

Measures of biodiversity and conservation policies

On which index to base trade-offs?

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Introduction

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A simple problem
The notion of species

Criteria of "diversity"

The cardinal criterion
The "efficient" number of species
The cardinal aggregation of dissimilarities
Uniformity and cardinal dissimilarities

Synthesis on indices

- Partial survey on biodiversity
- Do we control the properties of its measurement instruments? → more or less
- Are the various indices equivalent? → no.
- Is their use easy? → no, mainly for practical reasons.
- **Take-home message** : interest of the **axiomatic approach**.
Axioms \Leftrightarrow index of diversity.

Plan

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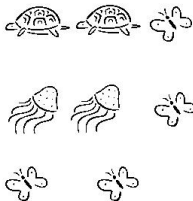
Synthesis on indices

- 1 Samples of living individuals
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 - The notion of species
- 2 Criteria of "diversity"
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- 3 Synthesis on indices
- 4 Conservation policies

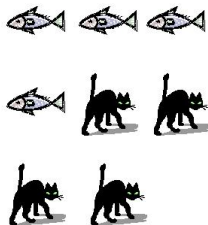
Which sample to preserve?

Consider two samples: $X^1 = \{T_1, T_2, M_1, M_2, P_1, P_2, P_3, P_4\}$ and $X^2 = \{S_1, S_2, S_3, S_4, C_1, C_2, C_3, C_4\}$, one of which must be sacrificed.

Échantillon X^1



Échantillon X^2



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Let us note

- $X^1 \succeq X^2$ for « sample X^1 is at least as diversified as sample X^2 »
- $X^1 \succ X^2$ for « sample X^1 is strictly more diversified than sample X^2 »
- $X^1 \sim X^2$ for « sample X^1 offers exactly the same biodiversity as sample X^2 »

The notion of species

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Notion of *dichotomic similarity* : two individuals i and i' are either equivalent ($i E i'$), or different ($i \bar{E} i'$)

Allows to divide the set of individuals into five equivalence classes:

$$T = \{T_1, T_2\}, M = \{M_1, M_2\}, P = \{P_1, P_2, P_3, P_4\}, \\ S = \{S_1, S_2, S_3, S_4\}, C = \{C_1, C_2, C_3, C_4\},$$

and to define the partitions S^1 and S^2 de X^1 et X^2 , based on similarity:

$$S^1 = \{T, M, P\} \text{ and } S^2 = \{S, C\}.$$

Notations : $S^0 = S^1 \cup S^2$, and $X^0 = X^1 \cup X^2$.

The cardinal criterion

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Pattanaik and Xu (2000a) : the cardinal criterion $n^j = \text{Card}(S^j)$ is the only reflexive and transitive \succeq which satisfies the following three axioms:

- **A1 Indifference between singletons:** Whatever the individuals i and $i' \in X^0$, $\{i\} \sim \{i'\}$.
- **A2 Monotony with respect to the addition of a species to a singleton :** Whatever the distinct individuals i and i' taken in X^0 , $i E i' \Rightarrow \{i, i'\} \sim \{i\}$, and $i \bar{E} i' \Rightarrow \{i, i'\} \succ \{i\}$.
- **A3 Independance :** For all subsets $A, B \in S^0$, and whatever $i \in X^0 \setminus (A \cup B)$, if $[i E a$ and $i E b$ for some $a \in A$ and some $b \in B]$ or $[i \bar{E} z$ for all $z \in A \cup B]$, then $A \succ B$ iff $A \cup \{i\} \succ B \cup \{i\}$.

The cardinal criterion : remarks

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- 1 The ranking is sensitive to the definition of species. Impact on the ranking if all individual are different species?
- 2 The ranking is not sensitive to the relative abundance of species. Impact on the ranking if 10,000 cats are added to sample 2?

Combining the notion of uniformity and richness

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- let a_A^j be the absolute abundance of species A in sample j
- and let $p_A^j = \frac{a_A^j}{\sum_{A \in S^j} a_i^j}$ be its relative abundance

The expression:

$$D_\alpha(n^j, p^j) = \left[\sum_{A \in S^j} (p_i^j)^\alpha \right]^{\frac{1}{1-\alpha}} .$$

gives a family of indices, configured by parameter α , whose logarithmic transformation is called *generalized entropy*, or *entropy of order α* (Rényi, 1961, Hill, 1973).

