

1
2
3
4
5
6
7
8
9
10
11
12
13
14
15
16
17

Title. Global Distribution of Vascular Epiphyte Diversity

Authors. Nora M. Cavanaugh^{1,*}, Amy E. Zanne^{1,2,†}, William K. Cornwell^{3,†}

¹Department of Biological Sciences, George Washington University, Washington, DC, 20009, USA

²Department of Biology, University of Miami, Coral Gables, FL, 33146, USA

³School of Biological, Earth & Environmental Sciences, University of New South Wales, Sydney, 2052, Australia

*corresponding author: nora.m.cavanaugh@gmail.com

†co-senior authors

1 ***Abstract.***

2 Epiphytes are a large and understudied part of global diversity. Classic work by Gentry and
3 Dodson argued that Neotropical, mid-elevation forests are centers of diversity for this growth
4 form. We assessed this hypothesis with modern global geospatial and climatic datasets. By
5 connecting growth form and occurrence data with climatic records at the same locations, we
6 quantified spatial and climatic distributions of epiphyte species richness. Latitude was a powerful
7 driver of epiphyte distributions, with peaks at the equator; here, epiphytes contributed
8 significantly to vascular plant species richness with greatest prevalence at mid elevations and in
9 the Neotropics. Climatically, precipitation was a stronger determinant than temperature as to
10 where epiphytic species thrive. The study provides robust support for the hypotheses that plant
11 diversity in Neotropical, mid-elevation forests is unusually concentrated in the epiphytic growth
12 form, and the lower proportion of epiphytic diversity elsewhere may have both physiological or
13 biogeographic explanations. The particular features of climate change in Neotropical mid-
14 elevation habitats, and the implications for epiphyte diversity, are worthy of urgent research.

15 ***Keywords.*** Diversity, Elevation, Epiphyte, GAMs, Global, Latitude

Background

Shifts in plant growth forms across the world's continents and climates have long fascinated plant biogeographers. Geographic variation in growth form is evident in the vast variety of plant structures we observe globally, with key transitions from tropical to temperate regions [1]. Biogeographic patterns in the frequency of vascular epiphytes [2], where plants grow on other plants without roots in the soil (Figure 1), is an especially striking example [3]. Despite the long history of interest, epiphytic taxa remain among the most disproportionately undersampled plant groups, perhaps due to the difficult logistics of studying them [4].

Lacking soil access, epiphytic plants rely on atmospheric moisture and organic decay for water and nutrients [5]; many have adaptations, such as thick water-storing leaves, reduced photosynthesis rates, and CAM photosynthesis [6]. Their distinct nutrient and water strategies, combined with heightened exposure to the elements in tree canopies, make them sensitive to environmental changes [7]. At regional- to global-scales, temperature and precipitation are thought to be critical drivers of epiphyte abundance and species-richness determining their latitudinal and elevational distributions [7–9]. Regionally, epiphyte richness and relative abundance are highest in wet than dry or extremely wet forests [7]. Further, frost [8] and freezing events also limit epiphytes. These strong temperature and precipitation sensitivities are thought to produce steep latitudinal and elevational gradients in epiphyte presence and diversity, with peaks in low latitude forests. Interestingly, Gentry and Dodson [7] argued that the peak for epiphyte diversity is in mid-elevation tropical forests where epiphytes may account for as much as 30% of forest foliar biomass [7], while other works suggests regionally 39% of the vascular flora [9] may be epiphytes in some places.

Insights into global distributions of epiphytes have primarily been derived from plot sampling, lists from specific countries, and informal observations. For instance, the Neotropics are thought to have a higher epiphyte diversity than the Paleotropics, a notion attributed to biogeographic history of certain epiphyte clades [7,10,11]. But quantitative comparisons of relative epiphytic contributions to plant diversity remain largely unreported. Notably, key theories on epiphyte spatial and climatic distributions, including Gentry and Dodson's [7] tropical mid-elevation peak hypothesis, await testing.

