

Como se estuda macroevolução?

Precisamos de geralmente duas coisas

Fenótipos

Genealogias  
(Filogenias)

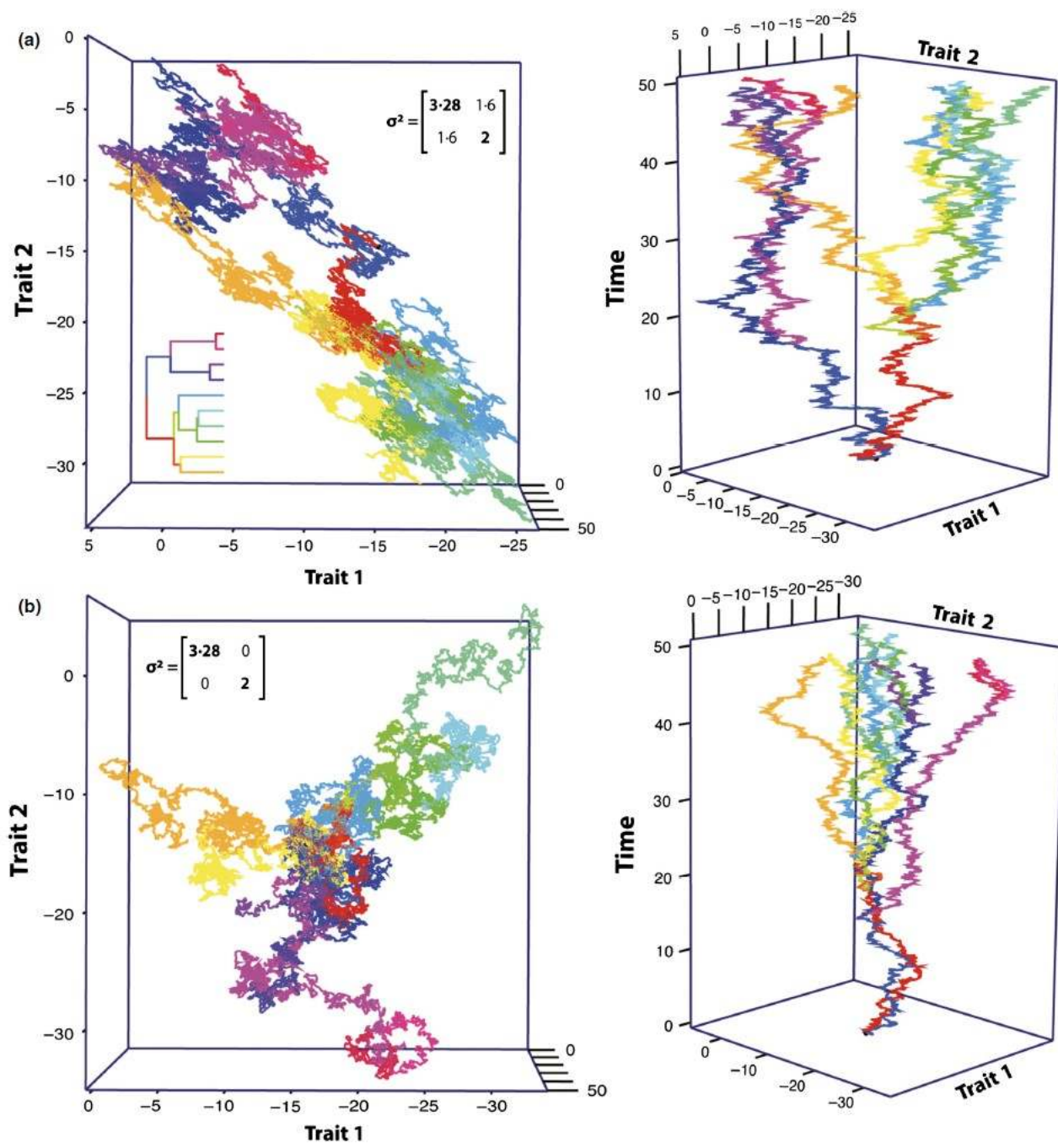
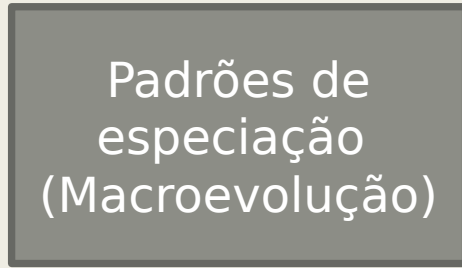
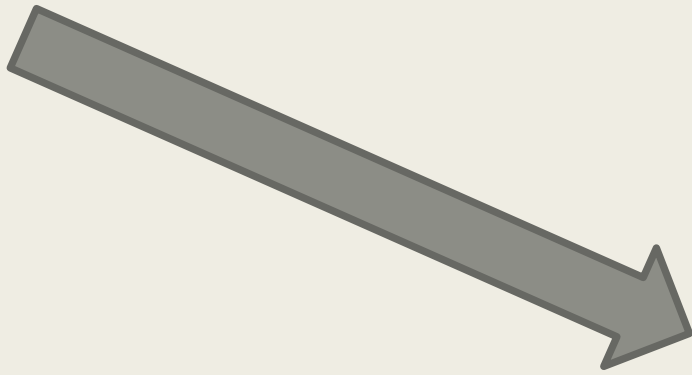
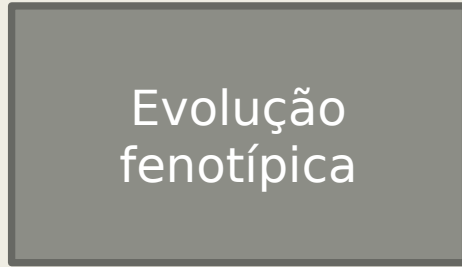
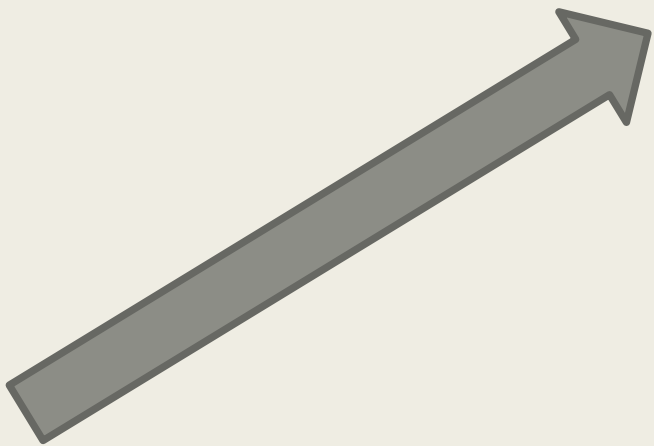


Fig. 2. Examples of two phenotypic traits evolving under a bivariate Brownian motion (BM) process within a 10 species tree fixed in (a). In (a), a

# O que são Métodos Filogenéticos Comparativos?

- Conjunto de métodos estatísticos que usam a relação de parentesco entre as espécies para testar hipóteses evolutivas sobre seus atributos
- Interesse surgiu no fim da década de 1970 com a disponibilidade de filogenias
  - *Processo evolutivo deixa "rastros" no fenótipo das espécies*
    - Espécies mais próximas *tendem* a ser mais parecidas
- Perguntas comuns
  - *Qual o padrão filogenético de uma dada característica das espécies?*
  - *Sob que processo e em que velocidade essa característica evolui?*
  - *Qual a correlação dessa característica com outras ou com a variação ambiental?*

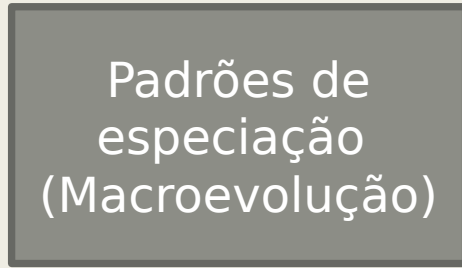
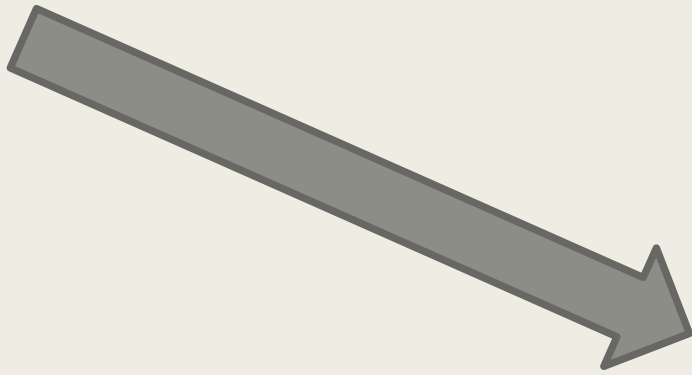
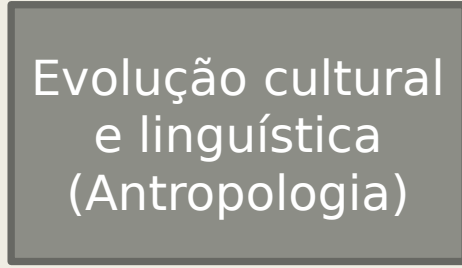
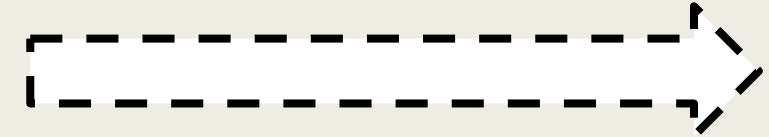
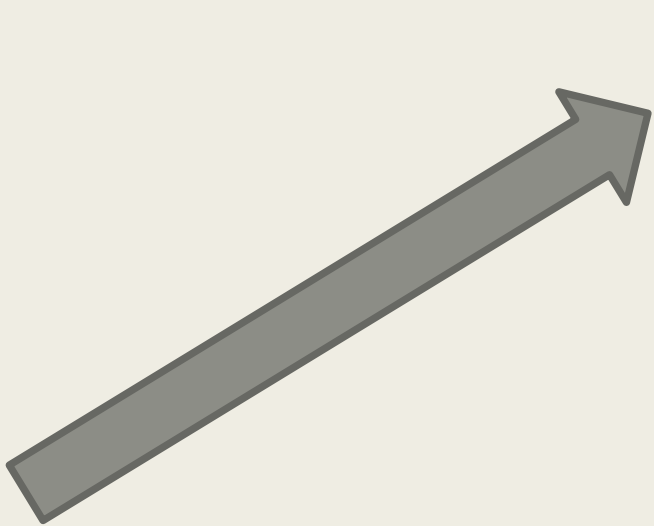


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O que não  
fazer

Conclusão e Dicas



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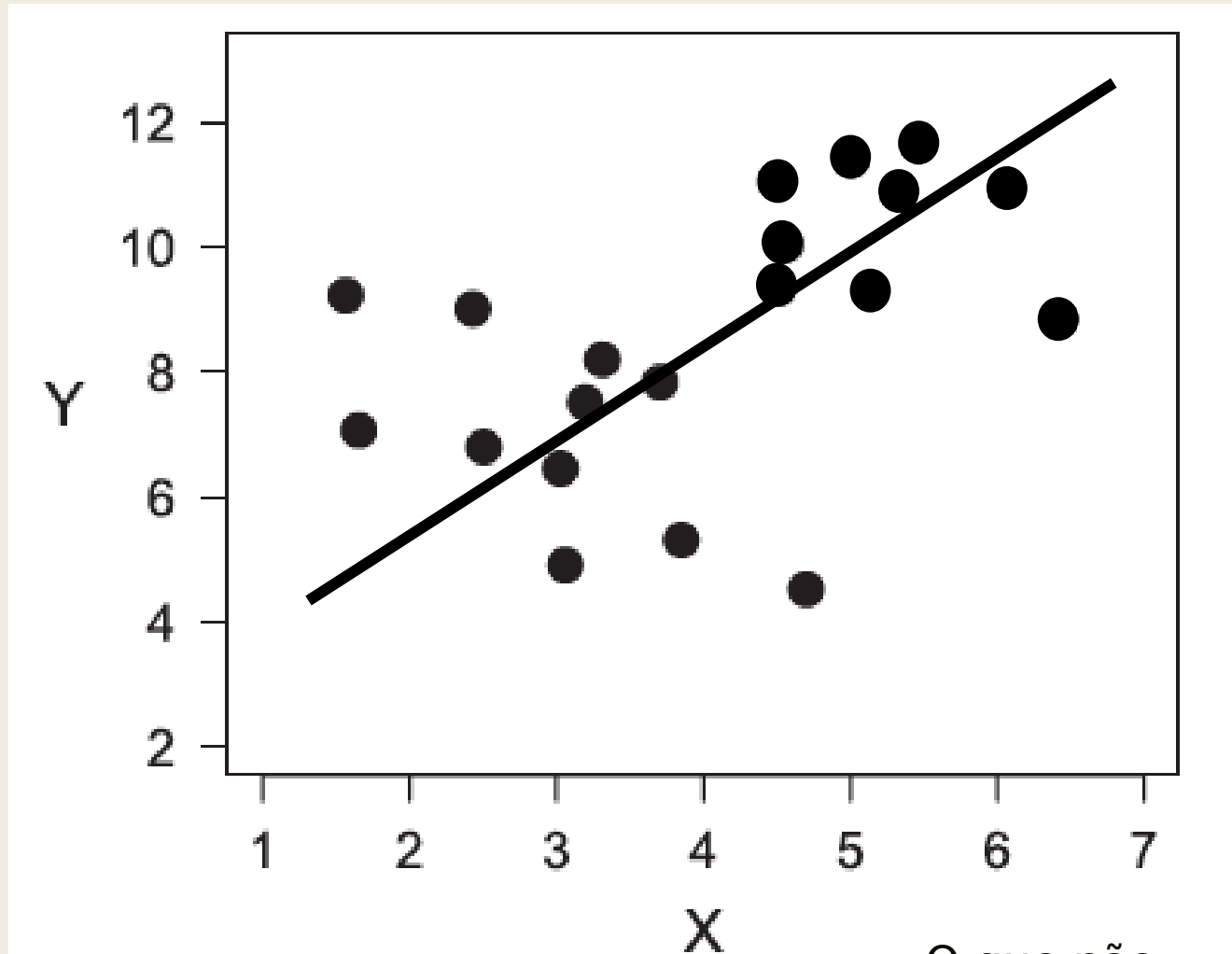
O que não  
fazer

Conclusão e Dicas

# O que são Métodos Filogenéticos Comparativos?

- *Problema da Autocorrelação Filogenética => viola os pressupostos dos métodos "convencionais"*
- *Necessidade de se incorporar a relação entre as espécies nas análises*

