

Incorporating Heterogenous Data Sources in Phylogenetic Modeling

April Wright

LBRN Annual Meeting

January 18



SOUTHEASTERN
LOUISIANA UNIVERSITY



Big Data



Mazberry.com

Datanami.com

Big Data

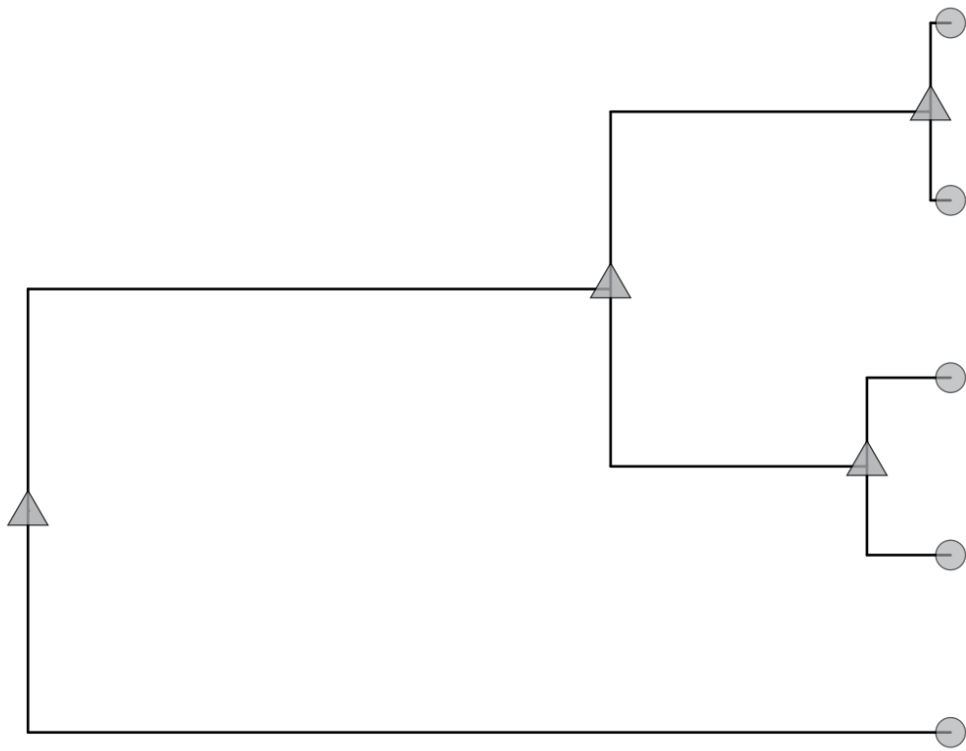


A word cloud graphic with the letters 'RIG' in large, bold, orange font. Surrounding 'RIG' are various words in smaller fonts, including 'USE', 'ONE', 'SINCE', 'SOFTWARE', 'REPAIRING', 'UBIQUITOUS', 'RADIO-FREQUENCY', 'WORKING', 'TYPES', and 'USING'.

Heterogeneous data = data coming from multiple sources, each with their own generating and collection process

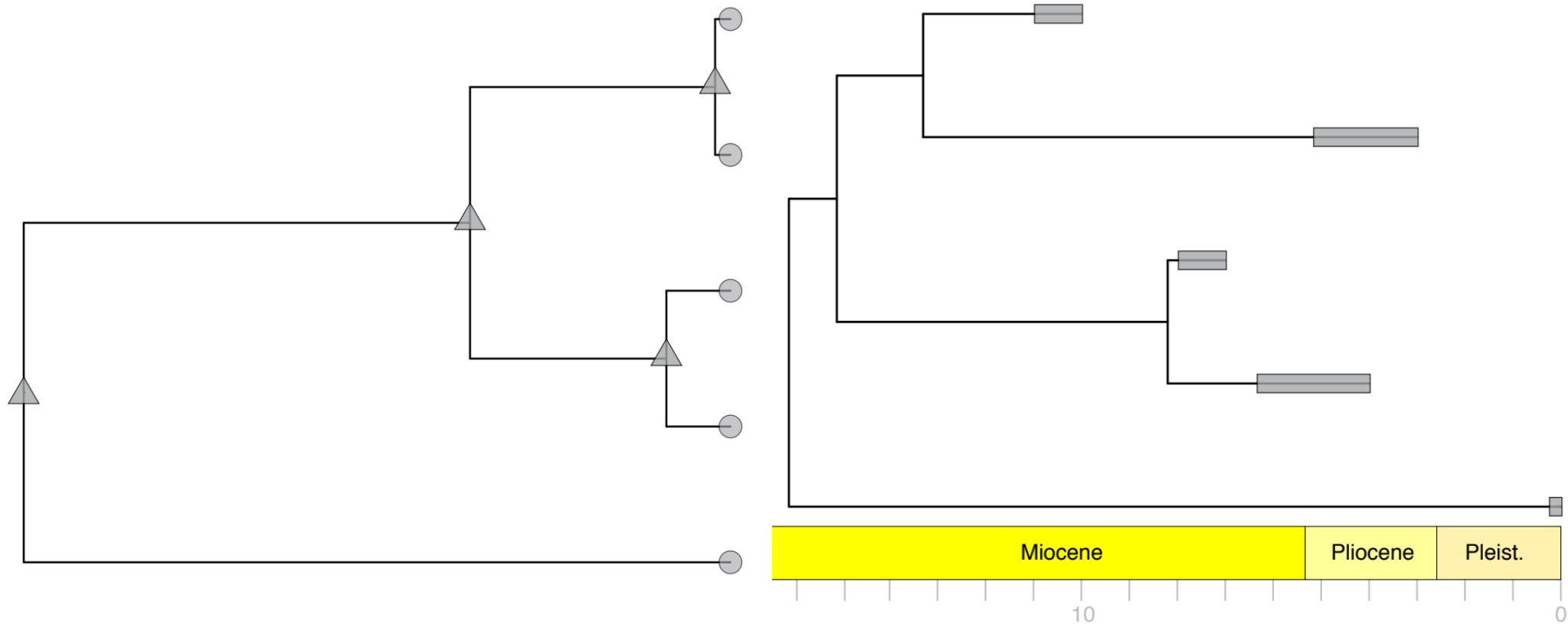


A word cloud graphic with the word 'STORAGE' in large, bold, grey font. Surrounding 'STORAGE' are various words in smaller fonts, including 'COMPUTING', 'TOOLS', 'WITHIN', 'PROCESS', 'DEFINITION', 'SEARCH', 'RECONSIDER', 'OPPORTUNITIES', 'INFO', 'COMPLEX', 'DATABASES', 'RESEARCH', 'MPP', 'TERABYTES', 'COST', 'CONTINUES', 'CITATION', 'RECORDS', 'INDEXING', 'DIFFICULTY', 'TARGET', 'ABILITY', 'SENSORS', 'ARCHIVES', 'AMOUNT', 'DESCRIBING', 'ELAPSED', 'CURRENT', 'THOUGHT', 'LARGE', 'EVERY', 'LARGER', 'CASE', 'STO', 'UNION', 'SOCIAL', 'PR', 'WORLD', 'SHA', 'ZETTABYTES', 'COMBAT', 'INCLU', 'BIOGEOCHEMICAL', 'CONNECTIONS', 'DEFINING', 'STO', 'UNION'.



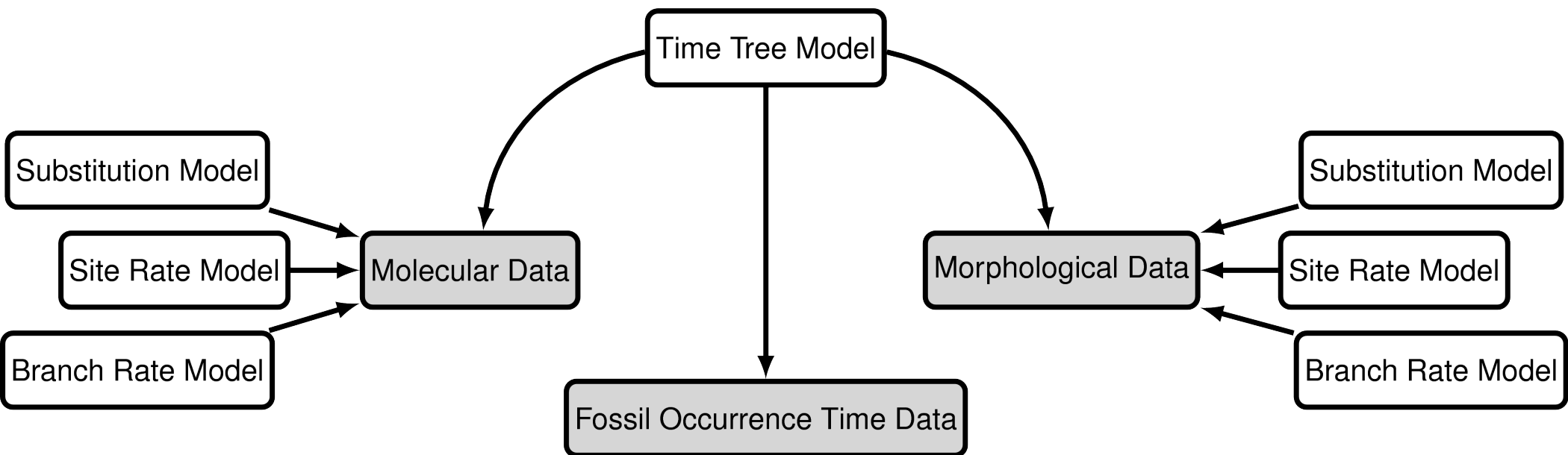
Estimating phylogenetic trees usually involves modeling the evolution of nucleotide sequences over time

