

# An estimate of the global dissolved oxygen trend for the last 50 years

Open ocean and coastal deoxygenation: assessing variability and trends

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## Background:

- Global upper ocean lost **approximately 2%** of O<sub>2</sub> inventory in the last 50 years (Schmidtko et al., 2017; Ito et al., 2017)
- Earth System Models struggle to reproduce this trend both in magnitude and spatial pattern (Stramma et al., 2012; Bopp et al., 2013; Long et al., 2017; 2019; Oschlies et al., 2018)
- Both observations and models are incomplete – but they are complementary

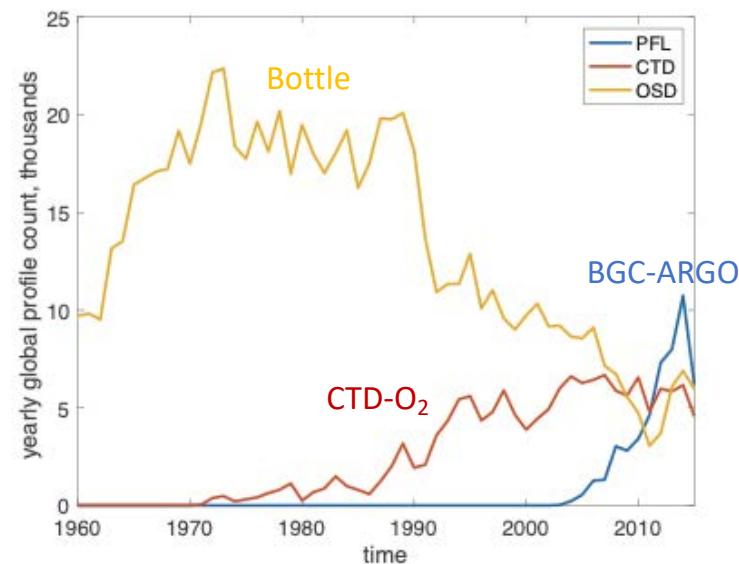
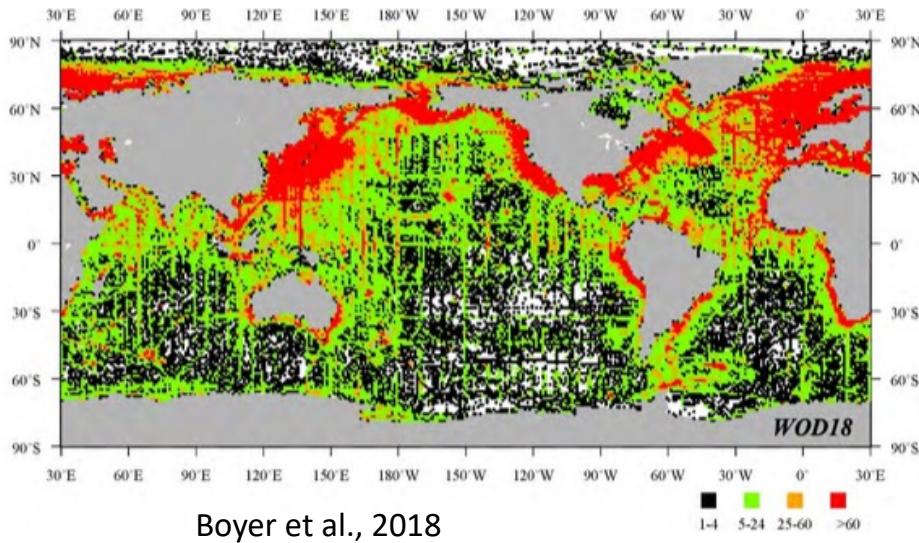
## Outline:

- Estimate the global O<sub>2</sub> inventory trend from the World Ocean Database (WOD, Boyer et al., 2018)
  - Optimal interpolation
- Compare CMIP6 models and observations
  - Subsample model O<sub>2</sub> field according to WOD sampling pattern
  - Assess sampling bias by comparing subsampled and full model
  - Climatology
  - Deoxygenation trends
  - Representation of regional trends

# Method:

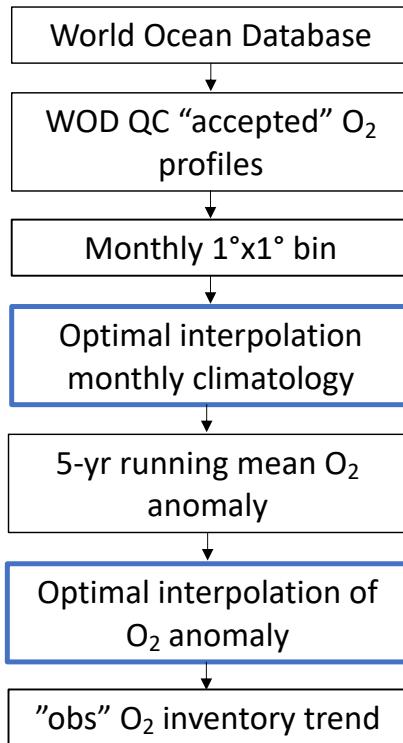
- Data Source: WOD select
- Observational pattern, sampling density and measurement technique evolve over time

Number and distribution of bottle data from WOD 2018



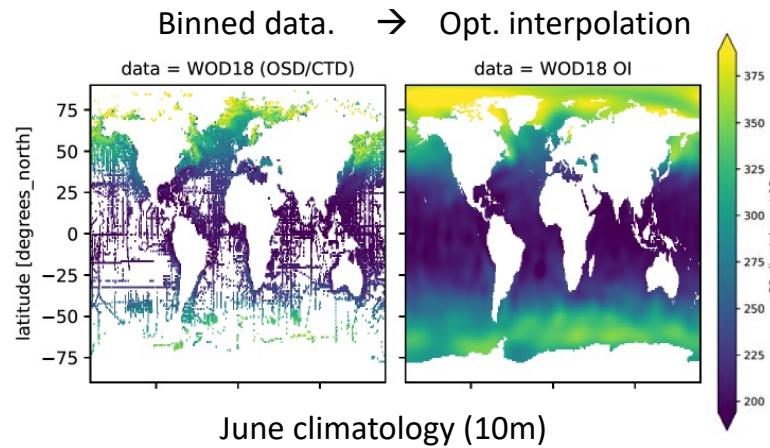
# Method: objective mapping of historical O<sub>2</sub> data

- **Bottle (1965-) and CTD (1987-)**
- **Optimal Interpolation (OI)** from discrete to grid
- **Monthly climatology** (gridded)
- **O<sub>2</sub> anomaly:** OI of the 5-year running mean of anomaly field



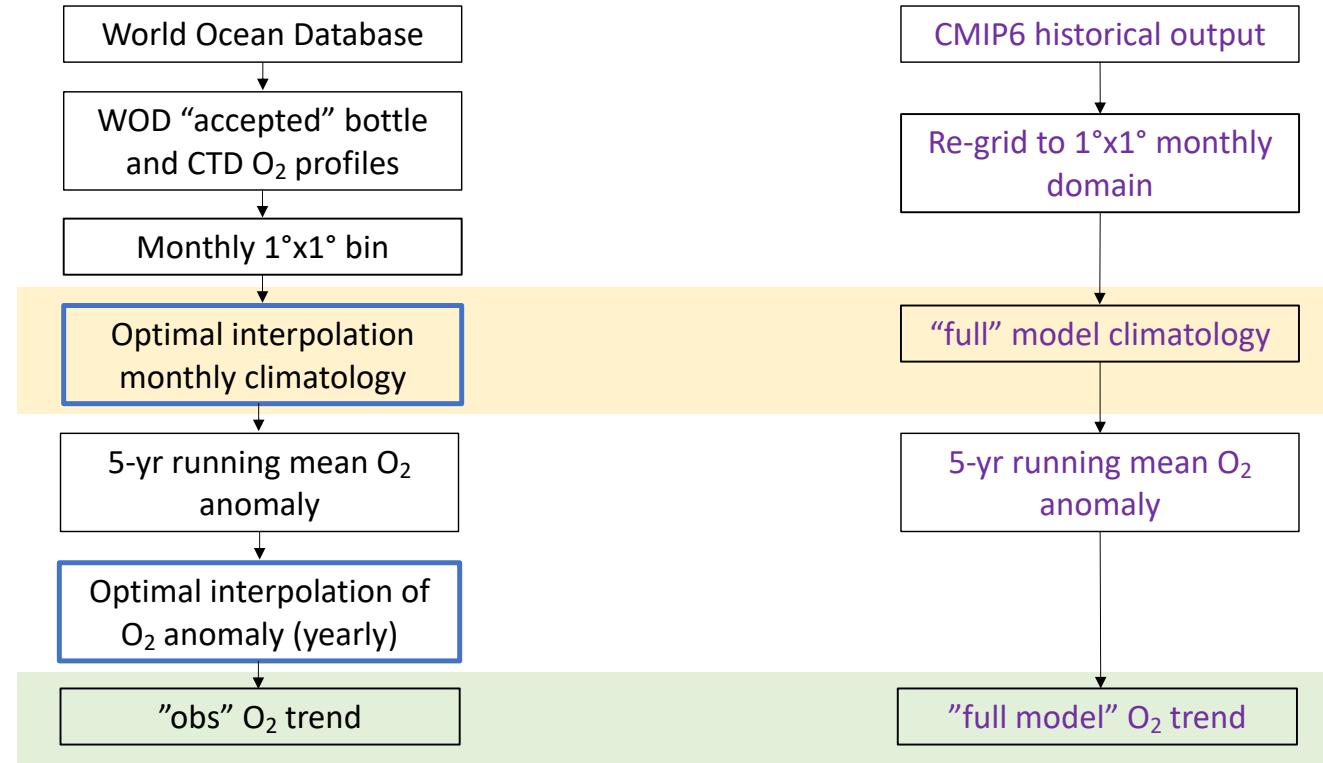
Optimal interpolation (Bretherton et al., 1976;  
Davis, 1985; Daley 1991; Wunsch 1996)

