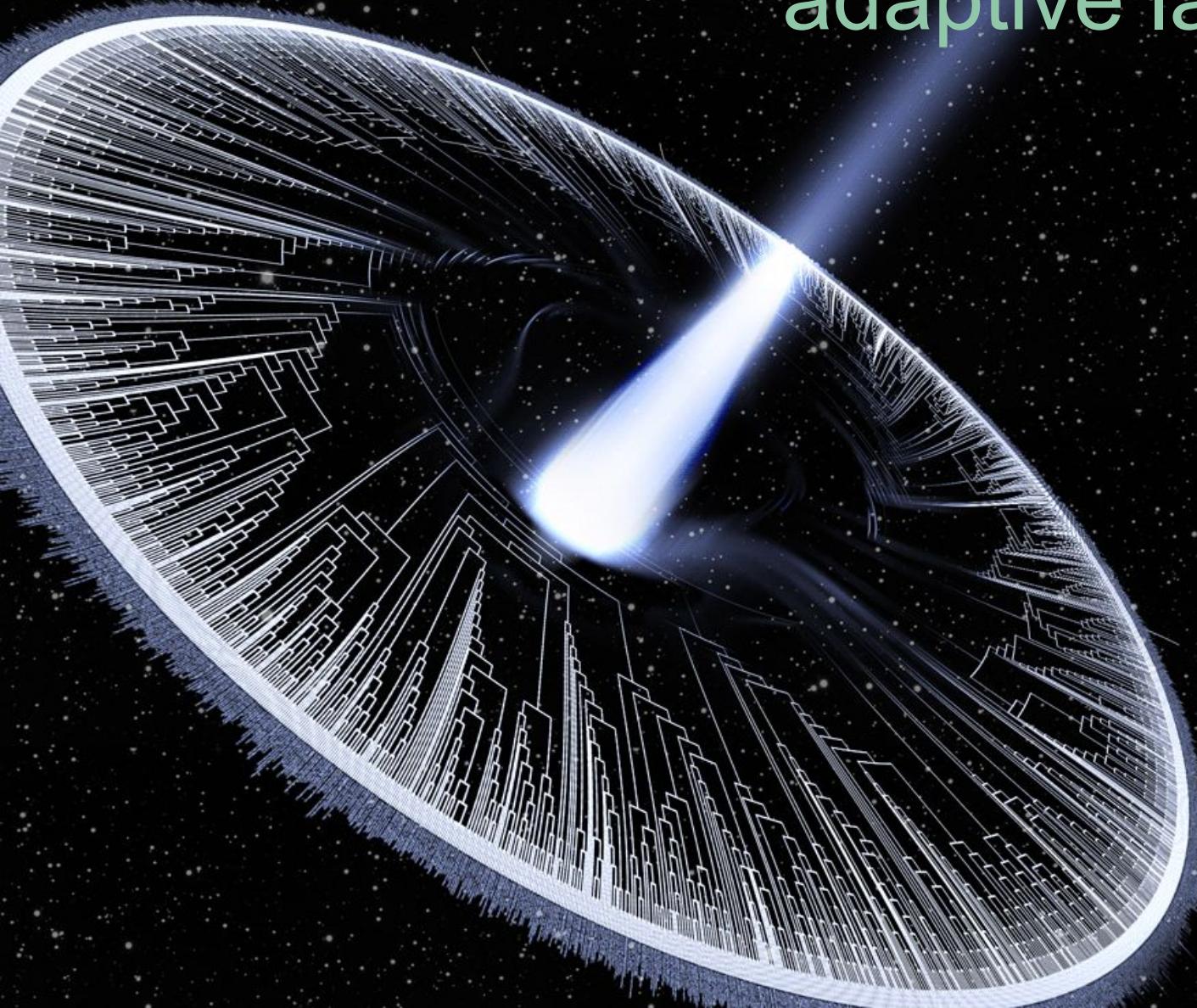
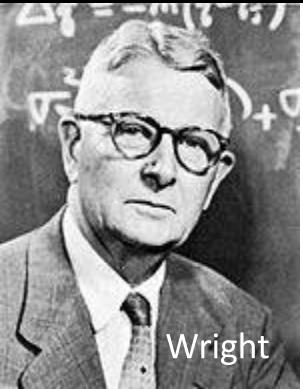


# The macroevolutionary dynamics of adaptive landscapes



**Josef C Uyeda**  
Postdoctoral Fellow  
University of Idaho

# Reductionism & the Modern Synthesis



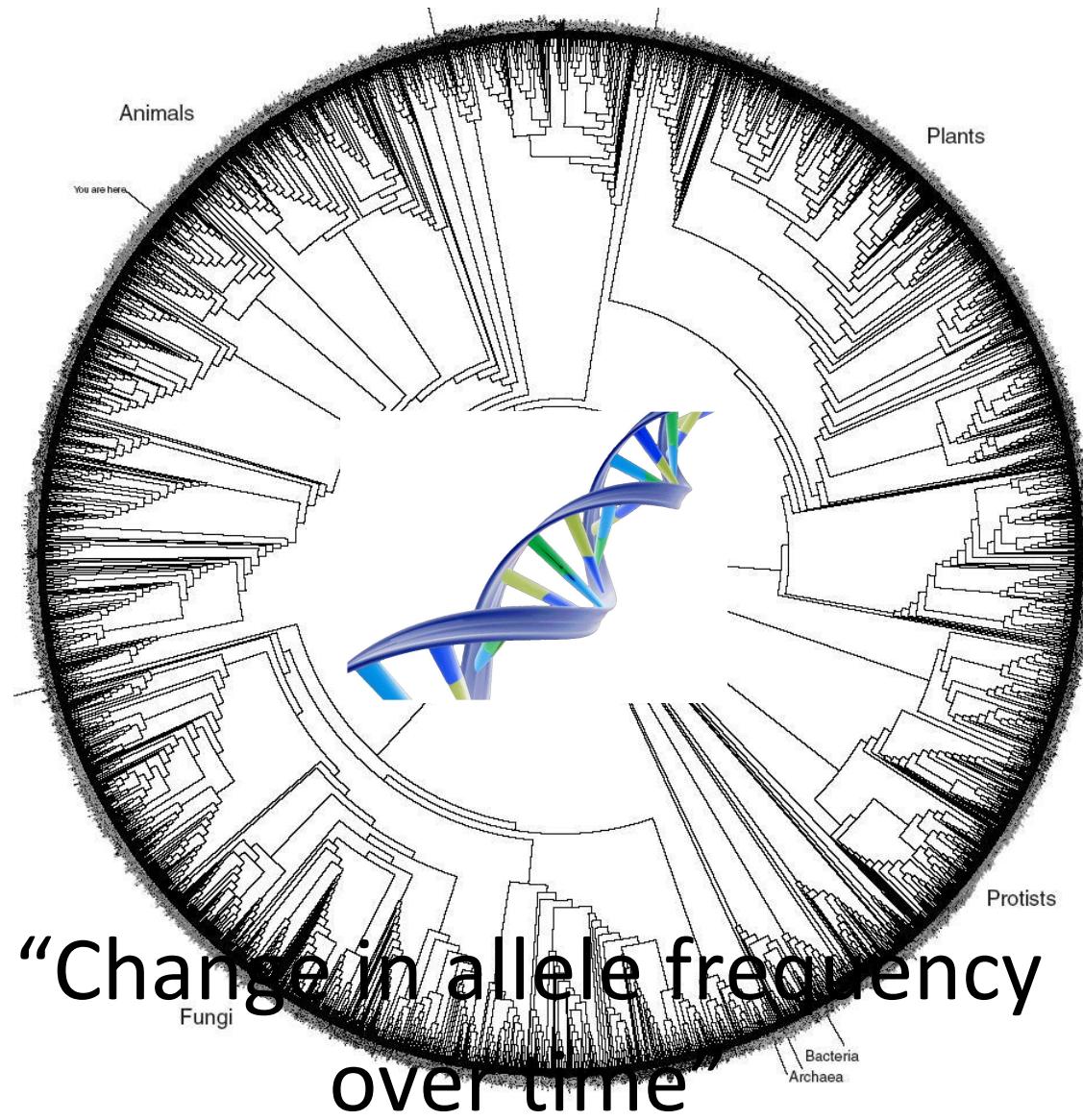
Wright



Dobzhansky



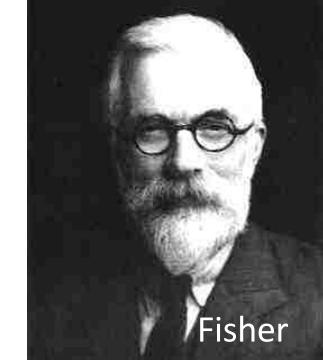
Stebbins



Haldane



Simpson



Fisher

# Outline

- Are micro and macroevolution are in conflict?
- How can we study macroevolution using realistic models of adaptation and evolution?
- Using bayou



# Microevolutionary patterns

We now know that we can study evolution in real time

16.06 g  
(1976) → 17.13 g  
(1978)

Response to selection

6.7%  $\Delta$  body size in  
1 generation (2 years)

Let's assume only 1% is  
evolutionary



(Grant and Grant, 2002)



# Let's do the calculations:

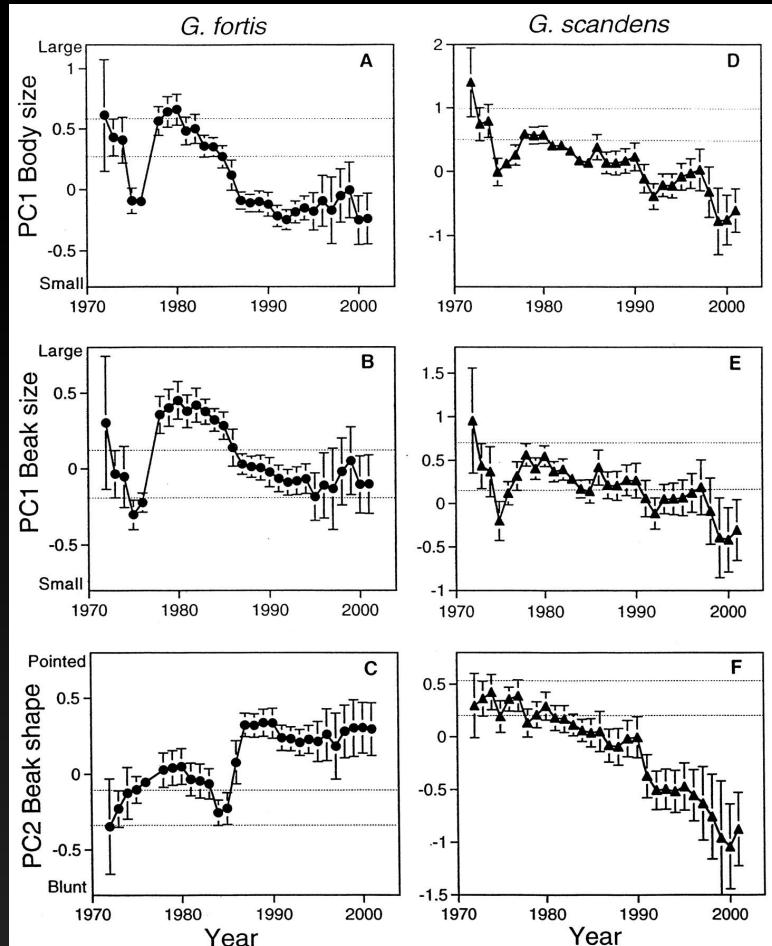
If a population increased by 1% every generation  
starting from ~16 g:

In 200 years	→	43 g
In 500 years	→	193 g
In 1,000 years	→	2.3 kg
In 2,000 years	→	335 kg
In 10,000 years	→	$6.47 \times 10^{19}$ kg

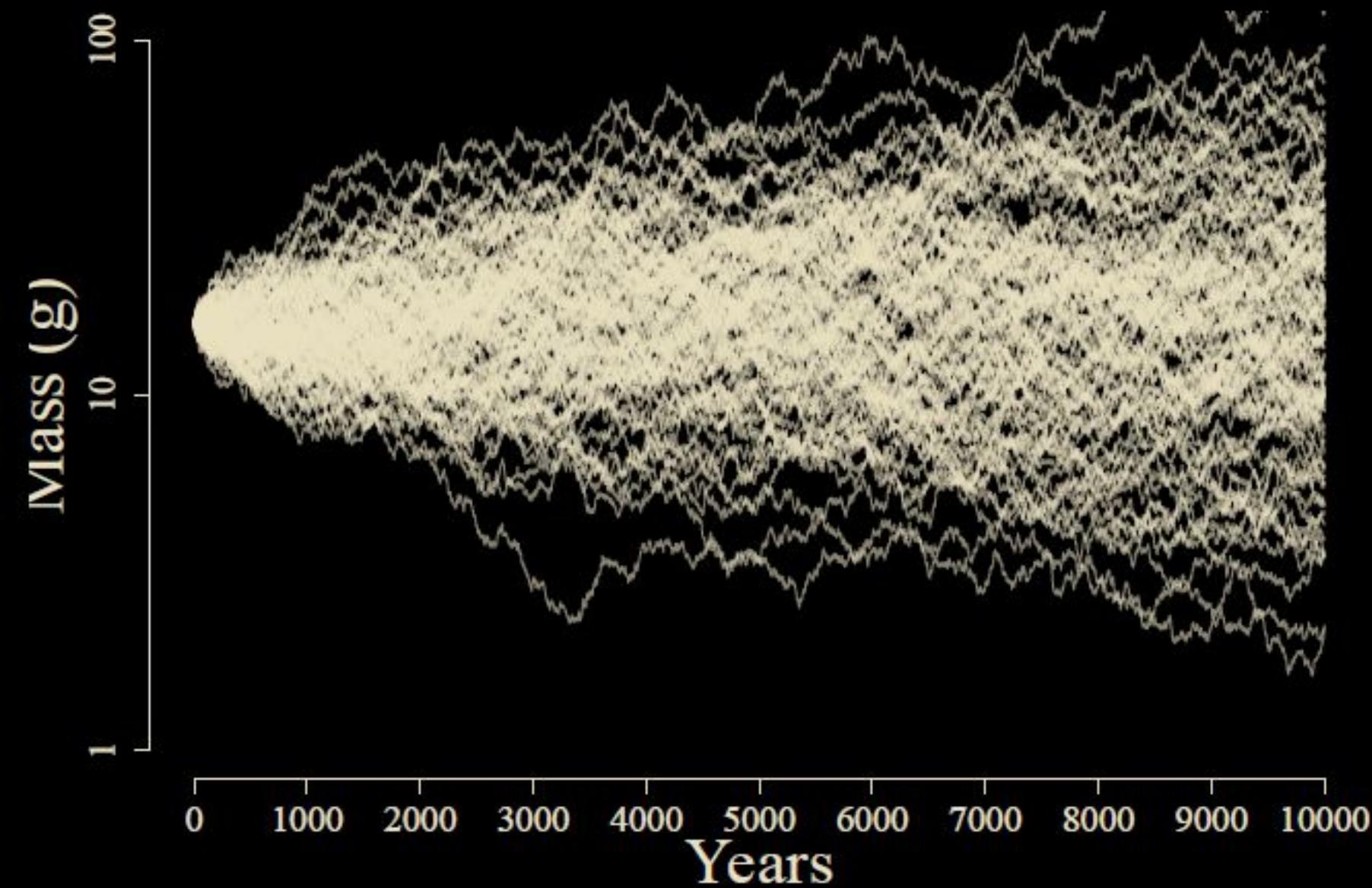
# But evolution often reverses itself!

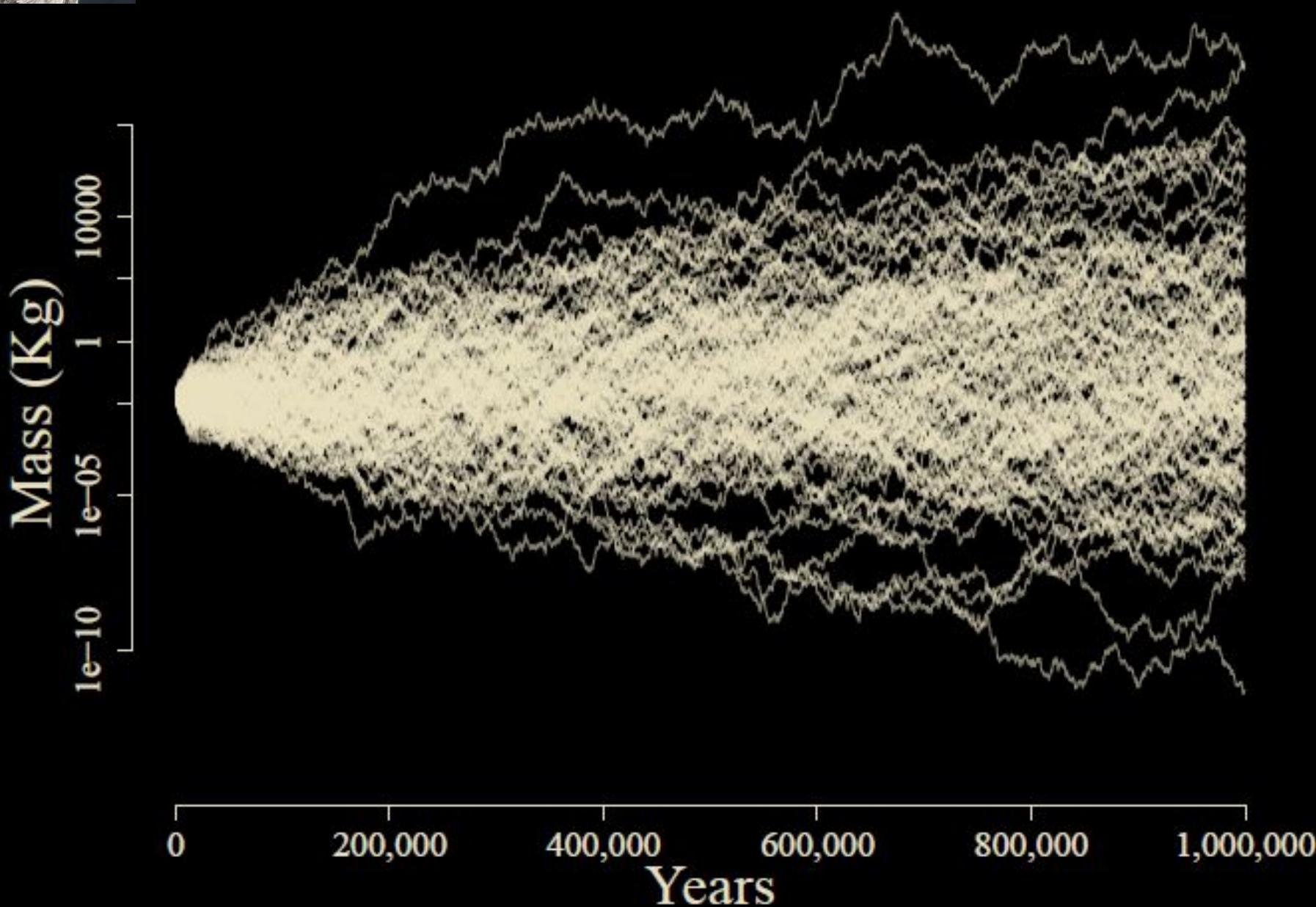
Let's instead simulate going up or down randomly

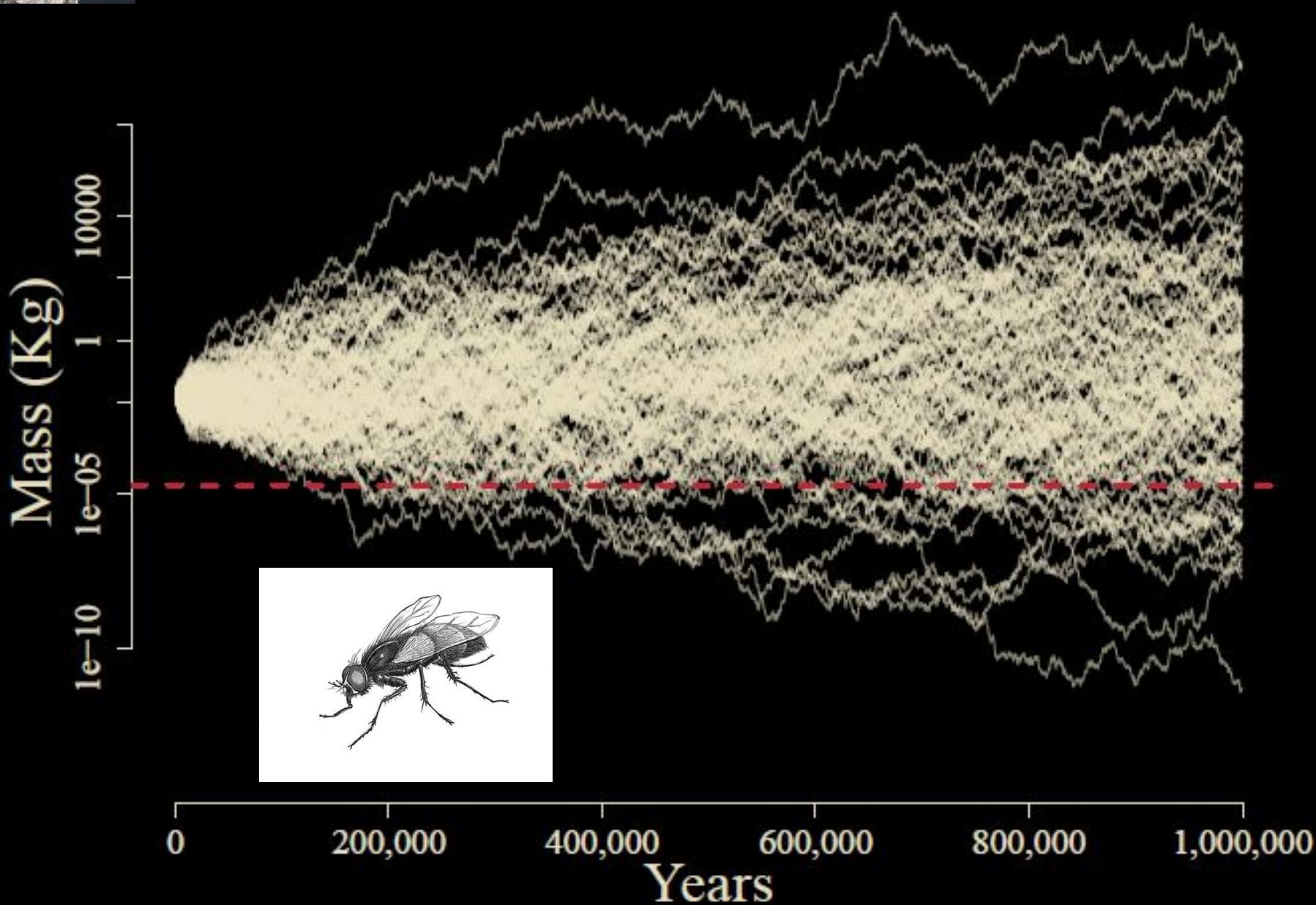
*(Brownian motion)*



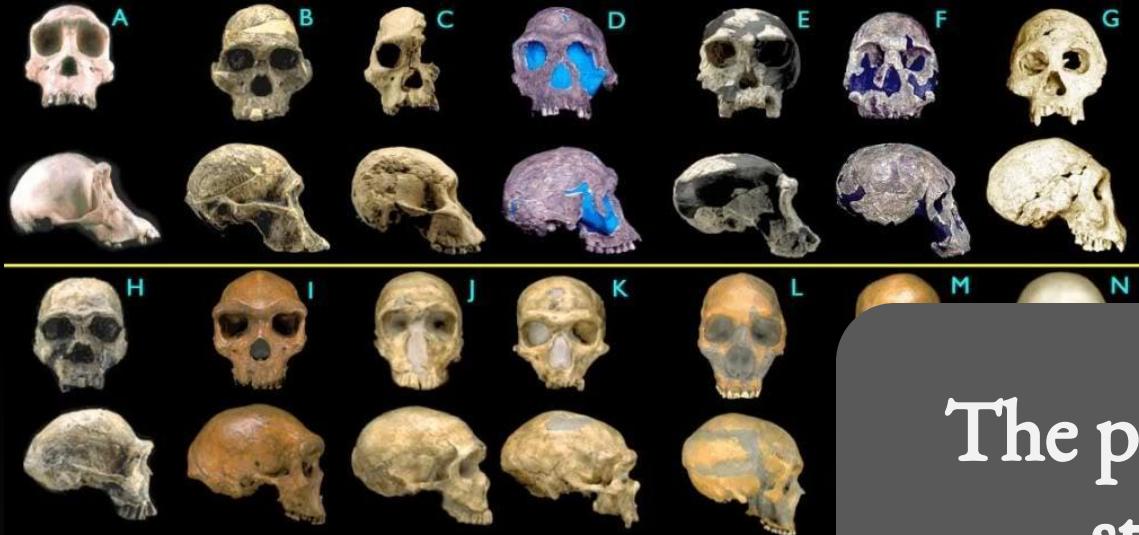
(Grant and Grant, 2002)



