

# Sampling standardisation

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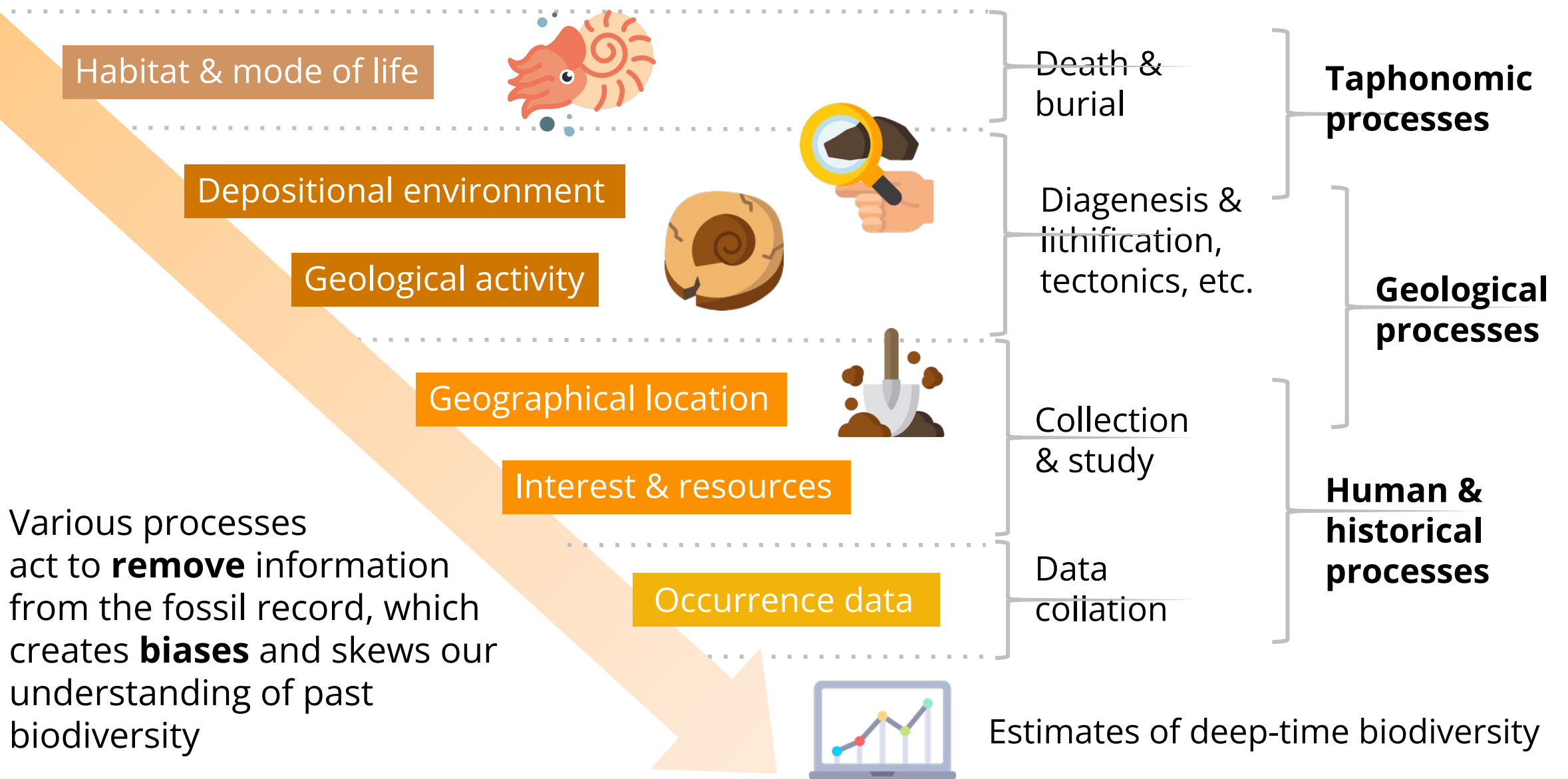
Tuesday 29/08/2022



Friedrich-Alexander-Universität  
Erlangen-Nürnberg



# FROM DEATH TO DATABASE

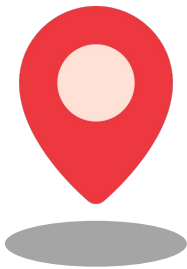


# Refresher: Scales of biodiversity

 $\alpha$ 

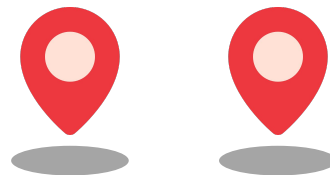
Alpha diversity

“local richness”

 $\beta$ 

Beta diversity

between two  
areas/regions

 $\gamma$ 

Gamma diversity

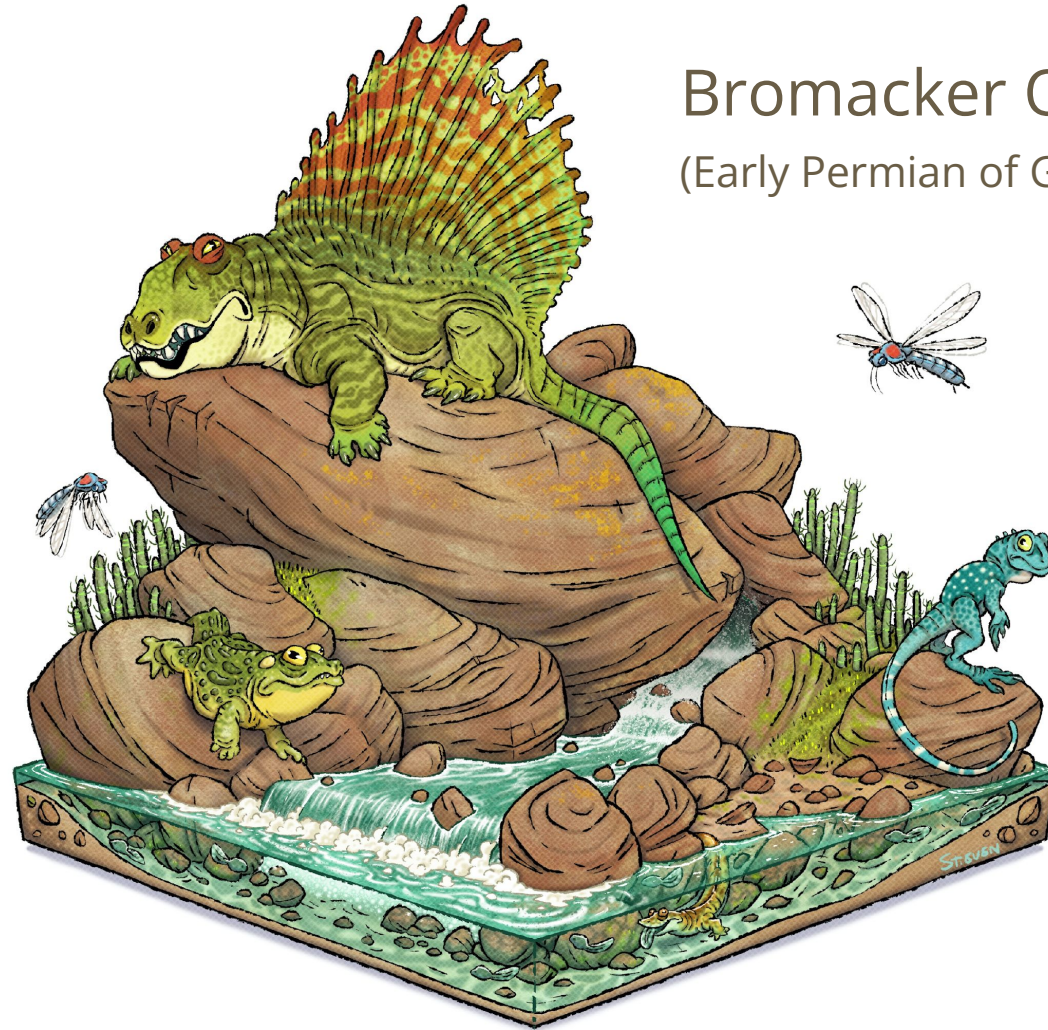
“global” diversity



$\alpha$

Alpha diversity

How many species in  
the cartoon?