Gaussian covariance function is assumed



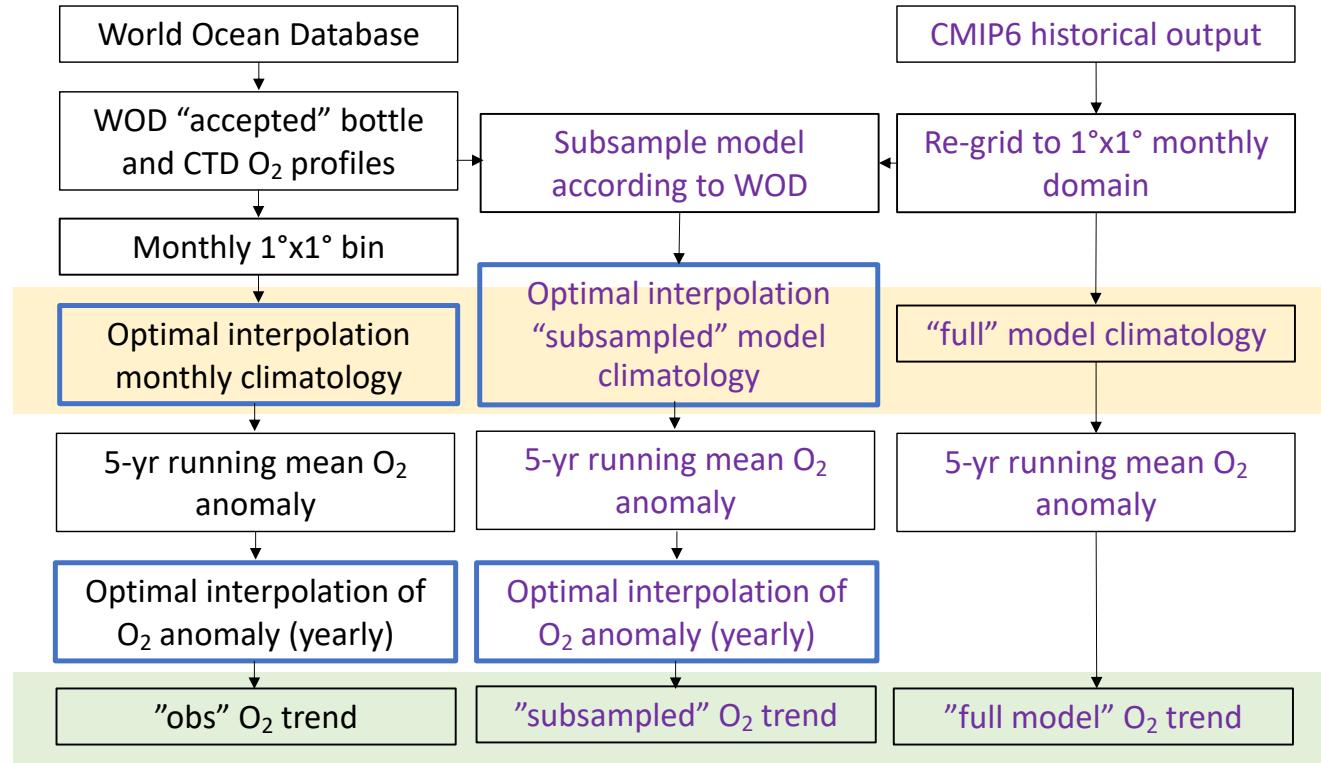
# Method: objective mapping of historical O<sub>2</sub> data

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- **Compare obs to model output**



# Method: objective mapping of historical O<sub>2</sub> data

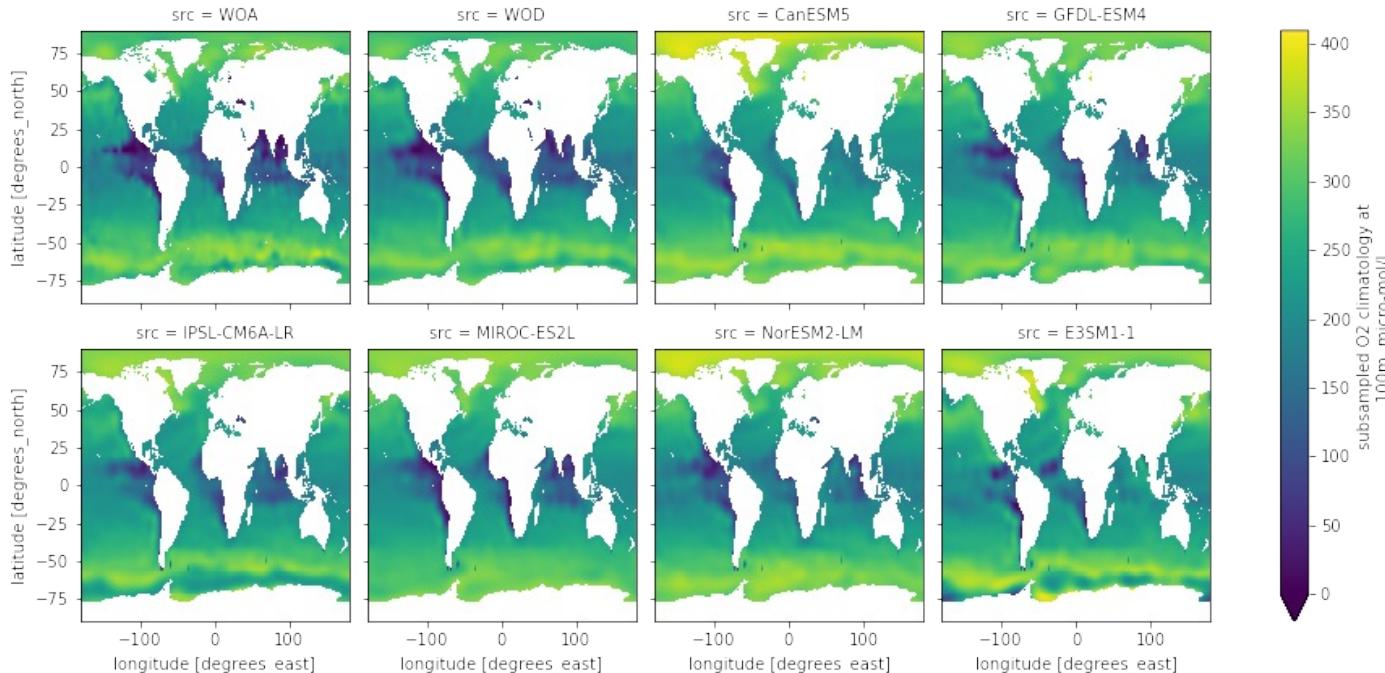
- **Bottle and CTD**  
(no ARGO yet)
- **Optimal Interpolation (OI)** from discrete to grid
- **Monthly climatology**  
(gridded)
- **O<sub>2</sub> anomaly:** OI of the 5-year running mean of anomaly field
- **Compare obs to model output**