Wright and
Warnock, in
review



Scaling phylogeny to time involves adding in age information, and often phenotypic information

Wright and
Warnock, in
review



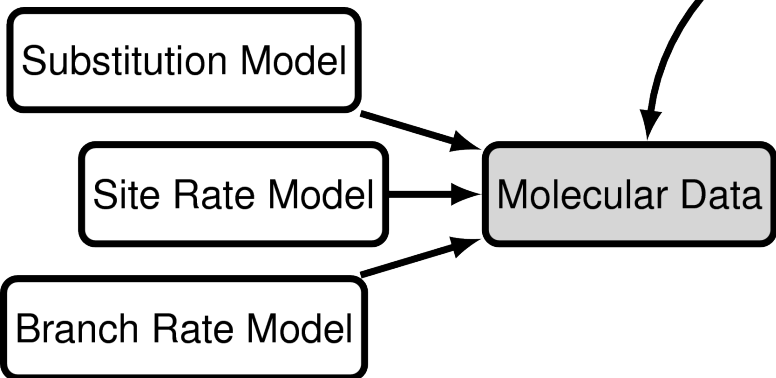
Substitution Model

Site Rate Model

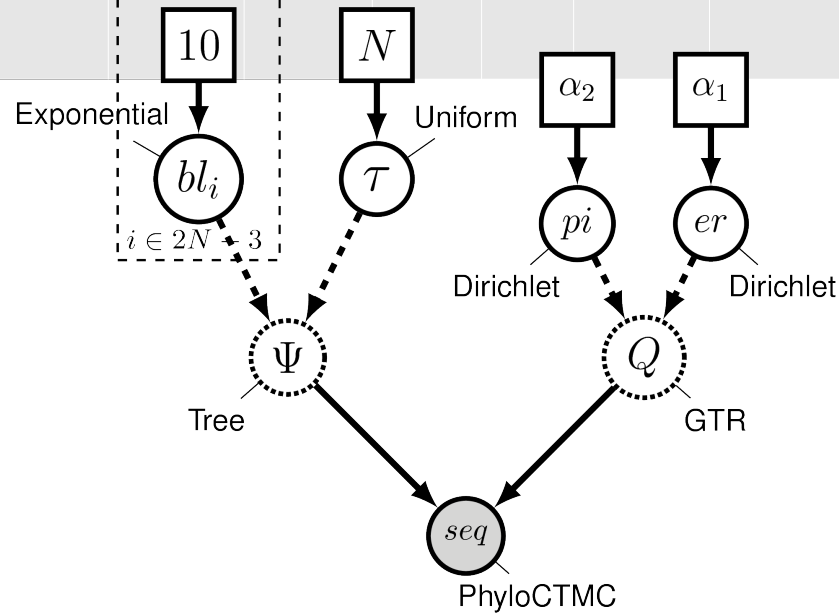
Branch Rate Model

Molecular Data

Taxon 1	A	C	T	A	C	T	C	G	
Taxon 2	A	C	T	A	A	T	G	T	C
Taxon 3	A	T	T	A	C	T	G	T	G
Taxon 4	G	G	A	A	C	T	G	G	T
Taxon 5	G	G	C	T	C	T	G	A	A

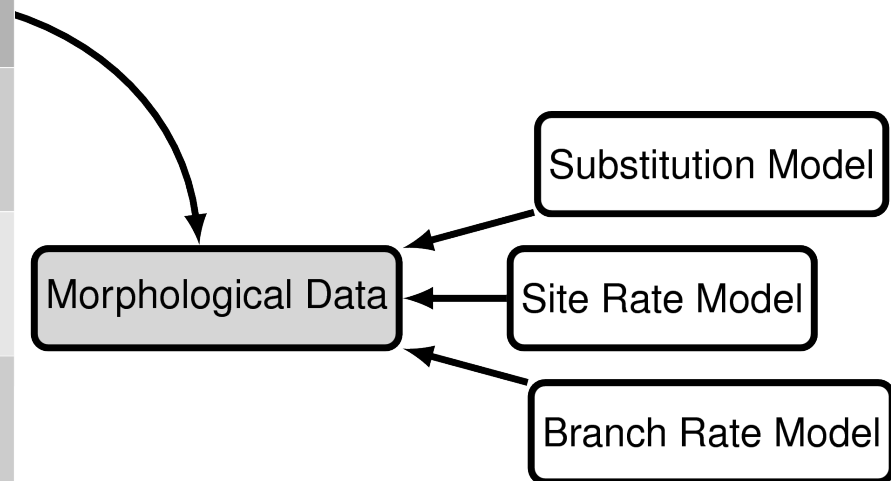


Taxon 1	A	C	T	A	C	T	C	G	
Taxon 2	A	C	T	A	A	T	G	T	C
Taxon 3	A	T	T	A	C	T	G	T	G
Taxon 4	G	G	A	A	C	T	G	G	T
Taxon 5	G	G	C	T	C	T	G	A	A

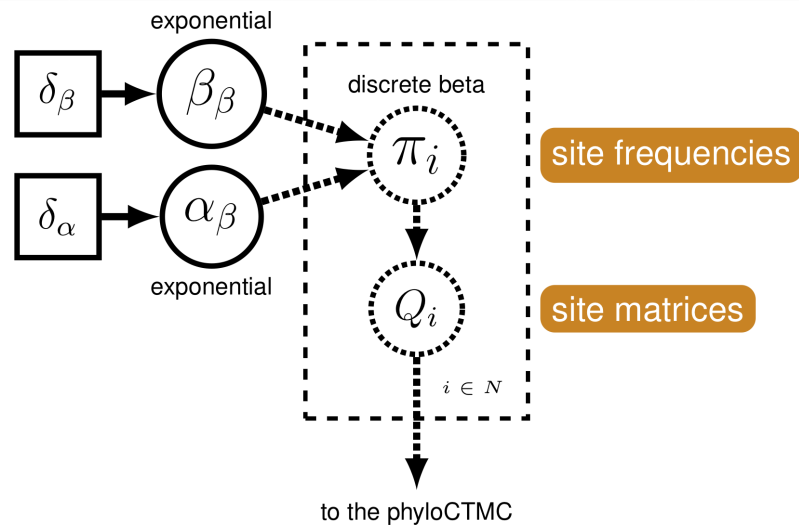
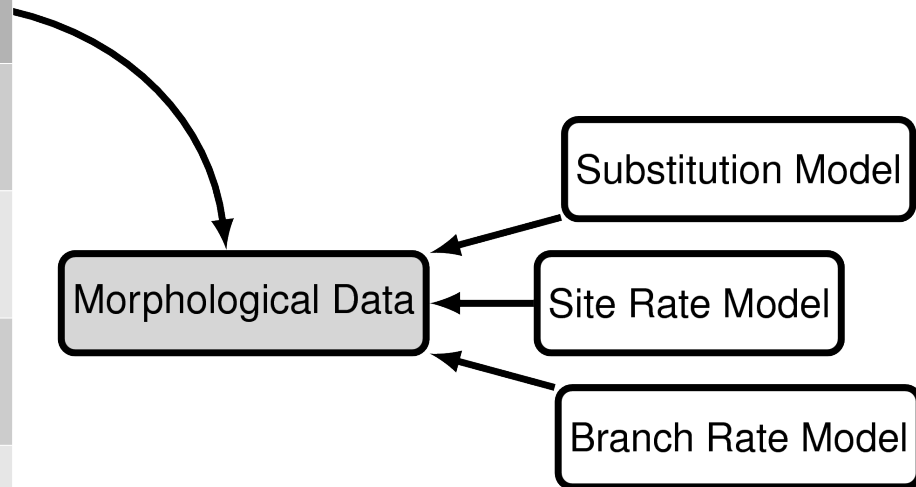


