

A general framework for measuring diversity

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Diversity measurement spans disciplines

- **Ecology** (degree of variation of life)
- **Population genetics** (expected heterozygosity)
- **Information theory** (amount of uncertainty in a message)
- **Physics** (entropy in thermodynamics)
- **Economics** (amount of income concentrated in highest earners)

Outline





- Part 1: Measuring diversity, ignoring species similarity
- Part 2: Measuring diversity, incorporating species similarity

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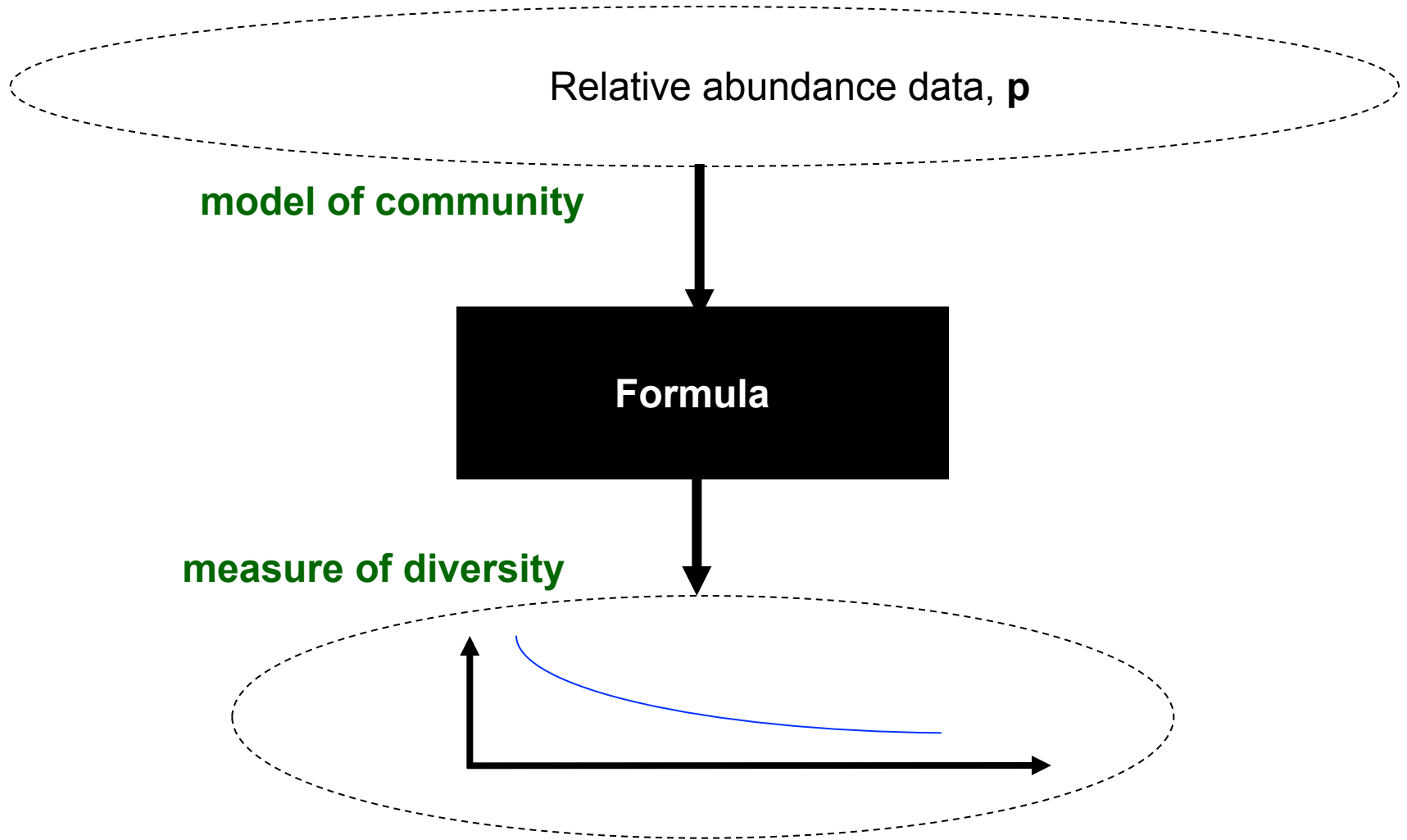
Quantifying diversity

- Richness: How many species?