# O problema do parentesco comum



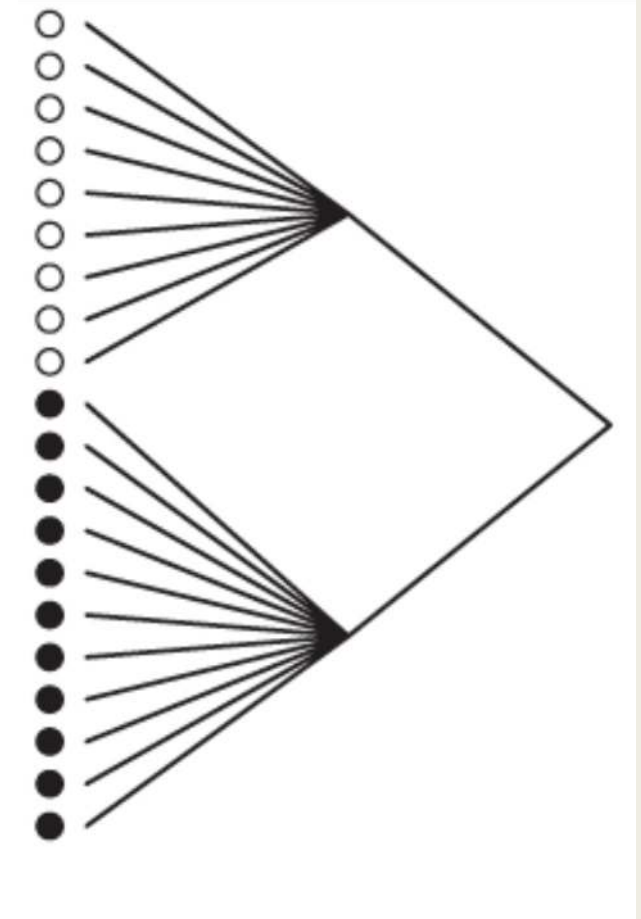
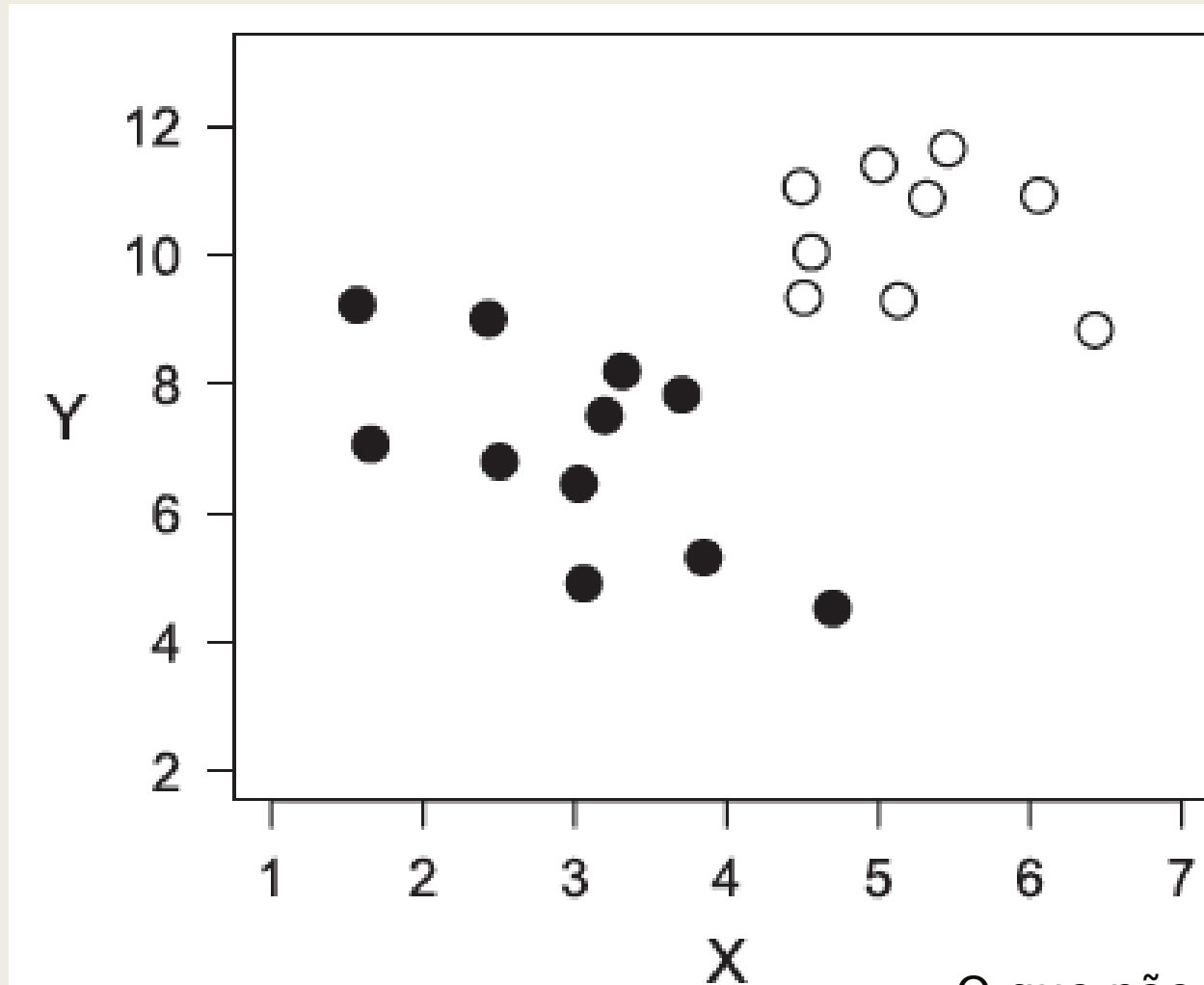
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# O problema do parentesco comum



Apresentação

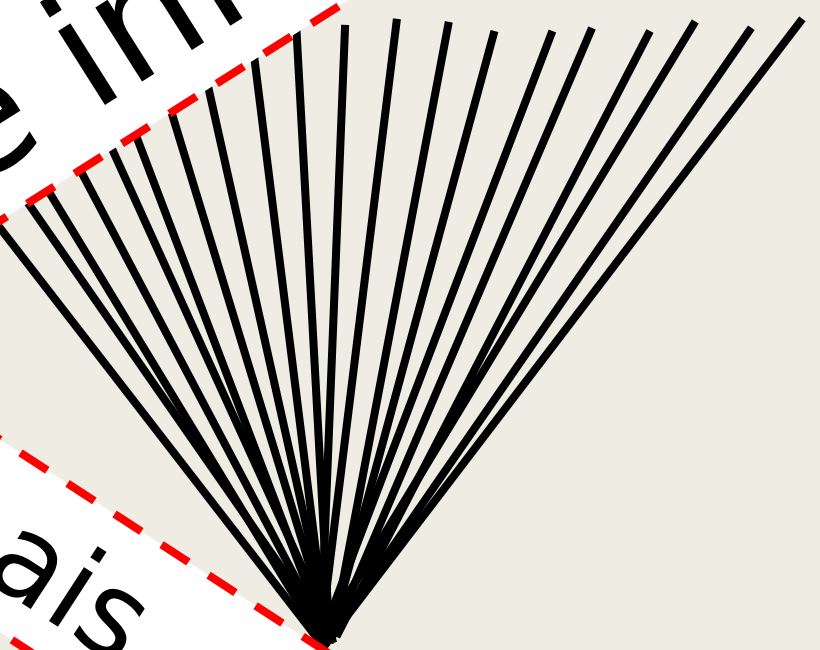
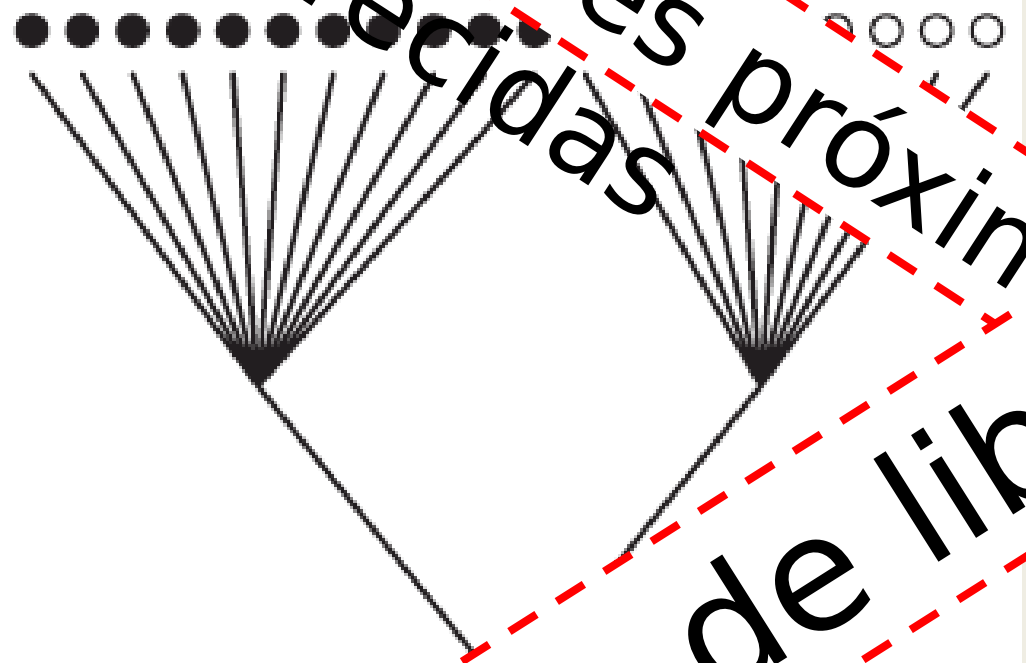
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Espécies não são independentes

parecidas próximas



**Graus de liberdade inflados**

Real”

Filogenético em

estri

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“ Phylogenies are fundamental to evolutionary biology, there is no doing it without taking them into account ”

Joe Felsenstein (1985)



*Evolution*, 39(6), 1985, pp. 1335–1351

THE QUANTITATIVE ASSESSMENT OF PHYLOGENETIC CONSTRAINTS  
IN COMPARATIVE ANALYSES: SEXUAL DIMORPHISM IN  
BODY WEIGHT AMONG PRIMATES

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*Departments of Anthropology, Cell Biology & Anatomy, and Ecology & Evolutionary Biology,  
Northwestern University, Evanston, IL 60201*

MALCOLM M. DOW

*Department of Anthropology and Program in Mathematical Methods in the Social Sciences,  
Northwestern University, Evanston, IL 60201*

AND

WALTER LEUTENEGGER

*Department of Anthropology, University of Wisconsin, Madison, WI 53706*

1985



Vol. 125, No. 1

The American Naturalist

January 1985

PHYLOGENIES AND THE COMPARATIVE METHOD

JOSEPH FELSENSTEIN

Department of Genetics SK-50, University of Washington, Seattle, Washington 98195

*Submitted November 30, 1983; Accepted May 23, 1984*

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VOL. 193, NO. 6 THE AMERICAN NATURALIST JUNE 2019

HISTORICAL COMMENT

# Revisiting a Key Innovation in Evolutionary Biology: Felsenstein's "Phylogenies and the Comparative Method"

Raymond B. Huey,<sup>1,\*</sup> Theodore Garland Jr.,<sup>2</sup> and Michael Turelli<sup>3</sup>



1987

*Evolution*, 41(5), 1987, pp. 1098–1115

PHYLOGENETIC STUDIES OF COADAPTATION: PREFERRED  
TEMPERATURES VERSUS OPTIMAL PERFORMANCE  
TEMPERATURES OF LIZARDS

RAYMOND B. HUEY

*Department of Zoology NJ-15, University of Washington, Seattle, WA 98195*

AND

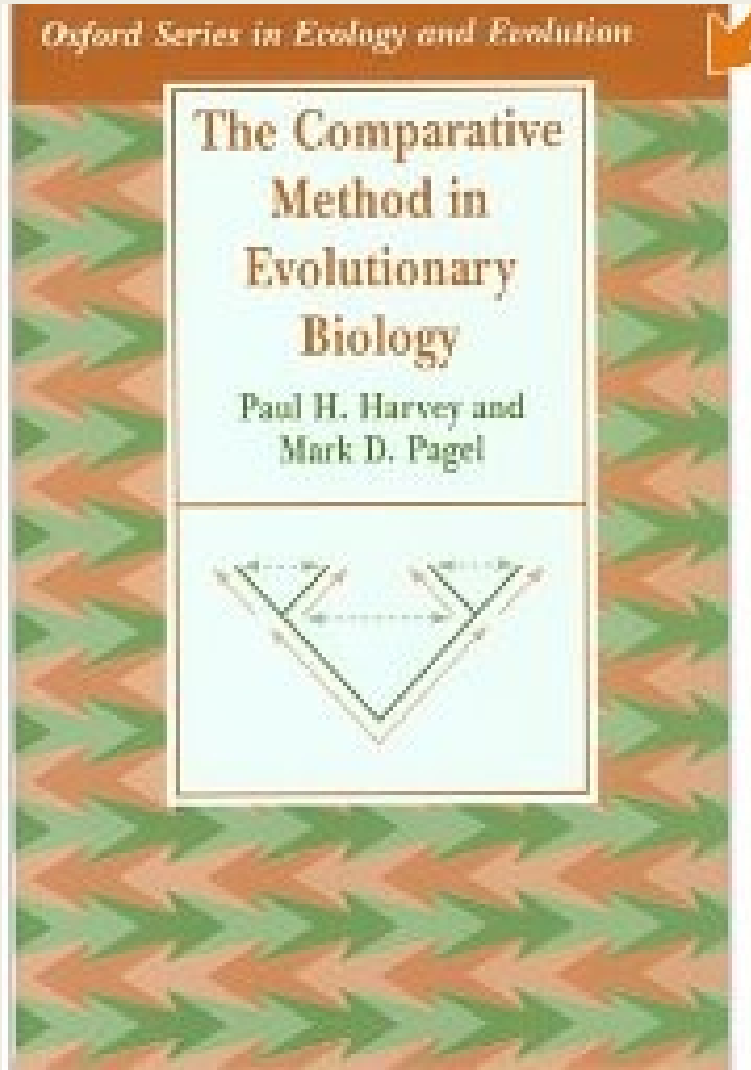
ALBERT F. BENNETT

*School of Biological Sciences, University of California, Irvine, CA 92717*

Estimativa de estado ancestral: Squared-change parsimony

# Principais métodos/Abordagens

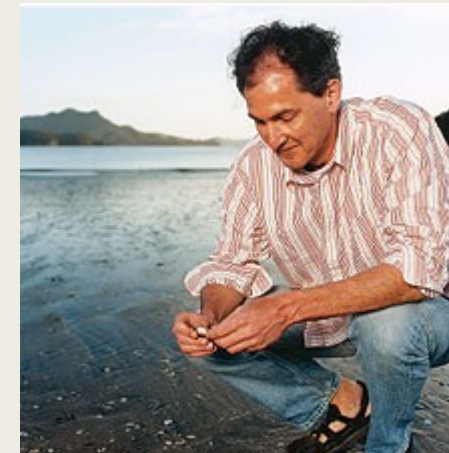
- Estimativa ("reconstrução") de estado ancestral
- Mensuração e teste de "sinal" filogenético
- Ajuste de Modelos de Evolução à atributos (BM, OU, EB/LB, trend etc)
- Estimativa de taxas de evolução de atributo(s) ao longo da filogenia
- Estimativa de ótimos/picos/regimes adaptativos ao longo da filogenia
- Evolução correlacionada de atributos contínuos (PGLS, phyloGLM) e categóricos (Pagel's method)