Wright, Pett
and Heath

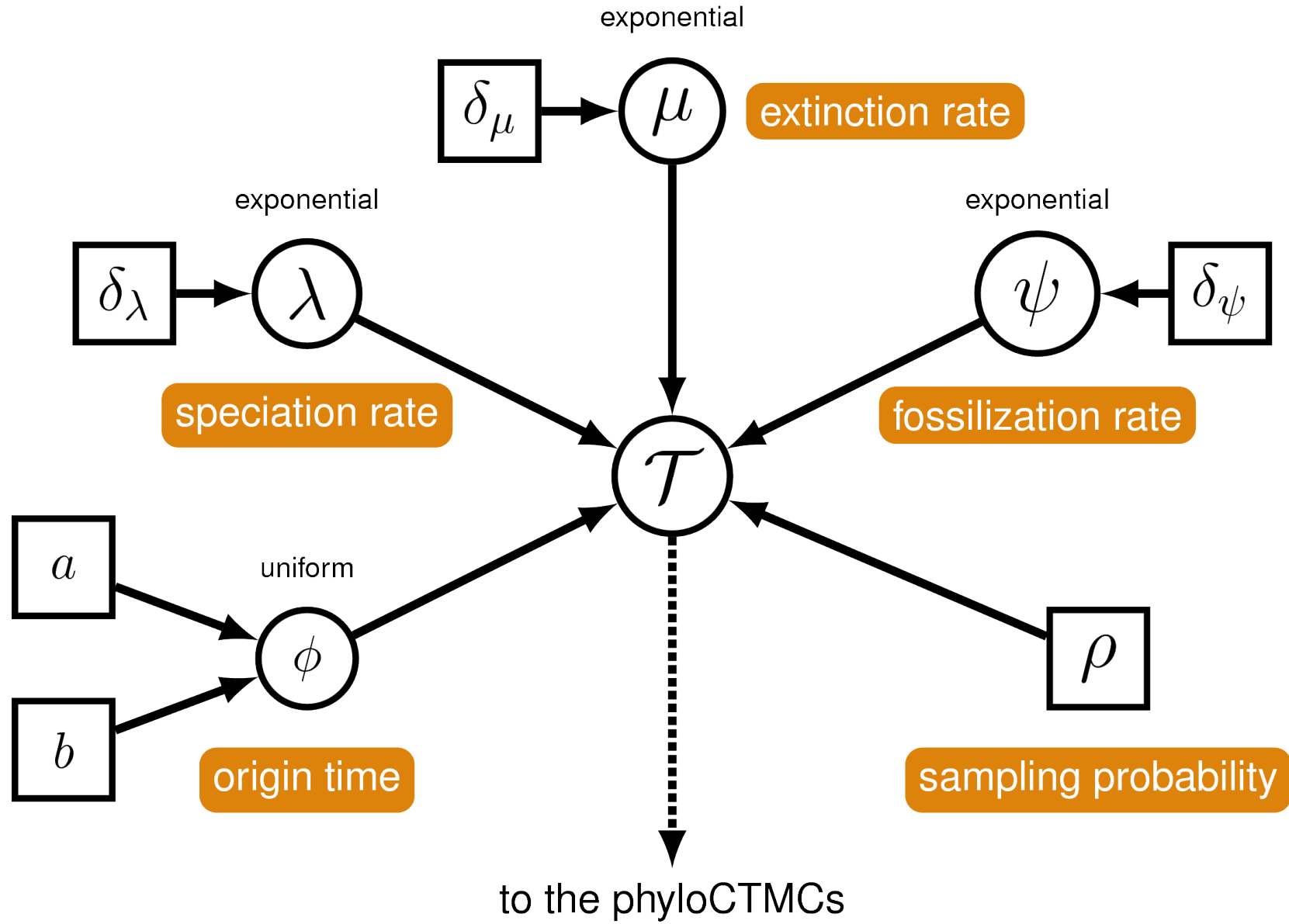
Taxon 1	0	0	0	0	0	0	0	0	0
Taxon 2	0	2	0	2	1	1	0	0	0
Taxon 3	1	2	0	2	3	0	0	1	1
Taxon 4	1	1	1	1	3	1	0	1	1
Taxon 5	1	1	0	1	2	1	1	1	0

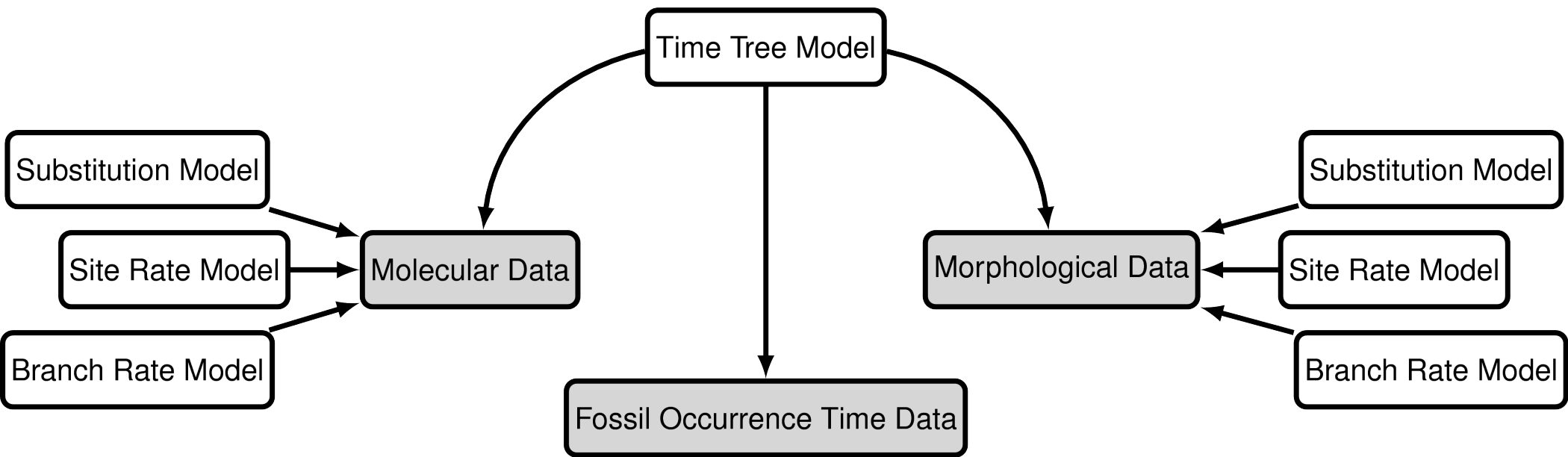


Taxon 1	0	0	0	0	0	0	0	0	0
Taxon 2	0	2	0	2	1	1	0	0	0
Taxon 3	1	2	0	2	3	0	0	1	1
Taxon 4	1	1	1	1	3	1	0	1	1
Taxon 5	1	1	0	1	2	1	1	1	0

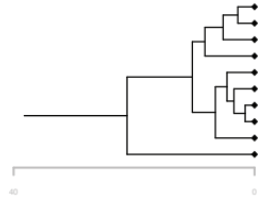


Wright, Pett
and Heath

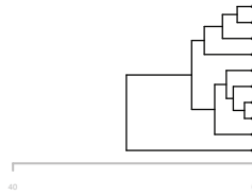




The complete outcome
of the diversification and
sampling processes



The reconstructed tree



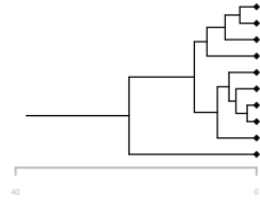
Model parameters

speciation (λ) = 0.1

Pure birth process

Wright and
Warnock, in
review

The complete outcome
of the diversification and
sampling processes



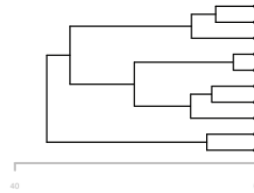
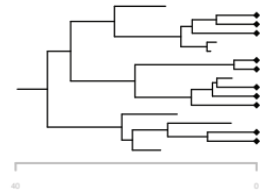
The reconstructed tree



Model parameters

speciation (λ) = 0.1

Pure birth process

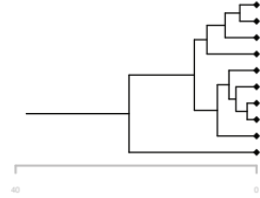


speciation (λ) = 0.1
extinction (μ) = 0.05

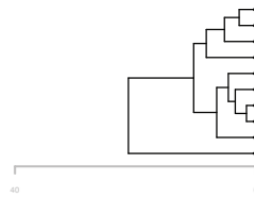
Birth-death process

Wright and
Warnock, in
review

The complete outcome
of the diversification and
sampling processes



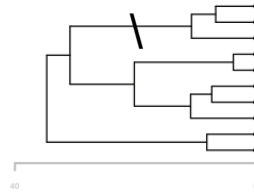
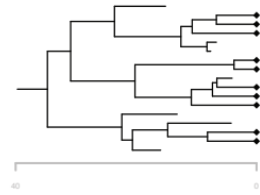
The reconstructed tree



Model parameters

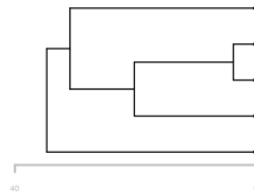
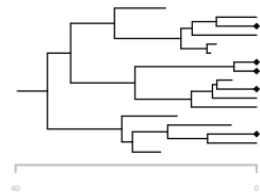
speciation (λ) = 0.1

Pure birth process



speciation (λ) = 0.1
extinction (μ) = 0.05

Birth-death process

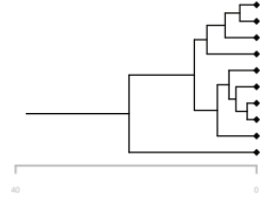


speciation (λ) = 0.1
extinction (μ) = 0.05
extant sampling (ρ) = 0.6

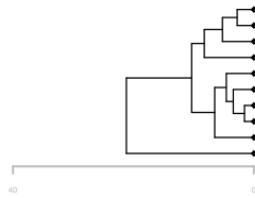
Birth-death sampling process

Wright and
Warnock, in
review

The complete outcome
of the diversification and
sampling processes



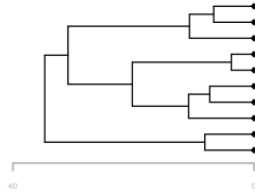
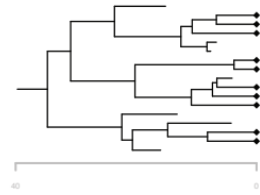
The reconstructed tree



Model parameters

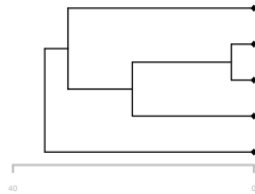
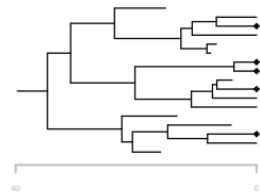
speciation (λ) = 0.1

