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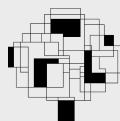
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**GLOBAL CHANGE AND FOREST
NUTRIENT STOICHIOMETRY. THE
FOLIAR ELEMENTAL COMPOSITION
OF WOODY PLANTS AND ITS
DRIVERS**

Helena Vallicrosa Pou
Doctoral Thesis

Advised by:
Prof. Josep Peñuelas
Prof. Jordi Sardans

September 2021



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Universitat Autònoma de Barcelona
Centre de Recerca i Aplicacions Forestals
DOCTORAT EN ECOLOGIA TERRESTRE

Global change and forest nutrient stoichiometry. The foliar elemental composition of woody plants and its drivers

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*A la meva mare, la meva germana, la meva
esposa i a totes les dones d'esperit crític.
Que aquest camí també és nostre.*

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Introduction

1.1 The Earth system and the biogeochemical cycles

Following the bases of physics and chemistry the Earth is considered a closed system, where energy enters and escapes freely but matter conforming it does not, excepting for the eventual income of rare meteorites. At the same way as energy, matter is not created nor destroyed but it is transformed (Lavoisier, 1785) so all the matter conforming the Earth can flow around the system without disappearing. In other words, there is a limited and static number of atoms of each element conforming our planet. Thus, all this matter can move around the abiotic (atmosphere, lithosphere, hydrosphere) and biotic (biosphere) compartments of the Earth changing in estate (solid, liquid and gas) and conforming what is known as biogeochemical cycles. Each chemical, depending on its atomic properties and how the evolution used them conform its own cycle, subjected to different processes and paths to cross the compartment borders. To understand and describe each cycle, science characterized them through their reservoirs, where the matter is stored, and fluxes, which are the different ways that each element can “escape” from each reservoir to flow into another. The carbon (C), nitrogen (N), phosphorus (P) and potassium (K) cycles have enormous impacts in biosphere and its development and due to that are the most studied matter cycles on Earth.

C-cycle

Carbon is the 15th most abundant element in Earth’s crust, relatively light, solid in ambient temperature and is capable to establish stable and unstable bounds with a vast number of compounds. We can consider carbon as the base of live up the point that chemistry based on C is called organic chemistry. On the Earth, the biggest C reservoir is the ocean, containing more than 37000 Gt of C. Then follows the soil, with 2300 Gt of C, the atmosphere with almost 800 Gt and finally plants, with about 550 Gt of C. All these reservoirs are connected through biotic and/or abiotic reactions, exchanging C between them. Roughly speaking, oceans and atmosphere are connected both-sides through different processes: gas exchange, which produces carbonic acid when CO₂ dissolves into the ocean; through living beings’ respiration, emitting CO₂ from the

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ocean to the atmosphere; and finally with autotrophs photosynthesis, absorbing CO₂ to the ocean and incorporating it to oceanic life matter. Atmosphere interacts with plants, animals and microbes through respiration, where they emit CO₂ to atmosphere, and through photosynthesis, where plants incorporate CO₂ from atmosphere becoming organic matter. Finally, soil interacts with atmosphere, through soil organisms respiration and through the trophic webs with animals, fungi and microbes that emit great part of the CO₂ previous fixed by plants as organic matter. Soil also interact with plants, incorporating C from organic matter decomposition (Figure 1.1). Despite the Earth system is more complex than that, the aforementioned relations are the most important in terms of quantity moving almost all C in our planet.

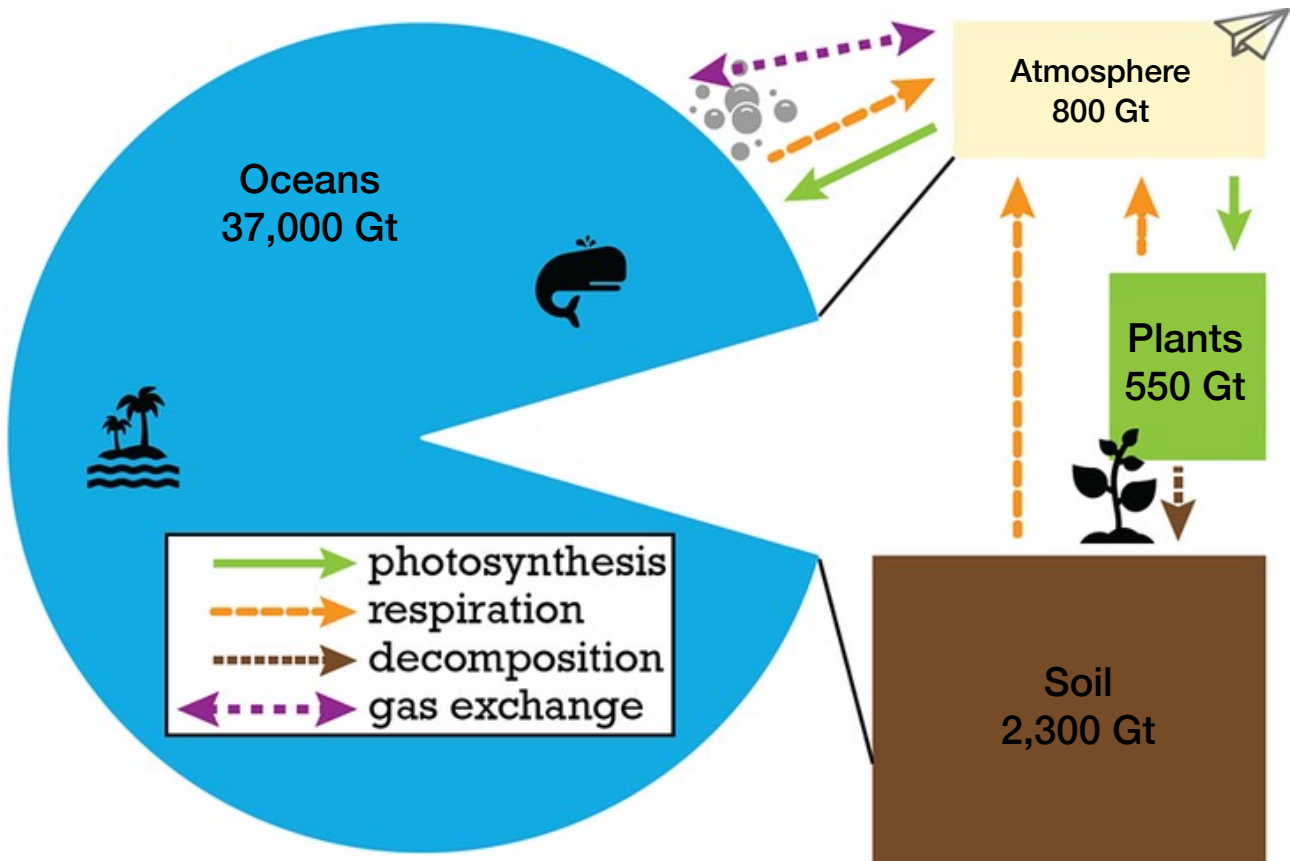


Figure 1.1. Schematic C cycle with compartments estimated Gt.
Ref: futurelearn.com (23/07/21) Tim Doheny-adams

N-cycle

Nitrogen is the 7th most abundant element in *Via Lactea* but due to the stability of its di-atomic covalent bond that yields very stable gas forms is difficult to be found in solid form in Earth surface conditions of pressure and temperature. On the Earth, 78% of the atmosphere is N, where is found as N₂ gas bonded with a triple covalent bond, one of the strongest union types which make it difficult to move between reservoirs. Paradoxically, N is also crucial to life on Earth, being part of structures as important as nucleic acids, proteins and amino acids. All living being on Earth needs from this difficult to achieve element. Consequently, the strategy that life has had to develop in order to incorporate N into the trophic chain has been challenging. To better

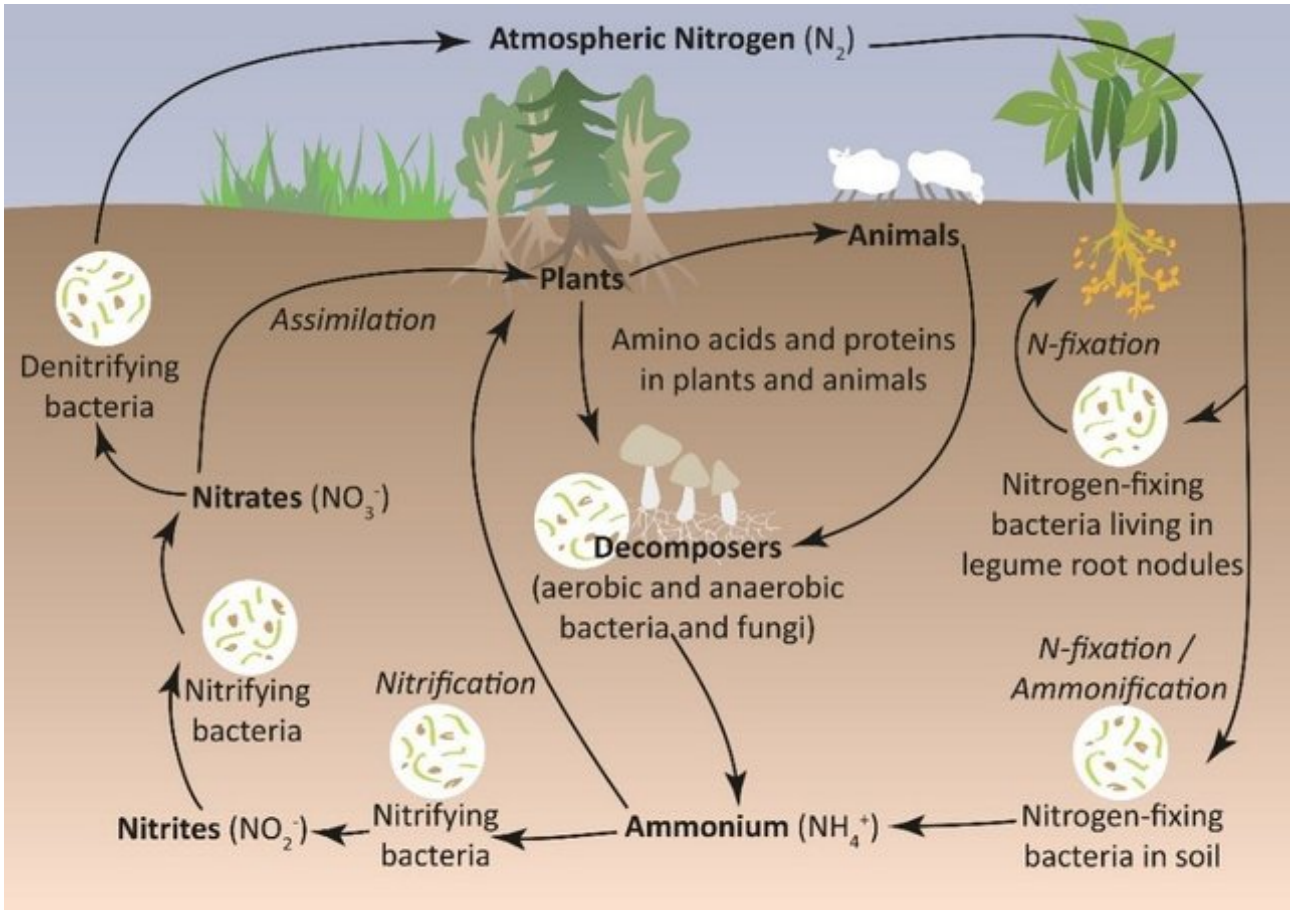


Figure 1.2. Schematic Nitrogen cycle. Ref: Lappalainen et al., 2016.

understand N cycle, it is useful to separate their reservoirs between atmosphere, plants (including both marine and terrestrial) and soil with high importance of microorganisms. The main mechanism life has to transform this inorganic N_2 into easier to absorb nitrogen compounds, such as nitrate, nitrite or ammonia is called nitrogen fixation and is conducted in more than 90% by marine or terrestrial microorganisms. This transformed N can now be assimilated by plants and animals which will return to the ground through decomposition. The return of N to the atmosphere can occur through denitrification process, also done by bacteria, or through organic matter combustion (Figure 1.2).

P-cycle

Phosphorus is the eleventh most abundant element in Earth crust and it is also a vital element for life. All living beings need P on their structures as far as it is part of nucleic acids, such as DNA and RNA, ATP, which is responsible for biological information storing, organisms energy storage and release and part of membrane cells as phospholipids. Inorganic phosphorus lays on the soil crust generally in orthophosphate form (PO_4^{3-}) and it is simply absorbed by plant roots. Different from C and N, phosphorus organic form is not transformed chemically by living beings and is always orthophosphate form, surrounded by 4 oxygens. The rest of successional trophic levels incorporate P by ingesting this biomass which already incorporated P. On one side this P come back to the soil crust through decomposition but on the other side soils are also renovated at

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geological scale through soil creation process of weathering, deposition and geological uplift. The concern regarding P is that through years of life succession the soils can be P depleted due to biomass removal or leaching and become P limited, constraining life development. Consequently, young soils have more available P because their reservoirs have not been spent yet (Walker and Syers, 1976) (Figure 1.3).

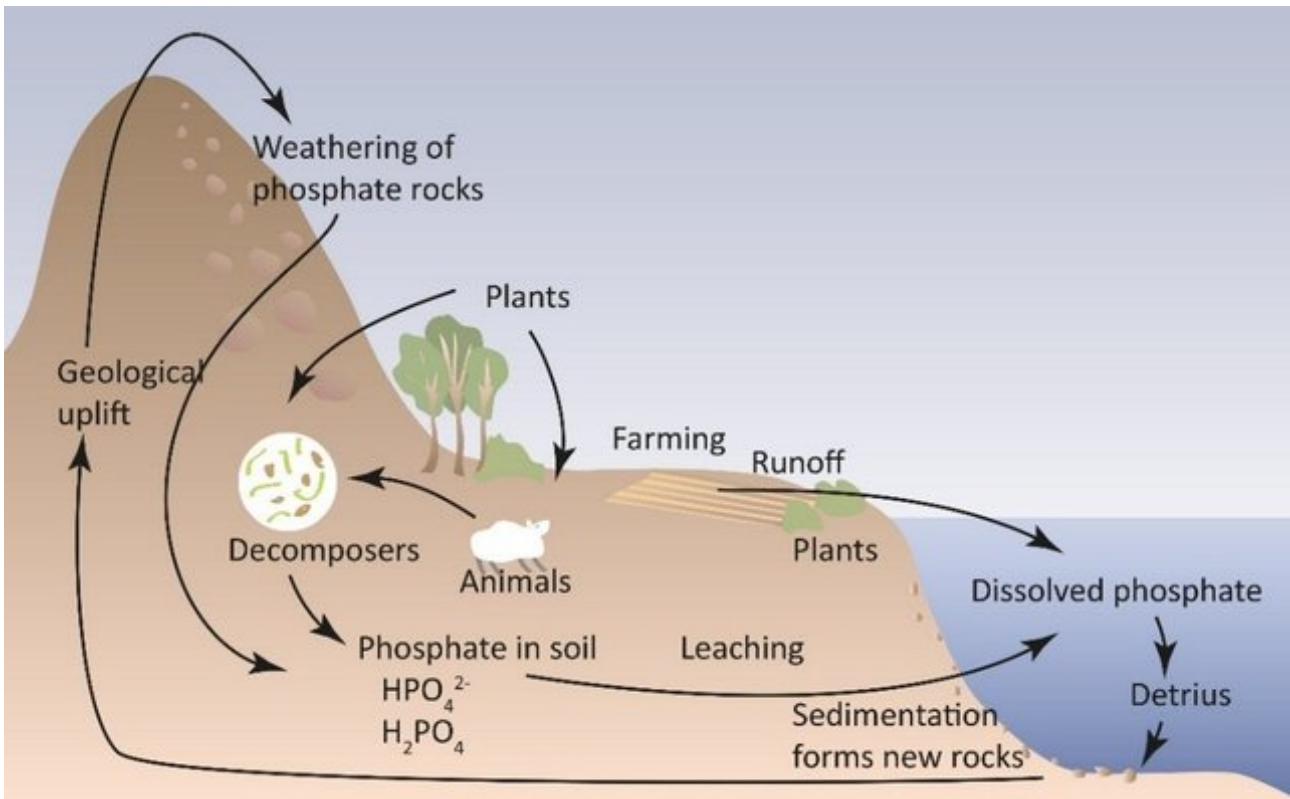


Figure 1.3. Schematic phosphorus cycle. Ref: Lappalainen et al., 2016.

K-cycle

Potassium is the seventh most abundant element in the soil crust. In living beings potassium is responsible for nucleic acids stabilization and it is used as ion to control osmotic pressure. It is very important in plant physiology contributing to photosynthesis through stomatal control and linked to water use and efficiency. In animals, K is responsible to transmit neurological impulse and for muscle contraction. The biggest K reservoir in biosphere are the oceans where K lays in water solution. Through geomorphic processes this K is incorporated into the lithosphere where generally it conform some minerals such as illite and mica or can be absorbed onto clay. Plants have the ability of pumping the exchangeable K from the lower soil layers to the top layers increasing its availability. This K can be dissolved in water and leached back to the oceans. Also some ocean water spray can be transported by air generating some K deposition which could be important in some coastal ecosystems (Figure 1.4). Differently to C, N and P which conform tissues and remain typically longer times in vegetal tissues K can be absorbed and released faster, as being used normally as ion.

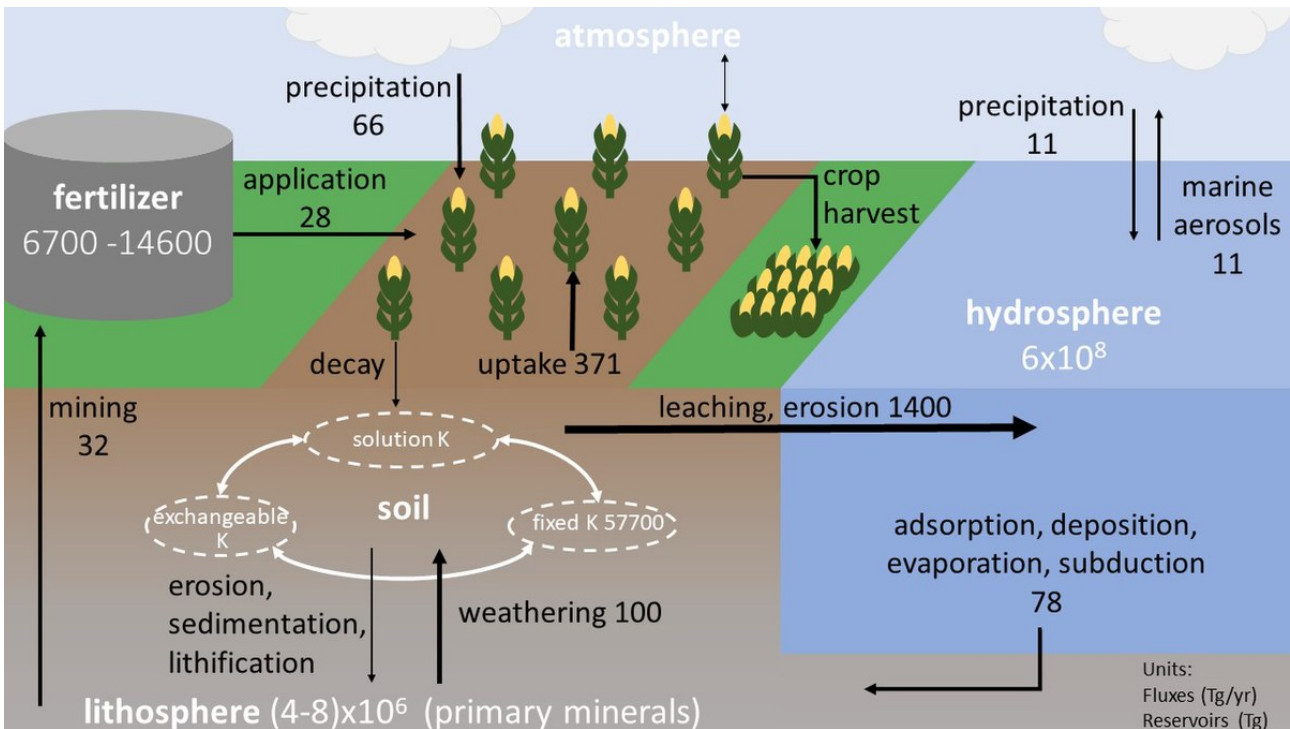


Figure 1.4. Schematic potassium cycle. Ref: wikipedia.

1.2 Climate change and plants

The last centuries and especially since industrial revolution, human being have been postulated as one of the major disruptors of biogeochemical cycles in modern times, endangering their stability (Canadell et al., 2007). Our massive production system based on exponential growth demands huge interactions with this biogeochemical cycles altering its reservoirs and creating new artificial fluxes that rarely occur in natural conditions or modifying existing ones. Is true that the Earth faced climate changes and unstable periods in the past which affected biogeochemical cycles, but not in this short time period and intensity. As a clear example we can have a look in C biogeochemical cycle, which is a recurrent topic in human’s agenda. Massive amount of C has been released from the lithosphere to the atmosphere lately, provoking an atmospheric CO₂ increase reaching levels never seen before (Monastersky, 2013; IPCC 2018) (Figure 1.5). These biogeochemical cycles alteration directly affect humans development but also have many direct and indirect implications in other live forms such as plants, which are going to be protagonists in this thesis.

One of the biogeochemical cycles alteration important for plants communities comes from the atmosphere CO₂ rise. Plants absorb CO₂ from the atmosphere to incorporate C into their structures in sugar form through photosynthesis process. This autotroph process is the base of C incorporation to organic chain. Initially, this CO₂ rise is linked to an increase of C absorption by plants called “Greening effect” or “CO₂ fertilization”, due to this major C availability for photosynthesis (Keenan et al., 2016) allowing plants to tampon partially the atmospheric CO₂

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increase. Sooner, though, this CO₂ absorbing capacity from plants is reduced due to other elements and/or soil moisture limitation (Wang et al., 2020). This phenomenon was already described by Sprengel in 1840 but popularized by Liebig in its law of the minimum. This law postulates that plants productivity or growth is limited by its scarce element, which could be N, P or many others, and hinders plants efficiency to buffer atmosphere C increase in medium/long term. Furthermore, this increasing unbalance between C and the rest of elements available would also generate plant nutrition deficiencies. By now we are already detecting a dilution of N, P, K, Ca, Mg and S in plant foliar tissues in Europe (Peñuelas et al., 2020a) and we still do not know for sure which additional effects this would cause.

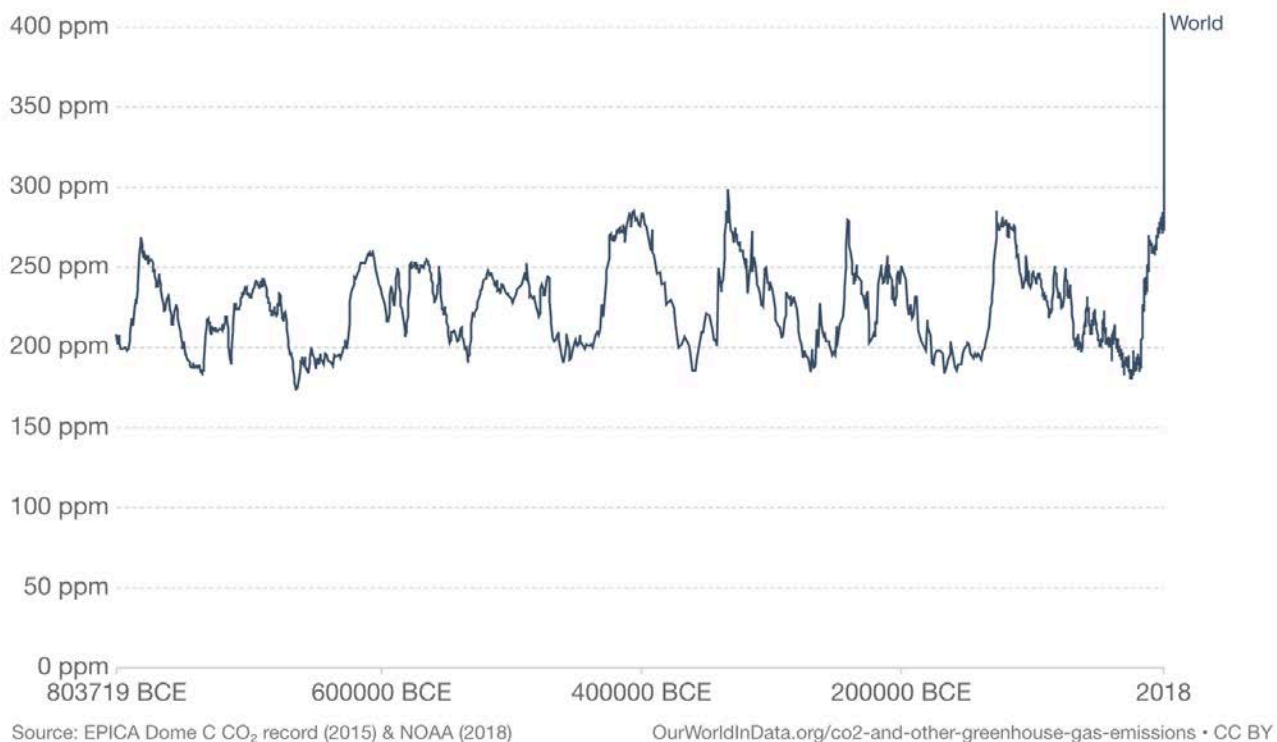


Figure 1.5 Global average long-term atmospheric concentration of carbon dioxide (CO₂), measured in parts per million (ppm). Long-term trends in CO₂ concentrations can be measured at high-resolution using preserved air samples from icecores.

The aforementioned atmospheric CO₂ and other gases increase also participates into the “greenhouse effect” keeping the heat from escaping back to the space. The greenhouse effect is responsible for global warming which have multiple consequences such as poles melting, temperature increase, risk of alteration of water fluxes in the ocean, sea level rise, alteration of pluvial regimes, increase of extreme climatic events between many others which contribute to the climate change (IPCC, 2018). Thus, the climate change is a multifactorial pool of alterations that differently affect plants depending on the species, placement and ecological pressure (Vallicrosa et al., 2021). For instance, an Oak into the Mediterranean will not be equally affected by temperature rise as a pine in Finland or Amazonian tree species will not be equally affected by torrential rains as a cactus in Atacama. Hence, the challenge for the scientists is to assess how

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the conditions are going to be modified by climate change and how those conditions are going to affect the different species.

Nitrogen cycle is another biogeochemical cycle highly modified by humans. Some paragraphs before we talked about the difficulties of N₂ fixation and its importance for plant development, so we became able to artificially synthesize N in industrial fertilizers to fertilize crops. This industrialized process which fixes N₂ from the atmosphere through high pressures is called Haber-Bosch process. The volatilization of a portion of this N fertilizers applied into agriculture in conjunction of fossil fuels combustion and the continuous increase of N₂ fixing crops generate an elevated income of atmospheric N which through precipitation reaches natural environments (Galloway et al., 2008; Schmitz et al., 2019; Peñuelas et al., 2021). This extra N fertilization reaching natural environments is associated with the alteration of plant-plant, plant-fungus, plant-soil and plant-herbivore relationships (Gilliam, 2006; Friedrich et al., 2012; Ochoa-Hueso et al., 2011), plant growth and C fixation increase (Bontemps et al., 2011; Schulte-Uebbing & de Vries, 2017), plant N increase (Baron et al., 2000), plant P decrease (Kowalenko, 2006) and increase of N:P ratios (Huang et al., 2016) despite its effects vary depending on the intensity and duration of N deposition. Despite all the information generated by scientific community about N deposition there are still some answers to reach as well as how this N deposition is combined with other climate change factors and how this affects intraspecific competition.

The combustion of fossil fuel, besides the increase of atmospheric CO₂ and N also contributes to the increase of S emissions to atmosphere. This S compounds and some N compounds causes the acid rain. This wet deposition with a very acid pH causes tissue damage by direct contact, soils acidification, availability of toxic compounds such as some trace elements, which negative impact on vegetal growth and negative impact in productivity (Singh and Agrawal, 2008). Consequently, big efforts were done to decrease the S and N emissions which were related to a decrease of S and N deposition in the last decades. Despite of this, N and S deposition are still an ecological concern (Schmitz et al., 2019).

The greening effect caused by atmospheric CO₂ increase generates an increase of vegetal biomass which is higher or lower depending on other elements availability. As seen before, the N deposition is also a factor that increases N availability in some regions which can also contribute to increase this greening effect. In contrast, while the availability of C and N increase, P availability and supply remains stable on soil. This factor can generate regional P limitation as well as high N:P imbalances. Consequently, P can become the limiting factor of vegetal development and restrict the C retention capacity (Peñuelas et al., 2013; Carnicer et al., 2015). Furthermore, the changes in N:P ratio can affect species composition, food webs structure and terrestrial ecosystems diversity and functioning (Sterner and Elser, 2002; Paseka and Grunberg, 2019; Peñuelas et al., 2019;2020b; Sardans et al., 2021). Thus, how to identify and mitigate this N:P imbalances and P limitation all over the world is another topic concerning scientific community these days.

1.3 Biogeochemical niche theory

Between this deep sea of ecological pressures and climate change alterations it would be useful to keep in mind the bases of ecology. One of the main objectives in ecology is to understand diversity. Why this species is in this particular site? How do the species interact? What does it drive its presence? And all these questions, of course, are extremely related to environmental conditions and biotic interactions we discussed earlier. In 1957, Hutchinson proposed the ecological niche theory, which comprehends all conditions necessary for an organism to exist (Hardesty, 1972). To make it easy we should imagine a multi-space with endless variables which settle each specie into a specific range of each variable of temperature, species cohabitation, soil texture, predator pressure and all variables you can imagine. Hence, generalist species have a wider range in the variables than specialist species, which are more adapted into particular conditions. Following this theory, species tend to avoid niche overlap between coexisting species in order to avoid competition and be more ecologically successful.

Unfortunately, even supported for the scientific community, this multi-space of variables is almost impossible to sample, quantify and experiment with so, as an alternative, Peñuelas et al., 2008 proposed the biogeochemical niche theory. This theory is based on the same principles than the classical niche theory but using only variables of elemental composition (the amount of each chemical compound), which are finite and quantifiable through chemical analysis. Following biogeochemical niche theory, species are considered as a product of a long-term natural selection which generates a particular genetic pool. This genetic pool includes the response of each specie to the different conditions which through the different fundamental biological processes such as growth, metabolism, reproduction or storage it is translated to a particular range of chemical compounds. Hence, the chemical composition of each specie could be considered as a biological fingerprint. This approach suggests the study of elemental composition as an indicator of the ecological processes at specie, community and ecosystem level and it is postulated as a very powerful tool to understand plant performance drivers. For example, it aims to relate chemical composition with photosynthesis and growth, reproduction and at the end ecological success. Also, the study of elemental composition in plants allows to include biosphere into the same language as we study the other compartments of biogeochemical cycles and conceive its function as a whole matter flow of chemical elements, which are the smaller particle we can work with.

1.4 Aim of the thesis

Arising from the exposed ecological knowledge and questions this thesis aim to offer new findings regarding:

- The additional effect of drought and N fertilization into foliar elemental composition of dominant species in a Mediterranean forest (Chapter 2)

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- How foliar elemental composition and environmental drivers are related with defoliation and forest health in Europe (Chapter 3)
- How the most abundant nutrients (N, P, K) are distributed into leaves of the woody vegetation all over the world and which are the main drivers (Chapter 4, Chapter 5)
- Empirical support for the biogeochemical niche theory (Chapter 2, Chapter 4, Chapter 5, Chapter 6)

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2

Short-term N fertilization differently affects the leaf and leaf litter chemistry of the dominant species in a Mediterranean forest under drought conditions

Helena Vallicrosa, Jordi Sardans, Romà Ogaya, Pere Roc Fernández and Josep Peñuelas

Abstract

Nitrogen (N) deposition is a key driver of global change with significant effects on carbon (C) cycling, species fitness, and diversity; however, its effects on Mediterranean ecosystems are unclear. Here, we simulated N deposition in an N-fertilization experiment with ^{15}N -labeled fertilizer in a montane evergreen Mediterranean holm oak forest, in central Catalonia, to quantify short term impacts on leaf, leaf litter elemental composition, and resorption efficiency in three dominant species (*Quercus ilex*, *Phillyrea latifolia*, and *Arbutus unedo*). We found that even under drought conditions, ^{15}N isotope analysis of leaf and leaf litter showed a rapid uptake of the added N, suggesting an N deficient ecosystem. Species responses to N fertilization varied, where *A. unedo* was unaffected and the responses in *P. latifolia* and *Q. ilex* were similar, albeit with contrasting magnitude. *P. latifolia* benefited the most from N fertilization under drought conditions of the experimental year. These differences in species response could indicate impacts on species fitness, competition, and abundance under increased N loads in Mediterranean forest ecosystems. Further research is needed to disentangle interactions between long-term N deposition and the drought predicted under future climate scenarios in Mediterranean ecosystems.

Keywords: elemental composition; isotopes; reabsorption; climate change; *Arbutus unedo*; *Phillyrea latifolia*; *Quercus ilex*

2.1 Introduction

Nitrogen (N), which is an essential element for plant nutrition, is involved in complex cycling in terrestrial ecosystems that involves biotic and abiotic processes, such as N_2 -fixation, mineralization, nitrification, ammonification, and denitrification [1,2,3]. Anthropogenic activities

since the industrial and agricultural revolutions, particularly those associated with fossil fuel combustion, cultivation of N₂-fixing crops, and production of N fertilizer using the Haber-Bosch process, increasingly influence the global N-cycle as they are often key sources of N in terrestrial ecosystems, driving fluxes of similar magnitudes to natural fluxes [4,5,6]. Inorganic N deposition in European forests increased on average from about 2.8 kg ha⁻¹yr⁻¹ in 1900 to a peak of 10.3 Kg N ha⁻¹yr⁻¹ in 1990, followed by a decline to 6.6 Kg N ha⁻¹yr⁻¹ by 2018 [7,8]. However, 62% of Europe continues to remain at risk of eutrophication [9] through rises in organic N deposition due to increasing levels of N-fertilization of cropland [8].

In general, N addition to ecosystems alters the first N cycle, increasing N mineralization, nitrification, and nitrate leaching rates, and thereafter other ecosystem variables such as P-cycle [5], and finally is associated with a long-term plant community diversity decrease [10]. Also, in some Mediterranean regions in California with elevated N deposition, native plant species have been replaced by invasive species with higher N performance [11,12,13]. Vegetation responses to increases in N supply are complex and include increased inter-plant competition, modified plant-soil feedbacks, and changes to plant-herbivore and plant-fungus relationships [14,15,16]. Typically, increases in N availability under N deposition are associated with greater plant growth [17,18], C-fixation [19], increased plant N concentrations [20,21], and reduced plant P concentrations [22,23] that contribute to increased plant N:P ratios [24,25,26,27]. While critical N loads have been described for a range of ecosystems and species, including 3–33 kg N ha⁻¹ yr⁻¹ for herbaceous species and shrublands and 4–39 kg N ha⁻¹ yr⁻¹ in forests in the US [10], there is a knowledge gap for Mediterranean Basin ecosystems.

Along with water availability, nutrient supply is a frequent limiting factor for Mediterranean ecosystems [28,29] and is an important factor in the growth, structure, and distribution of plant communities [30,31,32]. Consequently, Mediterranean forest communities tend to be dominated by woody plant species characterized by conservative traits related to tolerance of low water and nutrient conditions, such as slow growth and high levels of sclerophylly, high levels of investment in root biomass, and greater metabolic flexibility [28]. Responses of plant species to long-term N-fertilization under high levels of N deposition vary with life history strategy, where ruderal species are likely to be favored over stress-tolerators [33]. The resulting changes in competitive relationships within plant communities lead to long-term changes in species community composition [10,12,34], which could culminate in the extinction of endemic species and reduce overall levels of species diversity [16].

High levels of N deposition are known to constitute a threat for global plant diversity; as long as Mediterranean ecosystem is considered a diversity hotspot, an increase of N deposition could endanger its species diversity [35,36,37]. Deposition of N has been related to reduced levels

of resilience in Mediterranean plant communities to disturbing climatic conditions [28]. However, few field studies have assessed the relationships between increases in N-availability and responses of dominant woody species and shifts in nutrient cycling in Mediterranean plant communities. In particular, even less field studies assessed the impacts of a sudden rise in N deposition on a semi-pristine Mediterranean ecosystem, in which current loads of N deposition are low and especially interacting with drought. Therefore, we aimed to study the short-term effects of N-fertilization to simulate rapid N deposition and availability on: (i) foliar and litter nutrient composition; (ii) foliar nutrient reabsorption; and (iii) foliar and litter carbon (C) and N isotope ratios in three dominant tree species of a semi-pristine, low-nutrient Mediterranean holm-oak forest to increase the understanding of species community composition and dynamics under increased N deposition in the increasingly dry Mediterranean environment.

2.2 Materials and Methods

2.2.1 Study Site

The study was carried out on a south-facing slope (25% incline) of a semi-pristine (*Quercus ilex* L.) forest, where N deposition was 3.5 kg N ha⁻¹ yr⁻¹ between 1981 and 1994 [38], in the Prades Mountains, Catalonia, NE Spain (41°21' N, 1°02' E). The forest has not been disturbed for the last 70 years and the maximum height of the dominant species is about 6–10 m. Mean annual temperature and precipitation are 12 °C and 658 mm, respectively, with the warmest months occurring between June and August and the rainiest period between September and November (Figure 1). These conditions correspond to a mesic-Mediterranean climate, with a pronounced summer drought period that usually lasts for 3 months. During the study period, mean annual temperature and annual precipitation in 2014 were 12.65 °C and 661.38 mm respectively, and 13.25 °C and 355.44 mm respectively in 2015 (Figure 2.1). Air temperature and rainfall were recorded by an automatic meteorological station in the studied area. The soil is a stony Dystric

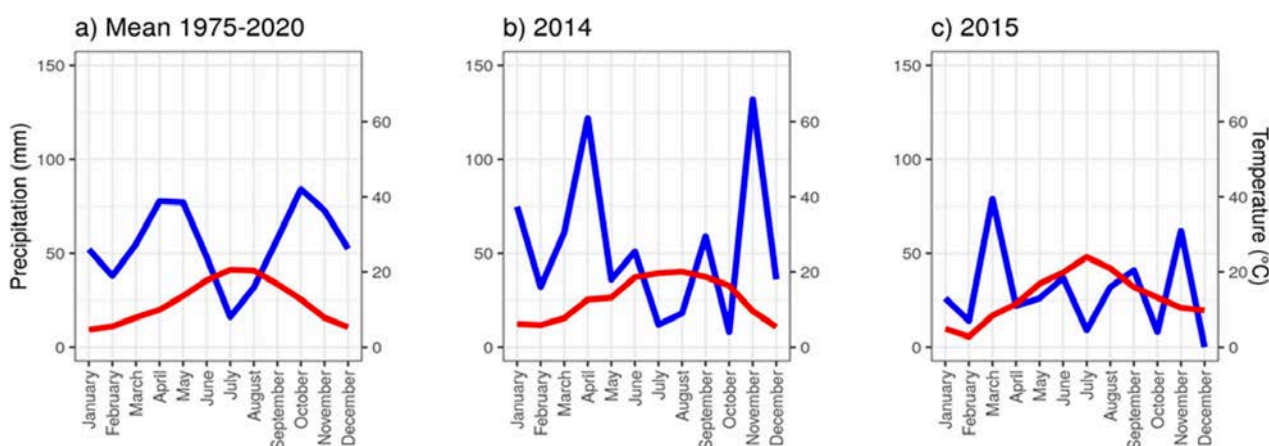


Figure 2.1 Bagnouls-Gausson ombrothermic diagram of mean climatic temperature (in red) and precipitation (in blue) by month in the study site. (a) Mean monthly data from 1975 to 2020. (b) Mean monthly data for 2014. (c) Mean monthly data for 2015.

Cambisol, on a bedrock of metamorphic sandstone, and ranges between 35 and 100 cm in depth. The dense forest vegetation is dominated by *Q. ilex*, with abundant *Phillyrea latifolia* L., *Arbutus unedo* L. among other evergreen species that are well-adapted to drought conditions (*Erica arborea* L., *Juniperus oxycedrus* L., and *Cistus albidus* L.) and the occasional occurrence of deciduous species (*Sorbus torminalis* L. Crantz and *Acer monspessulanum* L.). The three tree species (*Q. ilex*, *P. latifolia*, and *A. unedo*) represent 97% of the total aboveground biomass of the forest [39] and they frequently co-occur in Mediterranean *maquis* shrubland and evergreen *Q. ilex* forests. *Q. ilex* is widely distributed across the subhumid areas of the Mediterranean Basin, while *P. latifolia* occurs in warmer and drier Mediterranean areas [40,41] and *A. unedo* exploits forest gaps in which conditions are limiting for *Q. ilex* [42].

2.2.2 Experimental Design

We established eight 15 m × 10 m plots at the same altitude (950 m) [43]; four plots received N-fertilizer and the remainder were untreated controls. In 2015, a total fertilization of 60 kg of N ha⁻¹ a⁻¹ (at a rate of 15 kg N ha⁻¹ in each annual season) was applied as a solution of ammonium nitrate (NH₄NO₃) with a sprayer. This fertilization was sprayed in 3 different days per season (5 kg N ha⁻¹ each application), with at least 1 week between different applications. This solution was sprayed over the canopy level after climbing to the top of the uppermost tree in each plot. This solution was enriched with 15N as follows: 90% of “normal” ammonium nitrate, and 10% of ammonium nitrate enriched with 15N (the 10% of this enriched ammonium nitrate was 15N) (Sigma-Aldrich, Co., St. Louis, MO, USA).

2.2.3 Sampling

We sampled leaves of *Q. ilex*, *P. latifolia*, and *A. unedo* and foliar litter in mid-May (spring), end of July (summer), and mid-November (autumn) 2014, prior to treatment, and in 2015 during fertilization, sampling the same tree before and after treatment. On each sampling occasion, we randomly selected five trees of each species per plot and collected mature and healthy leaves at a height of 2–3 m from plants with a diameter of 2–12 cm at 5 cm above ground level; these plants represent about the 70% of the community biomass [44,45]. To reduce effects of tissue age and orientation to sunlight, we sampled leaves that were sun-lit and oriented southwards. Mean leaf life span is approximately 18 months [45], so most leaves sampled during 2015 under fertilization were also present during 2014 prior to treatment. Litterfall at the soil surface was collected in 20 circular baskets (27 cm in diameter, with 1.5-mm diameter mesh) that were randomly distributed in each plot. Even though the baskets were permanently placed over the ground, the dense canopy cover almost totally avoided N fertilization reaching the soil or the baskets. The collected litter was not in direct contact with the soil so its conservation state was good and the decomposition process had hardly begun. Once collected, the leaf and litter samples were taken to the laboratory and stored at 4 °C prior to analysis.

Foliar nutrient resorption was calculated as the difference in elemental compound concentration of leaves collected in 2014 and litter collected in 2015, using the equation $100 - (X_l \times 100)/X_f$, where X_l is litter element concentration in 2015 and X_f foliar element concentration in 2014. The result is an inference of proportional (%) element resorption efficiency prior to leaf fall.

2.2.4 Chemical Analyses

The leaf and foliar litter samples were washed with distilled water, as described by Porter (1986) [46], dried in an oven at 60 °C to a constant weight, and then ground using a mill (CYCLOTEC 1093, Foss Tecator, Höganäs, Sweden) for measurement of biomass. Leaf and litter concentrations of carbon (C) and N were quantified by combustion coupled to gas chromatography, by placing 1.4 mg of the milled samples in a tin microcapsule in an elemental analyzer (CHNS-O EuroVector, Milan, Italy), while concentrations of phosphorus (P), potassium (K), and micro-elements were determined by digesting samples of leaf and litter in acid in a microwave (MARSXpress, CEM, Matthews, NC, USA) at high pressure and temperature. Then 250 mg of each ground sample, 5 mL of nitric acid, and 2 mL of H₂O₂ were placed into Teflon tubes; digestate was placed in 50-mL flasks and diluted with Milli-Q water to a volume of 50 mL. Concentrations of P, K, and micro-elements were determined using optic emission spectrometry with inductively coupled plasma and the accuracy of the digestions and analytical biomass procedures was assessed using a certified standard biomass (NIST 1573a, tomato leaf; NIST, Gaithersburg, MD, USA) as a reference. Isotopic analyses of $\delta^{13}\text{C}$ ($^{13}\text{C}/^{12}\text{C}$) and $\delta^{15}\text{N}$ ($^{15}\text{N}/^{14}\text{N}$) of the leaf and litter samples were conducted at the Stable Isotope Facility at the University of California, Davis using a PDZ Europa ANCA-GSL elemental analyzer connected to a PDZ Europa 20–20 isotope ratio mass spectrometer (Sercon Ltd., Cheshire, UK).

2.2.5 Statistical Analyses

Between year treatment differences in plot, species, and season values were calculated based on proportional change in values between 2014 and 2015, and then linear mixed models were used to test for treatment differences in leaf and litter macro- (C, N, P, K) and micro-element concentrations (calcium, Ca; magnesium, Mg; chrome, Cr; iron, Fe; manganese, Mn; copper, Cu; zinc, Zn, strontium, Sr; nickel, Ni; and, lead, Pb) and reabsorption, and in foliar N and C isotopes by species, with plot and season as random factors. Models were defined using lme4 [47] and lmerTest [48] and r^2 was calculated in MuMIn [49] R packages. Treatment differences in leaf and litter isotope content by species was tested using Student's *t*-test.

Overall treatment differences in leaf and litter macro- (N, P, K) and micro-element (Ca, Mg, Fe, Mn, Cu, Zn) composition and isotope content ($\delta^{13}\text{C}$ and $\delta^{15}\text{N}$) by species were tested using general discriminant analysis (GDA) in Statistica 8.0 (StatSoft, Inc., Tulsa, OK, USA) that identifies

variables most responsible for group differences, while controlling variance due to other categorical variables (here, season).