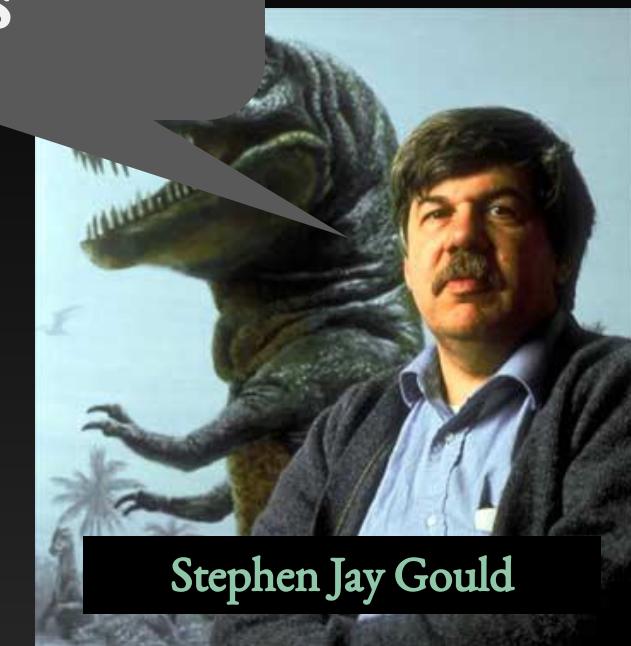
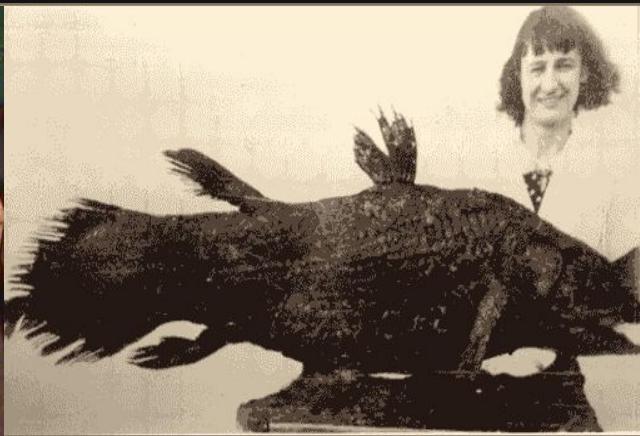




# What does the fossil record say?



The pattern is  
stasis



The Paradox of Stasis (Hansen & Houle 2004):

Organisms seem to be able to evolve far more than they ever do

Empirical studies often find:

**Strong (and often persistent) directional selection**

(Hereford et al. 2004, Morrissey & Hadfield 2012)

**High levels of additive genetic variance**

(Mousseau & Roff 1987, Houle 1992)

**Rapid evolutionary rates**

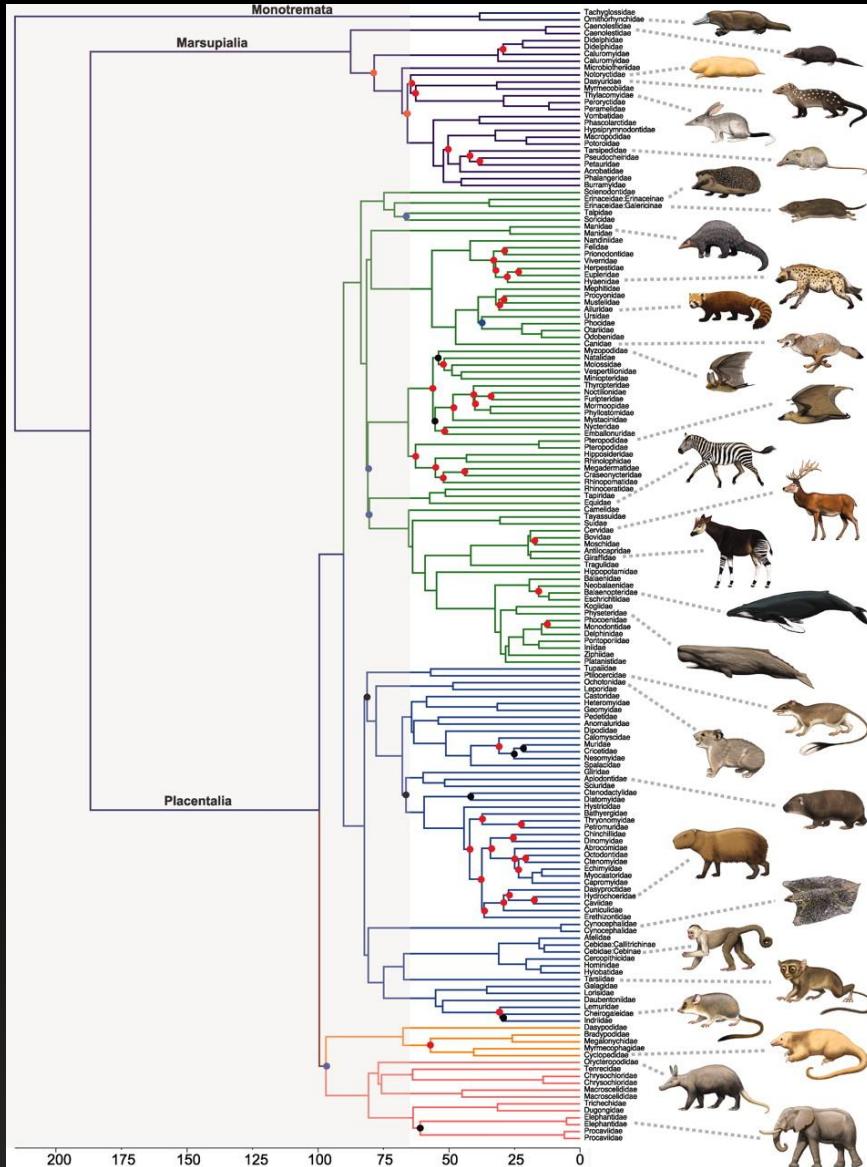
(Hendry & Kinnison 1999, Kinnison & Hendry 2002)

**...yet stasis in the fossil record**

(Gingerich 1983, 2002)

Does microevolution  
even matter for  
long-term change?

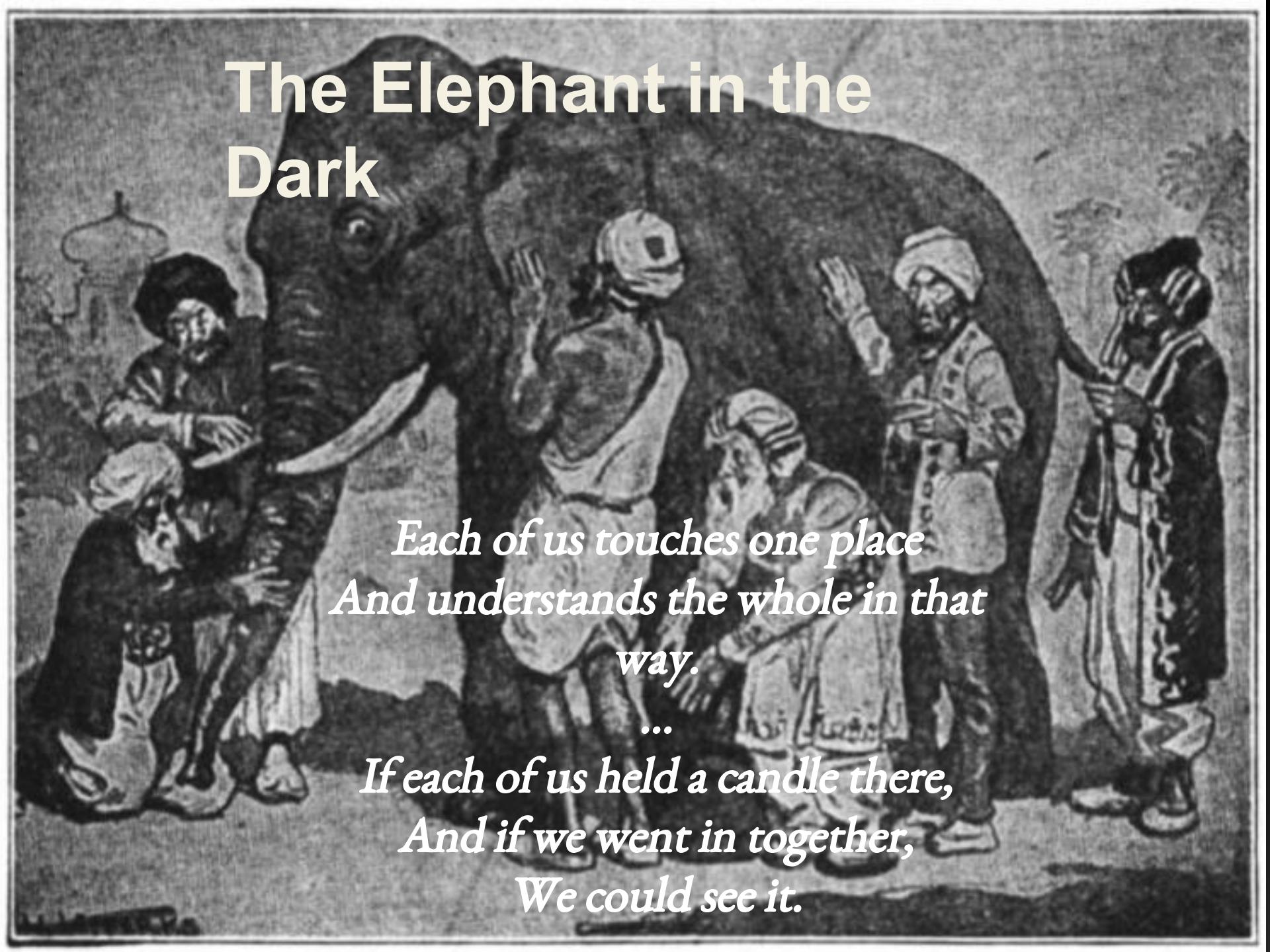
# Patterns in phylogenetic comparative data



So what do comparative biologists use to model evolution on a phylogeny?

*Gradual Brownian motion!*

# The Elephant in the Dark



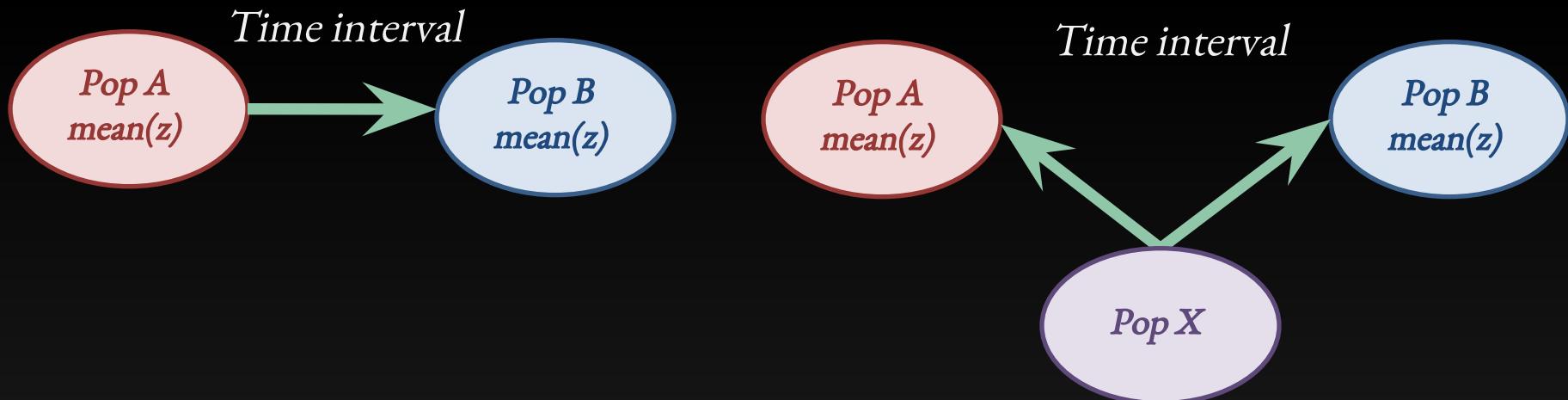
*Each of us touches one place  
And understands the whole in that  
way.*

...

*If each of us held a candle there,  
And if we went in together,  
We could see it.*

# How can we see the pattern across scales of time?

All studies of phenotypic evolution measure comparable quantities

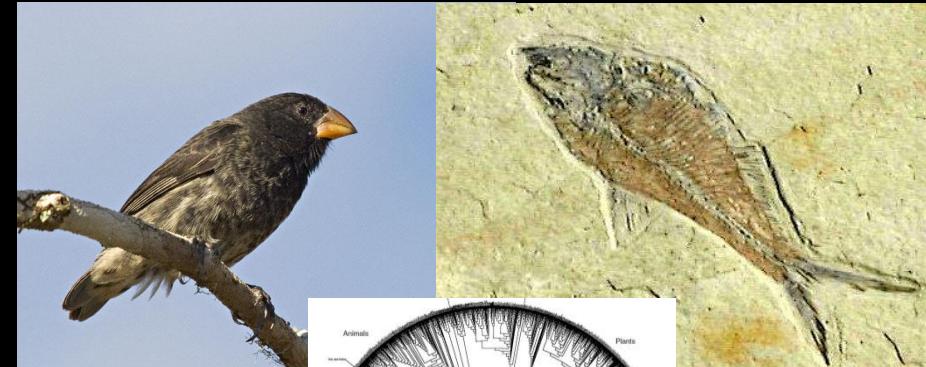
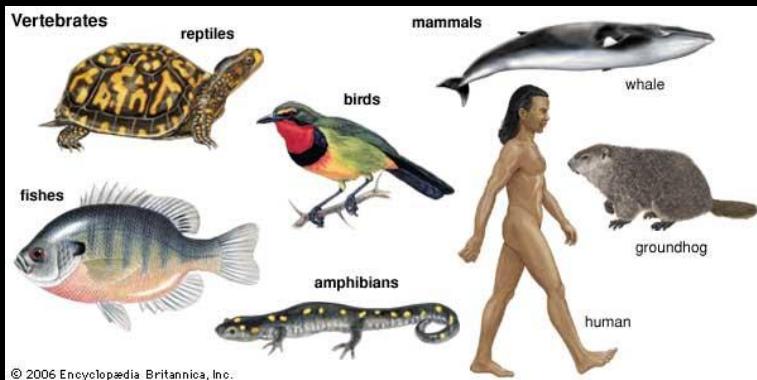


We measure two quantities:

- (1) “time for evolution”
- (2)  $\Delta$  mean body size

# Phenotypic divergence database

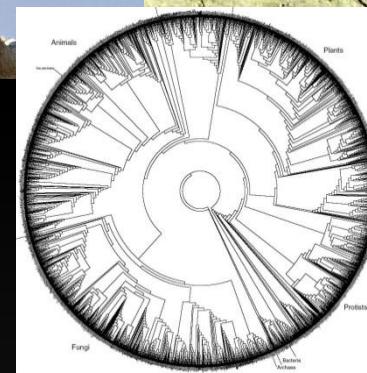
(Uyeda, Hansen, Arnold & Pienaar, 2011. *PNAS*.)



Only animals, mostly  
vertebrates, but also  
some inverts



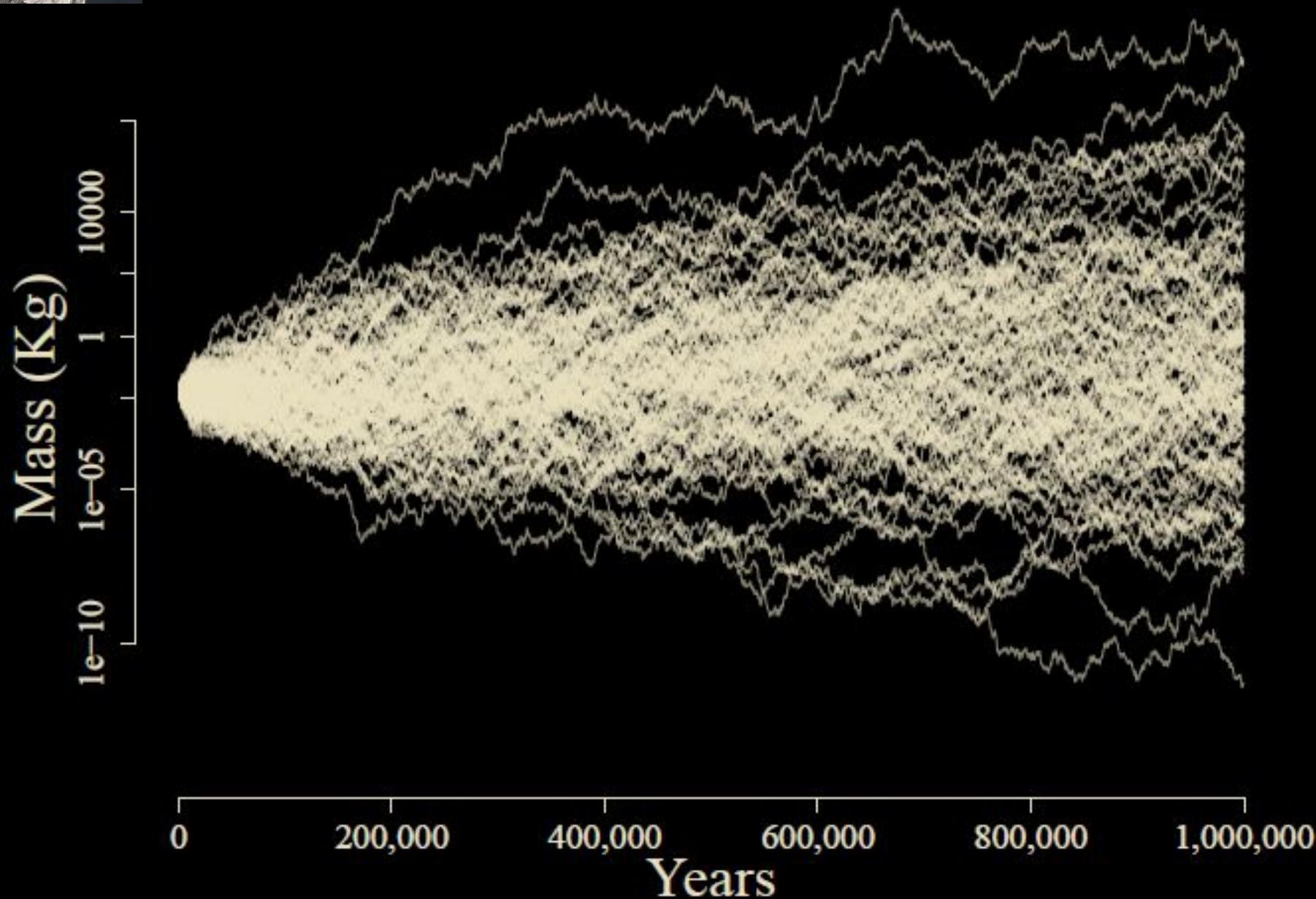
Only traits related to  
linear body size  
change

