

A large-ensemble observational ocean temperature/heat content product and the application

Huifeng Yuan^{1,2,3}, **Lijing Cheng**^{1,3}, Yuying Pan¹, Yujing Zhu¹, Xinyi Song¹,
Bin Zhang^{4,5}, Senliang Bao⁶, Jiang Zhu^{1,3}

¹ State Key Laboratory of Earth System Numerical Modeling and Application, Institute of Atmospheric Physics, Chinese Academy of Sciences

² Computer Network Information Center, Chinese Academy of Sciences

³ University of Chinese Academy of Sciences

⁴ Institute of Oceanology, Chinese Academy of Sciences

⁵ Oceanographic Data Center, Chinese Academy of Sciences

⁶ College of Meteorology and Oceanography, National University of Defense Technology



Observation Uncertainty

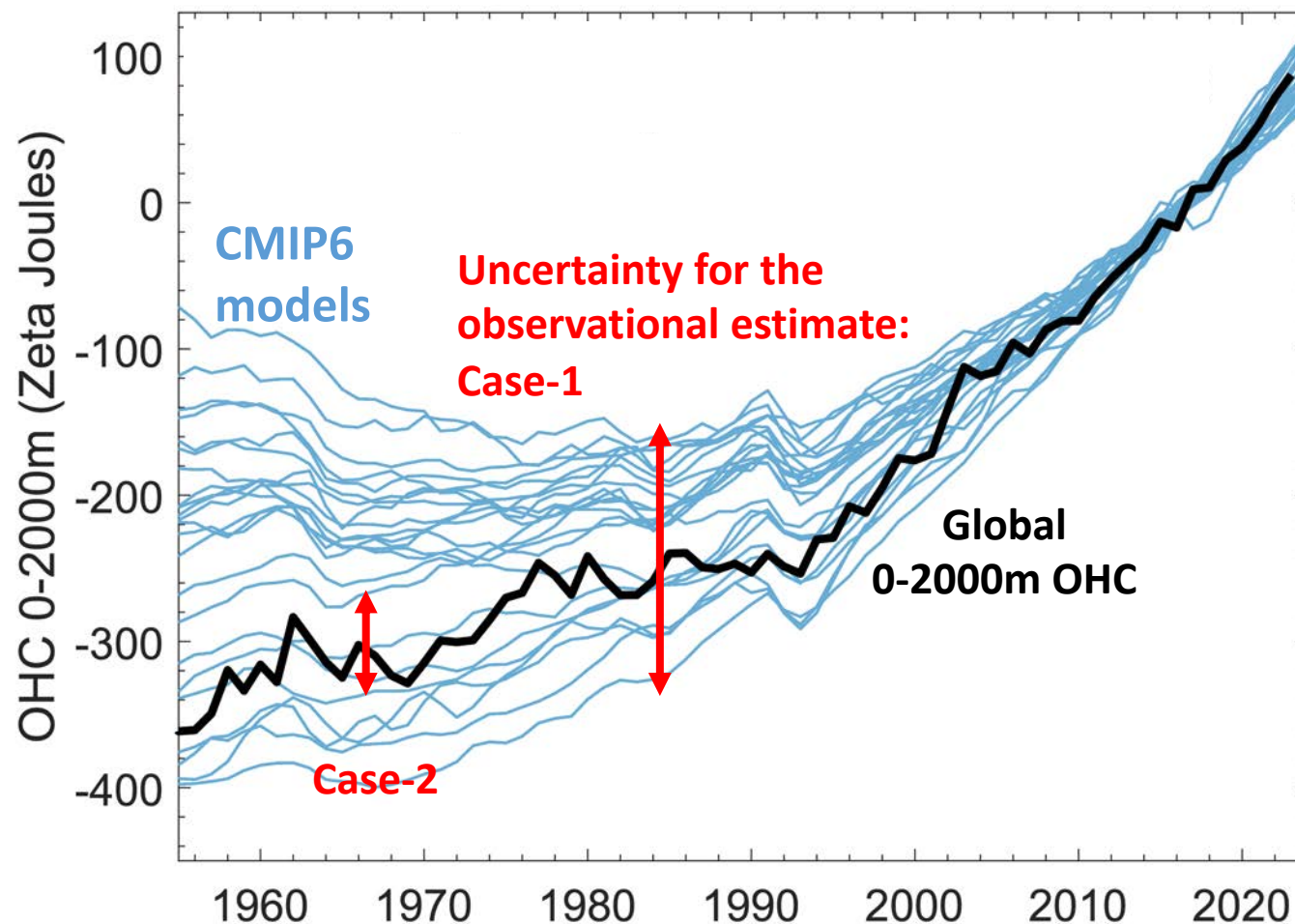


- A comprehensive uncertainty quantification for observational products and time series is critically needed for 1) Model-Obs comparison; 2) Refinement of the Observing System.

Assessment result:

Case-1: CMIP6 models ok

Case-2: CMIP6 models are really bad

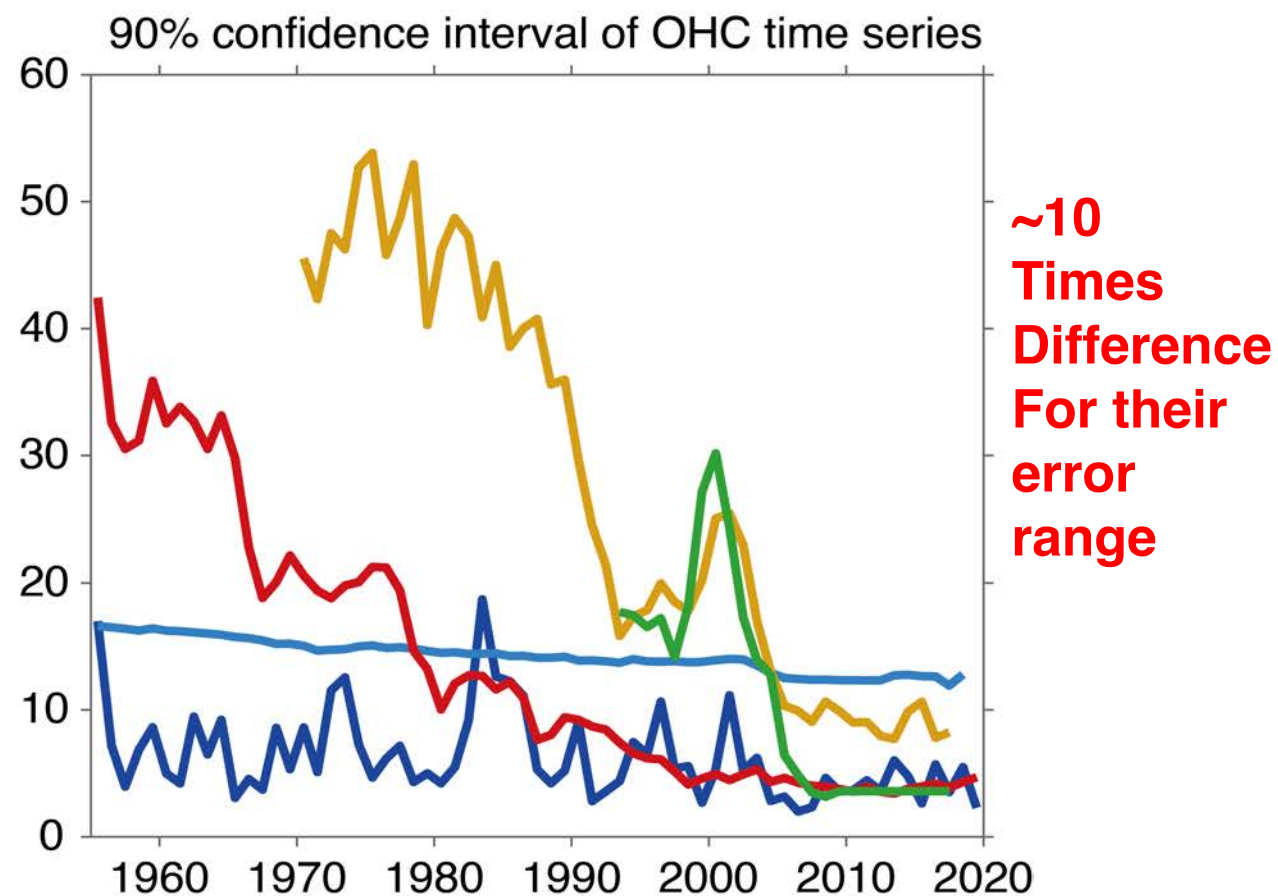
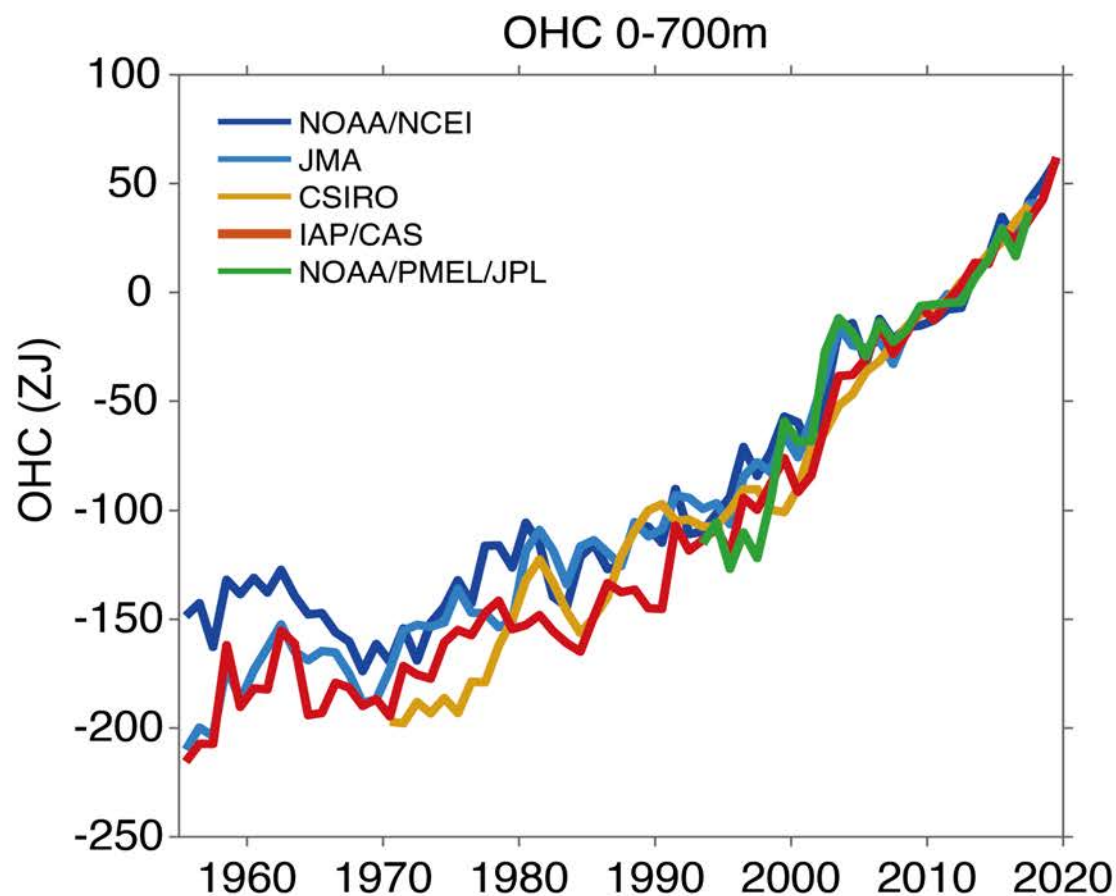


