Research

# Positive tree diversity effect on fine root biomass: via density dependence rather than spatial root partitioning



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The importance of species richness to ecosystem functioning and services is a central tenet of biological conservation. However, most of our theory and mechanistic understanding is based on diversity found aboveground. Our study sought to better understand the relationship between diversity and belowground function by studying root biomass across a plant diversity gradient. We collected soil cores from 91 plots with between 1 and 12 aboveground tree species in three natural secondary forests to measure fine root ( $\leq 2$  mm in diameter) biomass. Molecular methods were used to identify the tree species of fine roots and to estimate fine root biomass for each species. This study tested whether the spatial root partitioning (species differ by belowground territory) and symmetric growth (the capacity to colonize nutrient-rich hotspots) underpin the relationship between aboveground species richness and fine root biomass. All species preferred to grow in nutrient-rich areas and symmetric growth could explain the positive relationship between aboveground species richness and fine root biomass. However, symmetric growth only appeared in the nutrient-rich upper soil layer (0-10 cm). Structural equation modelling indicated that aboveground species richness and stand density significantly affected fine root biomass. Specifically, fine root biomass depended on the interaction between aboveground species richness and stand density, with fine root biomass increasing with species richness at lower stand density, but not at higher stand density. Overall, evidence for spatial (i.e. vertical) root partitioning was inconsistent; assumingly any roots growing into deeper unexplored soil layers were not sufficient contributors to the positive diversity-function relationship. Alternatively, density-dependent biotic interactions affecting tree recruitment are an important driver affecting productivity in diverse subtropical forests but the usual root distribution patterns in line with the spatial root partitioning hypothesis are unrealistic in contexts where soil nutrients are heterogeneously distributed.

Keywords: biodiversity–ecosystem function, molecular methods, spatial root partitioning, stand density, symmetric root growth

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### Introduction

There is scientific consensus that biodiversity strongly affects ecosystem functions and services, such as belowground biomass production and nutrient cycling, and the services provided to human (Bardgett and van Der Putten 2014, Gould et al. 2016). However, we lack mechanistic understanding of the ways biodiversity affects functioning, and especially its impact on belowground processes. Fine roots (roots  $\leq 2$ mm in diameter) are essential to belowground plant productivity (Bardgett et al. 2014, Mommer et al. 2015), accounting for between 22% and 76% of net primary productivity in terrestrial ecosystems (Gower et al. 1996, Jackson et al. 1997, Ma and Chen 2016). Research on the fine root dynamics in natural forests (Gale and Grigal 1987, Hendrick and Pregitzer 1992, Jackson et al. 1997) lags behind our understanding of aboveground diversity-function relationships (Huang et al. 2010, Zhang et al. 2012, Liang et al. 2016) due to logistical difficulties with sampling (Mommer et al. 2010, Zhang et al. 2012, Ma and Chen 2017). Fine roots are responsible for water and nutrient uptake and play an important role in mediating species coexistence, affecting spatial niche partitioning belowground and impacting broader niche space dynamics, ecosystem productivity (de Kroon et al. 2012, Valverde-Barrantes et al. 2015, Mommer et al. 2016) and nutrient cycling (Adams et al. 2013, Freschet and Roumet 2017). Understanding the mechanisms controlling fine root production is essential to disentangle plant interactions, resource use and the resilience of ecosystems to perturbation (Ma and Chen 2016, 2017).

The mechanisms by which biodiversity affects the total standing biomass and production of fine roots is a topic of debate. Most evidence supports the positive relationship between species richness and root production (Brassard et al. 2013, Xiang et al. 2015, Ma and Chen 2017, 2018, Mommer et al. 2018), but non-significant and negative effects have been reported (Jacob et al. 2013, Domisch et al. 2015). Similarly, a positive relationship between species richness and fine root biomass was reported in grasslands (Oram et al. 2018, Mahaut et al. 2020), while results from temperate forests (Meinen et al. 2009, Valverde-Barrantes et al. 2015) exhibited contrasting results. The contrasting findings may stem from the scale-dependent relationships between tree species richness and ecosystem function in forests (Chisholm et al. 2013). The causes of variation may include factors like site conditions, species composition and functional diversity, plant density and spatial arrangement, and stand legacy and development stage (Brassard et al. 2013, Chisholm et al. 2013, Forrester and Bauhus 2016). The mechanisms remain unclear for the overall positive effect of diversity on fine root production in ecosystems dominated by woody species, though the effect is widespread according to a recent metaanalysis (Ma and Chen 2016).

Resource partitioning is hypothesized to occur when species use different portions of the available resource pool across space, time and chemical form. Partitioning is expected to result in the more complete use of resources as diversity increases (Tilman 1999, Barry et al. 2020). The hypothesis predicts that higher species richness will also increase productivity by increasing the likelihood of including species with complementary traits and resource acquisition strategies, although some species have life-history traits that allow them to surpass the average biomass in mixed communities in certain circumstances. Consequently, more diverse forest stands have the potential to support more above and belowground biomass. Indeed, root biomass in mixed forests may be greater due to resources partitioning that avoid interspecific competition, at least when the major resource limitation for plant growth is belowground (Mahaut et al. 2020). For instance, the depletion of resources in surface soils due to competition may cause plants to allocate root growth to deeper horizons, resulting in more evenly distributed resource use across the whole profile (Mueller et al. 2013). The positive relationship between species richness and belowground biomass may, therefore, result from more fine roots growing deeper into vertical soil volumes in species-rich stands (Brassard et al. 2013). This phenomenon is termed spatial root partitioning, where species alter their colonization of belowground spaces as a result of resource partitioning.