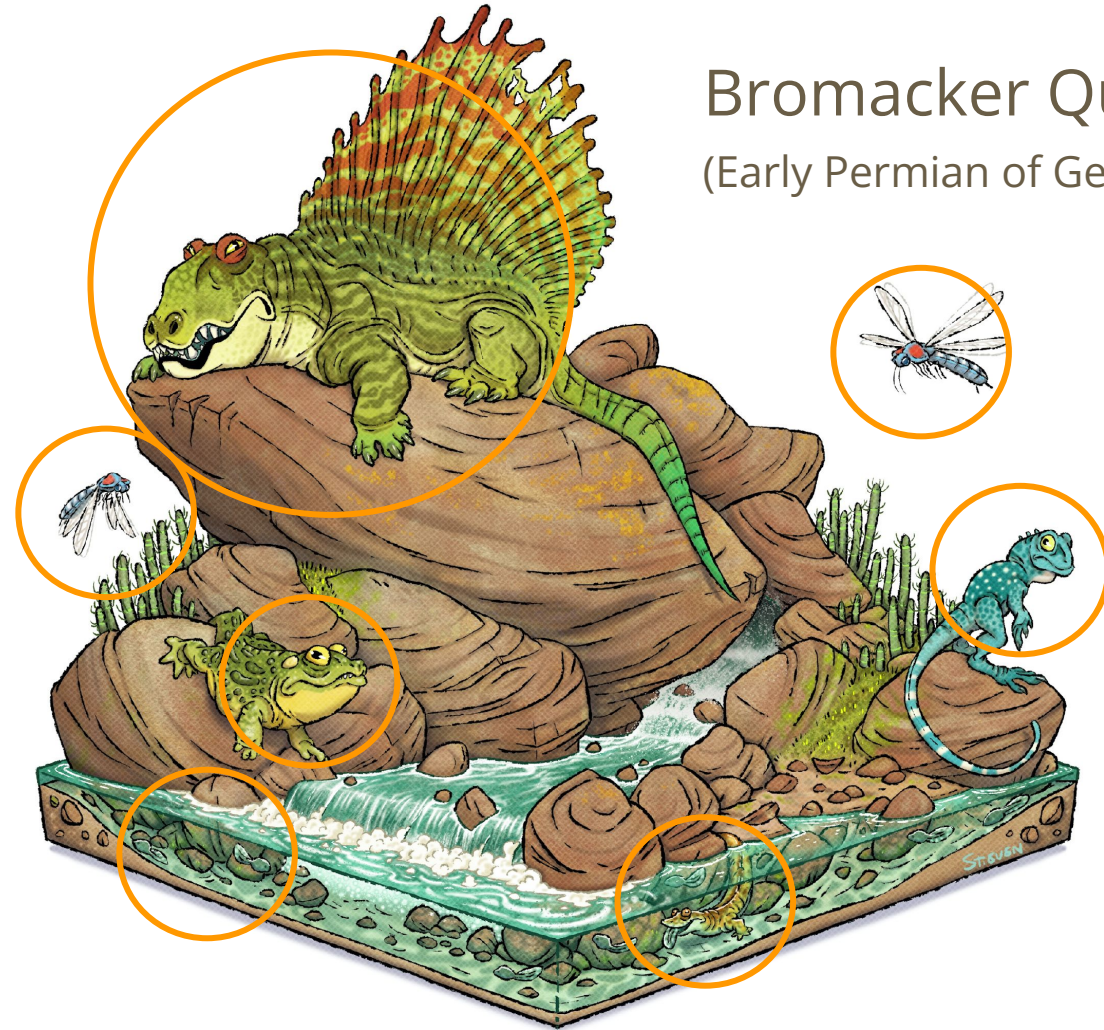
Bromacker Quarry  
(Early Permian of Germany)

$\alpha$

Alpha diversity

1 insect species  
1 fish? species  
4 tetrapod species

**Local richness** = 6 species



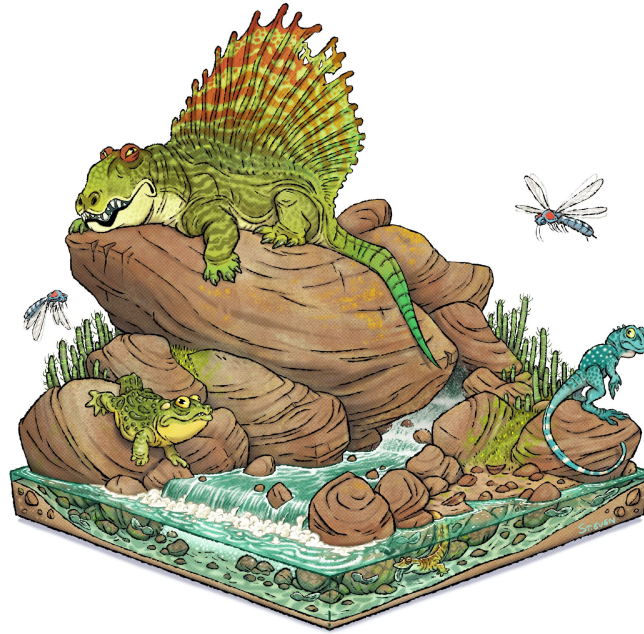
Bromacker Quarry  
(Early Permian of Germany)



$\beta$

Beta diversity

Comparison between  
this sample and  
another sample e.g.  
two different regions



Bromacker Quarry  
(Early Permian of **Germany**)

Arroyo Formation  
(Early Permian of **USA**)



# $\gamma$

Gamma diversity

## “Global” diversity

e.g. species diversity  
during the early Permian  
across the globe

(NB: never truly global...)

Permian fauna

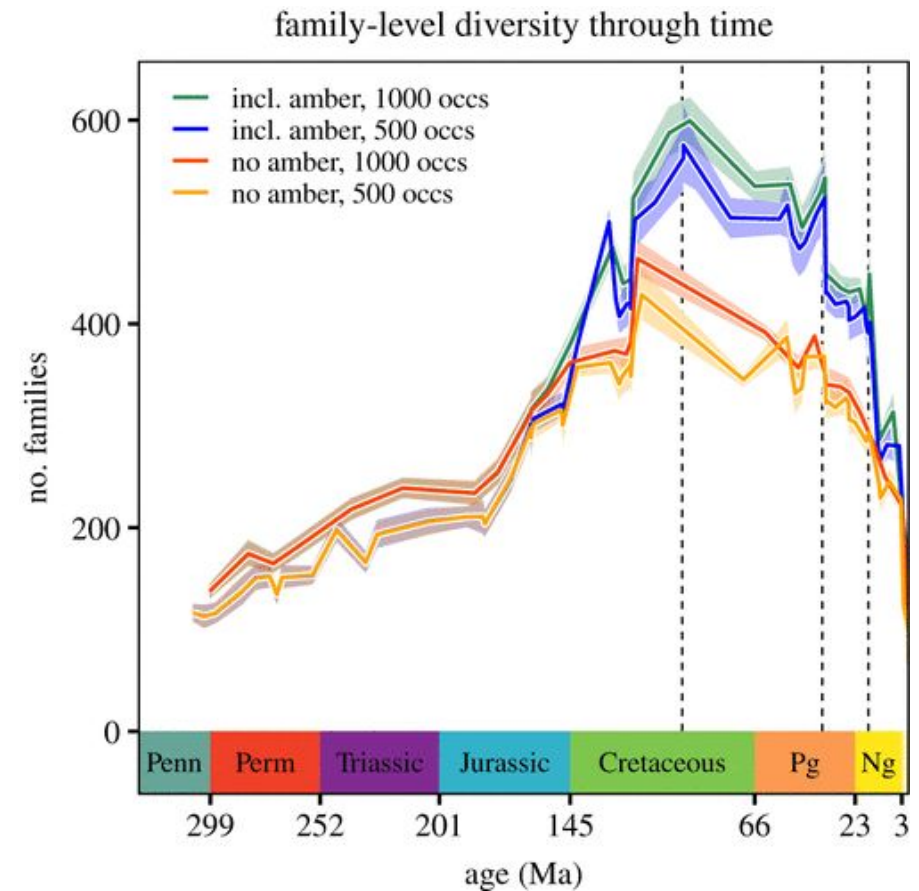


# Methods covered in other sections



# Capture-mark-recapture

- **Lee Hsiang Liow** later this week
- Estimating rates of origination and extinction and diversity-through-time
- Typically requires high resolution temporal data with abundant groups (e.g. marine invertebrates)



Schachat *et al.* (2019) *Proc Royl. Soc. B*

# Fossilized birth–death process

- We won't be covering this during this course
- If interested, speak to **Rachel Warnock & Laura Mulvey** next week
- Also check out the Phyloseminar recordings:
  - [Dr April Wright](#)
  - [Prof Rachel Warnock](#)
  - [Dr Joëlle Barido-Sottani](#)

*Paleobiology*, 46(2), 2020, pp. 137–157  
DOI: 10.1017/pab.2020.12

**PALEOBIOLOGY**  
A PUBLICATION OF THE  
 **Paleontological  
SOCIETY**

*Article*

**Assessing the impact of incomplete species sampling on estimates of speciation and extinction rates**

Rachel C. M. Warnock , Tracy A. Heath, and Tanja Stadler

Warnock *et al.* (2020) *Paleobiology*

# Taxic diversity-through-time

# Rarefaction

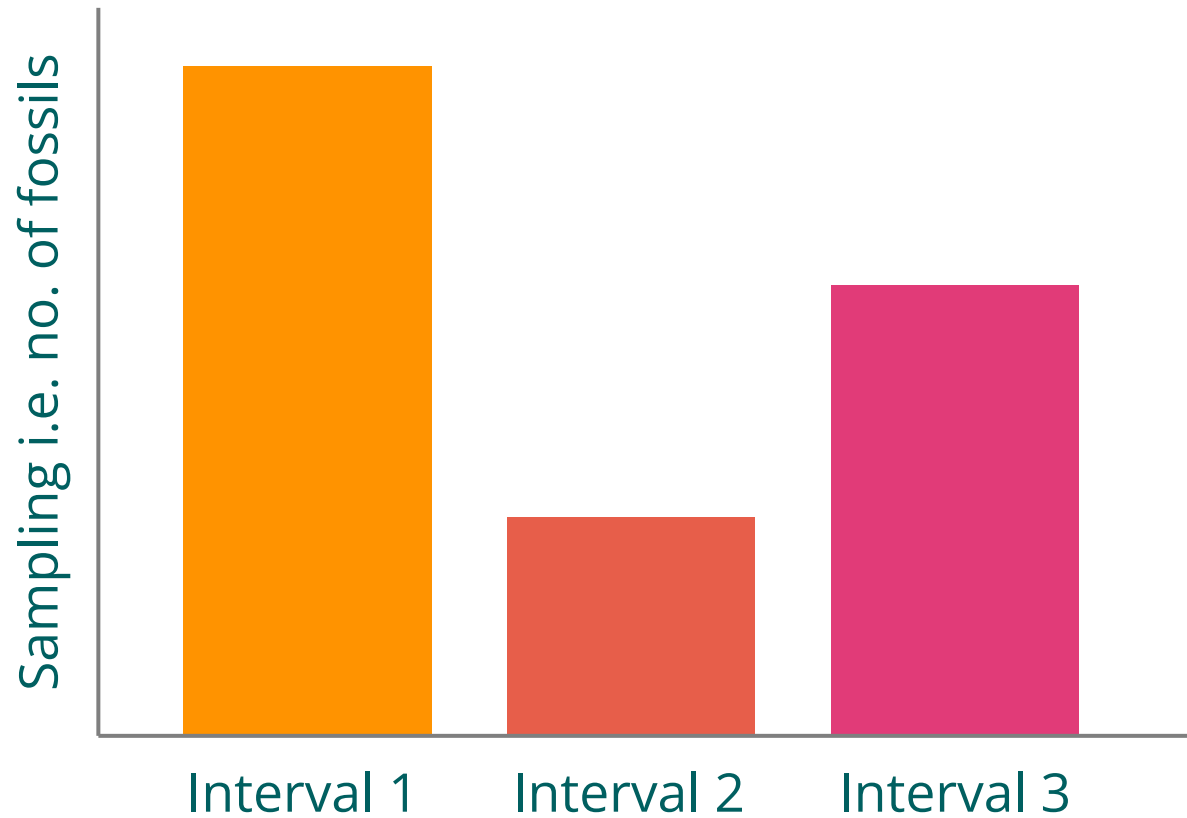
Covered by Wolfgang last week

- Fixes to a sample size
- Can result in information being lost
- Rare taxa can be underrepresented in estimates when evenness is low

