

1 Article

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# Endemics and cosmopolitans: application of 3 statistical mechanics to the dry forests of Mexico

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10 **Abstract:** Data on the seasonally dry tropical forests of Mexico have been examined in the light of  
11 statistical mechanics. The results suggest a division into two classes of species. There are drifting  
12 populations of a cosmopolitan class capable of existing in most dry forest sites; these have a  
13 statistical distribution previously only observed (globally) for populations of alien species. A high  
14 proportion of species found only at a single site are endemic and these prefer sites comparatively  
15 low in species richness.16 **Keywords:** statistical mechanics; resource partitioning; distribution of species; seasonally dry  
17 tropical forest; biotic resistance18 

## 1. Introduction

19 The techniques of statistical physics have been applied to problems of community structure  
20 with some success, primarily in achieving an understanding of the principles underlying the rather  
21 universal form of the species abundance distribution. This was traced to the rate of change of a  
22 population being proportional to the number of individuals each species contains [1, 2, 3, 4]. A rather  
23 more surprising application is to the distribution of alien species over the globe, where it was found  
24 that the number of species at  $n$  sites to which they are alien is exponentially distributed with  $n$ . At  
25 the same time, the distribution of the number of sites as a function of the number of species present  
26 is consistent with being drawn from an underlying exponential probability distribution. Beyond  
27 that, the number of pairs of sites sharing  $p$  species is exponentially distributed with  $p$  [5]. The  
28 relationship between these various exponential probability distributions was elucidated in [6]. In [5]  
29 it is speculated that similar principles may apply more generally to community assembly, for there  
30 are examples of the number of species with the number of sites occupied being distributed  
31 exponentially in populations of heteroflagellates and of tree species in the seasonally dry tropical  
32 forests of Mexico. Having clarified in [6] the roles of the alien species exponentials, we have returned  
33 to the dry forests of Mexico, where the data [7] contain not only the exponential distribution of the  
34 number of species with the number of sites (which first drew our attention) but also list the number  
35 of species at each site and beyond that the number of species common to each pair of sites. These  
36 three aspects of the data set require a category of cosmopolitan species, distributed in accord with  
37 the model for alien species, and in addition a category of endemic species found preferentially at  
38 high rank sites, those that are relatively species poor.39 

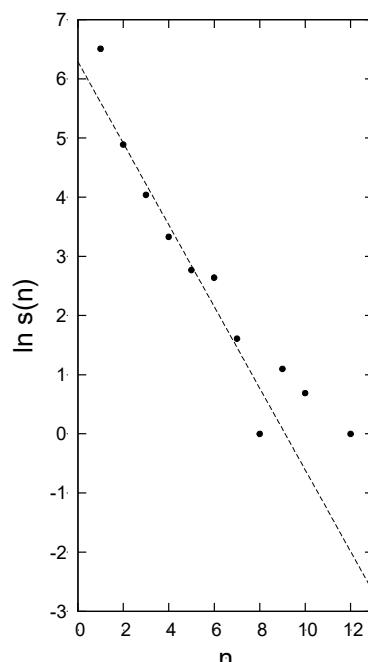
## 2. The underlying model

40 An exponential distribution of the number of species with the number of sites at which the  
41 species are found can be described using simple statistical mechanics. A given resource is to be  
42 divided into a given number of pieces, the cuts to be made at random. The most probable  
43 configuration is an exponential distribution of the number of pieces with their length. In ecology,  
44 this is known as MacArthur's broken stick [8], in the statistical mechanics of gases a microcanonical

45 ensemble. It is also the maximum entropy solution for a uniform prior. If the same resource is also  
 46 divided between the different sites in the same sort of way, the distribution of the number of sites  
 47 with the number of species each site contains is, for our particular application, drawn from an  
 48 underlying exponential distribution. These exponential distributions are themselves sufficient to  
 49 generate the exponential distribution of the number of pairs (and higher multiplets) of sites with the  
 50 number of species shared, without any further assumptions [6]. It is worth remarking that the  
 51 placing of the cuts could be accomplished statically (as in MacArthur's broken stick) or dynamically,  
 52 with species accepted and rejected from sites and sites growing and contracting in receptivity;  
 53 described by the appropriate master equations. The original application of these ideas was to the  
 54 statistical mechanics governing the global distribution of alien species, but the data of [7] invite their  
 55 application to the structure of the seasonally dry tropical forests of Mexico.

