

# Using a Limited-Domain Transport Matrix Technique to Study the Oxygen Concentrations in the Indian Ocean

Ann Bardin  
François Primeau  
Keith Moore

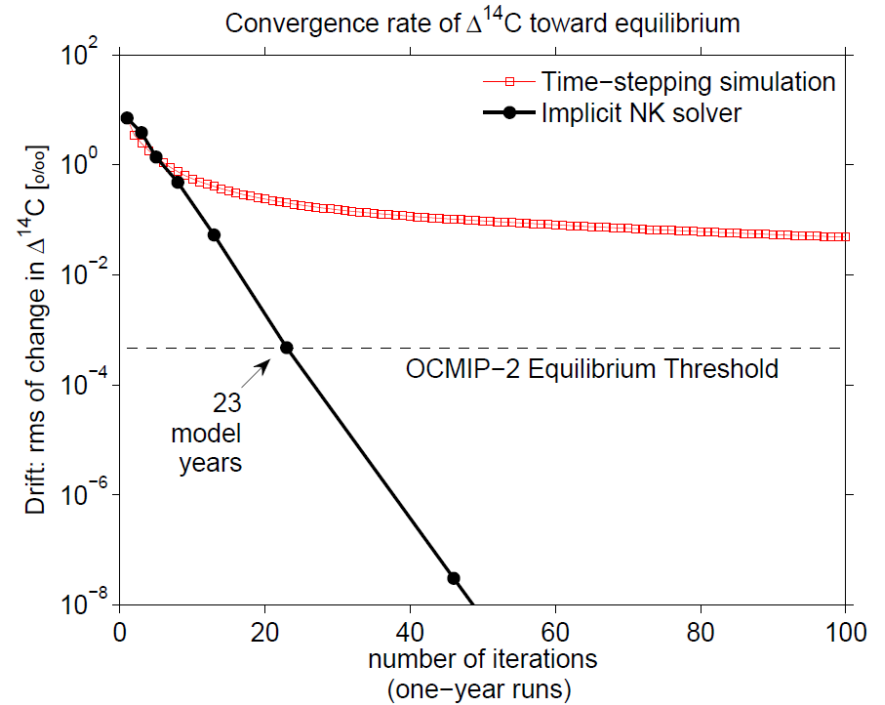
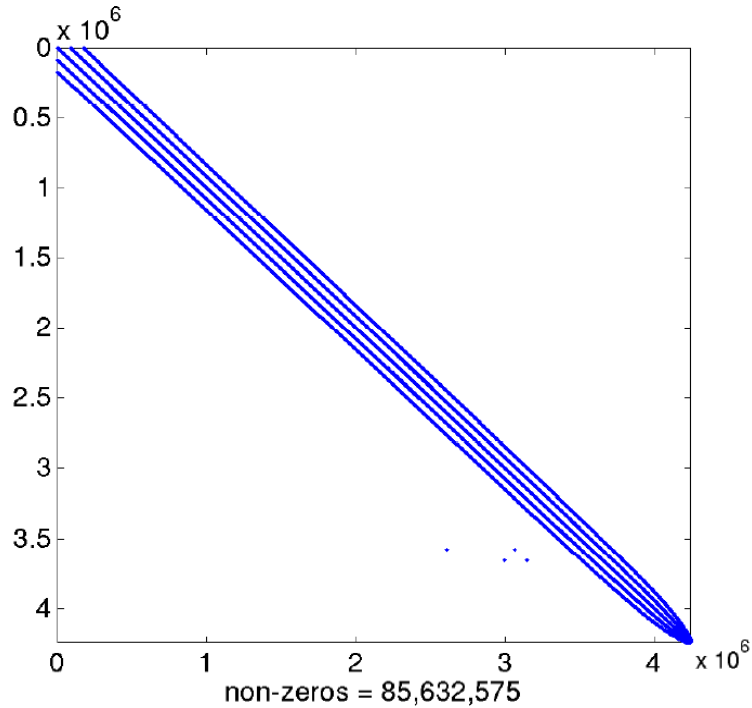
For CESM Ocean  
Modeling Working Group  
January, 2015

# Agenda

Previously,



- $^{14}\text{C}$  Age dating of the ocean using a Global offline model



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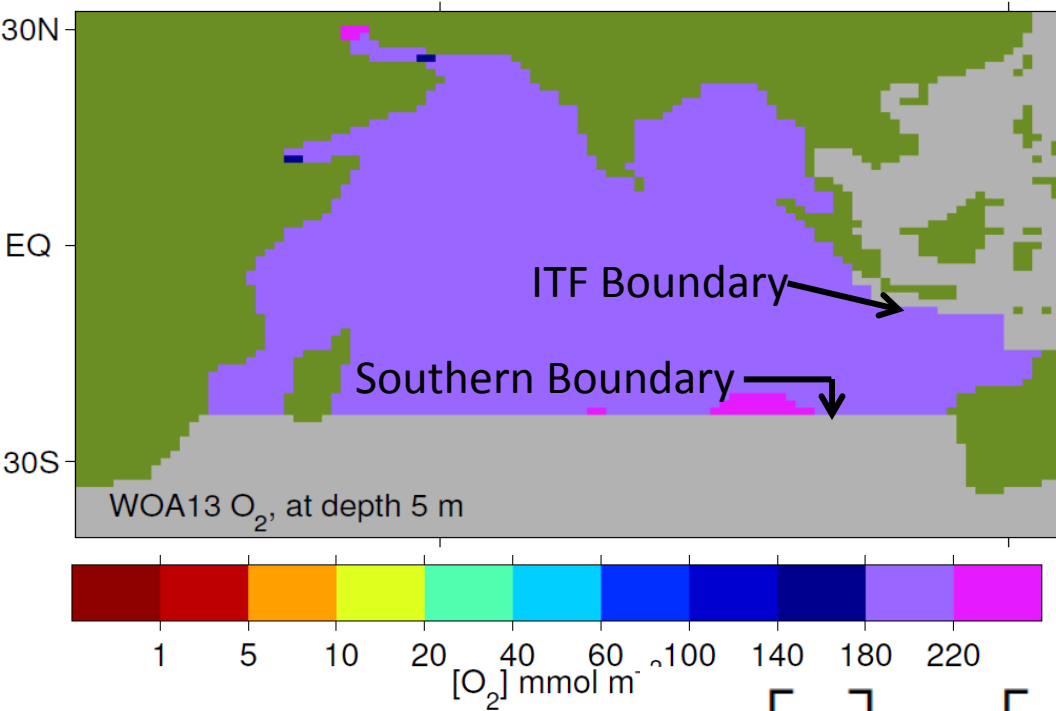


Now,

with a regional offline model, determine external vs. internal biases in circulation and biological processing

- How does this work?
- What are the effects of moving the southern boundary?
- From which boundaries do the OMZ sources of water and oxygen come?
- Can we determine circulation vs. biological processing biases?

# Regional Boundaries



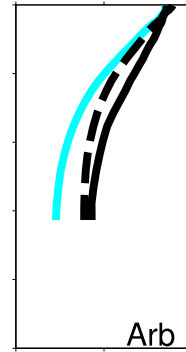
How to set up the boundary conditions such that it appears as if the global ocean is present?

$$\frac{\partial c}{\partial t} + \mathbf{T}c + S = 0$$

$$\frac{\partial}{\partial t} \begin{bmatrix} c_i \\ c_e \end{bmatrix} + \begin{bmatrix} \mathbf{T}_{ii} & \mathbf{T}_{ie} \\ \mathbf{T}_{ei} & \mathbf{T}_{ee} \end{bmatrix} \begin{bmatrix} c_i \\ c_e \end{bmatrix} + \begin{bmatrix} S_i \\ S_e \end{bmatrix} = 0$$

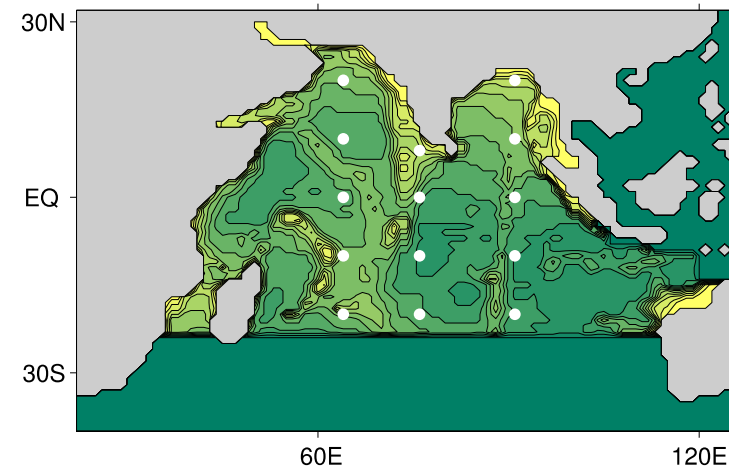
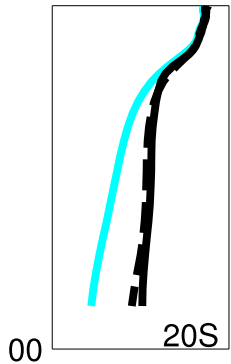
$$\frac{\partial c_i}{\partial t} + \mathbf{T}_{ii}c_i = -\mathbf{T}_{ie}c_e - S_i$$

# Distinguishing Regional Circulation Bias from Global Circulation Bias

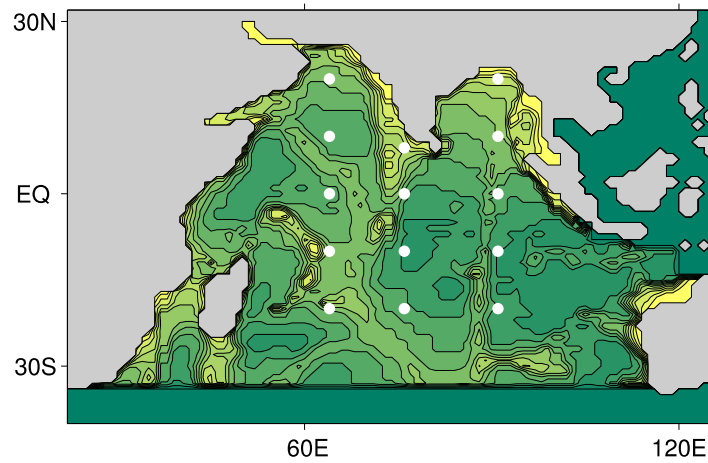
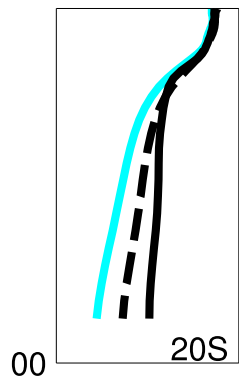
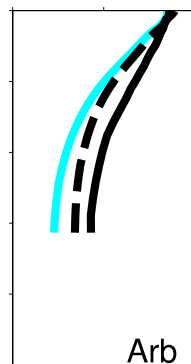


Comparison of

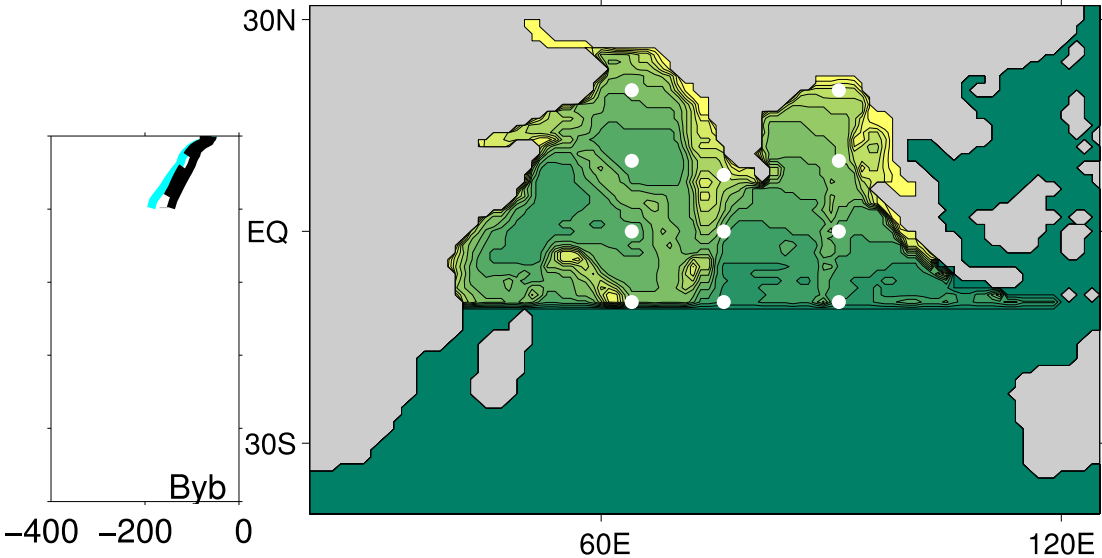
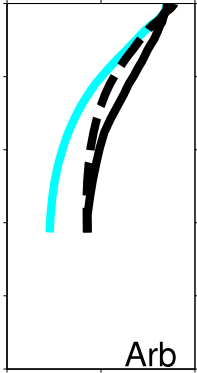
- $^{14}\text{C}$  Global simulation,
- Regional simulation using observational boundary values, and
- GLODAP gridded observations



