

# Warming, drought, and disturbances lead to shifts in functional composition: a millennial-scale analysis for Amazonian and Andean sites

Article

**Published Version** 

Creative Commons: Attribution 4.0 (CC-BY)

**Open Access** 

van der Sande, M. T. ORCID: https://orcid.org/0000-0002-6845-2308, Bush, M. B. ORCID: https://orcid.org/0000-0001-6894-8613, Åkesson, C. M., Berrio, J. C., Correia Metrio, A., Flantua, S. G. A. ORCID: https://orcid.org/0000-0001-6526-3037, Hooghiemstra, H., Maezumi, S. Y., McMichael, C. N. H. ORCID: https://orcid.org/0000-0002-1064-1499, Montoya, E., Mosblech, N. A. S., de Novaes Nascimento, M., Peña-Claros, M., Poorter, L., Raczka, M. F. ORCID: https://orcid.org/0000-0002-6602-8087 and Gosling, W. D. ORCID: https://orcid.org/0000-0001-9903-8401 (2023) Warming, drought, and disturbances lead to shifts in functional composition: a millennial-scale analysis for Amazonian and Andean sites. Global Change Biology. ISSN 1365-2486 doi: https://doi.org/10.1111/gcb.16818 Available at https://centaur.reading.ac.uk/112410/

It is advisable to refer to the publisher's version if you intend to cite from the work. See <u>Guidance on citing</u>.

To link to this article DOI: http://dx.doi.org/10.1111/gcb.16818



Publisher: Wiley

All outputs in CentAUR are protected by Intellectual Property Rights law, including copyright law. Copyright and IPR is retained by the creators or other copyright holders. Terms and conditions for use of this material are defined in the <u>End User Agreement</u>.

# www.reading.ac.uk/centaur

# CentAUR

Central Archive at the University of Reading

Reading's research outputs online

DOI: 10.1111/gcb.16818

# RESEARCH ARTICLE



# Warming, drought, and disturbances lead to shifts in functional composition: A millennial-scale analysis for Amazonian and Andean sites

Masha T. van der Sande <sup>1</sup> 💿 📔 Mark B. Bush <sup>2</sup> 💿 📔 Christine M. Åkesson <sup>2</sup> 🛛
Juan Carlos Berrio <sup>3</sup>   Alex Correia Metrio <sup>4</sup>   Suzette G. A. Flantua <sup>5</sup> 💿
Henry Hooghiemstra <sup>6</sup>   S. Yoshi Maezumi <sup>7</sup>   Crystal N. H. McMichael <sup>6</sup>
Encarni Montoya <sup>8</sup>   Nicole A. S. Mosblech <sup>2</sup>   Majoi de Novaes Nascimento <sup>6</sup>
Marielos Peña-Claros <sup>1</sup>   Lourens Poorter <sup>1</sup>   Marco F. Raczka <sup>9</sup>   William D. Gosling <sup>6</sup>

<sup>1</sup>Forest Ecology and Forest Management Group, Wageningen University & Research, Wageningen, The Netherlands
 <sup>2</sup>Institute for Global Ecology, Florida Institute of Technology, Melbourne, Florida, USA
 <sup>3</sup>School of Geography, Geology and the Environment, University of Leicester, Leicester, UK
 <sup>4</sup>Instituto de Geologia, Universidad Nacional Autonoma de Mexico, Mexico City, Mexico
 <sup>5</sup>Department of Biological Sciences, University of Bergen and Bjerknes Centre for Climate Research, Bergen, Norway
 <sup>6</sup>Institute for Biodiversity and Ecosystem Dynamics, University of Amsterdam, Amsterdam, The Netherlands
 <sup>7</sup>Department of Archaeology, Max Planck Institute for Geoanthropology, Jena, Germany
 <sup>8</sup>Institute of Geosciences Barcelona (GEO3BCN), CSIC, Barcelona, Spain
 <sup>9</sup>Department of Geography and Environmental Science, University of Reading, Reading, UK

# Correspondence

Masha T. van der Sande, Forest Ecology and Forest Management Group, Wageningen University & Research, Wageningen, The Netherlands. Email: masha.vandersande@wur.nl

# Funding information

Nederlandse Organisatie voor Wetenschappelijk Onderzoek, Grant/ Award Number: 019,1711 W 023 and NWO-VI.Veni.192.027; European Research Council, Grant/Award Number: NWO-ALWOP.322, 853394 and 834775; National Science Foundation, Grant/Award Number: 1624207. EAR 1338694, DEB 1260983, BCS0926973 and EAR1338694; Belmont Forum; National Aeronautics 622 and Space Administration, Grant/Award Number: NNX14AD31G; National Geographic Society, Grant/Award Number: 8763-10: Trond Mohn Stiftelse: University of Bergen, Grant/Award Number: TMS2022STG03; Netherlands Organization for Tropical Research,

# Abstract

Tropical forests are changing in composition and productivity, probably in response to changes in climate and disturbances. The responses to these multiple environmental drivers, and the mechanisms underlying the changes, remain largely unknown. Here, we use a functional trait approach on timescales of 10,000 years to assess how climate and disturbances influence the community-mean adult height, leaf area, seed mass, and wood density for eight lowland and highland forest landscapes. To do so, we combine data of eight fossil pollen records with functional traits and proxies for climate (temperature, precipitation, and El Niño frequency) and disturbances (fire and general disturbances). We found that temperature and disturbances were the most important drivers of changes in functional composition. Increased water availability (high precipitation and low El Niño frequency) generally led to more acquisitive trait composition (large leaves and soft wood). In lowland forests, warmer climates decreased community-mean height probably because of increased water stress, whereas in highland forests warmer climates increased height probably because of upslope migration of taller species. Disturbance increased the abundance of

This is an open access article under the terms of the Creative Commons Attribution License, which permits use, distribution and reproduction in any medium, provided the original work is properly cited. © 2023 The Authors. *Global Change Biology* published by John Wiley & Sons Ltd. -WILEY- 🚔 Global Change Biology

Grant/Award Number: WB 84-636; European Commission, Grant/Award Number: 792197; Natural Environment Research Council, Grant/Award Number: NRCF010001 and NE/J018562/1 acquisitive, disturbance-adapted taxa with small seeds for quick colonization of disturbed sites, large leaves for light capture, and soft wood to attain fast height growth. Fire had weak effects on lowland forests but led to more stress-adapted taxa that are tall with fast life cycles and small seeds that can quickly colonize burned sites. Site-specific analyses were largely in line with cross-site analyses, except for varying site-level effects of El Niño frequency and fire activity, possibly because regional patterns in El Niño are not a good predictor of local changes, and charcoal abundances do not reflect fire intensity or severity. With future global changes, tropical Amazonian and Andean forests may transition toward shorter, drought- and disturbance-adapted forests in the lowlands but taller forests in the highlands.

## KEYWORDS

Amazon, Andes, climate change, El Niño, fire, fossil pollen, functional traits, tropical forest

# 1 | INTRODUCTION

Old-growth tropical forests were long thought to be in a stable state. However, direct observations are accumulating that over the past decades forests are showing changes in productivity (Brienen et al., 2015), species composition (Feeley, Davies, et al., 2011), and functional trait composition (van der Sande et al., 2016). These changes can be caused by climate change, such as warming, droughts or increased atmospheric CO<sub>2</sub> concentration, or by natural and anthropogenic disturbances such as logging, hurricanes, and fires (Hirota et al., 2021). Understanding forest responses to multiple potential drivers is of critical importance, as it will help to understand forest responses to future changes. It is, however, difficult to understand the responses of tropical forest to multiple drivers, as they can have opposing effects and act at different timescales, and are therefore rarely considered in the same study. Most studies assess changes in tropical forests across a few decades (Brienen et al., 2015; Feeley, Davies, et al., 2011; van der Sande et al., 2016), whereas the recruitment and growth of trees to the canopy can take centuries, and the successional changes to old-growth forest composition even longer (Rozendaal et al., 2019). We therefore need to assess tropical forest responses at temporal scales of centuries to millennia.

Traditionally, long-term (100–1000 of years) palynological studies link changes in pollen taxon associations (González-Carranza et al., 2012; Smith & Mayle, 2018) to their ecological niche space to interpret the underlying environmental drivers of vegetation change. However, this way to infer the factors driving environmental change can be made more mechanistic by using functional plant trait characteristics. Functional traits are plant characteristics that determine plant establishment, growth, and survival, and thus the responses of species (Poorter et al., 2006; Violle et al., 2007) and ecosystems (Becknell & Powers, 2014; van der Sande et al., 2018) to environmental change. Therefore, using pollen data to analyze how the trait composition of plant communities is affected by human disturbance and climate change over centennial to millennial timescales will allow for a better mechanistic understanding of forest responses to global changes (Sakschewski et al., 2016). Various studies have used such a functional trait approach by determining the community-weighted mean trait values, to assess short-term, decadal forest responses to environmental change (Enquist & Enquist, 2011; Fauset et al., 2012; van der Sande et al., 2016; Zhou et al., 2014).

Recently, we presented a new approach that analyzed millennialscale shifts in functional trait composition, based on species abundance changes from fossil pollen records (van der Sande et al., 2019, 2020). We found that over a time period of 7000 years, the trait composition of a lowland forest in Peru was affected by past climate change and human disturbance (van der Sande et al., 2019). Using eight different traits, we showed that the community-mean wood density (WD), an indicator of drought and shade tolerance, decreased during times of high precipitation. Also, the communitymean leaf size increased with precipitation, probably because large leaves need more water for transpirational cooling and/or larger leaves are needed to intercept more light in wetter and denser forests. Furthermore, the community-mean tree height and seed mass (SM) increased with fire activity, perhaps because large species can escape crown fire, and seedlings from large seeds grow faster and have a greater chance of surviving a possible next fire. However, to date no studies have been done to assess how these relationships hold up across the diverse forests of the Amazon and Andes, and we do not know to what extent environmental drivers similarly affect trait composition for other forest types and at broader spatial scales.

Here, we assess the functional trait composition of eight South American tropical forest landscapes (ranging from 0 to 3200 m asl) and their millennial-scale responses to past climate change and disturbances. Along elevation, marked decreases occur in water availability, temperature, atmospheric pressure, and insolation, resulting in changes in species and trait composition (Enquist et al., 2017; Llerena-Zambrano et al., 2021; Maharjan et al., 2021). Such differences in environmental conditions and trait composition may lead to different forest responses to climate change and disturbances. For example, while the distributions of lowland tropical tree taxa are strongly influenced by mean annual rainfall (Toledo et al., 2012), the distributions of montane tree taxa, such as Weinmannia and Polylepis, are mostly determined by mean annual temperature (Duque et al., 2015; Fadrique et al., 2018; Groot et al., 2013). From ca. 2300 m, upslope night frost may occur, making resistance to night frost important for taxa occurring in these sites. This could suggest that Amazonian lowland forests respond most strongly to changes in rainfall, whereas highland Andean forests respond most strongly to changes in temperature and occurrence of night frost (Fadrique et al., 2018). In addition, intense droughts, such as those caused by El Niño events, are generally strongest in eastern and northern Amazonian lowland forests (Marengo et al., 2021). Furthermore, during the Holocene, tropical forests have seen varying degrees of human occupation and associated disturbances (McMichael & Bush, 2019). In many wet tropical forest ecosystems, fires do not naturally occur at high intensity or frequency, and are therefore often considered a human disturbance (Gosling et al., 2022). Forests with a longer history of natural or anthropogenic disturbances, such as fire or clearcut for agriculture (Iriarte et al., 2020), may be more resilient and show weaker responses (due to high resistance and/or fast recovery) to an increase in disturbances (Cole et al., 2014). On the other hand, frequent disturbances such as fires can also reduce an ecosystem's resilience and cause drastic shifts in state, for example to a savanna ecosystem (Staver et al., 2011).

