Estimation of the number of tree species in French Guiana by extrapolation of permanent plots richness

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The biodiversity of tropical rainforest is difficult to assess. Yet, its estimation is necessary for conservation purposes, to evaluate our level of knowledge and the risks faced by the forest in relation to global change. Our contribution is to estimate the regional richness of tree species from local but widely spread inventories. GuyaDiv is a network of forest plots installed over the whole territory of French Guiana, where trees over 10 cm DBH are identified. We use its information (1315 species censused in 68 one-hectare plots) to estimate the exponent of the species-area relationship, assuming Arrhenius’s power law. We can then extrapolate the number of species from three local, wide inventories (over 2.5 km2). We evaluate the number of tree species around 2200 over the territory.

# 1 Introduction

Biodiversity assessment in tropical moist forests is a practical challenge but a major goal considering they are the most diverse terrestrial ecosystems. Estimating the number of tree species is made possible by the long-term effort of sampling resulting in thousands of forest plots organized in various networks. In French Guiana, the GuyaDiv network consists of close to 250 plots across the whole forest. Based on similar datasets, the diversity of tree species has been estimated in Amazonia (ter Steege et al. 2013; ter Steege et al. 2020) and at the world scale (Slik et al. 2015). The methods used in those studies are not appropriate to estimate regional diversity, i.e. at a smaller scale where dispersal limitation is critical. The contribution of this paper is to estimate the number of tree species at the regional scale, in French Guiana (8 million hectares of tropical moist forest with no ecological boundary to distinguish them from the rest of Amazonia) and demonstrate which method is valid to do so. We build on Harte’s self similarity model (Harte, Kinzig, and Green 1999) that implies the power-law relationship of Arrhenius (1921) and provides a technique to evaluate its parameters (Harte et al. 1999), previously applied by Krishnamani, Kumar, and Harte (2004) in the Western Ghats, India. We show that the log-series model underlying the work of ter Steege et al. (2013) does not apply at the regional scale.

# 2 Methods

Self-similarity (Harte, Kinzig, and Green 1999) is a property based on scale invariance. Consider a species that is present in an area , say French Guiana. The probability to find it in half the whole area, denoted is . Then, if it is present , the probability to find it in turn in half , denoted , is also , and so on. The probability to find the species in is thus . In other words, the conditional probability to find a species in a sub-area, given that it is present in the area containing it, is constant: it does not depend either on the observation scale nor the species considered.

The Arrhenius power law (Arrhenius 1921) both implies and is a consequence of the self-similarity property (Harte, Kinzig, and Green 1999). The number of species observed in an area is

where is the power parameter and is the number of species in an area of size 1. Actually, . This is a classical relation in macroecology, with long empirical and theoretical support (Williamson, Gaston, and Lonsdale 2001; Gárcia Martín and Goldenfeld 2006).

If is known, the inventory of a reasonably large area allows computing . Then, can be calculated for any value of .

Harte et al. (1999) showed that under the assumption of self-similarity, can be inferred from the dissimilarity between small and distant plots of equal size distributed across the area. The Sørensen (1948) similarity between two plots is

where (respectively ) is the number of species in plot 1 (resp. plot 2) and is the number of common species.

Applied to plots of the same size separated by distance , Sørensen’s similarity decreases with distance following the relation (Harte et al. 1999) that can be estimated by the linear model

The logarithm of the Sørensen dissimilarity between pairs of plots can be regressed against the logarithm of the distance between the plots: the slope of the regression is .

The relation (2.3) holds at the same scale as the power law, i.e. at the regional scale (Grilli et al. 2012). Krishnamani, Kumar, and Harte (2004) estimated with a very good fit to the linear model at distances up from 1 km but not below.

A large enough inventory, provided by a permanent forest facility, is necessary along with a set of small, widely spread forest plots. Our plot network is GuyaDiv (Engel 2015). Since the installation of the first plots in 1986, the GuyaDiv network has continuously grown until today. It now consists of 243 plots of various sizes and shapes, distributed in various forest types, in 30 sites across French Guiana (figure 2.1). We took into account the 68 one-hectare plots of the network. They are located in 21 sites, which provides fairly good coverage of the variability of the forest in French Guiana.



Figure 2.1: The GuyaDiv network. Paracou, Piste de Saint-Elie and Nouragues are denoted PAR, PSE and NOU.

We gathered 3 local, large inventories to account for environmental variability and a network of plot covering the whole region.

