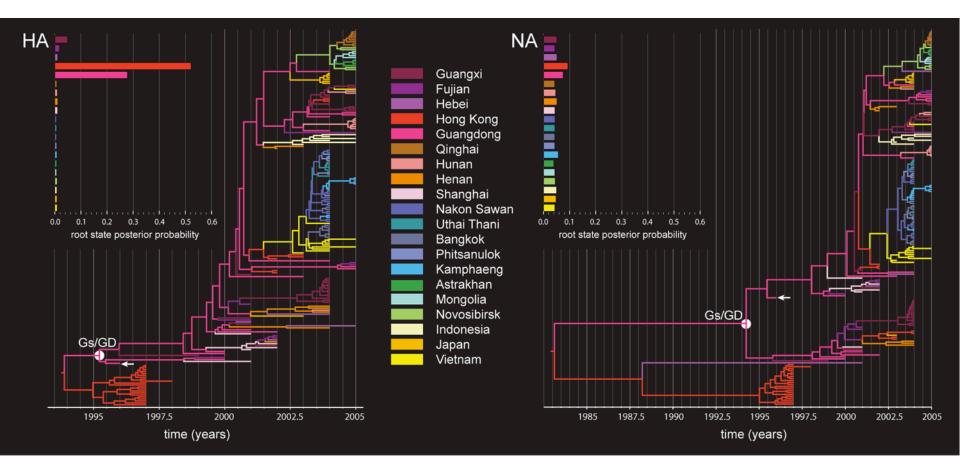
A primer on phylogenetic biogeography and DEC models

Jan 08, 2017
Michael Landis
SSB Meeting
Baton Rouge, LA

Epidemiology



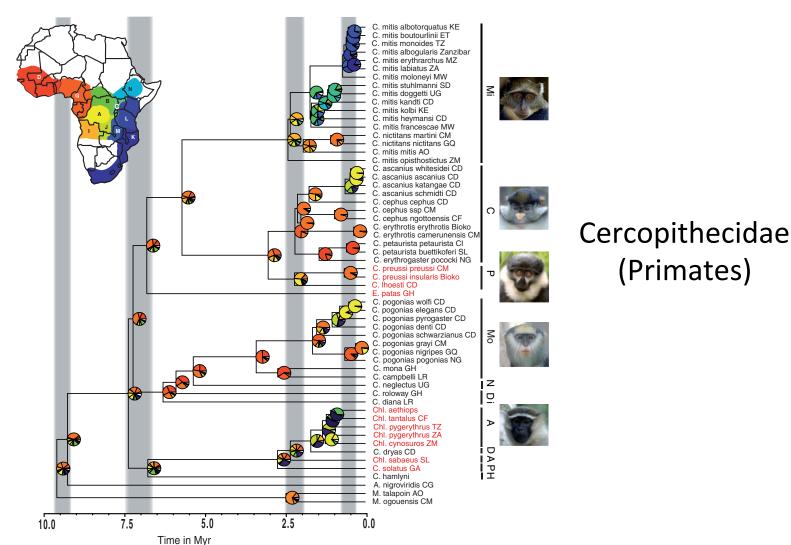
Hemagglutin (HA)

H5N1 (Avian Flu)

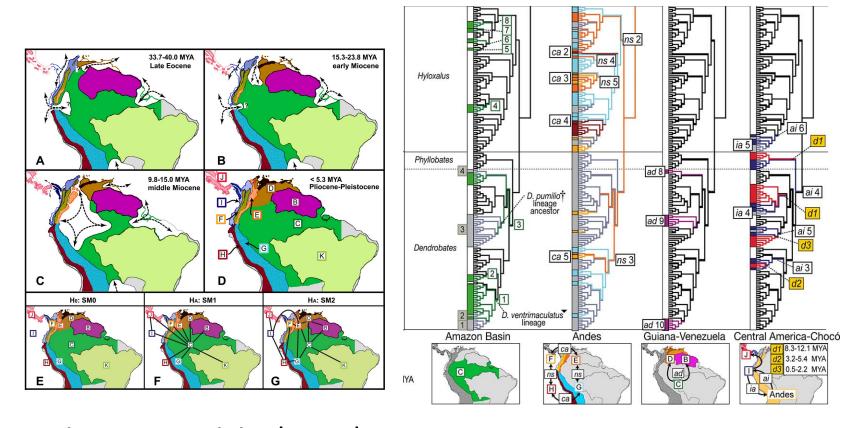
Neuraminidase (NA)