# What happens if we move the boundary to 35S ?



# What happens if we move the boundary to 12S ?



# Agenda

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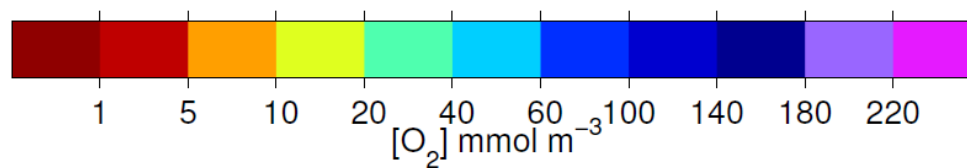
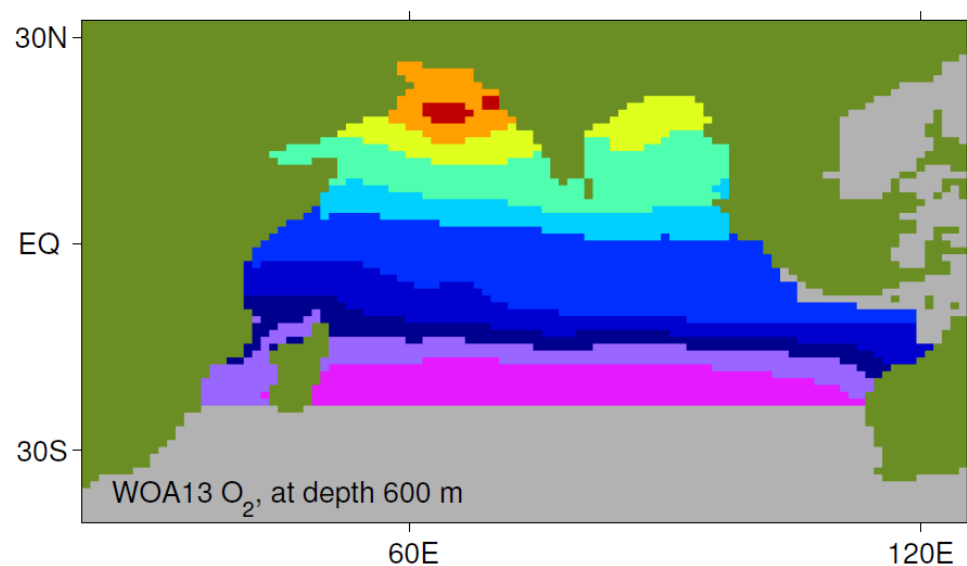
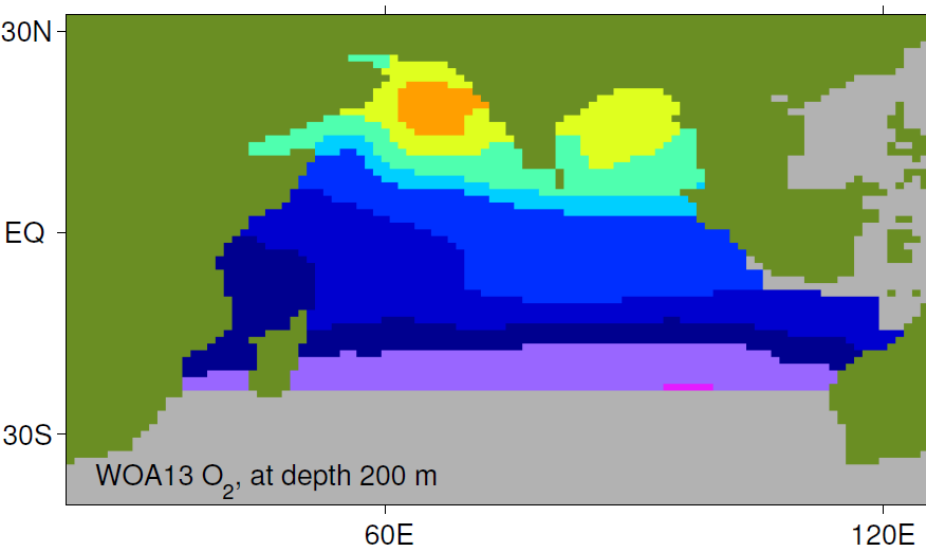
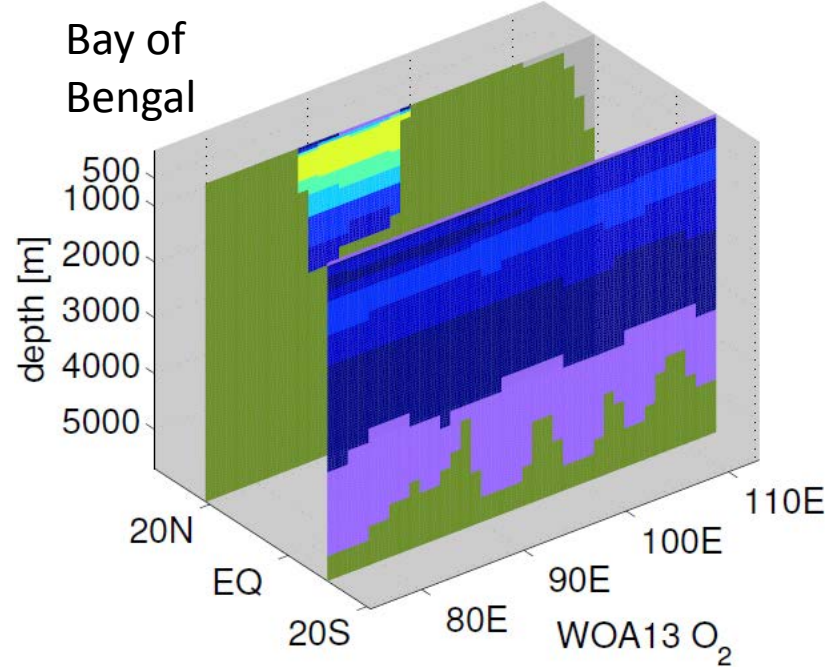
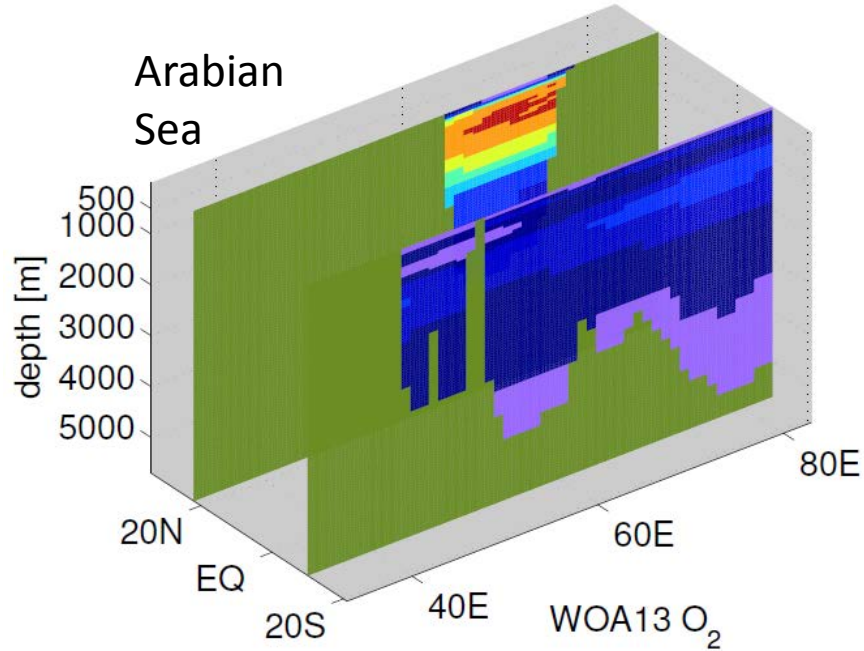
- $^{14}\text{C}$  Age Dating of the ocean using a Global offline model

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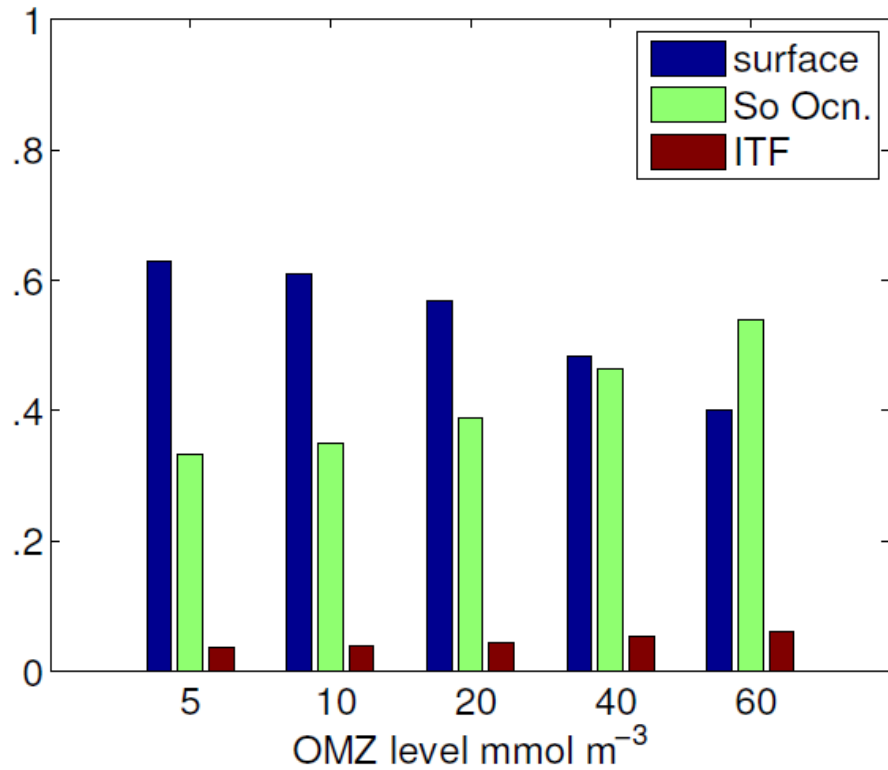
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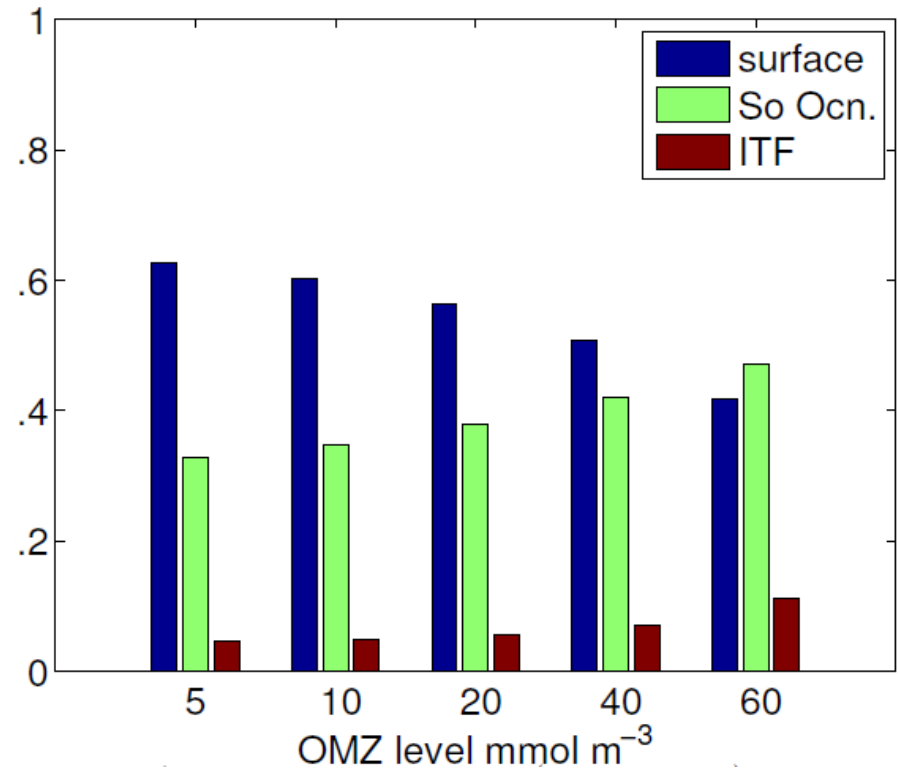




# Which boundaries are the biggest ventilation sources of the OMZs?



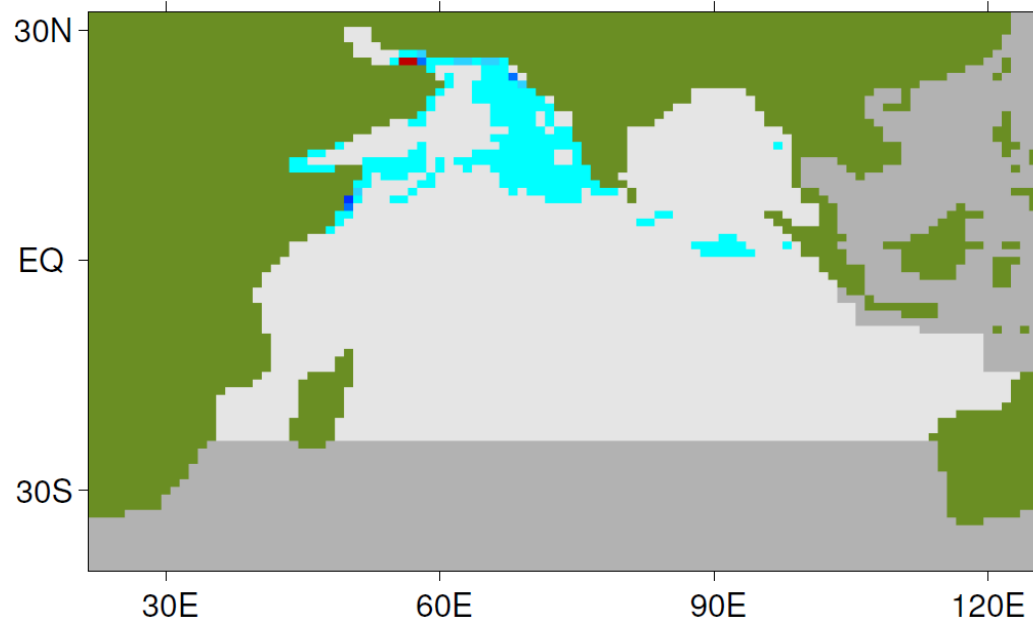
Arabian Sea



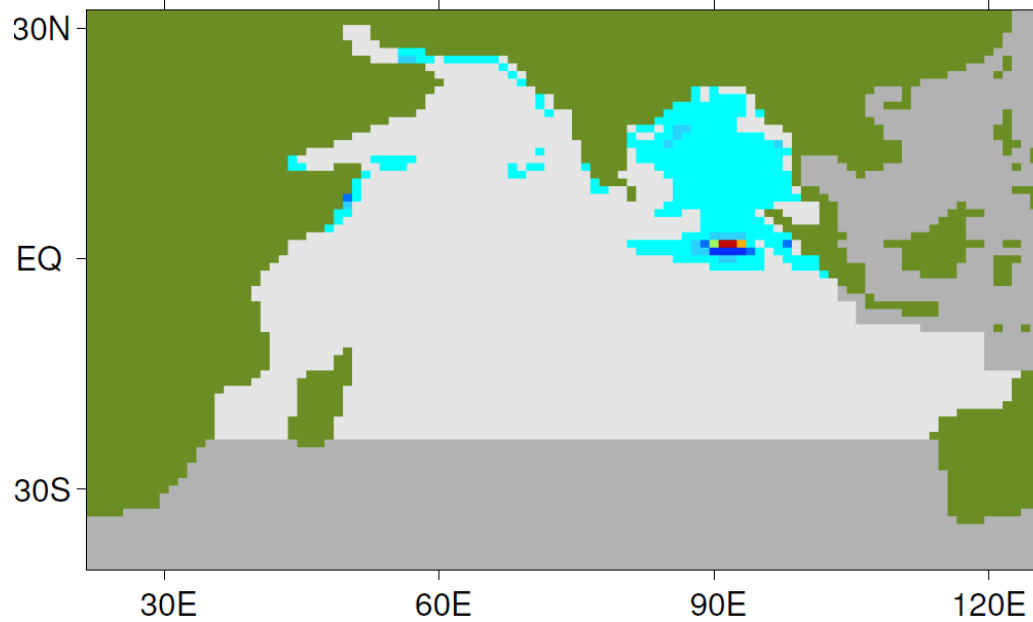
Bay of Bengal

# What is the ventilation source pattern on the surface ?

For the  
Arabian Sea  
 $20 \text{ mmol m}^{-3}$   
OMZ



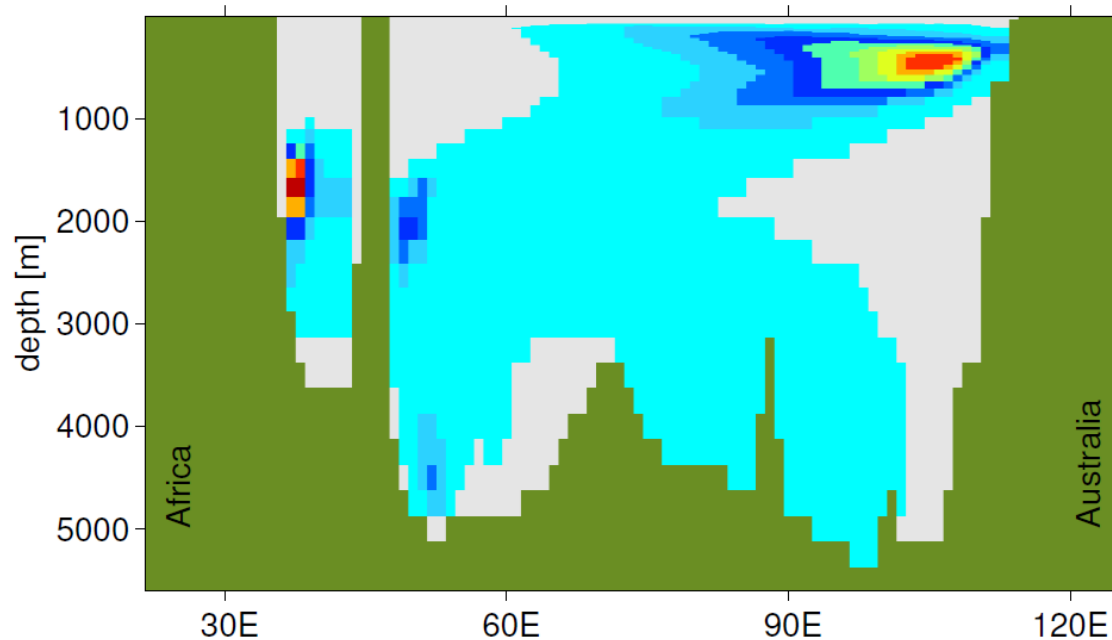
For the  
Bay of Bengal  
 $20 \text{ mmol m}^{-3}$   
OMZ