The Paracou research station (Gourlet-Fleury, Guehl, and Laroussinie 2004) contains six 6.25-ha and one 25-ha plots of primary rainforest. Nine 6.25-ha plots were logged between 1986 and 1988 in a forestry experiment that temporarily increased the recruitment of light-demanding species (Mirabel, Marcon, and Hérault 2021) and the functional diversity (Mirabel, Hérault, and Marcon 2020).

In a rather conservative approach, we retained only the well-identified trees of the permanent plots (571 species) and added available data from the GuyaDiv network: transects from Molino and Sabatier (2001) and ten 0.49-ha plots around the Guyaflux tower (Bonal et al. 2008) contain 575 species, including 132 new ones. 37 more species at the Cayenne herbarium (CAY: Hoff et al. 1989) were collected in the area but outside the plots. The total number of species is thus 740 included in a 4.84-km2 convex envelope.

The Piste de Saint-Elie site has been intensively sampled for 50 years. It encompasses four 1-ha and one half-hectare plots in GuyaDiv and a few small plots added for various studies. Moreover, many herbarium specimen were collected from the site. As a whole, we gathered 763 species in a 3-km2 area.

Nouragues research station (Bongers et al. 2001) provides 22 hectares of permanent plots curated the same way Paracou’s in a common network called Guyafor. We applied the same protocol, adding Guyadiv plots and herbarium collections up to 850 species in a 2.5-km2 area.

The number of plots varies across locations so the estimation of must be made with care. We sampled one random plot at each location to obtain pairs of plots. We calculated the Sørensen dissimilarity and the geographic distance between each pair of plots. We estimated as half the coefficient of the distance variable in the linear model . We repeated these steps 1000 times to obtain a distribution of estimated values depending on the plots drawn in each location. was estimated as the empirical mean of the distribution and its 95% confidence interval was obtained by eliminating the 2.5% extreme values on both tails.

The confidence interval of the estimation of the number of species is assessed by combining the uncertainty in and . The variance of is estimated from the three observed values. That of is obtained from the empirical distribution of . The variance of their product is calculated (the formula and its derivation are in Appendix 5.2). Finally, we assumed the normality of the distribution of the product of the estimates to retain an approximate 95% confidence interval of 2 standard deviations.

All analyses were made with R (R Core Team 2022) v. 4.1.2.

# 3 Results

The estimated value of is 0.103 with a 95% confidence interval between 0.089 and 0.121.

The estimated number of species per squared kilometer, , is respectively 629, 681 and 773 in Paracou, Piste de Saint Elie and Nouragues. The average value is 694.

Finally, the estimated number of species is 2230. Taking into account the uncertainty about , its 95% confidence interval is between 1589 and 2872.

# 4 Discussion

The self-similarity model allows estimating the number of species of tropical forests at a regional scale. It requires a network of plots at a wide range of distances from each other to estimate Arrhenius’s power law parameter. It should be completed by a continuous inventory whose size is consistent with the smallest scale of the power law. These constraints explain why the method has not been widely applied, beyond Krishnamani, Kumar, and Harte (2004) and this paper.

At smaller scales, i.e. inside a single community, the relation between area and number of species is described by species accumulation curves (SAC: Gotelli and Colwell 2001). It is driven by statistical models that address incomplete sampling (Shen, Chao, and Lin 2003; Béguinot 2015). After replacing the sampled area by the number of individuals it contains, well-known estimators of richness such as Chao’s (Chao 2004) or the jackknife (Burnham and Overton 1978) apply.

At the scale of the metacommunity, defined as of the neutral model of biogeography, the species distribution is in log-series (Hubbell 2001; Volkov et al. 2003). ter Steege et al. (2013) fitted a log-series to data provided by a network of plots to estimate the number of species in Amazonia. We applied the same method to our data in appendix 5.3. Its estimation is close to 4000 species in French Guiana: a very unlikely result according to the current expert knowledge and the recent checklist (Molino et al. 2022). The regional species pool does not follow a log-series distribution because of dispersal limitation (Grilli et al. 2012). In other words, the regional community is not a sample of the metacommunity: many of the metacommunity’s species are not present. As a consequence, the log-series estimation of the richness of a regional species pool leads to severe overestimation. For the same reasons, hyperdominance is less pronounced: 4% of the species contain half the trees (apendix 5.4), compared to 1.4% in Amazonia as a whole (ter Steege et al. 2013).