# Result: CMIP6 models' climatology

- CanESM5
- GFDL-ESM4
- IPSL-CM6A-LR
- MIROC-ES2L
- NorESM2-LM
- E3SM1-1

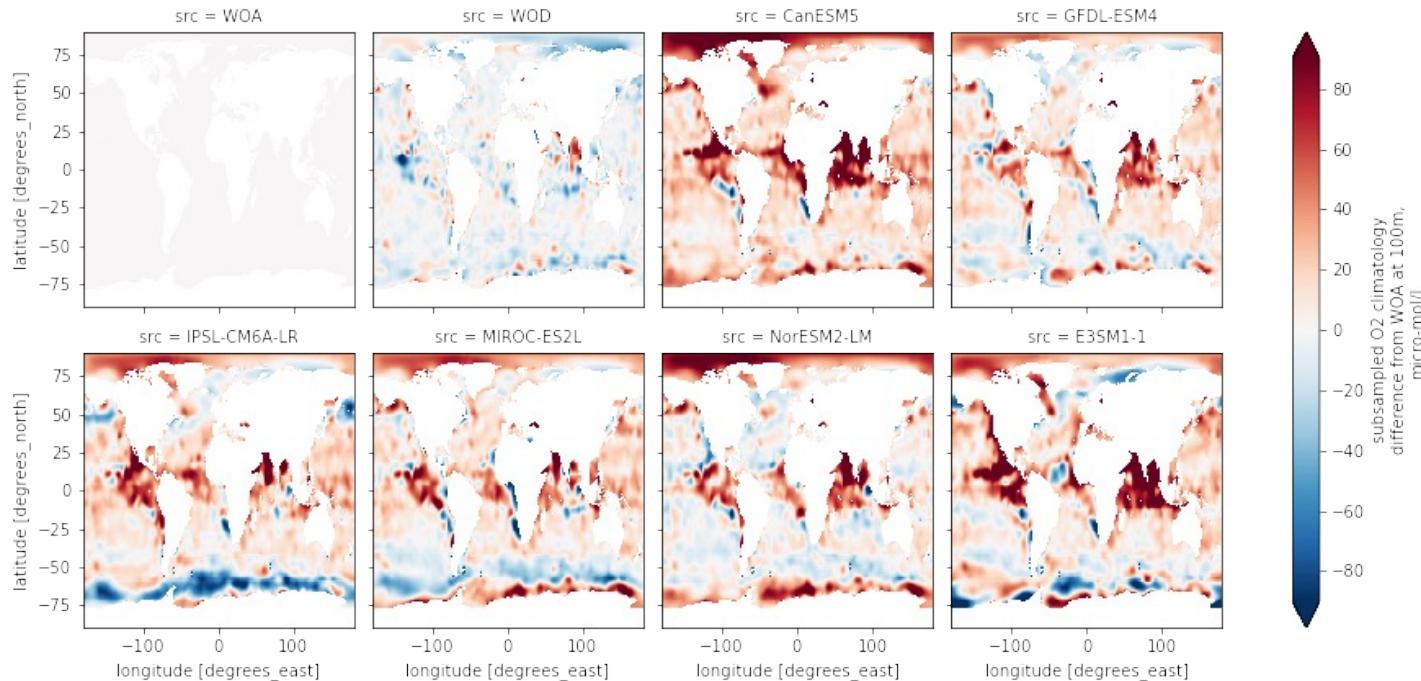
December climatology at 100m depth : subsampled and gap-filled



# Result: Climatology

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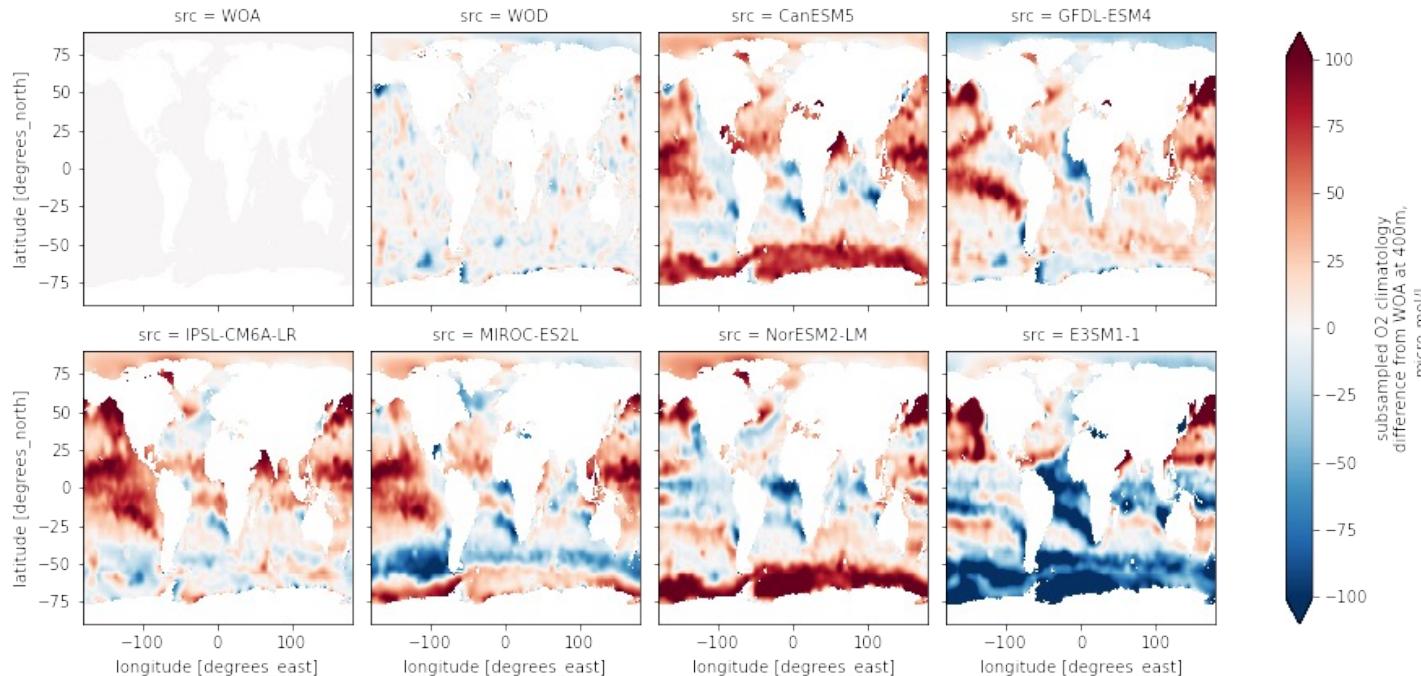
December climatology at 100m depth : subsampled and gap-filled,  
difference from WOA



# Result: Climatology

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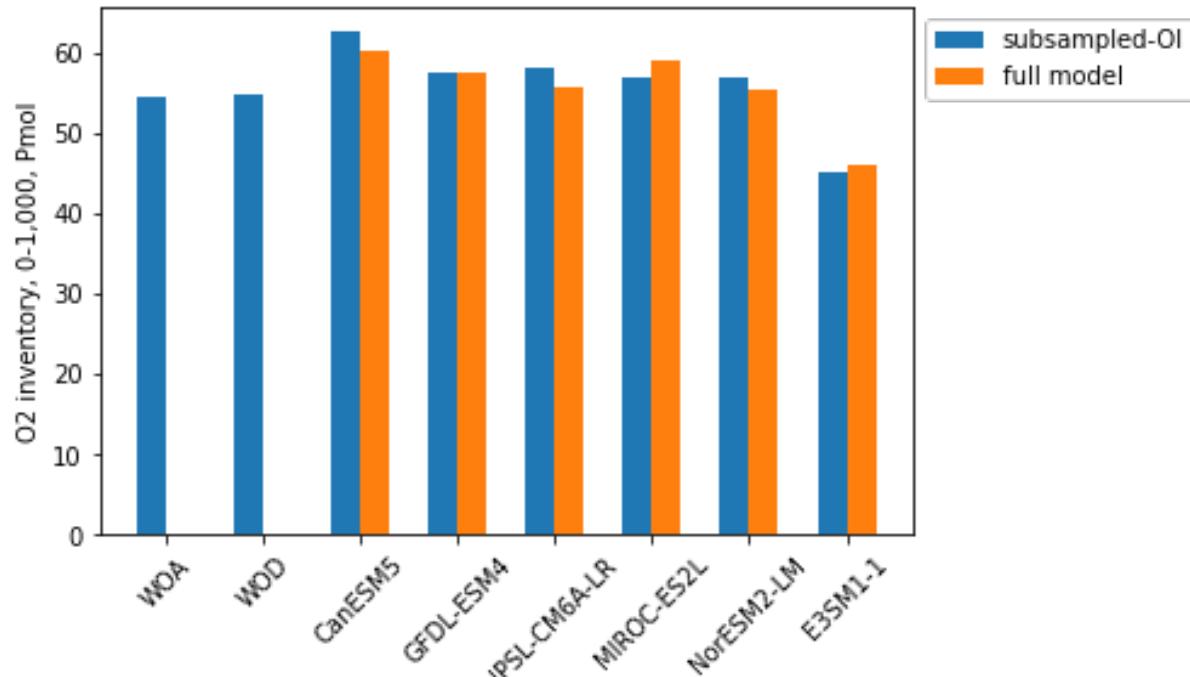
December climatology at 400m depth : subsampled and gap-filled,  
difference from WOA



