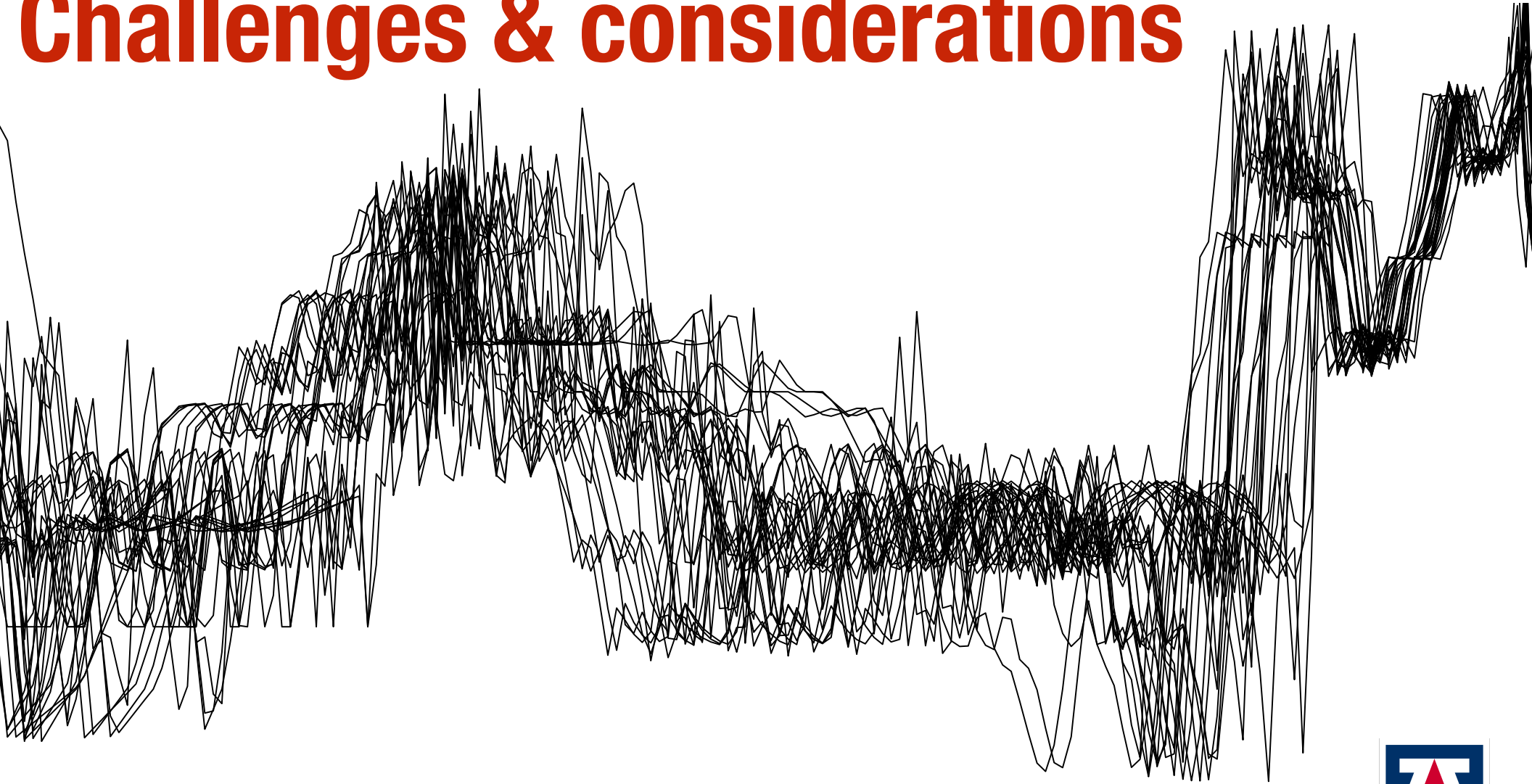
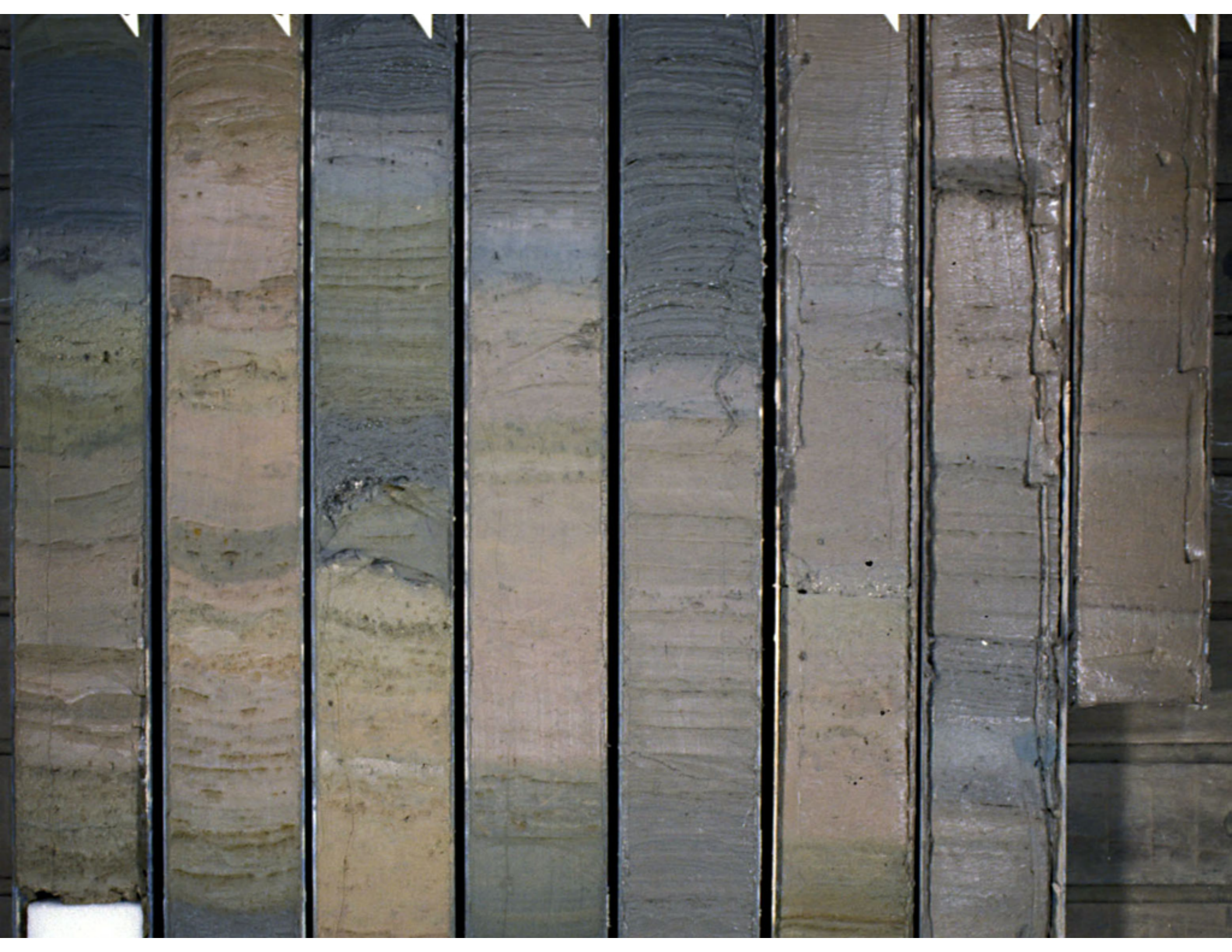


Interpreting past hydroclimate variability from sedimentary records: Challenges & considerations



Jessica Tierney
The University of Arizona



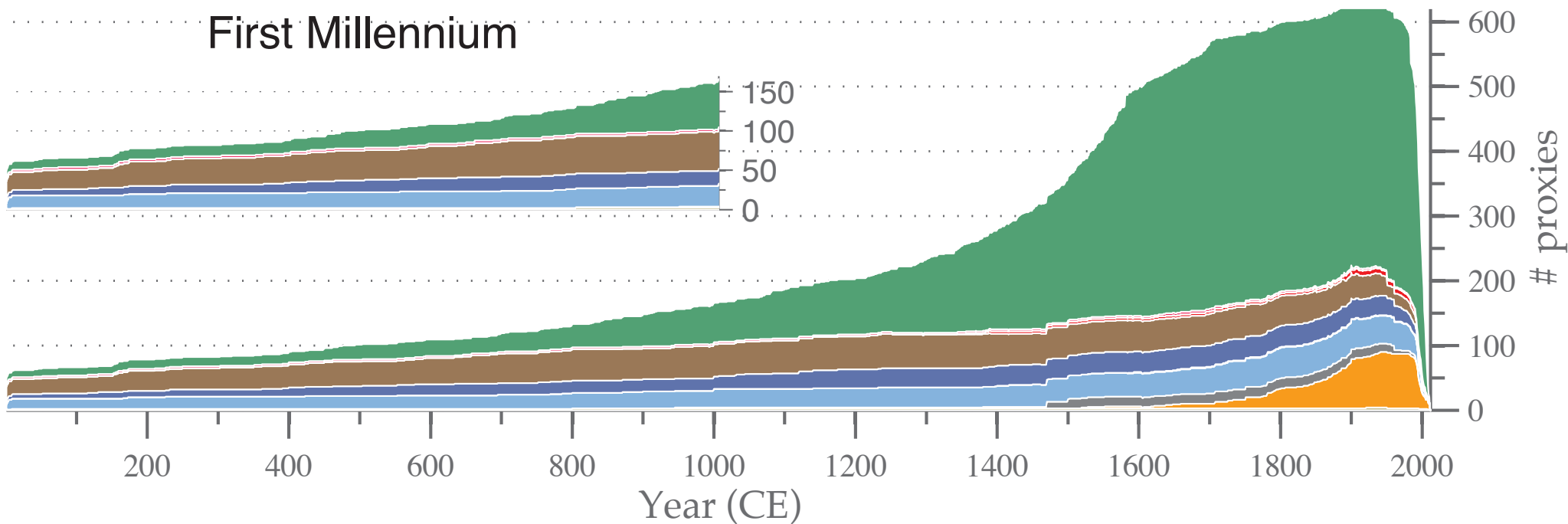


The farther back in time you go, the more important sediments become.