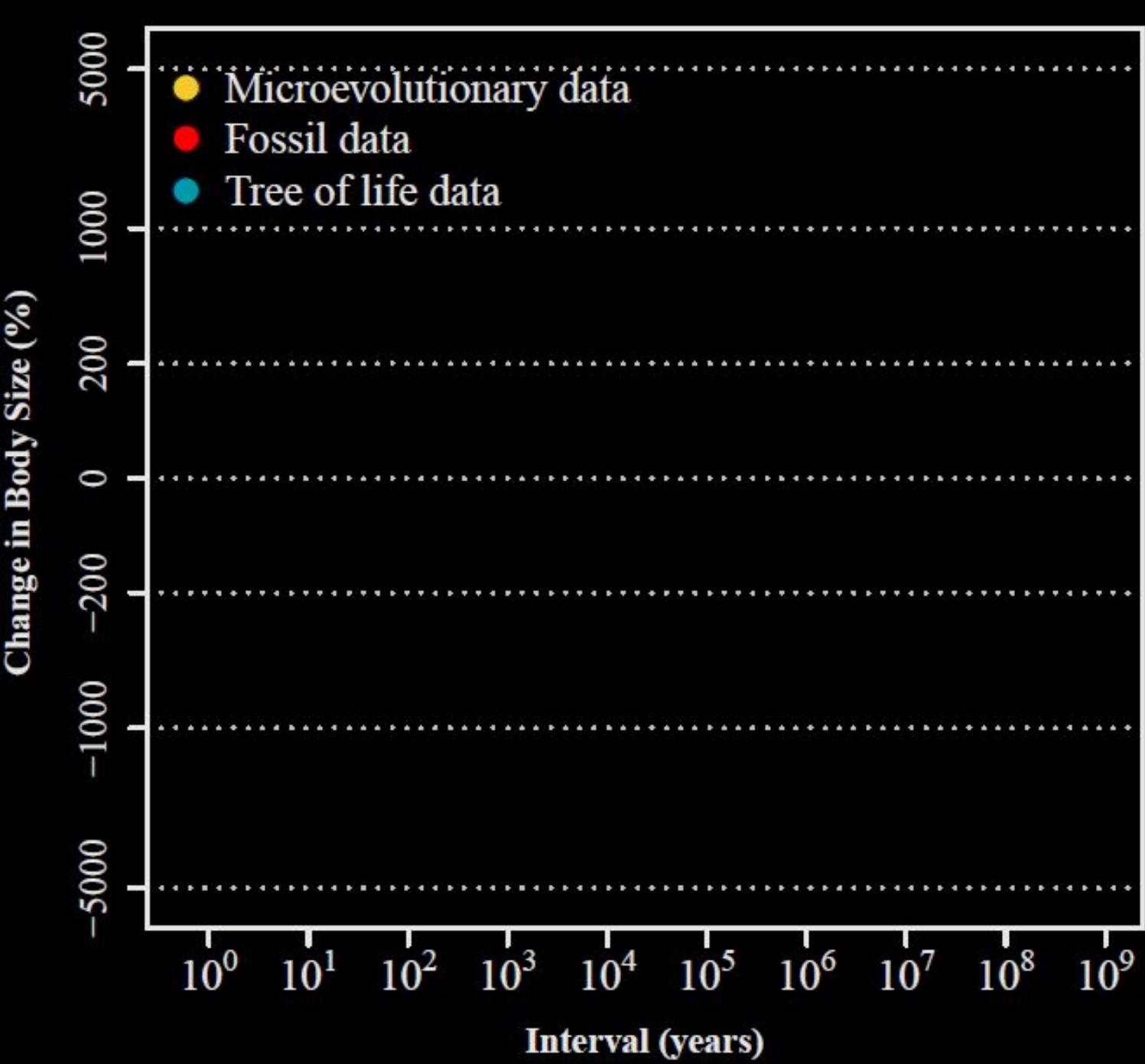


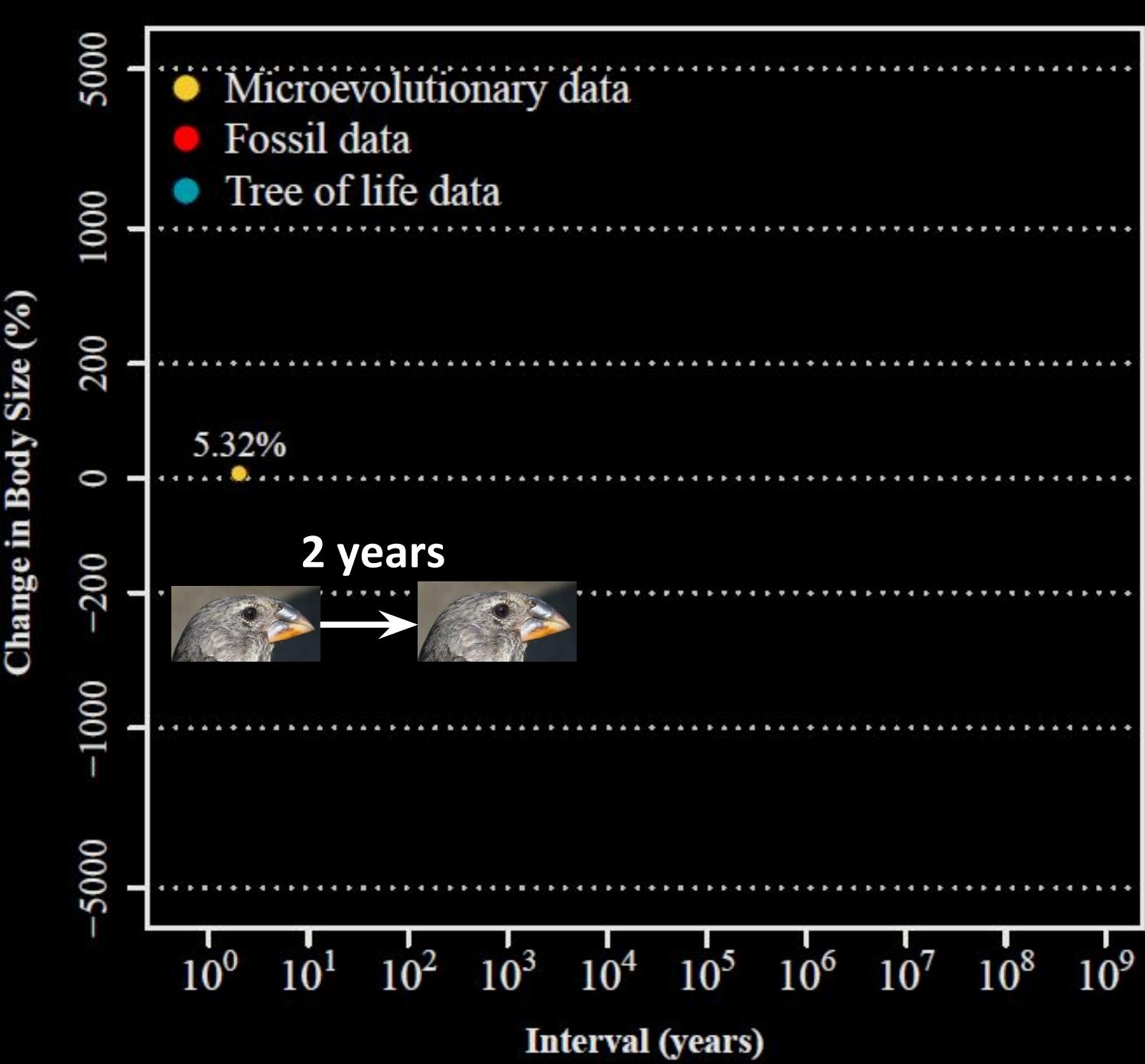
Field, Fossil and  
Phylogenetic  
comparative data

