



# Moderate phosphorus additions consistently affect community composition of arbuscular mycorrhizal fungi in tropical montane forests in southern Ecuador

# Juan F. Dueñas<sup>1,2</sup> (b), Tessa Camenzind<sup>1,2</sup> (b), Julien Roy<sup>1,2</sup> (b), Stefan Hempel<sup>1,2</sup>, Jürgen Homeier<sup>3</sup> (b), Juan Pablo Suárez<sup>4</sup> (b) and Matthias C. Rillig<sup>1,2</sup> (b)

<sup>1</sup>Institute of Biology, Freie Universität Berlin, Altensteinstr. 6, Berlin 14195, Germany; <sup>2</sup>Berlin-Brandenburg Institute of Advanced Biodiversity Research (BBIB), Berlin 14195, Germany; <sup>3</sup>Plant Ecology, University of Göttingen, Göttingen 37073, Germany; <sup>4</sup>Departamento de Ciencias Biológicas, Universidad Técnica Particular de Loja, San Cayetano Alto, Loja, Ecuador

Author for correspondence: Matthias C. Rillig Tel: +49 30 838 53165 Email: rillig@zedat.fu-berlin.de

Received: 26 February 2020 Accepted: 20 April 2020

*New Phytologist* (2020) **227:** 1505–1518 **doi**: 10.1111/nph.16641

Key words: Andes, arbuscular mycorrhiza (AM), atmospheric nutrient deposition, community ecology, fungi, global change, meta-barcoding, tropical forests.

#### **Summary**

• Anthropogenic atmospheric deposition can increase nutrient supply in the most remote ecosystems, potentially affecting soil biodiversity. Arbuscular mycorrhizal fungal (AMF) communities rapidly respond to simulated soil eutrophication in tropical forests. Yet the limited spatio-temporal extent of such manipulations, together with the often unrealistically high fertilization rates employed, impedes generalization of such responses.

• We sequenced mixed root AMF communities within a seven year-long fully factorial nitrogen (N) and phosphorus (P) addition experiment, replicated at three tropical montane forests in southern Ecuador with differing environmental characteristics. We hypothesized: strong shifts in community composition and species richness after long-term fertilization, site- and clade-specific responses to N vs P additions depending on local soil fertility and clade life history traits respectively.

• Fertilization consistently shifted AMF community composition across sites, but only reduced richness of Glomeraceae. Compositional changes were mainly driven by increases in P supply while richness reductions were observed only after combined N and P additions.

• We conclude that moderate increases of N and P exert a mild but consistent effect on tropical AMF communities. To predict the consequences of these shifts, current results need to be supplemented with experiments that characterize local species-specific AMF functionality.

### Introduction

Tropical Andean forests are centers of endemism and constitute the most biodiverse region of the world per unit area (Rahbek et al., 2019b). Despite the large contribution of these forests to preserve Earth's biodiversity, many aspects of their ecology remain unresolved. Most notably, the role that soils -and soil dwelling organisms- play in shaping these ecosystems' response to global change drivers (Baez et al., 2015; Hagedorn et al., 2019). This is particularly relevant for tropical Andes, as montane forest soils store considerable amounts of carbon (C) (Girardin et al., 2010; Moser et al., 2011; Spracklen & Righelato, 2014), yet the drivers controlling C fluxes are shifting in this region. In the past two decades, the intensification of human activities in the neighboring Amazonian plains has fueled a moderate increment in the deposition rates of reactive nitrogen (N) (Wilcke et al., 2013; Velescu et al., 2016) and phosphorus (P) (Wilcke et al., 2019) into the eastern Andes. Given that N and P are arguably the main soil elements regulating C cycling, and that their availability also affects soil microbes and the processes they drive (Camenzind et al., 2018), understanding how tropical

distribution and reproduction in any medium, provided the original work is properly cited and is not used for commercial purposes.

montane forests change in the face of ongoing soil eutrophication, requires a deeper understanding of how soil microbial communities respond to these disturbances.

Arbuscular mycorrhizal fungi (AMF) – a basal sub-phylum of mutualistic fungi (Glomeromycotina; Spatafora *et al.*, 2016) – form the most common type of mycorrhizal symbiosis worldwide (van der Heijden *et al.*, 2015), and are the dominant mutualists in Andean tropical forests (Kottke *et al.*, 2008; Smith & Read, 2008). AMF are ecologically relevant because they increase the uptake of P in exchange for plant derived C (Smith & Smith, 2012), and to a lesser extent the uptake of inorganic N (Hodge & Storer, 2015; Ushio *et al.*, 2017). Because of their prominent role in the flow of nutrients, assessing AMF community responses to shifting nutrient pulses might serve to establish a link between AMF diversity and ecosystem function (Rillig, 2004).

Based on what is currently known about the nutritional attributes of the symbiosis, several predictions on how AMF diversity may respond to increased N and P availability can be attempted. From a resource economy perspective (Johnson, 2010), when atmospheric deposition increases P supply beyond limitation, the benefit of the symbiosis is reduced (Johnson *et al.*,

*New Phytologist* ©2020 New Phytologist Trust This is an open access article under the terms of the Creative Commons Attribution-NonCommercial License, which permits use,

2015). This may intensify competition between AMF taxa for plant derived C and for soil nutrients, as well as between the host and AMF for inorganic N. In both cases, a reduction in AMF diversity can be expected. Conversely, in cases when P supply is the most limiting resource (i.e. N supply increases beyond limitation), the benefit of the symbiosis is enhanced. In this case AMF diversity levels might be maintained. The situation is considerably more nuanced when hosts are N and P co-limited. In this scenario, the nutritional benefit of the symbiosis will still be required, yet weak competition between AMF taxa for resources (Powell & Rillig, 2018) might lead to shifts in community composition. This last prediction is congruent with the co-adaptation model (Johnson, 2010). This model predicts that over time, ambient nutrient status selects sets of plants and fungi that are able to co-exist and maximize the exchange of resources (Johnson et al., 2010).

Quite importantly, all these predictions assume that each AMF taxon occupies a defined nutritional niche (Treseder & Allen, 2002). This assumption is underpinned by the fact that AMF isolates differ in the benefits they provide to plants (Koch et al., 2017), and by different clades (e.g. families) differing in susceptibility to fertilization regimes (van der Heyde et al., 2017; Treseder et al., 2018; Roy et al., 2019). Using classical abundance measures (e.g., root colonization, hyphal length), which are frequently used to assess fertilization effects, it is not possible to capture differences in responses of different AMF taxa to nutrient enrichment (Treseder, 2004). Information at such higher level of resolution can only be obtained by sequencing surveys. Yet the scarcity of surveys of this kind in tropical areas has been repeatedly noted in the literature (Cotton, 2018; Lilleskov et al., 2019), particularly for the tropical Andes (Soteras et al., 2019). We are aware of only two deep sequencing studies conducted at AMF dominated neo-tropical forests within the context of nutrient manipulation experiments (Camenzind et al., 2014; Sheldrake et al., 2018). These studies showed AMF diversity decreases when N is added alone or in combination with P, while community structure is affected mainly by the addition of P. These responses, however, appear to be modulated by the fertilization regime, the duration and dosage of the application, and whether AMF communities were characterized from DNA isolated from roots or soil.

Given that virtually all aspects of AMF ecology are understudied in the tropics, it is evident that important gaps in our understanding still remain. First, studies conducted on tropical AMF communities in the context of increased nutrient supply are geographically narrow. Given whole ecosystem manipulations are resource intensive, these can only be maintained over relatively small areas (Fayle *et al.*, 2015). Hence the majority of such experiments in the tropics have been established in mesic lowland forests that grow over P-deficient soils (Matson *et al.*, 1999; Mirmanto *et al.*, 1999; Kaspari *et al.*, 2008; Cusack *et al.*, 2011). In tropical montane forests, however, plants obtain most of their nutrients from thick layers of organic detritus of very heterogeneous nutritional condition (Tanner *et al.*, 1998; Wilcke *et al.*, 2002). This heterogeneity is thought to originate from the interaction of parent material of different age and composition (Hoorn *et al.*, 2010) with climate (i.e. thermal isoclines, cloud immersion, seasonal precipitation patterns, Rahbek *et al.*, 2019a) and topography (Tanner *et al.*, 1992; Werner & Homeier, 2015). In addition to the geographic bias, there is a temporal one. Up until now, assessments of tropical AMF communities within nutrient addition experiments have not been reproduced, thereby ignoring the temporal dimension of the disturbance (Zhang *et al.*, 2018). Finally, the majority of tropical nutrient manipulation experiments have set rates of mineral fertilization with the goal of assessing plant growth limitations (Tanner *et al.*, 1992; Mirmanto *et al.*, 1999; Kaspari *et al.*, 2008). These, however, often exceed the actual rates of atmospheric nutrient deposition that these regions experience (Cusack *et al.*, 2010).