Marine Sediments Lake Sediments Tree Rings Corals

c) Temporal Availability

First Millennium





Some nice features of sediment archives

- **Long, continuous records**
- **Multiple sensors and proxies can be measured**

Sedimentary Observations (Proxies) with hydroclimate information

- **Oxygen isotopes ($\delta^{18}\text{O}$) on foraminifera (marine)**
- **Lake levels**
- **Things sensitive to lake levels (Mg/Ca of minerals, $\delta^{18}\text{O}$ of authigenic carbonate).**
- **δD of leaf waxes**
- **Runoff indicators (Ti concentration, varves)**
- **Microfossil assemblages (pollen, diatoms)**



Some challenging features of sediment archives

- Age uncertainty is usually large
- Bioturbation mixes signals
- The archive itself adds red noise (e.g. lakes).

Interpreting sedimentary archives: an overview

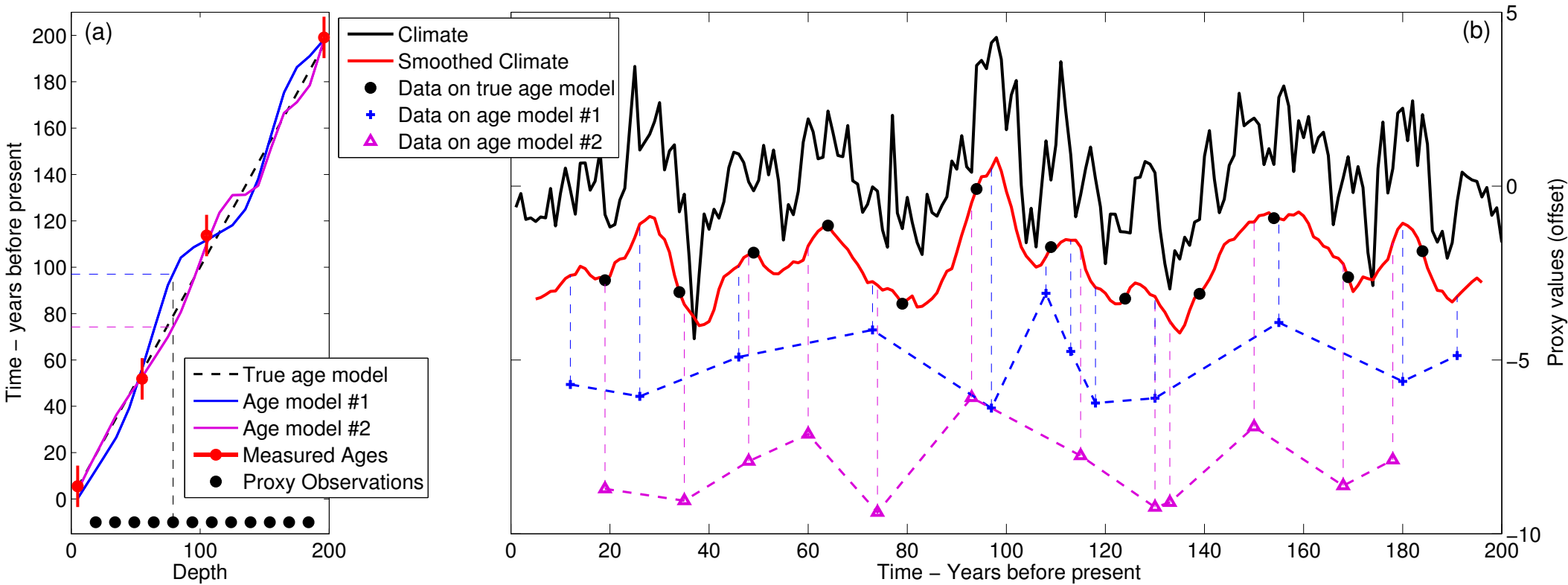


Figure made by Martin Tingley

Proper interpretation of hydroclimate data from sediments requires:

- **Proxy (observation) forward model(s)**
- **An archive model to account for smoothing/reddening**
- **A way to deal with age uncertainty**

Archive issues:
Age Uncertainty

The time uncertainty continuum

Cross-dated Archives

(Tree rings)



Layer-counted archives

(varves, ice cores, corals)



Radiometrically dated - Gaussian

(U/Th on speleothems, ^{210}Pb in sediments)



Radiometric dating - non-Gaussian

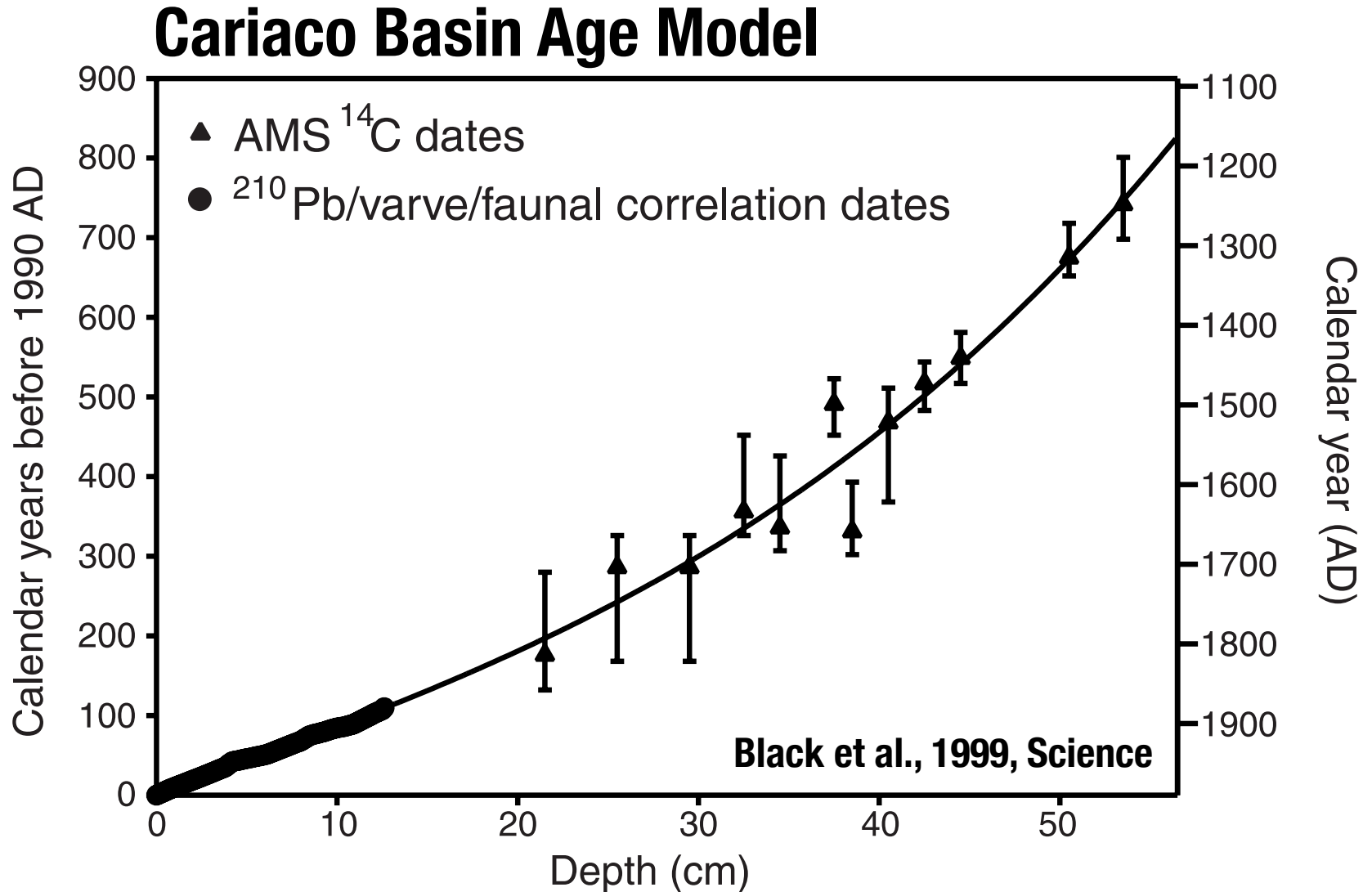
(^{14}C on sediments)



