How an invariant from category theory solves a problem in mathematical ecology

Tom Leinster

 $\mathsf{Glasgow}/\mathsf{EPSRC}$

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1. Magnitude (the invariant from category theory)

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2. Diversity (especially biological diversity)

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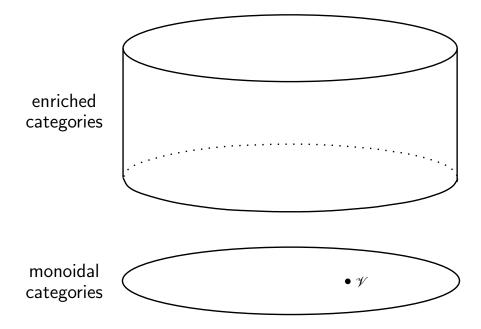
2. Diversity (especially biological diversity)

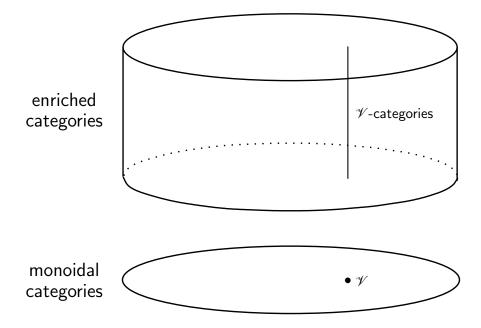
3. How to maximize diversity (the problem and its solution)

