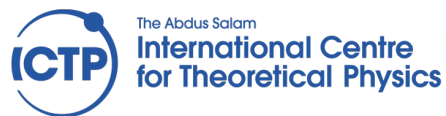


# How can we use paleoclimate proxy records to advance our understanding of AMV and TBI?

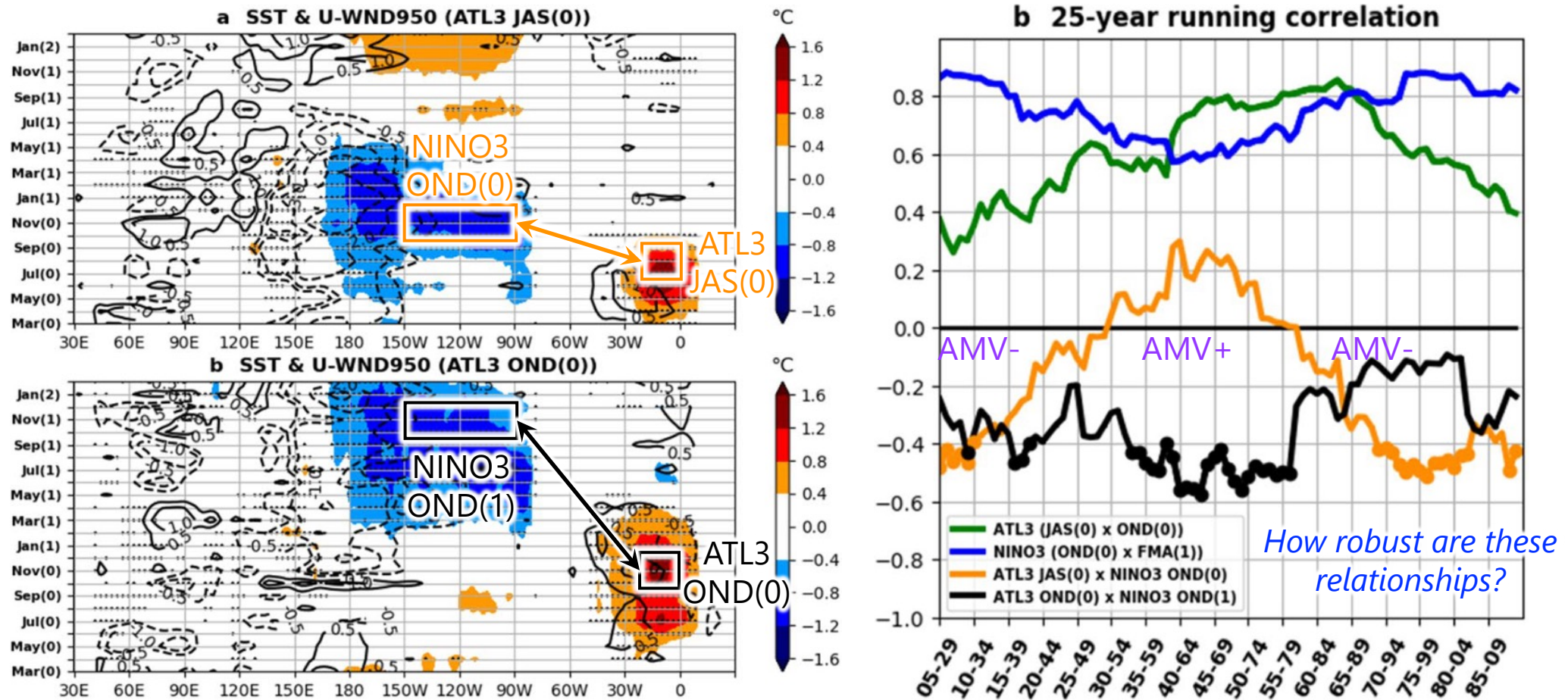
Yuko M. Okumura

*University of Texas at Austin Institute for Geophysics*



Observational records are too short, and models are imperfect....

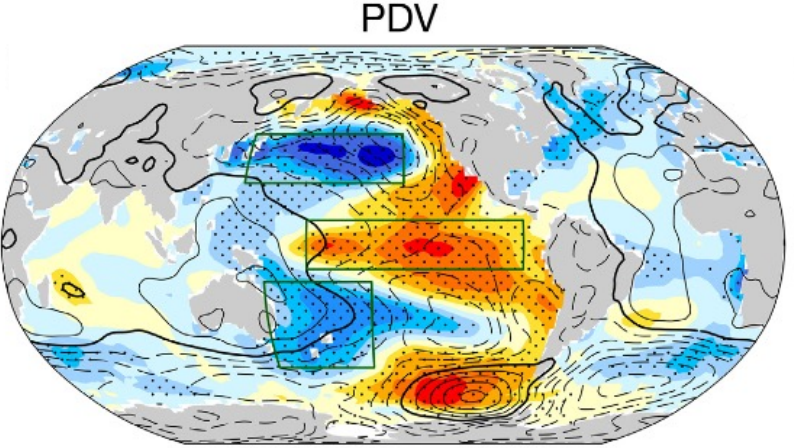
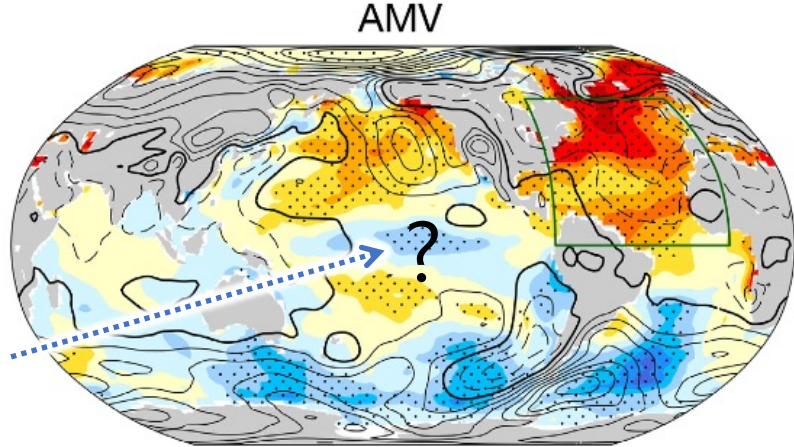
# Multidecadal modulation of Atlantic Nino-ENSO linkages



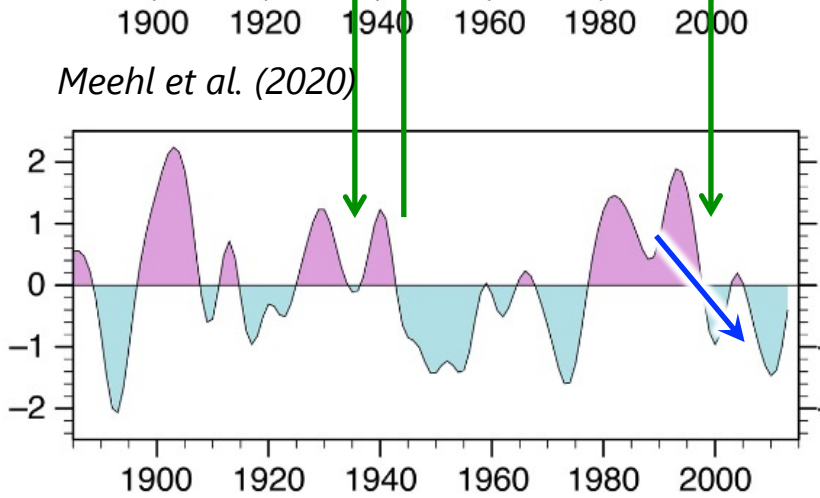
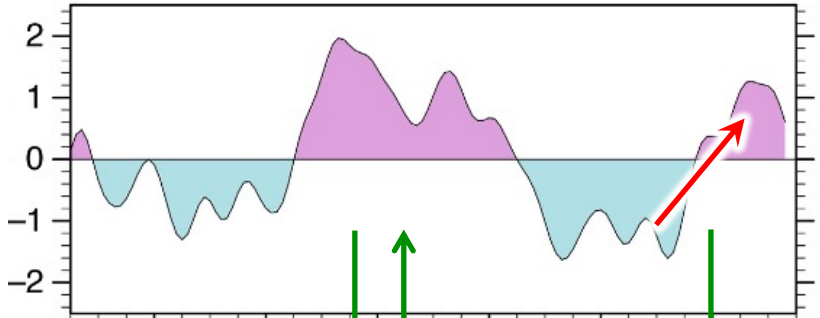
Hounsou-Gbo et al. (2020)  
 Also see Rodríguez-Fonseca et al. (2009)

# Atlantic-Pacific linkages in decadal variability

Pacific pattern is sensitive to trend removal methods  
*Deser and Phillips (2023)*  
*How much are AMV and PDV related?*



*Johnson et al. (2020)*



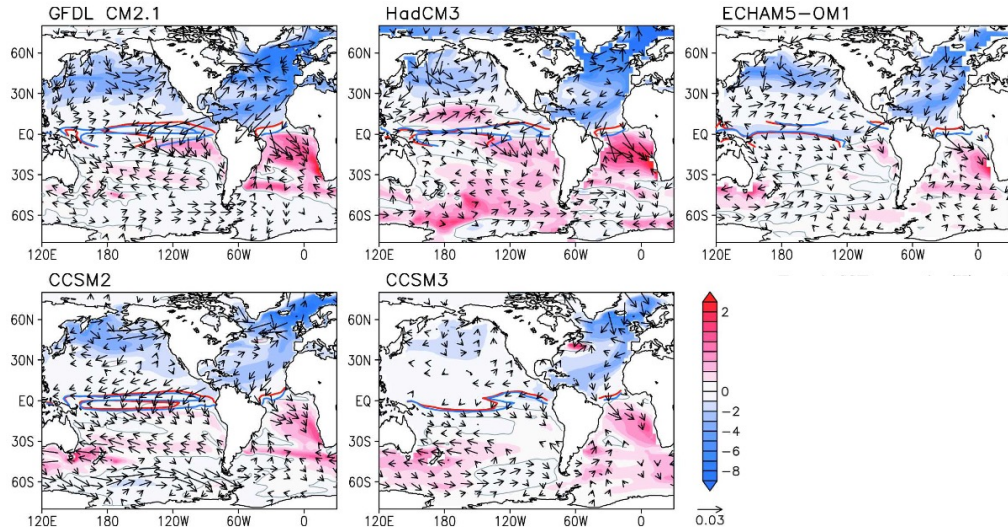
- McGregor et al. (2014)*
- Li et al. (2016)*
- Chikamoto et al. (2016)*
- Kucharski et al. (2016)*
- Ruprich-Robert et al. (2017)*

*Meehl et al. (2020)*



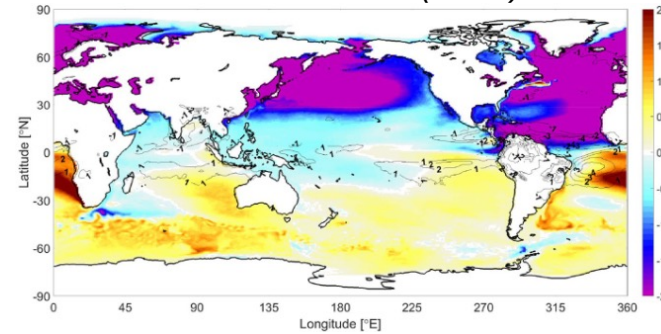
# Impact of AMOC shutdown on Pacific mean climate and ENSO

GFDL CM2.1, HadCM3, ECHAM5-OM1, CCSM2 & 3  
*Timmerman, Okumura et al. (2007)*

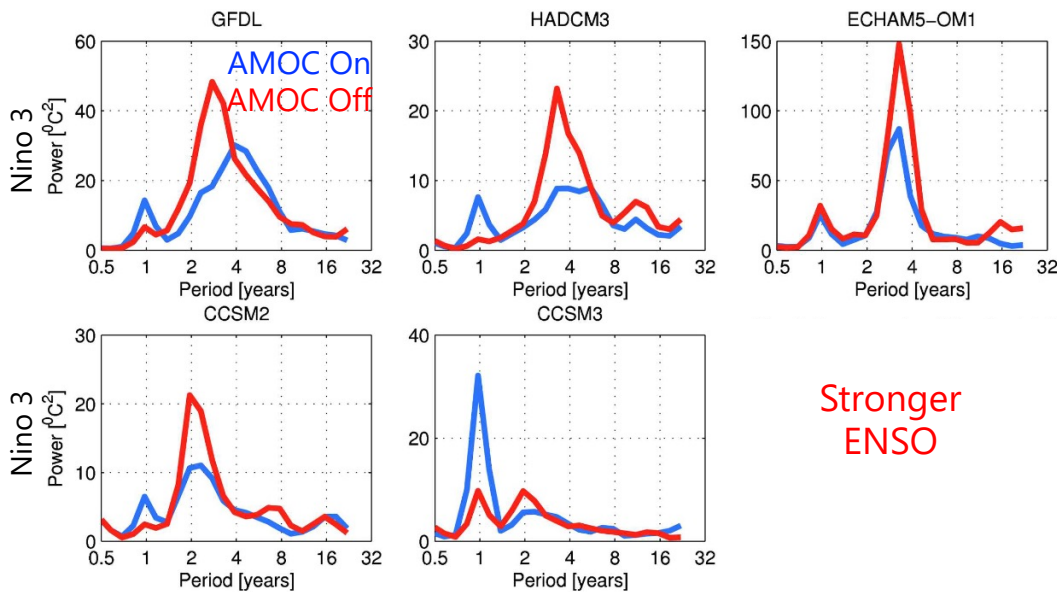
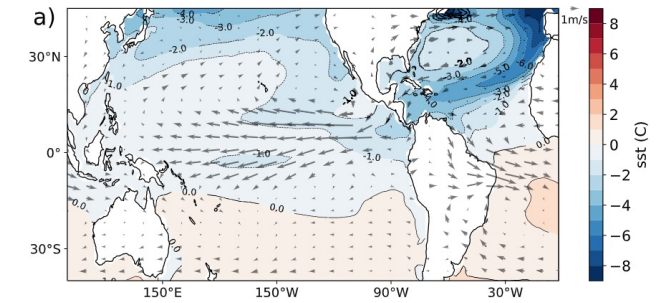


Various models' response to 1Sv freshwater forcing over the North Atlantic

HadGM3  
*Williamson et al. (2018)*



CESM1.2  
*Orihuela-Pinto et al. (2022)*

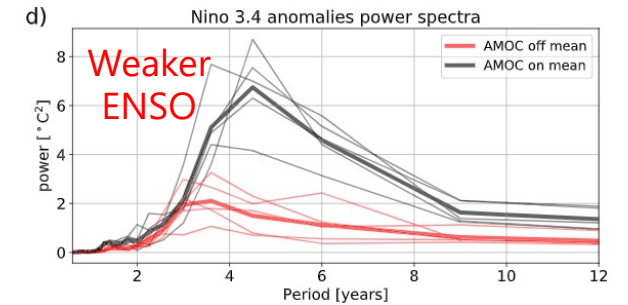


Stronger ENSO



No ENSO amplitude change

How does ENSO respond to AMOC shutdown?