56 **3. Relevant aspects of the data**

57 The data presented in [7] comprise 917 species from 20 different widely scattered sites in  
 58 Mexico. Of these, 670 are found at one site only and no species are found at more than 12 sites. The  
 59 richest site contains 124 species. The distribution of the number of species  $s(n)$  found at  $n$  sites agrees  
 60 well with an exponential for  $n > 1$  (Fig. 5 of [7], Fig. 1 of the present paper) and the number of pairs  
 61 sharing  $p$  species in common is consistent with an exponential distribution in  $p$  (see Fig. 3, upper  
 62 panel).



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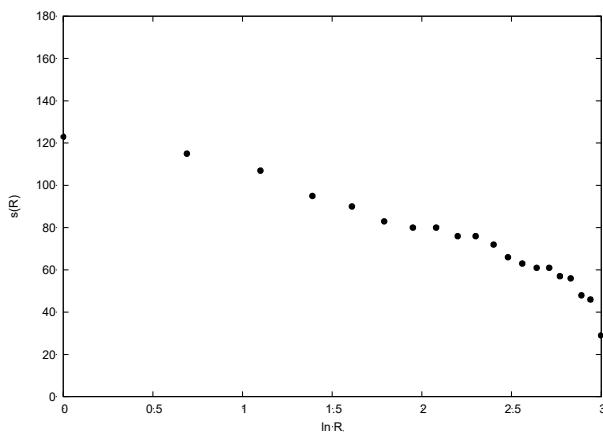
64 **Figure 1.** The natural logarithm of the number of species found at  $n$  sites in [7] is plotted against  $n$ .  
 65 For  $n > 1$  the distribution is consistent with an exponential. Note that the statistics become risible  
 66 beyond  $n \sim 7$ . For  $n=1$  there is an excess of  $\sim 400$  above the extrapolated exponential. We argue that  
 67 these must be largely *endemics*.

68 However, the species richness of the individual sites (Fig. 2, upper panel) is not consistent with  
 69 having been drawn from an underlying exponential probability. The most probable receptivity (or  
 70 species richness) of a site of rank  $R$  is proportional to  $\ln R_0 - \ln R$ , where the richest site is rank 1 and  
 71 for a simple exponential  $R_0$  is the number of sites +1, see [6]. For 20 sites and a pure exponential  
 72  $\ln R_0 = 3.04$ . In Fig 2 (upper panel) we plot the number of species  $s(R)$  against  $\ln R$  for the data. It is  
 73 a reasonable approximation to a straight line, but extrapolates to zero species at  $\ln R \approx 4.8$ . It is  
 74 certainly consistent with a truncated exponential, where no site has less than  $\sim 40$  species and such a  
 75 modification can also be handled with the methods of statistical mechanics. However, if there are no  
 76 sites with fewer species than  $\sim 40$ , it would seem that there will be fewer pairs of sites with a small

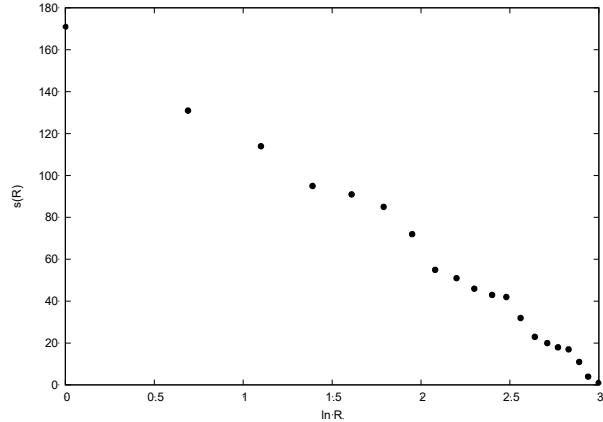
77 number of shared species than obtaining for an exponential probability that is not truncated. This is  
 78 indeed the case; in Fig. 3 (lower panel) we plot the number of pairs of sites as a function of the  
 79 number of species in common, for relative receptivity proportional to  $4.8 - \ln R$ . This distribution is  
 80 grossly different from that of the data shown in Fig. 3 (upper panel) and also that modelled  
 81 assuming relative probabilities proportional to  $3.04 - \ln R$ , shown in Fig. 3 (middle panel). The latter  
 82 represents an exponential site probability distribution that is not truncated, yields a distribution of  
 83 the number of pairs consistent with an exponential as a function of the number of common species  
 84 and agrees with the data. (The way in which the model distributions in Figs. 2 & 3 were generated is  
 85 relegated to a discussion in Appendix A.)

86 The conundrum presented by these data can be summarised rather simply. The distributions in  
 87 Fig. 2 upper and lower panels agree, but do not agree with Fig. 2, middle panel. However, the  
 88 distributions in Fig. 3 upper and middle panels agree but do not agree with Fig. 3, lower panel.