Observation Uncertainty



- A comprehensive uncertainty quantification is lacking

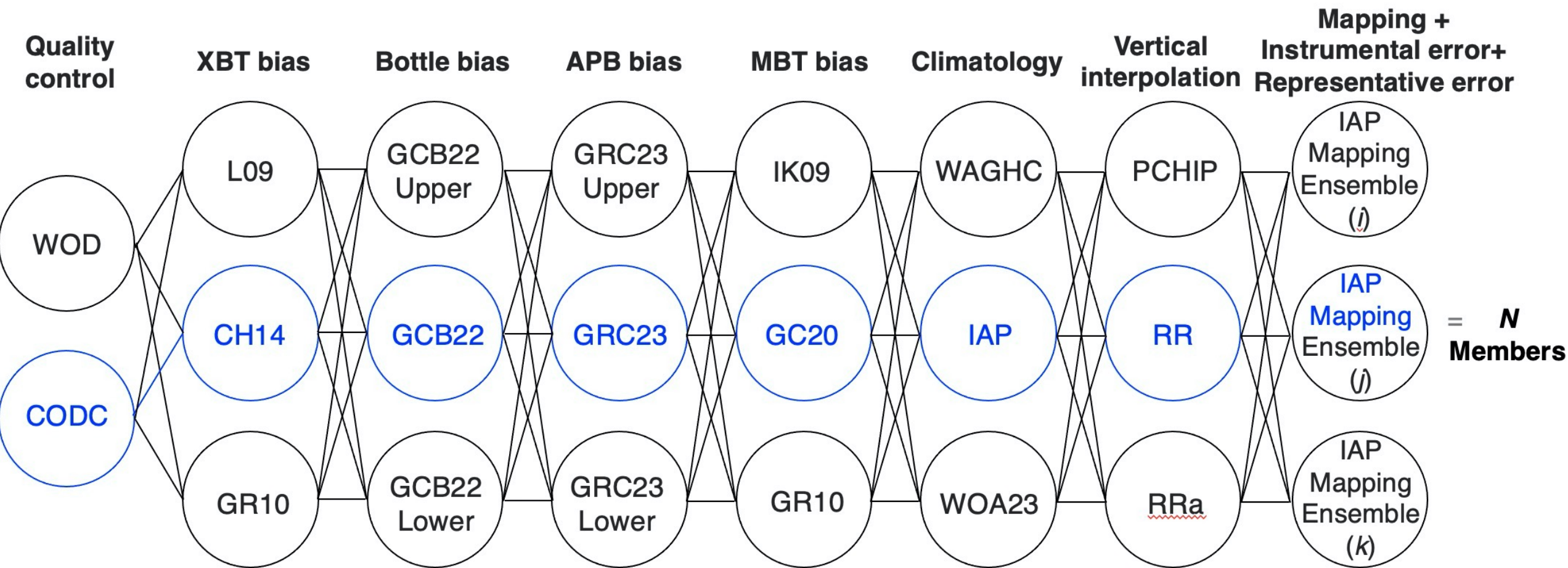
Need to know how big the uncertainty is? Where is the gap??