1991



Paul Harvey



Mark Pagel

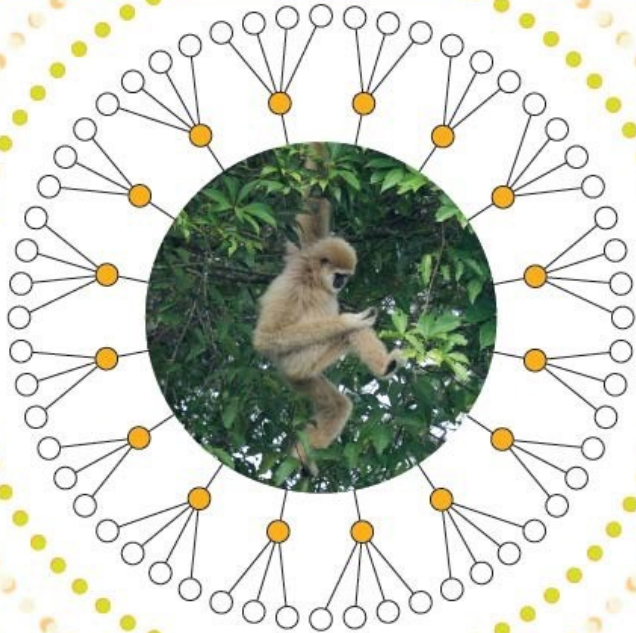
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The **Comparative Approach**  
in **Evolutionary Anthropology**  
and **Biology**



Charles L. Nunn



Charles Nunn, Duke University

2011

László Zsolt Garamszegi  
Editor

# Modern Phylogenetic Comparative Methods and Their Application in Evolutionary Biology

Concepts and Practice

 Springer

2015



Sevilha, Espanha, Novembro 2014

[http://www.mpcm-evolution.org/  
practice](http://www.mpcm-evolution.org/practice)

O que não  
fazer

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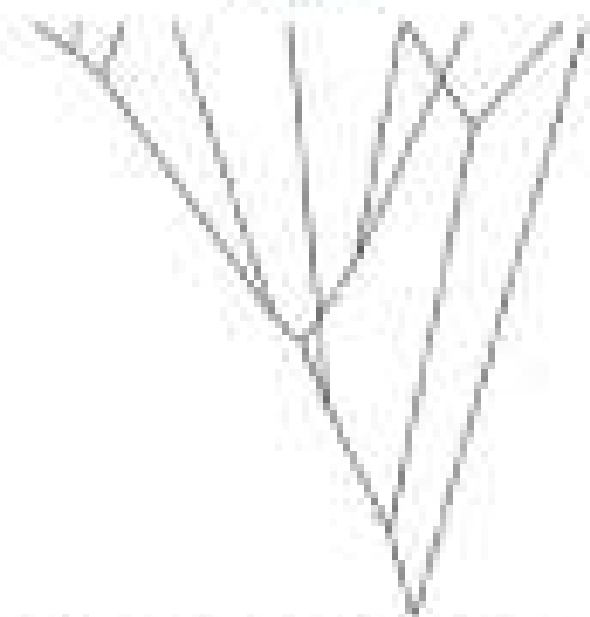
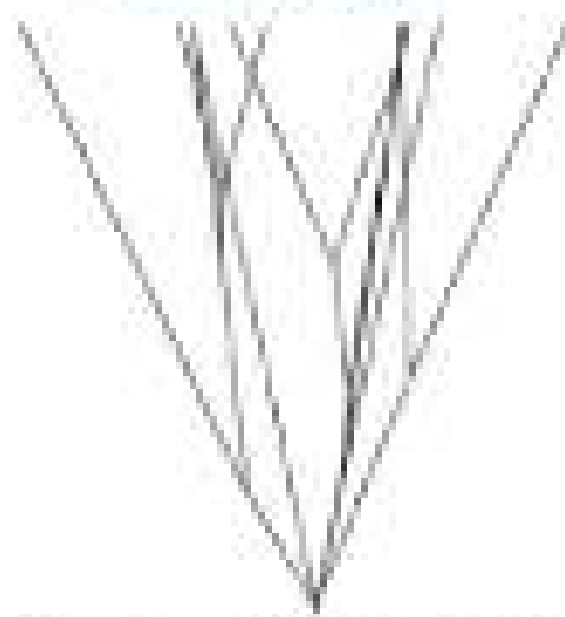
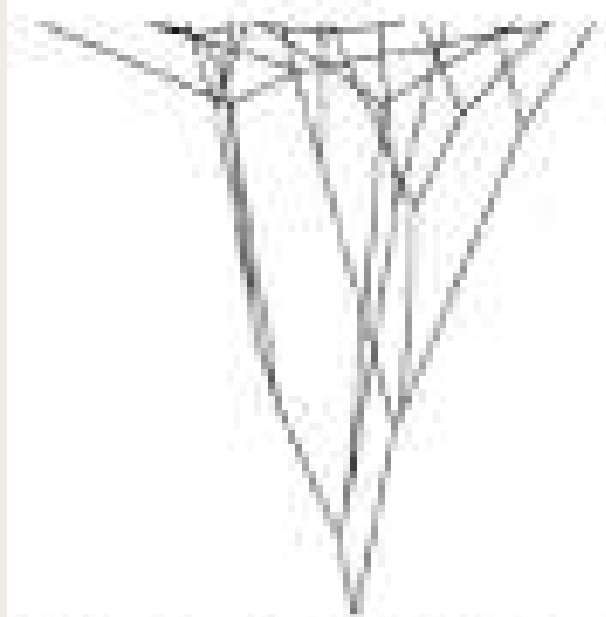
Principais Usos

phylogenetic signal

low

brownian

high



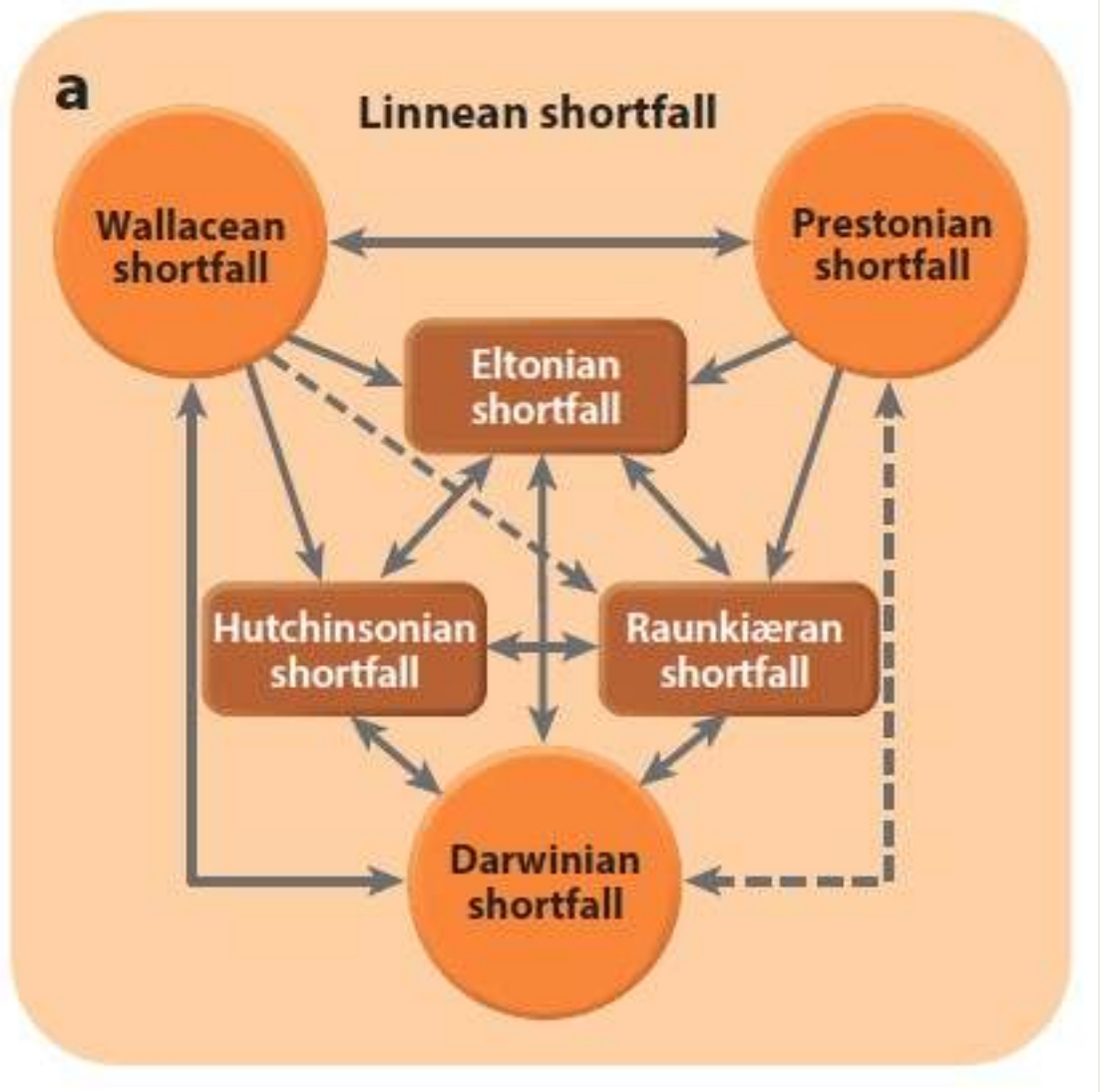
$K = 0.18$

$K \sim 1$

$K = 1.62$

# Problemas mais comuns

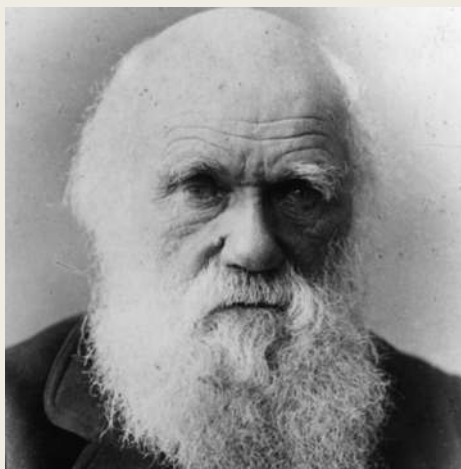
- Falta completa de dados (filogenéticos e traits)
- **Descasamento (*mismatch*) entre disponibilidade de dados de traits e de filogenias**
- Dados existem mas não estão acessíveis
- Déficits de conhecimento sobre biodiversidade: Darwiniano e Raunkiaeriano
  - *Dificultam ganho de conhecimento sobre evolução de atributos*
  - *Impedimento para estudos comparativos*



Hortal et al. 2015



Déficit Rauniaeriano  
Falta de informações  
sobre atributos das  
espécies

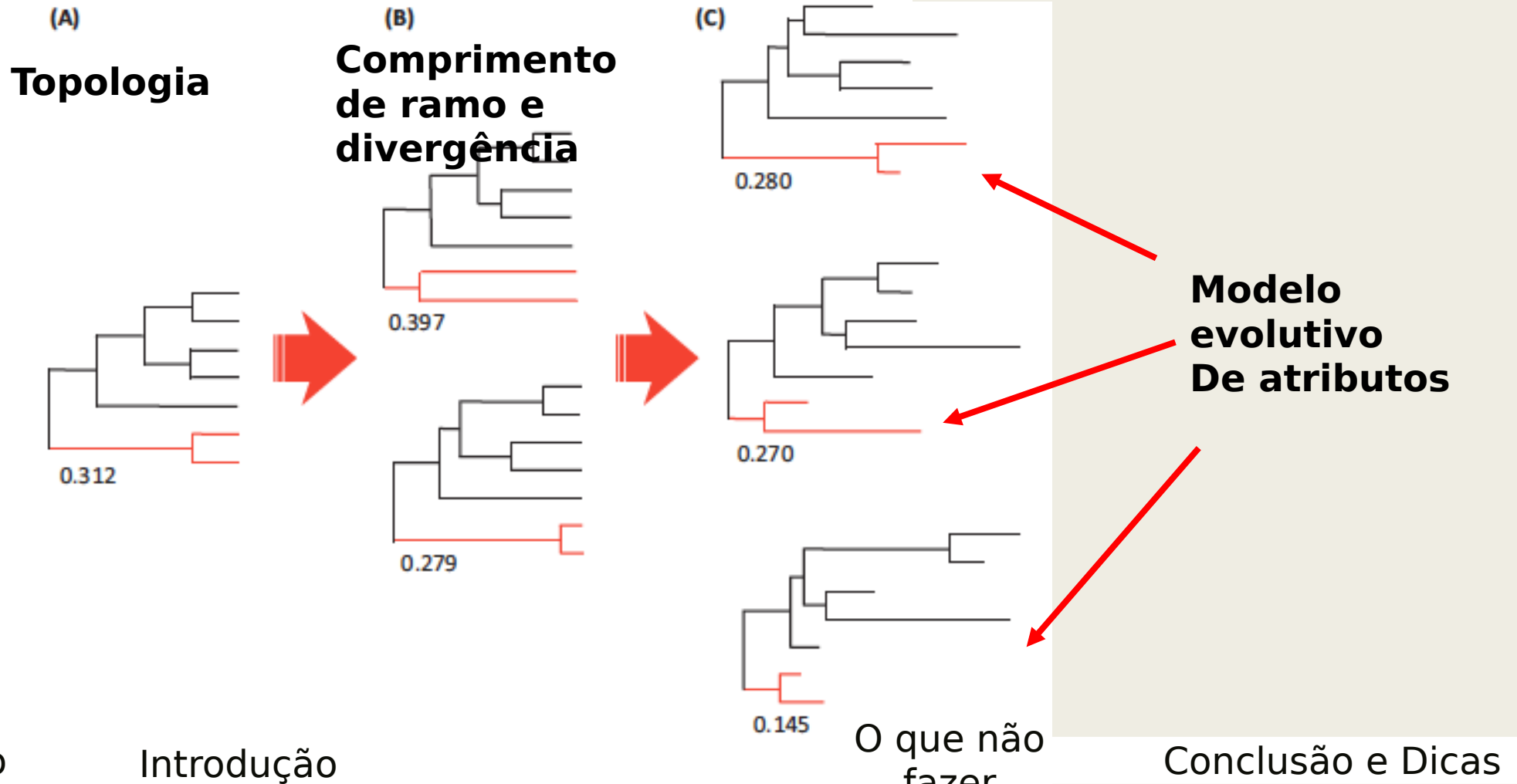


Déficit Darwiniano  
Falta de informações  
sobre relações entre  
espécies

# Darwinian shortfalls in biodiversity conservation

José Alexandre F. Diniz-Filho<sup>1</sup>, Rafael D. Loyola<sup>1</sup>, Pasquale Raia<sup>2</sup>, Arne O. Mooers<sup>3</sup>,  
and Luis M. Bini<sup>1</sup>