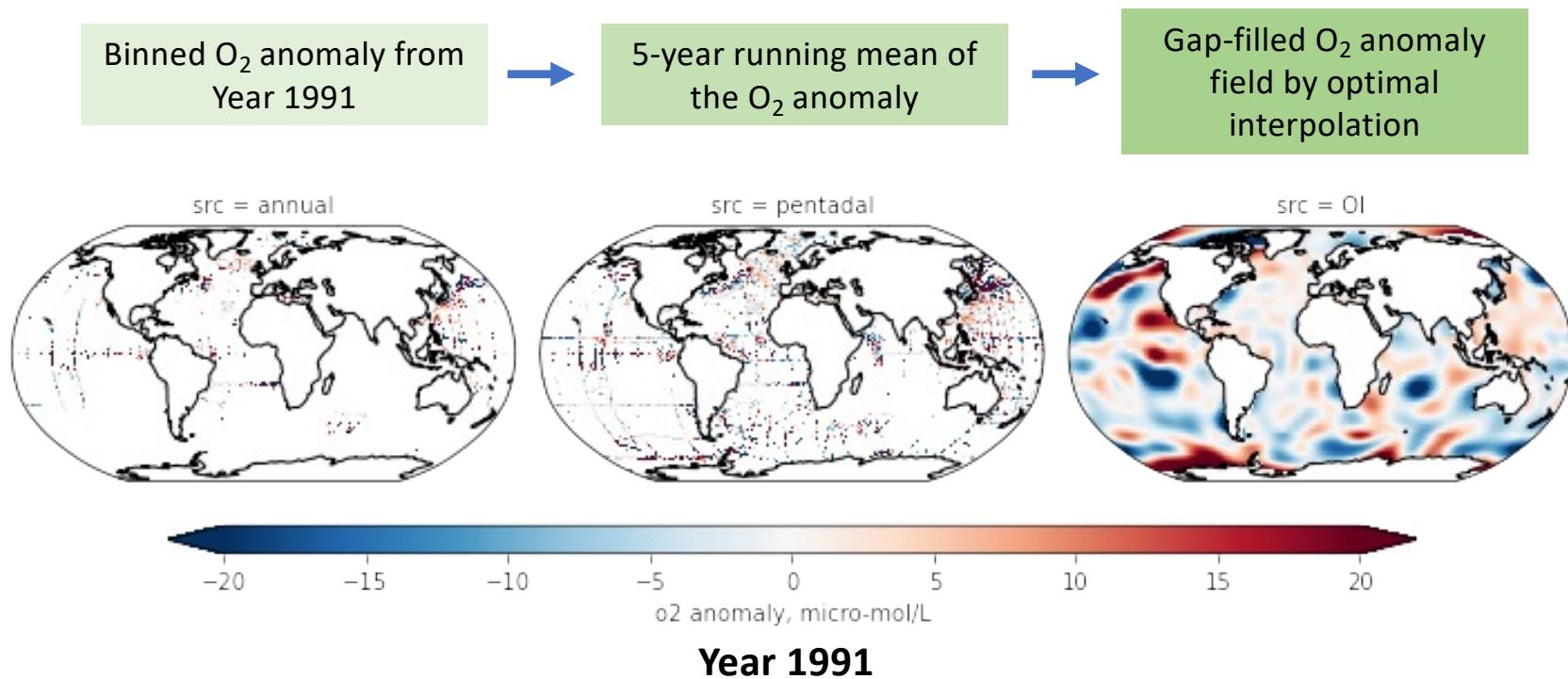
# Result: Climatological global O<sub>2</sub> inventory

0-1,000m O<sub>2</sub> inventory (annual mean climatology)

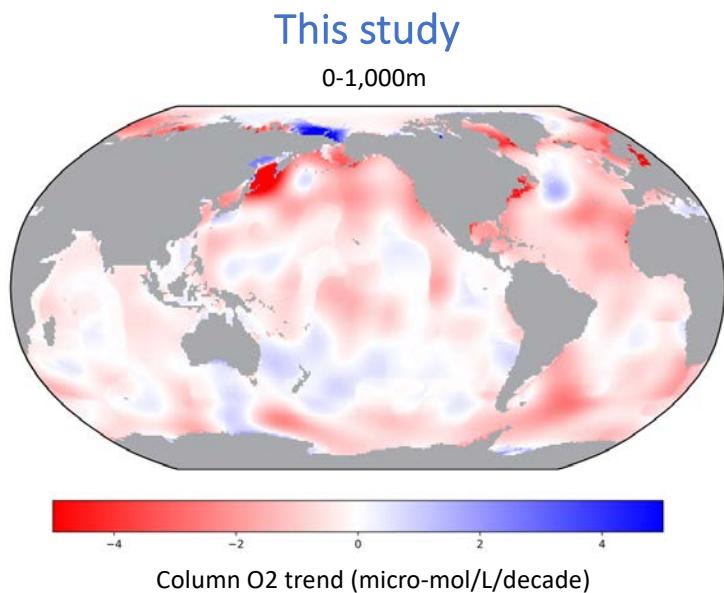
- WOA climatological inventory ~ 55Pmol
- Model estimates range ~ 46 - 60Pmol
- *Subsampled model O<sub>2</sub> inventories are within 4% of the full model value*



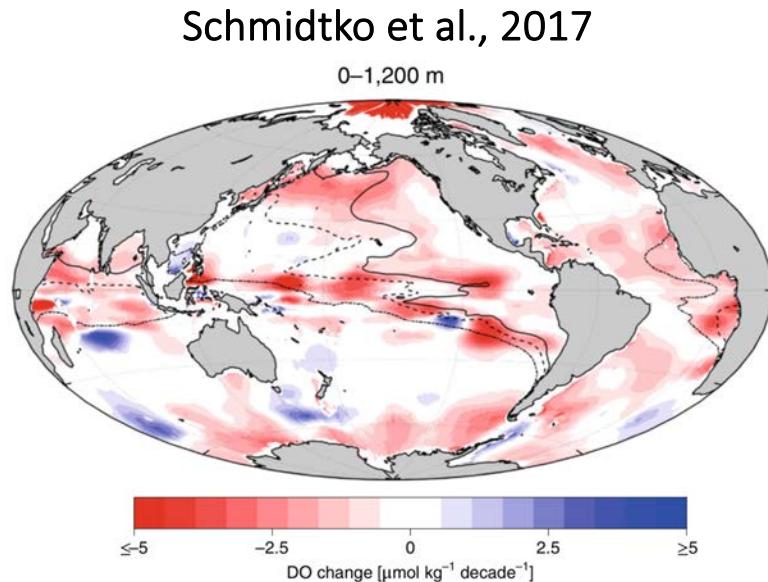
# Result: gap-fill by running mean and optimal interpolation



# Result: Global O<sub>2</sub> trend map



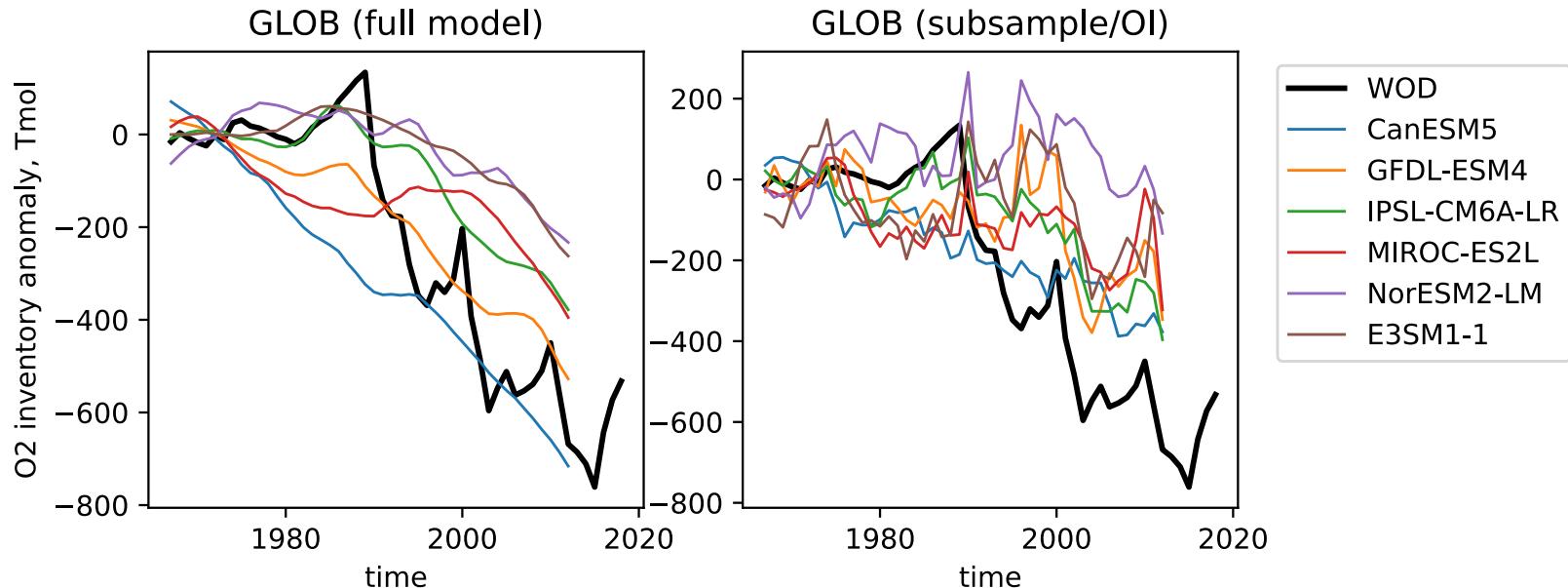
$-162 \pm 40$  Tmol/decade,  
approx. **1.5% loss** over 50 years