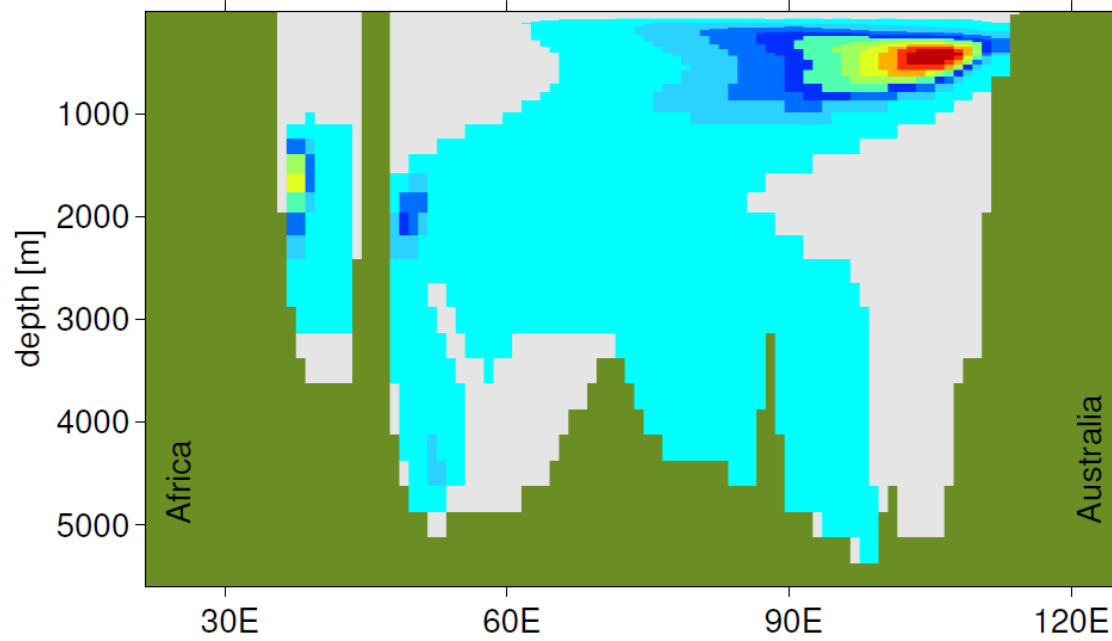
source  
fraction,  
normalized by  
its maximum

# What is the ventilation source pattern on the Southern Boundary?

For the  
Arabian Sea  
 $20 \text{ mmol m}^{-3}$   
OMZ

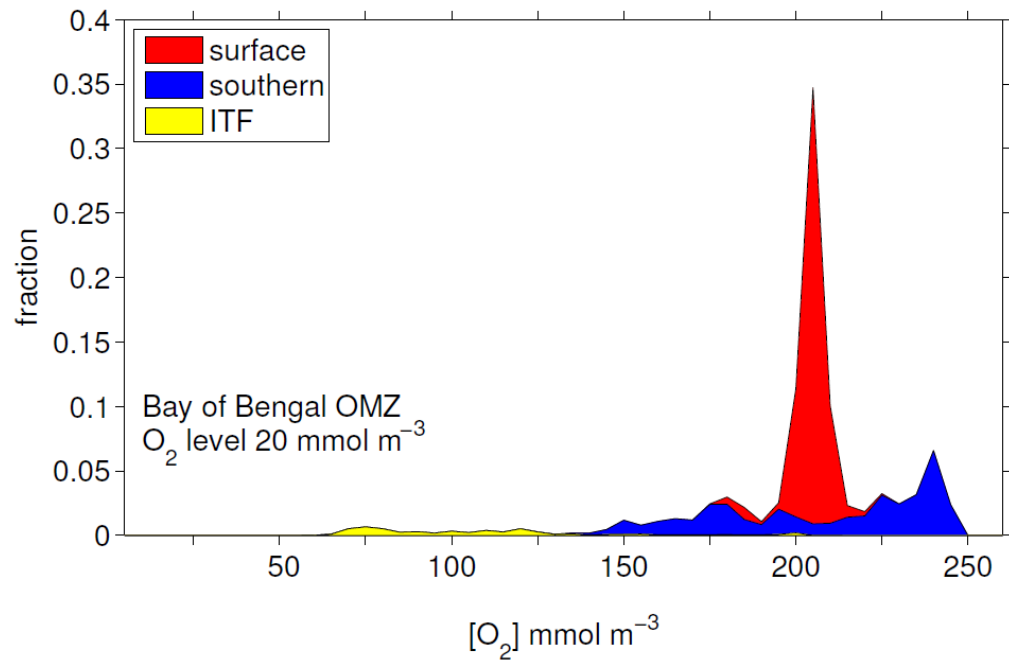
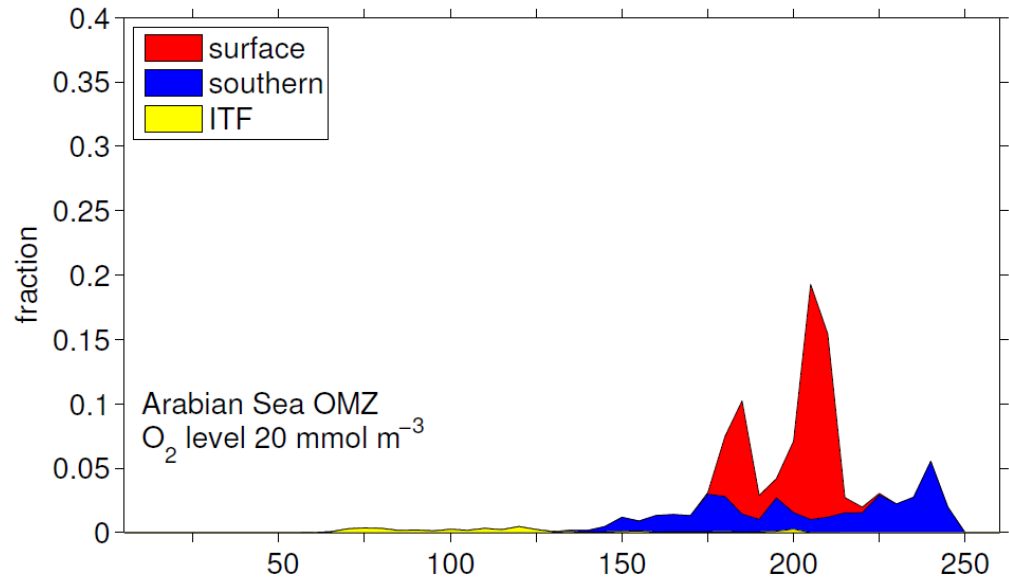


For the  
Bay of Bengal  
 $20 \text{ mmol m}^{-3}$   
OMZ



source  
fraction,  
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its maximum

# Oxygen Source Distribution



# Agenda

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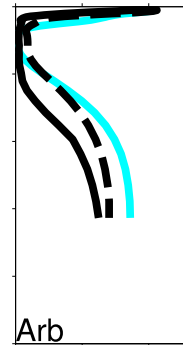
With a regional offline model, determine external vs. internal biases in circulation and biological processing

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# Regional Oxygen Model with Biology

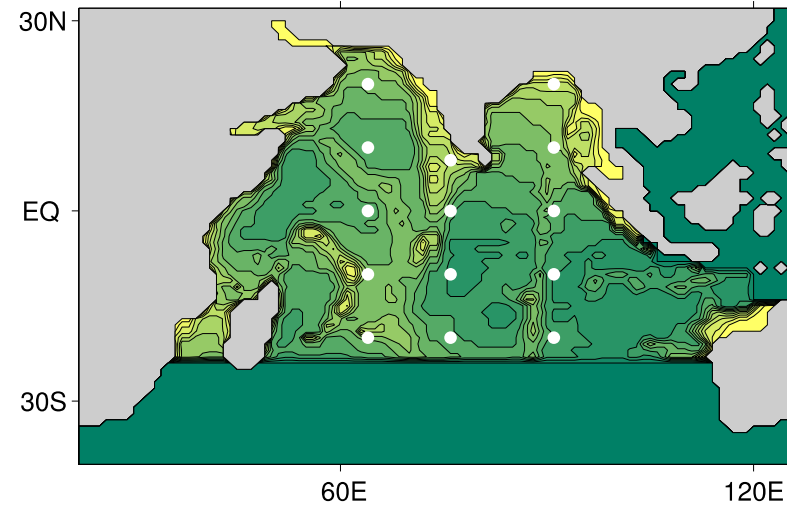
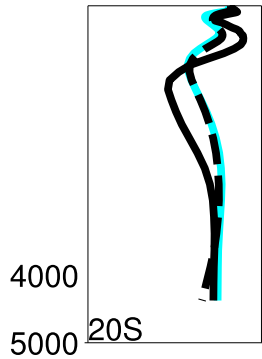
- Biological component for O<sub>2</sub>
  - Use BEC model O<sub>2</sub> production and consumption output variables from CMIP5 CESM simulation
- CMIP5 simulation
  - ocean-atmosphere coupled simulation for IPCC scenario RCP8.5 (business as usual)
  - Present day conditions: 1990s
  - Forcings and spin-up are different from that for the parent of offline model

# Comparing Regional BEC Bias with Global BEC Bias -1



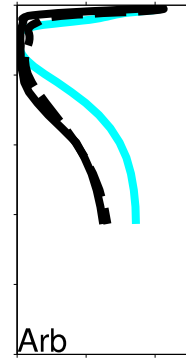
Comparison:

- Global BEC CMIP5  $O_2$ ,
- Regional Model with **Global BEC CMIP5  $O_2$  boundaries**, and
- WOA13  $O_2$  observations



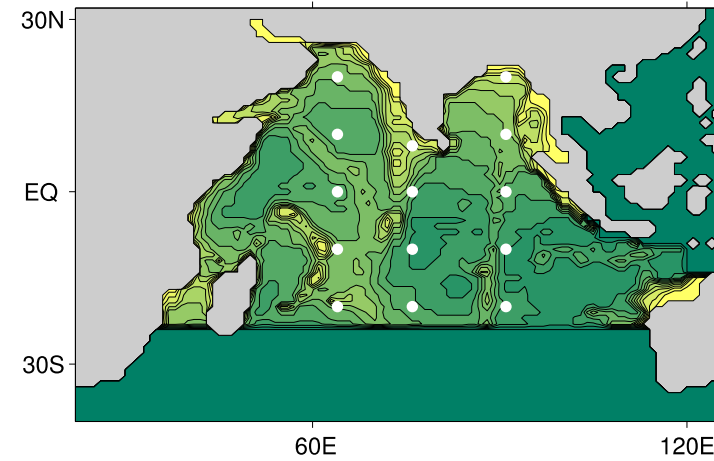
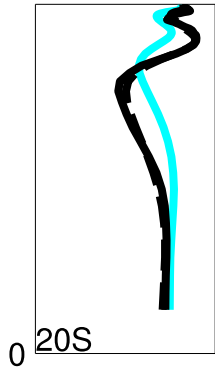


# Comparing Regional BEC Bias with Global BEC Bias -2

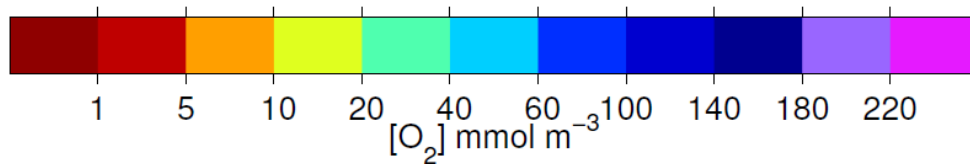
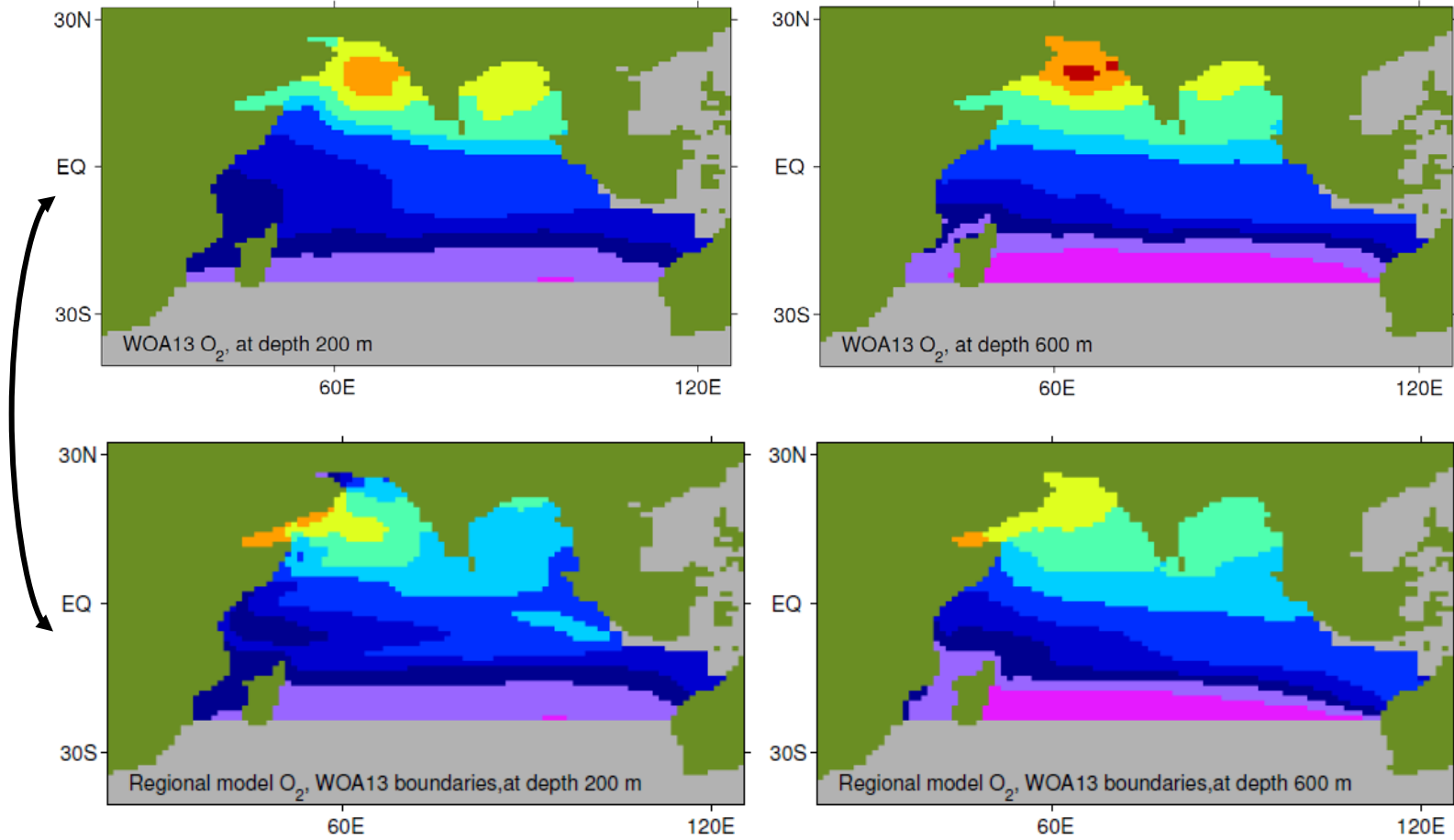


