PHYSIOLOGICAL ECOLOGY – ORIGINAL RESEARCH

Precipitation mediates sap flux sensitivity to evaporative demand in the neotropics

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Abstract

Transpiration in humid tropical forests modulates the global water cycle and is a key driver of climate regulation. Yet, our understanding of how tropical trees regulate sap flux in response to climate variability remains elusive. With a progressively warming climate, atmospheric evaporative demand [i.e., vapor pressure deficit (VPD)] will be increasingly important for plant functioning, becoming the major control of plant water use in the twenty-first century. Using measurements in 34 tree species at seven sites across a precipitation gradient in the neotropics, we determined how the maximum sap flux velocity (v_{max}) and the VPD threshold at which v_{max} is reached (VPD$_{max}$) vary with precipitation regime [mean annual precipitation (MAP); seasonal drought intensity (P_{DRY})] and two functional traits related to foliar and wood economics spectra [leaf mass per area (LMA); wood specific gravity (WSG)]. We show that, even though v_{max} is highly variable within sites, it follows a negative trend in response to increasing MAP and P_{DRY} across sites. LMA and WSG exerted little effect on v_{max} and VPD$_{max}$, suggesting that these widely used functional traits provide limited explanatory power of dynamic plant responses to environmental variation within hyper-diverse forests. This study demonstrates that long-term precipitation plays an important role in the sap flux response of humid tropical forests to VPD. Our findings suggest that under higher evaporative demand, trees growing in wetter environments in humid tropical regions may be subjected to reduced water exchange with the atmosphere relative to trees growing in drier climates.

Keywords Evapotranspiration · Plant functional traits · Transpiration · Vapor pressure deficit

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Introduction

Humid tropical forests cover approximately 12% of global ice-free land surface area (Mayaux et al. 2005) and are characterized by high mean annual precipitation (> 1500 mm) with low variability in atmospheric temperature ($\approx 25 \pm 5$ °C) (Richards 1952; Murphy and Lugo 1986). The majority of water entering tropical forests through precipitation or rivers is returned to the atmosphere via evapotranspiration (Moreira et al. 1997; Kumagai et al. 2016). Water released by trees in their transpiration flux largely contributes to total evapotranspiration in the tropics (Schlesinger and Jasechko 2014), 35% of which is cycled back to the biome as precipitation (Eltahir and Bras 1994; Zemp

et al. 2014). As such, tree transpiration in tropical forests is a major modulator of the global water cycle and plays a central role in climate regulation (Foley et al. 2007). Yet, despite our efforts in understanding transpiration patterns of tropical trees (e.g., Meinzer et al. 2003; Stahl et al. 2013a; Maréchaux et al. 2018), how trees regulate water use in these ecosystems remains one of the largest uncertainty components in models of tropical evapotranspiration.

At daily to seasonal timescales, trees regulate their transpiration flux in response to variation in atmospheric evaporative demand [i.e., vapor pressure deficit (VPD)], radiation, wind and available soil water (Oren et al. 1999; Meinzer et al. 2001). Under non-limiting soil water availability, radiation and VPD are usually the most significant climate variables controlling water flux in tropical trees (e.g., Meinzer et al. 2008). However, global warming will result in an exponential climb in VPD in the next decades (Zhang et al. 2015), and the relative role of these two abiotic drivers (i.e., radiation vs. VPD) is expected to shift in the future with VPD becoming the major control of plant water use in the twenty-first century (Novick et al. 2016). Therefore, improving our understanding of water use patterns and their response to VPD, including the linkages to predictive plant traits, is an important next step with major implications for global climate and vegetation predictions.

While over long periods (i.e., years to decades), stand water use is mainly regulated by changes in leaf area and species composition, over short-term periods (i.e., hours to days), trees regulate sap flux velocity (v) (Edwards et al. 1997) through changes in stomatal conductance. Thus, v response to daily VPD variation directly depends on the degree of stomatal closure (Schulze et al. 1972). Under low VPD conditions, plant stomata are fully open and v increases linearly with VPD (Franks et al. 1997), until v reaches a saturation rate (v_{max}, Fig. 1) at a given VPD threshold (VPD$_{max}$, Fig. 1). As VPD increases, trees progressively start closing their stomata, and for some species, including tropical trees, stomatal closure can be so pronounced as to result in a decreased rate of v (Fig. 1) (Schulze et al. 1972; Franks et al. 1997). The degree of sap flux response to VPD varies both within and between species because of differences in local climatic adjustments and ecological strategy. For instance, trees originating from distinct precipitation regimes should differ in their sap flux responses to VPD because of adaptive mechanisms in response to moisture conditions, including wood hydraulic properties and foliar traits (Mencuccini 2003; Poyatos et al. 2007). Trees growing in drier climates may produce xylem elements with reduced lumen areas relative to trees from wetter climates to reduce the risk of xylem embolism and promote overall hydraulic safety (Hacke et al. 2004; Fonti and Jansen 2012). Anatomical changes in these conductive tissues will directly alter the sap flux patterns of trees (i.e., reduced v in drier systems), and have been
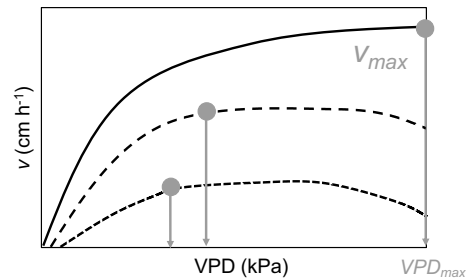