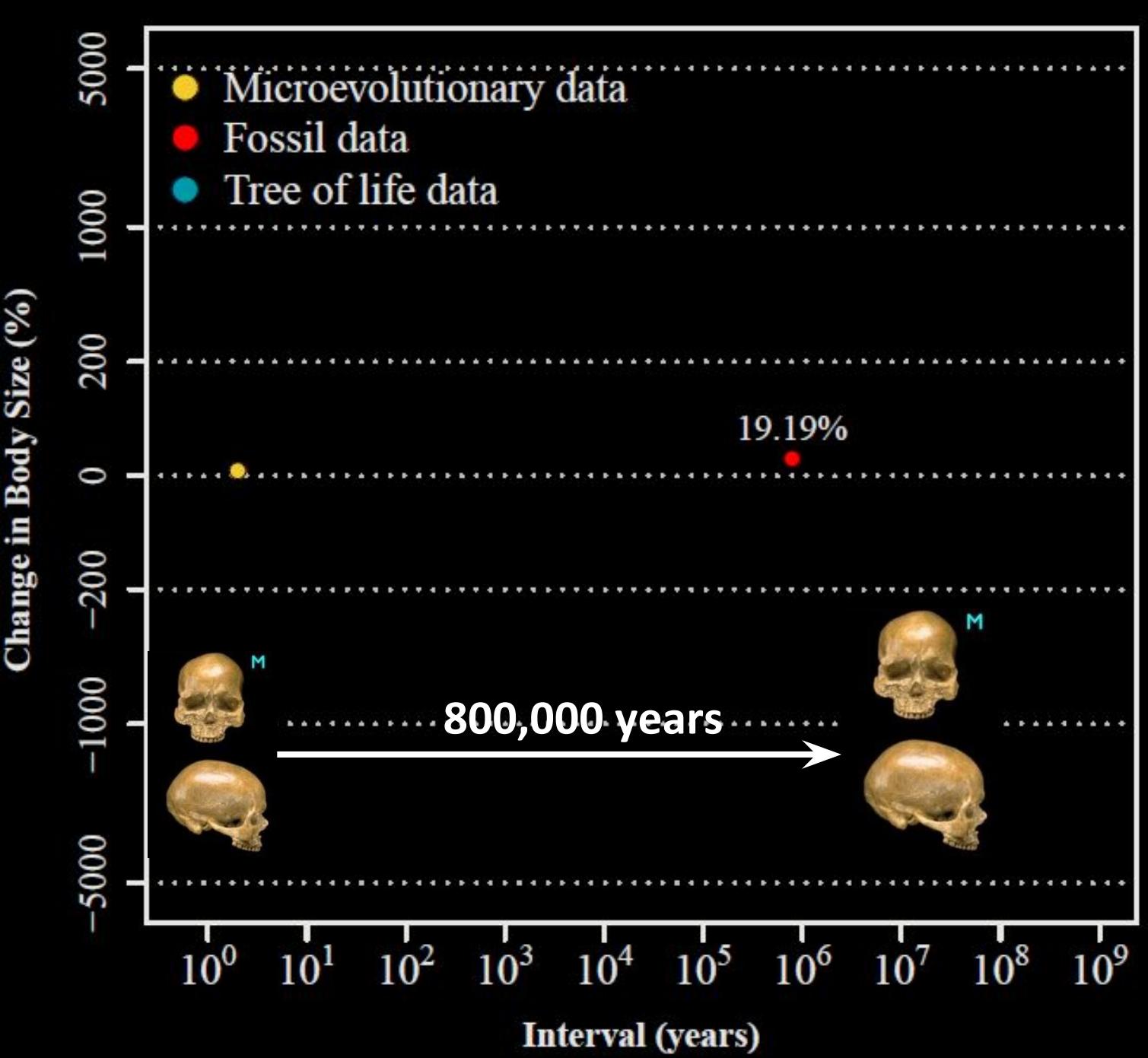
>8000 data points from  
> 150 studies

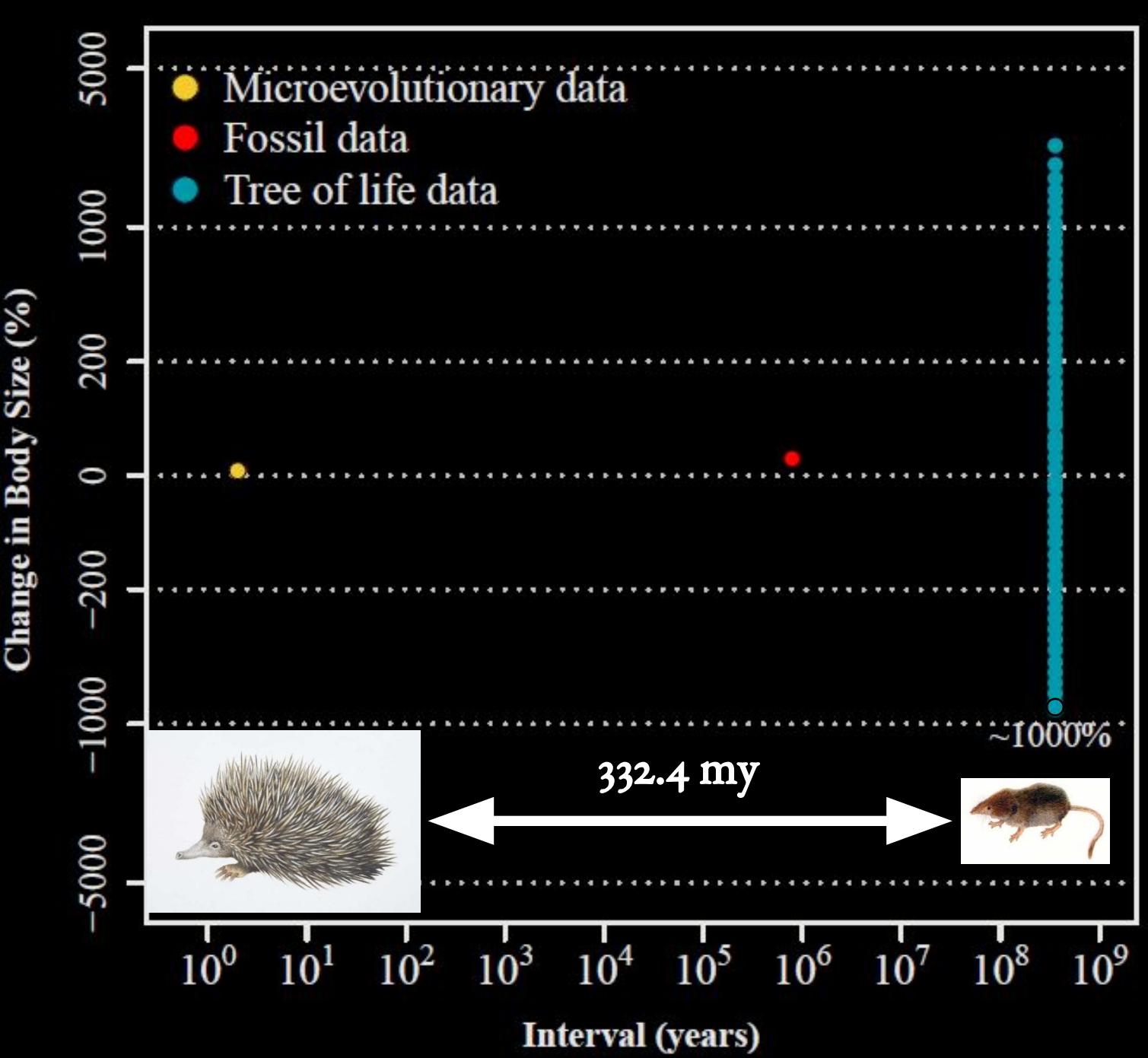
Intervals from < 1 yr to  
360 my

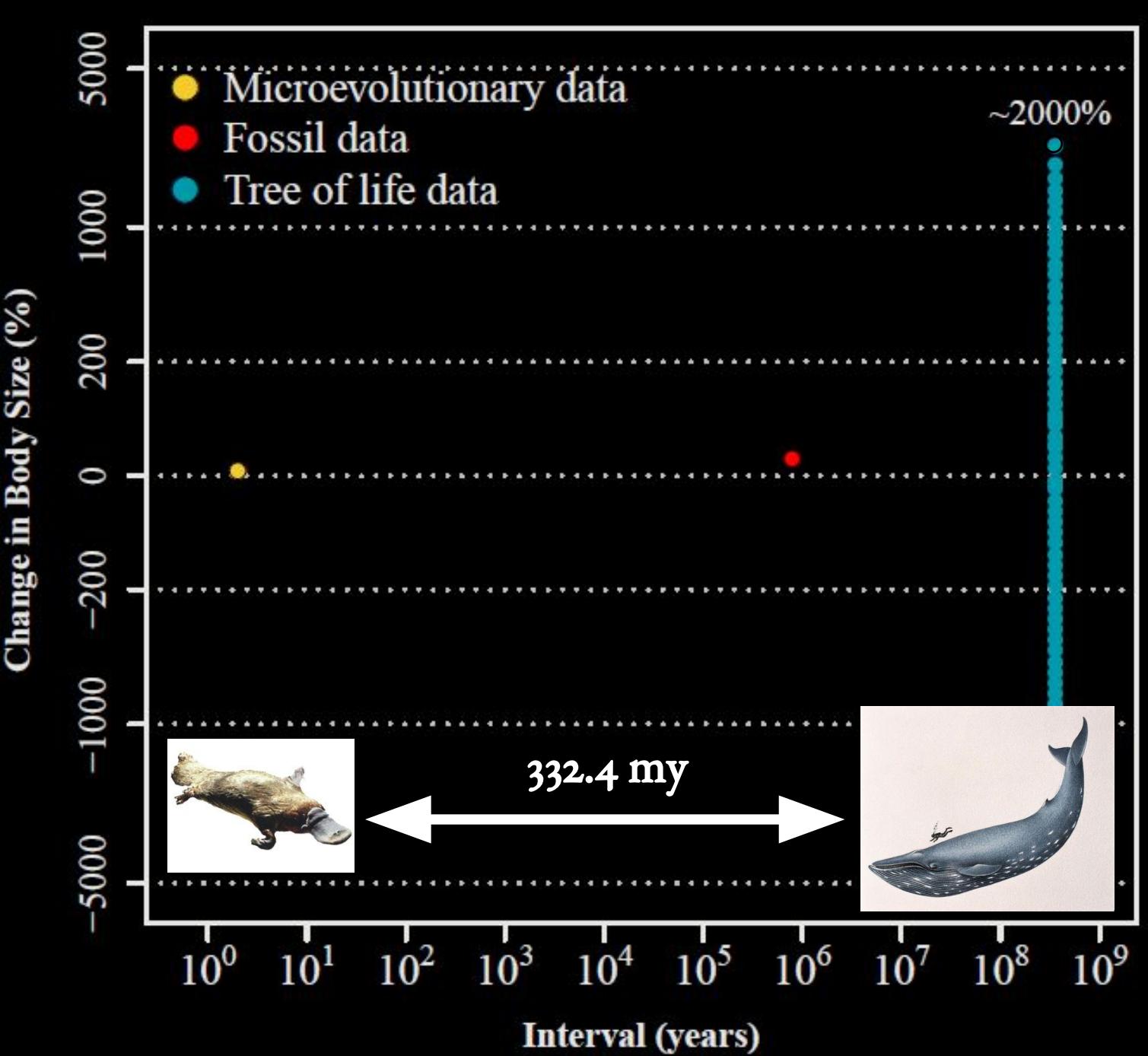


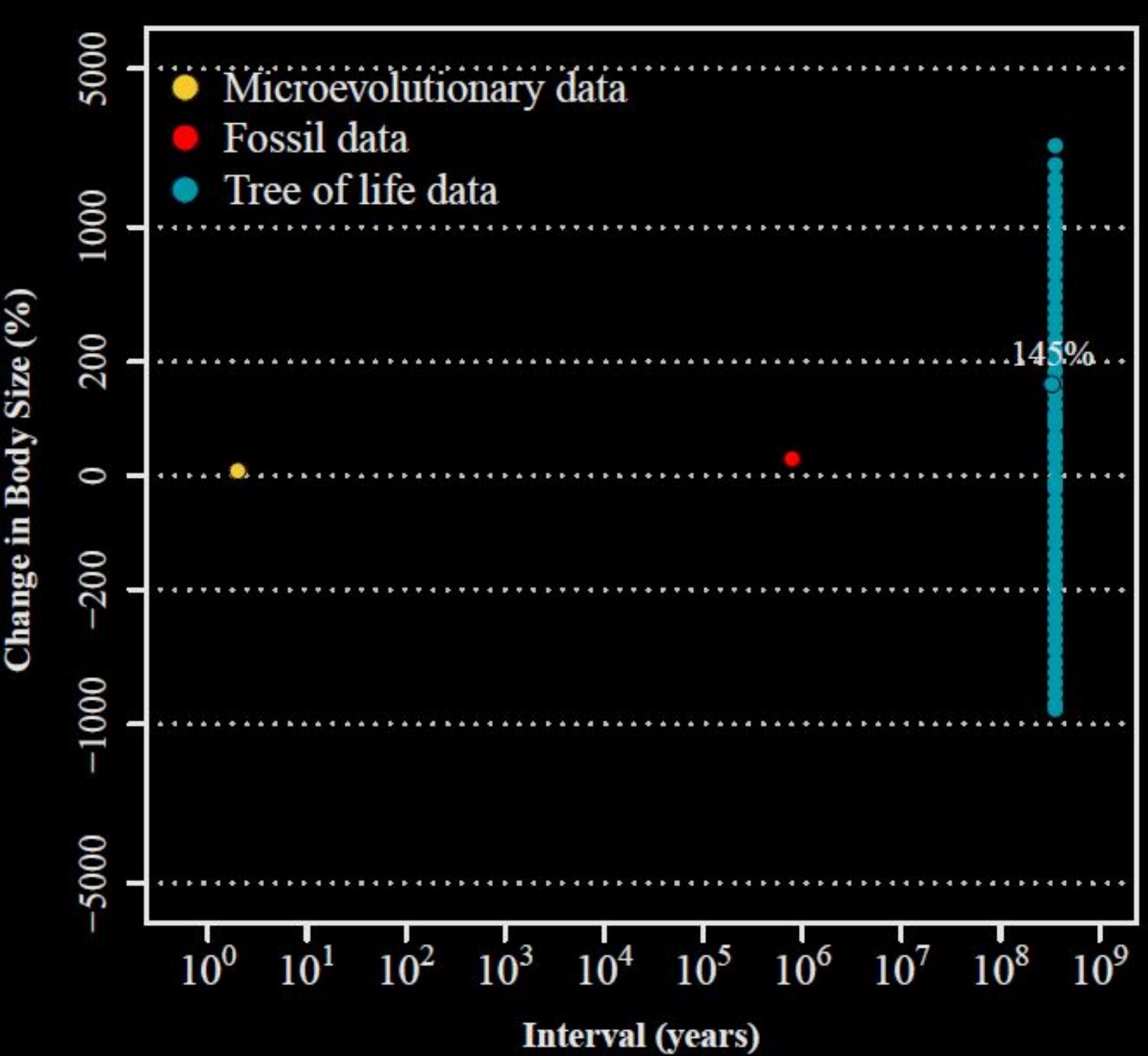


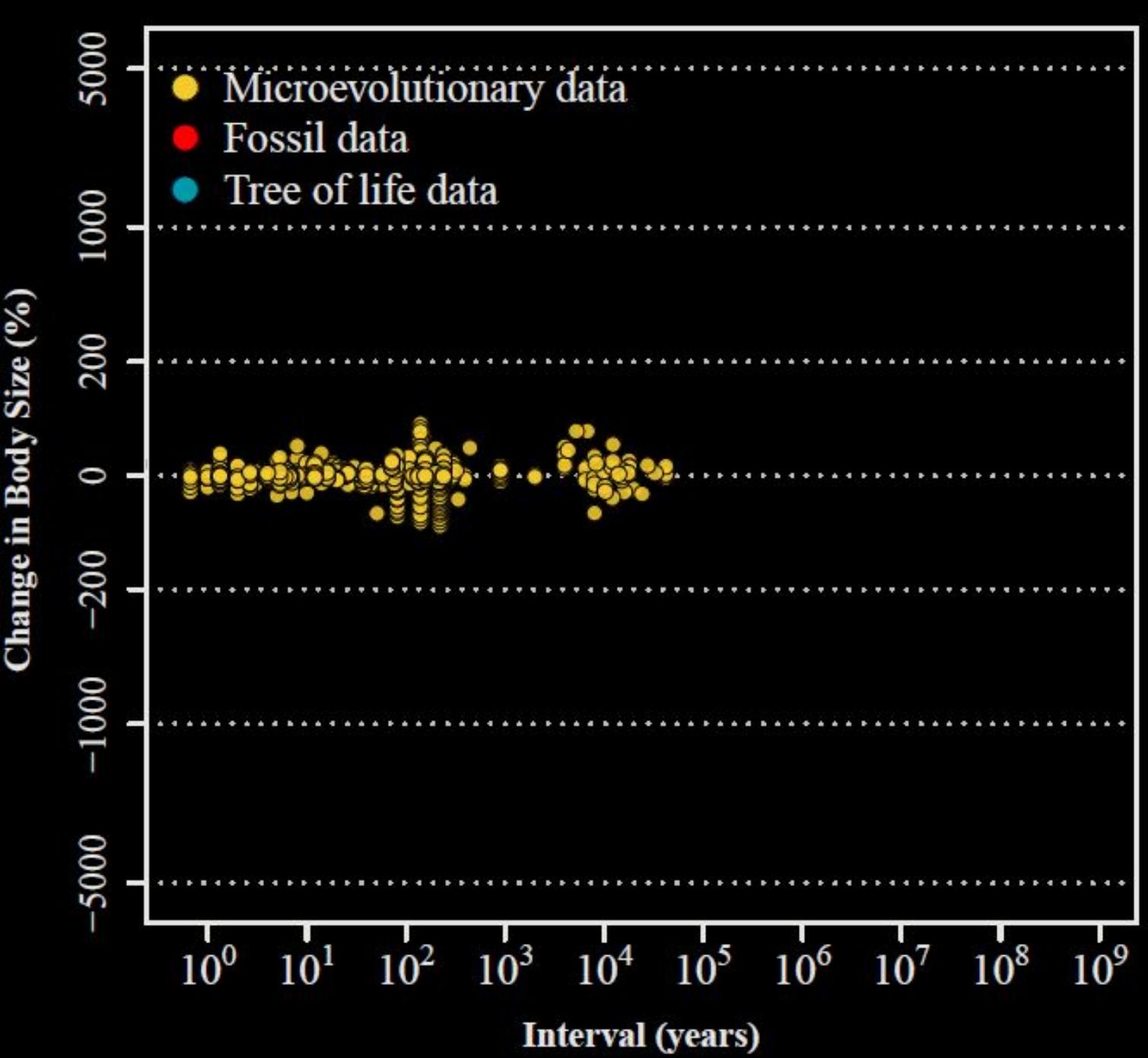


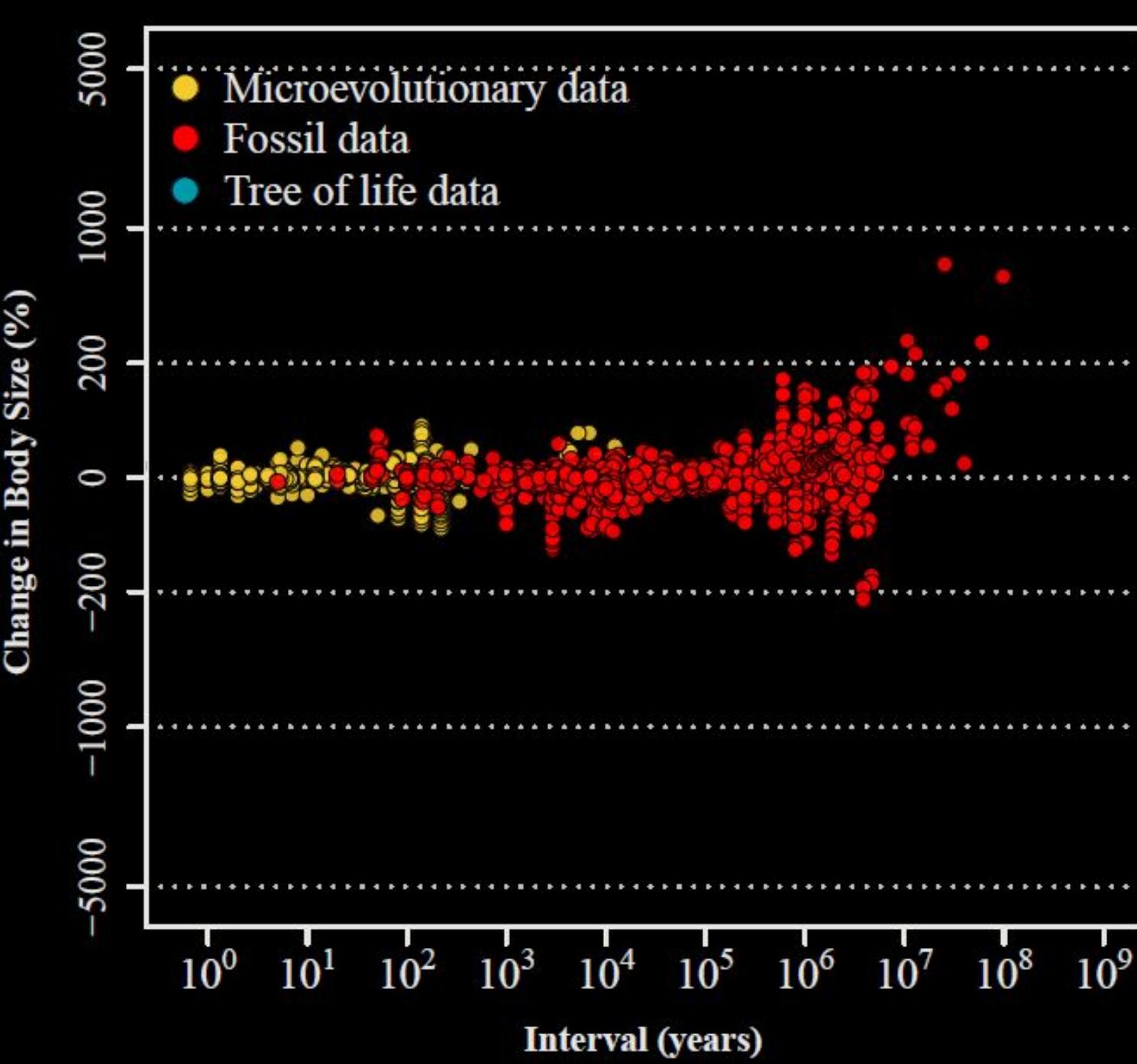








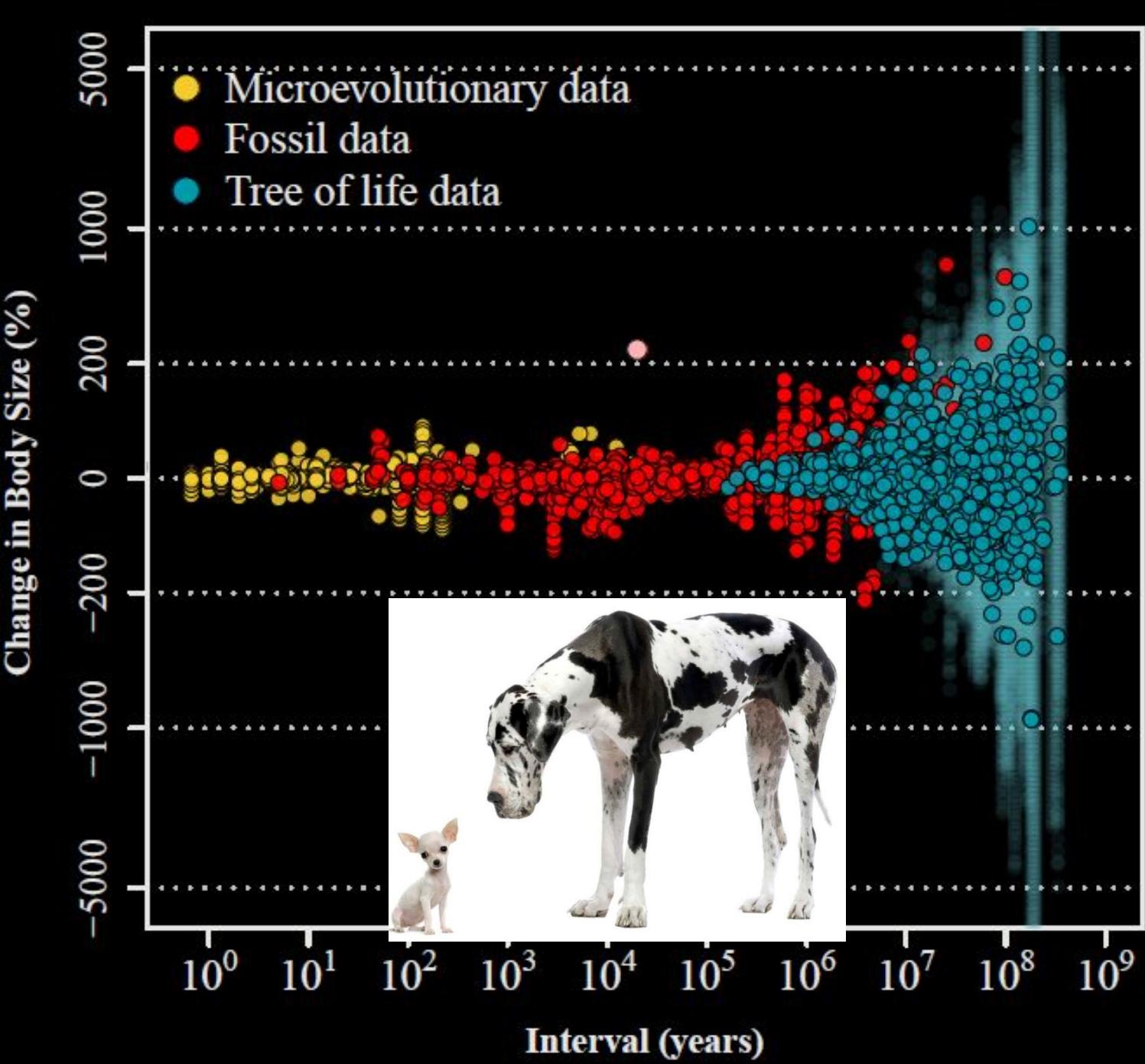


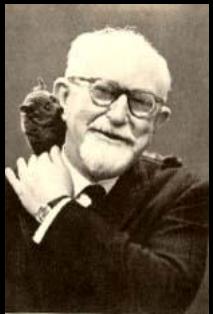


# “The Evolutionary Blunderbuss”

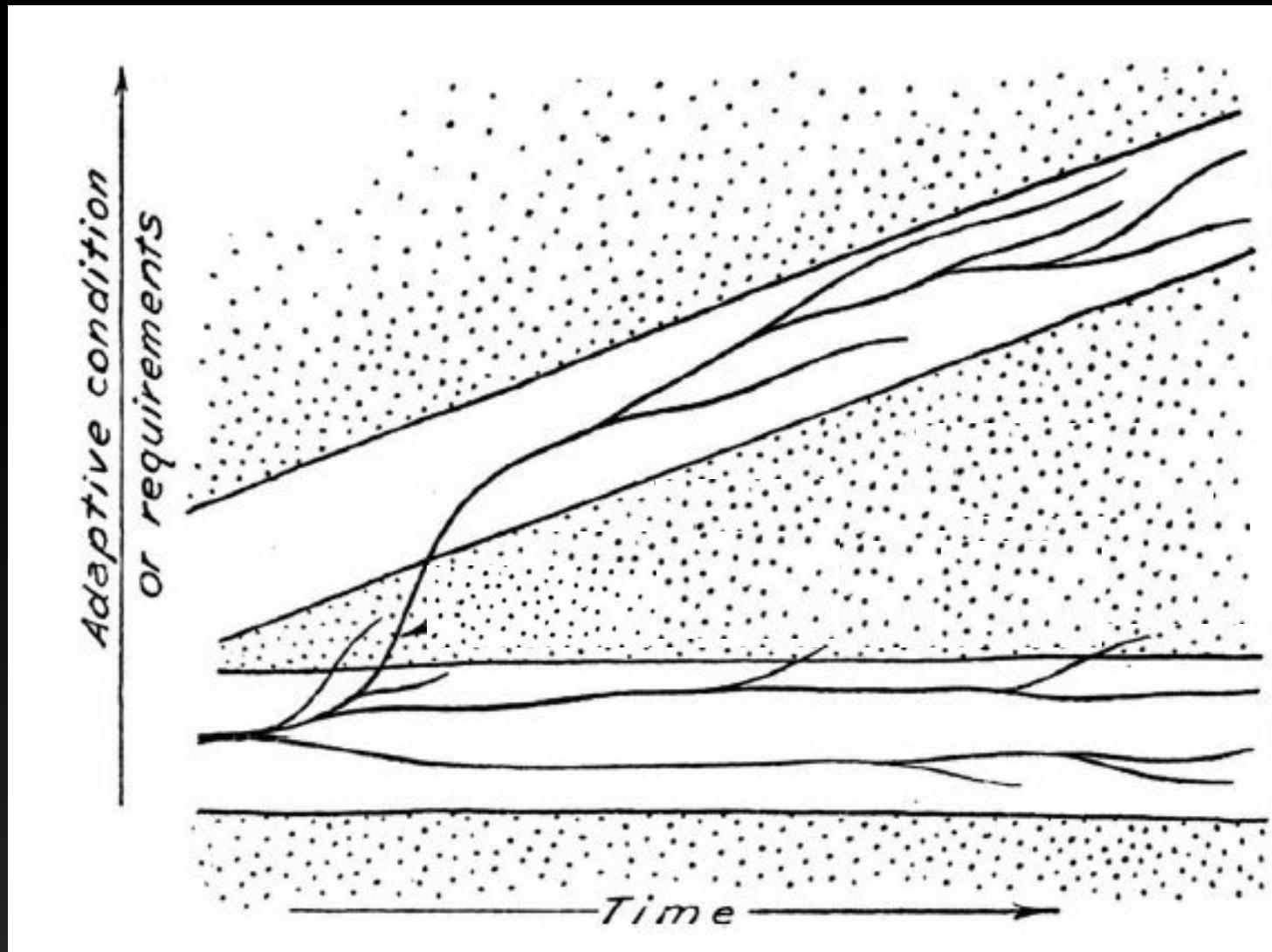


Uyeda et al.,  
*PNAS*, 2011



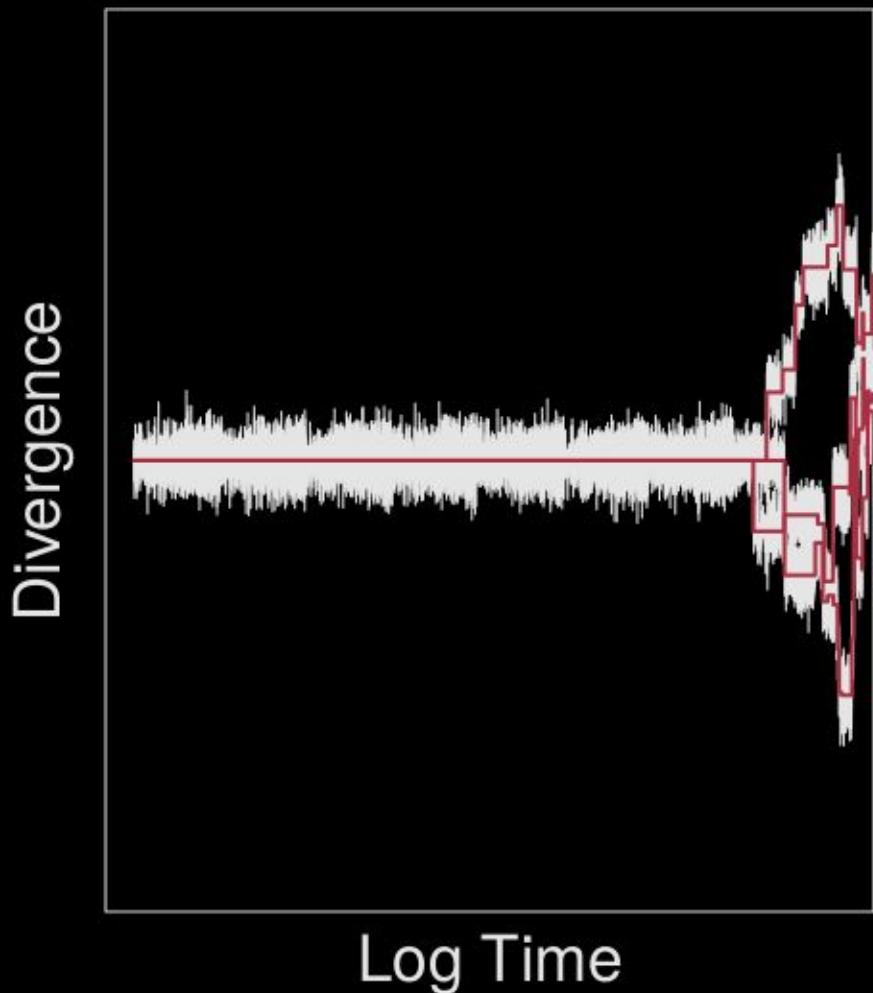


# Simpson's Adaptive Zones

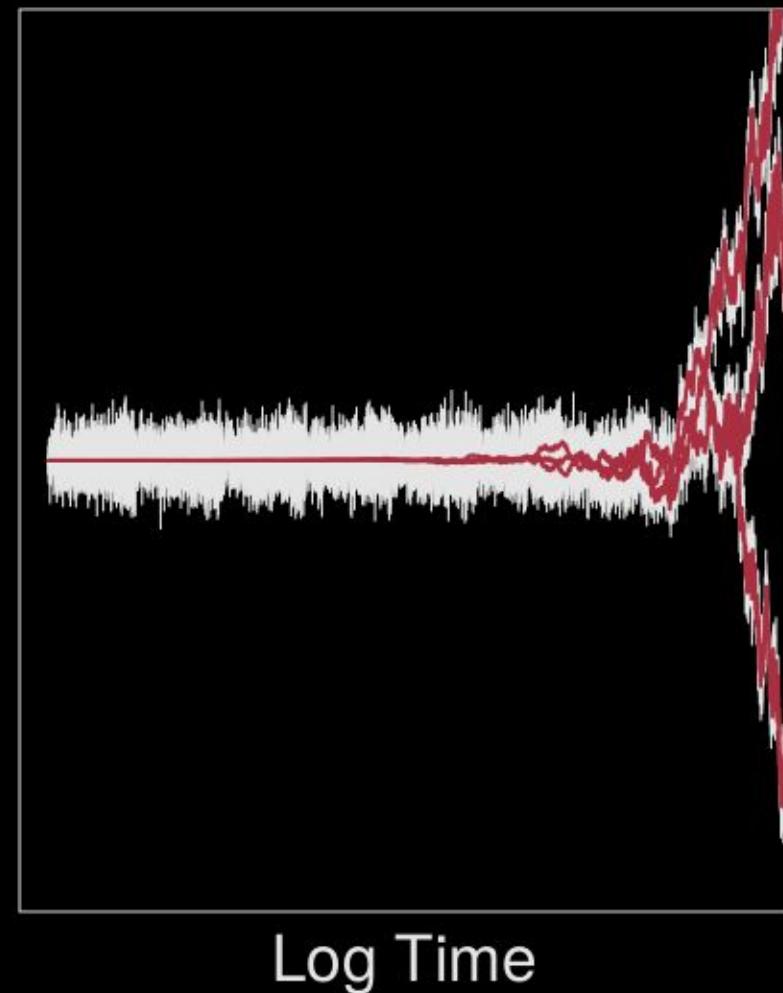


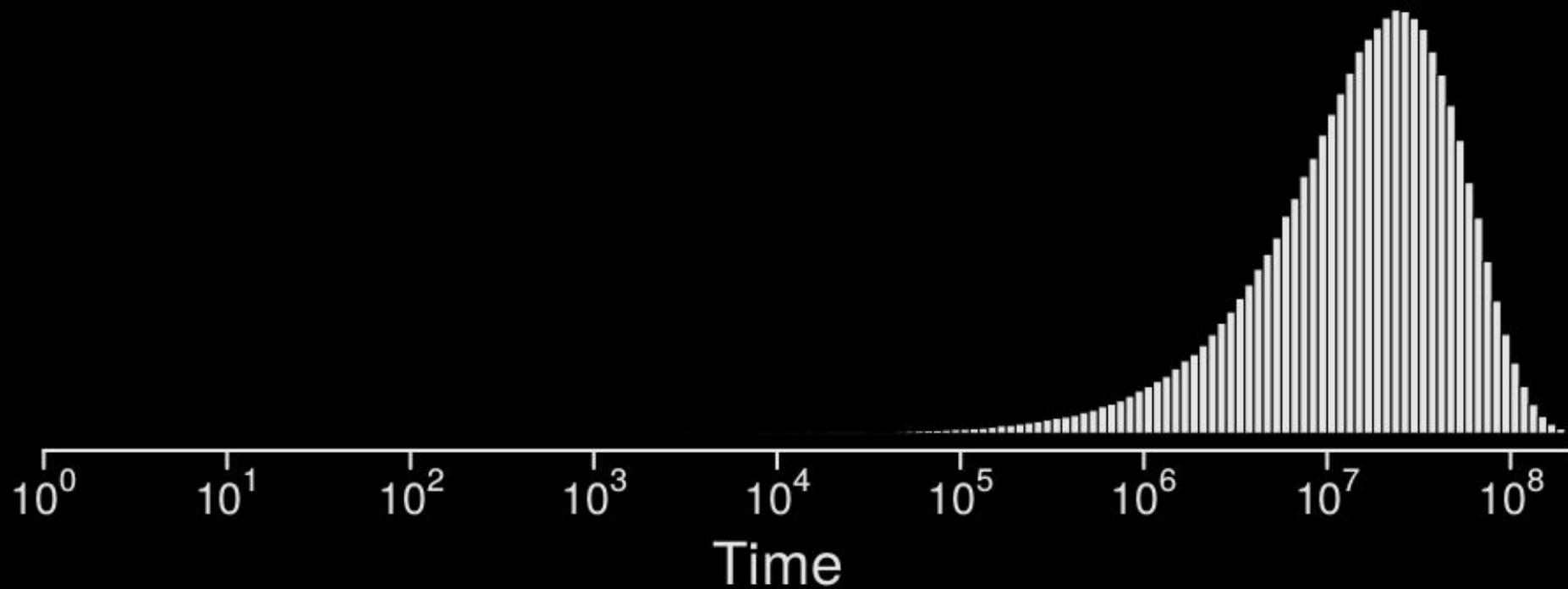
# Model fits

Multiple-Burst  
(MB)



Brownian Motion  
(BM)





Dataset	Parameter Estimates		
	Stasis SD	Burst SD	Ave. burst time
<i>Whole dataset</i>	= 0.096	= 0.27	25.0 my
<i>Microevolutionary &amp; Fossil</i>	= 0.087	= 0.25	1.5 my
<i>Phylogenetic</i>	= 0.086	= 0.22	21.8 my

Adaptive peaks  
move rapidly over  
short timescales  
Adaptive peak shifts, stabilizing selection  
& genetic drift  
(Ruxley 1987)

Phenotype

Adaptive Zones/Niches

Million-year  
Punctuated Equilibrium  
waiting times

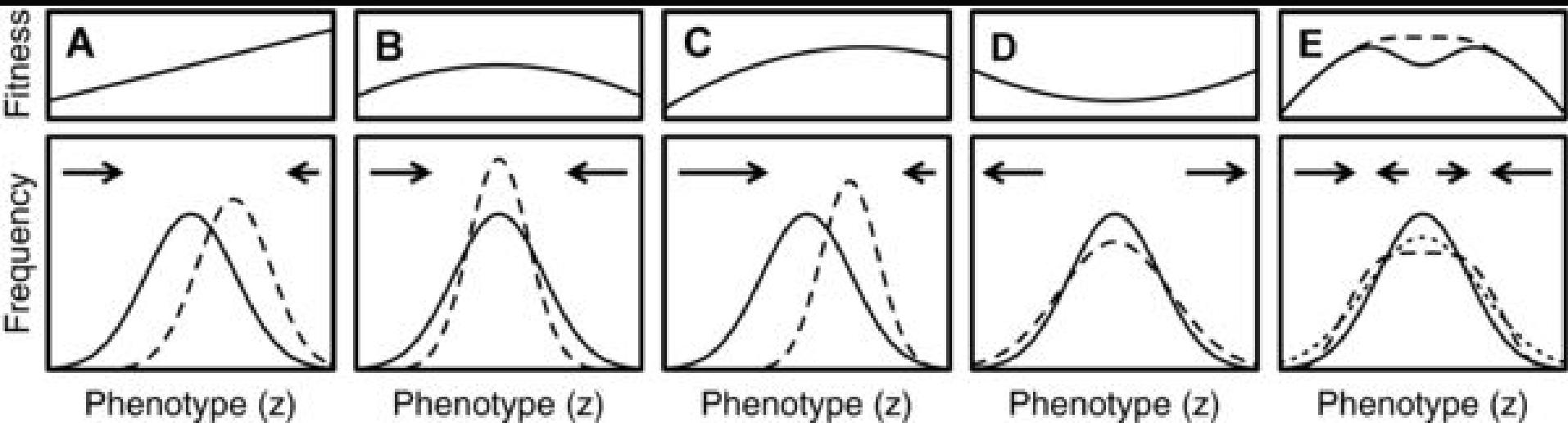
Time

Pennell, Harmon & Uyeda. 2013. Is there  
room for Punctuated Equilibrium in  
Macroevolution? *TREE*.