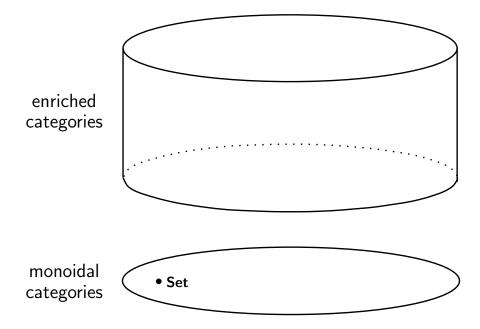
1. Magnitude

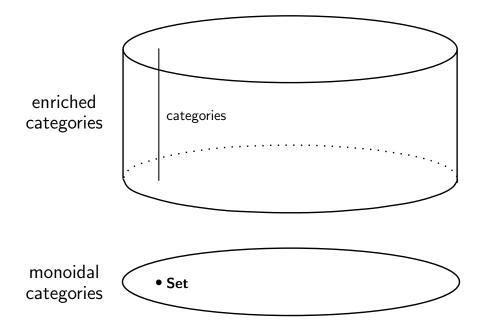


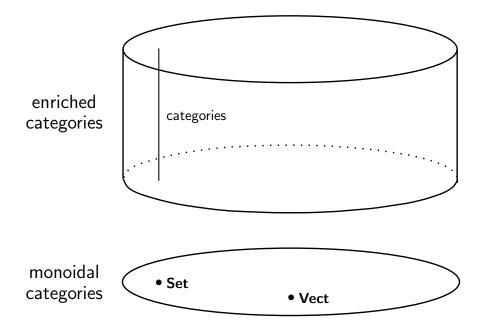


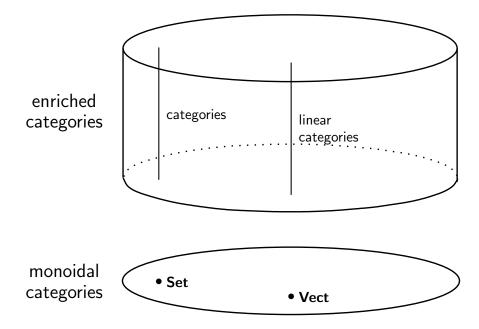


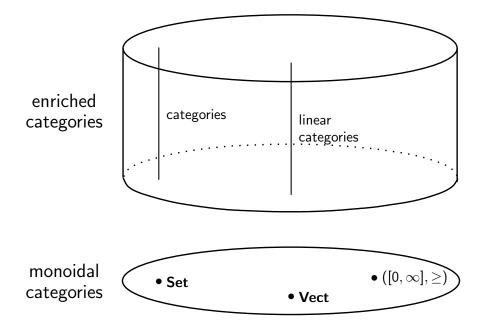


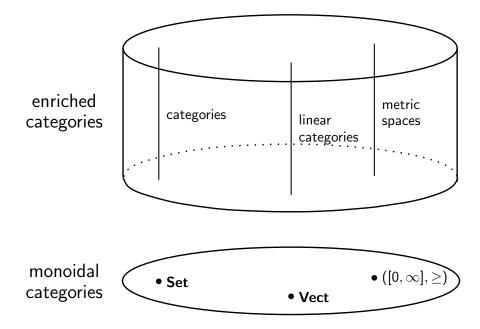


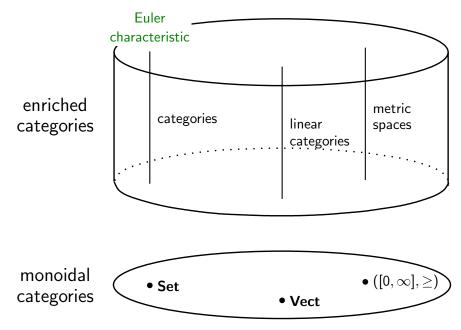


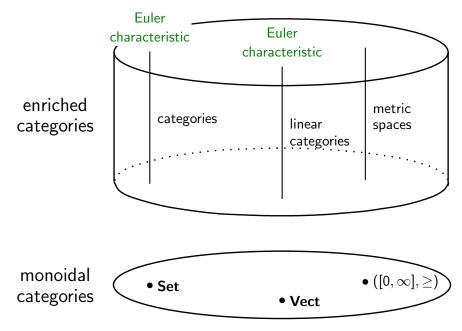


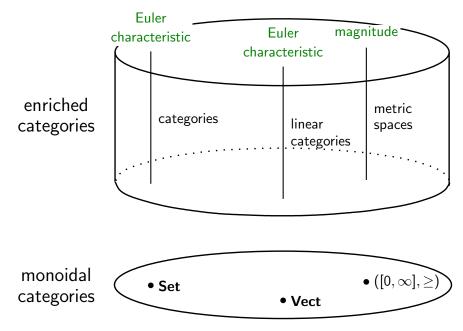


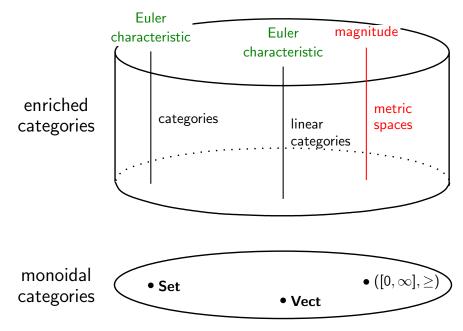












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for any weighting \mathbf{w} .

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Example: Let $A = \{a_1, \ldots, a_n\}$ with $d(a_i, a_j) = \infty$ for all $i \neq j$. Then |A| = n.

2. Diversity

joint with Christina Cobbold (Glasgow)

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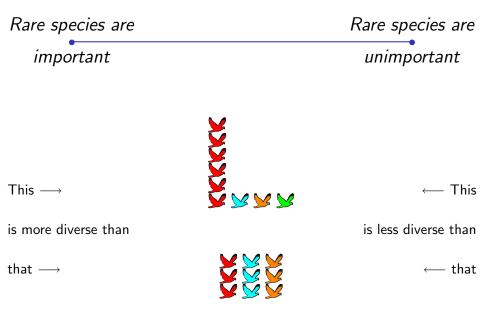
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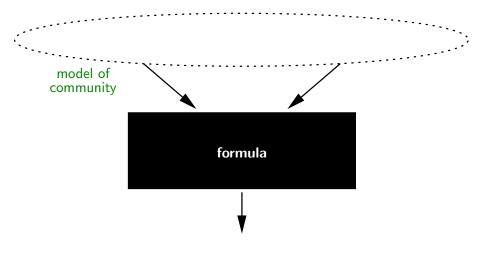
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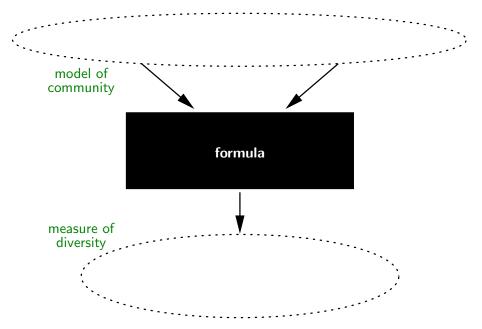
is less diverse than

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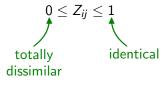
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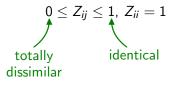
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$$n \times n \text{ matrix } (n = \text{ number of species})$$

$$Z_{ij} = \text{similarity between } i\text{th and } j\text{th species} = Z_{ji}$$

$$0 \le Z_{ij} \le 1, \ Z_{ii} = 1$$

$$\text{totally identical}$$

$$\text{Example: a crude model would take } Z = \begin{pmatrix} 1 & 0 & \cdots & 0 \\ 0 & 1 & \ddots & \vdots \\ \vdots & \ddots & \ddots & 0 \\ 0 & \cdots & 0 & 1 \end{pmatrix}.$$

This model assumes that distinct species are totally dissimilar.