Fig. 1 Theoretical variation in sap flux velocity (v) response to VPD: under low VPD conditions, v increases linearly with rising VPD until v reaches a saturation rate (v_{max}, grey circle) at a given VPD threshold (VPD$_{max}$, grey arrow). As VPD progressively increases v will either level-off at a maximum rate or start dropping progressively. Differences in v responses to increasing VPD between trees (highlighted by different dotted and bold lines) emerge from long-term adjustments to local moisture conditions (i.e., reflecting differences in foliar and wood hydraulic properties), with reductions in moisture expected to result in lower VPD$_{max}$ and v_{max}

associated with reduced VPD$_{max}$ and v_{max} in dry ecosystems (Grossiord et al. 2017, 2018). Similarly, reductions in soil moisture during dry periods have been linked with changes in stomatal density (Luomala et al. 2005) and in the synthesis of chemical signals inducing stomatal closure (Schachtman and Goodger 2008), which should also reduce VPD$_{max}$ and v_{max} in forests that are subjected to seasonal droughts. In humid tropical forests, regional variability in annual precipitation (from 1500 to > 4000 mm annually) and in dry season intensity is high, suggesting large variation in plant physiological and structural adjustments to moisture status, and thus potentially important differences in VPD$_{max}$ and v_{max} between ecosystems. However, soil moisture is usually less limiting in humid tropical forests than in temperate and semiarid regions where reductions in VPD$_{max}$ and v_{max} following precipitation reduction have been reported (Grossiord et al. 2018). As such, this characteristic physiological or hydraulic adjustment to soil moisture limitation may not occur in this biome, suggesting that acclimation processes to water stress would only occur under a given precipitation and/or drought intensity threshold.

A difficulty in making predictions on the functioning of humid tropical forests lies in the fact that these ecosystems host more tree species than any other terrestrial ecosystem (Myers et al. 2000). Large species diversity in the tropics is accompanied by large diversity in plant functional traits (Wright et al. 2007; Baraloto et al. 2010; Fortunel et al. 2012, 2014; Zhu et al. 2013; Cosme et al. 2017). Functional differences that directly alter v regulation include rooting properties (e.g., water uptake depth, Stahl et al. 2013b; Brum et al. 2019), hydraulic properties (e.g., lumen area or water potential at 50% loss of hydraulic conductivity P$_{50}$; Litvak et al. 2012) and foliar characteristics (e.g., stomatal density or leaf turgor loss point; Bartlett

et al. 2012, Maréchaux et al. 2018). However, while such mechanistic trait data are growing in availability for tropical forests, they remain poorly quantified relative to more easily measurable traits such as leaf mass per area (LMA) and wood specific gravity (WSG) (Wright et al. 2004; Chave et al. 2014). LMA and WSG, respectively, comprise the well-studied leaf and wood economics spectra, which have been successfully related to various aspects of plant function along a fast (resource-acquisitive, low LMA and WSG)-to-slow (resource-conservative, high LMA and WSG) continuum (Reich et al. 1997; but see Baraloto et al. 2010; Fortunel et al. 2012). These traits only indirectly relate to dynamic physiological processes such as F_D (Brodribb 2017); however, LMA and WSG can be used to support mechanistic theory of moisture adjustments in modelling frameworks by correlating with other plant traits related to hydraulic transport (Christoffersen et al. 2016). As such, we might expect trees originating from drier regions in humid tropical forests, and thus with lower VPD_{max} and v_{max}, to have higher LMA and WSG (i.e., two typical adjustment responses to reduced moisture, Wright et al. 2005) relative to trees with higher VPD_{max} and v_{max}.

Here we analyzed how trees regulate sap flux velocity in response to VPD variation in 34 species originating from seven sites along a precipitation gradient in the neotropics. Our objectives were to test how long-term local precipitation regime (annual precipitation and intensity of the dry season) modulates VPD_{max} and v_{max}, and detect whether variation in VPD_{max} and v_{max} across sites can be related

to the variability in two easy-to-measure functional traits: LMA and WSG. We hypothesized that

1. trees growing in relatively dry regions and that are subjected to more frequent and intense droughts would show reduced VPD_{max} and v_{max} compared to trees originating from wetter areas because of long-term physiological and structural adjustments to reduced soil moisture availability (Mencuccini 2003) (Fig. 1);
2. across all sites, trees with higher LMA and WSG would show reduced VPD_{max} and v_{max} relative to trees with low LMA and WSG.

