Further revisiting the bivalve and brachiopod saga; beyond pairwise analysis

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Are brachiopods and bivalves ships that pass in the night?

Gould & Calloway 1980: Clams and brachiopods - ships that pass in the night.





Idea: Use <u>process modelling</u> on recent extinction/origination <u>rates</u> to reexamine this.

The data

Extinction/origination rates estimated from fossil records (Mark-recapture modelling).

Two clades: bivalves and brachiopods.





Lee Hsiang Liow



Process models - linear SDEs

- Can handle arbitrary gap lengths because linear stochastic differential equations deal with continuous time.
 - Random walk, OU and directional change are just special cases.
- Can handle differences in observational noise and unknown observational noise.
- Can look at multiple processes and connections between them.



Properties of single linear SDE process (OU)



Process connections

- Can differentiate between <u>causal</u> and <u>correlative</u> connections of two processes.
- Can find connections even when the measurements of the two series are not at the same time. => No need to bin!
- Can find causal connections even when only the effect is measured => hidden layers.
 Autocorrelation of x2 different



Why go beyond pairwise analysis?

Pairwise comparisons:

- 1. Find internal structure for each rate process (standalone analysis).
- 2. Check for connections with climatic series.
- 3. Test all ways of connecting each pair of rate processes.

Lee Hsiang Liow, Trond Reitan and Paul G. Harnik (2015). Ecological interactions on macroevolutionary time scales: clams and brachiopods are more than ships that pass in the night, *Ecology Letters* doi: 10.1111/ele.12485

Problems with pairwise analysis:

• A connection between process A and C can be explained by a connection from A to B and from B to C.





- Without correcting for one connection it can be more difficult to find another.
- We don't get a systematic picture of the dynamics of each series, when they are connected only pair-wise.

Comprehensive analysis procedure

Possible combinations of connections is too large to examine systematically: $5^{13\approx}1.2$ billion. Do step-wise search instead.

- 1. Find internal structure for each time series (standalone analysis).
- 2. Start with a model for all 4+2 time series with no connection.
- 3. Try all models with one connection more.
- 4. If one is better, set that as the model to beat and go back to 3. (Stepwise up).

Modifications: Also allow do change a connection, remove a connection or modify the model structure in step 3.

Con: There can be a model that is better than the one found in a step-wise search.



Improvements in analysis



- Checking for the other effects in play means some connections can be removed.
- Consistency in time series description.
 - Variation due to internal fluctuations and due to external influence can be separated. => Reduced internal fluctuations in series affected by others.

PS: The great complexity in modelling alternatives means either using an enormous amount of computer resources or having to do with stepwise searches, though!

Biotic interactions

- Low bivalve extinction rate suppresses brachiopod origination. Bivalve extinctions opens up brachipod niches?
- Common extinction process.
 Brachipod extinction rate adds some unknown slower process.



- => Brachiopod diversity becomes more volatile with increased bivalve extinctions.
- Common origination process also, (but noisy bivalve process).

Thank you!

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