100 75 50 25 0

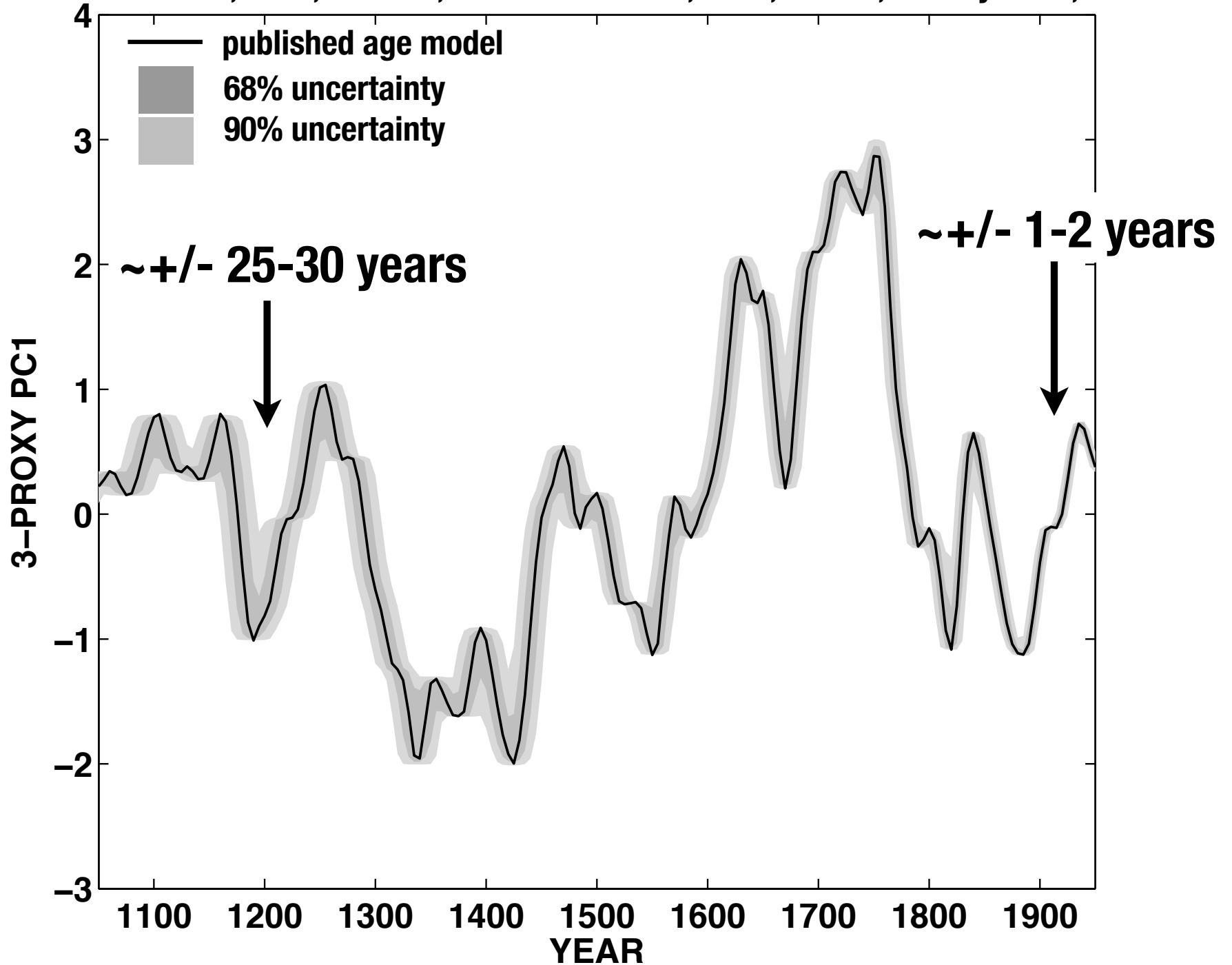
Uncertainty in Years

Annually resolved \neq time certain



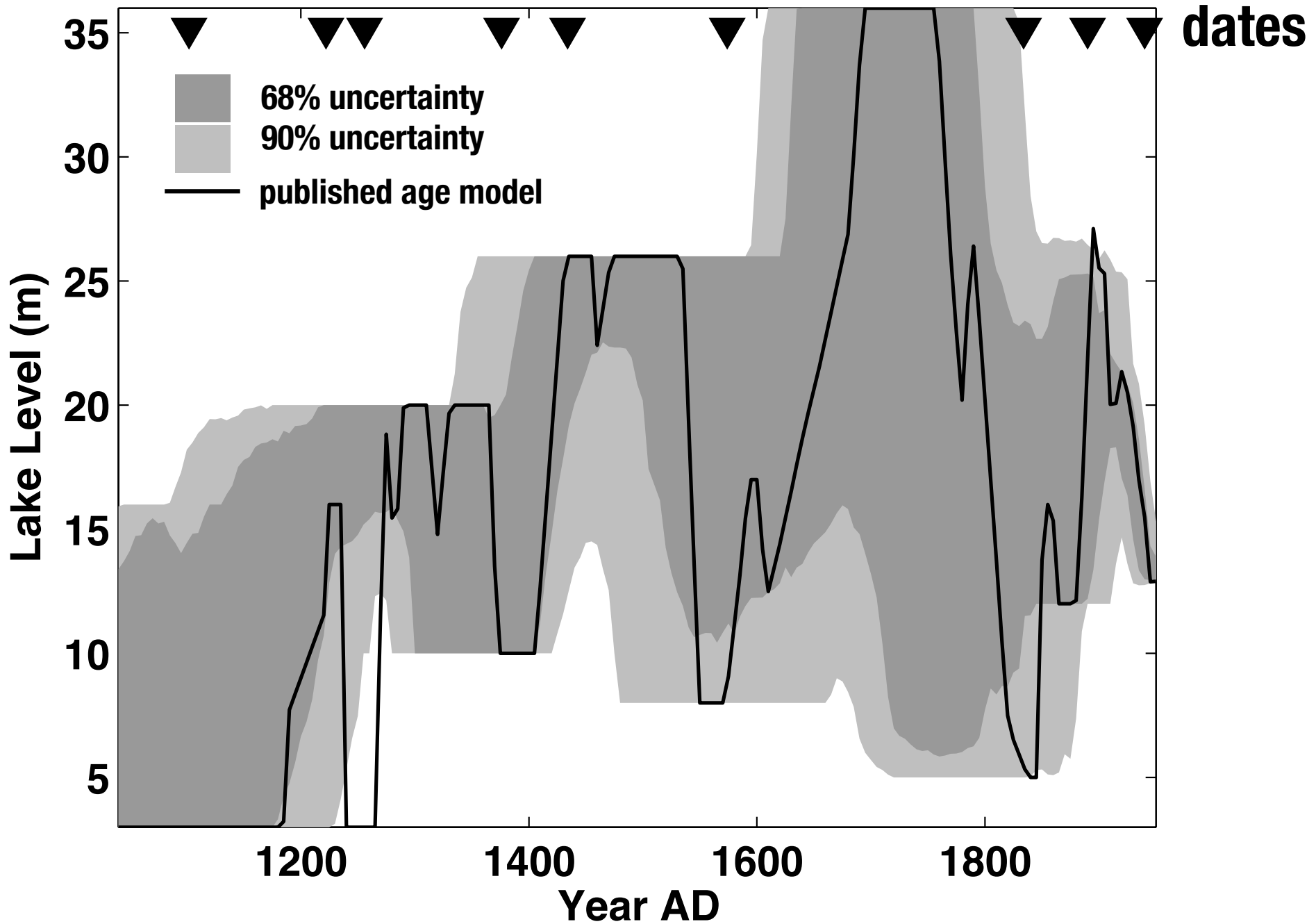
LAKE CHALLA, KENYA (VARVE-COUNTED)