Materials and methods

Study sites

We used data collected from mature humid tropical forests in seven sites spanning from Puerto Rico to northern Brazil (Table 1, Figs. S1 & S2). The focal sites are located in Puerto Rico (SAB hereafter), Costa Rica (SOL), Panama (SLZ, BCI and PNM), French Guiana (FRG) and Brazil (MAN). The target tree species pool (representing among the most abundant tree species within each site) varied between four and nine per site (Table 2), leading to a total of 34 tree species included in this study with only one species being present at multiple sites (Table S1). Climatic conditions (rainfall, air temperature, atmospheric humidity and solar radiation)

Table 1 Characteristics of the study sites

Site code	PNM	MAN	BCI	FRG	SLZ	SAB	SOL
Country	Panama	Brazil	Panama	French Guiana	Panama	Puerto Rico	Costa Rica
MAT (°C), MAP (mm)	26, 1826	27, 2200	26, 2640	26, 3102	25, 3286	24, 3500	24, 4200
P_{DRY} (mm)	53	95	60	72	70	90	100
Topography	Light slope	Flat	Flat	Light slope	Steep	Light slope	Steep
Soil depth (m)	> 6	> 20	NA	> 15	> 3	> 20	1.5
Elevation (m)	30	100	170	40	130	130	540
Mean LAI (m² m⁻²)	NA	6.0	6	6.7	NA	6.47	3.32
Soil type	Mollisol	Latosol	Oxisol	Acrisols	Oxisol	Ultisol	Andisol
MET station (m)	25	50	48	56	52	2	42
Sap flux method	TD	HR	TD	TD	HR	TD*	TD
Duration of the measurements (months)	12	2–5	16	24	13	12	21
References	Slot and Winter (2017)	Luizão et al. (2004)	Detto et al. (2018)	Bonal et al. (2008)	Slot and Winter (2017)	Kimball et al. (2018)	Aparecido et al. (2016)

MAP mean annual sum of precipitation (1950–2010), *MAT* mean annual temperature (1950–2010), P_{DRY} mean monthly sum of precipitation during the dry season, *LAI* leaf area index, *HR* heat ratio method, *TD* thermal dissipation method, *MET station* height of the meteorological station (m)

Table 2 Characteristics of the study trees ($\pm$ SE)

Site	Number of measured trees	Mean tree height (m)	Mean DBH (cm)	Number of target species
PNM	4	30.7 ± 2.7	83.9 ± 18.9	4
MAN	4	32.2 ± 1.5	59.9 ± 9.6	4
BCI	6	26.6 ± 2.0	47.3 ± 6.7	5
FRG	5	27.8 ± 2.1	40.3 ± 10.9	5
SLZ	6	28.1 ± 1.5	49.9 ± 4.5	6
SAB	9	23.4 ± 0.9	28.8 ± 1.8	8
SOL	8	30.1 ± 1.1	96.7 ± 24.5	4

DBH diameter at breast height

were measured continuously and recorded by local weather stations at all sites during the measurements.

All sites, apart from the SOL site, experience a dry season (i.e., monthly precipitation < 100 mm) of approx. 3 months. Long-term precipitation was used to characterize long-term annual moisture status and drought intensity in each site using the site-level average in annual sum of precipitation (MAP) and monthly precipitation during the dry season (P_{DRY}) over the 1950–2010 period. When long-term site-specific data were not available (all sites except PNM, BCI and SLZ), long-term precipitation was extracted for each site using Twentieth-Century Reanalysis Project, a 2.0° latitude and 2.0° longitude global climate dataset (Compo et al. 2011). The sites were characterized by contrasting precipitation regimes varying between 1826 and 4200 mm on average annually over the 1950–2010 period, with the PNM site (Panama) being the driest and the SOL site (Costa Rica) the wettest (PNM < MAN < BCI < SLZ < FRG < SAB < SOL) (Table 1). See Table 1 for more details on site characteristics and site-specific references.

Sap flux measurements

In each site between four and nine trees that occupied dominant positions in the canopy (to avoid effects related to crown exposure) were selected for this study, leading to a total of 43 trees (Table 2). At all sites, tree sap flux velocity (v; cm h^{-1}) was measured every 10 min, 15 min, 30 min or hour using either the thermal dissipation method (Granier 1987) or the heat ratio method (Burgess et al. 1998). Depending on the site, sensors were bought from manufacturers (SFM1, ICT International, NSW, Australia; UP-Gmbh, Cottbus, Germany; PS-GP, PlantSensors, Nakara, Australia) or lab-built. Measurements were conducted continuously for periods varying between two and 24 months (Table 1) between January 2014 and January 2017. For the thermal dissipation method, sensors (i.e., one sensor per tree except for the SOL site where two sensors per tree were installed, 10 or 20 mm long) were installed in the sapwood at 1.3 m aboveground or above buttresses with a 10 cm vertical spacing between probes. For the heat ratio method (i.e., one sensor per tree), each set of sensors consisted of two or three thermocouples and one-line heater probe. The thermocouples were inserted at 1.3 m aboveground at depths varying between 2.2 and 3 cm below the cambium. The sensors were covered with reflective insulation to reduce the risk of direct sunlight causing thermal gradients. The data were recorded continuously by data loggers (CR800, CR10X and CR1000, Campbell Scientific Corp., Logan, UT, USA), apart from the SFM1 sensors that contain a stand-alone datalogger. For more details, see the site-specific references in Table 1.

Sap flux data processing

Each site's sap flux data files were accompanied by a standardized metadata reporting framework, consisting of three associated metadata files, respectively, describing the data files, the columns of each data file, and field observations of tree size, canopy position, and species identity, if available (Christianson et al. 2017). We collated the raw data for all sites via a series of R scripts, which interpreted each dataset in terms of its associated metadata file (code available in the supplement of Christianson et al. 2017).