Lemey et al., 2008 (PLoS Comp Biol)

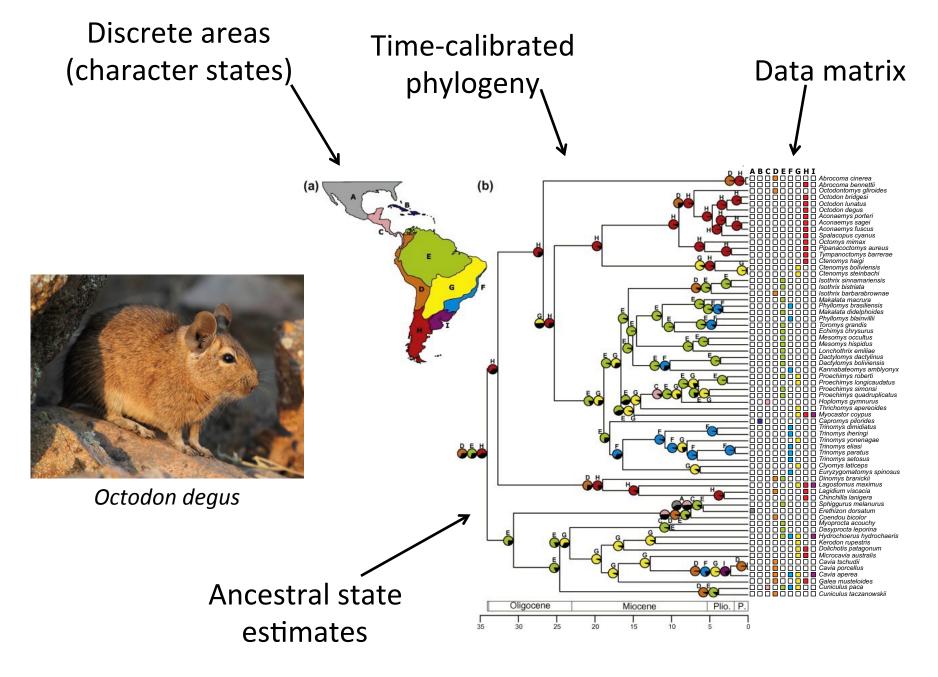
Conservation



Historical biogeography

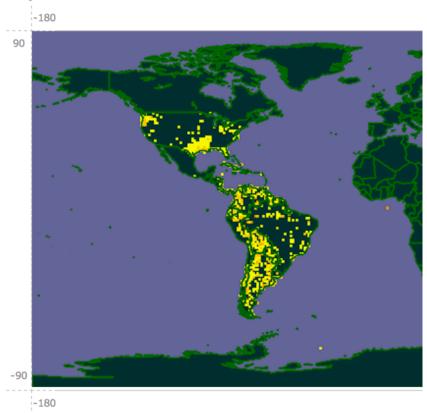


Testing connectivity hypotheses



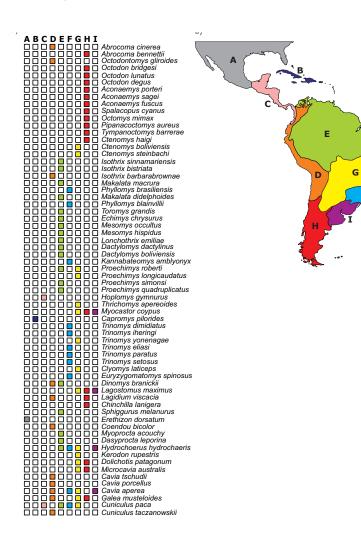
Species occurrence data (gbif.org, 2013)

Map of results



▶ Your search returned **13,264** occurrences with coordinates.