We ask two questions. First, how do temporal changes in past climate (precipitation, temperature anomalies, and the frequency of El Niño events) and past disturbances (fire activity and disturbances in general) determine shifts in community-mean trait values across Neotropical forests over at least the last 2000 years (for some of our sites up to 12,000 years). We hypothesized that increased rainfall and decreasing droughts increase the relative abundance of drought-vulnerable taxa that may have a combination of low WD, large adult stature with large hydraulic path lengths, and large leaves (Aleixo et al., 2019; Guillemot et al., 2022). High disturbance intensity (e.g., from fire, hurricanes, or land-use change) can have contrasting effects: on the one hand, it can create more open spaces and increase the relative abundance of pioneer species with low WD and large leaves. On the other hand, when disturbance events occur frequently, it could increase the relative abundance of taxa that can resist disturbance (e.g., with dense wood), can resprout, or that have a shorter life cycle (e.g., short adult stature). Second, how do these responses of trait composition to climate and disturbances depend on elevation? We hypothesized that precipitation and El Niño effects are stronger at low elevation, because water availability is a more limiting resource, while temperature effects are stronger at high elevation, because of its limiting effect on tree growth (Table 1). To address these questions, we use data from eight fossil pollen records, which we match with data of four key functional leaf, stem, and whole-plant traits that capture the global spectra in plant form and function (Díaz et al., 2015). Subsequently, we calculate community-mean trait values across time and link these to disturbance indices (charcoal to indicate fire, and abundance of the pioneer genus Cecropia spp. to indicate disturbances) and independent

Global Change Biology –WILEY – 3

climate proxies (for precipitation, temperature, and El Niño events). We test these hypotheses using cross-site analyses and site-specific analyses.

# 2 | MATERIALS AND METHODS

# 2.1 | Sites

We focused this study on eight sites in forest-dominated landscapes in the Amazon and Andes (Table 2; Figure 1). We selected four lowland (5-600m), one mid-elevation (1250m), and three highland (2780-3150m) sites. For each site, we had one fossil pollen record derived from lake sediments to assess changes in pollen taxonomic composition for the last two millennia, while some pollen records reflect a longer period up to the last ca. 12 kyr. We linked the pollen taxa names in these records (at genus level) to leaf and stem trait data to quantify "community-mean traits" changes over time. From the selected lake sediment cores, we also obtained data on charcoal for fire activity (Whitlock & Larsen, 2001) and guantified the abundance of Cecropia pollen as a proxy of forest openness (Zalamea et al., 2012), which was used as indicator of general disturbances. Furthermore, we used independent, external sources for climatic proxies of precipitation, temperature, and the frequency of El Niño events (see for a complete description below).

# 2.2 | Fossil pollen records

We used data from eight published fossil pollen records that covered at least the most recent 2000 years of the Holocene (mean = 6830 and max = 10,020 cal years BP; Table 2). Pollen grains and charcoal particles washed or blown in from land are well preserved in lake sediments and are therefore used to assess changes in vegetation and fire through time. We used the calibrated years before present (cal years BP) data as published per site (see references in Table 2), which were obtained from age models based on <sup>14</sup>C from the sediment cores.

We selected these eight fossil pollen and charcoal records because they cover the most recent part of the Holocene, have high temporal resolution to track forest dynamics (i.e., one sample every 20–50 years), and high resolution of botanical identification of the fossil pollen (for most taxa up to genus level). The number of pollen samples in the selected records varies from 40 to 451 (on average 150 samples per record). The temporal resolution of the records varies from 0.5 to 5.1 samples per 100 years (on average 2.6). For additional explanation of the lakes, the surrounding ecosystem, and the methods used for pollen analyses, see the original publications listed in Table 2. In total across all records, we had pollen data from 1200 pollen samples (i.e., 1200 points in time).

Samples were prepared following standardized methods (Faegri & Iversen, 1989). Pollen grains in the samples were identified and counted, in most cases up to 300 pollen grains per sample. Details



IADLE I (CONUNC	ea)			
(p)	Adult height (H)	Leaf area (LA)	Seed mass (SM)	Wood density (WD)
El Niño frequency	High frequency of droughts <i>increases</i> the abundance of short taxa with short hydraulic path length and short adult size	High frequency of droughts <i>decreases</i> the abundance of small-leaved species because of more efficient convective cooling and less need for transpirational cooling	High frequency of droughts <i>decreases</i> SM because of more small, short-lived species	High frequency of droughts <i>increases</i> the abundance of drought-tolerant taxa with high WD
Fire	Fire activity <i>increases</i> H because tall taxa are more likely to escape and survive fire because of less crown fire and thicker bark (Barlow & Peres, 2008; Brando et al., 2012), or fire activity <i>decreases</i> H because it mainly favors disturbance-adapted species with short life cycle	Fire activity <i>increases</i> LA because disturbance would favor taxa with large leaves to take advantage of high-light conditions (athough some pioneer species have small, compound leaves (Poorter & Rozendaal, 2008)), or fire activity <i>decreases</i> LA because of more efficient convective cooling in more open and warmer conditions	Fire activity <i>decreases</i> SM because small but many seeds enhance colonization of burned sites), or fire activity <i>increases</i> SM because large seeds are associated with high resprouting capacity and fast growth of seedlings, which enhances their chances to escape fire (Lahoreau et al., 2006; Westoby, 1998)	Fire activity <i>increases</i> WD, because dense wood is associated with less fire damage and with high resprouting capacity probably due to more carbohydrate reserves (Brando et al., 2012; Poorter et al., 2010)
Disturbances	Disturbances <i>decrease</i> H because pioneer species are often short, although long- lived pioneer species can be tall	Disturbances <i>increase</i> LA because high light availability favors the establishment of pioneer species with large leaves (although some pioneer species have small leaves, e.g., Vismia spp. and Trema spp.)	Disturbances <i>decrease</i> SM because high light availability favors the establishment of small-seeded species that regenerate well in full light	Disturbances (e.g., due to clearcut, hurricanes) <i>decrease</i> WD because open areas favor the establishment of soft-wooded pioneer species
<i>Note</i> : The cartoon in (; row), increased fire ac differences between ε	) provides a simplified overview of relative ch tivity (third row), and increased general disturt levations and drivers. The table in (b) provides	anges in trait composition that we expect wi bances (last rows). Note that these represent more detailed hypotheses on each of the er	ith increased precipitation and reduced droughts (u t relative changes over time in response to differen nvironmental effects (rows) on the four community	upper row), increased temperature (second it drivers, and do not represent absolute /-mean traits (columns).

# 7 4 Ś ~ TABLE

·-	
<u>ē</u>	
at	
ş	
e	
≥	
-0	
þ	
۲.	
ΞĨ	
Ε	
5	
d f	
ĕ	
de de	
5 U	
σ	
se	
n	
Le o	
si;	
ht	
.00	)
e e	
th	
5 L	
Ĵ	
ğ	
at	
Ę	
ē	
.⊑	
ta	
da	
ta	
ne	
f	
t 0	
· <u>·</u> ·	
_	
2	
щ	
3	
Ā	
F	

W	'IL	.E`	Y-	•	Glol	bal Cha	ange Biol	ogy						van der S
Caranã	Ч	5	Brazil	-2.84	-55.04	27.2	3109	-59-4318	Paraiso cave (Wang et al., 2017)	Yes, since ~4500 years BP	1.2	52	Lowland tropical rainforest	Maezumi et al. (2018)
Kumpak <sup>a</sup>	60	330	Ecuador	-2.84	-77.96	24	2500	-61-2415	El Tigre Perdido cave	Yes, sporadically until ~750calyears BP, and in recent 50 years	5.1	126	Lowland tropical rainforest	Åkesson et al. (2021)
Pata	f	360	Brazil	0.28	-66.68	25	3300	-59-7593	El Tigre Perdido cave	°Z	1.6	119	Lowland tropical rainforest, Rich in Alchornea, Anacardiaceae, Burseraceae, Melastomataceae, Myrtaceae, In swampy areas on the Hill, Mauritia and Mauritiella were abundant	Nascimento et al. (2019)
Sauce	в	600	Peru	-6.7	-76.22		1475	84-6856	El Tigre Perdido cave	Yes, throughout	1.4	94	Lowland tropical moist forest	Bush et al. (2016)
Pindo	d	1250	Ecuador	-1.45	-78.08	20.8	4800	-63-8096	El Tigre Perdido cave	Yes, sporadically	0.5	40	Mid-elevation, lower montane rain forest, at transition between lowland rainforest and paramo vegetation	Montoya et al. (2018, 2021)
Cocha	υ	2780	Colombia	1.08	-77.15	11.6	1400	130-11,945	El Tigre Perdido cave	Yes, starting 1500 cal years BP with deforestation	4.2	493	Andean forest up to ~3550m. Páramo vegetation with patches of <i>Polylepis</i> and Gynoxys dwarf forest at higher elevation	Flantua et al. (2014); González-Carranza et al. (2012)
Condores	þ	2860	Peru	-6.89	-77.69	12-17	3600	-57-2067	Palestina cave (Apaéstegui et al., 2014)	Yes, mainly until 1150 calyears BP, and low-intensity until 750 calyears BP	4.3	92	Montane forest, rich in Araliaceae, Ericaceae, Hedyosmum, Lauraceae, Melastomataceae, Rubiaceae, Urticaceae and Weinmannia	Åkesson et al. (2020); Matthews-Bird et al. (2017)
Llaviucu	- -	3150	Ecuador	-2.84	-79.15	11-12	>2000	-59-11,358	El Tigre Perdido cave (van Breukelen et al., 2008)	Yes, relatively constant	2.3	258	Montane forest on steep slopes, rich in Weinmannia, Alnus, Podocarpus, Rubiaceae, Hedyosmum, Urticaceae, and Myrsine. Up to 3800 m there is forest dominated by Polylepis and Gynoxys, and paramo vegetation at higher elevation	Nascimento et al. (2020)
	Letter in Figure 1	Elevation (m asl)	Country	Latitude	Longitude	Avg present-day annual temp (°C)	Avg present-day annual prec (mm/year)	Timespan (cal years BP)	Paleo-precipitation record	Human disturbance	Samples per 100 years	Sample size	Current vegetation type	References

Global Change Biology – WILEY – 7





of methods for pollen extraction and identification used for each of the sites can be found in earlier publications, see Table 2. Here, we only focus on taxa identified to genus level and occurring in the GlobalTreeSearch of the Botanic Gardens Conservation International (BGCI) and/or occurring as trees in The Plant List (http://www.thepl antlist.org), because all sites are tree dominated (see pictures in Figure 4), and we want to assess how the tree community is changing. We included pollen abundances from all identified genera, including those identified with some uncertainty (e.g., the taxa identified as "c.f."), as this was the best available identification. The sites varied in their proportion sampling coverage (between 0.37 and 0.97; Appendix S1) but sampling coverage was similar across years within sites, indicating that the coverage differences between sites would have little effect on the analyses (in which sites are included as random factors, see Section 2.8).