We started data processing using the raw mV values outputted by the sap flux sensors. Sap flux velocity data from the SOL site had already been converted to v (cm h^{-1}) using the Granier equation (1987) (see Aparecido et al. 2016 for more details). The open-source *Baseliner* software (Oishi et al. 2016) was used to calculate v values for each tree following the equation proposed by Granier (1987). No species-specific equations are available for the tropical species included in this study, and thus care must be taken when interpreting v results as the empirically derived coefficients in the Granier equation may introduce errors in v calculations (Bush et al. 2010). *Baseliner* enables users to control the quality and process data using a combination of automated steps and manual editing (Oishi et al. 2016). Missing data were gap filled when they were shorter than 2 h using linear interpolation (Oishi et al. 2016). Estimation of baseline nighttime flow is done automatically in *Baseliner* based

on a joint set of conditions, including nighttime hours (characterized by near-zero radiation), stable temperature differential between probes (estimated using coefficient of variation) and low VPD (see Oishi et al. 2016 for more details).

After converting all values into v, we conducted a systematic removal of values associated with measurement failures and sensor removals in the field. For the MAN, PNM, SLZ and BCI sites, we removed all days before DOY 175 in 2016 (corresponding to the 2015–2016 ENSO event) to avoid potential v responses to anomalously low soil moisture (Fig. S3). In addition, sub-hourly v data were visually assessed for all trees to ensure no drought period was included in the final dataset. The FRG site included semi-deciduous tree species, which experienced leaf drop during the measurement periods. To avoid effects related to changes in leaf area induced by significant leaf drop, these periods were removed from the analyses. Individual tree v time series are presented for each site in Fig. S4. The two methods used for measuring v (heat ratio method vs. thermal dissipation method) have been shown to vary in their accuracy to measure absolute v rates (Steppe et al. 2010). However, tests conducted at the MAN and SLZ sites (i.e., the two sites where the heat ratio method was used), where both sensor types were collocated on individual trees, indicated no significant differences in v rates between the two methods (Fig. S5). No information on the depth of the active sapwood was available for the target trees, but to our knowledge, no study reported radial changes in v patterns to VPD variation.

Estimation of maximum sap flux velocity and VPD at which sap flux velocity reaches maximum values

To avoid confounding effects of radiation, we applied a radiation filter for each site by removing all v data where sub-hourly radiation was below the 90th percentile of daytime radiation values. For most sites, this threshold was equal to 600 W m^{-2} apart for the BCI and FRG sites where the threshold was equal to 700 W m^{-2} (Fig S6). Using sub-hourly v data, we estimated the maximum sap flux velocity (v_{max}, Fig. 1) for each tree as the 95th percentile of v values after applying the radiation filter (Fig. S7). The VPD value at which v reaches maximum levels (VPD$_{max}$, Fig. 1) was estimated as the 2.5th percentile of VPD values corresponding to v_{max} (Fig. S7). All the analyses were done using the R language for statistical computing (3.2.1, R Development Core Team 2015).

Functional traits

To analyze how variation in VPD$_{max}$ and v_{max} could be related to foliar and wood functional traits, we used leaf mass per area (LMA, g m^{-2}) and wood specific gravity (WSG, g cm^{-3}). Investigation of other traits (e.g., wood anatomy,

leaf-to-sapwood area ratio) revealed a paucity of data for the target tree species, thus we focused strictly on LMA and WSG. When possible, we used direct measurements on the sampled trees during the sap flux measurements. Conversely, when the trait measurements were not available for our focal trees, we used previously published data originating from the same species (see sources in Table S1). In total, data on LMA and WSG were gathered for 31 (73%) and 39 (91%) trees (for LMA and WSG, respectively) (Table S1).

Statistical analyses

The impacts of long-term MAP (or P_{DRY}), LMA and WSG on VPD$_{max}$ and v_{max} were determined first by fitting linear models, followed by closer examination using linear mixed effect models (package *lme*) where MAP (or P_{DRY}), LMA, WSG, diameter at breast height (DBH, i.e., to account for effects related to tree size) and their interactions were used as fixed effects, and trees nested in sites was used as a random effect. The model selection procedure started with all variables and by progressively removing the variables with the lowest explanatory power until the minimal model with the lowest Akaike Information Criterion (AIC) was obtained. Models were compared using 'anova' test to select the least complex parsimonious model. In all cases, the linear model (package *lm*) with MAP or P_{DRY} was selected. The same tests were used to detect the impact of MAP (or P_{DRY}) on LMA and WSG, with MAP (or P_{DRY}), DBH and their interaction used as fixed effects.

Results

Climatic conditions

Precipitation during the measurements was similar to the long-term average precipitation (1950–2010) in all sites (Fig. S3). Mean daily air temperature and VPD ranged from 18 to 28 °C, and 0.47 to 2.94 kPa, respectively, during the measurement period, depending on the sites and seasons (Fig. S8). The sites experienced a range of VPD values during sap flux measurements varying between 0 and approx. 4.3 kPa (Fig. 2).