Discrete presence-absence (Upham & Patterson, 2012)



DEC

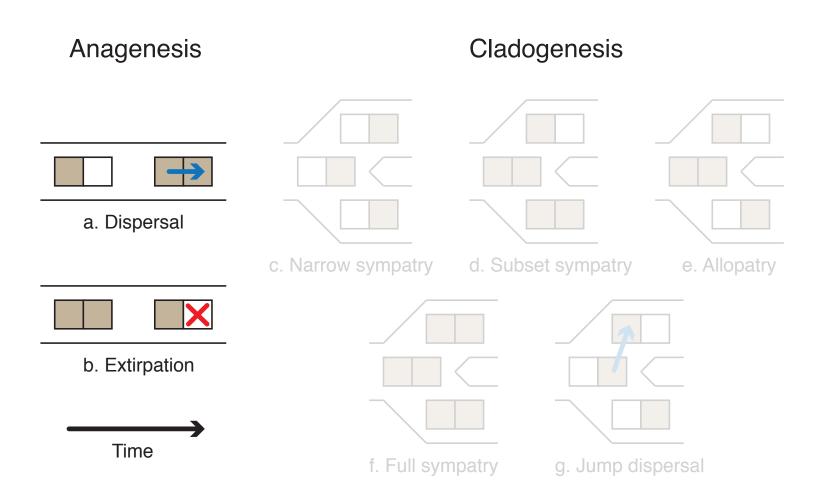
Dispersal-(Local) Extinction-Cladogenesis (DEC)
Many areas per taxon (range)
D,E as parameterized event types

Work by:

Ree et al., 2005 (Evolution)

Ree & Smith, 2008 (Syst Biol)

DEC event types

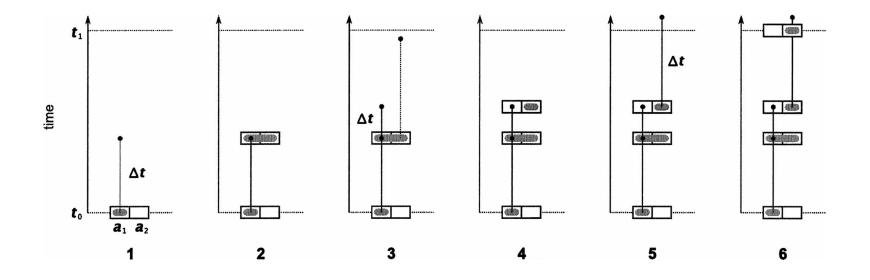


Rate matrix for anagenesis

$$Q = \begin{bmatrix} \emptyset & 1 & 2 & 3 & 12 & 13 & 23 & 123 \\ \hline \emptyset & -- & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 1 & E_1 & -- & 0 & 0 & D_{12} & D_{13} & 0 & 0 & 0 \\ 2 & E_2 & 0 & -- & 0 & D_{21} & 0 & D_{23} & 0 & 0 \\ 3 & E_3 & 0 & 0 & -- & 0 & D_{31} & D_{32} & 0 & 0 \\ 12 & 0 & E_2 & E_1 & 0 & -- & 0 & 0 & D_{13} + D_{23} & 0 \\ 13 & 0 & E_3 & 0 & E_1 & 0 & -- & 0 & D_{12} + D_{32} & 0 & 0 \\ 23 & 0 & 0 & E_3 & E_2 & 0 & 0 & -- & D_{21} + D_{31} & 0 & 0 & 0 & 0 & 0 & 0 \end{bmatrix}$$