#### 2.3 **Functional traits**

To evaluate past shifts in functional composition in forests, we use four tree traits that likely respond differently to underlying environmental changes: (1) WD, which is part of the wood economics spectrum (Chave et al., 2009) and associated with drought and shade tolerance and with species successional stage; (2) leaf area (LA), which is part of the plant size spectrum (Díaz et al., 2015) and associated with light capture and convective cooling; (3) adult height (H) as a strategy to avoid crown fire, enhanced light exposure, and is linked with drought vulnerability (Rowland et al., 2015) and vulnerability to strong wind (Onoda & Anten, 2011); and (4) SM, which enhances establishment success in the dark forest understory (Grimme & Jeffrey, 1965) but reduces the number of seeds produced (Paul-Victor & Turnbull, 2009).

Wood density was obtained from the global WD database (Zanne et al., 2009) and previously collected data (van der Sande et al., 2016, 2017). LA (including all leaflets for species with compound leaves) and adult height were obtained from previously collected data and the Botanical Information and Ecology Network (BIEN) database (http:// bien.nceas.ucsb.edu/bien/) using the BIEN package in R (Maitner et al., 2018). SM was obtained from the Seed Mass Database of Kew Royal Botanical Gardens (http://data.kew.org/sid/). For all traits, we only filtered data collected from the Neotropics.

Per tree genus present in the fossil pollen records, we calculated average trait values based on data from multiple species. These four traits generally show a strong significant phylogenetic signal (Coelho de Souza et al., 2016; van der Sande et al., 2019), indicating that species traits are generally similar to their genus-average or even family-average traits. For our dataset, the phylogenetic signal and the variation of species traits explained by genus was especially high for WD, H, and SM, and weaker but still significant for LA (Appendix S2). This uniformity suggests that within-genus variation in these traits is relatively small, and quantifying a genus-average trait value is meaningful. We only included genera in the calculation of community-mean trait values if we had data for at least three species of that genus or, for genera with less than nine species, data for at least one species in that genus. Despite the generally high phylogenetic signal, some genera contained species with widely different elevational distribution ranges, which can potentially result in strong differences in trait values among congeneric species. We therefore checked the within-genus variation by calculating the coefficient of variation (CV) per genus and per trait. We categorized our sites into elevation ranges: up to 1000 m asl for the lowland sites (Pata, Caranã, Kumpak, and Sauce), from 500 to 2000m asl for the midelevation site (Pindo), and above 2000m asl for the high-elevation sites (La Cocha, Llaviucu, and Condores). Where genera had a CV higher than 1 (i.e., the standard deviation was greater than the mean), we used elevational data from GBIF to eliminate species that occurred exclusively outside the elevation range of the given site from the calculation of genus-average trait values.

#### 2.4 Community-mean traits

We calculated the community-mean traits for each pollen sample, weighted by In-transformed tree taxon abundance. We Intransformed abundance of the taxa to reduce the weight of taxa with high pollen production, and we In-transform the traits to reduce extreme values. Our previous study showed that the relationship between community-mean traits of forests and elevation was accurately captured by tropical pollen assemblages, both at the species level and genus level (van der Sande et al., 2020). This coherence creates opportunities for assessing the effect of environmental gradients (either spatial or temporal) on community-mean traits from pollen assemblages. It is possible that the absolute estimated community-mean trait value did not well represent the actual community-mean traits of the surrounding forest, as the abundance of pollen taxa did not reflect the abundance of plant species in the real vegetation. As demonstrated before (van der Sande et al., 2020), we foresee that this did not influence the outcomes of the current study as we focused on the direction of change (i.e., the standardized slope of the regression models). Hence, we here primarily focus on the direction of the slope of environmental effects on community-mean traits, and do not interpret the absolute values of community-mean traits. Similar approaches to assess changes in trait composition using fossil pollen records have been previously used for tropical forest (van der Sande et al., 2019) and temperate forest (Brussel et al., 2018).

On average per site, from the total tree pollen counts we had data on WD for 73%, on H for 80% on LA for 84% and on SM for 68%. We refer to community-weighted mean traits as "community" traits throughout the manuscript.

#### 2.5 Climate

To understand temporal changes in community traits, we included three climatic proxies, all derived from independent data sources. First, we included reconstructed mean annual precipitation values, based on published speleothem records (i.e., formations of mineral groundwater deposits in caves) of  $\delta^{18}$ O. The  $\delta^{18}$ O records used are the nearest records to each of the sites that overlapped with the time window of each pollen records and had similar or higher temporal resolution.  $\delta^{18}$ O values were multiplied by -1 so that high values indicate high precipitation, which facilitated interpretation of results. Second, we included reconstructed mean annual temperature variability based on the dataset published by Kaufman et al. (Kaufman, McKay, Routson, Erb, Dätwyler, et al., 2020). Kaufman et al. reconstructed global mean surface temperature anomalies of the last 12,000 years as the deviation from the mean temperature between 1800 and 1900. The reconstructions were based on the "Temperature 12k" database (Kaufman, McKay, Routson, Erb, Davis, et al., 2020) using five statistical approaches. Here, we used the published average estimation across the five approaches of temperature anomalies for time bins of 100 years. We used the data provided for

the southern tropics (0°S-30°S). Third, as an indicator of extreme climatic disturbances, we used the frequency of El Niño events derived from lake Pallcacocha in western Ecuador (Moy et al., 2002). We used this dataset for all sites because El Niño events affect large parts of the Amazon and Andes with intense drought periods. Nevertheless, El Niño events are usually most severe in central Amazon and less severe in western Amazon and the Andes (Jiménez-Muñoz et al., 2016), and can even have slightly inversed effects (i.e., wetter conditions) in regions in Ecuador (Flantua et al., 2016). Indeed, for our Ecuadorian sites (Llaviucu, Pindo and Kumpak), the modern El Niño 3.4 index correlates weakly positively with precipitation, whereas it correlates negatively with precipitation for the other sites (Appendix S3). To take these inverse effects into account, we multiplied the El Niño frequency of the Ecuadorian sites (Pindo and Llaviucu) by -1, so that high values would also indicate more drought stress. This transformation (data not shown) showed to be similar to the original results, and we therefore further only present the original results. The precipitation, temperature, and El Niño data were interpolated to the same years as the calibrated years BP from the pollen records, using the na.approx function of the zoo package in R (Grimme & Jeffrey, 1965). For information on the original resolution of the data, see Appendix S4.

#### **Fire activity** 2.6

We used charcoal concentration as measure of fire activity, as high charcoal concentration could indicate the occurrence of spatially larger fires, multiple fires within the timespan of the sample, and/ or severe fires with high amounts of biomass consumed (Gosling et al., 2019; Whitlock & Larsen, 2001). Hence, we use the term "fire activity" instead of fire intensity, severity or frequency, as we do not know which of these is the cause of high charcoal abundance. In many wet tropical forest ecosystems, fires do not naturally occur at high severity or frequency, and are therefore often considered a human disturbance (Gosling et al., 2022). However, discussion remains on the origin of fires in the tropics, and we therefore refer to them as "fire-related disturbance" in general.

Charcoal concentrations were quantified from the same records used for pollen analyses, although often at a higher temporal resolution. In case charcoal data were available at different sample depths than the pollen analyses, we used the charcoal sample that was used at the time equal or directly preceding the pollen sample, to assess short-term forest responses to fire. Methods of charcoal counting (e.g., charcoal particle-size range) differed between records and values cannot be compared directly. We therefore standardized the charcoal data in two ways. First, we used the approach proposed by McMichael et al. (2021), using their "proportional relative scaling" within each site, that is, as  $(c_i - c_{\min}) / (c_{\max} - c_{\min})$ , where  $c_i$  is the charcoal in the sample,  $c_{\min}$  is the minimum charcoal count in the record, and  $c_{\max}$  is the maximum charcoal count in the record. This value was then multiplied by the proportion of samples in the record with charcoal.

Second, we applied z-transformations within records by using the scale function in R, as also done for the other predictor variables. Results of these two approaches are very similar, and we therefore present the latter approach to apply a consistent scaling method for all our predictor variables. At the sites of Lake Pata and Lake Kumpak<sup>a</sup>, although charcoal was counted, almost none was found. For Lake Pata, this is consistent with an absence of human occupation (Nascimento et al., 2019).

#### 2.7 General disturbance

As a proxy of general disturbances, for example caused by landuse conversion by humans, landslides, or hurricanes, we used the proportion of Cecropia pollen relative to the pollen sum (including pollen that were not identified, identified to family level, and different life forms such as grasses). Although the average Cecropia abundance differs between sites, the genus is present in all sites and likely increases with disturbances in low- and high-elevation sites. Therefore, the within-site increases in the proportion of Cecropia pollen indicates increasing frequency, intensity, and/or extent of disturbances

Cecropia is also included as one of the genera in the calculation of community-mean traits. Therefore, the effect of Cecropia abundance on community-mean traits may not be fully independent. To assess whether this influenced our results, we also ran the analyses described below using community-mean traits without Cecropia. The results are similar (Appendix S9) and we therefore present the community-mean traits based on all tree genera including Cecropia.

#### 2.8 Analyses

To assess the effect of reconstructed climate (precipitation, temperature, and El Niño frequency) and disturbance (fire activity and general vegetation disturbance) on temporal changes in tree trait composition, we used one linear mixed model per trait. Some of the predictor variables were derived using different laboratory techniques (e.g., the charcoal abundance was based on different charcoal size particles) or data sources (e.g., precipitation) among sites and could therefore not be compared in an absolute way. To remove such differences, we first scaled all variables per site, by subtracting the mean and dividing by the standard deviation, and then merged the data of the eight sites. In each model, we included reconstructed proxies for mean annual precipitation (i.e.,  $\delta^{18}$ O from stalagmites, multiplied by -1), mean annual temperature anomalies (Kaufman, McKay, Routson, Erb, Dätwyler, et al., 2020), El Niño frequencies (from Moy et al., 2002), fire activity (from charcoal data), and general vegetation disturbance (from Cecropia abundance) as standardized fixed predictor variables, site as random intercept, and year as random slope per site to account for repeated measures (i.e., temporal autocorrelation). To test how the effects of climate and disturbance on changes in trait composition depend on the

elevation of the site, we also included elevation and the interactions between elevation and all the other predictor variables. Note that the main effect of elevation cannot be significant as site differences have been removed by scaling the community-mean trait data within site. Nevertheless, there may be interactions between elevation and the other predictor variables, which is of our interest. Nonsignificant interaction effects were removed from the model. Hence, the final models included the main effects of the six fixed predictor variables (precipitation, temperature, El Niño, fire activity, general vegetation disturbance, and elevation) and a maximum of five interaction terms. We ran linear mixed models using the nlme package in R (Pinheiro & Bates, 2016).

To assess whether this overall model provides similar results to site-specific models, we also ran one generalized least square regression model per site per trait, including precipitation, temperature, El Niño frequency, fire activity, and general vegetation disturbance as fixed predictors. Furthermore, to account for potential temporal autocorrelation in the data, we included a temporal autocorrelation structure using the corCAR1 function, which is designed to deal with a continuous time covariate (Pinheiro & Bates, 2016). We standardized all response and predictor variables (by subtracting the mean and dividing by the standard deviation) prior to analyses so that we could compare effect sizes between models and sites. We ran generalized linear models using the gls function and the corCAR1 function from the nmle package in R (Pinheiro & Bates, 2016). For all analyses, R version 3.6.1 was used (R Core Team, 2019). Models based on a similar time window between sites of 2100 y gave similar results to using the maximum available time window per site (Appendix S5).