Weaker ENSO

What kinds of paleoclimate proxy records are available?  
(seasonal-decadal temporal resolutions)

# Main types of paleoclimate proxy records (tropics-mid-latitudes)

## Corals

- $\delta^{18}\text{O}$  (temperature/salinity), Sr/Ca, Mg/Ca (temperature)
- High resolution (monthly-annual)
- Low age uncertainty (< 1 yr)
- Relatively short (< 100 yrs)
- Limited availability in cool tropical oceans and before 1800



## Speleothems

- $\delta^{18}\text{O}$  (precipitation/temperature), Sr/Ca, growth rate
- High resolution (sub annual)
- Age uncertainty (<  $\pm 50$  yrs)
- Continuous records (can be > 1000 yrs)
- Seasonality in climate sensitivity
- Variable water transit time, growth hiatuses





# Main types of paleoclimate proxy records (mid-latitudes-polar)

## Tree rings

- Ring width,  $\delta^{18}\text{O}$  (temperature/precipitation)
- High resolution (sub annual-annual)
- Precise dates
- Continuous records (can be > 1000 yrs)
- Widespread distribution in mid-latitudes
- Inexpensive to produce records
- Seasonality in climate sensitivity
- Muted low-frequency variability due to detrending



## Ice cores

- $\delta^{18}\text{O}$ ,  $\delta\text{D}$  (temperature)
- High resolution (annual)
- Age uncertainty (<  $\pm 50$  yrs)
- Continuous records (> 1000 yrs)
- Limited to polar and high-elevation regions





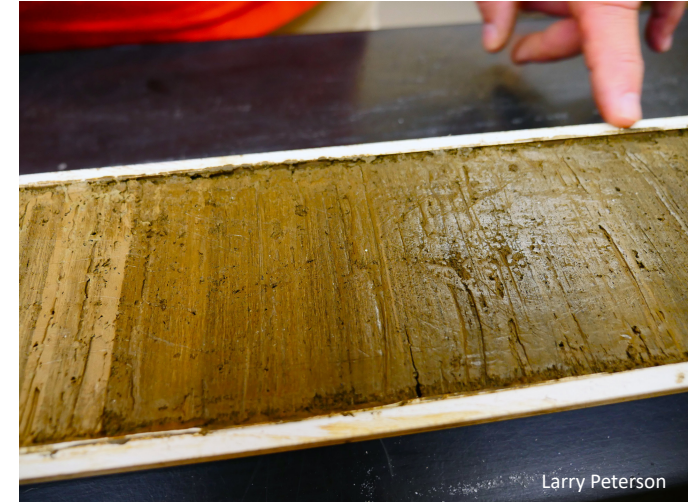
# Main types of paleoclimate proxy records

## Ocean/lake sediment cores

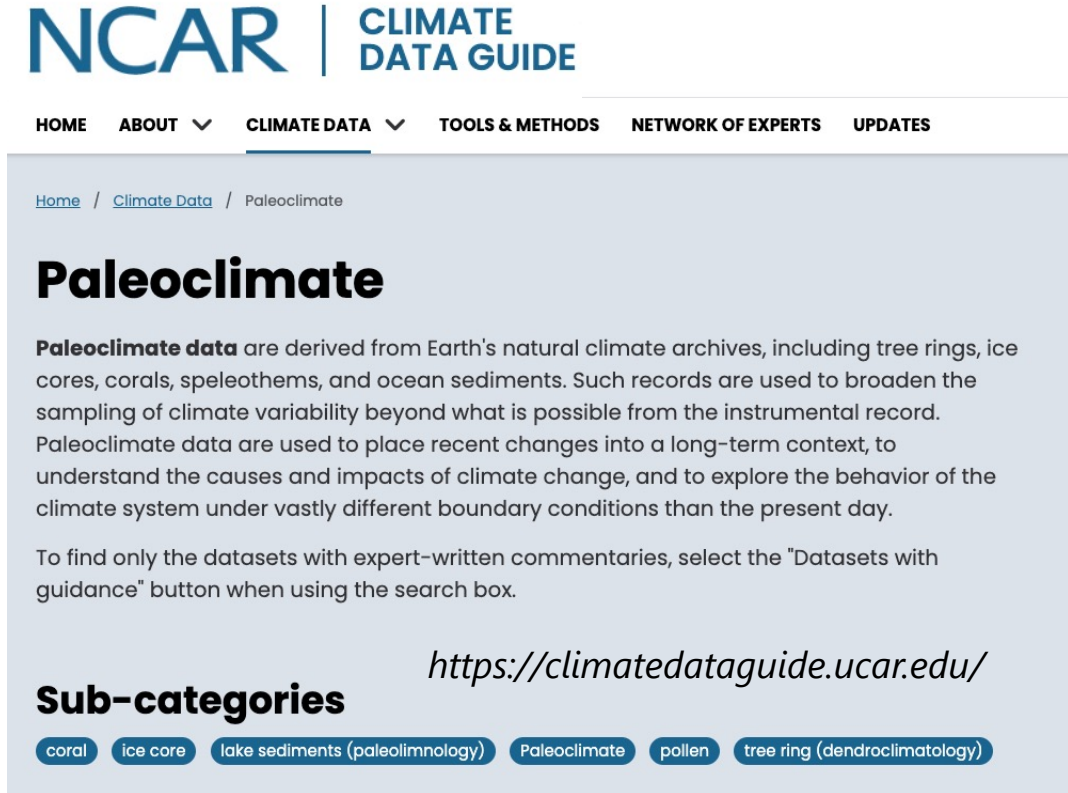
- Various quantities & climate interpretations
  - For example,
    - Chemical composition or abundance of planktonic organisms (temperature, salinity)
    - Silt grain size (ocean bottom current)
    - Titanium content (river discharge)
- Resolution depends on the sedimentation rates (annual-decadal sampling is possible)
- Fieldwork can be very expensive

## Other potential high-resolution proxies

- Bivalves, coralline algae, and other biological proxies
- Borehole temperatures



# Climate Data Guide (new paleoclimate section)



**NCAR | CLIMATE DATA GUIDE**

HOME ABOUT ▾ CLIMATE DATA ▾ TOOLS & METHODS NETWORK OF EXPERTS UPDATES

Home / Climate Data / Paleoclimate

## Paleoclimate

**Paleoclimate data** are derived from Earth's natural climate archives, including tree rings, ice cores, corals, speleothems, and ocean sediments. Such records are used to broaden the sampling of climate variability beyond what is possible from the instrumental record. Paleoclimate data are used to place recent changes into a long-term context, to understand the causes and impacts of climate change, and to explore the behavior of the climate system under vastly different boundary conditions than the present day.

To find only the datasets with expert-written commentaries, select the "Datasets with guidance" button when using the search box.

<https://climatedataguide.ucar.edu/>

### Sub-categories

coral ice core lake sediments (paleolimnology) Paleoclimate pollen tree ring (dendroclimatology)

- Developed in collaboration with the CLIVAR TBI RF Paleoclimate Working Group
- Expert guidance to various topics and datasets
- More new contents are under construction

Also, see a comprehensive review paper by *Jones et al. (2009)*



### Tree-ring width chronologies: An overview of their use as climate proxies and of available databases

Years of record *N/A*

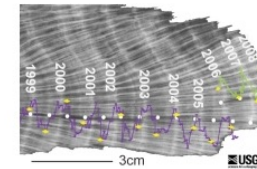
The width of an annual tree ring is a very simple indicator of the character of that year's weather, but collectively the global network of tree-ring width...

#### Main variables and Earth System components

*N/A*

Formats *N/A* Timestep Annual Domain Global Collections *N/A*

Experts contributing reviews St. George, Scott



### Coral geochemical records: An overview of their use as climate proxies and of available databases

Years of record *N/A*

Coral records are one of the main types of high-resolution (annual to sub-annual) paleoclimate proxies, providing timeseries of environmental conditions reaching...

#### Main variables and Earth System components

Atmosphere Evaporation Evaporation-Precipitation Precipitation Ocean Salinity SST - sea surface temperature

Formats *ascii* | HTML Table | Linked Paleo Data (LiPD) | Matlab Timestep *N/A*

Domain Atlantic Ocean, Indian Ocean, Pacific Ocean, Tropics Collections *N/A*

Experts contributing reviews Lawman, Allison



### An overview of paleoclimate information from high-resolution lake sediment records: Strengths, limitations and key databases

Years of record *N/A*

Accumulated sediments at the bottom of lakes are invaluable archives of past climate and environmental change. These sediments contain a variety of physical,...

#### Main variables and Earth System components

Atmosphere Air Temperature Precipitation Biosphere Pollen Land

Formats *ascii* | *csv* | Linked Paleo Data (LiPD) Timestep Annual, Decadal, Irregular Domain Global Collections *N/A*

Experts contributing reviews Larocca, Laura | Broadman, Ellie

How many paleoclimate proxy records do we have?  
(0-2000CE)



# Paleoclimate data archives at NOAA NCEI and PANGAEA



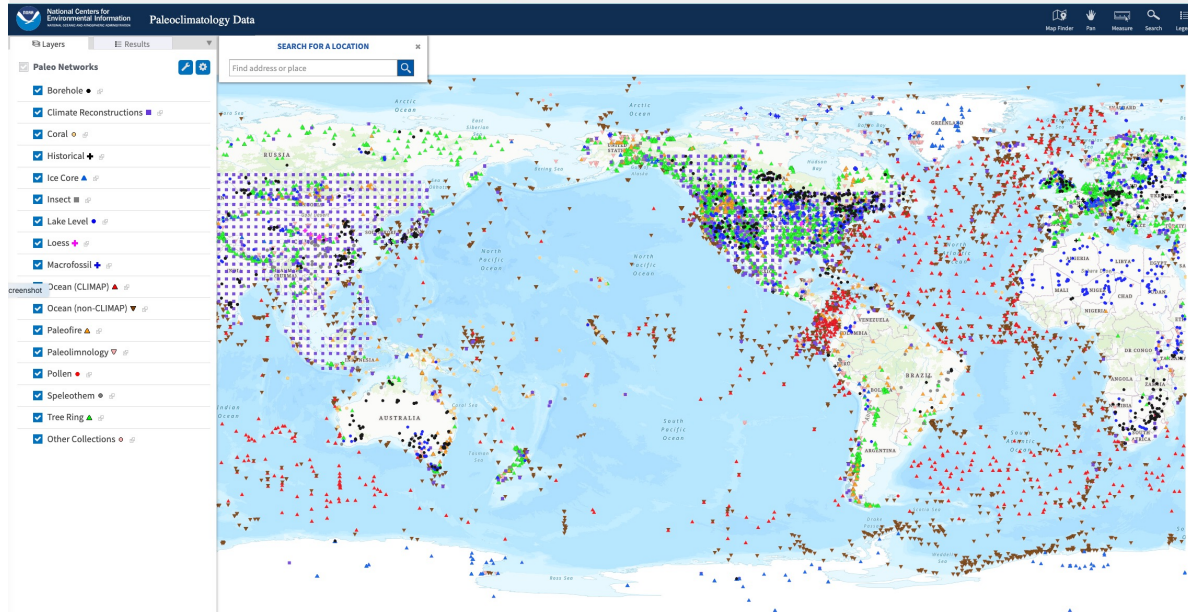
National Centers for Environmental Information  
NATIONAL OCEANIC AND ATMOSPHERIC ADMINISTRATION

Paleo Data Search

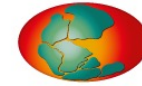


## Paleo Data Search

NCEI offers search and download of Paleoclimatic proxy data and Paleoclimate Reconstructions from the NOAA/World Data Service for Paleoclimatology archives. Over 10,000 data sets are available, derived from natural sources such as tree rings, ice cores, corals, and ocean and lake sediments. Use the General search box or Advanced search to improve filtering by investigators, locations, keywords and time periods. Data files for the entire result set, or a subset of it, can be downloaded as a single compressed file. A web service is also provided that you can use to get Paleo studies' metadata in JSON format. See the API help page for details and examples. You can also see some tips for using this page by clicking [here](#).

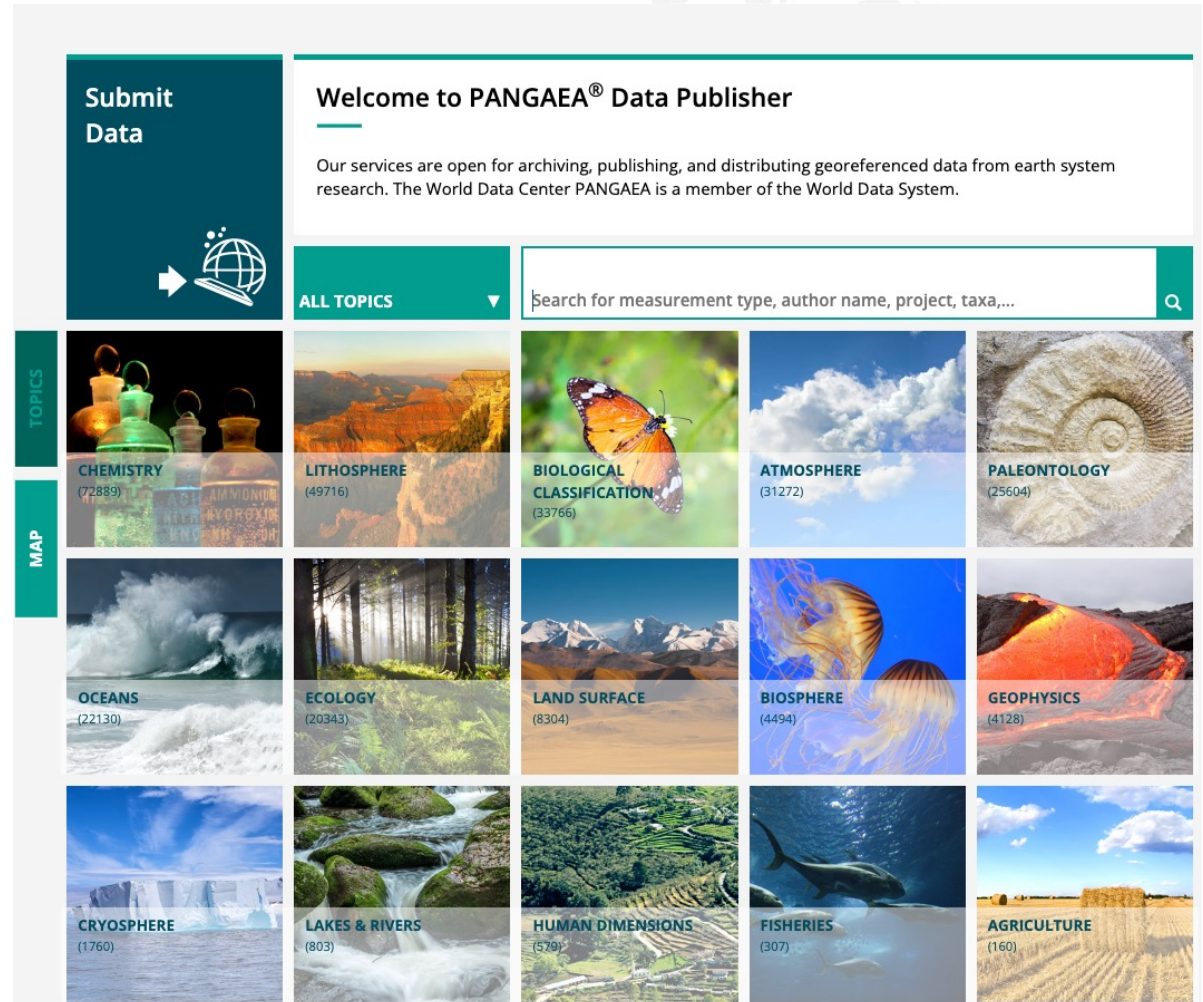


<https://www.ncei.noaa.gov/products/paleoclimatology>



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Our services are open for archiving, publishing, and distributing georeferenced data from earth system research. The World Data Center PANGAEA is a member of the World Data System.