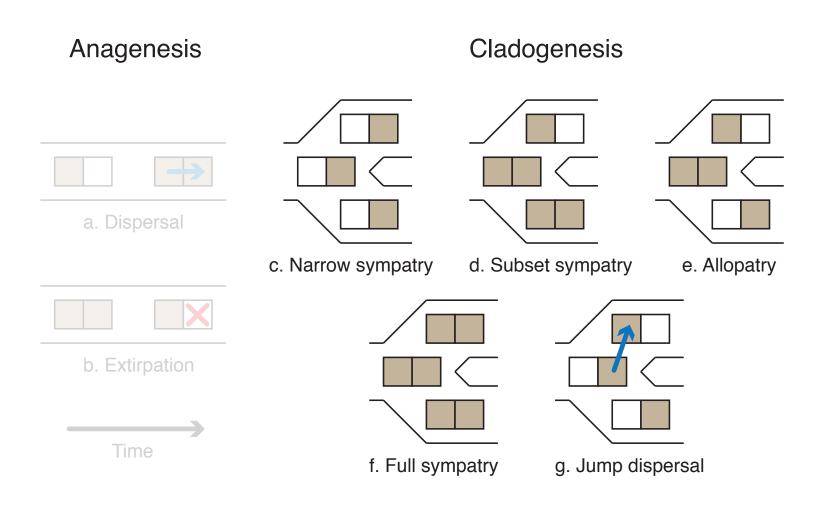
$$\mathbf{P}_{ij}(t) = \left[\exp\left\{\mathbf{Q}t\right\}\right]_{ij}$$