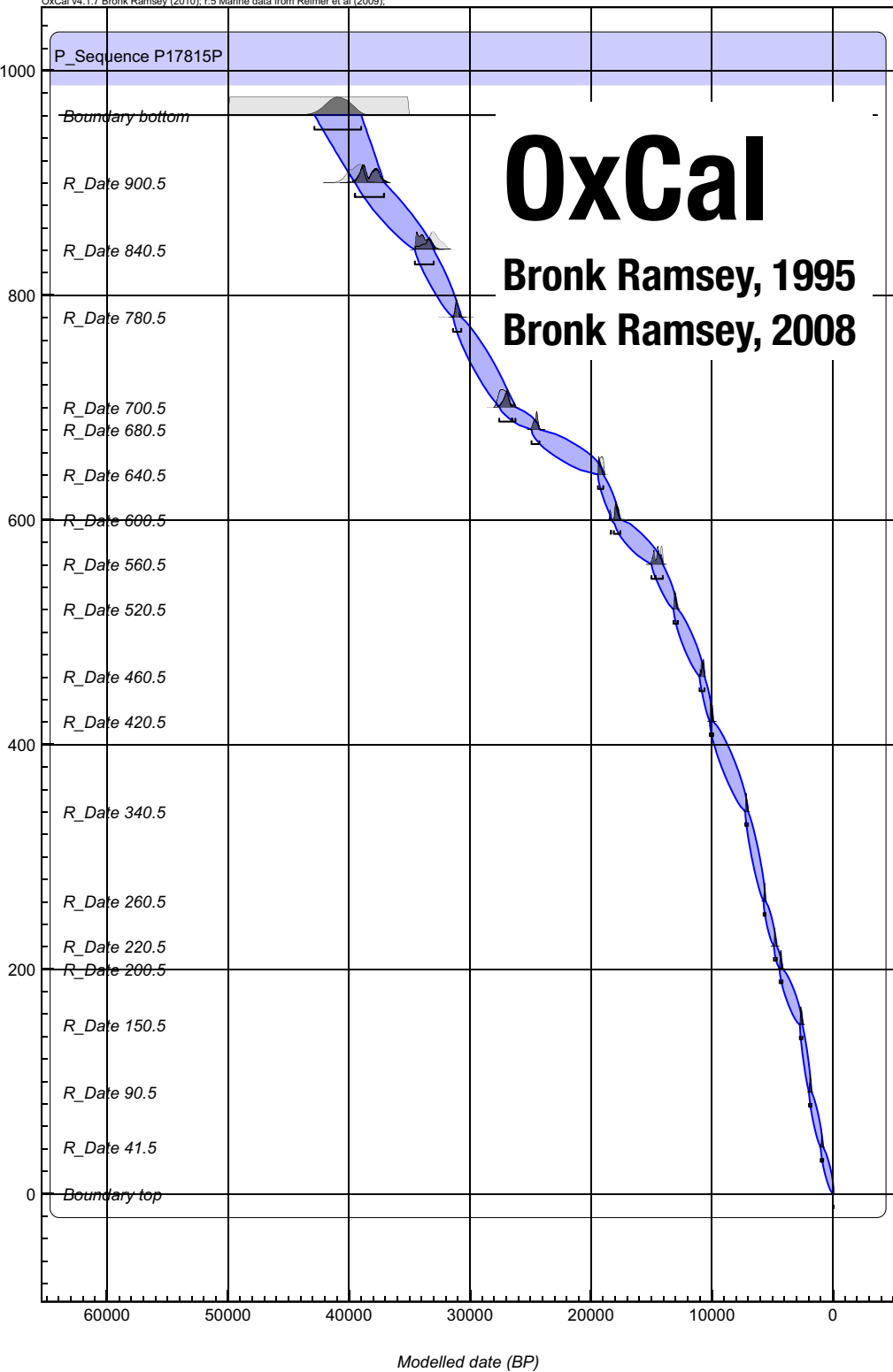
Wolff et al., 2011, Science; Verschuren et al., 2009, Nature, Tierney et al., 2011 QSR



LAKE NAIVASHA, KENYA (^{14}C DATED)

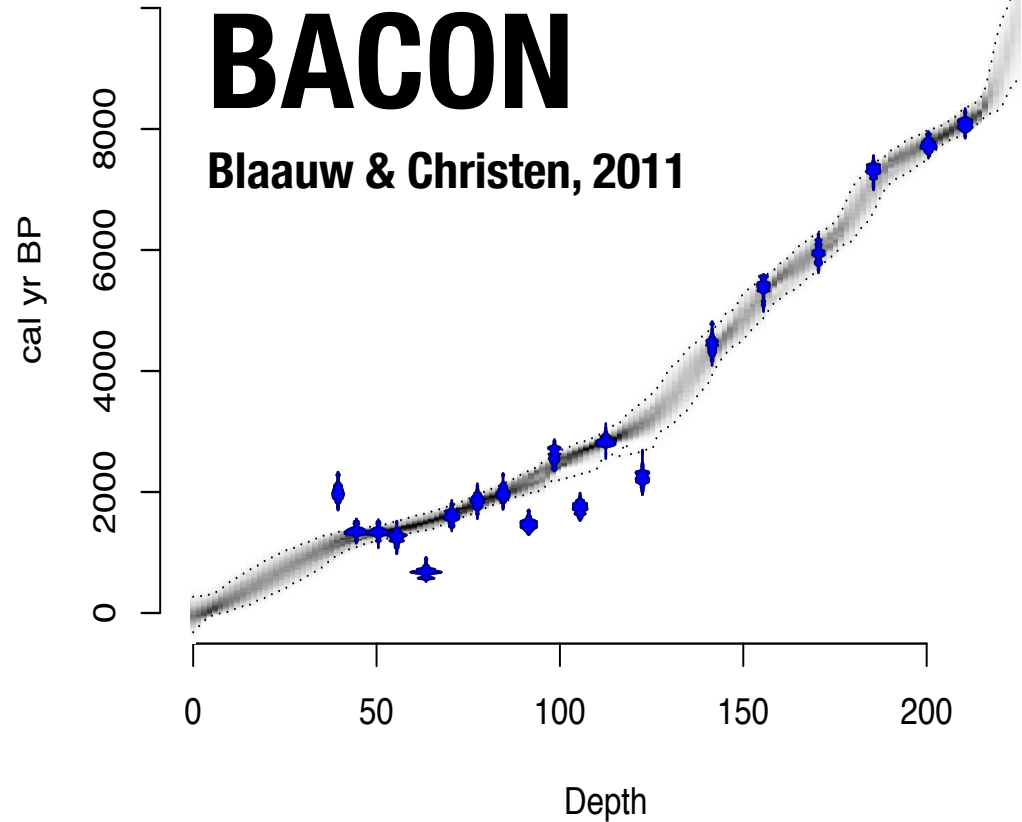
Verschuren et al., 2000, Nature





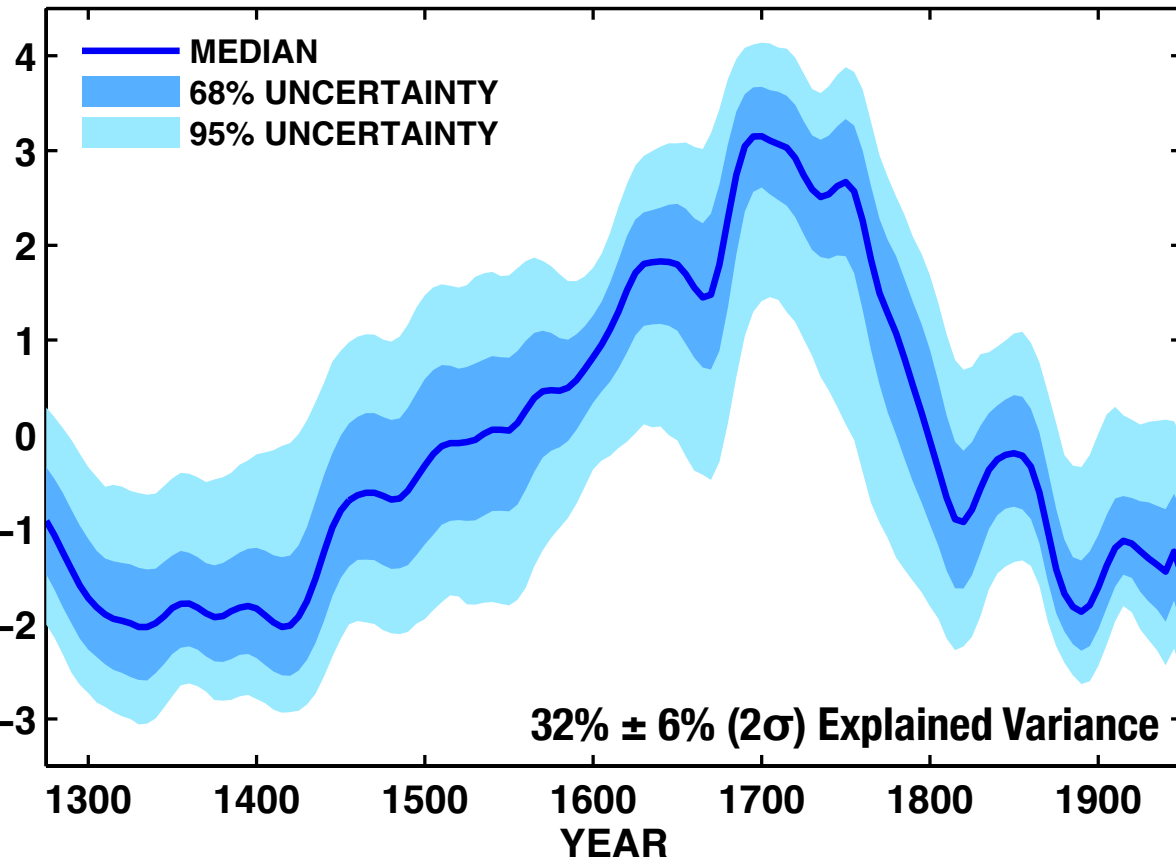
Age Modeling Techniques

Simplest approach uses MC iteration and the constraint of superposition. More complex approaches make assumptions about the sedimentation process