#### 3 RESULTS

We assessed how the community-mean tree traits (weighted by pollen abundance) changed with past climate (precipitation, temperature, and El Niño frequency) and disturbances (fire activity and general vegetation disturbances), and how these relationships varied with elevation. The most common tree genera in the pollen records were Acalypha, Cecropia, Hedyosmum, Hypericum, Miconia, Podocarpus, and Weinmannia in the high-elevation sites, Cecropia and Miconia in the mid-elevation site, and Alchornea, Caesalpinia, Cecropia, Iriartea, Mauritia, and Trema in the low-elevation sites (Appendix S6).

#### Adult tree height 3.1

Precipitation increased community tree height, whereas temperature decreased height and El Niño frequency tended to decrease height (Figure 2a). The temperature effect, however, was positive at high elevations and negative at low elevations (Figure 3b). The effect of fire activity was negative at high elevations and tended to be positive at low elevations (Figure 3d), and the effect of disturbance was positive only at high elevations (Figure 3e).



**FIGURE 2** Standardized regression coefficients of the effect of environmental and disturbance variables on four community-mean functional traits: (a) adult height, (b) leaf area, (c) seed mass, and (d) wood density. Environmental variables are: mean annual precipitation (dark blue), mean annual temperature (light blue), El Niño frequency (yellow), fire activity (dark red), general disturbance (gray), elevation (black), and the interaction of elevation with the other five variables (below the dashed line). Large, filled dots represent significant (p < .05) effects and small, open dots represent nonsignificant effects. Nonsignificant interaction effects were excluded from the model and thus not shown here. See Figure 3 for visualizations of the interaction effects.

# 3.2 | Leaf area

Precipitation, temperature, and general disturbance increased community LA (Figure 2b). The El Niño frequency decreased LA at high elevations and increased LA at low elevations (Figure 3h), and the disturbance effect is especially strong at low elevations (Figure 3j).

# 3.3 | Seed mass

General disturbance decreased community SM (Figure 2c). The negative effect of general disturbance (Figure 3o) on SM was strongest at low elevation. Fire activity decreased SM at high elevation but increased SM at low elevation (Figure 3n).

# 3.4 | Wood density

Temperature and general disturbance decreased WD (Figure 2d). This negative effect of general disturbance on WD was especially strong at low elevation (Figure 3t).

# 4 | DISCUSSION

We assessed how community tree trait composition across eight lowland and highland Neotropical forest sites relates to past climate change and disturbances. All four traits responded to these environmental variables, but the direction of effects often varied depending on elevation. Overall, the most important predictor was our measure for general vegetation disturbances, which increased tree height and LA and reduced SM and WD across the lowland and highland sites. Temperature was the most important climatic predictor, leading to increased LA and tree height at high elevations, and to decreased WD and tree height at low elevations. Tree height and LA respond strongly to these drivers, whereas SM and WD respond more weakly. Here, we will first discuss the overall responses of tropical lowland and highland forests and then highlight some of the main site-specific differences.

# 4.1 | More favorable climatic growing conditions lead to more acquisitive trait values

We expected that, under benign conditions, there would be an increase in the abundance of taxa with acquisitive trait values that are associated with fast growth. Such benign conditions would occur with increased water availability (i.e., increased precipitation and decreased El Niño frequency), increased temperatures at high elevation because they prolong the growing season and reduce freezing-induced cavitation risk, and decreased temperatures at low elevation because they reduce evaporation and, hence, reduce atmospheric drought stress (Table 1). We indeed found that community-mean adult height and LA (Figure 2a,b) increased with precipitation, indicating that increased water availability allows for higher dominance of taller taxa with longer hydraulic path lengths (Bennett et al., 2015) and larger leaves with higher transpirational demand (Wright et al., 2017). Interestingly, WD was not affected by changes in precipitation, as we had earlier found for one of the sites (van der Sande et al., 2019). Perhaps increasing precipitation leads on the one hand to higher water availability and an advantage of drought-vulnerable, fast-growing species with soft wood, and on



FIGURE 3 Visualizations of all relationships between the five environmental variables in columns (precipitation, temperature, El Niño frequency, fire activity, and general disturbance) and the four community-mean functional traits in rows [(a-e) adult height, (f-j) leaf area, (k-o) seed mass, and (p-t) wood density]. The relationships that showed a significant interaction with elevation (see Figure 2) are here visualized as two lines: low elevation (red, predicted for an elevation of 100m asl) and high elevation (blue, predicted for an elevation of 3000 m asl). Significant relationships that did not show an interaction with elevation are visualized as one gray line. Nonsignificant relationships are shown without line. The axes represent the scaled axes (scaling was done per site, by subtracting the site's mean and dividing by the site's standard deviation).

the other hand to denser forests and an advantage of shade-tolerant species with dense wood (Markesteijn et al., 2011). These opposing effects could have canceled each other out. Therefore, nexus traits that relate to multiple aspects of plant functioning (e.g., WD relating to drought and shade tolerance) may provide less clear relationships when opposing forces are at play.

Community responses to temperature were stronger than responses to precipitation and El Niño frequency, as three of the four traits were significantly affected by temperature, and temperature had the largest effect sizes (Figure 2). We found that, at high and cold elevation, adult height increased during warmer times (i.e., with high temperature; Figure 3b, blue line). Tree height generally decreases from low to high elevation (Mao et al., 2018; Simard et al., 2011; van der Sande et al., 2020), and tree size is one of the

most important traits predicting species' position along elevation gradients (Maharjan et al., 2021). Hence, increased temperature probably results in less growth limitation and a longer growing season (Mao et al., 2018), which allows for an upslope range expansion of taller species. Such an upward movement of lowland forest species has been observed in Holocene pollen records (Flantua et al., 2014; González-Carranza et al., 2012) and also during current global warming (Fadrique et al., 2018; Feeley, Silman, et al., 2011; Woodall et al., 2013). However, at low and warm elevations, adult height decreased with further warming, probably because stronger vapor pressure deficits and associated atmospheric drought lead to increased mortality of large trees (Figure 3b, red line) (Aleixo et al., 2019; Bauman, Fortunel, Delhaye, et al., 2022), which have longer hydraulic pathlengths and are more drought sensitive.

WILEY- Global Change Biology

In both lowland and highland forests, LA increased with temperature (Figures 2b and 3g), which may be determined by different mechanisms. In the lowlands, increased temperatures may increase tree mortality, resulting in more canopy gaps and more establishment opportunities of large-leaved pioneer species that can capture more light (Aleixo et al., 2019). In the highlands, however, higher temperatures reduce the risk of freezing, which may lead to a shift from species with small, dense, and coriaceous frost-tolerant leaves (Olson et al., 2018; Yang et al., 2020) to fast-growing species with large leaves.

High WD is associated with narrow vessels that increase tolerance to drought-induced and freezing-induced cavitation (Olson et al., 2018; Pittermann & Sperry, 2006; Yang et al., 2020), and with high resistance to wind (Putz et al., 1983). Dense-wooded species are therefore often found in dry areas and at higher elevations (Bruelheide et al., 2018; Olson et al., 2018). At low elevations, we expected that increasing temperature would lead to higher transpirational demand and atmospheric drought stress, and therefore to a higher abundance of drought-tolerant, dense-wooded species. We found, however, a negative effect of temperature on WD, both in lowlands and highlands (Figures 2d and 3q). This does not agree with findings from Bauman, Fortunel, Cernusak, et al. (2022), who show that acquisitive species were more sensitive to negative climate effects on tree growth. This is possibly explained by higher mortality rates and gap formation, which would favor the establishment of fast-growing, soft-wooded, light-demanding species (Aleixo et al., 2019), or by an increased abundance of taxa with high metabolic rates and fast life cycles.

Hence, across these eight forest sites, wetter climates (i.e., higher precipitation, lower El Niño frequency) increased the abundance of more drought-sensitive taxa with long hydraulic path lengths (Koch et al., 2004; Stovall et al., 2019) and large leaves that can capture more light but rely on transpirational cooling (Wright et al., 2017). However, climatic warming has opposite effects along the elevation gradient, providing at high elevation more favorable conditions for taller taxa and at low elevations more favorable conditions for shorter taxa.

### Fires lead to more stress-adapted 4.2 | species, while general disturbances lead to more acquisitive species

Disturbances can either lead to more open conditions, favoring the establishment of fast-growing, light-demanding species that are tall and have soft wood and large leaves, or lead to more stressful conditions (due to fire damage, topsoil removal by erosion, and supraoptimal temperatures in open conditions), favoring slow-growing, short species with dense wood and small leaves. We found that adult height and SM decreased with fire activity at high elevation (suggesting more stressful conditions), but not at low elevation (Figure 3d,k). Small trees with a fast life cycle and small-seeded species that can quickly colonize burned areas have a relative advantage at high fire

activity. Although fires have been frequent and widespread in lowland tropical forests (Gosling et al., 2022) we found, surprisingly, no clear effect of fire on lowland trait composition. We can think of five possible explanations. First, the long-term fire history resulted in adapted ecosystems that no longer strongly respond to fire in terms of their species and trait composition. This would be especially the case in the drier, eastern part of the Amazon where fires have been more severe and frequent (Gosling et al., 2022). However, it is not very likely for the wet (western) tropical forests where fires have been less frequent and severe despite human intervention (Gosling et al., 2022) and fire-resistance traits such as thick bark are rare (Paine et al., 2010; Poorter et al., 2014; Rosell, 2016). Second, ecosystem responses to fire are guick and at very short temporal scales that cannot be accurately tracked using fossil pollen records. Third, fire frequency and severity show strong differences within a landscape (Jones & Tingley, 2022) due to variation in topography, humidity, and fuel load, and therefore show no clear ecosystem-scale effect. Fourth, fire was used as a tool mainly to manage agricultural land (Maezumi et al., 2018) and may have had little direct effect on the remaining, surrounding forest. And fifth, forests may respond more strongly to fire intensity (e.g., burn temperature) than to fire severity and frequency. New tools may allow to also assess the millennial-scale effects of fire intensity on tropical forests (Gosling et al., 2019; Maezumi et al., 2021).

We used Cecropia abundance as an indicator of a wide range of disturbances such as human-induced land conversion, landslides, or hurricanes that create temporal vegetation openness. Increased disturbances were related to increased LA (Figure 2), increased adult height at high elevations (Figure 3e), and decreased SM (Figure 3o), and WD (Figure 3f). These results indicate that such open conditions favor disturbance-adapted taxa that produce many small seeds to colonize disturbed sites, have large leaves to capture more light, and soft wood to attain fast height growth. We expected that the results would be weaker for highland forests, where part of the Cecropia pollen may have been blown in from downslope. However, we see similarly strong effects of disturbance on lowlands and highlands, indicating that general disturbances and the effects on functional trait composition can be well captured by Cecropia abundance. Our Cecropia proxy for general disturbances has stronger effects than fire activity on community traits, possibly because it better reflects and integrates different kinds of disturbance, and/or it indicates disturbances to which the forests respond clearly.

#### Adult height and LA are most responsive to 4.3 climate and disturbances

Adult height and LA are generally more responsive than WD and SM. Various reasons may explain these differences. The height of trees is strongly limited by water availability (Koch et al., 2004), and tree height is one of the best predictors of drought-induced tree mortality (McDowell & Allen, 2015; Stovall et al., 2019), explaining its strong response to climate and to the indirect climatic changes caused by

(a) 3150 m - Llaviucu

(b) 2860 m - Condores

(C) 2780 m - Cocha

(d) 1250 m - Pindo

(e) 600 m - Sauce

(f) 360 m - Pata

(g) 330 m - Kumpak<sup>a</sup>

(h) 5 m - Caranã





0.50

0.25

0.00 -0.25

-0.50

L.