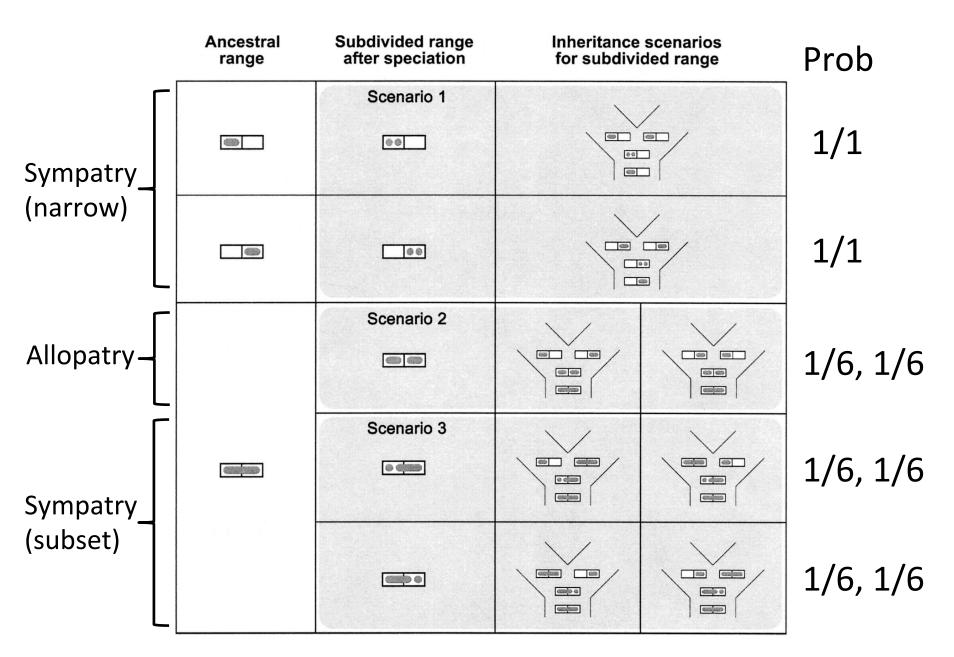
Dispersal & Extirpation



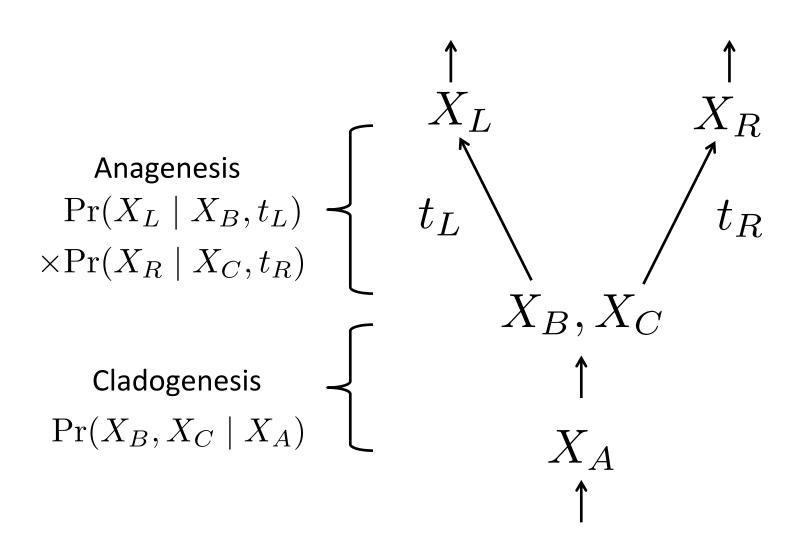
Exponentially-distributed times between events