In order to detect the effect of 2015's exceptional arid conditions, we calculated a *t*-test between 2015 and 2014 for leaves and litter from only control plots (which have no treatment applied in 2015).

2.3 Results

2.3.1 Fertilization Effects on Foliar Element Concentrations

There were between-year differences in C:P ratios in *P. latifolia*, where there were increases of $4.83 \pm 3.36\%$ and $3.05 \pm 0.86\%$ in untreated control and fertilized plots, respectively (difference between treatments: $p < 0.05$; \pm standard error (SE) showed; Figure 2.2a, **Table S1**), and ratios of N:P differed for *A. unedo*, where there were $1.64 \pm 1.65\%$ decreases and $1.12 \pm 1.38\%$ increases in the untreated and treated plots from 2014 (pretreatment) to 2015 (post-treatment), respectively, (difference between treatments: $p < 0.05$; \pm standard error (SE) showed; Figure 2.2b, **Table S1**). There were no treatment differences in leaf concentration of N, P, or K or in C:N ratios of the three species.

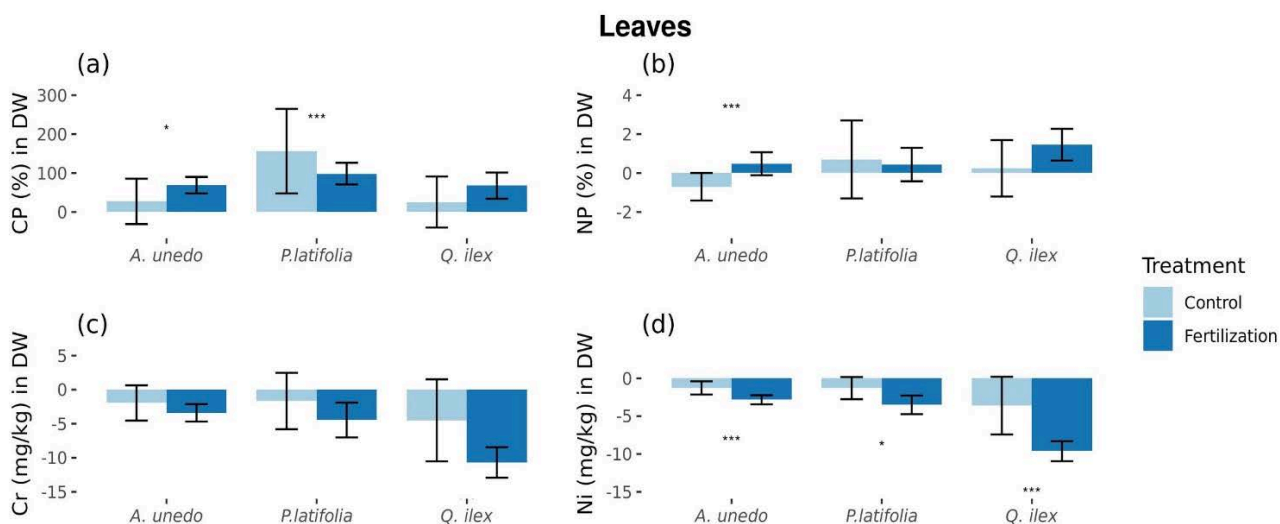


Figure 2.2 Foliar elemental ratios and microelements statistically different between control and fertilized plots. (a) C:P % in dry weight in leaves. (b) N:P % in dry weight in leaves. (c) Cr mg/kg in dry weight in leaves. (d) Ni mg/kg in dry weight in leaves. Values are relative to original values in 2014 expressed in % of change. * = Marginal significance ($p = [0.05, 0.1]$). *** = Significant differences ($p < 0.05$). Figures with standard errors.

Among the micro-elements, there were differences in leaf concentrations of chromium (Cr) in *Q. ilex*, where there were decreases of $1.68 \pm 1.83\%$ and $3.56 \pm 0.68\%$ in the untreated and treated plots, respectively (difference between treatments: $p < 0.05$; \pm standard error (SE)

showed; Figure 2.2c), while leaf concentration of nickel (Ni) in *A. unedo* decreased by $0.76 \pm 0.41\%$ and $1.49 \pm 0.28\%$, respectively (difference between treatments: $p < 0.05$; \pm standard error (SE) showed), and decreased in *Q. ilex* by $1.86 \pm 1.79\%$ and $4.67 \pm 0.62\%$ (difference between treatments: $p < 0.05$; \pm standard error (SE) showed; Figure 2.2d) (**Table S1**). There were no treatment differences in leaf concentrations of Ca, Mn, Fe, Cu, Zn, Sr, or Pb in the three species.

2.3.2 Fertilization Effects on Leaf Litter Element Concentrations

Treatment affected leaf litter concentration of macro-elements only in *P. latifolia* ($p < 0.05$; \pm standard error (SE) showed), where P concentration increased by $0.49 \pm 0.59\%$ in untreated plots and decreased by $1.80 \pm 0.72\%$ in fertilized plots (Figure 2.3a), while C:P ratios were

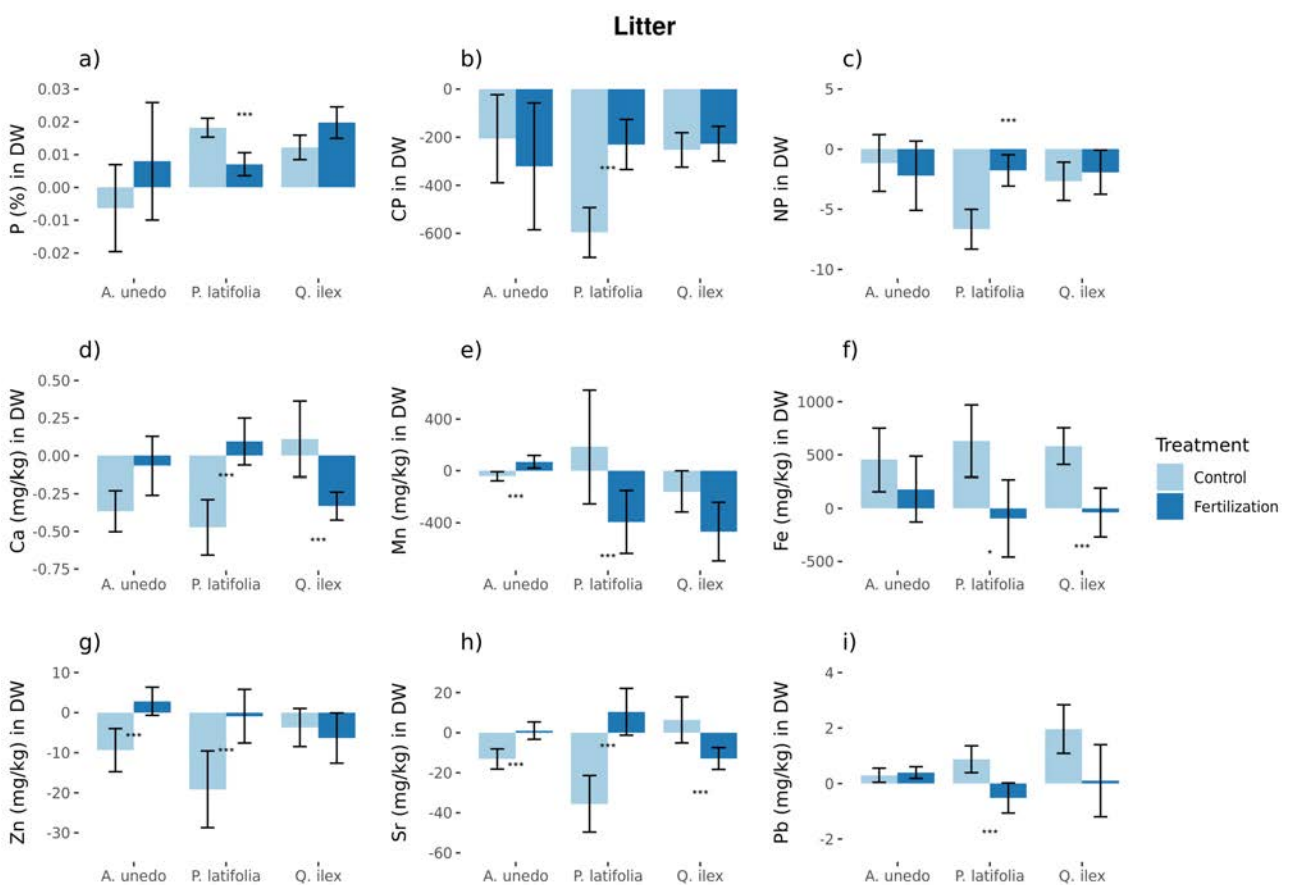


Figure 2.3. Litter elemental composition, ratios, and microelements statistically different between control and fertilized plots. The showed elements are: (a) P % in litter. (b) C:P in litter. (c) N:P in litter (d) Ca mg/kg in litter. (e) Mn mg/kg in litter. (f) Fe mg/kg in litter. (g) Zn mg/kg in litter. (h) Sr mg/kg in litter. (i) Pb mg/kg in litter. Values are relatives to original values in 2014 and are expressed in % of change. * = Marginal significance ($p = [0.05, 0.1]$). *** = Significant differences ($p < 0.05$). Figures with standard error.

decreased by $18.44 \pm 3.21\%$ and $7.12 \pm 3.22\%$ in untreated and fertilized plots, respectively (Figure 2.3b), and N:P ratios were $15.52 \pm 3.85\%$ and $4.11 \pm 3.04\%$ lower, respectively (Figure 2.3c) (**Table S2**). There were no differences in leaf litter concentration of the remaining macro-elements in the three species.

There were differences in litter concentration of micro-elements among the species (Figure 2.3d-i, **Table S2**). *A. unedo* leaf litter of Mn, Zn, and Sr increased from $-1.29 \pm 0.82\%$, $-12.25 \pm 3.57\%$, and $-9.44 \pm 2.7\%$ in the untreated plots to $1.44 \pm 1.22\%$, $-4.16 \pm 2.33\%$, and $-1.86 \pm 2.33\%$, respectively, in the N fertilized plots (difference between treatments: $p < 0.05$; \pm standard error (SE) showed), while *P. latifolia* leaf litter concentration of Ca, Zn, and Sr increased from $-19.88 \pm 5.35\%$, $-18.73 \pm 6.35\%$, and $-21.44 \pm 7.58\%$ in untreated plots to $-3.39 \pm 4.53\%$, $-6.64 \pm 4.44\%$, and $3.19 \pm 6.27\%$, respectively, in N fertilized plots and concentration of Mn and Pb decreased from $4.33 \pm 10.88\%$ and $4.04 \pm 2.52\%$ to $-10.01 \pm 6.04\%$ and $-3.24 \pm 2.83\%$, in the untreated and treated plots, respectively (differences between treatments: $p < 0.05$; \pm standard error (SE) showed). *Q. ilex* leaf litter concentration of Ca, Fe, and Sr decreased from $-2.89 \pm 7.32\%$, $16.58 \pm 5.21\%$, and $1.02 \pm 6.15\%$ in control plots, respectively, to $-15.77 \pm 2.70\%$, $-2.17 \pm 6.95\%$, and $-9.32 \pm 2.91\%$ in N fertilized plots, respectively (differences between treatments: $p < 0.05$; \pm standard error (SE) showed).

2.3.3 Foliar Nutrient Resorption

There were no effects of treatment on resorption of N, P, or K. While there were no differences in micro-element resorption in *A. unedo*, resorption of Mg and Ca in *P. latifolia* decreased from $-2.91 \pm 5.28\%$, and $-90.2 \pm 50.17\%$ in untreated plots, respectively, to $-19.71 \pm 8.12\%$ and $-171.1 \pm 20.99\%$, respectively, in fertilized plots (differences between treatments: $p < 0.05$; \pm standard error (SE) showed; Figure 2.4, **Table S3**).

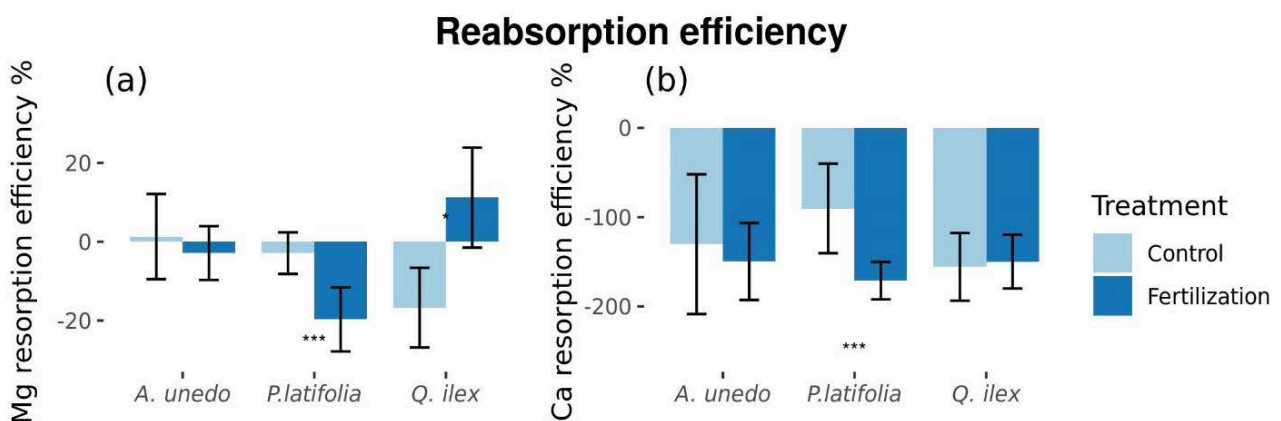


Figure 2.4. Microelements resorption efficiency % statistically different between control and fertilized plots. (a) Mg resorption efficiency. (b) Ca resorption efficiency. * = Marginal significance ($p = [0.05, 0.1]$). *** = Significant differences ($p < 0.05$). Figures with standard error.

2.3.4 Fertilizer N-Uptake

While there were no differences between year treatment differences in leaf and litter $\delta^{13}\text{C}$ in the three species, we found that leaf $\delta^{15}\text{N}$ varied between the untreated and treated plots in *P.*

2. SHORT-TERM N FERTILIZATION DIFFERENTLY AFFECTS THE LEAF AND LEAF LITTER CHEMISTRY OF THE DOMINANT SPECIES IN A MEDITERRANEAN FOREST UNDER DROUGHT CONDITIONS

latifolia ($0.25 \pm 8.28\%$ and $34.2 \pm 8.52\%$, respectively) and *Q. ilex* ($1.42 \pm 7.78\%$ and $37.49 \pm 6.11\%$, respectively) (differences between treatments: $p < 0.05$; \pm standard error (SE) showed; Figure 2.5a). No leaf differences in foliar $\delta^{15}\text{N}$ in *A. unedo*. Fertilization with ^{15}N -enriched fertilizer increased leaf litter $\delta^{15}\text{N}$ in *A. unedo* (from $0.072 \pm 14.57\%$ to $57.0 \pm 10.42\%$), *P. latifolia* (from $9.01 \pm 18.30\%$ to $58.5 \pm 13.68\%$), and *Q. ilex* (from $-0.34 \pm 20.68\%$ to $81.1 \pm 17.47\%$) (differences between treatments: $p < 0.05$; \pm standard error (SE) showed; Figure 2.5b) (Table S4). Content of $\delta^{15}\text{N}$ in *A. unedo* and *Q. ilex* was greater in leaf litter than in leaf material.

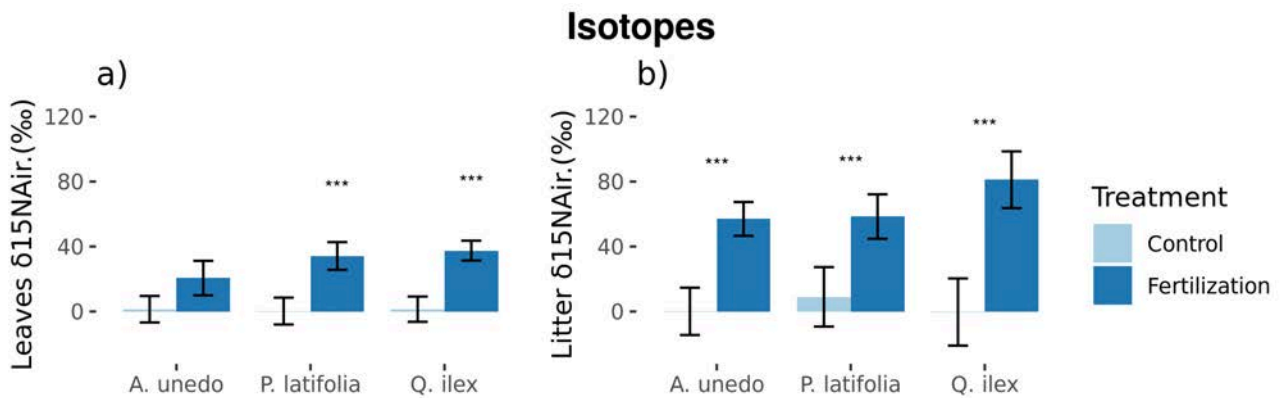


Figure 2.5 Isotopes statistically different between control and fertilized plots. a) Foliar tissue b) Foliar-litter tissue. *** = Significant differences ($P < 0.05$). Figures with standard error. *A. unedo* and *Q. ilex* foliar $\delta^{15}\text{N}$ is significantly different from litter $\delta^{15}\text{N}$.

2.3.5. Species Differences in Leaf and Leaf Litter Element Concentrations

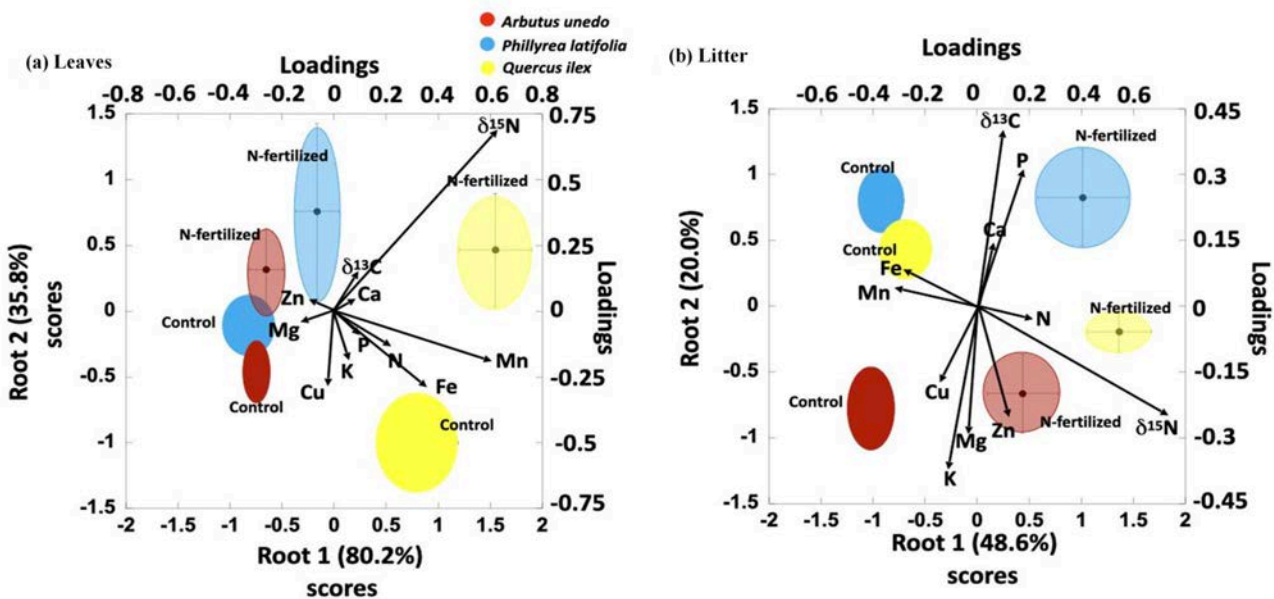


Figure 2.6 Generalized discriminant analysis (GDA) results representation of root 1 and root 2. Vectors representing variables, and ellipses representing control and N-fertilized plots measurements. (a) Leaves data. (b) Litter data.

The GDA driven by variation in $\delta^{13}\text{C}$, $\delta^{15}\text{N}$, K, Ca, Mn, Fe, Cu, and Zn concentrations (Table 2.1a) clearly separated the foliar elemental concentrations by species within and between treatments (Table 2.1b, Figure 2.6a). Similarly, there was clear separation of species in foliar litter within and between treatments (**Table 2b, Figure 6b**), driven by variation in $\delta^{13}\text{C}$, $\delta^{15}\text{N}$, N, P, K, Ca, Mn, and Fe concentrations (**Table 2a**). The variable loading most strongly in fertilized plots, separating them from control plots in leaves, is clearly $\delta^{15}\text{N}$ and with lower intensity $\delta^{13}\text{C}$, while Cu, Mg,

Table 2.1 (a) Foliar variables effect in GDA analysis in leaves. (b) Foliar variables effect in GDA analysis in litter. Significant effects ($p < 0.05$) are highlighted in bold type.

| (a) Leaves | | | | |
|-------------------|--------------|-------------|--------------------|--|
| Test | Wilks Lambda | F | <i>p</i> -Value | |
| ^{13}C | 0.953 | 2.67 | 0.023 | |
| ^{15}N | 0.748 | 18.1 | <0.0001 | |
| N | 0.989 | 0.615 | 0.69 | |
| P | 0.962 | 2.13 | 0.062 | |
| K | 0.959 | 2.24 | 0.049 | |
| Mg | 0.962 | 2.14 | 0.061 | |
| Ca | 0.938 | 3.57 | 0.0038 | |
| Mn | 0.742 | 18.7 | <0.0001 | |
| Fe | 0.906 | 5.6 | <0.0001 | |
| Cu | 0.946 | 3.1 | 0.0098 | |
| Zn | 0.941 | 3.36 | 0.0058 | |
| season | 0.941 | 1.66 | 0.087 | |
| (b) Litter | | | | |
| Variables | Wilks Lambda | F | <i>p</i> -Value | |
| ^{13}C | 0.917 | 4.36 | 0.00081 | |
| ^{15}N | 0.655 | 25.3 | <0.00001 | |
| N | 0.948 | 2.65 | 0.023 | |
| P | 0.827 | 10.1 | <0.00001 | |
| K | 0.869 | 7.26 | <0.00001 | |
| Mg | 0.959 | 2.07 | 0.07 | |
| Ca | 0.85 | 8.51 | <0.00001 | |
| Mn | 0.842 | 9.04 | <0.00001 | |
| Fe | 0.947 | 2.68 | 0.022 | |
| Cu | 0.955 | 2.28 | 0.048 | |
| Zn | 0.932 | 3.52 | 0.0043 | |
| season | 0.9 | 2.6 | 0.0045 | |

2. SHORT-TERM N FERTILIZATION DIFFERENTLY AFFECTS THE LEAF AND LEAF LITTER CHEMISTRY OF THE DOMINANT SPECIES IN A MEDITERRANEAN FOREST UNDER DROUGHT CONDITIONS

Table 2.2. (a) Squared Mahalanobis distances between species-treatment in leaves. (b) Squared Mahalanobis distances between species-treatment in litter. AC = *A. unedo* control plot. PC = *P. latifolia* control plot. QC = *Q. ilex* control plot. AN = *A. unedo* N-fertilized plot. PN = *P. latifolia* N-fertilized plot. QN = *Q. ilex* N-fertilized plot.

| (a) Leaves | | | | | |
|-------------------|--|--|--|---|--|
| | PC | AC | AN | QN | PN |
| QC | M = 3.83 F = 6.77 $p < 0.0001$ | M = 3.08 F = 5.44 $p < 0.0001$ | M = 4.40 F = 7.69 $p < 0.0001$ | M = 2.96 F = 5.24 $p < 0.0001$ | M = 4.21 F = 7.44 $p < 0.0001$ |
| PC | | M = 1.03 F = 1.82 $p = 0.041$ | M = 1.37 F = 2.39 $p = 0.0046$ | M = 6.27 F = 11.09 $p < 0.0001$ | M = 1.76 F = 3.10 $p = 0.0002$ |
| AC | | | M = 1.29 F = 2.26 $p = 0.0077$ | M = 6.28 F = 11.1 $p < 0.0001$ | M = 2.31 F = 4.08 $p < 0.0001$ |
| AN | | | | M = 5.28 F = 0.23 $p < 0.0001$ | M = 1.75 F = 3.07 $p = 0.0003$ |
| QN | | | | | M = 3.64 F = 6.43 $p < 0.0001$ |
| (b) Litter | | | | | |
| | AC | PC | AN | QN | PN |
| QC | M = 2.62 F = 4.61 $p < 0.000001$ | M = 3.41 F = 5.21 $p < 0.000001$ | M = 4.09 F = 7.12 $p < 0.000001$ | M = 5.9 F = 10.2 $p < 0.000001$ | M = 4.03 F = 5.77 $p < 0.000001$ |
| AC | | M = 3.63 F = 5.56 $p < 0.000001$ | M = 3.57 F = 6.21 $p < 0.000001$ | M = 6.50 F = 11.2 $p < 0.000001$ | M = 7.25 F = 10.38 $p < 0.000001$ |
| PC | | | M = 5.23 F = 7.93 $p < 0.000001$ | M = 7.29 F = 10.9 $p < 0.000001$ | M = 5.39 F = 6.89 $p < 0.000001$ |
| AN | | | | M = 3.19 F = 5.44104 $p < 0.000001$ | M = 3.24 F = 4.60059 $p < 0.000001$ |
| QN | | | | | M = 2.551809 F = 3.60 $p < 0.000001$ |

and Ca load to control plots. In litter, $\delta^{15}\text{N}$ is the strongest variable loading in fertilized plots with N in lower intensity. Contrarily, Fe and Mn load to control plots.

2.3.6 Drought Effects

All species have differences in control plots elemental composition between 2014 and 2015 in foliar tissue and respond similarly to drought. In foliar tissue, all macro-nutrients decrease

significantly in 2015 in all three studied species except C in *P. latifolia*, which have no significant differences. In foliar micro-nutrients, Mg and Cu decrease significantly in 2015 in all three species, Ca increases significantly in *P. latifolia* and *Q. ilex*; Cr and Ni decreases in *A. unedo* and *Q. ilex*; Mn and Sr increase significantly in all three species; Fe decreases in *A. unedo*, increases in *Q. ilex* and has no differences in *P. latifolia*; Zn decreases in *Q. ilex*; and Pb decreases in *A. unedo* and *P. latifolia* and has no differences in *Q. ilex* (Figure 2.7).

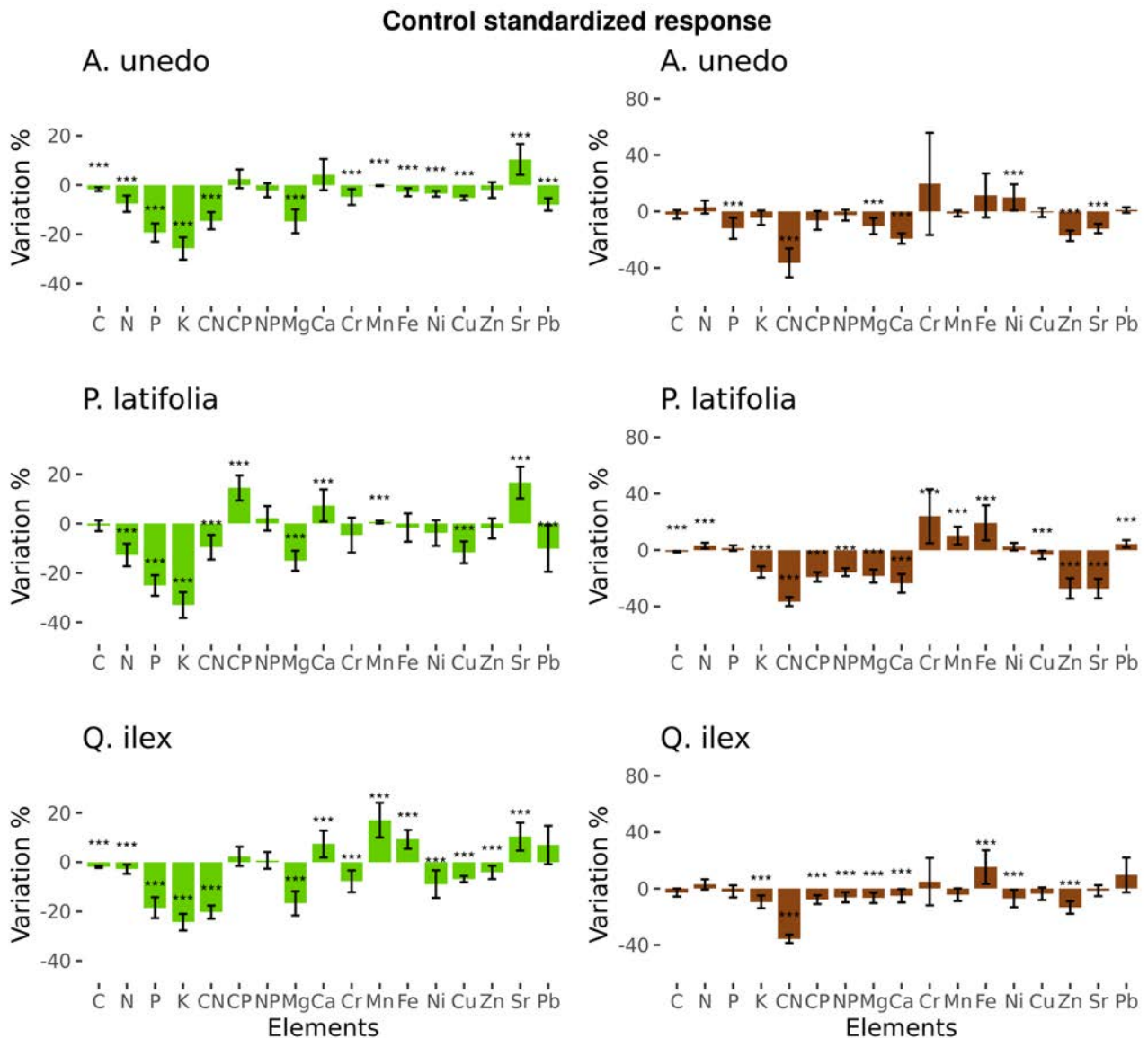


Figure 2.7 Foliar elemental composition; ratios and microelements (green); and litter elemental composition, ratios, and microelements (brown) by specie control plots data. Bars show the effect of drought through the values difference between 2015 and 2014. Values are relative to original values in 2014 so are expressed in % of change. *** = Significant differences from 0 according to t-test ($p < 0.05$). Figures with standard deviation.

2.4 Discussion

2.4.1 Interannual Differences

The overall macro-elements reduction and micro-elements variation in control plots between 2014 and 2015, as seen in Figure 2.7, are inherent effects of the exceptional drought in 2015. These year to year effects of drought are consistent with the drought experiments carried out in the same studied Mediterranean forest, where reduction of foliar N [50,51], P [52,53,54], and micro nutrients variation [55,56] were described to be associated to the drought treatment. This decrease of nutrient uptake associated to a decrease of soil water content gives evidence of the potential negative effects of drought by decreasing nutrient uptake capacity as well as the reinforced negative feedback of low nutrient concentration in leaves lowering the plant capacity to maintain an adequate water use efficiency [57]. Therefore, to correctly assess the effects of addition of N in this study, the exceptional 2015 arid conditions needs to be considered.

2.4.2 Macro-Elements

In contrast to our results, fertilization with N would be expected to increase total concentration of foliar N; however, we found evidence of an increase in foliar $\delta^{15}\text{N}$ that indicates rapid plant uptake of the applied fertilizer. The contrasting effects of added N on total foliar N concentration and foliar $\delta^{15}\text{N}$ may be explained by two hypotheses. First, added N is highly available, so although plants in the fertilized plots may have taken up similar amounts of total N from soil, there may have been greater uptake of the more easily available rich $\delta^{15}\text{N}$, and secondly, plants may have taken up greater amounts of N that was rapidly allocated to tissue other than leaf material, such as roots, to stimulate growth. Our results support these hypotheses, because we observed higher foliar concentrations of other elements following fertilization and higher leaf litter $\delta^{15}\text{N}$ concentrations that indicate decreases in leaf N resorption under increased N-availability.

2.4.3 Micro-Elements

In previous studies, N addition was related with a massive incorporation of NO_3^- into the system, causing cation losses by leaching and soil acidification [58,59,60]. In our study, leaching could have been generated by direct NO_3^- contact to the leaves, as described for acid rain impacts [61]. The decrease of foliar Cr in *Q. ilex* (Figure 2.2d) and Ni in *A.unedo* and *Q. ilex* (Figure 2.2e) is consistent with foliar leaching theory. In contrast, litter micro-elemental concentrations were not conclusively responding to N addition. The most remarkable response of micro-elements to N addition was the decrease of foliar Cr and Ni, which do not have a known biological benefit to plants and are considered pollutants. In this case, the short-term effects of N addition may be considered beneficial for species fitness, even though the size of effect varied among the three species (greatest in *Q. ilex*, moderate in *A. unedo*, and null in *P. latifolia*).

2.4.4 Nutrient Uptake

The isotope analysis showed rapid incorporation of N to the ecosystem following fertilization, where there were differences in foliar $\delta^{15}\text{N}$, but not of $\delta^{13}\text{C}$. Foliar uptake of N by *A. unedo* was

unaffected by treatment, whereas fertilization led to greater uptake in *P. latifolia* and *Q. ilex* (Figure 2.6), indicating possible interspecific imbalances in nutrient uptake under drought conditions.

In contrast, leaf litter $\delta^{15}\text{N}$ was consistently greater among the three species under N-fertilization, where the greater concentration in *A. unedo* and *Q. ilex* leaf litter than in leaf material highlights differences in resorption and indicates that, prior to the release of senescent leaves, *A. unedo* and *Q. ilex* reabsorbed smaller or negligible amounts of the applied N enriched with ^{15}N . There were no differences between $\delta^{15}\text{N}$ of *P. latifolia* leaf material and leaf litter, indicating unchanged levels of N resorption under N addition; this maintenance of greater nutrient use efficiency, even under drought conditions, than in *A. unedo* and *Q. ilex*, is consistent with previous studies that report its greater capacity for the maintenance of optimal function and growth under increasing drought than the other two species [44,62].

2.4.5 N limited Ecosystem

Our analyses showed rapid leaf and leaf litter elemental composition responses to N addition, through the increases in leaf and leaf litter $\delta^{15}\text{N}$, allowing us to conclude that this Mediterranean forest ecosystem is N limited, which is consistent with previous studies that showed decreases in foliar N in Mediterranean ecosystems during the 20th century, and associated them to increases in photosynthetic rates and C fixation, as well as growth capacity because of increasing atmospheric CO_2 concentrations [63] and with N limitation reported in the forests we studied [64]. Furthermore, the drought in 2015 also contributed to decreasing foliar N and increased even more the original plant N deficiency phenomenon already described in other studies [65].

These three dominant species of the holm oak forest ecosystem were characterized by smaller decreases in leaf and leaf litter concentrations of several elements under N-fertilization during the extreme high drought conditions of 2015. This rapid response of the mature ecosystem was remarkable and indicates that addition of N to an N-limited ecosystem improves nutrient retention and increases resilience of ecosystem function to drought stress.

Such drought recovery under N fertilization conditions could drive forest managers to consider generalized application of N-fertilization to stimulate C-uptake after droughts. However, N fertilization would be logistically complicated and would cause important N-cycle alterations, nutrient imbalances, decrease of diversity, and also can favor highly competitive invasive species replacing endemic ones. However, these impacts could be improved adding other nutrients such as P and K or even Fe, Mg, and sulfur. In this way, the fertilization probably would not generate important nutrient imbalances, and plants with better nutritional status could improve their water use efficiency. Our results can thus be useful for developing management strategies for Mediterranean forests under increasingly dry conditions projected for coming decades.

Long-term continuous N-fertilization experiments are needed to confirm the wider effects of increased availability of N on growth and stocks and changes in plant-soil cycling of nutrient elements of this Mediterranean ecosystem, including its dominant species. It is likely that sustained N deposition would decrease N limitation and its associated effects, but elements that derive from the bedrock, such as P or K, will increasingly become leached and limiting [5,6].

2.4.6 Biogeochemical Niche Differentiation

The GDA analysis showed a clear differentiation in element concentration among the three studied species and with treatment. This differentiation suggests a particular chemical identity per species as well as a particular species response to the same drivers. This chemical differentiation among species is supported by biogeochemical niche hypothesis [33,66,67]. Biogeochemical niche hypothesis is a derivation of the classic niche theory, which assigns to each species a specific position into a multidimensional space of traits, environmental requirements, and “needs”. Biogeochemical niche hypothesis aims to synthesize all these variables into an easily quantifiable multidimensional space of the elemental composition with the “n-dimensional” axes being the concentrations of the different bioelements. This chemical divergence responds to the necessity of avoiding niche overlap that has been driven through evolutive genetic selection and the environmental conditions where the species has been developed.

2.4.7 Species Differences in Response to N Fertilization

A. unedo, *P. latifolia*, and *Q. ilex* coexist at the same stage of ecological succession in the Mediterranean forest ecosystem [42,68], presenting different intraspecific tolerance to different extreme conditions. Despite *P. latifolia* and *Q. ilex* sharing the same strategy to avoid water loss during drought, *P. latifolia* has a higher tolerance, a more efficient recovery to drought [69], and high temperatures than *Q. ilex* [44]. At the same time, *P. latifolia* has lower tolerance to low winter temperatures than *Q. ilex* [69]. Also, previous studies of impacts of long-term drought have shown that *Q. ilex* and *A. unedo* are mostly affected through changes in C and nutrient storage, whereas *P. latifolia* tends to remain unaffected [44,62]. Despite all three species sharing a dimorphic root system, enabling them to access different water level sources [70], these differences seem to be explained through xylem vessels width. *Q. ilex* and *A. unedo* have wider xylem vessels, which allow them to transport greater amounts of sap under well-watered conditions, but makes them more susceptible to embolism under drought conditions [71]. Also, *Q. ilex* has higher capacity to exclude potential toxic ions than *A. unedo* [72].

The intraspecific different responses to N-fertilization observed in this study are consequent with the different species tolerance to drought conditions, where *P. latifolia* is the most drought-resistant species and also the one best at assimilating better N addition. As long as the fertilizer is sprayed to the leaves, its absorption is directly related to stomatal opening. Thus,

better watered species can afford longer stomatal apertures and consequently, higher N absorption [73]. This different N absorption among species may lead to changes in species composition in a drier and N fertilized environment as projected for these Mediterranean ecosystems for the next decades [9,28,74]. Under extreme drought conditions, *P. latifolia* could overtake *Q. ilex* dominance [65].

2.5 Conclusions

We found that added N was rapidly utilized in the three studied species, consistent with previous observations of N limitation in this area; this effect was remarkable, given the exceptional arid conditions during the study. Species responses to sudden increases in N availability varied, where *A. unedo* was unaffected and direction of responses in *P. latifolia* and *Q. ilex* were similar, albeit with contrasting magnitude. The macro-element concentrations were more sensitive in *P. latifolia* than in the other two species. *P. latifolia* was the species that took best advantage of the N fertilization and the species less affected by drought. The chemical composition of the three study species before and after N-fertilization follows the biogeochemical niche hypothesis, where differences in response may trigger changes in species coexistence and community composition.

Supplementary Materials

The following are available online at: <https://www.mdpi.com/article/10.3390/f12050605/s1>. Table S1: Results of the foliar mixed models. Table S2: Results of the litter mixed models. Table S3: Results of the reabsorption mixed models. Table S4: Results of the isotopes mixed models.

Author Contributions

Conceptualization, J.S. and J.P.; Data curation, H.V., R.O. and P.R.F.; Formal analysis, H.V. and J.S.; Methodology, H.V., R.O. and P.R.F.; Project administration, J.P.; Resources, J.P.; Supervision, J.S., J.P.; Visualization, H.V. and J.S.; Writing—original draft, H.V.; Writing—review & editing, H.V., J.S., R.O., J.P. All authors have read and agreed to the published version of the manuscript.

Funding

The authors would like to acknowledge the financial support from the Spanish government grant PID2019-110521GB-I00, the Fundación Areces grant ELEMENTAL-CLIMATE-2021, the Catalan Government grant SGR-2017-1005 and the European Research Council Synergy grant ERC-SyG-2013-610028 IMBALANCE-P.

Data Availability Statement

The data presented in this study are available on request from the corresponding author. The data are not publicly available due to the project is not finished yet.

Conflicts of Interest

The authors declare no conflict of interest.

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3

Foliar elemental composition and weather as drivers of defoliation rate in European forests

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Abstract

Defoliation is a standard, easily acquirable and widely used variable to assess forest health and vitality. However, its relationship with foliar elemental composition remains uncertain. Using inventory from the ICP Forests programme, we examined the relationships between trends in European defoliation, foliar elemental composition, and environmental factors in Europe as a whole and by latitudinal fringes. We observed a significant trend for increasing defoliation in South and Central Europe, but a slight decreasing tendency in the boreal fringe. Gymnosperms had higher defoliation trends than angiosperms. All studied species showed evidence of increased defoliation over the last decades, excepting *Quercus ilex*, which had decreased defoliation, and *Abies alba*, which was non-significant. Foliar elemental composition was associated with defoliation in European forests, with a clear inverse correlation with foliar N, and additional significant relationships found between defoliation and foliar P, foliar Ca, and foliar S. Climatic legacy, the distribution of precipitation over time, and different environmental pressures also played a role in defoliation, depending on the studied latitudinal fringe.

3.1 Introduction

Defoliation data are broadly used as an indicator of forest health and vitality (De Marco A. et al., 2014; Vacek et al., 2015; Gea-Izquierdo et al., 2019; Gottardini et al. 2020), probably due to its long history of observations (Menzel and Dose, 2005) and effortless data collection (Vliet et al., 2003). Defoliation is a generalist indicator (Ferretti, 1997, 1998) that is particularly related to temperature (Linkosalo, 1999; Peñuelas J. et al., 2004; Lebourgeois et al., 2010; De la Cruz et al., 2014), but is also related to soil water content (Peñuelas et al., 2004; Carnicer et al., 2011), photoperiod (Vitasse and Basler, 2013), rainfall (Peñuelas et al., 2004) and air pollution (Ferretti and Fischer, 2013). Consequently, it has been shown to be efficient for assessing the biological responses of forests to climate change (Menzel et al., 2006; Lebourgeois et al., 2010).

Documentation of the effects of climate change effects in Europe is growing, with consequences that include defoliation and drought-induced mortality in the central and semi-arid areas (Allen et al., 2010; de Vries and Posch, 2011; De Marco et al., 2014), long-term changes in the species compositions of terrestrial ecosystems (Mueller et al., 2005; Andreu et al., 2007; van Mantgem et al., 2009; Allen et al., 2010; Carnicer et al., 2011; Hanewinkel et al., 2013) and increased plant growth associated with warming, especially in the central and northern areas (Bussotti et al., 2014; Kauppi et al., 2014). Also, N deposition in Europe has increased from 2.8 kg ha⁻¹a⁻¹ in 1900 to 6.6 Kg N ha⁻¹y⁻¹ by 2018 through human activities (Engardt et al., 2017; Schmitz et al., 2019), with 62% of Europe considered to be at risk of eutrophication (Slootweg et al., 2015). This increase is associated with changes in soil condition at the European scale (Wallace et al., 2007; Phoenix et al., 2012), leading to substantial impacts on forest tree growth (Thomas et al., 2010) and nutrient imbalances (Blanes et al., 2013; de Vries et al., 2014). Even though N deposition intensity has decreased in the last 20 to 30 years in some areas of Europe, the long-term accumulation of N in soils remains a concern (Schmitz et al., 2019).

Shifts in soil nutrient availability and its effects on the foliar elemental composition of trees is another important factors related to forest health and vitality. The availability of elements like nitrogen, phosphorus, and potassium in the plant-soil system can substantially modify the impacts of global climate change (Jiang et al., 2017; Sardans & Peñuelas, 2015; Peñuelas et al., 2017, 2020; Sun et al., 2017; Wang et al., 2017; 2018; Terrer et al., 2019) and limit the global capacity for C fixation in the face of rising atmospheric CO₂ concentrations (Vicca et al., 2012; Fernández-Martínez et al., 2014; Zhu et al., 2016; Wang et al 2020). Thus, we expect that soil nutrient concentrations should interact with the effects of warming and drought to affect the defoliation status of forests in some European regions (Eastaugh et al., 2011; Zhang et al., 2014; Castagneri et al., 2015; Zimmermann et al., 2015; Vallicrosa et al., 2021). In this regard, it has been reported that the amounts of foliar elements, including N, P, K, and S, have decreased between 5% and 11% over the last 30 years in European forests, likely because of the effects of increasing atmospheric CO₂ concentrations and climate change (Peñuelas et al., 2020).

Given the above, our goal was to investigate the roles of foliar elemental composition and environmental factors on defoliation and assess tree vitality and drivers of health in (i) forest cover over the whole of Europe; (ii) angiosperms versus gymnosperms; (iii) the European forest cover, subdivided by boreal, temperate, and Mediterranean latitudes; and (iv) the most representative European forest species.

3.2 Methods

3.2.1 Data acquisition

We selected the dataset from International Co-operative Programme on Assessment and Monitoring of Air Pollution Effects on Forests (ICP Forests) (<http://icp-forests.net/>) that contained

both plot defoliation and plot foliar elemental composition data. The study dataset included data from 782 plots collected between 1992 and 2015. These data were collected for each plot repeatedly but irregularly over the sampled years, allowing for temporal analyses. Using geographical coordinates, we crossed the defoliation and elemental composition database with climatic gridded data from Climatic Research Unit (CRU) (Harris et al., 2020), the Standardized Precipitation-Evapotranspiration Index (SPEI), which is inverse to the aridity index and is used as a proxy of available water; soil data from the Land-Atmosphere Interaction Research Group at Sun Yat-sen University (Shangguan et al., 2014), and deposition data from CRU (Table S3.1). In addition to using the general database, we split the data on angiosperms and gymnosperms according to species, and by latitude, corresponding to the Mediterranean (latitude < 46°), temperate (from 46 to 58° latitude), and boreal fringes (latitude > 58°). Furthermore, the most commonly sampled species were selected for analysis (defined as > 40 individuals, and present in > 5 plots).