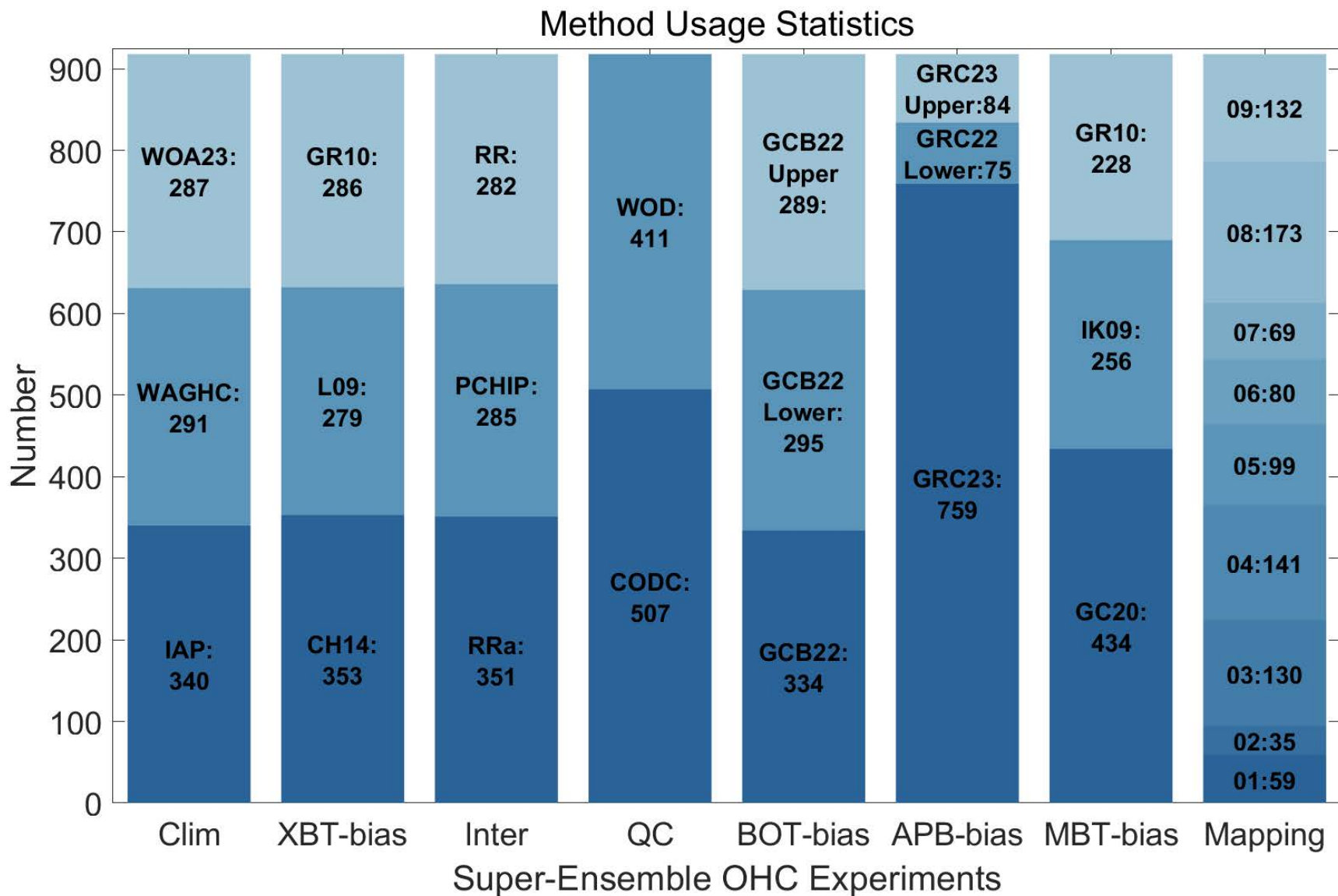
A Large Ensemble Approach



- Ocean heat content / Temperature uncertainty quantification



A Large Ensemble Approach



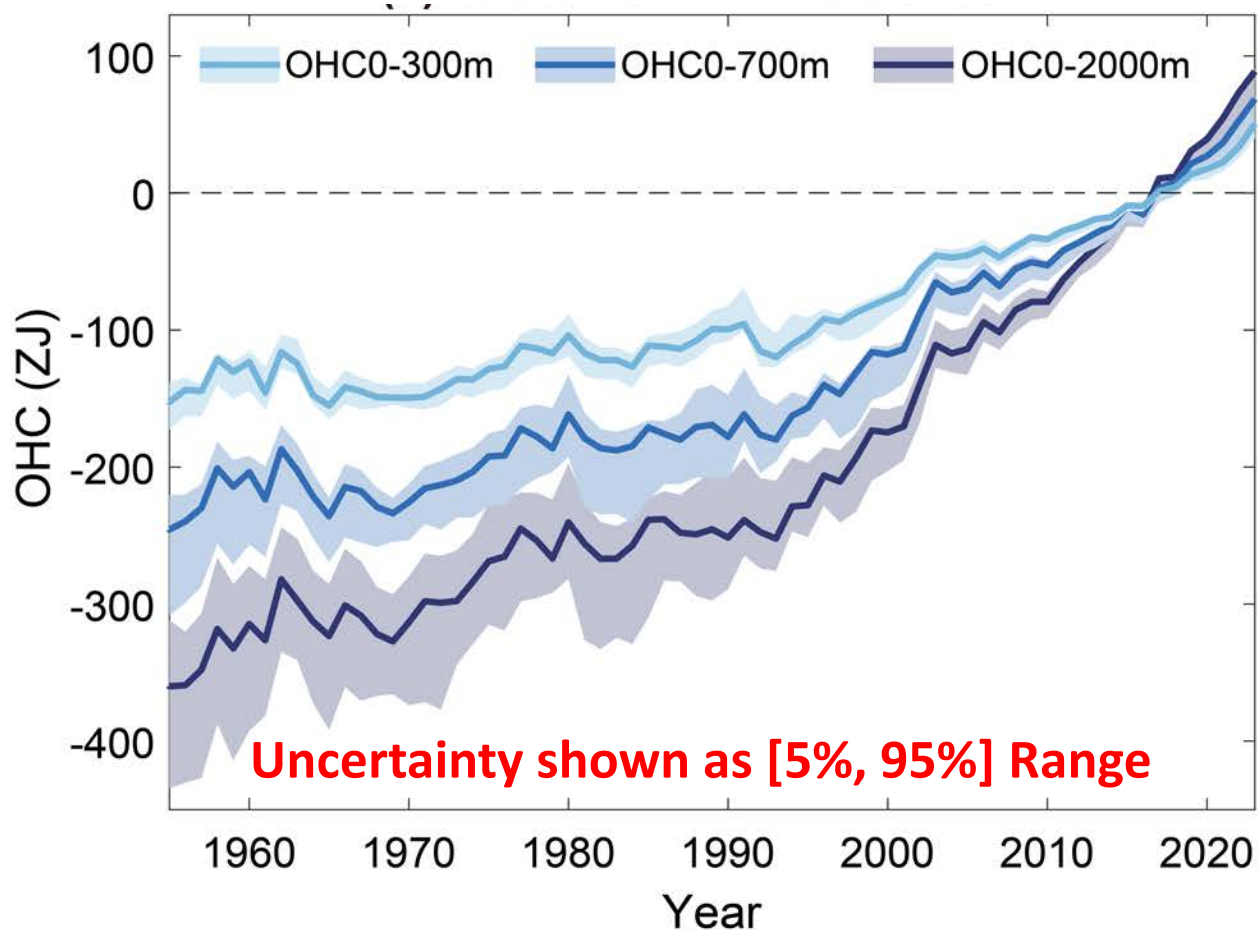
- **900 Ensemble Members!**
- **12 ZFLOPs CPU times**
- **70 TB memory**

Results: OHC annual mean

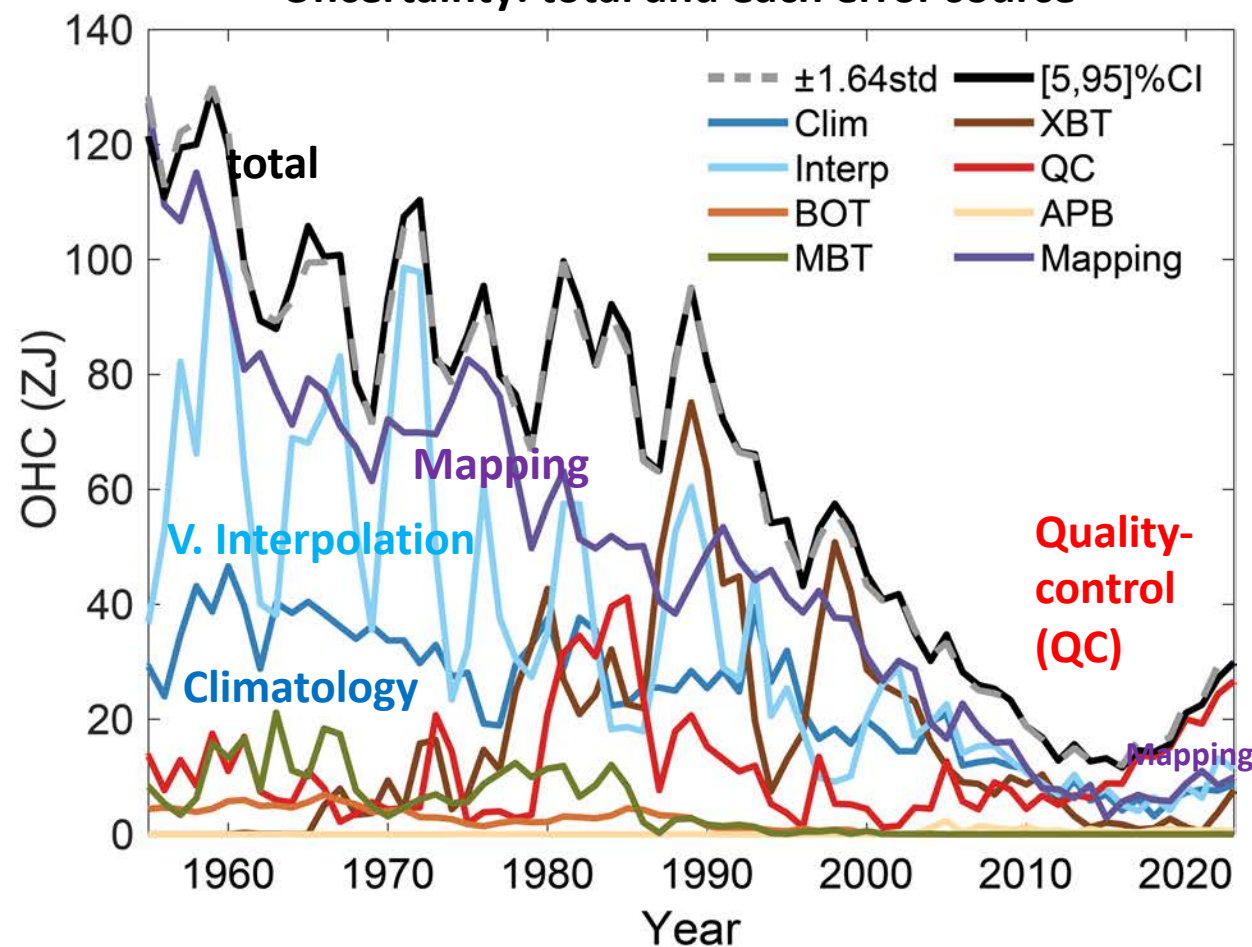


- Total uncertainty: reduced from ~120 ZJ (~1960) to 20~30 ZJ (2010-2023)
- QC: largest error source for now; mapping/sampling: largest before ~2010