Our study capitalizes on a large growth form database [12] with ~47% of named vascular plant species [13]; this dataset also includes true negatives, i.e. species that are known to not be epiphytes. Combining this database with global occurrence and climatic data, we modeled vascular epiphyte species richness over latitudinal, elevational, temperature and precipitation gradients to illuminate global trends of vascular epiphyte medians and limits. Specifically, we asked the following two questions:

1. Where do epiphytes contribute most to plant diversity? We hypothesized that epiphytes are most prevalent in tropical regions [9] at intermediate elevations in the Neotropics [7,10,11].
2. What are the spatial and climatic limits of the epiphytic growth form?

1
2 We hypothesized that as few epiphytes can survive freezing temperatures and low moisture,
3 epiphyte diversity will rapidly decline outside of tropical warm, wet conditions. Building on
4 Gentry and Dodson [7], we focus on the proportion of documented diversity that is epiphytic.
5

6 **Methods**

7 **Growth Form Data**

8 A global growth form database [12] for 143,616 vascular plant species from 445 families
9 was used to classify growth form by species, including 21,110 epiphytic species. The Taseski *et*
10 *al.* [12] database classifies each of the included species into one of seven growth forms: aquatic,
11 obligate epiphytes, hemiepiphytes, climbing, parasitic, holo-mycoheterotrophic and free-
12 standing. Following a definition of epiphytism from Madison [10] the database excludes 1) very
13 rare, “accidental” epiphytes, 2) hemiepiphytes, and 3) haustorial parasites. We used the authors’
14 static consensus “species-level” dataset to exclude taxa with variable growth forms.
15

16 **Spatial and Bioclimatic Data**

17 To establish species geographic midpoints and limits, we obtained georeferenced records
18 for vascular plants from the Global Biodiversity Information Facility (GBIF) [14], totaling
19 168,516,597 records. Common data quality issues were cleaned via both the GBIF filters and
20 Coordinate Cleaner [15]. After excluding select records around biodiversity institutions,
21 162,494,125 locations remained.

22 For all remaining locations, we extracted climate and elevation data from WorldClim
23 v2.1 [16] (1970-2000) records of bioclimatic variables. We used records of annual mean
24 temperature (BIO1) and precipitation (BIO12) to obtain estimates of bioclimatic variables for
25 each record.

26 For both geographic and climatic distributions, we tested both midpoints (i.e., range
27 centers as medians) and limits (i.e., range edges as maximum and minimum). For limits, we
28 defined ‘maximum’ as the 97.5th percentile and ‘minimum’ as the 2.5th percentile. Locational
29 data from GBIF were analyzed to obtain median latitude and maximum latitude and elevation for
30 each species. The maximum of the absolute value of latitude (maximum absolute latitude) for
31 each species was calculated to quantify how far from the equator species were observed. We
32 analyzed minimum climatic values for each species. The cleaned dataset comprising records
33 from all databases included 103,077 species, each of which had a record for growth form,
34 minimum, median and maximum absolute latitude, median and maximum elevation, and
35 minimum and median precipitation and temperature.
36

37 **Analyses**

38 Epiphyte spatial and climatic medians and limits were analyzed using Generalized
39 Additive Models (GAMs), in which the linear dependent variable responds to smooth functions
40 of predictor variables. A GAM approach serves as a middle ground between linear models and

1 complex machine learning models for more closely fit outcomes; it does not make assumptions
2 of linearity as for linear models, while allowing for greater interpretation of the resulting model
3 compared to prediction-focused machine learning approaches.

4 The GAM models were logistic, assuming a binomial distribution and log-link. For more
5 intuitive visualization, the log-odds scales were transformed to probability. Smoothing
6 parameters were selected using the Restricted Maximum Likelihood (REML). The number of
7 basis functions, k , was 3 for all GAMs to avoid overfitting and model biologically reasonable
8 smoothed relationships [17]. Smoothers were applied to all predictor variables, as environmental
9 factors rarely have linear relationships with ecological response variables. Concurvity, a
10 generalization of collinearity for nonlinear models, was assessed [18]). We investigated the
11 relative importance of spatial and climatic medians and limits explaining epiphyte distributions.
12 We present models with 1, 2, 3, and 5 predictors (mean annual precipitation, mean annual
13 temperature, maximum absolute latitude, elevation, and continent) and compare percentage
14 deviance explained among models. More complex climate variables were also considered but to
15 avoid strongly covarying predictors and compare with literature predictions, we focused on these
16 5 variables. Models were run for both distribution midpoints and limits. We used the “mgcv”
17 package [19] of the R program [20].