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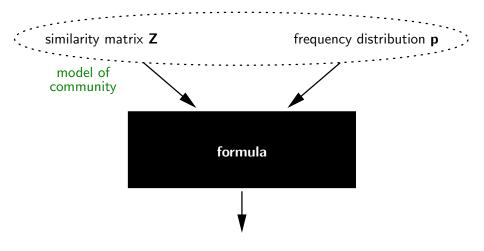
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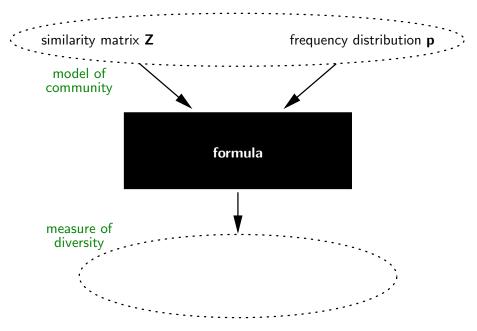
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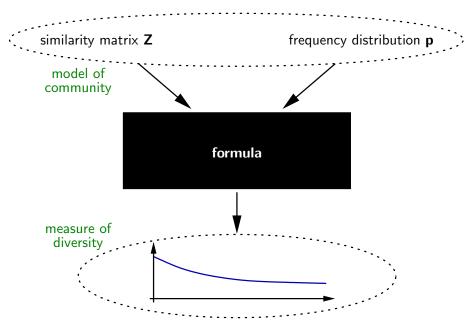
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 $p_i \ge 0$ and $\sum p_i = 1$

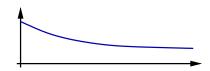




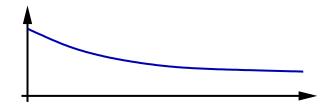




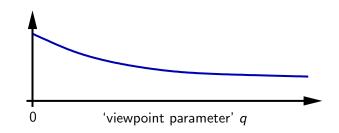
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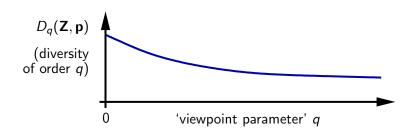


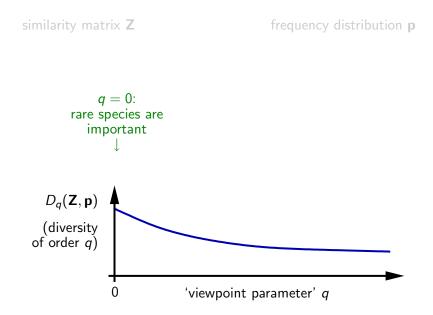
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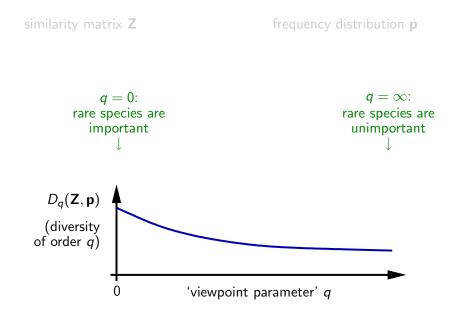


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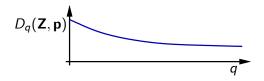
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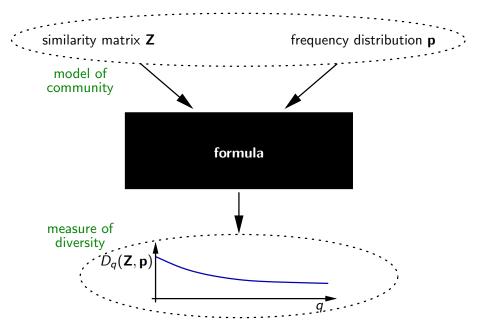


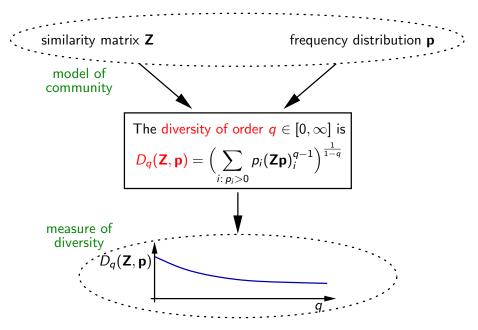




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3. How to maximize diversity

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Let $0 \leq q \leq \infty$.

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I.e., what is

```
\sup\{D_q(\mathbf{Z},\mathbf{p}) : \text{ frequency distributions } \mathbf{p}\},\
```

and which **p** attain this supremum?

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- Also, surely the answer should mention q...? After all, different values of q represent different viewpoints on what diversity is.

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Corollary

There is a frequency distribution that maximizes diversity of order q for all q simultaneously.

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'There is a best of all possible worlds.'