In species rich forests, root biomass may also be impacted by changes in tree root growth strategies (Valverde-Barrantes et al. 2015). Root growth can be symmetric or asymmetric, depending on the response of tree species to nutrient availability according to soil horizon or heterogeneity. In a scenario of symmetric growth, all species have an equal capacity to detect and colonize nutrient-rich hotspots, resulting in a positive correlation between root biomass and species richness in areas with higher nutrient availability. Conversely, in an asymmetric scenario, a limited number of pre-emptive species invest more in root growth or alter morphological traits to increase nutrient absorption efficiency. In this scenario, less competitive species are excluded from or less effective to take advantage from high nutrient patches.

Negative biotic feedbacks can alter plant diversity-productivity relationships, such as density dependence effects like the Janzen-Connell effect (Petermann et al. 2008, Schnitzer et al. 2011). The negative biotic feedbacks occur when enemies and/or pathogens are sufficiently speciesspecific that tree performance is suppressed when they occur among members of their own species in a negative densitydependent manner, leading to less growth suppression in plant communities with diverse species relative to monocultures (Janzen 1970, Connell 1971, Johnson et al. 2012). Thus, stand density is another important factor influencing the relationship between species richness and root biomass, where richness might be positively correlated with stand density (Kennedy et al. 2002, Marquard et al. 2009). As a result, the assembly of plant communities with diverse species could be favoured compared to monocultures (Barry et al. 2019) and both species richness and stand density need to be considered when understanding effects on fine root biomass (Forrester and Bauhus 2016).

It is critical to identify the relative biomass and spatial distribution of plant species belowground to test whether the relationship between species richness and fine root biomass is driven by resource partitioning (i.e. spatial distribution) or growth strategy (i.e. symmetric versus asymmetric). Until recently, the identification of fine roots was a limiting factor in ecological studies since the roots of distinct species closely intermingle and can be difficult to distinguish morphologically (Mommer et al. 2010). Molecular methods provide an effective approach to identify roots in diverse plant communities (Jones et al. 2011, Hiiesalu et al. 2012, Frank et al. 2015, Zeng et al. 2015, 2017), making it possible to estimate standing root biomass at the species level (Valverde-Barrantes et al. 2015, Oram et al. 2018).

Most studies on the mechanisms controlling diversity– function relationships have been conducted by experimental manipulation (He et al. 2005, Schnitzer et al. 2011, Mueller et al. 2013, Domisch et al. 2015, Oram et al. 2018). However, an increasing number of studies have proven that the relationships between biodiversity and ecosystem function occurring in naturally assembled communities might deviate from experimental manipulations (Hooper et al. 2005, Leuschner et al. 2009, Cardinale et al. 2011, van der Plas 2019). Therefore, with the help of new molecular tools, we investigated how the standing fine root biomass varied along a tree diversity gradient in naturally-occurring subtropical forests in southern China. These forests are highly diverse (Bruelheide et al. 2011), productive (Yu et al. 2014) and represent complex successional dynamics (Xiang et al. 2015), making them a relevant model system for studying belowground tree interactions.

In trying to elucidate the complex linkages between root productivity, whole-plant productivity and the spatial resource partitioning underlying species coexistence, it is critical to measure standing fine root biomass (total amount at a certain time) rather than solely fine root productivity (amount per year). The acquisition of belowground resources relies largely on maintaining absorptive fine root biomass, which can be done by increasing fine root lifespan and/or increasing productivity (Eissenstat 1992, Hodge 2004). Measures of plant standing biomass capture key aspects of the positive diversity–function relationship (Cardinale et al. 2007, Zhang et al. 2012), as commonly recognized aboveground (Cardinale et al. 2011, Liang et al. 2016, Williams et al. 2017).

Here, we conducted a study to test the underlying mechanisms for the positive correlation between standing fine root biomass and tree species richness (Fig. 1). In our study framework, we address potential confounding factors like the



Figure 1. A schematic framework depicting the potential mechanisms underlying the effect of tree species richness on fine root biomass. (a) Depicts the hypothesis that fine root biomass increases with aboveground tree species richness. (b) Illustrates the trends in the inverse of the coefficient of variation (inverse CV) of fine root biomass (FRB) across soil profile increases expected from the hypothesis that spatial root partitioning is responsible for the increase in fine root biomass with aboveground tree species richness. (c) and (d) depict whether symmetric root growth (c) or asymmetric root growth (d) leads to higher fine root biomass in nutrient-rich areas as tree species increases. Symmetric root growth occurs when all species have an equal growth capacity and their root evenly spread in nutrient-rich sites, so that the inverse CV of FRB remains stable with aboveground tree species richness (c). Otherwise, asymmetric root growth occurs when fine roots of particular species dominate nutrient-rich areas and their root less evenly spread, so that the inverse CV of FRB decreases with aboveground tree species richness (d).

possible increased allocation to belowground biomass under increased belowground competition or nutrient limitation (Gersani et al. 2001, Craine 2006). Firstly, we hypothesized that a proxy for aboveground productivity (leaf area index) would increase with species richness and positively correlate with root biomass. Secondly, we expected that spatial root partitioning would be a primary mechanism underlying the positive relationship between fine root biomass and species richness. To test this hypothesis, we measured whether fine root biomass had filled a greater soil volume and spread more evenly, resulting from allocation to deep soils as tree species richness increased (Fig. 1b). Thirdly, we expected root growth strategy would be associated with high soil resource availability. We examined whether all species had an equal tendency to proliferate in nutrient-rich sites (i.e. symmetric root growth; Fig. 1c(i)) versus the dominance of fewer, select species (i.e. asymmetric growth; Fig. 1c(ii)). Finally, we tested whether a higher stand density flattened the diversity-function relationship due to a negative density-dependence effect. The interactions between aboveground tree species richness, soil nutrient and stand density on fine root biomass were considered to disentangle the complex relationships driving diversity-function relationships.