18 Results

19
20
21 Overall, of the plants around the globe for which we identified growth form, 10.6% were
22 epiphytes.

23 Global Median Distribution of Epiphytes

24 Epiphytes contributed the most to vascular plant diversity in the Neotropics near the equator at
25 intermediate elevations, <2000 m; from GAM analyses with three predictors (continent, latitude
26 and elevation) estimates, for species whose range medians were close to the equator at 2000 m
27 elevation in the Neotropics 54.8% were epiphytes (Figure 2A; Table S1). This is higher than any
28 other considered environment in the world. For the same elevation at the equator in the
29 Paleotropics, the estimate was 31.2%. Away from the equator, the proportion of epiphyte species
30 declines steeply into both northern and southern hemispheres. At the tropical limits (i.e., the
31 tropic of cancer and capricorn) and 2000 m, the estimates were 20.1% epiphytes for the
32 Neotropics and 8.6 % for the Paleotropics. Climatically, vascular epiphytes contributed most to
33 plant diversity at intermediate precipitation, peaking between 3500 and 4000 mm, and
34 intermediate temperatures, peaking just over 15°C (Figure 2B; Table S1). The single strongest
35 predictor was latitude followed by precipitation and then continent (Neotropics versus
36 Paleotropics) (Table S1).

37 Geographic and Climatic Limits to the Distribution of Epiphytes Compared to Non- 38 Epiphytes

1
2 At cold temperatures, few species were epiphytes, while the proportion of epiphytic species
3 increased rapidly towards warmer climates (Figure 2B). 96.7% of epiphytic species had
4 latitudinal limits at $\sim 30^\circ$ or less; 98.4% of species had elevational limits at ~ 4000 m or less
5 (Figure 2C). Of the models with only one predictor, the maximum absolute latitude explained the
6 most deviance followed by minimum annual precipitation, minimum temperature of the coldest
7 month and maximum elevation (Table S1). An additive minimum climatic model including
8 minimum annual precipitation and minimum temperature of the coldest month explained 14.7%
9 deviance, which was less than the best single spatial predictor (maximum absolute latitude at
10 17.7% deviance; Table S2). For both temperature and precipitation minimum values explained
11 more deviance than maximum values (Table S1).

12 13 **Discussion**

14 Epiphytes are rule breakers. While most plants reach from the soil towards the sun, epiphytes
15 remain detached from the ground, high in canopies, constantly exposed to the elements without
16 moisture reserves from the soil to buffer dry periods. The rules epiphytes break and the necessary
17 survival strategies they acquired dictate where they survive. In this global data-driven study, we
18 find quantitative support for Gentry and Dodson's [7] hypothesis that the peak contribution of
19 epiphytes to total plant diversity occurs in mid-elevation tropical montane cloud forests (TMCF)
20 in the Neotropics. Gentry and Dodson [8] called this pattern a "somewhat tenuously established
21 trend", but the data here strongly support it. They also wrote, "In the Andes, the peak in epiphyte
22 diversity appears to be between 1,000 m and 2,000 m". Our analysis of the mid-point of species
23 ranges (Figure 2A) suggests a peak close to the upper end of their postulated range.

24 As previously suggested by Taylor *et al.* [9], of the considered predictors, latitude shaped
25 epiphyte distribution more than any other variable. Epiphytes made up almost 40% of those
26 vascular plant species with distributions limited to the equator. Epiphyte species' distributions
27 rapidly declined away from the equator; this pattern was true for latitudinal medians and limits.

28 In addition to latitude, continent was also an important predictor with much diversity
29 higher in the Neotropics; this is consistent with plot and country list studies [7,9–11]. Based on
30 our results, the pattern may be driven by greater availability of mid-elevation area near the
31 equator (Table 1) leading to considerably more area at ideal epiphyte conditions in the
32 Neotropics. Along these lines, Gentry and Dodson [8] speculated that higher meso- and micro-
33 site diversity within the Andes compared to the Paleotropical mountains may have led to especially
34 high beta diversity in the Neotropics. This difference in areas of high elevation habitat close to
35 the equator may have generated epiphyte diversity and/or maintained it through historical climate
36 changes [7].