The estimated number of tree species in the 8-million-hectare forest of French Guiana is close to 2200, with a quite wide confidence interval due to the variability in the estimation of both the number of trees in a squared kilometer and the power-law parameter.

As shown in figure 5.1, the fit of the linear model is not perfect. The theory does not address habitat variation, that is well-described in French Guiana (Guitet et al. 2015). The dissimilarity between plot pairs is thus explained by distance and habitat dissimilarity, the latter ignored in the model. Yet, the estimation of is quite robust because the GuyaDiv network covers a wide range of habitats, allowing to cancel out local variability. Adding more plots or describing a few more species in the previous plots may not change significantly since it is obtained from the dissimilarity between plots. Its value 0.103 is in line with that of Krishnamani, Kumar, and Harte (2004) in another tropical forest: it is very small compared to the classical 0.25 of Arrhenius (1921) or 0.263 of Preston (1962). This was discussed by MacArthur and Wilson (1967), chapter 2. The power law applies to embedded scales of the same ecosystem here, in contrast to the usual sets of isolated islands providing the data (Triantis, Guilhaumon, and Whittaker 2012): in our case, the number of species increases less with the area, leading to smaller values.

The critical aspect of the estimation is the accuracy of the starting point of the extrapolation, that mainly depends on the representativeness of the local inventories Again, the self-similarity model assumes that , the number of species per squared kilometer, is the same everywhere. Local, observed values must be understood as variations around the real , that should be estimated by replicating inventories across the whole region. This is of course restricted by the huge resources needed to settle a single one: three replicates are an exceptional amount of data. Paracou, Piste de Saint Elie and Nouragues represent quite well the variability of local richness of the forest of French Guiana. We made a strict selection of the data to count the numbers of species, which are thus lower bounds. Ongoing efforts of botanists may increase a bit the value of , implying a proportional increase in the estimation of the number of species.

A recent work (Molino et al. 2022) lists nearly 1800 species of indigenous trees in French Guiana, based on herbarium collections on the one hand, and on data from the GuyaDiv and GuyaFor plot networks (Engel 2015) on the other. However, this checklist is only a state of the art of our knowledge of the tree flora. Even in the most intensively explored areas, botanists conducting botanical inventories have identified a number of entities that are morphologically distinct from all known species in French Guiana, and which they therefore consider to be still unnamed species. They gave them provisional names (e.g. *Pouteria* sp. A), until more information is available to either recognize species known in other parts of the world, or to describe them and give them a valid name according to the Code of Nomenclature. The GuyaDiv and GuyaFor databases together currently list more than 300 of these unnamed species, but Molino et al. (2022) selected only 144 of them for their checklist, the ones that were best characterized and best illustrated by good quality herbarium specimens. Although it cannot be excluded that some of the other 150-200 unnamed species are in fact simple morphological variants of already described species, they believe that most of them represent distinct species. In other words, the number of known species in French Guiana (named and unnamed) is probably already close to 2000. Furthermore, the available data is very unevenly distributed across the territory. The south and especially the north-west of French Guiana are poorly explored botanically (few inventory plots, relatively few herbarium specimens), while their floras are significantly different from the better inventoried northern and central zones. It is thus very likely that the exploration of these little-known areas will add new species to the list. Therefore, the estimate of 2230 spp. given here seems quite plausible, given the state of our knowledge.

# 5 Appendix

## 5.1 Similarity distance decay

The relation between Sørensen’s similarity and distance is presented in figure 5.1. All pairs of plots more than 800 meters apart (the scale of Paracou’s 0.625-km2 inventory) are shown. The estimation of is not made this way because some locations contain more plots than others so their weight is increased. The technique used in the text of the paper consists of drawing a random plot in each location to estimate , and repeat this process a large number of times to estimate the expectation of .

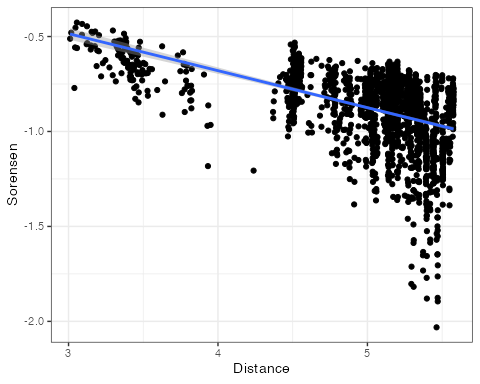


Figure 5.1: Relation between Sørensen’s similarity and the distance between pairs of plots. Both axes are in base-10 logarithms, distances are in meters. Each point is a pair of plots more than 800 m apart, up to 377 km. A linear model is fitted: the slope of the regression is .