$-258 \pm 18.5$  Tmol/decade,  
approx. **2% loss** over 50 year

# Result: Global O<sub>2</sub> inventory time series

5-year running mean, 0-1,000m global O<sub>2</sub> inventory trend

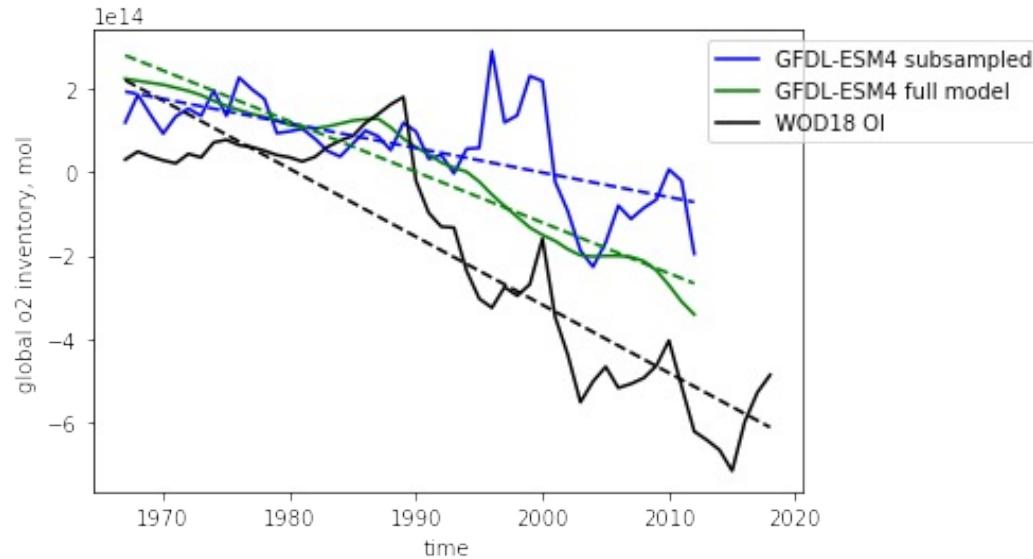


- Some models show comparable trend to observations (full model)
- Subsampled model trend shows comparable interannual "noise"

# Result: Global O<sub>2</sub> inventory time series

5-year running mean, 0-1,000m global O<sub>2</sub> inventory trend

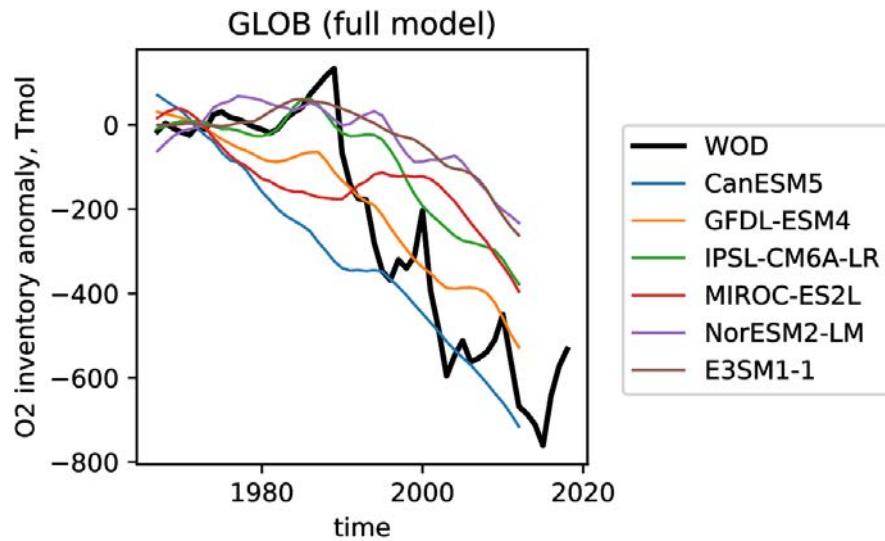
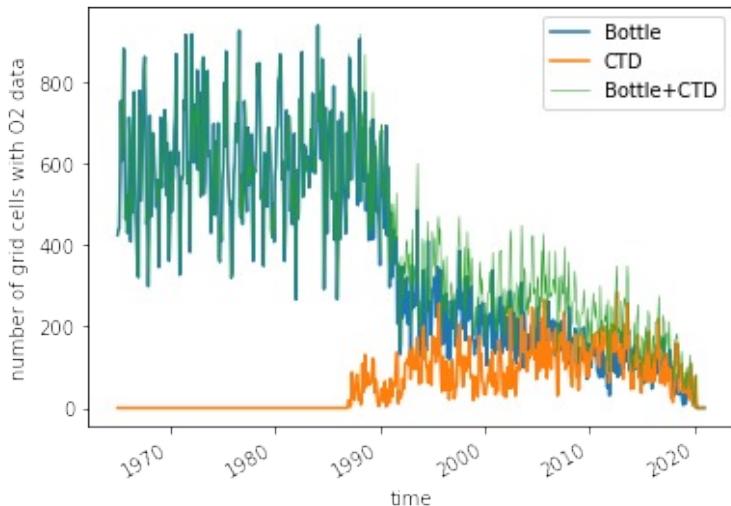
In GFDL-ESM4,  
subsampled model  
output shows spurious  
peaks in late 1990s and  
late 2000s that is not  
present in the full model



- Some models show comparable trend to observations (full model)
- Subsampled model trend shows comparable interannual "noise"

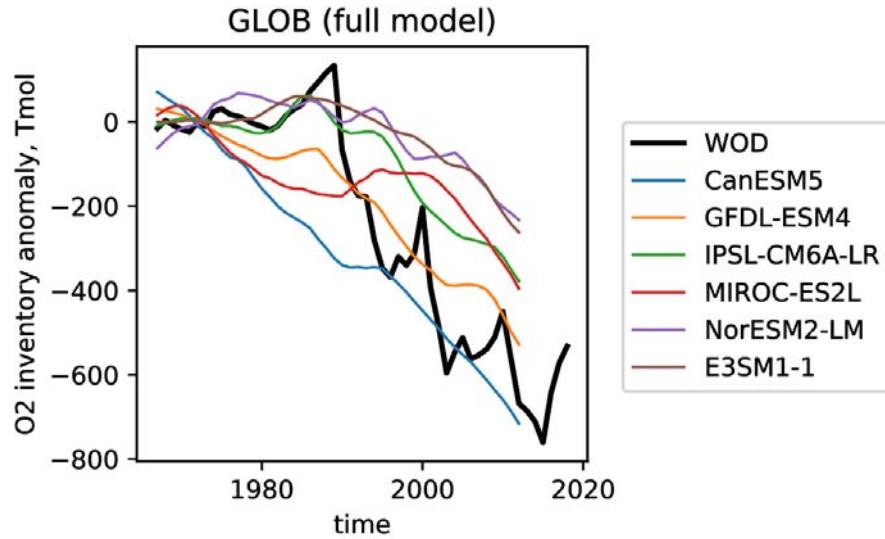
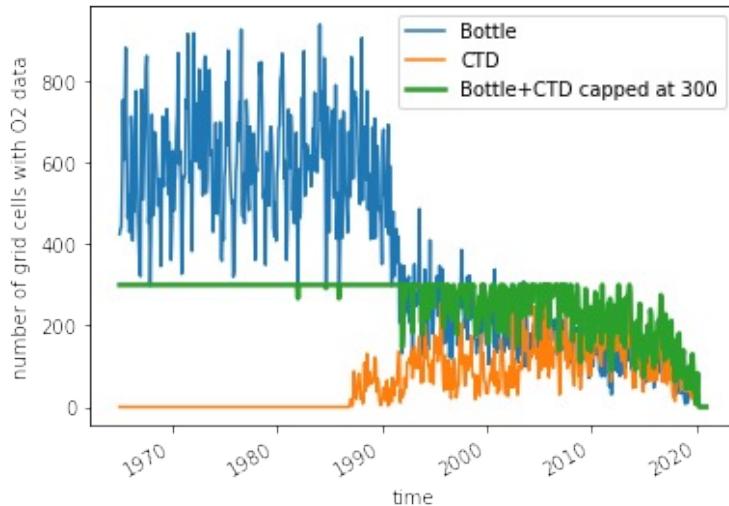
# Result: sensitivity experiment with normalized data count

- Monthly profile count shows sharp decline after 1990
- This coincides with the start of strong deoxygenation