37 In models of proportion of epiphytes with median precipitation and temperature,
38 temperature had a hump-shaped relationship with a peak around 20°C . For precipitation, these
39 models predicted a monotonic increase. Interestingly, few epiphytes were present at high
40 temperatures even when the rainfall is very high both in the Neo- and Paleotropics, perhaps due

1 to episodic high vapor pressure deficit. Also, few epiphytes occurred below freezing
2 temperatures, although minimum temperature did not explain as much deviance as minimum
3 annual precipitation.

4 Our results here for distributions of epiphytes and tropical montane cloud forests
5 (TMCFs) appear to share closely aligned climatic boundaries, with understanding of climatic
6 limits for both being vital with changing climates. The definition of TMCF varies throughout the
7 literature, but consistently they may be recognized by cloud cover [21], which suppresses vapour
8 pressure deficit. Most TMCFs are found within a narrow band of elevation (~2000m and
9 3500m), although several exist lower [21]. Our results suggested overlapping temperature
10 preferences for epiphytes and TMCFs; a quantitative analysis of epiphyte ranges could be a
11 powerful and objective way to approach conservation of this complex and diverse ecosystem.

12 **Conclusions**

14 An understanding of epiphyte distribution and ecology has long been a challenge as they live
15 their lives well above our heads, beyond our notice. However, given large epiphyte contributions
16 to species diversity in particular regions, an understanding of where epiphytes exist and what
17 shapes their distribution is critical. Depending on how they are impacted by climate change, we
18 run a risk of losing these taxa before we understand their climatic distribution of epiphytes [22].

19
20 *Acknowledgements.* The authors thank the Zanne lab for comments on earlier drafts.

21
22 *Funding.* This work was supported by George Washington University, Department of Biological
23 Sciences Harlan undergraduate research program (NMC).

References.

1. Zanne AE *et al.* 2014 Three keys to the radiation of angiosperms into freezing environments. *Nature* **506**, 89–92.
2. Benzing DH. 1987 Vascular epiphytism: taxonomic participation and adaptive diversity. *Ann. Mo. Bot. Gard.* , 183–204.
3. Schimper AFW. 1888 *Die epiphytische vegetation Amerikas*. Fischer.
4. Cornwell WK *et al.* 2014 Functional distinctiveness of major plant lineages. *J. Ecol.* **102**, 345–356.
5. Jansky SH, Roble J, Spooner DM. 2016 *Solanum clarum* and *S. morelliforme* as novel model species for studies of epiphytism. *Front. Plant Sci.* **7**, 231.
6. Hietz P *et al.* 2022 Putting vascular epiphytes on the traits map. *J. Ecol.* **110**, 340–358.
7. Gentry AH, Dodson C. 1987 Diversity and biogeography of neotropical vascular epiphytes. *Ann. Mo. Bot. Gard.* **74**, 205–233.
8. Zotz G. 2005 Vascular epiphytes in the temperate zones—a review. *Plant Ecol.* **176**, 173–183.
9. Taylor A, Zotz G, Weigelt P, Cai L, Karger DN, König C, Kreft H. 2022 Vascular epiphytes contribute disproportionately to global centres of plant diversity. *Glob. Ecol. Biogeogr.* **31**, 62–74.
10. Madison M. 1977 Vascular epiphytes: their systematic occurrence and salient features. *Selbyana* **2**, 1–13.
11. Couvreur TL. 2015 Odd man out: why are there fewer plant species in African rain forests? *Plant Syst. Evol.* **301**, 1299–1313.
12. Taseski GM, Beloe CJ, Gallagher RV, Chan JY, Dalrymple RL, Cornwell WK. 2019 A global growth-form database for 143,616 vascular plant species. *Ecology*. e02614
13. Christenhusz MJ, Byng JW. 2016 The number of known plants species in the world and its annual increase. *Phytotaxa* **261**, 201–217.
14. GBIF.org (16 June 2022) GBIF Occurrence Download <https://doi.org/10.15468/dl.qzwbba>
15. Zizka A *et al.* 2019 CoordinateCleaner: Standardized cleaning of occurrence records from biological collection databases. *Methods Ecol. Evol.* **10**, 744–751.
16. Fick SE, Hijmans RJ. 2017 WorldClim 2: new 1-km spatial resolution climate surfaces for global land areas. *Int. J. Climatol.* **37**, 4302–4315.
17. Duursma RA, Falster DS. 2016 Leaf mass per area, not total leaf area, drives differences in above-ground biomass distribution among woody plant functional types. *New Phytol.* **212**, 368–376.
18. Wood S.N., N. Pya and B. Saefken (2016) Smoothing parameter and model selection for general smooth models (with discussion). *J. of the Amer. Stat Assoc* **111**,1548-1575.
19. Ross N. In press. GAMs in R: A Free, Interactive Course using mgcv.
20. R Core Team. 2022 R: A language and environment for statistical computing.
21. Aldrich M, Billington C, Edwards M, Laidlaw R. 1997 Tropical montane cloud forests: an urgent priority for conservation. *WCMC Biodivers. Bull.* **2**, 1–14.
22. Ramírez-Barahona S, Cuervo-Robayo ÁP, Feeley K, Ortiz-Rodríguez A, Vásquez-Aguilar A, Ornelas JF, Rodríguez-Correa H. 2021 Climate change and deforestation drive the displacement and contraction of tropical montane cloud forests.