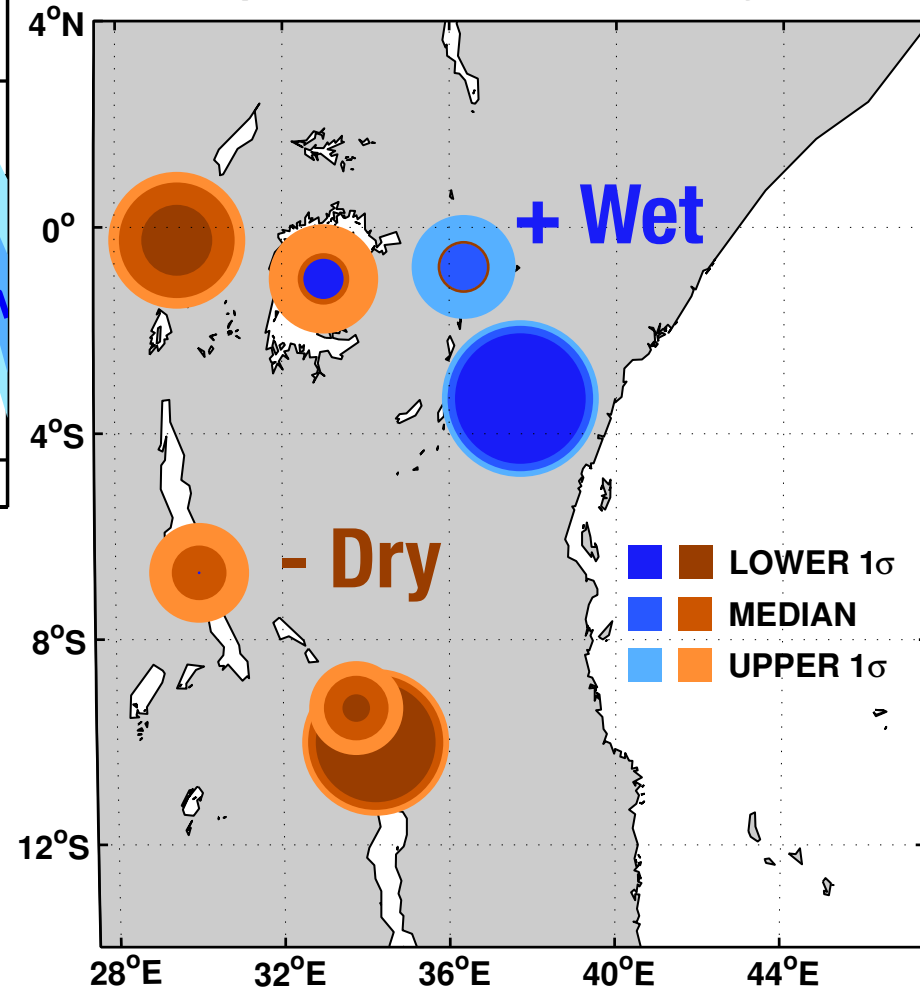
Monte Carlo EOF

East Africa MCEOF1; 10,000 simulations



EOF1 Loadings

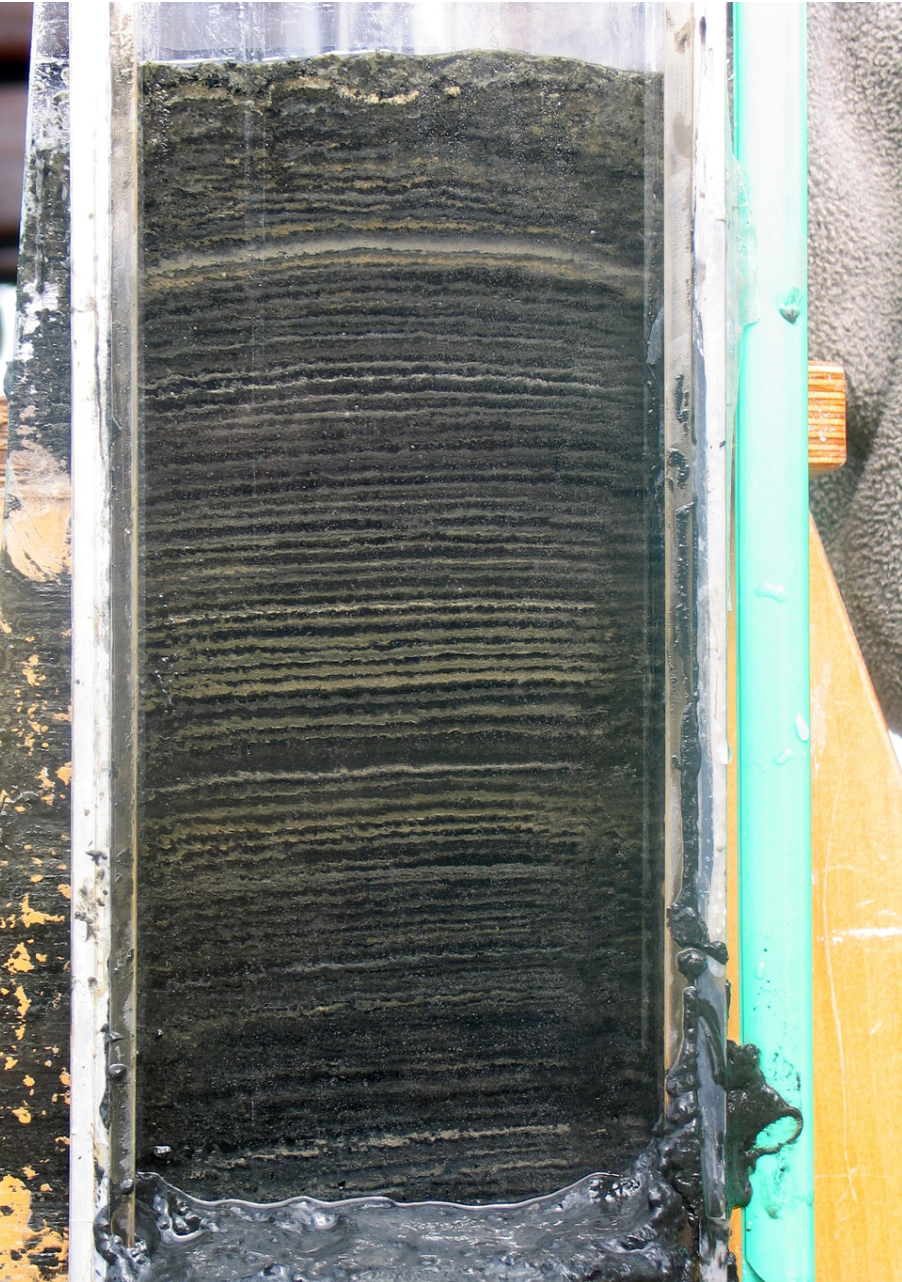
sizes of circles represents loading value
colors represent median and uncertainty bounds



Tierney, Smerdon, Anchukaitis & Seager
Nature, 2013

Archive issues:
Bioturbation

Unless you have this:



**You need to account
for bioturbation!**



Photo by Guillaume Leduc

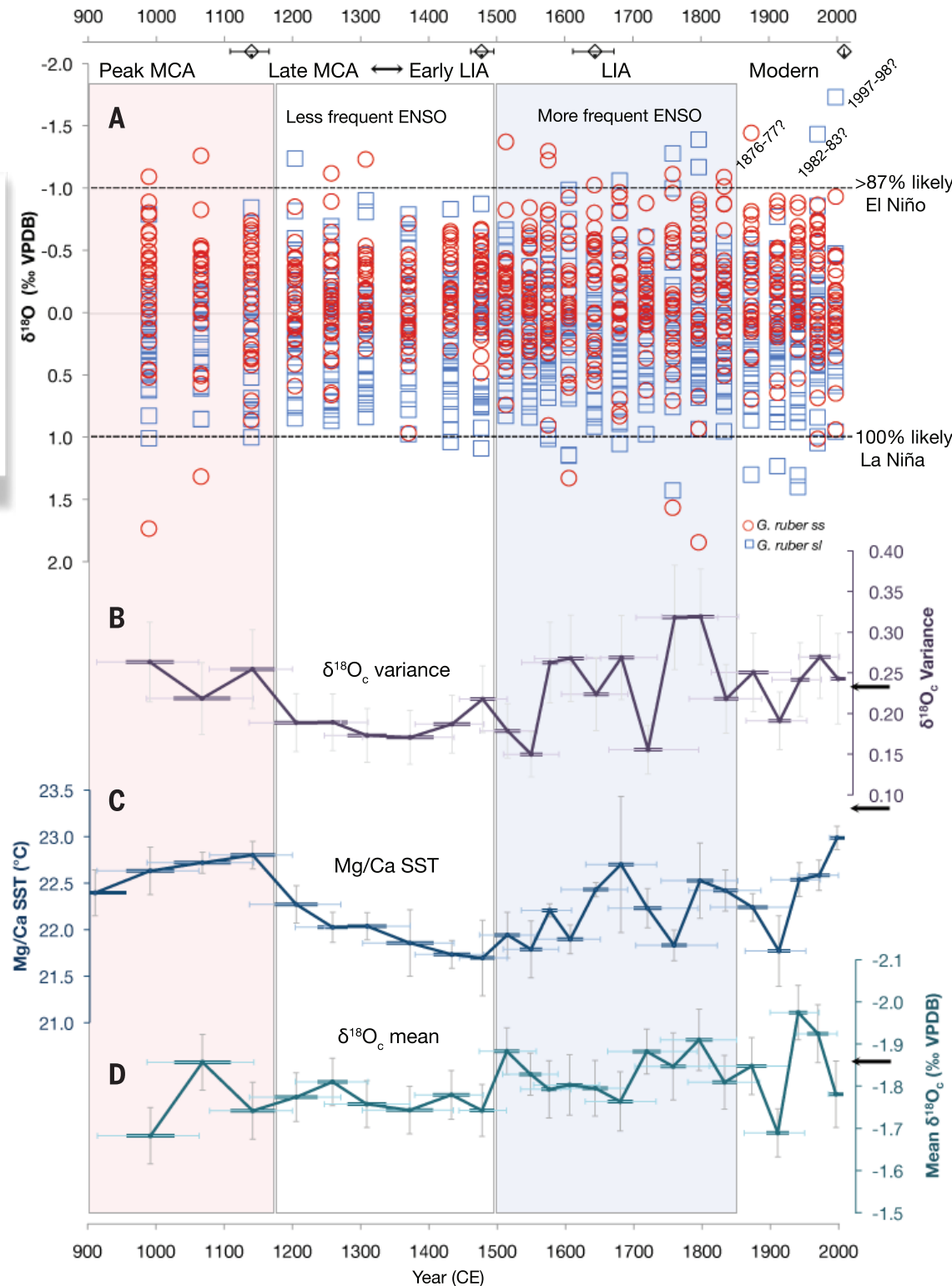
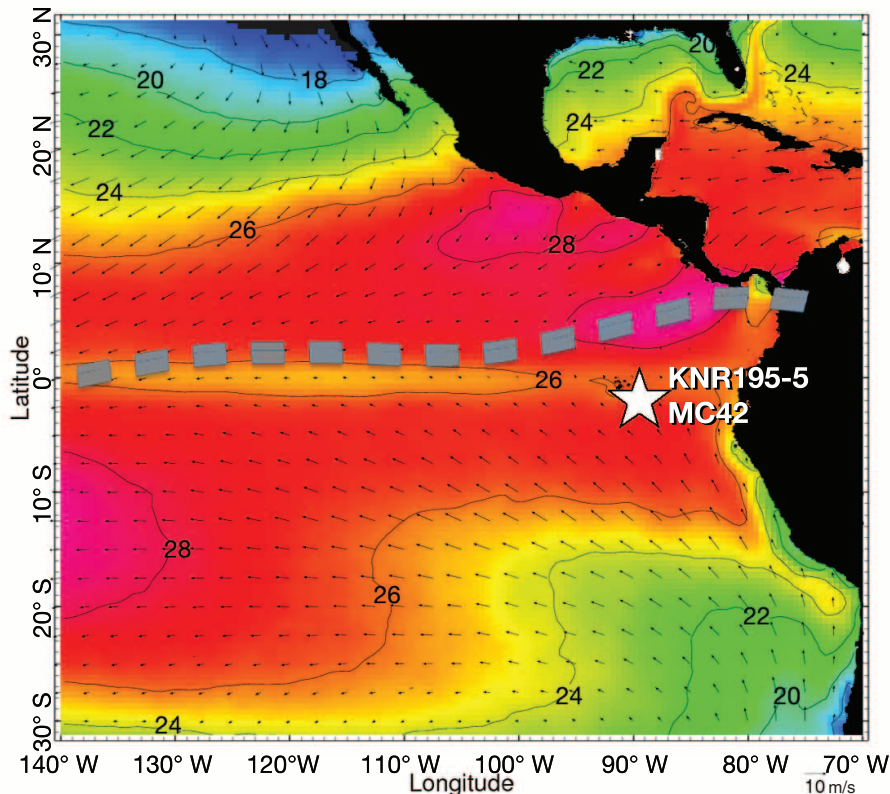
Example