	3	100	1000
	3	10	1
	3	1	1
	3	1	1

- All sites have 4 species – how do we distinguish them?
- Ans: Include relative contribution of a species to the community
- Diversity is a relationship between richness and abundance
- Key ideas: richness, evenness and dominance

Quantifying diversity



Quantifying diversity

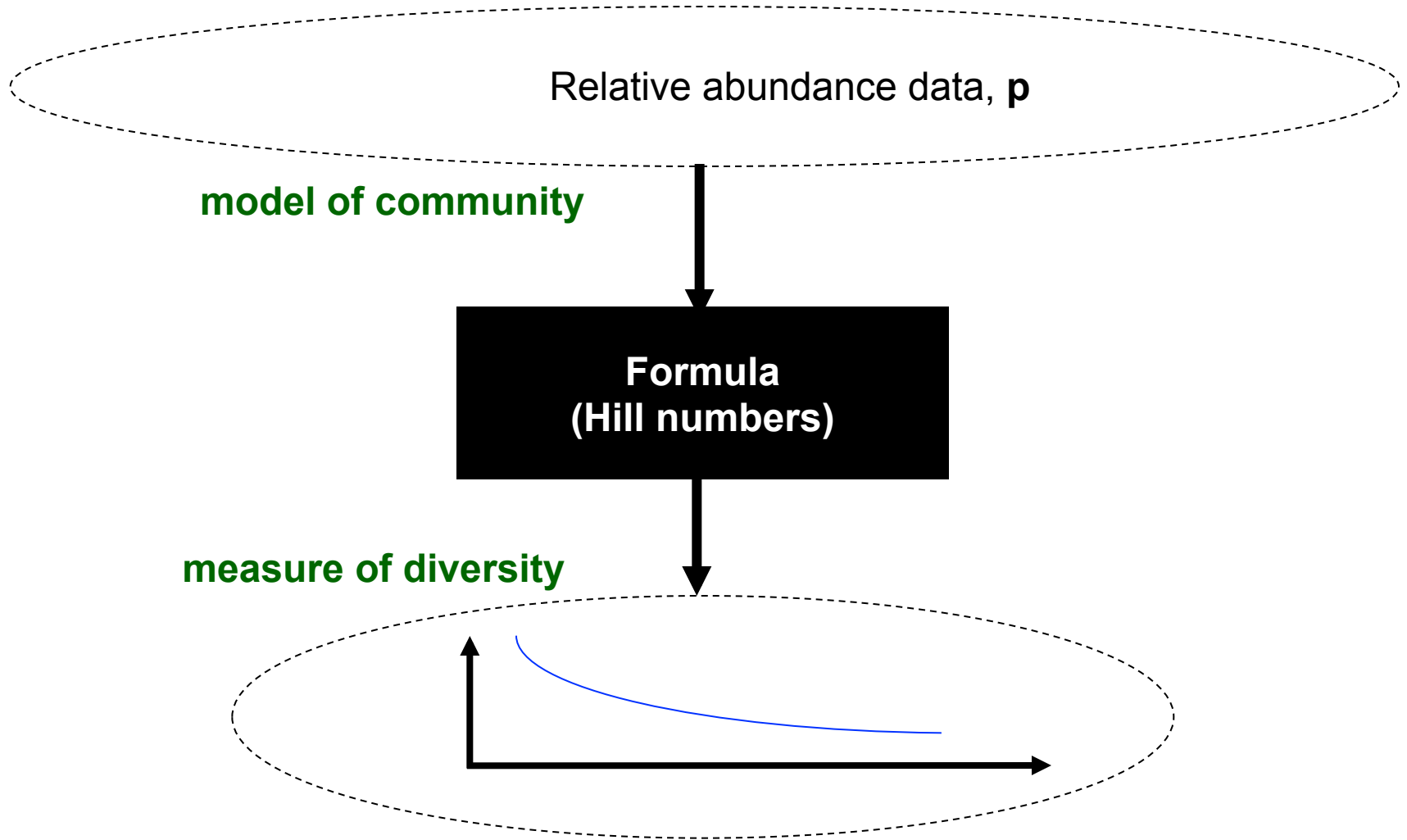
Relative abundance data, \mathbf{p}

$$\mathbf{p} = \begin{pmatrix} p_1 \\ \vdots \\ p_n \end{pmatrix}$$

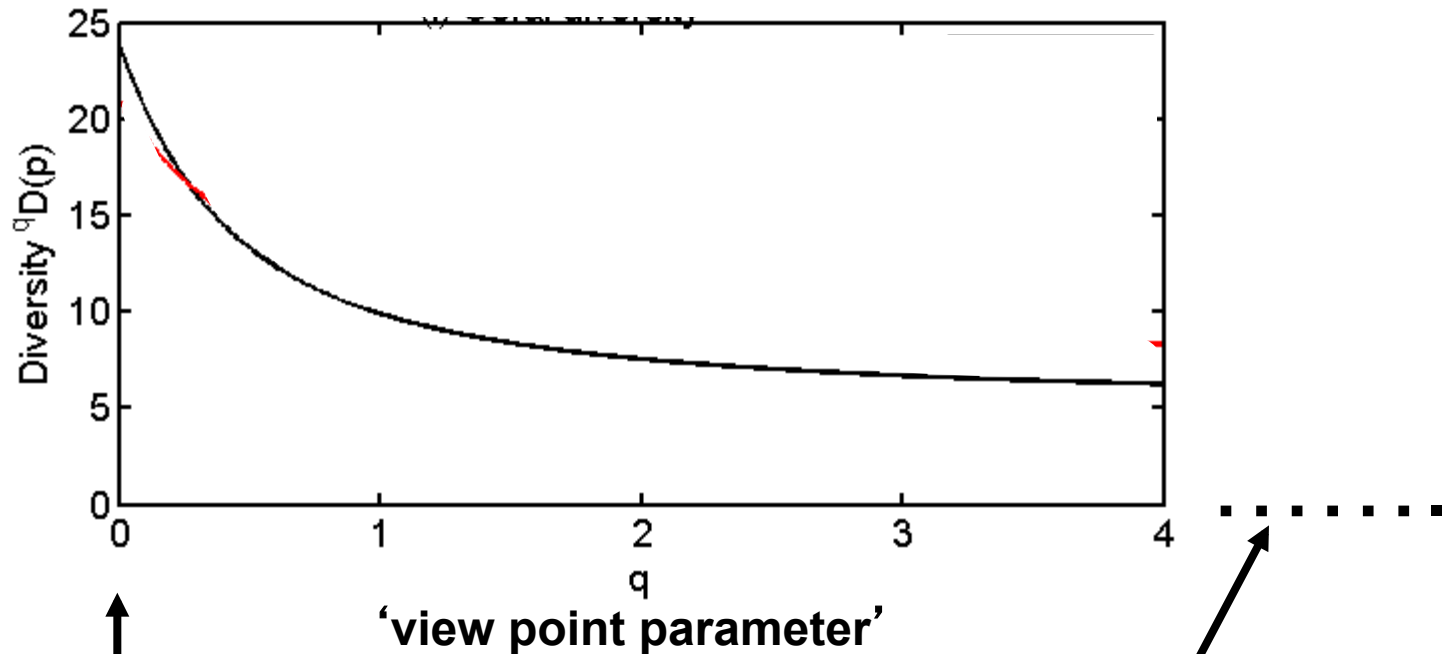
p_i = relative frequency,
or relative abundance,
of the i th species