## 5.2 Variance of the product of two random variables

Let and two random variables, here the estimators of and .

The variance of their product is

$$

If and are independent (this applies to and ), covariances are 0 and the variance reduces to

$$

## 5.3 Log-series estimation of the number of species

Assuming that the plots are samples of a metacommunity that follows a log-series distribution, the rank-abundance curve can be extrapolated (figure 5.2) following ter Steege et al. (2013).

First, the total number of trees is estimated by extrapolation of the average number of trees per plot. There are close to 260 million trees in French Guiana.

The probability for one of these trees to belong to a given species is obtained by averaging the probability of the species among plots. Each plot is a sample of a local community whose composition is not completely known: for example, many rare species are not in the sample. The observed frequency of a species in a plot is not the probability of the species in the community: frequencies sum up to 1 while the sum of the actual probabilities of observed species, called the sample coverage (Good 1953), sums up to 1 minus that of the unobserved species. The actual probabilities of observed species can be estimated following Chao and Jost (2015), with the *entropart* package (Marcon and Hérault 2015).

The most abundant tree species is *Eperua falcata* with around 8 million trees.

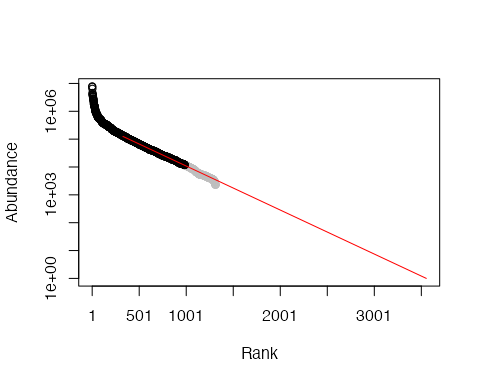


Figure 5.2: Extrapolation of the rank-abundance curve built from the GuyaDiv plots. Extrapolated abundances (in log scale) of observed species are plotted against the rank of their species. The abundances of unobserved species (the red curve) is extrapolated linearly from the center 50% of the distribution of the observed species. The rarest 25%, ignored for the extrapolation, are plotted as grey points.

The estimated number of species according to this model is 3554. This is undoubtedly a severe overestimation, see the discussion section of the paper.

## 5.4 Hyperdominance

Hyperdominance is a characteristic of many distributions of species. Figure 5.3 shows the accumulation of individuals from the most abundant to the rarest species.

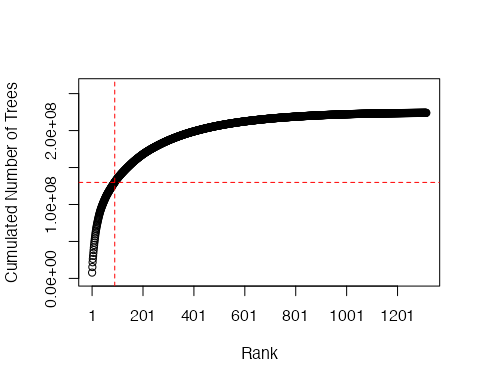


Figure 5.3: Accumulation of the number of individuals from the most abundant to the rarest species. The horizontal line corresponds to half the individuals. The vertical line allows reading the corresponding rank of the species.

Only 90 species, i.e. 4% of their estimated number, contain half the number of trees.

# References

Arrhenius, Olof. 1921. “Species and Area.” *Journal of Ecology* 9 (1): 95–99. <https://doi.org/10.2307/2255763>.

Béguinot, Jean. 2015. “Extrapolation of the Species Accumulation Curve for Incomplete Species Samplings: A New Nonparametric Approach to Estimate the Degree of Sample Completeness and Decide When to Stop Sampling.” *Annual Research & Review in Biology* 8 (5): 1–9. <https://doi.org/10.9734/ARRB/2015/22351>.

Bonal, Damien, Alexandre Bosc, Stéphane Ponton, Jean-Yves Goret, Benoît Burban, Patrick Gross, Jean-Marc Bonnefond, et al. 2008. “Impact of Severe Dry Season on Net Ecosystem Exchange in the Neotropical Rainforest of French Guiana: HIGHER NEP UNDER SEVERE DROUGHT.” *Global Change Biology* 14 (8): 1917–33. <https://doi.org/10.1111/j.1365-2486.2008.01610.x>.