### Material and methods

### Study site description

This study was carried out in the Dashanchong Forest Park ( $28^{\circ}23'58''-28^{\circ}24'58''N$ ,  $113^{\circ}17'46''-113^{\circ}19'08''E$ ), in Changsha County, Hunan Province, China. The altitude ranged from 55 m to 217 m a.s.l., with hilly topography. This region has a humid mid-subtropical monsoonal climate with annual mean temperatures of  $17.3^{\circ}C$  and mean monthly temperatures of  $-10.3^{\circ}C$  in the coolest month (January) and  $39.8^{\circ}C$  in the warmest month (July). Mean annual precipitation is 1416 mm, and the minimum and maximum annual precipitation is 936 mm and 1954 mm (year period during 1954-2010) (Ouyang et al. 2016, Wu et al. 2019). The soil is a shallow (30 cm deep), well-drained clay loam overlying slate and shale parent rock, classified as Ferralsols (WRB 2006).

In this study, we selected three typical secondary forests: 1) a mixed coniferous and evergreen broad-leaved forest at an early successional stage, dominated by *Pinus massoniana* and *Lithocarpus glaber* (PM); 2) a broad-leaved deciduous forest at an intermediate successional stage, dominated by *Choerospondias axillaris* (CA); and 3) an broad-leaved evergreen forest at late successional stage, dominated by *L. glaber* and *Cyclobalanopsis glauca* (CG). The PM and CG were located on two hilly ridges separated by a valley with a distance of 200 m and these two forests were 1500 m away from CA.

### Sampling design

In 2013, we identified three 1-ha forest sites corresponding to each forest type (PM, CA and CG). Each site was divided

in 100 plots of  $10 \times 10$  m. The stand characteristics of each plot have previously been reported (Liu et al. 2014, Zhu et al. 2016). A subset of 91 plots, representing a gradient in tree species richness, were chosen: 30 plots for PM (ranging from 2 to 9 tree species); 31 plots for CA (1-12 tree species); and 30 plots for CG (1-11 tree species; see overview in Supplementary material Appendix 1 Fig. A1). Trees within each plot were mapped, identified, and the diameter at breast height (DBH, at 1.3 m above the ground), height (H) and basal area (BA) of all trees with  $DBH \ge 4$  cm were measured. The stand density was determined by counting the number of stems within each plot. Pielou's evenness was determined based on DBH according to Pielou (1966). These stand characteristics of each forest types are displayed in Supplementary material Appendix 1 Table A1. Species functional classification included: evergreen conifer, broad-leaved deciduous, broad-leaved evergreen and shrub species (Iio et al. 2014). The dominant species were: P. massoniana, C. axillaris, L. glaber, C. glauca, Liquidambar formosana, Cleyera japonica, Cinnamomum camphora and Loropetalum chinense.

In August 2016, we sampled one soil core (10 cm in internal diameter) to 30 cm depth (i.e. down to bedrock) in the centre of each plot, which we further separated in three soil depths of 0-10, 10-20 and 20-30 cm. Fine roots (defined here as roots  $\leq 2$  mm in diameter) were collected from soil samples at each depth and placed into separated plastic bags in the field. A total of 273 soil samples were collected and transported to the laboratory stored at 4°C for further analysis (within 1 week). Adjacent to the location of each fine root sampling (within 30 cm distance) we collected an additional soil sample per plot (n=91) for chemical analysis of nutrient concentrations using the same sampling method. In July 2014, the leaf area index (LAI) was estimated based on hemispherical photographs taken at the centre of each plot with a SY-S01A device (Shiya Scientific and Technical Cooperation, Hebei, China), as previously described (Zhu et al. 2016). We assumed that the LAI values sampled in July 2014 are representative of the actual values at the time of the fine root sampling in August 2016, since numerous studies show that the LAI in tropical forests varies only slightly between years (Le Dantec et al. 2000, Barr et al. 2004, Cristiano et al. 2014).

### Root biomass and species identification

In the laboratory, fine root mass was separated from soil by sieving and any adhering soil aggregates were removed manually. The remaining soil was placed in a bucket filled with tap water and then gently washed over sieves (0.2 mm mesh) to collect all remaining fine root fragments. Roots were divided between live and dead pools, based on morphological criteria. Live roots were intact, tough and flexible, whereas dead roots had a dark cortex, were rigid and broke easily (Brassard et al. 2013). All dead roots were discarded. For each sample, fine roots were then randomly divided into two parts. In the first part, 30 pieces of intact fine roots (about 5 cm length) were randomly selected, weighed for fresh weight ( $W_{fresh-first-part}$ ) and then stored at  $-80^{\circ}$ C for DNA-based species identification.

If the total number of intact fine roots was less than 60 pieces, a random selection of half the number of intact fine roots was made. The second part was used to determine the total fine root biomass ( $W_{total}$ ) according to following formula:

$$W_{total} = (W_{fresh-first-part} + W_{fresh-second-part}) \times W_{dry-second-part} / W_{fresh-second-part}$$

where  $W_{\text{fresh-second-part}}$  corresponds to the fresh weight, and  $W_{\text{dry-second-part}}$  corresponds to weight following oven-drying at 65°C, after a constant weight was achieved.

We chose to run our analyses on 30 pieces of intact fine roots, since a prior study (Jones et al. 2011) found calculations based on the identifications on 10 fine root fragments per sample produced an underestimation of actual richness. At the depth of 0-10 cm of one plot in PM (aboveground 9 richness), one plot in CA (aboveground 12 richness) and one plot in CG (aboveground 11 richness) representing the most diverse plots, we also tested whether adding an additional 20 intact root fragments (i.e. using a total of 50 pieces of intact fine roots) improved the detection of species. In total, 273 samples of 30 root fragments, plus the three additional samples of 20 root fragments, were used for estimating species richness by DNA sequencing. DNA extractions were performed by grinding each root sample in liquid nitrogen for 1 min, and using the Plant DNA Kit, as per the recommended use (Tiangen Biotech Co. Ltd., Beijing). DNA purity was measured by the ratio of absorbance at 260 nm/280 nm, which ranged from 1.75 to 1.85 and was considered high quality DNA.