$$p_i \geq 0, \quad \sum p_i = 1$$

Quantifying diversity



Diversity profile



$q=0$, species richness
rare species are important

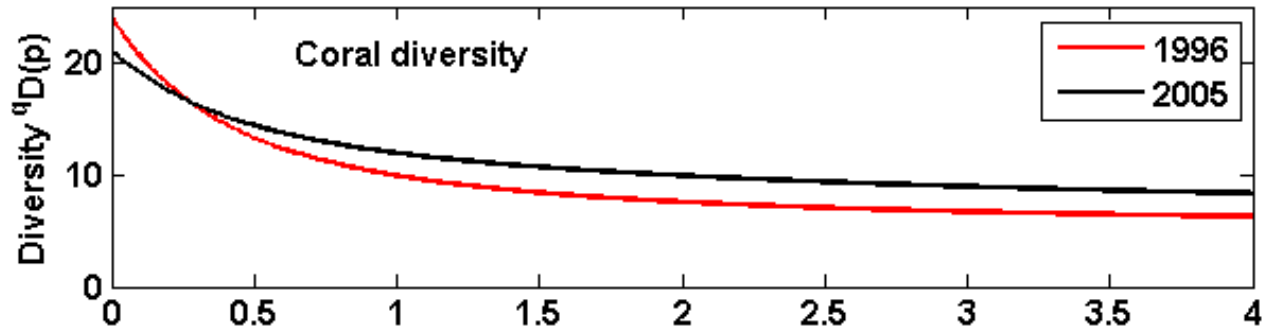
$q=\text{infinity}$, 1/Berger-Parker
rare species are unimportant

‘Importance of evenness’

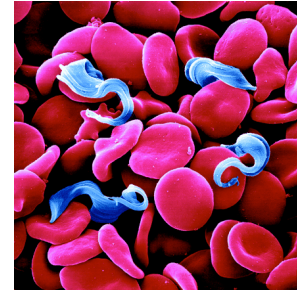
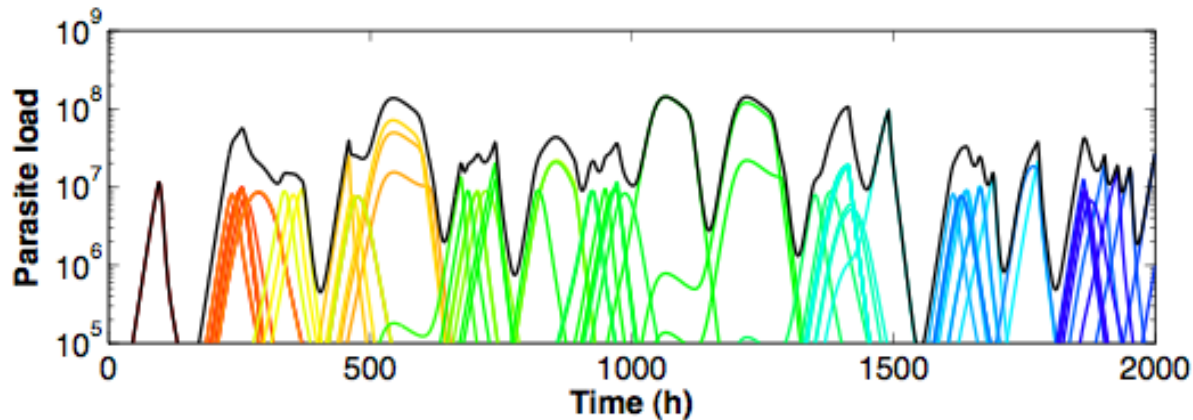
Comparing communities using diversity profiles

1996 community was more rich in species, but less even

Understorey is more diverse, unless we care only about dominance.