Ignorâncias



**MIGA SUA LOCA**



**SIACALME**

Meu deu  
agora? Me  
cucuiã  
doutorad  
me soco

# Pacotes phyndr e taxonlookup

## Methods in Ecology and Evolution



British Ecological Society

*Methods in Ecology and Evolution* 2015

doi: 10.1111/2041-210X.12517

### APPLICATION

## A simple approach for maximizing the overlap of phylogenetic and comparative data

Matthew W. Pennell<sup>1,2†</sup>, Richard G. FitzJohn<sup>3†</sup> and William K. Cornwell<sup>4,5†</sup>

- Maximiza a amostragem trocando espécies na árvore, para os quais não há dados de atributos, por espécies "filogeneticamente equivalentes" sem alterar a estrutura da filogenia
  - Baseado em ranking taxonômico (ou só os nomes dos gêneros) ou uma árvore topológica
  - Alternativa a métodos de aleatorização ou de imputação de dados faltantes

# Ecology and Evolution

Open Access

## Filling the gap in functional trait databases: use of ecological hypotheses to replace missing data

Simon Taugourdeau<sup>1,2,3</sup>, Jean Villerd<sup>1,2</sup>, Sylvain Plantureux<sup>1,2</sup>, Olivier Huguenin-Elie<sup>3</sup> & Bernard Amiaud<sup>4,5</sup>



EDITOR'S  
CHOICE

Ecography 37: 105–110, 2014

doi: 10.1111/j.1600-0587.2013.00528.x

© 2013 The Author. Ecography © 2013 Nordic Society Oikos

Subject Editor: Nathan J. Sanders. Accepted 26 July 2013

## Phylogenetic imputation of plant functional trait databases

Nathan G. Swenson

## Phylogenetic eigenvector maps: a framework to model and predict species traits

Guillaume Guénard<sup>1\*</sup>, Pierre Legendre<sup>1</sup> and Pedro Peres-Neto<sup>2</sup>



*Genetics and Molecular Biology*, 38, 3, 396-400 (2015)

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DOI: <http://dx.doi.org/10.1590/S1415-475738320140391>

Short Communication

### The best of both worlds: Phylogenetic eigenvector regression and mapping

José Alexandre Felizola Diniz Filho, Fabricio Villalobos and Luis Mauricio Bini

# Methods in Ecology and Evolution



*Methods in Ecology and Evolution* 2016

doi: 10.1111/2041-210X.12612

## APPLICATION

### **Rphylopars: fast multivariate phylogenetic comparative methods for missing data and within-species variation**

Eric W. Goolsby<sup>1,2,\*</sup>, Jorn Bruggeman<sup>3</sup> and Cécile Ané<sup>4,5</sup>

# Methods in Ecology and Evolution



*Methods in Ecology and Evolution* 2014

doi: 10.1111/2041-210X.12232

### **Imputation of missing data in life-history trait datasets: which approach performs the best?**

Caterina Penone<sup>1\*</sup>, Ana D. Davidson<sup>2,3</sup>, Kevin T. Shoemaker<sup>2</sup>, Moreno Di Marco<sup>4</sup>, Carlo Rondinini<sup>4</sup>, Thomas M. Brooks<sup>5</sup>, Bruce E. Young<sup>3</sup>, Catherine H. Graham<sup>2</sup> and Gabriel C. Costa<sup>1</sup>

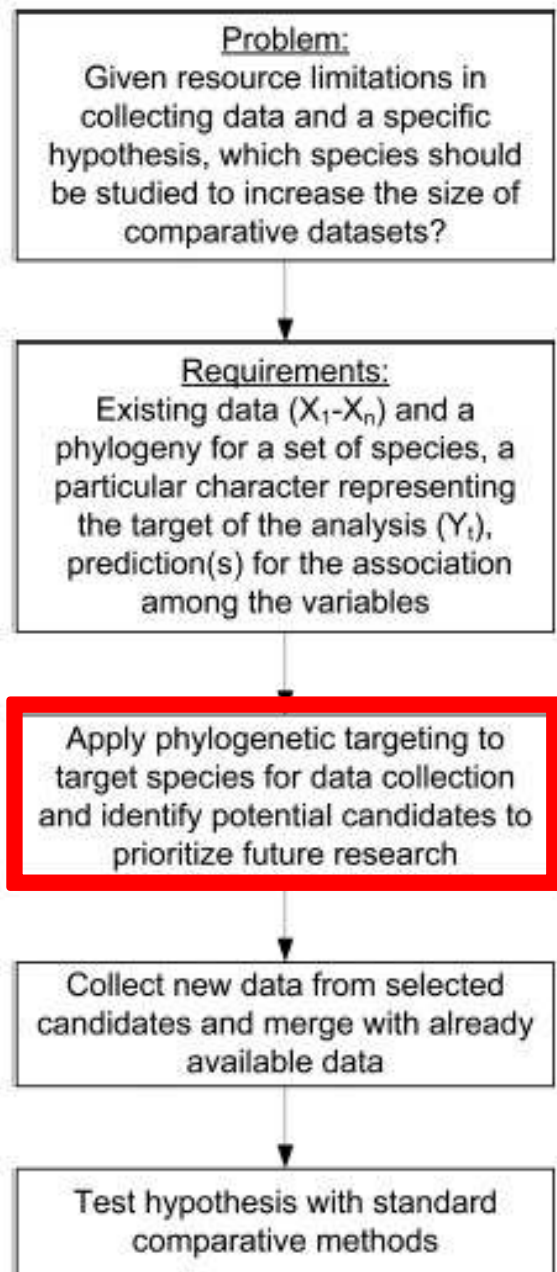
VOL. 176, NO. 5 THE AMERICAN NATURALIST NOVEMBER 2010



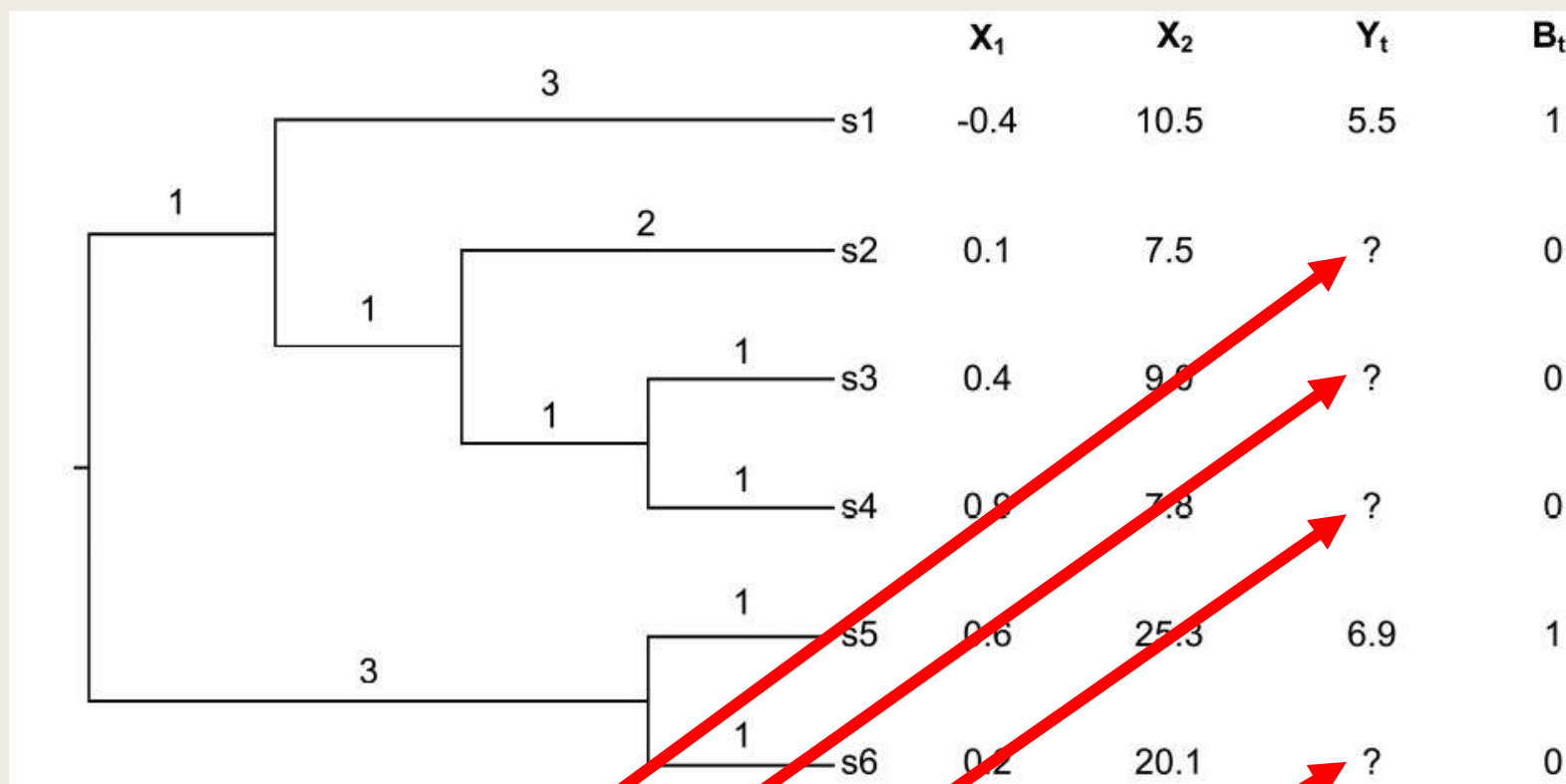
# Phylogenetic Targeting of Research Effort in Evolutionary Biology

Christian Arnold<sup>1,2,\*</sup> and Charles L. Nunn<sup>1</sup>

# Workflow PhyloTargeting



## 3 Atributos contínuos



Espécies com dados  
faltantes  
Para variável resposta

Como otimizar o  
levantamento de dados?

# Limitações de PCMs

VOL. 177, NO. 6 THE AMERICAN NATURALIST JUNE 2011

# Seeing the Forest for the Trees: The Limitations of Phylogenies in Comparative Biology

(American Society of Naturalists Address)\*

Jonathan B. Losos<sup>†</sup>

# Limitações de PCMs

- Muitos atributos não exibem sinal filogenético, ou seja, tem pouca correlação com a filogenia
  - *Depende da escala filogenética, estatística usada etc*
  - *Convergência (compartilhamento do mesmo regime adaptativo)*
- Estimativas de estados ancestrais tem muita incerteza
  - *Necessidade de incorporar informações de fósseis*
  - *Atributos evoluem sob taxas e modelos diferentes*
- Filogenias são pouco úteis quando há muita variação intraespecífica
- Filogenias ajudam a desvendar padrões, e não processos
  - *Velha história: inferir processos a partir de padrão*
  - *Mesmo padrão pode ser causado por diversos processos*
  - *Evite perguntas dicotômicas: "efeito relativo da filogenia (ou pior "história) e ecologia numa característica"*
  - *Filogenias não "causam" nada, mas sim são maneiras de representar a história evolutiva de um grupo*

“ Phylogenetics is a powerful tool for understanding evolution, but it is not omnipotent. ”

## Rethinking phylogenetic comparative methods

JOSEF C. UYEDA<sup>1,\*</sup>, ROSANA ZENIL-FERGUSON<sup>2,3</sup>, AND MATTHEW W. PENNELL<sup>4</sup>

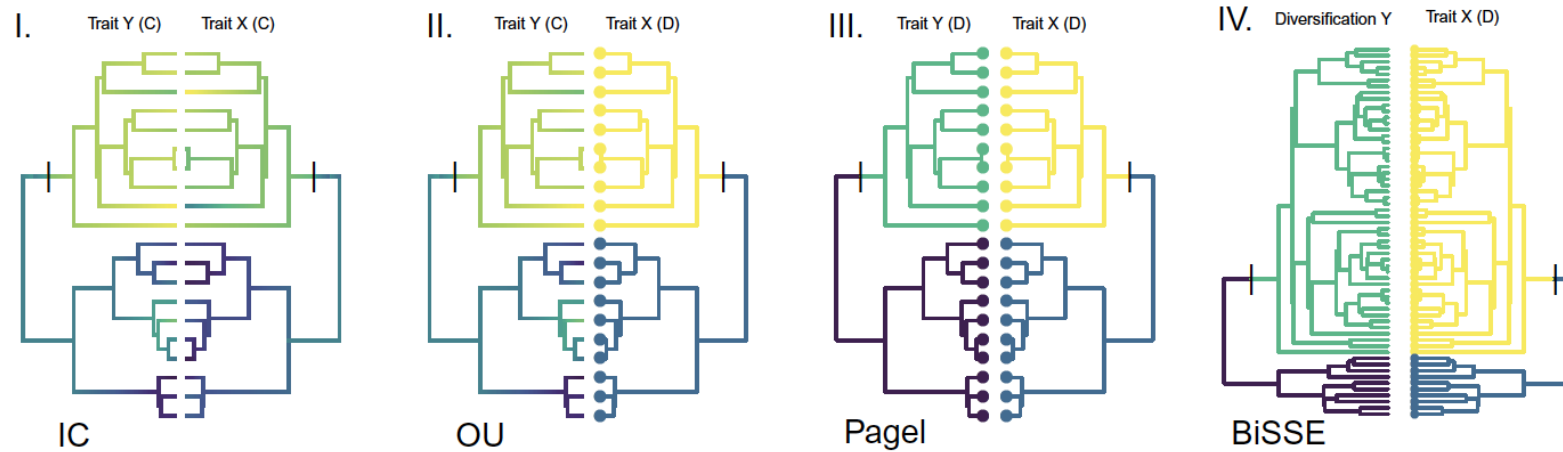
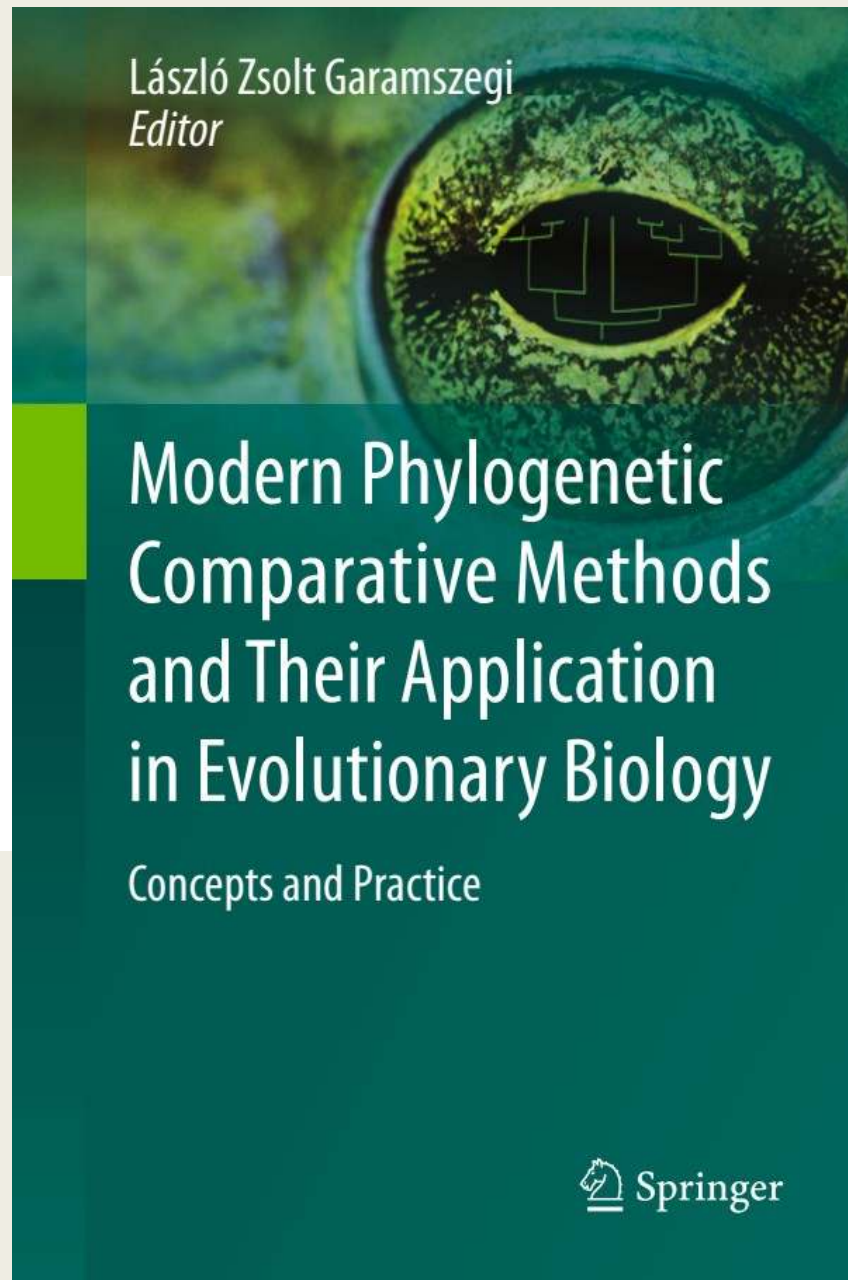