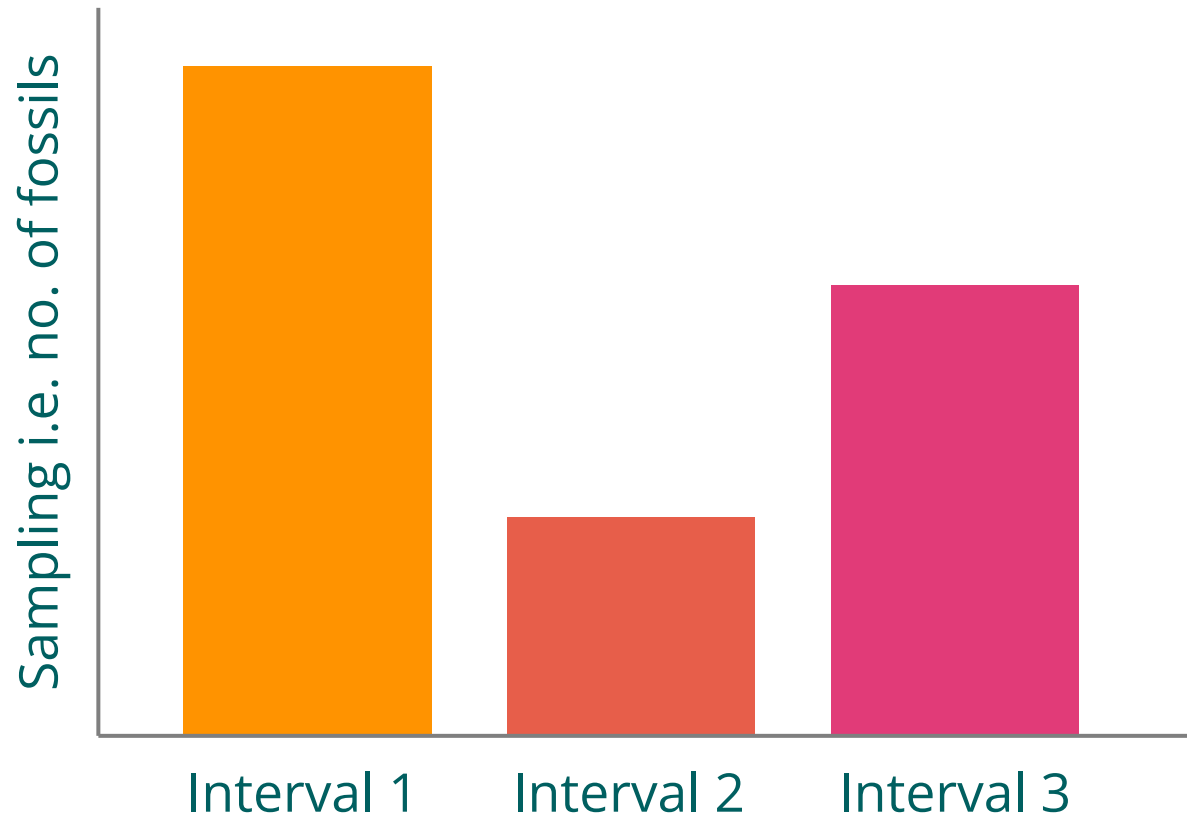




# Hypothetical sampling scenario



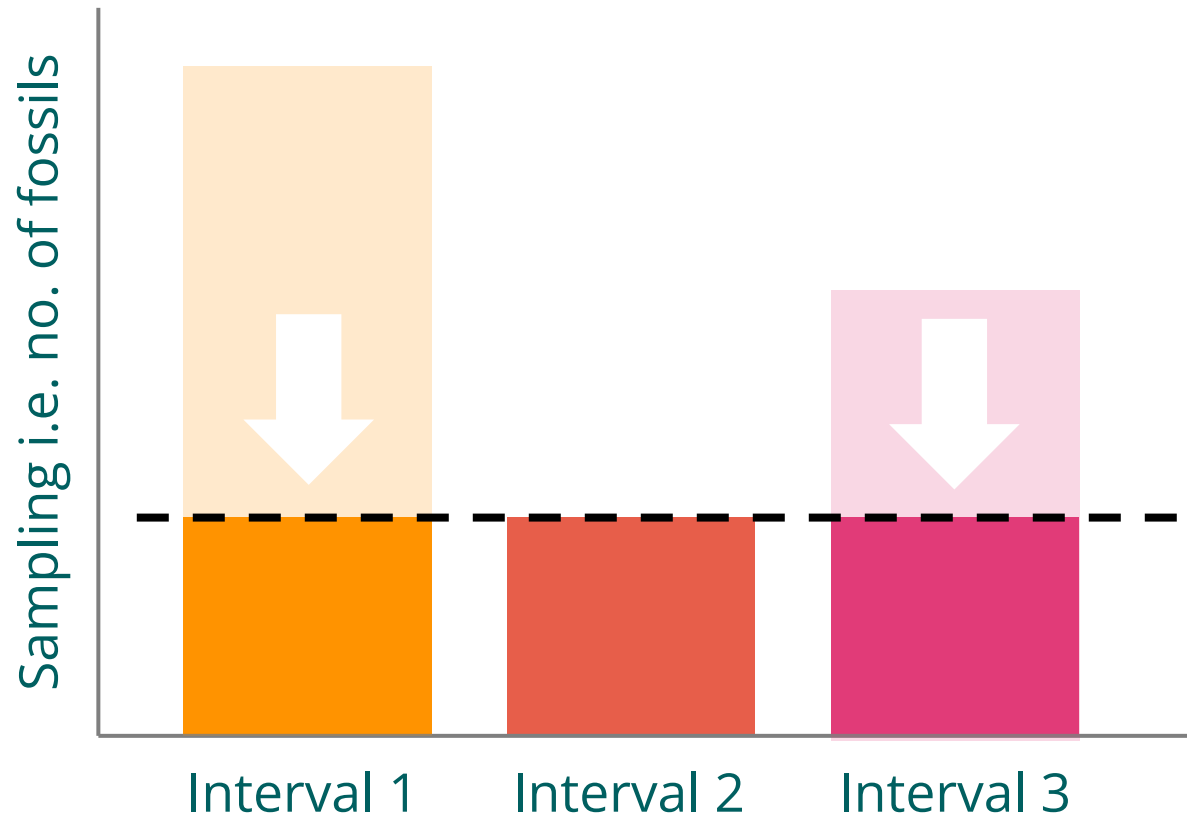
# Hypothetical sampling scenario



## Classical rarefaction

- draws samples DOWN to the level of the least-well-sampled bin

# Hypothetical sampling scenario



## Classical rarefaction

- draws samples DOWN to the level of the least-well-sampled bin

# Coverage-based methods

- Subsample to a fixed coverage
- Better at dealing with rare taxa than rarefaction