Pure birth process



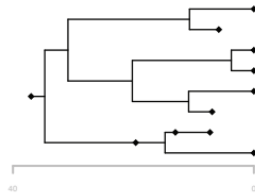
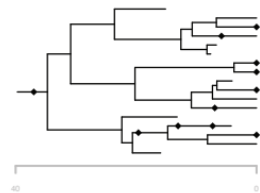
speciation (λ) = 0.1
extinction (μ) = 0.05

Birth-death process



speciation (λ) = 0.1
extinction (μ) = 0.05
extant sampling (ρ) = 0.6

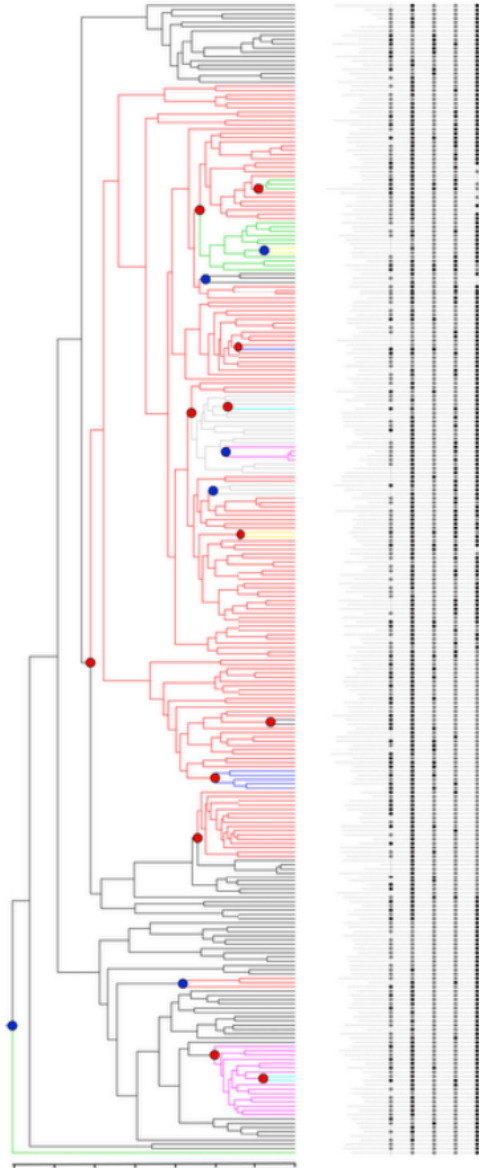
Birth-death sampling process



speciation (λ) = 0.1
extinction (μ) = 0.05
extant sampling (ρ) = 0.6
fossil recovery (ψ) = 0.05

Fossilized birth-death process

Wright and
Warnock, in
review

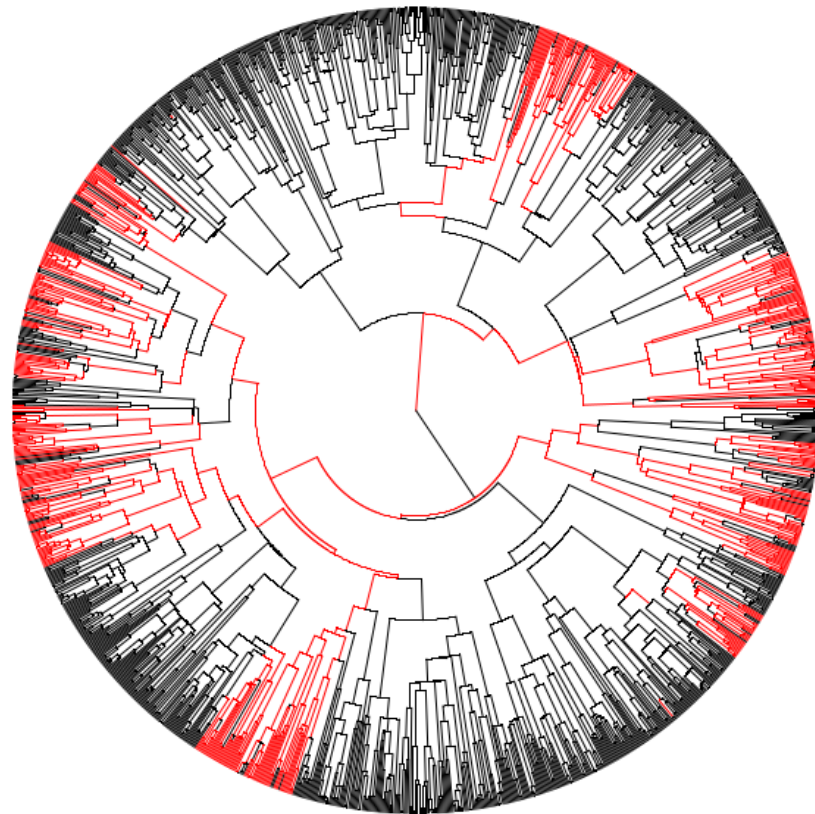


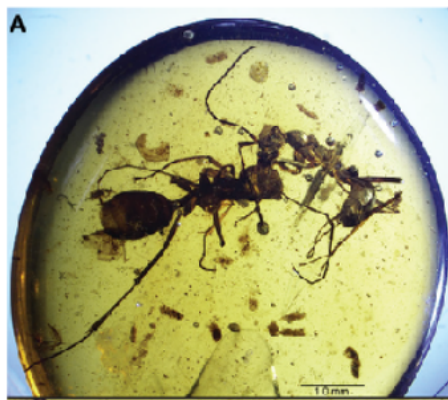
Why Ants?

Abundant molecular resources

666-tip multi-gene phylogeny from
Blanchard and Moreau (2017)

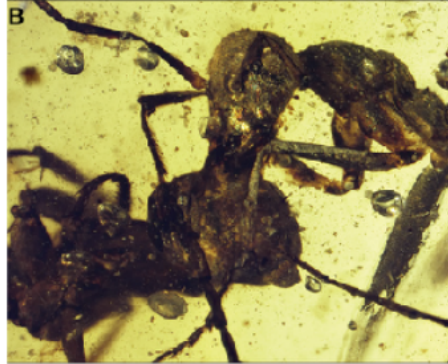
Why Ants?



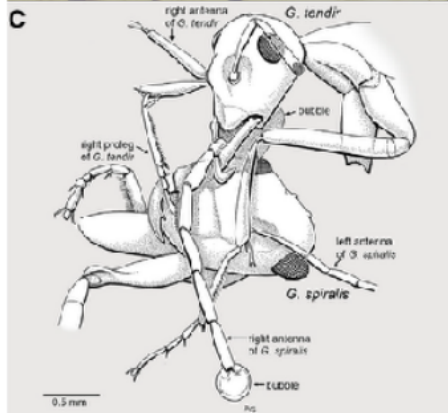


Why Ants?

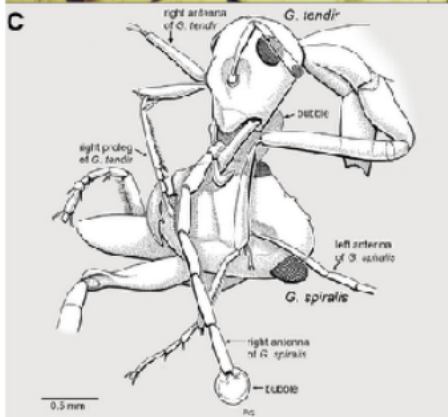
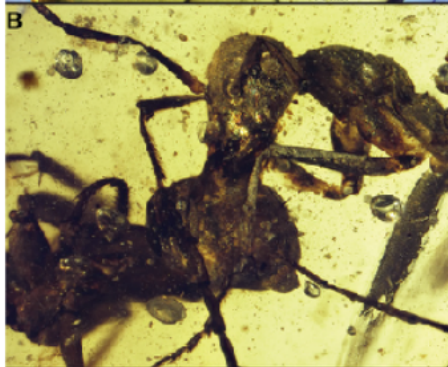
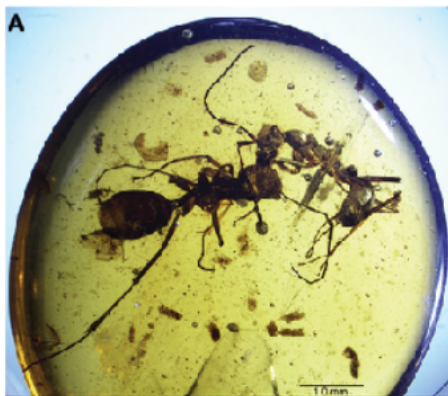
Abundant morphological resources