DEC event types

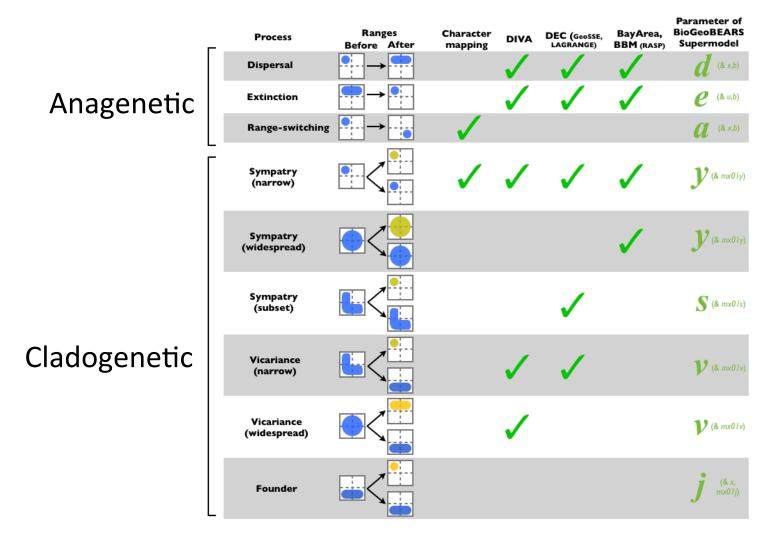


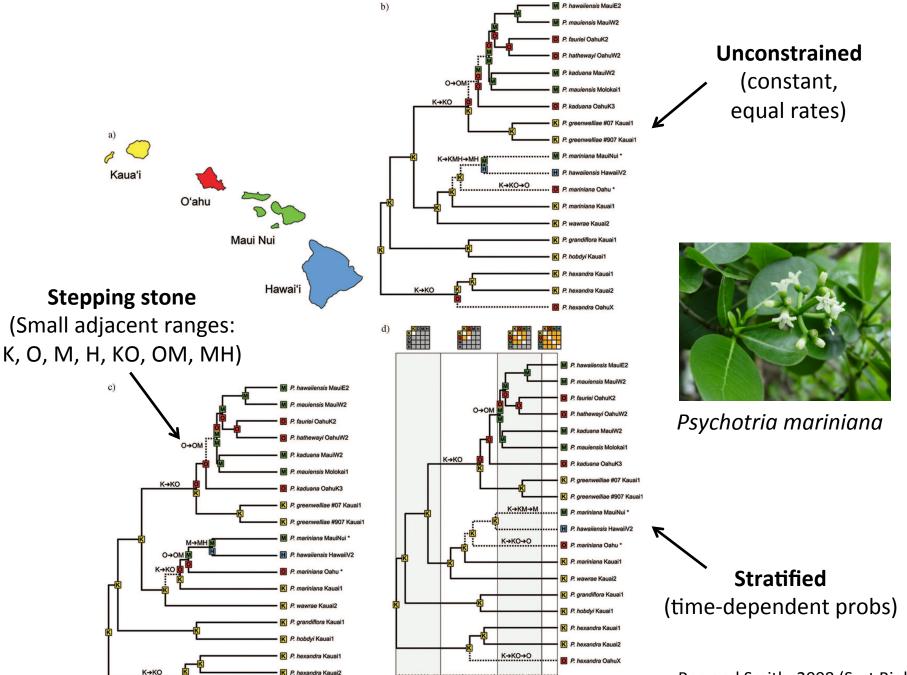


DEC likelihood



Generalized DEC model



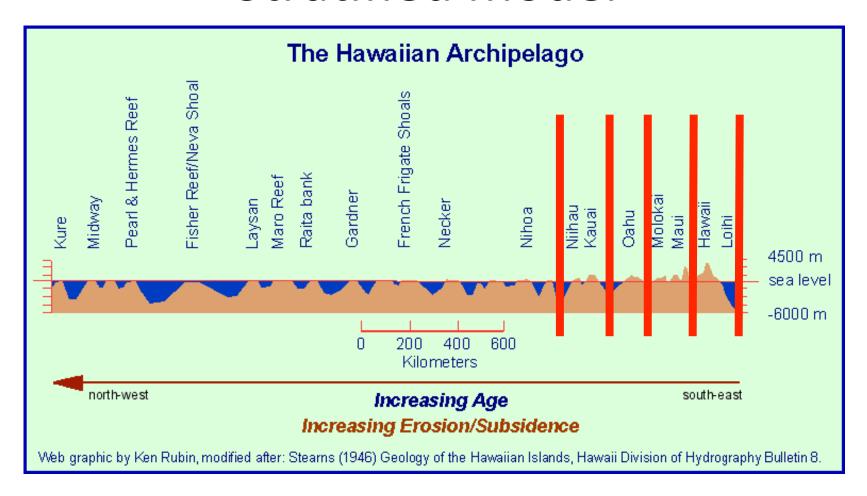


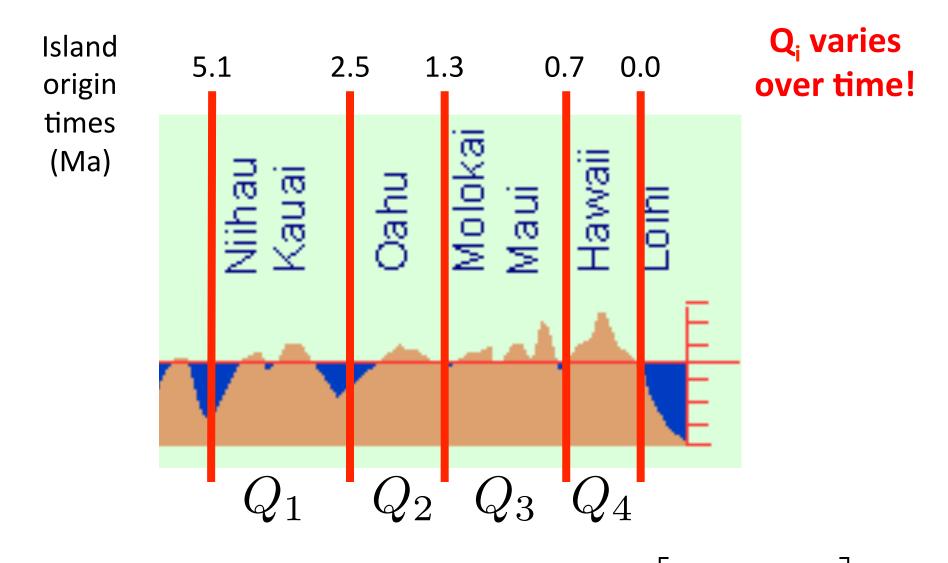
Million years before present

P. hexandra OahuX

Ree and Smith, 2008 (Syst Biol)