In this paper, we assess the responses of tropical forest AMF communities to increased nutrient deposition in a more realistic scenario. We do so by surveying a seven year-long fully factorial nitrogen (N) and phosphorus (P) addition experiment in southern Ecuador (Homeier et al., 2012). This experiment is fully replicated at three sites where P is the main limiting element for tree growth (Cárate-Tandalla et al., 2018), but its availability, as well as that of mineralized N, is modulated by local environmental conditions (Martinson et al., 2013). One of these sites was surveyed after two years of simulated atmospheric deposition (Camenzind et al., 2014), indicating important short-term reductions in AMF species richness. Here we focus on assessing the long-term response and increasing the external validity of our results by including all three sites within the experiment. We hypothesized that: (1) there will be a decrease in AMF molecular diversity after fertilization in sites with greater P availability, (2) nutrient applications will shift AMF community composition, but these shifts will be mediated by ambient availability of nutrients at different sites, and (3) assuming AMF lineages differ in terms of nutrient use and exchange capacities, clade responses to nutrient applications will be also different. To the best of our knowledge, this constitutes the most encompassing assessment of nutrient addition effects on naturally occurring AMF dominated forests.

# **Materials and Methods**

### Study site

Experimental work occurred on three sites along the south eastern Andes of Ecuador. Sites are located at an average distance of 19 km and at an average elevation difference of 1000 m of each other, starting at *c*. 1000 m above sea level (m asl; Supporting Information Fig. S1). All sites are within protected areas and are covered by different forest types (Homeier *et al.*, 2013). The lowest site corresponds to pre-montane forest, the mid site to lower montane forests and the highest site to upper montane forest. Tree species turnover is complete between pre- and upper montane forests while fewer than five species are shared between lower montane and the other two forest types (Homeier *et al.*, 2013). Canopy openness and stand height are reduced, while fine root biomass sharply increases at the upper montane forest in relation to the other two forest classes (Moser *et al.*, 2011). From premontane to upper montane forest, understorey vegetation becomes denser with decreasing canopy openness. This stratum is mainly composed of tree recruits, herbaceous monocots, ferns, and a few woody shrub species (J. Homeier, pers. comm).

Climate at the three sites is permanently humid and strongly influenced by the dominant easterlies coming from the Amazon. Radar and ground station data indicate high precipitation totals that increase towards the upper montane forest (2000–  $4500 \text{ mm yr}^{-1}$ ; Homeier *et al.*, 2010; Rollenbeck & Bendix, 2011). Precipitation patterns are weakly seasonal with a maximum usually distributed from April to July. Minima occur towards the end of the year (Sep-Dec), when the dominant easterlies briefly give way to westerlies coming from the Pacific Ocean (Oñate-Valdivieso *et al.*, 2018). Temperature regimes also shift between sites. Direct measurements of average daily temperature show a decrease from *c.* 19°C to *c.* 9°C between the preand upper montane sites (Moser *et al.*, 2007).

Soil physical and chemical characteristics also change between sites. Soils at the lower and upper montane sites are covered by 10-40 cm deep organic layers, have a propensity to water logging and a loamy mineral fraction (Wolf *et al.*, 2011; Werner & Homeier, 2015). At the pre-montane forest, soil texture becomes sandy, leading to a better drainage and the organic horizon depth is reduced close to 0 cm. Organic layers are generally acidic (pH range: 3-5) and suffer from chronic nutrient deficiencies. N and P availability tends to increase in the pre-montane forest relative to the lower and upper montane forests (Wolf *et al.*, 2011; Werner & Homeier, 2015). Despite of this, tree growth at all sites is predominantly limited by P availability (Graefe *et al.*, 2010; Cárate-Tandalla *et al.*, 2018).

Additional details of each site environmental characteristics can be found in Table S1.

# Experimental design

A full factorial nutrient manipulation experiment started at each site in January 2008 (Homeier et al., 2012; Fig. S1b). Since then, urea (50 kg of N  $ha^{-1}$  yr<sup>-1</sup>) and monosodium phosphate (10 kg  $P ha^{-1} yr^{-1}$ ) were applied manually every six months. These rates of application are moderate relative to the rates applied in similar experiments elsewhere (Liu et al., 2015a; Sheldrake et al., 2018) and correspond well to the annual rates of atmospheric deposition quantified at the lower montane forest site between years 2007-2012 (Velescu et al., 2016; Wilcke et al., 2019). Experimental factors are applied in a randomized block arrangement. That is, on each site there are four blocks of four plots each (16 plots per site, 48 plots total). Each block consists of three plots with different nutrient application regimes (+N, +P and +N+P)and one unfertilized plot (Ctrl). Ctrl plots were always located above fertilized plots to avoid fertilizer runoff. Fertilization regime was assigned randomly at the start of the experiment for the remaining plots. While randomization mitigates the effects of confounding sources of variability, blocking ensures greater homogeneity in environmental conditions between sets of plots. Plots are 400 m<sup>2</sup> and are at least 10 m apart to ensure independence of experimental units.

In August 2015, a 10 cm soil core (Ø 5 cm) was extracted from the organic layer of six sub-plots  $(4 \text{ m}^2)$  within each treatment plot. Sub-plots were randomly established along two orthogonal transects. We sampled one core within each sub-plot. This yielded a total of 96 cores per site (Fig. 1). In order to standardize our sampling procedure, *c*. 20 fine root pieces of 1–2 cm length and <2 mm diameter were separated from the organic layer of each soil core and subsequently preserved in 97% EtOH. Roots were favored over soil, because DNA extraction from the organic



**Fig. 1** Spatial distribution of cores collected for this study. Each cluster of six points of the same color represent cores within a plot according to their fertilization regime. Text indicates the relative position of blocks at each site, each encompassing four plots (i.e. 24 cores). Core position was allocated randomly using two orthogonal transects within each plot. Map coordinates are in decimal degrees and polygons in various shades of green intend to remind the reader that each site is different in terms of soil and plant community composition, forest structure and climate.

layer of these forests is cumbersome and hinders amplification. Samples were kept frozen upon their transport to the molecular ecology laboratories at the Institute for Biology of Freie Universität Berlin, where they were finally stored at  $-20^{\circ}$ C.

### DNA extraction, PCR amplification and sequencing

Roots from each of the samples were lyophilized overnight (Alpha 1-4 LDplus; Christ GmbH, Harz, Germany). Upon lyophilization, roots were pulverized by shaking a 2 mm metal bead along with roots in a 2 ml tube placed within a MM400 mill (2 min of 25 oscillations per second, Retsch GmbH., Hann, Germany). DNA was isolated from pulverized roots following the PowerSoil DNA isolation kit (MoBio Laboratories Inc., Carlsband, CA, USA) standard protocol. DNA extracts were stored at  $-20^{\circ}$ C upon amplification. In order to minimize contamination, blank extracts were included, and all materials used were sterilized.

The genetic polymorphism within the nuclear rDNA operon was assessed adopting a nested PCR strategy. DNA extracts were amplified with a cocktail of Glomeromycotina specific primer sets developed by Krüger *et al.* (2009), in two consecutive PCR rounds. A third and final PCR round targeted a *c.* 400 bp fragment spanning the D1 and D2 variable domains of LSU with the LR2rev–LR3 primer set (Roy *et al.*, 2017). Details of the PCR conditions and amplicon library preparation can be found in the Methods S1. Amplicon libraries were sequenced in three separate reactions on an Illumina MiSeq platform using  $2 \times 250$  pairedend chemistry at the Berlin Center for Genomics in Biodiversity Research (BeGenDiv).

#### Bioinformatic processing and taxonomic assignment

Paired-end reads were processed in USEARCH v.10 (Edgar, 2010). Reads from each site were processed separately for the merging, primer sequence removal and filtering steps. Reads that passed the filtering criteria were then combined in a single file for subsequent steps. MOTHUR (Schloss *et al.*, 2009) was employed to retain sequences with at least 375 bp and less than seven homopolymers. Sequences were clustered *de novo* into operational taxonomic units (OTUs) with UPARSE (Edgar, 2013), the minimum OTU cluster size was set to 8 and sequence similarity threshold to 97%. Chimera removal and clustering occurred simultaneously. Merged reads of each site were then mapped to OTUs to produce an OTU abundance table. Sequences representing these OTUs are deposited at the European Nucleotide Archive (ENA), under accession nos. LR656271–LR656682.

Phylotype taxonomic identity was assigned by aligning OTUs to Krüger *et al.* (2012) reference database using BLAST+ (Camacho *et al.*, 2009). Only the query sequences with alignment coverage  $\geq$  90% were retained. Following Martinez-García *et al.* (2015), an OTU was assigned to species level when the best hit was  $\geq$  97% identical to a reference sequence, to genus when identity was between 90–96%, and to family when identity was between 80–90%.