Tree species were identified using polymerase chain reaction amplification of the *rbc*La sequence, using the primers 5'-ATGTCACCACAAACAGAGACTAAAGC-3' and 5'-GT AAAATCAAGTCCACCRCG-3', following a method described by Kress et al. (2009), which was able to distinguish fine roots of tree species. PCR was performed using an Eppendorf Mastercycler with a total reaction volume of 20  $\mu$ l, containing 8  $\mu$ l Quick Taq DyeMix, 1  $\mu$ l (10  $\mu$ M) for each of the primers and 1.5 µl of template DNA. Amplification was performed with the following conditions: 5 min denaturation at 94°C and 29 cycles of 30 s denaturation at 94°C, 30 s annealing at 52°C, 45 s extension at 72°C, followed by a final extension at 72°C for 5 min. PCR products were purified using a 1.0% agarose gel in  $0.5 \times TAE$  by electrophoresis. PCR product sequencing was performed by BioSune biotechnology (Shanghai Co., Ltd.) and rbcLa sequences were aligned using a BLAST search from our previous established *rbc*La library (unpubl. data) with GENEDOC software. This method successfully identified coniferous, broad-leaved deciduous, broad-leaved evergreen and shrub species, but no herbs, grasses or other understory vegetation species (Supplementary material Appendix 1 Table A2).

### Soil chemical analyses

Large debris was removed from each soil sample used in chemical analyses in the field, before transporting the soil core at 4°C to the laboratory. For each sample, 500 g of fresh soil was air-dried and sieved to 2 mm prior to chemical analyses. Soil organic carbon (C), total nitrogen (N) and total phosphorus (P) were determined following Jiang et al. (2017).

C was measured by the  $K_2Cr_2O_7/H_2SO_4$  oxidation method. Total N was determined with the Semimicro–Kjeldahl method by using Kjeltec K9840 automatic azotometer. Total P was measured with the sodium hydroxide (NaOH) fusion and the Mo–Sb colorimetric method by using spectrophotometry (Institute of Soil Science 1978). All measurements were performed in triplicate. Additional measurements were carried out for samples exhibiting high levels of variation among triplicates. The measurements were averaged to minimize measurement errors. The standard error and deviation associated with each average were estimated.

#### Data analysis

The proportion of fine root biomass for each species was calculated as the proportion of biomass assigned to roots fragments identified by DNA sequencing (Jones et al. 2011). Given the random sampling of 30 roots per sample at each depth, one sequence was assumed to represent 1–30th of the total fine root biomass. To assess the fine root partitioning between layers and within a layer, we calculated the inverse of the coefficient of variation (inverse CV) based on the biomass of each species per depth, using the equation:

inverse  $CV = \mu_{biomass} / SD_{biomass}$ 

where  $\mu_{biomass}$  corresponds to the mean biomass across depth or within depth, and  $SD_{biomass}$  corresponds to the biomass standard deviation across depth or within depth.

The inverse CV across depth is an indicator to reflect spatial root partitioning (Barry et al. 2020) and we preferred the inverse CV because its interpretation is more intuitive (Tilman 1999). A high inverse CV across depth corresponds with a more even distribution of fine root biomass across soil depths, with more root mass allocated to deeper layers. When across-depth inverse CV is low, the fine root biomass is mostly concentrated at surface layer soils. We used the within-depth inverse CV to quantify variability in fine root biomass among different species at a given soil layer, which reflect the root growth strategies. A higher within-depth inverse CV indicates symmetric root growth, due to low variation in fine root biomass of diverse species in that layer. Contrastingly, the dominance of few species would be reflected in a low within-depth inverse CV, indicating an asymmetric growth strategy. Mean rooting depth was calculated as the sum of roots in each soil layer multiplied by the mean depth of layer and then divided by the total of roots in all layers (Mommer et al. 2010).

The statistical software R ver. 3.2.0 (<www.r-project.org>) was used to perform all data analysis and to produce figures. To best capture the shape of the relationship between tree species richness and fine root biomass, we tested linear (y=a+bx) as well as several saturating functions [2-parameter, 3-parameter

(y = a - be - cx) and Michaelis–Menten exponential functions]. The best fit was assessed based on Akaike information criterion (AIC). As the data were best described by a linear fit, a generalized linear model was used to assess the effect of tree species and forest types simultaneously on total root biomass and inverse CV across layers (R syntax: 'model=glm (response variable ~ richness + forest\_type'). We further analysed relationships between factors and aboveground tree species richness with a linear mixed effects approach using the 'nlme' package ver. 3.1-137 (Pinheiro et al. 2017) following previously described guidelines (Zuur et al. 2009). For the response variables tested at the layer level (root biomass in each depths and inverse CV within depths), the random effect of the model was the depth within each plot, nested to account for pseudoreplication. The following R syntax was used: 'model=lme (response variable ~ richness + forest\_type, random = -1 |plot, weights = varIdent (form = -1|layer))'. The 'varIdent' weighting function was used to correct for heteroscedasticity (Zuur et al. 2009) resulting from differing levels of variation among the soil layers. The relationships between root-related parameters, stand structure factors and soil nutrient content were tested with a similar approach, with each implemented as fixed predictors in the model. Stand density was standardized by weighting the total BA in each plot with the 'weights' package (Pasek et al. 2020), since the size of different stands was different.