FIGURE 1. Singular, unrepeated events (vertical dashes) can generate apparently significant associations across several types of comparative analyses. Case Studies I–III are indicated in panels I–III, and though we do not consider diversification models such as BiSSE in our examples, they are similarly affected (panel IV). In each case, we map (in some cases, arbitrarily) the dependent variable (Y) on the phylogeny on the left and the predictor trait on the same phylogeny to the right (X), and indicate whether the trait is a continuous trait (C), a discrete trait (D) or a diversification rate. Colors on the branches indicate the state of the character on the phylogeny—either continuous trait value, discrete character state, or diversification rate regime. Panels I and III correspond to variations of “Felsenstein’s worst-case scenario” and “Darwin’s scenario,” respectively. We also suggest a common method used to analyze such associations: IC = Independent Contrasts (Felsenstein 1985); OU = Ornstein–Uhlenbeck models (Butler and King 2004); Pagel = Pagel’s correlation test (Pagel 1994).

# Desusos de Métodos Comparativos

**Chapter 14**  
**Use and Misuse of Comparative Methods  
in the Study of Adaptation**

**Thomas F. Hansen**





*Proc. R. Soc. Lond. B* **205**, 581–598 (1979)

581

*Printed in Great Britain*

## The spandrels of San Marco and the Panglossian paradigm: a critique of the adaptationist programme

BY S. J. GOULD AND R. C. LEWONTIN



# Interpretação de evidências de adaptação

- Um padrão pode ser gerado por vários processos
- Só uma boa conexão entre a pergunta e o processo de interesse junto com avaliação de hipóteses alternativas permite inferir adaptação
  - *Sempre levar em conta relações alométricas (com tamanho do corpo)*
- Importância de se usar modelos evolutivos adequados (e.g., OU)
- Toda adaptação é fruto de seleção, mas nem toda leva à adaptação.
  - *Correlação entre atributos, um estado de um atributo pode surgir como correlação a um outro e não como resposta a uma pressão evolutiva*
  - *Levar em conta o contexto ambiental (ou social se for o caso)*

doi:10.1111/j.1420-9101.2009.01757.x

REVIEW

# **The seven deadly sins of comparative analysis**

R. P. FRECKLETON

© 2009 THE AUTHOR. *J. EVOL. BIOL.* **22** (2009) 1367–1375

JOURNAL COMPILATION © 2009 EUROPEAN SOCIETY FOR EVOLUTIONARY BIOLOGY

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**Table 1** Seven deadly sins of comparative analysis.

Problem	Consequence	Solution	Software	
1 Putting undue faith in models with low $R^2$	Models with low explanatory power may be statistically significant. This is often a consequence of large sample sizes and in practice the effects of variables included in models are weak	The importance of weak predictors may be over-emphasized; $R^2$ is not a reliable measure of fit or relative fit	Use effect sizes as well as significance tests. AIC is a better measure for comparing model fit. Low $R^2$ is a diagnostic of lack of model fit	MasterBayes; gee function in APE; PGLM function in CAICR
2 Reporting both PI and PC analysis	PI and PC make very different assumptions about the distribution of data, and are best regarded as alternative models for the same data. As such they should not be treated equally	Models with alternative assumptions are treated equally; potentially conflicting results may be reported	Check residuals and data for phylogenetic dependence; use a correction if appropriate	BayesTraits; GEIGER; PDAP; CAICR
3 Not testing distributional assumptions	Phylogenetically corrected models make assumptions about the distribution of residuals that are the same as those made in nonphylogenetic analysis and are well known	Parameter estimates may be incorrect or biased. Reported $P$ -values may be incorrect	Use conventional regression diagnostics – check for linearity, normality of residuals and homogeneity of variance (all adjusted for phylogeny)	gee function in APE; CAIC/CAICR; MasterBayes
4 Data dredging	In analyses, comparing a large number of predictors, best fit models are selected by comparing a large number of alternative models, or by using significance tests on parameters to distinguish models	High probability of type I errors; degenerate sampling distributions for parameters. Selected model is often no better than many possible alternatives. Outcome is highly sensitive to collinearity	Clearly identify hypotheses to be tested and test those. Report all stages in the model selection process. Use the full model when appropriate; when selection is necessary use model averaging or a multi-model approach	gee function in APE; CAICR; MasterBayes
5 Treating residuals as data	Residuals from regressions of the response on confounding variables are used to control for unwanted effects in multi-variable regressions	Results in biases, particularly when the predictors are collinear	Use multipredictor analyses rather than univariate methods; do not use residuals in model fitting	gee function in APE; CAICR; MasterBayes
6 Ignoring alternative models	Methods such as contrasts and GLS assume that residuals are distributed according to the predictions of a Brownian model of trait evolution. This may not be the cases and other processes may be operating	The phylogenetic correction may not be fully effective. The effects of important processes such as stabilizing selection, varying rates of evolution or other factors shaping trait variation may be missed	Consider alternative models, such as OU model, $\delta$ , $\lambda$ or $\kappa$ transformations of Pagel (1997, 1999), or models incorporating rate variations	BayesTraits, GEIGER, LASER, APE, OUCH
7 Ignoring quality control of data	Data from disparate sources vary in quality and may be erroneous. Data may be missing for significant numbers of species	Low quality data will compromise statistical power. Missing data can lead to biases in the outcome of analyses	Employ quality criteria for data inclusion. Analyse data to determine whether data are missing randomly with respect to other variables. Consider imputation methods	MasterBayes

## Shedding light on the ‘dark side’ of phylogenetic comparative methods

Natalie Cooper<sup>1,2\*</sup>, Gavin H. Thomas<sup>3</sup> and Richard G. FitzJohn<sup>4</sup>

- Leitura cuidadosa antes de utilizar os métodos no R
- Sempre ser crítico sobre os resultados
- Importância de se reportar as análises utilizando ferramentas de reprodutibilidade (R Markdown, LaTeX etc)

# Onde encontrar mais informações sobre PCMs?

## ■ Canais do YouTube

- *Evolution 2015, 2016 (Vídeos com palestras do congresso)*
- *PhyloMeth (Curso online sobre métodos comparativos)*
- *NMBios (cursos sobre genética quantitativa e métodos comparativos)*
- *Phyloseminar (ciclo de palestras online sobre diversos temas em ecologia e evolução)*

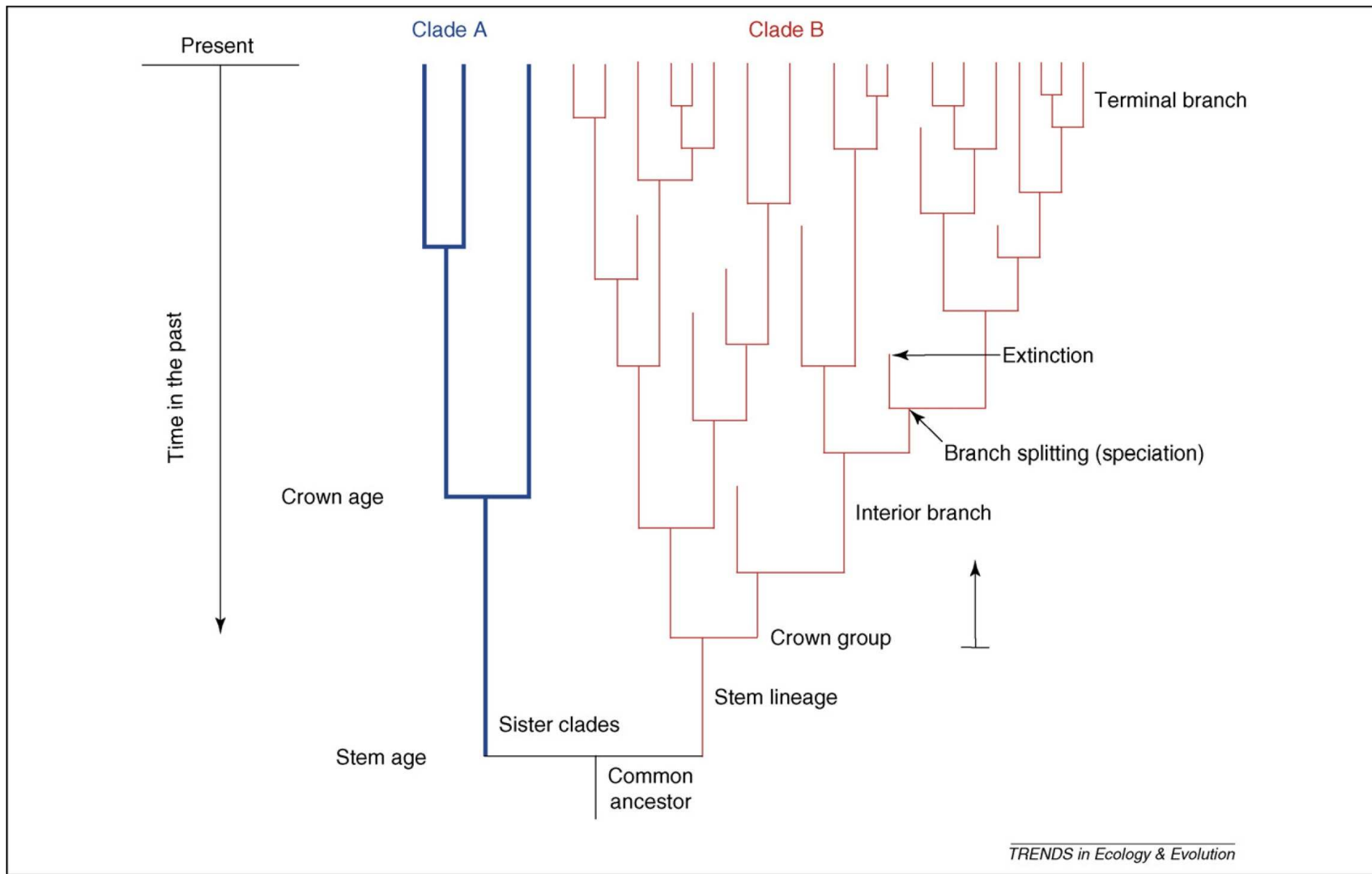
## ■ Listas de email (R-SIG-PHYLO) e foruns (stackoverflow.com)