1 Table 1. Area of land (km²) in different elevation bands from 0-5000 m above sea level in the
2 Neotropics versus Paleotropics (with the tropics defined as between tropic of cancer and tropic of
3 capricorn). Data from WorldClim v2.1. Note that the high elevation Himalaya and Tibetan
4 Plateau in Paleo landmasses fall outside of the tropics by this definition.

Elevational bands (m)	Neotropics	Paleotropics
0-1000	13,185,033	29,006,359
1000-2000	902,479	5,472,605
2000-3000	462,335	358,880
3000-4000	393,835	31,096
4000-5000	297,012	979

5

1



2

3

4

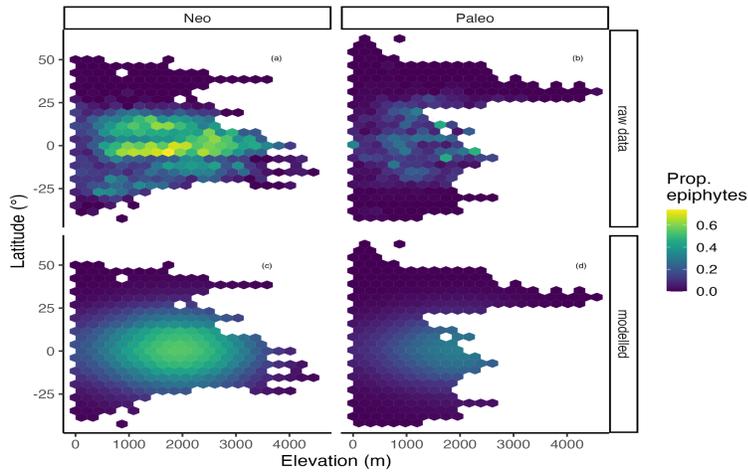
5

6

7

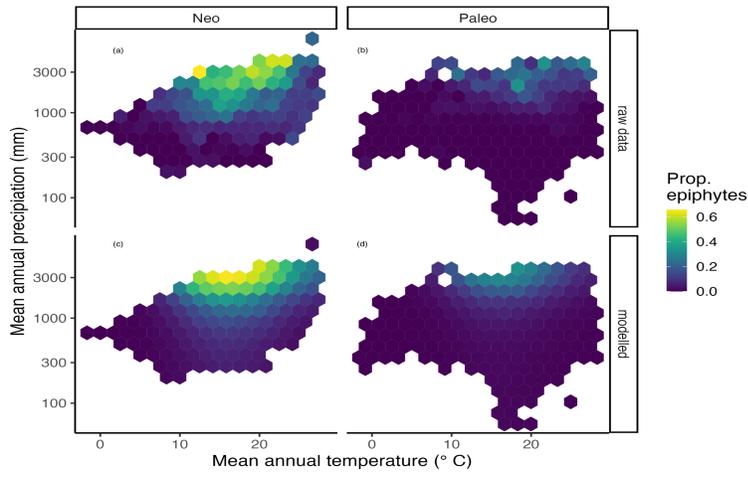
Figure 1. Epiphytic bromeliad (*Tillandsia caloura*) overlooking cloud forest on the Sierra Nevada de Santa Marta, Colombia (Photo: Riley Fortier, Identification: Julian Andres Aguirre Santoro <https://www.inaturalist.org/observations/187959544>).