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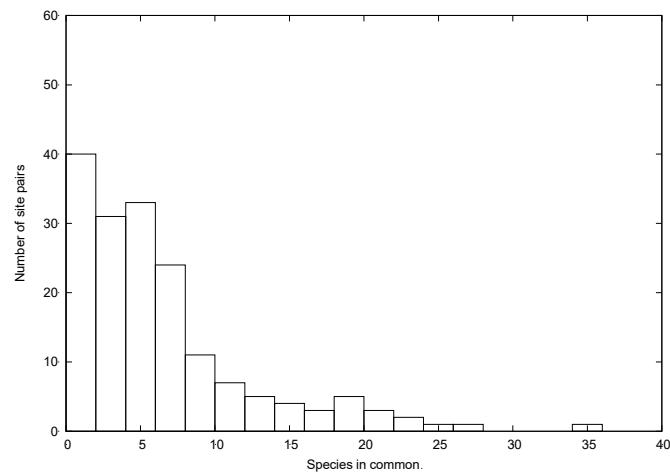


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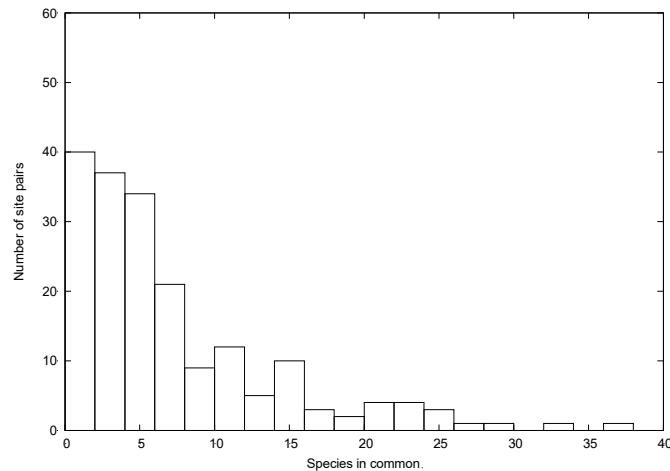
92 **Figure 2.** The number of species  $s(R)$  at sites of rank  $R$  plotted against  $\ln R$ . **Upper panel:** The data  
 93 in [7], where the highest rank sites have occupancy ~40 species. **Middle panel:** The distribution for

94 an underlying exponential for *cosmopolitan* species; the highest rank sites would have negligible  
 95 population. **Lower panel:** The distribution assuming that sites have receptivity for cosmopolitans  
 96 similar to the data.

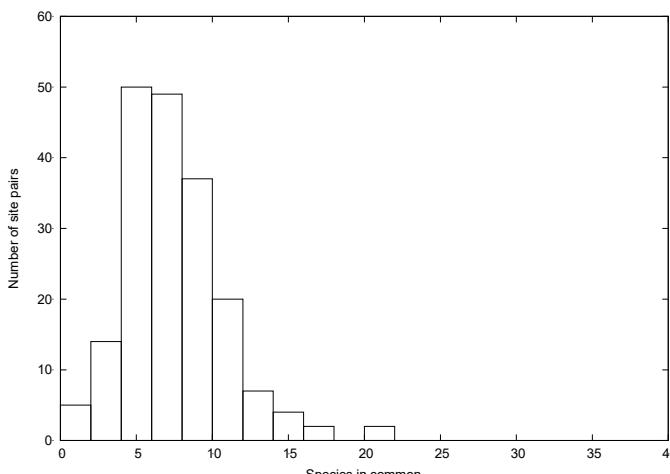
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**Figure 3.** The number of pairs of sites as a function of the number of species in common. Only species found at two or more sites contribute. **Upper panel:** The data of [7]. **Middle panel:** The model distribution for cosmopolitan receptivities determined by a simple exponential underlying probability; cf Fig. 2. **Lower panel:** The distribution assuming that the cosmopolitan species are governed by a truncated distribution, as in the lower panel of Fig. 2. The data in Fig. 3 upper panel agree with the middle panel but not with the lower.

106 **3. Disentangling the conundrum**

107 The distribution of  $s(n)$  with  $n$ , shown in Fig. 1, is consistent with an exponential for  $n > 1$ .  
108 Extrapolating back to  $n = 1$  gives 270 species at just one site, yet in the data there are 670. Thus 400 of  
109 these cannot be part of the exponential distribution characteristic of cosmopolitans. At the same time  
110 it should be remembered that only species for  $n > 1$  appear in the distribution of pairs. This suggests  
111 that the distribution of site receptivity with rank be divided into two classes: for cosmopolitans an  
112 exponential that is not truncated, with receptivity tending to zero as  $R \rightarrow R_0$  (where  $R_0 \sim 21$ ), but for  
113 endemics a different distribution, given at least approximately by the difference between the upper  
114 and middle panels of Fig. 2. This difference is significantly greater than zero for  $\ln R \gtrsim 1.5$  and  
115 grows with increasing rank. The sum of endemics over all ranks must add up to 400 species. This  
116 could be achieved by letting all sites have the same receptivity (~20) but the difference is better  
117 represented by letting sites of rank  $R$  have receptivity approximately  $2R$ , so that the site of rank 20  
118 has receptivity 40 for endemics. High rank sites are of low species richness; this pattern corresponds  
119 to endemic receptivity greatest for those sites poor in cosmopolitan species.