Global OHC and its uncertainty



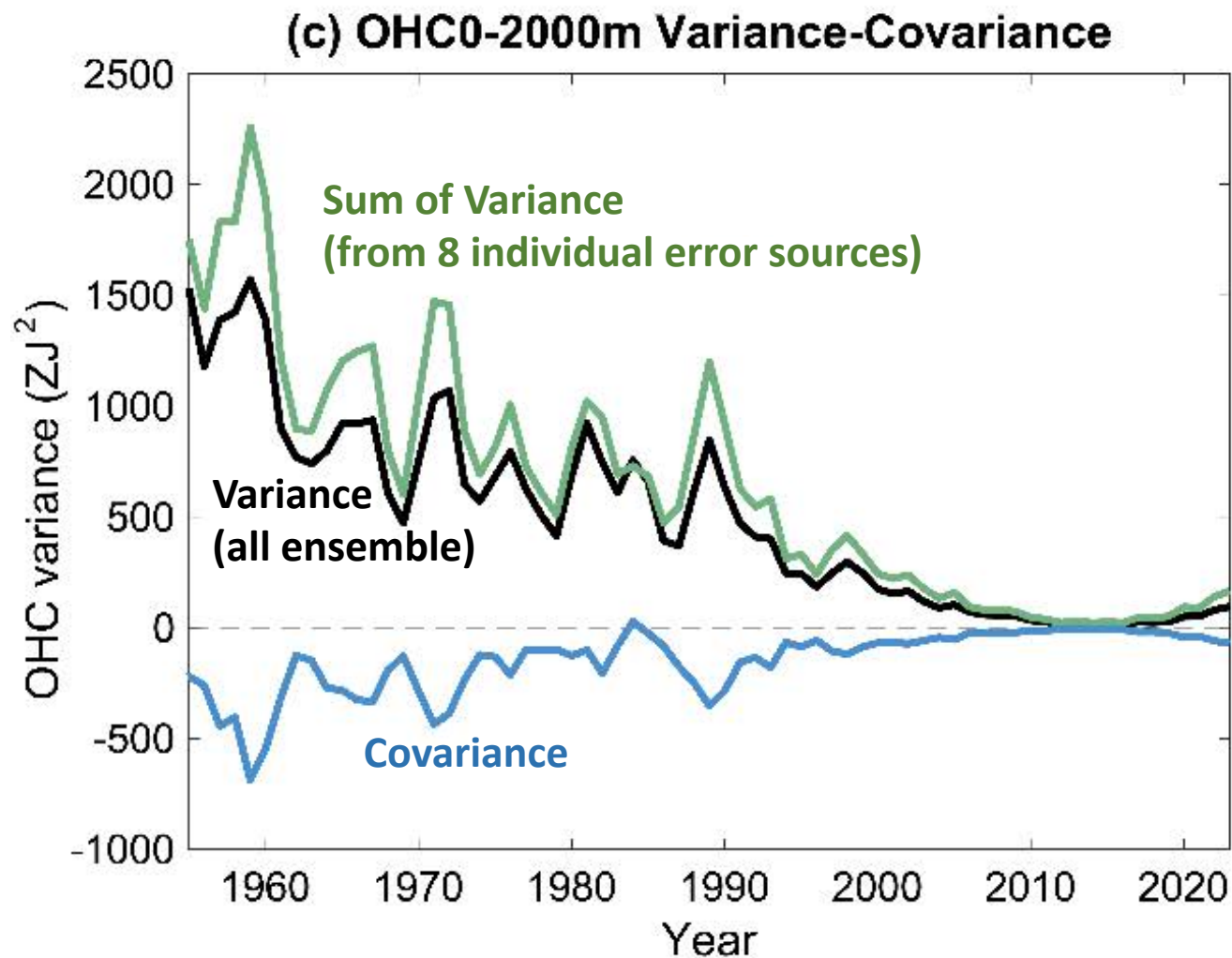
Uncertainty: total and each error source



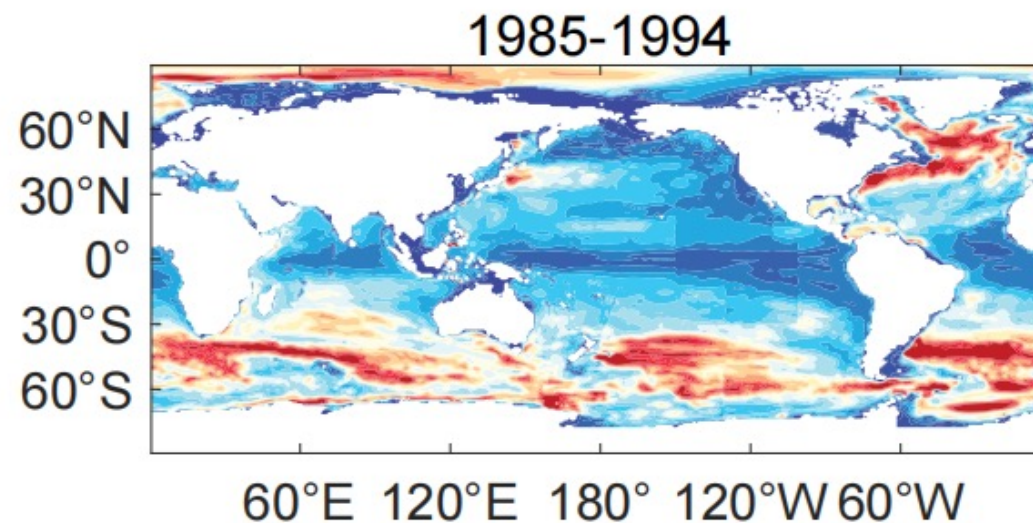
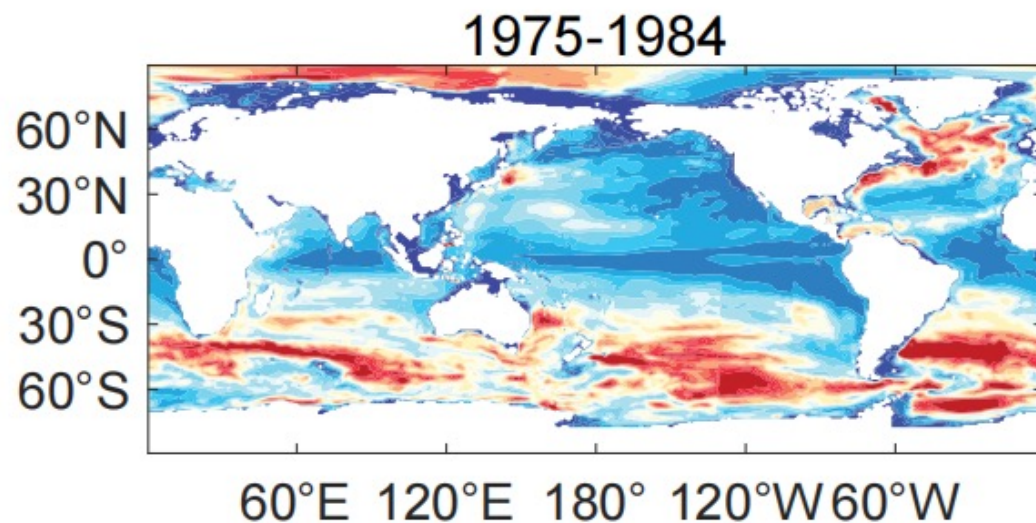
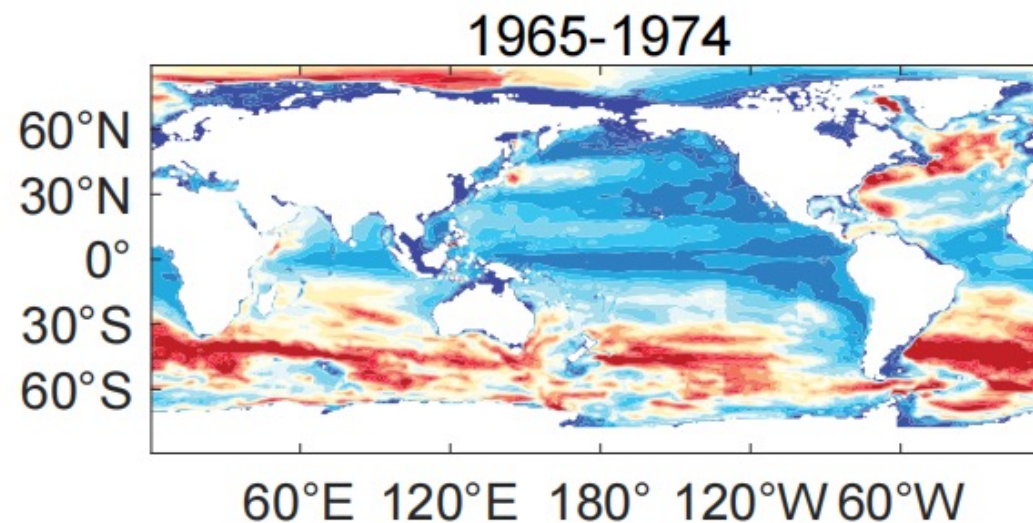
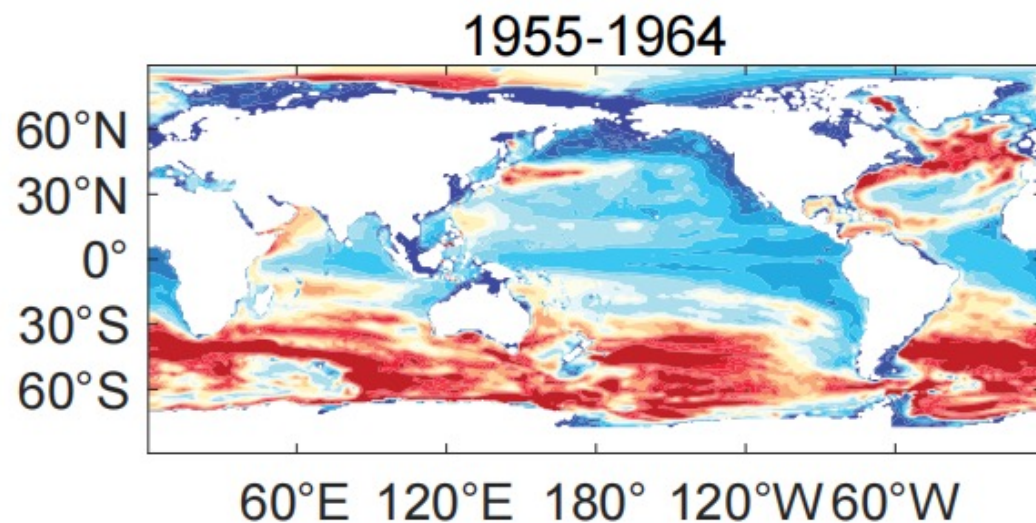
Results: OHC annual mean