Entropy: particular cases

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- the cardinal criterion: $D_0(n^j, p^j) = n^j$
- The Berger-Parker index, with $\alpha = +\infty$,

$$D_{+\infty}(n^j, p^j) = 1/\max(p_A^j).$$

According to this index, $X^1 \sim X^2$, since

$$D_{+\infty}(n^1, p^1) = D_{+\infty}(n^2, p^2) = 2.$$

Entropy indices: particular cases (continued)

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- Simpson index with $\alpha = 2$,

$$D_2(n^j, p^j) = 1 / \sum_{A \in S^j} (p_A^j)^2.$$

This index declares $X^1 \succ X^2$, with respective values $D_2(n^1, p^1) \simeq 2,66$ and $D_2(n^2, p^2) = 2$.

- the Shannon-Wiener measure, from information theory, with $\alpha \rightarrow 1$,

$$D_1(n^j, p^j) = \exp \left(- \sum_{A \in S^j} p_i^j \ln p_i^j \right),$$

$D_1(n^1, p^1) \simeq 2,83$. $D_1(n^2, p^2) \simeq 2$.

Entropy indices : axiomatic (Shorroks, 1984)

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Any ranking of samples obtained via index D_α , avec $\alpha \neq 0$, is logically equivalent to a ranking that satisfies the 4 following axioms:

- **A4 Symmetry** : if sample \tilde{S} is obtained from a permutation of species proportions in sample S , then $\tilde{S} \sim S$.
- **A5 Scale Invariance** : for any number $t > 0$, if \tilde{S} is obtained from S by multiplying the population of each species by t , then $\tilde{S} \sim S$.

Entropy Indices : axiomatic continued (Shorroks, 1984)

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- **A6 Abundance equalization** : Consider two samples X^1 et X^2 composed of the same species. If they are distributed in same proportions in the two samples, except for two species such that:

$$a_h^1 = a_h^2 + \delta < a_k^2 - \delta = a_k^1$$

avec $\delta > 0$, alors $X^1 \succ X^2$.

- **A7 Decomposable Representability** : there exists a numeric function $D_\alpha(.,.)$ that represents the ranking \succ and such that, for any pair of samples X^1, X^2 :

$$D_\alpha(n^1 + n^2, (p^1, p^2)) = D_\alpha(n^1, p^1) + D_\alpha(n^2, p^2) + D_\alpha(n^1 + n^2, (\bar{p}^1, \bar{p}^2))$$

Entropy indices : remarks

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Synthesis on indices

- This family abide by the axiom of indifference with respect of singletons, but do not necessarily respect the monotony axiom and the independance axiom.
- Common limitation : indices not sensible to dissimilarities that may exist among species. A sample with 4 bees and 4 ants would be judged equivalent to a sample with 4 bees and 4 lions by any of these indices.

Weitzman index (1992)

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Synthesis on indices

- A dissimilarity measure is a distance function $d : X^j \times X^j \rightarrow R^+$, which satisfies the two following properties:

- ① symmetry: $d(i, i') = d(i', i)$, $\forall i, i' \in X^j$,
- ② $d(i, i') = 0$, iff $i E i'$.

- Assume that:

- in sample 1 : $d(T, P) = a > d(T, M) = b > d(M, P) = c$,
- in sample 2 : $d(S, C) = d > a + c$.

- The distance between a singleton i'' and a set, here the non empty subset \mathbf{x}^j of X^j , is:

$$\delta(i'', \mathbf{x}^j) = \min_{h \in \mathbf{x}^j} d(i'', h) \quad , \quad \forall i'' \in X^j \setminus \mathbf{x}^j, \forall \mathbf{x}^j \subseteq X^j .$$

Weitzman index(1992) (continued)

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$$D_W (X^j) = \max_{i \in X^j} \{ D_W (X^j - i) + \delta (i, X^j - \{i\}) \} .$$

For our two samples, under the normalization $D^0 = 0$

$$D_W (X^1) = a + c < D_W (X^2) = d .$$

Important observation: this index reverses the previous rankings!

Weitzman's index (1992) : properties

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- **A8 Monotonicity with respect to species** If an individual i is added to a sample X^j , then

$$D_W (X^j \cup i) \geq D_W (X^j) + \delta (i, X^j) .$$

- **A9 Existence of a link** For any sample X^j made of at least two species, there exists at least a species $l(X^j) \in X^j$, called "link", which satisfies

$$D_W (X^j) = D_W (X^j - \{l\}) + \delta (l, X^j - \{l\}) .$$

- **A10 Monotonicity with respect to distances**

Weitzman's index (1992) : calculator

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In practice, computations are very complicated and time consuming.

A "calculator" is available on the net:

<http://www1.montpellier.inra.fr/lameta/biodiv/login.php>

Contact me in case of need!

Rao's quadratic entropy (1982)

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Makes use of information on **frequencies** and on **dissimilarities**:

$$D_R(X) = \sum_{i \in X} \sum_{j \in X} p_i * p_j * d_{ij} .$$

Measure of the **expected dissimilarity** between two species randomly drawn in X . No axiomatic characterization?