## ■ Cursos do Liam Revell e Luke Harmon (disponíveis no GitHub)

## ■ Companion sites de livros do Charles Nunn e Garamszegi

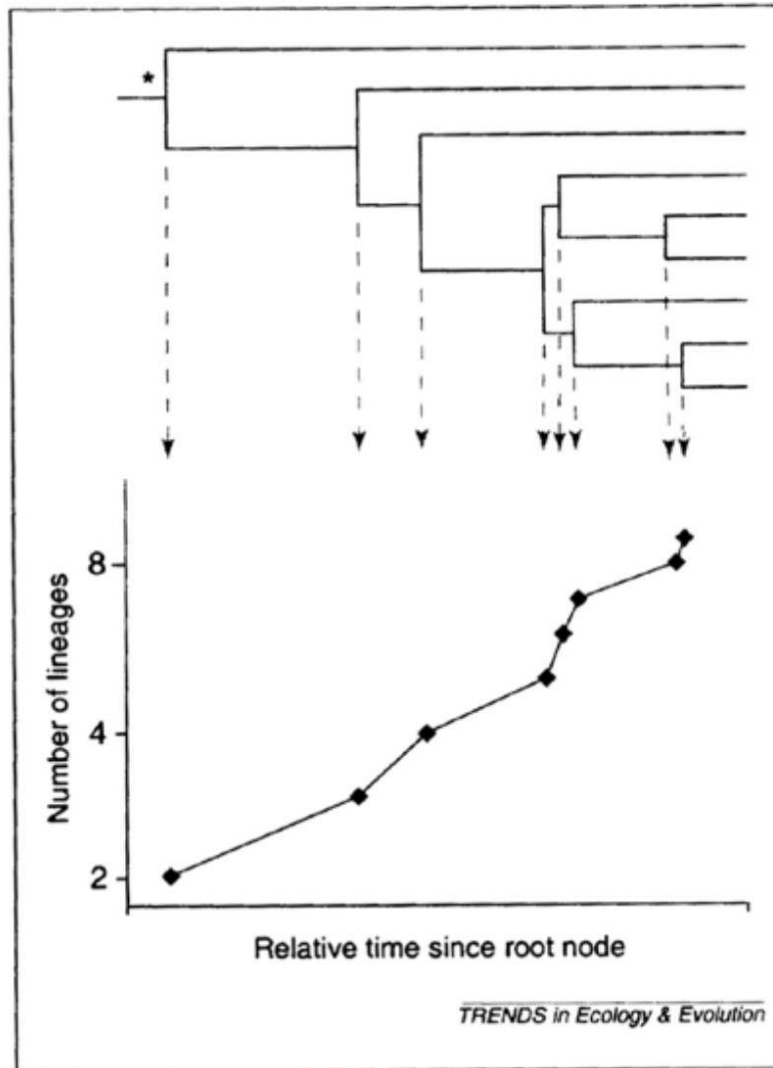


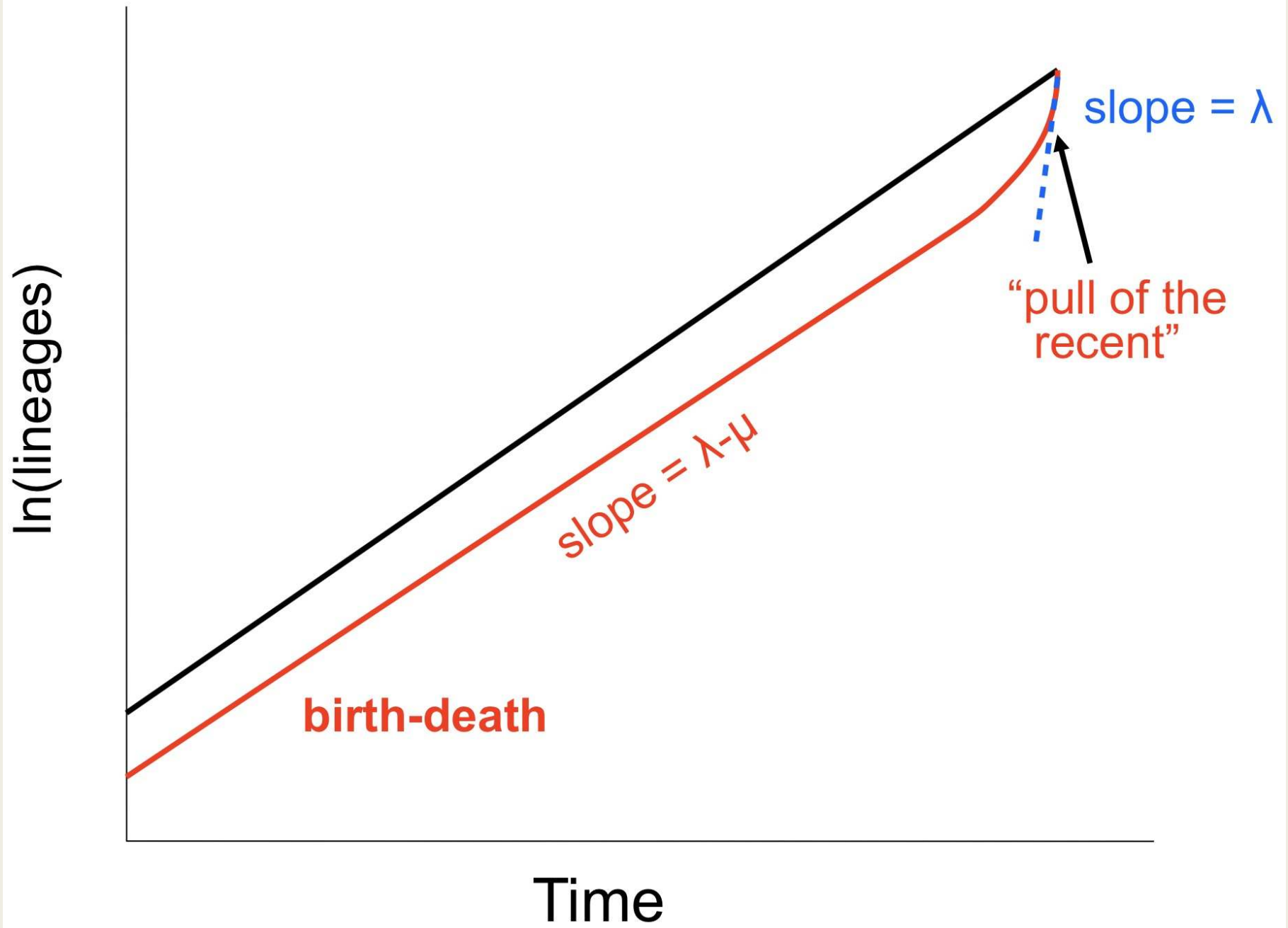
# Métodos para inferir dinâmica de diversificação de linhagens

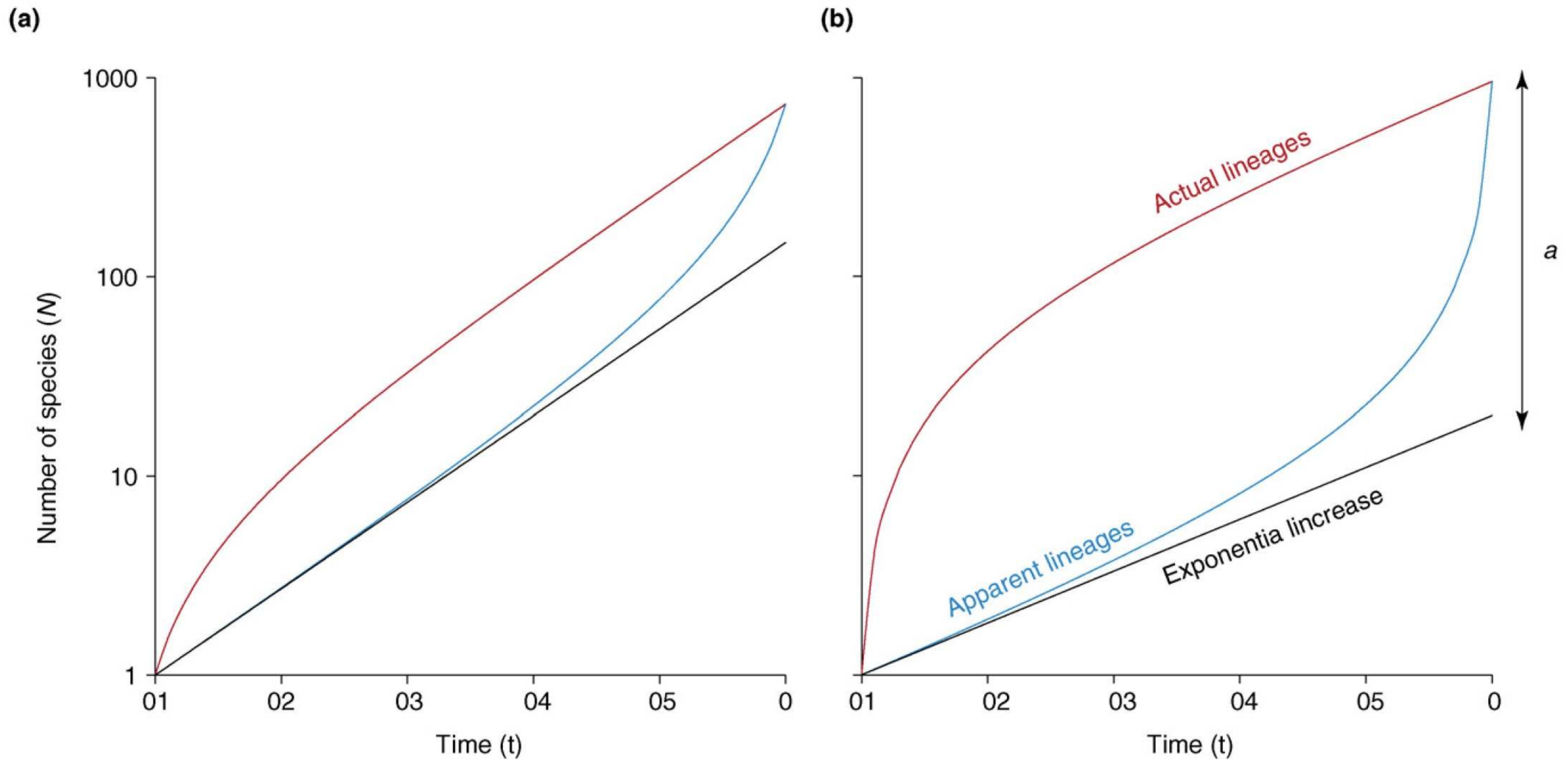


**Figure 1.** Terms pertaining to phylogenetic trees. Sister clades A and B have a common ancestor at the base of the phylogeny from which the stem lineage (i.e. common ancestor) of each clade descends. At any one time, a clade consists of two or more independently evolving lineages, which are branches of the tree. The stem age of a clade

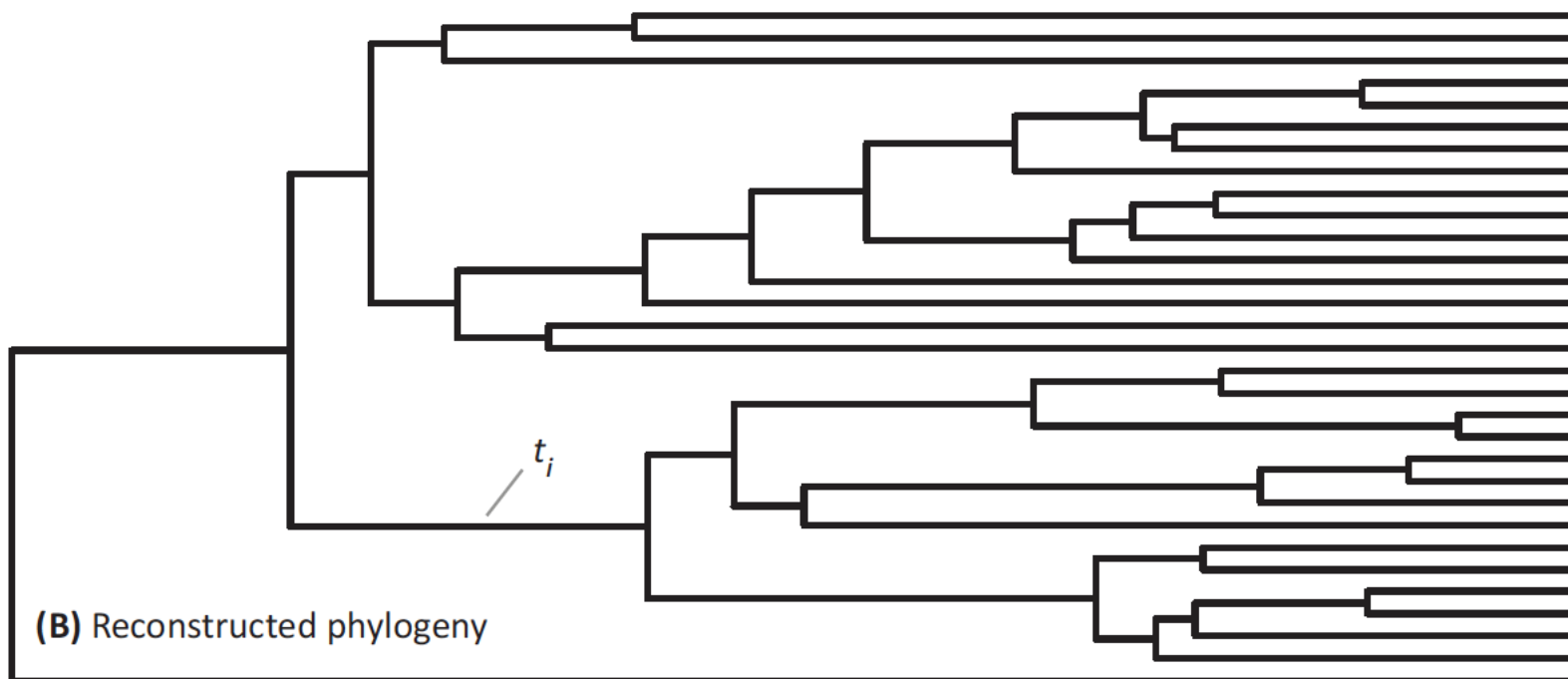
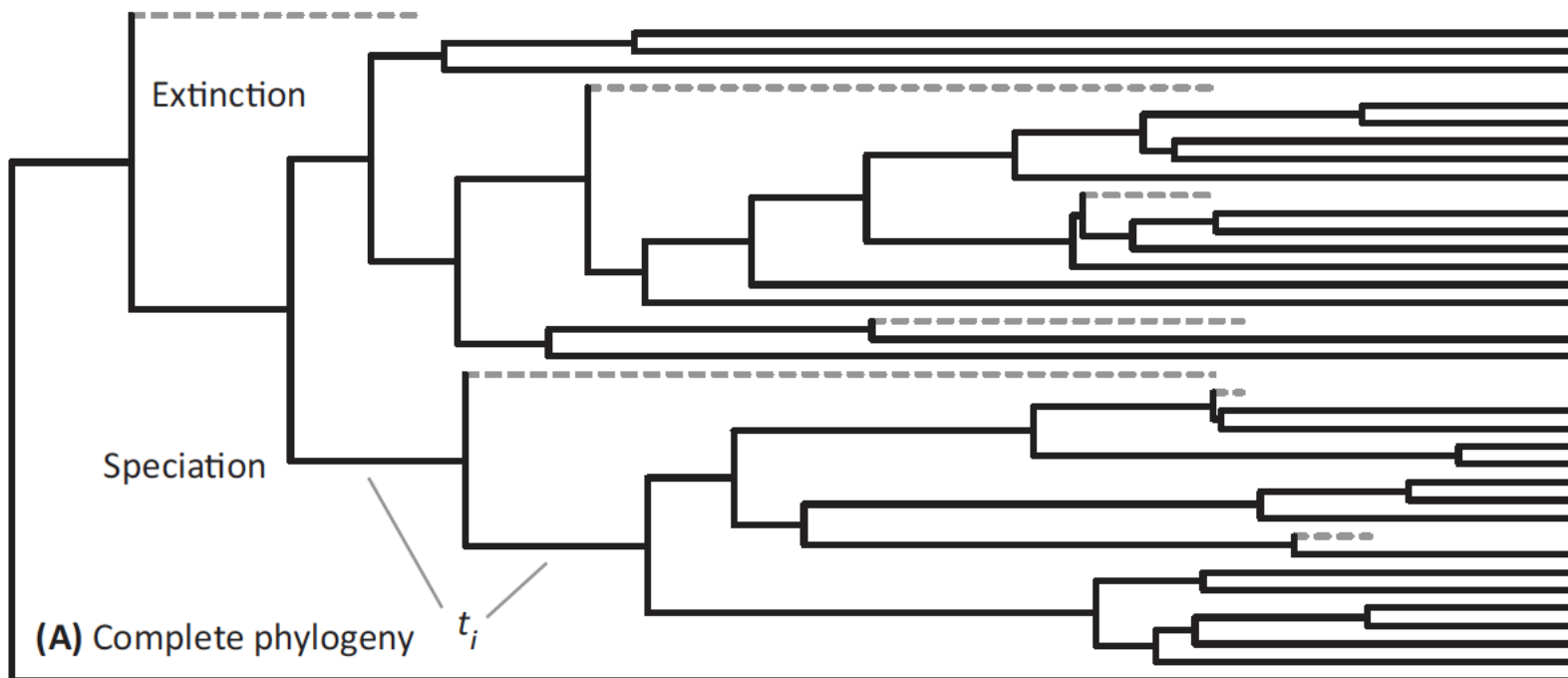
# Lineage-through-time







**Figure 1.** LTT plots for the average number of extant (actual) lineages ( $N$ ) (red lines) and the average number of apparent lineages (i.e. ancestral to living species) ( $N_A$ )



Paleobiology. 1977. vol. 3, pp. 23–40.