3.2.2 Maps generation and regressions

Using repeated defoliation measurements in the general database that were collected over multiple years, we calculated the defoliation trend by plot and the corresponding significance. We plotted the values of the ICP plots containing defoliation and elemental composition data onto a European map using the *ggspatial* package in R (Dunnington, 2021). We used the same procedure to similarly plot defoliation trends of angiosperms, gymnosperms, and for each focal species. The whole Europe, latitudinal, angiosperm, gymnosperm and by-species defoliation trends were calculated by Theil-Sen regression in the *mblm* package in R (Komsta, 2019) using the corresponding dataset following the Defoliation ~ year form. Comparison of the slopes for angiosperms and gymnosperms was carried out using a Chow test in the R package *gap* (Zhao, 2021).

3.2.3 Data analysis and model creation

To select the most meaningful variables, we built univariate models using the complete database, and for each latitudinal group, the division between gymnosperms and angiosperms, and a subset of individual species. The models were built using the *lme* function in the *nlme* R package (Pinheiro et al., 2020) with the form Defoliation ~ variable, and country, plot, and species included as random factors. We used the temporal autocorrelation *corCAR1* in year, country, plot, and species with a value of 0.2. The significant variables for each subset (*P*-value < 0.05) were reanalyzed with the *lme* function and the following form: Defoliation ~ significant variable 1 + significant variable 2..., with country, plot, and species included as random factors. A *corCAR1* temporal autocorrelation was employed following year, country, plot, and species forms. The models built with significant variables were subjected to the *dredge* function of *MuMIn* R package (Barton, 2020) for model selection using AIC optimization.

3.3 Results

3.3.1 Description

We found a temporal trend toward increasing defoliation in European forests, with defoliation % increasing by 0.38% yearly over the study period (Figure 3.1). There was a slight but significant decrease in defoliation in the Northern latitudes (Figure 3.2a), with defoliation decreasing by -0.004% each year from 1995 to 2015 (Figure 3.2a). By contrast, increasing defoliation tendencies were observed in Central and Mediterranean latitudes (0.501% and 0.272%, respectively) with the central latitudes being most strongly affected by defoliation (Figure 3.2b and Figure 3.2c).

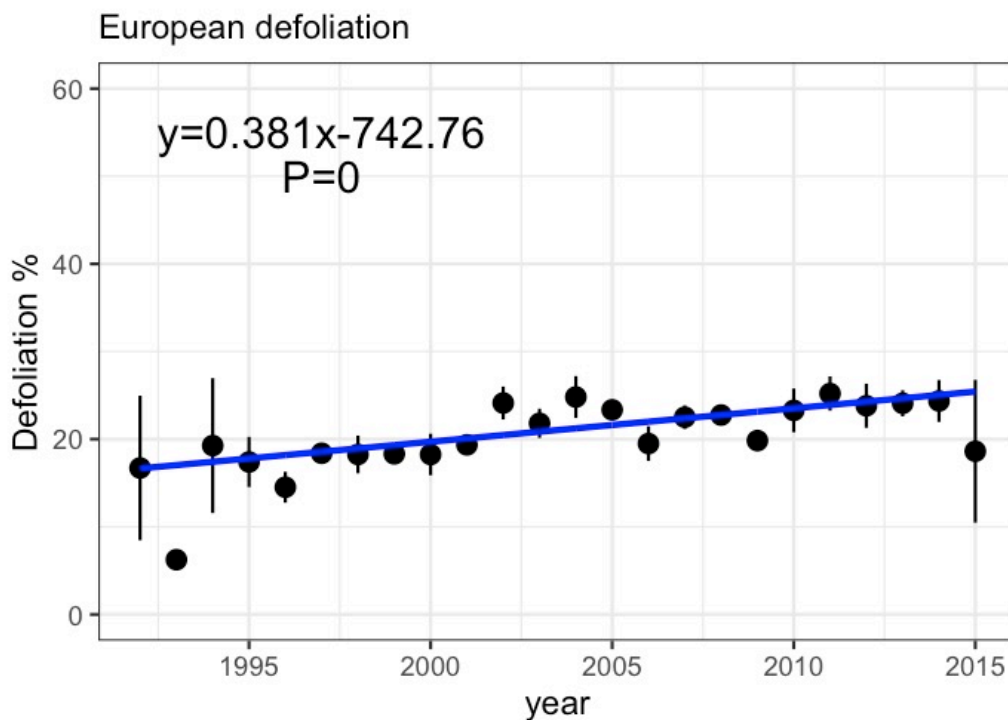


Figure 3.1 Defoliation trend in % defoliation for European plots from 1992 to 2015. The data summarize the defoliation of 3,869 individual trees. P=0 means < 0.0009. Bars represent the point range for each year.

Comparing defoliation rates between angiosperms and gymnosperms overall, or by latitudinal groups, showed that in all cases, gymnosperms had higher rates of defoliation than angiosperms (Figure 3.3). The results of the Chow test showed that these differences between angiosperms and gymnosperms were statistically different in all cases (Table S3.2).

Species-specific descriptive analyses revealed significantly increased defoliation ($p < 0.05$) in *Fagus sylvatica* (0.28% by year), *Picea abies* (0.58% by year), *Pinus pinaster* (0.71% by year), *Pinus sylvestris* (0.18% by year), *Quercus cerris* (0.25% by year), *Quercus petraea* (0.47% by year), and *Quercus robur* (0.35% by year). A significant decreasing trend in defoliation was found for *Quercus ilex* (-0.61% a year), and no significant trend was observed for *Abies alba* (Figure 3.3).

3. FOLIAR ELEMENTAL COMPOSITION AND WEATHER AS DRIVERS OF DEFOLIATION RATE IN EUROPEAN FORESTS

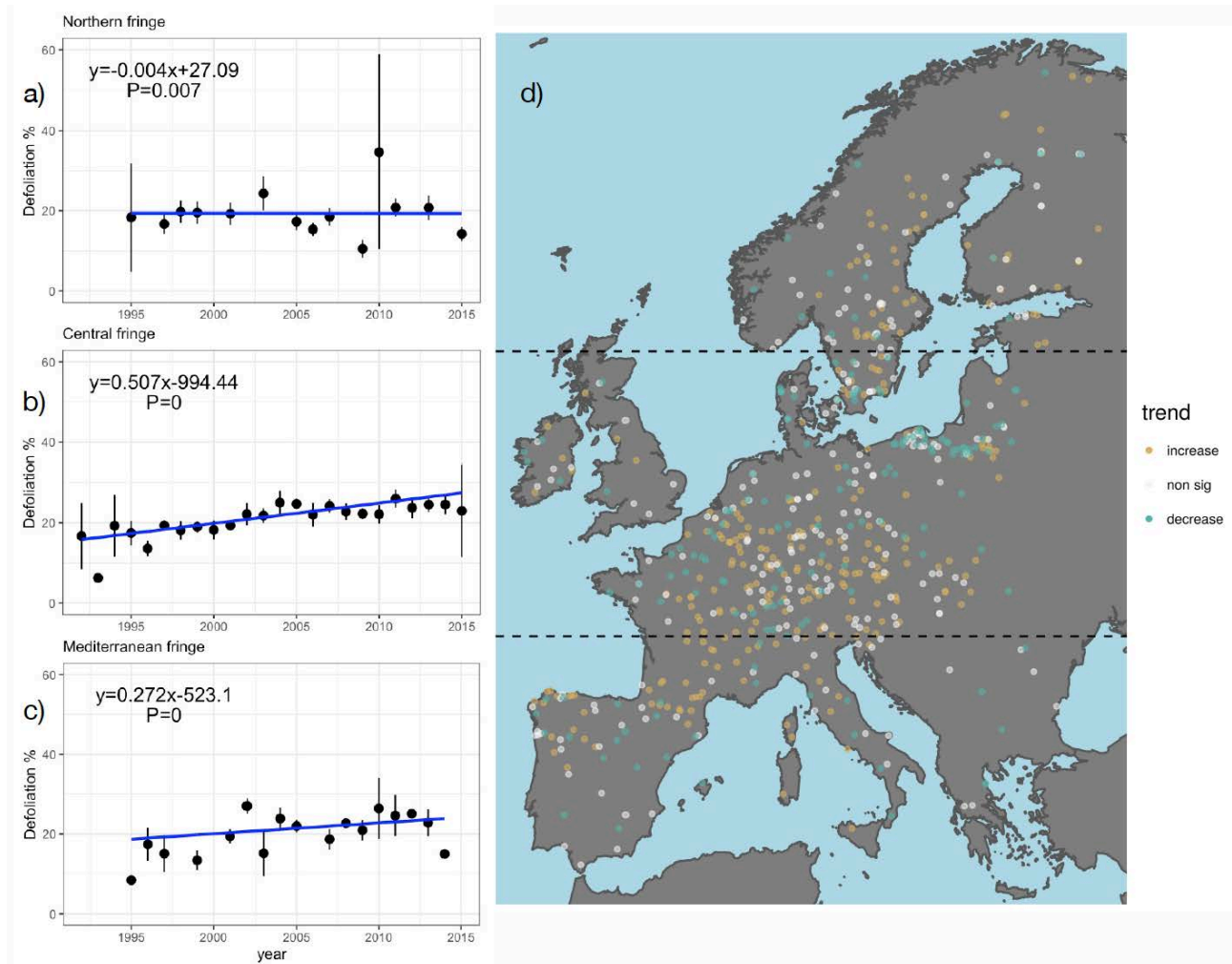


Figure 3.2. Relationship between defoliation % and year in a) the Northern fringe, b) the Central fringe, c) the Mediterranean fringe. d) Map shows each sampled plot coded according to whether defoliation during the study period showed a significantly increasing trend (orange), significantly decreasing trend (green), or non-significant trend (white). The dashed lines indicates the boundaries between the three latitudinal fringes $P=0$ means $P < 0.0009$.

3.3.2 Global and latitudinal models

According to our model (Table 3.1), European defoliation was directly correlated with spring precipitation, spring temperature and nitrogen oxide deposition; it was also inversely correlated with sulphur oxide deposition and annual SPEI average. Based on our models, in latitudes higher than 58° the main drivers of defoliation were spring precipitation and spring temperature in the previous year, which were directly correlated with defoliation, whereas foliar nitrogen concentration was inversely correlated with defoliation. At the central latitudes (from 46° to 58°), the best model showed that defoliation was directly correlated with spring temperature and summer SPEI, and inversely correlated with precipitation and temperature in the previous year and sulfur oxide deposition. At the Mediterranean latitudes ($< 46^\circ$), the main driver of defoliation was the mean precipitation in spring, which, in contrast to the northern latitudes, was inversely correlated with defoliation.

3. FOLIAR ELEMENTAL COMPOSITION AND WEATHER AS DRIVERS OF DEFOLIATION RATE IN EUROPEAN FORESTS

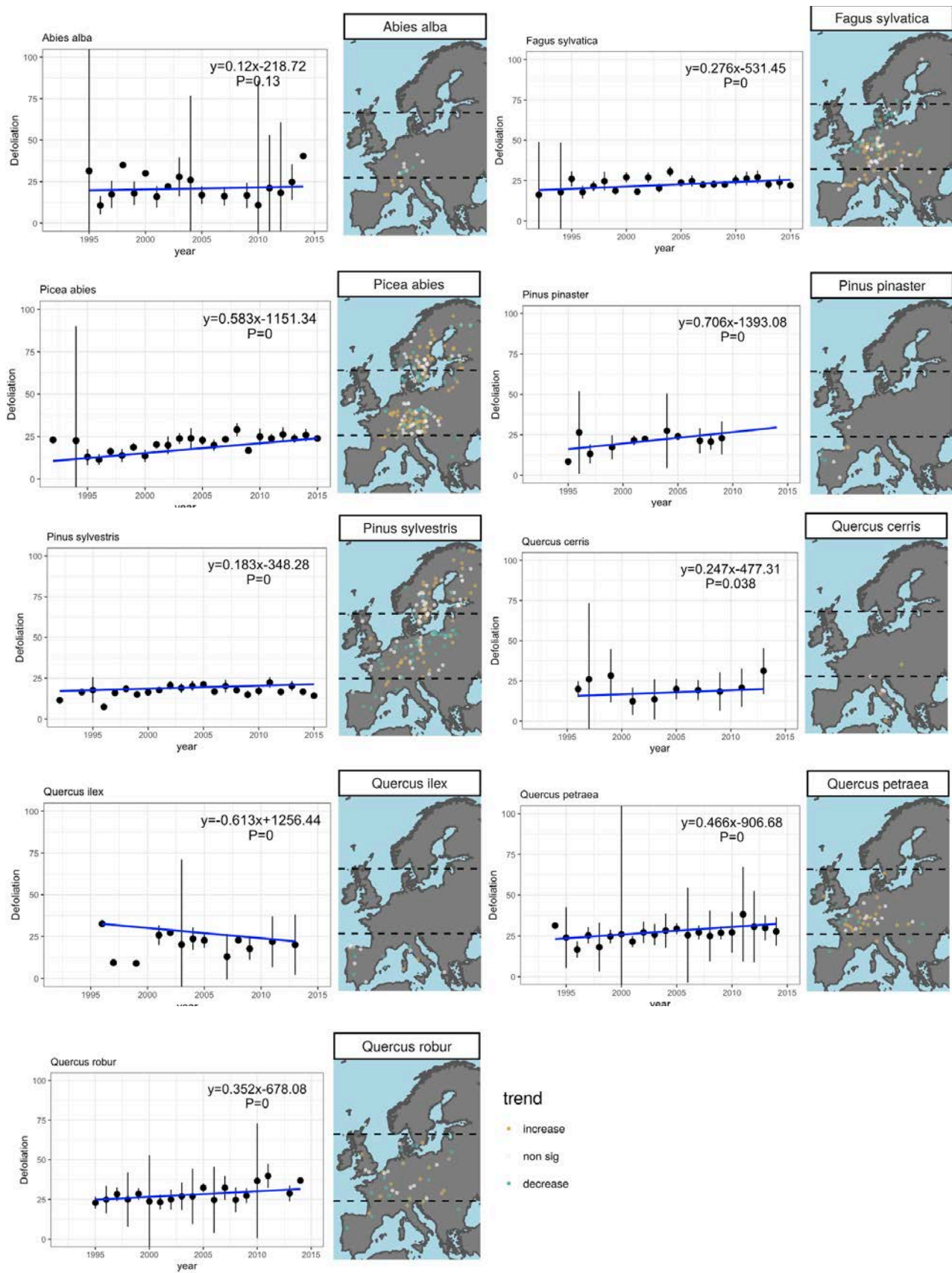


Figure 3.3. Trends and distribution of data by species, for each study species with $n > 40$ and plots > 5 . Equation and p-value provided for each regression. Bars represent the point range for each year. $P=0$ means $P < 0.0009$

3. FOLIAR ELEMENTAL COMPOSITION AND WEATHER AS DRIVERS OF DEFOLIATION RATE IN EUROPEAN FORESTS

Table 3.1. Summary of mixed model results for defoliation % across Europe, and separated by latitudinal fringe. Coefficients and p-values are shown for each variable.

| All Europe (n=3,869) | Intercept | MAP spring | MAT spring | N dep. ox. | S ox. | SPEI12 AnnualAvg |
|--|------------------|-------------------|------------------------|-------------------|--------------|-------------------------|
| Value | 5.492 | 0.043 | 0.736 | 0.003 | -0.002 | -0.648 |
| p-value | 0.003 | 0.000 | 0.000 | 0.000 | 0.001 | 0.000 |
| Nothern Europe (n=464) | Intercept | MAP spring | MAT spring ant. | foliar N | | |
| Value | 11.008 | 0.049 | 1.109 | -0.772 | | |
| p-value | 0.008 | 0.027 | 0.000 | 0.001 | | |
| Central Europe (n=2,720) | Intercept | MAP ant. | MAT ant. | MAT spring | S ox. | SPEI01 SummerAvg |
| Value | 19.686 | -0.040 | -0.752 | 0.885 | -0.005 | 0.521 |
| p-value | 0.000 | 0.000 | 0.000 | 0.000 | 0.000 | 0.000 |
| Mediterranean latitudes (n=685) | Intercept | MAP spring | | | | |
| Value | 23.075 | -0.038 | | | | |
| p-value | 0.000 | 0.022 | | | | |

3.3.3 Angiosperm and gymnosperm defoliation models

We found substantial differences in the variables that explained defoliation in angiosperms versus gymnosperms (Table 3.2). Defoliation in angiosperms was directly related to mean spring temperature, and by annual SPEI with a window of 3 months, and it was inversely correlated with mean winter precipitation, mean annual temperature of the previous year, sulfur oxide deposition, and SPEI annual average with a window of 12 months. In gymnosperms, defoliation was directly related to thermal amplitude, mean spring precipitation, mean spring temperature of the previous year, and N oxide deposition. It was negatively related to foliar N and annual SPEI with a 12-months window.

Table 3.2. Summary of mixed model results for defoliation % for angiosperms and gymnosperms. Coefficients and p-value are shown for each variable.

| Angiosperms (n=1,401) | Intercept | MAP winter | MAT ant. | MAT spring | S ox. | SPEI 03 annual avg. | SPEI 12 annual avg. |
|------------------------------|------------------|--------------------------|-------------------|------------------------|-----------------|----------------------------|----------------------------|
| Value | 17.893 | -0.033 | -1.240 | 1.361 | -0.002 | 1.109 | -0.997 |
| P-value | 0.000 | 0.013 | 0.000 | 0.000 | 0.009 | 0.000 | 0.001 |
| Gimnosperms (n=2,338) | Intercept | Thermal amplitude | MAP spring | MAT spring ant. | Foliar N | N dep. ox. | SPEI 12 annual avg. |
| Value | 2.266 | 1.283 | 0.046 | 0.311 | -0.305 | 0.004 | -0.354 |
| P-value | 0.476 | 0.000 | 0.000 | 0.021 | 0.000 | 0.001 | 0.015 |

3.3.4 Defoliation trends by species

In species-specific models we found that defoliation in *Abies alba* was inversely correlated with the mean temperature of the previous year. In *Fagus sylvatica*, defoliation was inversely correlated

3. FOLIAR ELEMENTAL COMPOSITION AND WEATHER AS DRIVERS OF DEFOLIATION RATE IN EUROPEAN FORESTS

Table 3.3 Summary of mixed model results for defoliation % by species, where n > 40 individuals and the number of plots > 5. Variable coefficients and p-values are shown.

| | | | | | | | | |
|------------------------------------|------------------|------------------------|------------------------|----------------------------|-----------------|----------------------------|---------------|----------------------------|
| Abies alba (n=122) | Intercept | MAT ant. | | | | | | |
| Value | 32.823 | -1.669 | | | | | | |
| p-value | 0.000 | 0.029 | | | | | | |
| Fagus sylvatica (n=723) | Intercept | MAP winter | MAT ant | Foliar S | | | | |
| Value | 32.457 | -0.037 | -0.523 | -2.615 | | | | |
| p-value | 0.000 | 0.011 | 0.049 | 0.021 | | | | |
| Picea abies (n=1,162) | Intercept | Foliar Ca | MAP spring | MAT spring ant. | Foliar N | SPEI 12 annual avg. | | |
| Value | 13.116 | -0.335 | 0.054 | 0.546 | -0.288 | -0.755 | | |
| p-value | 0.000 | 0.050 | 0.000 | 0.008 | 0.045 | 0.001 | | |
| Pinus pinaster (n=67) | Intercept | MAT | Soil Org. C | | | | | |
| Value | 72.990 | -4.186 | 0.985 | | | | | |
| p-value | 0.000 | 0.000 | 0.004 | | | | | |
| Pinus sylvestris (n=790) | Intercept | MAP spring | MAT ant. | MAT spring | Foliar P | pH difference | pH H2O | SPEI 12 annual avg. |
| Value | -6.060 | 0.054 | -0.452 | 0.960 | 3.018 | -3.535 | 3.375 | -0.711 |
| p-value | 0.164 | 0.000 | 0.029 | 0.000 | 0.010 | 0.011 | 0.009 | 0.002 |
| Quercus cerris (n=43) | Intercept | pH difference | Foliar S | SPEI 01 annual avg. | | | | |
| Value | 44.139 | -0.519 | 5.224 | 1.541 | | | | |
| p-value | 0.011 | 0.063 | 0.021 | 0.030 | | | | |
| Quercus ilex (n=85) | Intercept | Foliar S | | | | | | |
| Value | 10.600 | 10.783 | | | | | | |
| p-value | 0.029 | 0.007 | | | | | | |
| Quercus petraea (n=275) | Intercept | MAT spring | MAT winter ant. | Foliar N | S ox. | | | |
| Value | 8.432 | 2.151 | -1.321 | -0.356 | -0.005 | | | |
| p-value | 0.433 | 0.000 | 0.002 | 0.072 | 0.003 | | | |
| Quercus robur (n=216) | Intercept | MAT winter ant. | | | | | | |
| Value | 31.848 | -0.893 | | | | | | |
| p-value | 0.000 | 0.013 | | | | | | |

with the mean precipitation in winter, mean temperature of the previous year, and foliar sulfur. Defoliation in *Picea abies* was directly correlated with the mean spring precipitation and mean spring temperature of the previous year, and was inversely correlated with foliar Ca, foliar N, and

yearly SPEI. In *Pinus pinaster*, defoliation was directly correlated with soil carbon and inversely correlated with mean annual temperature. Defoliation in *Pinus sylvestris* was directly correlated with mean spring precipitation, mean spring temperature, foliar P and soil pH, and inversely correlated with the mean annual temperature of previous year, the difference in pH calculated in water and in CaCl, which describes soil base saturation, and annual SPEI. *Quercus cerris* defoliation correlated directly with foliar sulfur and SPEI, and was inversely correlated with pH difference (pH in H₂O - pH in CaCl). *Quercus ilex* correlated directly only with foliar S. Defoliation in *Quercus petraea* was directly correlated with the mean spring temperature, and was inversely correlated with the mean temperature of the previous winter, foliar N, and sulfur oxide deposition. Finally, *Quercus robur* defoliation was inversely correlated with the mean temperature of the previous winter (Table 3.3).

3.4 Discussion

3.4.1 Effects of foliar elemental composition on defoliation

Significant relationships between foliar elemental composition variables and defoliation in models for six from the nine analyzed species, and in the northern latitude fringe and in gymnosperms, highlight the importance of considering foliar elemental composition in attempts to understand and predict defoliation in European forests. According to our results for gymnosperms, *Picea abies* and *Quercus petraea* models, higher levels of foliar N were associated with low defoliation and could be considered an indicator of forest health in relative terms. Nitrogen is a crucial element for protein biosynthesis, light capture, and water-use efficiency, and thus it is directly linked to photosynthesis and foliar biomass (Field et al., 1983; Poorter et al., 2012; Evans and Clarke, 2019). N deficiency or decrease could contribute to the defoliation process. Furthermore, the detection of an inverse relationship between foliar N concentration and defoliation in the northern fringe is consistent with other studies showing that nitrogen supply limits plant production and growth in boreal forests (Högberg et al., 2017). In this case, foliar nitrogen is again suggested as a good indicator of forest health. In a nitrogen-deficient environment, an increase of nitrogen prevents defoliation in the whole fringe.

Another interesting finding was the relationship between defoliation and foliar S, which was surprising due to the different directions observed (i.e., it was directly correlated with defoliation in *Quercus ilex* and *Quercus cerris*, but and inversely correlated with defoliation in *Fagus sylvatica*). S is an important basic protein constituent that is necessary for plant growth and development. Over the last few decades it has grown in importance because of a high amount of SO_x deposition in Europe, and associated plant toxicity (Pfanzen and Beyschlag, 1993). However, due to environmental regulations, SO_x deposition started decreasing in the 1970s (Engardt et al., 2017). Our results suggest that defoliation increases with sulfur in the *Quercus* genera, which is

associated with sulfur toxicity by deposition that would have been absorbed. By contrast, *Fagus* appears to have a sulfur deficit, which causes a decrease in photosynthesis (Terry, 1976). This fact could be underlying the observed increase in defoliation in *F. sylvatica* over the study period.

P was present in the defoliation models for *Pinus sylvestris*. P is a basic requirement for plant growth because it is a component of genetic, metabolic, structural, and regulatory molecules, and frequently cannot be substituted by any other elements (White and Hammond, 2008). We would expect an inverse relationship between P and defoliation, given that *P. sylvestris* a fast-growing species that requires a large amount of P to rapidly build its structure. However, in our model, the relationship between foliar P and defoliation was direct. One possible explanation for this finding is seasonality. In other studies, seasonality has been shown to be related to higher levels of foliar P (Vallicrosa et al., 2021), where high seasonality and changing environmental conditions impair different tissues, leading to defoliation and favoring morphological and physiological adaptations. Consequently, in such changing environments the repair and generation of plant tissue may require higher levels of P. However, further research is needed to test this hypothesis. This explanation would also correspond with the extensive distribution range of *Pinus sylvestris* (Durrant et al., 2016), throughout which the species is subjected to very different pressures.

Defoliation in *Picea abies* had a negative relationship with foliar Ca, an essential plant nutrient that plays several structural roles in the cell wall and membranes. It is also a counter-cation for inorganic and organic anions in the vacuole. In addition, the Ca²⁺ concentration is also an obligate intracellular messenger, coordinating responses to numerous developmental cues and environmental challenges (White and Broadley, 2003). On this basis, it is reasonable to expect higher rates defoliation in the presence of a Ca²⁺ deficit.

The increase of atmospheric CO₂ has been related to a dilution process of foliar nutrients (Peñuelas et al., 2020). On this regard, if atmospheric CO₂ levels keep increasing as is predicted, the dilution of foliar nutrients would probably keep increasing proportionally. Consequently, the decrease of foliar nutrients such as N, P, Ca and S associated to climate change would also contribute to the defoliation increase of European forests.

3.4.2 Environmental effects on defoliation

Aside from foliar elemental composition, environmental conditions play a crucial role in understanding defoliation in European forests. We found relationships between defoliation, water availability, and deposition in the general model for all Europe. Precipitation in the spring increases defoliation, presumably due to nutrient leaching or/and light limitation due to clouds (Reinhardt and Smith, 2008). Aridity or 'less water availability' during the year also increases defoliation, possibly through embolisms in extreme conditions or simply poorer plant functioning. Thus,

defoliation associated with aridity could increase in the following years if the frequency and severity of droughts events increases in the Northern hemisphere, as is predicted with climate change (Meehk & Tebaldi, 2004; IPCC 2007; Van Oijen et al., 2014; Spinoni et al., 2017).

Nitrogen and sulfur deposition are associated with anthropic atmosphere contamination and are responsible for many ecological effects (Bobbink et al., 2013). Despite the fact that N and S deposition decreased in the recent decades (Engardt et al., 2017), nitrogen deposition still affects European forests, which can be seen as increasing defoliation in the general defoliation model (Table 3.1) and the gymnosperms defoliation model (Table 3.2). With respect to S deposition, this general negative correlation with deposition results from the coincidence of decreasing S deposition over recent decades with an almost generalized increase in defoliation.

The temporal range and homogeneity of precipitation also appeared to influence defoliation. In some of the models, such as the all-Europe model, central Europe model, and angiosperm, gymnosperm, *Picea abies*, and *Pinus sylvestris* models, we observed that although precipitation is crucial to avoid defoliation, intense periods of precipitation or torrential rains can provoke defoliation. Thus, a proper water income for the prevention of defoliation would be one that is continuous and homogenized. This hypothesis contrasts with current predictions of future precipitation patterns in Europe; models such as REMO 5.1 and the Intergovernmental Panel on Climate Change (IPCC) report predict increases in torrential rains in Europe due to climate change (Semmler and Jacob, 2004; IPCC, 2021). If these predictions are accurate, we would expect an increase in defoliation in Europe due to the concentration of precipitation. Indeed, this is already occurring.

The latitudinal fringe models (Figure 3.1) are important for accurately elucidating European defoliation responses to various pressures, because different pressures dominate in each latitudinal fringe that in turn differently affect forest defoliation and health. The most flagrant example is precipitation. In the northern and central fringes, precipitation in the spring increases defoliation but it decreases defoliation in the Mediterranean fringe. We attribute this result to the difference in water availability between latitudes, with water being more limiting in the Mediterranean. Where water is abundant, an increase of precipitation can decrease photosynthetic active radiation and favor leaching of the available nutrients, which hinders vegetal development. However, if water is limiting an increase in water income can be crucial to sprout. This effect has become even more important over recent decades, where droughts and aridity in the Mediterranean fringe have increased, with consequences for vegetation (Carnicer et al., 2011; Peñuelas et al., 2017).

The influence of short-term climatic legacies on defoliation is also remarkable. As seen in the latitudinal, angiosperm and gymnosperm, and species-specific models, the amount of

precipitation and temperature in the previous year commonly explains defoliation. The importance of climatic legacy on growth has been detected in the United States (Peltier et al., 2018) and Spain (Marqués et al., 2021). In this study, we also detected an effect of climatic legacy on defoliation at the European scale, by species and by latitudinal European region. Related to this finding, some seasons were found to be more crucial than others in determining defoliation, based on recurrence in the models. The most common seasons that appeared in our defoliation models were spring, followed by winter. In a seasonally changing climate such as that in Europe, which experiences four seasons over most of the continent, spring is the growing and sprout season for most species, especially deciduous ones. It seems reasonable that climatic variation in this season would determine yearly production.

3.4.3 Differences between defoliation rates

Previous studies using European defoliation record data from 1990 to 2007 showed an increase in defoliation only in the Mediterranean fringe, with the boreal and central fringes showing stable defoliation rates of approximately 15% and 20% respectively (Carnicer et al., 2011). In this study that includes data collected until 2015, we found that central Europe experienced higher rates of defoliation, followed by Mediterranean forests. It is likely that the drought effects of climate change are better tolerated in the Mediterranean fringe, which has historically been resistant to hot and dry conditions due to its climatic characteristics. By contrast, forests at central European latitudes, which evolved under more humid conditions, would suffer more severely during periods of drought. This hypothesis is consistent with the results of our central European latitude model (Table 3.1), which showed that reduced precipitation and the temperature of the last year increased defoliation.

The differences in defoliation between angiosperms and gymnosperms that we found were also remarkable. In all cases, defoliation levels in gymnosperms were higher. According to the presented models (Table 3.2), only water availability, expressed as SPEI12 annual Avg., affect both angiosperms and gymnosperms being more intense in angiosperms (-0.997) than in gymnosperms (-0.354). Despite the intensity of each factor affecting each group, differences between gymnosperms and angiosperms in defoliation reflect their physiology and internal functioning. The differences between gymnosperms and angiosperms have been of previous concern to the scientific community (Carnicer et al., 2013). Recently, it was concluded that angiosperms have a lower resistance to drought (low capacity to reduce the impact of initial drought) and gymnosperms show reduced recovery (to pre-drought level) (DeSoto et al., 2020). This difference is important because one extremely adverse year could have a serious effect on angiosperms defoliation, but only in that year. By contrast, the effects would last several years in gymnosperms, which could lead to the progressive accumulation of defoliation effects.

3.5 Final remarks

Defoliation has increased overall in European forests over the last decades but has decreased slightly at the northern latitudes. Defoliation in Europe is expected to keep increasing due to the predicted climate change conditions. Comparing between groups, gymnosperms showed higher rates of defoliation than angiosperms. Foliar elemental composition was related to defoliation in most European forest species, and was shown to be an informative complement to environmental variables and useful for assessing forest health. Nitrogen was the nutrient with the clearest effects, with the concentration of foliar nitrogen being inversely correlated with defoliation. However, other elements such as calcium, sulfur, and phosphorus also played a role in the defoliation of some European species. We emphasize the necessity of considering the different pressures that affect each climatic fringe, which in this case was perfectly exemplified by water availability at the Mediterranean latitudes versus the rest of Europe. Homogeneity of precipitation also appeared to be very important to reduce defoliation. The climatic legacy of the previous year also plays an important role in defoliation, as well as climatic variations in the spring. These findings should prove useful in the development of tools for assessing and understanding European forest health through defoliation data, which are broadly used and easily collected.

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4

Global maps and factors driving forest foliar elemental composition: the importance of evolutionary history

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Abstract

Consistent information on the current elemental composition of vegetation at global scale and the variables that determine it is lacking. To fill this gap, we gathered a total of 30912 georeferenced records on tree foliar concentrations of N, P, and K from published databases, and produced global maps of foliar N, P and K concentrations for woody plants using neural networks at a resolution of 1 km². We used data for climate, atmospheric deposition, soil, and morphoclimatic groups to train the neural networks. Foliar N, P and K do not follow clear global latitudinal patterns but are consistent with the hypothesis of soil substrate age. We additionally built generalized linear mixed models to investigate the evolutionary history effect together with the effects of environmental effects. In this comparison, evolutionary history effects explained most of the variability in all cases (mostly >60%). These results emphasize the determinant role of evolutionary history in foliar elemental composition, which should be incorporated in upcoming dynamic global vegetation models.

Keywords: Climate change; neural networks; global map; leaf; nitrogen; phosphorus; potassium

4.1 Introduction

In the Earth system, forests store close to 80% of all the biomass on earth, store 50 to 65% of terrestrial organic carbon and occupy a third of the terrestrial vegetated surface (Reichstein and Carvalhais, 2019). Despite its importance in carbon (C) cycles large uncertainties exist regarding stocks, turnover times and the carbon sink function in forest (Reichstein and Carvalhais, 2019). Recent studies show that accounting for stocks, fluxes, and availability of nitrogen (N), phosphorus (P) and potassium (K) in the plant-soil system can largely improve projections of

carbon cycles, especially when simulating global change impacts (Jiang et al., 2017; Sardans & Peñuelas, 2015; Peñuelas et al., 2017, 2020; Sun et al., 2017; Wang et al., 2018; 2019; Terrer et al., 2019). In fact, empirical evidence suggests that the availability of N, P and K limits the capacity of globally increasing C fixation by the rising atmospheric CO₂ concentrations (Vicca et al., 2012; Fernández-Martínez et al., 2014; Zhu et al., 2016; Bellassen et al., 2017, Wang et al 2020), which was recently addressed in Earth-system models (Meyerholt and Zaehle, 2015; Walker et al., 2015; Goll et al., 2017). Several studies have reported improvements in accuracy of the projections of the Earth-system models when information on N and P has been coupled to that of the C-cycle (Zaehle et al., 2010;2011;2015; Piao et al., 2013; Huang et al., 2016; Wang et al., 2017; Fernández-Martínez et al., 2019). The content/concentration of these elements in photosynthetic tissues is thus key for the functioning of terrestrial ecosystems, C-cycling, and for their response to current global changes, and can be further improved by the inclusion of other vegetation types in future studies.

The latitude-temperature theory supports a monotonic variation in foliar N and P concentrations with latitude due to latitude-induced shifts in temperature and precipitation. Nevertheless, this relationship remains unclear and sometimes opposite patterns have been reported (Reich and Oleksyn 2004; McGroddy et al. 2004; Kerkhoff et al. 2005; Yuan and Chen 2009; Ordoñez et al. 2009; Elser et al., 2010). The substrate age hypothesis, on the other hand, claims that older soils may be more N-abundant and P-limited than relatively younger soils (Walker and Syers 1976). Due to sustained P losses over geological timescales, P availability is expected to decrease with increasing soil age, implying a transition from N to P limitation when going from younger soils to older soils (Walker and Syers 1976; Chadwick et al. 1999; Vitousek et al., 2010). Although these global patterns might hold, foliar element concentrations can be highly heterogeneous on a regional scale. As such, foliar N and P concentrations have been shown to vary with mean annual precipitation within the tropics (Santiago et al., 2004) and within the temperate forest zone (Han et al., 2005). Additionally, soil type, temperature, water availability and even light intensity affect foliar nutrient concentrations (Ordoñez et al., 2009; Huxman et al., 2004; Voesenek and Pierik, 2008; Wang et al., 2012). This suggests that climatic and edaphic factors – should be included when trying to constrain variability in foliar nutrient concentrations. However, the consistency of these relations on a larger scale remains to be tested.

Most studies quantifying foliar elemental composition focus predominantly on foliar N and P, leaving foliar K largely understudied. Contrastingly, K is the most abundant nutrient in leaves after N and is considerably more abundant than P (Sardans et al., 2006; Zheng and Shangguan, 2007). Being a rock-derived nutrient, as P, its availability is mainly dependent on the parent material and weathering state (Catmak, 2005). Foliar K is important for water-use efficiency regulations in dry environments (Egilla et al., 2005; Graciano et al., 2005; Sardans et al., 2012a, 2012b) via its effects on stomatal function, cellular osmotic equilibrium and water fluxes (Babita et al., 2010; Laus et al., 2011; Sardans and Peñuelas 2015;2021). Importantly, K-limitation has been

reported across forests from different biomes (Olde Venterink et al., 2001; Tripler et al., 2006; Wright et al., 2011; Sardans and Peñuelas 2015; 2021), which further stresses the importance of including foliar K when trying to constrain foliar nutrient concentrations globally.

Evolutionary history effects are a long-term and complex product of the evolutionary processes resulting from a species' natural selection. This species adaptation to biotic and abiotic interactions with soil, climate and other species coexistence play a key role in determining the elemental foliar composition at continental (Sardans et al., 2015; Peñuelas et al., 2019) and global (Sardans et al., 2021) scales.

Bayesian models allow for the disentanglement of the species /taxonomical effects linked to long-term evolution (phylogeny) from those due to species/taxonomy linked to more recent convergent evolutionary processes, including strong selection within the phylogeny and recent epigenetic changes that are not directly due to and thus detected by strict use of phylogenetic distance matrix as covariable (Sardans et al., 2021). Apart from the evolutionary history effects, other abiotic (climate, soil type) and biotic (competition) factors play a significant role in explaining the foliar elemental composition variability found in large data sets of thousands of woody species growing in all continents (Sardans et al., 2015, 2021; Peñuelas et al., 2019).

Despite the important role of N, P and K in terrestrial ecosystems and their contribution to the global C-cycle models precision, only few studies have provided a global map approach to predict foliar N and P concentrations (Butler et al., 2017 and Moreno-Martínez et al., 2018). In the case of K, no gridded global map is available (Sardans et al. 2012a; Sardans and Peñuelas, 2015). Furthermore, a good understanding of the links between foliar nutrient concentrations and soil, climate and atmospheric deposition remains elusive while that evolutionary history effects on tree foliar nutrient concentrations at spatial scale remain unexplored as a whole.

Our first two aims were to (i) provide high resolution (1 km²) grid maps of woody plants foliar N, P and K concentrations in woody communities at a global scale and (ii) identify global N, P and K patterns. We built models for foliar nutrient concentrations based only on environmental variables, without including the likely dominant evolutionary history effects, to provide relationships with the climate variables and thus allow to project changes of foliar composition in response to climate change. Our third aim was (iii) to investigate the evolutionary history effects in interaction with the effects of soil, climate and atmospheric deposition.

4.2 Results

4.2.1 High resolution (1 km²) global maps of foliar N, P and K concentrations in woody communities based on environmental variables

The estimations of foliar N, P and K concentrations by neural network models showed precisions of 0.337, 0.040 and 0.181 normalized root mean squared error (RMSE) respectively and 0.63, 0.31

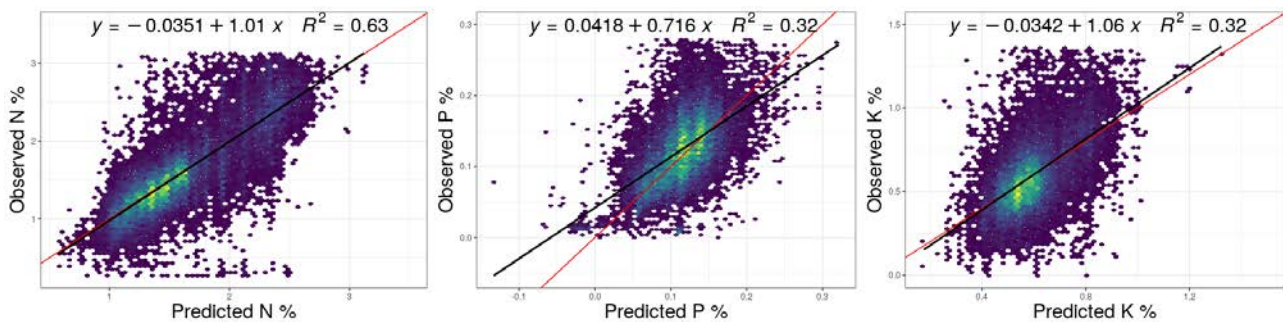


Figure 4.1 Observed versus predicted values for neural networks models predicting foliar N, P and K concentrations. Black line = fitted linear model between observed and predicted values. Red line = 1:1 line. RMSE = root mean squared error

and 0.32 R^2 respectively in predicted vs observed regressions (Figure 4.1).

Foliar N concentrations were predicted to be lowest in northwestern Eurasia and the north of North America. Foliar N concentrations were notably high in eastern Russia, central Africa, some regions in the Rocky Mountains and the Andes (Figure 4.2a) so to follow a latitudinal pattern at a glance is difficult. The map showing the standard error of the mean (SEM) estimation among replicates indicated that the predicted uncertainties were highest in mountainous areas, some regions in Siberia, the Labrador Peninsula, the Somali Peninsula and some sparse points (Figure S4.1a). The coefficient of variation (CV) for N in the neural-network models by morphoclimatic group ranged from 9.97 % in temperate coniferous to 33.46 % in Temperate coniferous, with a mean of 18.94 % CV for all forest types (Table S4.1).

The latitudinal pattern of foliar P concentrations is not clear either at a glance but lower levels are common in the tropical fringe. Foliar P concentrations were lowest in Northern Latitudes of North America, Florida, central Amazonia, some zones in central Africa, some zones in East Siberia, south-east of Asia and some zones in southern Australia. There were high foliar P concentrations in the Rocky Mountains and North America, the south of the Andes, central Europe, central parts of southern Africa and some spots in Siberia (Figure 4.2b). The high foliar P concentration in Siberia match with an uncertainty spot into the standard error of the mean map and also Labrador's Peninsula in an uncertain P zone. Other zones of uncertainty were in some parts of North America and in some isolated pixels in central Asia (Figure S4.1b). The CV for foliar P concentrations in the neural-network models ranged from 64.76% in temperate deciduous broadleaved to 109.30 % CV in tropical evergreen forests, with a mean of 98.26 % CV for all forest types (Table S4.1).

The predicted foliar K concentrations did not follow a global latitudinal pattern either. Some zones such as the Rocky Mountains, the southern Andes, the Somali Peninsula, and the North of Australia were predicted to have high foliar K concentrations. Foliar K concentrations were lowest

4. GLOBAL MAPS AND FACTORS DRIVING FOREST FOLIAR ELEMENTAL COMPOSITION: THE IMPORTANCE OF EVOLUTIONARY HISTORY

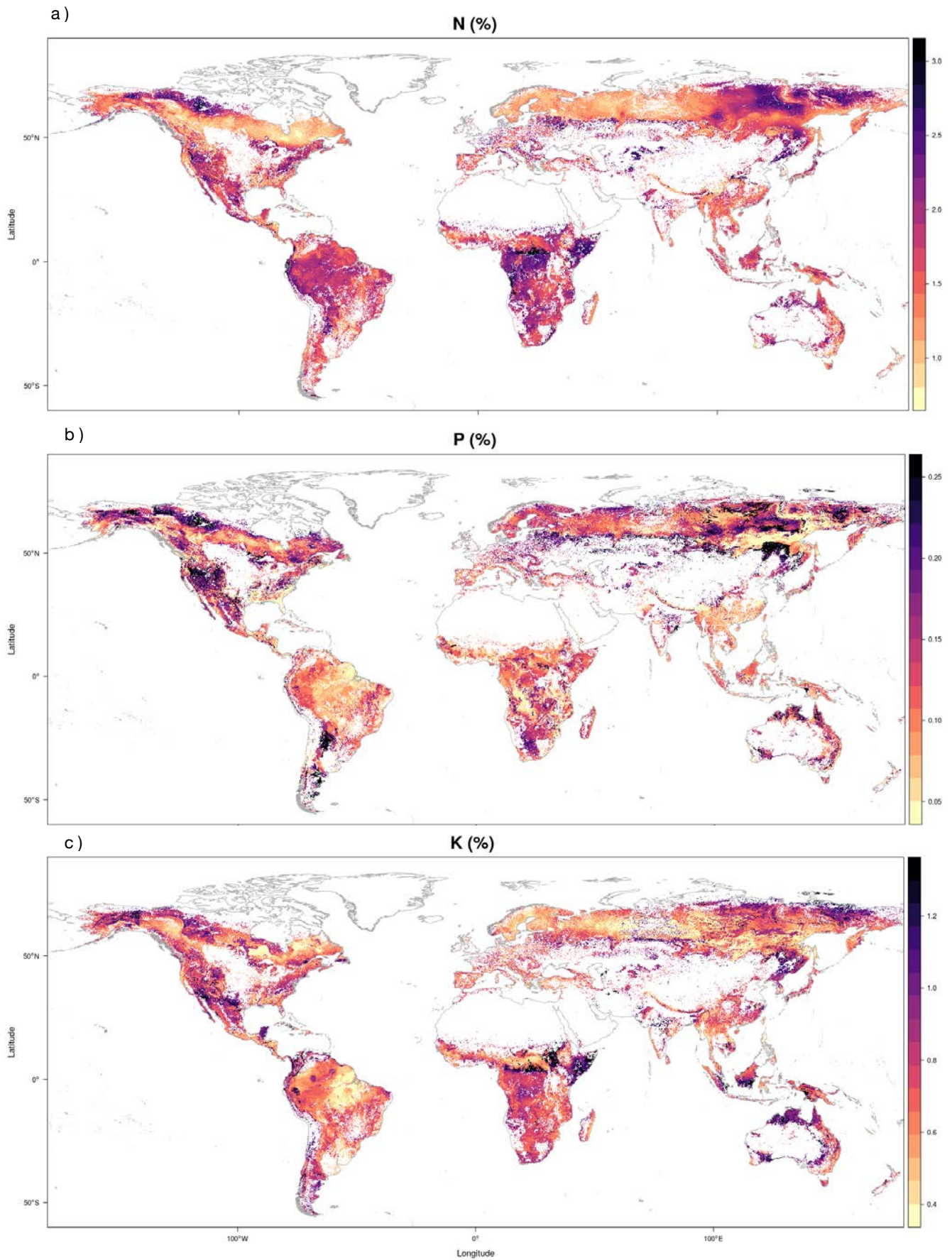


Figure 4.2 Neural Network predicted maps of foliar a) N, b) P and c) K concentration for woody plants. White areas indicate no woody vegetation.

at the mouth of the Amazonian River, in the Labrador Peninsula and central and west of Russia (Figure 4.2c). The zones with higher SEM are the south-east of Siberia, the south of Africa and the Rocky Mountains. The CV for K in the neural-network models ranged from 3.81 % in Temperate evergreen broadleaved forests to 27.64 % in Tropical evergreen, with a mean of 15.42 % CV for all forest types (Table S4.1).