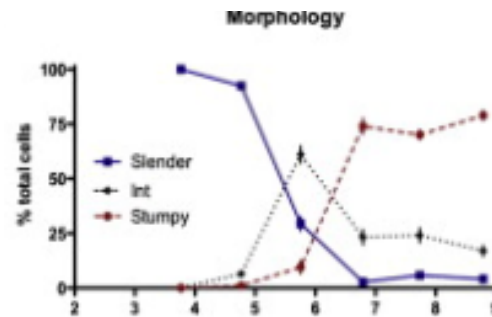
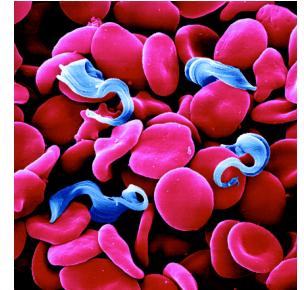
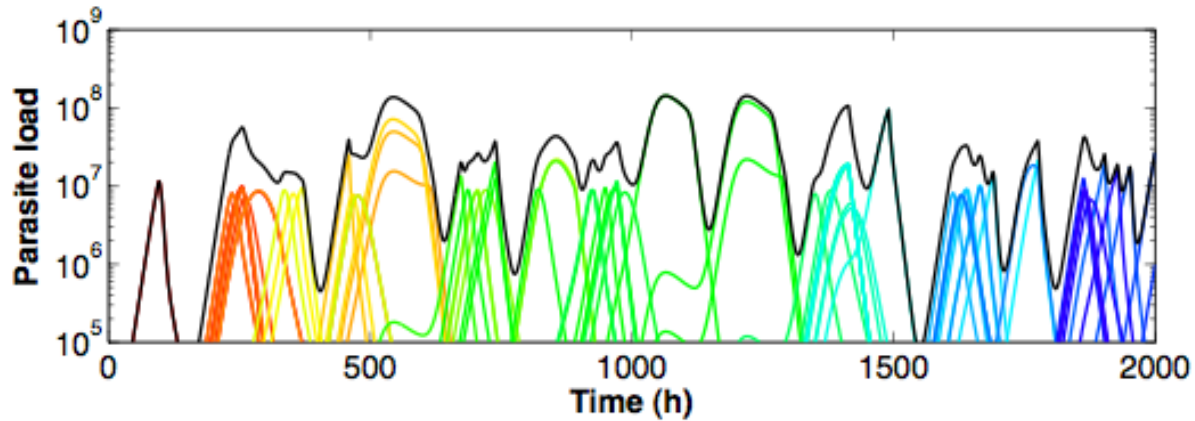


Trypanosome infections and the role of antigenic diversity?



How is antigenic diversity expressed and how does it power trypanosome persistence and survival?

Trypanosome infections and the role of antigenic diversity?



Outline

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What are some of the limitations of Hill numbers

- “...associated with the idea of diversity is the concept of ‘distance’ i.e. some measure of the dissimilarity of the resources in question”

OECD Handbook on biodiversity valuation: A guide for policy makers

- “A community of ten species of barnacle should clearly be less diverse than a community of ten very different species”

The essence of a point made by E.C. Pielou, Ecological Diversity

- There is not always a good notion of what constitutes a species e.g. microbial communities

Quantifying diversity

Similarity data, \mathbf{Z}

Abundance data, \mathbf{p}

model of community

$n \times n$ matrix (n = number of species)

Z_{ij} = similarity between i th and j th species

totally dissimilar $\rightarrow 0 \leq Z_{i,j} \leq 1 \leftarrow$ *identical*

Example

This model assumes that distinct species are totally dissimilar

$$\mathbf{Z} = \begin{pmatrix} 1 & 0 & \dots & 0 \\ 0 & 1 & \ddots & \vdots \\ \vdots & \ddots & \ddots & 0 \\ 0 & \dots & 0 & 1 \end{pmatrix}$$