PALEOCEANOGRAPHY

Dynamical excitation of the tropical Pacific Ocean and ENSO variability by Little Ice Age cooling

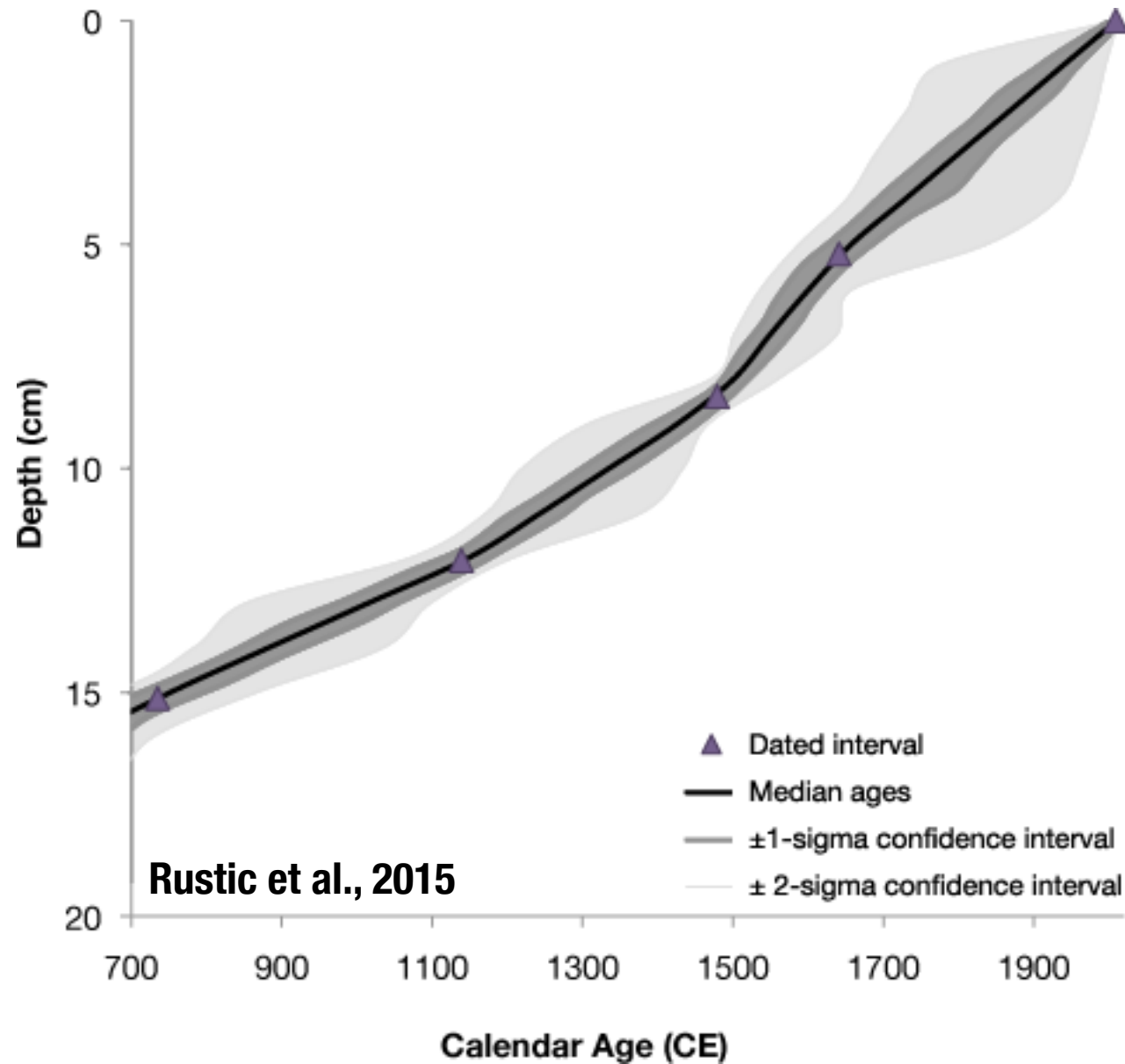
Gerald T. Rustic,^{1,2*} Athanasios Koutavas,^{1,2,3}
 Thomas M. Marchitto,⁴ Braddock K. Linsley²