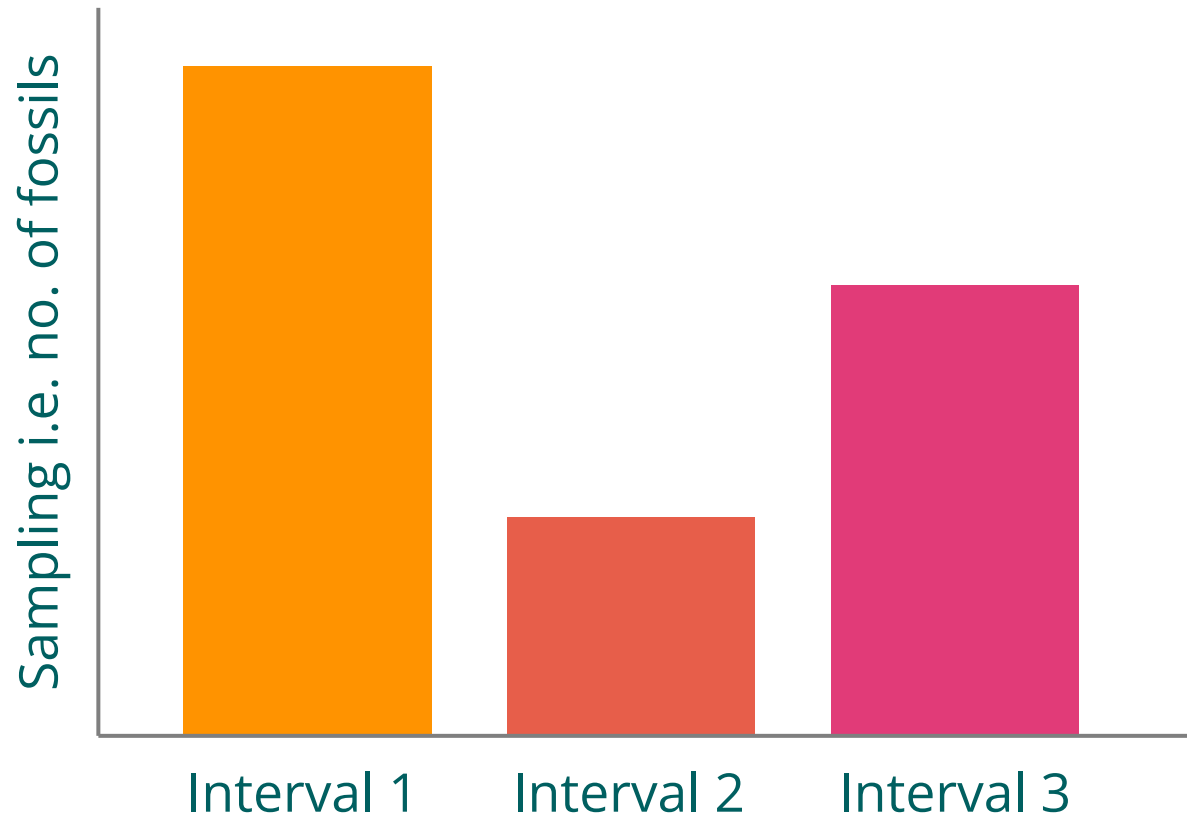
# Coverage-based methods

## Shareholder Quorum Subsampling (SQS)

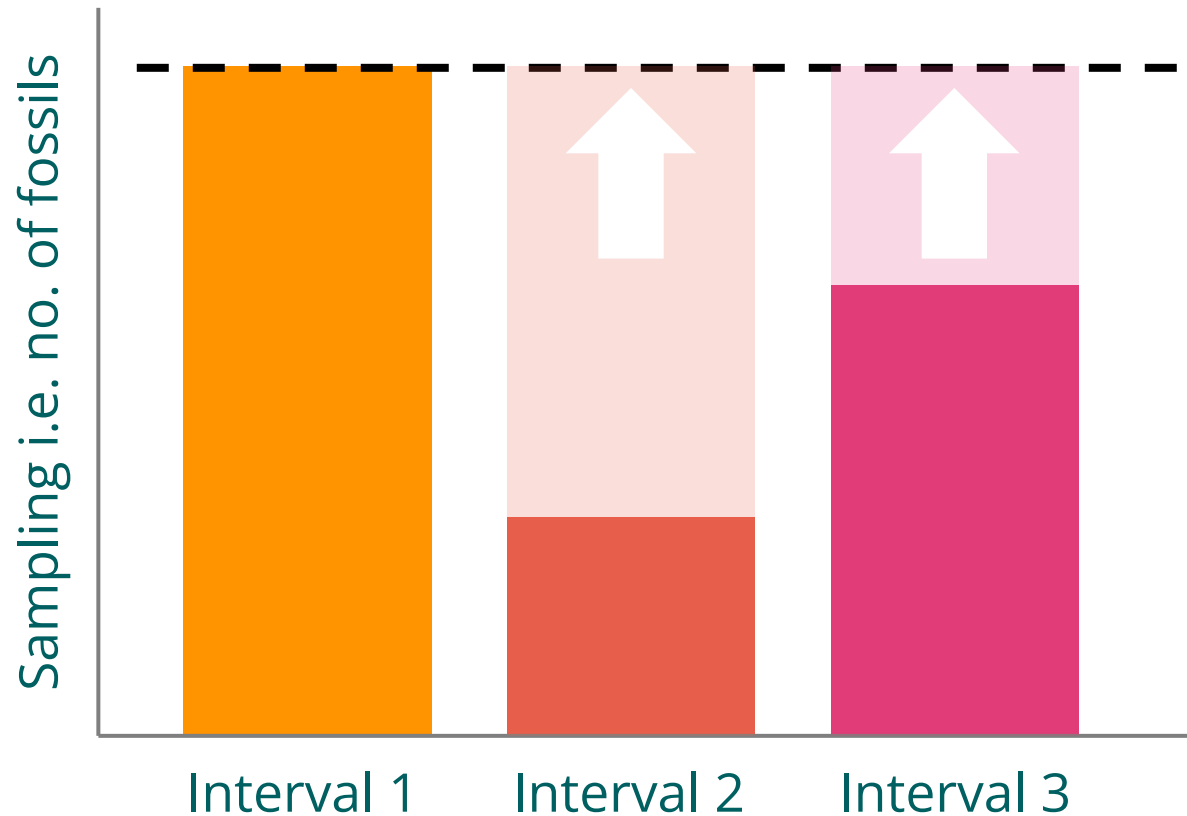
- Developed by John Alroy in 2010
- Interpolation method (i.e. estimates from known data)
- Known among ecologists as **coverage-based rarefaction** (iNEXT R package - **interpolation** and **extrapolation**)



# Hypothetical sampling scenario



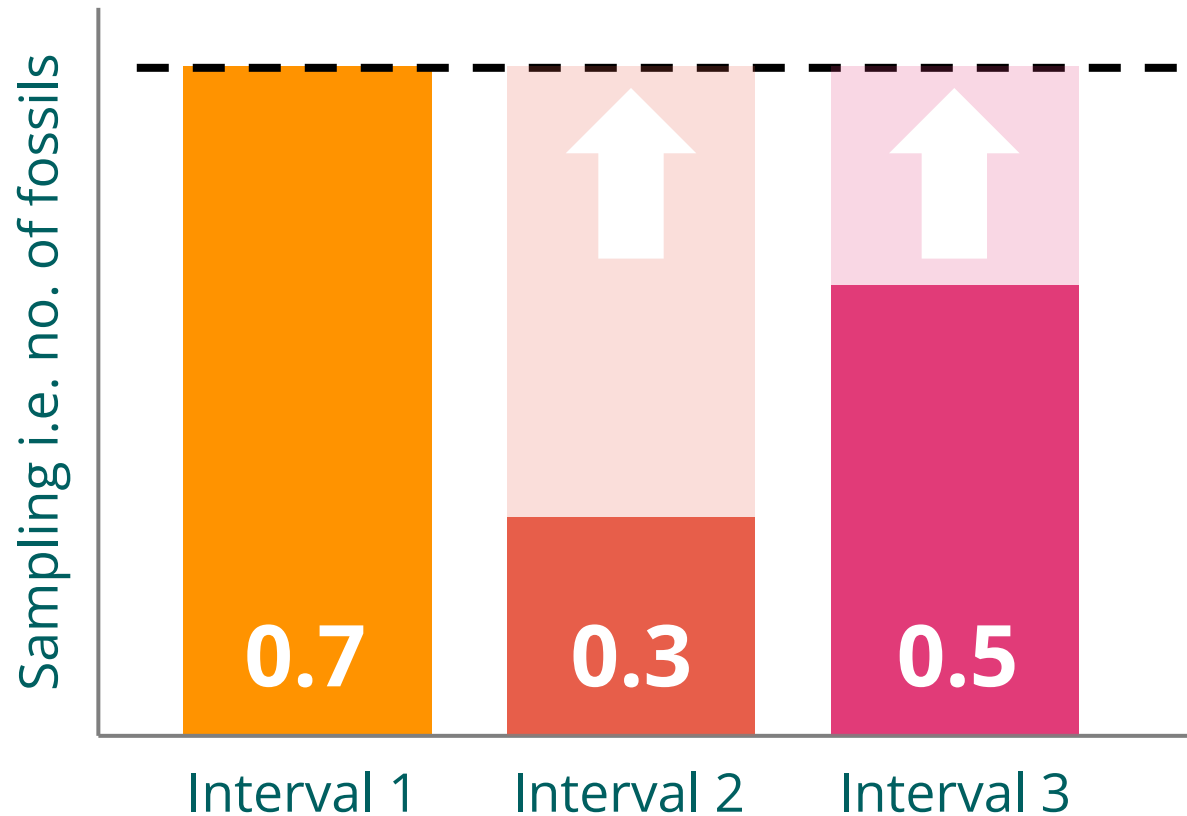
# Hypothetical sampling scenario



## Coverage-based methods

- draw samples UP based on an inference from the known data

# Hypothetical sampling scenario



## SQS

- Based on sample 'coverage' as measured by Good's  $u$
- This is based on species frequencies to give an estimate of how 'complete' the bin is



# Example: Early tetrapod diversity

- Was early tetrapod (terrestrial vertebrate) diversity impacted by the Carboniferous 'rainforest collapse' (CRC)?
- How does sampling impact our understanding of this?