Structural equation modelling (SEM) was used to examine the effects of species richness, soil nutrients (C, N and P), stand density and forest types on fine root biomass in each soil layer with the 'lavaan' package (Rosseel 2012). To account for potential selection effects (Aarssen 1997), we tested the role of the presence/absence of several tree species that were frequently present in the plots by introducing these species as covariates in the model. The 'interact\_plot' function from the package 'jtools' ver. 1.1.1 (Long 2018) was used for plotting two-way interactions with continuous variables. Marginal (mr<sup>2</sup>) and conditional (cr<sup>2</sup>) r<sup>2</sup>-values representing the variance explained by the fixed and fixed + random effects, respectively, were obtained with the 'r.squaredGLMM' function from the MuMIn R package (Nakagawa and Schielzeth 2013).

### Results

### Molecular analysis of species proportions

We successfully amplified *rbc*La sequences in all samples and identified a total of 32 different species of root fragments (Supplementary material Appendix 1 Table A2). The upper 0–10 cm layer had the highest belowground species richness (up to nine species), with a mean of 4.2 ( $\pm$  1.5 SD) species. The lowest belowground species richness occurred at a depth of 20–30 cm (between one and six species), with a mean of 2.8 ( $\pm$  1.1 SD) species. When a higher number of roots was sequenced (+ additional 20 pieces of intact fine roots), the estimated belowground species richness did not change and the average relative proportions of each species only varied



Figure 2. The relationship between belowground species richness estimated with the DNA-sequencing and aboveground species richness in all forests (n=91) in (a), the early successional species-dominated mixed forest stand (PM) (n=30) (b), the broad-leaved deciduous species-dominated mixed forest stand (CA) (n=31) (c) and the late successional broad-leaved evergreen species-dominated forest stand (CG) (n=30) (d). The red line depicts the linear regression and the variance explained by the entire model, including both fixed and random effects, is inset on each panel.

within 2% between total tested 30 and 50 of pieces of intact fine roots sample. This demonstrated that a sampling of 30 fragments of fine root in each depth of a plot provided an acceptable estimate of richness and proportions of each species. As expected, belowground species richness correlated positively with aboveground species richness for all three forest types (Fig. 2), with r<sup>2</sup> values ranging from 0.48 to 0.86. This relationship was driven, in part, by the absence of species and not necessarily due to a failure to detect species.

# Relationships between species richness, fine root biomass and leaf area index

The total standing fine root biomass (the sum of 0–30 cm depth) was positively correlated with aboveground species richness. On average, we found an increase of 8.55 g root biomass for each additional aboveground tree species presented in the plots (p=0.003) (Fig. 3a, Supplementary material Appendix 1 Table A3). LAI, i.e. the investment in aboveground light acquisition, was significantly positively correlated to aboveground species richness (p=0.050) (Fig. 3b) and fine root biomass (p=0.012) (Fig. 3c). There were no significant effects of forest type on fine root biomass (p=0.120) and LAI (p=0.400).

Of the total fine root biomass, 57.5% was found in the upper 0–10 cm layer, with 25.0% at 10–20 cm and 17.5% at 20–30 cm layer. Species richness did not correlate with mean rooting depth (p=0.290) (Supplementary material Appendix 1 Fig. A2). There were significantly interactive effects between aboveground species richness × depth on the fine root biomass (p=0.003) (Table 1). Specifically, fine root biomass strongly increased with aboveground species richness in the upper (0–10 cm) layer (Fig. 3d, Table 1), with a small increase in the intermediate layer (10–20 cm) and no increase in the lower (20–30 cm) layer.

### **Evenness of root distribution**

The across-depth inverse CV, our measure of spatial partitioning, was not significantly correlated with aboveground species richness (Fig. 4a, Table 1). However, the within-depth inverse CV was significantly correlated by the interaction of aboveground species richness × depth (Table 1). This interaction resulted from the decreased evenness of root biomass in deeper layers (10–20 cm and 20–30 cm) where less nutrients are available, but not in the more nutrient-rich upper layer (0–10 cm) (Fig. 4b).



Figure 3. In (a), the relationships between aboveground species richness and fine root biomass in all samples from all forests (n=91). In (b), the relationships between aboveground species richness and leaf area index (LAI) in all samples from all forests (n=91). In (c), the relationships between fine root biomass and LAI in all samples from all forests (n=91). In (d), the relationships between aboveground species richness and fine root biomass for 0–10 cm (brown), 10–20 cm (orange) and 20–30 cm depth (yellow) in all samples from all forests (n=273). Lines depict linear regressions and the shaded areas indicate 95% confidence intervals. Variance explained by the entire model, including both fixed and random effects represents, is inset on each panel.

Table 1. Effects of aboveground tree species richness, soil depth (Depth) and their interaction, on fine root biomass (g m<sup>-2</sup>) (n=273) and the inverse of coefficient of variation (1/CV) of fine root biomass across (n=91) and within soil depths (n=273). NA represents variables that were not retained in the minimal adequate models following AIC-based model comparisons. Variance explained by the fixed effects represents the marginal r<sup>2</sup> (mr<sup>2</sup>) whereas the variance explained by the entire model, including both fixed and random effects represents the conditional r<sup>2</sup> (cr<sup>2</sup>).