#### Environmental factors

One composite sample of the organic layer was created by aggregating and homogenizing six sub-plot samples extracted from each plot (n = 48). Air dried samples were then transported to the plant ecology laboratories at the University of Göttingen, Germany. Soil pH was determined by suspension of the sample in a KCl solution; organic soil C and N with a C/N analyzer (Vario EL III; Elementar, Hanau, Germany) and plant-available P with the resin-bag method (Amer *et al.*, 1955). Finally, all trees with a diameter at breast height  $\geq 10$  cm were identified to species level in order to calculate tree species richness per plot.

### Statistical analyses

All statistical analyses were performed in R (v.3.4.3; R Core Team, 2017). Packages ADESPATIAL (Dray *et al.*, 2019), DESEQ2 (Love *et al.*, 2014), DPLYR (Wickham *et al.*, 2018), GGPLOT2 (Wickham, 2016), GGPUBR (Kassambara, 2018), LME4 (Bates *et al.*, 2015), LMERTEST (KUZNETSOVA *et al.*, 2017), MVABUND (Wang *et al.*, 2012), PHYLOSEQ (McMurdie & Holmes, 2013), RGDAL (Bivand *et al.*, 2019), SP (Bivand *et al.*, 2013) and VEGAN (Oksanen *et al.*, 2018) were employed. The commands used for the analyses can be found in Table S2.

Variability of environmental factors across sites and plots To visualize how environmental factors varied across plots and sites, variability was collapsed using a principal component analysis (PCA). Variables were scaled and centered and the two most informative axes were plotted.

Normalization of sequencing data As is typically observed in high throughput sequencing data, there was a high number of samples with few sequences and few samples with high number of counts (Fig. S2a). To account for the large differences in sequencing depth across samples, a variance stabilization transformation (VST) was applied (Love *et al.*, 2014). VST avoids rarefying to an arbitrary minimum sequencing depth while preserving the integrity of the data (McMurdie & Holmes, 2014; Sheldrake *et al.*, 2018). Applying VST normalized the density distribution of sequencing depth (Fig. S2b) while still allowing a sufficient coverage to characterize the diversity of AMF across samples (Fig. S3). Thus, the transformed table was used for all subsequent analyses.

AMF molecular diversity indices Following Morris *et al.* (2014), per sample AMF molecular diversity (hereafter referred as 'alpha diversity') was quantified by two indices: Hill number 0 ( $H_0$ ) and 2 ( $H_2$ ).  $H_0$  and  $H_2$  are generalized forms of popular diversity indices that facilitate comparisons across studies given they express taxonomic diversity in standardized units (Hill, 1973).  $H_0$  equals richness (S) and expresses the number of OTUs per sample while  $H_2$  equals to the inverse of Simpson's dominance index and expresses the effective number of 'abundant' OTUs per sample (Chao *et al.*, 2014). To visualize how alpha diversity partitioned between different families within

Glomeromycotina,  $H_0$  and  $H_2$  were also estimated by segregating OTU tables of the most represented families in our dataset (i.e. Acaulosporaceae, Glomeraceae and Gigasporaceae). To visualize AMF taxa turnover across sites, OTUs with relative abundance equal or greater to 1% were selected and their presence and relative abundance was plotted.

Effects of nutrient addition on AMF molecular diversity The response of AMF alpha diversity to fertilization was inferred through linear mixed effects models (LMMs; Bates et al., 2015). To meet model assumptions, H<sub>0</sub> and H<sub>2</sub> estimates were square root transformed and specified as response variables. N and P were specified as fixed terms (i.e.  $sqrt(H_0/H_2) \sim N \times P$ ). To account for the random variability imposed by the experimental design, a nested random term was specified (i.e. 1|Site/Block/ Plot). Given that including all components of the random term led to model over-fitting (blocks contributed to explain 0 % of residual variability in H<sub>0</sub> and H<sub>2</sub>, Table S3), the random structure of the models was re-specified as 1|Site/Plot. The full OTU dataset and the per-family OTU data sub-sets were fitted to this model structure. The difference from control in mean  $H_0/H_2$ explained by the nutrient treatment regime, hereafter referred as the effect size, was used to infer the impact of nutrient addition on AMF alpha diversity. To visualize the magnitude and direction of these effect sizes and to provide a measure of uncertainty, 95% confidence intervals around effect sizes were estimated by refitting the model 1000 times with parametric bootstraps of the original data (Morris, 2002). In addition to this, we ascertained the effect of nutrient application regimes with classical null hypothesis significance testing by performing t tests. The null hypothesis was that the difference from control was not different from 0. Given that the current implementation of mixed models in LME4 package does not estimate P-values, these were determined via LMERTEST package (Kuznetsova et al., 2017).

Effects of nutrient addition on AMF community composition The effects of fertilization on AMF community composition were examined with multivariate generalized linear models (MGLM; Wang et al., 2012). MGLMs can handle multivariate response variables in which the variance is not constant (Warton et al., 2012), which is the case here (Fig. S4). Given the compositional nature of the data (Gloor et al., 2017), phylotype proportions cannot be considered to represent the abundance of AMF taxa in the environment. Consequently, to assess if fertilization elicits a change in AMF community composition, we focused on OTU occurrence data. Because our goal was to assess if the effect of each fertilization factor differed among sites - and since MGLMs cannot handle random effects, a separate model for each site was specified. Spatial dependencies in OTU presence within each site were accounted for by Moran eigenvectors maps (MEMs, Dray et al., 2006). MEMs were estimated according to the method developed by Bauman et al. (2018b). This is both an estimation and selection procedure that yields a set of MEMs that optimally describe the spatial structures observed in biotic communities (Bauman et al., 2018a). Thus, the selected MEMs were specified as predictors in each of the MGLMs (i.e. OTU

occurrence ~ MEMs + N × P). The variance structure for all three models was specified as binomial. Finally, deviance tests were performed on each MGLM to measure the strength of nutrient addition effects on AMF community composition. If the sequential inclusion of explanatory terms significantly increased the fit of the data in relation to a reduced model, then such factor was considered to have a significant influence on OTU occurrence. In addition to this, distance based redundancy analysis plots based on Jaccard dissimilarity matrices were employed to visualize the effects of treatments on AMF community composition (RDA; Legendre & Anderson, 1999). One RDA per site was specified as a two-way model (N × P), including MEMs as conditional covariates.

Sensitivity analysis To test the robustness of our results and compare to previously observed short-term effects (Camenzind *et al.*, 2014), the whole dataset was re-analyzed with traditionally applied statistical procedures (i.e. rarefying to a common minimum depth and PERMANOVA; Anderson, 2001; Oksanen *et al.*, 2018). Details of these procedures are presented in the Methods S2.

# Results

# Taxonomic delineation and assignation

A total of 280 samples were amplified and generated 12 625 525 merged reads. Six samples with less than 10 reads each were discarded as they were considered defective and 503 495 unique sequences were retained after filtering. These sequences were clustered in 628 OTUs at 97% similarity, of which 65.6% (412 OTUs, 87.77% of reads) identified with known Glomeromycotina sequences. All Glomeromycotina OTUs were assigned to three orders and six families, but c. 75% of these reads could be assigned to a known genus.

# Environmental variation and AMF community properties across sites

PCA of environmental factors indicated that environmental conditions in plots at the lower and upper montane forests were similar and differed from the conditions at the pre-montane forest site (Fig. 2a). In general, all experimental plots were characterized by low fertility and acidic soils. However, soils at the lower and upper montane plots had lower N and greater P availability than soils at the pre-montane site. In contrast, soils at the pre-montane site had higher pH and supported more diverse tree communities (Table S4). AMF OTU accumulation curves indicate that premontane plant communities hosted on average 126 more OTUs than lower and upper montane forests, which relative to each other reached a very similar number of OTUs (Fig. S5). Alpha diversity and relative abundance of reads of the most represented families within Glomeromycotina traced this pattern. While in the pre-montane plots OTUs assigned to Glomeraceae were more diverse and encompassed a greater proportion of reads than Acaulosporaceae, at both lower and upper montane sites OTUs



**Fig. 2** Site variability in environmental parameters and relative abundance of phylotypes assigned to main clades within Glomeromycotina. (a) Principle component analysis (PCA) of soil organic layer parameters and tree species richness. Two axes were sufficient to capture 79.3% of within site variability in soil parameters (n = 48). Closed and open symbols represent homogenized soil samples according to fertilization regime and hulls enclose all samples within a site. (b) H<sub>0</sub> (Richness) of phylotypes and (c) proportion of reads assigned to the most represented families across sites. White stars within boxplots represent the mean while the mid-horizontal line represents the median.

assigned to Acaulosporaceae were more diverse and contributed with a greater proportion of reads than Glomeraceae (Fig. 2b,c). Turnover of the most represented OTUs within these families, however, was strong across sites. None of the aforementioned OTUs occurred in all three sites whereas *c*. 10% of these OTUs were shared between the lower montane and one of the other two sites (Fig. 3).