Rustic et al., 2015

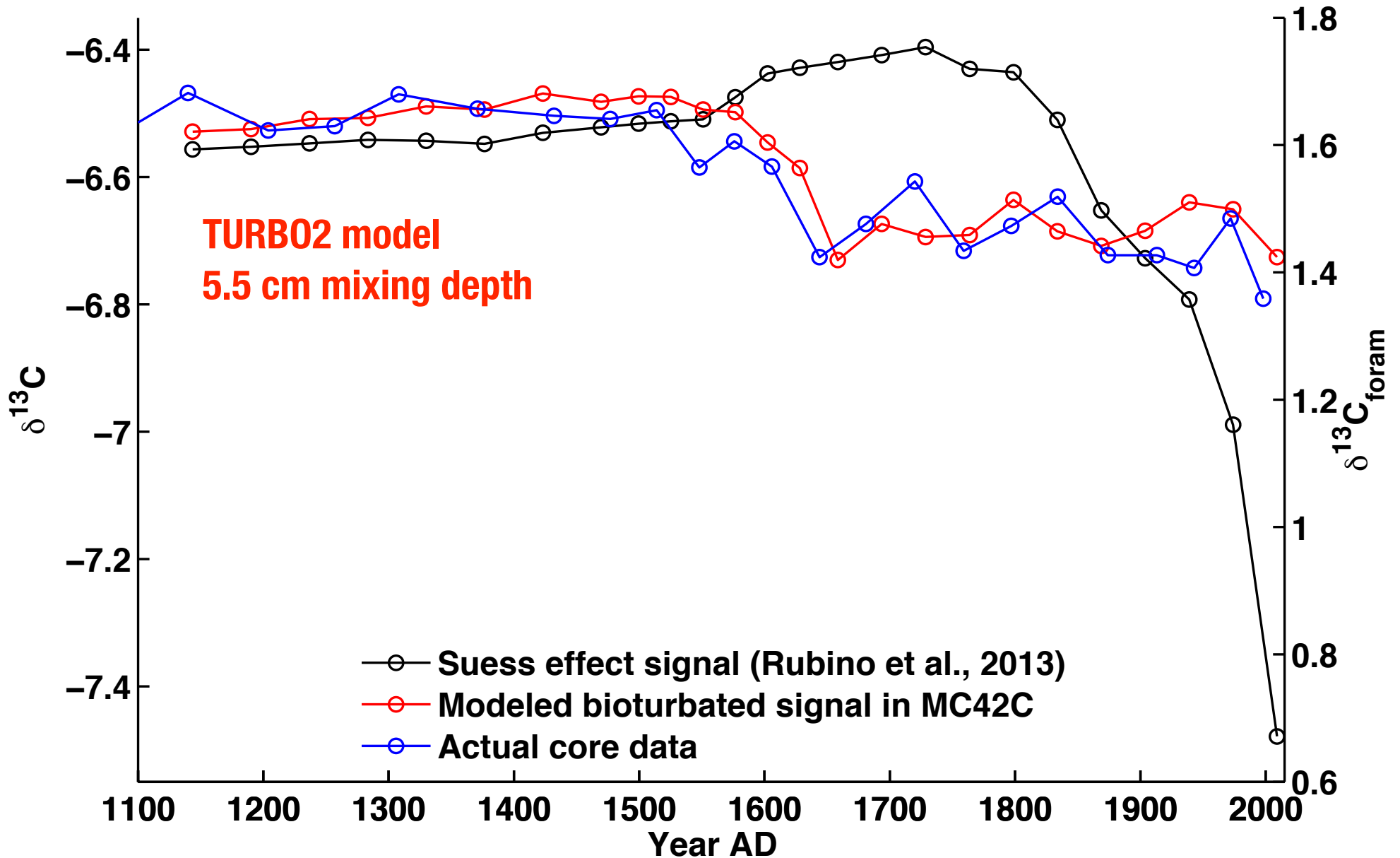


The Problem:

Record is only ca. 15 cm long, and is not laminated.



Using the Suess effect to assess bioturbation



Bioturbation models

Typically modeled as an impulse response function that describes instantaneous mixing of initial deposition in the “bioturbation layer” (H).

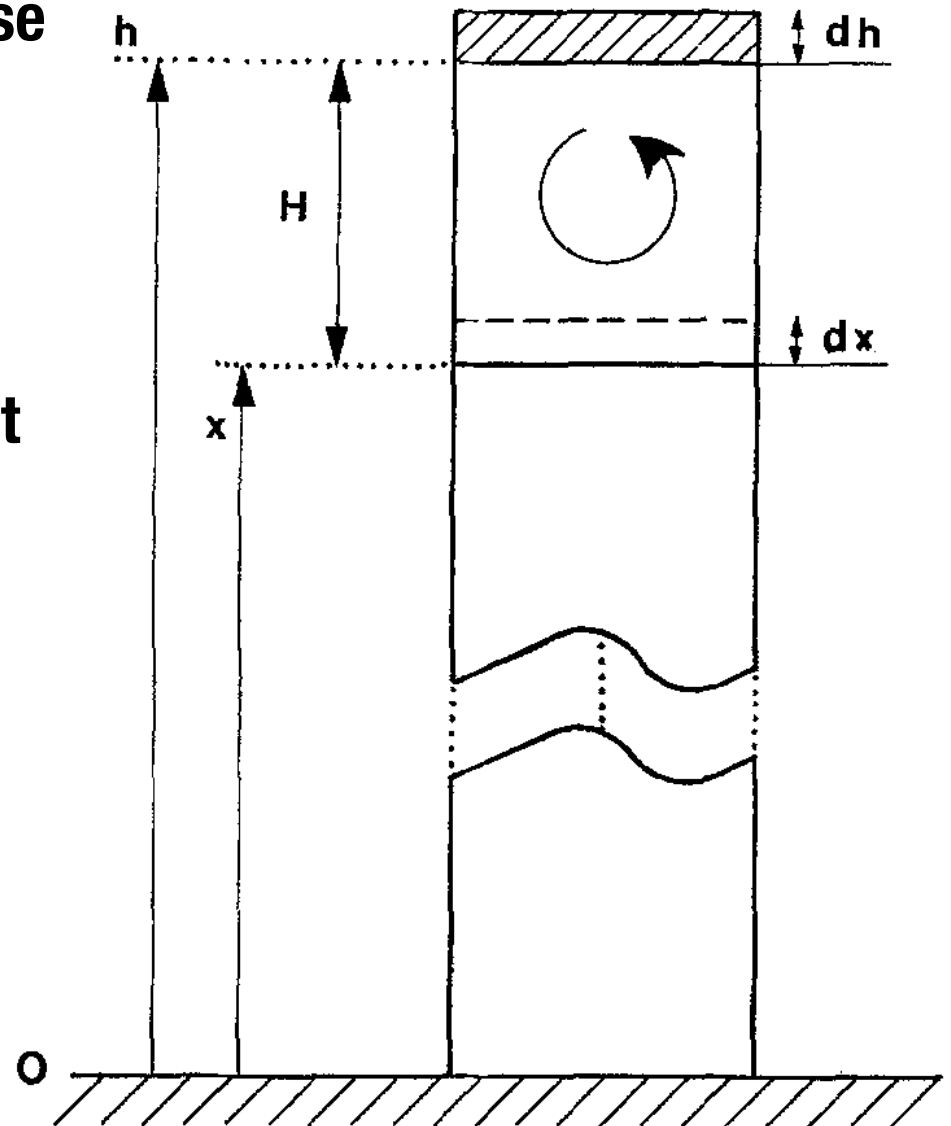
e.g., Berger and Heath (1968) and Bard et al., (1987) model:

$$dC/dt = 1/H * (C_{dh} - C_H)$$

or, the diffusion model of Guinasso and Schink, 1975, JGR:

$$dC/dt = D \frac{d^2C}{dx^2} - v \frac{dc}{dx}$$

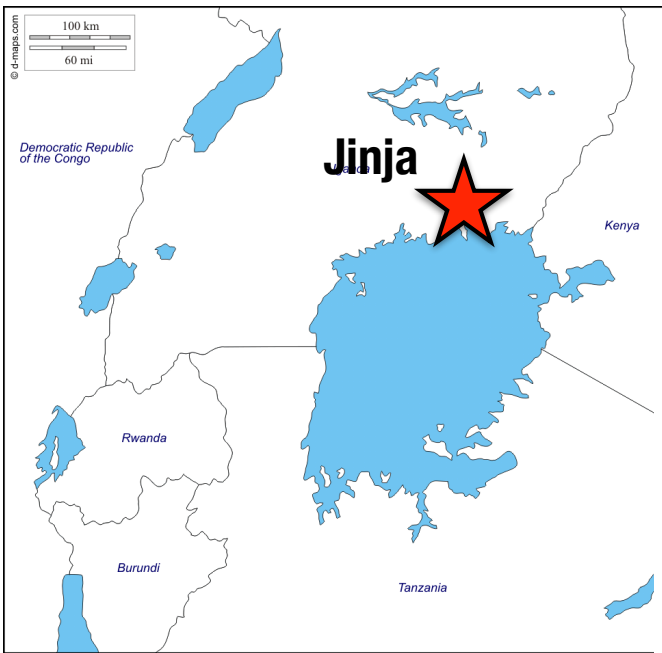
where D is diffusivity and v is sed rate.