Source	Fine root biomass	1/CV across depths	1/CV within depths
Species richness	$F_{1,87} = 10.35,$ p=0.002	$F_{1,86} = 0.96,$ p=0.431	$F_{1,87} = 6.97,$ p=0.009
Depth	$F_{2,178} = 18.93,$ p < 0.001	NĂ	$F_{2,178} = 23.27,$ p < 0.001
Species richness × Depth	$F_{2,178} = 5.99,$ p=0.003	NA	F <sub>2,178</sub> =7.61, p < 0.001
	$mr^2 = 0.1414,$ $cr^2 = 0.4432$	$mr^2 = 0.0405,$ $cr^2 = 0.0405$	$mr^2 = 0.1323,$ $cr^2 = 0.5523$

#### **Relationship with soil nutrients**

Overall, soil C, N and P significantly varied with depth in a decreasing gradient from the upper to lower depths (Supplementary material Appendix 1 Fig. A3). The soil C and N contents of the upper layer (0-10 cm) were significantly higher than those of the deeper soil layers (10-20 cm and 20-30 cm) (Supplementary material Appendix 1 Fig. A3), so we defined the upper layer (0-10 cm) as the nutrient-rich layer, and the deeper layers (10-20 cm and 20-30 cm) as the nutrient-poor layer. No significant effect of aboveground species richness on soil nutrients was found. The within-depth inverse CV of fine root biomass in the upper nutrient-rich soil was significantly correlated by the interaction between aboveground species richness and soil C and N, but not P (Table 2). For all three models, the fitted coefficient for the aboveground species richness × nutrient interaction was positive, indicating higher predicted values of within-depth inverse CV with increasing soil nutrient content, implying higher evenness of root biomass contribution of the different species with increasing soil nutrient pools in the upper (0-10)cm) layer (Fig. 5). Moreover, an additional model run with all three nutrients simultaneously, found a significant  $C \times N \times$ P interaction ( $F_{1,165} = 4.48$ , p=0.03). This interaction could not be further simplified by maximum likelihood tests, and the fitted coefficient was positive, indicating the evenness of the root biomass within the upper layer (0-10 cm) increased with the soil nutrients (Supplementary material Appendix 1 Table A4). In contrast, no significant interactive effect was observed within the deeper nutrient-poor soil layers (10-20 cm and 20–30 cm).

### Testing for density and species sampling effects

Only stand density had a significant relationship with fine root biomass (Supplementary material Appendix 1 Table A5) in testing factors related to stand structure (e.g. average DBH, average H, average BA, stand density and Pielou's evenness).



Figure 4. In (a), the impact of aboveground species richness on the inverse CV of fine root biomass (FRB) across all soil layers (n=91). Variance explained by the entire model, including both fixed and random effects, represents the conditional  $r^2$  (cr<sup>2</sup>). In (b), the impact of the interaction between aboveground species richness and depth interaction on the inverse CV of FRB within depths for the soil depth layers of 0–10 cm (brown), 10–20 cm (orange) and 20–30 cm (yellow) (n=273). Lines depict the fitted linear regression lines and the shaded areas indicate the 95% confidence intervals. Variance explained by the entire model, including both fixed and random effects, represents the conditional r<sup>2</sup> (cr<sup>2</sup>).

The SEM model revealed a significant positive bidirectional relationship between aboveground species richness, fine root biomass and stand density at the 0–10 cm depth, explaining 10% variation of fine root biomass (Fig. 6). Soil nutrients and forest types had non-significant effects on root biomass (Fig. 6). In subsoil layers (10–20 cm and 20–30 cm), no significant effects of tree species, stand density, soil nutrients and forest types on fine root biomass were detected by using the SEM method.

To better understand the drivers behind the diversityroot biomass relationship, and account for sampling effects due to the presence/absence of species, we incorporated stand density and species identity, alongside aboveground species richness, into the model as predictors of fine root biomass. According to AIC, the minimal adequate model retained to predicting the presence of *C. glauca* included a significant density × aboveground species richness interaction ( $F_{1,82}$ =4.21, p=0.038). The presence of *C. glauca*, had a major impact on root biomass, increasing it, on average, by 40.41 g. These results indicate that the tree species richness effect on root biomass varied with stand density (Fig. 7;

Table 2. Effects of aboveground tree species richness and total soil organic carbon (C), nitrogen (N) and phosphorus (P) contents and their interactions on the inverse of the coefficient of variation (1/CV) of fine root biomass within soil depths of 0-10 cm (n=91). Variance explained by the fixed effects represents the marginal  $r^2$  (mr<sup>2</sup>) whereas the variance explained by the entire model, including both fixed and random effects, represents the conditional  $r^2$  (cr<sup>2</sup>).

Source	1/CV within depths	Source	1/CV within depths	Source	1/CV within depths
Species richness C	$F_{1,87} = 0.17$ , p=0.6764 $F_{1,87} = 0.56$ , p=0.4566	Species richness N	$F_{1,87} = 0.16$ , p=0.6917 $F_{1,87} = 0.18$ , p=0.6675	Species richness P	$F_{1,87} = 0.13$ , $p = 0.7155$ $F_{1,87} = 2.19$ , $p = 0.1426$
C × Species richness	$F_{1,87} = 4.90, p = 0.0294$	N × Species richness	$F_{1,87} = 7.72, p = 0.0067$	P × Species richness	$F_{1,87} = 1.44, p = 0.2329$
	$mr^2 = 0.0689,$ $cr^2 = 0.0689$		$mr^2 = 0.0949,$ $cr^2 = 0.0949$		$mr^2 = 0.0455,$ $cr^2 = 0.0455$

Supplementary material Appendix 1 Table A6). The interaction indicates lower fine root biomass at low tree diversity levels and low density, but not at high density levels (Fig. 7c).