Stratified model





Transition probability over epochs

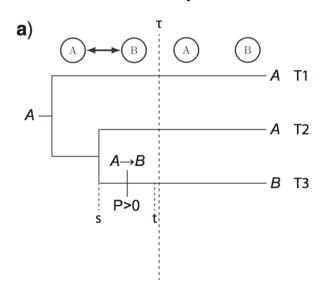
$$P(x \to y; t) = \left[\prod e^{Q_i \delta t_i} \right]_{x,y}$$

Dating with biogeographic processes

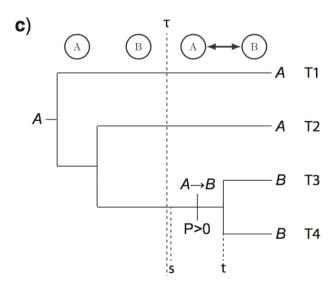
Areas split

Probable speciation time

Prob > 0



Areas merge

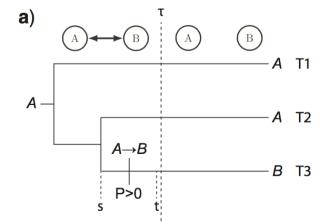


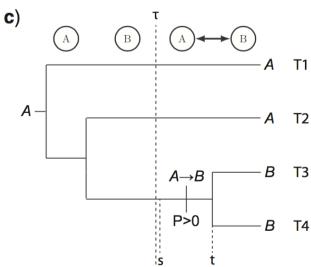
Dating with biogeographic processes

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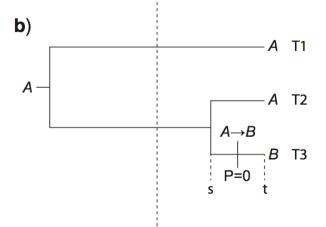
Probable speciation time

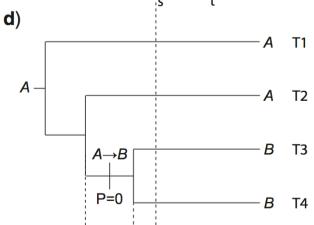




Prob > 0

Improbable speciation time





Landis, 2016 (Syst Biol)

Prob = 0

RevBayes

Flexible model specification Graphical models

Easy and intuitive to use Rev language interface

Fast computation and efficient inference C++ backend

Bayesian terminology

D

 θ

 $P(D \mid \theta)$

 $P(\theta)$

 $P(\theta \mid D)$

data, observations

model parameters

model likelihood

prior probability

posterior probability

Bayes rule
$$P(\theta \mid D) = \frac{P(D \mid \theta)P(\theta)}{P(D)}$$

Model equations

How are variables interrelated?