ALL TOPICS

Search for measurement type, author name, project, taxa,...

TOPICS	MAP
CHEMISTRY (72889)	LITHOSPHERE (49716)
BIOLOGICAL CLASSIFICATION (33766)	ATMOSPHERE (31272)
PALEONTOLOGY (25604)	OCEANS (22130)
ECOSYSTEMS (22130)	ECOLOGY (20343)
LAND SURFACE (8304)	BIOSPHERE (4494)
GEOPHYSICS (4128)	CRYOSPHERE (1760)
LAKES & RIVERS (803)	HUMAN DIMENSIONS (579)
FISHERIES (307)	AGRICULTURE (160)

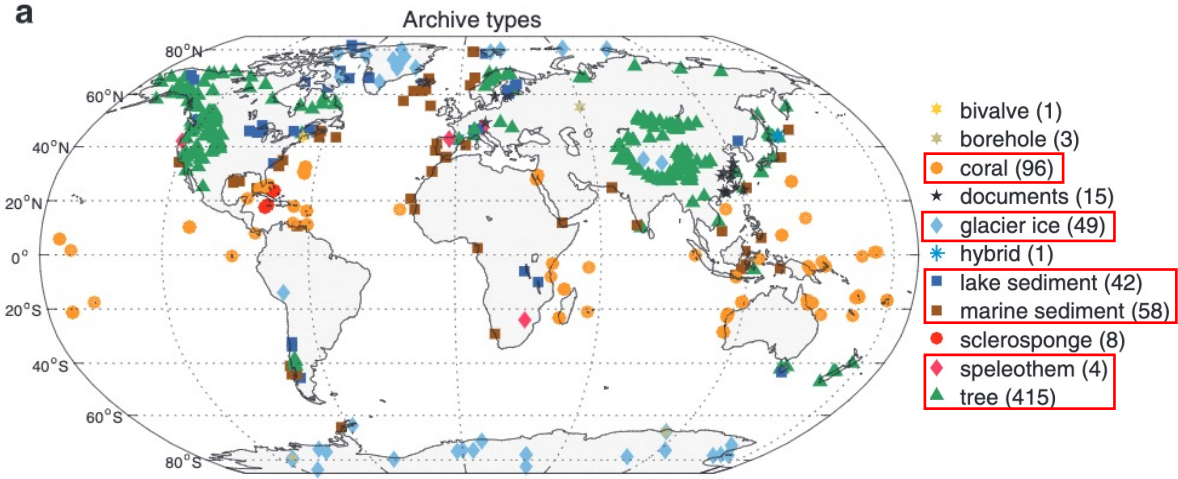
<https://www.pangaea.de>



# PAGES2k databases

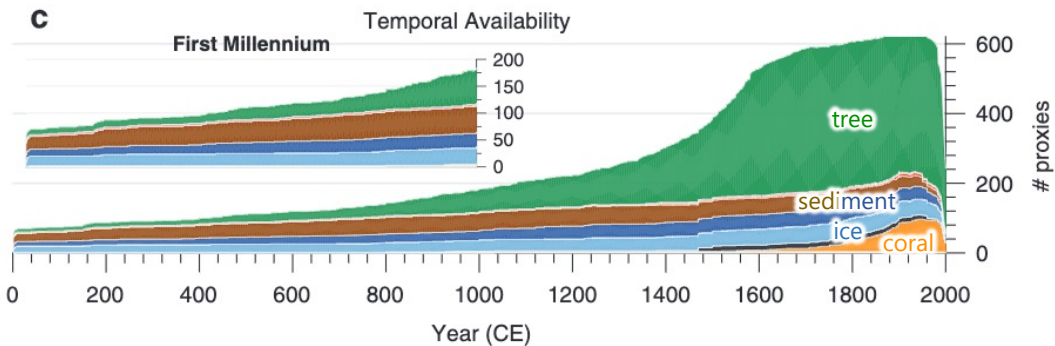
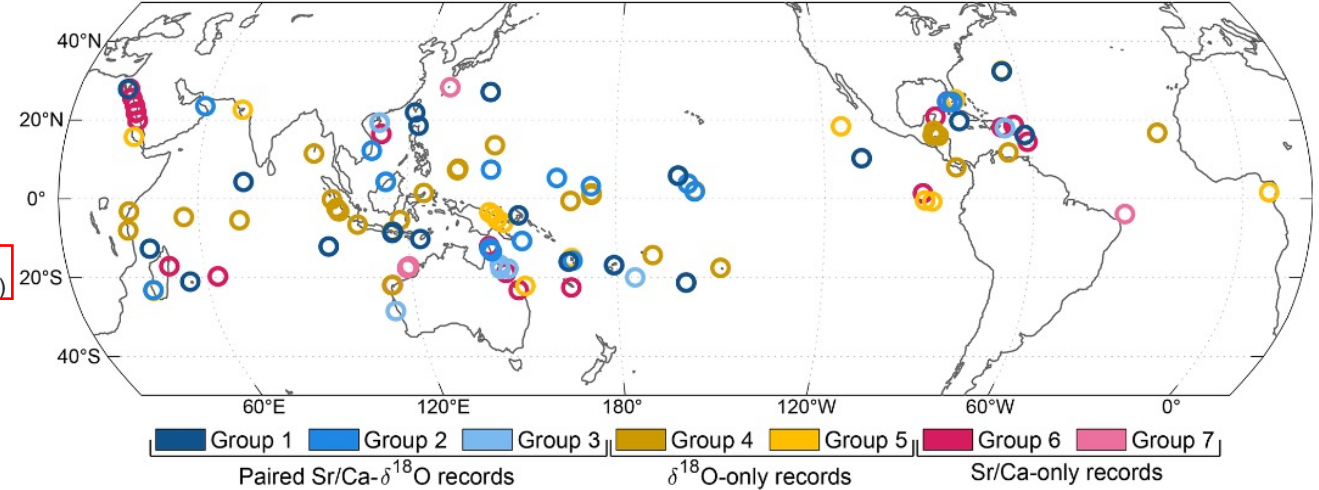
## PAGES2k—Temperature-sensitive proxies

PAGES2k 2.0.0 (692 records from 648 sites)

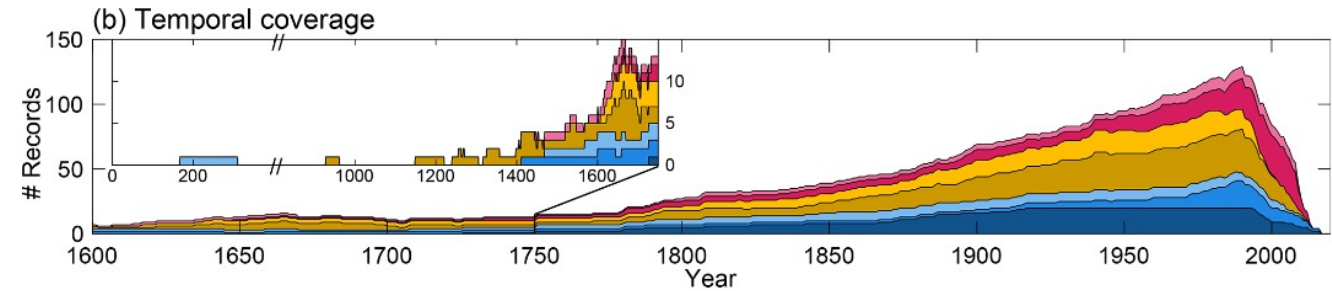


## CoralHydro2k—Coral Sr/Ca & $\delta^{18}\text{O}$ (SST & SSS)

(a) CoralHydro2k database - 233 total timeseries



*Emile-Geay et al. (2017)*



*Walter et al. (2023)*

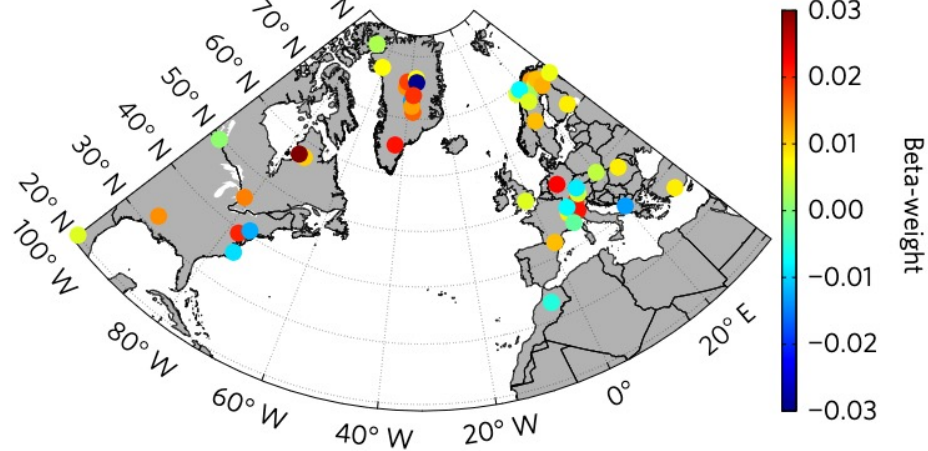
Available in the Linked Paleo Data format (readable in Python, MATLAB, and R) from NOAA NCEI's paleoclimate data archive.

Other PAGES2k databases include SISAL (speleothem; *Comas-Bru 2020*) and Iso2k ( $\delta^{18}\text{O}$  &  $\delta\text{D}$ ; *Konecky et al. 2020*)

Examples of AMV/TBI research using paleoclimate proxy records

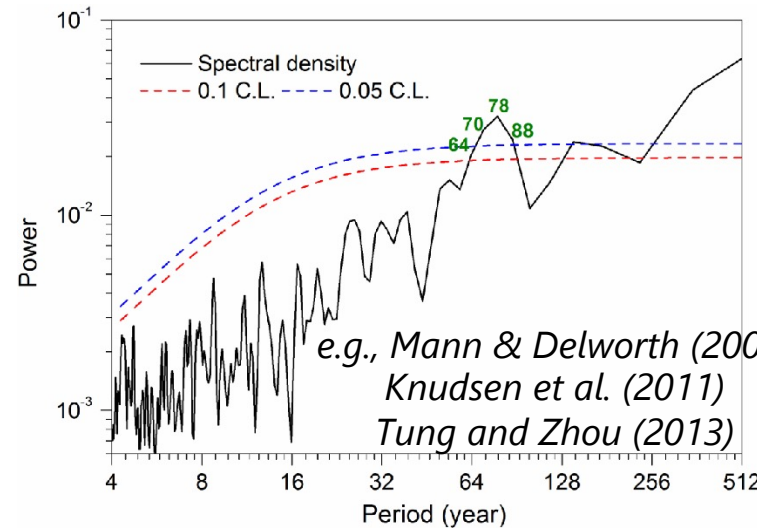
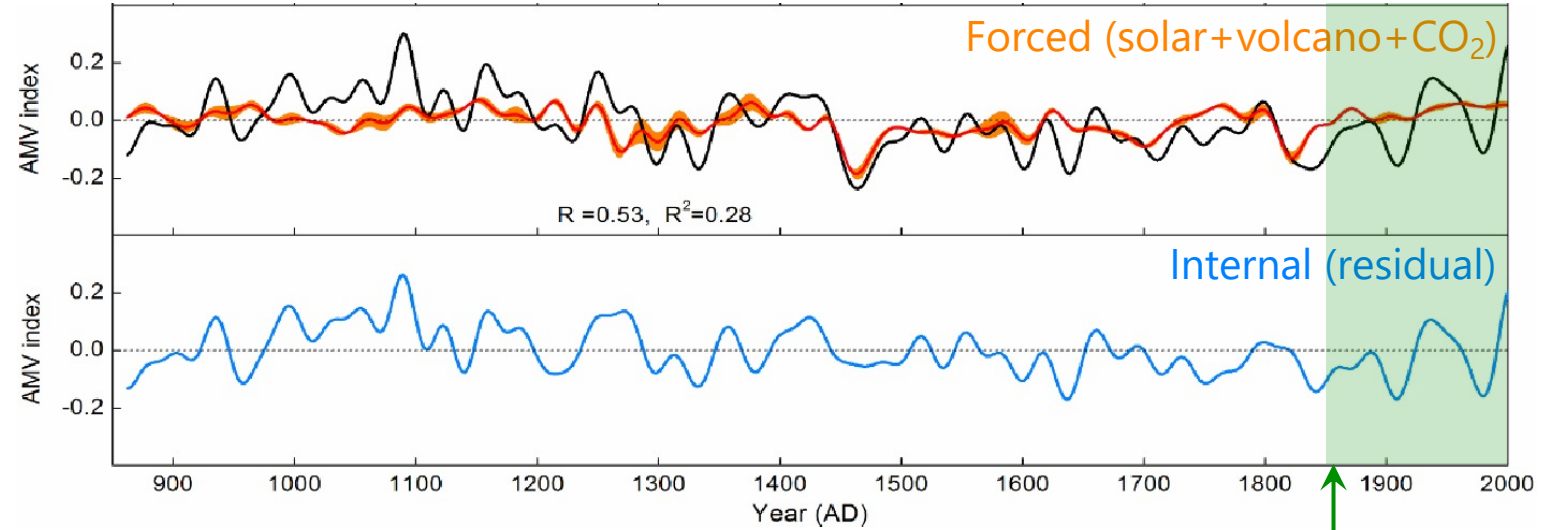
# Role of external forcing in AMV

Locations and weights of annual tree ring and ice core data used for AMV reconstruction



Wang et al. 2017

Reconstructed AMV index



e.g., Mann & Delworth (2000)  
Knudsen et al. (2011)  
Tung and Zhou (2013)

Potential role of anthropogenic aerosols  
e.g., Booth et al. (2012), Si and Hu (2017),  
Bellomo et al. (2018)