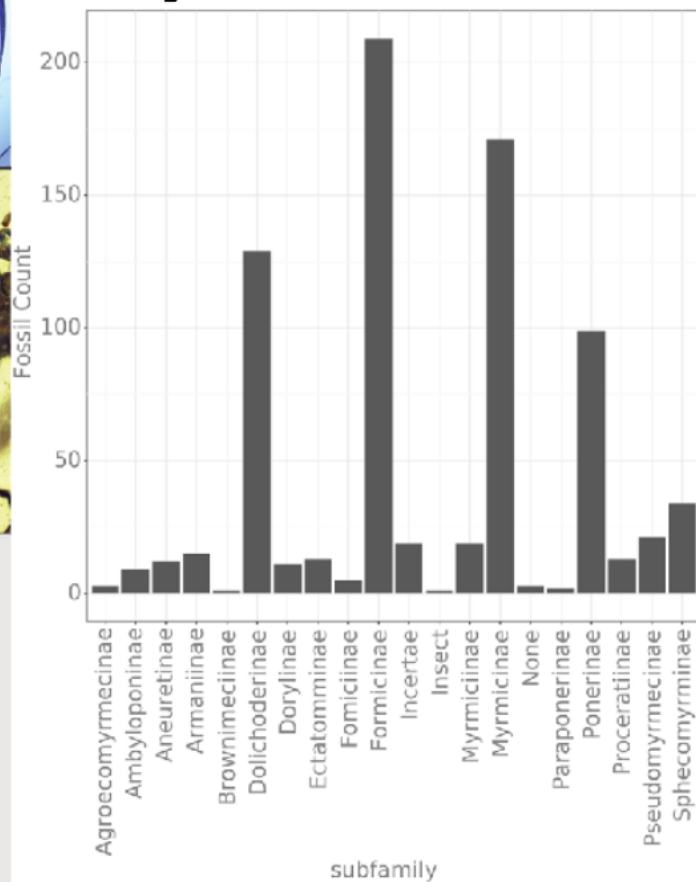
Samples both with character data
and without character data

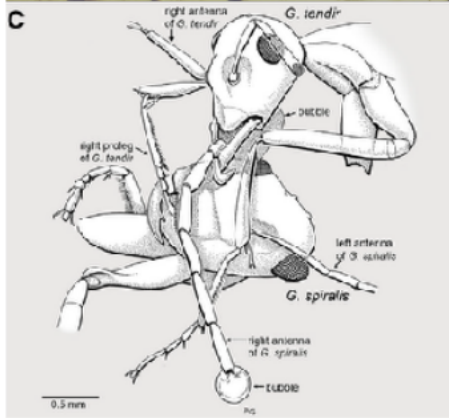
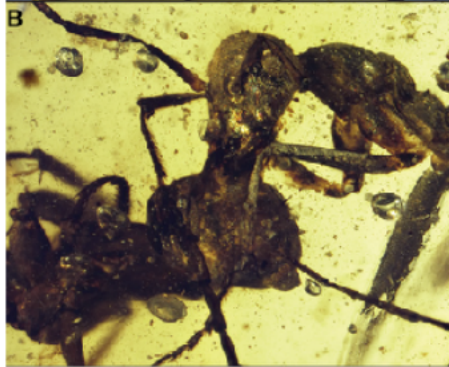
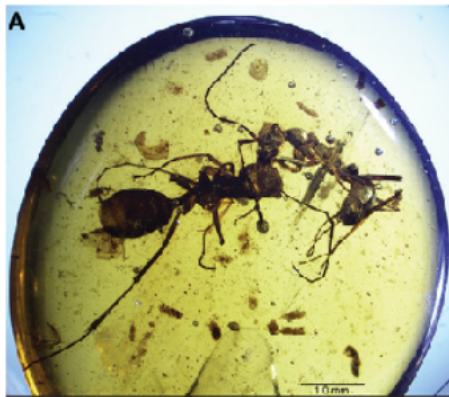


Barden
&
Grimaldi, 2017

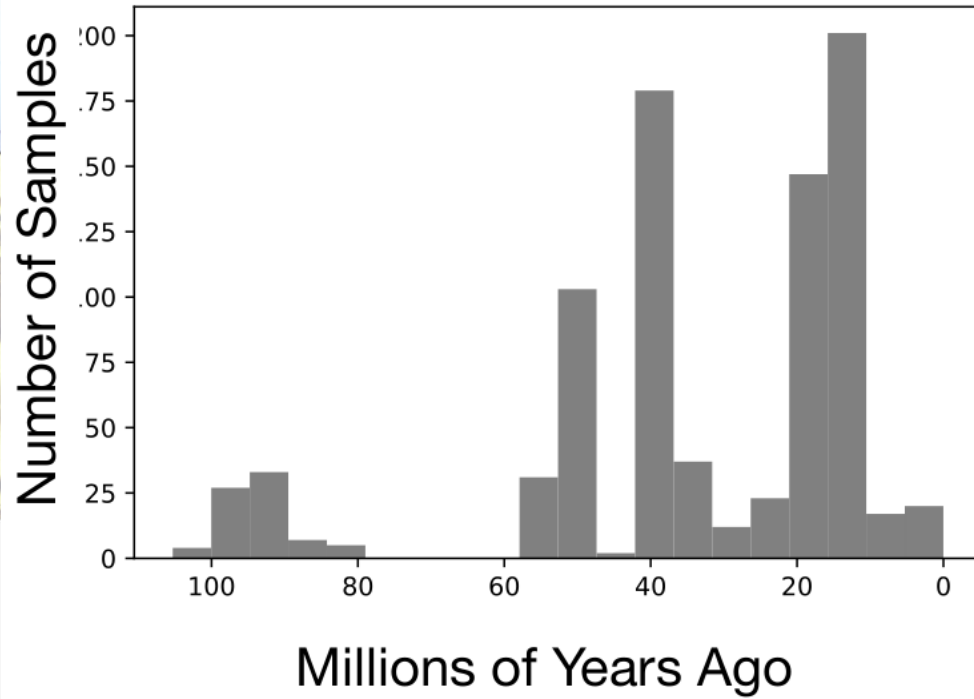


Why Ants?

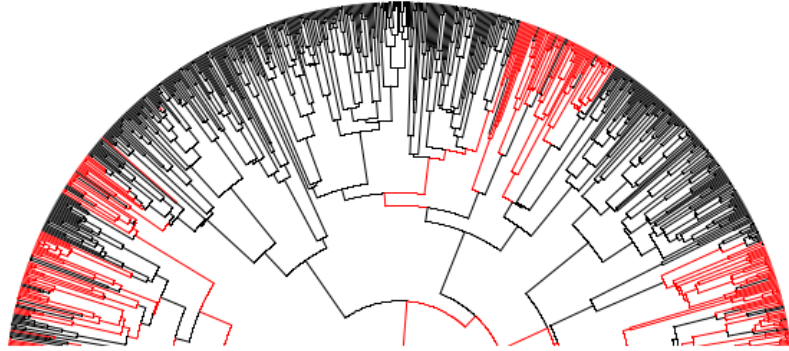




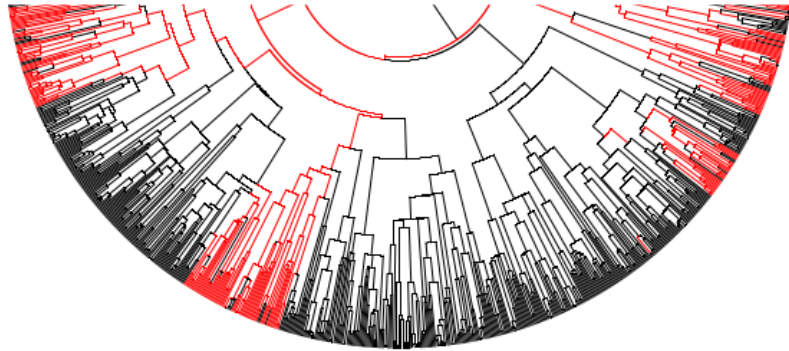
Why Ants?

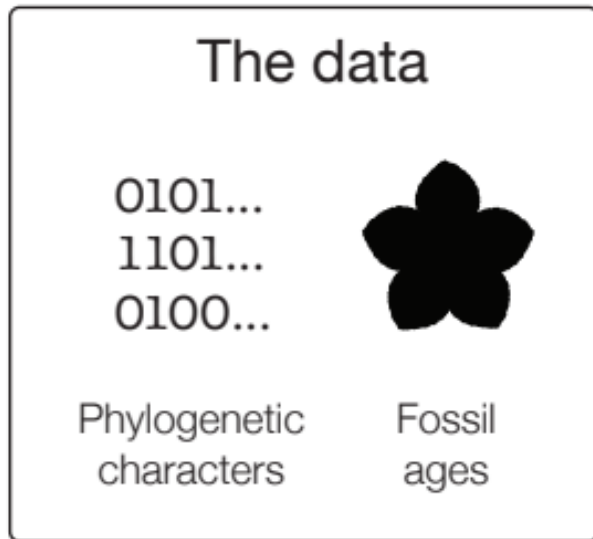


Why Ants?