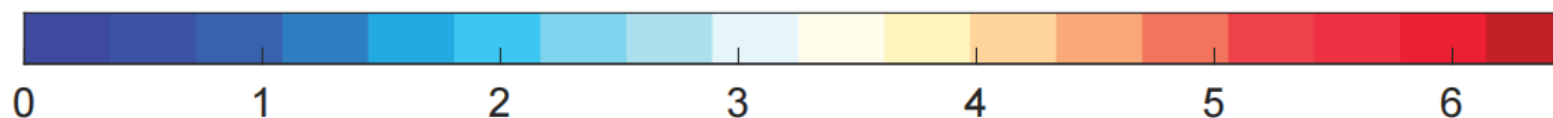
- Different error sources are not independent



Results: OHC annual mean, regional

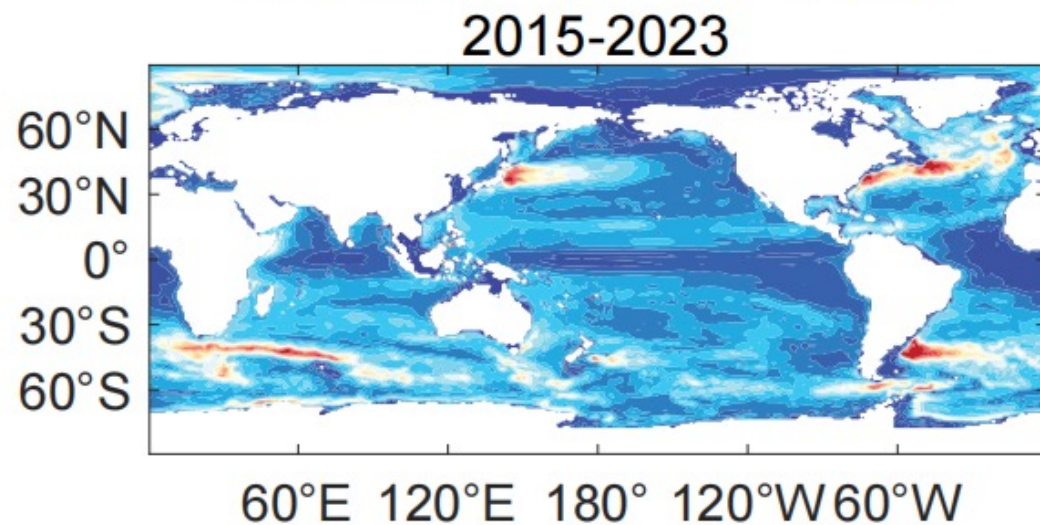
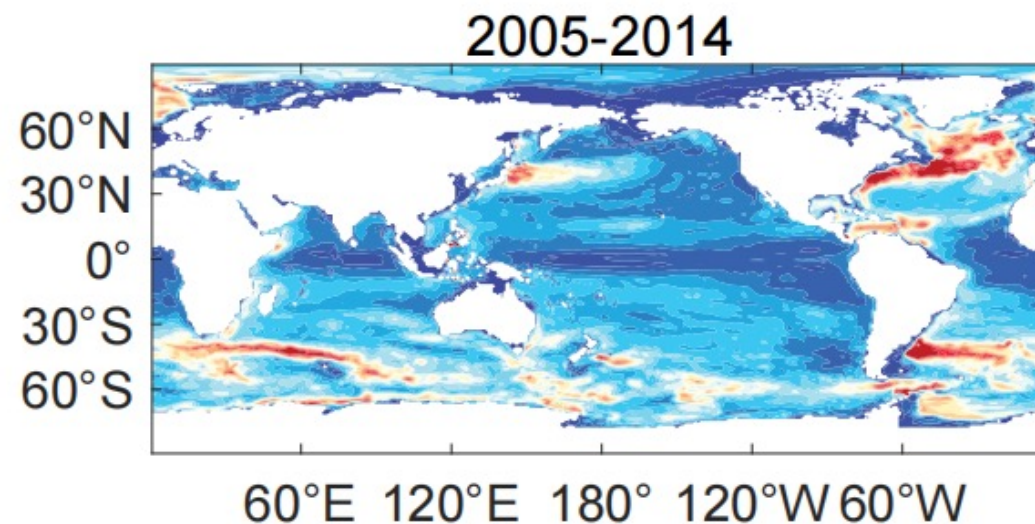
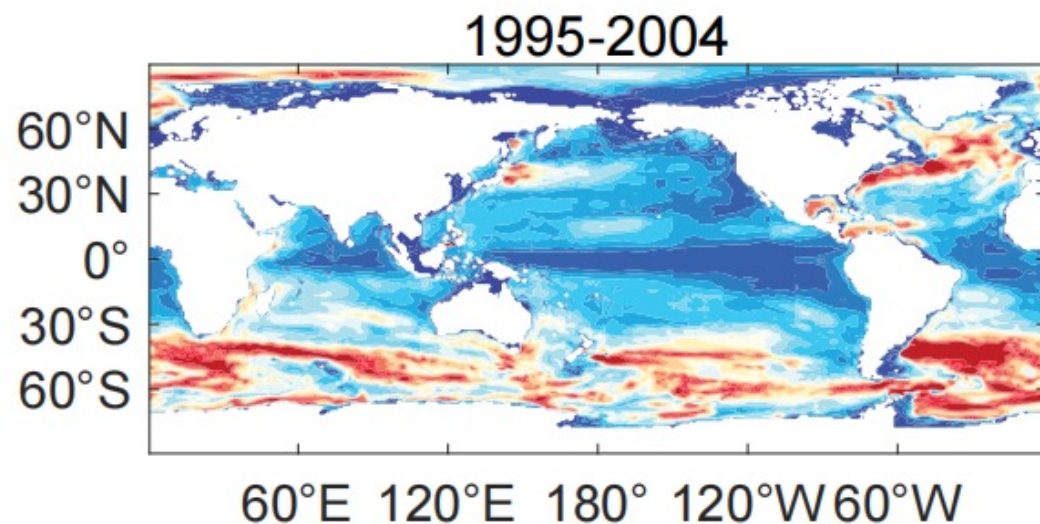


Uncertainty shown
as [5%, 95%] Range

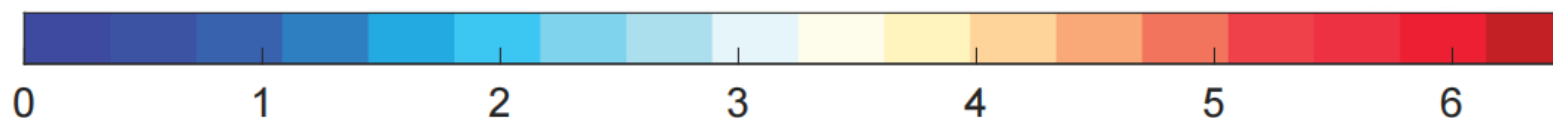


$\times 10^9 \text{ J m}^{-2}$

Results: OHC annual mean, regional



Uncertainty shown
as [5%, 95%] Range



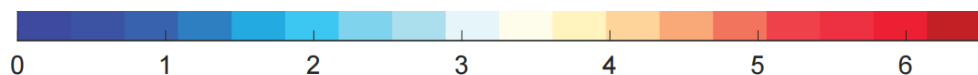
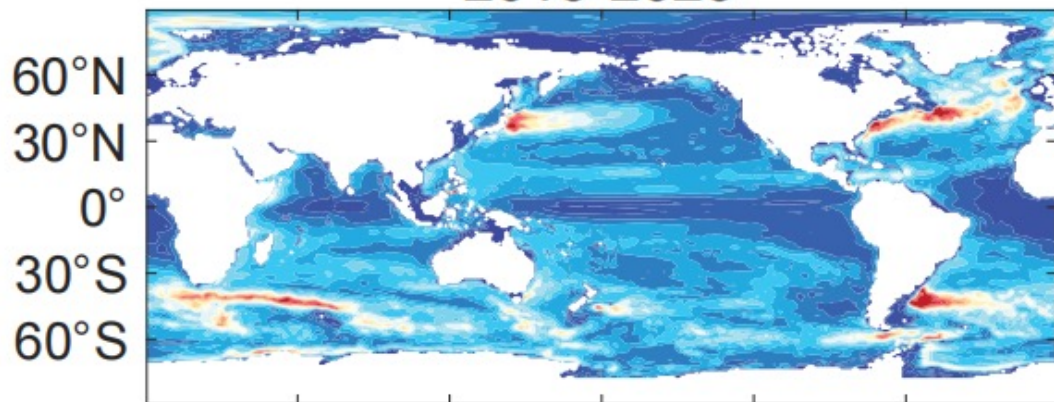
$\times 10^9 \text{ J m}^{-2}$