4.2.2 Soil types

Spodosols and Histosols were the soil orders with lowest foliar N concentrations while Oxisols and Vertisols had the highest foliar N concentrations. The soil orders with the lowest foliar P concentrations were Oxisols and Ultisols, being Vertisols and Mollisols those with the highest foliar P concentrations. The lowest foliar K concentrations were found in Spodosols and Gelisols and the highest in Vertisols and Aridisols (Figure 4.3 and Table S4.2).

4.2.3 The environmental (climate and soil) versus the evolutionary history (phylogeny and species) effects in the different morphoclimatic types.

Nitrogen

The generalized linear models (glm) only with environmental variables conducted for each biome only explained from 5.5 % of the variability for temperate broadleaved evergreen to 38.8 % of the variability in N for boreal forests (Table S4.3). Soil pH, aridity index and solar radiation and precipitation seasonality correlated positively with foliar N concentrations in tropical evergreen forests. Soil gravel and evapotranspiration seasonality were positively correlated with foliar N concentrations while soil base saturation was negatively correlated in tropical deciduous forests. For temperate coniferous forest, foliar N concentrations correlated positively with soil pH and precipitation of the warmest quarter while soil base saturation evapotranspiration and soil pH were negatively correlated. In turn, foliar N concentrations in temperate broadleaved evergreens were correlated positively with aridity index, evapotranspiration and soil pH. In temperate broadleaved deciduous forests foliar N concentrations were correlated positively with annual precipitation and negatively with aridity index, soil pH and precipitation of the driest quarter. Finally, foliar N concentrations were positively correlated with minimum June, July and August precipitation and negatively correlated with maximum June, July and August precipitation and maximum temperature of the warmest month in boreal forests (Table S4.3).

The generalized mixed models (glmm), which besides environmental variables included the evolutionary history effects that comprise phylogeny and species, explained much more variance than glm. Evolutionary history effects (random variables in this case), also known as Pagel's lambda, explained 42-81% of the variability in foliar N concentrations while the exclusively environmental fixed variables explained only 1-58% (Table S4.4b). Phylogeny explained most of the variance in tropical evergreen, temperate coniferous, temperate broadleaved evergreen and boreal forests.

4. GLOBAL MAPS AND FACTORS DRIVING FOREST FOLIAR ELEMENTAL COMPOSITION: THE IMPORTANCE OF EVOLUTIONARY HISTORY

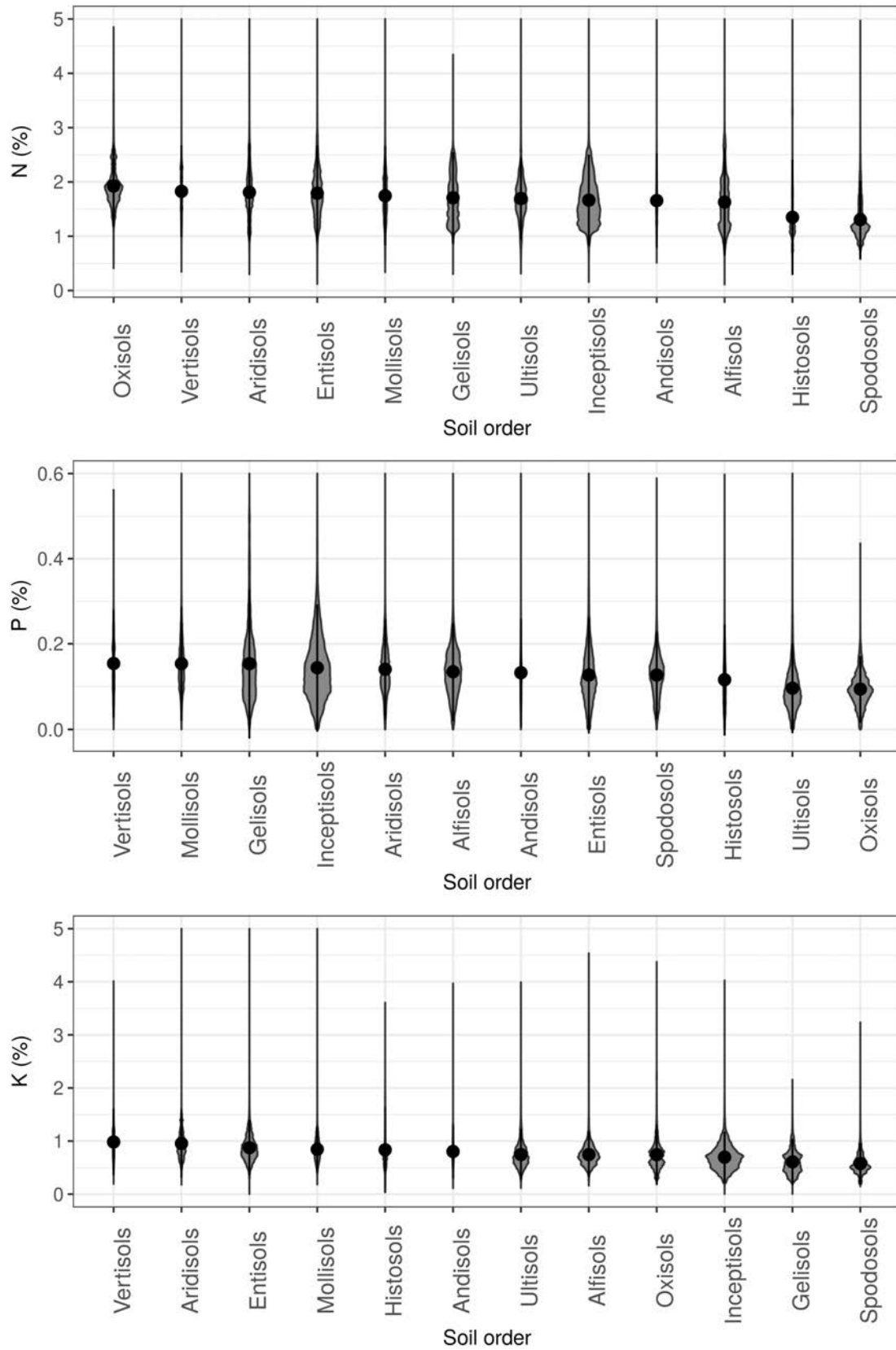
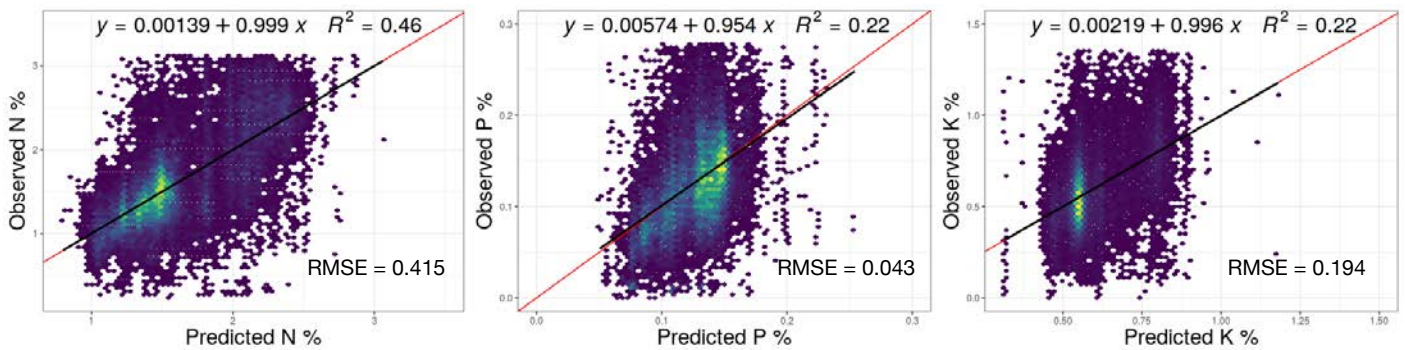


Figure 4.3 Violin plots of predicted values of foliar N, P and K concentrations grouped by soil order (USDA soil taxonomy). The predicted values of foliar N, P and K concentrations differ significantly among soil types ($P < 0.05$).

Phosphorus

The glm models built entirely with environmental variables only explained from 5% of the total variance for tropical deciduous to 18% in temperate coniferous forests (Table S4.3), including: a positive relation of foliar P concentrations with evapotranspiration seasonality and a negative relation with inorganic N deposition, soil pH, isothermality and mean temperature of the driest quarter, in tropical evergreen forests; a positive relation of foliar P with exchangeable soil Ca and a negative relation with soil base saturation, soil pH and isothermality in tropical deciduous forests. Foliar P concentrations were positively related with aridity index and exchangeable soil K and negatively related with soil pH in temperate coniferous forests. In temperate broadleaved evergreen forests foliar P concentrations were negatively correlated with annual evapotranspiration, daily mean solar radiation, precipitation of the driest month and mean diurnal range. In temperate broadleaved deciduous forests a positive relation between evapotranspiration seasonality, solar radiation and precipitation of the driest month and foliar P concentrations has been found with also a negative relation with precipitation of the coldest quarter. Moreover, there

Without species and phylogeny



With species and phylogeny

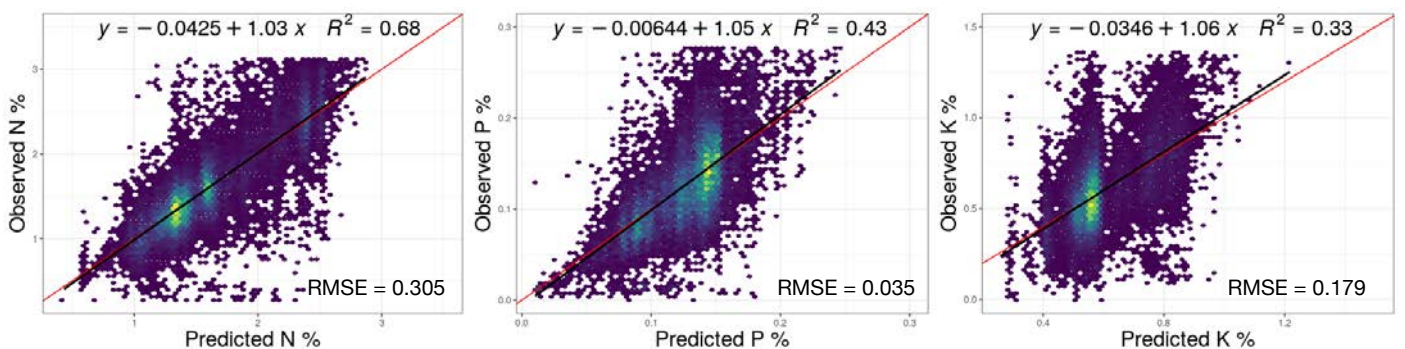


Figure 4.4 Observed versus predicted values for the generalized linear models (without legacy factors) and the generalized linear mixed models (with legacy factors) models predicting foliar N, P and K concentrations. Black line = fitted linear model between observed and predicted values. Red line = 1:1 line. Equation describing the black line. RMSE = root mean squared error.

was a positive relation between foliar P concentrations and maximum June, July and August

precipitation and mean annual temperature and a negative relation between foliar P concentrations and wet oxidate N deposition in boreal forest.

The glmm models, which besides environmental variables included the evolutionary history effects that comprise phylogeny and species, showed that these legacy effects explained most of the variance of foliar P concentrations, similar than in foliar N concentrations. The overall legacy effects thus explained 39-99% of total foliar P concentration variance in these biomes (Table S4.4b). Phylogeny explained most of the variance in tropical evergreen, temperate coniferous and boreal forests.

Potassium

The glm models built entirely with environmental variables explained total foliar K concentrations variance only between 3% for temperate broadleaved evergreen and temperate broadleaved deciduous and 97% for boreal forest types (Table S4.3). There was a positive relation between foliar K concentrations and soil exchangeable acidity and mean annual precipitation and a negative relation with dry N deposition in tropical evergreen. There was a negative relation between foliar K concentrations and evapotranspiration and wet reduced N deposition in tropical deciduous forests. Positive relationships between foliar K concentrations and aridity index, evapotranspiration seasonality, maximum June, July and August precipitation and mean annual temperature were found in temperate coniferous forest. There was a negative relation with solar radiation and precipitation of the driest quarter in temperate broadleaved evergreen forests. A positive relation between foliar K concentrations and soil pH and precipitation of the coldest quarter has been seen in temperate broadleaved deciduous. Finally, there was a positive relation between foliar K concentrations and mean temperature of coldest quarter, minimum temperature of the coldest month while there was a negative relation with dry N deposition and mean annual precipitation in boreal forests.

The glmm models, which besides environmental variables included the evolutionary history effects showed that these legacy effects explained most of the variance of the foliar K concentrations data, similar to foliar N and P concentrations. Legacy explained 22-98% of the variance, and the environmental fixed variables only explained from <1 to 8% of the variance (Table S4.4b).

The predictive power of the models for the whole dataset considering all the morphoclimatic types together increased highly when including evolutionary history effects in comparison with the models without them. The R^2 of the relationship between observed and predicted values increased from 46% to 68% for N, from 21% to 43% for P, and from 22% to 33% for K comparing the glm models with environmental variables against the glmm models considering also the evolutionary history (Figure 4.4).

4.3 Discussion

4.3.1 Global maps

We have produced raster maps with predicted foliar N, P and K concentrations with 1 km spatial resolution, by only considering environmental factors and no ecophysiological traits. Avoiding ecophysiological traits will allow for models to be easily adapted to future climate change scenarios, applying only the predicted environmental abiotic conditions. The addition of functional traits obtained by satellite remote sensing may offer slightly better performance (Moreno-Martínez et al. 2018), but these traits are difficult to predict and map for future scenarios. Our maps thus constitute the most reliable current proxy of global forest foliar elemental composition and can be easily used for modeling studies by providing the amount of foliar N, P and K concentrations in dry weight for each terrestrial location just from environmental variables.

The uncertainty of the predicted foliar concentrations was highest in zones with strong gradients of environmental variation and/or in zones with a low density of sampling points, such as the Rocky Mountains, the Himalayas and the Andes. Some of them also coincide with sparse vegetation points or big land extensions without experimental data available, like the Asian part of the boreal morphoclimatic type. The relationships between the observed foliar N, P and K concentrations and the expected concentrations in function of the neural network models used to build the maps have, however, proved to have reasonable goodness of fit and precision (Figure 4.1).

4.3.2 Environmental factors

The environmental drivers of foliar elemental composition were different across the six morphoclimatic types. This lack of common and consistent environmental global drivers is coherent with the divergence in results of more regional studies on foliar nutrients (e.g. Sandel et al., 2010 and Santiago et al., 2004). These diverging responses to the selected predictors reveal that plant sensitivity and determinant factors are dependent on morphoclimatic type emphasizing the differential pressures between latitudes and foliar type.

The correlations between foliar P concentrations and climatic variables seem to be partially ruled by instability of the system. In Tropical evergreen, Tropical deciduous and in Temperate broadleaved deciduous a higher seasonality or less isothermality is related with higher P levels. Foliar K concentrations were associated with water-dependent variables in Temperate coniferous, Temperate broadleaved evergreen and boreal, having higher K values in more arid conditions. These results are consistent with the narrow link between plant water-use efficiency and K concentrations (Sardans and Peñuelas, 2015) which acknowledges the osmotic use of K in water retention.

Foliar N and P concentrations under different soil types were consistent with the soil-age hypothesis at global scales, which describe young soils as N-limited and P-rich and old soils as N-rich and P-limited. Oxisols, which generally represent the oldest and more weathered surface soils, were sustaining woody plant communities with relatively more N and less P in their leaves, followed closely by Ultisoils which exhibited a similar pattern (Figure 4.4). This pattern, however, did not apply to forest communities on ‘*younger*’ soils, where more P and less N is to be expected. Our corresponding explanation is at the level of the order of soil taxonomy’s classification, and we must take into account that there is no family covering all the young soils. Vertisols is the soil order with simultaneously high levels of N, P and K. Those soils are characterized by high content of expansive clay and high cation exchange capacity (Soil Survey Staff. 1999).

4.3.3 Evolutionary history effects

The evolutionary history effects were found to explain most of the variability in foliar N, P and K concentrations, thus complementing and extending the prediction capacity of environmental factors. Most of the variance explained by the environmental factors in glm, was explained by evolutionary history effects in glmm. Species are associated with particular soil and climatic traits, so phylogeny incorporates climatic and soil conditions to some extent. This strong evolutionary history signal in foliar elemental composition has recently been reported in studies at local, regional and global scales (Castellanos et al., 2018; Peñuelas et al 2009, 2010, 2019; de la Riva et al., 2017; Hu et al., 2018; Reimann et al., 2018; Sardans and Peñuelas, 2015, Sardans et al, 2015, 2016b, 2020). For example, specific families with singular nutrient levels such as Fabaceae which are N-fixer have foliar N concentrations of 2.08 %, i.e. higher than the mean 1.62 %, whereas Proteaceae, which are typically from low-P environments (Hayes et al., 2021) have a mean of 0.066 % P, i.e. lower than the mean 0.126 %. Consequently, this key role of evolutionary history is important in order to determine the foliar elemental composition and is the most consistent explanation behind the lack of strong effect of climatic variables in similar studies of this topic (Reich and Oleksyn 2004; McGroddy et al. 2004; Kerkhoff et al. 2005; Yuan and Chen 2009; Ordoñez et al. 2009; Elser et al., 2010) that did not take evolutionary history effects into account.

Our results strongly resonate with the biogeochemical niche hypothesis (Peñuelas et al., 2008, 2019; Sardans et al., 2021), which predicts that different species, as evolutionary products, would have different optimal elemental compositions (elementomes). Phylogeny and species, as proxies of overall evolutionary history, explained on average more than 2/3 of the variability of the foliar concentrations of N, P and K. Phylogeny represents long-term evolutionary information, while species represent more short-term evolution, which underlie more recent evolution and coevolution of different and distant taxonomical clades by coinciding under similar environmental (climate, soil, competition) conditions. Several recent evolutionary events such as climate warming, species migration, shifts in species interactions (e.g. with herbivorous or parasitic species) and climatic convergence can all increase the rate of evolutionary convergence among

species from different clades or the evolutionary divergence within the same clade, and thus can also differentially increase the rate of evolution as observed in several characters in different species (Wright et al., 2006; Gillman et al., 2010; Kellner et al., 2011; Puurtinen et al., 2016; Jwa et al., 2017; Molina-Montenegro et al., 2018). All these factors cannot be “detected” by phylogeny but can be detected by taxonomy, in this case by the current species factor inside the evolutionary history effects.

The rate of species turnover in woody vegetation along spatial gradients, however, is expected to be outpaced by environmental change in short- and medium-term, as evidenced by projections of climatic, socio-economic and C-cycle models for the coming decades. The use of algorithms to predict foliar N, P and K concentrations in the near future has thus to be based on models including only climate, N deposition and soil traits that can effectively change in short time intervals of decades. Our study, though, identified the crucial explanatory role of evolutionary history effects as independent variables in global-scale models of foliar N, P and K concentrations. Evolutionary history effects were the main drivers controlling the foliar elemental composition under each environmental condition. Species is thus an important factor for plant functional traits present throughout the plant kingdom, for predicting the use of bioelements and thus for the biological control of biogeochemical cycles. The strong effects of evolutionary history suggest that the incorporation of dominant species into models, although difficult, would largely improve its predicting power. Species and their phylogeny, that represent long-term information stored in genes, together with more recent phenotypic/epigenetic shifts, determine the elemental composition of current plant cover.

The coexistence of species is another factor determining elemental composition. Considering coexistence in addition to environmental conditions and genetic legacies will favor even more the identification of the whole pool of variability of foliar elemental composition (Peñuelas et al. 2019). A possible approach with this purpose could come from combining our maps with GBIF (Global Biodiversity Information Facility) occurrences or improving the classification capacity of satellite imagery.

4.4 Final remarks and conclusions

We generated global maps for foliar N, P and K concentrations at resolutions of 1 km using neural-network machine learning, with mean R^2 values of 0.63, 0.32 and 0.32, and RMSE values of 0.34, 0.04 and 0.18 respectively, providing the best maps to date based only on environmental variables and without functional traits. The distribution of foliar N and P concentrations was consistent with the soil-age hypothesis. The pattern of foliar N, P and K concentrations and their relationships with environmental variables differed depending on the forest morphoclimatic type emphasizing different environmental pressures. Thus, the separation of global forest in the main morphoclimatic types is thus necessary to model forest canopy elemental composition. More than

that, adding evolutionary history effects through general linear mixed models to environmental variables largely increased the amount of explained variance emphasizing the role of evolutionary history in controlling foliar elemental composition, and encouraging the use of species in future models of foliar elemental composition.

4.5 Material and Methods

The methods summary is in figure 4.5.

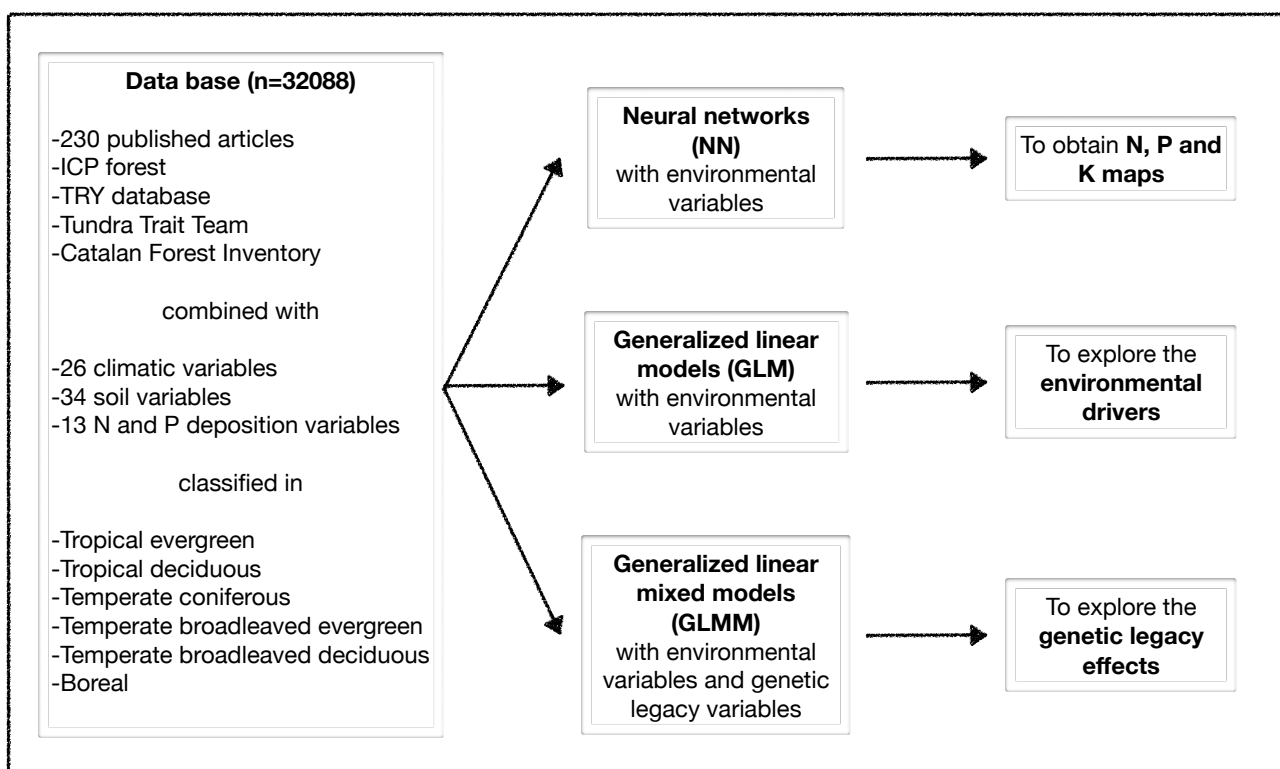


Figure 4.5 Summary of the methodology followed in this paper

4.5.1 Database generation

We combined 24631 inputs for N foliar concentrations in DW, 23726 for P foliar concentrations in DW and 18988 for K foliar concentrations in DW corresponding to woody plants around the world (Figure 4.6). The data were obtained from 257 published articles (Table S4.6), the TRY database (<http://www.try-db.org/TryWeb/dp.php>), the ICP Forest database (International Co-operative Programme on Assessment and Monitoring of Air Pollution Effects on Forests, <http://icp-forests.net/page/data-requests>), the Tundra Trait Team and the Catalan Forest Inventory (Gracia et al., 2004). All foliar data were obtained using comparable analytical methods, mostly based on elemental analyzers for N, and on acid digestion coupled to optical spectrometry detection (in the majority of cases inductively coupled plasma to optical emission spectroscopy (ICP-OES) for P

and K). All foliar samples were mature leaves collected between 1990 and 2016. We only used data from georeferenced plots. The samples with values more than two times SD were considered outliers and removed in order to avoid analytical or transcription data errors. Final sample sizes (number of data points) and elements used in each model are shown in Table S4.5.

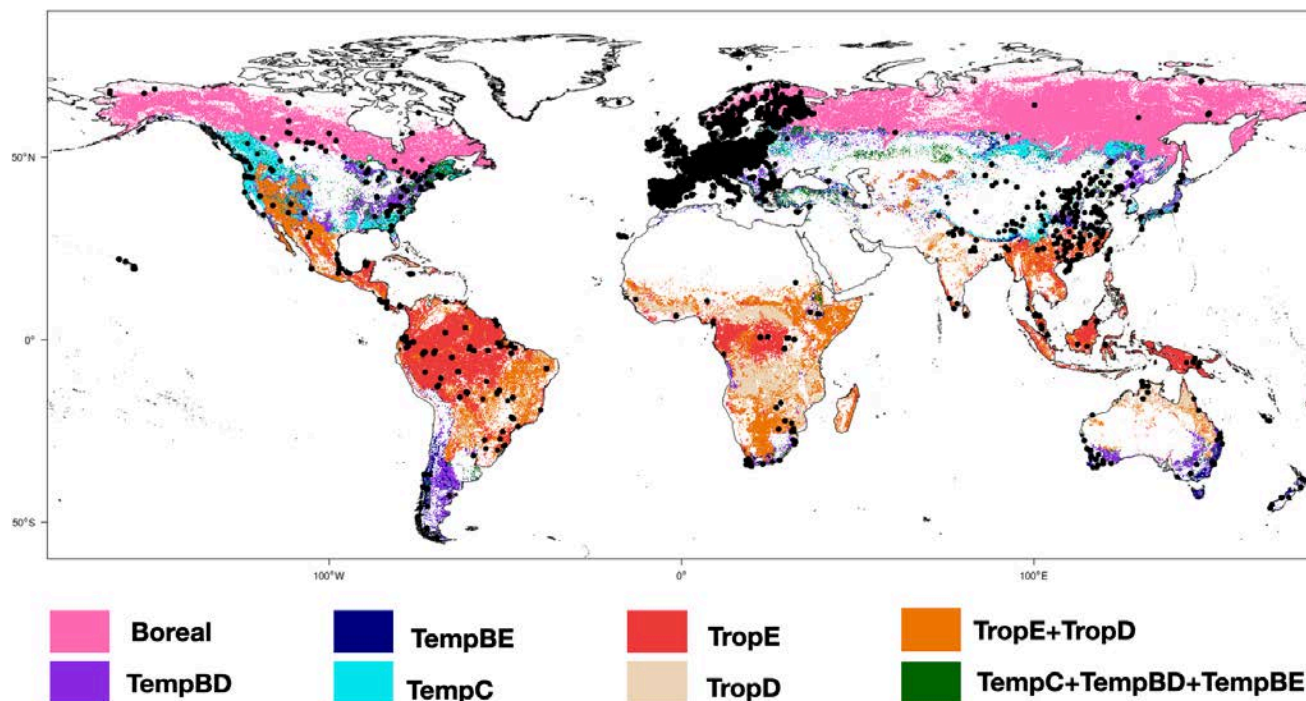


Figure 4.6 Sampling points for N, P and K. Colors corresponding to different morphoclimatic groups and its combinations in mixed forests. TempC = Temperate coniferous. TempEB= Temperate evergreen broadleaved. TempBD=Temperate broadleaved deciduous. TropE= Tropical evergreen. TropD= Tropical deciduous.

Data for soil, climate and N and P deposition were added to foliar concentrations using the *raster* (Hijmans, 2019) and *sf* (Pebesma, 2018) packages in R. Thirty-four soil variables from the Land-Atmosphere Interaction Research Group at Sun Yat-sen University were initially considered, at resolutions of 1 km at the equator (Shangguan et al., 2014). We initially considered 26 climatic variables, which were the standard bioclimatic variables from the WorldClim version 2 database (Fick and Hijmans, 2017) (Table S4.7), an aridity index and data for evapotranspiration from the CGIAR-CSI v2 database (Trabucco & Zomer, 2019) also at a resolution of 1 km² at the equator. These climatic data have been estimated from long-term meteorological time series (1970-2000), based on interpolated climatic data provided by meteorological stations around the globe and adjusted to topography. Twelve variables of N deposition were extracted from Ackerman et al. (2018) (Table S4.7), which provided data for organic, inorganic, oxidate and reduced forms of N deposition at a resolution of 25 km at the equator. The downscaling to 1 km was done with *res* function in *raster* R package (Hijmans et al., 2019). Data for P deposition were from Wang et al. (2017) at a resolution of 1 km and as a mean for 1997-2013 (Table S4.7).

This database of the foliar N, P and K concentrations and information for soil, climate and N and P deposition was classified in six morphoclimatic types of forest by geographical location and

species morphology. Those are tropical evergreen, tropical deciduous, temperate coniferous, temperate broadleaved evergreen, and temperate broadleaved deciduous and boreal. The tropical, temperate and boreal assignments were based on the WWF ecoregion map (Olson et al, 2001), where “Tundra” and “Boreal Forest/Taiga” account for boreal forests; “Temperate Broadleaf and Mixed forests”, “Temperate grasslands, Savanas and Scrublands”, “Montane grasslands and Scrublands”, “Mediterranean Forests, woodlands and Scrub”, “Temperate Conifer Forests” and “Deserts and xeric scrublands” higher than 30° latitude account for the temperate forests and “Tropical and subtropical Moist Broadleaved Forest”, “Tropical and subtropical Dry Broadleaved Forest”, “Tropical and subtropical grasslands, Savanas and Scrublands”, “Tropical and subtropical Coniferous forests”, “Mangroves”, “Flooded Grasslands and Savannas” and “Deserts and xeric scrublands” lower than 30° latitude account for tropical forests. The evergreen, deciduous, coniferous and broadleaved designation was not assigned by map category but has been assigned by species characteristics according literature and specialist criterion in order to be more specific. In case some species could be deciduous or evergreen this species would be considered in both categories. Thus, the latitudinal designation is complemented by the foliar morphology in the different morphoclimatic type assignation. After, each morphoclimatic subset is the database used for each model training.

4.5.2 Neural networks and global maps of elemental composition

We built a total of 18 models, i.e. 6 groups of morphoclimatic types × 3 foliar variables (N, P and K concentrations), using neural networks in R with the package *keras* (Allaire & Chollet, 2019). The Kaiser-Meyer-Olkin method was applied to each subset of data for the 73 variables of soil, climate and deposition to automatically exclude the most strongly autocorrelated variables and avoid colinearity. We set the correlation threshold between 0.6 and 0.9 to obtain a set of the 19 remaining variables (Table S4.8). The datasets with remaining variables were then randomly divided into training, test and validation subsets, at a ratio of 60%, 20% and 20% (Lever et al., 2016), respectively and standardizing the data. A ponderation system based on weighting the samples by Europe and the rest of the World has been included to level the data origin and smooth the possible unbalancing effect from massive sampling in Europe. A neural network was constructed with one input layer, two hidden layers of 128 densely connected neurons and one output layer with one neuron, so we built independent networks for each nutrient and morphoclimatic forest type. The models were trained by optimizing mean squared errors on the test set. The validation data were used to cross-validate the accuracy of the model following the k-fold methodology and the root mean squared error (RMSE), the mean, the standard deviation, the coefficient of variation and R^2 was calculated for each model. Each model, was trained and calculated several times until stabilize the variation due to the random splitting of the data set. The mean of those values resulting of each repetition was calculated to obtain a final stable value with its corresponding standard error.

The variable importance function in the *Dalex* R package (Biececk, 2018) was used to identify the most influential predictor variables in the predicted outcome. This function calculates the loss function using the squared error of the model (`_full_model_`), randomizes each variable, calculates the loss in the absence of a predictive signal and calculates the loss with all variables randomized (`_baseline_`). We repeated this process 100 times per iteration in each model, for a mean total of 10 000 randomizations.

The land-cover map from ESA-CCI v2.0.7b at a resolution of 300 m was used to set up the model predictions for the six morphoclimatic forest types by element in three global raster maps. The resolution was modified to 1000 m using the aggregate function of the *raster* package with the mode as a gathering parameter. The land-cover map was then reclassified (Table S4.8) to our six morphoclimatic types to match the land-cover map with our prediction and use it to mask the vegetation for determining the distribution of each vegetation group. For mixed forests in the land cover map we calculated and plotted the corresponding mean values of each forests predictions for that region in order to better assess the reality. The neural network predictions were then plotted in three raster longitude/latitude WGS84 projection at a resolution of 1 km with the predicted percentages of foliar N, P and K concentrations in mature leaves of woody species. Uncertainty maps were also provided for each element using the mean standard error of the mean (SEM).

4.5.3 Generalized linear models

We selected the 10 most important variables based on their importance in the neural-network model to identify significant correlations with N, P, K concentrations. We then created a subset of the six least strongly correlated variables and built saturated glm models using these six variables and their first-degree interactions following gamma family distribution with an inverse link. We then applied the dredge function in the MuMIn R package (Barton, 2019) to select the final model based on the lowest Akaike information criterion and a maximum of six variables and interactions per model. We also determined the proportion of deviance explained by the glm or a pseudo- R^2 value with the `Dsquared` function into `modEvA` (Barbosa et al., 2015) R package.

4.5.4 Generalized linear mixed models

We used Bayesian generalized linear mixed models in the *MCMCglmm* R package (Hadfield 2010) to understand the combined role of phylogeny and species compared to the predictors used for the neural network (variables for soil, climate and deposition). We again selected the 10 most important variables for each biome and element based on the importance of the neural-network variables and also created a subset of the six least strongly correlated fixed variables for running the models. We also used the phylogenetic tree provided by Qian and Jin, 2015 which matches with 1580 of our species. Those corresponding species conformed to the random part of the model as “phylogeny” and the species group as “species”. We ultimately built 6 × 3 models with

the form: $\text{element} \sim \text{var1} + \text{var2} + \text{var3} + \text{var4} + \text{var5} + \text{var6}$, $\text{random} = \text{phylogeny} + \text{species}$. The random variance explained by phylogeny and by species was thus also specified.

4.5.5 Soil age

We used the USDA classification of soil taxonomy when no map of soil age was available for determining whether and how the age of the substrate also influenced the foliar elemental compositions. The USDA classification partially and categorically considers soil age in their order divisions and allowed us to infer the effect of the soil age into elemental composition. We grouped our predicted N, P and K concentrations by their corresponding soil orders. Then we compared the orders using an ANOVA and a Tukey's post hoc test with the HSD.test from *agricolae* (Mendiburu, 2020) R package. Finally, we represented the results in violin plots by soil order.

Acknowledgements

This work was supported by the Spanish Government grant PID2019-110521GB-I00, the Fundación Ramon Areces project ELEMENTAL-CLIMATE, the European Research Council Synergy grant ERC-2013-SyG-610028 IMBALANCE-P, and the Catalan Government grant SGR 2017-1005. M.F-M is a postdoctoral fellow of the Research Foundation – Flanders (FWO).

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Global distribution and drivers of forest biome foliar N:P ratios

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Abstract

Detailed understanding of patterns and drivers of terrestrial N:P ratios is essential for the accurate prediction of impacts of global change on ecosystem biogeochemical cycling and function. However, confirmation of the global distribution and drivers of foliar N:P ratios across contrasting terrestrial ecosystems remains lacking. In this study, we used neural network predictions to create a global map of woody plant foliar N:P ratios for four contrasting forest biomes (boreal, temperate coniferous and broadleaf, and tropical) based on a database comprising 24347 records. We then tested impacts on the N:P ratios of potential environmental drivers using generalized linear models and genetic drivers using generalized linear mixed models. We found that foliar N:P ratios are negatively associated with latitude, with higher N:P ratios occurring in tropical forests and lower N:P ratios occurring in boreal forests; globally, N:P ratios indicate greater levels of P limitation than N limitation. The influence of environmental factors varied among the four forest biomes, likely due to contrasting combined environmental conditions; this finding would have been obscured had we conducted a single “forest biome” analysis. Genetic legacy explained significant variation in woody plant foliar N:P ratios and we suggest its inclusion in future studies to improve N:P ratio predictions. Overall, our study will be useful to improve prediction of effects of global change on biogeochemical cycles and ecosystem functioning.

5.1 Introduction

In terrestrial systems, the ratio of nitrogen (N) to phosphorus (P) (N:P) content of plant foliar tissue is an indicator of spatio-temporal variations in plant physiological and ecosystem biogeochemical function, including N and/or P limitation or co-limitation (Schreeg et al., 2014), species niche occupation (Peñuelas et al., 2019), and vegetation carbon (C) retention capacity (Güsewell 2004; Ågren 2008; Tian et al., 2018). For example, in natural and agricultural ecosystems, biomass

growth is constrained by N:P leaf ratios (Vitousek & Howarth, 1991; Van Duren & Pegtel 2000; Das et al. 2006).

The relationship between foliar N:P content and terrestrial ecosystem biogeochemical function may be described by the growth rate hypothesis (GRH) that states that fast growing species require rapid protein synthesis, which in turn, requires large amounts of P-rich RNA. When essential resources, such as N or light, are at high levels of availability, increased growth rate is dependent on increases in P-rich RNA, as indicated by research that shows N:P ratios, particularly of leaf tissue, is negatively correlated with plant growth rate (Peng et al., 2011a; Rivas-Ubach et al., 2012; Yu et al., 2012; Yan et al., 2015; Jing et al., 2017). Under non-limiting conditions, balanced foliar N:P ratios of mature plants may be 14-16 on a mass basis (Elser et al., 2000; Knecht & Göransson, 2004; Zhang & Elser, 2017), although further research is needed for confirmation (Sardans et al., 2021), because Güsewell (2004) and Greenwood et al. (2008) reported ratios of N:P on a mass basis of <10 indicate limited N and ratios >20 indicate limited P, in contrast to Koerselman & Meuleman (1996), who reported ratios of <14 indicate limited N and ratios >16 indicate limited P. In terrestrial plants N:P increase relatively at low growth rates, given its relationship with amino acid limitation in protein synthesis and reaches a maximum. N:P decreases in high growth rate when the ensemble of amino acids rates is related to P-rich RNA (Ågren, 2004; Yu et al., 2012). In this relationships, though, N concentrations scales slower than P concentrations in leaves and its correlation is not linear (Ågren, 2004, 2008; Reich and Oleksyn, 2004; Kerkhoff and Enquist, 2005; Niklas et al., 2005; Niklas and Cobb, 2005; Sardans et al., 2012; Sardans et al., 2016, b; Tian et al., 2018).

These links between plant growth rate and overall N:P ratios also vary with ontogeny and climate conditions. At initial stages of development, N:P ratios are negatively correlated with plant growth, due to the allocation of the nutrients to biomass production (Zhang et al., 2019), whereas at the mature growth stage, when plants invest greater proportions of N and P to non-growth functions, this relation becomes weaker (Kerkhoff and Enquist, 2005; Peñuelas and Sardans, 2009; Rivas-Ubach et al., 2012; Zhang et al., 2019). Temperature and water availability have been shown to increase community level N:P ratios (Fan et al., 2016), due to more favorable growth conditions (Sardans et al., 2011; Sun et al., 2017), while under drought conditions, N:P ratios may shift to improve water use efficiency (Rivas-Ubach et al., 2012; Qiao et al., 2018; Sun et al., 2019; Peñuelas et al., 2020; Sardans et al., 2021).

Quantification of plant N:P ratios may be used as a tool to understand plant community structure and function (Zhao et al., 2019), including across successional stages within biomes, where they are expected to be lower in rapidly growing pioneer plant species, such as grasses, than in slow growing, late-successional species, such as tree species (Peñuelas et al., 2013; Sardans and Peñuelas, 2013; Busch et al., 2018). For example, N:P ratios increase with successional stage in African savanna vegetation (grasses: 8.6; broad-leaf trees: 13.7; and, fine-leaf trees: 18) (Ratnam et al., 2008) and in eastern China (grassland: 7.38; early successional mixed forest: 14-16; late successional mixed forest: 18-20) (Yan et al., 2008). These associations

are related to plant life history strategies that tend to vary across several stages of succession, as indicated by the associations between high N:P ratios and stress-tolerators, low N:P ratios and fast-growing, ruderal species, and intermediate N:P ratios and competitor species (Yan et al., 2008; Busch et al., 2018; Peñuelas et al., 2019). Changes in N:P ratios are known to affect the structure of terrestrial food webs (Fanin et al., 2013; et al., 2014; Zechmeister-Boltenstern et al., 2015; Paseka and Grunberg, 2019), while imbalances between N and P decrease ecosystem C retention capacity (Carnicer et al., 2015; Peñuelas et al., 2013) and affect ecosystem species composition, structure, diversity, and function (Sternner and Elser, 2002; Peñuelas et al., 2019;2020; Sardans et al., 2021).

In addition to local and regional scale variations in terrestrial foliar N and P concentrations and ratios, global-scale studies of their patterns and drivers have revealed monotonic decreases in N:P ratios from tropical to polar latitudes (McGroddy et al., 2004, Reich and Oleksyn, 2004; Kerkhoff et al., 2005; Yuan and Chen, 2009; Zhang et al. 2018, 2019b) that are consistent with latitudinal increases in N:P ratios with mean annual precipitation and temperature and the soil-age hypothesis (Walker and Sayers, 1976) that states older tropical soils may be more N-abundant and P-limited than relatively younger soils. However, these patterns and drivers of N:P ratios are inconsistent with findings of regional scale studies that have reported latitudinal increases in N:P (De Frenne et al., 2013; Sardans et al., 2016a,b; Zhang et al., 2019b). Our objectives were to a) use three approaches to create global maps of foliar N:P ratios across ecosystems, based on modeled climate, soil, and N and P deposition data; b) identify global drivers of woody vegetation N:P ratios; and, c) explore the role of genetic legacy (phylogenetics) in foliar N:P ratios of woody plants.

5.2 Materials and Methods

5.2.1 Database compilation

We compiled 25761 and 23815 globally distributed georeferenced records of woody plant N and P foliar concentrations, respectively, from the TRY (<http://www.try-db.org>) and ICP Forests (<http://icp-forests.net>) databases, the Catalan Forest Inventory (Gracia et al., 2004) and 230 published articles (Table S5.1). Data comprised comparable analytical methodologies, based on elemental analyses for N and sample acid digestion coupled to optical detection methods for P, for foliar samples collected between 1990 and 2016. Data with $2\times$ standard deviation (SD) were considered outliers and removed to avoid mistakes in data collation or transcription; N:P ratios were then calculated from the remaining values, before data with $2\times$ SD were again removed. Following outlier removal, our database comprised 20851 records.

Soil, climate, and N and P deposition data for locations of the georeferenced foliar N:P ratio data were input to the database using *raster* (Hijmans, 2020) and *sf* (Pebesma, 2018) R packages. Initially, we considered 34 soil variables from the Land-Atmosphere Interaction

Research Group at Sun Yat-sen University (Shangguan et al., 2014), 26 climate variables, comprising the standard bioclimate variables from the WorldClim version 2 database (Fick and Hijmans, 2017), and evapotranspiration and aridity index data from the CGIAR-CSI v2 database (Trabucco & Zomer, 2019) at 1-km resolution at the equator. The climate data comprise estimations interpolated from a globally distributed, meteorological time series (1970-2000) and adjusted for topography. Twelve N deposition variables, based on reduced, oxidized, inorganic, and organic forms of N deposition, at 25-km resolution at the equator from 1984 to 2016 were extracted from Ackerman et al. (2018); data were downscaled to 1-km using the *res* function in the R *raster* package (Hijmans, 2020). Mean P deposition data for the period 1997–2013 were derived from Wang et al. (2017) at a resolution of 1 km. Following exclusion of some variables, due to redundancy, the final database comprised 73 soil, climate, and N and P deposition variables as drivers of woody plant foliar N:P concentrations (Table S5.2).

The database was divided into four types of forest biome, comprising tropical, temperate coniferous, temperate broadleaved and boreal, based on the WWF ecoregion map (Olson et al., 2001) that classifies “tundra” and “boreal forest/taiga” as boreal forests, “temperate broadleaf and mixed forests”, “temperate grasslands, savannas and scrublands”, “montane grasslands and scrublands”, “Mediterranean forests, woodlands and scrub”, “temperate conifer forests” and “deserts and xeric scrublands” from $>30^\circ$ latitude as temperate forests, and “tropical and subtropical moist broadleaved forest”, “tropical and subtropical dry broadleaved forest”, “tropical and subtropical grasslands, savannas and scrublands”, “tropical and subtropical coniferous forests”, “mangroves”, “flooded grasslands and savannas”, and “deserts and xeric scrublands” $<30^\circ$ latitude as tropical forests (Figure S5.3). The distinction between temperate coniferous and broadleaf forests was based on species taxonomy.