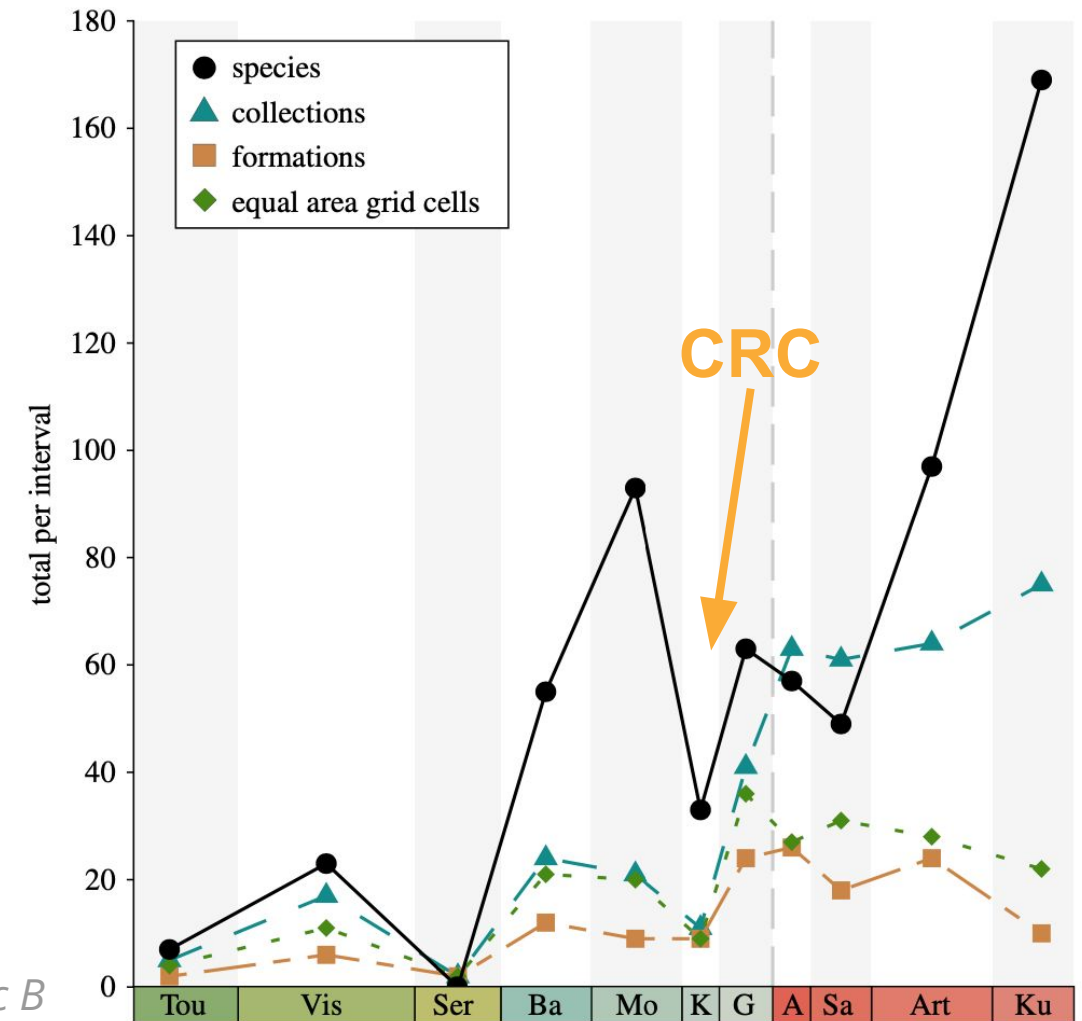


Dunne *et al.* (2018) *Proc Royl Soc B*

# Example: Early tetrapod diversity

## Raw (face-value) richness

- Raw (face-value) species richness tracks proxies for sampling
- More sampling = greater species richness

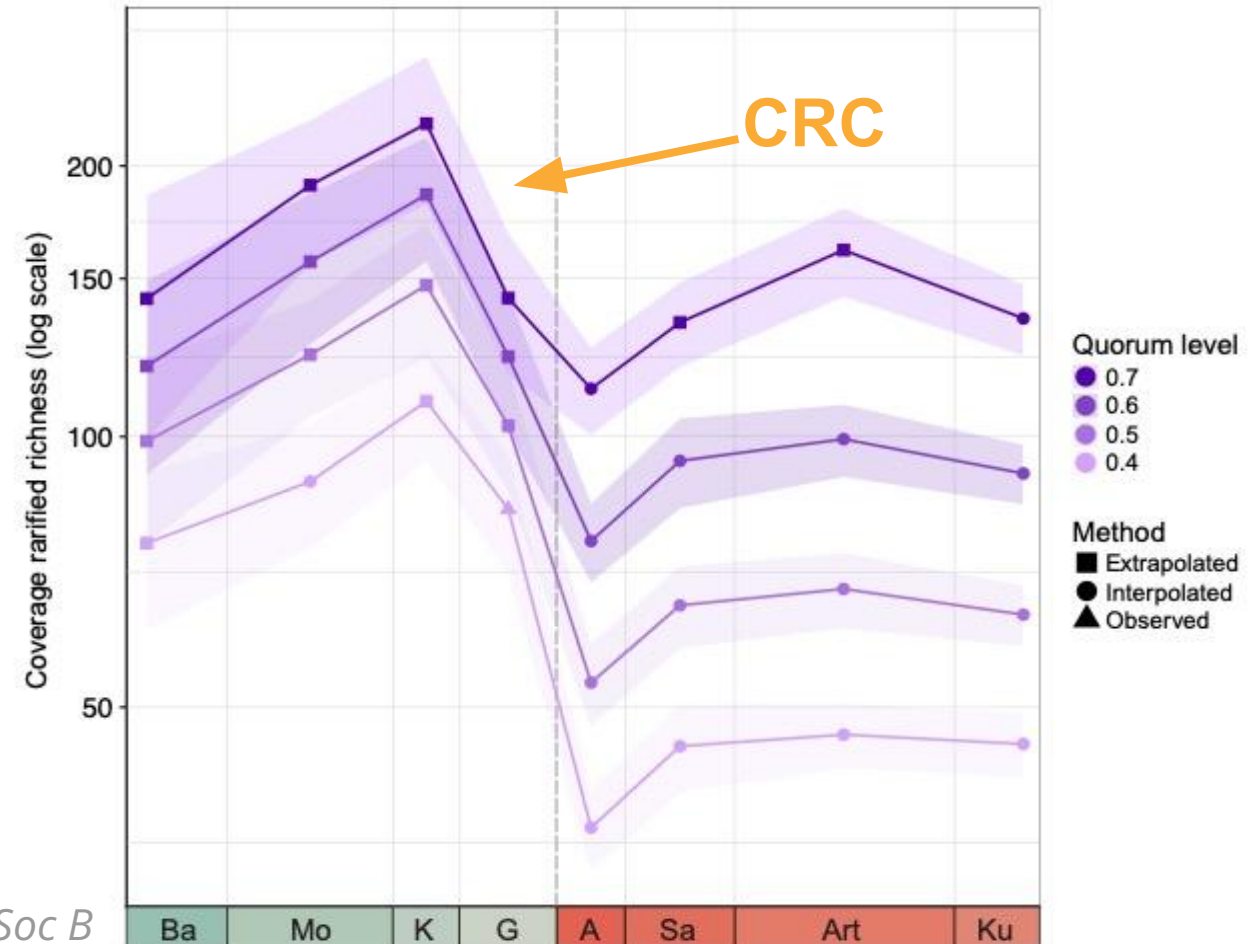


Dunne *et al.* (2018) *Proc Royl Soc B*

# Example: Early tetrapod diversity

## Coverage-rarified richness

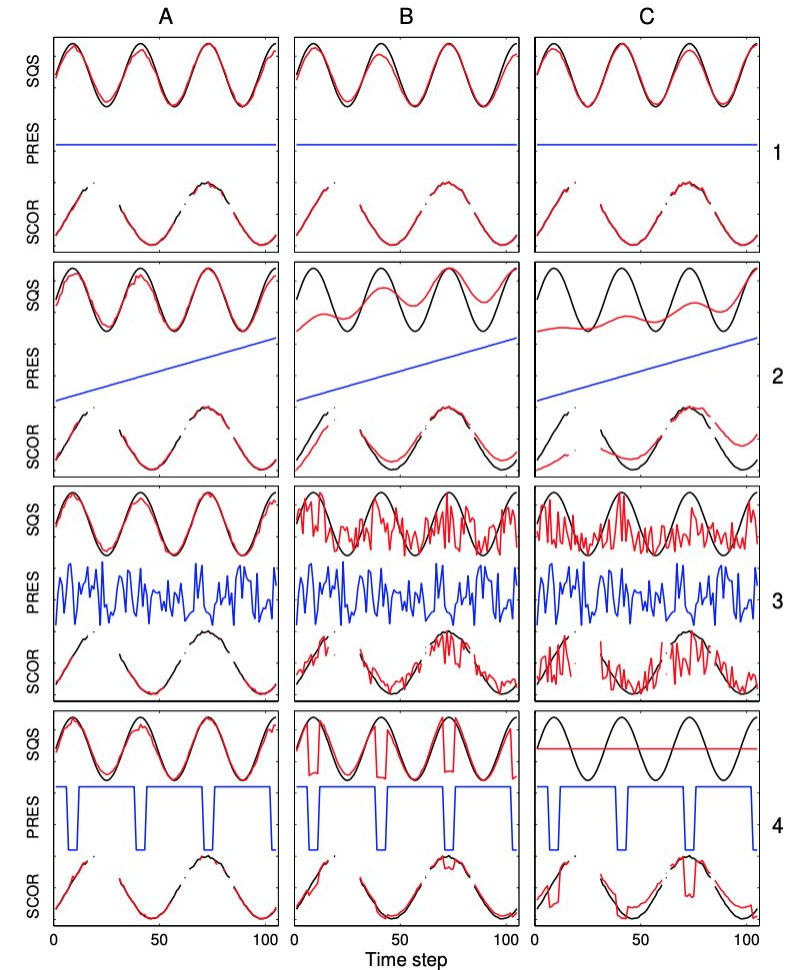
- Implemented through iNEXT R package
- Shows a more 'intuitive' pattern given what we know about the CRC



Dunne *et al.* (2018) *Proc Royl Soc B*

# SQS: Criticisms

- Found to track evenness i.e. if sample is dominated by common species, SQS might miss true richness changes (Hannisdal *et al.* 2012)
- Still needs relatively high levels of sampling to compute estimates

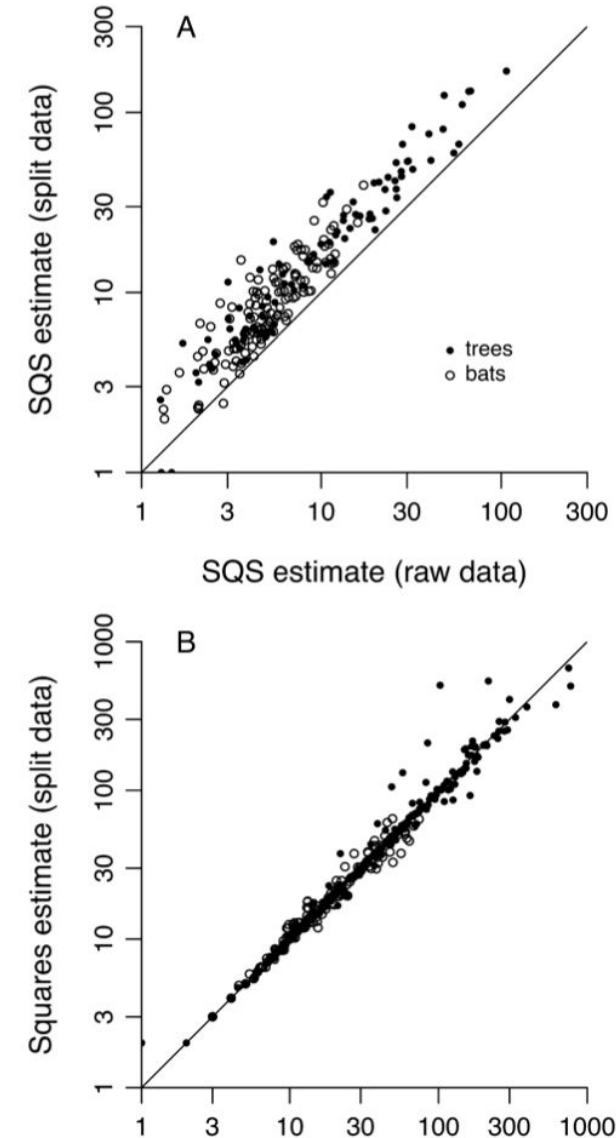


Hannisdal *et al.* 2012 *Glob. Change Biol.*



# Squares

- Also developed by John Alroy
- Another coverage-based method
- Performs well when the rank abundance of distributions of samples is particularly skewed (i.e. there are many rare taxa)