Quantifying diversity

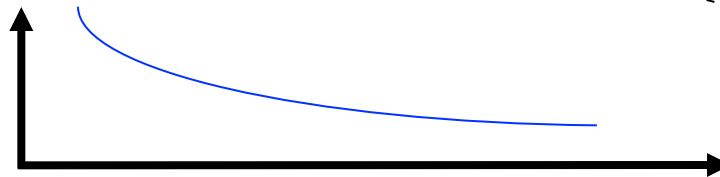
Similarity data, \mathbf{Z}

Abundance data, \mathbf{p}

model of community

$${}^q D^{\mathbf{Z}}(\mathbf{p}) = \left(\sum_{i:p_i > 0} p_i (\mathbf{z}\mathbf{p})_i^{q-1} \right)^{\frac{1}{1-q}}$$

measure of diversity



Example: Butterfly data in the Ecuadorian rainforest

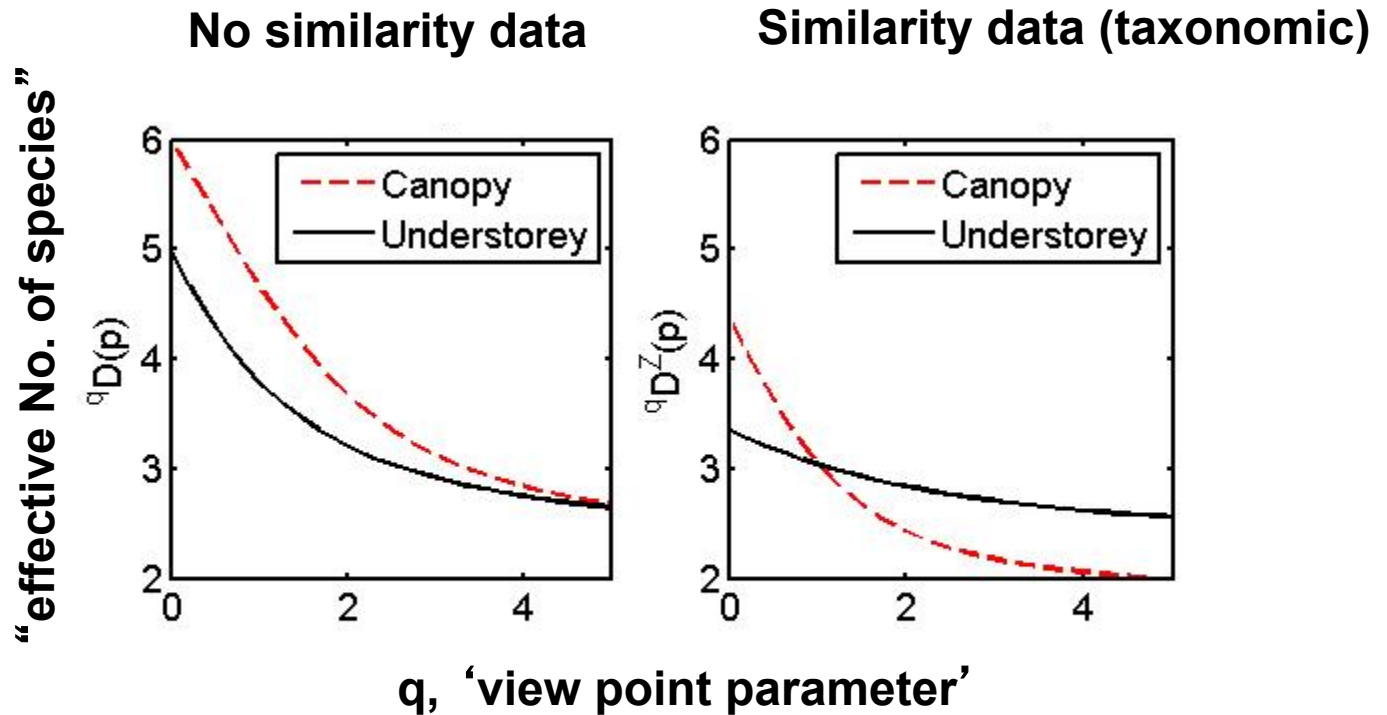
**Abundance data of Charaxinae
Butterflies at a rainforest site
in Ecuador**