#### Effects of nutrient addition on AMF molecular diversity

Responses of diversity indices to fertilization regime were minimal and statistically insignificant when analyzing all sites together (Table S5). Closer inspection of effect sizes estimated for each site confirmed these differences were not biologically meaningful at any site (Fig. 4a). When the analysis was partitioned among families, no effect was observed with only one exception. Glomeraceae mean H<sub>0</sub> and H<sub>2</sub> decreased by 5.2 ( $\pm$  2.4 SE) and 3.7 ( $\pm$  1.7 SE) OTUs respectively (*P*=0.02 and 0.02) as a response to the combined addition of N and P. The negative effect of the combined addition of N and P on Glomeraceae was consistent across sites (Fig. 4b).

# Effects of nutrient addition on AMF community composition

Deviance tests indicate that nutrient addition consistently affected AMF community composition at every site (Table 1). Fertilization effects on community composition were dependent on the nutrient added and the ambient nutrient status at each site. While adding N did not elicit a shift in AMF community composition only in the pre-montane forest, adding P alone consistently elicited community shifts at all sites. Given that the most represented OTUs across sites are present in all fertilization regimes, the shifts detected by deviance tests are most likely driven by the appearance and disappearance of rare OTUs. Test results were robust to the inclusion of eigenvector maps, which also increased the fit of every model significantly. This suggests that, in addition to the fertilization effects, spatially structured factors also contribute to explain the observed variability in AMF community composition. RDAs on Jaccard dissimilarity index are congruent with this result, as these indicate that nutrient factors explained on average 3.87% variability in AMF community structure, while conditioned MEMs explained 15.5% (Fig. 5).

### Sensitivity tests

Re-analysis of the dataset, using more traditionally employed statistical procedures, did not change results qualitatively (Tables S6 and S7). Rarefying to a minimum depth of 850 reads eliminated 3 AMF OTUs compared with VST. PERMANOVA on Jaccard distances found addition of P affects AMF community composition except for the upper montane forest site. In contrast the addition of N alone or in combination with P did not elicit shifts in AMF community composition.

# Discussion

Our cross-site analysis indicates that tropical montane forests harbor highly diverse AMF communities that appear to be structured by site specific environmental conditions. We provide



Fig. 3 Turnover of the most abundant operational taxonomic units (OTUs) across the three sites where the nutrient manipulation experiment took place. OTUs were selected if their relative abundance was greater than 1% of the total. Taxa are ordered by family to emphasize their turnover across sites.

evidence that indicates seven years of moderate N and P fertilization rates have affected AMF community composition but not richness, a finding consistent among sites. Nutrient effects are indeed mild, but remain clear even when spatial dependencies in AMF community composition are accounted for. Our results further suggest that fertilization effects depend on site ambient



**Table 1** Deviance test results parameters describing how each predictor contributed to improve the fit of the observed data to the model. MEMs stand for Moran's Eigenvector maps.

| Site          | Model   | df | Deviance | Р       |
|---------------|---------|----|----------|---------|
| Pre-montane   | с. 1    | 95 |          |         |
|               | + MEMs  | 86 | 4857.440 | < 0.001 |
|               | + N     | 85 | 393.527  | 0.553   |
|               | + P     | 84 | 593.784  | < 0.001 |
|               | + N : P | 83 | 520.412  | < 0.001 |
| Lower montane | с. 1    | 88 |          |         |
|               | + MEMs  | 79 | 2862.472 | < 0.001 |
|               | + N     | 78 | 260.035  | 0.030   |
|               | + P     | 77 | 331.201  | < 0.001 |
|               | + N : P | 76 | 297.538  | < 0.001 |
| Upper montane | с. 1    | 88 |          |         |
|               | + MEMs  | 80 | 2368.596 | 0.003   |
|               | + N     | 79 | 329.737  | 0.003   |
|               | + P     | 78 | 399.214  | < 0.001 |
|               | + N : P | 77 | 215.143  | 0.054   |

nutrient status, since N addition did not affect AMF communities in pre-montane forests, while P shifted community composition independently of soil nutrient status. Furthermore, the composition of the regional OTU pool was site specific and the response to fertilization was clade-specific, suggesting differences among

Glomeromycotina

Acaulosporaceae Gigasporaceae

Glomeraceae

Fig. 4 Estimated differences in mean H<sub>0</sub> (Richness) and H<sub>2</sub> (1/Simpson's dominance) of fertilized plots in relation to controls at each experimental site. Overall differences at the sub-phylum level are presented in (a) while (b) presents differences at the family level. The magnitude of the differences is presented in the square-root scale. Open and closed symbols represent point estimates and whiskers represent their 95% confidence intervals estimated by refitting the model 1000 times with parametric bootstraps of the original data. A 0.5 increase or decrease represents a difference of c. 5 units.

AMF clades in terms of their adaptation to different nutrient conditions. Overall, our results indicate that the rate of atmospheric nutrient deposition experienced by these forests constitutes a modest, yet consistent disturbance for AMF communities.

Both the phylotype pool and mean richness in our study sites are one of the highest so far reported for AMF, yet still fall within the boundaries of previous global AMF diversity assessments (Kivlin et al., 2011; Davison et al., 2015). Our observations that there was a substantial turnover of AMF taxa at different sites are also congruent with recent literature that found a strong influence of elevation on AMF beta diversity (Geml et al., 2014; Kivlin et al., 2017; Haug et al., 2019). Given that metabarcoding studies are not consistent in the strategies adopted to arrive at OTU definitions (Lekberg et al., 2014; Hart et al., 2015), and that elevation is a compound variable that usually involves a number of inter-related climatic, topographic and soil variables, it is not possible to generalize this pattern to other areas in the Andes. Nonetheless, recent reports of high AMF molecular diversity on both dry (Rodriguez-Echeverria et al., 2017; Morgan & Egerton-Warburton, 2017) and wet (Bachelot et al., 2017; García de León et al., 2018) tropical lowland forests lend support to the idea that tropical Andean forests harbor highly diverse AMF communities. Acaulosporaceae higher abundance and richness at sites with acidic pH and low N availability is congruent with the characterization of members of this clade as stress tolerant (Oehl et al.,



**Fig. 5** Constrained ordination plots depicting the influence of nutrient addition on arbuscular mycorrhizal fungi (AMF) communities. Panels (a–c) present one ordination per site. Pairwise Jaccard distances were estimated from a normalized operational taxonomic units (OTU) table. Ellipses represent one standard deviation from group centroids. Two axes explained 4.3%, 4.5% and 3.9% variability in AMF community composition, after spatial dependencies were conditionally partialled out.

2009; Veresoglou *et al.*, 2013; Liu *et al.*, 2015b). By contrast, high abundance of Glomeraceae at the site with the lowest C/N ratio among the set is in line with the association of this clade with higher N availability (Treseder *et al.*, 2018).

We found little support for our first hypothesis that predicted an overall negative effect of fertilization on AMF alpha diversity, which included sites with a slightly higher P availability. These results deviate from the short-term responses reported during an earlier assessment at the lower montane forest site (Camenzind *et al.*, 2014). As re-analyzing our data with traditional statistical approaches yielded qualitatively similar results, it is unlikely our observations are caused by a technical bias. Rather, these results

could be attributed to temporal variability in the response of AMF communities to increased nutrient supply. Wide shifts in the response of AMF intraradical structures to fertilization over time have been observed in our study sites (Camenzind et al., 2016). Alternatively, given that classic fertilization experiments have typically applied N and P at much higher rates (Egerton-Warburton et al., 2007; Liu et al., 2012; Sheldrake et al., 2018), the rather moderate rate employed in this study could have allowed AMF communities to respond to the new nutrient condition without impacting taxonomic richness. Multiple examples of neutral responses of AMF richness as a function of fertilization dosage can be found in the literature (Alguacil et al., 2010; Vályi et al., 2015). Overall, these results support the notion that the intensity and duration of fertilization could be modulating the responses of AMF both in terms of abundance (Zhang et al., 2018), alpha and beta diversity (Roy et al., 2017).

In line with our second hypothesis, N and P addition did affect AMF community composition, with the effects of P addition the most consistent factor across sites. This is congruent with previous reports at both our study area and other tropical forests (Alguacil et al., 2010; Camenzind et al., 2014; Sheldrake et al., 2018). It also suggests that AMF in this region are primarily involved in P for C transactions and that ambient nutrient status is important to consider when attempting to predict AMF root community responses to fertilization, as adding N alone did not affect AMF community composition as consistently as P. The addition of P may select for taxa with better ability to hoard P in order to maximize carbon gains from the host (Whiteside et al., 2019). Our results also indicate that spatially structured ecological processes are influencing how AMF communities in these forests assemble. As this study was not designed to disentangle and quantify the relative importance of different ecological processes on AMF community composition, we can only speculate about this point. Previous studies have shown that at small to intermediate spatial scales, neutral and environmental drivers interact to determine the structure of AMF communities (Caruso et al., 2012; Veresoglou et al., 2019). In tropical forests, there is wide array of available hosts which are likely employing a variety of strategies to cope with nutrient limitations (Nasto et al., 2014; Sayer & Banin, 2016; Baez & Homeier, 2018). Yet the degree to which individual tree species may influence the distribution and assemblage of AMF communities has yet to be firmly established in the tropics. For instance, a single AMF phylotype has been shown to associate with as many as 28 species of trees in one of our study sites (Haug et al., 2013). What appears more likely, is that the composition of AMF communities inferred from mixed root samples is simultaneously reflecting the variability introduced by the host, fine scale edaphic factors, stochastic processes and priority effects. In order to identify the drivers behind these patterns, new field assessments that quantify environmental variation at smaller spatial scales are required.