# Some recent proposals

# Intraspecific competition

Haller & Hendry. 2014. *Solving the paradox of stasis: Squashed stabilizing selection and the limits of detection, Evolution*



# Populations vs. lineages

Bartoszek et al. *The Ornstein-Uhlenbeck process with migration: evolution with interactions, arXiv*

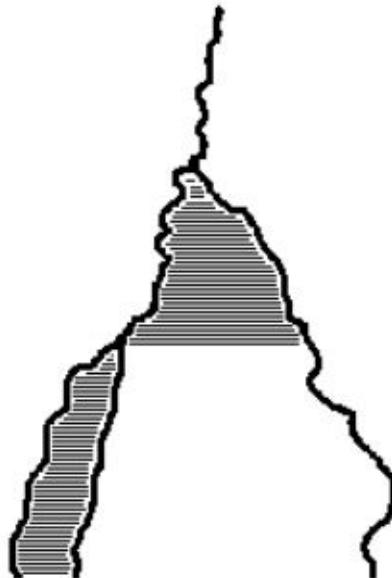
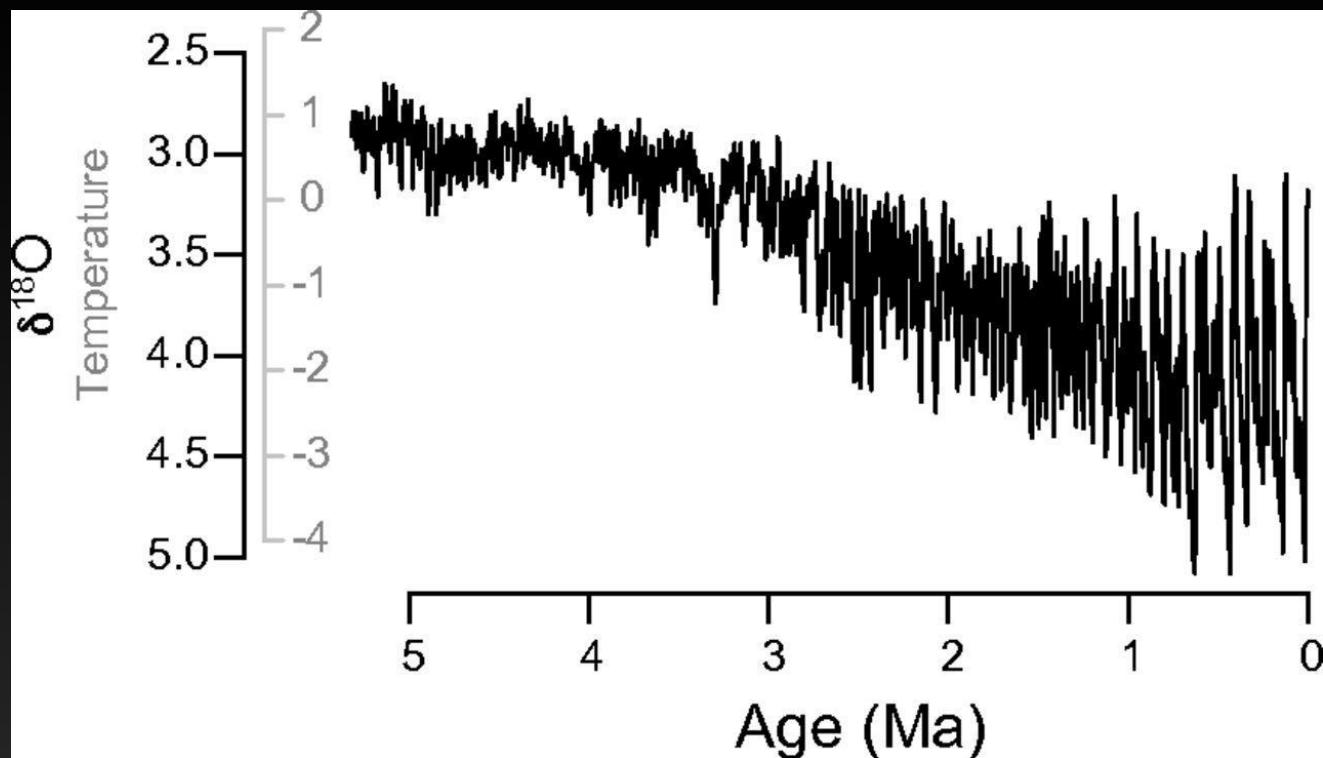


Figure 2: An evolving trait on a phylogenetic tree with migrations indicated, by horizontal lines.

# Temperature tracking

Hunt et al. 2015. *Simple vs complex models of trait evolution and stasis as a response to environmental change, PNAS*



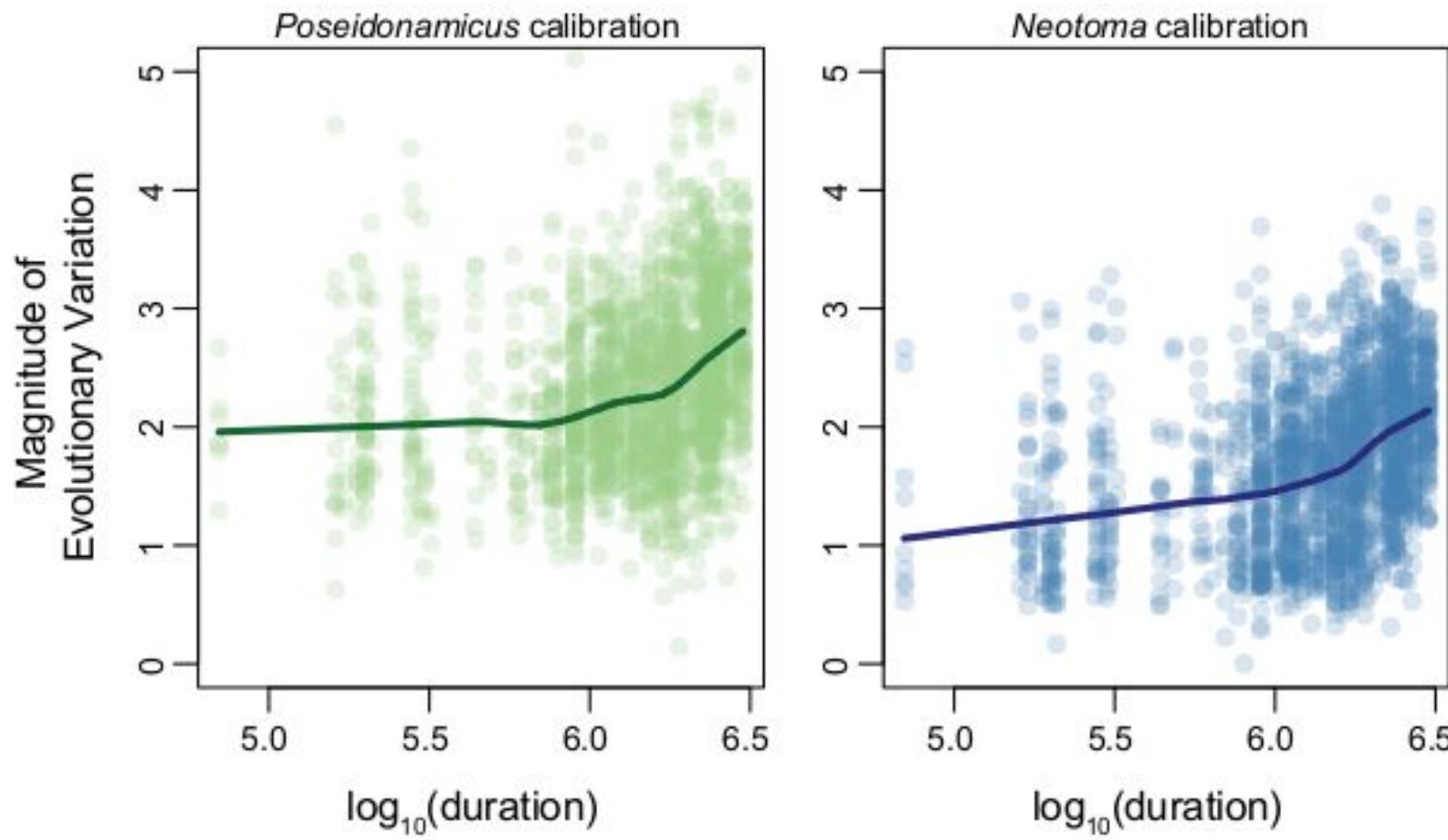
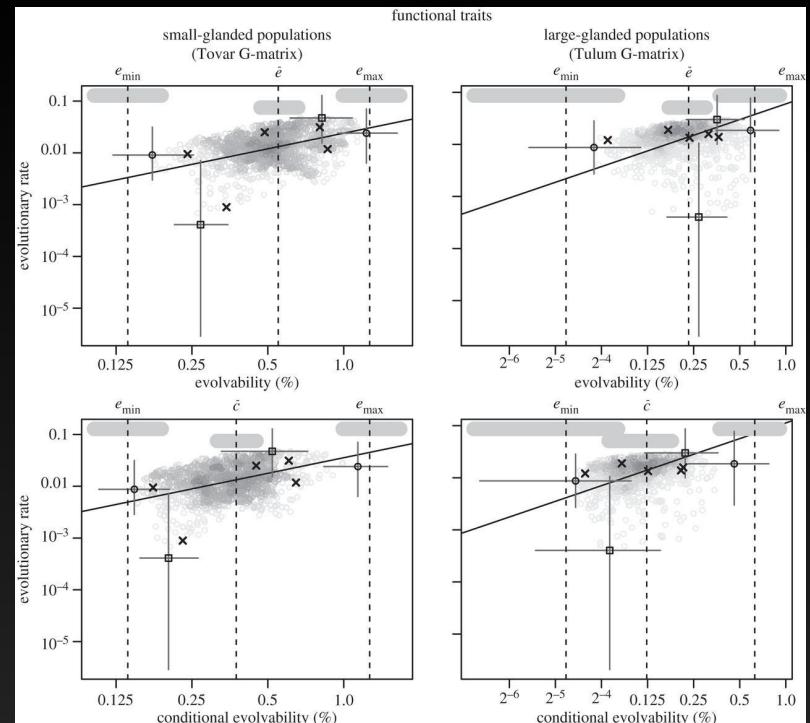
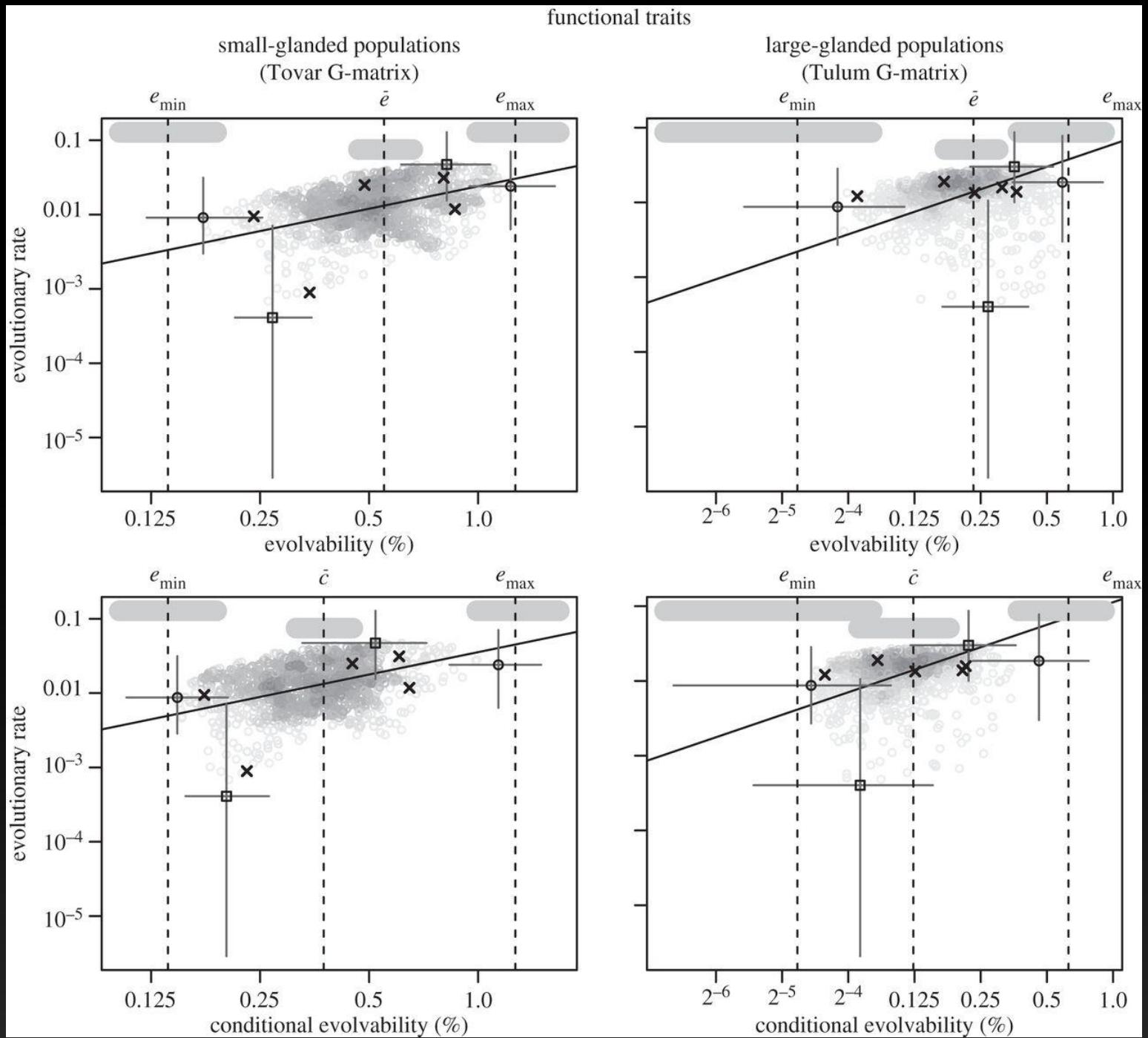


Figure S6. Results of simulations from the temperature-tracking model, calibrated by *Poseidonamicus major* (left) and *Neotoma cinerea* (right). Vertical axis is magnitude of evolutionary variation measured as the standard deviation of samples in a sequence, with the contribution from measurement error removed (see Methods). Horizontal axis is sequence duration, in years and on a  $\log_{10}$  scale (a value of 6 is 1 Myr). Points are semi-transparent and lines represent locally weighted (lowess) regressions with a smoother span = 0.5.

# Multivariate genetic constraints

Bolstad et al. 2014. *Genetic constraints predict evolutionary divergence in Delachampia blossoms*. Phil. Trans. B.





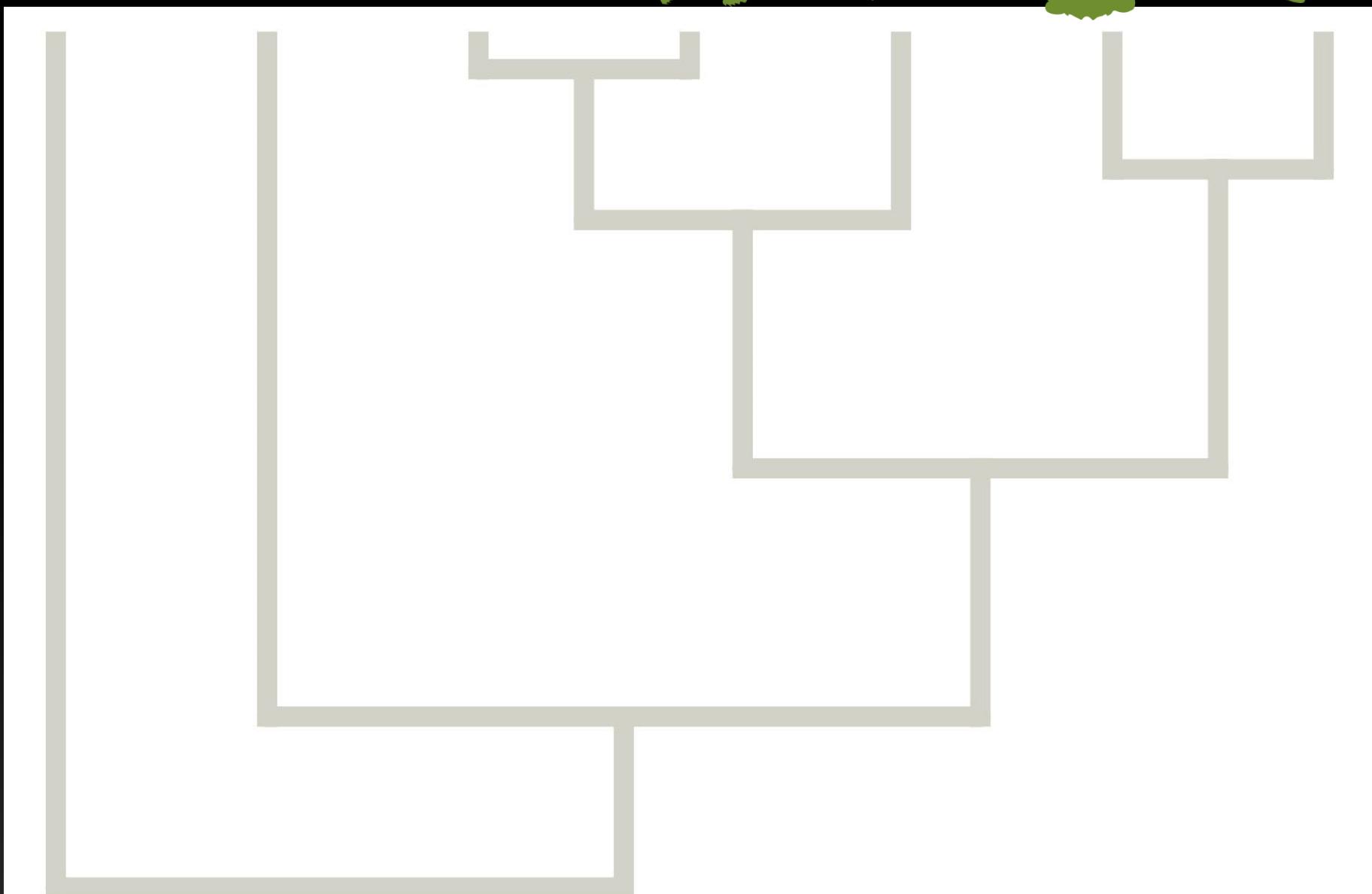
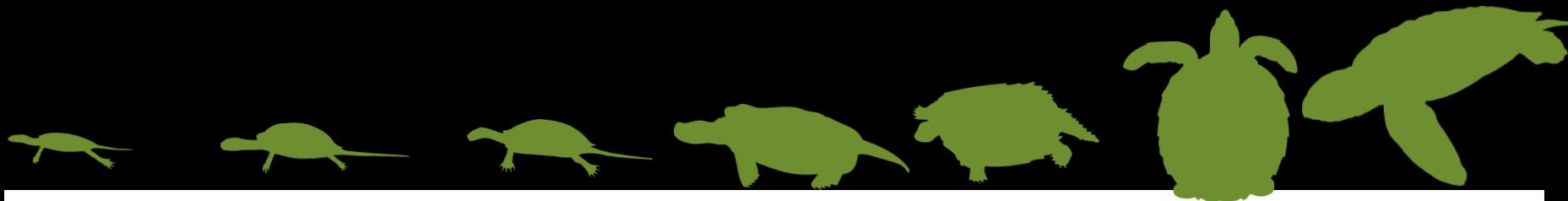
# All of the above?