Species	Canopy	Understorey
<i>Prepona laertes</i>	15	0
<i>Archaeoprepona demophon</i>	14	37
<i>Zaretis itys</i>	25	11
<i>Memphis arachne</i>	89	23
<i>Memphis offa</i>	21	3
<i>Memphis xenocles</i>	32	8

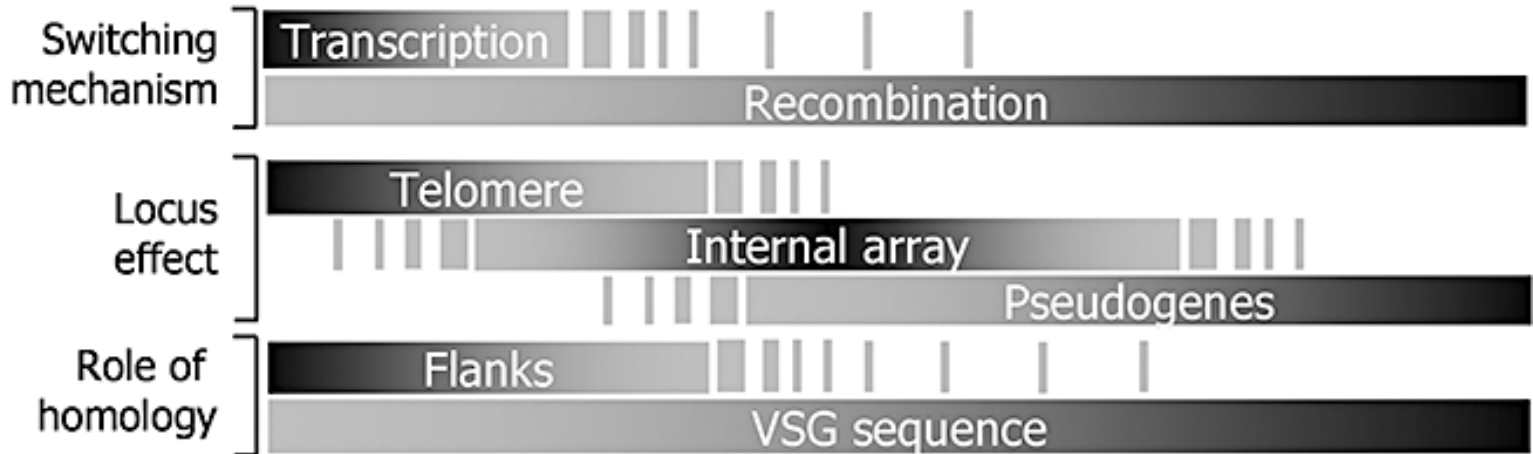
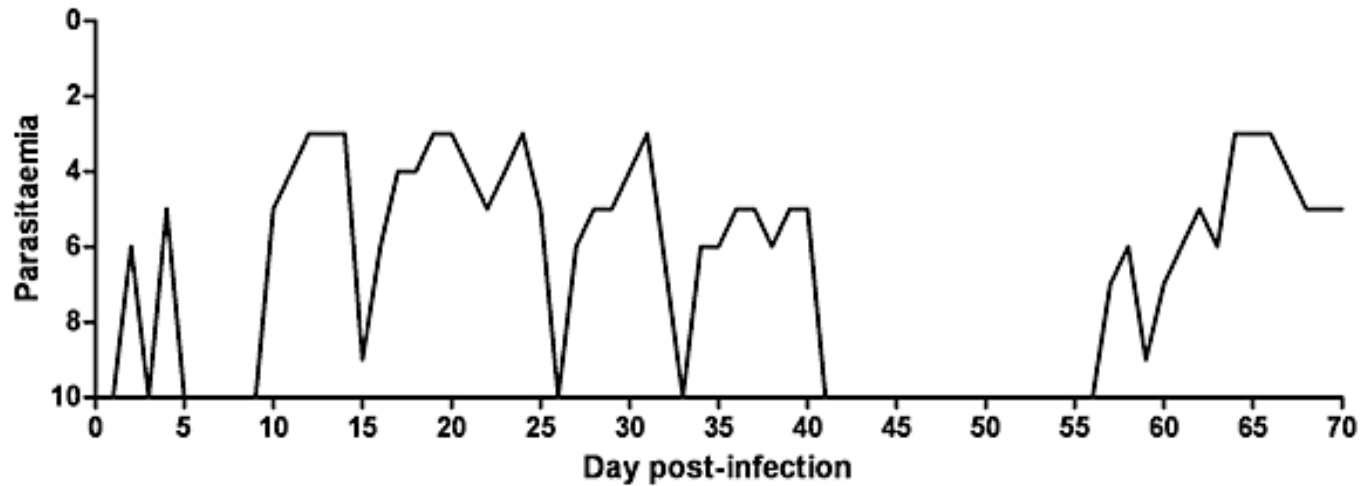
Taxonomic similarity matrix