Comparison:

- Global BEC CMIP5 O<sub>2</sub> ,
- Regional Model with **WOA13 O<sub>2</sub> boundaries**, and
- WOA13 O<sub>2</sub> observations

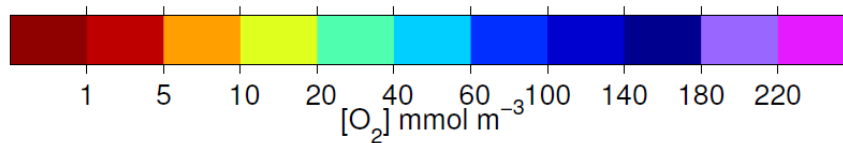
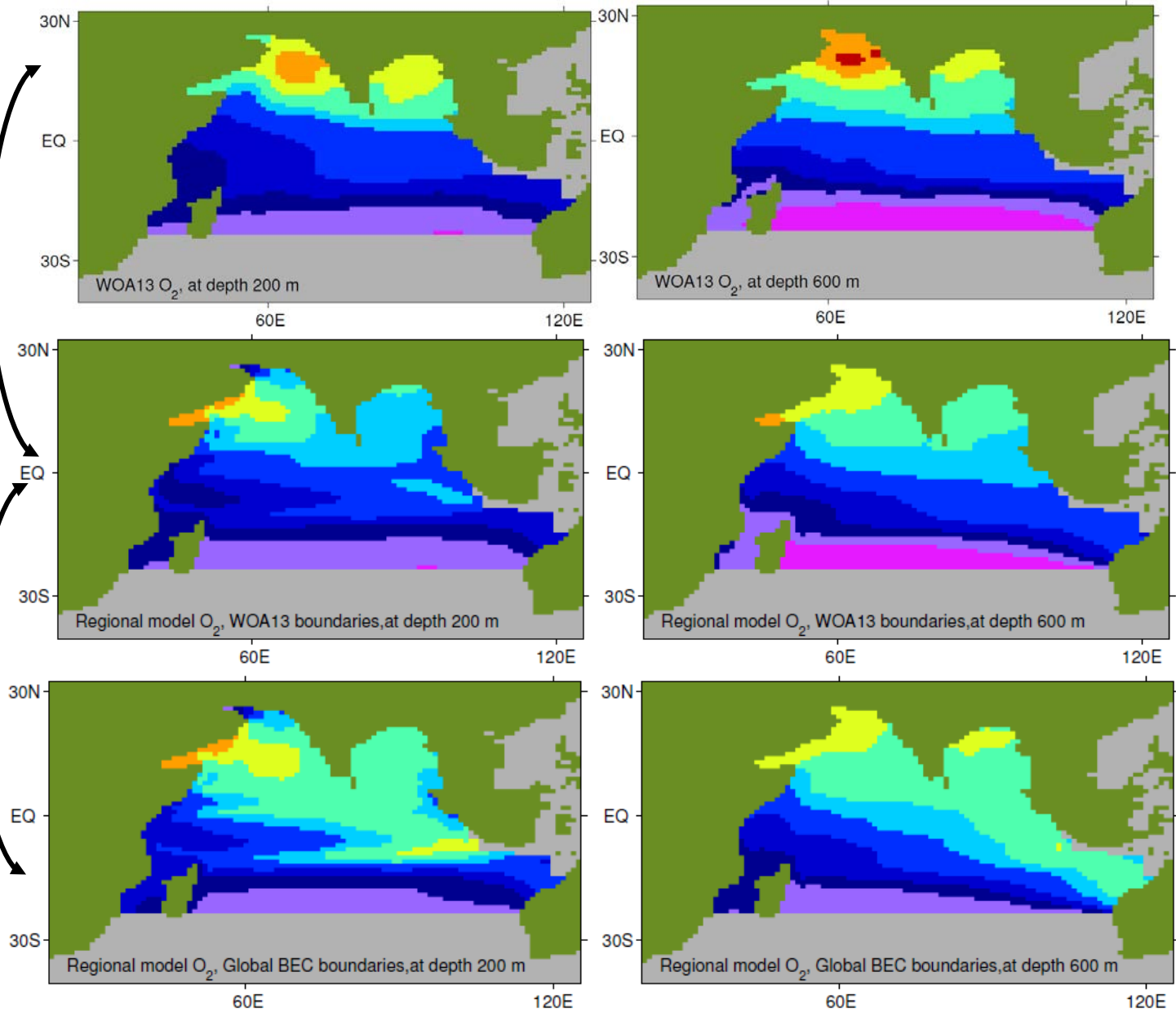


Difference:  
If  
circulation  
OK,  
then  
biology



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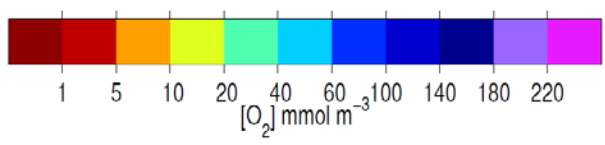
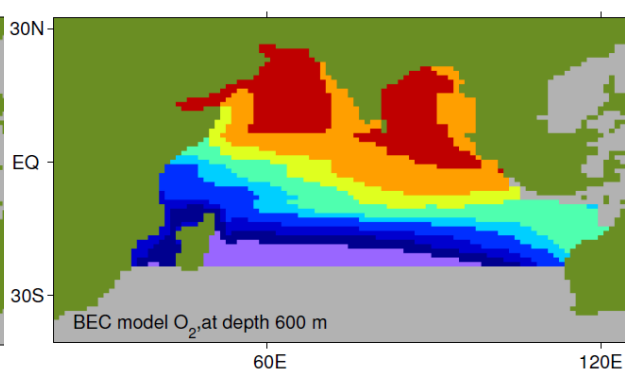
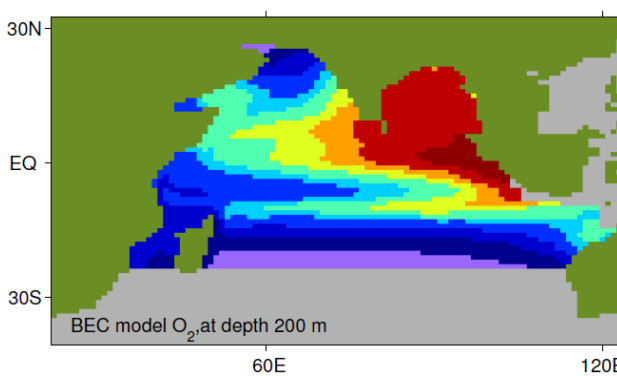
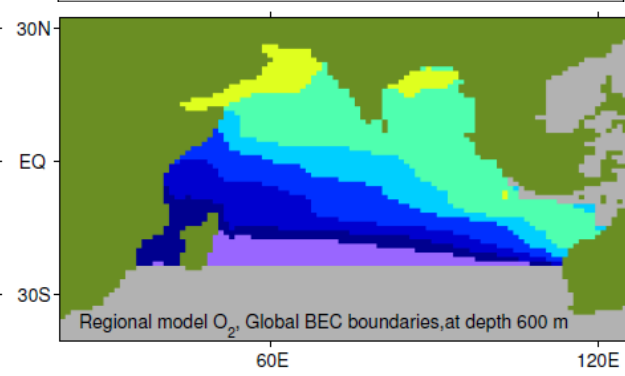
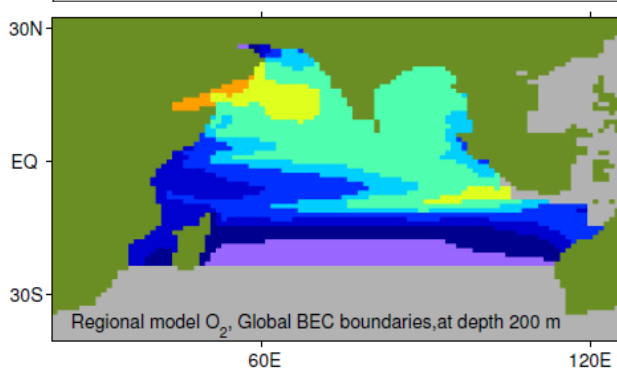
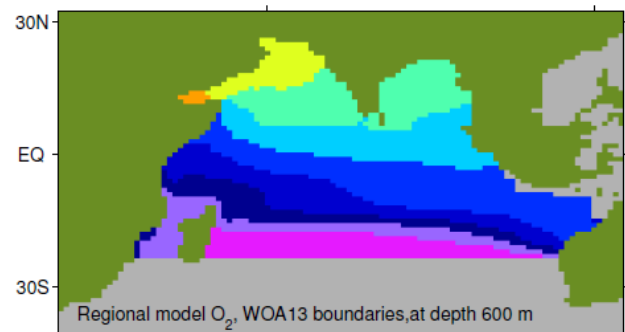
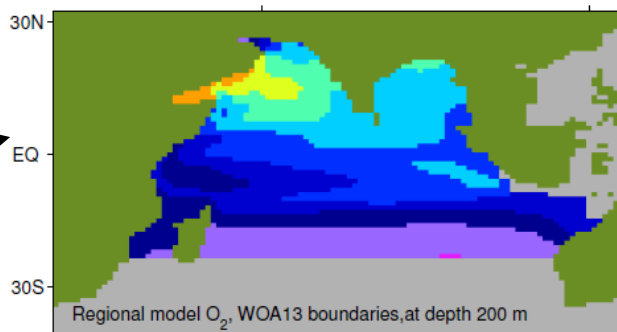
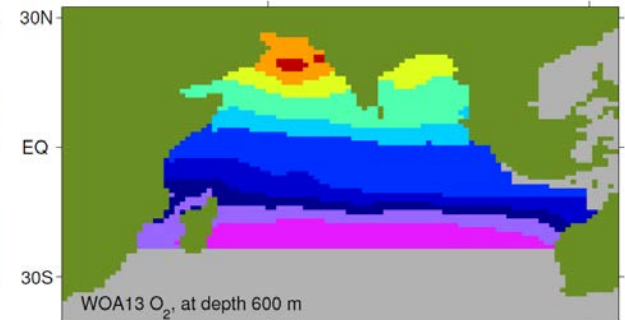
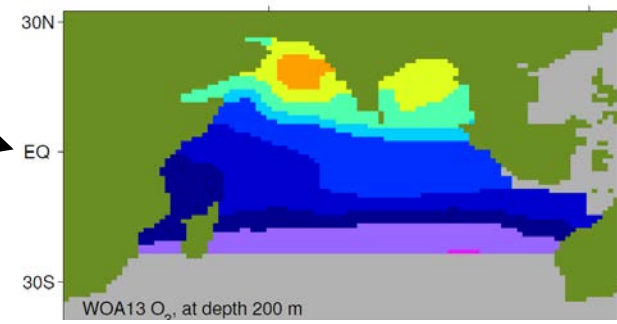
Difference:  
Regional  
versus  
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Difference:  
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versus  
External  
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Difference:  
Regional  
model  
circulation  
versus  
Global CMIP5  
circulation



# Conclusions

The regional model capability has the potential to provide a platform for further circulation and biogeochemical studies.