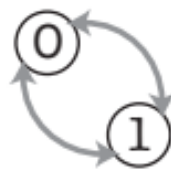


Vast, but biased resources





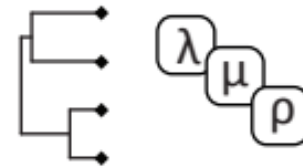
Tripartite model components



Substitution
model



Clock
model



Tree and tree
model

Systematic Conflict

Molecular evidence supports each of these

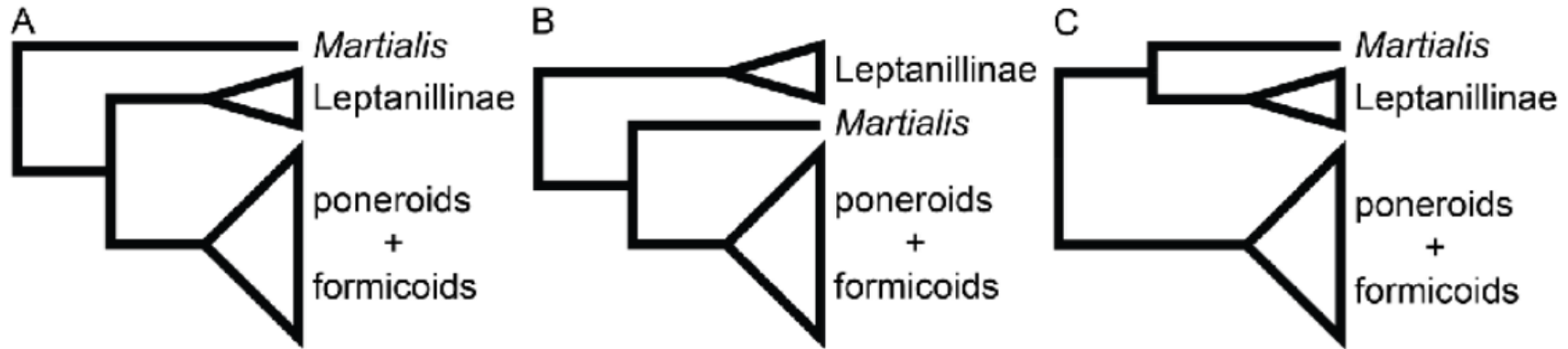
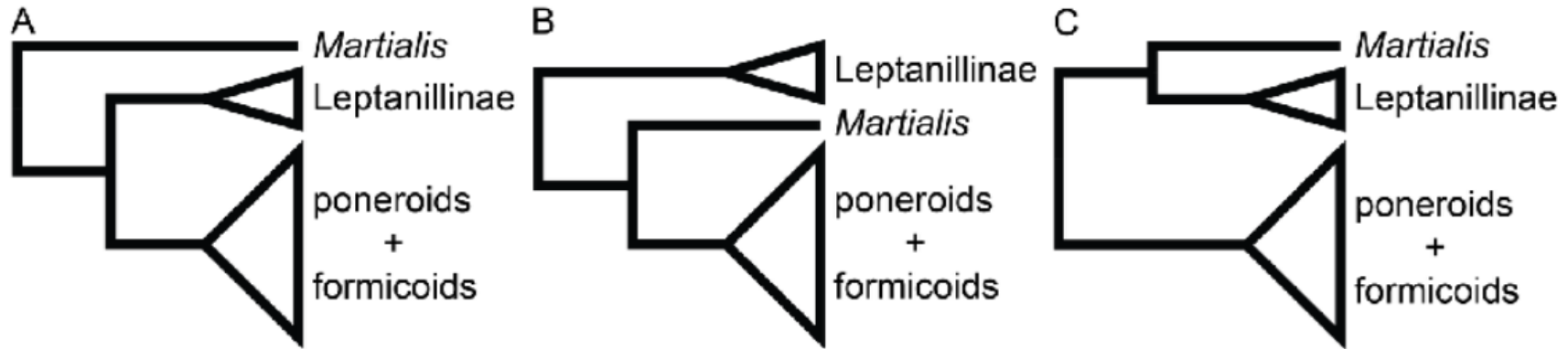


Figure adapted from Borowiec et al 2019

Systematic Conflict

Molecular evidence supports each of these



Morphology supports none of them

Figure adapted from Borowiec et al 2019

Putting everything together

posterior

$$P(\text{Tree} \text{ Flower } \lambda \mu \rho \text{ Clock } | \begin{matrix} 0101\dots \\ 1101\dots \\ 0100\dots \end{matrix}) =$$

probability of the character data given everything else* probability of the timetree given the tree model priors on fossil ages priors on model parameters

$$\frac{P(\begin{matrix} 0101\dots \\ 1101\dots \\ 0100\dots \end{matrix} | \text{Tree} \text{ Flower } \lambda \mu \rho \text{ Clock}) P(\text{Tree} | \text{Flower } \lambda \mu \rho) P(\text{Flower}) P(\lambda \mu \rho) P(\text{Clock}) P(\text{Clock})}{P(\begin{matrix} 0101\dots \\ 1101\dots \\ 0100\dots \end{matrix})}$$

marginal probability of the data

*the tree, the parameters and the tripartite model

Depending on the assumptions made about evolution, we recover support for every one of these topologies

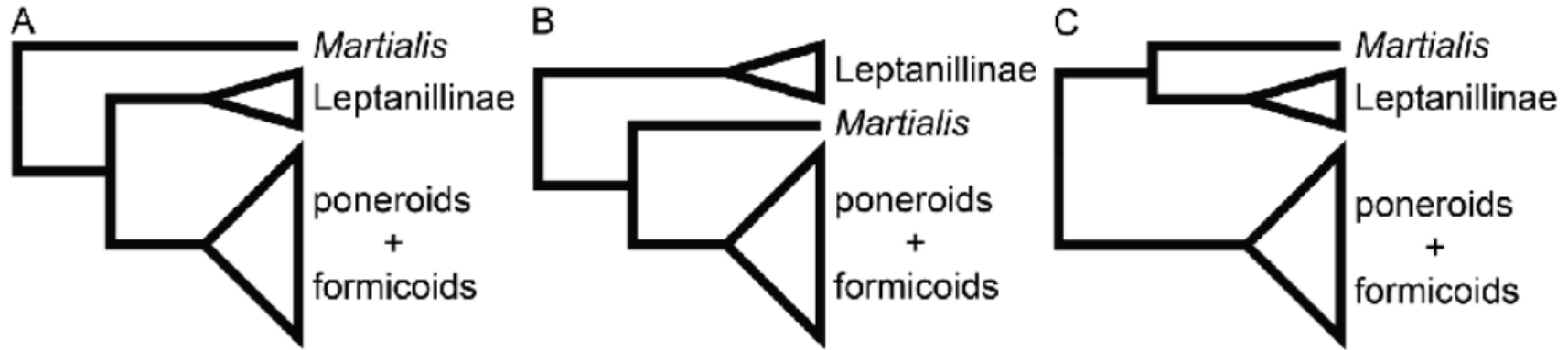


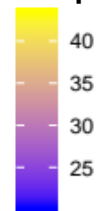
Figure adapted from Borowiec et al 2019



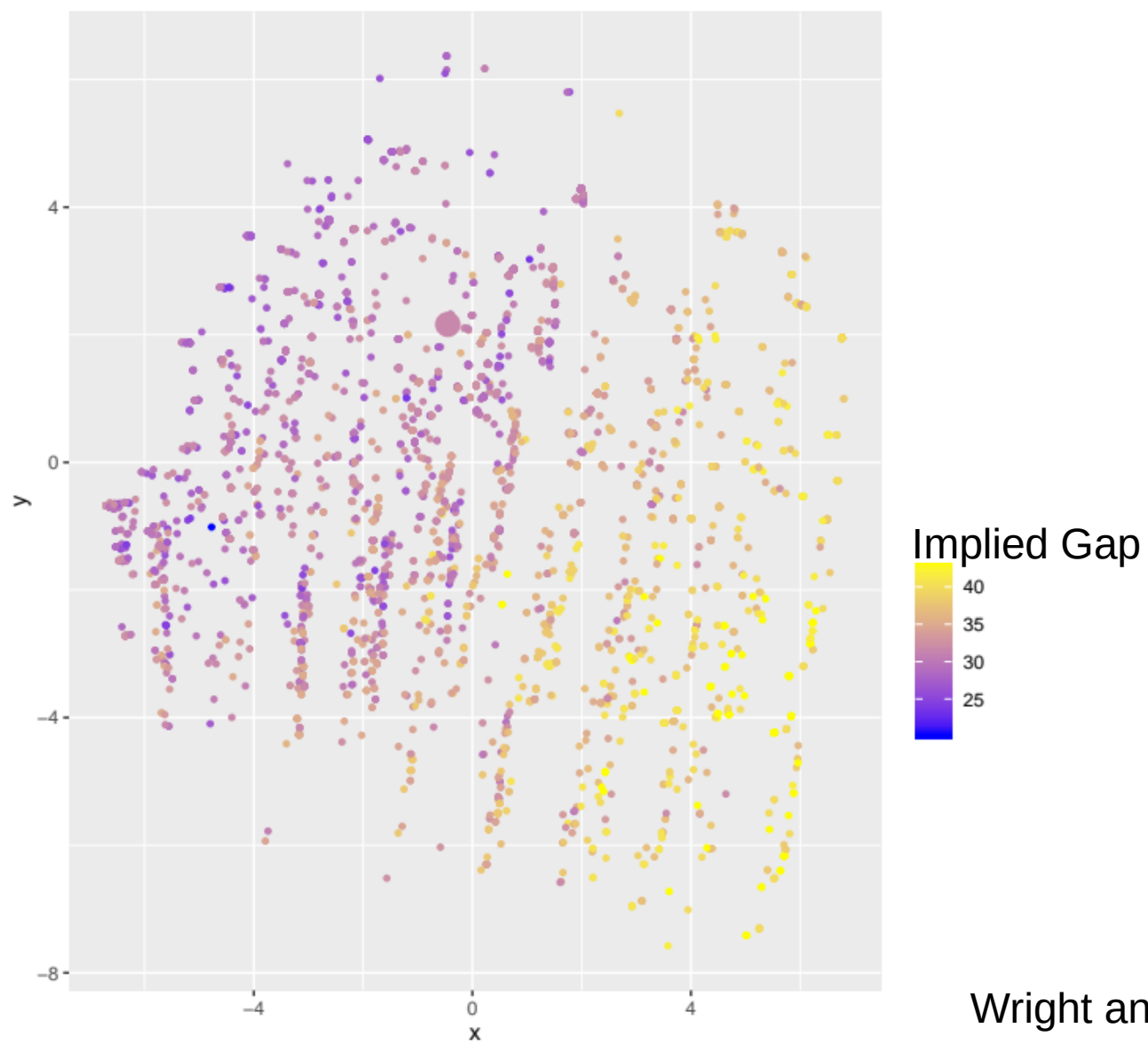
If every hypothesis has some support, how do we know which is true?