Figure 5. Interaction plot depicting the impact of (a) aboveground species richness × soil organic carbon (C), (b) aboveground species richness × soil nitrogen (N) and (c) aboveground species richness × soil phosphorus (P) on the inverse CV of fine root biomass (FRB) within soil depth of 0–10 cm (n=91 for each soil nutrients). The filled circles represent high soil nutrient content and open triangles represent low soil nutrient content. The change tendency of inverse CV of FRB within soil depth of 0–10 cm with aboveground tree species richness in high soil nutrient content is shown by solid blue lines, where those in low soil nutrient content are shown by dashed blue lines. Variance explained by the entire model, including both fixed and random effects represents the conditional r<sup>2</sup> (cr<sup>2</sup>). High soil nutrient concentrations are defined as those higher than the average value of all+standard deviation, whereas the low values are those lower than this average value – standard deviation.

### Discussion

# Molecular methods are sufficiently accurate to estimate species-specific fine root biomass

The resource partitioning is often put forward as one of the main mechanisms of enhancing ecosystem functioning; however, the evidence of resource partitioning by roots belowground is weak and often conflicting (Brassard et al. 2013, Valverde-Barrantes et al. 2015, Xiang et al. 2015, Ma and Chen 2016, 2017). At least in part, this could be related to the methodological challenges associated with quantifying the root biomass as the diversity of tree species increases. Our findings indicate that DNA sequencingbased methods are a reliable approach of estimating fine



Figure 6. The results of structural equation model showing the effects of aboveground tree species richness, stand density, forest types and soil nutrients on fine root biomass (n=91). The coefficients are standardized prediction coefficients for each causal path. Solid blue lines represent significant and positive effects and dashed blue lines indicate insignificant and negative effects. Dashed grey lines represent insignificant and negative effects. Numbers above solid arrows are standardized path coefficients (\* p < 0.05, \*\* p < 0.01, \*\*\* p < 0.001) and width of an arrow indicates the strength of the relationships. R<sup>2</sup> denotes the proportion of variance explained. CFI corresponds to the comparative fit index. RMSEA corresponds to the standardized root mean square residual. Stand density was standardized by weighting the basal area in each plot.



Figure 7. In panel (a), the impact of aboveground species richness on stand density (n=91). In panel (b), the impact of stand density on fine root biomass (n=91). Lines depict the fitted linear regression lines and the shaded areas indicate the 95% confidence intervals. (c) Interaction plot depicting aboveground species richness × stand density interaction (n=91). The filled circles represented high stand density and open circles represented low stand density. The change tendency of fine root biomass with aboveground tree species richness in high stand density is shown by solid blue line, whereas that in low stand density is shown by dashed blue line. Variance explained by the entire model, including both fixed and random effects represents the conditional  $r^2$  (cr<sup>2</sup>). Stand density was standardized by weighting the basal area in each plot. High stand density is defined as being greater than the average value + standard deviation whereas the low density is lower than the average value standard deviation.

root biomass in species-rich mixtures, consistent with previous studies. To date, there are three popular molecular methods for analysing the fine root samples: the next-generation sequencing method, the quantitative real time-PCR (qPCR) method and the universal markers method (Mommer et al. 2011). Next-generation sequencing is an effective method to identify the species, but is far more expensive than the other methods (Grada and Weinbrecht 2013). Currently, qPCR is the most popular method in grasslands, where no more than eight species co-exist (Mommer et al. 2010, Hendriks et al. 2015, Oram et al. 2018), and is constrained by the difficulty of developing species-specific primers where a large number of species coexist (Zeng et al. 2017). Thus, in this study we chose the universal markers method, which has been proven that it could accurately identify a large number of tree species in forests (Jones et al. 2011, Kesanakurti et al. 2011).

Our results show a good agreement between above- and belowground tree species richness using the universal markers method (Fig. 2) and suggest that our sampling strategy and methodology are appropriate for detecting species based on fine root fragments. In several instances, a greater number of species were detected belowground than aboveground, consistent with previous reports (Pärtel et al. 2012). This is likely due to the wide lateral spread of roots, with belowground species occasionally corresponding to trees from outside the plots (Kesanakurti et al. 2011, Zeng et al. 2017). Furthermore, we likely underestimated aboveground species richness by only including trees with a DBH  $\geq$  4 cm. In addition, some aboveground tree species were not detected in our DNA-based survey of fine roots, which may have resulted from the fine roots of some plants failing to reach the coring sites in the middle of the plot, or in too low an abundance to be detected.

## Fine root biomass is influenced by soil nutrient distribution

The positive correlation between tree species richness and fine root biomass (Fig. 3a) was consistent with previous studies on fine root biomass (Liu et al. 2014, Frank et al. 2015, Milcu et al. 2016). Our results suggest this pattern might be attributed to an increase in belowground competition for nutrients with increasing tree diversity (Gersani et al. 2001, Craine 2006). The increased LAI associated with aboveground tree species richness also contributes to fine root biomass, as it leads to higher net primary productivity (NPP) and more carbon allocated belowground for root growth and nutrient uptake. The positive relationship between LAI, root biomass and aboveground species richness indicates that increasing tree species richness stimulated both fine root biomass and aboveground leaf development (Mahaut et al. 2020), in support of our first hypothesis.