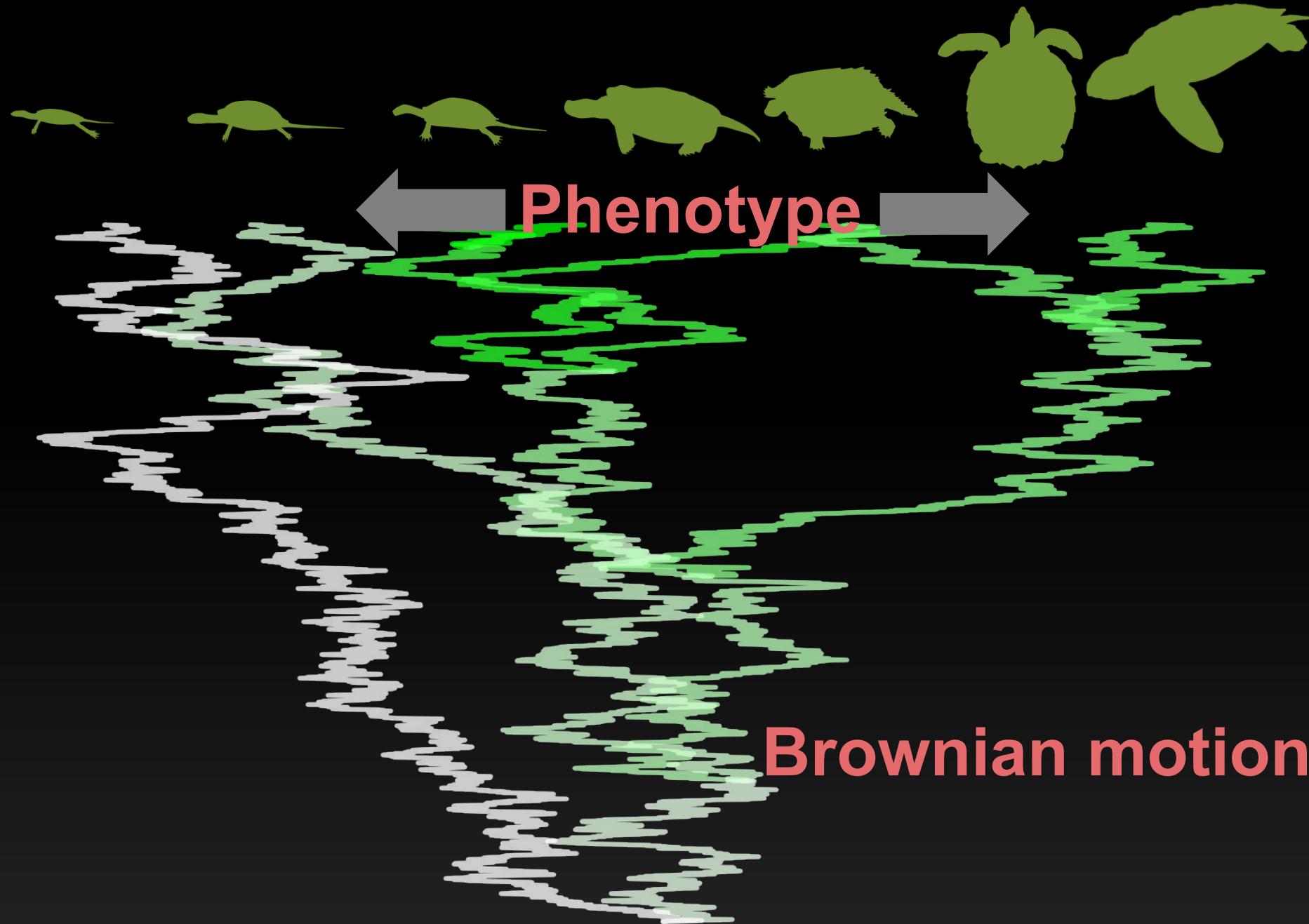
Most of Hansen & Houle's criticisms of  
these ideas still hold

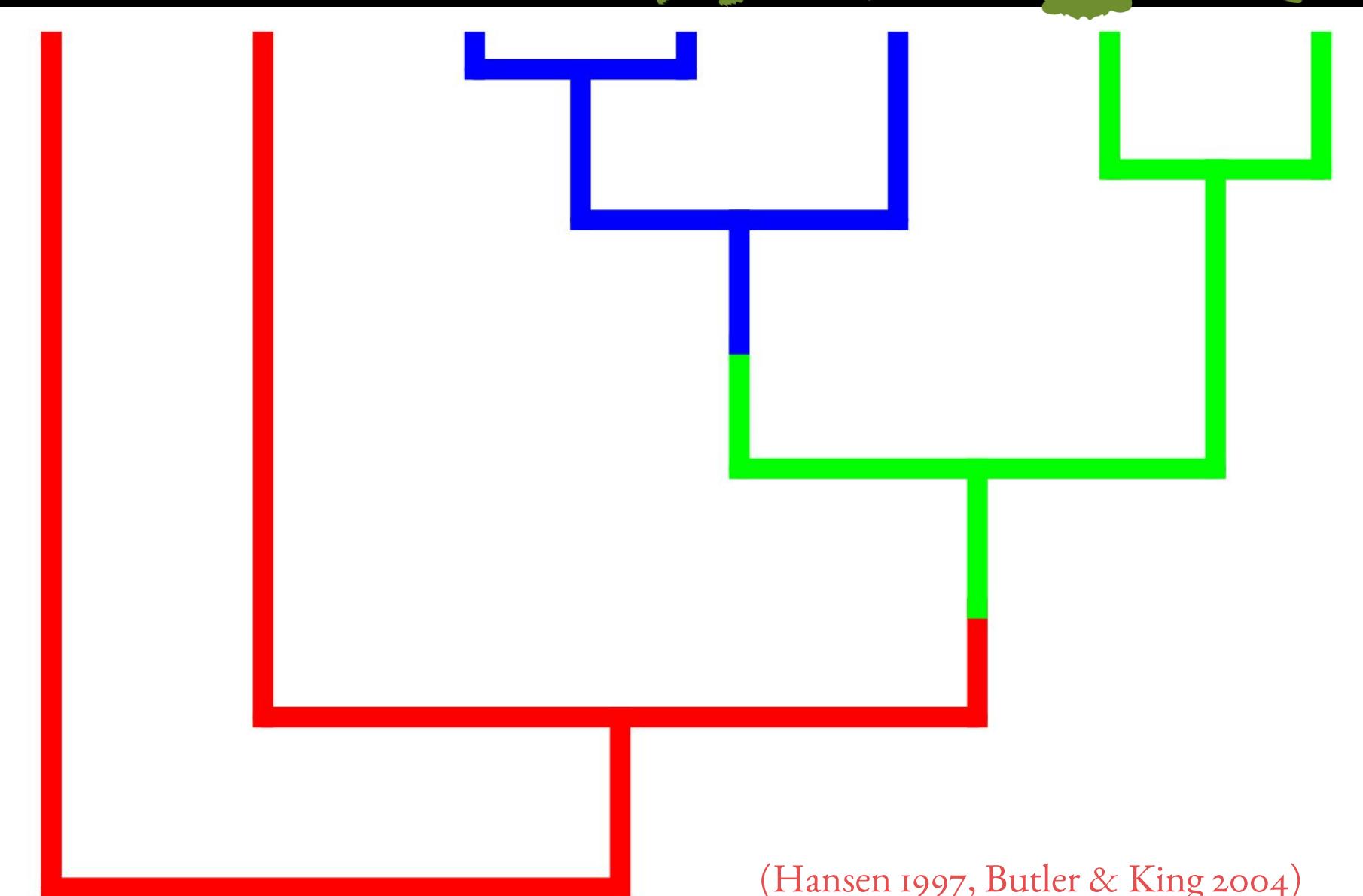
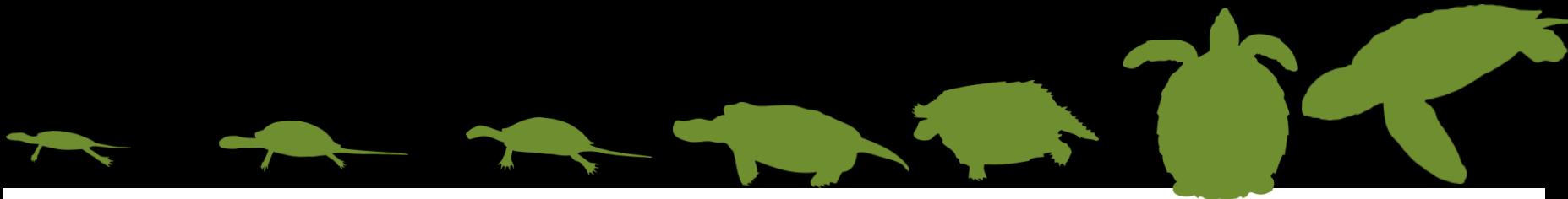
...but it's hard to imagine that they don't  
all contribute



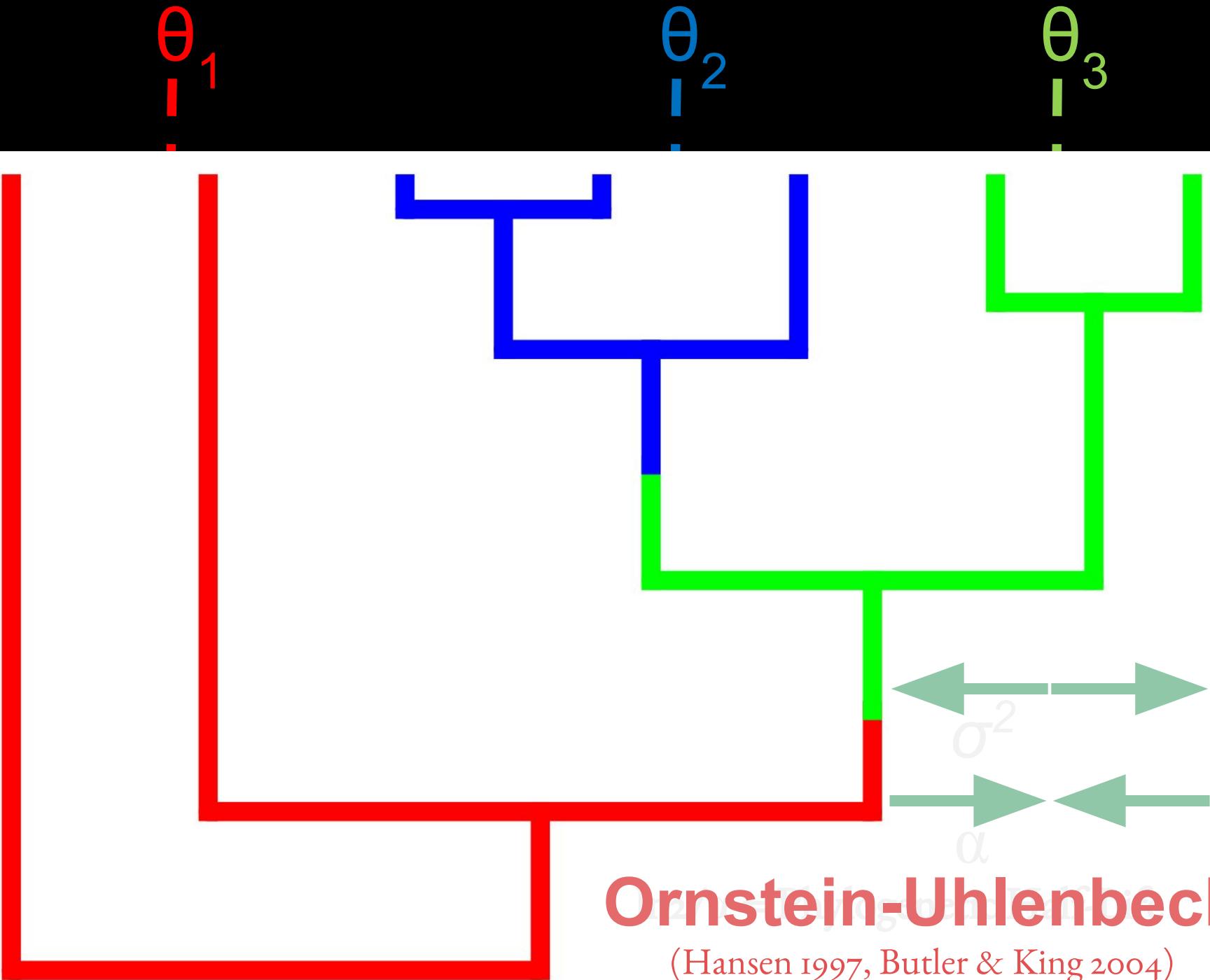
# The phylogenetic comparative method



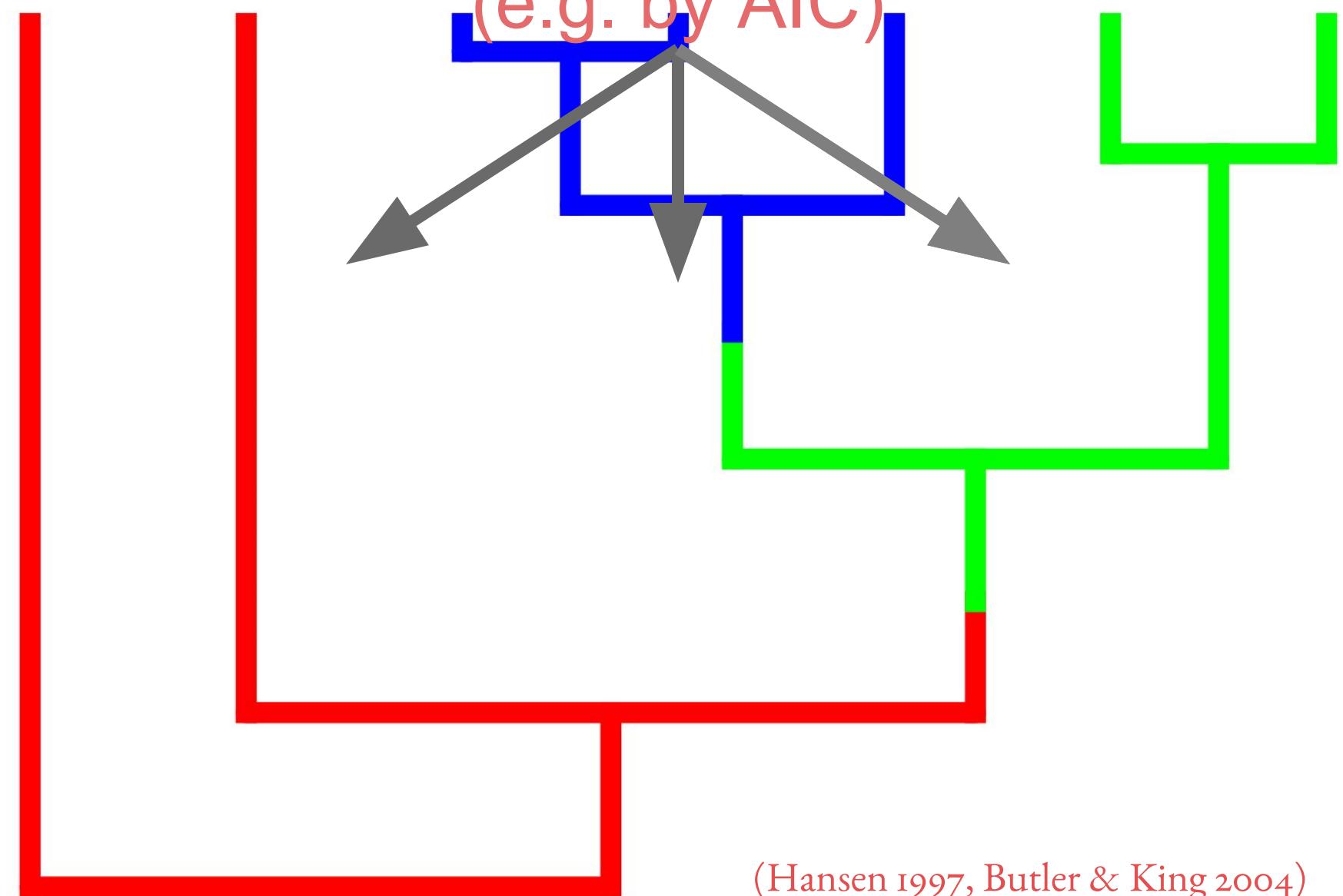




(Hansen 1997, Butler & King 2004)



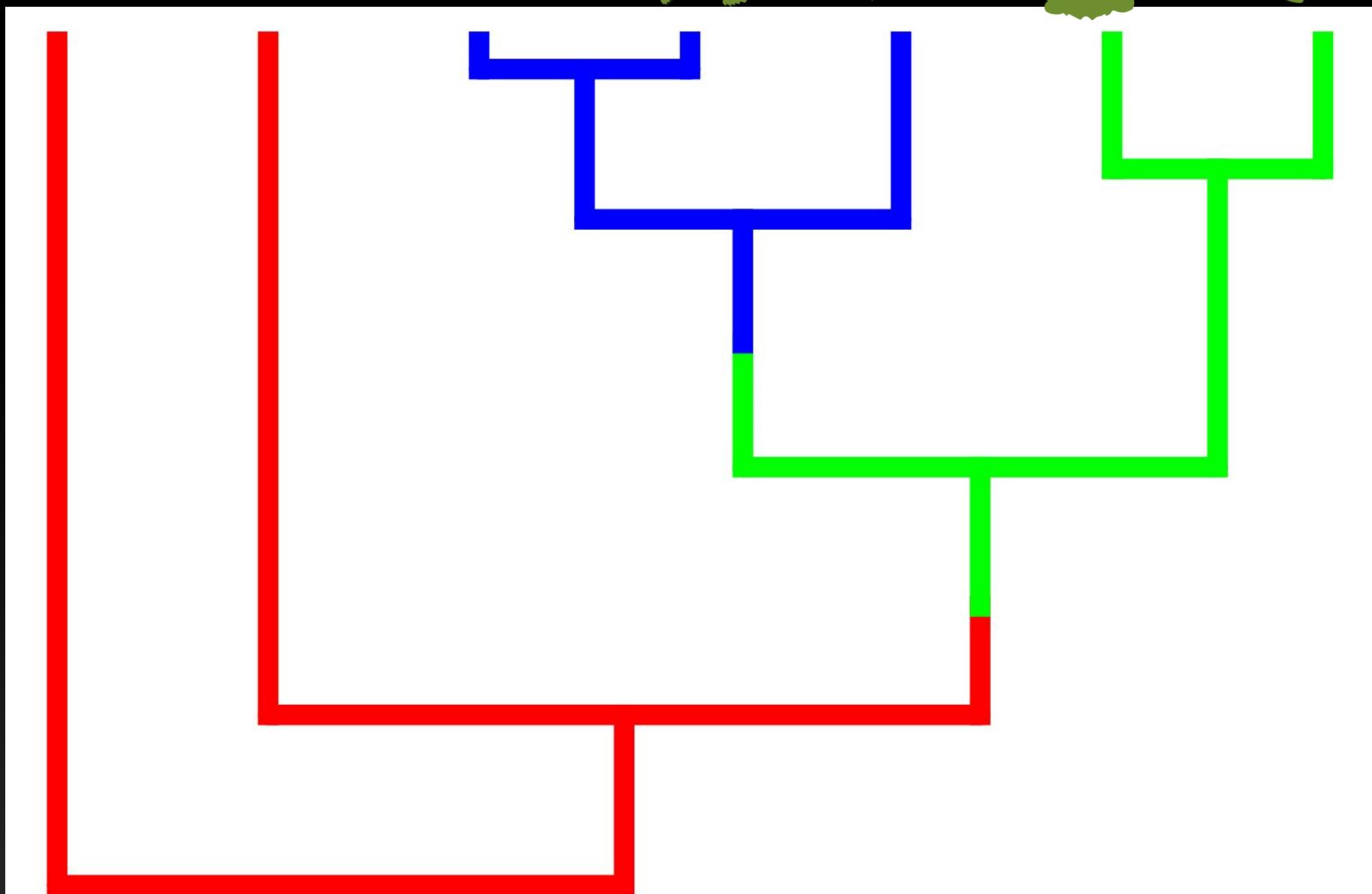
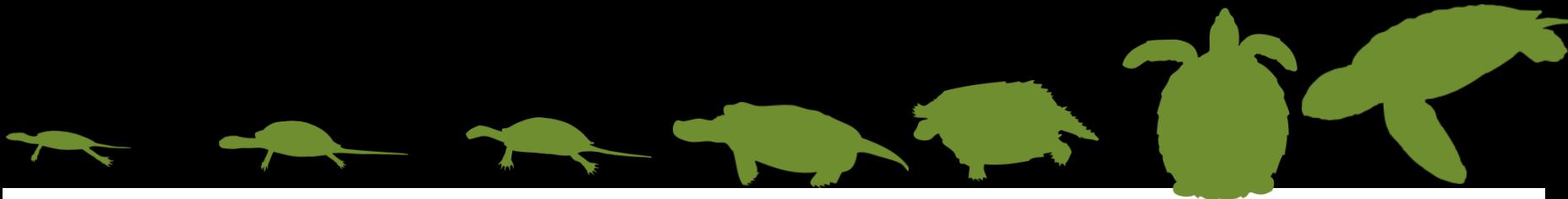
Compare models  
Best Model  
(e.g. by AIC)

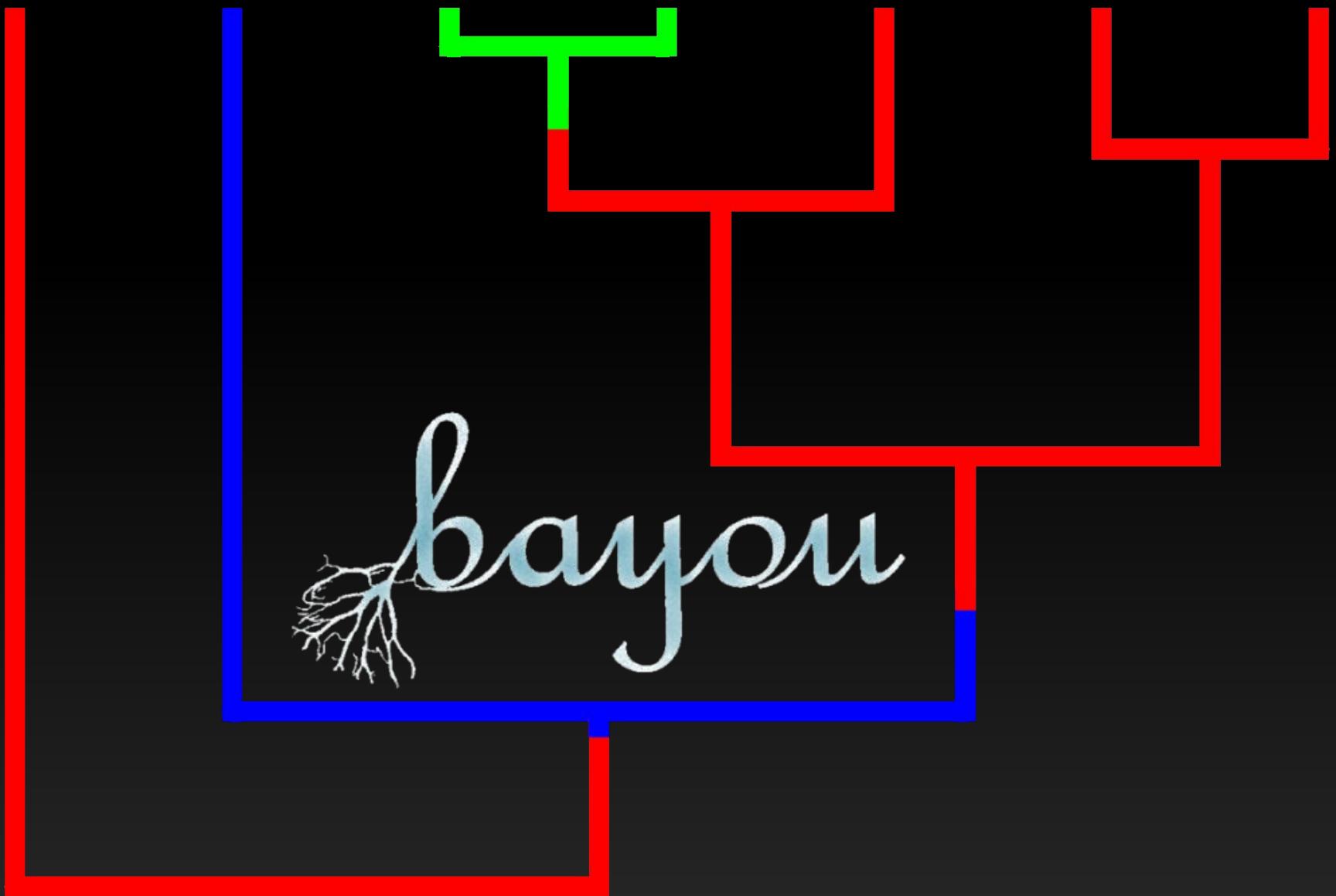
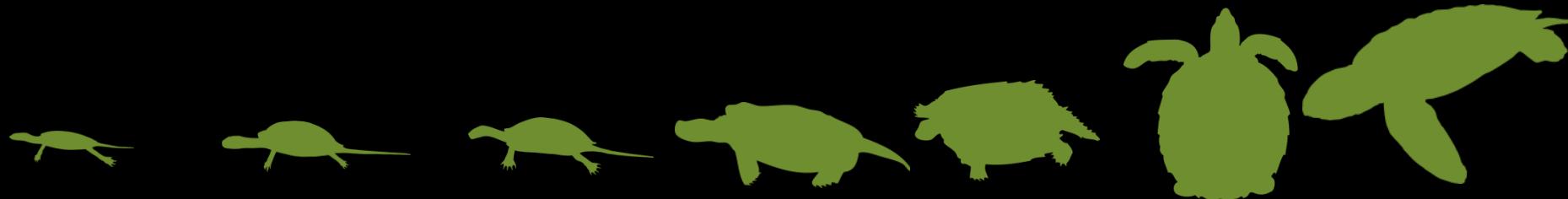


(Hansen 1997, Butler & King 2004)

# Two issues

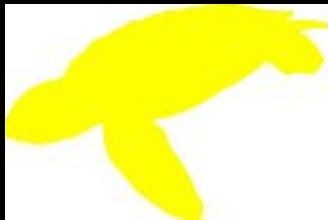
1. Best model may still be bad
2. Model has biological meaning – but  
may be lost when applied to  
comparative data





# Turtles and Tortoises

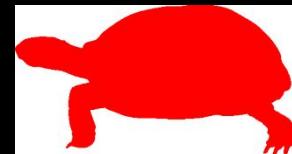
(Jaffe et al. 2011)