We observed differential responses to fertilization of clades within Glomeromycotina in terms of taxonomic diversity, which lends some support to our third hypothesis. Differential trait expression (Chagnon *et al.*, 2013) might explain this contrasting response to some extent. Taxa within Acaulosporaceae are known to exhibit slow growth, both intra and extra radically (Hart & Reader, 2002). These traits have traditionally been associated with high carbon use efficiency. Following this logic, it is plausible that the negligible effect of fertilization on richness of this lineage is explained by their efficient use of carbon. By contrast, Glomeraceae consistent reduction in taxonomic diversity after N and P additions suggests that some members of this clade have greater carbon demands. As certain members of this clade tend to exhibit a fast colonization rate and greater investment in intra radical growth (Hart & Reader, 2005), it could be argued that they have a less efficient use of carbon and possibly provide less P for C benefit to the host (Pearson & Jakobsen, 1993). If this is so, nutrient addition might promote their down regulation by the host or their competitive exclusion by those taxa that indeed make a more efficient use of available C (Kiers et al., 2011). Despite our observations fitting well with a differential trait expression framework, the highlighted traits might also vary at the species level (Maherali & Klironomos, 2012; Koch et al., 2017). Since trait information only exist for a fraction of AMF isolates, at this stage we simply miss empirical information to clearly link AMF traits to nutrient requirements or function. This prevents us to unequivocally establish whether differential adaptations to nutrient supply are the basis for the patterns reported here.

In conclusion, AM fungal communities appear to have adjusted to moderate nutrient additions at all experimental sites by shifting their composition relative to control sites, while species richness remained stable. These changes are more subtle than predicted by studies using higher doses of experimental fertilization, yet its robustness and consistency clearly suggest that such responses to ongoing atmospheric deposition can also be expected across the tropical Andes. Regarding functional implications, selection of AMF clades that invest less in extra-radical mycelium might reduce C storage below ground and retention of surplus products of N mineralization (Baldos et al., 2015; Velescu et al., 2016). Changes in AMF community structure elicited by fertilization could also set feedback loops in motion (Bever et al., 2012; Neuenkamp et al., 2018). This could favor plants adapted to high nutrient availability and promote their dominance (Baez & Homeier, 2018). In the long-term, an increasing dominance of fewer plant hosts, the so called 'homogenization' of the mycorrhizal environment (Caruso et al., 2012), could support less diverse AMF communities (Alguacil et al., 2012; Liu et al., 2012; Johnson et al., 2015). In order to fully capture the functional consequences for these ecosystems we need to gain a better understanding of how AMF taxa functional roles differ in these diverse ecosystems, and on how fine scale structural heterogeneity shapes AMF communities in tropical forests. Future research needs to tackle how AMF community parameters vary at finer temporal, spatial and phylogenetic resolutions. Most importantly, complementary studies about AMF nutrient demands, host effects and feedbacks deserve further attention.

#### Acknowledgements

We express our gratitude to NCI International, UTPL and BeGenDiv students and staff for their valuable assistance

throughout this study. We thank DFG (grant no. PAK 823/1) for financial support and the Ministry of the Environment of Ecuador for granting us the appropriate permits to conduct our research. We thank three anonymous referees for their suggestions which greatly improved the quality of this manuscript.

# **Author contributions**

JFD performed laboratory work, analyzed the data and wrote the manuscript. TC collected samples and assisted with data analysis. JR and SH assisted with bioinformatics and data analysis. JH designed the field experiment, collected samples and conducted environmental sample analysis. JPS assisted with data collection. MCR designed the study. TC, JR, SH, JH, JPS and MCR contributed with ideas and revised the manuscript.

# ORCID

Tessa Camenzind D https://orcid.org/0000-0001-5025-2976 Juan F. Dueñas D https://orcid.org/0000-0001-9770-3447 Jürgen Homeier D https://orcid.org/0000-0001-5676-3267 Matthias C. Rillig D https://orcid.org/0000-0003-3541-7853 Julien Roy D https://orcid.org/0000-0003-2964-1314 Juan Pablo Suárez D https://orcid.org/0000-0002-9453-5545

# References

- Amer F, Bouldin DR, Black CA, Duke FR. 1955. Characterization of soil phosphorus by anion exchange resin adsorption and P<sup>32</sup>-equilibration. *Plant and Soil* 6: 391–408.
- Anderson MJ. 2001. A new method for non-parametric multivariate analysis of variance. *Austral Ecology* 26: 32–46.
- Alguacil MdelM, Lozano Z, Campoy MJ, Roldán A. 2010. Phosphorus fertilisation management modifies the biodiversity of AM fungi in a tropical savanna forage system. *Soil Biology & Biochemistry* 42: 1114–1122.
- Alguacil MdelM, Torrecillas E, Hernández G, Roldán A. 2012. Changes in the diversity of soil arbuscular mycorrhizal fungi after cultivation for biofuel production in a Guantanamo (Cuba) tropical system. *PLoS ONE7*: e34887.
- Bachelot B, Uriarte M, McGuire KL, Thompson J, Zimmerman J. 2017. Arbuscular mycorrhizal fungal diversity and natural enemies promote coexistence of tropical tree species. *Ecology* 98: 712–720.
- Baez S, Homeier J. 2018. Functional traits determine tree growth and ecosystem productivity of a tropical montane forest: Insights from a long-term nutrient manipulation experiment. *Global Change Biology* 24: 399–409.
- Baez S, Malizia A, Carilla J, Blundo C, Aguilar M, Aguirre N, Aquirre Z, Alvarez E, Cuesta F, Duque A *et al.* 2015. Large-scale patterns of turnover and basal area change in Andean forests. *PLoS ONE* 10: e0126594.
- Baldos AP, Corre MD, Veldkamp E. 2015. Response of N cycling to nutrient inputs in forest soils across a 1000–3000 m elevation gradient in the Ecuadorian Andes. *Ecology* 96: 749–761.
- Bates D, Mächler M, Bolker B, Walker S. 2015. Fitting linear mixed-effects models using lme4. *Journal of Statistical Software* 67: 1–48.
- Bauman D, Drouet T, Dray S, Vleminckx J. 2018a. Disentangling good from bad practices in the selection of spatial or phylogenetic eigenvectors. *Ecography* 41: 1638–1649.
- Bauman D, Drouet T, Fortin M-J, Dray S. 2018b. Optimizing the choice of a spatial weighting matrix in eigenvector-based methods. *Ecology* 99: 2159–2166.
- Bever JD, Platt TG, Morton ER. 2012. Microbial population and community dynamics on plant roots and their feedbacks on plant communities. *Annual Review of Microbiology* 66: 265–283.
- ©2020 The Authors *New Phytologist* ©2020 New Phytologist Trust