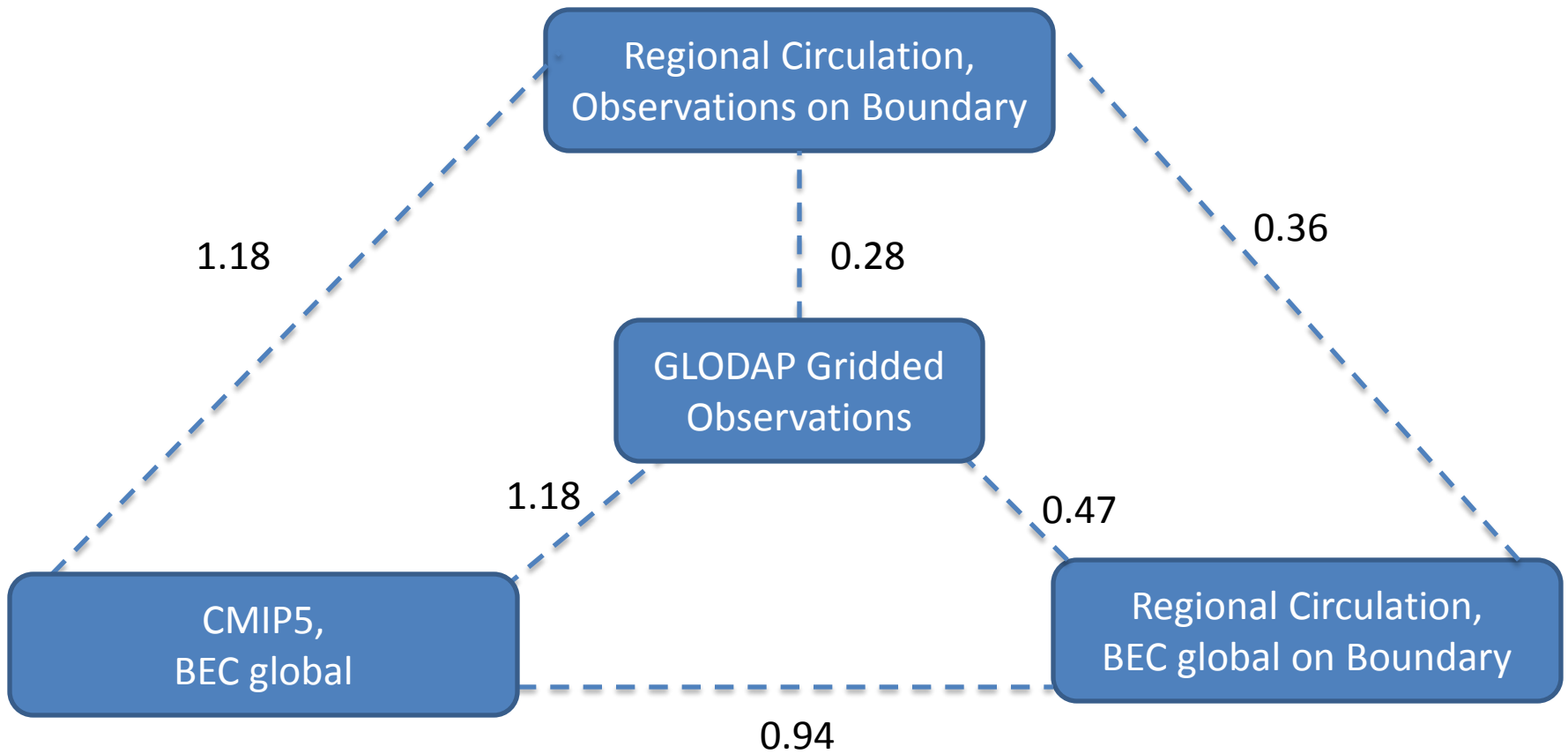


# Thank you for listening

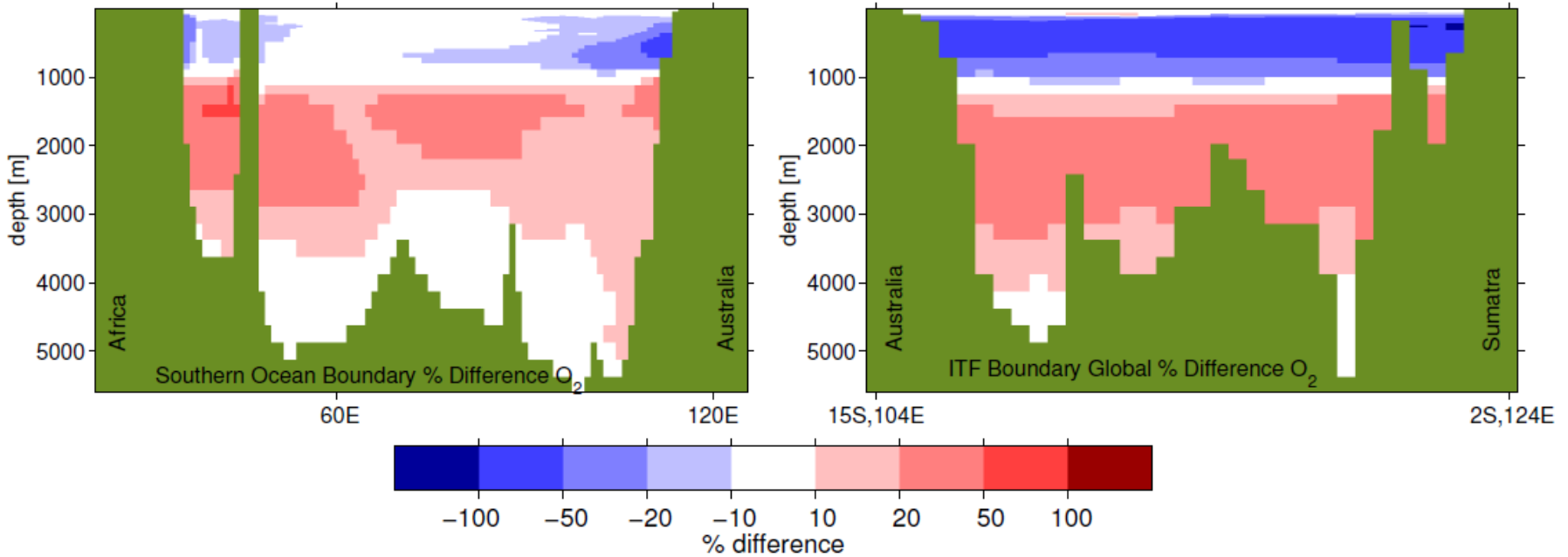
This work was supported by grants from the National Science Foundation, and from the Department of Energy Biological and Environmental Sciences Division.

Computing resources for running the Community Earth System Model (CESM), the parent model of the offline model developed in this work, were provided by the Climate Simulation Laboratory at the National Center for Atmospheric Research's Computational and Information Systems Laboratory, sponsored by the National Science Foundation and other agencies.

# RMS of $\log[\text{O}_2]$ Comparisons

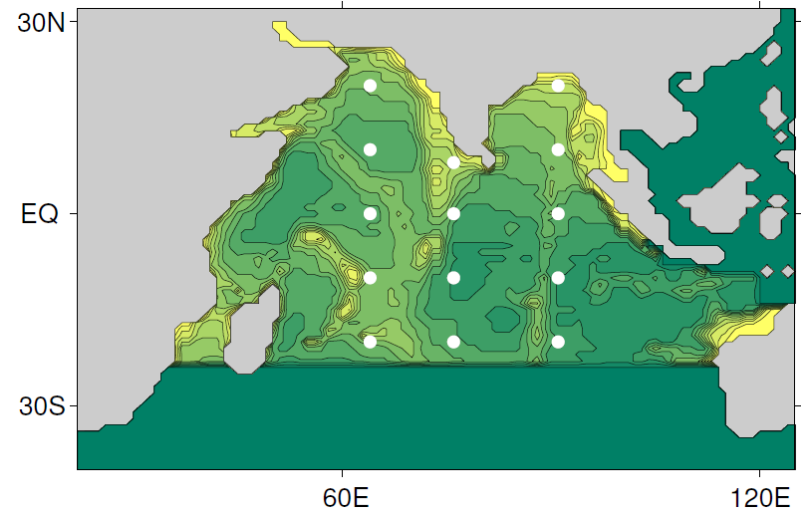
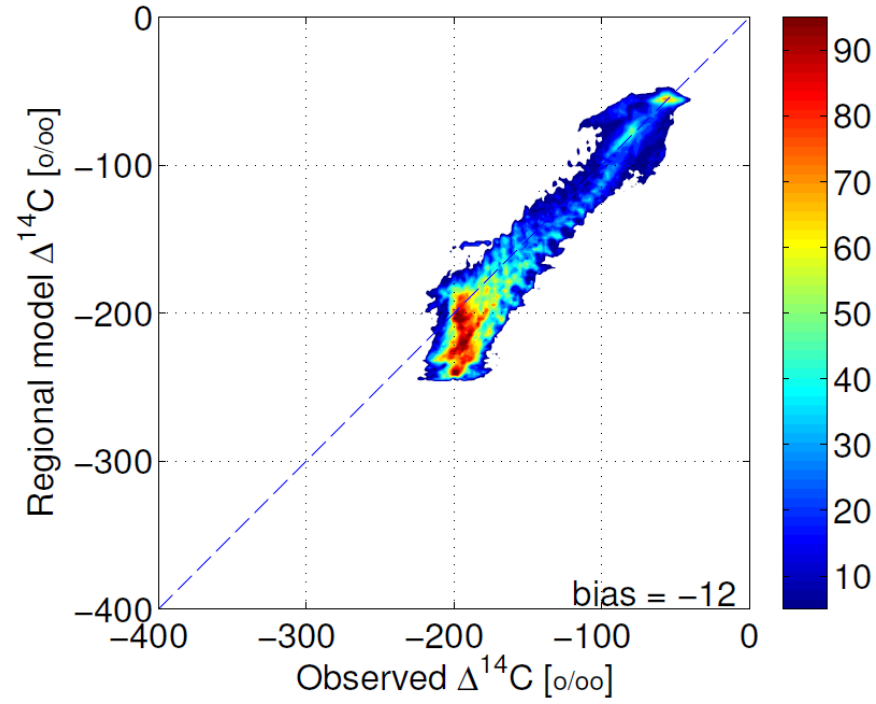
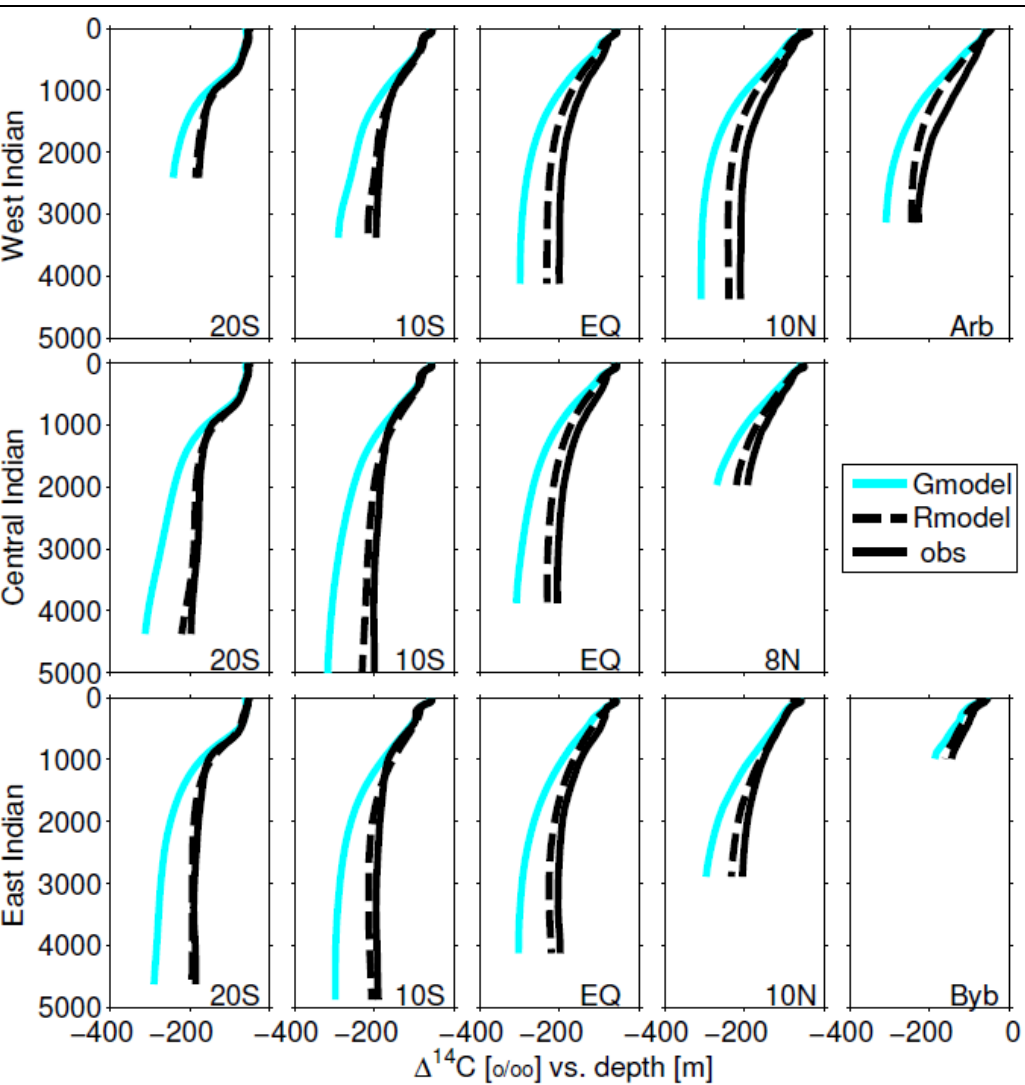


# How different are the O<sub>2</sub> boundary values?

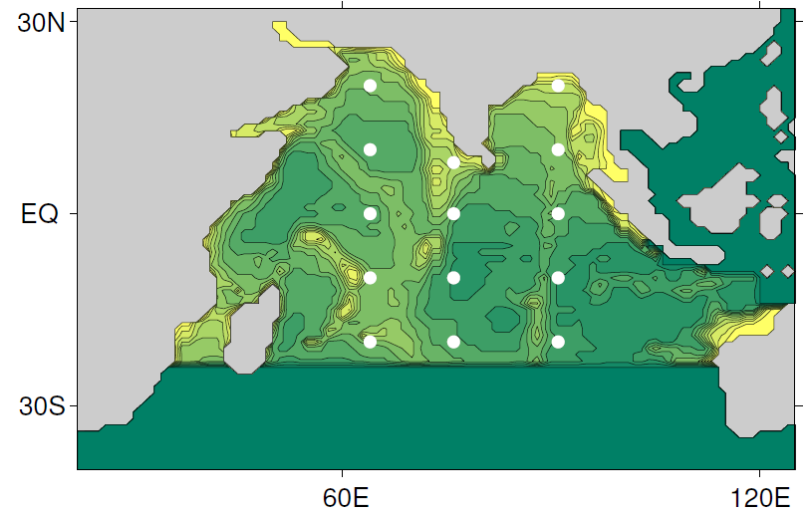
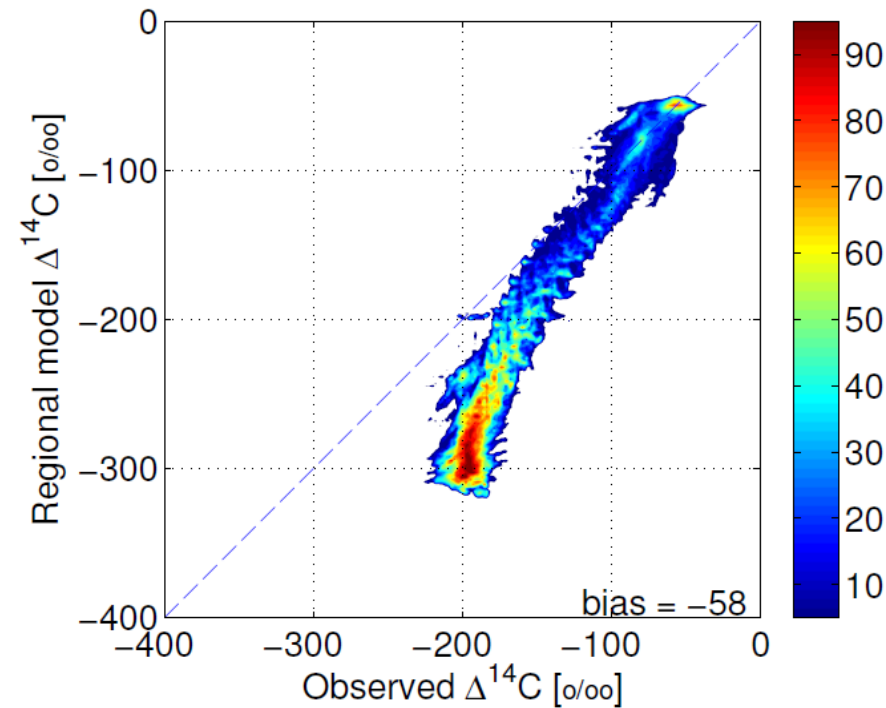
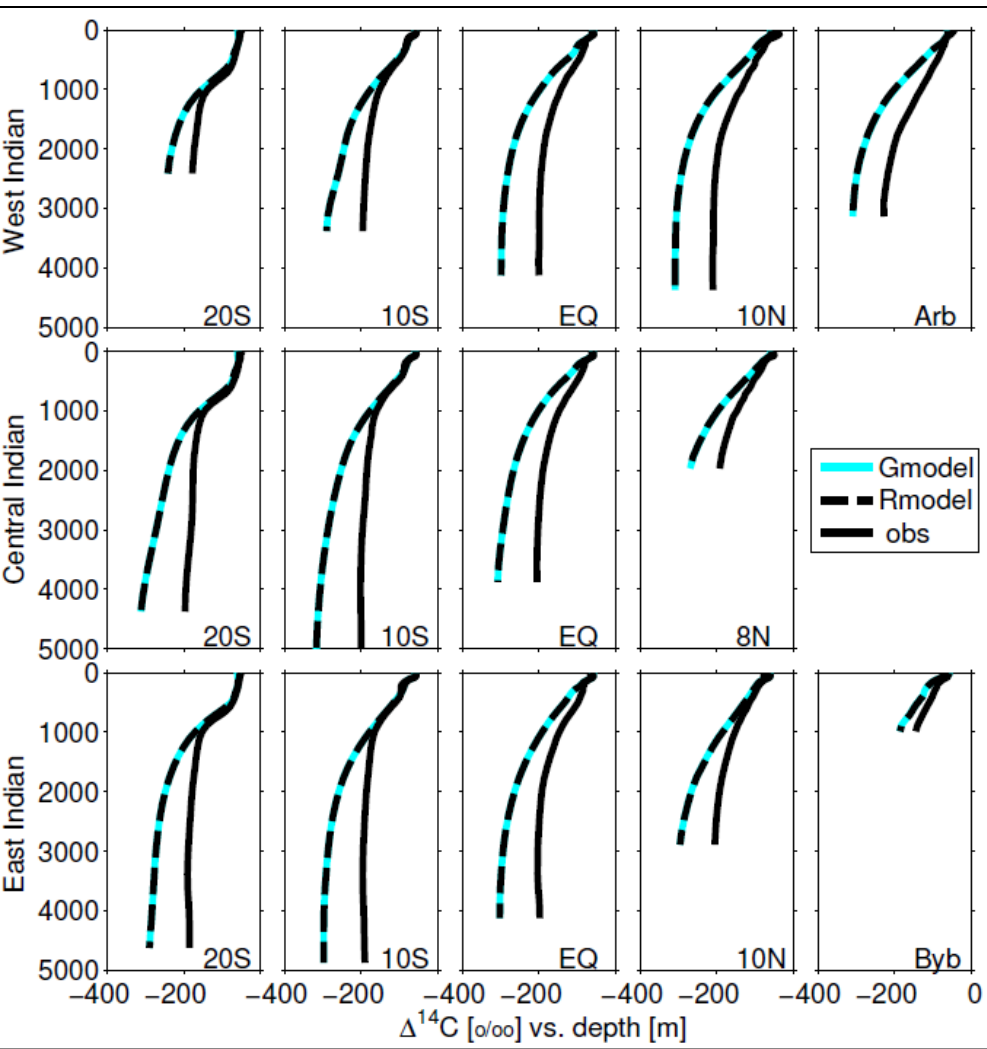