Sap flux response to VPD variation

Strong variability in sap flux velocity (v) was observed within sites, reflecting the important diversity of water use strategies between species (Fig. S4). For most trees, v increased linearly with VPD until reaching a saturation rate (v_{max}) at a given VPD threshold (VPD$_{max}$, Fig. 2). For a few trees, v decreased with rising VPD after reaching a saturation rate, suggesting strong stomatal closure, while other
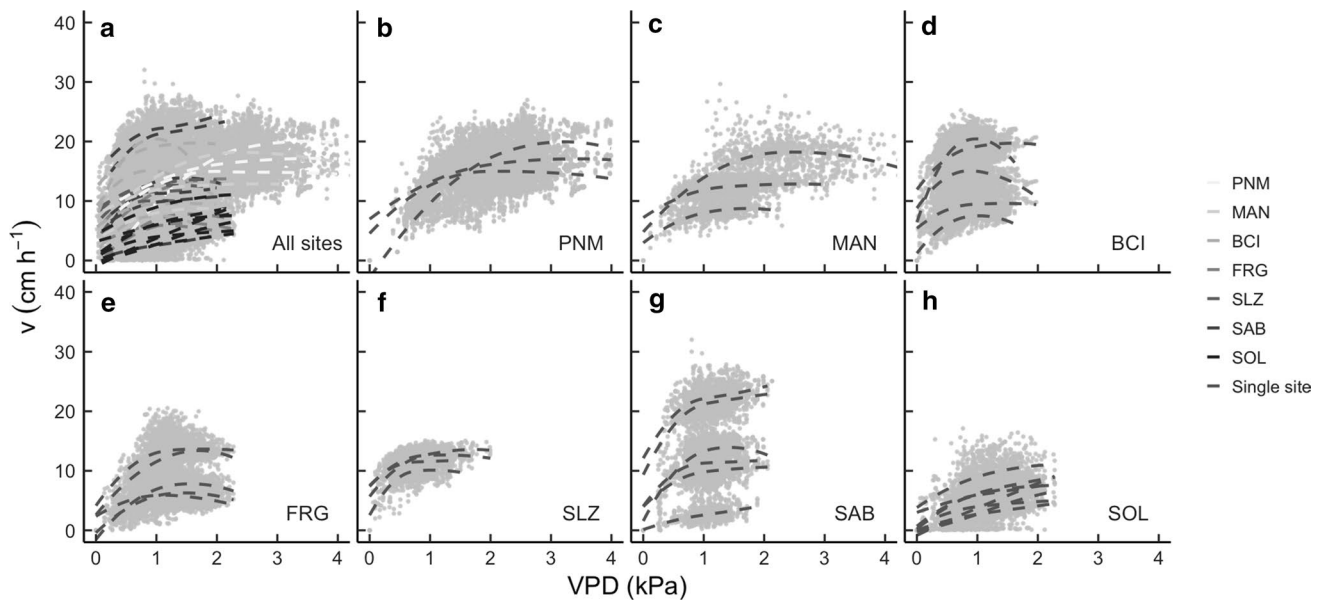
Fig. 2 Sub-hourly sap flux velocity (v, cm h^{-1}) as a function of vapor pressure deficit (VPD, kPa) for each site. Sites are organized going from the driest (**b**) to the wettest (**h**) (i.e., in terms of MAP). Dashed lines represent fitted curves using local regression function for each individual tree

trees showed no distinctive saturation rate with rising VPD (Fig. 2). Trees displaying a decline in v at high VPD did not have significantly different LMA or WSG from trees without such a decline (Welch's two-sided t test: $t = 0.257$, $df = 4.05$, $P = 0.810$; $t = 0.169$, $df = 4.75$, $P = 0.873$, respectively). In general, v_{max} was reached when VPD_{max} varied between 0.6 and 2.0 kPa, depending on the trees (Fig. 2). v_{max} varied between 4.1 and 41.4 cm h^{-1}, depending on the individual tree (Fig. 2).

VPD_{max} and v_{max} were highly variable across sites, with a tendency for lower mean values at wetter sites and higher values at drier sites. The driest site, PNM, had the highest values (mean of 1.5 kPa and 24.7 cm h^{-1} for VPD_{max} and v_{max}, respectively), while the wettest site, SOL, had the lowest v_{max} (mean of 7.7 cm h^{-1}). There were significant negative effects of MAP on v_{max} ($r^2 = 0.32$, slope $= -0.006$, $P < 0.001$) but not on VPD_{max} ($r^2 = 0.10$, slope $= -0.000$, $P = 0.062$) (Fig. 3). A significant negative effect of P_{DRY} was found for v_{max} ($r^2 = 0.21$, slope $= -0.21$, $P = 0.005$), but not for VPD_{max} ($r^2 = 0.00$, slope $= -0.000$, $P = 0.842$) (Fig. 3). No relationship was found between VPD_{max} and v_{max} (Fig. S9), indicating no trade-off between the VPD threshold at which v levels-off at maximum rates and maximum v.

Relationships with functional traits

No effect of LMA on v_{max} ($r^2 = 0.00$, $P = 0.835$) and VPD_{max} ($r^2 = 0.00$, $P = 0.704$) was found. Similarly, no relationship between WSG and v_{max} ($r^2 = 0.08$, $P = 0.167$), and VPD_{max} ($r^2 = 0.02$, $P = 0.542$) was found (Fig. 4). There was no effect of MAP or P_{DRY} on LMA ($P = 0.722$ and $P = 0.600$, respectively), or on WSG ($P = 0.434$ and $P = 0.290$). A significant relationship was observed between LMA and WSG (Fig. S9), suggesting a slight coupling between leaf and stem economics in these trees (i.e., trees with higher LMA tend to grow denser wood).