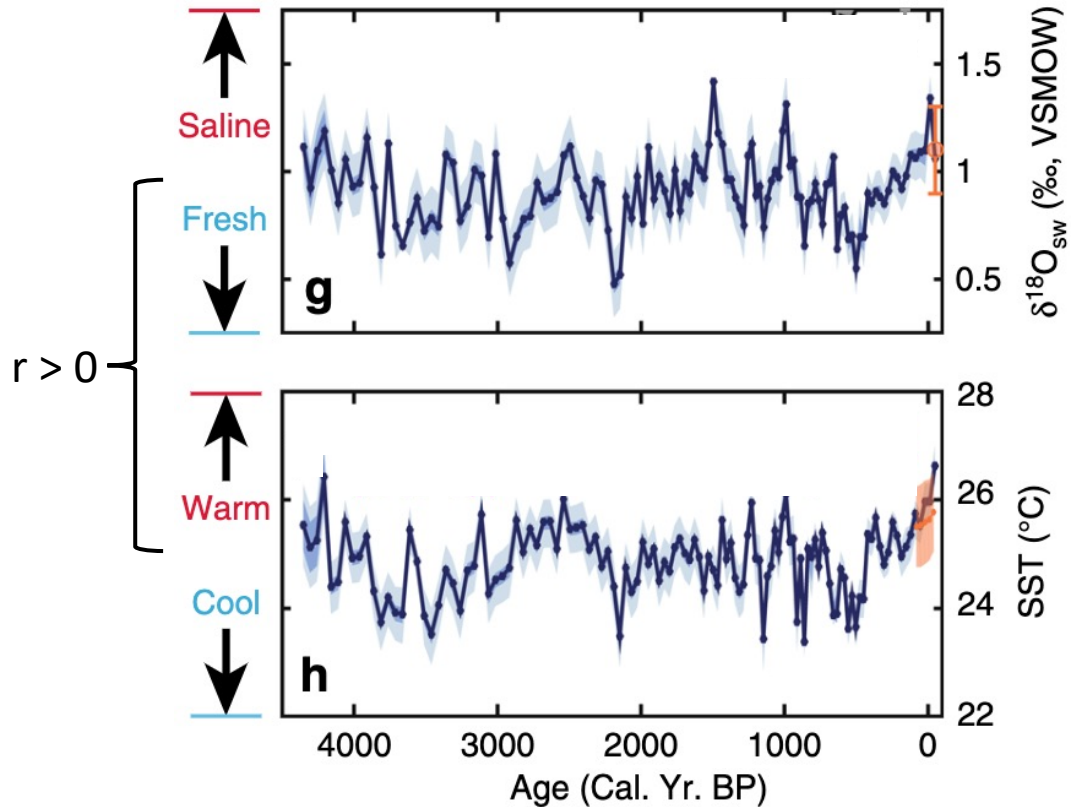
No significant multidecadal peaks  
e.g., Rahmstorf et al. (2015)  
Shigh et al. (2018)



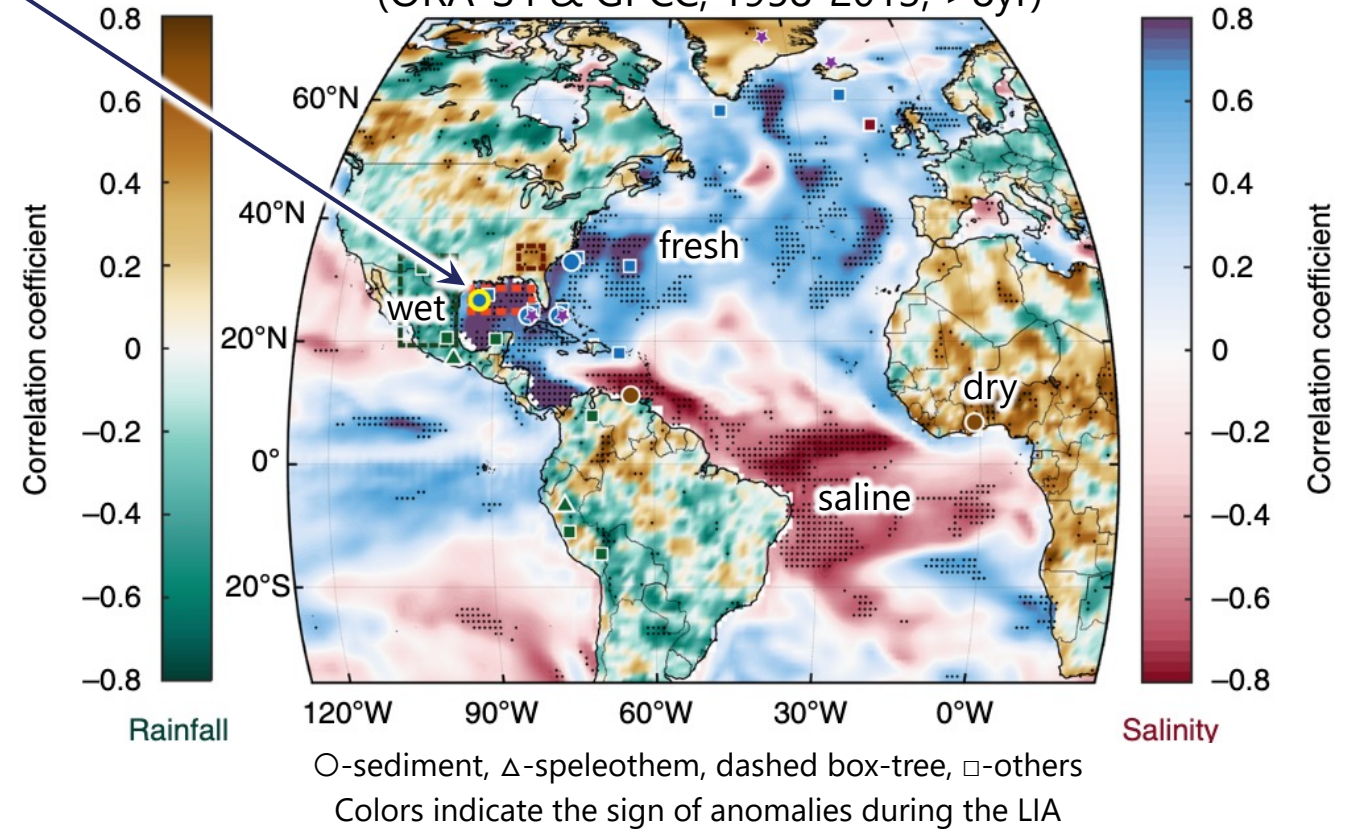


# Role of salinity in centennial Atlantic variability

SST and sea surface salinity (SSS) reconstructions based on ocean sediment cores from the northern Gulf of Mexico (Mg/Ca and  $\delta^{18}\text{O}$  of planktic foraminifer)



SSS and land precipitation correlations with the northern Gulf of Mexico SSS index (ORA-S4 & GPCC, 1958-2013, >8yr)

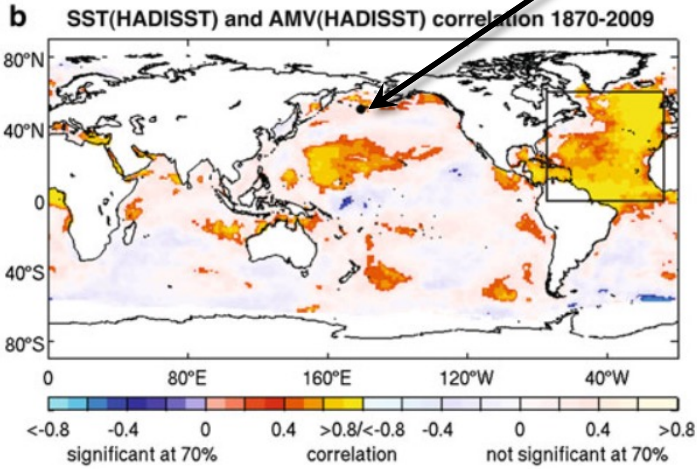


*Thirumalai, Okumura et al. (2018)*

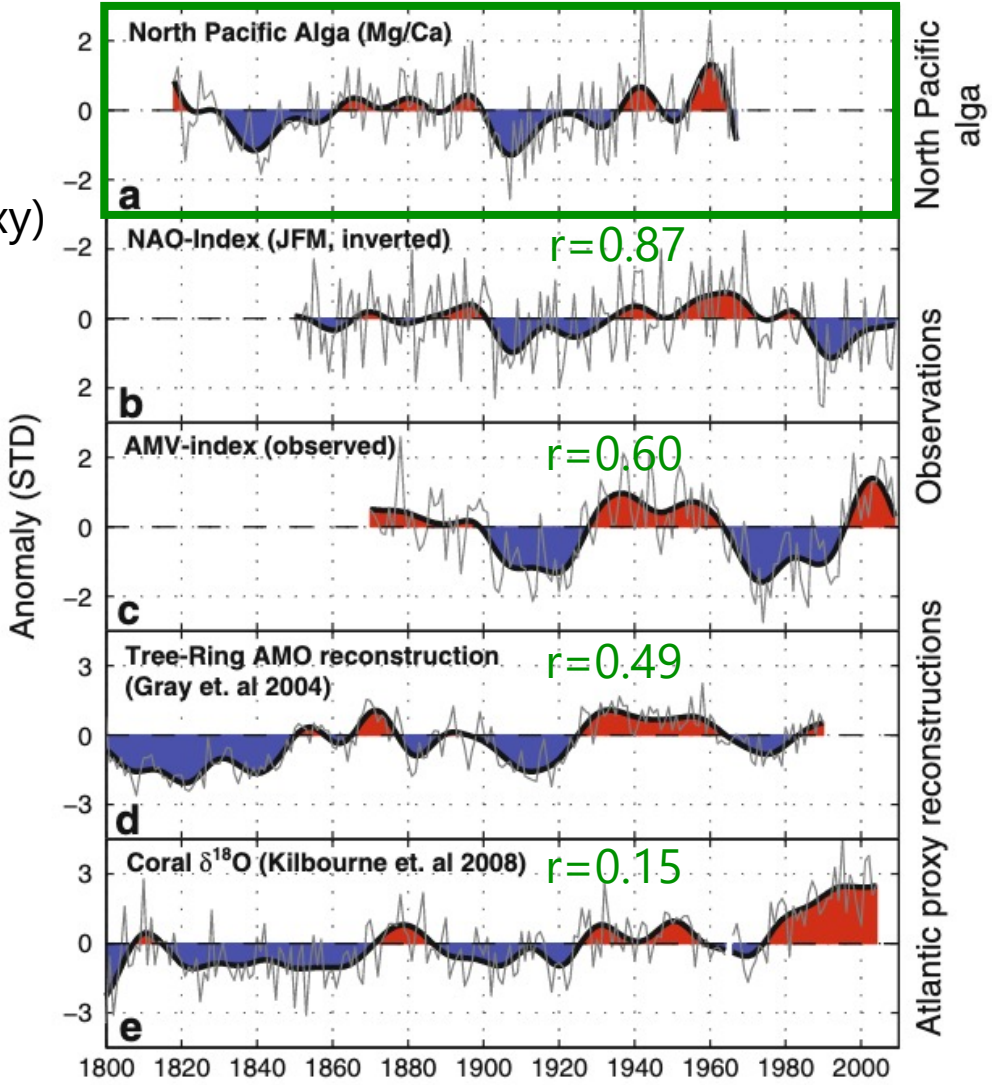
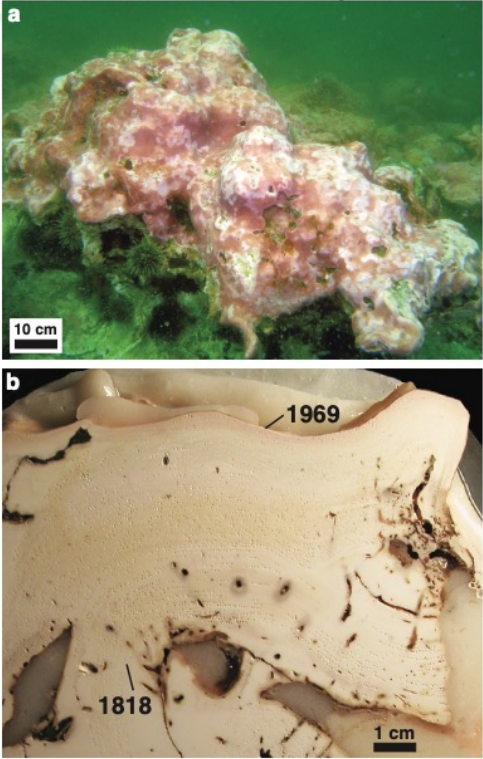


# Atlantic-Pacific linkage in decadal climate variability

Coralline algae Mg/Ca record from the Aleutian Islands (temperature proxy)

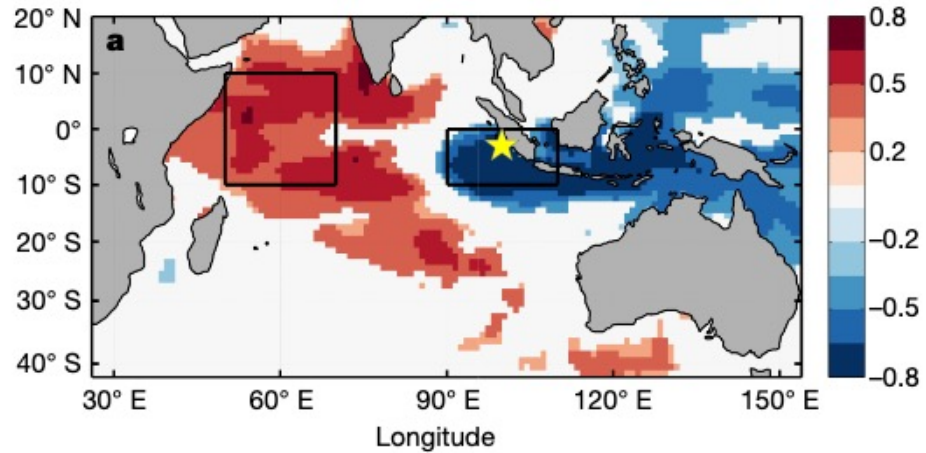


Hetzinger et al. (2012)

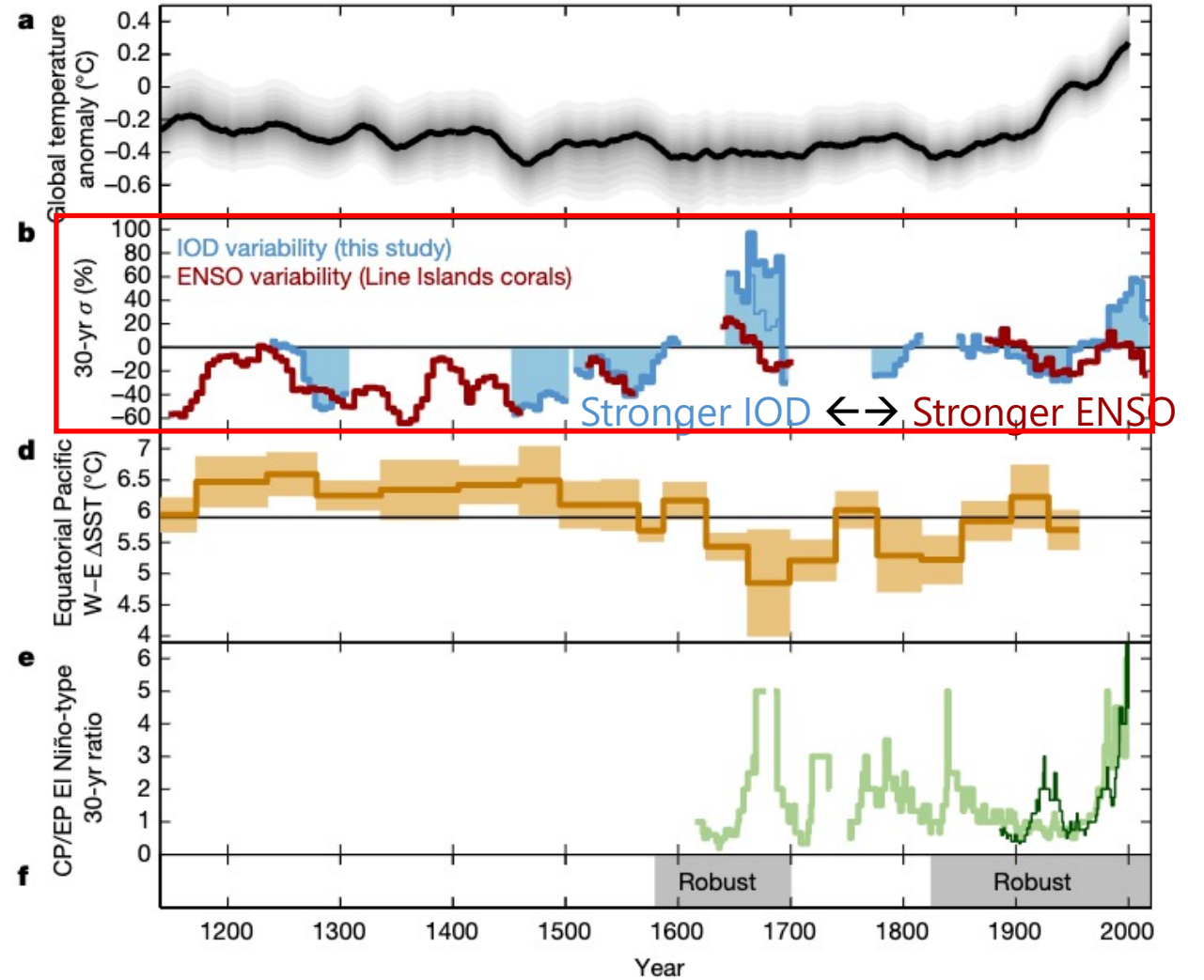


# Linkage between decadal modulation of ENSO and IOD

Modern/fossil coral  $\delta^{18}\text{O}$  from offshore of Sumatra  
( $r=0.79$  with Jul-Dec IOD index, 1982-2000)