- Bivand R, Keitt T, Rowlingson B, Pebesma E, Sumner M, Hijmans R, Rouault E, Warmerdam F, Ooms J, Rundel C. 2019. *rgdal: Bindings for the 'geospatial' data abstraction library.* [WWW document] URL http://rgdal.r-forge.r-project. org.
- Bivand RS, Pebesma E, Gómez-Rubio V. 2013. Applied spatial data analysis with R. New York, NY, USA: Springer-Verlag.
- Camacho C, Coulouris G, Avagyan V, Ma N, Papadopoulos J, Bealer K, Madden TL. 2009. BLAST plus: architecture and applications. *BMC Bioinformatics* 10: 421.
- Camenzind T, Haettenschwiler S, Treseder KK, Lehmann A, Rillig MC. 2018. Nutrient limitation of soil microbial processes in tropical forests. *Ecological Monographs* 88: 4–21.
- Camenzind T, Hempel S, Homeier J, Horn S, Velescu A, Wilcke W, Rillig MC. 2014. Nitrogen and phosphorus additions impact arbuscular mycorrhizal abundance and molecular diversity in a tropical montane forest. *Global Change Biology* 20: 3646–3659.
- Camenzind T, Homeier J, Dietrich K, Hempel S, Hertel D, Krohn A, Leuschner C, Oelmann Y, Olsson PA, Suarez JP *et al.* 2016. Opposing effects of nitrogen versus phosphorus additions on mycorrhizal fungal abundance along an elevational gradient in tropical montane forests. *Soil Biology & Biochemistry* 94: 37–47.
- Cárate-Tandalla D, Camenzind T, Leuschner C, Homeier J. 2018. Contrasting species responses to continued nitrogen and phosphorus addition in tropical montane forest tree seedlings. *Biotropica* **50**: 234–245.
- Caruso T, Hempel S, Powell JR, Barto EK, Rillig MC. 2012. Compositional divergence and convergence in arbuscular mycorrhizal fungal communities. *Ecology* 93: 1115–1124.
- Chagnon P-L, Bradley RL, Maherali H, Klironomos JN. 2013. A trait-based framework to understand life history of mycorrhizal fungi. *Trends in Plant Science* 18: 484–491.
- Chao A, Chiu C-H, Jost L. 2014. Unifying species diversity, phylogenetic diversity, functional diversity, and related similarity and differentiation measures through Hill numbers. *Annual Review of Ecology, Evolution, and Systematics* 45: 297–324.
- Cotton TA. 2018. Arbuscular mycorrhizal fungal communities and global change: an uncertain future. *FEMS Microbiology Ecology* 94: fiy179.
- Cusack DF, Silver WL, Torn MS, Burton SD, Firestone MK. 2011. Changes in microbial community characteristics and soil organic matter with nitrogen additions in two tropical forests. *Ecology* 92: 621–632.
- Cusack DF, Torn MS, McDowell WH, Silver WL. 2010. The response of heterotrophic activity and carbon cycling to nitrogen additions and warming in two tropical soils. *Global Change Biology* 16: 2555–2572.
- Davison J, Moora M, Öpik M, Adholeya A, Ainsaar L, Ba A, Burla S, Diedhiou AG, Hiiesalu I, Jairus T et al. 2015. Global assessment of arbuscular mycorrhizal fungus diversity reveals very low endemism. *Science* 349: 970–973.
- Dray S, Bauman D, Blanchet G, Borcard D, Clappe S, Guenard G, Jombart T, Larocque G, Legendre P, Madi Net al. 2019. adespatial: Multivariate multiscale spatial analysis. [WWW document] URL https://CRAN.R-project. org/package=adespatial.
- Dray S, Legendre P, Peres-Neto PR. 2006. Spatial modelling: a comprehensive framework for principal coordinate analysis of neighbour matrices (PCNM). *Ecological Modelling* 196: 483–493.
- Edgar RC. 2010. Search and clustering orders of magnitude faster than BLAST. *Bioinformatics* 26: 2460–2461.
- Edgar RC. 2013. UPARSE: highly accurate OTU sequences from microbial amplicon reads. *Nature Methods* 10: 996–998.
- Egerton-Warburton LM, Johnson NC, Allen EB. 2007. Mycorrhizal community dynamics following nitrogen fertilization: A cross-site test in five grasslands. *Ecological Monographs* 77: 527–544.
- Fayle TM, Turner EC, Basset Y, Ewers RM, Reynolds G, Novotny V. 2015. Whole-ecosystem experimental manipulations of tropical forests. *Trends in Ecology & Evolution* 30: 334–346.
- García de León DG, Neuenkamp L, Moora M, Opik M, Davison J, Patricia Pena-Venegas C, Vasar M, Jairus T, Zobel M. 2018. Arbuscular mycorrhizal fungal communities in tropical rain forest are resilient to slash-and-burn agriculture. *Journal of Tropical Ecology* 34: 186–199.

Geml J, Pastor N, Fernandez L, Pacheco S, Semenova TA, Becerra AG, Wicaksono CY, Nouhra ER. 2014. Large-scale fungal diversity assessment in the Andean Yungas forests reveals strong community turnover among forest types along an altitudinal gradient. *Molecular Ecology* 23: 2452–2472.

Girardin CAJ, Malhi Y, Aragão LEOC, Mamani M, Huaraca huasco W, Durand L, Feeley KJ, Rapp J, Silva-espejo JE, Silman M *et al.* 2010. Net primary productivity allocation and cycling of carbon along a tropical forest elevational transect in the Peruvian Andes. *Global Change Biology* 16: 3176– 3192.

Gloor GB, Macklaim JM, Pawlowsky-Glahn V, Egozcue JJ. 2017. Microbiome datasets are compositional: and this is not optional. *Frontiers in Microbiology* 8: 2224.

Graefe S, Hertel D, Leuschner C. 2010. N, P and K limitation of fine root growth along an elevation transect in tropical mountain forests. *Acta Oecologica* 36: 537–542.

Hagedorn F, Gavazov K, Alexander JM. 2019. Above- and belowground linkages shape responses of mountain vegetation to climate change. *Science* **365**: 1119–1123.

Hart MM, Aleklett K, Chagnon P-L, Egan C, Ghignone S, Helgason T, Lekberg Y, Öpik M, Pickles BJ, Waller L. 2015. Navigating the labyrinth: a guide to sequence-based, community ecology of arbuscular mycorrhizal fungi. *New Phytologist* 207: 235–247.

Hart MM, Reader RJ. 2002. Taxonomic basis for variation in the colonization strategy of arbuscular mycorrhizal fungi. *New Phytologist* **153**: 335–344.

Hart MM, Reader RJ. 2005. The role of the external mycelium in early colonization for three arbuscular mycorrhizal fungal species with different colonization strategies. *Pedobiologia* **49**: 269–279.

Haug I, Setaro S, Suárez JP. 2013. Reforestation sites show similar and nested AMF communities to an adjacent pristine forest in a tropical mountain area of south Ecuador. *PLoS ONE* 8: e63524.

Haug I, Setaro S, Suárez JP. 2019. Species composition of arbuscular mycorrhizal communities changes with elevation in the Andes of South Ecuador. *PLoS ONE* 14: e0221091.

van der Heijden MGA, Martin FM, Selosse M-A, Sanders IR. 2015. Mycorrhizal ecology and evolution: the past, the present, and the future. *New Phytologist* **205**: 1406–1423.

van der Heyde M, Ohsowski B, Abbott LK, Hart M. 2017. Arbuscular mycorrhizal fungus responses to disturbance are context-dependent. *Mycorrhiza* 27: 431–440.

Hill M. 1973. Diversity and avenness: a unifying notation and its consequences. *Ecology* 54: 427–432.

Hodge A, Storer K. 2015. Arbuscular mycorrhiza and nitrogen: implications for individual plants through to ecosystems. *Plant and Soil* 386: 1–19.

Homeier J, Breckle S-W, Günter S, Rollenbeck RT, Leuschner C. 2010. Tree diversity, forest structure and productivity along altitudinal and topographical gradients in a species-rich Ecuadorian montane rain forest. *Biotropica* 42: 140–148.

Homeier J, Hertel D, Camenzind T, Cumbicus NL, Maraun M, Martinson GO, Nohemy Poma L, Rillig MC, Sandmann D, Scheu S *et al.* 2012. Tropical andean forests are highly susceptible to nutrient inputs-rapid effects of experimental N and P addition to an Ecuadorian montane forest. *PLoS ONE7*: e47128.

Homeier J, Leuschner C, Bräuning A, Cumbicus NL, Hertel D, Martinson GO, Spannl S, Veldkamp E. 2013. Effects of nutrient addition on the productivity of montane forests and implications for the Carbon cycle. In: Bendix J, Beck E, Bräuning A, Makeschin F, Mosandl R, Scheu S, Wilcke W, eds. *Ecosystem services, biodiversity and environmental change in a tropical mountain ecosystem of south Ecuador.* Berlin, Germany: Springer, 315–329.

Hoorn C, Wesselingh FP, ter Steege H, Bermudez MA, Mora A, Sevink J, Sanmartin I, Sanchez-Meseguer A, Anderson CL, Figueiredo JP *et al.* 2010. Amazonia through time: Andean uplift, climate change, landscape evolution, and biodiversity. *Science* **330**: 927–931.

Johnson NC. 2010. Resource stoichiometry elucidates the structure and function of arbuscular mycorrhizas across scales. *New Phytologist* 185: 631–647.

Johnson NC, Wilson GWT, Bowker MA, Wilson JA, Miller RM. 2010. Resource limitation is a driver of local adaptation in mycorrhizal symbioses. *Proceedings of the National Academy of Sciences, USA* 107: 2093–2098. Johnson NC, Wilson GWT, Wilson JA, Miller RM, Bowker MA. 2015. Mycorrhizal phenotypes and the law of the minimum. *New Phytologist* 205: 1473–1484.

Kaspari M, Garcia MN, Harms KE, Santana M, Wright SJ, Yavitt JB. 2008. Multiple nutrients limit litterfall and decomposition in a tropical forest. *Ecology Letters* 11: 35–43.

Kassambara A. 2018. ggpubr: 'ggplot2' based publication ready plots. [WWW document] URL https://CRAN.R-project.org/package=ggpubr.

Kiers ET, Duhamel M, Beesetty Y, Mensah JA, Franken O, Verbruggen E, Fellbaum CR, Kowalchuk GA, Hart MM, Bago A et al. 2011. Reciprocal rewards stabilize cooperation in the mycorrhizal symbiosis. Science 333: 880– 882.