We found little evidence in support of our hypothesis that spatial root partitioning would contribute to the positive diversity-function relationship. The higher biomass in the top layer (0-10 cm) was correlated with increasing tree species richness and this correlation disappeared in subsoil layers (10-20 cm and 20-30 cm). This result indicates that more belowground biomass allocation with increasing tree species richness was not associated with a greater deep volume of soil infiltrated by fine roots (Fig. 3d, 4a). This is in line with the findings of several grassland studies that found that plant roots tended to aggregate in the dense topsoil layer despite increasing diversity (von Felten and Schmid 2008, Mommer et al. 2010). Despite competition, plants may not invest in deeper roots due to the observed decrease in nutrients with depth. Instead, plants appear to compete more efficiently for nutrients, with most species allocating new growth in the top soil where the nutrient availability is higher. Concentrations of soil C, N and P were highest in the uppermost layer of the soil (Supplementary material Appendix 1 Fig. A3) where we observed the greatest investment in fine root biomass (Caldwell et al. 1996). The high values of within-depth inverse CV in the nutrient-rich top layer (Fig. 4b) indicates the nutrient hotspots were most evenly explored. Higher richness did not lead to vertical avoidance, but increased foraging for the nutrient-rich topsoil layer. Furthermore, the within-depth inverse CV of the upper nutrient-rich soil layer was strongly affected by the interaction between aboveground species richness and soil C (or N) (Fig. 5), a result that is in accordance with the symmetric growth hypothesis. Overall, these findings are in agreement with a previous study (Valverde-Barrantes et al. 2015) which found that roots of all tree species tended to grow in nutrient-rich areas and higher fine root biomass was associated with an aggregation of species. However, we acknowledge that we cannot completely discount the possibility that plant resource uptake by deeper roots, though lower in biomass, may have been a significant source of nutrients, though fine root biomass is strongly linked to nutrient uptake (Kulmatiski et al. 2017). Additionally, our study did not account for soil deeper than 30 cm, nor the importance of horizontal root partitioning. There is evidence that, in some ecosystems, these root dynamics can explain the positive relationship between species richness and biomass (von Felten and Schmid 2008). Nevertheless, one would expect to find evidence for a vertical niche partitioning even in these conditions, where a strong nutrient gradient exists across the upper 30 cm of soil (Supplementary material Appendix 1 Fig. A3).

The effect of the presence/absence of *Cyclobalanopsis glauca* on the positive diversity–function relationship is consistent with the 'selection effect.' The selection hypothesis postulates that high production in species rich communities could be due to the higher chance of there being a more productive species (Aarssen 1997). However, since naturally assembled forests are extremely complex and lack monocultures, we cannot fully explore the selection effect and can only conclude that the selection effect may exist in these subtropical forests. Further studies in controlled conditions could elucidate the contribution of a single species on root biomass productivity in mixed species forests.

### Stand density-dependent effects on fine root biomass

SEM was used to understand the drivers of the relationship between species richness and fine root biomass, whereby stand density, forest types and soil nutrients were taken into account. Tree species richness and fine root biomass were significantly correlated, indicating that diversity and biomass can feedback on each other (Grace et al. 2016). Furthermore, tree species richness and stand density were significantly correlated, with stand density affecting fine root biomass, while the effects of forest types and soil nutrients were very weak (Fig. 6). These results show that stand density has stronger effects on fine root biomass than species richness in naturally assembled forests. This result is in contrast with a controlled glasshouse experiment, in which root biomass increased with species richness but remained constant with a similar increase gradient of plant density (He et al. 2005). This suggests that the relationship between species richness and biomass may be weaker in naturally assembled forests (van der Plas 2019).

In natural forests, it is difficult to disentangle the relationship between aboveground species richness and stand density, which could result from more species-rich communities supporting higher stand density or higher density could be the consequence of higher species richness. Our results suggest it depends on the interaction between stand density and aboveground species richness, with lower standing fine root biomass at low density and low species richness, an effect which disappears at high density (Fig. 7c).

We contend that there are at least two alternative explanations for the interaction between stand density and aboveground species richness. One explanation stems from the interpretation of the higher density in more diverse mixtures (Fig. 1a, 7) as both the cause and consequence of regeneration-niche driven recruitment processes. From this perspective, the results are in alignment with the negative biotic feedback hypothesis which produces a positive relationship between species richness and biomass (Barry et al. 2019) because species differ in their enemies (pests, pathogens and herbivores) and the interactions between plant and enemy may create a strong conspecific negative density dependence. This negative density dependence effect (also known as Janzen–Connell effect) leads to reduced plant performance in low diversity stands and is particularly well documented in forests (Packer and Clay 2000, Lambers et al. 2002, Freckleton and Lewis 2006). The second explanation of why the positive diversity-root biomass relationship was highest at low stand density and disappeared at high stand density is the saturation of the effect under conditions of high stand density. This could be linked to the existence of an upper limit in the competitive advantage provided to a tree by further increasing its investment in fine root biomass in conditions of high competition for soil resources.

This study found an increase in fine root biomass with tree species richness along a diversity gradient across three different secondary forests. Testing for the belowground mechanisms driving this relationship revealed a lack of support for the spatial root partitioning hypothesis that greater fine roots grow in subsoil layers. Instead, we found that the evenness of the root biomass within soil horizons was strongly affected by the interaction between aboveground species richness and soil nutrient content in the topsoil (0–10 cm). This implies there is no inherent advantage for a particular species in colonizing nutrient hotspots, indicating symmetric root growth strategies are common in nutrient rich forest soils. SEM revealed that stand density was the dominant factor explaining the variation in effect of aboveground species richness on fine root biomass rather than soil nutrients. Fine root biomass also depended on the interaction between tree species richness and stand density, suggesting that density-dependent biotic feedbacks affecting tree recruitment should be considered as a driver of belowground productivity in diverse subtropical forests. Finally, we conclude that patterns of root distribution associated with resource partitioning are unlikely in contexts where soil nutrients are heterogeneously distributed.

### Data availability statement

Data are available from the Dryad Digital Repository: <a href="http://dx.doi.org/10.5061/dryad.cvdnctj2g">http://dx.doi.org/10.5061/dryad.cvdnctj2g</a> (Zeng et al. 2020).

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*Statement of authorship* – WX designed the study; Data collection and analyses were performed by WZ, BZ, SO, LC and WX; Statistical analyses were performed by WZ and AM with input from BZ, SO, LC, WX; The manuscript was written by WZ, AM and WX, with input from BZ, YZ, GTF and OJV.

*Conflict of interest* – The authors declare that they have no conflict of interest.

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