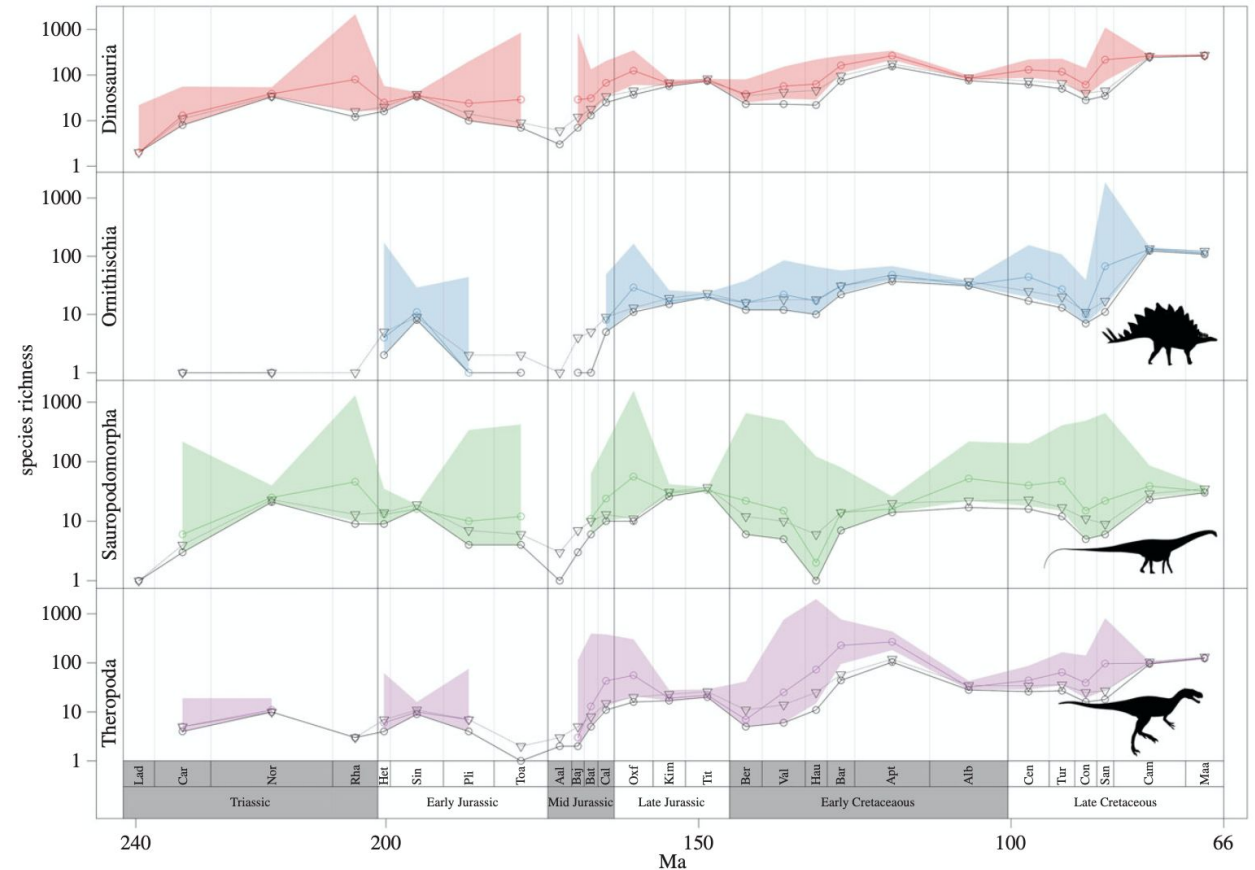


Alroy (2020) *Paleobiology*

# Other subsampling methods

# TRiPS

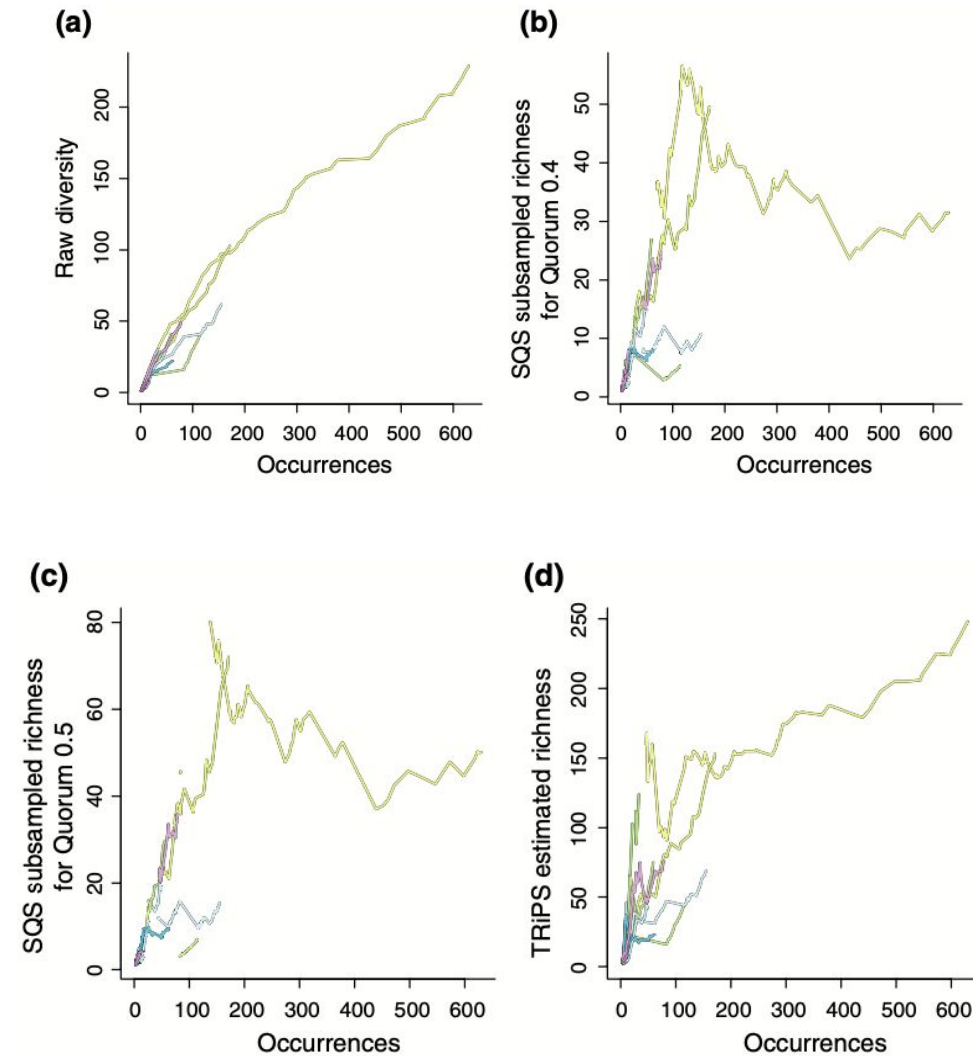
- True **R**ichness estimated using a **P**oisson **S**ampling model
- Extrapolation method
- Available via a Shiny app: [starrfelt.shinyapps.io/TRiPS/](http://starrfelt.shinyapps.io/TRiPS/)



Starrfelt & Liow (2016) *Phil. Trans.*

# TRiPS: Criticism

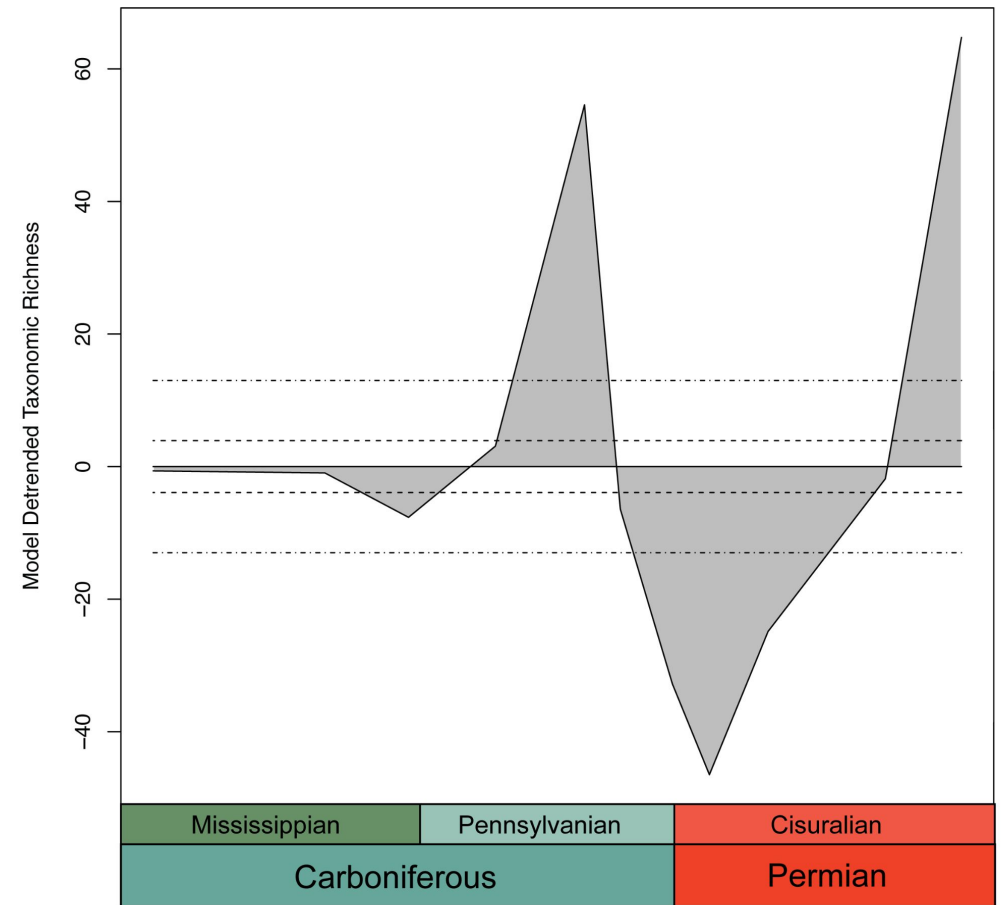
- Tracks unstandardised diversity, particularly in well-sampled bins
- Doesn't deal well when dataset contains many common species