Bongers, Frans, Pierre Charles-Dominique, P-M Forget, and Marc Théry. 2001. *Nouragues: Dynamics and Plant-Animal Interactions in a Neotropical Rainforest*. Vol. 80. Springer Science & Business Media.

Burnham, K. P., and W. S. Overton. 1978. “Estimation of the Size of a Closed Population When Capture Probabilities Vary Among Animals.” *Biometrika* 65 (3): 625–33. <https://doi.org/10.2307/2335915>.

Chao, Anne. 2004. “Species Richness Estimation.” In *Encyclopedia of Statistical Sciences*, edited by N Balakrishnan, C B Read, and B Vidakovic, 2nd ed. New York: Wiley.

Chao, Anne, and Lou Jost. 2015. “Estimating Diversity and Entropy Profiles via Discovery Rates of New Species.” *Methods in Ecology and Evolution* 6 (8): 873–82. <https://doi.org/10.1111/2041-210X.12349>.

Engel, Julien. 2015. “Plot Networks & Teams.” *ATDN Tree Morphospecies Website*. http://atdnmorphospecies.myspecies.info/node/781.

Gárcia Martín, Héctor, and Nigel Goldenfeld. 2006. “On the Origin and Robustness of Power-Law Species-Area Relationships in Ecology.” *Proceedings of the National Academy of Sciences of the United States of America* 103 (27): 10310–15. <https://doi.org/10.1073/pnas.0510605103>.

Good, I. J. 1953. “The Population Frequency of Species and the Estimation of Population Parameters.” *Biometrika* 40 (3/4): 237–64. <https://doi.org/10.1093/biomet/40.3-4.237>.

Gotelli, Nicholas J., and Robert K. Colwell. 2001. “Quantifying Biodiversity: Procedures and Pitfalls in the Measurement and Comparison of Species Richness.” *Ecology Letters* 4 (4): 379–91. <https://doi.org/10.1046/j.1461-0248.2001.00230.x>.

Gourlet-Fleury, Sylvie, Jean Marc Guehl, and Olivier Laroussinie. 2004. *Ecology & Management of a Neotropical Rainforest. Lessons Drawn from Paracou, a Long-Term Experimental Research Site in French Guiana*. Paris: Elsevier.

Grilli, Jacopo, Sandro Azaele, Jayanth R. Banavar, and Amos Maritan. 2012. “Spatial Aggregation and the Speciesarea Relationship Across Scales.” *Journal of Theoretical Biology* 313 (0): 87–97. <https://doi.org/10.1016/j.jtbi.2012.07.030>.

Guitet, Stéphane, Raphaël Pélissier, Olivier Brunaux, Gaëlle Jaouen, and Daniel Sabatier. 2015. “Geomorphological Landscape Features Explain Floristic Patterns in French Guiana Rainforest.” *Biodiversity and Conservation* 24 (5): 1215–37. <https://doi.org/10.1007/s10531-014-0854-8>.

Harte, John, Ann Kinzig, and Jessica Green. 1999. “Self-Similarity in the Distribution and Abundance of Species.” *Science* 284 (5412): 334–36. <https://doi.org/10.1126/science.284.5412.334>.

Harte, John, Sarah Mccarthy, Kevin Taylor, Ann Kinzig, and Marc L. Fischer. 1999. “Estimating Species-Area Relationships from Scale Plot to Landscape Data Using Species Spatial-Turnover.” *Oikos* 86 (1): 45–54. <https://doi.org/10.2307/3546568>.

Hoff, M., G. Cremers, C. Feuillet, and J.-L. de Granville. 1989. “La Banque de Donnees "AUBLET" de l’Herbier Du Centre ORSTOM de Cayenne (CAY).” *Bulletin Du Jardin Botanique National de Belgique / Bulletin van de National Plantentuin van België* 59 (1/2): 171. <https://doi.org/10.2307/3668163>.

Hubbell, Stephen P. 2001. *The Unified Neutral Theory of Biodiversity and Biogeography*. Princeton University Press.

Krishnamani, R., A. Kumar, and John Harte. 2004. “Estimating Species Richness at Large Spatial Scales Using Data from Small Discrete Plots.” *Ecography* 27 (5): 637–42. <https://doi.org/10.1111/j.0906-7590.2004.03790.x>.

MacArthur, Robert H., and Edward O. Wilson. 1967. “The Theory of Island Biogeography.” In *Monographs in Population Biology*. Vol. 1. Princeton University Press.