Results: OHC annual mean, regional



Total uncertainty

2015-2023



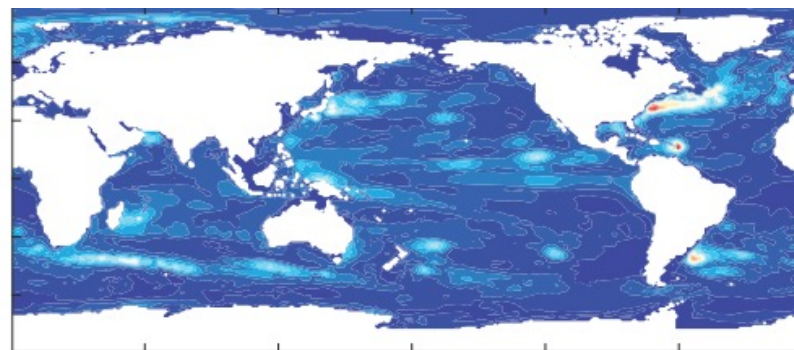
$\times 10^9 \text{ J m}^{-2}$

Uncertainty shown
as [5%, 95%] Range

**Vertical
Interpolation**



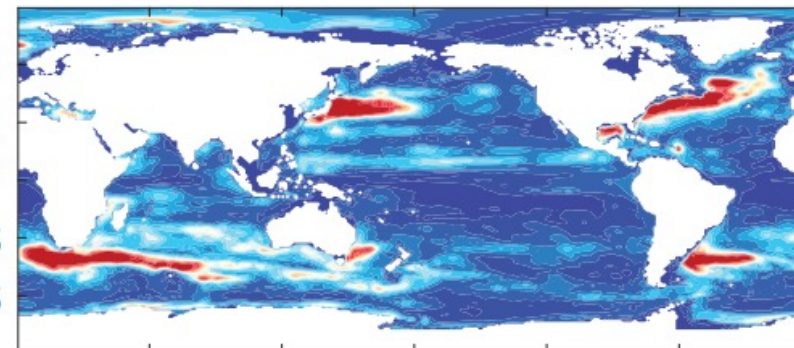
60°N
30°N
0°
30°S
60°S



**Quality
Control**



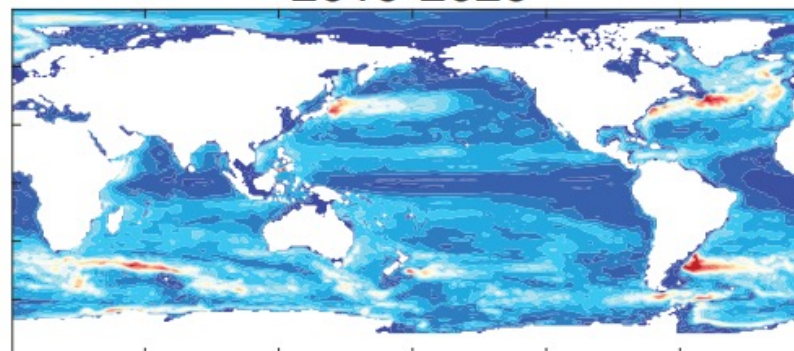
60°N
30°N
0°
30°S
60°S



**Mapping/
Sampling**



60°N
30°N
0°
30°S
60°S

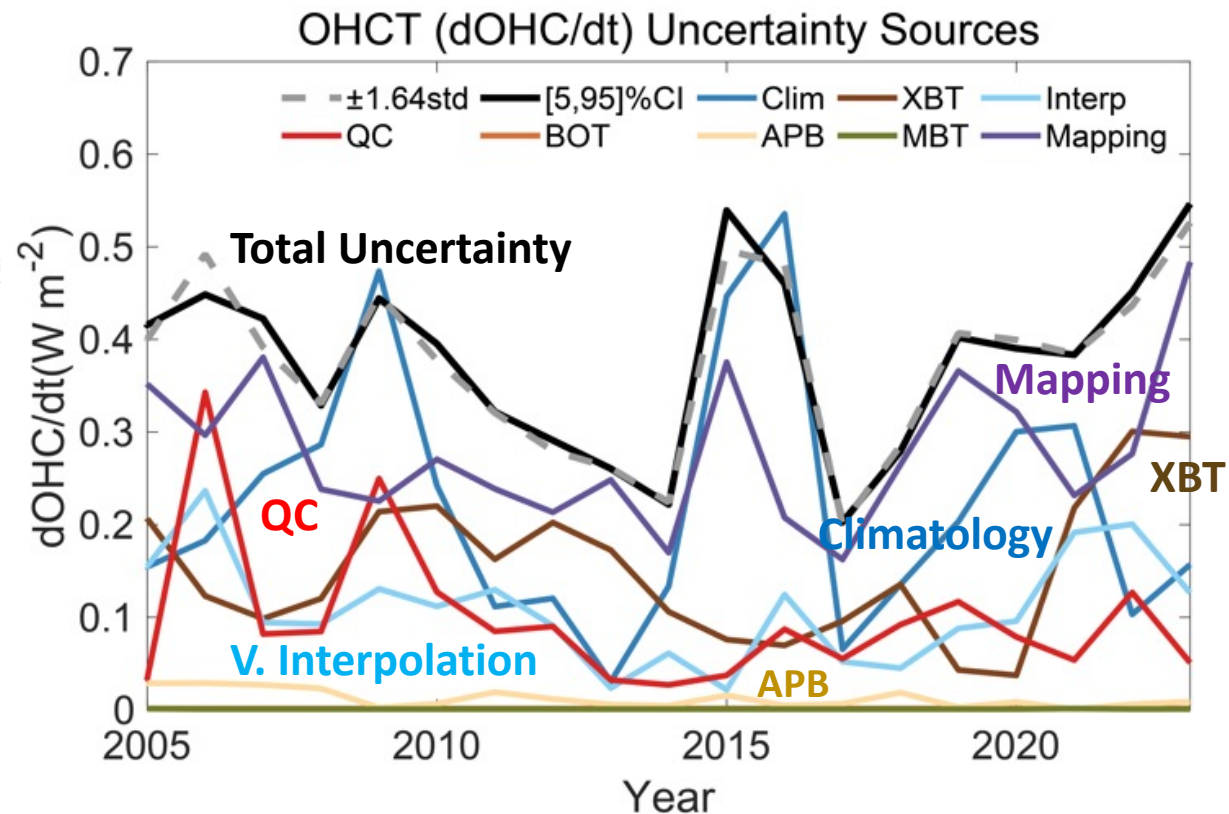
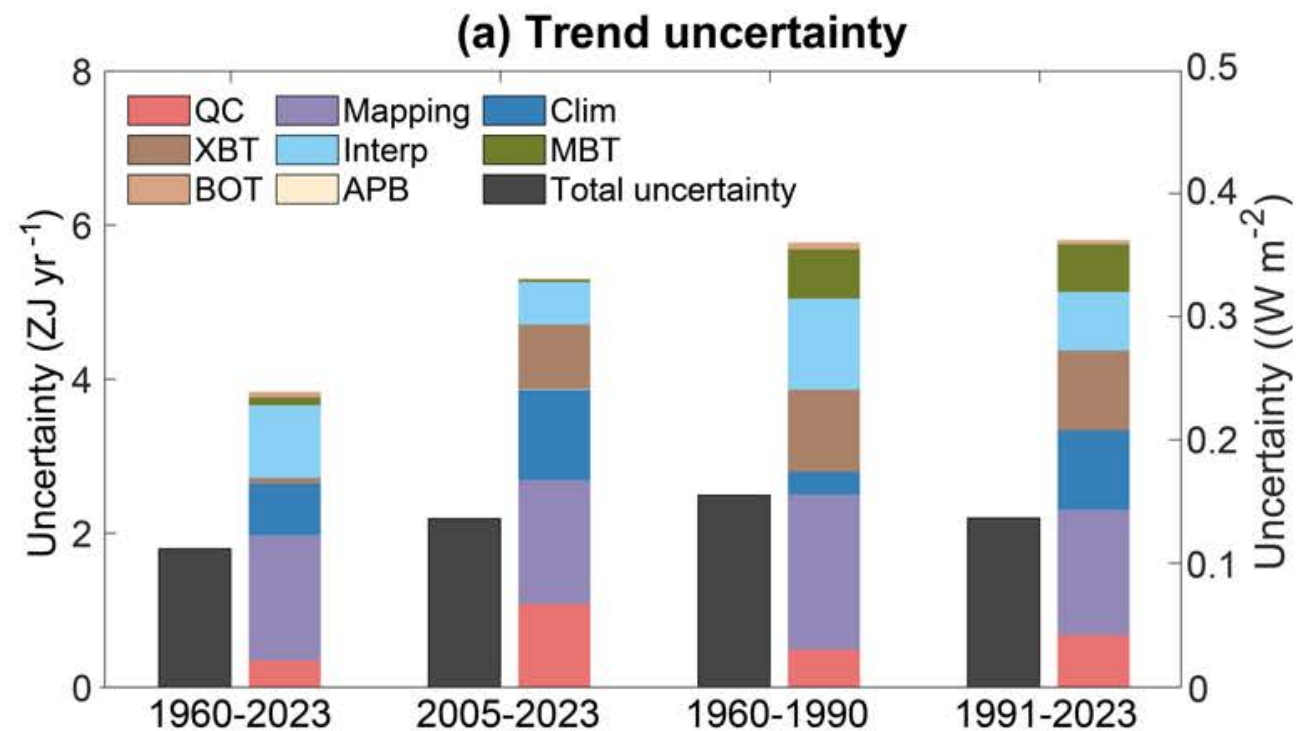