Rao's index (1982) (calculus)

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$$\begin{aligned}D_R(X^1) &= 2 * \frac{1}{4} * \frac{1}{2} * d(T, P) \\ &+ 2 * \frac{1}{4} * \frac{1}{4} * d(T, M) \\ &+ 2 * \frac{1}{4} * \frac{1}{2} * d(M, P) \\ &= \frac{1}{4} * (a + c) + \frac{1}{8} * b .\end{aligned}$$

$$\begin{aligned}D_R(X^2) &= 2 * \frac{1}{2} * \frac{1}{2} * d(S, C) \\ &= \frac{1}{2} * d .\end{aligned}$$

Rao's index (1982) (calculus continued)

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Therefore

$$D_R(X^2) > D_R(X^1)$$

iff

$$\frac{1}{2} * d > \frac{1}{4} * (a + c) + \frac{1}{8} * b.$$

Since we have assumed that $d > a + c$, this inequality is possible only if $d(T, M) = b$ is not too large.

Synthesis on indices

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Synthesis on indices

- Formal description $\Omega^j = \{E, n^j, p^j, d()\}$ of a sample j
- Diversity index $D : \Omega^j \rightarrow R$, synthetizes pieces of information.
- a protection policy may favor biodiversity according to a particular index, and be harmful according to another index
- Indices do not all abide by the same principles. Some are based on a functional point of view, other obey a patrimonial logic.
- Because of the growing concern for values such as freedom and well-being, the interest tends to shift from diversity towards ecosystems services (cf MEA).

Conservation policies: the Noah's ark metaphor

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Synthesis on indices

Let $P_i \in [0, 1]$ stand for the survival probability of species $i = P, T$.

4 possible states of the world:

- 1 P and T survive, with proba $P_1 * P_2$,
- 2 only P survives, with proba $P_1 * (1 - P_2)$,
- 3 only T survives, with proba $(1 - P_1) * P_2$,
- 4 P and T disappear, with proba $(1 - P_1) * (1 - P_2)$.

Conservation policy : a tool that varies survival probabilities

$$\underline{P}_i \leq P_i \leq \bar{P}_i, \forall i = 1, 2, \quad (1)$$

where \underline{P}_i if no protection, and \bar{P}_i in case of maximal protection.

Noah's ark metaphor

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C_i cost associated to \bar{P}_i

B total budget

$$\sum C_i \frac{P_i - \bar{P}_i}{\bar{P}_i - \underline{P}_i} = B \quad (2)$$

Noah's utility: addition of **expected existence value**

$$U(P_1, P_2) = P_1 U_1 + P_2 U_2,$$

and **expected diversity of all the species** $W(P_1, P_2)$

$$\begin{aligned} W(P_1, P_2) &= P_1 * P_2 * D_W(\{s_1, s_2\}) \\ &+ P_1 * (1 - P_2) * D_W(\{s_1\}) \\ &+ (1 - P_1) * P_2 * D_W(\{s_2\}) \\ &+ (1 - P_1) * (1 - P_2) * D_W(\emptyset). \end{aligned}$$

Noah's ark metaphor

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Noah's problem :

$$\max_{P_1, P_2} W(P_1, P_2) + U(P_1, P_2) \quad (3)$$

subject to (1) et (2).

Expected marginal diversity

$$\begin{aligned} \frac{\partial}{\partial P_i} W(P_1, P_2) &= P_j * [D_W(\{s_i, s_j\}) - D_W(\{s_j\})] \\ &+ (1 - P_j) * D_W(\{s_i\}) > 0 \end{aligned} \quad (4)$$

The diversity function is strictly increasing: 'corner' solutions .
Is this 'corner' property robust?...

Noah's ark metaphor

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Another contribution of Weitzman : the optimal solution can be approximated by a **simple rule**. Let species be ranked according to the values:

$$R_i = (D_i + U_i) \left(\frac{\Delta P_i}{C_i} \right) \quad (5)$$

with

$$\Delta P_i = \bar{P}_i - \underline{P}_i ,$$

and species are embarked until budget is exhausted

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S. Aulong, K. Erdlenbruch et C. Figuières,

Un tour d'horizon des critères d'évaluation de la diversité biologique.

Economie Publique, 2006.



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Les critères d'évaluation de la biodiversité : propriétés et difficultés d'usage.

Inra Sciences Sociales, 2008, n° 4-5. (See also the english version, on the same page)

More to read II

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Ecological Economics, 2005, 55(2), 218-223.

Thanks for your attention!