Community-mean height (m)

20

10

5

20

10

5

20

10

5

20

10

5

20

10

5

20

10

5

20

10

5

20

10

5











-0.25 -0.50 10000 7500 5000 2500 ò Prec Temp EN Fire Gen Cal years BP

FIGURE 4 The eight sites [(a-h) same order as Figure 1 and Table 2) ordered from highest to lowest elevation, with a picture of the lake and the current vegetation (first column), the temporal changes in community-mean adult height (in meters) (second column), and the standardized regression coefficients of precipitation (Prec; dark blue), temperature (Temp; light blue), El Niño frequency (EN; yellow), fire activity (Fire; dark red) and general disturbance (Gen; gray) on community-mean adult height (third column). We here only show results for height for illustrative purposes. Filled circles represent significant effects and open circles represent nonsignificant effects. Note that the relationships tested (third column) do not test the effect of time. Photos are from R. Marcom (a), M. Bush (b), H. Hooghiemstra (c), E. Montoya (d), A. Sánchez Sierra (e), M. Nascimento (f), C. Akesson (g), and Y. Maezumi (h).

13

WILEY- Global Change Biology

disturbances. The strong responses of LA are striking, given that LA is less strongly conserved within genera (Appendix S2) and, hence, more uncertainty arises when calculating community-mean traits based on genus-average data. WD, on the other hand, is associated with resistance to multiple environmental stressors, such as shade (Markesteijn et al., 2011), drought (Poorter & Markesteijn, 2008), and pathogens (Augspurger & Kelly, 2010). These multiple drivers of WD may have opposite effects and result in less clear temporal changes. SM is one of the main dimensions of global variation in plant traits (Díaz et al., 2015) as it influences reproduction, germination, and seedling survival, but it has no direct impact on adult trees, which most strongly determine the community trait composition. Our study shows that the long-term effects of climate change and disturbances are best captured by changes in traits related to plant and leaf size, rather than by WD and SM.

# 4.4 | Local disturbance histories determine local responses to climate and disturbances

Overall, 34% of the 156 relationships tested at the site level were significant (Appendix S7), which is similar to the cross-site analyses (35% significant). The strongest site-level drivers were temperature (significant for 47% of the relationships) and general disturbance (significant for 53%), and the directions of these site-level effects were generally similar to the cross-site effects; temperature and disturbance increased community-mean LA and decreased community-mean SM and WD, and temperature also decreased height (Figure 4; Appendices S7 and S8). This is in line with recent increases in abundances of lowland tree taxa across highland forests due to global warming (Fadrique et al., 2018). We found, however, that effects of El Niño frequency and fire activity varied strongly between sites, indicating that sitespecific responses to some drivers are context dependent. Nearly all sites had some effects of El Niño and fire, but on different traits and in different directions (Appendix S8). This indicates that El Niño and fire events do impact the forest, but that effects can be opposite and local differences in, for example, soil conditions and seasonality may determine local-scale responses to these drivers. Specifically, the sites that show stronger El Niño effects (e.g., Cocha, Pata) are the sites in which El Niño probably causes strongest reduction in precipitation (Appendix S3). Our index for El Niño frequency is derived from one record for all sites, but the climatic effects of El Niño events can vary strongly across regions (Marengo et al., 2021). Furthermore, locally the degree of human influence during the last 10,000 years can vary strongly (Flantua et al., 2016; Piperno et al., 2015), and sites may respond at different rates, hence with different lag times, to fire. The lack of effects of El Niño and fire does not seem to be determined by weaker variation in these indicators (the CV of El Niño and fire was mostly not lower than the CV of other drivers). Hence, although temperature is a commonly strong driver of change across forests, certain forest ecosystems simply seem less responsive and more resilient to other types of changes (e.g., climate and disturbance events). Future studies are needed to assess how different disturbance regimes in the past influence forest resilience to future disturbances.

#### 5 | CONCLUSIONS

During recent decades, forests have shifted in species and trait composition both in lowland (Enquist & Enquist, 2011; Fauset et al., 2012; van der Sande et al., 2016) and highland (Feeley, Silman, et al., 2011) tropical forests. The direction, speed, and causes of these changes, however, remain uncertain. Here we show on a timescale of 10,000 years that tropical forests show strong responses to mean temperature and general disturbances; Warmer climates provide more favorable conditions for taller taxa with soft wood at high elevations and for smaller taxa with soft wood at low elevations, and disturbances favor disturbance-adapted taxa that are short with a fast life cycle and have small leaves to cope with increased heat and insolation in open areas. Especially traits related to the plant size spectrum (adult height and LA) showed strong responses to past climate and disturbances.

This study is the first to assess millennial-scale effects of environmental change on functional trait composition across Amazonian and Andean forests. Although we cannot predict absolute changes in functional composition based on pollen composition, future increases in temperature may lead to relative increases in soft-wooded species with large leaves, and relative increase in forest height in the highlands and relative decreases in forest height in the lowlands. These shifts in functional composition also imply shifts in biodiversity and ecosystem functioning, with potentially less carbon storage and sequestration in the lowlands but potentially more carbon sequestration in the highlands.

## **ACKNOWLEDGMENTS**

We thank various funding sources. M.T.v.d.S. was supported by the Rubicon research program with project number 019.171LW.023 and the Veni research program with project number NWO-VI. Veni.192.027, both funded by the Netherlands Organisation for Scientific Research (NWO); M.T.v.d.S. and L.P. by the European Research Council Advanced Grant PANTROP 834775; M.B.B. by the National Science Foundation 621 (grant # EAR1338694, BCS0926973 and 1624207), the Belmont Forum, the National Aeronautics 622 and Space Administration (grant no. NNX14AD31G), and National Geographic Society (grant no. 8763-10); S.G.A.F. by Trond Mohn Stiftelse (TMS) and University of Bergen (Grant No. TMS2022STG03/Past, Present and Future of Alpine Biomes Worldwide); H.H. by the Netherlands Organization for Tropical Research (grant WB 84-636) to study Lake La Cocha; S.Y.M. and W.D.G. by the European Commission (Marie Curie Fellowship 792197); C.N.H.M. by the European Research Council Starting Grant StG 853394 (2019) and the NWO-ALWOP.322; E.M. by the Natural Environment Research Council (NERC) of UK (grant NE/ J018562/1), and for radiocarbon dating by the NERC Radiocarbon Facility NRCF010001 (allocation number 1682.1112); M.d.N.N. by the National Science Foundation (NSF)-DEB 1260983, EAR 1338694 and 1624207. All work for Lake Kumpak<sup>a</sup> was conducted under Ecuadorian Collection Permit 08-620 2017-IC and for Lake Pindo under Permit 14-2012-IC-FLO-DPAP-MA.

# CONFLICT OF INTEREST STATEMENT

The authors declare no conflict of interest.

# DATA AVAILABILITY STATEMENT

The data underlying the analyses are publicly available via https:// doi.org/10.17026/dans-znr-nydh.

# ORCID

Masha T. van der Sande <sup>®</sup> https://orcid.org/0000-0002-6845-2308 Mark B. Bush <sup>®</sup> https://orcid.org/0000-0001-6894-8613 Suzette G. A. Flantua <sup>®</sup> https://orcid.org/0000-0001-6526-3037 Crystal N. H. McMichael <sup>®</sup> https://orcid.org/0000-0002-1064-1499 William D. Gosling <sup>®</sup> https://orcid.org/0000-0001-9903-8401

# REFERENCES

- Åkesson, C. M., Matthews-Bird, F., Bitting, M., Fennell, C., Church, W. B., Peterson, L. C., Valencia, B. G., & Bush, M. B. (2020). 2,100 years of human adaptation to climate change in the High Andes. *Nature Ecology* & Evolution, 4, 66–74. https://doi.org/10.1038/s41559-019-1056-2
- Åkesson, C. M., McMichael, C. N. H., Raczka, M. F., Huisman, S. N., Palmeira, M., Vogel, J., Neill, D., Veizaj, J., & Bush, M. B. (2021). Longterm ecological legacies in western Amazonia. *Journal of Ecology*, 109(1), 432–446. https://doi.org/10.1111/1365-2745.13501
- Aleixo, I., Norris, D., Hemerik, L., Barbosa, A., Prata, E., Costa, F., & Poorter, L. (2019). Amazonian rainforest tree mortality driven by climate and functional traits. *Nature Climate Change*, *9*, 384–388. https://doi.org/10.1038/s41558-019-0458-0
- Apaéstegui, J., Cruz, F. W., Sifeddine, A., Vuille, M., Espinoza, J. C., Guyot, J. L., Khodri, M., Strikis, N., Santos, R. V., Cheng, H., Edwards, L., Carvalho, E., & Santini, W. (2014). Hydroclimate variability of the northwestern Amazon Basin near the Andean foothills of Peru related to the South American Monsoon System during the last 1600 years. *Climate of the Past*, 10(6), 1967–1981. https://doi.org/10.5194/cp-10-1967-2014
- Augspurger, C. K., & Kelly, C. K. (2010). Pathogen mortality of tropical tree seedlings: Studies of the effects of dispersal distance, experimental seedling density, and light conditions. *Oecologia*, 61(2), 211– 217. https://doi.org/10.1007/BF00396763
- Baraloto, C., Forget, P. M., & Goldberg, D. E. (2005). Seed mass, seedling size and neotropical tree seedling establishment. *Journal of Ecology*, 93(6), 1156–1166. https://doi.org/10.1111/j.1365-2745.2005.01041.x
- Barlow, J., & Peres, C. A. (2008). Fire-mediated dieback and compositional cascade in an Amazonian forest. *Philosophical Transactions* of the Royal Society B: Biological Sciences, 363(1498), 1787–1794. https://doi.org/10.1098/rstb.2007.0013
- Bauman, D., Fortunel, C., Cernusak, L. A., Bentley, L. P., McMahon, S. M., Rifai, S. W., Aguirre-Gutiérrez, J., Oliveras, I., Bradford, M., Laurance, S. G. W., Delhaye, G., Hutchinson, M. F., Dempsey, R., McNellis, B. E., Santos-Andrade, P. E., Ninantay-Rivera, H. R., Chambi Paucar, J. R., Phillips, O. L., & Malhi, Y. (2022). Tropical tree growth sensitivity to climate is driven by species intrinsic growth rate and leaf traits. *Global Change Biology*, 28(4), 1414–1432. https://doi.org/10.1111/gcb.15982
- Bauman, D., Fortunel, C., Delhaye, G., Malhi, Y., Cernusak, L. A., Bentley, L. P., Rifai, S. W., Aguirre-Gutiérrez, J., Menor, I. O., Phillips, O. L., McNellis, B. E., Bradford, M., Laurance, S. G. W., Hutchinson, M. F., Dempsey, R., Santos-Andrade, P. E., Ninantay-Rivera, H. R., Chambi Paucar, J. R., & McMahon, S. M. (2022). Tropical tree mortality has increased with rising atmospheric water stress. *Nature*, 608(7923), 528–533. https://doi. org/10.1038/s41586-022-04737-7
- Becknell, J. M., & Powers, J. S. (2014). Stand age and soils as drivers of plant functional traits and aboveground biomass in secondary

Global Change Biology –WILEY

tropical dry forest. Canadian Journal of Forest Research, 44, 604-613. https://doi.org/10.1139/cjfr-2013-0331