120 It should of course be noted that, with only 917 species in the data sample, the statistics are  
121 barely adequate to establish the division into the two classes of cosmopolitan and endemic species;  
122 there is no hope of finding finer structure. It is, however, intriguing that the distribution of  
123 receptivities for endemics is such that the overall distribution of receptivities is consistent with being  
124 drawn from a (truncated) exponential.

125 **4. Discussion and conclusions**

126 The data of [7] make available the distribution of the number of species with the number of sites  
127 at which they are found, the number of species found at each site and the number of pairs of sites as  
128 a function of the number of species shared. These distributions are consistent with cosmopolitan  
129 species (those capable of existing in more than one site) being distributed according to a statistical  
130 mechanics of division of some resource at random and the number of species at sites of any given  
131 rank being drawn from an underlying exponential reflecting division among sites of that same  
132 resource. This is a second example of the structures first revealed, for alien species, in [5] and treated  
133 most completely in [6]. (Note: the reader familiar with [5] and [6] may recall that the population  
134 distribution over sites is consistent with being drawn from an underlying exponential distribution  
135 that is not truncated. In those data all species are alien to all sites; there are no *endemics*.)

136 From the point of view of community assembly and population dynamics, the surprising  
137 feature is that the rate at which a given species loses or gains a site must be independent of the  
138 number already occupied. Similarly the rate at which a site gains or loses receptivity (in a dynamical  
139 interpretation) for cosmopolitan species must be independent of that receptivity. In the language of  
140 Maximum Entropy, these correspond to uniform *priors*.

141 Beyond that, there is evidence for a different dynamic operating in this environment. There are  
142 also *endemic* species, each incapable of surviving outside of a single site. The distribution of the  
143 number of endemic species over sites is markedly different from the receptivities for the  
144 cosmopolitans. So far as one can extract anything further from these data, there seems to be an  
145 anti-correlation between receptivities for cosmopolitans and for the endemic species. Thus this study  
146 has further illuminated the application of statistical mechanics to population dynamics and  
147 community assembly and also suggested an ecologically interesting aspect of interactions between  
148 endemic and cosmopolitan species, perhaps a form of biotic resistance.

149 **Conflicts of Interest:** The authors declare no conflict of interest

150 **Appendix A**

151 The underlying idea is that the distribution of the number of species with the number of sites at  
152 which they are found is an exponential generated by subdividing some underlying resource and that  
153 the distribution of the number of sites as a function of their rank is drawn from an underlying  
154 exponential generated by subdividing that same resource along a different axis. Envisage a grid with

155 species identifiers on one axis and site identifiers along the other. If a given species is found at a  
156 given site, that intersection has value 1. If a given species is not at that given site, that intersection  
157 has value zero. The sum of all elements represents the resource and was called the *footprint* in [6].  
158 The grid must be populated according to some scheme that generates the exponential  $s(n)$  and  
159 receptivities or rank abundance consistent with having been drawn from an underlying exponential  
160 distribution. Once the grid has been so populated the number of pairs of sites as a function of the  
161 number of species in common is easily generated by interrogating the grid.

162 There are various ways of populating the grid, listed in [6]. For the purposes of this note, we  
163 have populated the grid in the following way. First, for a given exponential distribution of  $s(n)$  the  
164 species are allocated numbers such that the first  $s(1)$  species are to be assigned to one site only, the  
165 next  $s(2)$  are to be assigned to two sites only and so on. This step is trivial; less trivial is how the  
166 species are assigned to particular sites. The sites we label by rank and in assigning a given species to  
167 a site, the recipe is very simple. Each site of rank  $R$  has relative probability  $\ln R_0 - \ln R$  and a species  
168 is allocated to an empty site at random, according to the appropriately normalised probabilities. For  
169 the case of a pure exponential underlying the populations of 20 sites,  $\ln R_0$  has value 3.04 ( $\ln 21$ ) and  
170 this value was used to generate Figs. 2 and 3, middle panels. The data we are discussing (Fig. 2,  
171 upper panel) suggest a truncated exponential with  $\ln R_0 \sim 4.8$ ; hence Figs. 2 and 3, lower panels.

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