Close *et al.* (2018) *Method Ecol. Evol.*

# Residual modelling

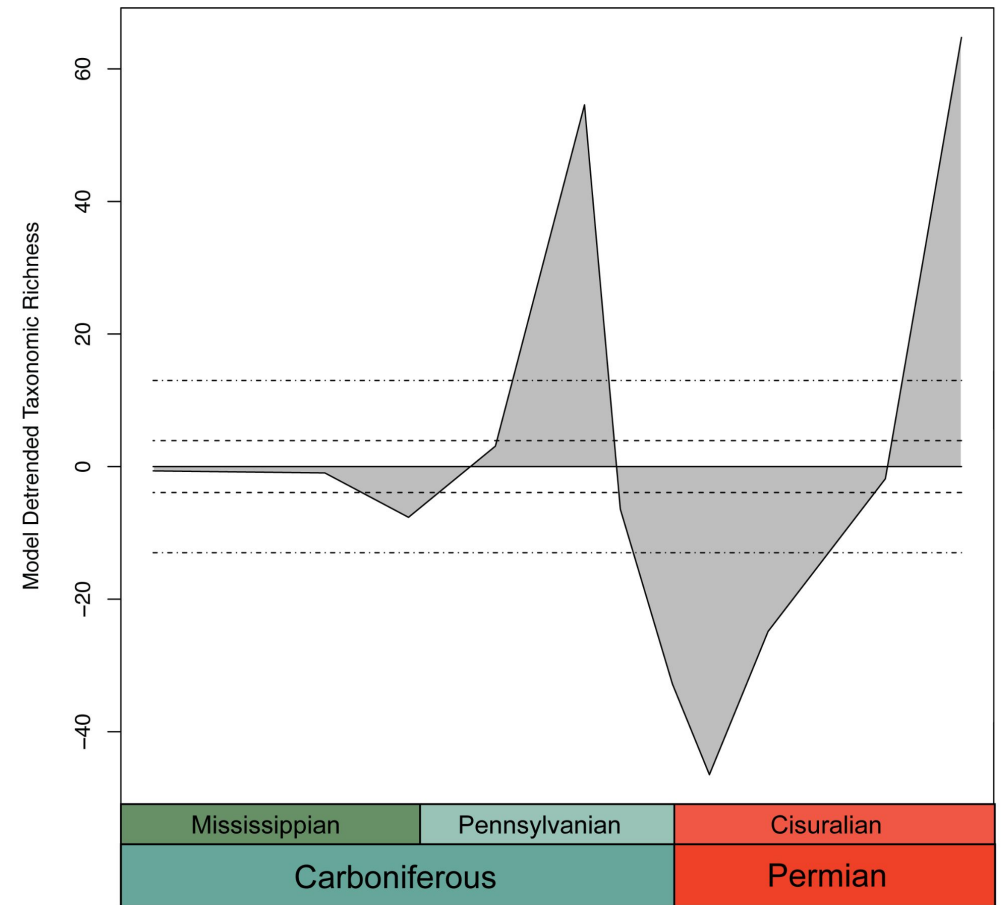
- Looks at the relationship between sampling and diversity, then plots the residuals to identify instances where diversity is lower or higher than expected
- Introduced by Smith & McGowan, developed by [Graeme Lloyd](#)



E. Dunne (unpublished data)

# Residual modelling: Criticism

- Reliant on the sampling proxy used - which can mean different things
- Modelling is a generally an underdeveloped standardisation method



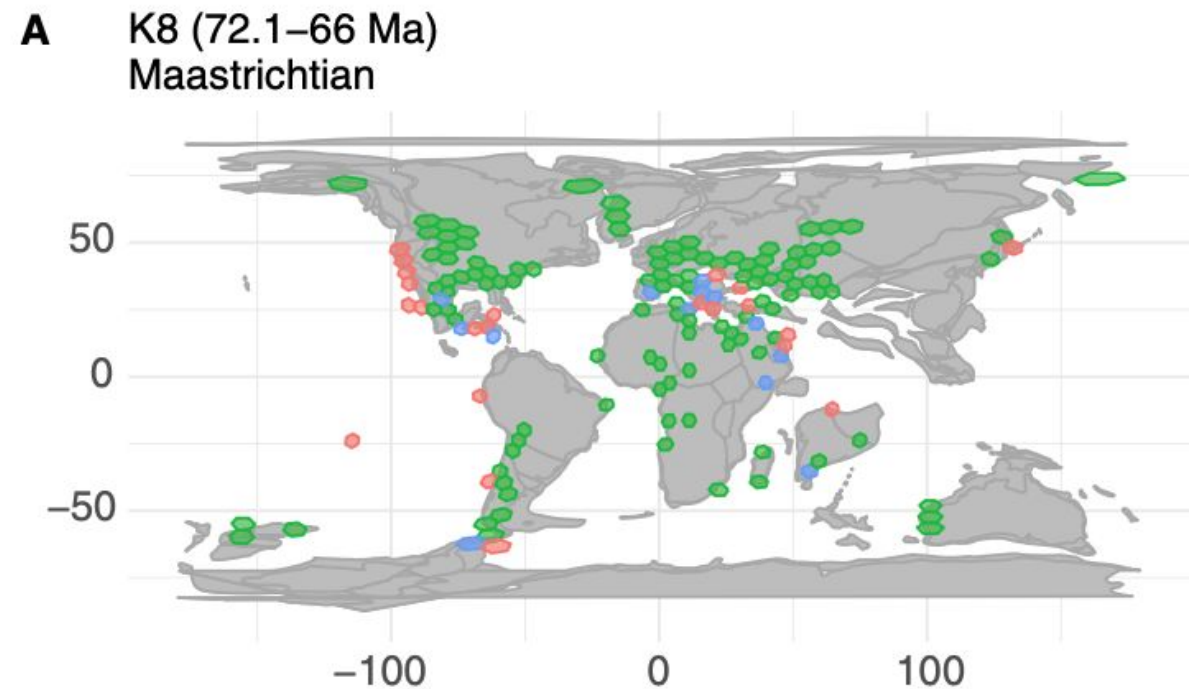
E. Dunne (unpublished data)

# Correcting for spatial sampling



# Global vs. regional diversity

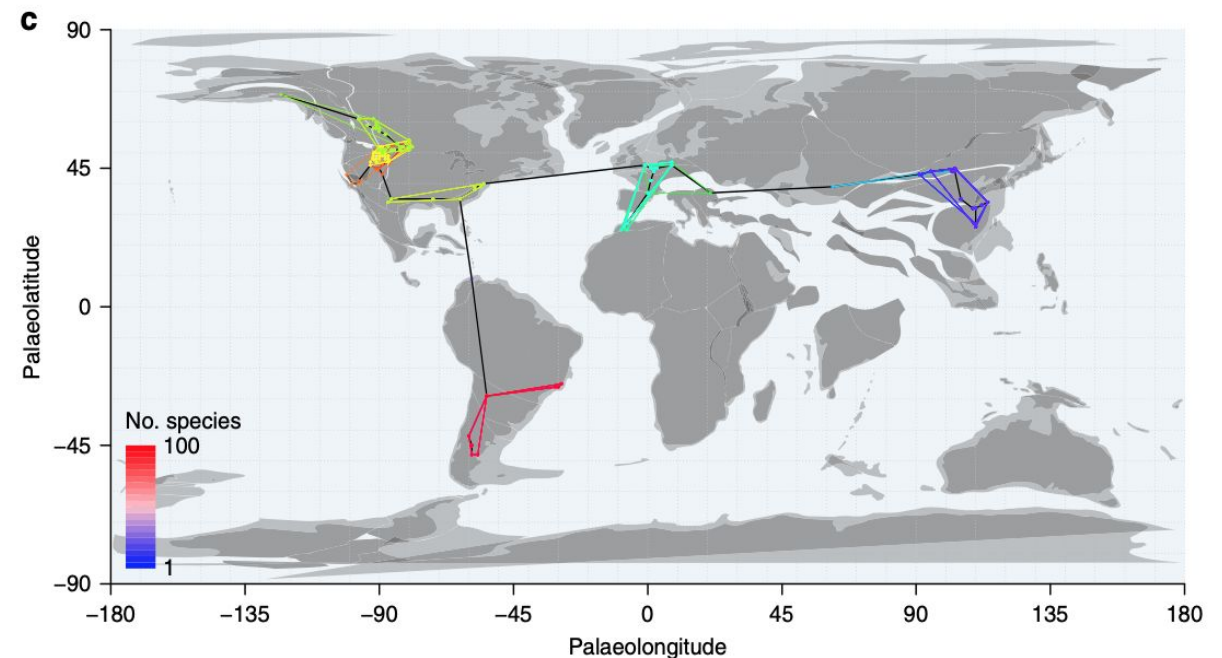
- Some authors argue that 'global' diversity is meaningless
- Spatial sampling biases are pervasive and must be corrected for
- Same authors argue for greater focus on regional diversity