- Bennett, A. C., McDowell, N. G., Allen, C. D., & Anderson-Teixeira, K. J. (2015). Larger trees suffer most during drought in forests worldwide. *Nature Plants*, 1(10), 1–5. https://doi.org/10.1038/nplants.2015.139
- Brando, P. M., Nepstad, D. C., Balch, J. K., Bolker, B., Christman, M. C., Coe, M., & Putz, F. E. (2012). Fire-induced tree mortality in a neotropical forest: The roles of bark traits, tree size, wood density and fire behavior. *Global Change Biology*, 18(2), 630–641. https://doi. org/10.1111/j.1365-2486.2011.02533.x
- Brienen, R. J. W., Phillips, O. L., Feldpausch, T. R., Gloor, E., Baker, T. R., Lloyd, J., Lopez-Gonzalez, G., Moneagudo-Mendoza, A., Malhi, Y., Lewis, S. L., Vásquez Martinez, R., Alexiades, M., Álvarez Dávila, E., Alvarez-Loayza, P., Andrade, A., Aragão, L. E. O. C., Araujo-Murakami, A., Arets, E. J. M. M., Arroyo, L., ... Zagt, R. J. (2015). Long-term decline of the Amazon carbon sink. *Nature*, *519*(7543), 344–348. https://doi.org/10.1038/nature14283
- Bruelheide, H., Dengler, J., Purschke, O., Lenoir, J., Jiménez-Alfaro, B., Hennekens, S. M., Botta-Dukát, Z., Chytrý, M., Field, R., Jansen, F., Kattge, J., Pillar, V. D., Schrodt, F., Mahecha, M. D., Peet, R. K., Sandel, B., van Bodegom, P., Altman, J., Alvarez-Dávila, E., ... Jandt, U. (2018). Global trait-environment relationships of plant communities. *Nature Ecology & Evolution*, *2*, 1906–1917. https://doi. org/10.1038/s41559-018-0699-8
- Brussel, T., Minckley, T. A., Brewer, S. C., & Long, C. J. (2018). Communitylevel functional interactions with fire track long-term structural development and fire adaptation. *Journal of Vegetation Science*, 29, 450–458. https://doi.org/10.1111/jvs.12654
- Bush, M. B., Correa-Metrio, A., McMichael, C. H., Sully, S., Shadik, C. R., Valencia, B. G., Guilderson, T., Steinitz-Kannan, M., & Overpeck, J. T. (2016). A 6900-year history of landscape modification by humans in lowland Amazonia. *Quaternary Science Reviews*, 141, 52–64. https://doi.org/10.1016/j.quascirev.2016.03.022
- Chave, J., Coomes, D., Jansen, S., Lewis, S. L., Swenson, N. G., & Zanne, A. E. (2009). Towards a worldwide wood economics spectrum. *Ecology Letters*, 12(4), 351–366. https://doi.org/10.1111/j. 1461-0248.2009.01285.x
- Coelho de Souza, F., Dexter, K. G., Phillips, O. L., Brienen, R. J. W., Chave, J., Galbraith, D. R., Gonzalez, G. L., Mendoza, A. M., Toby Pennington, R., Poorter, L., Alexiades, M., Álvarez-Dávila, E., Andrade, A., Aragão, L. E. O. C., Araujo-Murakami, A., Arets, E. J. M. M., Aymard, C. G. A., Baraloto, C., Barroso, J. G., ... Baker, T. R. (2016). Evolutionary heritage influences amazon tree ecology. *Proceedings of the Royal Society B: Biological Sciences, 283*, 1–10. https://doi.org/10.1098/rspb.2016.1587
- Cole, L. E. S., Bhagwat, S. A., & Willis, K. J. (2014). Recovery and resilience of tropical forests after disturbance. *Nature Communications*, 5, 1–7. https://doi.org/10.1038/ncomms4906
- Díaz, S., Kattge, J., Cornelissen, J. H. C., Wright, I. J., Lavorel, S., Dray, S., Reu, B., Kleyer, M., Wirth, C., Prentice, I. C., Garnier, E., Bönisch, G., Westoby, M., Poorter, H., Reich, P. B., Moles, A. T., Dickie, J., Gillison, A. N., Zanne, A. E., ... Gorné, L. D. (2015). The global spectrum of plant form and function. *Nature*, *529*, 167–171. https://doi. org/10.1038/nature16489
- Duque, A., Stevenson, P. R., & Feeley, K. J. (2015). Thermophilization of adult and juvenile tree communities in the northern tropical Andes. Proceedings of the National Academy of Sciences of the United States of America, 112(34), 10744–10749. https://doi.org/10.1073/ pnas.1506570112
- Enquist, B. J., Bentley, L. P., Shenkin, A., Maitner, B., Savage, V., Michaletz, S., Blonder, B., Buzzard, V., Espinoza, T. E. B., Farfan-Rios, W., Doughty, C. E., Goldsmith, G. R., Martin, R. E., Salinas, N., Silman, M., Díaz, S., Asner, G. P., & Malhi, Y. (2017). Assessing trait-based scaling theory in tropical forests spanning a broad temperature gradient. *Global Ecology and Biogeography*, 26(12), 1357–1373. https:// doi.org/10.1111/geb.12645

WILEY- 🚔 Global Change Biology

- Eller, C. B., Barros, F. D. V., Bittencourt, P. R. L., Rowland, L., Mencuccini, M., & Oliveira, R. S. (2018). Xylem hydraulic safety and construction costs determine tropical tree growth. *Plant Cell and Environment*, 41(3), 548–562. https://doi.org/10.1111/pce.13106
- Enquist, B. J., & Enquist, C. A. F. (2011). Long-term change within a Neotropical forest: Assessing differential functional and floristic responses to disturbance and drought. *Global Change Biology*, 17(3), 1408–1424. https://doi.org/10.1111/j.1365-2486.2010.02326.x
- Fadrique, B., Báez, S., Duque, Á., Malizia, A., Blundo, C., Carilla, J., Osinaga-Acosta, O., Malizia, L., Silman, M., Farfán-Ríos, W., Malhi, Y., Young, K. R., Cuesta, C. F., Homeier, J., Peralvo, M., Pinto, E., Jadan, O., Aguirre, N., Aguirre, Z., & Feeley, K. J. (2018). Widespread but heterogeneous responses of Andean forests to climate change. *Nature*, 564, 207–212. https://doi.org/10.1038/s41586-018-0715-9
- Faegri, K., & Iversen, I. (1989). Textbook of pollen analysis (K. Faegri, P. Emilkaland, & K. Krzywinski, Eds.). John Wiley & Sons.
- Fauset, S., Baker, T. R., Lewis, S. L., Feldpausch, T. R., Affum-Baffoe, K., Foli, E. G., Hamer, K. C., & Swaine, M. D. (2012). Drought-induced shifts in the floristic and functional composition of tropical forests in Ghana. *Ecology Letters*, 15(10), 1120–1129. https://doi. org/10.1111/j.1461-0248.2012.01834.x
- Feeley, K. J., Davies, S. J., Perez, R., Hubbell, S. P., & Foster, R. B. (2011). Directional changes in the species composition of a tropical forest. *Ecology*, 92(4), 871–882. https://doi.org/10.1890/10-0724.1
- Feeley, K. J., Silman, M. R., Bush, M. B., Farfan, W., Cabrera, K. G., Malhi, Y., Meir, P., Revilla, N. S., Quisiyupanqui, M. N. R., & Saatchi, S. (2011). Upslope migration of Andean trees. *Journal of Biogeography*, 38(4), 783–791. https://doi.org/10.1111/j.1365-2699.2010.02444.x
- Flantua, S., Hooghiemstra, H., van Boxel, J. H., Cabrera, M., González-Carranza, Z., & González-Arango, C. (2014). Connectivity dynamics since the Last Glacial Maximum in the northern Andes: A pollendriven framework to assess potential migration. In W. D. Stevens, O. M. Montiel, & P. H. Raven (Eds.), *Paleobotany and biogeography:* A festschrift for Alan Graham in his 80th year (Vol. 128, pp. 98–123). Missouri Botanical Garden Press.
- Flantua, S. G. A., Hooghiemstra, H., Vuille, M., Behling, H., Carson, J. F., Gosling, W. D., Hoyos, I., Ledru, M. P., Montoya, E., Mayle, F., Maldonado, A., Rull, V., Tonello, M. S., Whitney, B. S., & González-Arango, C. (2016). Climate variability and human impact in South America during the last 2000 years: Synthesis and perspectives from pollen records. *Climate of the Past*, 12(2), 483–523. https:// doi.org/10.5194/cp-12-483-2016
- González-Carranza, Z., Hooghiemstra, H., & Vélez, M. I. (2012). Major altitudinal shifts in Andean vegetation on the Amazonian flank show temporary loss of biota in the Holocene. *The Holocene*, 22(11), 1227–1241. https://doi.org/10.1177/0959683612451183
- Gosling, W. D., Cornelissen, H., & McMichael, C. N. H. (2019). Reconstructing past fire temperatures from ancient charcoal material. Palaeogeography, Palaeoclimatology, Palaeoecology, 520, 128– 137. https://doi.org/10.1016/j.palaeo.2019.01.029
- Gosling, W. D., Maezumi, S. Y., Heijink, B. M., Nascimento, M. N., Raczka, M. F., van der Sande, M. T., Bush, M. B., & McMichael, C. N. H. (2022). Scarce fire activity in north and north-western Amazonian forests during the last 10,000 years. *Plant Ecology & Diversity*, 14(3– 4), 143–156. https://doi.org/10.1080/17550874.2021.2008040
- Greenwood, S., Ruiz-Benito, P., Martínez-Vilalta, J., Lloret, F., Kitzberger, T., Allen, C. D., Fensham, R., Laughlin, D. C., Kattge, J., Bönisch, G., Kraft, N. J. B., & Jump, A. S. (2017). Tree mortality across biomes is promoted by drought intensity, lower wood density and higher specific leaf area. *Ecology Letters*, 20, 539–553. https://doi. org/10.1111/ele.12748
- Grimme, J. P., & Jeffrey, D. W. (1965). Seedling establishment in vertical gradients of sunlight. *Journal of Ecology*, 53(3), 621–642.
- Groot, M. H. M., Hooghiemstra, H., Carlos, J., & Giraldo, C. (2013). Review of palaeobotany and palynology North Andean environmental and climatic change at orbital to submillennial time-scales: Vegetation,

water levels and sedimentary regimes from Lake Fúquene 130-27 ka. *Review of Palaeobotany and Palynology*, 197, 186-204. https://doi.org/10.1016/j.revpalbo.2013.04.005