Discussion

Precipitation mediates sap flux response to evaporative demand in the neotropics

Our findings highlight that sap flux response to VPD under non-depleted soil moisture conditions in humid tropical forests partially depends on average MAP and P_{DRY} over the last 50 years, i.e., indicators of long-term moisture availability and drought stress intensity. More specifically, our data show that as average site-level precipitation increases and seasonal drought intensity decreases, trees attain lower maximum sap flux (v_{max}) when soil moisture is non-limiting (Fig. 3). This relationship was not an artifact of reduced radiation at wetter sites because of the radiation filter applied (Fig. S6). These findings contrast with previous observations from Mediterranean and semiarid woodlands where increasing aridity resulted in reduced v_{max} (e.g., Poyatos et al. 2007; Grossiord et al. 2018), suggesting contrasting underlying adjustments to moisture between supply-limited and demand-limited environments.
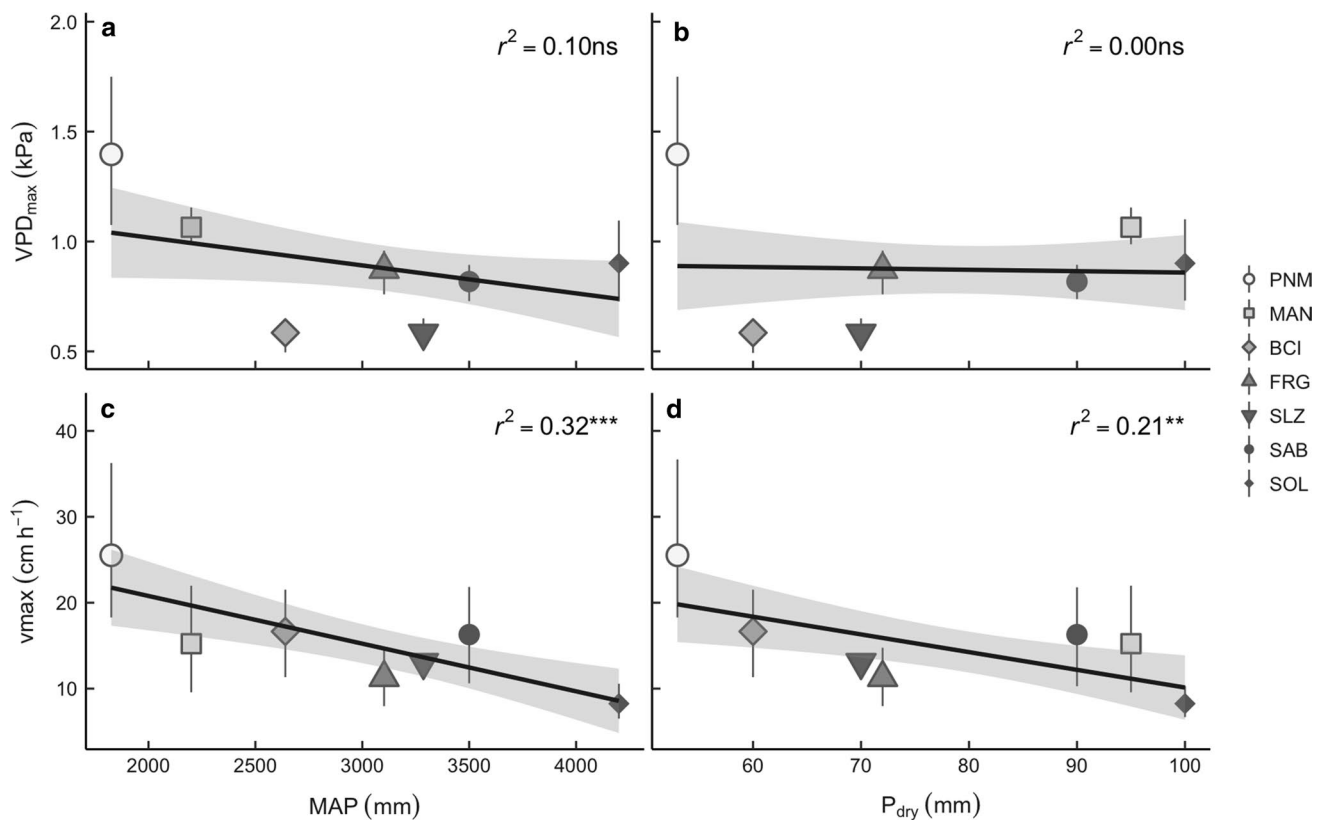
Fig. 3 Relationships between the VPD threshold at which sap flux levels-off at maximum levels ($VPD_{max} \pm SD$, kPa) and maximum sap flux ($v_{max} \pm SD$, cm h^{-1}), and mean annual precipitation (MAP, mm) (**a** and **c**) or monthly precipitation during the dry season (P_{DRY}, mm) (**b** and **d**). Asterisks, situated next to the r^2 values, denote the significance of the relationships (*$P < 0.05$, **$P < 0.01$, ***$P < 0.001$)