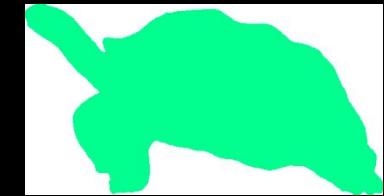
Marine



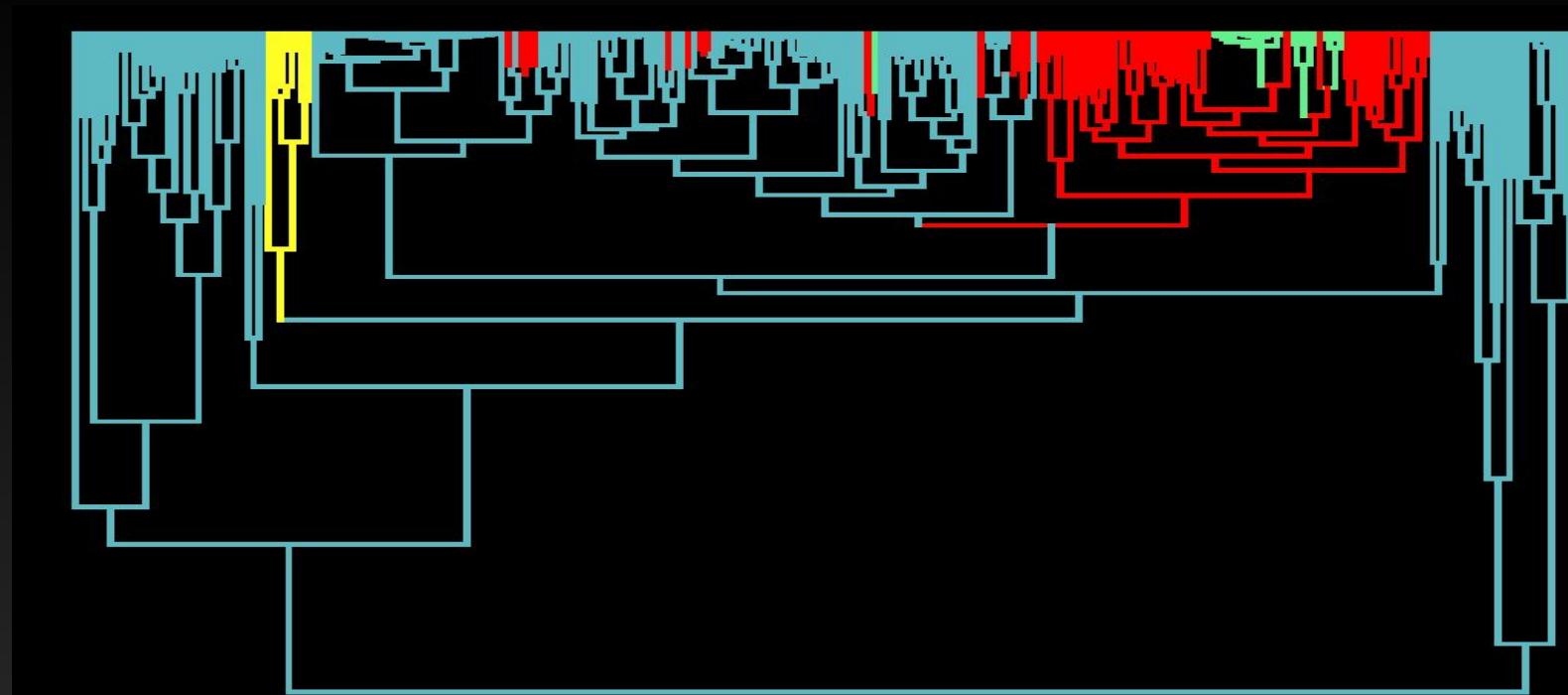
Freshwater



Terrestrial

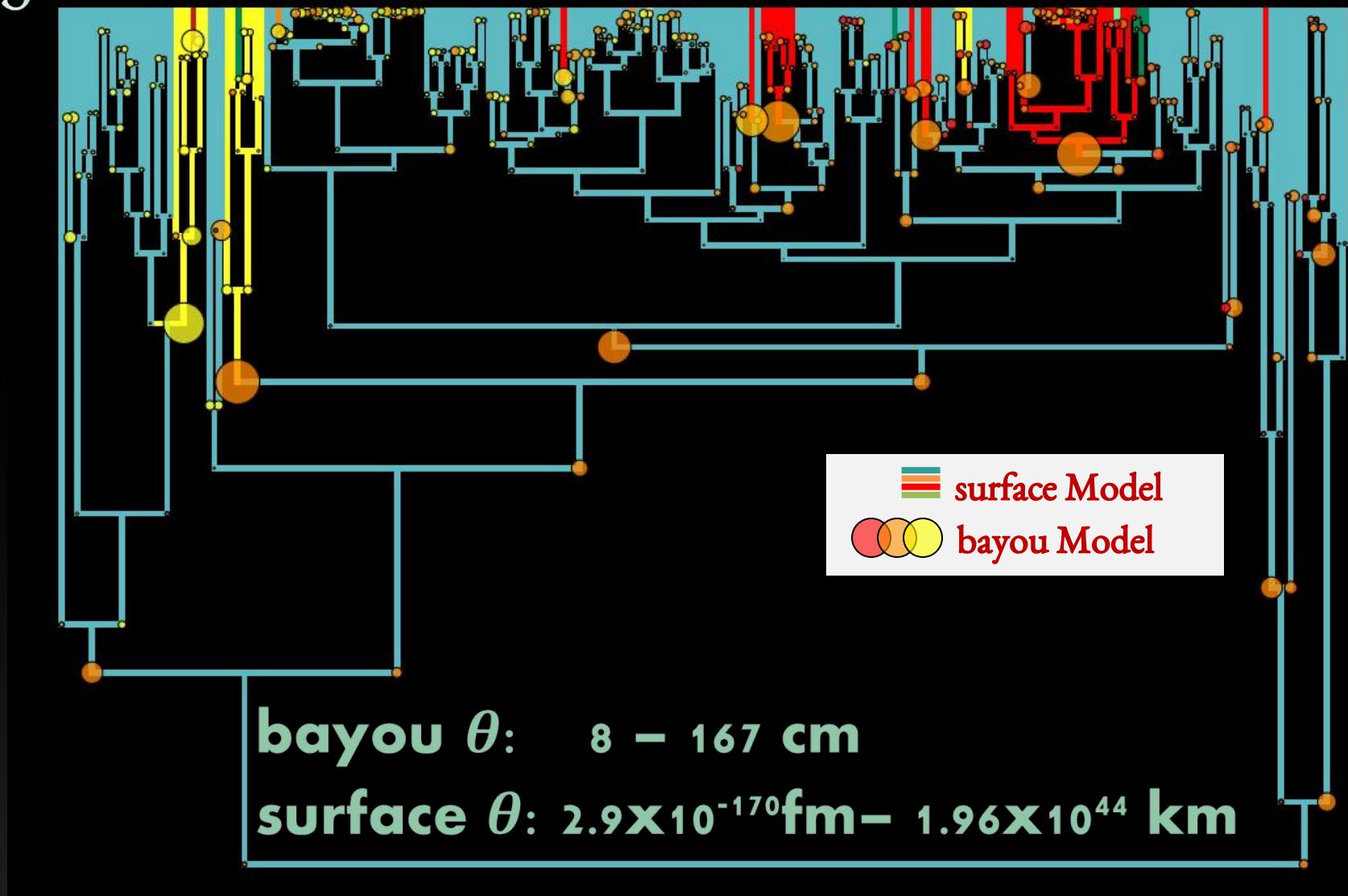


Island



*bayou*

(Uyeda and Harmon, 2014)



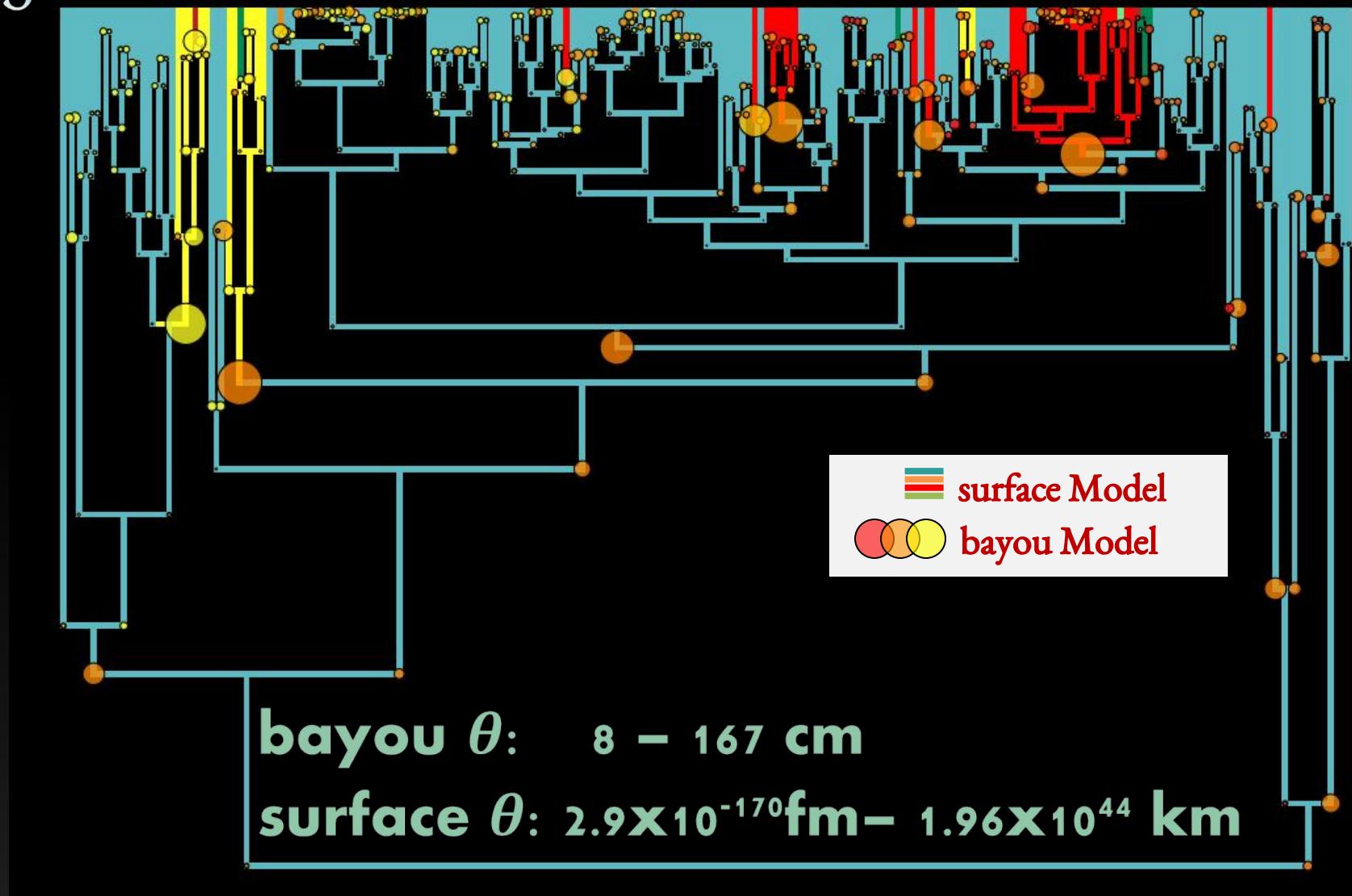
**surface**

(Ingram & Mahler, 2012)





(Uyeda and Harmon, 2014)



bayou phy. half-life = 3.94 million years  
surface phy. half-life = 92 million years

# We can generate better hypotheses

Jaffe et al. (2011)

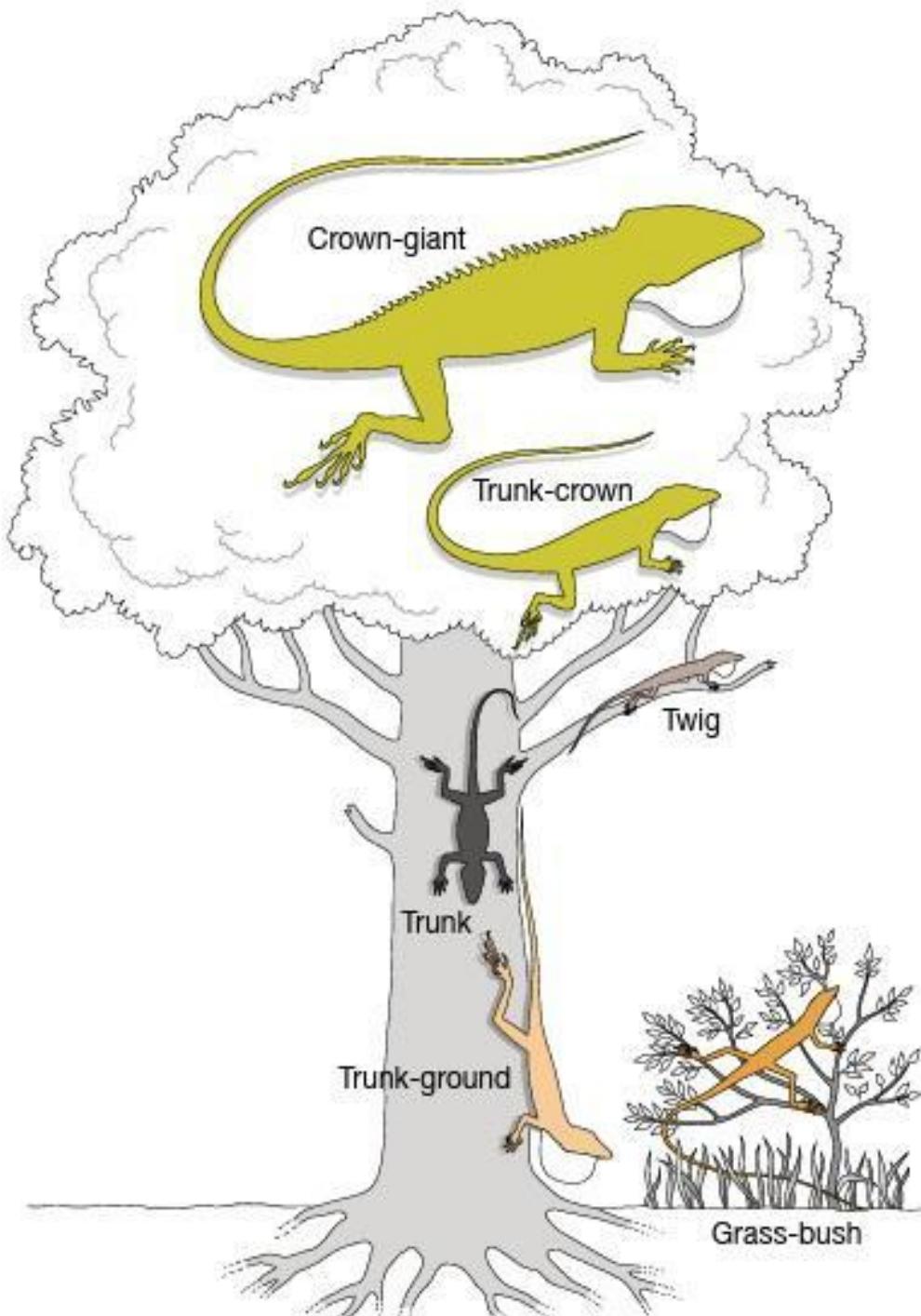
Marine, Freshwater, Terrestrial and Island

Of those, only Marine was found by bayou.

Better hypothesis?

Aquatic life history + high environmental temperature

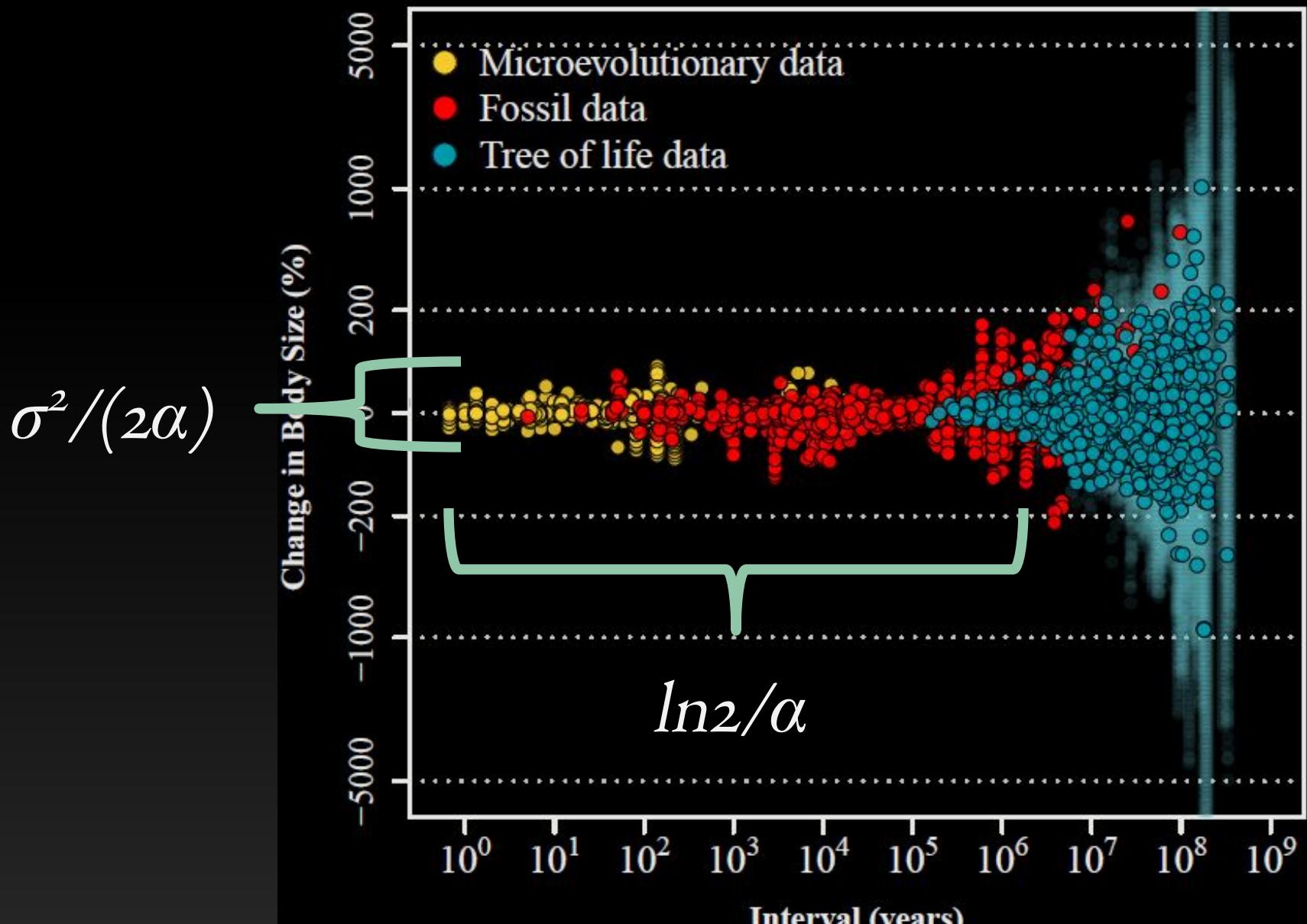




# *Anolis* bayou

- 85 taxa
- Body size (SVL)
- Use 3 different priors:
  - Weakly informative (Free)
  - Blunderbuss model (Stasis shifts)
  - Quantitative genetic model (Peak shifts)

# “Blunderbuss” Parameterization

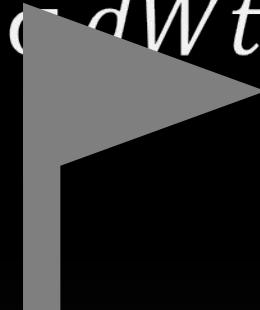
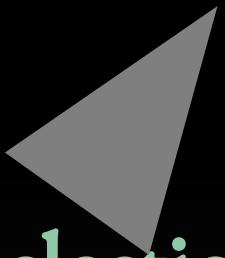