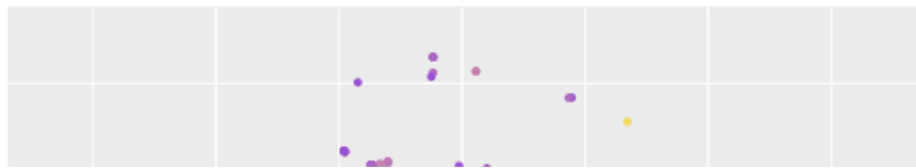
Implied Gap



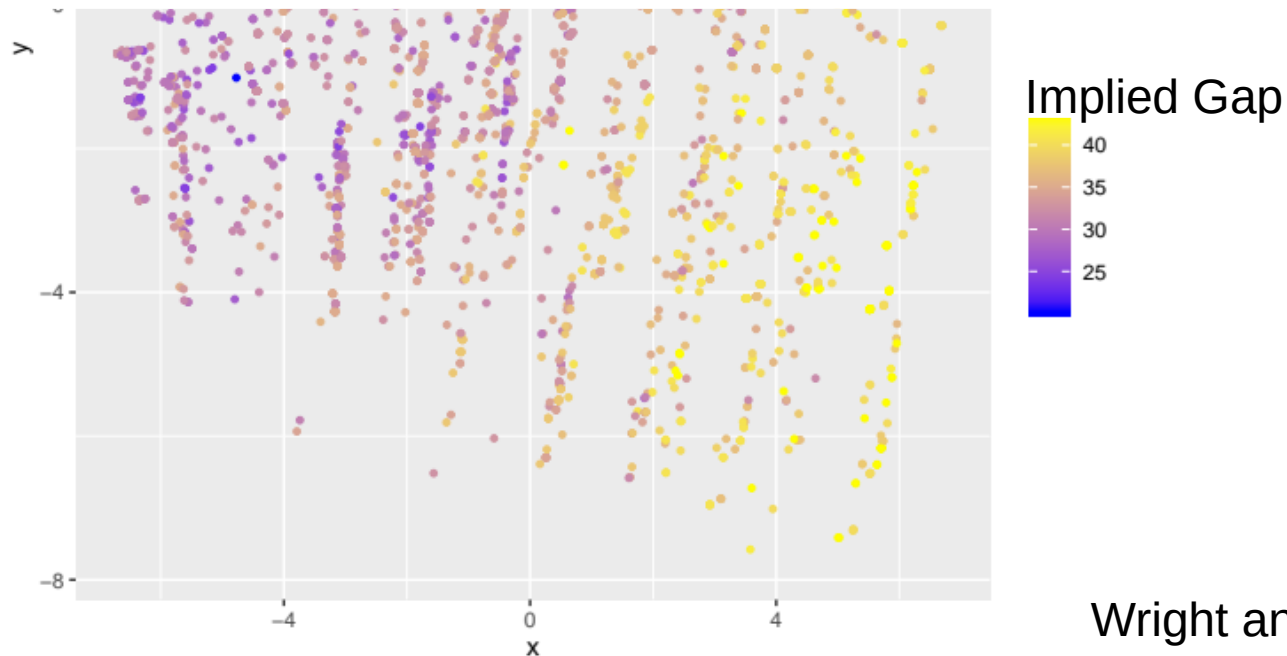
Wright and Lloyd, in review



Wright and Lloyd, in review

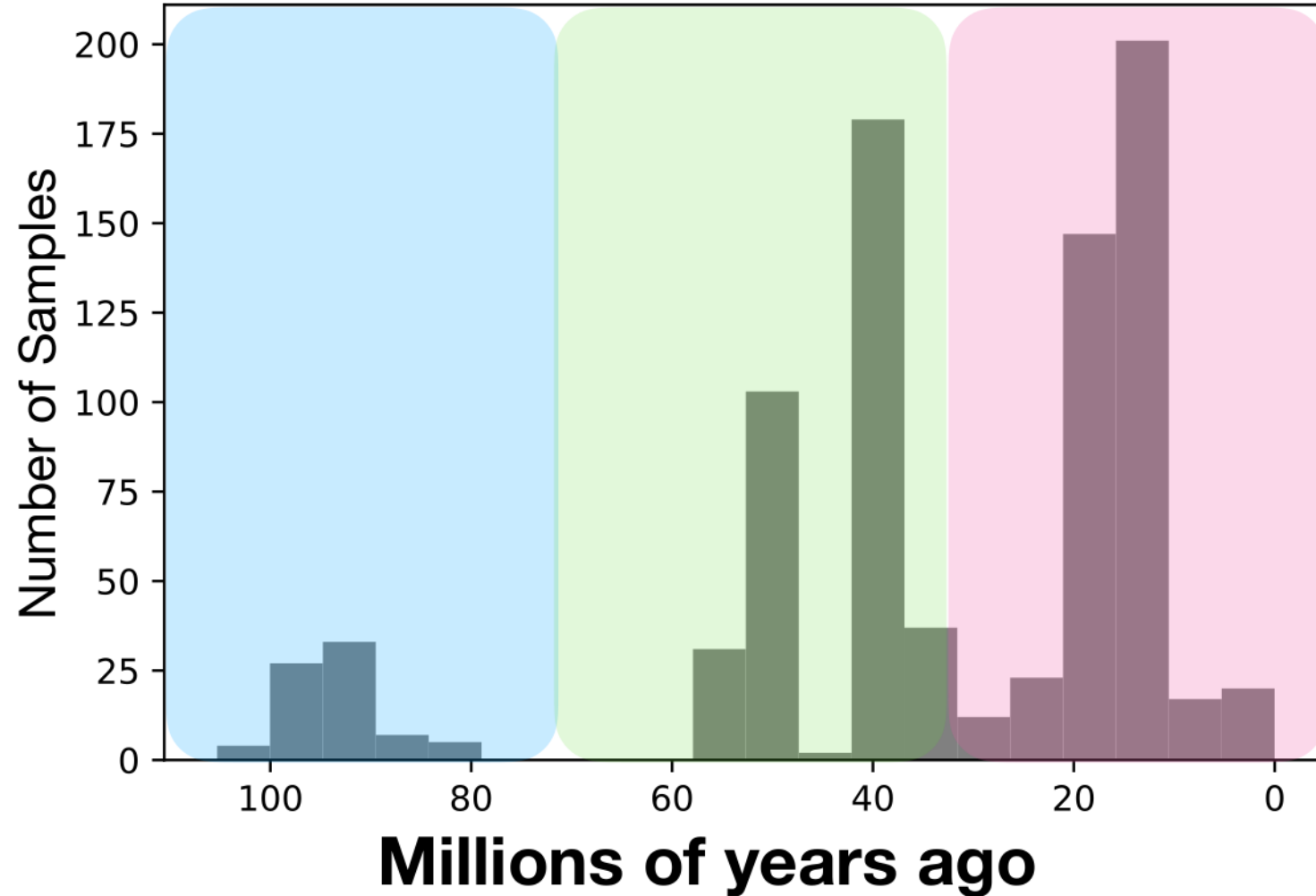


Not only can we support any hypothesis we want, bad hypotheses are often very close to good ones