$$D \sim \text{Exponential}(Y)$$

$$Y = (\theta_1 - \theta_2)^2$$

$$\theta_1 \sim \text{Exponential}(1)$$

$$\theta_2 \sim \text{Exponential}(1)$$

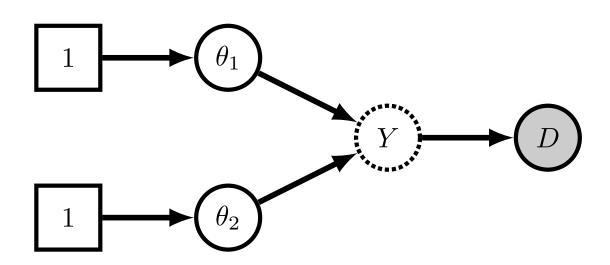
Model graph

$$D \sim \text{Exponential}(Y)$$

$$Y = (\theta_1 - \theta_2)^2$$

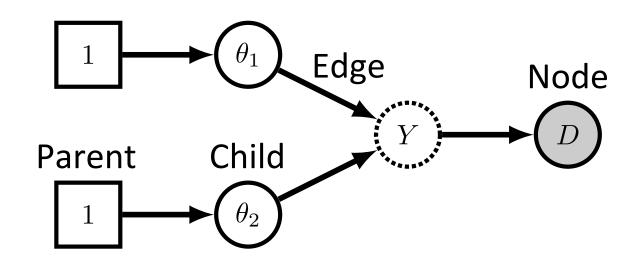
 $\theta_1 \sim \text{Exponential}(1)$

 $\theta_2 \sim \text{Exponential}(1)$



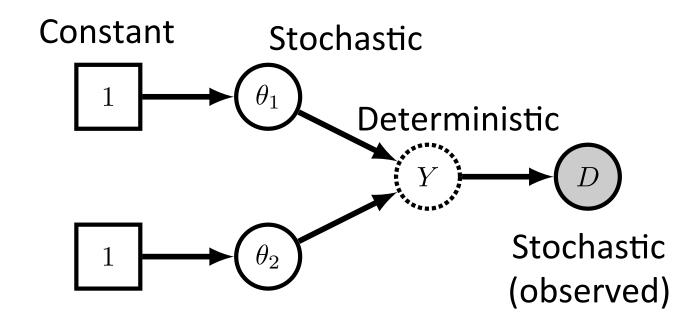
Model variable relationships

Edges indicate how child variables depend on parent variables



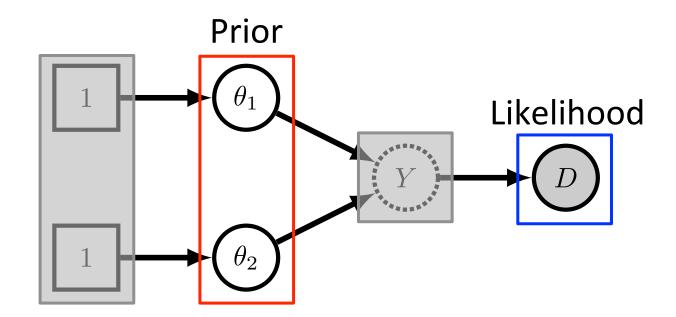
Model variable types

Nodes have different properties



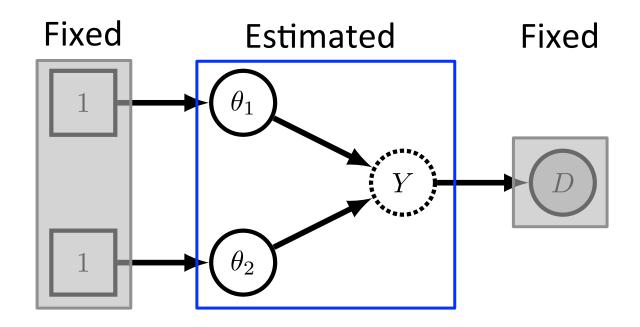
Model probabilities

Stochastic nodes contribute to model posterior



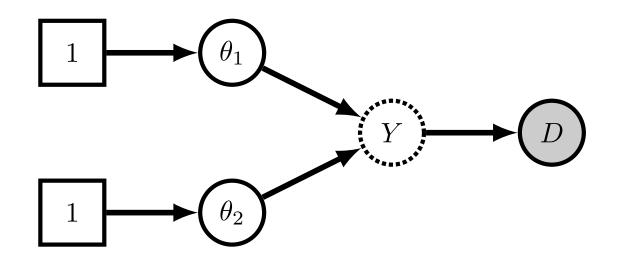
Parameter estimation

Estimate the values of deterministic and (unobserved) stochastic nodes



Model in Rev

```
D \sim \text{Exponential}(Y) \qquad \qquad \text{for (i in 1:2) } \{ \\ Y = (\theta_1 - \theta_2)^2 \qquad \qquad \text{theta[i] } \sim \text{dnExp(1)} \\ \theta_1 \sim \text{Exponential}(1) \qquad \qquad \text{Y := (theta[1]-theta[2])^2} \\ \theta_2 \sim \text{Exponential}(1) \qquad \qquad \text{D.clamp(3.14159)}
```



Let's build some models!!