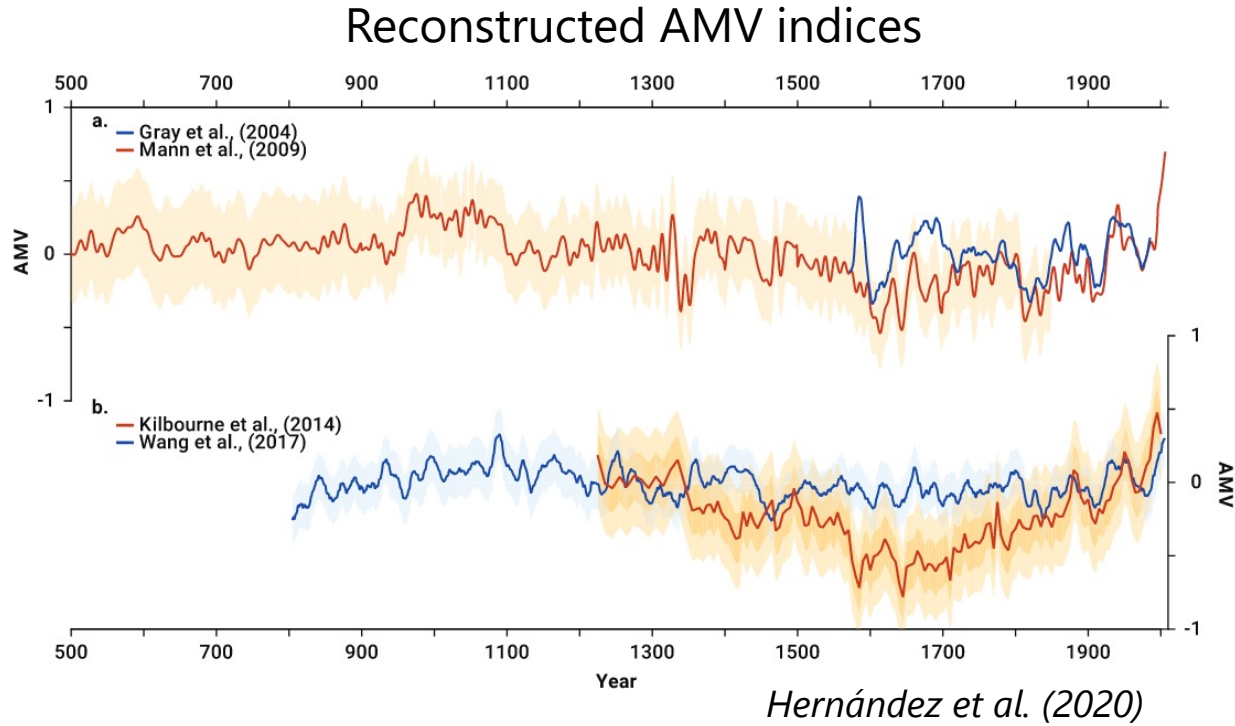


*Abram et al. (2020)*



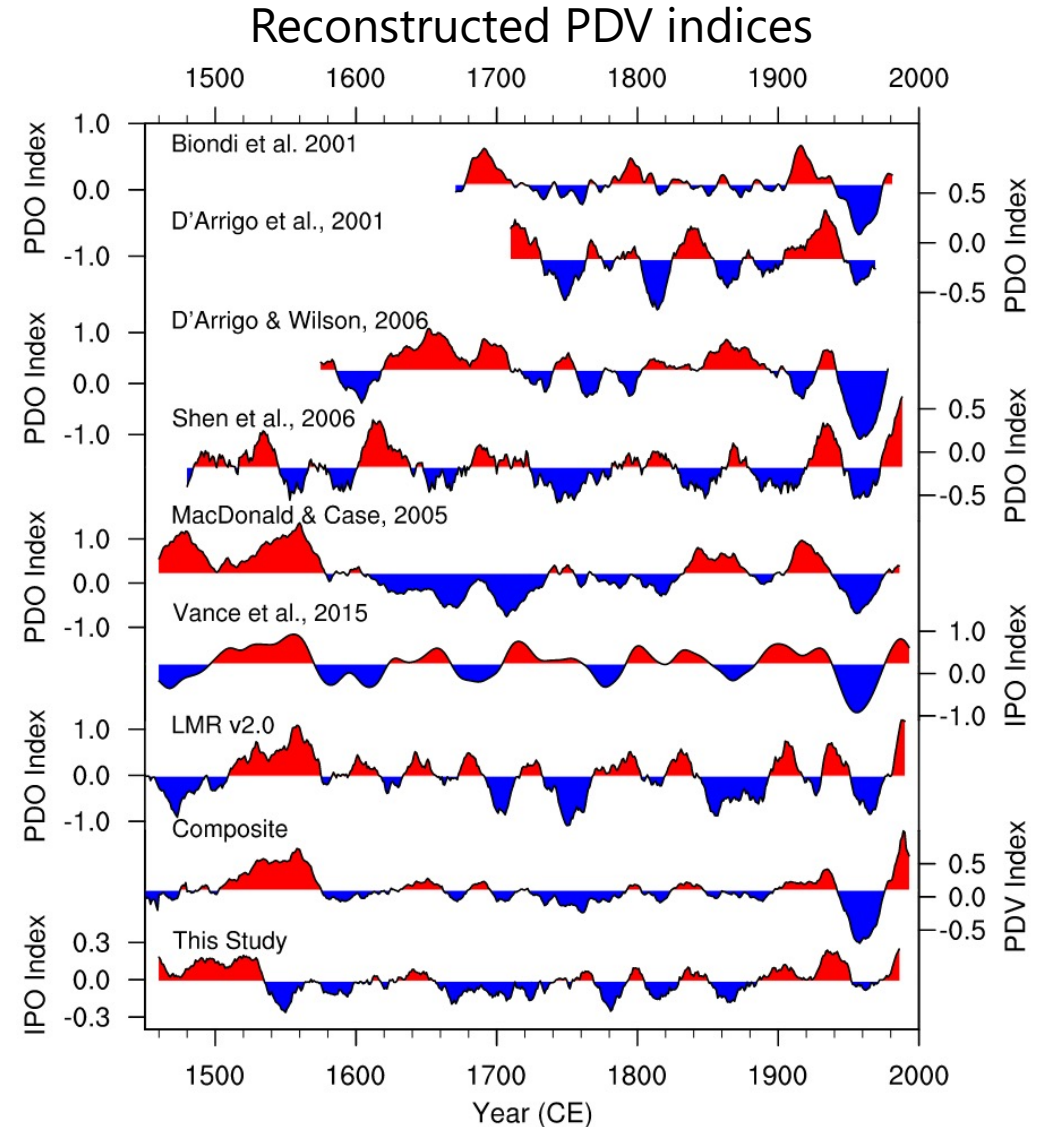
How well can we reconstruct modes of climate variability?

# Inconsistencies among reconstructions of climate modes



“Paleo-Spaghetti” (*Henley 2017*)

These inconsistencies are likely to arise from different proxies and methods used for reconstruction.

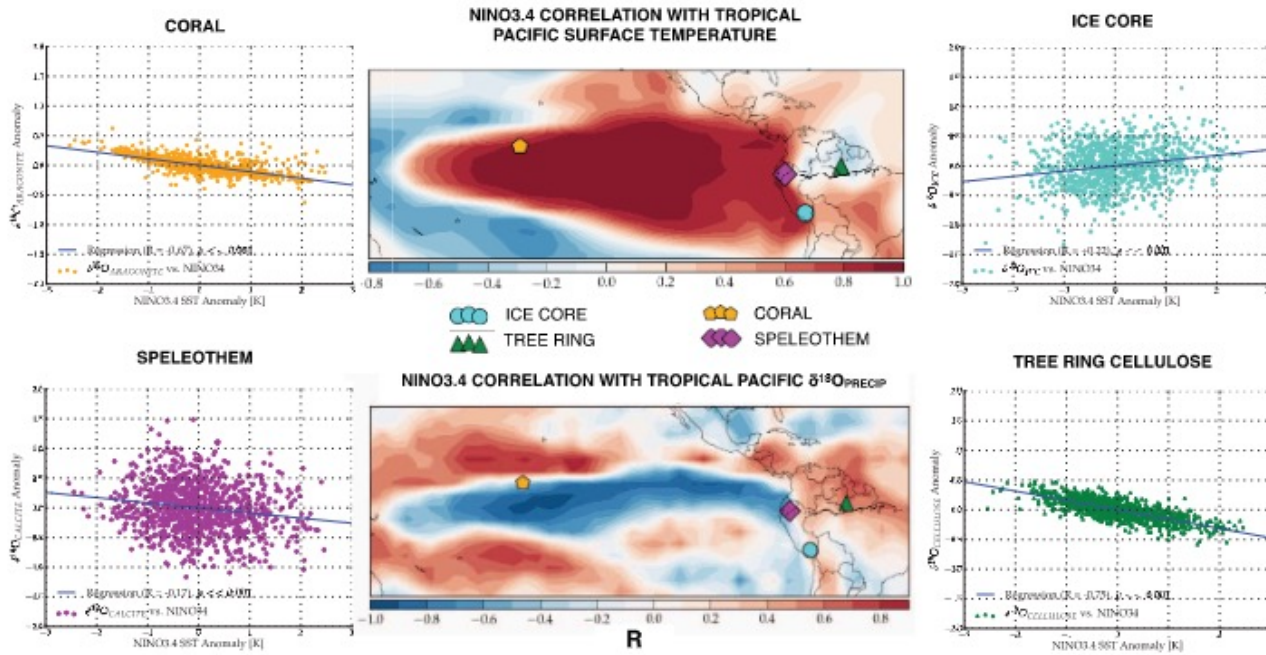
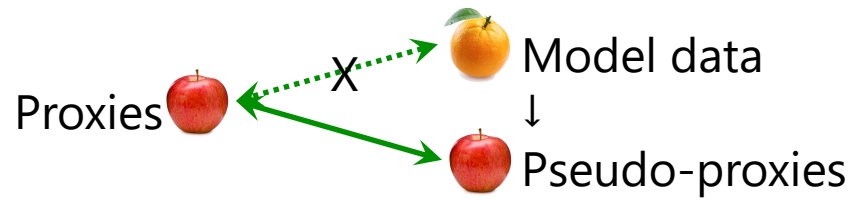


*Porter et al. (2021)*



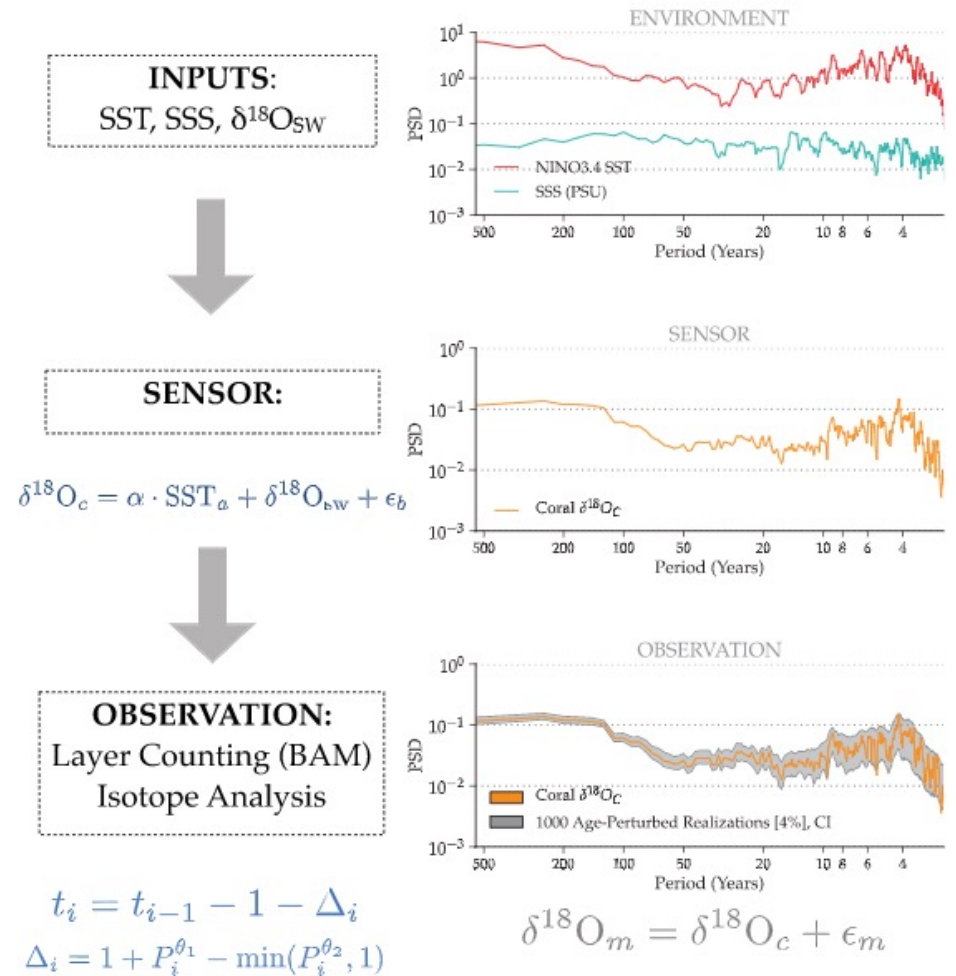
Is there a better method to reconstruct climate modes?  
(paleoclimate reanalysis = proxy + model)