5.2.2 Global models of woody plant foliar N:P ratios

Neural Networks

One model per forest biome was built based on neural networks (NN) using the *keras* package in R (Allaire & Chollet, 2019). The Kaiser-Meyer-Olkin method was applied to each of the four subsets of data for the 53 climate, soil, and deposition variables to exclude those that were most strongly autocorrelated and to avoid overparameterization; the correlation threshold was settled according to result in 19 remaining variables (Table S5.4). Then, the datasets with remaining variables were randomly divided into training (60%), test (20%), and validation (20%) subsets (Lever et al., 2016), and data were standardized using *scale* function in R (R core team, 2020). Due to the greater number of data records derived from Europe, data collected from outside the region were weighted to avoid any potential European bias. We built independent NNs for the four forest biomes, where they were constructed with one input layer, two hidden layers of 128 densely connected neurons and one output layer comprising one neuron. The validation data were used to cross-validate the accuracy of the model following the K-fold methodology and the root mean

squared error (RMSE), mean, SD, coefficient of variation, and R^2 were calculated for each model; the mean of values (\pm SE) from each repetition was calculated to obtain a final stable value.

The model predictions were extrapolated to the ESA-CCI land cover map v2.0.7b (ESA, 2017), at 300-m resolution, for the four forest biomes by element in three global raster maps; the resolution was modified to 1000-m using the aggregate function of the *raster* package in R (Hijmans, 2020), with mode as a gathering parameter. Then, the land-cover map was reclassified (Table S5.4) to the four forest biomes to match it with our predictions and use it to mask vegetation to determine the distribution of each forest type. The NN predictions were plotted at 1-km resolution in three raster longitude/latitude WGS 84 (World Geodesic System, 1984) projections, with the predicted woody plant foliar N:P ratios for mature leaves. Uncertainty maps were also provided for each element using the mean SE.

Generalized linear models

To test for associations between the soil, climate, and N and P deposition variables and N:P ratios, we selected the 10 most important variables, based on their NN variable importance, among which, a subset of the six least correlated variables was created and used to build generalized linear models (GLMs), with first-degree interactions following the gamma family distribution with inverse link. We then applied the dredge function in the *MuMIn* R package (Barton, 2019) to select the final models, based on the lowest Akaike information criterion, that comprised a maximum of six variables and interactions per model. The determined proportion of deviance explained by the GLM, or a pseudo- R^2 value, was calculated using the *Dsquared* function in the *modEVA* (Barbosa et al., 2015) R package.

Generalized linear mixed models

We used Bayesian generalized linear mixed models (GLMMs) in the *MCMCglmm* R package to understand the combined role of phylogeny and species compared with the roles of the soil,

Table 5.1 Neural network performance for all morphoclimatic groups. RMSE = Root mean squared error. MAE = Mean absolute error. SD = Standard deviation. CV = Coefficient of variation

| | Tropical | Temperate coniferous | Temperate broadleaves | Boreal |
|-----------------|-----------------|---------------------------------|----------------------------------|---------------|
| RMSE (%) | 7.077 | 3.622 | 5.619 | 1.918 |
| MAE (%) | 5.504 | 2.614 | 4.181 | 1.370 |
| Mean (%) | 20.698 | 14.442 | 18.827 | 12.346 |
| SD (%) | 1.972 | 1.453 | 1.677 | 1.730 |
| CV (%) | 0.095 | 0.101 | 0.089 | 0.140 |

climate, and deposition predictors used for the NN. For the NN predictors, we again selected the 10 most important variables for each forest type and element, based on their importance in the

NN, and created a subset of the six least strongly correlated fixed variables. For phylogeny, we used the phylogenetic tree provided by Qian and Jin (2015) that contained 744 of the species in our database; the species and their phylogenetic relations conformed to the random part of the models. The four models followed the form: $\text{element} \sim \text{var1} + \text{var2} + \text{var3} + \text{var4} + \text{var5} + \text{var6}$, $\text{random} = \text{phylogeny} + \text{species}$. The random variables, comprising species and phylogeny, describe the long-term evolutionary effects on genotypes, where phylogeny targets the response magnitude, due to phylogenetic distance, and species targets interspecific variability not directly related to phylogenetic distance.

5.2.3 Soil age

We used the USDA classification (Soil survey staff, 2014) of soil taxonomy at the order level to determine the influence of substrate age on woody plant foliar N:P ratios in the four forest types. We grouped the predicted N:P ratios from the NNs by their corresponding soil order and then compared the orders using ANOVA and Tukey's post hoc test with the `HSD.test` function in the *agricolae* (Mendiburu, 2020) R package; the results were visualized as violin plots by soil order, using `ggplot2` (Wickham, 2016) by mean descending order.

5.3 Results

5.3.1 Global distribution of woody plant foliar N:P ratios

Of the three approaches used to predict woody plant foliar N:P ratios, greatest predictive power, based on predicted vs observed R^2 , was provided by NNs ($R^2 = 0.69$; RMSE = 3.80) (Figure 5.1). The NNs predicted mean N:P ratios for the forest types were greatest in tropical forests (20.7 ± 2.0), followed by temperate broadleaved forests (18.8 ± 1.7), temperate coniferous forests (14.4 ± 1.5), and boreal forests (12.4 ± 1.7) (Table 5.1).

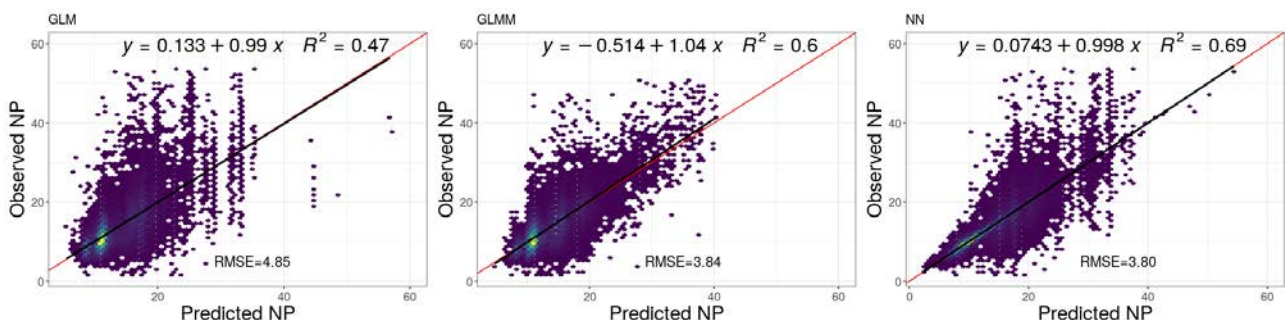


Figure 5.1 Predicted versus observed foliar N:P values across the four forest biomes estimated by generalized linear modelling (GLM), generalized linear mixed modelling (GLMM), and neural networks (NN). Black line is the fitted linear model between predicted and expected values; red line is line of unity.

The global distribution of woody plant foliar N:P ratios, based on NN predictions (Figure 5.2), confirmed lowest ratios are largely concentrated in boreal regions, particularly in northern Europe, as well as other regions, including India, northern Sub-Saharan Africa, and Patagonia. In contrast, regions with higher N:P ratios are generally located in the tropics and subtropics,

Table 5.2 Summary of the generalized linear model per morphoclimatic group.

| | | Estimate | Pr(> t) |
|-----------------------|---|-----------|----------|
| Tropical | (Intercept) | 0.050 | 0.000 |
| | Soil base saturation | 0.000 | 0.002 |
| | Soil cation exchange capacity | 0.001 | 0.000 |
| | Potential evapotranspiration seasonality | -0.001 | 0.000 |
| | Maximum December, January, February precipitation | -0.000 | 0.000 |
| | Soil base saturation:soil cation exchange capacity | -0.000 | 0.000 |
| | Soil base saturation:Potential evapotranspiration seasonality | 0.000 | 0.000 |
| | AIC / pR ² | 25536.497 | 0.230 |
| Temperate coniferous | (Intercept) | 0.045 | 0.000 |
| | Aridity index | -0.000 | 0.000 |
| | Potential evapotranspiration seasonality | 0.001 | 0.000 |
| | Maximum June, July, August precipitation | 0.001 | 0.000 |
| | Mean temperature of the driest quarter | -0.002 | 0.000 |
| | Aridity index:Mean temperature of the driest quarter | 0.000 | 0.000 |
| | Potential evapotranspiration seasonality:Maximum June, July, August precipitation | -0.000 | 0.000 |
| | AIC / pR ² | 61842.197 | 0.115 |
| Temperate broadleaved | (Intercept) | 0.087 | 0.000 |
| | Minimum June, July, August precipitation | 0.001 | 0.000 |
| | Daily mean solar radiation | -0.000 | 0.000 |
| | Precipitation of the driest month | -0.001 | 0.000 |
| | Precipitation of the driest quarter | -0.000 | 0.000 |
| | Minimum June, July, August precipitation:Daily mean solar radiation | 0.000 | 0.000 |
| | Daily mean solar radiation:Precipitation of the driest quarter | 0.000 | 0.000 |
| | AIC / pR ² | 35556.667 | 0.098 |
| Boreal | (Intercept) | 0.186 | 0.000 |
| | Maximum June, July, August precipitation | -0.006 | 0.000 |
| | Mean temperature of warmest quarter | -0.008 | 0.012 |
| | Precipitation of wettest quarter | 0.002 | 0.000 |
| | Maximum June, July, August precipitation:Mean temperature of warmest quarter | 0.000 | 0.000 |
| | Maximum June, July, August precipitation:Precipitation of wettest quarter | -0.000 | 0.000 |
| | Mean temperature of warmest quarter:Precipitation of wettest quarter | -0.000 | 0.000 |
| | AIC / pR ² | 8655.749 | 0.103 |

including Amazonia, southeast Asia, southern Sub-Saharan Africa, northeast China, and north, south west Australia.

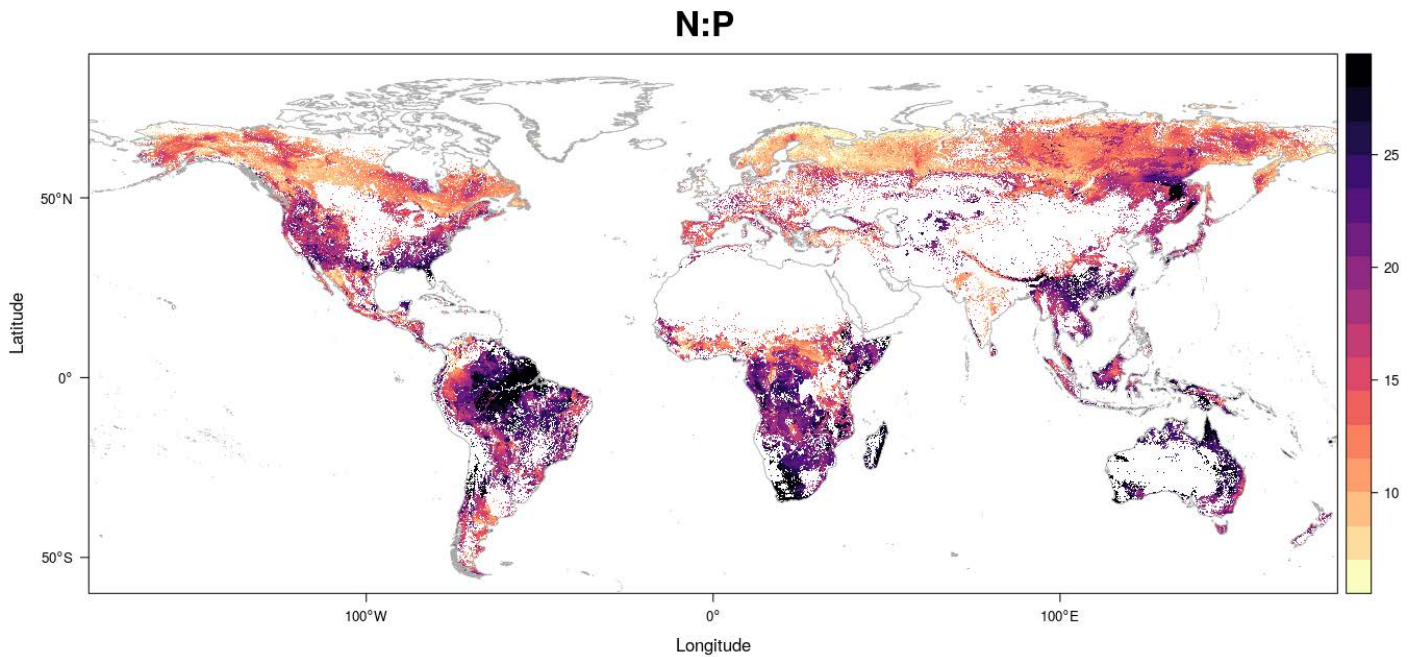


Figure 5.2 Predicted woody plant foliar N:P ratios across global forest biomes; unshaded areas indicate lack of data.

5.3.2 Environmental drivers of N:P ratios

The GLM used to test impacts of potential environmental drivers on woody plant foliar N:P ratios (Table 5.2) (global $R^2 = 0.47$ and RMSE = 4.85; Figure 5.1) showed positive relations with soil base saturation and soil cation exchange capacity in tropical forests and negative relations with potential evapotranspiration seasonality and maximum December, January and February precipitation (forest type $R^2 = 0.23$). In temperate coniferous forests (forest type $R^2 = 0.11$), there are positive relations with potential evapotranspiration seasonality and maximum June, July and August precipitation and negative relations with aridity index and mean temperature of the driest quarter, while in temperate broadleaf forests (forest type $R^2 = 0.10$), minimum June, July and August precipitation is positively related to foliar N:P ratios and daily mean solar radiation, precipitation of the driest month and precipitation of the driest quarter are negatively related to foliar N:P ratios; in boreal forests (forest type $R^2 = 0.10$), there is a positive relation with precipitation of the wettest quarter and negative relations with maximum June, July and August precipitation and mean temperature of the warmest quarter (Table 5.2).

5.3.3 Phylogenetic drivers of N:P ratios

The GLMM used to test impacts of phylogenetic drivers on woody plant foliar N:P ratios (global $R^2 = 0.6$ and RMSE = 3.84; Figure 5.1) showed that random factor variability (phylogeny and species) in N:P ratios is greater than for that of the fixed environmental factors. The variability in N:P ratios explained by phylogeny + species ranges from 40.2% for tropical forests to 82.7% for boreal forests, while variability explained by phylogeny ranges from 6.8% for tropical forests to 50.0% for

Table 5.3 Summary of generalized linear mixed model. Variability explained by for the whole model and by random and fixed part. Phylogeny, species and units belongs to random variability explained. $R^2c = R^2m + R^2$

| | R^2c | R^2m (fixed) | R^2 (random) | Phylogeny | Species | Units |
|------------------------------|--------|----------------|----------------|-----------|---------|-------|
| Tropical | 0.527 | 0.125 | 0.402 | 0.068 | 0.392 | 0.540 |
| Temperate coniferous | 0.832 | 0.005 | 0.827 | 0.500 | 0.331 | 0.169 |
| Temperate broadleaved | 0.692 | 0.019 | 0.672 | 0.387 | 0.299 | 0.315 |
| Boreal | 0.851 | 0.022 | 0.829 | 0.206 | 0.641 | 0.153 |

temperate coniferous and variability explained by species ranged from 29.9% for temperate broadleaf forests to 64.1% for boreal forests (Table 5.3).

5.3.4 Soil age as a driver of N:P ratios

Woody plant foliar N:P ratios vary among soil orders (Figure 5.3) and tend to be higher from Oxisols (mean = 19.1) that occur in tropical wet forests of south America and central Africa, followed by Ultisols (mean = 16.3) that occur in South-eastern Asia and in sparse spots in the tropical fringe. In contrast, lowest N:P ratios are found from Spodosols (mean = 11.4) that typically occur in cold and humid regions, such as Atlantic Europe, Scandinavia, and Canada, followed by

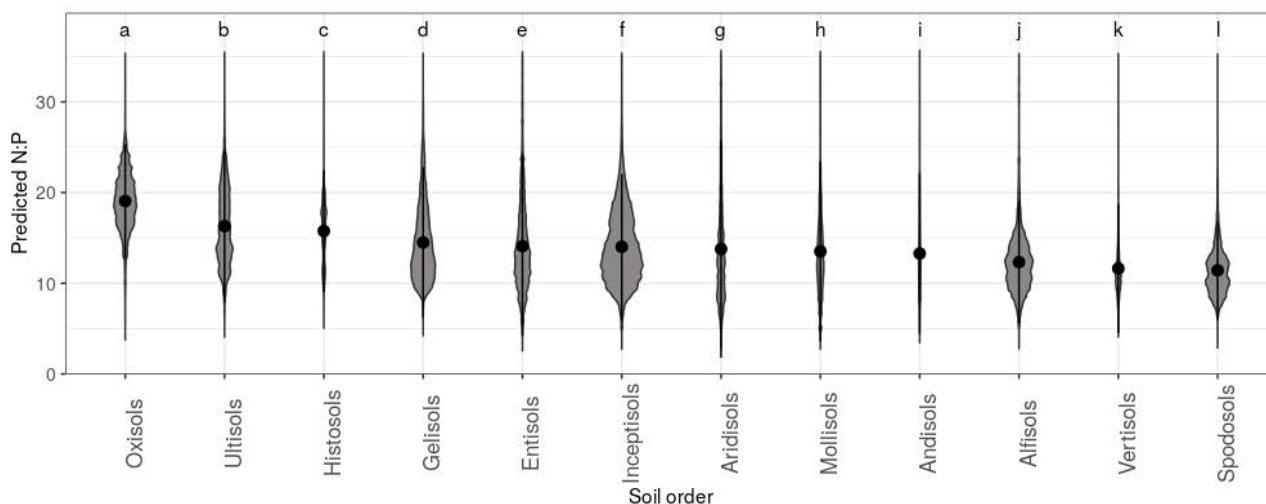


Figure 5.3 Variation in predicted global woody plant foliar N:P ratios among USDA soil taxonomy orders. Predicted values differ significantly among soil types ($P < 0.05$).

Vertisols (mean = 11.6), known to be conformed by expansive clay with high nutrient retention that occur in isolated zones with exchanging floods and drought periods such as east Australia, south India, Sudan between others.

5.4 Discussion

5.4.1 Global distribution maps of foliar N:P ratios

We constructed a high resolution global map of N:P ratios using NNs trained with environmental variables that identifies forest regions with N and P limitation, that play a role in the biogeochemical function of ecosystems. Although global foliar N and P maps are available (Butler et al., 2017; Moreno-Martínez et al., 2018; Vallicrosa et al., 2021), this is the first gridded N:P ratio map at the global scale constructed from an extensive N:P database using machine learning tools. We chose not to calculate global distribution of wood plant foliar N:P based on currently available N and P maps, because this approach would aggregate errors for each element and assume drivers of foliar N and P are the same as drivers of N:P ratios. Thus, we trained specific N:P ratio models to test for their drivers.

We found that our model predictions follow the substrate age hypothesis (Walker and Syers 1976), where foliar N:P ratios are high in the tropics and low at boreal latitudes (Chadwick et al., 1999; Vitousek et al., 2010) (Table 5.1); indeed, our results showed that woody plant foliar N:P ratios range from 12.34 in boreal forests to 20.70 in tropical forests. Given limitations of N and P limitation occur when N:P ratios are <10 and >20 , respectively (Güsewell, 2004; Greenwood et al. 2008), our results indicate that woody vegetation tends to be more P limited than N limited, supporting our predictions and concurring with results reported by Du et al. (2020) that showed 18% of the global terrestrial surface, excluding agricultural, urban, and glacial areas, was under N limitation while 43% was P limited, predominantly in the tropics.

At the regional scale, our model predictions support the old, climatically buffered and infertile landscapes theory (Hopper, 2009), which states these types of landscape, such as the Cape floristic region in South Africa and the Southwest Floristic Region of Australia, are characterized by high levels of P limitation (Lambers et al., 2008, 2010; Oliveira et al., 2015), as indicated by the high N:P ratios for southern Africa and southwest Australia. We also found differences in N:P ratios between temperate coniferous (mean = 14.4) and broadleaf forests (mean = 18.8) (Table 5.1) that may indicate successional differences, as many coniferous trees are typically fast-growing, early successional species, which require higher proportions of P than broadleaf species that tend to be slower-growing, late successional species, with lower requirements for P (Peñuelas et al., 2013; Sardans and Peñuelas, 2013; Busch et al., 2018).

5.4.2 Environmental drivers

Our decision to model environmental drivers of woody plant foliar N:P ratio by forest biome at the global scale was justified, because impacts of the drivers varied among biomes and with latitude, with apparently contrasting effects. For example, potential evapotranspiration seasonality was negatively related to foliar N:P ratios in tropical forests and positively related to those in temperate coniferous forests, while in temperate coniferous and broadleaf forests, low water availability, expressed in aridity index or precipitation levels, was negatively related with foliar N:P ratios;

these results may indicate that foliar N decreases in temperate latitudes under low levels of water availability (Sardans et al., 2008). In contrast to at temperate latitudes, greater levels of precipitation in boreal forests lead to lower N:P ratios, indicating that mineral leaching, which tends to affect the more mobile N than P, may be more of a constraint than water availability, particularly at these high latitudes where N is frequently more limiting than P. Foliar N:P ratios were related to soil properties only in tropical forests, supporting previous studies that have shown key links between soil properties and tropical foliar elemental composition (Both et al., 2018, Hernández-Vargas et al., 2019).

5.4.3 Genetic drivers

Phylogeny and species explained more variability in foliar N:P ratios than environmental factors for each of the forest biomes (Table 5.3), supporting previous studies in which genetic legacy effects were found to explain most of the variability in woody plant foliar N, P, and potassium concentrations at the global scale (Sardans et al., 2021; Vallicrosa et al., 2021). Genetic legacy effects are a product of long- and short-term evolutionary processes (represented by phylogeny and species, respectively), during which species adapt to shifts in abiotic and biotic stressors, caused by climate, soil, and interactions with other species. While phylogeny include ancient adaptation and differentiation from other clades, species include more epigenetic factors which, through evolutive convergence could generate similar N:P relations with different clades.

Most of the variance explained by the environmental factors in glm, was explained by genetic legacy effects in glmm. Genotypes are associated with particular soil and climatic traits, so phylogeny incorporates climatic and soil conditions to some extent. Indeed, strong genetic legacy signals for foliar elemental composition have recently been reported at local, regional, and global scales (Castellanos et al., 2018; de la Riva et al., 2017; Hu et al., 2018; Reimann et al., 2018; Sardans and Peñuelas, 2015, Sardans et al, 2015, 2016a), supporting studies of the biogeochemical niche hypothesis in plants (Peñuelas et al., 2008, 2010, 2019; Sardans et al., 2021) that have reported phylogeny and species, as proxies of overall genetic legacy, explain >75% of the variability in foliar elemental composition.

Disentangling single genetic legacy effects is problematic and highlights the large proportion of variability in boreal forest woody species N:P ratios that is explained by species (Table 5.3). Globally, boreal ecosystems contain some of the lowest levels of vascular plant diversity (Brummitt et al., 2020) and forests in these climate zones tend to be dominated by low numbers of coniferous species (Freedman, 1999). Thus, this high level of woody species homogeneity and associated low levels of species coexistence and interspecific competition are likely to lead to low levels of phenotypic plasticity and greater stability of foliar N:P ratios. In the other forest biomes, where levels of species diversity and heterogeneity are greater, it is likely that species foliar N:P ratios reflect levels of species coexistence (Peñuelas et al. 2019; Sardans et al., 2021), thus limiting the predictive power of phylogeny and species, as supported by our results that showed tropical forest foliar N:P ratios were least explained by these random factors.

Our study shows that forest species diversity and heterogeneity are key drivers of woody plant foliar N:P proportions, so we recommend their inclusion, along with environmental conditions in future studies of foliar N:P. To facilitate the inclusion of species in global-scale studies of N:P ratios, the Global Biodiversity Information Facility offers free, globally georeferenced species data that may be used in niche modeling of remotely sensed airborne imaging spectroscopy and laser imaging detection and ranging (LiDAR) data added to a clustering algorithm (Yi et al., 2020).

5.5 Conclusions

Our study provides the first global distribution maps of woody plant foliar N:P ratios and confirmation of their negative relation with latitude as a principal driver. Globally, forest biomes are more P limited than N limited, as suggested by previous studies. We found variation in effects of environmental drivers on N:P ratios among forest biomes, due to contrasting associated environmental pressures; these variations would have been masked in a single global “forest biome” analysis. Genetic legacy was a key driver of N:P variability and its inclusion in future studies of N:P ratios will lead to improved prediction of effects of global change on biogeochemical cycles and ecosystem function, including forest primary production, respiration, and C-cycling.

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6

Empirical support for the biogeochemical niche hypothesis in forest trees

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Abstract

The possibility of using the elemental compositions of species as a tool to identify species/genotype niche remains to be tested at a global scale. We investigated relationships between the foliar elemental compositions (elementomes) of trees at a global scale with phylogeny, climate, N deposition and soil traits. We analysed foliar N, P, K, Ca, Mg and S concentrations in 23,962 trees of 227 species. Shared ancestry explained 60–94% of the total variance in foliar nutrient concentrations and ratios whereas current climate, atmospheric N deposition and soil type together explained 1–7%, consistent with the biogeochemical niche hypothesis which predicts that each species will have a specific need for and use of each bio-element. The remaining variance was explained by the avoidance of nutritional competition with other species and natural variability within species. The biogeochemical niche hypothesis is thus able to quantify species-specific tree niches and their shifts in response to environmental changes.

6.1 Main

The ‘niche’ theory is fundamental to ecology, because niches are both drivers and consequences of evolutionary processes^{1,2,3,4}. The concept is easy to understand theoretically: each species tends to occupy a particular position along the gradients of all abiotic and biotic variables that define and determine fitness. This view is consistent with the niche concepts defined by Tracy and Christian¹, Wright et al.⁵ and Swanson et al.⁶, among many others, where the niche is directly associated with a multivariate space. Accurate measurement of the exact parameters of a niche, however, is challenging due to the large number of variables that affect organisms within ecosystems. Several approaches have been developed in recent decades to more easily manage this complex and multivariate concept—for example, niche regeneration⁷ and functional

niche^{8,9,10}. A more general and easier method to define and measure species niches using field data, however, is needed.

The recently proposed biogeochemical niche (BN) hypothesis^{11,12,13} incorporates most, if not all, niche parameters using species-specific elemental composition and stoichiometry. The assumptions underlying this hypothesis are based on the idea that each species is a unique genetic pool of individuals and a product of long-term evolutionary processes, so that each species should have a specific morphological structure and functionality (from gene expression to physiological processes). Fundamental biological processes (for example, growth, secondary metabolism, reproduction and storage of bio-elements) have distinct rates in different species depending on selection pressures, so different species must differentially allocate elements to various traits of tissues and organs. Each species should thus tend to have its own elemental composition and stoichiometry (homeostatic component of BN). The changing circumstances during the lives of organisms, however, should also determine a necessary phenotypical plasticity to allow the individuals of each species to adapt its functionality and morphology during their lives (plasticity component). This ability differs in extent and quality among species. BN plasticity depends on the current genotypic and thus genetic variability of a population, and also on the phenotypical plasticity of individuals to respond to environmental shifts throughout their lives. The BN hypothesis allows us to detect plasticity at two levels: (1) within populations due to the intraspecific variability in elemental composition of a set of individuals of the same species living under the same environmental conditions at a specific time (for example, due to individual genotypic differences or different ontogenetic stages), and (2) at the individual level (phenotypic plasticity), by indicating how each individual of a population varies its elemental composition when environmental conditions shift¹³.

The BN hypothesis is useful for representing the ecological niche of each species in a hyperdimensional volume generated by different bio-elemental concentrations and stoichiometric relationships, which could be simply and practically tested by a combined chemical and mathematical approach using multivariate and phylogenetic analyses¹³. The position of each species in the hyperdimensional volume can shift with time and changing environmental conditions, depending on the degree of species-specific stoichiometric plasticity (plasticity component), but the BN hypothesis should also tend to maintain its own identity relative to the BNs of other species (homeostatic component)¹³. BN space at a specific time should therefore be a consequence of historical and current trends toward maximization of fitness in response to abiotic and biotic circumstances such as trophic relationships and water, light or nutrient availabilities and fluxes^{13,14,15}. The various levels of plasticity among species can be detected because homeostatic species will occupy a smaller volume in multidimensional space, and plastic species will occupy a larger volume¹³. For example, comparing the movement/expansion/contraction of the BNs of two populations of different species or genotypes submitted to the same environmental shifts will thus provide information about their levels of BN plasticity¹³. The temporal shifts of the BN of a species or population can also be calculated, so we can follow the

signatures of evolution on the BN. BNs also allow us to describe and quantify the expansion, contraction and extinction of niches and the appearance of new niches (for example, when new species colonize an ecosystem)¹³. The BN hypothesis, however, has been experimentally tested only at small spatial and phylogenetic scales^{11,12,13,14,15,16,17}.

We aimed to test the BN hypothesis in forest trees across all forest biomes and continents (Extended Data Fig. 1). Our study is based on the elementome of leaves, the plant organ where most compounds (from those allocated to growth or reproduction to those allocated to energy metabolism, defence or storage) are synthesized and where photosynthesis, the most crucial plant function, occurs. Leaves thus constitute a key organ in plant functioning, and we can define the ‘species biogeochemical niche’ for each species in its environmental circumstances by analysis of changes in foliar elemental composition. We built a global data set to test the extent to which (1) shared ancestry, (2) abiotic factors (for example, climate, N deposition and soil traits) and (3) biotic factors (for example, composition of the community inhabited by a tree) affect the BN. We hypothesized that each species would have a different need and use for each bio-element to optimize function, and thus that shared ancestry would account for a large part of the foliar elemental composition in a wide set of data from a broad spectrum of species. Species, however, also evolve to some degree during fluctuating environmental conditions, so some of the variability in elemental composition should be due to the phenotypic component and thus to current abiotic and biotic conditions such as climate, soil type, atmospheric N deposition and competition, which should account for another part of the variability of elemental composition. We thus expected to demonstrate the suitability of using the elemental compositions of organisms, the elementome¹³, to define species-specific ‘niche differences’ in a tangible and measurable way, providing a valuable tool for establishing and identifying species niches.

6.2 Results

6.2.1 Phylogeny and BN size

The analysis of Pagel’s λ identified significant phylogenetic signals in foliar N, P, K, S, Ca and Mg concentrations, N/Ca, N/Mg, P/Ca, P/Mg, P/S, K/Ca and K/S ratios and the scores of the first six principal component analysis (PCA) axes (Supplementary Table 1, Figures 6.1–6.4, Extended Data Figs. 2–5 and Supplementary Figs. 1–9), with Pagel’s λ values in several variables >0.5 . These variables significantly tended to be more similar in the clades of more recently separated species than in those of more phylogenetically distant species, thus demonstrating that the divergence of the values of the variables among clades over time was largely and significantly driven by evolutionary processes. For example, foliar N concentrations were significantly more similar among Pinaceae species than between Pinaceae and Fagaceae species, with Pinaceae species generally having lower values than Fagaceae species (Figure 6.1). The phylogenetic signals using Pagel’s λ were generally more similar in the subset of the database that also contained information for foliar C concentrations (7,479 datapoints representing 138 species) than in the

general database without foliar C concentrations (Supplementary Tables 2 and 3 and Supplementary Figs. 10–14). Of the 33 variables studied, only the foliar C/K ratio did not have a significant λ . Furthermore, these Pagel's λ values were high (>0.6 for most of the nutrient variables) (Supplementary Table 2).

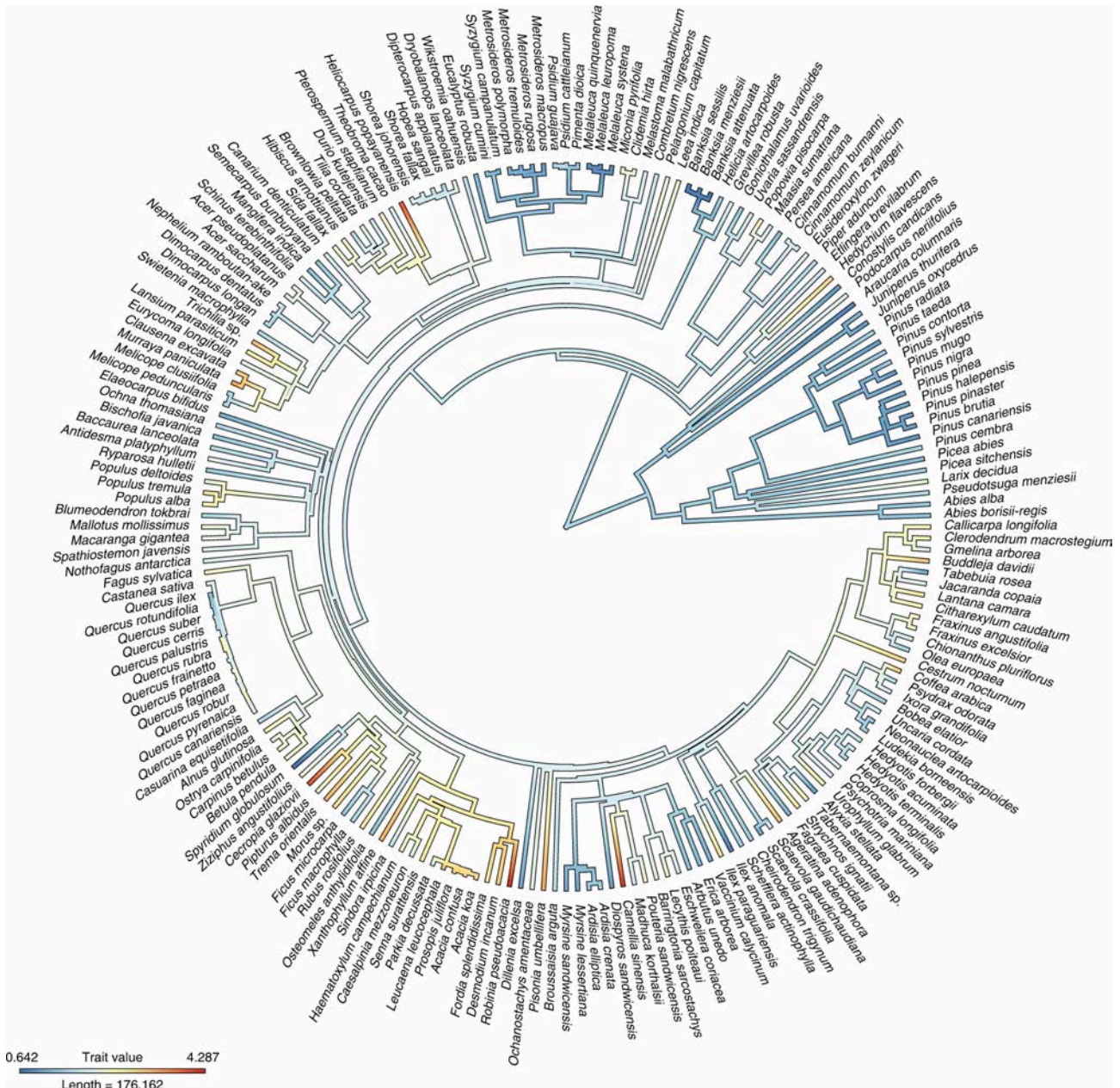


Figure 6.1 Phylogenetic diagram of foliar N concentration (percentage of dry weight) (25,112 datapoints) in the phylogenetic tree.

The range of values in a functional discriminant analysis (FDA) (mainly along root 1, which explained 90.8% of the total variance) that represented the sizes of species-specific BNs was significantly larger for the species subjected to lower climatic stress (*Quercus robur* and *Quercus petraea*) than for Mediterranean species adapted to drought (*Pinus halepensis*, *P.*

pinaster and *Quercus ilex*) (Figure 6.5 and Supplementary Tables 4 and 5). These five species were the most abundant in our survey and were clearly separated in the multivariate space by significant distances (squared Mahalanobis distances; Supplementary Table 4) and in all foliar variables that significantly contributed to the separation of all species (Supplementary Table 5). We also detected a strong phylogenetic effect in the distribution of scores along the first three root axes of the FDA (Supplementary Table 6).

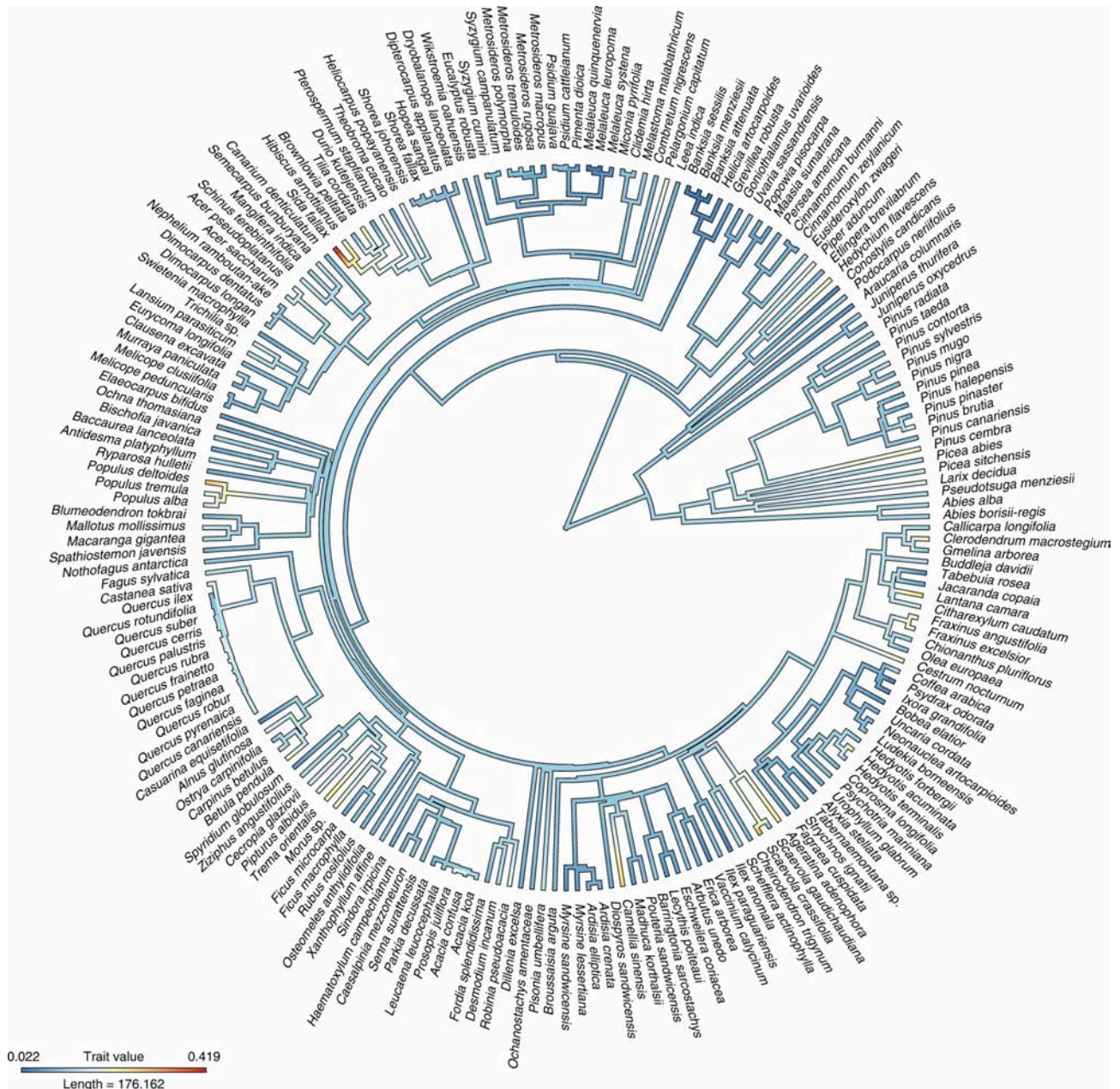


Figure 6.2 Phylogenetic diagram of foliar P concentration (percentage of dry weight) (25,112 datapoints) in the phylogenetic tree.

6.2.2 Abiotic factors

Climate, N deposition and soil type

Phylogeny explained significantly most of the variance in foliar elemental composition: 58.7–91.7% (mean 80.9%) of the variance in foliar concentration of the six bio-elements, 39.0–94.1% (mean 68.8%) of the variance in their pairwise ratios and 43.2–89.6% (mean 74.0%) of the variance in the scores of the first three axes of a PCA (Supplementary Table 7). Species significantly explained 1.4–14.6% (mean 5.58%) of the variance in foliar concentrations of the six bio-elements, 0.4–28.1% (mean 8.1%) of the variance in pairwise ratios and 0.6–13.8% (mean 5.07%) of the variance in the scores of the first three PC scores. Inheritance thus significantly

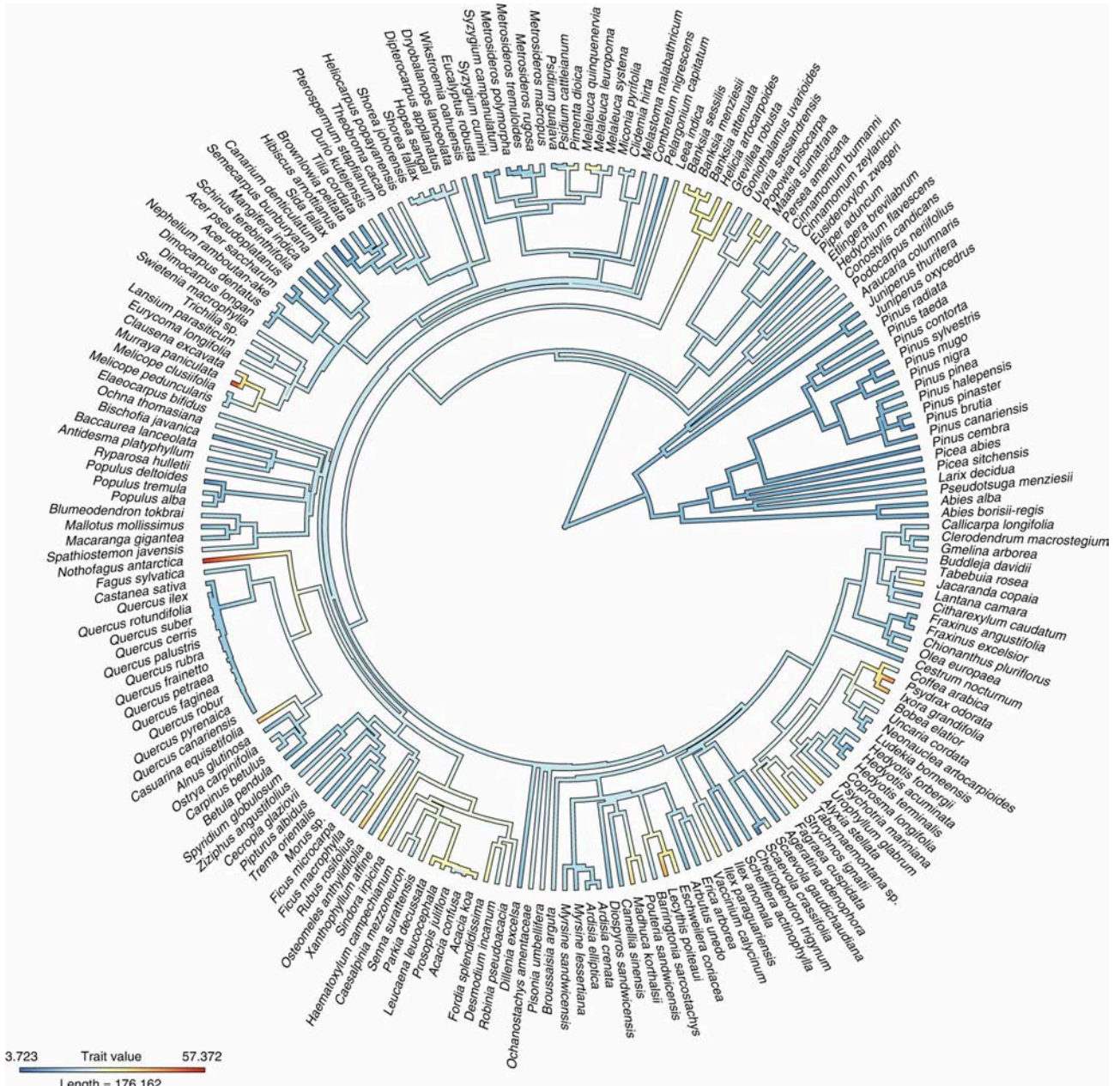


Figure 6.3 Phylogenetic diagram of foliar N/P ratio (25,112 datapoints) in the phylogenetic tree.

explained 73.3–93.6% (mean 86.5%) of the variance in foliar concentration of the six bio-elements, 67.1–94.5% (mean 81.7%) of the variance in their pairwise ratios and 57–90.2% (mean 79.1%) of the variance in the scores of the first three PCs.