## The shape of evolution: a comparison of real and random clades

Stephen Jay Gould, David M. Raup, J. John Sepkoski, Jr., Thomas J. M. Schopf, and Daniel S. Simberloff

*Paleobiology*, 11(1), 1985, pp. 42–52

## Mathematical models of cladogenesis

David M. Raup

## STOCHASTIC SIMULATION AND EVOLUTION OF MORPHOLOGY—TOWARDS A NOMOTHETIC PALEONTOLOGY

DAVID M. RAUP AND STEPHEN JAY GOULD



VOLUME 81

NUMBER 5

## THE JOURNAL OF GEOLOGY

September 1973

STOCHASTIC MODELS OF PHYLOGENY AND  
THE EVOLUTION OF DIVERSITY<sup>1</sup>

DAVID M. RAUP, STEPHEN JAY GOULD, THOMAS J. M. SCHOPF, AND DANIEL S. SIMBERLOFF

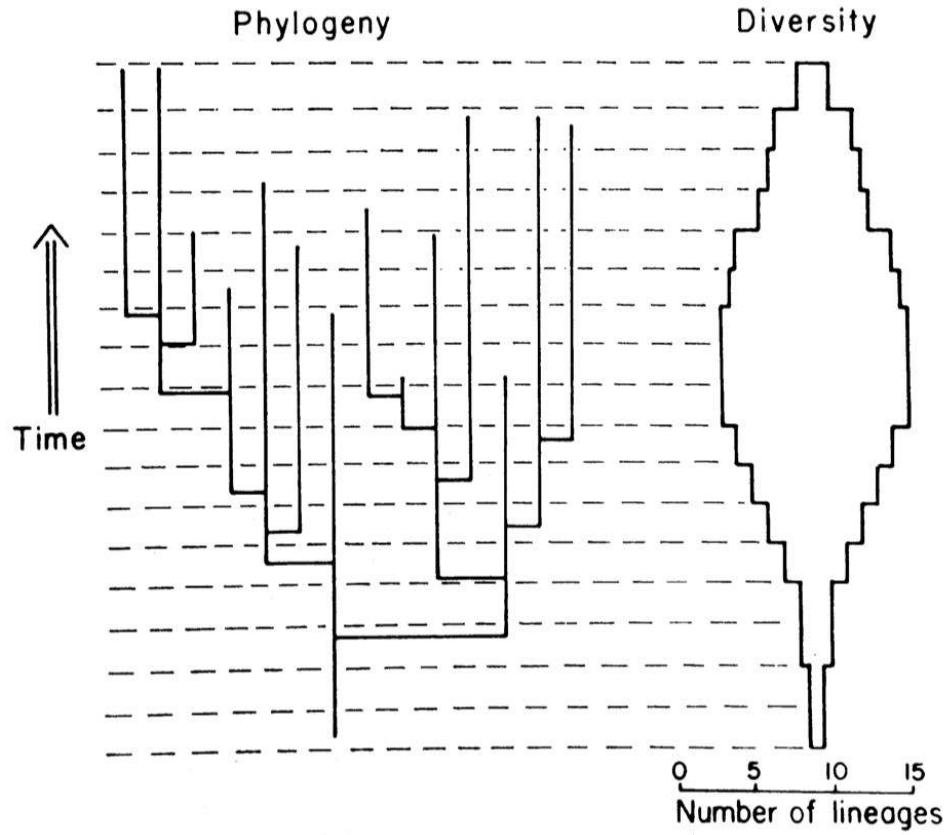


FIG. 1.—Hypothetical phylogeny (left) and the pattern of change in number of lineages through time (right).

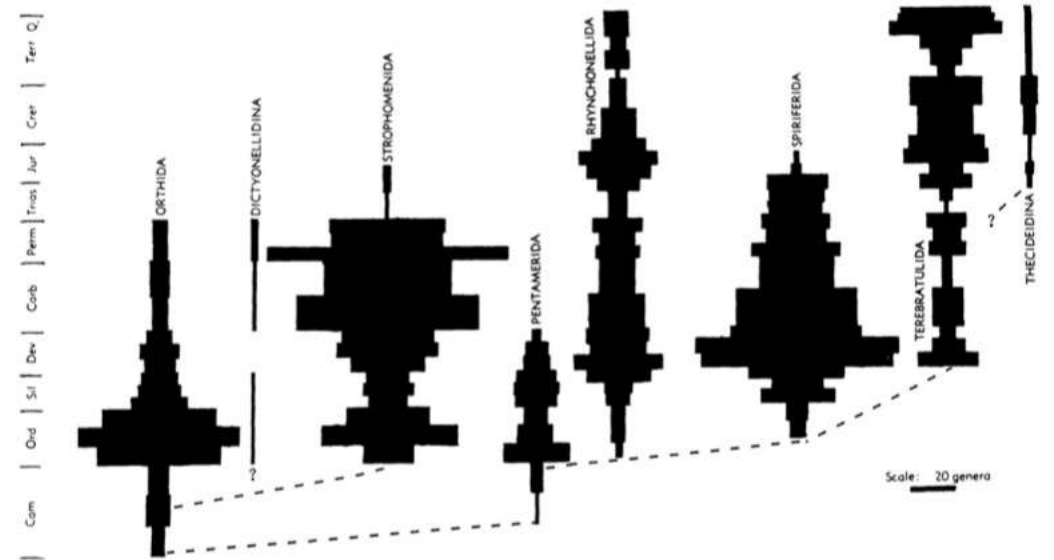
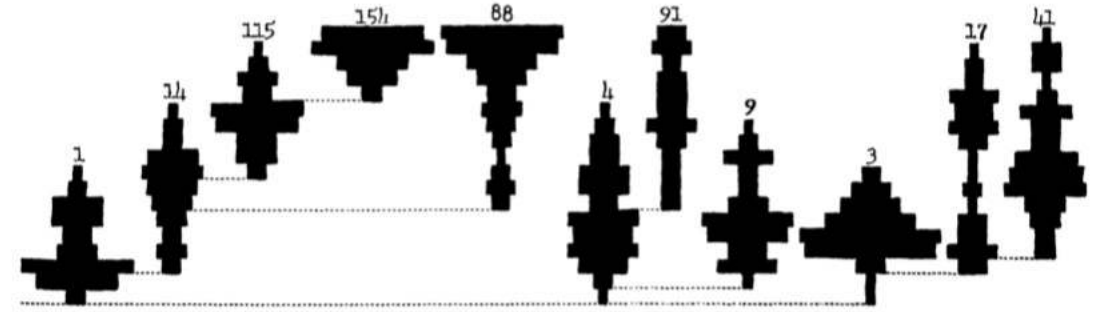


FIGURE 1. Comparison of random with real clades. Top: clades for one run of the MBL program at branching and extinction probabilities of 0.1. Bottom: real clades for genera within orders of brachiopods, from

# The reconstructed evolutionary process

SEAN NEE, ROBERT M. MAY AND PAUL H. HARVEY

*Phil. Trans. R. Soc. Lond. B* (1994) **344**, 305–311



*Proc. Natl. Acad. Sci. USA*  
Vol. 89, pp. 8322–8326, September 1992  
Evolution

## Tempo and mode of evolution revealed from molecular phylogenies

SEAN NEE\*, ARNE Ø. MOOERS\*, AND PAUL H. HARVEY\*†

# ECOLOGY LETTERS

*Ecology Letters*, (2014) 17: 508–525

doi: 10.1111/ele.12251

**REVIEW AND  
SYNTHESIS**

## Phylogenetic approaches for studying diversification

### Abstract

Estimating rates of speciation and extinction, and understanding how and why they vary over