Kivlin SN, Hawkes CV, Treseder KK. 2011. Global diversity and distribution of arbuscular mycorrhizal fungi. Soil Biology & Biochemistry 43: 2294–2303.

Kivlin SN, Lynn JS, Kazenel MR, Beals KK, Rudgers JA. 2017. Biogeography of plant-associated fungal symbionts in mountain ecosystems: a meta-analysis. *Diversity and Distributions* 23: 1067–1077.

Koch AM, Antunes PM, Maherali H, Hart MM, Klironomos JN. 2017. Evolutionary asymmetry in the arbuscular mycorrhizal symbiosis: conservatism in fungal morphology does not predict host plant growth. *New Phytologist* 214: 1330–1337.

Kottke I, Haug I, Setaro S, Suárez JP, Weiß M, Preußing M, Nebel M, Oberwinkler F. 2008. Guilds of mycorrhizal fungi and their relation to trees, ericads, orchids and liverworts in a neotropical mountain rain forest. *Basic and Applied Ecology* 9: 13–23.

Krüger M, Krüger C, Walker C, Stockinger H, Schuessler A. 2012. Phylogenetic reference data for systematics and phylotaxonomy of arbuscular mycorrhizal fungi from phylum to species level. *New Phytologist* 193: 970–984.

Krüger M, Stockinger H, Krüger C, Schuessler A. 2009. DNA-based species level detection of Glomeromycota: one PCR primer set for all arbuscular mycorrhizal fungi. *New Phytologist* 183: 212–223.

Kuznetsova A, Brockhoff PB, Christensen RHB. 2017. ImerTest package: tests in linear mixed effects models. *Journal of Statistical Software* 82: 1–26.

Legendre P, Anderson MJ. 1999. Distance-based redundancy analysis: testing multispecies responses in multifactorial ecological experiments. *Ecological Monographs* 69: 1–24.

Lekberg Y, Gibbons SM, Rosendahl S. 2014. Will different OTU delineation methods change interpretation of arbuscular mycorrhizal fungal community patterns? *New Phytologist* 202: 1101–1104.

Lilleskov EA, Kuyper TW, Bidartondo MI, Hobbie EA. 2019. Atmospheric nitrogen deposition impacts on the structure and function of forest mycorrhizal communities: a review. *Environmental Pollution* 246: 148–162.

Liu L, Gundersen P, Zhang W, Zhang T, Chen H, Mo J. 2015. Effects of nitrogen and phosphorus additions on soil microbial biomass and community structure in two reforested tropical forests. *Scientific Reports* **5**: 1–10.

Liu L, Hart MM, Zhang J, Cai X, Gai J, Christie P, Li X, Klironomos JN. 2015. Altitudinal distribution patterns of AM fungal assemblages in a Tibetan alpine grassland. *FEMS Microbiology Ecology* 91: fiv078.

Liu Y, Shi G, Mao L, Cheng G, Jiang S, Ma X, An L, Du G, Johnson NC, Feng H. 2012. Direct and indirect influences of 8 yr of nitrogen and phosphorus fertilization on Glomeromycota in an alpine meadow ecosystem. *New Phytologist* 194: 523–535.

Love MI, Huber W, Anders S. 2014. Moderated estimation of fold change and dispersion for RNA-seq data with DESeq2. *Genome Biology* 15: 550.

Maherali H, Klironomos JN. 2012. Phylogenetic and trait-based assembly of arbuscular mycorrhizal fungal communities. *PLoS ONE7*: e36695.

Martinez-Garcia LB, Richardson SJ, Tylianakis JM, Peltzer DA, Dickie IA. 2015. Host identity is a dominant driver of mycorrhizal fungal community composition during ecosystem development. *New Phytologist* 205: 1565– 1576.

Martinson GO, Corre MD, Veldkamp E. 2013. Responses of nitrous oxide fluxes and soil nitrogen cycling to nutrient additions in montane forests along an elevation gradient in southern Ecuador. *Biogeochemistry* 112: 625–636.

Matson PA, McDowell WH, Townsend AR, Vitousek PM. 1999. The globalization of N deposition: ecosystem consequences in tropical environments. *Biogeochemistry* 46: 67–83.

McMurdie PJ, Holmes S. 2013. phyloseq: An R package for reproducible interactive analysis and graphics of microbiome census data. *PLoS ONE* 8: e61217.

- McMurdie PJ, Holmes S. 2014. Waste not, want not: why rarefying microbiome data is inadmissible. *PLoS Computational Biology* 10: e1003531.
- Mirmanto E, Proctor J, Green J, Nagy L, Suriantata. 1999. Effects of nitrogen and phosphorus fertilization in a lowland evergreen rainforest. *Philosophical Transactions of the Royal Society B: Biological Sciences* 354: 1825–1829.

Morgan BST, Egerton-Warburton LM. 2017. Barcoded Ns31/Aml2 primers for sequencing of arbuscular mycorrhizal communities in environmental samples. *Applications in Plant Sciences* 5: 1700017.

Morris EK, Caruso T, Buscot F, Fischer M, Hancock C, Maier TS, Meiners T, Mueller C, Obermaier E, Prati D *et al.* 2014. Choosing and using diversity indices: insights for ecological applications from the German biodiversity exploratories. *Ecology and Evolution* 4: 3514–3524.

Morris JS. 2002. The BLUPs are not "best" when it comes to bootstrapping. *Statistics & Probability Letters* 56: 425–430.

Moser G, Hertel D, Leuschner C. 2007. Altitudinal change in LAI and stand leaf biomass in tropical montane forests: a transect study in Ecuador and a pantropical meta-analysis. *Ecosystems* 10: 924–935.

Moser G, Leuschner C, Hertel D, Graefe S, Soethe N, Iost S. 2011. Elevation effects on the carbon budget of tropical mountain forests (S Ecuador): the role of the belowground compartment. *Global Change Biology* 17: 2211–2226.

Nasto MK, Alvarez-Clare S, Lekberg Y, Sullivan BW, Townsend AR, Cleveland CC. 2014. Interactions among nitrogen fixation and soil phosphorus acquisition strategies in lowland tropical rain forests. *Ecology Letters* 17: 1282– 1289.

Neuenkamp L, Moora M, Öpik M, Davison J, Gerz M, Männistö M, Jairus T, Vasar M, Zobel M. 2018. The role of plant mycorrhizal type and status in modulating the relationship between plant and arbuscular mycorrhizal fungal communities. *New Phytologist.* 220: 1236–1247.

Oehl F, Sieverding E, Ineichen K, Maeder P, Wiemken A, Boller T. 2009. Distinct sporulation dynamics of arbuscular mycorrhizal fungal communities from different agroecosystems in long-term microcosms. *Agriculture Ecosystems* & Environment 134: 257–268.

Oksanen J, Blanchet FG, Friendly M, Kindt R, Legendre P, McGlinn D, Minchin PR, O'Hara RB, Simpson GL, Solymos Pet al. 2018. vegan: community ecology package. [WWW document] URL https://CRAN.R-project. org/package=vegan.

Oñate-Valdivieso F, Fries A, Mendoza K, Gonzalez-Jaramillo V, Pucha-Cofrep F, Rollenbeck R, Bendix J. 2018. Temporal and spatial analysis of precipitation patterns in an Andean region of southern Ecuador using LAWR weather radar. *Meteorology and Atmospheric Physics* **130**: 473–484.

Pearson JN, Jakobsen I. 1993. Symbiotic exchange of carbon and phosphorus between cucumber and three arbuscular mycorrhizal fungi. *New Phytologist* 124: 481–488.

Powell JR, Rillig MC. 2018. Biodiversity of arbuscular mycorrhizal fungi and ecosystem function. *New Phytologist* 220: 1059–1075.

R Core Team. 2017. R: a language and environment for statistical computing. Vienna, Austria: R Foundation for Statistical Computing.

Rahbek C, Borregaard MK, Antonelli A, Colwell RK, Holt BG, Nogues-Bravo D, Rasmussen CMØ, Richardson K, Rosing MT, Whittaker RJ et al. 2019a. Building mountain biodiversity: geological and evolutionary processes. Science 365: 1114–1119.

Rahbek C, Borregaard MK, Colwell RK, Dalsgaard B, Holt BG, Morueta-Holme N, Nogues-Bravo D, Whittaker RJ, Fjeldså J. 2019b. Humboldt's enigma: What causes global patterns of mountain biodiversity? *Science* 365: 1108–1113.

Rillig MC. 2004. Arbuscular mycorrhizae and terrestrial ecosystem processes. *Ecology Letters* 7: 740–754.

Rodriguez-Echeverria S, Teixeira H, Correia M, Timoteo S, Heleno R, Opik M, Moora M. 2017. Arbuscular mycorrhizal fungi communities from tropical Africa reveal strong ecological structure. *New Phytologist* 213: 380–390.