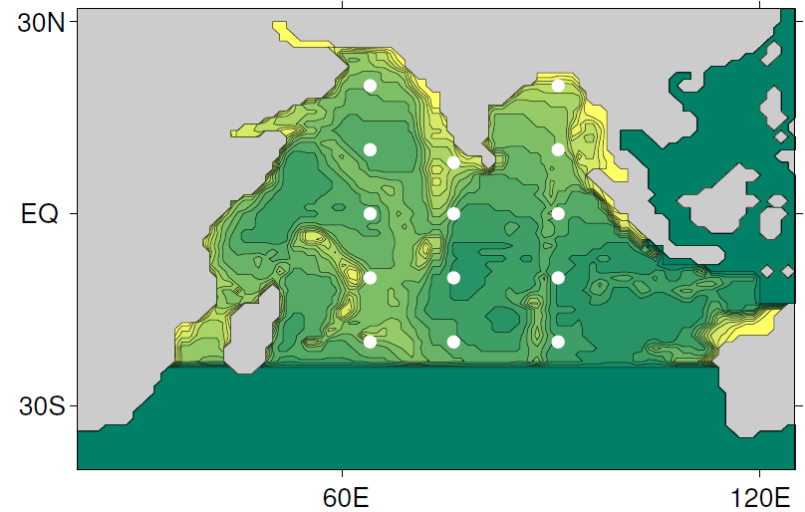
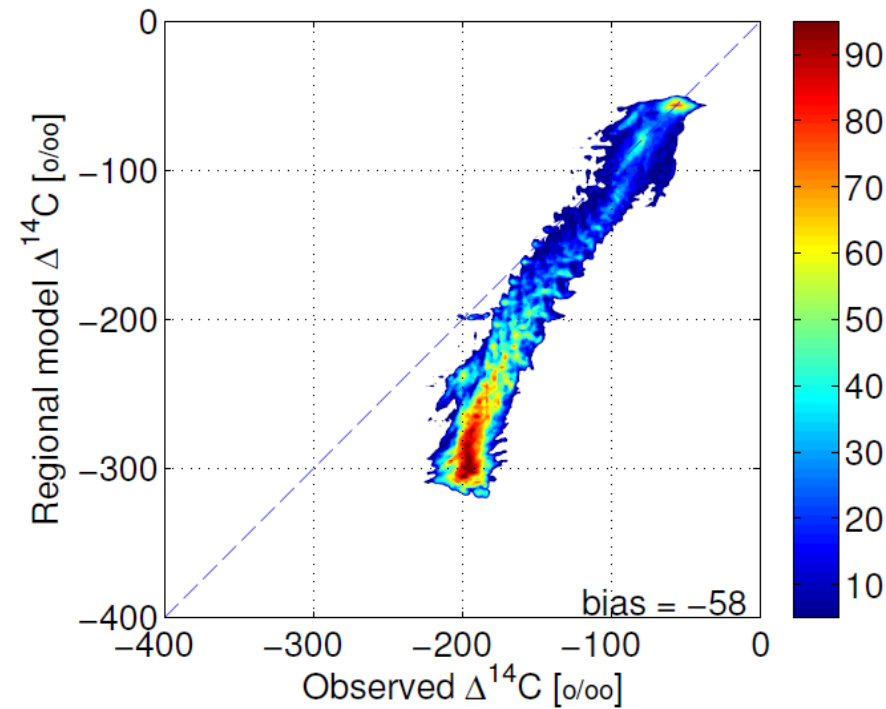
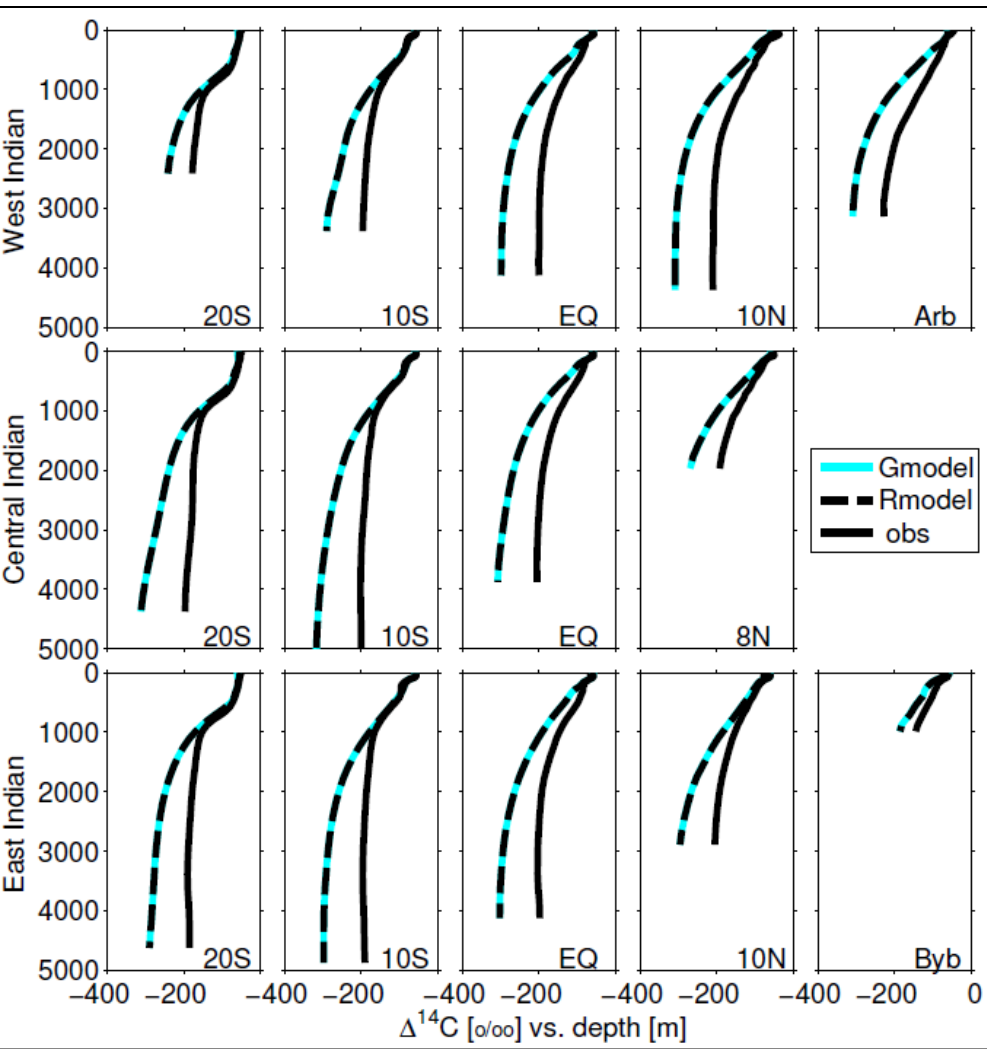
# GLODAP observational $^{14}\text{C}$ Boundaries



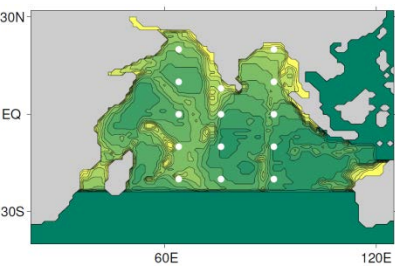
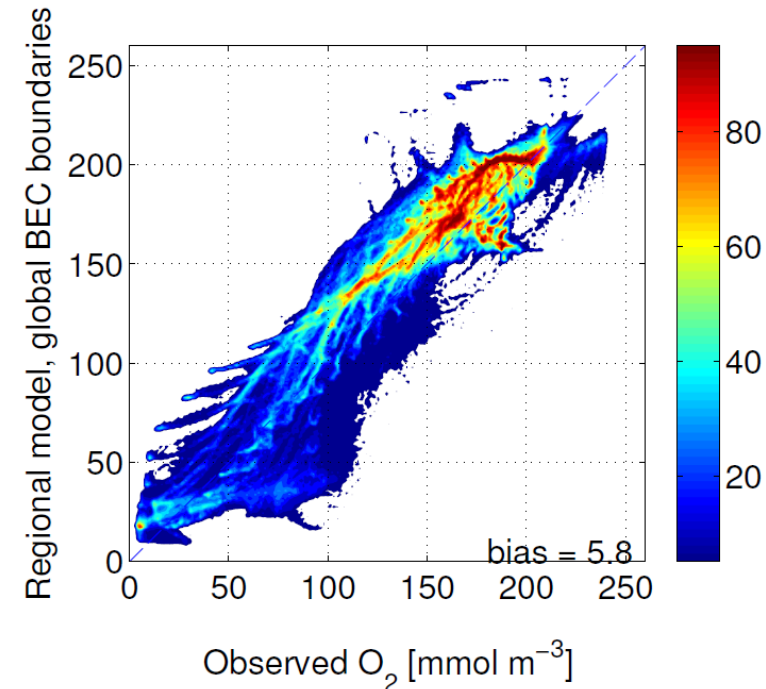
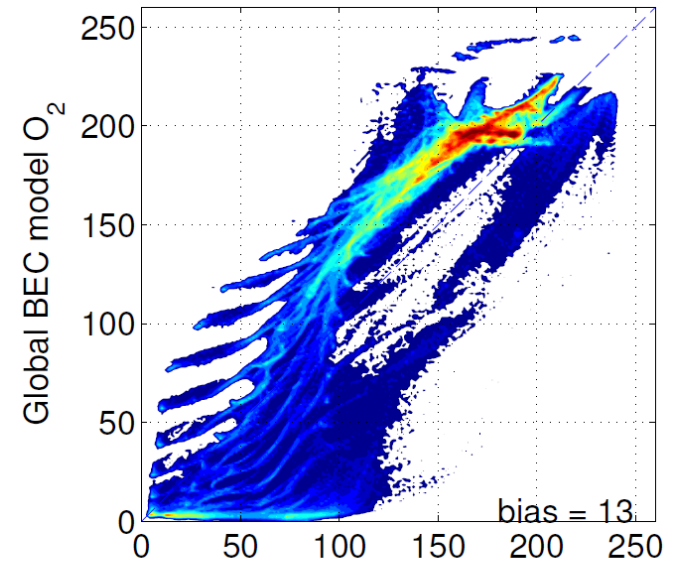
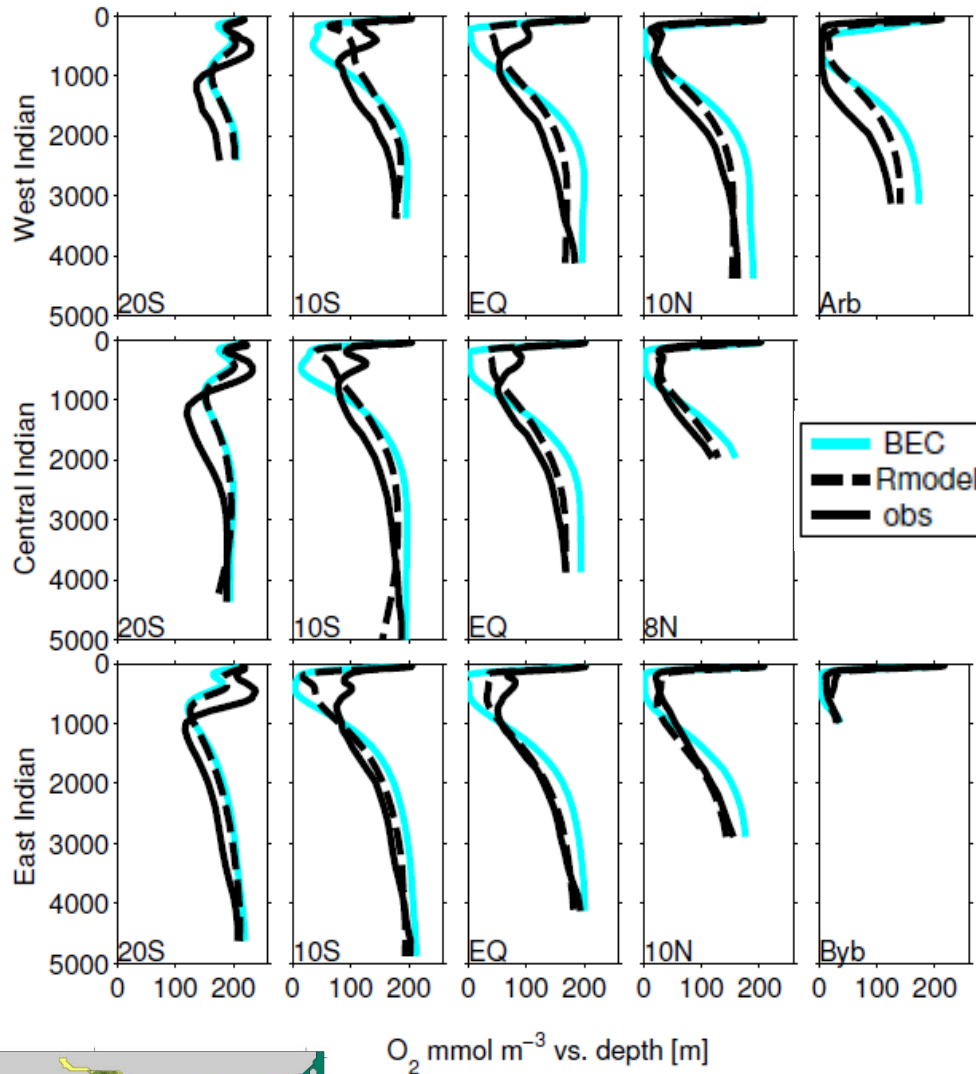
# Global Simulation $^{14}\text{C}$ Boundaries