60°E 120°E 180° 120°W 60°W

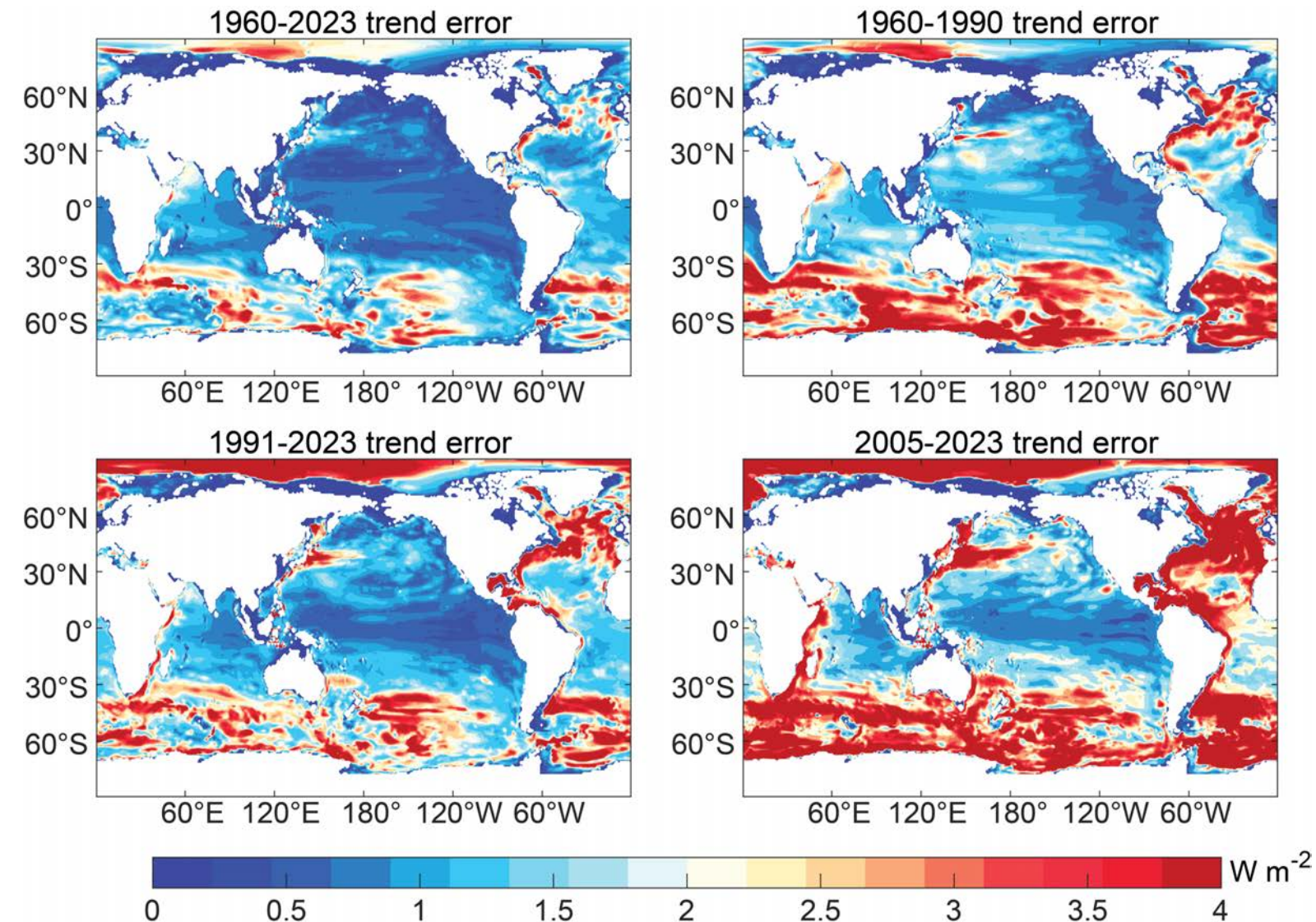
Results: OHC trend and variability uncertainty



- 1960-2023 trend: Mapping > Vertical interpolation method > Climatology choice
- 2005-2023 trend: Mapping > QC > Climatology choice
- Annual dOHC/dt, 2020-2023: Mapping > XBT bias > vertical interpolation

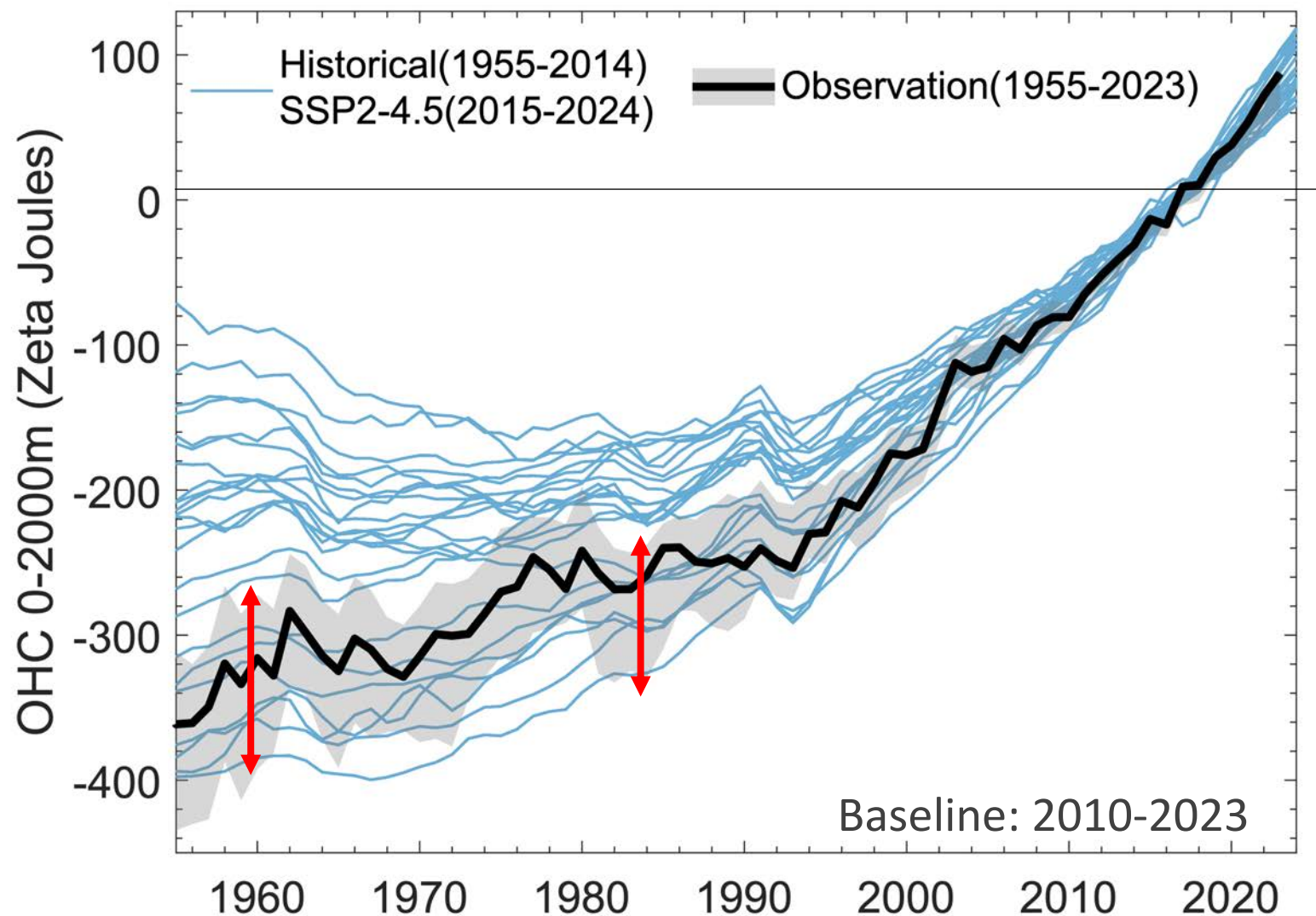


Results: OHC trend uncertainty, regional



- The critical regions to estimate the OHC trend are the **polar regions** and the **boundary current regions**.
- The **Atlantic and Southern Oceans** have higher uncertainty than the Pacific and Indian Oceans, characterized by high variability and trends.