# Proxy system models



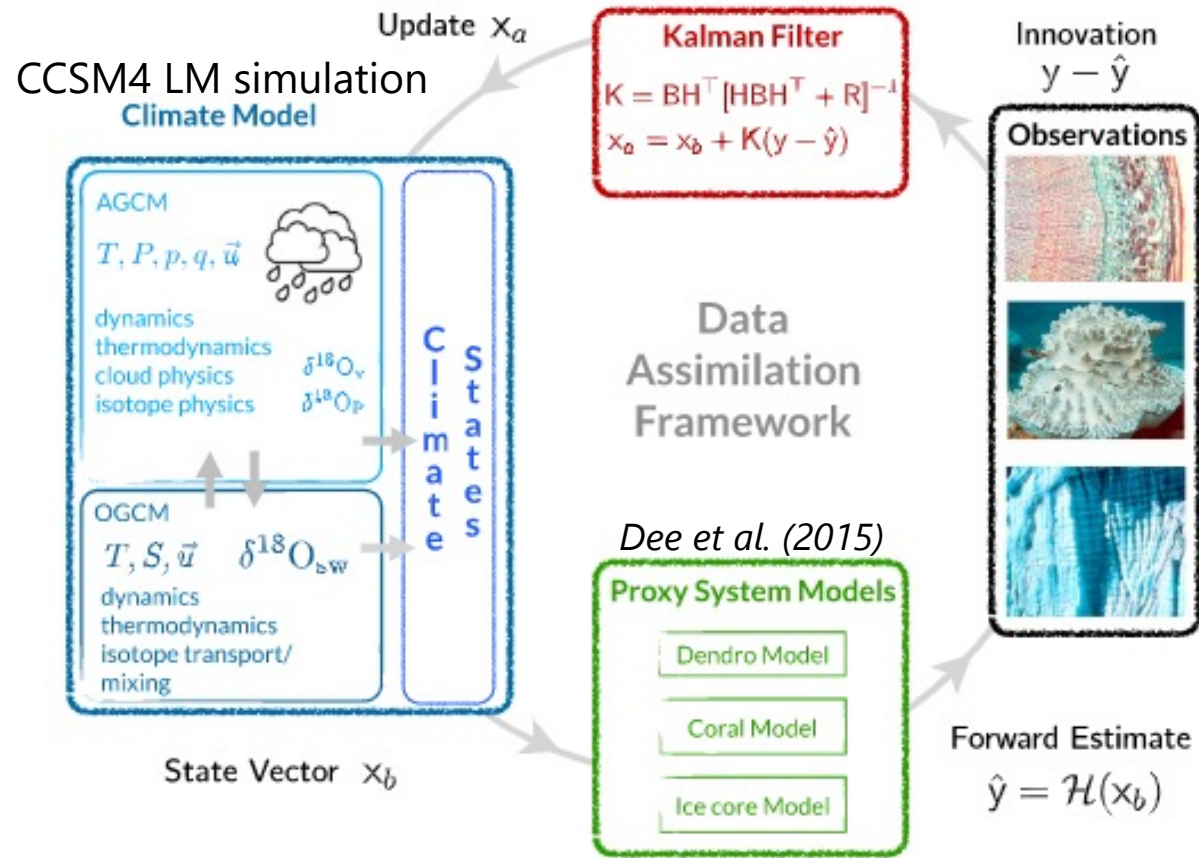
## PROXY SYSTEM MODEL: CORAL $\delta^{18}\text{O}$

Simulated MTM Spectra for each Signal Transformation, Palmyra Island



Dee et al. (2015)

# Paleoclimate data assimilation (offline)



**Figure 1.** Conceptual framework for the Last Millennium Reanalysis, outlining our paleoassimilation approach. Starting from the prior (a collection of simulated climate states) from which random draws are pulled, the states are mapped to proxy space via a proxy system model (PSM). These predictions  $\hat{y}$  are compared to the actual proxy measurements  $y$  to compute the innovation,  $\hat{y} - y$ . These innovations are then used to update the prior via the Kalman filter equations, which also update the error covariance. The cycle is repeated many ( $10^4$ ) times to sample the distribution of the prior ensemble.

*Hakim et al.  
(2016)*

## Last Millennium Reanalysis (LMR)

*Hakim et al. (2016), Tardif et al. (2019)*

544 proxies (temperature, seasonal-annual)  
→ 2-deg annual dataset for 0-2000CE

## Paleo Hydrodynamics Data Assimilation (PHYDA)

*Steiger et al. (2018)*

2978 proxies (hydroclimate, seasonal-annual)  
→ 2-deg annual/seasonal dataset for 0-2000CE

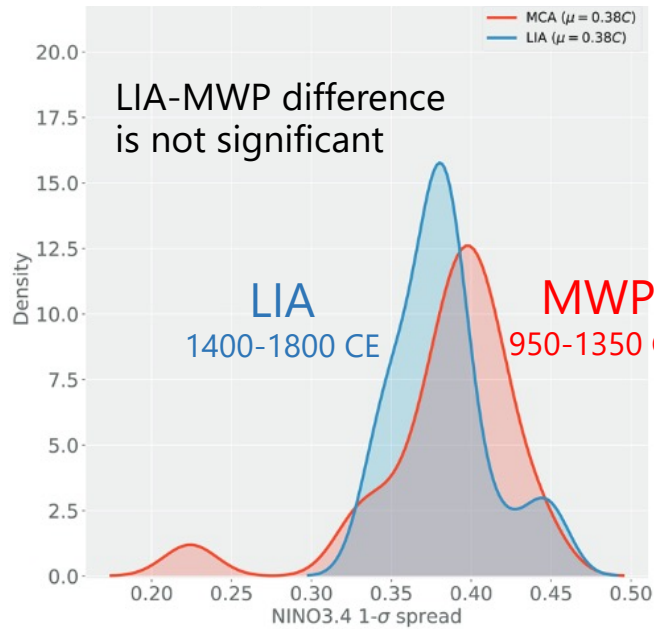
Both datasets are available from the NOAA NCEI's paleoclimate data archive.



# ENSO during the Little Ice Age and Medieval Warm Period in LMR

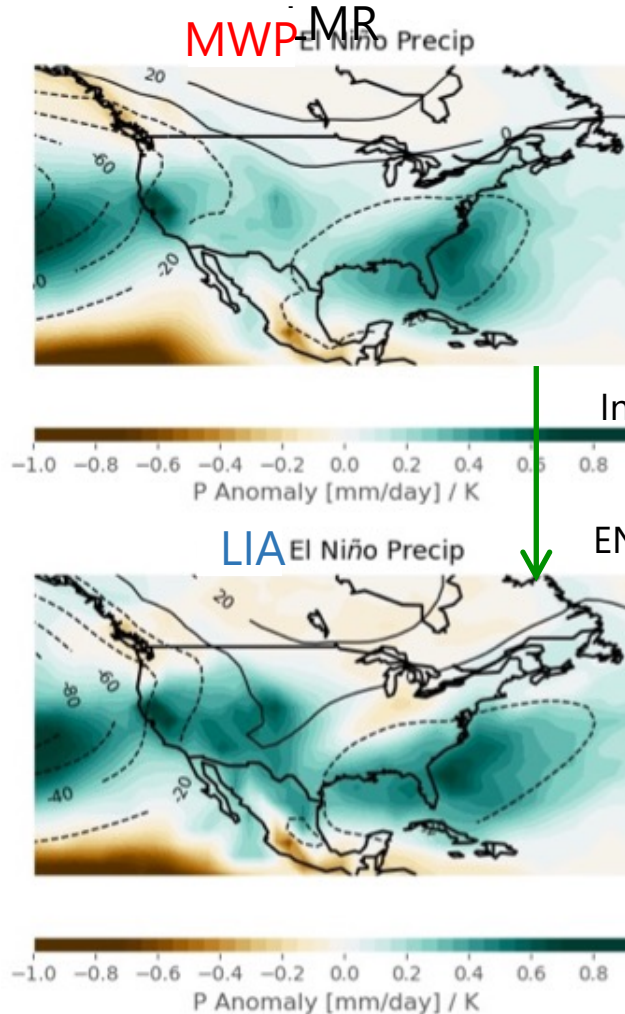
*Li et al. (2011)* suggest ENSO was stronger during LIA than MWP based on N American tree ring records

Distribution of Nino3.4 SD in the LMR ensemble

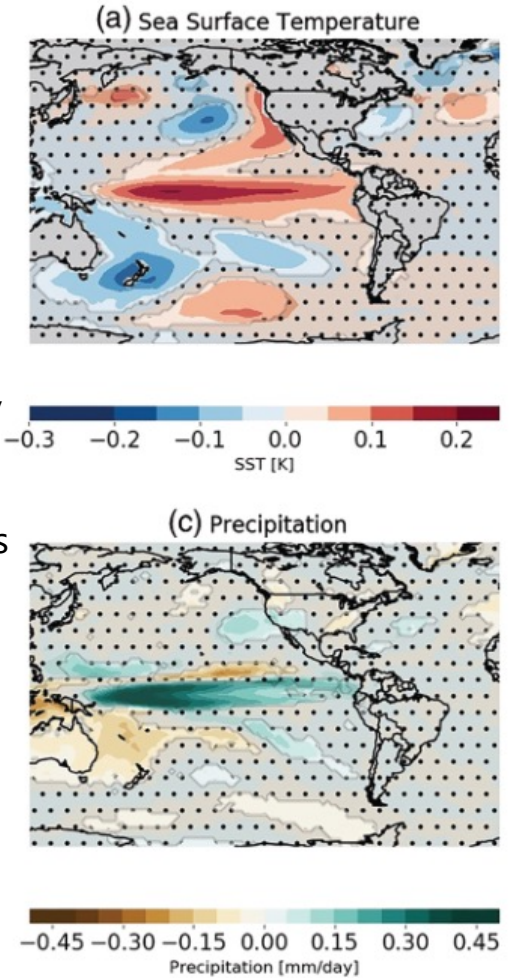


*Dee, Okumura et al. (2020, GRL)*

El Niño teleconnection in

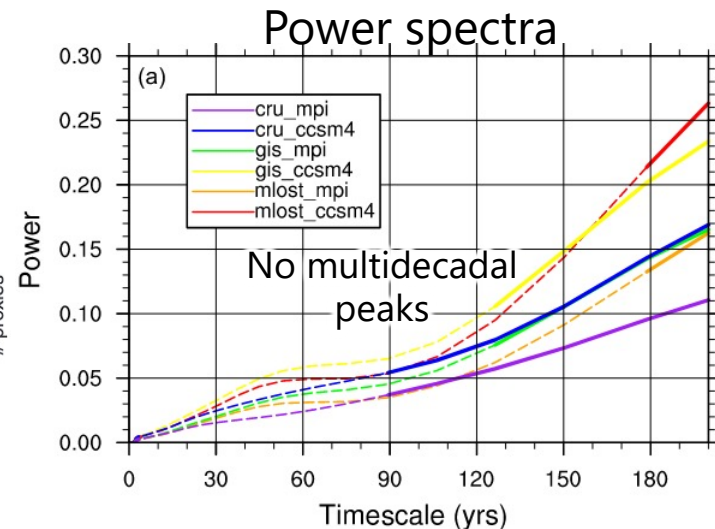
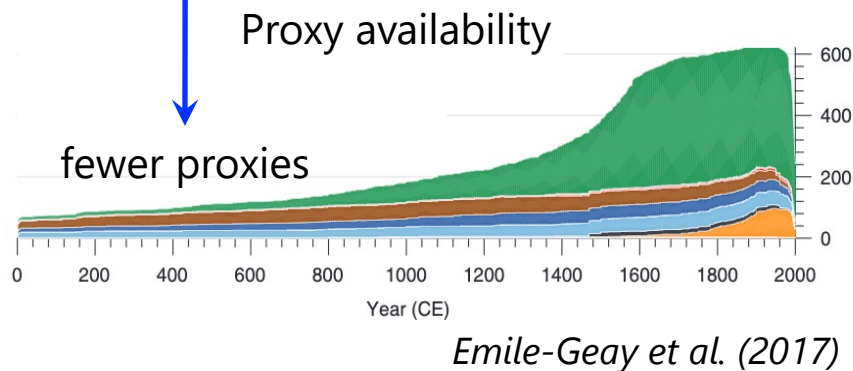
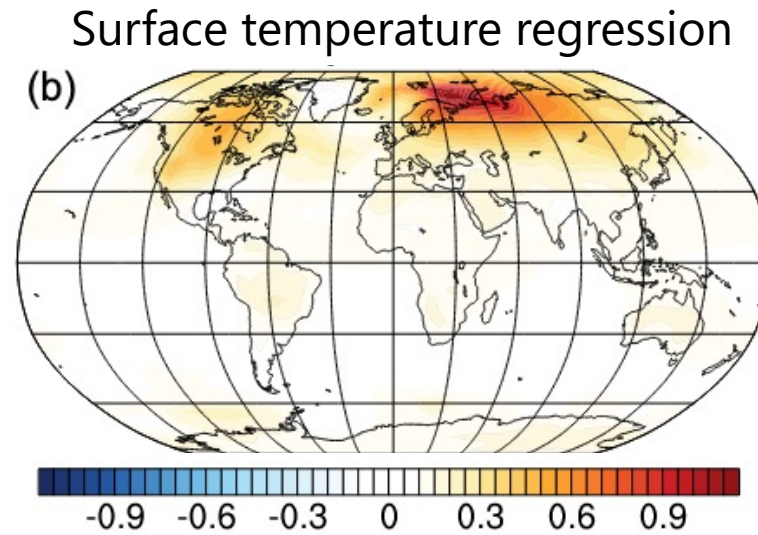
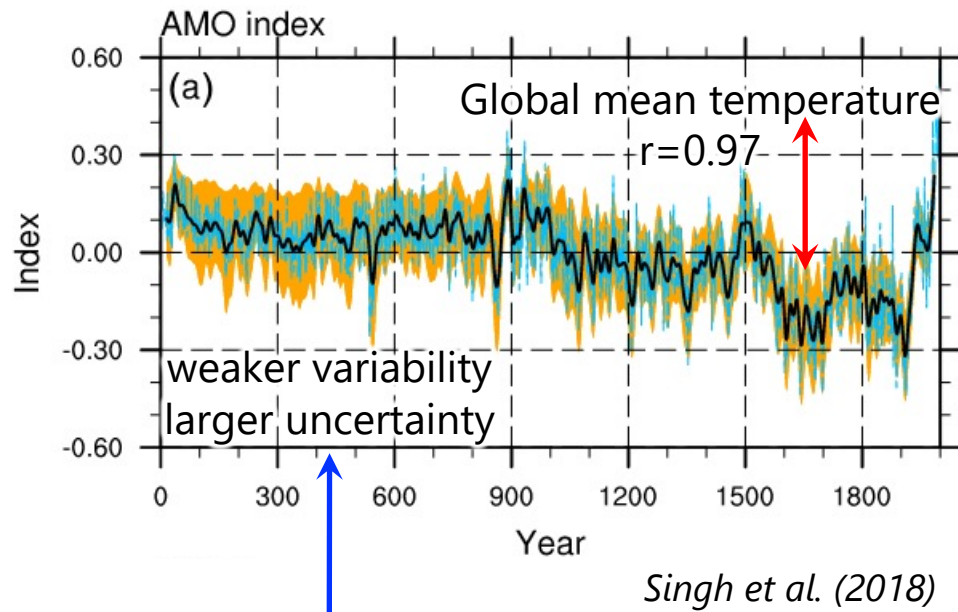


LIA-MWP mean state change in LMR





# No Atlantic "multidecadal" variability in LMR



A way forward:

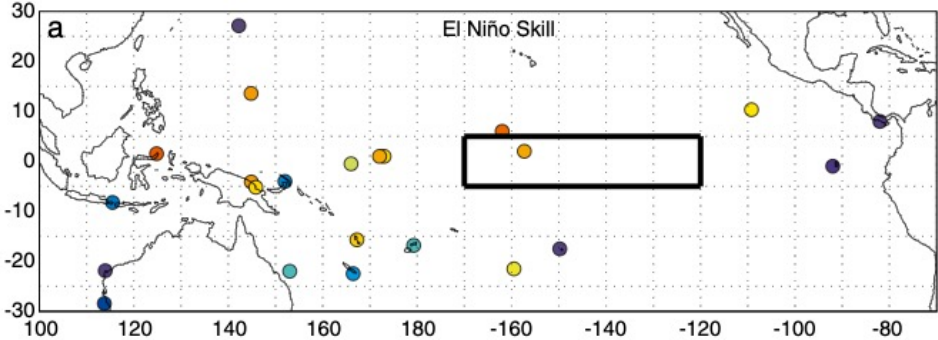
- 1) Mechanistic understanding of reconstruction skills

# Asymmetric skills of corals in detecting El Niño and La Niña

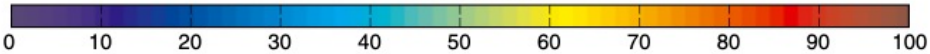
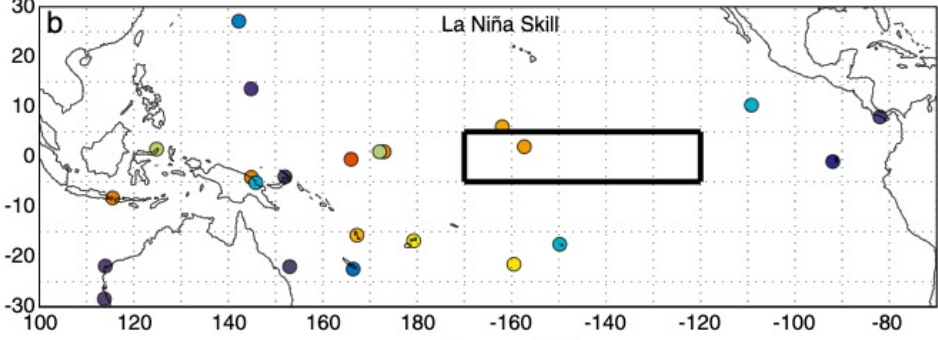
ENSO event detection skills of pseudo coral  $\delta^{18}O$  records derived from observed SST and SSS data

$$\delta^{18}O_{anom} = a_1 SST_{anom} + a_2 SSS_{anom}$$

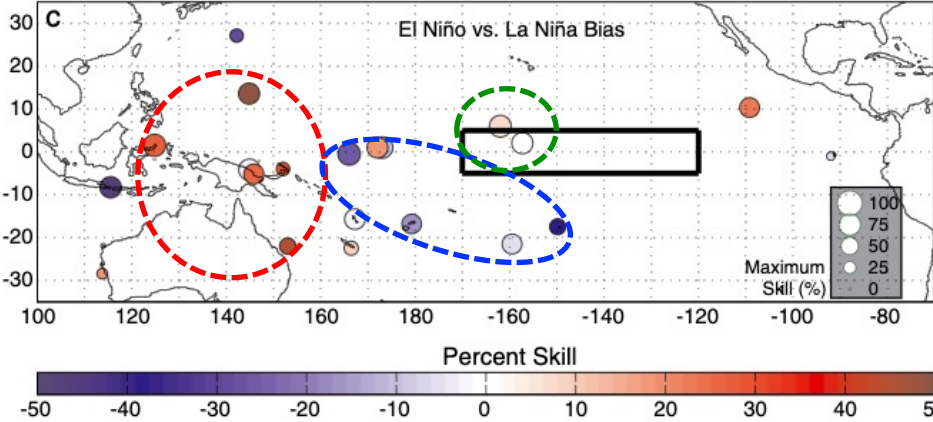
El Niño skill



La Niña skill



El Niño skill – La Niña skill

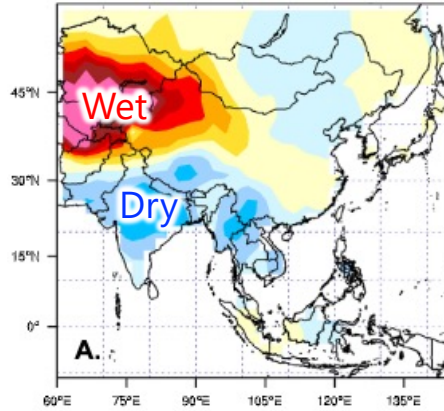


Hereid, Okumura et al. (2013)

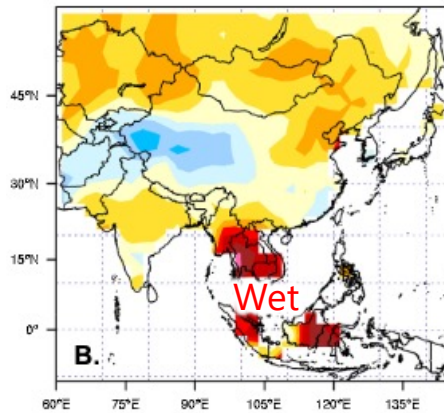
# ENSO phases embedded in tree ring data

EOF analysis of Monsoon Asia Drought Atlas (MADA), 1300-1989  
Summer PDSI reconstruction based on 327 tree rings (*Cook et al., 2010*)

MADA  
EOF1 (15%)

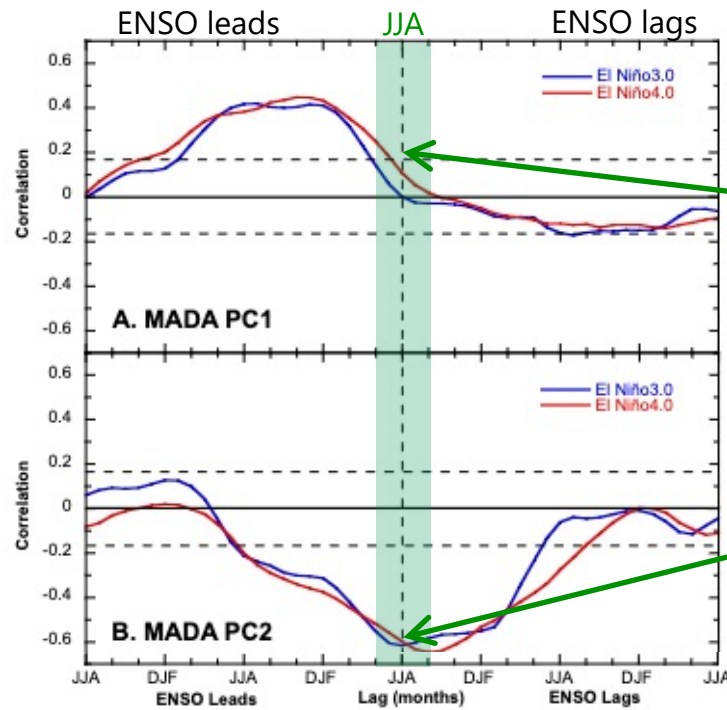


MADA  
EOF2 (10%)

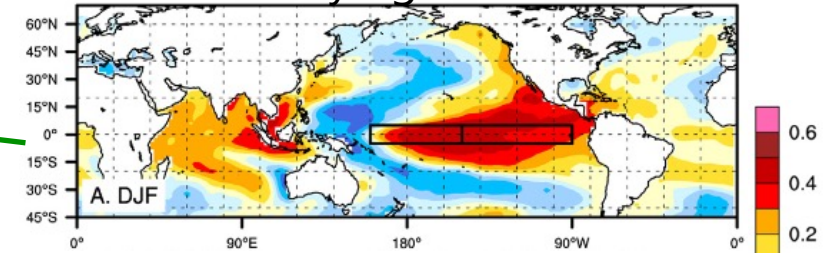


*Li et al. (2014)*

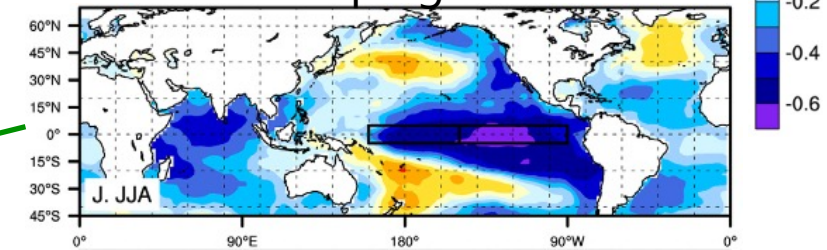
Lead-lag correlation with Nino3 & Nino4



Decaying El Nino



Developing La Nina

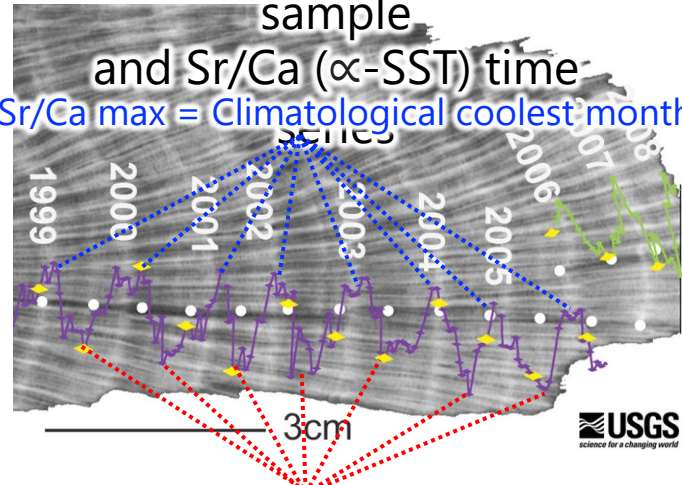




# Impact of SST seasonal cycle on coral chronology

X-ray image of a coral sample and Sr/Ca ( $\propto$ -SST) time series

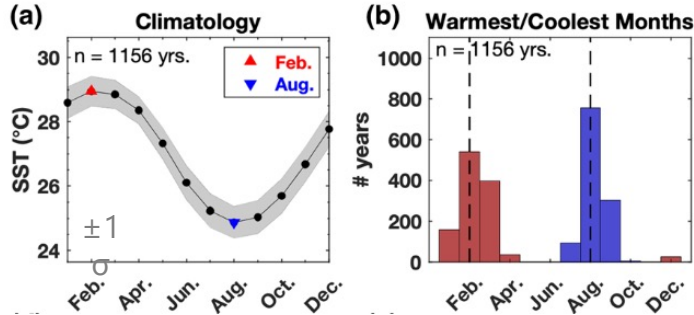
Sr/Ca max = Climatological coolest month



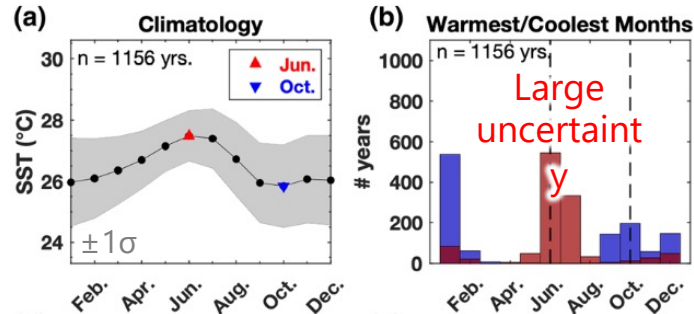
Interpolate to evenly-spaced monthly values

Sr/Ca min = Climatological warmest month

Vanuatu (SW Pacific)

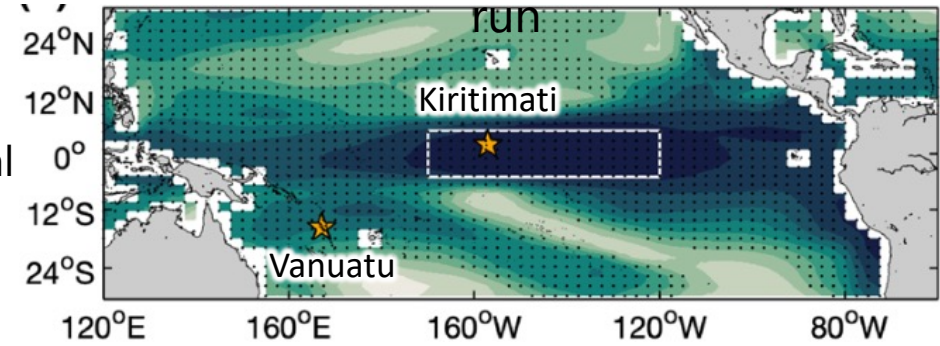


Kiritimati (C Eq Pacific)

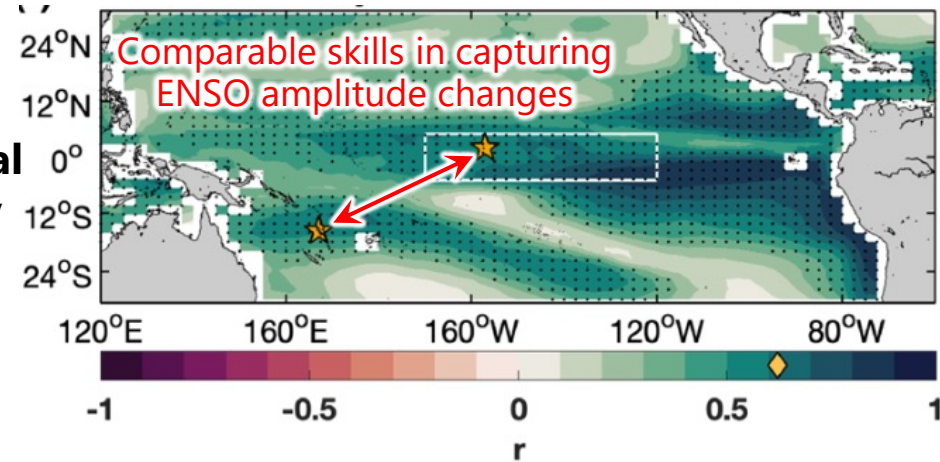


20-yr running  $\sigma$  correlation between Nino3.4 index and pseudo-coral  $\delta^{18}O$  in CESM1 control