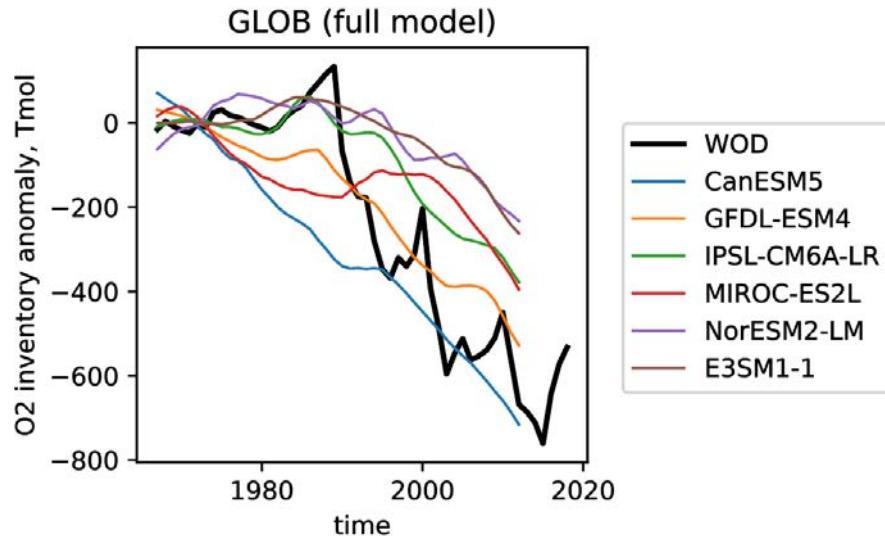
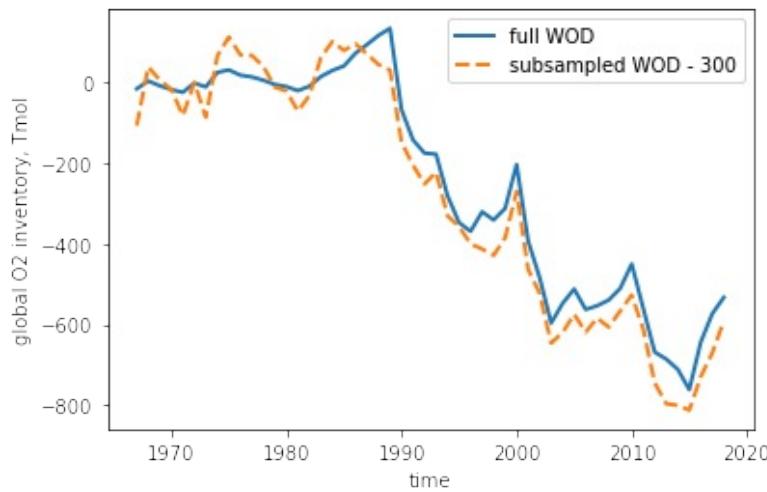
# Result: sensitivity experiment with normalized data count

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- *Randomly drop observed profiles to normalize the data count*



# Result: sensitivity experiment with normalized data count

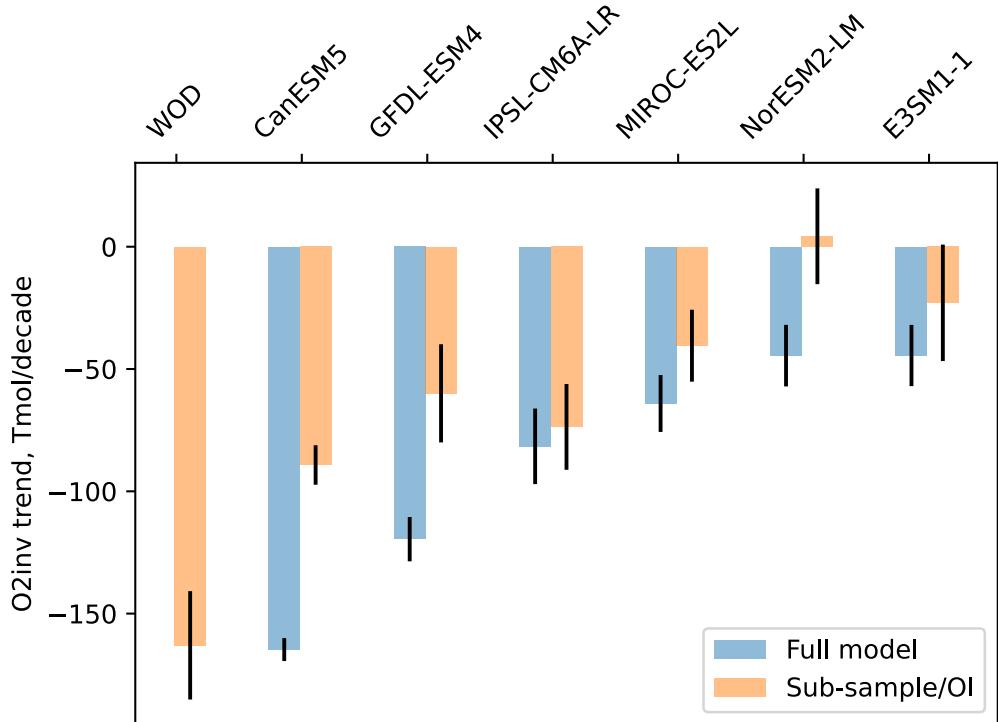
- Monthly profile count shows sharp decline after 1990
- This coincides with the start of strong deoxygenation
- *Randomly drop observed profiles to normalize the data count*
- *Similar deoxygenation trend*



# Result: Global O<sub>2</sub> inventory time series

0-1,000m global O<sub>2</sub> inventory linear trend (1967-2012)

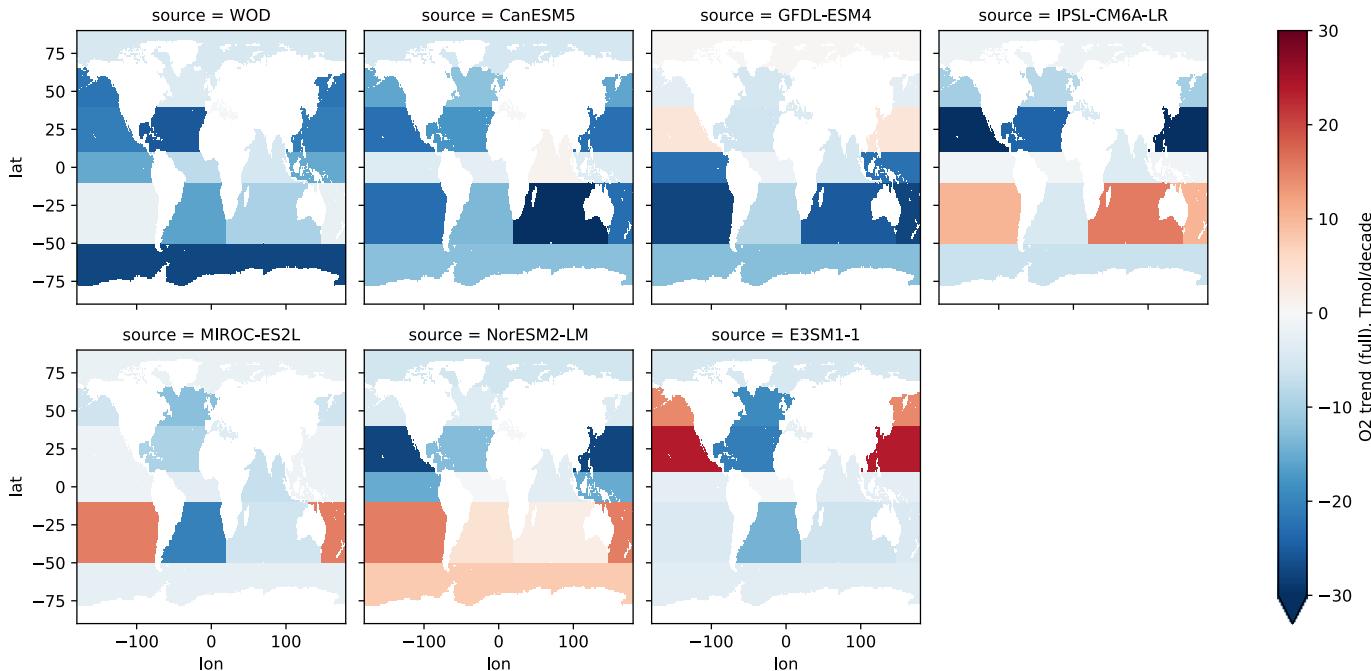
- Subsampled models significantly *underestimate* observed deoxygenation trend
- Subsampled trend also *underestimate* full model trend
- **Where is the disagreement coming from?**