The negative response pattern of v_{max} to increasing MAP and P_{DRY} observed here implies that compared to dry temperate forests, tree sap flux velocity in humid tropical forests does not depend on drought adjustments to local climate (i.e., adjustments reducing the vulnerability to water shortage) (Grossiord et al. 2018). Instead, sap flux patterns in response to climate variability are probably dependent on adjustments to high-moisture conditions. Indeed, in the sites included here, VPD is usually low and precipitation is high compared to temperate and semiarid regions, thus tree water relations are more rarely limited by high evaporative demand or drought stress. One may, therefore, expect trees in this environment to have evolved functional traits to deal with other limiting factors such as low radiation induced by the high cloud cover (Moore et al. 2018). Furthermore, high atmospheric humidity can lead to sustained leaf wetness with water films on leaves inhibiting gas exchanges, and resulting in reduced sensitivity to atmospheric drivers (Dawson and Goldsmith 2018; Moore et al. 2018). Plants that grow in high atmospheric humidity conditions have also been reported to show low levels of endogenous abscisic acid (ABA) (Nejad and Van Meeteren 2007; Okamoto et al. 2009), and marginal stomata regulation on carbon and water

fluxes (Torre and Fjeld 2001; Torre et al. 2003). Therefore, an important research topic for future work, in addition to exploring adjustment mechanisms to reduced precipitation, is to understand how adaptive mechanisms related to high moisture could relate to sap flux regulation in tropical trees.

Lower v_{max} under non-limiting soil moisture conditions could potentially result in reduced water exchange with the atmosphere in humid tropical forests as more days with high VPD are likely to occur in the future. Currently, Earth system models (ESM) are being developed to incorporate plant hydraulic traits (Xu et al. 2016; Christoffersen et al. 2016; Kennedy et al. 2019), but it is not immediately clear if such traits will produce the patterns observed here for humid tropical ecosystems. Incorporating traits related to adjustments to high-moisture environments could potentially affect the differential responses of global precipitation to vegetation changes (e.g., Kooperman et al. 2018). To gain further insight into the drivers of sap flux variability, we suggest extending this work to more extreme sites, i.e., both wet and dry, and exploring other relevant factors such as long-term indices of evaporative demand (Poyatos et al. 2007). Improved quantification of within-site variation, including systematic replication of species sampled
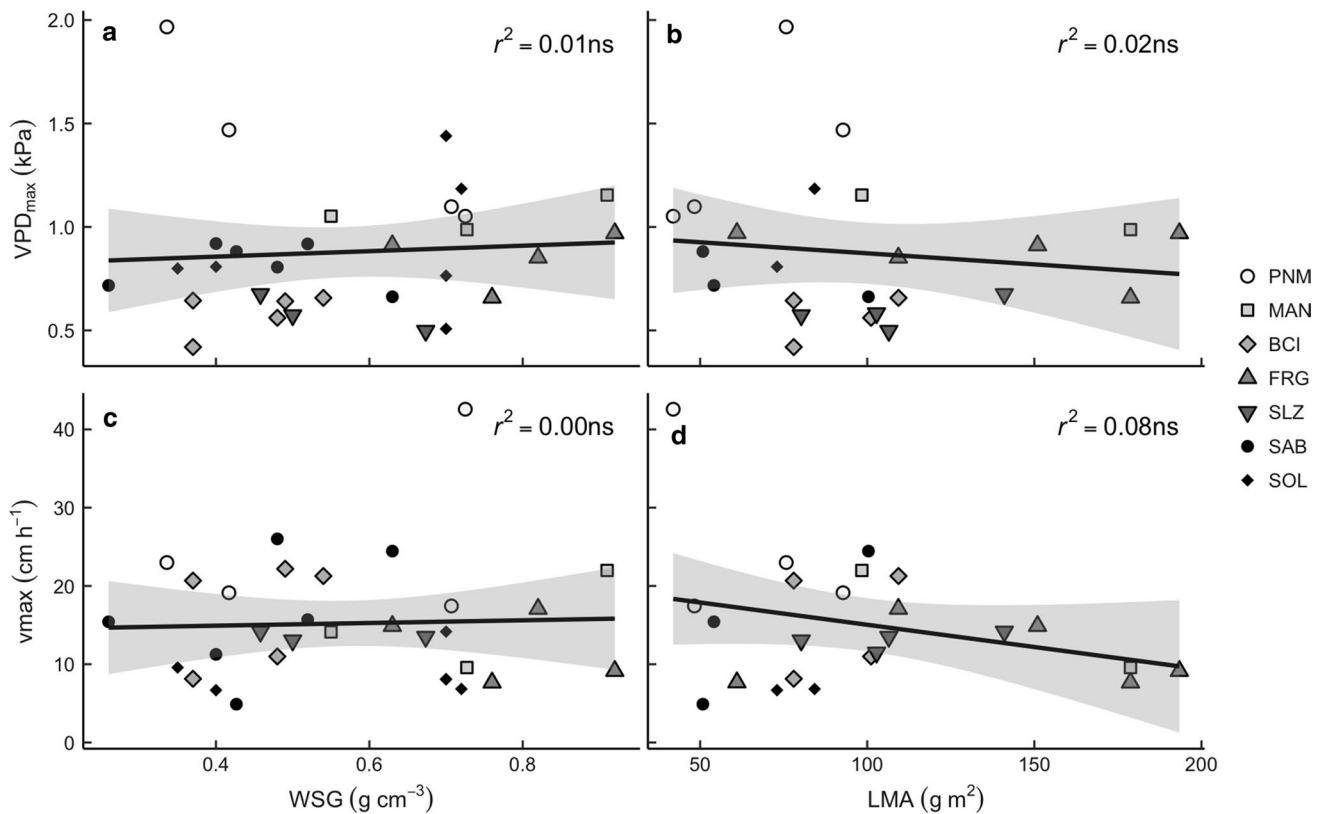
Fig. 4 Relationships between VPD threshold at which sap flux levels-off at maximum levels (VPD$_{max}$, kPa) and maximum sap flux (v_{max}, cm h^{-1}), and wood specific gravity (WSG, g cm^{-3}) (**a** and **c**) or leaf mass per area (LMA, g m^{-2}) (**b** and **c**), across all sites. Each point represents a different individual tree

along environmental gradients would also be needed. Such an improved design would be valuable for trait-enabled dynamic vegetation models (Fisher et al. 2018), even if systematically sampling the same species in tropical forests may prove complicated considering their high species diversity.