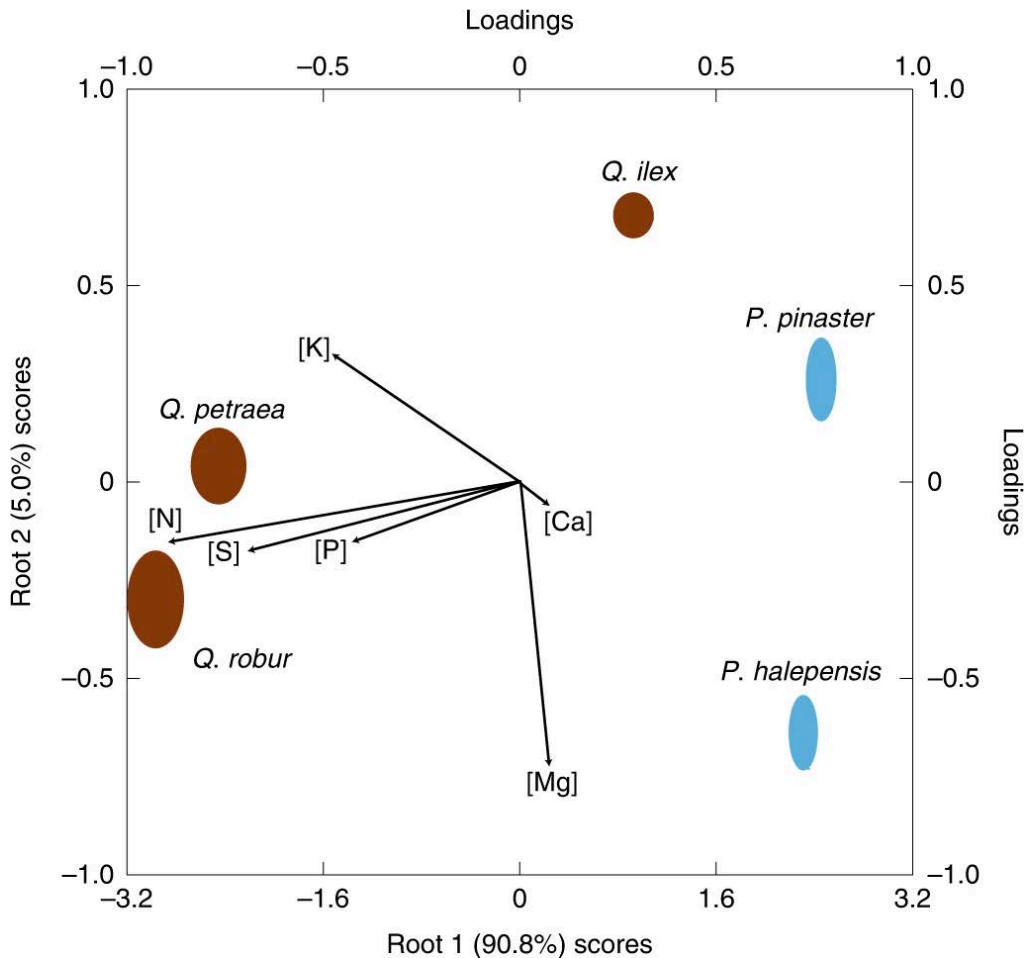


Figure 6.5 Plot of the first two roots of functional discriminant analysis using *P. pinaster*, *P. halepensis*, *Q. ilex*, *Q. petraea* and *Q. robur* as dependent categorical grouping factors, and foliar N, P, K, S, Ca and Mg concentrations and pairwise ratios as continuous independent variables.

with MAP and N deposition on overall foliar elemental composition, as indicated by the PC1 scores (Supplementary Table 7).

Higher precipitation was significantly associated with lower foliar concentrations of metal elements (K, Ca and Mg) and P and was significantly and positively correlated with foliar N and S concentrations (Supplementary Table 7). MAT was correlated significantly and positively with foliar N and metal (K, Ca and Mg) concentrations and N/P ratio, and negatively with foliar P concentrations. N deposition was correlated positively with foliar N, P and S concentrations and negatively with foliar Ca, Mg and K concentrations.

Soil type explained a low but significant percentage of the variance in elemental composition and ratios (Supplementary Table 8), ranging between 0.1% for the foliar P/S ratio to 2.0% for foliar K concentrations. A PCA, however, indicated that trees growing in different soil types occupied significantly different areas of the two-dimensional plot of the first two PC axes (Figure 6.6) and that this distribution was mainly explained by phylogeny ($R^2=0.72$, 0.84 and 0.87

for PC1, PC2 and PC3 scores, respectively) (Supplementary Table 8). Trees growing on Inceptisols and Alfisols, typical of temperate forests, occupied a central position in this space. Trees growing in Alfisols, typical of wet and mesic temperate forests, had intermediate foliar N and K concentrations and the second highest foliar P concentration (Extended Data Fig. 6), with intermediate foliar N/P, N/K and P/K ratios (Extended Data Fig. 7). Trees growing in Spodosols, very common in boreal and alpine coniferous forests, had the highest P and lowest K foliar concentrations (Extended Data Fig. 6) and thus the highest foliar P/K ratios (Extended Data Fig. 7). Trees growing in Oxisols, typical of wet tropical forests, had the second highest foliar N concentrations and the lowest foliar P concentrations (Extended Data Fig. 6), the highest foliar N/P and N/K ratios and the lowest foliar P/K ratio (Extended Data Fig. 7).

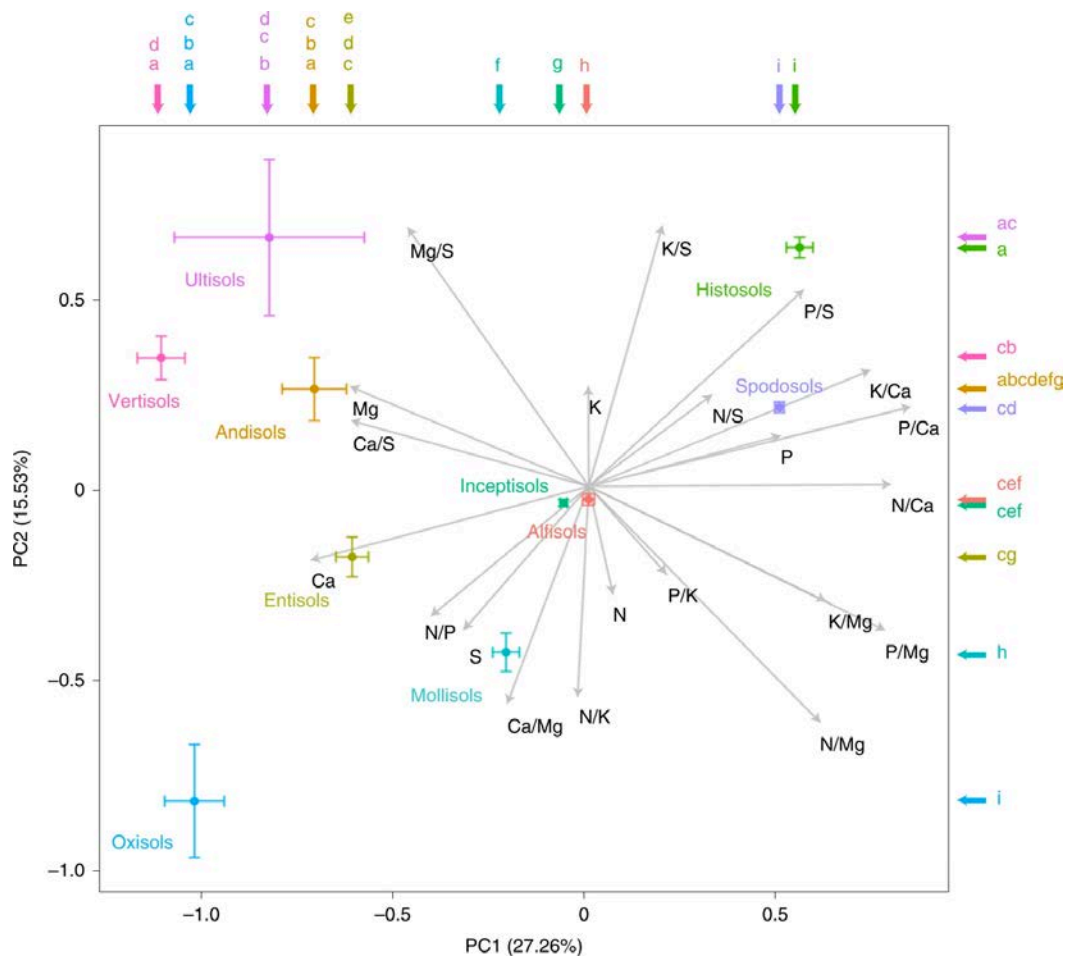


Figure 6.6 Plot of PCA cases and variables superimposed, defined by the first two components of the PCA, with foliar N, P, K, Ca, Mg and S concentrations as variables and with soil orders as cases.

6.2.3 Biotic factors

Competition of foliar elementomes among coexisting species

Foliar N and P concentrations, the N/P ratio and the scores for the first two PCA axes for species frequently shifted significantly when the distributions of two species overlapped. These

differences usually explained little of the variance in foliar variables, but they were statistically significant (Supplementary Tables 9–15). For example, foliar N and P concentrations, the N/P ratio and the scores for the first two PCA axes differed significantly when *Pinus abies* grew in areas with and without *Q. robur* (Extended Data Fig. 8a), although the percentage of explained variance was $\leq 3.5\%$ (Supplementary Table 9). These shifts were reciprocal. Foliar P concentrations, N/P ratios and PC1 scores also differed significantly between subsets of *Q. robur* growing in areas with and without *P. abies* (Extended Data Fig. 8a and Supplementary Table 10), explaining a maximum of only 5% of total variance. Foliar P concentrations, N/P ratios and PC1 scores differed significantly between *Abies alba* coexisting or not with *Q. petraea* (Extended Data Fig. 8b and Supplementary Table 11), explaining a maximum of 5% of total variance, and foliar N and P concentrations, N/P ratios and PC1 scores differed significantly between *Q. petraea* coexisting or not with *A. alba* (Supplementary Table 12), explaining a maximum of 4% of total variance. Foliar N concentrations and PC1 scores differed significantly between *Fagus sylvatica* growing in areas with and without *Pinus sylvestris* (Extended Data Fig. 8c and Supplementary Table 13), explaining a maximum of 2% of total variance. Foliar N and P concentrations, N/P ratios and PC1 scores differed significantly between *P. sylvestris* growing in areas with and without *F. sylvatica* (Extended Data Fig. 8c and Supplementary Table 14), explaining a maximum of 1% of total variance. The percentage of variance explained for some variables was much higher in some cases—for example, 17% for the foliar N concentration of *P. sylvestris* growing with or without *Q. robur* (Supplementary Table 14) and 35% for the foliar P concentration of *Larix decidua* growing with or without *Q. robur* (Supplementary Table 15).

6.3 Discussion

6.3.1 BN size and phylogeny

Use of the foliar concentrations of several bio-elements significantly separated the species in the hypervolume generated by the corresponding multivariate analyses, as previously reported only in smaller studies^{11,12,13,14,15,16,17,18}. The FDA plot (showing 95.8% of total explained variance) clearly separated the BNs of species, with *Pinus* species having positive values on root 1 and *Quercus* species having more negative values, also consistent with the positive link between phylogenetic distance and species-specific BN identity among species.

The elements N, P, K, S, Ca and Mg contribute differentially to plant metabolic and physiological functions and to cells, tissues and organs. We therefore expected that different species, as evolutionary products, would have different optimal elementomes^{11,12,13,14}. The results of our analysis on the global set of 227 of the most representative tree species worldwide (163, 58 and 6 from tropical, temperate and boreal biomes, respectively) strongly support this hypothesis. The results also indicated that foliar BNs of the species became more similar as their

phylogenetic distance decreased. These results are fully consistent with Kerkhoff et al.[19](#), who also found a consistent and significant phylogenetic signal in N and P concentrations in plant organs in a set of 1,287 plant species. A small number of published studies of BNs, all including fewer species, has also reported significant organ or body stoichiometric dependence on taxonomy and/or phylogeny of plant and animal species, although not all studies detected links between species phylogeny and N/P ratios[13,14,15,20](#). The great majority of the studies nevertheless found significant relationships between species' elemental composition and taxonomic and phylogenetic distance[13,14,15,20](#). Similar results have also been obtained in ionomic studies[21](#).

Phylogeny and species, as proxies of overall genomic difference, however, did not explain 100% of variability in the elementome. Some of the phylogenetic lines of distant clades may have been exposed to similar environmental conditions that would have driven parallel selection of the characteristics that determine elemental concentrations, consequently eliciting convergence to more similar elementomes than would be expected from their phylogenetic distance. In other words, species that are phylogenetically distant (for example, those that have developed on different continents but under current similar environmental conditions) may occupy a similar BN. For example, a change toward a warmer climate can increase the speed of evolution of several characters differently in different species[5,22,23](#). Several other factors, such as species migration, changes in species interactions (for example, with herbivorous or parasitic species) and climatic convergence, can increase the speed of evolutionary convergence among species in different clades[24,25,26](#). Distant clades could thus evolve under new, more similar, environmental conditions, favouring a trend toward convergence in functionality and thus in elementome. The results nevertheless indicated that evolutionary processes have significantly contributed to differences in foliar elementomes that originated during species diversification, directly explaining 57–94.5% (average 85.7%) of the variance in foliar concentrations and ratios. Anacker and Strauss[27](#) also reported that niche differences among species increased with phylogenetic distance, again consistent with our results. Part of the inheritability factor that differs from phylogeny explained an average of about 7% of variance in the variables studied, perhaps due to the recent divergent evolution of more proximal taxonomical species adapting to distinct and divergent environmental shifts in their respective distribution areas.

6.3.2 Climate and N deposition

Several studies have reported trends in foliar N and P concentrations and N/P ratios in trees growing along climatic and latitudinal gradients[28,29,30,31](#), but their results have not always fully agreed. Most studies have observed a general trend toward decreasing foliar and litter P concentrations and increasing N/P ratios as latitude decreased and MAT, MAP and length of growing season increased[28,29,30,31,32,33,34](#). Not all studies, however, have detected clear patterns of N/P ratios among or within climatic areas[33](#). Townsend et al.[34](#) and Lovelock et al.[35](#),

for example, found no relationship between N/P ratio and either latitude or MAP in tropical areas. Even when a significant relationship was detected in these studies, climatic variables explained only a small fraction of the variation in foliar elements—for example, 16–25 and 5–35% reported by Yuan and Chen³¹ and Reich and Oleksyn²⁸, respectively, depending on the variable. These studies used linear models that considered only climatic variables and N deposition without phylogeny and species as random factors. The variance explained by climatic variables in our study decreased in our Bayesian analyses when we added species as a random factor (0.3–11.0%, with a mean of 4.3% among all variables) (Supplementary Table 6).

Our results thus indicate significant relationships of foliar nutrient composition with N deposition and basic climatic traits such as MAP and MAT at a global scale. A decrease in foliar P concentrations and an increase in foliar N concentrations and N/P ratios with increasing MAT are consistent with the higher N and lower P concentrations in plants frequently observed toward equatorial latitudes. We also identified a general and significant relationship of foliar concentrations of the main macronutrients with N deposition. Lower foliar metal concentrations with higher levels of N deposition are totally consistent with the higher leaching of soil bases associated with N deposition and with competition among bases for plant absorption with ammonium³⁶. Higher foliar N and S concentrations with increased N deposition are also due to the consequent higher availability of soil N and S^{37,38}. Interestingly, we also identified a globally positive correlation between higher levels of N deposition and higher foliar P concentrations when local studies reported all types of results, from increases to decreases in foliar P concentrations. Increases in P concentrations have been associated with higher capacities of plants and microbes to mobilize and take up more P due to higher N availability^{39,40}. Lower foliar P concentrations under higher N loads, however, have been associated with stronger P limitation^{41,42,43}. Our results thus indicated that N deposition in forests at the global scale significantly tends to increase foliar P concentrations but also N/P ratios, thus generally trending toward more P-limited forests.

6.3.3 Soil type

Soil type explained a modest but significant amount of variance (0.1–2%) in tree foliar composition and stoichiometry. In fact, soil type and its capacity to supply some of the most important bio-elements to plants is partially due to historic and current climatic conditions. Species foliar elementomes were consistent with the traits of the various soil types (Figure 6.6). Trees growing in Inceptisols and Alfisols, typical of temperate forests, occupied a central position in the PCA space, suggesting a more balanced elemental composition than trees growing in other soil types. Trees growing in Andisols and Vertisols, two soil types rich in readily weathered minerals such as Ca²⁺ and Mg²⁺ (refs. 44,45), typically had higher than average foliar Ca and Mg concentrations. Andisols are volcanic soils that are frequently rich in Fe-Mg silicates and in anorthite, a Ca feldspar. Entisols are characterized by high concentrations of expandable clays such as vermiculite and montmorillonite that are also rich in Mg and Ca, respectively. Trees

growing in Spodosols (typical of sandy soils) had the lowest concentrations of Ca, Mg and K, which could be linked to the high leaching of basic cations in these acidic soils and, consequently, the low content of exchangeable complexes and slow mineralization. Trees growing in Spodosols also had the highest foliar P concentrations (Supplementary Fig. 10) and thus the highest foliar P/K ratios. Trees growing in Oxisols (wet tropical forests) had the second highest foliar N concentrations, the lowest foliar P concentrations, the highest foliar N/P and N/K ratios and the lowest foliar P/K ratio (Supplementary Fig. 11). These results for Oxisols are consistent with recent observations of low foliar P concentrations and high foliar N/P ratios in wet tropical forests^{28,32}. Our global study thus associates high foliar N/K and low foliar P/K ratios with wet tropical forests. Relationships between foliar BN and soil type along natural gradients have recently been observed⁴⁶, but these relationships may not be as strong as expected and may not necessarily be universal. Ordoñez et al.²⁹ observed that the concentrations of some elements and ratios were correlated between soil type and photosynthetic tissues but that others were not.

6.3.4 Competition among coexisting species

Foliar N and P concentrations, N/P ratio and scores for the first two PCA axes for species shifted significantly when the distributions of two species overlapped. These differences usually explained little of the variance in foliar elemental concentrations and ratios but were significant (Supplementary Tables 8–14). For example, foliar N and P concentrations, N/P ratio and scores for the first two PCA axes differed significantly when *P. abies* grew in areas with and without *Q. robur*, although the percentage of explained variance was $\leq 3.5\%$ (Supplementary Table 8). These shifts were reciprocal and occurred for pairs of tree species that were the most dominant in Europe (Supplementary Tables 8–14). These results from field analyses are consistent with those of an experiment in seminatural grasslands where the target species shifted their elemental compositions depending on neighbouring species¹⁷.

6.3.5 Homeostasis versus plasticity

Intraspecific variability explained a significant amount (2–20%) of the total random variability of all elemental concentrations and ratios (Supplementary Tables 6 and 7). Species that have evolved in highly fluctuating environments are expected to have a greater capacity of functional and/or morphological shifts and thus require a more plastic stoichiometry than species that have evolved in a more stable environment^{13,39}. Our results confirmed these expectations: the range of values in the FDA that represented the sizes of species-specific BNs was higher ($P < 0.001$ along roots 1 and 2) for species subjected to less climatic stress (*Q. robur* and *Q. petraea*) than for the Mediterranean species adapted to drought (*P. halepensis*, *P. pinaster* and *Q. ilex*) (Figure 6.5 and Supplementary Tables 5 and 6). These results indicated a trade-off between adaptation to being competitive in a stable environment versus being successful in a more fluctuating environment.

Different levels of environmental stress cause a continuum of strategies between homeostasis and plasticity. Species growing in more stressful environments and with poor resource availability have less BN plasticity than those growing in less stressful and richer environments^{47,48}.

6.4 Conclusions

The results of this study provide clear support for the BN hypothesis¹³. First, each species had a different BN, with a significant trend of larger differences in BNs as phylogenetic distance and evolutionary time increased. Recent evolutionary convergence due, for example, to recent adaptation of distant clades to similar soil or climatic environments, however, indicated that the differences in BN among species could not be fully resolved by phylogenetic analyses alone. Second, environmental factors such as climate and soil type also explained an important part of the intraspecific variance in BN. These effects were moderate but significant and independent of taxonomy. Each species could be represented by its specific space in the hypervolume generated by multivariate analysis of its foliar elemental composition and stoichiometry (elementome), so its specific plasticity was observed in the shift of its space in response to environmental changes. Third, coexisting, competing species tended to have distinct BNs to minimize competitive pressure. Fourth, a trade-off between adaptations to being competitive in a stable environment versus being successful in a more fluctuating environment generated a continuum of strategies between homeostasis and plasticity.

6.5 Methods

6.5.1 Data acquisition

Foliar data

We gathered 23,962 datapoints of foliar N, P, K, Ca, Mg and S concentrations, expressed as percentage dry weight. These data corresponded to 227 tree species at a global scale, including all latitudes and ecosystems. We considered only those tree species with more than three locations. The data were obtained from 192 publications (Supplementary Table 1) and inventories such as the Catalan Forest Inventory⁴⁹. We also gathered and used a subset of 7,479 datapoints with 138 species that included information on foliar C concentration, in addition to foliar N, P, K, Mg, Ca and S concentrations, for identification of possible differences in the analyses with or without C concentrations. All data were obtained from leaves using comparable and homologated analytical methods (see the ICP forests manual, *Sampling and Analysis of Needles and Leaves*, <http://icp-forests.net/page/icp-forests-manual>). The N, P, K, S, Ca and Mg pairwise ratios were calculated on a mass basis. Nutrient concentrations for the same species from different databases were analysed using mixed models, with database as a fixed factor and country as a random factor; no significant differences were found. All foliar samples were collected between

1990 and 2015. We used data derived from georeferenced plots only; Supplementary Fig. 1 shows the distribution of those plots.

Data for climate, soil and N and P deposition

Climatic and soil data were added to the foliar stoichiometric data using the raster package in R (v.2.6–7). These data were obtained from the WorldClim 2.0 database⁵⁰, with a resolution of 1 km² at the equator: minimum average temperature, maximum average temperature, average solar radiation, maximum wind speed, average wind speed, mean water vapour pressure, MAT, mean diurnal range, isothermality, temperature seasonality, maximum temperature of the warmest month, minimum temperature of the coldest month, annual temperature range, mean temperature of the wettest quarter, mean temperature of the driest quarter, mean temperature of the coldest quarter, MAP, mean precipitation of the wettest month, mean precipitation of the driest month, mean precipitation seasonality, mean precipitation of the wettest quarter, mean precipitation of the driest quarter, precipitation of the warmest quarter and precipitation of the coldest quarter. This climatic model was calculated for a long meteorological time series (1970–2000) based on interpolated values of climatic data provided by meteorological stations throughout the territory and adjusted to the observed topography. Five aridity indices were calculated using the climatic data^{51,52,53,54}.

The data for the deposition of atmospheric N and P were obtained from Global Threats to Human Water Security and River Biodiversity⁵⁵, with a resolution of 1 km² at the equator. Soil taxonomies (order and suborder) were obtained from the USDA Global Soils Region Map (https://www.nrcs.usda.gov/wps/portal/nrcs/detail/soils/use/?cid=nrcs142p2_054013), which provides a resolution of 1 km² at the equator.

6.5.2 Phylogenetic and statistical analyses

Phylogenetic signal

We prepared a phylogenetic tree containing the species in our database to test for phylogenetic signals using R statistical software⁵⁶. We thereby obtained a phylogenetic tree containing a selection of species from PhytoPhylo, an available megaphylogeny of vascular plants⁵⁷. We used the `read.tree` and `drop.tip` functions from the `Rape` package⁵⁸ to load the PhytoPhylo tree and removed all species that were not in our database.

We used the `phylosig` function from the R `phytools` package⁵⁹ to test for phylogenetic signals in the foliar elemental compositions of species and therefore to determine the extent to which foliar N, P, K, S, Ca and Mg concentrations, pairwise ratios and PCA scores had phylogenetic signals. The `phylosig` function calculates statistics of a phylogenetic signal (Pagel's λ) and *P* values based on the variance in phylogenetically independent contrasts relative

to tip shuffling randomization⁶⁰. We chose to analyse phylogenetic signals in the data using Pagel's λ assumption, based on a study by Münkemüller et al.⁶¹ comparing the advantages and disadvantages of various methods for estimation of phylogenetic signals. Pagel's λ method can provide reliable measurements of effect size and discriminate between more complex models of trait evolution (such as polygenic organismic traits)⁶². Mean λ in Pagel's method does not change as the number of species in a phylogeny increases, and is recommended for large phylogenies with >50 species (or taxa)⁶³, unlike other methods.

We also used the contMap function of the phytools package to graphically reconstruct the values of traits with a phylogenetic signal across our phylogeny. We used the ape package⁵⁰ to load the phylogenetic tree and select the species included in it. The contMap function estimates the ancestral characters at internal nodes using maximum likelihood and assuming Brownian motion as a model for trait evolution⁵⁵, and then interpolates the ancestral condition along the branches of the tree⁶⁴

BN size

Another interesting trait when comparing taxa is BN size. We thus conducted FDA to determine whether different but closely related species typical of different environments (from more to less climatic stress) tended to have different BN sizes. We compared five of the most important forest species in Europe: *Q. petraea*, *Q. robur*, *Q. ilex*, *P. pinaster* and *P. halepensis*. All five species were represented at 600–800 sites in our database across their distributions. FDA is a multivariate analysis that derives optimal separation between groups (in this case, the different sets of individuals of each species) by maximizing between-group variance and minimizing within-group variance of the set of independent continuous variables used in the analysis (in this case, foliar N, P, K, S, Ca and Mg concentrations and their pairwise ratios)⁶⁵. We compared the range of scores in the first two roots of the FDA as a measure of the size of the 'niche space' of each species. The first two roots of the FDA explained 95.8% of variance in the foliar elemental composition of the various species. We then analysed the roles of phylogeny and species in the dispersion of canonical scores on the root axes of the FDA using Bayesian phylogenetic linear mixed models and the MCMCglmm package⁶⁶ in R. Phylogeny and species were included as random factors: the phylogenetic term accounted for variability in the shared ancestry while the species term accounted for species-specific traits independent of shared ancestry.

Analysis of the relationships of foliar elemental composition with climatic variables and N deposition

We tested the effects of climate and N deposition on the foliar concentrations of bio-elements, their ratios and PC scores (from the PCA of all elemental foliar concentrations and their pairwise ratios) using Bayesian phylogenetic linear mixed models and the MCMCglmm package⁶⁶ in R.

We used MAT, MAP, annual radiation, mean annual vapour pressure deficit, range of diurnal temperatures and N deposition as fixed effects. Phylogeny and species were included as random factors: the phylogenetic term accounted for variability in shared ancestry while the species term accounted for species-specific traits independent of the shared ancestry. Both random factors together thus accounted for variance explained by heritability. We repeated these analyses using soil type rather than climate and N deposition as fixed effects.

Analysis of the relationships between foliar elemental composition and soil type

We analysed differences in foliar variables among the various soil types (taxonomic orders). A soil map was generated using the R packages raster and rgdal to obtain soil classification for each sample location. We chose soil type (orders of soil taxonomy) as the most accurate taxon at the pixel scale in the USDA Global Soils Region Map. No data were found for Gelisols or Aridisols. We tested the effect of soil order on the foliar concentration of bio-elements, their ratios and PC scores (from the PCA of all elemental foliar concentrations and their pairwise ratios) using Bayesian phylogenetic linear mixed models and the MCMCglmm package⁶⁶ in R. We used soil orders as fixed effects. Phylogeny and species were included as random factors: the phylogenetic and species terms were introduced as random factors accounting for variance explained by heritability, as described previously.

We performed PCAs for foliar N, P, K, Ca, Mg and S concentrations and N/P ratios to further explore the relationships between trees growing under different soil types and their overall elemental compositions. We then analysed the scores of the PC1 and PC2 axes to detect differences in overall foliar elemental composition depending on the order of the soil in which they grew, using Bayesian phylogenetic linear mixed models and the MCMCglmm package⁶⁶ in R, in which the first three PCA axes were the response variables and soil order was the fixed predictor. Phylogeny and species were included as random factors, as in the previous analysis of FDA scores. Model parameters (soil types) with non-overlapping 95% credible intervals were considered to differ significantly.

Analysis of differences in species foliar elemental composition and stoichiometry between populations growing in different communities with different species compositions

We used the map of species distribution in the European Information System on Forest Genetic database, <http://portal.eufgis.org/data/>. We compared the foliar N, P and K concentrations of pairwise species with comparable co-occurring and non-co-occurring surfaces with an overlapping distribution of 25–75%. We established sets of individuals in the overlapping area between the compared species and both areas where only one of the species was present. The data were analysed in R using the packages raster (v.3.4.3), rgeos (v.3.4.4), maptools (v.3.4.3), maps (v.3.4.3), rworldmap (v.3.4.4), ggmap (v.3.4.3) and rworldxtra (v.3.4.4). We used these tools

to select species with large distributions and many datapoints in our database (600–800) and combined species in several possible pairs. We compared the two portions of global distributions for each species of each pair that overlapped or not with the distribution of the other species. We used analysis of variance to compare N, P and K concentrations and PC1 and PC2 scores (from the PCA of the six bio-elements and their pairwise ratios) for each species inside and outside the overlapping zone (with or without competition between the two species, respectively).

Supplementary material

All supplementary figures and tables are available online at: <https://www.nature.com/articles/s41559-020-01348-1>

Data availability

All data are available at the Global Ecology Unit CREAM-CSIC-UAB (glonuteco.creaf.cat/data/).

Code availability

All code is available at the Global Ecology Unit CREAM-CSIC-UAB (glonuteco.creaf.cat/data/).

Acknowledgements

The authors thank the European Research Council Synergy (grant no. ERC-SyG-2013-610028 IMBALANCE-P), the Spanish Government (grant no. PID2019-110521GB-I00) and the Catalan Government (grant no. SGR 2017-1005). M.F.-M. is a postdoctoral fellow of the Research Foundation–Flanders.

Contributions

J.S. and J.P. conceived, designed and supervised the project. J.S., H.V., I.A.J., J.P. and P.Z. searched the bibliography and gathered data. J.S., H.V., P.Z., M.F.-M., A.R., P.C., M.O., I.A.J. and J.P. checked the data and contributed to data accuracy selection. J.S., H.V., G.F.-A., J.P. and M.F.-M. developed the statistical analyses. J.S., J.P., M.F.-M., H.V. and G.F.-A. created the tables and figures. J.S. wrote the paper. J.P., H.V., G.P., A.G.-G., M.F.-M., G.F.-A., A.R., P.C., M.O. and I.A.J. revised the manuscript. All authors read and revised the final version of the manuscript.

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7

General conclusions

In this thesis I have worked around the elemental composition and stoichiometry in leaves of woody plants, and I have established and/or determined their relations with environmental drivers. I started exploring the effect of N deposition on foliar elemental composition and stoichiometry of dominant species in a Mediterranean forest under drought conditions through an experimental design. I obtained evidence of the capability of Mediterranean species to incorporate rapidly this N addition under drought conditions even though its magnitude differs between species. Thus, we observed that the addition of N can partially counteract the decrease of N as a response of drought. Despite of these results we cannot consider the addition of N as a good drought effect palliative because its addition could generate nutrient imbalances and modify the competition capacity of the species.

In a continental context of Europe, I wanted to describe the defoliation tendencies, determine the relationship of defoliation with environmental conditions and establish the relation between defoliation and foliar elemental composition, which is a new approach. All these relations intended to be useful in terms of determining the health of European forests relating higher defoliation rates with worse forest health state. According to the results, the defoliation is increasing in Europe the last decades and it is expected to keep increasing due to climate change conditions. Also, gymnosperms showed higher defoliation rates than angiosperms and most of the studied species showed an increasing defoliation. We emphasize the necessity of considering the different pressures that affect different latitudes. Homogeneity of precipitation, spring conditions and climatic legacy of the previous year also appeared to be very important in defoliation. Furthermore, I want to highlight the established relation of defoliation with foliar elemental composition where foliar N has shown to be strongly related with defoliation, with an inverse correlation. Foliar S, Ca and P were also important in some European species.

The increasing attention of foliar elemental composition in the scientific community generated a big amount of global data in the last years that, in conjunction with new computational resources and techniques allows to conduct an accurate analysis at global scale. In this thesis I used these resources to provide high resolution global maps of N, P, K and N:P foliar elemental composition which, from my point of view, are a promising tool to increase the

accuracy of global C-cycle modeling. In all the cases the foliar elemental composition responded differently to climatic pressures depending on its morphoclimatic group. The global distribution of N, P and K did not have a strong latitudinal component but N:P ratio clearly showed an inverse correlation with latitude. Furthermore, N, P and N:P generally followed the soil-age hypothesis.

Most of the chapters in this thesis discuss around the biogeochemical niche hypothesis and in all the cases the importance of species identity or the genetic pool is highlighted. The most specific chapter around this topic is the 6th, where a clear and specific empirical support confirming the biogeochemical niche theory is provided. According to the results, from 60% to 94% of chemical variability depends on phylogenetic differences between species, from 1% to 7% depends on environmental conditions and the rest vary depending on biotic competitions. In the global models of N, P, K and N:P also a big part of explained variability depended on the evolutionary history of the studied species and in the 2nd chapter the different studied species had an independent multi-space of chemical conditions and reacted differently to the different conditions. So, with all this evidence gathered, genetic legacy and species identity should be considered in future investigations regarding foliar elemental composition.

Appendix

Appendix III: Foliar elemental composition and weather as drivers of defoliation rate in European forests

Table S3.1. Studied variables summary including variable name, origin and brief description

| Variable name | Origin | Description |
|---------------------|---|--|
| SPEI 01 annual avg. | https://spei.csic.es/ | Annual average SPEI of 1 month window |
| SPEI 01 spring avg. | https://spei.csic.es/ | Spring average SPEI of 1 month window |
| SPEI 01 summer avg. | https://spei.csic.es/ | Summer average SPEI of 1 month window |
| SPEI 03 annual avg. | https://spei.csic.es/ | Annual average SPEI of 3 month window |
| SPEI 03 spring avg. | https://spei.csic.es/ | Spring average SPEI of 3 month window |
| SPEI 03 summer avg. | https://spei.csic.es/ | Summer average SPEI of 3 month window |
| SPEI 06 annual avg. | https://spei.csic.es/ | Annual average SPEI of 6 month window |
| SPEI 06 spring avg. | https://spei.csic.es/ | Spring average SPEI of 6 month window |
| SPEI 06 summer avg. | https://spei.csic.es/ | Summer average SPEI of 6 month window |
| SPEI 12 annual avg. | https://spei.csic.es/ | Annual average SPEI of 12 month window |
| SPEI 12 spring avg. | https://spei.csic.es/ | Spring average SPEI of 12 month window |
| SPEI 12 summer avg. | https://spei.csic.es/ | Summer average SPEI of 12 month window |
| MAP | CRU (Harris et al., 2020) | Mean annual precipitation |
| MAP spring | CRU (Harris et al., 2020) | Mean spring precipitation |
| MAP winter | CRU (Harris et al., 2020) | Mean winter precipitation |
| MAT | CRU (Harris et al., 2020) | Mean annual temperature |
| MAT spring | CRU (Harris et al., 2020) | Mean spring temperature |
| MAT winter | CRU (Harris et al., 2020) | Mean winter temperature |
| MAP ant. | Transformation | Mean annual precipitation of previous year |
| MAP spring ant. | Transformation | Mean annual precipitation of previous spring |
| MAP winter ant. | Transformation | Mean annual precipitation of previous winter |
| MAT ant. | Transformation | Mean annual temperature of previous year |
| MAT spring ant. | Transformation | Mean annual temperature of previous spring |
| MAT winter ant. | Transformation | Mean annual temperature of previous winter |
| Foliar N | ICP forests | In dry weight (mg/g) |
| Foliar S | ICP forests | In dry weight (mg/g) |
| Foliar P | ICP forests | In dry weight (mg/g) |

Table S3.1 Continuation

| | | |
|--------------------------|--|---|
| Foliar P | ICP forests | In dry weight (mg/g) |
| Foliar Ca | ICP forests | In dry weight (mg/g) |
| Foliar mg | ICP forests | In dry weight (mg/g) |
| Foliar K | ICP forests | In dry weight (mg/g) |
| Soil Org. C | Sun Yat-sen Univ. (Shangguan et al., 2014) | |
| Soil pH H ₂ O | Sun Yat-sen Univ. (Shangguan et al., 2014) | |
| N dep. ox. | Sun Yat-sen Univ. (Shangguan et al., 2014) | |
| N dep. red. | Sun Yat-sen Univ. (Shangguan et al., 2014) | |
| S ox. | Sun Yat-sen Univ. (Shangguan et al., 2014) | |
| Soil pH difference | Transformation | Soil pH H ₂ O - Soil pH CaCl ₂ |
| Thermal amplitude | Transformation | Annual maximum temperature - Annual minimum temperature |

Table S3.2 Summary of Chow test results between angiosperms and gymnosperms in al-Europe and all three latitudinal fringes.

| Angiosperms vs gymnosperms | F-value | P-value |
|----------------------------|----------|---------|
| General | 3476.237 | 0.000 |
| North | 704.863 | 0.000 |
| Central | 2821.822 | 0.000 |
| Mediterranean | 265.789 | 0.000 |

Appendix IV: Global maps and factors driving forest foliar elemental composition: the importance of evolutionary history

SE of N (%)

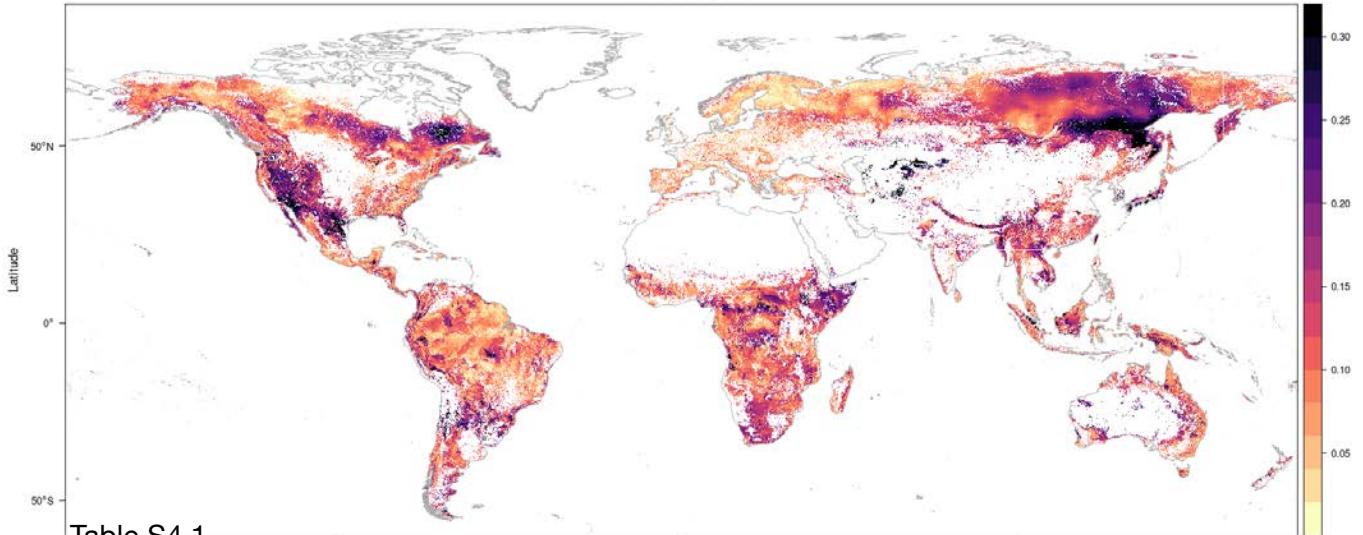


Table S4.1

SE of P (%)

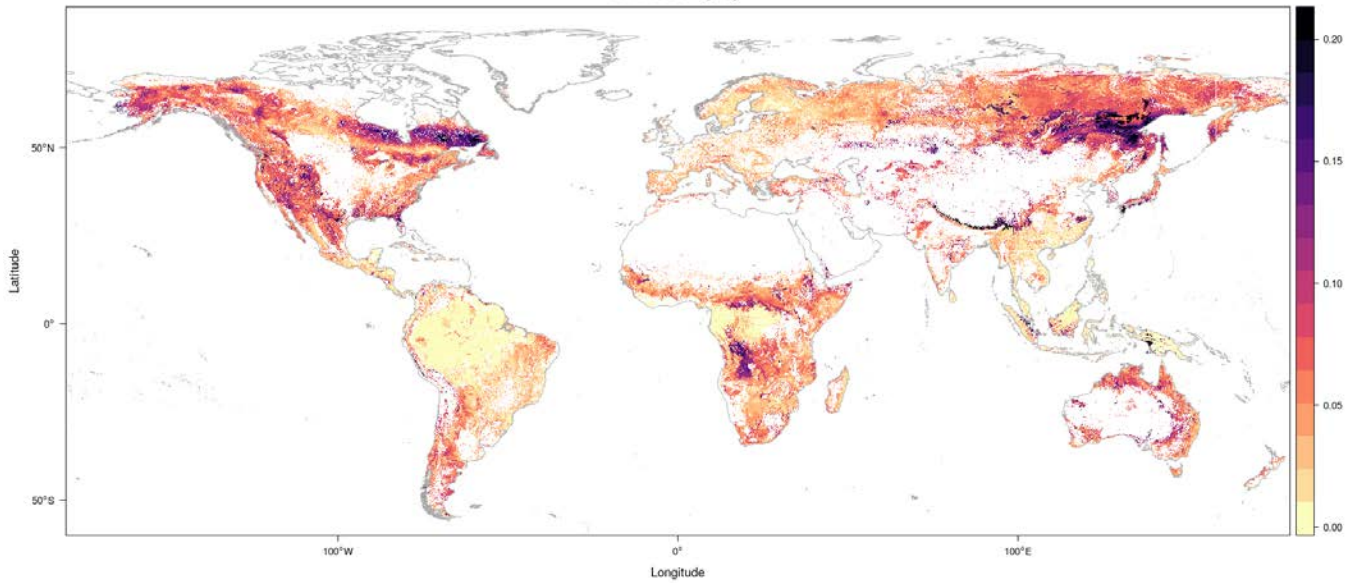


Figure S4.1 Continue

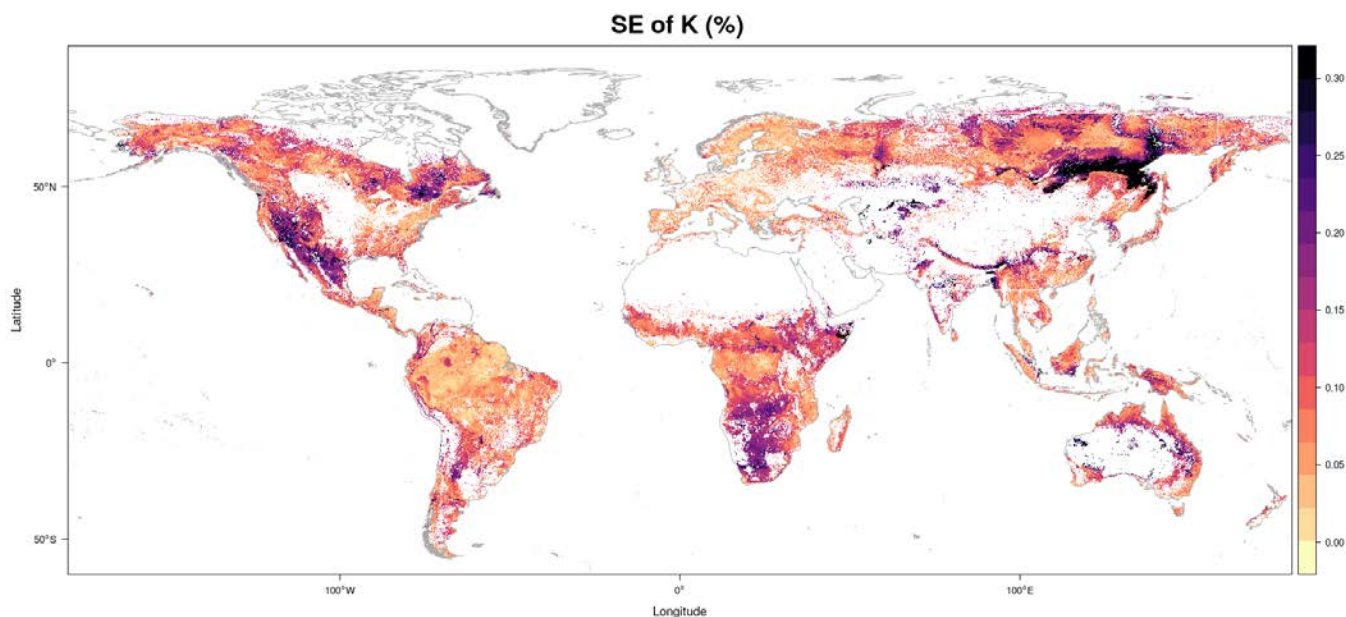


Figure S4.1 Neural network standard error (SE) maps of a) N, b) P, and c) K for tree covered zones. White areas indicate no tree vegetation cover.