Results: OHC Model-Obs inter-comparison



- Among **22** CMIP6 models, **7** fall in the [5%-95%] observational range and are consistent with observations.

Summary



- “Observation” is not perfect (it is an estimate of the actual world); it does have uncertainty caused by many sources of error. A quantification of observational uncertainty is critically needed.
- A Large-ensemble approach (~900 members) is proposed to quantify Ocean Temperature (0-2000m) and OHC estimate uncertainty, accounting for 9 known error sources (8 groups).
- Uncertainty can be estimated globally/regionally, for annual (monthly) mean, trend, variability, etc.
- This Large-ensemble approach is a useful tool for 1) Model-Obs inter-comparison; 2) observation system evaluation and gap identification.



Thanks for your attention!

IAP datasets:

<http://www.ocean.iap.ac.cn/>



International **Q**uality-controlled **O**cean **D**atabase IQuOD “Mission Statement”

To **maximize the quality, consistency, and completeness** of the long-term global subsurface ocean temperature (and salinity) database

The power of IQuOD: Ability to pull together the expertise from the international research community (producers/users) and to focus that combined effort into a single “best” dataset.

5. Uncertainty estimate/assignment



Instrumental uncertainty (IQuOD)

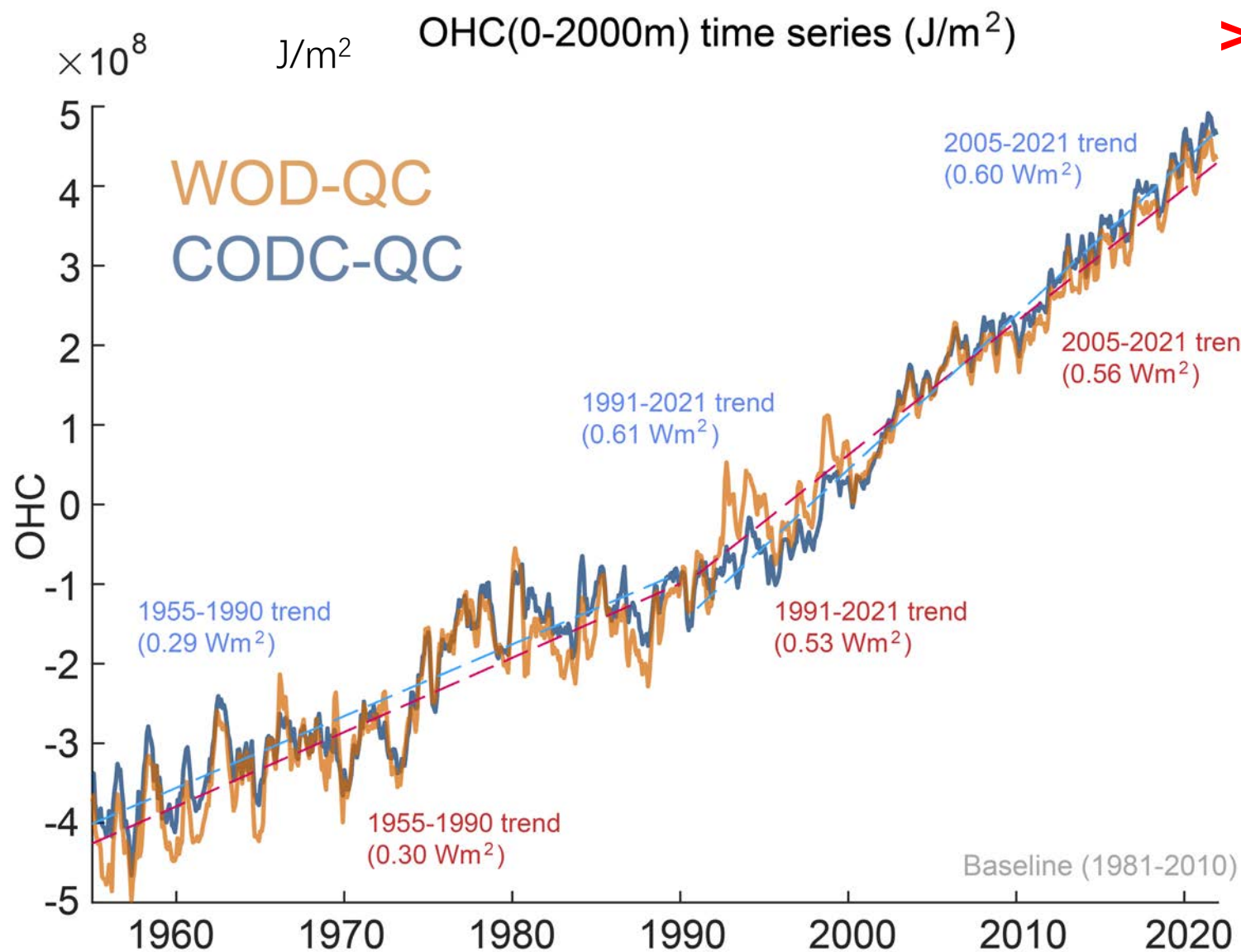
- IQuOD v0.1 (2018) release contains **'Type B' measurement uncertainties** determined from **manufacturer specifications** and other publications.

Uncertainty budget templates and a **code base with sample calculations** for uncertainty budgets will be published.

Instrument type	Temperature (°C)	Depth/Pressure	Approx. First Year of Routine Use
Bottle/reversing thermometer	0.02	5%	1900
Conductivity-Temperature-Depth (CTD) uncalibrated and calibration status unknown	0.01	0.08%	1964
CTD calibrated	0.002	0.015%	1964
CTD animal mounted	0.005	-	2004
Glider	0.002	-	2002
Profiling floats (pre-Argo)	0.005	-	1994
Profiling floats (Argo***)	0.002	2.4 dbar	2000
Expendable Bathythermograph (XBT) Sippican manufacturer	0.1	<=230 m: 4.6 m; >230 m: 2%	1967
Mechanical Bathythermograph (MBT)	0.3		1938

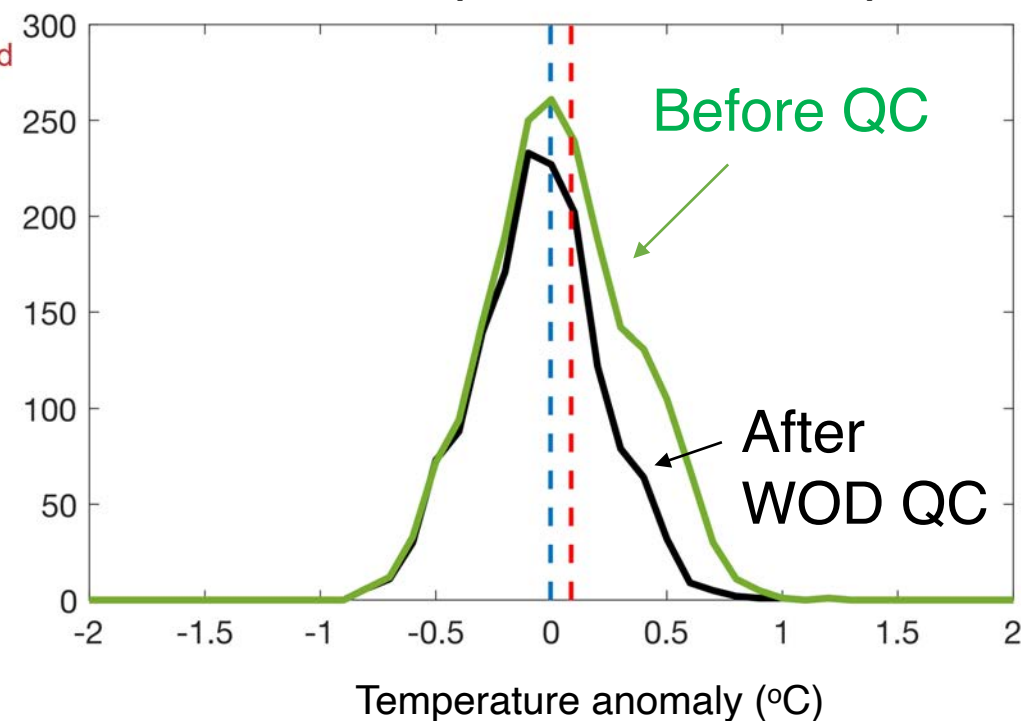
Uncertainty estimates for a selection of instrumentation in the WOD as described in Cowley et al, 2021. See <https://www.iquod.org/specifications.html> for full information.

Results: QC impact



>8% trend difference!

WOD-QC (Northwest Pacific)



Results: QC impact



Eddy-rich regions are critical

2005-2020 mean Difference between WOD-QC and CODC-QC OHC (0-2000m)