Rollenbeck R, Bendix J. 2011. Rainfall distribution in the Andes of southern Ecuador derived from blending weather radar data and meteorological field observations. *Atmospheric Research* **99**: 277–289. Roy J, Mazel F, Sosa-Hernández MA, Dueñas JF, Hempel S, Zinger L, Rillig MC. 2019. The relative importance of ecological drivers of arbuscular mycorrhizal fungal distribution varies with taxon phylogenetic resolution. *New Phytologist* 224: 936–948.

Roy J, Reichel R, Brueggemann N, Hempel S, Rillig MC. 2017. Succession of arbuscular mycorrhizal fungi along a 52-year agricultural recultivation chronosequence. *FEMS Microbiology Ecology* 93: fix102.

Sayer EJ, Banin LF. 2016. Tree nutrient status and nutrient cycling in tropical forest—lessons from fertilization experiments. In: Goldstein G, Santiago LS, eds. *Tropical tree physiology: adaptations and responses in a changing environment*. Basel, Switzerland: Springer, 275–297.

Schloss PD, Westcott SL, Ryabin T, Hall JR, Hartmann M, Hollister EB, Lesniewski RA, Oakley BB, Parks DH, Robinson CJ et al. 2009. Introducing mothur: open-source, platform-independent, community-supported software for describing and comparing microbial communities. Applied and Environmental Microbiology 75: 7537–7541.

Sheldrake M, Rosenstock NP, Mangan S, Revillini D, Sayer EJ, Olsson PA, Verbruggen E, Tanner EVJ, Turner BL, Wright SJ. 2018. Responses of arbuscular mycorrhizal fungi to long-term inorganic and organic nutrient addition in a lowland tropical forest. *ISME journal.* 12: 2433–2445.

Smith SE, Read DJ. 2008. *Mycorrhizal symbiosis*. Cambridge, UK: Academic Press.

Smith SE, Smith FA. 2012. Fresh perspectives on the roles of arbuscular mycorrhizal fungi in plant nutrition and growth. *Mycologia* 104: 1–13.

Soteras F, Menoyo E, Grilli G, Becerra AG. 2019. Arbuscular mycorrhizal fungal communities of high mountain ecosystems of South America: relationship with microscale and macroscale factors. In: Pagano MC, Lugo MA, eds. *Fungal biology. Mycorrhizal fungi in South America.* Cham, Switzerland: Springer International, 257–275.

Spatafora JW, Chang Y, Benny GL, Lazarus K, Smith ME, Berbee ML, Bonito G, Corradi N, Grigoriev I, Gryganskyi A *et al.* 2016. A phylum-level phylogenetic classification of zygomycete fungi based on genome-scale data. *Mycologia* 108: 1028–1046.

Spracklen DV, Righelato R. 2014. Tropical montane forests are a larger than expected global carbon store. *Biogeosciences* 11: 2741–2754.

Tanner EVJ, Kapos V, Franco W. 1992. Nitorgen and phosphorus fertilization effects on Venezuelan montane forest trunk growth and litterfall. *Ecology* 73: 78–86.

Tanner EVJ, Vitousek PM, Cuevas E. 1998. Experimental investigation of nutrient limitation of forest growth on wet tropical mountains. *Ecology* 79: 10– 22.

Treseder KK. 2004. A meta-analysis of mycorrhizal responses to nitrogen, phosphorus, and atmospheric CO<sub>2</sub> in field studies. *New Phytologist* 164: 347– 355.

Treseder KK, Allen EB, Egerton-Warburton LM, Hart MM, Klironomos JN, Maherali H, Tedersoo L. 2018. Arbuscular mycorrhizal fungi as mediators of ecosystem responses to nitrogen deposition: A trait-based predictive framework. *Journal of Ecology* 106: 480–489.

Treseder KK, Allen MF. 2002. Direct nitrogen and phosphorus limitation of arbuscular mycorrhizal fungi: a model and field test. *New Phytologist* 155: 507–515.

Ushio M, Aiba S, Takeuchi Y, Iida Y, Matsuoka S, Repin R, Kitayama K. 2017. Plant-soil feedbacks and the dominance of conifers in a tropical montane forest in Borneo. *Ecological Monographs* 87: 105–129.

Vályi K, Rillig MC, Hempel S. 2015. Land-use intensity and host plant identity interactively shape communities of arbuscular mycorrhizal fungi in roots of grassland plants. *New Phytologist* 205: 1577–1586.

Velescu A, Valarezo C, Wilcke W. 2016. Response of dissolved carbon and nitrogen concentrations to moderate nutrient additions in a tropical montane forest of South Ecuador. *Frontiers in Earth Science* 4: UNSP 58.

Veresoglou SD, Caruso T, Rillig MC. 2013. Modelling the environmental and soil factors that shape the niches of two common arbuscular mycorrhizal fungal families. *Plant and Soil* 368: 507–518.

Veresoglou SD, Liu L, Xu T, Rillig MC, Wang M, Wang J, Chen Y, Hu Y, Hao Z, Chen B. 2019. Biogeographical constraints in Glomeromycotinan distribution across forest habitats in China. *Journal of Ecology* 107: 684–695.

- Wang Y, Naumann U, Wright ST, Warton DI. 2012. mvabund- an R package for model-based analysis of multivariate abundance data. *Methods in Ecology* and Evolution 3: 471–474.
- Warton DI, Wright ST, Wang Y. 2012. Distance-based multivariate analyses confound location and dispersion effects. *Methods in Ecology and Evolution* 3: 89–101.
- Werner FA, Homeier J. 2015. Is tropical montane forest heterogeneity promoted by a resource-driven feedback cycle? Evidence from nutrient relations, herbivory and litter decomposition along a topographical gradient. *Functional Ecology* 29: 430–440.
- Whiteside MD, Werner GDA, Caldas VEA, van't Padje A, Dupin SE, Elbers B, Bakker M, Wyatt GAK, Klein M, Hink MA *et al.* 2019. Mycorrhizal fungi respond to resource inequality by moving phosphorus from rich to poor patches across networks. *Current Biology* 29: 2043–2050.e8.
- Wickham H. 2016. ggplot2: elegant graphics for data analysis. New York, NY, USA: Springer.
- Wickham H, François R, Henry L, Müller K. 2018. *dplyr: a grammar of data manipulation*. [WWW document] URL https://CRAN.R-project.org/packa ge=dplyr.
- Wilcke W, Leimer S, Peters T, Emck P, Rollenbeck R, Trachte K, Valarezo C, Bendix J. 2013. The nitrogen cycle of tropical montane forest in Ecuador turns inorganic under environmental change. *Global Biogeochemical Cycles* 27: 1194– 1204.
- Wilcke W, Velescu A, Leimer S, Bigalke M, Boy J, Valarezo C. 2019. Temporal trends of phosphorus cycling in a tropical montane forest in Ecuador during 14 years. *Journal of Geophysical Research: Biogeosciences* 124: 1370–1386.
- Wilcke W, Yasin S, Abramowski U, Valarezo C, Zech W. 2002. Nutrient storage and turnover in organic layers under tropical montane rain forest in Ecuador. *European Journal of Soil Science* 53: 15–27.
- Wolf K, Veldkamp E, Homeier J, Martinson GO. 2011. Nitrogen availability links forest productivity, soil nitrous oxide and nitric oxide fluxes of a tropical montane forest in southern Ecuador. *Global Biogeochemical Cycles* 25: GB4009.
- Zhang T, Chen HYH, Ruan H. 2018. Global negative effects of nitrogen deposition on soil microbes. *ISME Journal* 12: 1817–1825.

# **Supporting Information**

Additional Supporting Information may be found online in the Supporting Information section at the end of the article.

Fig. S1 Study area, site location and experimental design schematic.

Fig. S2 Density distribution of sequencing depth across sequencing runs Fig. S3 Per sample and per treatment rarefaction curves.

Fig. S4 Relationship between mean OTU presence and its variance.

Fig. S5 Taxon accumulation curves estimated from variance stabilized data.

Methods S1 Nested PCR conditions and library preparation.

Methods S2 Description of methods for data re-analysis or sensitivity tests.

Table S1 Experimental sites detailed environmental properties.

**Table S2** Summary of the commands and packages used for statistical analysis.

**Table S3** Contribution of each random term component to explain residual variability in H0 (Richness) and H2 (1/Simpson's dominance).

Table S4 Means and standard errors of environmental factors.

**Table S5** Estimates and statistical tests derived from linear mixed effect models fitted with data normalized with variance stabilizing transformation.

**Table S6** Estimates and statistical tests derived from linear mixed effect model fitted with data normalized by rarefying to 850 read minimum depth.

**Table S7** Two-way PERMANOVA results based on Jaccard dissimilarity matrices estimated with data normalized by rarefying to 850 read minimum depth.

Please note: Wiley Blackwell are not responsible for the content or functionality of any Supporting Information supplied by the authors. Any queries (other than missing material) should be directed to the *New Phytologist* Central Office.