Hélène Morlon\*

# Modelos de Diversificação de linhagens

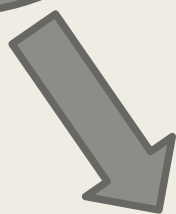
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graph TD; A[Modelos de Diversificação de linhagens] --> B(Espécies são a unidade de diversificação, sem referência a indivíduos, Tamanho de população, ou distribuição geográfica); A --> C(Dinâmica de indivíduos, Tamanho de população, ou range geográfico é considerado explicitamente);
```

Espécies são a unidade de diversificação, sem referência a indivíduos, Tamanho de população, ou distribuição geográfica

Dinâmica de indivíduos, Tamanho de população, ou range geográfico é considerado explicitamente

# Pressupostos dos modelos de diversificação

Variação das taxas



Varia com o tempo

Constante

Heterogeneidade



Homogênea

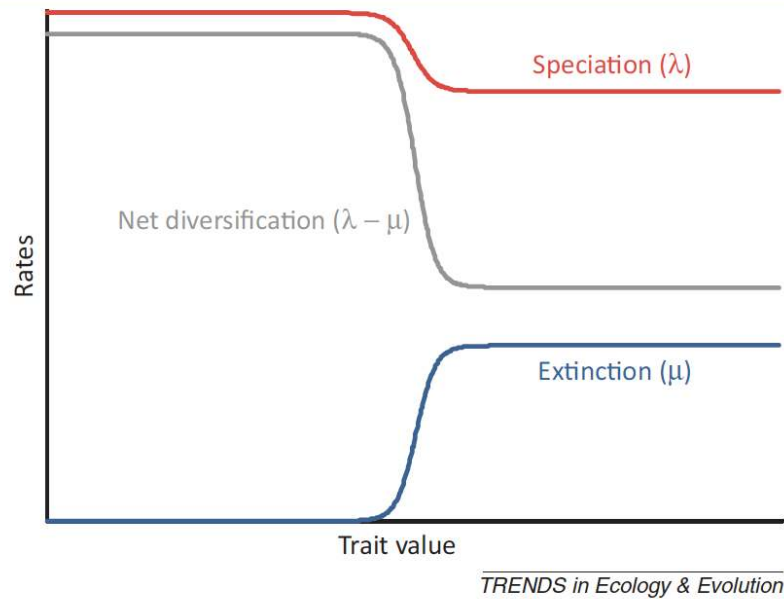
Varia entre linhagens

Comprimento do processo de especiação



instantânea

Protaída



**Figure 1.** Example of a sigmoidal relation between speciation (negative) and extinction (positive) and a continuously valued trait (e.g., body size), resulting in greater diversification of clades that have lower values of that trait due to their higher net diversification rate.

Modelos que estimam a diversificação dependente de um atributo

Família de modelos xxSSE

BiSSE, MuSSE, QuaSSE, GeoSSE, BiSSEnes

Hidden States (Semi-paramétricos)

(a) Species level phylogeny / branching times

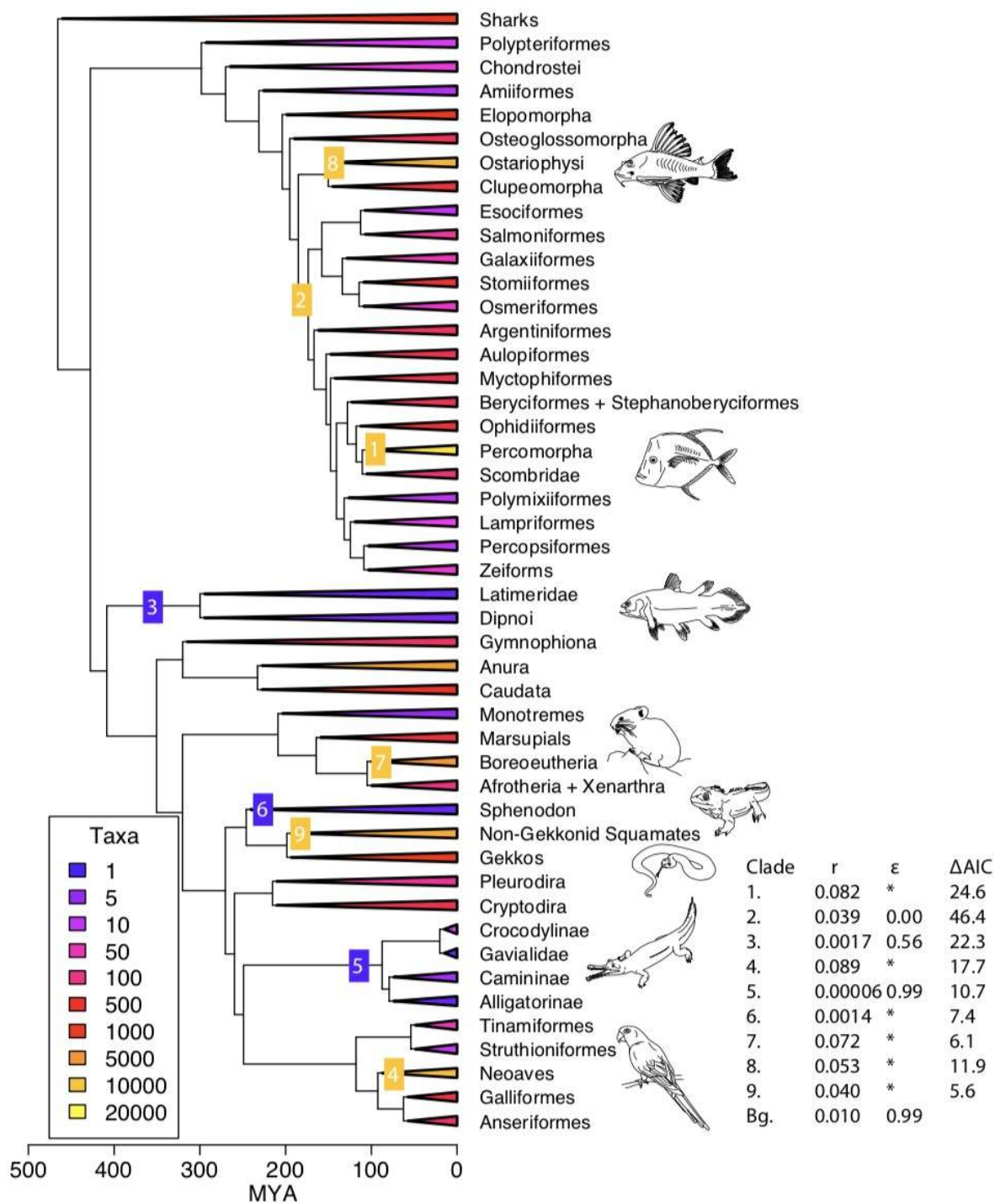


+ Traits

- \*
- ▲
- ▲
- \*
- \*

# Nine exceptional radiations plus high turnover explain species diversity in jawed vertebrates

Michael E. Alfaro<sup>a,1</sup>, Francesco Santini<sup>a</sup>, Chad Brock<sup>b</sup>, Hugo Alamillo<sup>b</sup>, Alex Dornburg<sup>c</sup>, Daniel L. Rabosky<sup>d,e</sup>, Giorgio Carnevale<sup>f</sup>, and Luke J. Harmon<sup>g</sup>



# Methods in Ecology and Evolution



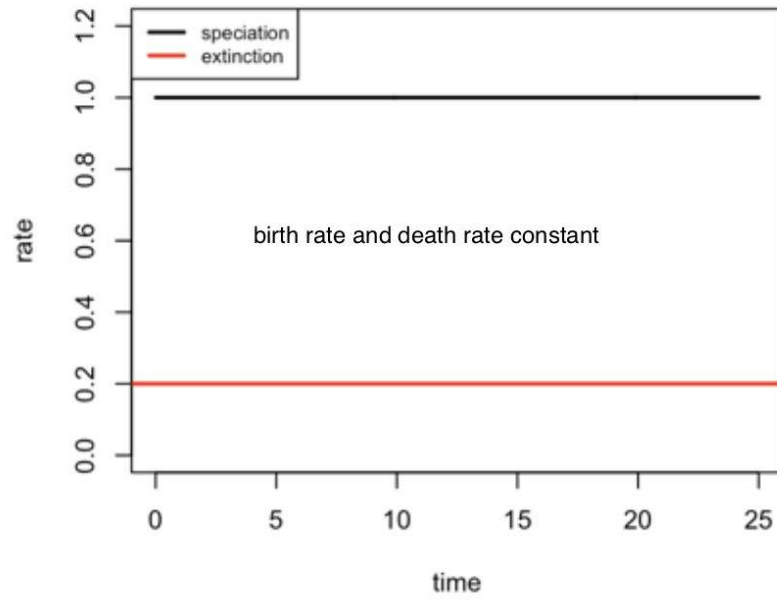
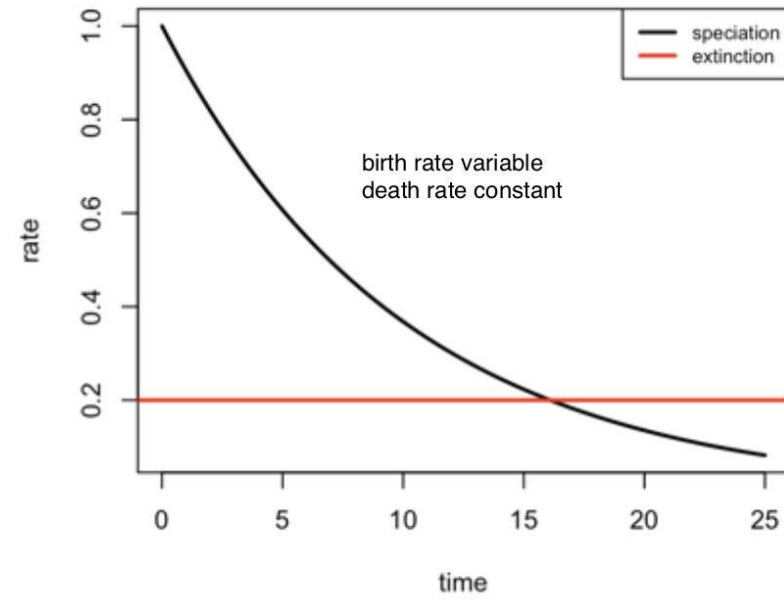
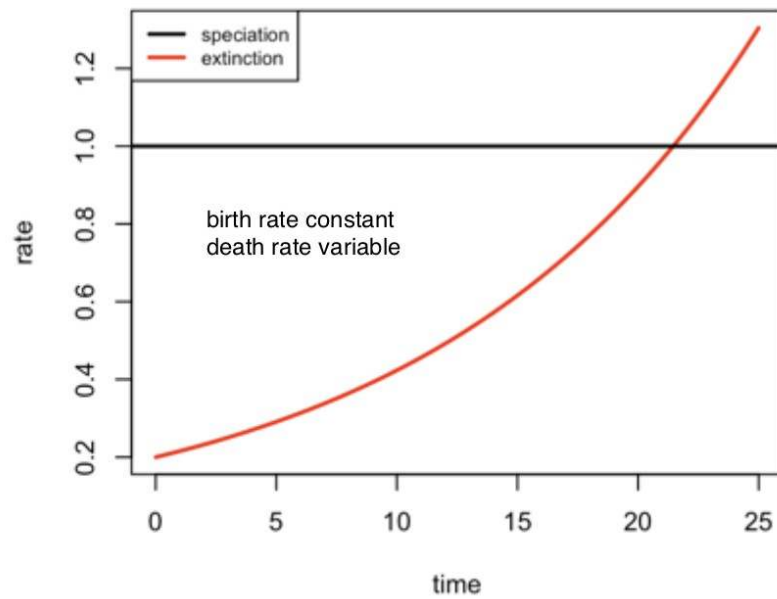
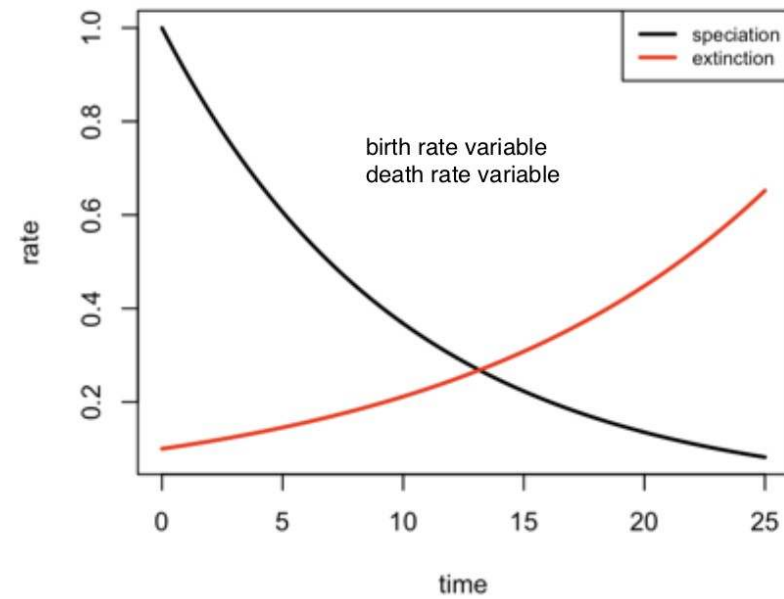
*Methods in Ecology and Evolution* 2016, 7, 589–597

doi: 10.1111/2041-210X.12526

**APPLICATION**

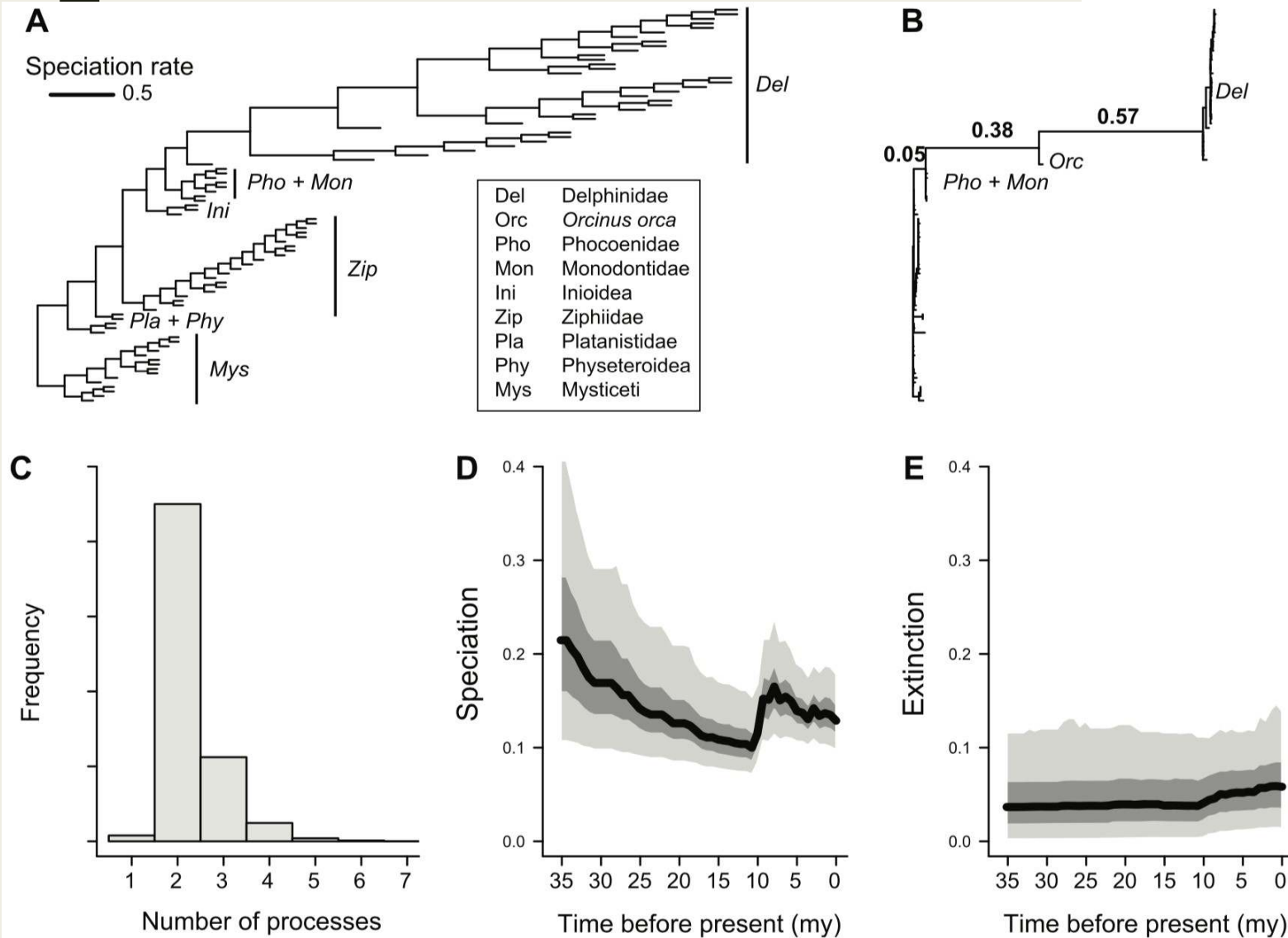
## **RPANDA: an R package for macroevolutionary analyses on phylogenetic trees**

**Hélène Morlon<sup>1\*</sup>, Eric Lewitus<sup>1</sup>, Fabien L. Condamine<sup>2</sup>, Marc Manceau<sup>1</sup>, Julien Clavel<sup>1</sup> and Jonathan Drury<sup>1</sup>**

**BCSTDCST****BVARDCST****BCSTDVAR****BVARDVAR**

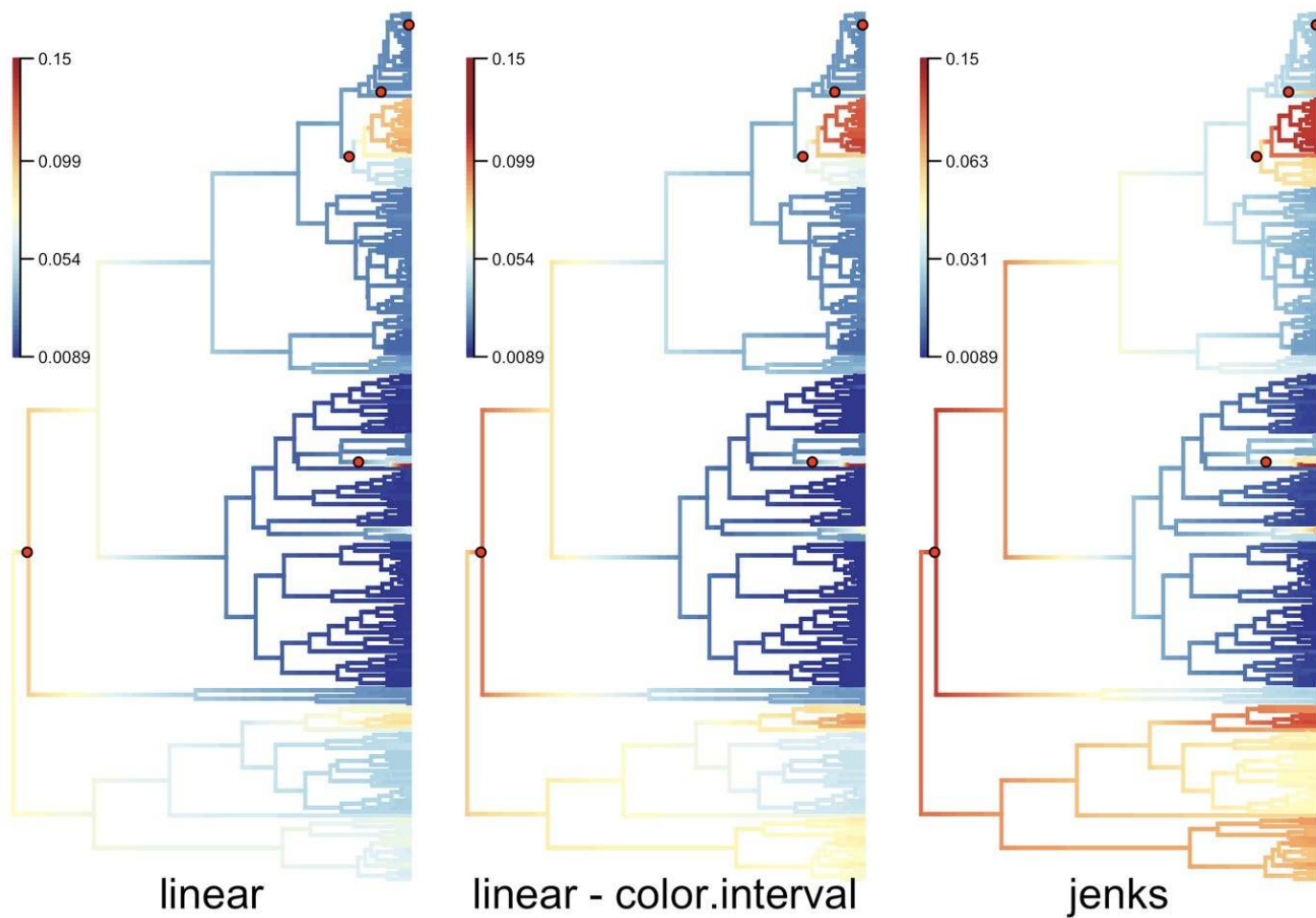
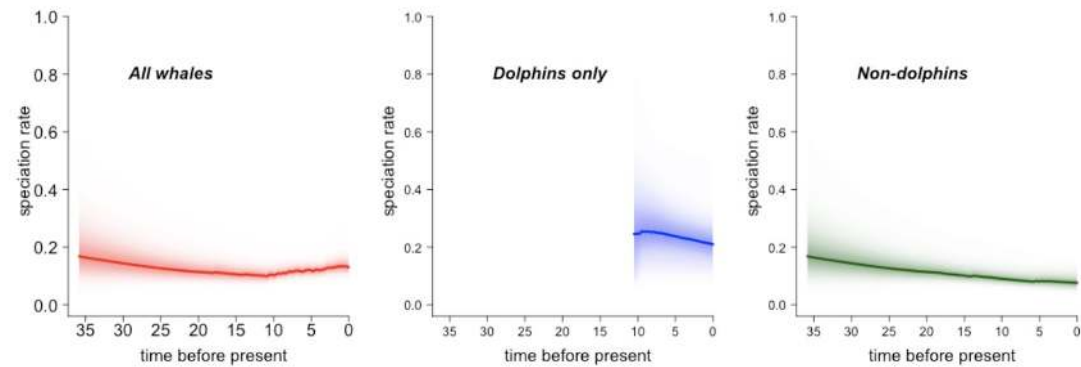
# Automatic Detection of Key Innovations, Rate Shifts, and Diversity-Dependence on Phylogenetic Trees

Daniel L. Rabosky\*



**Figure 9. Dynamics of cetacean diversification through time as revealed by BAMM analysis.** (A) Phylogeny of cetaceans [51], with branch

### 3.6. Rate variation through time: color density plot



Fim da Parte 2

Perguntas?



**Be Happy**

**'Cause**

**Its**

**Lunch**

**Time**