Table S4.1 Root Mean Squared Error (RMSE), Mean Absolute Error (MAE), Mean, Standard Deviation of the predictions (SD) and Coefficient of Variation (CV) of neural network prediction for each forest morfoclimatic type.

| | Nutrient | Tropical evergreen | Tropical deciduous | Temperate coniferous | Temperate evergreen broadleaves | Temperate deciduous broadleaves | Boreal | Mean |
|-----------------|----------|--------------------|--------------------|----------------------|---------------------------------|---------------------------------|---------|--------|
| RMSE (%) | N | 0.483 | 0.548 | 0.251 | 0.335 | 0.446 | 0.310 | 0.395 |
| MAE (%) | | 0.377 | 0.426 | 0.185 | 0.242 | 0.312 | 0.214 | 0.293 |
| Mean (%) | | 1.793 | 1.916 | 1.264 | 1.660 | 2.187 | 1.528 | 1.725 |
| SD (%) | | 0.333 | 0.191 | 0.423 | 0.257 | 0.254 | 0.375 | 0.306 |
| CV (%) | | 18.572 | 9.969 | 33.465 | 15.482 | 11.614 | 24.542 | 18.941 |
| RMSE (%) | P | 0.061 | 0.072 | 0.055 | 0.057 | 0.057 | 0.057 | 0.060 |
| MAE (%) | | 0.047 | 0.058 | 0.042 | 0.044 | 0.043 | 0.042 | 0.046 |
| Mean (%) | | 0.109 | 0.139 | 0.140 | 0.160 | 0.169 | 0.135 | 0.142 |
| SD (%) | | 0.119 | 0.149 | 0.148 | 0.165 | 0.110 | 0.135 | 0.137 |
| CV (%) | | 109.298 | 107.013 | 105.697 | 102.726 | 64.761 | 100.087 | 98.264 |
| RMSE (%) | K | 0.266 | 0.268 | 0.161 | 0.268 | 0.224 | 0.161 | 0.225 |
| MAE (%) | | 0.208 | 0.204 | 0.121 | 0.194 | 0.168 | 0.120 | 0.169 |
| Mean (%) | | 0.738 | 0.825 | 0.641 | 0.814 | 0.918 | 0.678 | 0.769 |
| SD (%) | | 0.204 | 0.184 | 0.089 | 0.031 | 0.078 | 0.111 | 0.116 |
| CV (%) | | 27.642 | 22.303 | 13.885 | 3.808 | 8.497 | 16.372 | 15.418 |

Table S4.2 Post-hoc results of predicted foliar N, P and K concentrations for the different soil orders. Q25, Q50 and Q75 are the quartiles.

| | Element | mean | std | r | Q25 | Q50 | Q75 |
|--------------------|---------|-------|-------|----------|---------|-------|-------|
| Oxisols | N | 1.925 | 0.380 | 9747759 | 1.696 | 1.877 | 2.067 |
| Vertisols | | 1.827 | 0.421 | 1474053 | 1.518 | 1.840 | 2.159 |
| Aridisols | | 1.809 | 0.451 | 5965666 | 1.540 | 1.773 | 2.079 |
| Entisols | | 1.792 | 0.442 | 10399889 | 1.491 | 1.761 | 2.062 |
| Mollisols | | 1.745 | 0.456 | 3835740 | 1.440 | 1.732 | 2.042 |
| Gelisols | | 1.708 | 0.423 | 12555849 | 1.355 | 1.668 | 2.024 |
| Ultisols | | 1.695 | 0.377 | 9532959 | 1.465 | 1.689 | 1.924 |
| Inceptisols | | 1.665 | 0.419 | 23939807 | 1.334 | 1.610 | 1.947 |
| Andisols | | 1.656 | 0.437 | 992731 | 1.357 | 1.603 | 1.896 |
| Alfisols | | 1.629 | 0.492 | 11362246 | 1.225 | 1.577 | 1.949 |
| Histosols | | 1.349 | 0.531 | 2068271 | 1.072 | 1.181 | 1.387 |
| Spodosols | | 1.305 | 0.360 | 8112938 | 1.077 | 1.199 | 1.449 |
| Vertisols | | P | 0.154 | 0.063 | 1468477 | 0.106 | 0.152 |
| Mollisols | 0.153 | | 0.066 | 3717903 | 0.110 | 0.146 | 0.185 |
| Gelisols | 0.153 | | 0.087 | 12438420 | 0.092 | 0.140 | 0.192 |
| Inceptisols | 0.144 | | 0.075 | 23093731 | 0.091 | 0.134 | 0.186 |
| Aridisols | 0.140 | | 0.059 | 5861452 | 0.101 | 0.136 | 0.175 |
| Alfisols | 0.134 | | 0.057 | 11325446 | 0.096 | 0.133 | 0.170 |
| Andisols | 0.132 | | 0.063 | 961789 | 0.087 | 0.127 | 0.167 |
| Entisols | 0.127 | | 0.068 | 10135525 | 0.082 | 0.118 | 0.163 |
| Spodosols | 0.127 | | 0.051 | 7996245 | 0.093 | 0.128 | 0.157 |
| Histosols | 0.116 | | 0.065 | 1839547 | 0.068 | 0.108 | 0.150 |
| Ultisols | 0.096 | | 0.052 | 8855638 | 0.062 | 0.088 | 0.121 |
| Oxisols | 0.094 | | 0.039 | 9510712 | 0.069 | 0.092 | 0.116 |
| Vertisols | K | | 0.977 | 0.288 | 1478594 | 0.764 | 0.981 |
| Aridisols | | 0.938 | 0.255 | 5844462 | 0.768 | 0.909 | 1.065 |
| Entisols | | 0.875 | 0.255 | 11351275 | 0.707 | 0.844 | 1.004 |
| Mollisols | | 0.843 | 0.216 | 4005397 | 0.690 | 0.824 | 0.974 |
| Histosols | | 0.829 | 0.385 | 2101576 | 0.607 | 0.727 | 0.858 |
| Andisols | | 0.804 | 0.255 | 990715 | 0.642 | 0.768 | 0.923 |
| Ultisols | | 0.746 | 0.239 | 9789001 | 0.586 | 0.711 | 0.863 |
| Alfisols | | 0.745 | 0.209 | 11510110 | 0.608 | 0.722 | 0.850 |

TS4.2 Continuation

| | | | | | | | |
|--------------------|---|-------|-------|----------|-------|-------|-------|
| Oxisols | K | 0.743 | 0.286 | 9777929 | 0.565 | 0.714 | 0.852 |
| Inceptisols | | 0.697 | 0.240 | 24365193 | 0.530 | 0.679 | 0.827 |
| Gelisols | | 0.608 | 0.218 | 12520339 | 0.444 | 0.587 | 0.737 |
| Spodosols | | 0.575 | 0.193 | 8053901 | 0.457 | 0.540 | 0.665 |

Table S4.3 Generalized Mixed Model (GLM) results for foliar N, P and K concentrations. It includes variable slope and p value, model Akaike Information Criterion (AIC) and model R2. See Table S7 for description of variable abbreviations.

| | N | | | P | | | K | | |
|----------------------|-----------------------|----------|----------|-----------------------|------------|----------|--------------------------|-----------|----------|
| | | Estimate | Pr(> t) | | Estimate | Pr(> t) | | Estimate | Pr(> t) |
| Tropical evergreen | (Intercept) | -2.896 | 0.000 | (Intercept) | 44.934 | 0.000 | (Intercept) | 1.132 | 0.000 |
| | Ai_et0 | 0.000 | 0.000 | Inorganic_Ndeptot | -0.005 | 0.000 | EXH | 0.172 | 0.000 |
| | PHH2O | 0.062 | 0.000 | PETseasonality | 0.085 | 0.000 | Inorganic_Ndepdry | -0.000 | 0.048 |
| | Var41 | 0.000 | 0.000 | PHCA | -0.188 | 0.000 | Bio_12 | 0.000 | 0.000 |
| | Bio_15 | 0.000 | 0.010 | Bio_3 | -0.374 | 0.000 | EXH:inorganic_Ndepdry | -0.000 | 0.000 |
| | Ai_et0:PHH2O | -0.000 | 0.000 | Bio_9 | -1.038 | 0.000 | EXH:Bio_12 | -0.000 | 0.000 |
| | PHH20:var41 | -0.000 | 0.000 | Bio_3:Bio_9 | 0.016 | 0.000 | Inorganic_Ndepdry:Bio_12 | 0.000 | 0.011 |
| | AIC / pR ² | 7264.805 | 0.101 | AIC / pR ² | -13489.126 | 0.116 | AIC / pR ² | 658.477 | 0.054 |
| Tropical deciduous | (Intercept) | 0.455 | 0.000 | (Intercept) | 22.451 | 0.000 | (Intercept) | 2.189 | 0.000 |
| | BS | -0.002 | 0.000 | BS | -0.118 | 0.000 | Et0_yr | -0.000 | 0.000 |
| | CEC | -0.002 | 0.051 | EXCA | 0.091 | 0.021 | Oxred_Ndepwetred | -0.003 | 0.000 |
| | GRAV | 0.005 | 0.001 | PHH2O | -0.199 | 0.000 | Bio_7 | -0.006 | 0.453 |
| | PETseasonality | 0.005 | 0.000 | Bio_3 | -0.054 | 0.000 | Oxred_Ndepwetred:Bio_7 | 0.000 | 0.001 |
| | BS:CEC | 0.000 | 0.000 | BS:PHH2O | 0.002 | 0.000 | | | |
| | CEC:GRAV | -0.000 | 0.000 | | | | | | |
| | AIC / pR ² | 2844.228 | 0.060 | AIC / pR ² | -4219.656 | 0.049 | AIC / pR ² | 170.243 | 0.044 |
| Temperate coniferous | (Intercept) | 0.668 | 0.000 | (Intercept) | 13.730 | 0.000 | (Intercept) | -0.086 | 0.495 |
| | BS | -0.001 | 0.000 | Ai_et0 | 0.000 | 0.000 | Ai_et0 | 0.000 | 0.000 |
| | Et0_yr | -0.000 | 0.000 | EXK | 9.917 | 0.000 | PETseasonality | 0.008 | 0.000 |
| | PHCA | 0.005 | 0.000 | PHH2O | -0.144 | 0.000 | Var29 | 0.006 | 0.000 |
| | PHK | -0.109 | 0.000 | PHK | -2.859 | 0.000 | Bio_1 | 0.109 | 0.000 |
| | Bio_18 | 0.000 | 0.000 | Ai_et0:EXK | -0.001 | 0.000 | Ai_et0:var29 | -0.000 | 0.000 |
| | Et0_yr:PHK | 0.000 | 0.000 | PHH20:PHK | 0.044 | 0.000 | Ai_et0:Bio_1 | -0.000 | 0.000 |
| | AIC / pR ² | 4056.611 | 0.249 | AIC / pR ² | -44732.147 | 0.184 | AIC / pR ² | -9733.303 | 0.043 |

Table S4.3 Continuation

| | | | | | | | | | |
|---------------------------------|-----------------------|----------|-------|-----------------------|-----------|-------|-----------------------|-----------|-------|
| Temperate broadleaved evergreen | (Intercept) | -0.442 | 0.020 | (Intercept) | 14.905 | 0.000 | (Intercept) | 3.552 | 0.000 |
| | Ai_et0 | 0.000 | 0.000 | Ai_et0 | -0.000 | 0.000 | Et0_yr | -0.000 | 0.404 |
| | Et0_yr | 0.000 | 0.001 | PETseasonality | -0.065 | 0.000 | Var41 | -0.000 | 0.019 |
| | PHH2O | 0.018 | 0.000 | Bio_14 | 0.146 | 0.000 | Bio_17 | -0.014 | 0.000 |
| | Ai_et0:et0_yr | 0.000 | 0.000 | Bio_17 | -0.096 | 0.000 | Et0_yr:Bio_17 | -0.000 | 0.081 |
| | Ai_et0:PHH2O | -0.000 | 0.000 | Ai_et0:Bio_17 | 0.000 | 0.000 | Var41:Bio_17 | 0.000 | 0.000 |
| | Et0_yr:PHH2O | -0.000 | 0.000 | PETseasonality:Bio_17 | 0.001 | 0.000 | | | |
| | AIC / pR ² | 2924.360 | 0.055 | AIC / pR ² | -7082.053 | 0.049 | AIC / pR ² | 194.543 | 0.028 |
| Temperate broadleaved deciduous | (Intercept) | 0.505 | 0.000 | (Intercept) | 5.925 | 0.000 | (Intercept) | 0.999 | 0.000 |
| | Ai_et0 | -0.000 | 0.000 | Organic_Ndepdry | 0.378 | 0.000 | Ai_et01 | -0.000 | 0.490 |
| | PHH2O | -0.000 | 0.048 | Oxred_Ndeptotox | -0.004 | 0.002 | PHCA | 0.003 | 0.000 |
| | Bio_12 | 0.000 | 0.000 | PNZ | -0.001 | 0.000 | Bio_14 | 0.001 | 0.256 |
| | Bio_17 | -0.000 | 0.000 | Var31 | 0.084 | 0.000 | Bio_19 | 0.001 | 0.002 |
| | Ai_et0:Bio_17 | 0.000 | 0.000 | Bio_1 | 0.604 | 0.000 | Ai_et0:Bio_14 | 0.000 | 0.000 |
| | | | | Var31:Bio_1 | -0.007 | 0.000 | Bio_14:Bio_19 | -0.000 | 0.000 |
| | AIC / pR ² | 7441.211 | 0.076 | AIC / pR ² | -6455.099 | 0.098 | AIC / pR ² | -226.012 | 0.026 |
| Boreal | (Intercept) | 1.016 | 0.000 | (Intercept) | 6.326 | 0.000 | (Intercept) | 3.460 | 0.000 |
| | var28 | 0.086 | 0.000 | Oxred_Ndepwetox | -0.006 | 0.013 | Inorganic_Ndepdry | -0.002 | 0.000 |
| | var29 | -0.060 | 0.000 | Var29 | 0.019 | 0.000 | Bio_11 | 0.124 | 0.001 |
| | Bio_5 | -0.029 | 0.000 | Bio_1 | 0.364 | 0.000 | Bio_12 | -0.001 | 0.000 |
| | var28:var29 | -0.000 | 0.000 | Bio_10 | -0.039 | 0.191 | Bio_6 | 0.060 | 0.021 |
| | var28:Bio_5 | -0.004 | 0.000 | Oxred_Ndepwetox:Bio_ | 0.005 | 0.000 | Bio_11:Bio_6 | 0.004 | 0.000 |
| | var29:Bio_5 | 0.003 | 0.000 | Bio_1:Bio_10 | -0.056 | 0.000 | Bio_12:Bio_6 | -0.000 | 0.000 |
| | AIC / pR ² | 3206.911 | 0.388 | AIC / pR ² | -9105.834 | 0.079 | AIC / pR ² | -1562.190 | 0.070 |

Table S4.4 (a and b): Generalized linear mixed model (GLMM) fixed effects with significant variables in bold (<0.05). Description of abbreviations in Table S7 (a). Glmm performance and % of variance explained by each random factor: R2 (random) = R2c - R2m (b).

| | Nitrogen fixed effects | | | Phosphorus fixed effects | | | Potassium fixed effects | | |
|----------------------|------------------------|-----------|--------|--------------------------|-----------|--------|--------------------------|-----------|--------|
| | | post mean | p MCMC | | post mean | p MCMC | | post mean | p MCMC |
| Tropical evergreen | (Intercept) | 2.222 | 0.001 | (Intercept) | 0.062 | 0.012 | (Intercept) | 0.488 | 0.001 |
| | Bio_15 | 0.001 | 0.407 | Bio_3 | 0.000 | 0.199 | Bio_4 | -0.000 | 0.464 |
| | Ai_et0 | 0.000 | 0.253 | Bio_9 | -0.001 | 0.088 | Bio_6 | 0.003 | 0.563 |
| | Var41 | -0.000 | 0.001 | PETseasonality | -0.001 | 0.003 | Bio_7 | 0.010 | 0.047 |
| | BS | -0.000 | 0.880 | PHCA | 0.001 | 0.001 | Bio_12 | 0.000 | 0.484 |
| | PHH2O | -0.003 | 0.199 | Inorganic_Ndepdry | 0.000 | 0.015 | EXH | -0.006 | 0.084 |
| | PHK | 0.039 | 0.189 | Inorganic_Ndeptot | -0.000 | 0.764 | Inorganic_Ndepdry | 0.000 | 0.169 |
| Tropical deciduous | (Intercept) | 2.281 | 0.001 | (Intercept) | 0.010 | 0.853 | (Intercept) | 0.370 | 0.360 |
| | PETseasonality | -0.012 | 0.001 | Bio_3 | 0.000 | 0.024 | Bio_1 | -0.003 | 0.821 |
| | BS | -0.002 | 0.483 | Bio_17 | 0.000 | 0.061 | Bio_7 | 0.000 | 0.993 |
| | CEC | -0.002 | 0.676 | BS | -0.000 | 0.713 | Et0_yr | 0.000 | 0.032 |
| | EXH | -0.007 | 0.547 | EXCA | -0.002 | 0.012 | Var30 | 0.000 | 0.700 |
| | GRAV | 0.002 | 0.433 | PHCA | 0.000 | 0.677 | Oxred_Ndepdryred | 0.000 | 0.617 |
| | PHH2O | 0.003 | 0.631 | PHH2O | 0.001 | 0.089 | Oxred_Ndepwetred | 0.000 | 0.805 |
| Temperate coniferous | (Intercept) | 2.048 | 0.001 | (Intercept) | 0.350 | 0.891 | (Intercept) | 0.607 | 0.708 |
| | Bio_9 | 0.004 | 0.001 | Ai_et0 | -0.000 | 0.077 | Bio_11 | -0.001 | 0.492 |
| | Bio_18 | 0.000 | 0.080 | BS | 0.000 | 0.001 | Bio_13 | 0.001 | 0.001 |
| | Et0_yr | -0.001 | 0.001 | EXK | -0.002 | 0.929 | Ai_et0 | -0.000 | 0.001 |
| | BS | 0.003 | 0.001 | PHCA | -0.000 | 0.924 | PETseasonality | 0.000 | 0.880 |
| | PHCA | -0.010 | 0.001 | PHH2O | -0.001 | 0.001 | Var28 | 0.000 | 0.132 |
| | PHK | 0.032 | 0.001 | PHK | -0.007 | 0.204 | Var29 | 0.000 | 0.717 |

Table S4.4 a. Continuation

| | | | | | | | | | |
|---------------------------------|-----------------|--------|-------|-------------------|--------|-------|-------------------|--------|-------|
| Temperate broadleaved evergreen | (Intercept) | 1.857 | 0.001 | (Intercept) | 0.129 | 0.001 | (Intercept) | 0.501 | 0.001 |
| | Et0_yr | -0.000 | 0.004 | Bio_1 | -0.000 | 0.372 | Bio_14 | 0.004 | 0.001 |
| | Ai_et0 | -0.000 | 0.181 | Var31 | 0.000 | 0.003 | Bio_17 | -0.001 | 0.059 |
| | BS | -0.001 | 0.011 | PNZ | 0.000 | 0.424 | Et0_yr | 0.000 | 0.004 |
| | PHCA | 0.007 | 0.001 | Inorganic_Ndepwet | 0.000 | 0.001 | Var41 | -0.000 | 0.311 |
| | PHH2O | -0.002 | 0.056 | Organic_Ndepdry | -0.001 | 0.205 | Inorganic_Ndeptot | 0.000 | 0.001 |
| | PHK | -0.067 | 0.001 | Oxred_Ndeptotox | -0.000 | 0.001 | Oxred_Ndepwetox | -0.002 | 0.001 |
| Temperate broadleaved deciduous | (Intercept) | 1.939 | 0.001 | (Intercept) | 0.146 | 0.001 | (Intercept) | 0.877 | 0.001 |
| | Bio_12 | -0.000 | 0.003 | Bio_14 | -0.001 | 0.001 | Bio_12 | 0.000 | 0.380 |
| | Bio_17 | 0.000 | 0.057 | Bio_17 | 0.000 | 0.001 | Bio_13 | -0.000 | 0.929 |
| | Bio_19 | -0.000 | 0.149 | Ai_et0 | -0.000 | 0.713 | Bio_14 | -0.000 | 0.552 |
| | Ai_et0 | 0.000 | 0.001 | PETseasonality | -0.000 | 0.005 | Bio_19 | 0.000 | 0.023 |
| | Var28 | 0.000 | 0.479 | EXCA | -0.000 | 0.017 | Ai_et0 | -0.000 | 0.001 |
| | PHH2O | 0.001 | 0.300 | Inorganic_Ndeptot | -0.000 | 0.583 | PHCA | -0.001 | 0.001 |
| Boreal | (Intercept) | 1.529 | 0.001 | (Intercept) | 0.236 | 0.001 | (Intercept) | 0.643 | 0.001 |
| | Bio_1 | 0.001 | 0.887 | Bio_1 | 0.002 | 0.003 | Bio_6 | 0.017 | 0.025 |
| | Bio_5 | 0.009 | 0.032 | Bio_10 | 0.004 | 0.001 | Bio_11 | -0.029 | 0.003 |
| | Bio_9 | 0.001 | 0.683 | Et0_yr | -0.000 | 0.001 | Bio_12 | 0.000 | 0.753 |
| | Var28 | -0.009 | 0.001 | Var29 | -0.000 | 0.001 | Bio_13 | 0.000 | 0.939 |
| | Var29 | 0.007 | 0.001 | Oxred_Ndeptotox | 0.000 | 0.519 | Var29 | -0.000 | 0.948 |
| | Inorganic_Ndepv | -0.000 | 0.397 | Oxred_Ndepwetox | -0.000 | 0.124 | Inorganic_Ndepdry | 0.000 | 0.001 |

Table S4.4 b.

| | | R ² c | R ² m (fixed) | R ² (random) | phylo | species | units |
|-------------------|--|------------------|--------------------------|-------------------------|-------|---------|-------|
| Nitrogen | Tropical evergreen | 0.742 | 0.018 | 0.723 | 0.555 | 0.182 | 0.263 |
| | Tropical deciduous | 0.551 | 0.036 | 0.515 | 0.406 | 0.128 | 0.466 |
| | Temperate coniferous | 0.720 | 0.082 | 0.638 | 0.319 | 0.372 | 0.309 |
| | Temperate broadleaved evergreen | 0.826 | 0.008 | 0.817 | 0.500 | 0.324 | 0.176 |
| | Temperate broadleaved deciduous | 0.436 | 0.010 | 0.426 | 0.144 | 0.287 | 0.570 |
| | Boreal | 0.769 | 0.012 | 0.758 | 0.548 | 0.218 | 0.234 |
| Phosphorus | Tropical evergreen | 0.662 | 0.024 | 0.639 | 0.435 | 0.219 | 0.346 |
| | Tropical deciduous | 0.424 | 0.030 | 0.394 | 0.220 | 0.186 | 0.594 |
| | Temperate coniferous | 0.988 | 0.000 | 0.988 | 0.552 | 0.435 | 0.012 |
| | Temperate broadleaved evergreen | 0.802 | 0.009 | 0.793 | 0.296 | 0.505 | 0.200 |
| | Temperate broadleaved deciduous | 0.795 | 0.006 | 0.789 | 0.247 | 0.546 | 0.206 |
| | Boreal | 0.752 | 0.017 | 0.736 | 0.420 | 0.328 | 0.252 |
| Potassium | Tropical evergreen | 0.494 | 0.037 | 0.456 | 0.176 | 0.298 | 0.526 |
| | Tropical deciduous | 0.337 | 0.082 | 0.254 | 0.194 | 0.082 | 0.724 |
| | Temperate coniferous | 0.980 | 0.000 | 0.980 | 0.559 | 0.421 | 0.020 |
| | Temperate broadleaved evergreen | 0.388 | 0.022 | 0.366 | 0.116 | 0.258 | 0.626 |
| | Temperate broadleaved deciduous | 0.239 | 0.016 | 0.223 | 0.134 | 0.092 | 0.774 |
| | Boreal | 0.816 | 0.011 | 0.805 | 0.603 | 0.210 | 0.187 |

Table S4.5 Final number of samples used in each morphoclimatic forest type model

| | N | P | K |
|--|----------|----------|----------|
| Tropical evergreen | 3862 | 3761 | 1946 |
| Tropical deciduous | 1341 | 1368 | 366 |
| Temperate coniferous | 11152 | 11165 | 10720 |
| Temperate broadleaved evergreen | 2267 | 1799 | 1486 |
| Temperate broadleaved deciduous | 3813 | 3791 | 2825 |
| Boreal | 2196 | 1842 | 1645 |
| sum | 24631 | 23726 | 18988 |

Table S4.6 Published articles used as a source for data assembling.

| Author | Journal | Title | Authors | Vol | Num | Pags | DOI |
|---------------------|--------------------------------------|--|--|------------|------------|-------------|---|
| Achat et al 2018 | Ecological Monographs | Nutrient remobilization in tree foliage as affected by soil nutrients and leaf life span | Achat, DL (Achat, David Ludovick) ^[1] ; Pousse, N (Pousse, Noemie) ^[2] ; Nicolas, M (Nicolas, Manuel) ^[3] ; Augusto, L (Augusto, Laurent) ^[4] | 88 | 3 | 408-428 | |
| Aerts et al. 2009 | Functional Ecology | Seasonal climate manipulations result in species-specific changes in leaf nutrient levels and isotopic composition in a sub-arctic bog | Aerts, R (Aerts, Rien) ^[1] ; Callaghan, TV (Callaghan, Terry V.) ^[2,3] ; Dorrepaal, E (Dorrepaal, Ellen) ^[1] ; van Logtestijn, RSP (van Logtestijn, Richard S. P.) ^[1] ; Cornelissen, JHC (Cornelissen, Johannes H. C.) ^[1] | 23 | 4 | 680-688 | 10.1111/j.1365-2435.2009.01566.x |
| Albaugh et al. 2010 | Southern Journal of Applied Forestry | Characterization of Foliar Macro- and Micronutrient Concentrations and Ratios in Loblolly Pine Plantations in the Southeastern United States | Albaugh, JM (Albaugh, Janine M.) ^[1] ; Blevins, L (Blevins, Leandra) ^[1] ; Allen, HL (Allen, H. Lee) ^[1] ; Albaugh, TJ (Albaugh, Timothy J.) ^[1] ; Fox, TR (Fox, Thomas R.) ^[2] ; Stape, JL (Stape, Jose L.) ^[1] ; Rubilar, RA (Rubilar, Rafael A.) ^[3] | 34 | 2 | 53-64 | 10.1093/sjaf/34.2.53 |
| Almeida et al. 2014 | Ciências Agrárias | Nutrient cycling in mango trees | Cinara Xavier de Almeida ^{1*} ; José Luiz Pita Junior ² ; Danilo Eduardo Rozane ³ ; Henrique Antunes de Souza ⁴ ; Amanda Hernandez ⁵ ; William Natale ⁶ ; Antonio Sergio Ferraudo | 35 | 1 | 259-266 | 10.5433/1679-0359.2014v35n1p259 |
| Alongi et al. 2003 | Trees-structure and function | Nutrient partitioning and storage in arid-zone forests of the mangroves <i>Rhizophora stylosa</i> and <i>Avicennia marina</i> | Alongi, DM (Alongi, DM); Clough, BF (Clough, BF); Dixon, P (Dixon, P); Tirendi, F (Tirendi, F) | 17 | 1 | 51-60 | 10.1007/s00468-002-0206-2 |

7. Appendix IV

| | | | | | | | |
|---------------------------------|--|---|---|-----|-------|-----------|---|
| Ameztegui et al. 2017 | Functional Ecology | Shade tolerance and the functional trait: demography relationship in temperate and boreal forests | Ameztegui, A (Ameztegui, Aitor) ^[1,2,3] ; Paquette, A (Paquette, Alain) ^[1] ; Shipley, B (Shipley, Bill) ^[4] ; Heym, M (Heym, Michael) ^[5] ; Messier, C (Messier, Christian) ^[1,6] ; Gravel, D (Gravel, Dominique) ^[4,7,8] | 31 | 4 | 821-830 | 10.1111/1365-2435.12804 |
| Amores et al. 2006 | Water, Air and Soil Pollution | Nutritional status of Northern Spain beech forests | Amores, G (Amores, G.); Bermejo, R (Bermejo, R.); Elustondo, D (Elustondo, D.); Lasheras, E (Lasheras, E.); Santamaria, JM (Santamaria, J. M.) | 177 | (1-4) | 227-238 | 10.1007/s11270-006-9157-3 |
| Andivia et al. 2010 | European Journal Forest Research | Nutrients return from leaves and litterfall in a mediterranean cork oak (Quercus suber L.) forest in southwestern Spain | Andivia, E (Andivia, Enrique) ^[1] ; Fernandez, M (Fernandez, Manuel) ^[1] ; Vazquez-Pique, J (Vazquez-Pique, Javier) ^[1] ; Gonzalez-Perez, A (Gonzalez-Perez, Aranzazu) ^[1] ; Tapias, R (Tapias, Raul) ^[1] | 129 | 1 | (5-12) | 10.1007/s10342-009-0274-6 |
| Annan-Afful et al. 2004 | Soil Science and Plant Nutrition | Nutrient and bulk density characteristics of soil profiles in six land use systems along toposequences in inland valley watersheds of Ashanti region, Ghana | Annan-Afful, E (Annan-Afful, E); Iwashima, N (Iwashima, N); Otoo, E (Otoo, E); Asubonteng, KO (Asubonteng, KO); Kubota, D (Kubota, D); Kamidohzono, A (Kamidohzono, A); Masunaga, T (Masunaga, T); Wakatsuki, T (Wakatsuki, T) | 50 | 5 | 649-664 | 10.1080/00380768.2004.10408522 |
| Artemkina et al., 2016 | Russian Journal of Ecology | Chemical Composition of Juniperus Sibirica Needles (Cupressaceae) in the Forest-Tundra Ecotone, the Khibiny Mountains | Artemkina, N.A., Orlova, M.A., Lukina, N. V. | 4 | | 243-250 | 0.1134/S106741361604007X |
| Bai et al. 2012 | Journal of Applied Ecology | Grazing alters ecosystem functioning and C:N:P stoichiometry of grasslands along a regional precipitation gradient | Bai, YF (Bai, Yongfei) ^[1] ; Wu, JG (Wu, Jianguo) ^[1,2,3] ; Clark, CM (Clark, Chris M.) ^[2,3] ; Pan, QM (Pan, Qingmin) ^[1] ; Zhang, LX (Zhang, Lixia) ^[1] ; Chen, SP (Chen, Shiping) ^[1] ; Wang, QB (Wang, Qibing) ^[1] ; Han, XG (Han, Xingguo) ^[1] | 49 | 6 | 1204-1215 | 10.1111/j.1365-2664.2012.02205.x |
| Baruch&Goldstein_Hawaii_Med_Old | International journal of plant science | Responses to light and water availability of four invasive Melastomataceae in the Hawaiian islands | Baruch, Z (Baruch, Z); Pattison, RR (Pattison, RR); Goldstein, G (Goldstein, G) | 161 | 1 | 107-118 | 10.1086/314233 |
| Bassow&Bazzaz_PETERSHAM_MA | Ecology | How environmental conditions affect canopy leaf-level photosynthesis in four deciduous tree species | Bassow, SL (Bassow, SL); Bazzaz, FA (Bazzaz, FA) | 79 | 8 | 2660-2675 | 10.1890/0012-9658(1998)079[2660:HECACL]2.0.CO;2 |
| Bauer et al. 1997 | Tree physiology | Nutrient contents and concentrations in relation to growth of Picea abies and Fagus sylvatica along a European transect | Bauer, G (Bauer, G); Schulze, ED (Schulze, ED); Mund, M (Mund, M) | 17 | 12 | 777-786 | |
| Bauters et al. 2017a | Biogeosciences | Parallel functional and stoichiometric trait shifts in South American and African forest communities with elevation | Bauters, M., H. Verbeeck, M. Demol, S. Bruneel, C. Taveirne, D. Van der Heyden, L. Cizungu, and P. Boeckx | 14 | | 5313-5321 | |
| Bauters et al. 2017b | Ecosystems | Functional Composition of Tree Communities Changed Topsoil Properties in an Old Experimental Tropical Plantation | Bauters, M., H. Verbeeck, S. Doetterl, E. Ampoorter, G. Baert, P. Vermeir, K. Verheyen, and P. Boeckx | 20 | | 861-871 | |

7. Appendix IV

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|--------------------------------------|-------------------------------|---|--|-----|----|-----------|---|
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| Bombonato et al. 2010 | Plant Ecol | Variations in the foliar nutrient content of mire plants: effects of growth-form based grouping and habitat | Bombonato, L (Bombonato, Laura) ^[1] ; Siffi, C (Siffi, Chiara) ^[1] ; Gerdol, R (Gerdol, Renato) ^[1] | 211 | 2 | 235-251 | 10.1007/s11258-010-9786-x |
| Bond et al 1999. Oecol 120: 183-192, | Oecologia | Foliage physiology and biochemistry in response to light gradients in conifers with varying shade tolerance | Bond, BJ (Bond, BJ); Farnsworth, BT (Farnsworth, BT); Coulombe, RA (Coulombe, RA); Winner, WE (Winner, WE) | 120 | 2 | 183-192 | 10.1007/s004420050847 |
| Bongers_et_al_Los_Tuxtlas | Botanical gazette | Leaf characteristics of the tropical rain-forest flora of Los-Tuxtlas, Mexico | BONGERS, F (BONGERS, F); POPMA, J (POPMA, J) | 151 | 3 | 354-365 | 10.1086/337836 |
| Boni et al. 2016 | Ciência florestal | Comparative assessment of the nutritional status for baru (<i>Dipterix alata</i>) seedlings | Thais Soto Boni, Kátia Luciene Maltoni, Salatier Buzetti, Ana Maria Rodrigues Cassiolato | 26 | 1 | 109-121 | 10.5902/1980509821095 |
| Bormann et al. 1990 | Forest ecology and management | | | | | | |
| Bubier et al. 2011 | Oecologia | Effects of nutrient addition on leaf chemistry, morphology, and photosynthetic capacity of three bog shrubs | Bubier, JL (Bubier, Jill L.) ^[1] ; Smith, R (Smith, Rose) ^[1] ; Juutinen, S (Juutinen, Sari) ^[1] ; Moore, TR (Moore, Tim R.) ^[2] ; Minocha, R (Minocha, Rakesh) ^[3] ; Long, S (Long, Stephanie) ^[3] ; Minocha, S (Minocha, Subhash) ^[4] | 167 | 2 | 355-368 | 10.1007/s00442-011-1998-9 |
| Bündchen et al 2013 | Scientia Forestalis | Nutritional status and nutrient use efficiency in tree species of subtropical forest in southern Brazil | Bundchen, M (Buendchen, Marcia) ^[1] ; Boeger, MRT (Tones Boeger, Maria Regina) ^[2] ; Reissmann, CB (Reissmann, Carlos Bruno) ^[3] ; da Silva, SLC (Couto da Silva, Sabrina Leticia) ^[1] | 41 | 98 | 227-236 | |
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| Burton et al. 1993 | Soil Science Society Am. J. | Foliar nutrients in sugar maple forests along a regional pollution-climate gradient | BURTON, AJ (BURTON, AJ); PREGITZER, KS (PREGITZER, KS); MACDONALD, NW (MACDONALD, NW) | 57 | 6 | 1619-1628 | 10.2136/sssaj1993.03615995005700060036x |
| Bussotti et al. 2000 | Trees-structure and function | Leaf morphology and macronutrients in broadleaved trees in central Italy | Bussotti, F (Bussotti, F); Borghini, F (Borghini, F); Celesti, C (Celesti, C); Leonzio, C (Leonzio, C); Bruschi, P (Bruschi, P) | 14 | 7 | 361-368 | 10.1007/s004680000056 |
| Bussotti et al. 2005 | Tree physiology | Leaf morphology and chemistry in <i>Fagus sylvatica</i> (beech) trees as affected by site factors and ozone: results from CONECOFOR permanent monitoring plots in Italy | Bussotti, F (Bussotti, F); Pancrazi, M (Pancrazi, M); Matteucci, G (Matteucci, G); Gerosa, G (Gerosa, G) | 25 | 2 | 211-219 | 10.1093/treephys/25.2.211 |
| Caldeira et al. 2002 | Annals of Forest Science | Quantification of nutrient content in above-ground biomass of young <i>Acacia mearnsii</i> De Wild., provenance Bodalla | Caldeira, MVW (Caldeira, MVW); Schumacher, MV (Schumacher, MV); Spathelf, P (Spathelf, P) | 59 | 8 | 833-838 | 10.1051/forest:2002081 |

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|---------------------------------------|---|---|---|-----|-----|---------|----------------------------------|
| Caldeira et al. 2017 | Scientia Forestalis | Levels and redistribution of nutrientes in the leaves of <i>Bixa arborea</i> Huber. and <i>Joannesia princeps</i> Vell. in a florest restoration area | Caldeira, MVW (Winckler Caldeira, Marcos Vinicius) ^[1] ; Moreira, FL (Moreira, Fagner Luciano) ^[2] ; Goncalves, ED (Goncalves, Elzimar de Oliveira) ^[1] ; Campanharo, IF (Campanharo, Italo Favoreto) ^[3] ; Castro, KC (Castro, Kallil Chaves) | 45 | 114 | 305-317 | 10.18671/scifor.v45n114.07 |
| Campo & Dirzo, 2003 | Journal of Tropical Ecology | Leaf Quality and Herbivory Responses to Soil Nutrient Addition in Secondary Tropical Dry Forests of Yucatán | Campo, J., Dirzo, R. | 19 | 5 | 525-530 | |
| Canadell et al. 1992 | Vegetatio | Variation in tissue element concentrations in <i>Quercus-ilex</i> L over a range of different soils | CANADELL, J (CANADELL, J); VILA, M (VILA, M) | 100 | | 273-282 | |
| Cekstere et al. 2010 | Baltic Forestry | Macronutrient Status in the Different-Aged Lime Trees (<i>Tilia x vulgaris</i> H.) in Riga Streets | Cekstere, G (Cekstere, Gunta) ^[1,2] ; Osvalde, A (Osvalde, Anita) ^[1] | 16 | 1 | 16-22 | |
| Chaturvedi et al. 2011 | Journal of vegetation science | Leaf attributes and tree growth in a tropical dry forest | Chaturvedi, RK (Chaturvedi, R. K.) ^[1] ; Raghubanshi, AS (Raghubanshi, A. S.) ^[1] ; Singh, JS (Singh, J. S.) ^[1] | 22 | 5 | 917-931 | 10.1111/j.1654-1103.2011.01299.x |
| Chen et al. 2009 | Journal of Plant Nutrition and Soil Science | Mulberry nutrient management for silk production in Hubei Province of China | Chen, F (Chen, Fang) ^[1] ; Lu, JW (Lu, Jianwei) ^[2] ; Zhang, MC (Zhang, Mingchu) ^[3] ; Wan, KY (Wan, Kaiyuan) ^[1] ; Liu, DB (Liu, Dongbi) ^[4] | 172 | 2 | 245-253 | 10.1002/jpln.200800093 |
| Cheng XB et al 2012. Photosynthetic a | Photosynt hetica | Photosynthesis, leaf morphology and chemistry of <i>Pinus koraiensis</i> and <i>Quercus mongolica</i> in broadleaved Korean pine mixed forest | Cheng, XB (Cheng, X. B.) ^[1,2] ; Wu, J (Wu, J.) ^[3] ; Han, SJ (Han, S. J.) ^[1] ; Zhou, YM (Zhou, Y. M.) ^[1] ; Wang, XX (Wang, X. X.) ^[4] ; Wang, CG (Wang, C. G.) ^[1,2] ; Zhao, J (Zhao, J.) ^[1,2] ; Hu, QH (Hu, Q. H.) ^[5] | 50 | 1 | 56-66 | 10.1007/s11099-012-0005-y |
| Choula et al. 2017 | Applied Ecology and Environmental Research | Regeneration, growth and nutrient partitioning of three woody species on degraded tropical rainforest land | Choula, F (Choula, F.) ^[1] ; Taffouo, VD (Taffouo, V. D.) ^[1] ; Priso, RJ (Priso, R. J.) ^[1] ; Etame, J (Etame, J.) ^[1] ; Zapfack, L (Zapfack, L.) ^[2] ; Ntsomboh, NG (Ntsomboh, Ntsefong G.) ^[2,3] ; Ngane, KB (Ngane, K. B.) ^[4] | 15 | 1 | 363-378 | 10.15666/aeer/1501_363378 |
| Clancy et al. 2004 | Canadian Journal of Forest Research | Foliar nutrients and induced susceptibility: genetic mechanisms of Douglas-fir resistance to western spruce budworm defoliation | Clancy, KM (Clancy, KM); Chen, Z (Chen, Z); Kolb, TE (Kolb, TE) | 34 | 4 | 939-949 | 10.1139/X03-264 |
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|---|--|---|---|-----|-------|-----------|-------------------------------|
| Corcioli et al. 2016 | Cerne | Macro and micronutrient deficiency in mature seedlings of <i>khaya ivorensis</i> studied in nursery | Corcioli, G (Corcioli, Graciella) ^[1] ; Borges, JD (Borges, Jacomo Divino) ^[1] ; de Jesus, RP (de Jesus, Roberta Paula) ^[1] | 22 | 1 | 121-128 | 10.1590/01047760201622012085 |
| Corrêa et al. 2013 | Scientia Forestalis | Litterfall and macronutrients in a <i>Eucalyptus dunnii</i> stand in a degraded pasture in Pampa Biome, South Brazil | Correa, RS (Correa, Robson Schaff) ^[1] ; Schumacher, MV (Schumacher, Mauro Valdir) ^[2] ; Momolli, DR (Momolli, Dione Richer) ^[3] | 41 | 97 | 65-74 | |
| Courtois et al. 1998 | Annals of Forestal Sciences | | | | | | |
| Dale et al. 2015 | Plant and Soil | Isolating the effects of precipitation, soil conditions, and litter quality on leaf litter decomposition in lowland tropical forests | Dale, SE (Dale, Sarah E.) ^[4,1] ; Turner, BL (Turner, Benjamin L.) ^[2] ; Bardgett, RD (Bardgett, Richard D.) ^[3] | 394 | (1-2) | 225-238 | 10.1007/s11104-015-2511-8 |
| Dalling 1994 | Association for Tropical Biology | | | | | | |
| de Cassia-Silva C et al 2017. Plant Ecology | Plant Ecology | When the same is not the same: phenotypic variation reveals different plant ecological strategies within species occurring in distinct Neotropical savanna habitats | de Cassia-Silva, C (de Cassia-Silva, Cibele) ^[1,2] ; Cianciaruso, MV (Cianciaruso, Marcus V.) ^[2] ; Maracahipes, L (Maracahipes, Leandro) ^[2] ; Collevatti, RG (Collevatti, Rosane G.) ^[1] | 218 | 10 | 1221-1231 | 10.1007/s11258-017-0765-3 |
| De la Riva EG et al, 2018 | Trees-structure and function | Relationships between leaf mass per area and nutrient concentrations in 98 Mediterranean woody species are determined by phylogeny, habitat and leaf habit | de la Riva, EG (de la Riva, Enrique G.) ^[1,2] ; Villar, R (Villar, Rafael) ^[1] ; Perez-Ramos, IM (Perez-Ramos, Ignacio M.) ^[3] ; Quero, JL (Luis Quero, Jose) ^[4] ; Matias, L (Matias, Luis) ^[3] ; Poorter, L (Poorter, Lourens) ^[5] ; Maranon, T (Maranon, Teodoro) ^[3] | 32 | 2 | 497-510 | 10.1007/s00468-017-1646-z |
| Deans et al. 1999 | Forest Ecology and Management | Nutrient and organic-matter accumulation in <i>Acacia senegal</i> fallows over 18 years | Deans, JD (Deans, JD); Diagne, O (Diagne, O); Lindley, DK (Lindley, DK); Dione, M (Dione, M); Parkinson, JA (Parkinson, JA) | 124 | (2-3) | 153-167 | 10.1016/S0378-1127(99)00063-8 |
| DeLucia91Ecol | Ecology | Resource-use efficiency and drought tolerance in adjacent great-basin and sierran plants | DELUCIA, EH (DELUCIA, EH); SCHLESINGER, WH (SCHLESINGER, WH) | 72 | 1 | 51-58 | 10.2307/1938901 |
| Derroire G et al 2018 | Scientific Report | Contrasting patterns of leaf trait variation among and within species during tropical dry forest succession in Costa Rica | Derroire, G (Derroire, Geraldine) ^[1,2] ; Powers, JS (Powers, Jennifer S.) ^[3,4] ; Hulshof, CM (Hulshof, Catherine M.) ^[5] ; Varela, LEC (Cardenas Varela, Luis E.) ^[6] ; Healey, JR (Healey, John R.) ^[1] | 8 | | 285 | 10.1038/s41598-017-18525-1 |
| Dominguez et al. 2015 | Spanish Journal of Agricultural Research | Leaf blade and petiole nutritional evolution and variability throughout the crop season for <i>Vitis vinifera</i> L. cv. Graciano | Dominguez, N (Dominguez, Natalia) ^[1] ; Garcia-Escudero, E (Garcia-Escudero, Enrique) ^[1] ; Romero, I (Romero, Izaskun) ^[1] ; Benito, A (Benito, Ana) ^[1] ; Martin, I (Martin, Ignacio) ^[1] | 13 | 3 | e0801 | 10.5424/sjar/2015133-5142 |