# Result: Patterns of O<sub>2</sub> inventory trend

0-1,000m regional O<sub>2</sub> inventory trend : full model

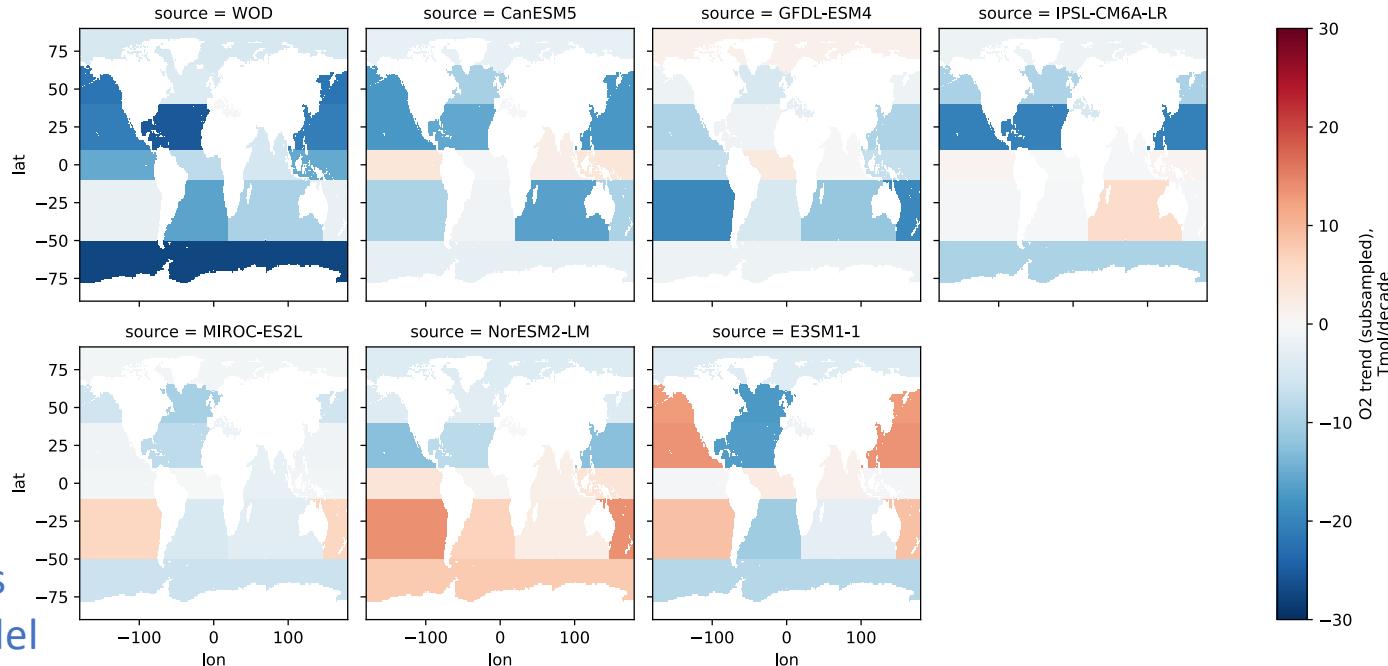
- 11 regional inventory trends in color scale
- Consistent in the North Atlantic
- Disagreements in the SH



# Result: Patterns of O<sub>2</sub> inventory trend

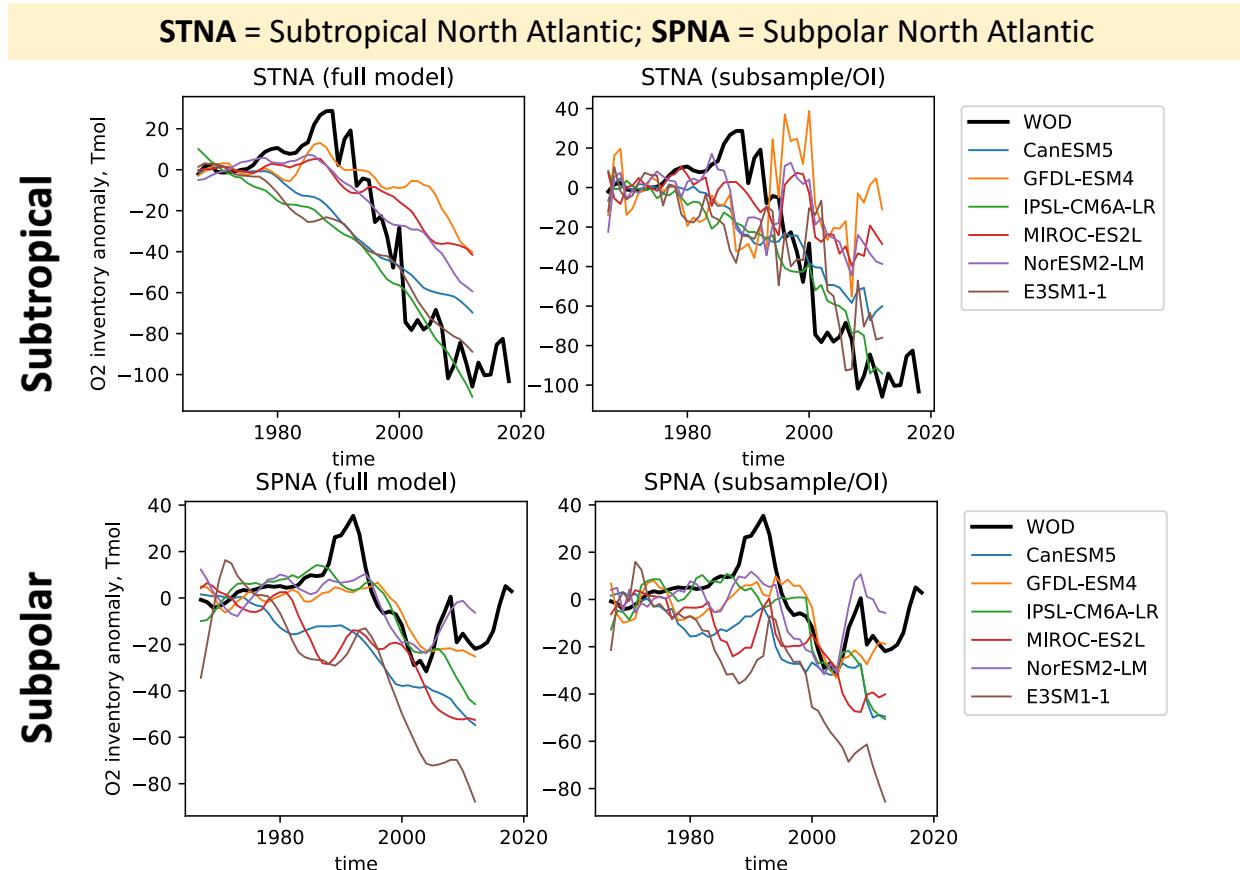
0-1,000m regional O<sub>2</sub> inventory trend : subsampled model

- 11 regional inventory trends in color scale
- Consistent in the North Atlantic
- Disagreements in the SH
- Subsampled model generally preserves the sign of full model trend



# Result: Regional O<sub>2</sub> inventory time series

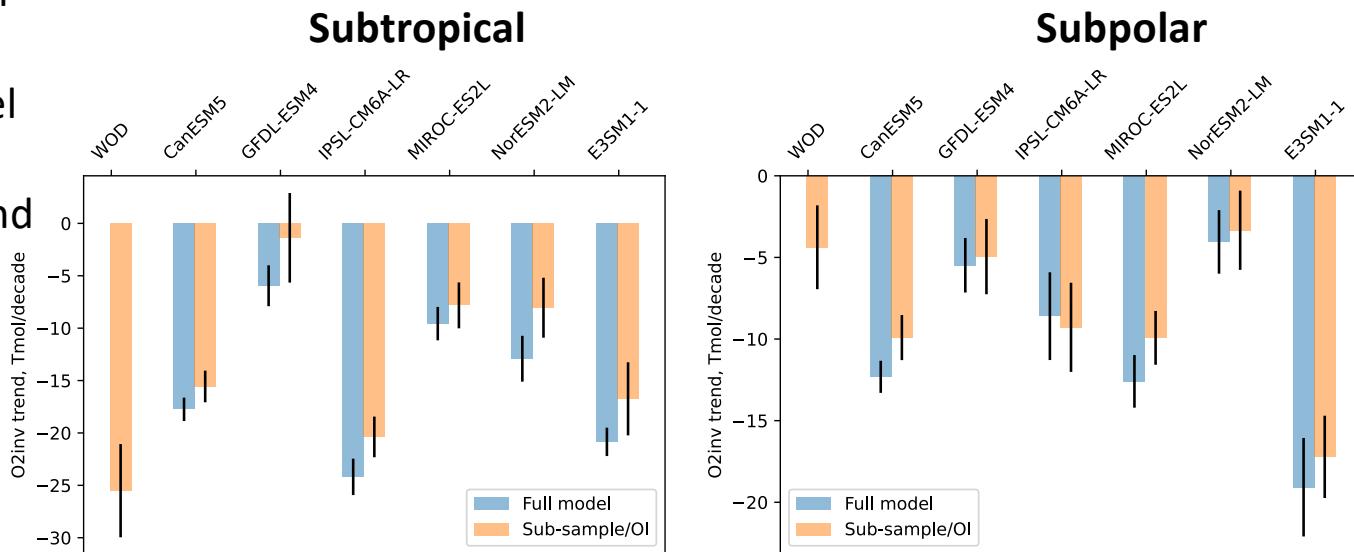
- North Atlantic is relatively data-rich
- Subsampled model generally capture the full model trend
- Some subsampled models show spurious peaks



# Result: Regional O<sub>2</sub> inventory trend

- North Atlantic is relatively data-rich
- Subsampled model generally capture the full model trend
- Some subsampled models show spurious peaks
- Models are overlapping/ bracketing the observed values