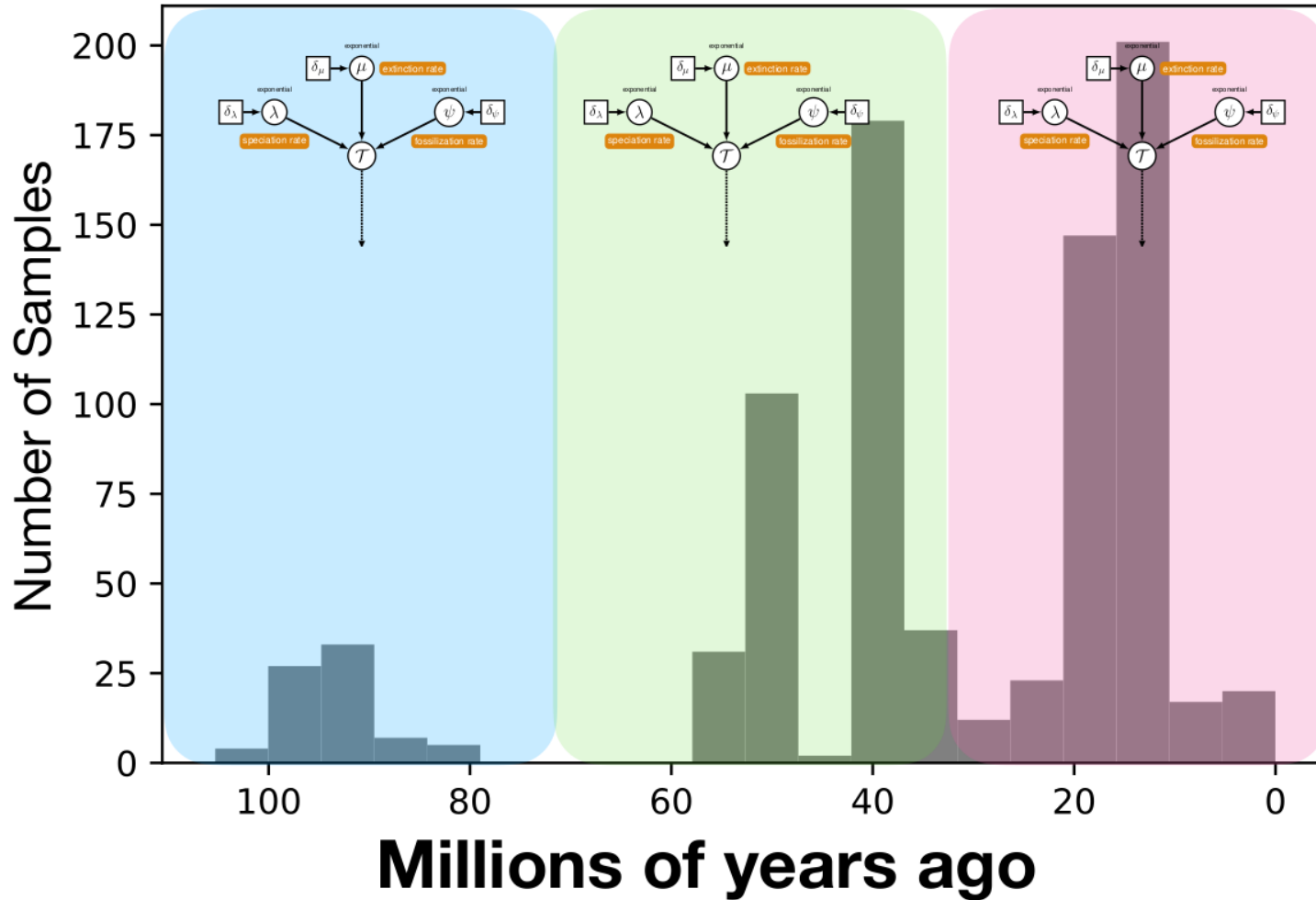


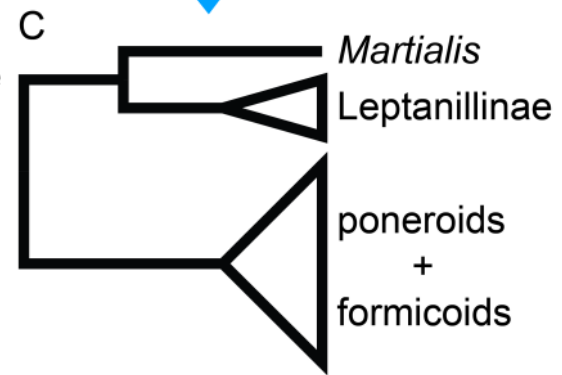
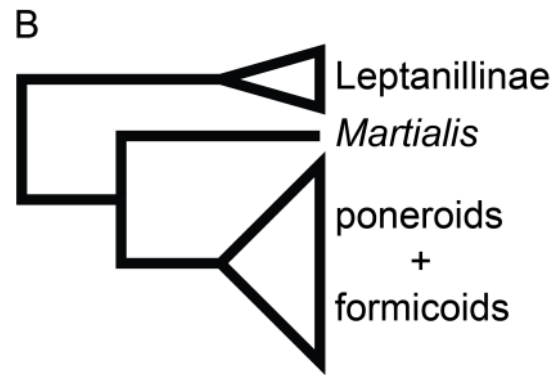
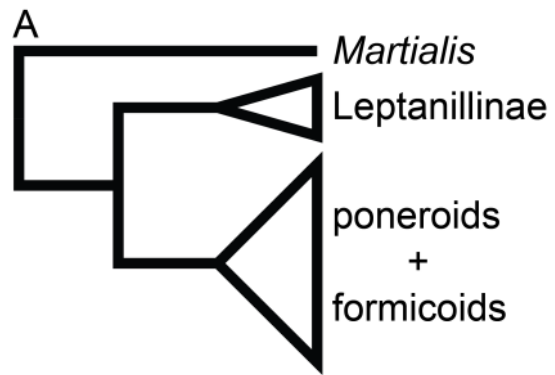
Wright and Lloyd, in review

Accounting for Uneven Fossil Sampling



Accounting for Uneven Fossil Sampling





Introduction to Posterior Prediction

Assessing the fit of Normal distributions to trait data

Jeremy M. Brown and Christina L. Kolbmann

Last modified on October 10, 2019

Training students to be data detectives

Computational Biology

The why, when, and how of computing in biology classrooms [version 1; peer review: 1 approved]

✉ April M. Wright ¹, Rachel S. Schwartz ², Jamie R. Oaks³, Catherine E. Newman⁴, Sarah P. Flanagan ⁵

 [Author details](#)



This article is included in the [Bioinformatics Education and Training Collection](#) collection.

Training students to be data detectives

Computational Biology

The why, when, and how of computing in biology classrooms [version 1; peer review: 1 approved]

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 [Author details](#)



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Lessons learned in this class are being applied to our intro biology sequence

Training students to be data detectives



Training students to be data detectives

Hands-On Learning with RevBayes

Primary organizer: Dr. April Wright, Southeastern Louisiana University

Content: This workshop will focus on using the phylogenetic estimation software RevBayes in an instructional setting. We will first introduce the graphical model framework used by the software. Graphical models can be used to introduce the fundamentals of probability, while also enabling transparent and flexible assembly of new phylogenetic models. Then, we will discuss using RevBayes in hands-on exercises for systematics and phylogenetics courses. Topics will include making use of the robust RevBayes tutorial library, tailoring pre-existing tutorials to your course, contributing your tutorials to the tutorial bank, using interactive computing notebooks, and integrating the software with R and Python.

Training students to be data detectives

Discrete morphology - Models and Tree Inference

April M. Wright

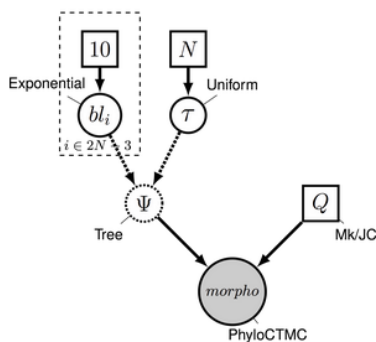
Source: vignettes/module_05_TripartiteModel1_morph_change_models/05_RB_MCMC_Discrete_Morph.Rmd

Introduction to phylogenetic models of morphological evolution

Morphological data is commonly used for estimating phylogenetic trees from fossils. This tutorial will focus on estimating phylogenetic trees from *discrete* characters, those characters which can be broken into non-overlapping character states. This type of data has been used for estimation of phylogenetic trees for many years. In the past twenty years, Bayesian methods for estimating phylogeny from this type of data have become increasingly common.

This tutorial will give an overview of common models and assumptions when estimating a tree from discrete morphological data. We will use a dataset from Zamora, Rahman, and Smith (2013). This dataset contains 23 extinct echinoderm taxa and 60 binary and multistate characters.

Overview of Discrete Morphology Models



```
for (i in 1:n_branches) {  
  bl[i] ~ dnExponential(10.0)  
}  
topology ~ dnUniformTopology(taxa)  
psi := treeAssembly(topology, bl)  
  
Q_morpho <- fnJC(2)  
  
phyMorpho ~ dnPhyloCTMC( tree=psi,  
  Q=Q, type="Standard",  
  coding="variable" )  
phyMorpho.clamp( morpho )
```

Graphical model showing the Mk model (left panel). Rev code specifying the Mk model is on the right-hand panel.

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[Overview of Discrete Morphology Models](#)

[The Mk Model](#)

[Ascertainment Bias](#)

[Example: Inferring a Phylogeny of Extinct Cinctans Using the Mk Model](#)

[The Mk Model](#)

[Complete MCMC Analysis](#)

[Set-Up the MCMC](#)

[You made it! Save all of your files.](#)

[Choose Your Own Adventure](#)

[Lognormally-distributed among-character rate variation](#)

[Ascertainment Bias](#)

[Relaxing Character State Symmetry](#)

[Modifying the Rev-script](#)

[References](#)

Thank You!

- Jeremy Brown
- Christina Kolbmann
- Basanta Khakurel
- Courtney Grigsby
- Tyler Tran

- Rachel Warnock
- Tracy Heath
- Graeme Lloyd
- Corrie Moreau
- David Bapst

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MS:

- Barido-Sottani J, Saupe E, Smiley TM, Soul, LC, Wright AM, Warnock RCM. In review. Seven rules for simulations in paleobiology.
- Wright AM, Lloyd, GT. In review. Bayesian analyses in phylogenetic paleontology: Interpreting the posterior sample. Preprint: <https://github.com/graemetlloyd/ProjectWhalehead/blob/master/vignettes/MS.pdf>
- Warnock RCM, Wright AM. In review. Understanding the tripartite approach to Bayesian divergence time estimation. Preprint: <https://www.overleaf.com/read/cbdxvgvxdkdq>
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Courses:

- Biological Data Analysis: <https://biologicaldataanalysis2019.github.io/2019/>
- Introduction to Biodiversity Data Science: <https://paleontology.github.io/GBIO153H/index.html>
- Systematics: <https://wrightaprilm.github.io/Systematics2020/index.html>

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