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|-----------------------------|---|--|--|-----|-------|-----------|---|
| Dordel et al. 2011 | Canadian Journal of Forest Research | Effects of nurse-tree crop species and density on nutrient and water availability to underplanted <i>Toona ciliata</i> in northeastern Argentina | Dordel, J (Dordel, Julia) ^[1] ; Simard, SW (Simard, Suzanne W.) ^[1] ; Bauhus, J (Bauhus, Juergen) ^[2] ; Guy, RD (Guy, Robert D.) ^[1] ; Prescott, CE (Prescott, Cindy E.) ^[1] ; Seely, B (Seely, Brad) ^[1] ; Hampel, H (Hampel, Hermann); Pozas, LJ (Pozas, Luciano J.) ^[3] | 41 | 9 | 1754-1768 | 10.1139/X11-093 |
| Dos Santos et al. 2006 | Forest Ecology and Management | Growth, leaf nutrient concentration and photosynthetic nutrient use efficiency in tropical tree species planted in degraded areas in central Amazonia | dos Santos, UM (dos Santos, UM); Goncalves, JFD (Goncalves, JFD); Feldpausch, TR (Feldpausch, TR) | 226 | (1-3) | 299-309 | 10.1016/j.foreco.2006.01.042 |
| Duan and Chang, 2015 | Ecological Engineering | Responses of lodgepole pine (<i>Pinus contorta</i>) and white spruce (<i>Picea glauca</i>) to fertilization in some reconstructed boreal forest soils in the oil sands region. | Duan, M., Chang, S.X. | 84 | | 354-361 | 10.1016/j.ecoleng.2015.09.046 |
| Duquesnay A. et al 2000 | Tree Physiology | Spatial and temporal variability of foliar mineral concentration in beech (<i>Fagus sylvatica</i>) stands in northeastern France | Duquesnay, A (Duquesnay, A); Dupouey, JL (Dupouey, JL); Clement, A (Clement, A); Ulrich, E (Ulrich, E); Le Tacon, F (Le Tacon, F) | 20 | 1 | 13-22 | |
| El-Jendoubi et al. 2012 | Plant and Soil | Prognosis of iron chlorosis in pear (<i>Pyrus communis</i> L.) and peach (<i>Prunus persica</i> L. Batsch) trees using bud, flower and leaf mineral concentrations | El-Jendoubi, H (El-Jendoubi, Hamdi) ^[1] ; Igartua, E (Igartua, Ernesto) ^[2] ; Abadia, J (Abadia, Javier) ^[1] ; Abadia, A (Abadia, Anunciacion) ^[1] | 354 | (1-2) | 121-139 | 10.1007/s11104-011-1049-7 |
| Ellison et al., 2019 | Ecology | Poor nutrition as a potential cause of divergent tree growth near the Arctic treeline in northern Alaska | Ellison, S.B.Z., Sullivan, P.F., Cahoon, S.M.P., Hewitt, R.E. | 100 | 12 | | |
| Faheem siddiqui et al. 2014 | Pakistan Journal Botany | Foliar and soil nutrient distribution in conifer forests of moist temperate areas of himalayan and hindukush region of Pakistan: a multivariate approach | Siddiqui, MF (Siddiqui, Muhammad Faheem) ^[1] ; Shaukat, SS (Shaukat, Syed Shahid) ^[2] ; Ahmed, M (Ahmed, Moïnuddin) ^[2] ; Khan, IA (Khan, Imran Ahmed) ^[3] ; Khan, N (Khan, Nasrullah) ^[4] | 46 | 5 | 1811-1827 | |
| Fajardo & Siefert 2016 | Oecologia | Phenological variation of leaf functional traits within species | Fajardo, A (Fajardo, Alex) ^[1] ; Siefert, A (Siefert, Andrew) ^[2] | 180 | 4 | 951-959 | 10.1007/s00442-016-3545-1 |
| Fajardo et al 2017 | Journal of Ecology | An assessment of carbon and nutrient limitations in the formation of the southern Andes tree line | Fajardo, A (Fajardo, Alex) ^[1] ; Piper, FI (Piper, Frida I.) ^[1] | 105 | 2 | 517-527 | 10.1111/1365-2745.12697 |
| Ferreira et al. 2016 | Forest ecology and management | Nutrient release from decomposing Eucalyptus harvest residues following simulated management practices in multiple sites in Brazil | Ferreira, GWD (Ferreira, Gabriel W. D.) ^[1] ; Soares, EMB (Soares, Emanuelle M. B.) ^[1] ; Oliveira, FCC (Oliveira, Fernanda C. C.) ^[1] ; Silva, IR (Silva, Ivo R.) ^[1] ; Dungait, JAJ (Dungait, Jennifer A. J.) ^[2] ; Souza, IF (Souza, Ivan F.) ^[1] ; Vergutz, L (Verguetz, Leonardus) ^[1] | 370 | | (1-11) | 10.1016/j.foreco.2016.03.047 |
| Fiala et al. 2017 | Zprávy Lesnického Výzkumu | | | | | | |
| Finer 1992 | Scandinavian Journal of Forest Research | Nutrient Concentrations in <i>Pinus sylvestris</i> Growing on an Ombrotrophic Pine Bog, and the Effects of PK and NPK Fertilization | Finer, L (Finer, Leena) | 7 | (1-4) | 205-218 | 10.1080/02827589209382713 |

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|---|---------------------------------------|--|--|-----|-------|-----------|---------------------------------|
| Galuszka et al. 2011 | Environ. Monit. Assess. | The influence of chloride deicers on mineral nutrition and the health status of roadside trees in the city of Kielce, Poland | Galuszka, A (Galuszka, Agnieszka) ^[1] ; Migaszewski, ZM (Migaszewski, Zdzislaw M.) ^[1] ; Podlaski, R (Podlaski, Rafał) ^[2] ; Dolegowska, S (Dolegowska, Sabina) ^[1] ; Michalik, A (Michalik, Artur) ^[1] | 176 | (1-4) | 451-464 | 10.1007/s10661-010-1596-z |
| Gatto et al. 2014 | Revista Brasileira da Ciência do solo | Nutrient cycling and balance in the Eucalyptus sp soil-plant system in the Distrito Federal, Brazil | Gatto, A (Gatto, Alcides) ^[1] ; Bussinguer, AP (Bussinguer, Angela Pereira) ^[2] ; Ribeiro, FC (Ribeiro, Fabiana Campos) ^[2] ; de Azevedo, GB (de Azevedo, Gileno Brito) ^[2] ; Bueno, MC (Bueno, Maria Cristina) ^[3] ; Monteiro, MM (Monteiro, Marina Morais) ^[2] ; de Souza, PF (de Souza, Pierre Farias) ^[2] | 38 | 3 | 879-887 | 10.1590/S0100-06832014000300019 |
| Giachetti et al. 2007 | Plant Biosystems | Effects of tannery waste on growth dynamics and metal uptake in <i>Salix Alba</i> L. | Giachetti, G (Giachetti, G.); Sebastiani, L (Sebastiani, L.) | 141 | 1 | 22-30 | 10.1080/11263500601153511 |
| Giertych et al. 1997 | Tree physiology | Distribution of elements along the length of Scots pine needles in a heavily polluted and a control environment | Giertych, MJ (Giertych, MJ); DeTemmerman, LO (DeTemmerman, LO); Rachwal, L (Rachwal, L) | 17 | 11 | 697-703 | |
| Gonçalves-Alvim SJ, et al 2006. Plant Ecology | Plant ecology | Sclerophylly in <i>Qualea parviflora</i> (Vochysiaceae): influence of herbivory, mineral nutrients, and water status | Goncalves-Alvim, SJ (Goncalves-Alvim, S. J.); Korndorf, G (Korndorf, Gaspar); Fernandes, GW (Fernandes, G. Wilson) | 187 | 2 | 153-162 | 10.1007/s11258-004-3286-9 |
| Gong et al. 2016 | | | | | | | |
| González-García et al. 2016 | Iforest Biogeosciences and Forestry | Nutritional, carbon and energy evaluation of <i>Eucalyptus nitens</i> short rotation bioenergy plantations in northwestern Spain | Gonzalez-Garcia, M (Gonzalez-Garcia, Marta) ^[1] ; Hevia, A (Hevia, Andrea) ^[1] ; Majada, J (Majada, Juan) ^[1] ; Rubiera, F (Rubiera, Fernando) ^[2] ; Barrio-Anta, M (Barrio-Anta, Marcos) ^[3] | 9 | | 303-310 | 10.3832/ifor1505-008 |
| Grootemaat et al. (2017), Oikos | Oikos | Scaling up flammability from individual leaves to fuel beds | Grootemaat, S (Grootemaat, Saskia) ^[1] ; Wright, IJ (Wright, Ian J.) ^[1] ; van Bodegom, PM (van Bodegom, Peter M.) ^[2] ; Cornelissen, JHC (Cornelissen, Johannes H. C.) ^[3] | 126 | 10 | 1428-1438 | 10.1111/oik.03886 |
| Grubb et al. 1994 | Journal of Tropical Ecology | Mineral nutrient status of coastal hill dipterocarp forest and <i>adinandra belukar</i> in Singapore - Analysis of soil, leaves and litter | GRUBB, PJ (GRUBB, PJ); TURNER, IM (TURNER, IM); BURSLEM, DFRP (BURSLEM, DFRP) | 10 | 4 | 559-577 | 10.1017/S0266467400008233 |
| Guan ZJ et al 2011. J Plant Res | Journal of plant research | Leaf anatomical structures of <i>Paphiopedilum</i> and <i>Cypripedium</i> and their adaptive significance | Guan, ZJ (Guan, Zhi-Jie) ^[1,2] ; Zhang, SB (Zhang, Shi-Bao) ^[3] ; Guan, KY (Guan, Kai-Yun) ^[1] ; Li, SY (Li, Shu-Yun) ^[1] ; Hu, H (Hu, Hong) ^[1] | 124 | 2 | 289-298 | 10.1007/s10265-010-0372-z |
| Guimaraes et al. 2015 | Revista Árvore | Biomass and nutrients of <i>Eucalyptus dunnii</i> Maiden stand in Pampa Gaucho | Guimaraes, CC (Guimaraes, Claudiney Couto) ^[1] ; Schumacher, MV (Schumacher, Mauro Valdir) ^[2] ; Witshoreck, R (Witshoreck, Rudi) ^[3] ; Souza, HP (Souza, Huan Pablo) ^[1] ; Santo, JC (Santo, Joel Carvalho) ^[3] | 39 | 5 | 873-882 | 10.1590/0100-6762201500500010 |

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|----------------------------|--|--|--|-----|-------|---------|----------------------------------|
| Güsewell & Koerselman 2002 | Perspectives in Plant Ecology, Evolution and Systematics | Variation in nitrogen and phosphorus concentrations of wetland plants | Güsewell, S (Güsewell, S); Koerselman, M (Koerselman, M) | 5 | 1 | 37-61 | 10.1078/1433-8319-000022 |
| Hall et al. 1973 | Phytopathological notes | | | | | | |
| Han et al. 2005 | New Phytologist | Leaf nitrogen and phosphorus stoichiometry across 753 terrestrial plant species in China | Han, WX (Han, WX); Fang, JY (Fang, JY); Guo, DL (Guo, DL); Zhang, Y (Zhang, Y) | 168 | 2 | 377-385 | 10.1111/j.1469-8137.2005.01530.x |
| Han et al. 2012 | Ecology Letters | | | | | | |
| Han et al. 2016 | Forest Science and Technology | The effects of organic manure and chemical fertilizer on the growth and nutrient concentrations of yellow poplar (<i>Liriodendron tulipifera</i> Lin.) in a nursery system | Han, SH (Han, Si Ho) ^[1] ; An, JY (An, Ji Young) ^[2] ; Hwang, J (Hwang, Jaehong) ^[3] ; Kim, SB (Kim, Se Bin) ^[1] ; Park, BB (Park, Byung Bae) ^[1] | 12 | 3 | 137-143 | 10.1080/21580103.2015.1135827 |
| Han, 2006 | | | | | | | |
| Harrington et al. 1995 | Oecologia | Forest growth along a rainfall gradient in Hawaii - <i>Acacia-koa</i> stand structure, productivity, foliar nutrients, and water-use and nutrient-use efficiencies | HARRINGTON, RA (HARRINGTON, RA); FOWNES, JH (FOWNES, JH); MEINZER, FC (MEINZER, FC); SCOWCROFT, PG (SCOWCROFT, PG) | 102 | 3 | 277-284 | 10.1007/BF00329794 |
| Hart et al. 2003 | Forest Ecology and Management | Biomass and macro-nutrients (above- and below-ground) in a New Zealand beech (<i>Nothofagus</i>) forest ecosystem: implications for carbon storage and sustainable forest management | Hart, PBS (Hart, PBS); Clinton, PW (Clinton, PW); Allen, RB (Allen, RB); Nordmeyer, AH (Nordmeyer, AH); Evans, G (Evans, G) | 174 | (1-3) | 281-294 | 10.1016/S0378-1127(02)00039-7 |
| Hartemink 2001 | Forest ecology and management | Biomass and nutrient accumulation of <i>Piper aduncum</i> and <i>Imperata cylindrica</i> fallows in the humid lowlands of Papua New Guinea | Hartemink, AE (Hartemink, AE) | 144 | (1-3) | 19-32 | 10.1016/S0378-1127(00)00655-1 |
| Harvey et al. 1999 | Canadian Journal of Forest Research | | | | | | |
| He JS et al 2006 | Oecologia | Stoichiometry and large-scale patterns of leaf carbon and nitrogen in the grassland biomes of China | He, JS (He, Jin-Sheng); Fang, JY (Fang, Jingyun); Wang, ZH (Wang, Zhiheng); Guo, DL (Guo, Dali); Flynn, DFB (Flynn, Dan F. B.); Geng, Z (Geng, Zhi) | 149 | 1 | 115-122 | 10.1007/s00442-006-0425-0 |
| Hejcman et al. 2016 | Grass and Forage Science | Forage quality of leaf fodder from the main woody species in Iceland and its potential use for livestock in the past and present | Hejcman, M (Hejcman, M.) ^[1,2] ; Hejcmanova, P (Hejcmanova, P.) ^[3] ; Pavlu, V (Pavlu, V.) ^[1] ; Thorhallsdottir, AG (Thorhallsdottir, A. G.) ^[4] | 71 | 4 | 649-658 | 10.1111/gfs.12224 |
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|------------------------|---|--|---|-----|-------|-----------|-------------------------------|
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|---|--------------------------------------|--|--|-----|-------|---------|---|
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| Kayama et al. 2009b | Trees-structure and function | Growth characteristics of Sakhalin spruce (<i>Picea glehnii</i>) planted on the northern Japanese hillsides exposed to strong winds | Kayama, M (Kayama, Masazumi) ^[2] ; Makoto, K (Makoto, Kobayashi) ^[3] ; Nomura, M (Nomura, Mutsumi) ^[2] ; Sasa, K (Sasa, Kaichiro) ^[2] ; Koike, T (Koike, Takayoshi) ^[1,3] | 23 | 1 | 145-157 | 10.1007/s00468-008-0263-2 |
| Kikamägi et al. 2014 | Trees-structure and function | The growth and nutrients status of conifers on ash-treated cutaway peatland | Kikamägi, K (Kikamaegi, Karin) ^[1] ; Ots, K (Ots, Katri) ^[1] ; Kuznetsova, T (Kuznetsova, Tatjana) ^[1] ; Pototski, A (Pototski, Aleksander) ^[2] | 28 | 1 | 53-64 | 10.1007/s00468-013-0929-2 |
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|-----------------------------|---|---|---|-----|-------|-----------|----------------------------------|
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| Lemma 2012 | Journal of Plant Nutrition and Soil Science | Soil chemical properties and nutritional status of trees in pure and mixed-species stands in south Ethiopia | Lemma, B (Lemma, Bekele) | 175 | 5 | 769-774 | 10.1002/jpln.201100221 |
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|-----------------------------|---|---|--|-----|-------|-----------|------------------------------------|
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| Mahadeva et al. 2015 | Journal of Plant Nutrition | Evaluation of macro and micro nutritive elemental levels in the mealy-bug (<i>Maconellicoccus hirsutus</i>)- Infested leaves of mulberry (<i>Morus sp.</i>) | Mahadeva, A (Mahadeva, A.) ^[1] ; Shree, MP (Shree, M. P.) ^[2] | 38 | 1 | 96-107 | 10.1080/01904167.2014.920381 |
| Majer et al. 1992 | Australian Journal of Ecology | Variation in foliar nutrients in Eucalyptus trees in eastern and western-Australia | MAJER, JD (MAJER, JD); RECHER, HF (RECHER, HF); GANESHANANDAM, S (GANESHANANDAM, S) | 17 | 4 | 383-393 | 10.1111/j.1442-9993.1992.tb00821.x |
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|-------------------------|---|--|---|-----|-------|-----------|---------------------------------|
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| Metali et al 2015 | New Phytologist | Controls on foliar nutrient and aluminium concentrations in a tropical tree flora: phylogeny, soil chemistry and interactions among elements | Metali, F (Metali, Faizah) ^[1] ; Abu Salim, K (Abu Salim, Kamariah) ^[1] ; Tennakoon, K (Tennakoon, Kushan) ^[1] ; Burslem, DFRP (Burslem, David F. R. P.) ^[2] | 205 | 1 | 280-292 | 10.1111/nph.12987 |
| Michopoulos et al. 2007 | Plant and soil | Nutrient cycling and foliar status in an urban pine forest in Athens, Greece | Michopoulos, P (Michopoulos, Panagiotis); Baloutsos, G (Baloutsos, George); Economou, A (Economou, Anastasios); Samara, C (Samara, Constantini); Thomaidis, NS (Thomaidis, Nikolaos S.); Grigoratos, T (Grigoratos, Theodoros) | 294 | (1-2) | 31-39 | 10.1007/s11104-007-9224-6 |
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|---|-------------------------------------|--|--|-----|-------|-----------|------------------------------|
| Neves et al. 2007 | Estuaries and Coasts | Primary production and nutrient content in two salt marsh species, <i>Atriplex portulacoides</i> L. and <i>Limoniastrum monopetalum</i> L., in Southern Portugal | Neves, JP (Neves, J. P.); Ferreira, LF (Ferreira, L. F.); Simoes, MP (Simoes, M. P.); Gazarini, LC (Gazarini, L. C.) | 30 | 3 | 459-468 | 10.1007/BF02819392 |
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| Potocic et al. 2003 | Periodicum biologorum | Recovery of black pine (<i>Pinus nigra</i> Arn.) needles in response to lowered SO ₂ in the air - a case study of Plomin thermal power plant (Croatia) | Potocic, N (Potocic, N); Seletkovic, I (Seletkovic, I); Lepedus, H (Lepedus, H); Cesar, V (Cesar, V) | 105 | 3 | 319-323 | |
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|------------------------|-------------------------------------|--|--|-----|-------|-----------|----------------------------------|
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| Skonieczna et al. 2014 | Drewno | Element content of Scots pine (<i>Pinus sylvestris</i> L.) stands of different densities | Skonieczna, J (Skonieczna, Joanna) ^[1] ; Malek, S (Malek, Stanislaw) ^[2] ; Polowy, K (Polowy, Krzysztof) ^[1] ; Wegiel, A (Wegiel, Andrzej) ^[1] | 57 | 192 | 77-87 | 10.12841/wood.1644-3985.S13.05 |
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| Van Wesemael 1992 | Forest ecology and management | | | | | | |

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|---------------------------------------|---|--|--|-----|-------|-----------|---------------------------------|
| Vanguelova et al. 2010 | Biogeochemistry | Long term effects of whole tree harvesting on soil carbon and nutrient sustainability in the UK | Vanguelova, E (Vanguelova, Elena) ^[1] ; Pitman, R (Pitman, Rona) ^[1] ; Luiro, J (Luiro, Jukka) ^[2] ; Helmisaari, HS (Helmisaari, Helja-Sisko) ^[2] | 101 | (1-3) | 43-59 | 10.1007/s10533-010-9511-9 |
| Varnagiryte-Kabasinskiene et al. 2015 | Iforest - Biogeosciences and Forestry | Vertical position of dry mass and elemental concentrations in Pinus sylvestris L. canopy under the different ash-nitrogen treatments | Varnagiryte-Kabasinskiene, I (Varnagiryte-Kabasinskiene, Iveta) ^[1,2] ; Stakenas, V (Stakenas, Vidas) ^[1] ; Miksys, V (Miksys, Virgilijus) ^[1] ; Kabasinskas, A (Kabasinskas, Audrius) ^[3] | 8 | | 838-845 | 10.3832/ifor1342-007 |
| Viera et al. 2009 | Ciência florestal | Nutrients concentration and retranslocation in the Pinus taeda L. needles | Viera, M (Viera, Marcio) ^[1] ; Schumacher, MV (Schumacher, Mauro Valdir) ^[2] | 19 | (3-4) | 375-382 | |
| Viera et al. 2011 | Revista Árvore | Biomass and removed nutrients in the first thinning of Pinus taeda L. stand in Cambara do Sul, RS | Viera, M (Viera, Marcio) ^[1] ; Schumacher, MV (Schumacher, Mauro Valdir) ^[2] ; Bonacina, DM (Bonacina, Darlan Michel) | 35 | 3 | 371-379 | 10.1590/S0100-67622011000300001 |
| Vitousek et al 1995 | Ecology | Foliar nutrients during long-term soil development in Hawaiian montane Rain-forest | VITOUSEK, PM (VITOUSEK, PM); TURNER, DR (TURNER, DR); KITAYAMA, K (KITAYAMA, K) | 76 | 3 | 712-720 | 10.2307/1939338 |
| Wallin et al. 1998 | Canadian Journal of Forest Research | Association of within-tree jack pine budworm feeding patterns with canopy level and within-needle variation of water, nutrient, and monoterpene concentrations | Wallin, KF (Wallin, KF); Raffa, KF (Raffa, KF) | 28 | 2 | 228-233 | 10.1139/cjfr-28-2-228 |
| Wan et al. 2009 | Journal of Plant Nutrition | Nutrient Elements in Leaves of Rare and Endangered Species in Wuhan Botanical Garden, China | Wan, KY (Wan, Kai-yuan) ^[1,2] ; Chen, F (Chen, Fang) ^[1] ; Tao, Y (Tao, Yong) ^[1,2] ; Chen, SS (Chen, Shu-sen) ^[1] | 32 | 11 | 1914-1940 | 10.1080/01904160903242391 |
| Wang et al. 1995 | Forest Ecology and Management | Aboveground biomass and nutrient accumulation in an age sequence of aspen (Populus tremuloides) stands in the boreal white and black spruce zone, British Columbia | WANG, JR (WANG, JR); ZHONG, AL (ZHONG, AL); COMEAU, P (COMEAU, P); TSZE, M (TSZE, M); KIMMINS, JP (KIMMINS, JP) | 78 | (1-3) | 127-138 | 10.1016/0378-1127(95)03590-0 |
| Wang et al. 1997 | Forest ecology and management | White spruce foliar nutrient concentrations in relation to tree growth and soil nutrient amounts | Wang, GG (Wang, GG); Klinka, K (Klinka, K) | 98 | 1 | 89-99 | 10.1016/S0378-1127(97)00048-0 |
| Wang et al. 2003 | Plant and soil | Seasonal changes in element contents in mangrove element retranslocation during leaf senescence | Wang, WQ (Wang, WQ); Wang, M (Wang, M); Lin, P (Lin, P) | 252 | 2 | 187-193 | 10.1023/A:1024704204037 |
| Wang et al. 2007 | Scandinavian Journal of Forest Research | Effects of wood ash, vitality fertilizer and logging residues on needle and root chemistry in a young Norway spruce stand | Wang, P (Wang, Pei); Olsson, BA (Olsson, Bengt A.); Lundkvist, H (Lundkvist, Helene) | 22 | 2 | 136-148 | 10.1080/02827580701231480 |
| Wang W & Lin P 1999 | Mangroves and salt marshes | | | | | | |
| Wang, 1987b | | | | | | | |
| Wiersma et al. 2007 | Environmental Monitoring Assessment | Forest vegetation monitoring and foliar chemistry of red spruce and red maple at Acadia National Park in Maine | Wiersma, GB (Wiersma, G. Bruce); Elvir, JA (Elvir, Jose Alexander); Eckhoff, JD (Eckhoff, Janet D.) | 126 | (1-3) | 27-37 | 10.1007/s10661-006-9329-z |

7. Appendix IV

| | | | | | | | |
|----------------------------|-------------------------------------|--|--|-----|-------|-----------|-------------------------------|
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| Wu et al. 2007 | Forest Ecology and Management | Mineral nutrient status of tree species in relation to environmental factors in the subtropical rain forest of Taiwan | Wu, CC (Wu, Chia-Chi); Tsui, CC (Tsui, Chun-Chih); Hseih, CF (Hseih, Chang-Fu); Asio, VB (Asio, Victor B.); Chen, ZS (Chen, Zueng-Sang) | 239 | (1-3) | 81-91 | 10.1016/j.foreco.2006.11.008 |
| Wu et al. 2011 | Silvae Genetica | Variations in biomass, nutrient contents and nutrient use efficiency among Chinese fir provenances | Wu, PF (Wu, Pengfei) ^[1] ; Tigabu, M (Tigabu, Mulualem) ^[2] ; Ma, XQ (Ma, Xiangqing) ^[1] ; Oden, PC (Oden, Per Christer) ^[2] ; He, YL (He, Youlan) ^[1] ; Yu, XT (Yu, Xintuo) ^[1] ; He, ZY (He, Zhiying) ^[1] | 60 | (3-4) | 95-105 | 10.1515/sg-2011-0014 |
| Wu et al. 2012 | Forest Ecology and Management | Leaf nitrogen and phosphorus stoichiometry of Quercus species across China | Wu, TG (Wu, Tonggui) ^[1] ; Dong, Y (Dong, Yi) ^[1] ; Yu, MK (Yu, Mukui) ^[1] ; Wang, GG (Wang, G. Geoff) ^[2] ; Zeng, DH (Zeng, De-Hui) ^[3] | 284 | | 116-123 | 10.1016/j.foreco.2012.07.025 |
| Wu et al. 2014 | Ecological Complexity | Patterns of leaf nitrogen and phosphorus stoichiometry among Quercus acutissima provenances across China | Wu, TG (Wu, Tonggui) ^[1] ; Wang, GG (Wang, G. Geoff) ^[2] ; Wu, QT (Wu, Qianting) ^[1,3] ; Cheng, XR (Cheng, Xiangrong) ^[1] ; Yu, MK (Yu, Mukui) ^[1] ; Wang, W (Wang, Wan) ^[1] ; Yu, XB (Yu, Xuebiao) ^[3] | 17 | | 32-39 | 10.1016/j.ecocom.2013.07.003 |
| Xu 2006 | Ann. For. Sci. | Nutrient dynamics in decomposing needles of Pinus luchuensis after typhoon disturbance in a subtropical environment | Xu, XN (Xu, Xiaoniu) | 63 | 7 | 707-713 | 10.1051/forest:2006051 |
| Xu et al., 2003 | | | | | | | |
| Xue et al. 1996 | Forest Ecology and Management | Nutrient cycling in a Chinese-fir (Cunninghamia lanceolata) stand on a poor site in Yishan, Guangxi | Xue, L (Xue, L) | 89 | (1-3) | 115-123 | |
| Yan et al. 2016 | Journal of Plant Ecology | Leaf nutrient dynamics and nutrient resorption: a comparison between larch plantations and adjacent secondary forests in Northeast China | Yan, T (Yan, Tao) ^[1,2,3] ; Lu, XT (Lu, Xiaotao) ^[1] ; Yang, K (Yang, Kai) ^[1,2] ; Zhu, JJ (Zhu, Jiaojun) ^[1,2] | 9 | 2 | 165-173 | 10.1093/jpe/rtv034 |
| Yang et al 2015 | Journal of Ecology | C:N:P stoichiometry of Artemisia species and close relatives across northern China: unravelling effects of climate, soil and taxonomy | Yang, XJ (Yang, Xuejun) ^[1] ; Huang, ZY (Huang, Zhenying) ^[1] ; Zhang, KL (Zhang, Keliang) ^[1] ; Cornelissen, JHC (Cornelissen, Johannes H. C.) ^[2] | 103 | 4 | 1020-1031 | 10.1111/1365-2745.12409 |
| Yang et al. 2016 | Canadian Journal of Forest Research | Sources of variability in tissue chemistry in northern hardwood species | Yang, Y (Yang, Yang) ^[1] ; Yanai, RD (Yanai, Ruth D.) ^[1] ; Fatemi, FR (Fatemi, Farrah R.) ^[2] ; Levine, CR (Levine, Carrie R.) ^[3] ; Lilly, PJ (Lilly, Paul J.) ^[4] ; Briggs, RD (Briggs, Russell D.) ^[1] | 46 | 3 | 285-296 | 10.1139/cjfr-2015-0302 |
| Zas, R. & Serrada, R. 2003 | Forest Ecology and Management | Foliar nutrient status and nutritional relationships of young Pinus radiata D. Don plantations in northwest Spain | Zas, R (Zas, R); Serrada, R (Serrada, R) | 174 | (1-3) | 167-176 | 10.1016/S0378-1127(02)00027-0 |

| | | | | | | | |
|---------------------|------------------------------|--|--|----|---|---------|---------------------------|
| Zatylny et al. 2006 | Journal of Plant Nutrition | Development of standard concentrations of foliar nutrients for saskatoon | Zatylny, AM (Zatylny, AM); St-Pierre, RG (St-Pierre, RG) | 29 | 2 | 195-207 | 10.1080/01904160500468662 |
| Zech et al., 1991 | Turrialba | Mineral deficiencies of forest trees in Yucatan (Mexico) and consequences for land-use | Zech, W., Drechsel, P., Neugebauer, B. | 41 | 2 | 230-236 | |
| Zhai et al., 1987 | | | | | | | |
| Zhou et al. 2016 | Journal of forestal research | | | | | | |

Table S4.7 Abbreviations, complete names and units for the variables used to build the models.

| Nick | Complete names | Units | Source |
|-------|---|--------------------------------------|------------------------|
| Var28 | Minimum June July August precipitation | mm | Metzger et al., 2013 |
| Var29 | Maximum June July August precipitation | mm | Metzger et al., 2013 |
| Var30 | Minimum December January February precipitation | mm | Metzger et al., 2013 |
| Var31 | Maximum December January February precipitation | mm | Metzger et al., 2013 |
| Var41 | Daily mean solar radiation | kJ m ⁻² day ⁻¹ | Fick and Hijmans, 2017 |
| Var42 | Altitude | m | Fick and Hijmans, 2017 |
| BD | Bulk density | g/cm ³ | Shangguan et al., 2014 |
| BS | Base saturation | % | Shangguan et al., 2014 |
| CACO3 | CaCo ₃ | % of weight | Shangguan et al., 2014 |
| CEC | Cation exchange capacity | cmol/kg | Shangguan et al., 2014 |
| CLAY | Clay content | % of weight | Shangguan et al., 2014 |
| ECE | Electrical conductivity | ds/m | Shangguan et al., 2014 |
| ESP | Exchangeable Na | cmol/kg | Shangguan et al., 2014 |
| EXAL | Exchangeable Al | cmol/kg | Shangguan et al., 2014 |
| EXCA | Exchangeable Ca | cmol/kg | Shangguan et al., 2014 |
| EXH | Exchangeable acidity | cmol/kg | Shangguan et al., 2014 |
| EXK | Exchangeable K | cmol/kg | Shangguan et al., 2014 |
| EXMG | Exchangeable Mg | cmol/kg | Shangguan et al., 2014 |
| EXNA | Exchangeable Na | cmol/kg | Shangguan et al., 2014 |
| GRAV | Gravel content | % of volume | Shangguan et al., 2014 |
| GYP | Gypsum | % of weight | Shangguan et al., 2014 |
| OC | Organic carbon | % of weight | Shangguan et al., 2014 |

| | | | |
|--------------------|---------------------------------------|--|------------------------|
| PBR | P Bray1 method | ppm of weight | Shangguan et al., 2014 |
| PHCA | Ph(CaCl ₂) | | Shangguan et al., 2014 |
| PHH ₂ O | Ph(H ₂ o) | | Shangguan et al., 2014 |
| PHK | Ph(KCl) | | Shangguan et al., 2014 |
| PNZ | P retention New Zeland method | % of weight | Shangguan et al., 2014 |
| SAND | Sand content | % of weight | Shangguan et al., 2014 |
| SILT | Silt content | % of weight | Shangguan et al., 2014 |
| TC | Total carbon | % of weight | Shangguan et al., 2014 |
| TK | Total K | % of weight | Shangguan et al., 2014 |
| TN | Total N | % of weight | Shangguan et al., 2014 |
| TP | Total P | % of weight | Shangguan et al., 2014 |
| TS | Total S | % of weight | Shangguan et al., 2014 |
| VMC1 | Volumetric water content at -10 KPa | % of volume | Shangguan et al., 2014 |
| VMC2 | Volumetric water content at -33 KPa | % of volume | Shangguan et al., 2014 |
| VMC3 | Volumetric water content at -1500 KPa | % of volume | Shangguan et al., 2014 |
| Modelslat | Latitude | ° | - |
| Inorganic_Ndepdry | Dry inorganic N deposition | kgN·km ⁻² ·year ⁻¹ | Ackerman et al. (2018) |
| Inorganic_Ndeptot | Total inorganic N deposition | kgN·km ⁻² ·year ⁻¹ | Ackerman et al. (2018) |
| Inorganic_Ndepwet | Wet inorganic N deposition | kgN·km ⁻² ·year ⁻¹ | Ackerman et al. (2018) |
| Organic_Ndepdry | Dry organic N deposition | kgN·km ⁻² ·year ⁻¹ | Ackerman et al. (2018) |
| Organic_Ndeptot | Total organic N deposition | kgN·km ⁻² ·year ⁻¹ | Ackerman et al. (2018) |
| Organic_Ndepwet | Wet organic N deposition | kgN·km ⁻² ·year ⁻¹ | Ackerman et al. (2018) |
| Oxred_Ndepdryox | Dry oxidate N deposition | kgN·km ⁻² ·year ⁻¹ | Ackerman et al. (2018) |
| Oxred_Ndepdryred | Dry reduced N deposition | kgN·km ⁻² ·year ⁻¹ | Ackerman et al. (2018) |
| Oxred_Ndepotox | Total oxidate N deposition | kgN·km ⁻² ·year ⁻¹ | Ackerman et al. (2018) |
| Oxred_Ndepotred | Total reduced N deposition | kgN·km ⁻² ·year ⁻¹ | Ackerman et al. (2018) |
| Oxred_Ndepwetox | Wet oxidate N deposition | kgN·km ⁻² ·year ⁻¹ | Ackerman et al. (2018) |

| | | | |
|----------------------|--|--|------------------------|
| Oxred_Nd epwetred | Wet reduced N deposition | kgN·km ⁻² ·year ⁻¹ | Ackerman et al. (2018) |
| Pdep | P deposition | mg m ⁻² year ⁻¹ | Wang et al. (2017) |
| Bio_1 | Annual mean temperature | °C | Fick and Hijmans, 2017 |
| Bio_2 | Mean diurnal range | °C | Fick and Hijmans, 2017 |
| Bio_3 | Isothermality | | Fick and Hijmans, 2017 |
| Bio_4 | Temperature seasonality | | Fick and Hijmans, 2017 |
| Bio_5 | Maximum temperature of the warmest month | °C | Fick and Hijmans, 2017 |
| Bio_6 | Minimum temperature of the coldest month | °C | Fick and Hijmans, 2017 |
| Bio_7 | Annual temperature range | °C | Fick and Hijmans, 2017 |
| Bio_8 | Mean temperature of the wettest quarter | °C | Fick and Hijmans, 2017 |
| Bio_9 | Mean temperature of the driest quarter | °C | Fick and Hijmans, 2017 |
| Bio_10 | Mean temperature of the warmest quarter | °C | Fick and Hijmans, 2017 |
| Bio_11 | Mean temperature of the coldest quarter | °C | Fick and Hijmans, 2017 |
| Bio_12 | Annual precipitation | mm | Fick and Hijmans, 2017 |
| Bio_13 | Precipitation of the wettest month | mm | Fick and Hijmans, 2017 |
| Bio_14 | Precipitation of the driest month | mm | Fick and Hijmans, 2017 |
| Bio_15 | Precipitation seasonality | | Fick and Hijmans, 2017 |
| Bio_16 | Precipitation of wettest quarter | mm | Fick and Hijmans, 2017 |
| Bio_17 | Precipitation of driest quarter | mm | Fick and Hijmans, 2017 |
| Bio_18 | Precipitation of warmest quarter | mm | Fick and Hijmans, 2017 |
| Bio_19 | Precipitation of coldest quarter | mm | Fick and Hijmans, 2017 |
| Et0_yr | Annual evapotranspiration | mm/day | Trabucco & Zomer, 2019 |
| Ai_et0 | Aridity Index | | Trabucco & Zomer, 2019 |
| PETseasonality | Evapotranspiration seasonality | | Trabucco & Zomer, 2019 |

7. Appendix IV

TS8. a) Reclassification table from the European Space Agency - Climate Change Initiative - Land Cover (ESA-CCI-LC) map (ESA. Land Cover CCI Product User Guide Version 2. Tech. Rep. 2017. Available at: maps.elie.ucl.ac.be/CCI/viewer/download/ESACCI-LC-Ph2-PUGv2_2.0.pdf) to our morphoclimatic types. b) Equivalent categories from ESA-CCI-LC map

| Vegetation group | ESA-CCI-LC correspondence |
|--|---|
| Tropical evergreen | 12,40,50,70,71,72,90,100,120,121,160,170 |
| Tropical deciduous | 12,40,60,61,62,90,100,120,122,160,170 |
| Temperate coniferous | 12,40,70,71,72,80,81,82,90,100 |
| Temperate broadleaved evergreen | 12,40,50,90,100,120,121,160,170 |
| Temperate broadleaved deciduous | 12,40,60,61,62,90,100,120,122,160,170 |
| Boreal | 40,60,61,62,70,71,72,80,81,82,90,100,120,121,122,160,170 |
| No data | 10,11,20,30,110,130,140,150,151,152,153,180,190,200,201,202,210,220 |

TS8. b

Legend of the global CCI-LC maps, based on LCCS

| Value | Label | Color |
|-------|--|-------|
| 0 | No Data | |
| 10 | Cropland, rainfed | |
| 11 | Herbaceous cover | |
| 12 | Tree or shrub cover | |
| 20 | Cropland, irrigated or post-flooding | |
| 30 | Mosaic cropland (>50%) / natural vegetation (tree, shrub, herbaceous cover) (<50%) | |
| 40 | Mosaic natural vegetation (tree, shrub, herbaceous cover) (>50%) / cropland (<50%) | |
| 50 | Tree cover, broadleaved, evergreen, closed to open (>15%) | |
| 60 | Tree cover, broadleaved, deciduous, closed to open (>15%) | |
| 61 | Tree cover, broadleaved, deciduous, closed (>40%) | |
| 62 | Tree cover, broadleaved, deciduous, open (15-40%) | |
| 70 | Tree cover, needleleaved, evergreen, closed to open (>15%) | |
| 71 | Tree cover, needleleaved, evergreen, closed (>40%) | |
| 72 | Tree cover, needleleaved, evergreen, open (15-40%) | |
| 80 | Tree cover, needleleaved, deciduous, closed to open (>15%) | |
| 81 | Tree cover, needleleaved, deciduous, closed (>40%) | |
| 82 | Tree cover, needleleaved, deciduous, open (15-40%) | |
| 90 | Tree cover, mixed leaf type (broadleaved and needleleaved) | |
| 100 | Mosaic tree and shrub (>50%) / herbaceous cover (<50%) | |
| 110 | Mosaic herbaceous cover (>50%) / tree and shrub (<50%) | |
| 120 | Shrubland | |
| 121 | Evergreen shrubland | |
| 122 | Deciduous shrubland | |
| 130 | Grassland | |
| 140 | Lichens and mosses | |
| 150 | Sparse vegetation (tree, shrub, herbaceous cover) (<15%) | |
| 151 | Sparse tree (<15%) | |
| 152 | Sparse shrub (<15%) | |
| 153 | Sparse herbaceous cover (<15%) | |
| 160 | Tree cover, flooded, fresh or brakish water | |
| 170 | Tree cover, flooded, saline water | |
| 180 | Shrub or herbaceous cover, flooded, fresh/saline/brakish water | |
| 190 | Urban areas | |
| 200 | Bare areas | |
| 201 | Consolidated bare areas | |
| 202 | Unconsolidated bare areas | |
| 210 | Water bodies | |
| 220 | Permanent snow and ice | |

Table S4.9 Final variables selected per each model using the Kaiser-Meyer-Olkin method. The 19 least correlated per model. TropE = Tropical evergreen, TropD = Tropical deciduous, TempC = Temperate coniferous, TempBE = Temperate broadleaved evergreen, TempBD = Temperate broadleaved deciduous, Bor = Boreal. Complete variable names are shown in table S7.

| vars | N_Tr op E | N_Tr op D | N_Temp C | N_Temp pEB | N_Temp pDB | N_Bor | P_Tr op E | P_Tr op D | P_Temp pC | P_Temp pEB | P_Temp pDB | P_Bor | K_Tr op E | K_Tr op D | K_Temp C | K_Temp pEB | K_Temp pDB | K_Bor |
|-------|-----------|-----------|----------|------------|------------|-------|-----------|-----------|-----------|------------|------------|-------|-----------|-----------|----------|------------|------------|-------|
| var28 | | | x | | x | x | | | x | | x | x | | | x | | | |
| var29 | | | x | | | x | | | x | | | x | | | x | | x | x |
| var30 | | | | | | | | | x | | | | | x | | | | |
| var31 | x | | | | | | | | | | | | | x | | | | x |
| var41 | x | x | x | x | x | | | x | x | x | x | | | | | x | x | |
| var42 | | | | | | | | | | | | | | | | | | |
| BD | | | | | | | | | | | | | | | | | | x |
| BS | x | x | x | x | x | | x | x | x | x | | | | | x | | x | |
| CACO3 | | | x | | | | | | x | | | | | | x | | | |
| CEC | x | x | | | | | x | x | | x | | | x | x | | x | | |
| CLAY | | | | | | | | | | | | | | | | | | |
| ECE | | | x | | | | | | | x | | | | | | x | | |
| ESP | | | | | | | | | | | | | x | | | | | |
| EXAL | | x | | | x | | | x | | | | | | | | x | | |
| EXCA | | | x | x | | | | x | x | x | | | | x | x | x | x | |
| EXH | x | x | | | | | x | | | | | | x | | | | | |
| EXK | x | x | x | x | x | | x | x | x | x | | x | x | | x | | x | x |
| EXMG | | | | | | | | | | | | | | x | | | | |
| EXNA | | | | | | | | | | | | | | | | | | |
| GRAV | | x | | | | | | x | | | | | | | | | | |
| GYP | | | | | | | | | | | | | x | | | | | |
| OC | | | | | | | | | | | | | | | | | | |
| PBR | | | | | | | | | | | | | | | | | | |
| PHCA | x | x | x | x | x | | x | x | x | x | x | | | x | x | | x | |
| PHH2O | x | x | x | x | x | | x | x | x | | x | | x | | x | x | x | |
| PHK | x | x | x | x | x | | | x | x | x | x | | x | | x | x | x | |
| PNZ | | | | | | | | | | | | | | | | | | |
| SAND | | | | | | | | | | | | | | | | | | |
| SILT | | | | | | | | | | | | | | | | | | |

7.Appendix IV

| | | | | | | | | | | | | | | | | | | |
|------------------|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|
| wc2.1_30s_bio_15 | x | x | | | x | | | x | | | | | x | x | | | | |
| wc2.1_30s_bio_16 | | | | | | | | | | x | x | | | | | | x | x |
| wc2.1_30s_bio_17 | | x | | x | x | x | | x | | x | x | | | | | x | x | x |
| wc2.1_30s_bio_18 | | | x | | | x | | x | | | | | | | x | x | | |
| wc2.1_30s_bio_19 | | | x | | x | | | | | | x | | | | x | | x | |
| et0_yr | | x | x | x | x | x | | x | x | x | x | x | | x | x | x | x | |
| ai_et0 | x | x | | x | x | | | | x | x | x | | | | x | | x | |
| PETseasonality | x | x | x | x | x | x | x | | x | x | x | | x | | x | x | x | |

Appendix V: Global distribution and drivers of forest biome foliar N:P ratios

Table S5.1 See table S4.6

Table S5.2 See table S4.7

Table S5.3 See table S4.8a and S4.8b

Table S5.4

| | vars | Trop | TempN | TempB | Bor |
|----|-------|------|-------|-------|-----|
| 1 | var28 | | x | x | |
| 2 | var29 | | x | | x |
| 3 | var30 | | | | |
| 4 | var31 | x | | | x |
| 5 | var41 | x | x | x | |
| 6 | var42 | | | | |
| 7 | BD | | | | |
| 8 | BS | x | x | x | |
| 9 | CACO3 | | x | | |
| 10 | CEC | x | | | |
| 11 | CLAY | | | | |
| 12 | ECE | | | | |
| 13 | ESP | x | | | |
| 14 | EXAL | | | | |
| 15 | EXCA | | x | x | |
| 16 | EXH | x | | | |
| 17 | EXK | x | x | x | x |
| 18 | EXMG | | | | |
| 19 | EXNA | | | | |
| 20 | GRAV | | | | |
| 21 | GYP | | | | |
| 22 | OC | | | | |
| 23 | PBR | | | | |
| 24 | PHCA | x | x | x | |

| | | | | | |
|----|-------------------|---|---|---|---|
| 25 | PHH2O | x | x | x | |
| 26 | PHK | | x | x | |
| 27 | PNZ | | | | |
| 28 | SAND | | | | |
| 29 | SILT | | | | |
| 30 | TC | | | | |
| 31 | TK | x | | | |
| 32 | TN | | | | |
| 33 | TP | | | | |
| 34 | TS | | | | |
| 35 | VMC1 | | | | |
| 36 | VMC2 | | | | |
| 37 | VMC3 | | | | x |
| 38 | modelslat | x | | | |
| 39 | inorganic_Ndepdry | x | | | x |
| 40 | inorganic_Ndeptot | x | | | x |
| 41 | inorganic_Ndepwet | | | | |
| 42 | organic_Ndepdry | | | | |
| 43 | organic_Ndeptot | | | | |
| 44 | organic_Ndepwet | | | | |
| 45 | oxred_Ndepdryox | | | | x |
| 46 | oxred_Ndepdryred | | | | |
| 47 | oxred_Ndeptotox | | | | x |
| 48 | oxred_Ndeptotred | | | | |
| 49 | oxred_Ndepwetox | | | | |
| 50 | oxred_Ndepwetred | | | | |
| 51 | Pdep | | x | | x |
| 52 | wc2.1_30s_bio_1 | | | | |
| 53 | wc2.1_30s_bio_2 | | | x | |
| 54 | wc2.1_30s_bio_3 | | | | |
| 55 | wc2.1_30s_bio_4 | | | | |
| 56 | wc2.1_30s_bio_5 | | | | |
| 57 | wc2.1_30s_bio_6 | x | | | x |
| 58 | wc2.1_30s_bio_7 | x | | | |
| 59 | wc2.1_30s_bio_8 | | x | x | x |

| | | | | | |
|-----------|------------------|---|---|---|---|
| 60 | wc2.1_30s_bio_9 | | x | x | x |
| 61 | wc2.1_30s_bio_10 | | | | x |
| 62 | wc2.1_30s_bio_11 | | | | x |
| 63 | wc2.1_30s_bio_12 | | | x | |
| 64 | wc2.1_30s_bio_13 | | x | | x |
| 65 | wc2.1_30s_bio_14 | | | x | |
| 66 | wc2.1_30s_bio_15 | | | | |
| 67 | wc2.1_30s_bio_16 | | | | x |
| 68 | wc2.1_30s_bio_17 | | | x | x |
| 69 | wc2.1_30s_bio_18 | | x | x | |
| 70 | wc2.1_30s_bio_19 | x | | | |
| 71 | et0_yr | x | x | x | x |
| 72 | ai_et0 | | x | x | |
| 73 | PETseasonality | x | x | x | |