Common functional traits provide limited insights into the mechanisms of sap flux regulation in the neotropics

We found a large variability in LMA and WSG within and across sites, reflecting the high functional diversity present in these ecosystems (Fortunel et al. 2012). Nevertheless, the large diversity in these functional traits could not be related to the variability in VPD$_{max}$ and v_{max} observed across sites (Fig. 4). This is not so surprising in light of a recent review (Moles 2018) that highlights a remarkable degree of inconsistency in reported relationships of LMA and WSG with other plant traits related to plant ecological strategy or the fast-slow economic spectrum (Reich 2014). Moreover, we expect that stem and leaf traits more directly related to acquisition, transport, and retention of water (hydraulic traits) would underpin the patterns observed here; appropriate trait selection is, therefore, critical for uncovering trait–moisture relationships more generally (Griffin-Nolan et al. 2018). Specifically, reduction in moisture across large environmental gradients has been associated with shifts in mechanistic foliar traits such as stomatal density (e.g., Luomala et al. 2005) or chemical compounds inducing stomatal closure (Schachtman and Goodger 2008). Investigating such anatomical and chemical foliar adjustments that provide stronger mechanistic basis than LMA will be needed to unravel the underlying adaptive processes driving VPD$_{max}$ and v_{max} patterns along our precipitation gradient (Fig. 3). Similarly, WSG had no detectable impact on VPD$_{max}$ and v_{max} (Fig. 4). Wood density is considered an important modulator of xylem water transport as higher wood density has been associated with reduced hydraulic conductivity and higher resistance to xylem cavitation (Hacke et al. 2004). As such, this property could constrain the maximum flux of water movement in trees (Barbour and Whitehead 2003). However, most WSG measurements, including the ones used in this study, are made using main stems. Yet, to be relevant for water transport, this trait should represent all woody tissues, from the roots to the canopy (Fortunel et al. 2012). Furthermore, the interpretation of WSG as an indicator of

plant hydraulic functions is debated (Larjavaara and Muller-Landau 2010), since a given WSG can be achieved under various combinations of wood anatomy which do not necessarily impact water transport, but instead reflect variability in the competing demands of strength and storage (Fortunel et al. 2014; Zieminska et al. 2015; Morris et al. 2016; Dias et al. 2019).

Therefore, although LMA and WSG are useful for indicating, respectively, placement on the leaf economics spectrum (Wright et al. 2004) and successional status in productivity models (Moorcroft et al. 2001), they do so only at global scales and do not consistently relate to other plant traits at local and regional scales (Moles 2018), as our findings also confirm here. They appear to provide limited interpretation of dynamic plant responses to environmental variation within hyper-diverse tropical forests (Brodribb 2017). While incorporation of such local adjustments in ESMs is possible via trait-mediated plant responses to the environment (e.g., Fisher et al. 2015), the functional traits explored here, LMA and WSG, show little promise. Focused data collection on more mechanistic traits associated with plant hydraulics and stomatal function like, for instance, P_{50}, leaf turgor loss point, cuticular conductance, sapwood anatomy, stomatal density or foliar chemical compounds are likely to reveal mechanistic controls on the interspecific differences in sap flow observed here, which can be used to refine existing plant hydraulic models (Christoffersen et al. 2016; Wolf et al. 2016; Xu et al. 2016; Sperry et al. 2017).

Conclusion

This study demonstrates that local climate plays an important role in the sap flux response of humid tropical forests to evaporative demand. Moreover, we highlight that trees growing in wetter regions in the tropics may be subjected to a reduced sap flux velocity with the high evaporative demand predicted by most climate models. We expect incorporating these regulation strategies in models could improve our prediction accuracy of both vegetation dynamics and water cycles. This study also shows that easy-to-measure functional traits provide little interpretation in dynamic sap flux response to VPD, suggesting that more mechanistic traits should be investigated to build predictors in future models. Finally, it is important to note that although our sampling included a large number of species relative to previous studies investigating sap flux-climate responses, our work still covers only a limited range of the incredible diversity present in humid tropical forests. Extending sap flux measurements in more regions in the tropics and developing large databases of plant water use (e.g., SAPFLUXNET, Poyatos et al. 2016) is an important next step if we want to improve our predictive capacity of tropical forest responses to climate change.

Author contribution statement CG, BC, JW and NGM planned the research. AA, HA, BB, BG, BW, CB, CB, CS, CF, DB, DC, MD, BF, CF, KJ, GRM, GWM, CV, JW, BW, NS, LA, TEW and LW contributed data. CG and BC analyzed the data and wrote a first draft of the manuscript, and all authors contributed to revisions.

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