$$Z_{ij} = \begin{cases} 0 & \text{if of different genera} \\ 0.5 & \text{if different but congeneric} \\ 1 & \text{if } i = j, \end{cases}$$

Butterfly data in the Ecuadorian rainforest



Trypanosome infections and similarity



Microbe communities: notion of a species is problematic

- Expected similarity between a randomly chosen pair of individuals:

$$1/2 D^Z(p) = \mu_2$$

- Now consider $q > 2$ (whole number). Given q individuals of species i_1, i_2, \dots, i_q then a measure of group similarity is:

$$Z_{i_1 i_2} Z_{i_1 i_3} \cdots Z_{i_1 i_q}$$

- Let μ_q be the expected similarity of a randomly chosen group of q individuals (sampled with replacement).
Then

$${}^q D^Z(p) = \mu_q^{1/(1-q)}$$

Answering the common criticisms

- Diversity can mean too many different things
 - We can separate meanings by choosing different Z
- Too many diversity measures have been proposed
 - Many of them are unified under the umbrella of ${}^qD^Z$
- Diversity measures produce meaningless numbers
 - Effective numbers produce meaningful numbers
- A single number carries little information
 - Draw a diversity profile
- Diversity measures are too dependent on the notion of species
 - These behave proportionately when species boundaries are changed
- The varying differences between species are ignored
 - Not here

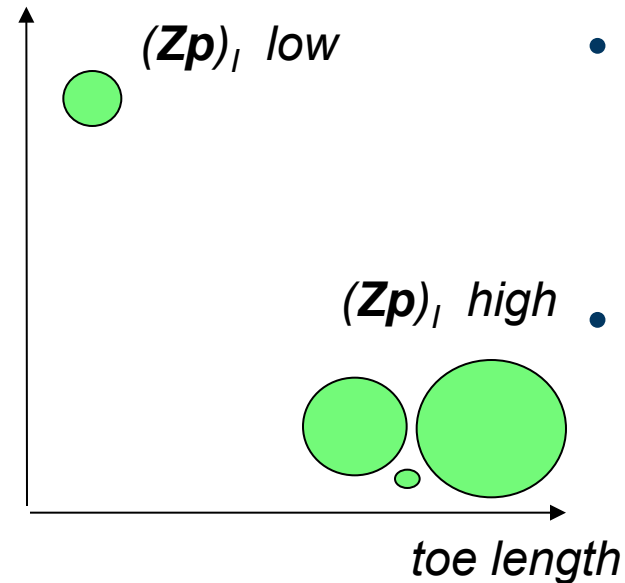
Acknowledgements to....



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Similarity-sensitive diversity measures

beak
length



- The ordinariness of the i -th species is

$$(Zp)_i = \sum_{j=1}^S Z_{ij} P_j$$

- Average ordinariness of an individual within the community

$$\sum_{i=1}^S p_i (Zp)_i$$

which measures lack of diversity. So one measure of diversity is

$$1 / \sum_{i=1}^S p_i (Zp)_i$$