# Quantitative Genetics

## Parameterization

(Lande 1976)

$$dZ_t = -\alpha (Z_{t-1} - \bar{Z}) dt + \sigma dW_t$$

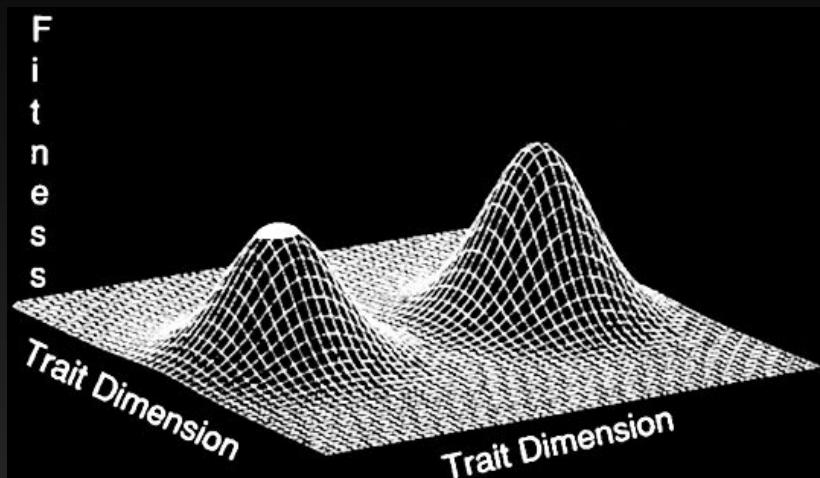


Stabilizing Selection

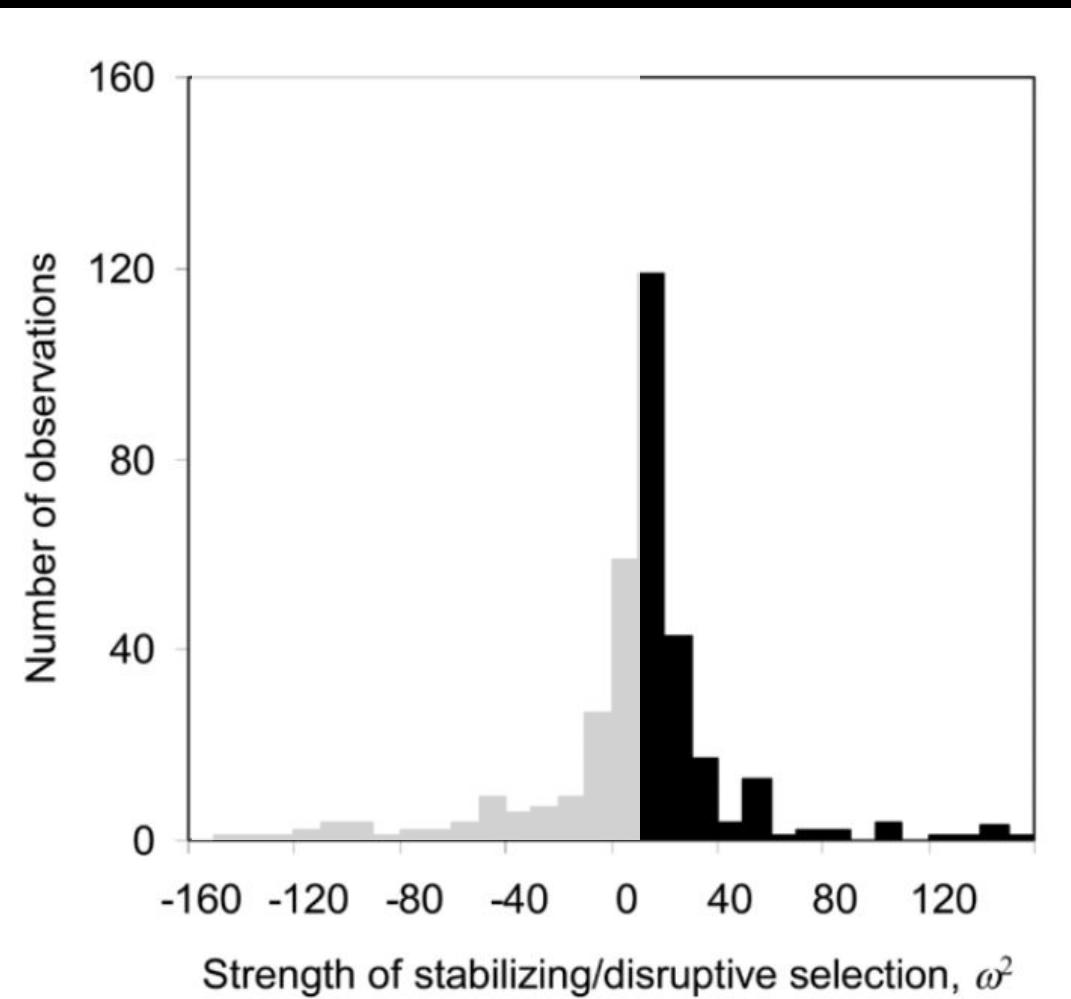
$$\alpha = h^2 V_P / (V_P + \omega^2)$$

Genetic Drift

$$\sigma^2 = h^2 V_P / N_e$$



# QG model priors



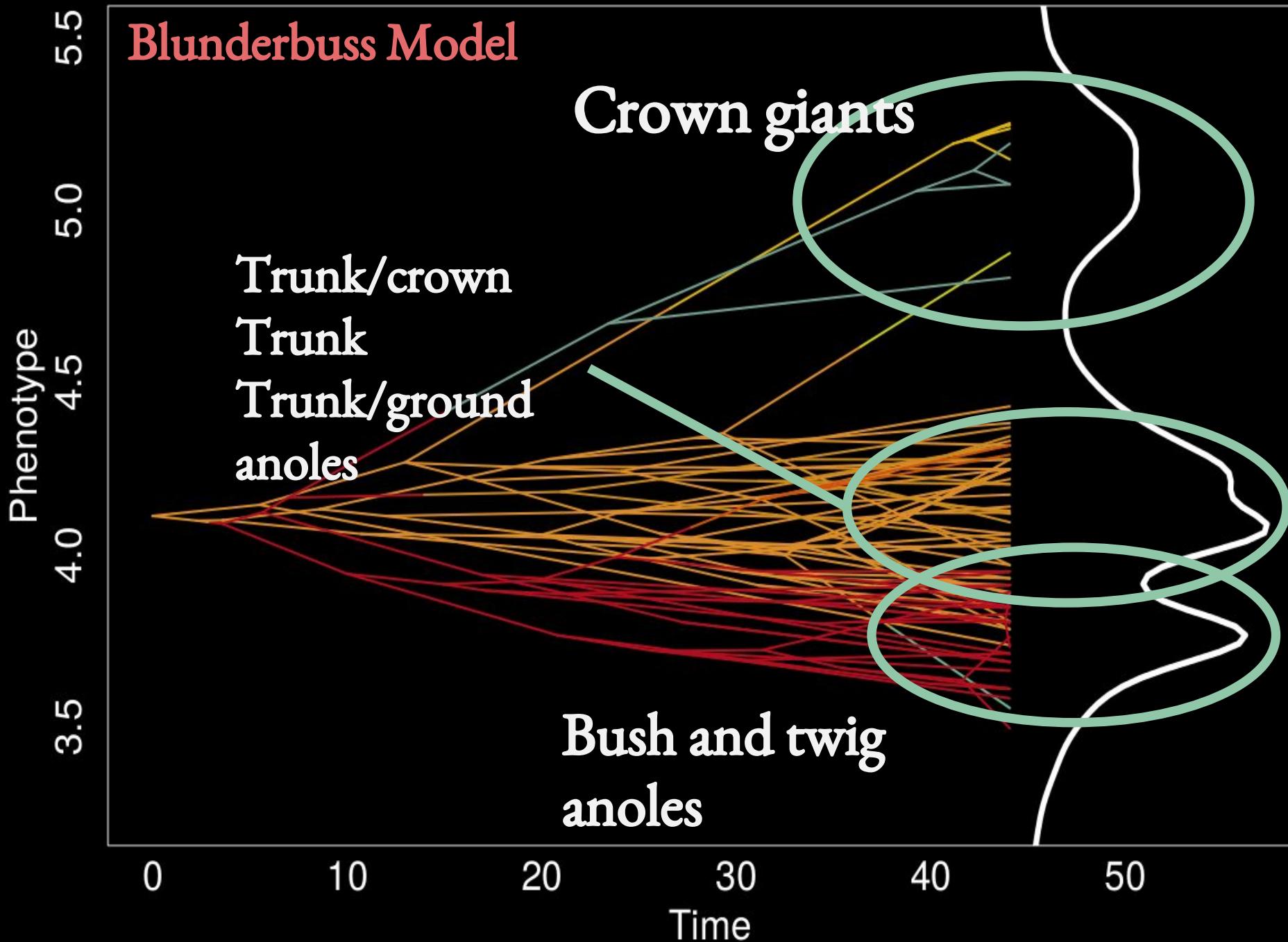
$h^2$ =estimated in anoles to be  
~0.55 for body size

$V_p$ =estimated from the data

$N_e = 99\% \text{ CI between } 1000 \text{ and } 400,000 \text{ (mean } 22,000)$

$\omega^2$ = Stabilizing & directional  
selection gradients estimated  
from wild populations

# Blunderbuss Model



# Both Blunderbuss and Lande models perform much more poorly than free parameterization

Parameterization	Marginal lnL	$2 \ln BF:$ Free vs. _____
Free	-16.4	0
Blunderbuss	-24.9	17.0
Lande (QG)	-37.7	21.3

Can also combine these interpretations with ecotype-based hypotheses.....

# Convergent, Ecotype-based regimes fit tree best, but should not be interpreted as either Blunderbuss or Lande model

Regimes	Parameterization	Convergence	Marginal lnL
Fixed- Ecotype	Free	Yes	9.83
Fixed- Ecotype	Blunderbuss	Yes	2.73
Fixed- Ecotype	Free	No	-3.62
Fixed- Ecotype	Lande (QG)	Yes	-6.70
Fixed- Ecotype	Blunderbuss	No	-14.16
Free	Free	No	-16.41
Fixed- Ecotype	Lande (QG)	No	-18.66
Free	Blunderbuss	No	-24.93
Free	Lande (QG)	No	-37.73

Phenotype

QG Adaptive peak  
shifts

“All of the above”

Time

Adaptive zone (e.g. *Anolis* ecotypes)

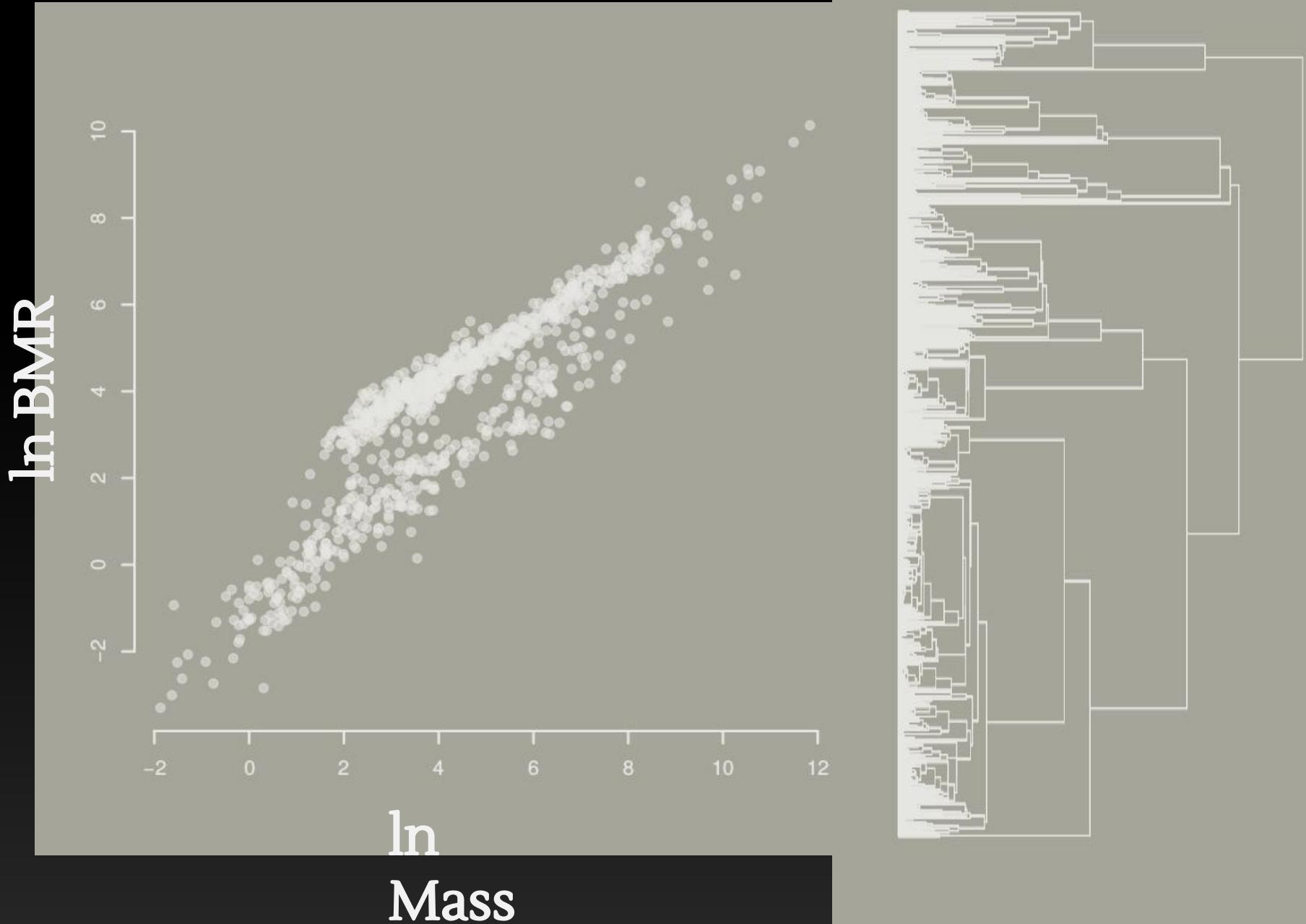
# Conclusions

All datasets point toward a common pattern with  
million-year thresholds  
(but why remains...)

We can understand the causes of adaptive shifts by  
using biologically realistic Bayesian models –  
Analyze data jointly across scales

Just the beginning....

# Basal Metabolic Rates



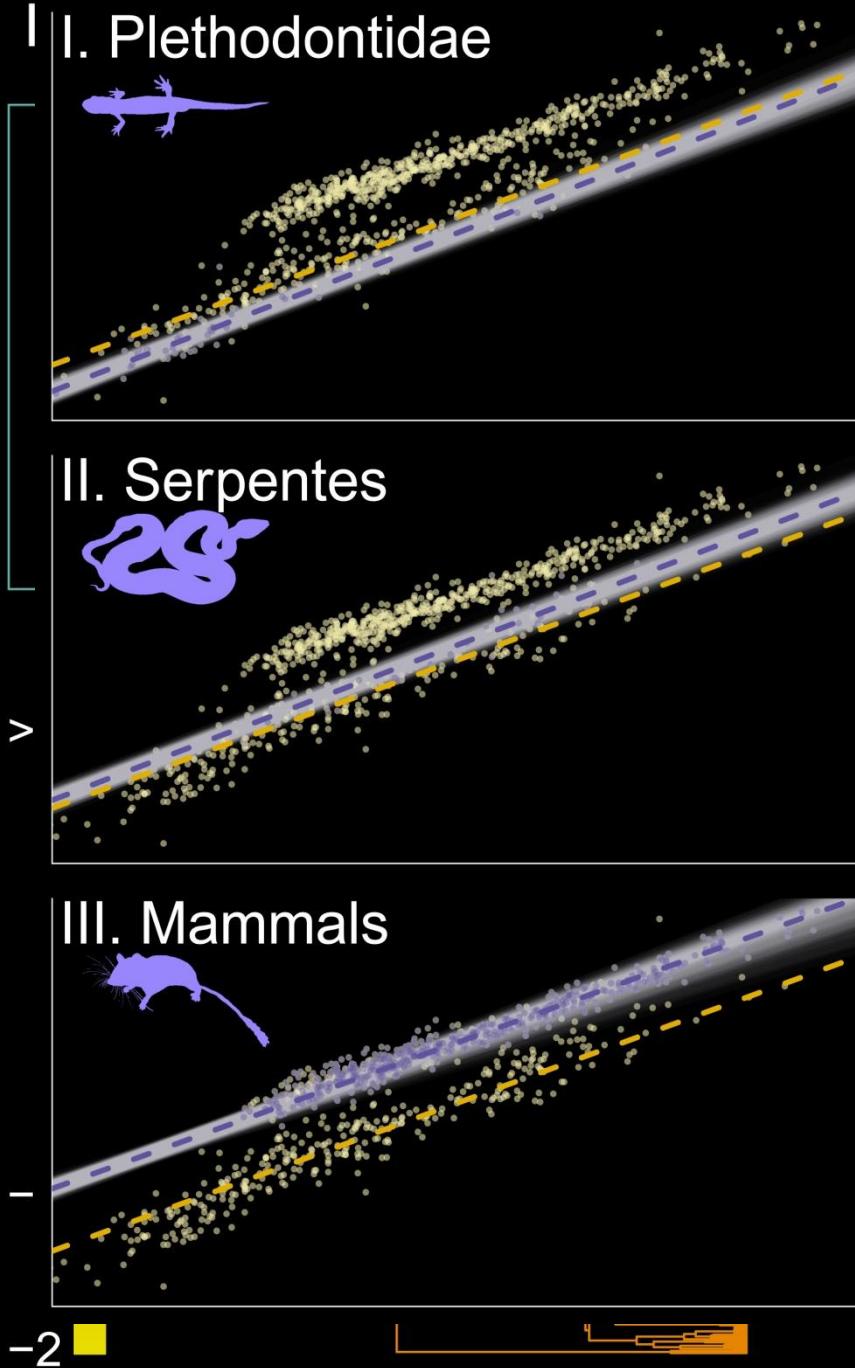
# I. Plethodontidae



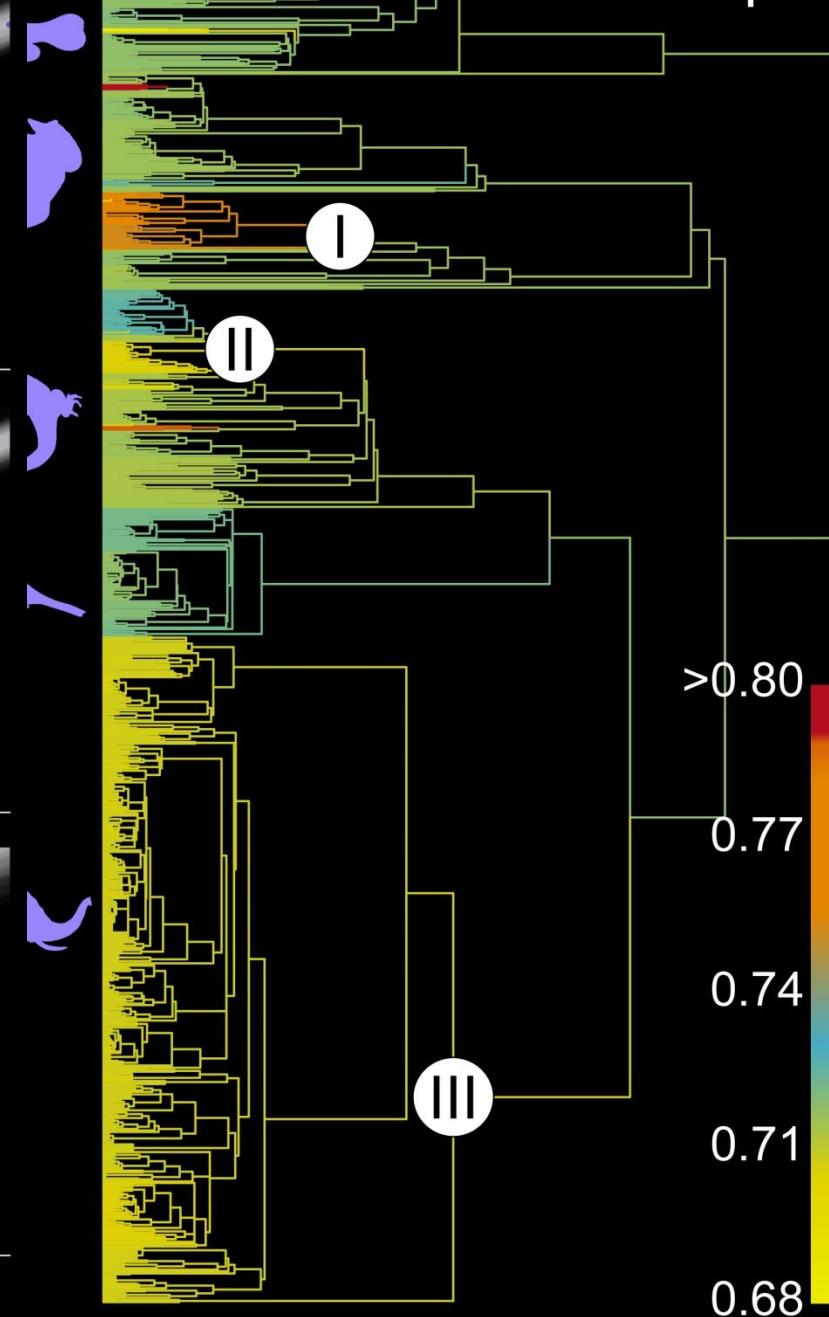
# II. Serpentes

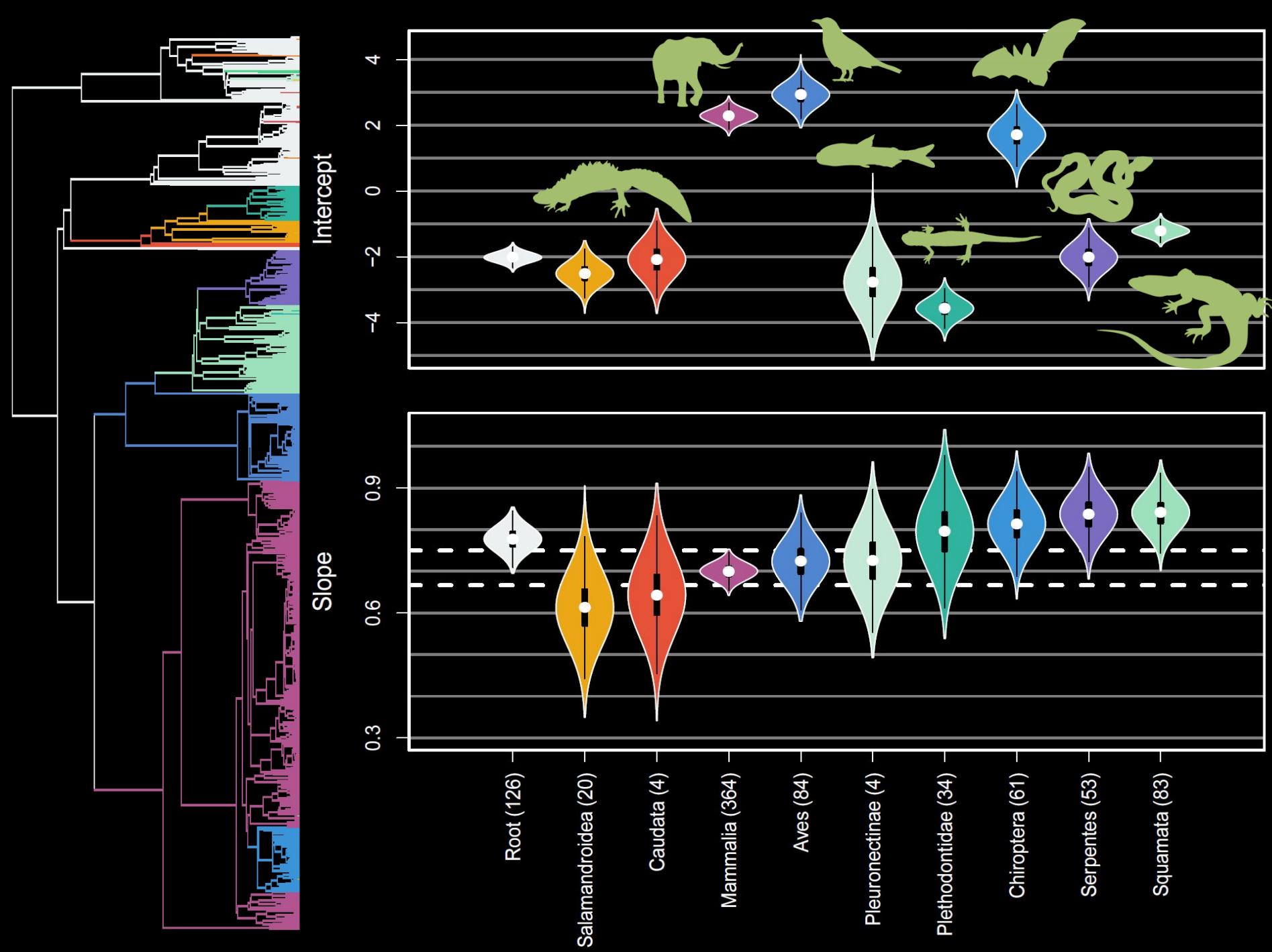


# III. Mammals



Slope





# bayou v2.0-alpha

- Reversible-jump & Fixed models
- Flexible prior specification
- Alternative OU parameterizations
- Flexible model implementation (including regression models)
- Impute missing predictors using BM
- Model comparisons using Bayes Factors

# Warnings

- bayou tends to be conservative
- Convergence can be difficult
- Identifiability of shift configurations
- Identifiability of shift numbers
- Bayes Factors are influenced by priors
- Cannot yet do RJ + convergent regimes

# Tomorrow: *bayou* computer exercise

**Have a working development environment:**

Mac: Install Xcode

Windows: Install Rtools

**Install R packages:**

devtools, dplyr

**You are encouraged to run through the posted code ahead of time, and use tomorrow's time to develop and analyze your own question**

# Acknowledgements

## Coauthors and collaborators

Thomas Hansen

Luke Harmon

Stevan Arnold

Jason Pienaar

Craig McClain

Matt Pennell

Paul Hohenlohe

Jon Eastman

Rafael Maia

Eliot Miller

Curtis Lisle

Jeff Baumes

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Daniel Caetano

David Tank

Laura Gayton



Questions?