Marcon, Eric, and Bruno Hérault. 2015. “Entropart, an R Package to Measure and Partition Diversity.” *Journal of Statistical Software* 67 (8): 1–26. <https://doi.org/10.18637/jss.v067.i08>.

Mirabel, Ariane, Bruno Hérault, and Eric Marcon. 2020. “Diverging Taxonomic and Functional Trajectories Following Disturbance in a Neotropical Forest.” *Science of The Total Environment* 720: 137397. <https://doi.org/10.1016/J.SCITOTENV.2020.137397>.

Mirabel, Ariane, Eric Marcon, and Bruno Hérault. 2021. “30 Years of Postdisturbance Recruitment in a Neotropical Forest.” *Ecology and Evolution* 11 (21): 14448–58. <https://doi.org/10.1002/ece3.7634>.

Molino, Jean-François, and Daniel Sabatier. 2001. “Tree Diversity in Tropical Rain Forests: A Validation of the Intermediate Disturbance Hypothesis.” *Science* 294 (5547): 1702–4. <https://doi.org/10.1126/science.1060284>.

Molino, Jean-François, Daniel Sabatier, Julien Engel, Frame, D., Lucas, E.J., Delprete, P.G., Grenand, Pierre, et al. 2022. “An Annotated Checklist of the Tree Species of French Guiana, Including a Vernacular Nomenclature.” *Adansonia* submitted.

Preston, F. W. 1962. “The Canonical Distribution of Commonness and Rarity: Part I.” *Ecology* 43 (2): 185–215. <https://doi.org/10.2307/1931976>.

R Core Team. 2022. *R: A Language and Environment for Statistical Computing*. Vienna, Austria: R Foundation for Statistical Computing.

Shen, Tsung-Jen, Anne Chao, and Chih-Feng Lin. 2003. “Predicting the Number of New Species in a Further Taxonomic Sampling.” *Ecology* 84 (3): 798–804. <https://doi.org/10.1890/0012-9658(2003)084[0798:PTNONS]2.0.CO;2>.

Slik, J. W. Ferry, Víctor Arroyo-Rodríguez, Shin-Ichiro Aiba, Patricia Alvarez-Loayza, Luciana F. Alves, Peter S. Ashton, Patricia Balvanera, et al. 2015. “An Estimate of the Number of Tropical Tree Species.” *Proceedings of the National Academy of Sciences of the United States of America* 112 (24): 7472–77. <https://doi.org/10.1073/pnas.1423147112>.

Sørensen, T. 1948. “A Method of Establishing Groups of Equal Amplitude in Plant Sociology Based on Similarity of Species Content and Its Application to Analyses of the Vegetation on Danish Commons.” *Biologiske Skrifter*, Biologiske skrifter, 5 (4): 1–34.

ter Steege, Hans, Nigel C. A. Pitman, Daniel Sabatier, Christopher Baraloto, Rafael P. Salomão, Juan Ernesto Guevara, Oliver L. Phillips, et al. 2013. “Hyperdominance in the Amazonian Tree Flora.” *Science* 342 (6156): 1243092. <https://doi.org/10.1126/science.1243092>.

ter Steege, Hans, Paulo I. Prado, Renato A. F. de Lima, Edwin Pos, Luiz de Souza Coelho, Diogenes de Andrade Lima Filho, Rafael P. Salomão, et al. 2020. “Biased-Corrected Richness Estimates for the Amazonian Tree Flora.” *Scientific Reports* 10 (1): 10130. <https://doi.org/10.1038/s41598-020-66686-3>.

Triantis, Kostas A., François Guilhaumon, and Robert J. Whittaker. 2012. “The Island Speciesarea Relationship: Biology and Statistics.” *Journal of Biogeography* 39 (2): 215–31. <https://doi.org/10.1111/j.1365-2699.2011.02652.x>.

Volkov, Igor, Jayanth R. Banavar, Stephen P. Hubbell, and Amos Maritan. 2003. “Neutral Theory and Relative Species Abundance in Ecology.” *Nature* 424 (6952): 1035–37. <https://doi.org/10.1038/nature01883>.

Williamson, Mark, Kevin J. Gaston, and W. M. Lonsdale. 2001. “The Speciesarea Relationship Does Not Have an Asymptote!” *Journal of Biogeography* 28 (7): 827–30. <https://doi.org/10.1046/j.1365-2699.2001.00603.x>.