- Guillemot, J., Martin-, N. K., Bulascoschi, S. L., Poorter, L., Morin, X., Pinho, B. X., Maire, G., Bittencourt, P. R. L., Oliveira, R. S., Bongers, F., Brouwer, R., Pereira, L., Andrés, G., Melo, G., Boonman, C. C. F., Onoda, Y., Schneider, J. V., Sheremetiev, S., & Brancalion, P. H. S. (2022). Small and slow is safe: On the drought tolerance of tropical tree species. *Global Change Biology*, *28*, 2622–2638. https://doi. org/10.1111/gcb.16082
- Hirota, M., Flores, B. M., Betts, R., Borma, L. S., Esquivel-Muelbert, A., Jakovac, C. C., Lapola, D. M., Montoya, E., Oliveira, R. S., & Sakschewski, B. (2021). Chapter 24: Resilience of the Amazon forest to global changes: Assessing the risk of tipping points. In C. Nobre, A. Encalada, E. Anderson, F. H. Roca Alcazar, M. Bustamante, C. Mena, M. Peña-Claros, G. Poveda, J. P. Rodriguez, S. Saleska, S. Trumbore, A. L. Val, L. Villa Nova, R. Abramovay, A. Alencar, C. Rodríguez Alzza, D. Armenteras, P. Artaxo, S. Athayde, & H. T. Barretto Filho (Eds.), *Informe de evaluación de Amazonía 2021. Traducido del inglés al español por iTranslate* (pp. 1–32). United Nations Sustainable Development Solutions Network. https://doi.org/10.55161/QPYS9758
- Iriarte, J., Elliott, S., Maezumi, S. Y., Alves, D., Gonda, R., Robinson, M., Gregorio de Souza, J., Watling, J., & Handley, J. (2020). The origins of Amazonian landscapes: Plant cultivation, domestication and the spread of food production in tropical South America. *Quaternary Science Reviews*, 248, 106582. https://doi.org/10.1016/j.quascirev.2020.106582
- Jiménez-Muñoz, J. C., Mattar, C., Barichivich, J., Santamaría-Artigas, A., Takahashi, K., Malhi, Y., Sobrino, J. A., & van der Schrier, G. (2016). Record-breaking warming and extreme drought in the Amazon rainforest during the course of El Niño 2015-2016. *Scientific Reports*, 6, 1–7. https://doi.org/10.1038/srep33130
- Jones, G. M., & Tingley, M. W. (2022). Pyrodiversity and biodiversity: A history, synthesis, and outlook. *Diversity and Distributions*, 28(3), 386-403. https://doi.org/10.1111/ddi.13280
- Kaufman, D., McKay, N., Routson, C., Erb, M., Dätwyler, C., Sommer, P. S., Heiri, O., & Davis, B. (2020). Holocene global mean surface temperature, a multi-method reconstruction approach. *Scientific Data*, 7(1), 1–13. https://doi.org/10.1038/s41597-020-0530-7
- Kaufman, D., McKay, N., Routson, C., Erb, M., Davis, B., Heiri, O., Jaccard, S., Tierney, J., Dätwyler, C., Axford, Y., Brussel, T., Cartapanis, O., Chase, B., Dawson, A., de Vernal, A., Engels, S., Jonkers, L., Marsicek, J., Moffa-Sánchez, P., ... Zhilich, S. (2020). A global database of Holocene paleotemperature records. *Scientific Data*, 7(1), 115. https://doi.org/10.1038/s41597-020-0445-3
- Koch, G. W., Sillett, S. C., Jennings, G. M., & Davis, S. D. (2004). The limits to tree height. *Nature*, 428(6985), 851–854. https://doi. org/10.1038/nature02417
- Lahoreau, G., Barot, S., Gignoux, J., Hoffmann, W. A., Setterfield, S. A., & Williams, P. R. (2006). Positive effect of seed size on seedling survival in fire-prone savannas of Australia, Brazil and West Africa. *Journal of Tropical Ecology*, 22(6), 719–722. https://doi.org/10.1017/ S026646740600349X
- Liang, X., Ye, Q., Liu, H., & Brodribb, T. J. (2021). Wood density predicts mortality threshold for diverse trees. New Phytologist, 229(6), 3053-3057. https://doi.org/10.1111/nph.17117
- Llerena-Zambrano, M., Ordoñez, J. C., Llambí, L. D., van der Sande, M., Pinto, E., Salazar, L., & Cuesta, F. (2021). Minimum temperature drives community leaf trait variation in secondary montane forests along a 3000-m elevation gradient in the tropical Andes. *Plant Ecology & Diversity*, 14(1– 2), 47–63. https://doi.org/10.1080/17550874.2021.1903604
- Maezumi, S. Y., Gosling, W. D., Kirschner, J., Chevalier, M., Cornelissen, H. L., Heinecke, T., & McMichael, C. N. H. (2021). A modern analogue matching approach to characterize fire temperatures and plant species from charcoal. *Palaeogeography, Palaeoclimatology, Palaeoecology*, 578, 110580. https://doi.org/10.1016/j.palaeo.2021. 110580

- Maezumi, S. Y., Robinson, M., Gregorio de Souza, J., Urrego, D., Schaan, D., Alves, D., & Iriarte, J. (2018). New insights from pre-Columbian land use and fire management in Amazonian Dark Earth forests. *Frontiers in Ecology and Evolution*, 6, 1–23. https://doi.org/10.3389/ fevo.2018.00111
- Maharjan, S. K., Sterck, F. J., Makri, M., & Poorter, L. (2021). Functional traits shape tree species distribution in the Himalayas. *Journal of Ecology*, 109, 3818–3834. https://doi.org/10.1111/1365-2745.13759
- Maitner, B. S., Boyle, B., Casler, N., Condit, R., Donoghue, J., Durán, S. M., Guaderrama, D., Hinchliff, C. E., Jørgensen, P. M., Kraft, N. J. B., McGill, B., Merow, C., Morueta-Holme, N., Peet, R. K., Sandel, B., Schildhauer, M., Smith, S. A., Svenning, J. C., Thiers, B., ... Enquist, B. J. (2018). The bien r package: A tool to access the Botanical Information and Ecology Network (BIEN) database. *Methods in Ecology and Evolution*, 9(2), 373–379. https://doi.org/10.1111/2041-210X.12861
- Mao, L., Chen, S., Zhang, J., & Zhou, G. (2018). Altitudinal patterns of maximum plant height on the Tibetan Plateau. *Journal of Plant Ecology*, 11(1), 85–91. https://doi.org/10.1093/jpe/rtw128
- Marengo, J. A., Espinoza, J.-C., Fu, R., Jimenez Muñoz, J. C., Muniz Alves, L., Ribeiro da Rocha, H., & Schongart, J. (2021). Chapter 22: Longterm variability, extremes, and changes in temperature and hydro meteorology. In C. Nobre, A. Encalada, E. Anderson, F. H. Roca Alcazar, M. Bustamante, C. Mena, M. Peña-Claros, G. Poveda, J. P. Rodriguez, S. Saleska, S. Trumbore, A. L. Val, L. Villa Nova, R. Abramovay, A. Alencar, C. Rodríguez Alzza, D. Armenteras, P. Artaxo, S. Athayde, & H. T. Barretto Filho (Eds.), *Informe de evaluación de Amazonía 2021. Traducido del inglés al español por iTranslate* (pp. 1–33). United Nations Sustainable Development Solutions Network. https://doi.org/10.55161/zgj8060
- Markesteijn, L., Poorter, L., Bongers, F., Paz, H., & Sack, L. (2011). Hydraulics and life history of tropical dry forest tree species: Coordination of species' drought and shade tolerance. *New Phytologist*, 191(2), 480– 495. https://doi.org/10.1111/j.1469-8137.2011.03708.x
- Matthews-Bird, F., Valencia, B. G., Church, W., Peterson, L. C., & Bush, M. (2017). A 2000-year history of disturbance and recovery at a sacred site in Peru's northeastern cloud forest. *The Holocene*, 27(11), 1707–1719. https://doi.org/10.1177/0959683617702232
- McDowell, N. G., & Allen, C. D. (2015). Darcy's law predicts widespread forest mortality under climate warming. *Nature Climate Change*, 5(7), 669–672. https://doi.org/10.1038/nclimate2641
- McMichael, C. N. H., & Bush, M. B. (2019). Spatiotemporal patterns of pre-columbian people in Amazonia. *Quaternary Research (United States)*, 92(1), 53–69. https://doi.org/10.1017/qua.2018.152
- McMichael, C. N. H., Heijink, B. M., Bush, M. B., & Gosling, W. D. (2021). On the scaling and standardization of charcoal data in paleofire reconstructions. *Frontiers of Biogeography*, 13(1), 1–9. https://doi. org/10.21425/F5FBG49431
- Moles, A. T., Ackerly, D. D., Webb, C. O., Tweddle, J. C., Dickie, J. B., Pitman, A. J., & Westoby, M. (2005). Factors that shape seed mass evolution. Proceedings of the National Academy of Sciences of the United States of America, 102(30), 10540–10544. https://doi. org/10.1073/pnas.0501473102
- Montoya, E., Keen, H. F., Luzuriaga, C. X., & Gosling, W. D. (2018). Longterm vegetation dynamics in a megadiverse hotspot: The ice-age record of a pre-montane forest of Central Ecuador. *Frontiers in Plant Science*, 9, 1–14. https://doi.org/10.3389/fpls.2018.00196
- Montoya, E., Matthews-bird, F., Brooks, S. J., & Gosling, W. D. (2021). Forests protect aquatic communities from detrimental impact by volcanic deposits in the tropical Andes (Ecuador). *Regional Environmental Change*, 21(53), 1–14.
- Moy, C. M., Seltzer, G. O., Rodbell, D. T., & Anderson, D. M. (2002). Variability of El Niño/Southern Oscillation activity at millennial timescales during the Holocene epoch. *Nature*, 420, 162-165. https://doi.org/10.1038/nature01163.1
- Nascimento, M. N., Martins, G. S., Cordeiro, R. C., Turcq, B., Moreira, L. S., & Bush, M. B. (2019). Vegetation response to climatic changes in

western Amazonia over the last 7,600 years. *Journal of Biogeography*, 46(11), 2389–2406. https://doi.org/10.1111/jbi.13704