Benson *et al* (2021) *Curr. Biol.*

# Minimum-spanning tree length

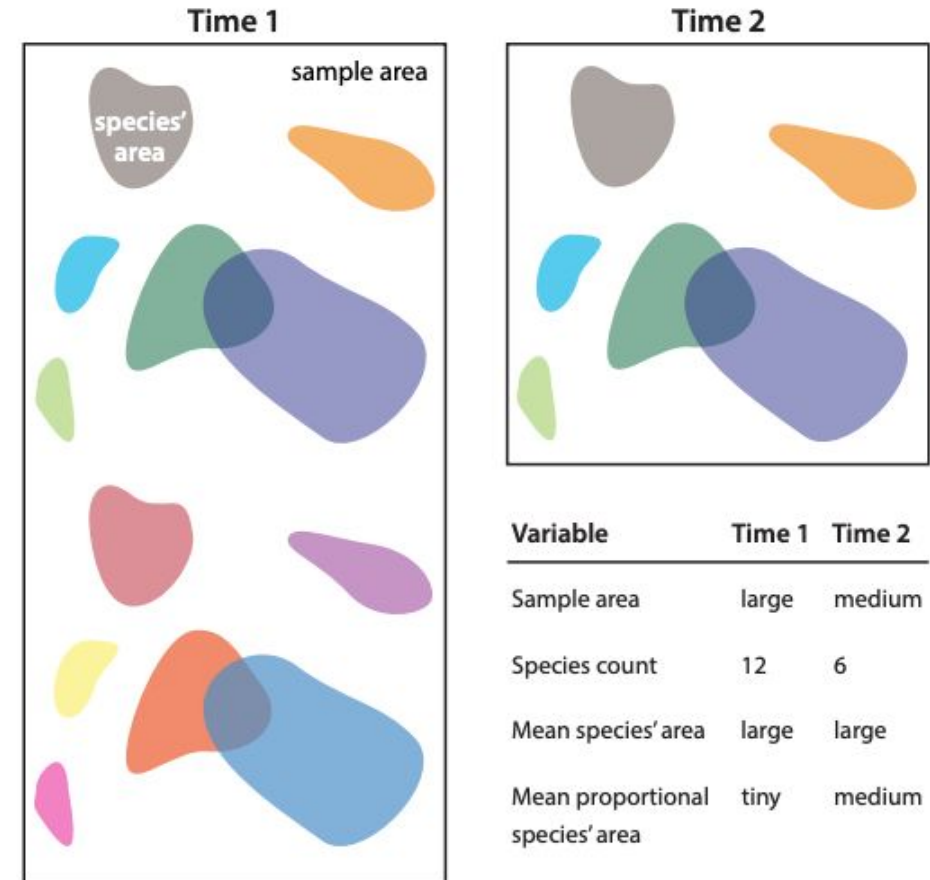
- Attempting to control for the species-area effect
- MST length draws spatial samples of fixed extent
- MST example: a cable company wanting to lay line to multiple towns - minimizing amount of cable saves money



Close *et al* (2017) *Nat. Commun.*

# Spatial subsampling

- Antell *et al.*'s method controls both total sampling area (no. of occupied equal-area grid cells) and dispersion of sampling sites through time (MSTs)
- Keep an eye out for a new R package being released soon!

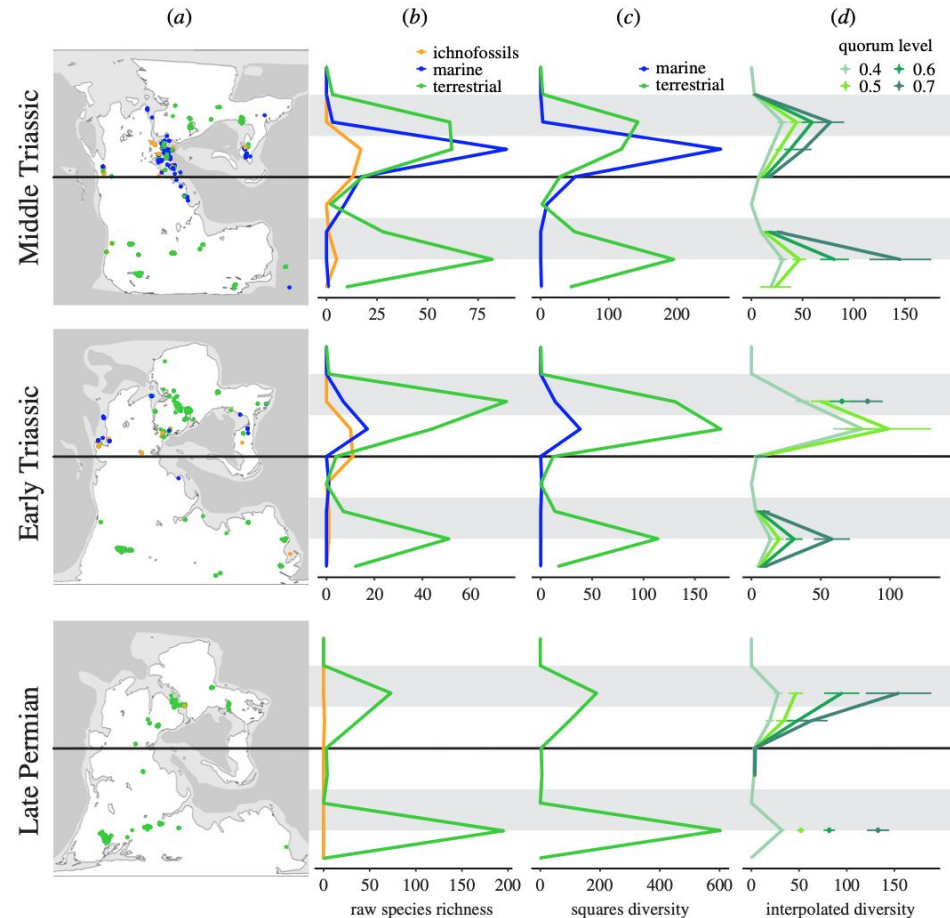


Antell *et al* (2020) *Curr. Biol.*

# Which method should I use?

# Which method is the 'best'?

- Current most popular for temporal trends = SQS/coverage-based rarefaction
- Useful to use more than one method
- Most important that you explore your data
- Don't expect one single method to fix all problems!



Allen *et al* (2020) *Proc. Royl. Soc. B.*

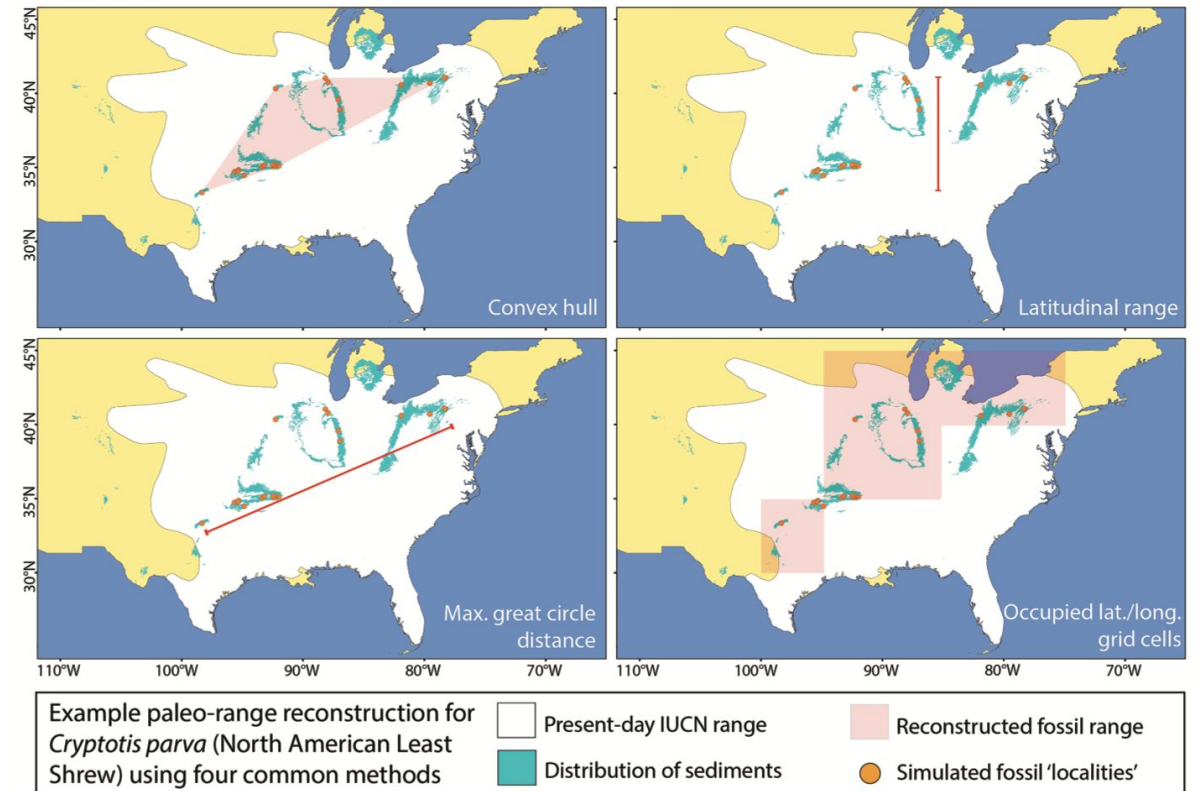
# Best practice

1. Always consider that there are biases lurking among your data
2. Explore your data thoroughly
3. Choose a suitable metric to quantify sampling bias
4. Consider which subsampling method best suits your data
5. Remember that your corrected estimates are not automatically 'correct'!



# Can we even trust the fossil record?

- Simulations have shown that the fossil record has good potential to preserve palaeogeographic ranges (in both recent time and deep time)
- Temporal patterns are a little trickier though - they don't seem to preserve so well



Darroch *et al* (2020) *Am. Nat*