Without chronological uncertainty



With chronological uncertainty

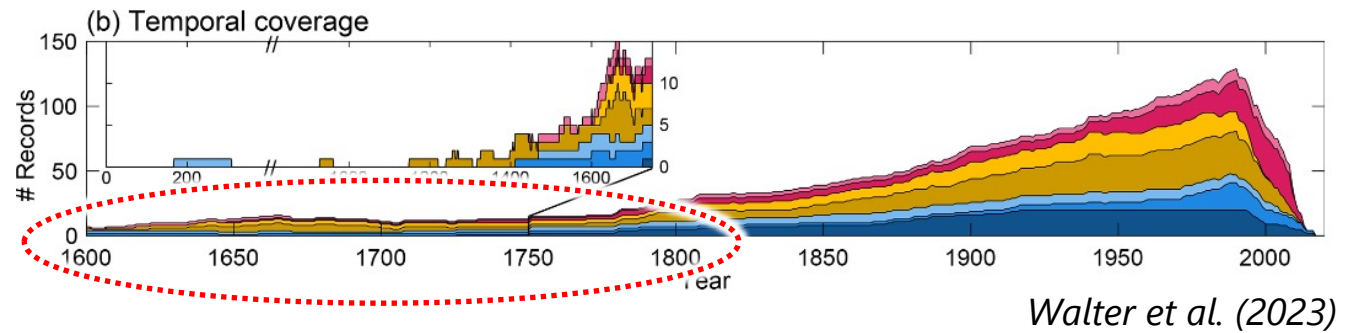
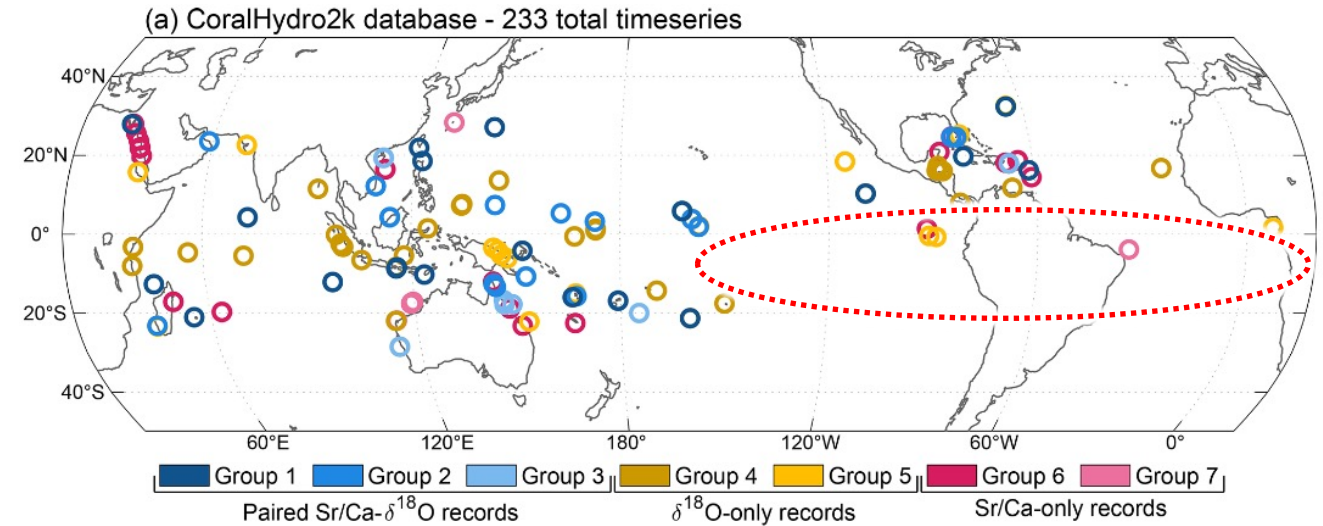
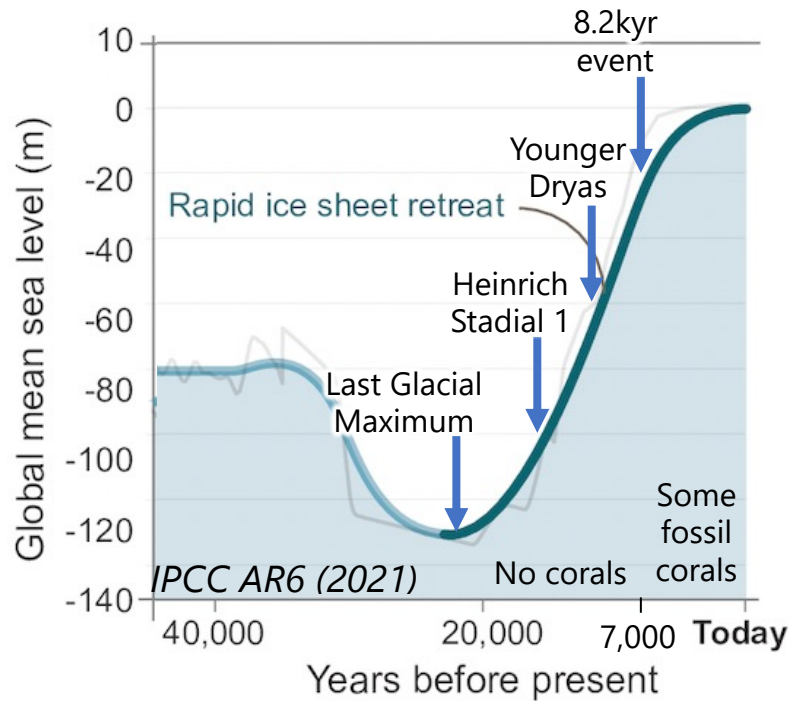


Lawman et al. (2020)

A way forward:

2) Obtain more proxies from key regions & periods

# Lack of tropical proxy records in cool tropical oceans and before 1800

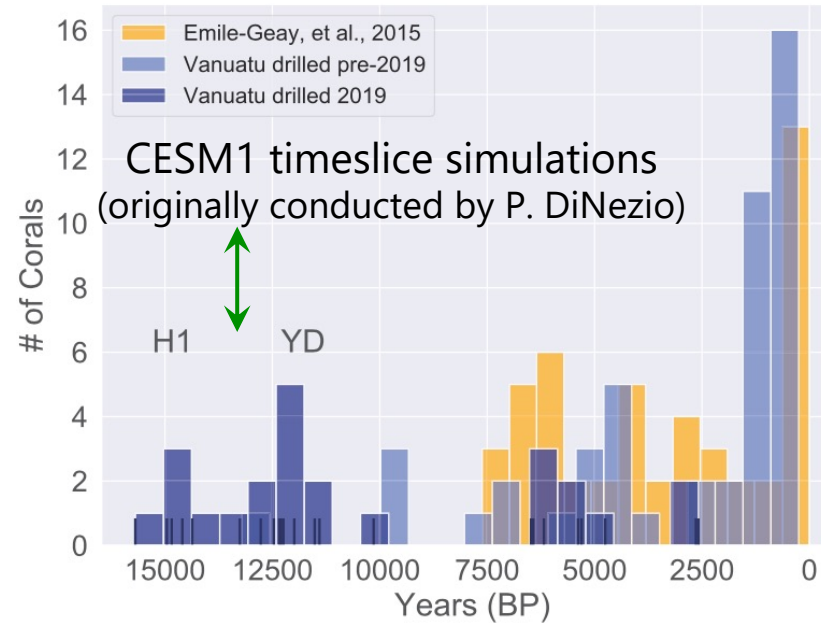
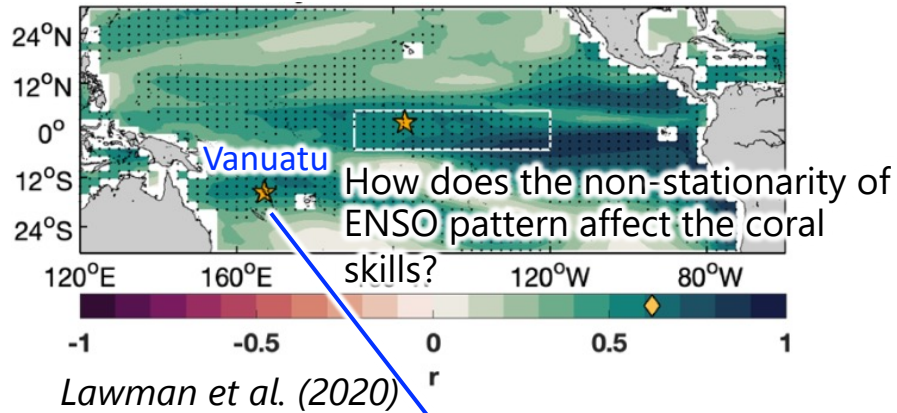


Lack of direct evidence of forced ENSO changes  
(See a review by Lu et al. 2018)

Fast-growing coral species (*Porites*) commonly used for paleoclimate reconstructions do not typically live more than a few hundred years.  
Most fossil coral records are also short (~30 yrs on average).



# Fossil corals from Vanuatu—Evidence for forced ENSO changes



Jud Partin  
(lead PI)



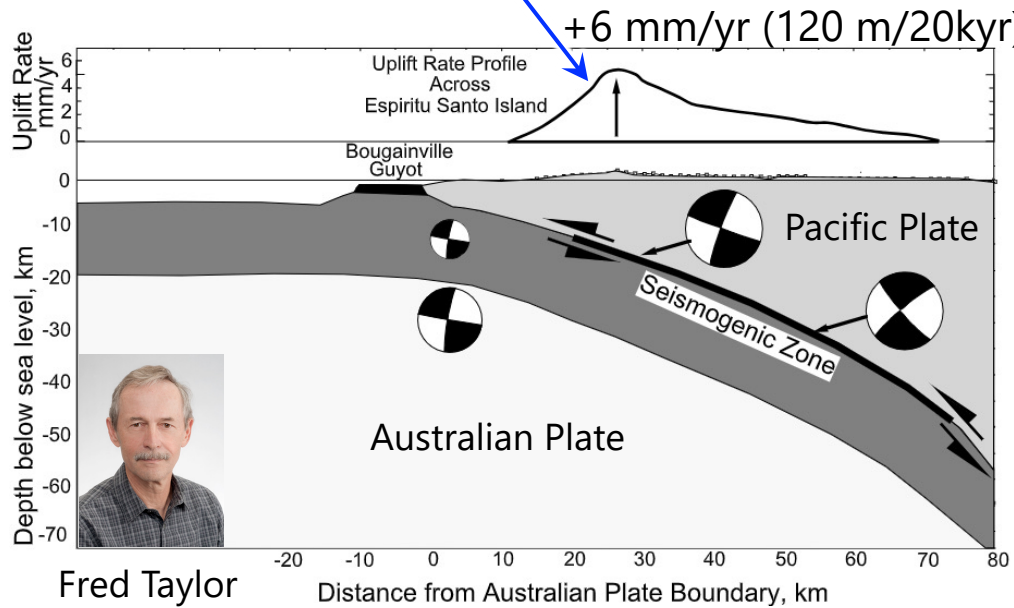
AGS-2103078



Rob Domeyko  
(student)



Yuko Okumura  
(student)



Taylor et al. (2005)



# Summary

- Paleoclimate proxy data has the potential to address many important science questions related to AMV/AMOC and TBI
- Recent compilations of PAGES2k databases and reanalysis products make paleoclimate proxy data more accessible
- Available reconstructions of climate modes poorly agree with each other to derive robust conclusions about the nature of variability
- To move forward, we need to better understand climate processes affecting various proxy records and develop robust methods for reconstruction
- We also need to enhance both spatial and temporal coverage of high-resolution proxy records, particularly in the tropical Atlantic and eastern Pacific and before 1800

*These efforts require close collaborations between climate dynamics/modeling and paleoclimate research communities*





# Climate models as a test bed for climate reconstruction methods: pseudoproxy experiments

Jason E. Smerdon\*

Application to climate mode reconstructions

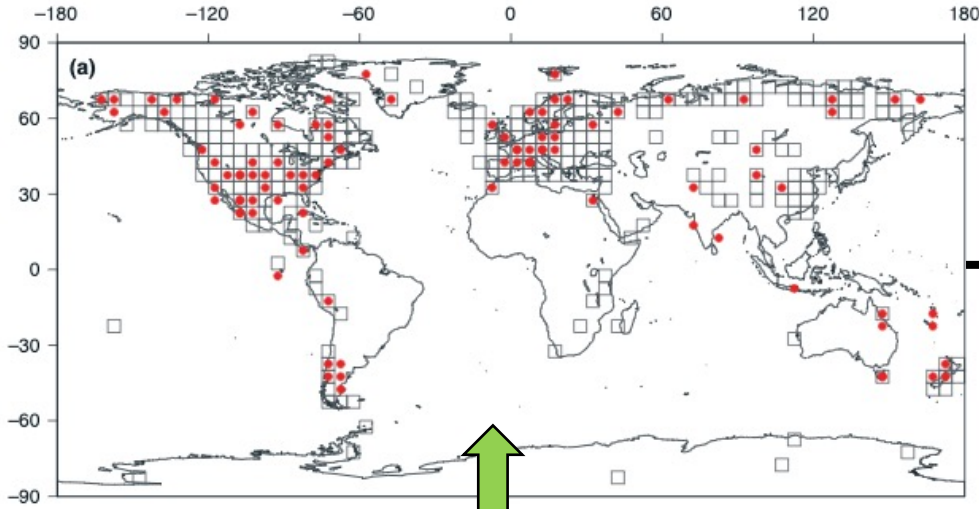
NAO—Ortega et al. (2015)

ENSO—Batehup et al. (2015)

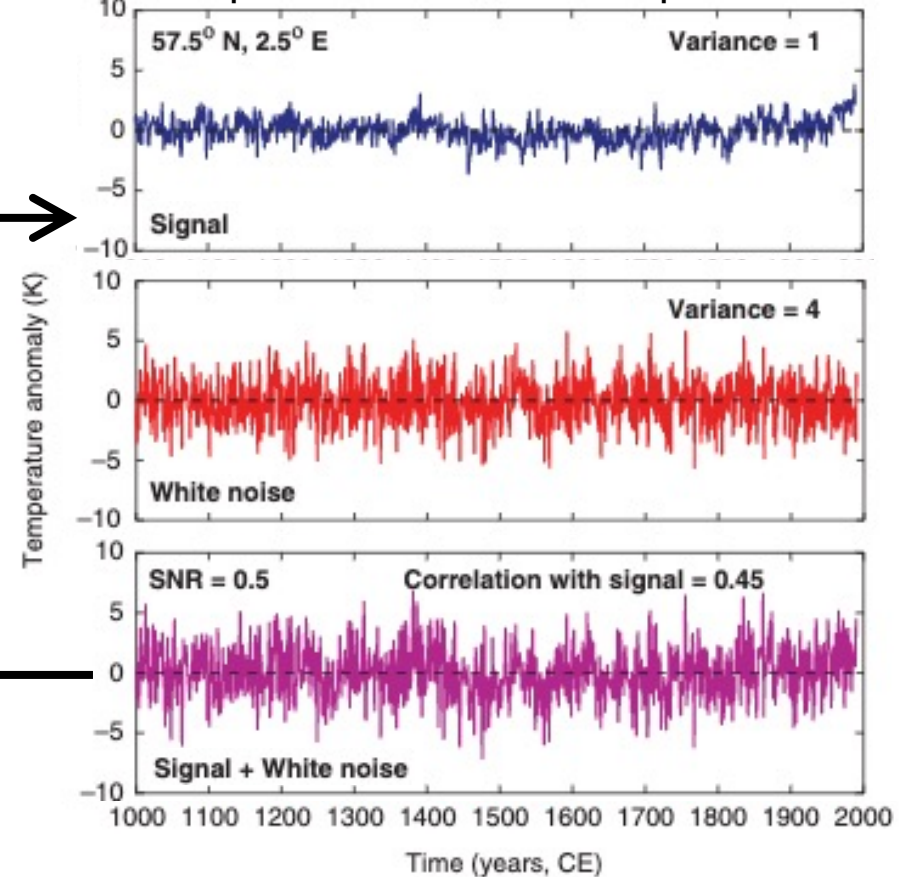
IPO—Henke et al. (2017)

ENSO, PDV, AMV—Midhun et al. (2020)

### Climate Model Data



Pseudoproxies = Model output + Noise



### Calibration & Reconstruction