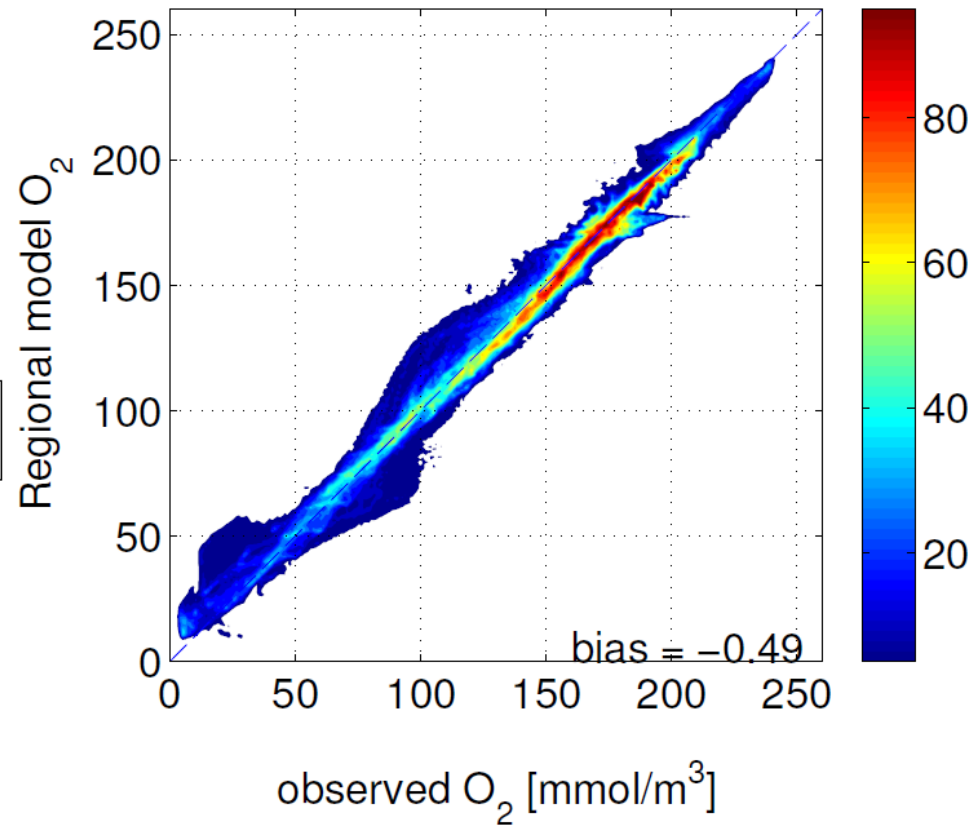
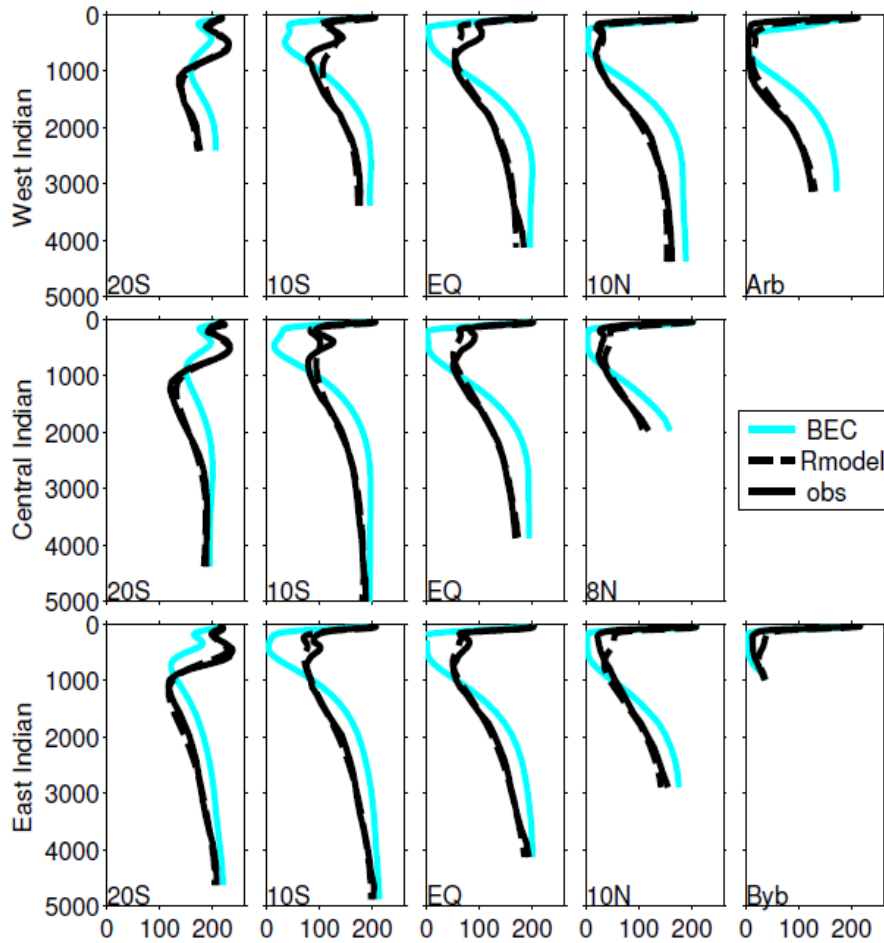
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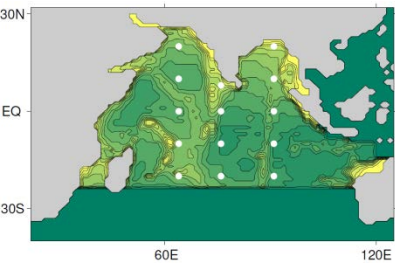
# CMIP5 BEC Global Simulation O<sub>2</sub> Boundaries



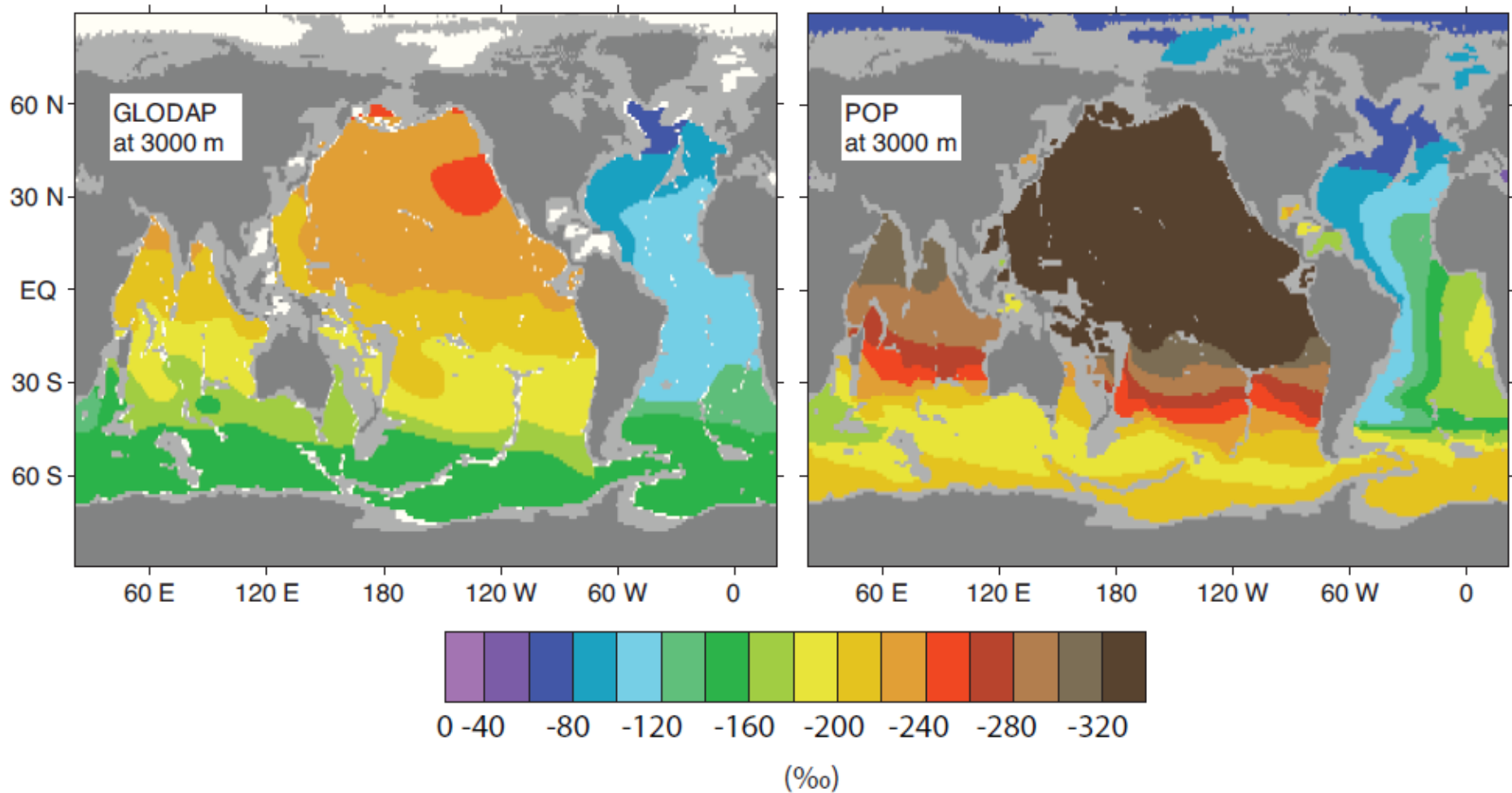
# WOA13 observational O<sub>2</sub> Boundaries



O<sub>2</sub> mmol m<sup>-3</sup> vs. depth [m]



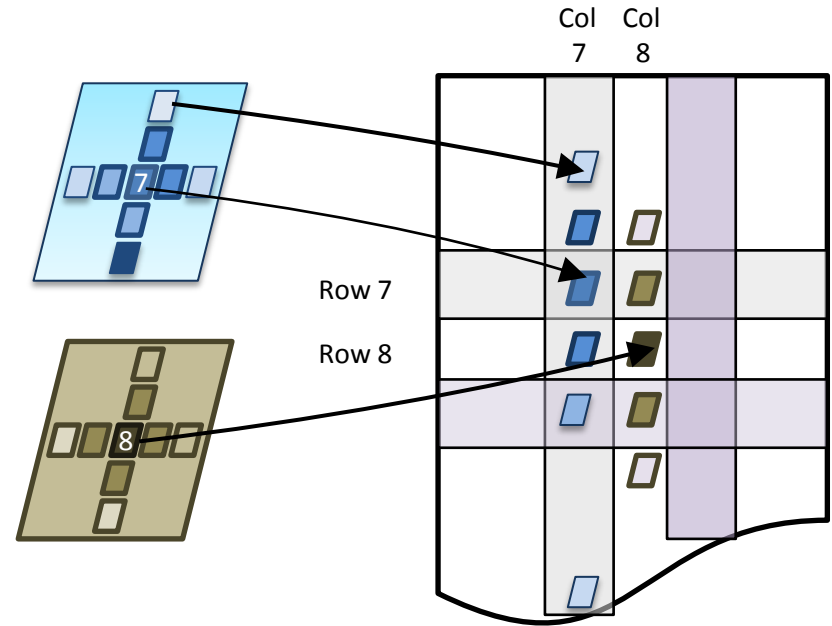
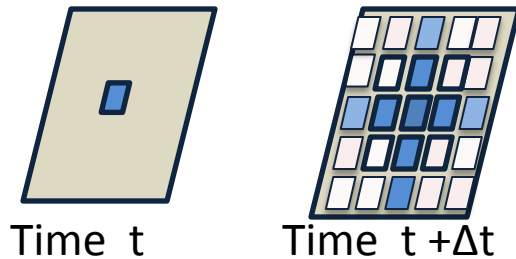
# Model Equilibrium $\Delta^{14}\text{C}$ vs. GLODAP Observations at 3000 m



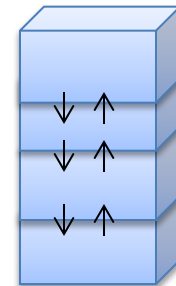


# Record OGCM circulation fields for transport matrix

- Advection and horizontal diffusion fields were recorded using an Impulse-Response Function (IRF).



- Recorded monthly-averaged values for each impulse tracer were used to create the advection and horizontal diffusion operators.
- The vertical diffusion operator was calculated from recorded coefficients.