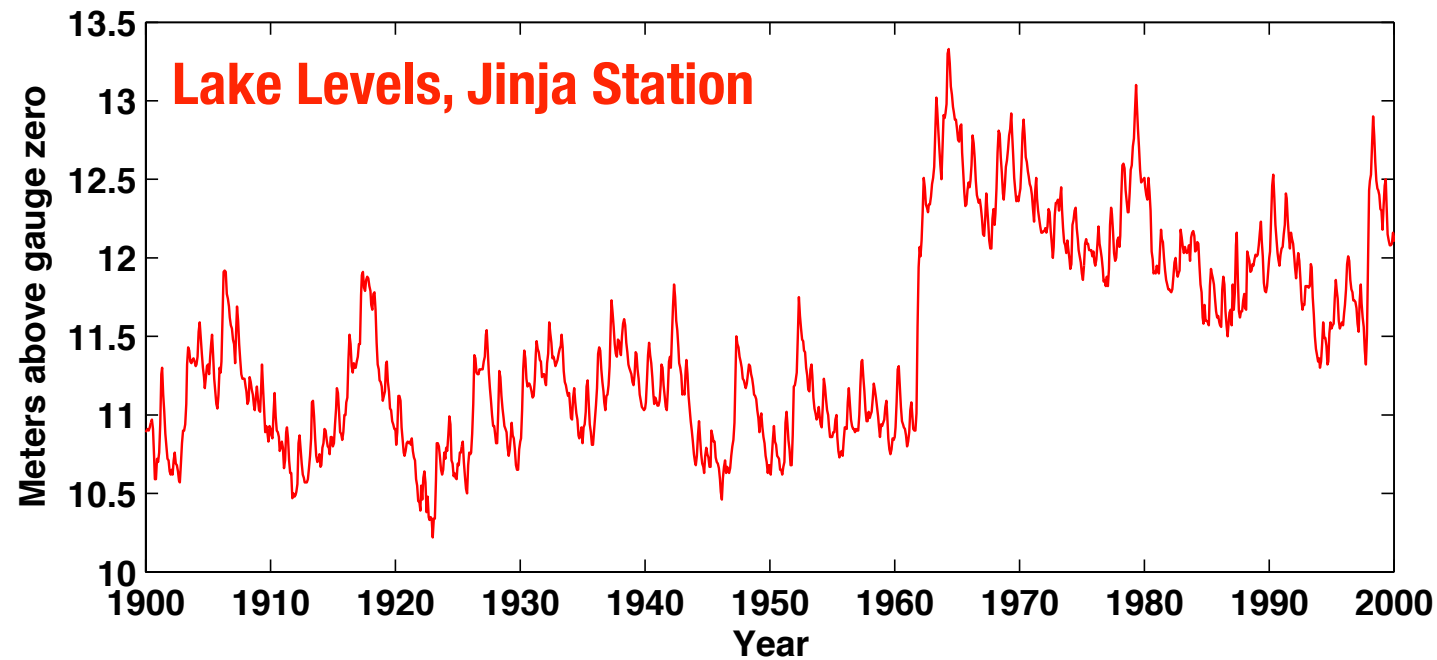
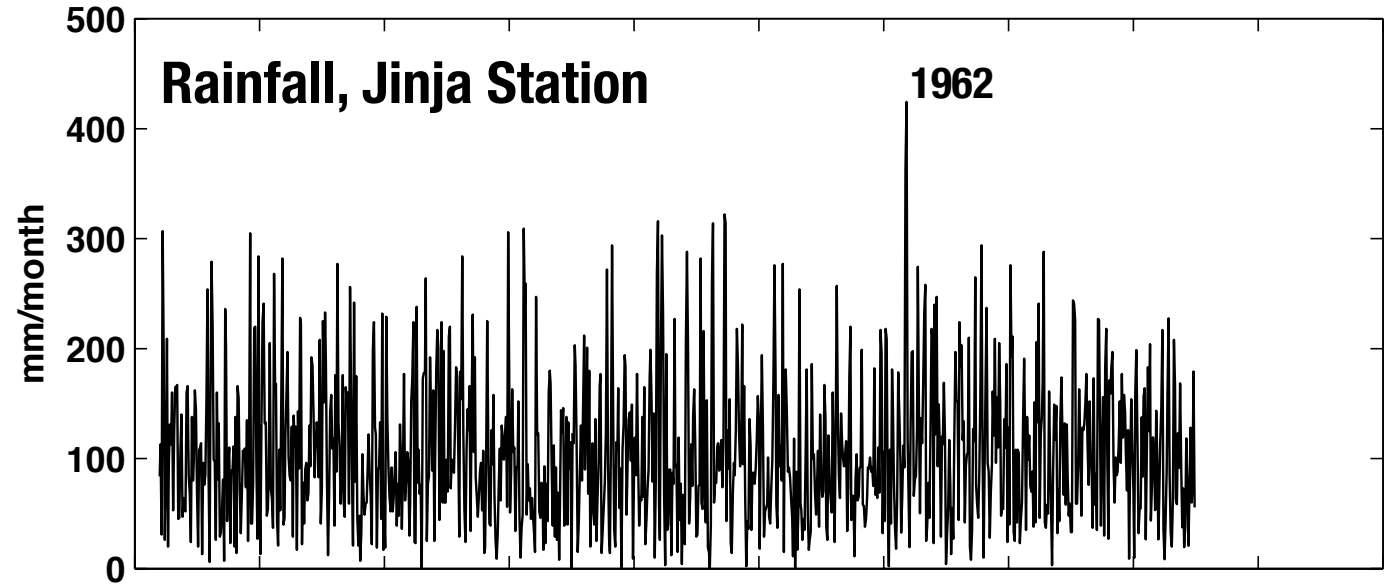
Bard et al., 1987, Clim. Dyn.

Archive issues:

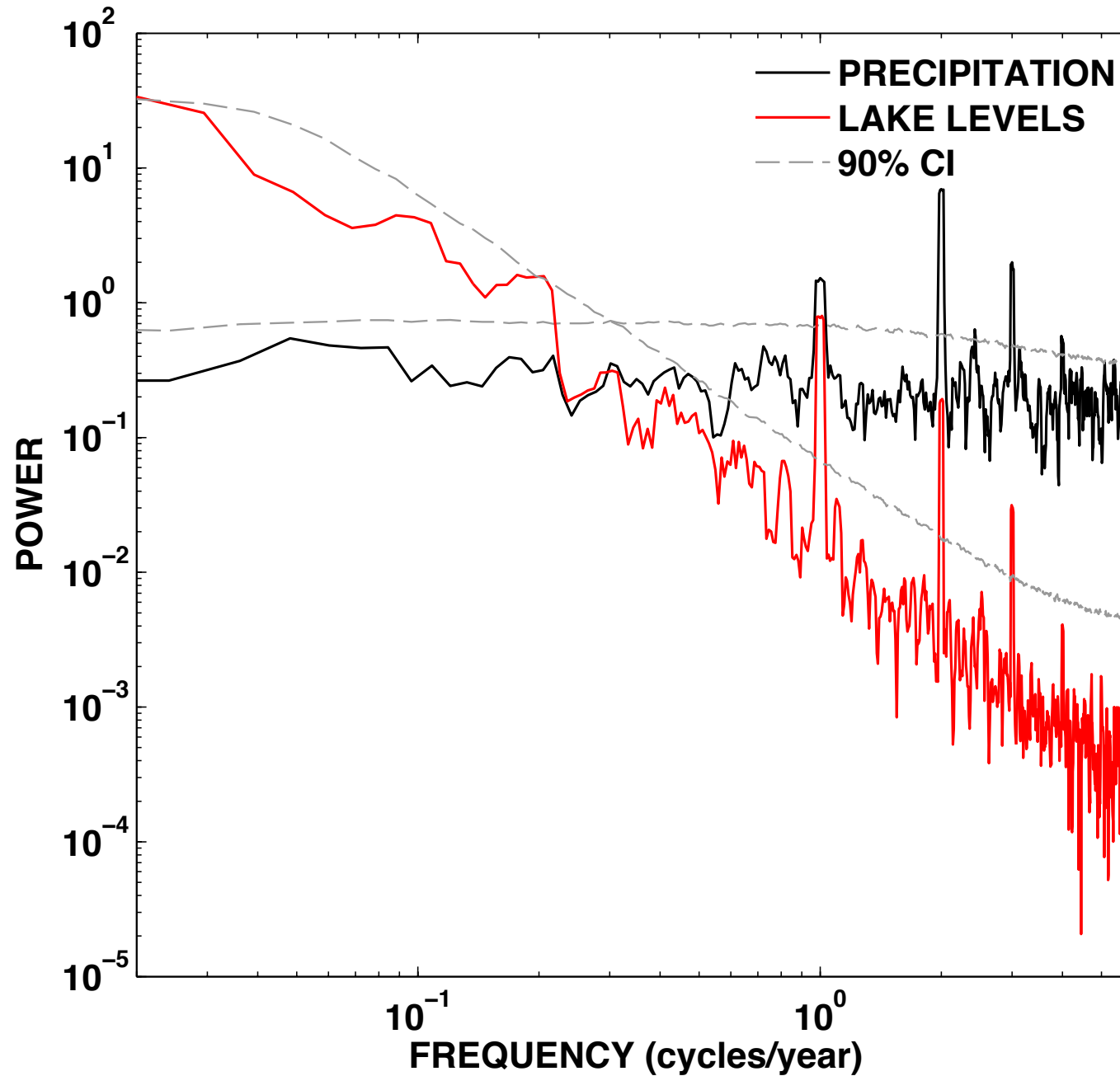
Reddening of the signal
(lake level proxies)



Example: Lake Victoria



Spectral comparison



Ways forward

- **Ad-hoc approach: only use/interpret lowest frequencies (drawbacks: qualitative only, plus archive creates low frequency, so is this variability even “real”?)**
- **Better idea: start forward modeling sedimentary records from climate models.**

Envisioning a hierarchical model for sediments

Level 1: Spatiotemporal process model

$$SST_{t+1} - \mu = \alpha \cdot (SST_t - \mu) + \epsilon_t$$

$$\epsilon_t \sim \mathcal{N}(0, \Sigma)$$

$$\Sigma_{i,j} = \sigma^2 \exp(-\phi |x_i - x_j|)$$

Level 2: Proxy forward model, can be updated to account for age model uncertainty (Werner & Tingley, 2015, *Clim. Past*)

$$\text{logit}(U_{37}^{K'}) | SST = \alpha + \beta \cdot SST + \epsilon,$$

$$\epsilon \sim \mathcal{N}(0, \tau^2) \text{ IID.}$$

$$\text{logit}(U_{37}^{K'}) | \mathcal{T}, SST = \alpha + \beta \cdot \Lambda^{\mathcal{T}} \cdot SST + \epsilon,$$

$$\epsilon \sim \mathcal{N}(0, \tau^2) \text{ IID.}$$

Level 3: Archive model (bioturbation or other sedimentary features)

$$U_{37obs}^{K'} | U_{37}^{K'} = \sum_{t_n} U_{37t_1+t_n}^{K'} \cdot g(t_n) + \epsilon(t_1),$$

$$\epsilon(t_1) \sim \mathcal{N}(0, \tau^2) \text{ IID.}$$

Shameless Plug: Awesome Postdoctoral position available in my lab!



- **Part of the “Data Assimilation for Deep Time” Project. We’re doing DA from the LGM to present...and also for the PETM!**
- **Looking for someone with good quant skills, and expertise in paleoclimate/climate dynamics/climate modeling.**