1 A.



2

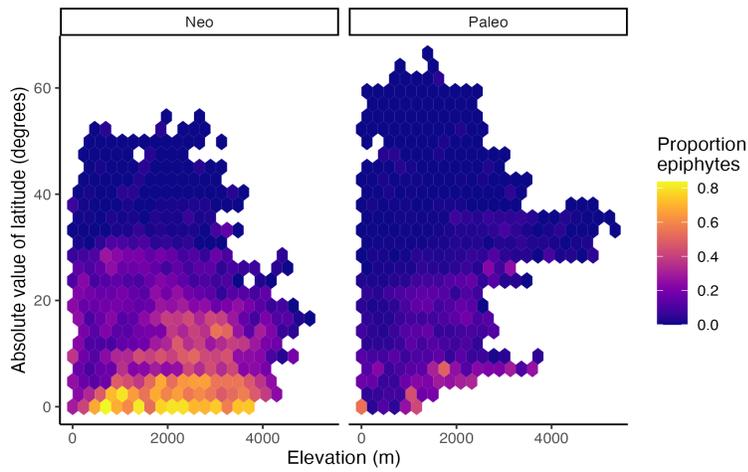
3 B.



4

5

C.



6

7

8 Figure 2. Proportion of epiphytes for all species median distributions with respect to A.

9 elevation, latitude, and continent. The large amount of very high elevation area (Table 1) from

1 25-35 N latitude in the Paleotropics is principally the Himalayas and Tibetan Plateau. In the
2 Neotropics, the large high elevation areas are principally the Andes. B. MAP (log scale), MAT,
3 and continent. Panels (left) are raw data and (right) are modeled distribution with 3-predictor
4 GAMs. C. Proportion of epiphytes for all species with limit distributions with respect to
5 elevation, the absolute value of latitude, and continent. Panels are modeled distribution with 3-
6 predictor GAMs. Bins with fewer than 20 species were excluded from the visualization.
7

1 **Supplementary Materials.**

2 Table S1. The single predictor models for proportion of epiphytes. Maximum is the 97.5%
 3 quantile of observations, minimum is the 2.5% quantile of observations representing a statistical
 4 estimate of the species range limit either spatially or climatically. Continent, which is a binary
 5 variable, is not a smoothed term. Precipitation is the mean annual precipitation and temperature
 6 is the mean annual temperature from Worldclim.

<i>Quantile and Model</i>	EDF	Deviance explained (%)
<i>Median</i>		
Latitude	2	16
Elevation	1.999	5.38
Precipitation	1.999	11.7
Temperature	1.999	3.22
Continent		9.1
<i>Maximum</i>		
Abs. Value Latitude	1.996	17.7
Elevation	1.998	1.88
Precipitation	2	8.1
Temperature	2	1.9
<i>Minimum</i>		
Precipitation	1.999	12.5
Temperature	1.997	7.76

7

1 Table S2. Multi-predictor models for proportion of epiphytes. Maximum is the 97.5% quantile
 2 of observations, minimum is the 2.5% quantile of observations representing a statistical estimate
 3 of the species range limit either spatially or climatically. Precipitation is the mean annual
 4 precipitation, and temperature is the mean annual temperature from Worldclim.

<i>Quantile and Model</i>	EDF	Deviance explained (%)
<i>Median spatial and climatic</i>		
Overall		24.5
Latitude	1.999	
Elevation	1.762	
Precipitation	1.997	
Temperature	1.998	
<i>Maximum spatial, minimum climatic</i>		
Overall		22.9
Latitude	1.976	
Elevation	1.997	
Precipitation	1.996	
Temperature	1.984	
<i>Median spatial</i>		
Overall		21
Latitude	2.000	
Elevation	1.999	
<i>Median climatic</i>		
Overall		15.8
Precipitation	1.999	
Temperature	1.999	
<i>Maximum spatial</i>		
Overall		20.4

Latitude	1.995	
Elevation	1.999	
<hr/>		
<i>Minimum climatic</i>		
Overall		14.7
Precipitation	1.999	
Temperature	1.999	
<hr/>		

1