- Nascimento, M. N., Mosblech, N. A. S., Raczka, M. F., Baskin, S., Manrique, K. E., Wilger, J., Giosan, L., Benito, X., & Bush, M. B. (2020). The adoption of agropastoralism and increased ENSO frequency in the Andes. *Quaternary Science Reviews*, 243, 106471. https://doi. org/10.1016/j.quascirev.2020.106471
- Olson, M. E., Soriano, D., Rosell, J. A., Anfodillo, T., Donoghue, M. J., & Edwards, E. J. (2018). Plant height and hydraulic vulnerability to drought and cold. Proceedings of the National Academy of Sciences of the United States of America, 115(29), 7551–7556. https://doi. org/10.1073/pnas.1721728115
- Onoda, Y., & Anten, N. P. R. (2011). Challenges to understand plant responses to wind. *Plant Signaling & Behavior*, 6(7), 1057–1059. https://doi.org/10.4161/psb.6.7.15635
- Paine, C. E. T., Stahl, C., Courtois, E. A., Patiño, S., Sarmiento, C., & Baraloto, C. (2010). Functional explanations for variation in bark thickness in tropical rain forest trees. *Functional Ecology*, 24(6), 1202–1210. https://doi.org/10.1111/j.1365-2435.2010.01736.x
- Paul-Victor, C., & Turnbull, L. A. (2009). The effect of growth conditions on the seed size/number trade-off. *PLoS One*, 4(9), e6917. https:// doi.org/10.1371/journal.pone.0006917
- Pinheiro, J., & Bates, D. (2016). Package 'nlme': Linear and nonlinear mixedeffects models. Version 3.1-124.
- Piperno, D. R., McMichael, C., & Bush, M. B. (2015). Amazonia and the Anthropocene: What was the spatial extent and intensity of human landscape modification in the Amazon Basin at the end of prehistory? *The Holocene*, 25(10), 1588–1597. https://doi. org/10.1177/0959683615588374
- Pittermann, J., & Sperry, J. S. (2006). Analysis of freeze-thaw embolism in conifers. The interaction between cavitation pressure and tracheid size. *Plant Physiology*, 140(1), 374–382. https://doi.org/10.1104/ pp.105.067900.to
- Poorter, L., Bongers, L., & Bongers, F. (2006). Architecture of 54 moistforest tree species: Traits, trade-offs, and functional groups. *Ecology*, 87(5), 1289–1301.
- Poorter, L., Kitajima, K., Mercado, P., Chubiña, J., Melgar, I., & Prins, H.
  H. T. (2010). Resprouting as a persistence strategy of tropical forest trees: Relations with carbohydrate storage and shade tolerance. *Ecology*, 91(9), 2613–2627. https://doi.org/10.1890/09-0862.1
- Poorter, L., & Markesteijn, L. (2008). Seedling traits determine drought tolerance of tropical tree species. *Biotropica*, 40(3), 321–331. https://doi.org/10.1111/j.1744-7429.2007.00380.x
- Poorter, L., Mcneil, A., Hurtado, V. H., Prins, H. H. T., & Putz, F. E. (2014). Bark traits and life-history strategies of tropical dry- and moist forest trees. *Functional Ecology*, 28(1), 232–242. https://doi. org/10.1111/1365-2435.12158
- Poorter, L., & Rose, S. A. (2005). Light-dependent changes in the relationship between seed mass and seedling traits: A meta-analysis for rain forest tree species. *Oecologia*, 142(3), 378–387. https://doi. org/10.1007/s00442-004-1732-y
- Poorter, L., & Rozendaal, D. M. A. (2008). Leaf size and leaf display of thirty-eight tropical tree species. *Oecologia*, 158(1), 35–46. https:// doi.org/10.1007/s00442-008-1131-x
- Putz, F. E., Coley, P. D., Lu, K., Montalvo, A., & Aiello, A. (1983). Uprooting and snapping of trees: Structural determinants and ecological consequences. *Canadian Journal of Forest Research*, 13, 1011–1020. https://doi.org/10.1007/s13398-014-0173-7.2
- R Core Team. (2019). R: A language and environment for statistical computing. R Foundation for Statistical Computing. https://www.R-proje ct.org/
- Rosell, J. A. (2016). Bark thickness across the angiosperms: More than just fire. *New Phytologist*, 211(1), 90–102. https://doi.org/10.1111/ nph.13889
- Rowland, L., da Costa, A. C. L., Galbraith, D. R., Oliveira, R. S., Binks, O. J., Oliveira, A. A. R., Pullen, A. M., Doughty, C. E., Metcalfe, D. B.,

-WILEY- Global Change Biology

Vasconcelos, S. S., Ferreira, L. V., Malhi, Y., Grace, J., Mencuccini, M., & Meir, P. (2015). Death from drought in tropical forests is triggered by hydraulics not carbon starvation. *Nature*, *528*, 119–122. https://doi.org/10.1038/nature15539

- Rozendaal, D. M. A., Bongers, F., Aide, T. M., Alvarez-Dávila, E., Ascarrunz, N., Balvanera, P., Becknell, J. M., Bentos, T. V., Brancalion, P. H. S., Cabral, G. A. L., Calvo-Rodriguez, S., Chave, J., César, R. G., Chazdon, R. L., Condit, R., Dallinga, J. S., de Almeida-Cortez, J. S., de Jong, B., de Oliveira, A., ... Poorter, L. (2019). Biodiversity recovery of neotropical secondary forests. *Science Advances*, *5*(3), eaau3114. https://doi. org/10.1126/sciadv.aau3114
- Sakschewski, B., von Bloh, W., Boit, A., Poorter, L., Peña-Claros, M., Heinke, J., Joshi, J., & Thonicke, K. (2016). Resilience of Amazon forests emerges from plant trait diversity. *Nature Climate Change*, 6, 1032–1036. https://doi.org/10.1038/nclimate3109
- Simard, M., Pinto, N., Fisher, J. B., & Baccini, A. (2011). Mapping forest canopy height globally with spaceborne lidar. *Journal of Geophysical Research: Biogeosciences*, 116(4), 1–12. https://doi. org/10.1029/2011JG001708
- Smith, R. J., & Mayle, F. E. (2018). Impact of mid to late Holocene precipitation changes on vegetation across lowland tropical South America: A paleo-data synthesis. *Quaternary Research*, 89, 134– 155. https://doi.org/10.1017/qua.2017.89
- Staver, A. C., Archibald, S., & Levin, S. (2011). The global extent and determinants of savanna and forest as alternative biome states. *Science*, 334(6053), 230–232. https://doi.org/10.1126/science.1210465
- Stovall, A. E. L., Shugart, H., & Yang, X. (2019). Tree height explains mortality risk during an intense drought. *Nature Communications*, 10(1), 1–6. https://doi.org/10.1038/s41467-019-12380-6
- Toledo, M., Peña-Claros, M., Bongers, F., Alarcón, A., Balcázar, J., Chuviña, J., Leaño, C., Licona, J. C., & Poorter, L. (2012). Distribution patterns of tropical woody species in response to climatic and edaphic gradients. *Journal of Ecology*, 100(1), 253–263. https://doi. org/10.1111/j.1365-2745.2011.01890.x
- van Breukelen, M. R., Vonhof, H. B., Hellstrom, J. C., Wester, W. C. G., & Kroon, D. (2008). Fossil dripwater in stalagmites reveals Holocene temperature and rainfall variation in Amazonia. *Earth and Planetary Science Letters*, 275(1–2), 54–60. https://doi.org/10.1016/j.epsl.2008.07.060
- van der Sande, M. T., Arets, E. J. M. M., Peña-Claros, M., Hoosbeek, M. R., Cáceres-Siani, Y., van der Hout, P., & Poorter, L. (2018). Soil fertility and species traits, but not diversity, drive productivity and biomass stocks in a Guyanese tropical rainforest. *Functional Ecology*, 32(2), 461–474. https://doi.org/10.1111/1365-2435.12968
- van der Sande, M. T., Arets, E. J. M. M., Peña-Claros, M., Luciana de Avila, A., Roopsind, A., Mazzei, L., Ascarrunz, N., Finegan, B., Alarcón, A., Cáceres-Siani, Y., Licona, J. C., Ruschel, A., Toledo, M., & Poorter, L. (2016). Old-growth Neotropical forests are shifting in species and trait composition. *Ecological Monographs*, 86(2), 228–243. https:// doi.org/10.1890/15-1815.1
- van der Sande, M. T., Bush, M. B., Urrego, D. H., Silman, M., Farfan-Rios, W., García Cabrera, K., Shenkin, A., Malhi, Y., McMichael, C. H., & Gosling, W. D. (2020). Modern pollen rain predicts shifts in plant trait composition but not plant diversity along the Andes-Amazon elevational gradient. *Journal of Vegetation Science*, 31(1), e12925. https://doi.org/10.1111/jvs.12925
- van der Sande, M. T., Gosling, W. D., Correa-Metrio, A., Prado-Junior, J., Poorter, L., Oliveira, R. S., Mazzei, L., & Bush, M. B. (2019). A 7000year history of changing plant trait composition in an Amazonian landscape; the role of humans and climate. *Ecology Letters*, 22(6), 925–935. https://doi.org/10.1111/ele.13251
- van der Sande, M. T., Peña-Claros, M., Ascarrunz, N., Arets, E. J. M. M., Licona, J. C., Toledo, M., & Poorter, L. (2017). Abiotic and biotic drivers of biomass change in a neotropical forest. *Journal of Ecology*, 105(5), 1223–1234. https://doi.org/10.1111/1365-2745.12756

- Violle, C., Navas, M.-L., Vile, D., Kazakou, E., Fortunel, C., Hummel, I., & Garnier, E. (2007). Let the concept of trait be functional! *Oikos*, 116(5), 882–892. https://doi.org/10.1111/j.2007.0030-1299.15559.x
- Wang, X., Edwards, R. L., Auler, A. S., Cheng, H., Kong, X., Wang, Y., Cruz, F. W., Dorale, J. A., & Chiang, H. W. (2017). Hydroclimate changes across the Amazon lowlands over the past 45,000 years. *Nature*, 541(7636), 204–207. https://doi.org/10.1038/nature20787
- Westoby, M. (1998). A leaf-height-seed (LHS) plant ecology strategy scheme. *Plant and Soil*, 199, 213–227.
- Whitlock, C., & Larsen, C. (2001). Charcoal as a fire proxy. In J. P. Smol, H. J. B. Birks, & W. M. Last (Eds.), *Tracking Environmental change using lake sediments. Volume 3: Terrestrial, algal, and siliceous indicators* (pp. 75–97). Kluwer Academic Publishers.
- Woodall, C. W., Zhu, K., Westfall, J. A., Oswalt, C. M., D'Amato, A. W., Walters, B. F., & Lintz, H. E. (2013). Assessing the stability of tree ranges and influence of disturbance in eastern US forests. *Forest Ecology and Management*, 291, 172–180. https://doi.org/10.1016/j. foreco.2012.11.047
- Wright, I. J., Dong, N., Maire, V., Prentice, I. C., Westoby, M., Díaz, S., Gallagher, R. V., Jacobs, B. F., Kooyman, R., Law, E. A., Leishman, M. R., Niinemets, Ü., Reich, P. B., Sack, L., Villar, R., Wang, H., & Wilf, P. (2017). Global climatic drivers of leaf size. *Science*, 357(6354), 917– 921. https://doi.org/10.1126/science.aal4760
- Yang, D., Wang, A. Y., Zhang, J. L., Bradshaw, C. J. A., & Hao, G. Y. (2020). Variation in stem xylem traits is related to differentiation of upper limits of tree species along an elevational gradient. *Forests*, 11(3), 1–14. https://doi.org/10.3390/f11030349
- Zalamea, P. C., Heuret, P., Sarmiento, C., Rodríguez, M., Berthouly, A., Guitet, S., Nicolini, E., Delnatte, C., Barthélémy, D., & Stevenson, P. R. (2012). The genus *Cecropia*: A biological clock to estimate the age of recently disturbed areas in the neotropics. *PLoS One*, 7(8), e42643. https://doi.org/10.1371/journal. pone.0042643
- Zanne, A. E., Lopez-Gonzalez, G., Coomes, D. A., Ilic, J., Jansen, S., Lewis,
  S. L., Miller, R. B., Swenson, N. G., Wiemann, M. C., & Chave, J.
  (2009). Data from: Towards a worldwide wood economics spectrum.
  Dryad Digital Repository. https://doi.org/10.5061/dryad.234
- Zhou, G., Houlton, B. Z., Wang, W., Huang, W., Xiao, Y., Zhang, Q., Liu, S., Cao, M., Wang, X., Wang, S., Zhang, Y., Yan, J., Liu, J., Tang, X., & Zhang, D. (2014). Substantial reorganization of China's tropical and subtropical forests: Based on the permanent plots. *Global Change Biology*, 20(1), 240–250. https://doi.org/10.1111/gcb.12385

## SUPPORTING INFORMATION

Additional supporting information can be found online in the Supporting Information section at the end of this article.

How to cite this article: van der Sande, M. T., Bush, M. B., Åkesson, C. M., Berrio, J. C., Correia Metrio, A., Flantua, S. G. A., Hooghiemstra, H., Maezumi, S. Y., McMichael, C. N. H., Montoya, E., Mosblech, N. A. S., de Novaes Nascimento, M., Peña-Claros, M., Poorter, L., Raczka, M. F., & Gosling, W. D. (2023). Warming, drought, and disturbances lead to shifts in functional composition: A millennial-scale analysis for Amazonian and Andean sites. *Global Change Biology*, 00, 1–18. https://doi.org/10.1111/gcb.16818