STNA = Subtropical North Atlantic; SPNA = Subpolar North Atlantic

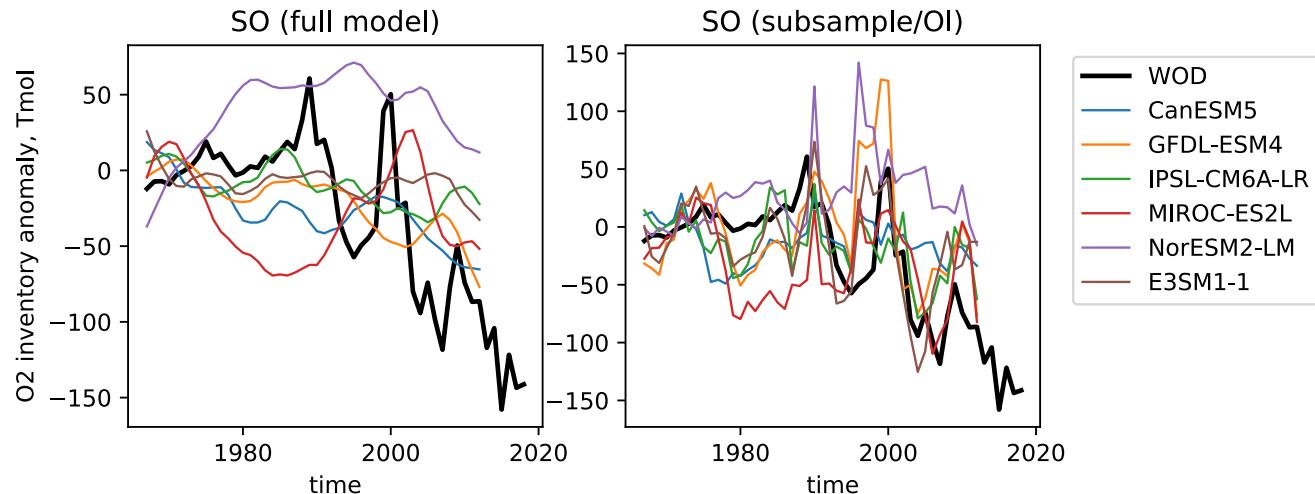


# Result: Regional O<sub>2</sub> inventory trend

- Southern Ocean is relatively data-poor
- Major sampling noises are visible in the subsampled model data

SO = Southern Ocean

## Southern Ocean (poleward of 50°S)

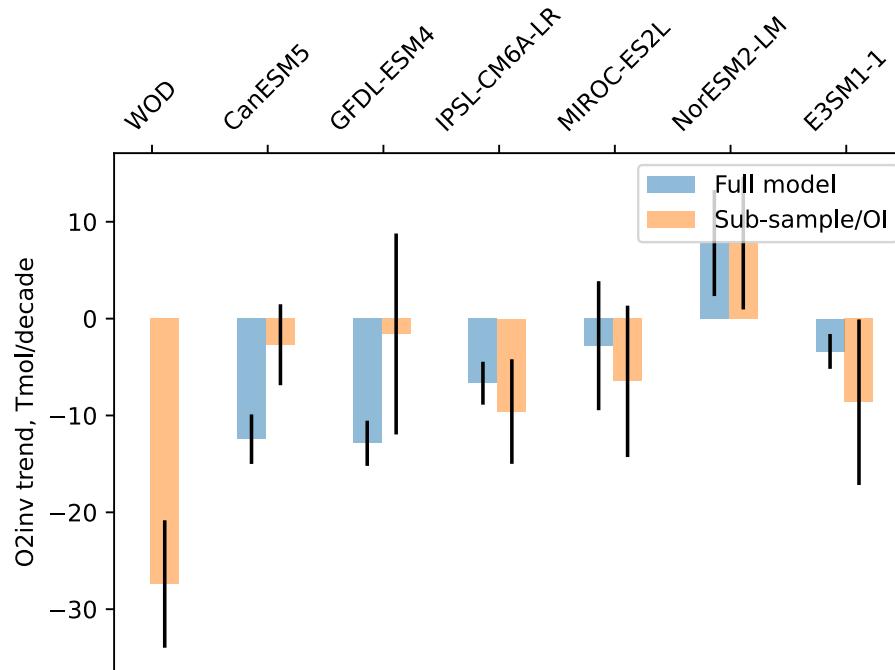


# Result: Regional O<sub>2</sub> inventory trend

- Southern Ocean is relatively data-poor
- Major sampling noises are visible in the subsampled model data
- OI is not doing a good job in the SO!!!

SO = Southern Ocean

## Southern Ocean (poleward of 50°S)



## **Summary:** an estimate of the global deoxygenation trend

- **$1.5 \pm 0.4\%$  loss of O<sub>2</sub> over the last 50 years**
  - Less tropical deoxygenation in comparison to Schmidtko et al (2017)
- **CMIP6 models are closer to observations than previous generations** but still underestimates the global trend
  - Models bracket the observation in the North Atlantic
- **Models are not perfect but useful for understanding observations**
  - Subsampled models can illustrate the noisy global/regional time series caused by the sampling biases (e.g. Southern Ocean)

# Moving forward

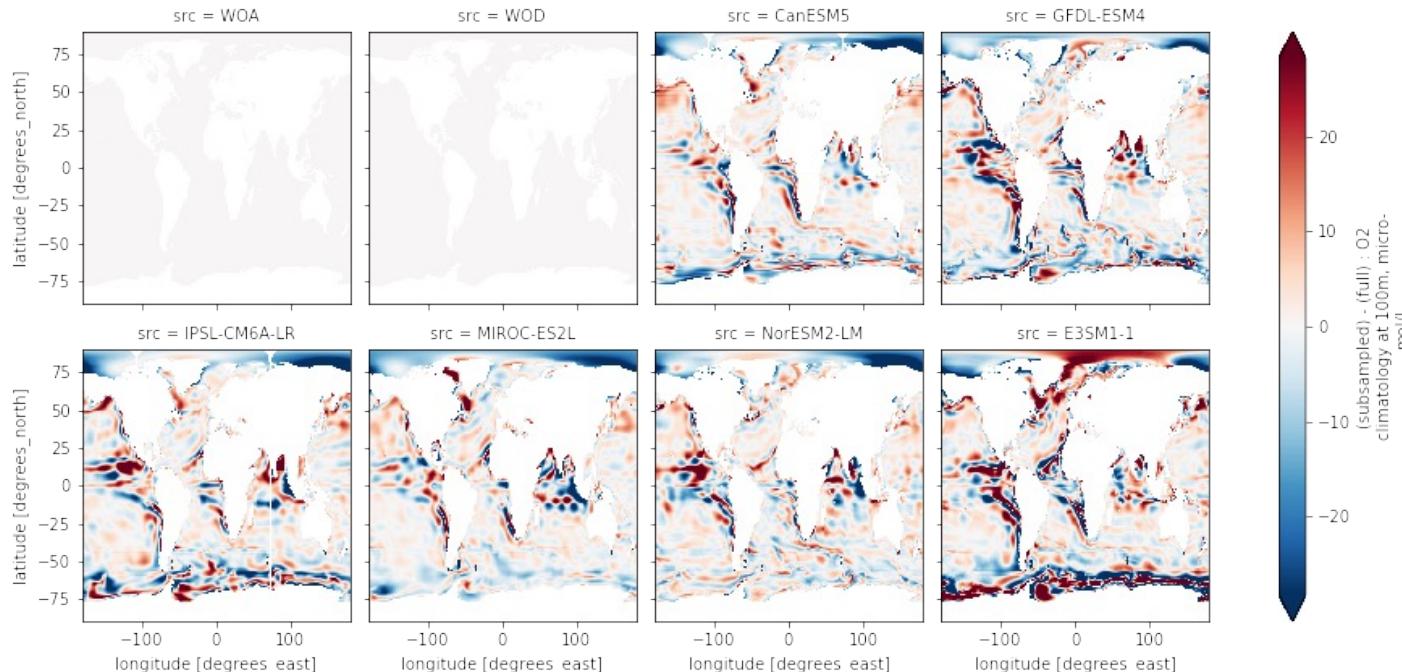
- Observational intercomparison
  - Standardized comparison of different gap-fill approaches
  - Coastal and regional assessments
- Integration of new observations: BGC-Argo
- Reproducibility & open access
  - Data source: **WOD select**
  - Scripts: [github.com/takaito1/optint\\_wod\\_o2](https://github.com/takaito1/optint_wod_o2)

Thank you!

# Result: Climatology

- CanESM5
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December climatology at 100m depth : subsampled and gap-filled,  
difference from full model



# Result: Global O<sub>2</sub> inventory time series

0-1,000m global O<sub>2</sub> inventory linear trend (1967-2012)

- NH trend (~90Tmol/decade) and SH (~70Tmol/decade)
- Comparing NH vs SH trends, subsampled models better capture the full model trend in the NH. Major discrepancies in the SH