# Implicit Newton-Krylov solver (nsoli.m)

iteratively solves for seasonal-cycle equilibrium

- Each iteration requires a 1-year seasonal-cycle run
- Offline transport time-stepping uses
  - 3<sup>rd</sup>-degree Adams-Bashforth for advection,
  - Euler -forward for horizontal diffusion,
  - Euler-backward for vertical diffusion,
  - and accounts for sea-surface height changes.
- Calculate the difference between the beginning and end of the year ( $X_{n+1} - X_n$ )
- But – for a faster solution, apply a preconditioner



# Motivation for oxygen study

Predicted loss of oxygen from the ocean due to climate change (Bopp 2002; Matear and Hurst 2003; Stramma 2008; Bopp 2013)

Observations suggest that a loss of oxygen is already underway (Whitney 2007; Chan 2008; Stramma 2012)

Ocean general circulation models of the IPCC class have biases even when simulating present-day conditions, especially at low oxygen values (Bopp 2013)

Volume of water in Oxygen Minimum Zones (OMZs) is predicted to increase or decrease in CMIP5 study (Bopp 2013)

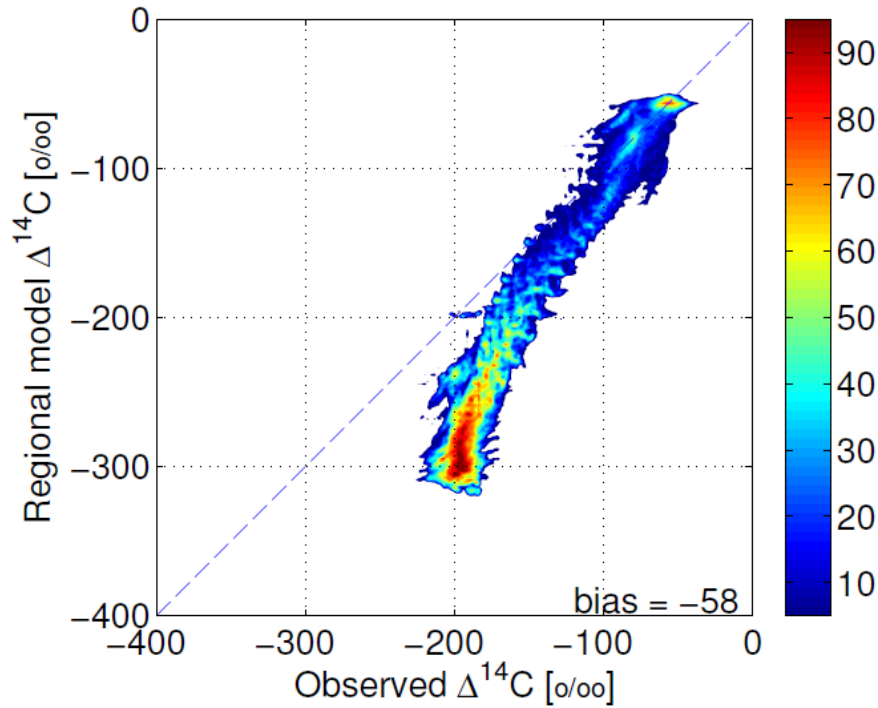
Oxygen is a very integrative quantity of

- the circulation
- biological production and consumption
- air-sea gas exchange

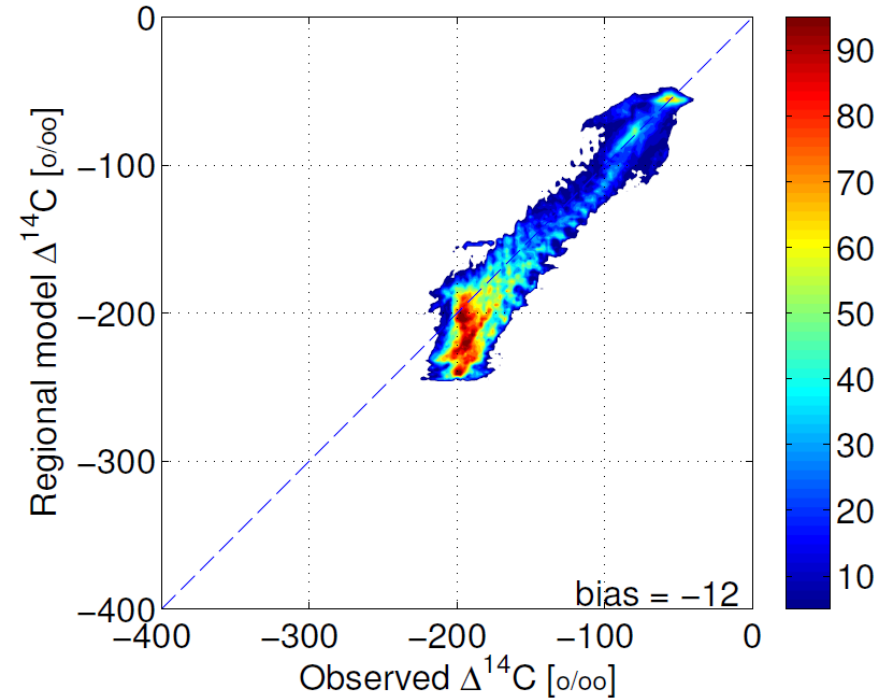
# Conclusions

- The circulation differences between the regional model and the CMIP5 simulation make a significant difference in the results.
- The regional model with observations on the border give the least bias compared to observations, but there are still significant misfits at low oxygen concentrations.
- The regional model capability has the potential to provide a platform for further circulation and biogeochemical studies.

# Regional $^{14}\text{C}$ simulation with observational boundary values vs. Global Simulation

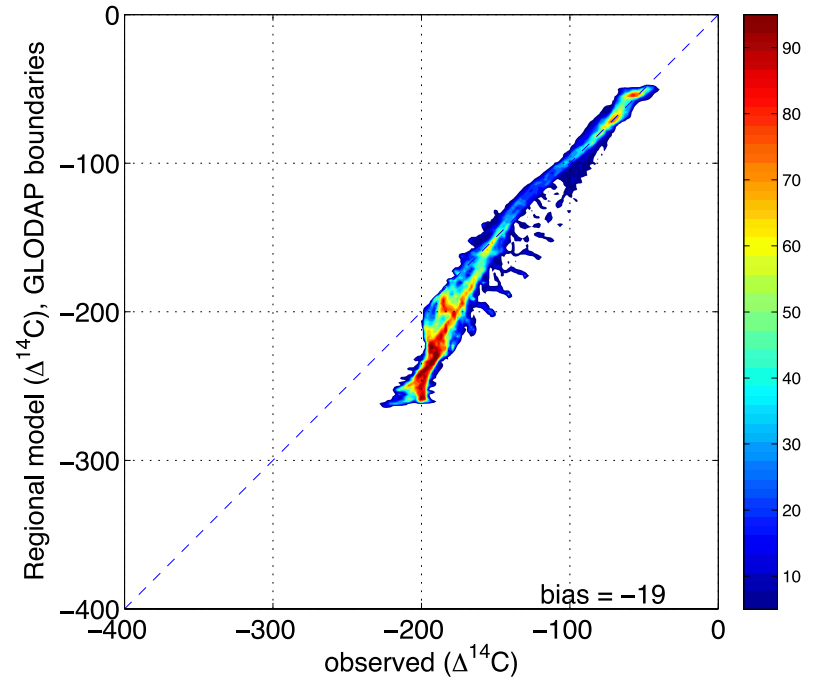
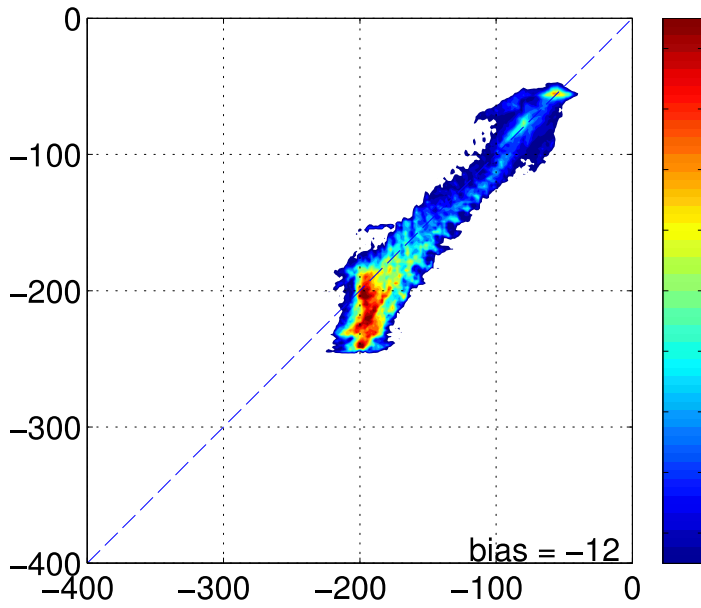
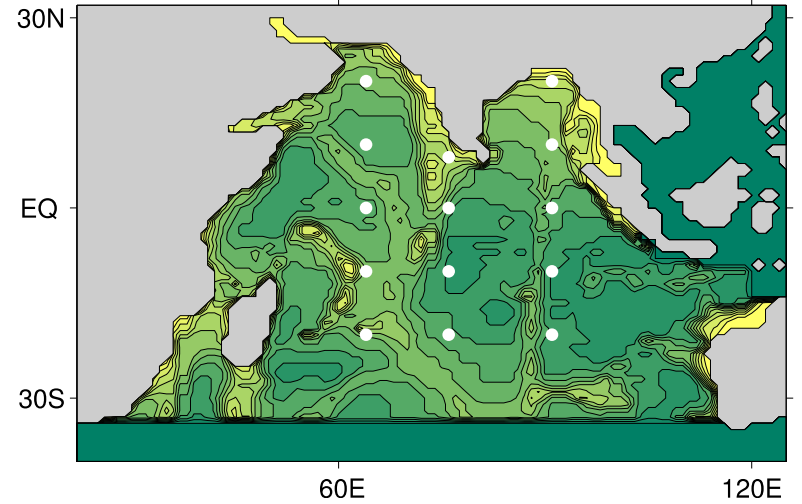
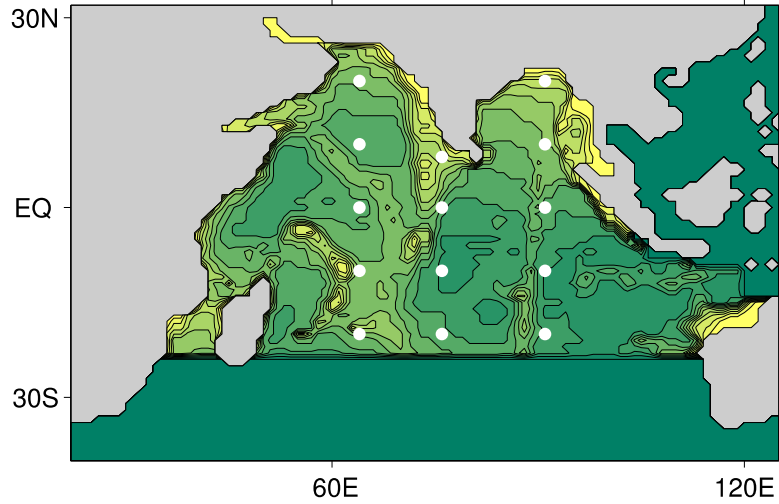


Global Simulation  
 $^{14}\text{C}$  Boundaries

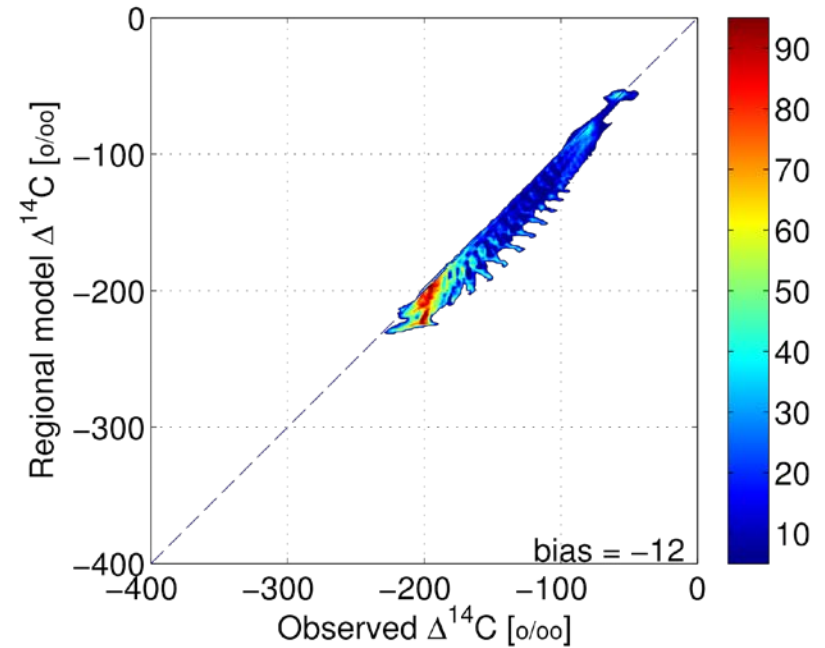
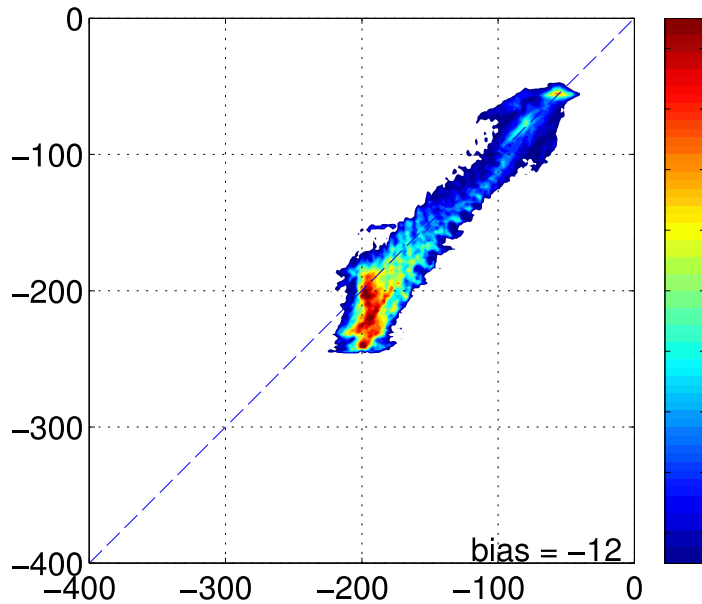
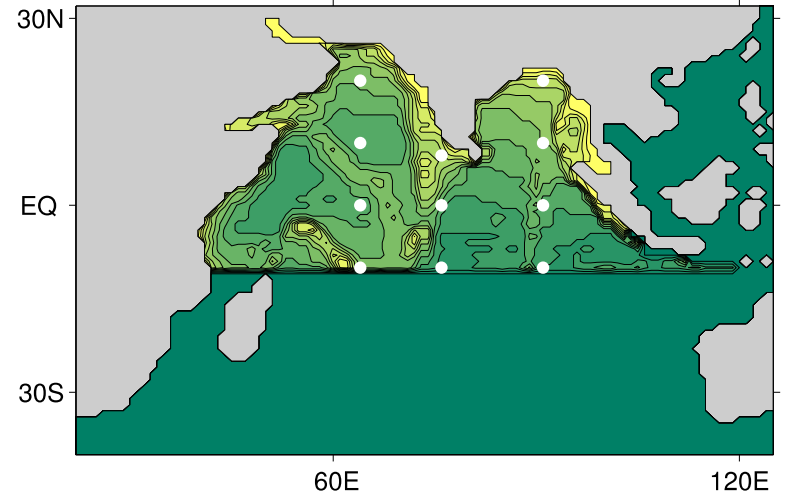
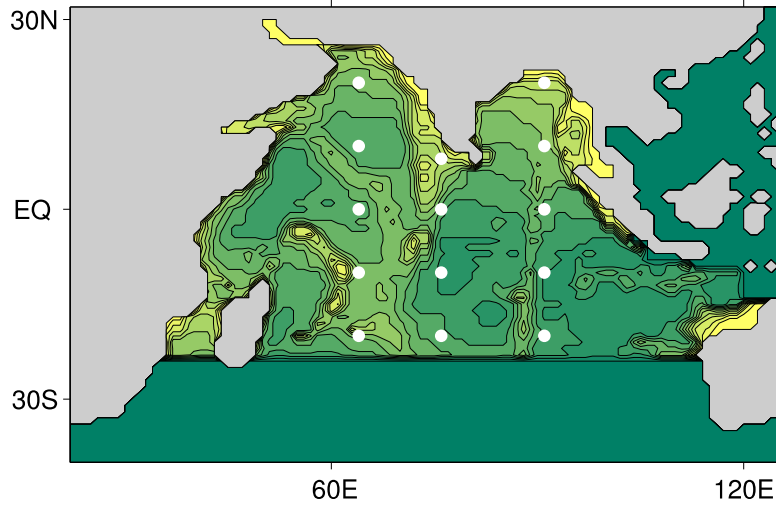


GLODAP observational  
 $^{14}\text{C}$  Boundaries

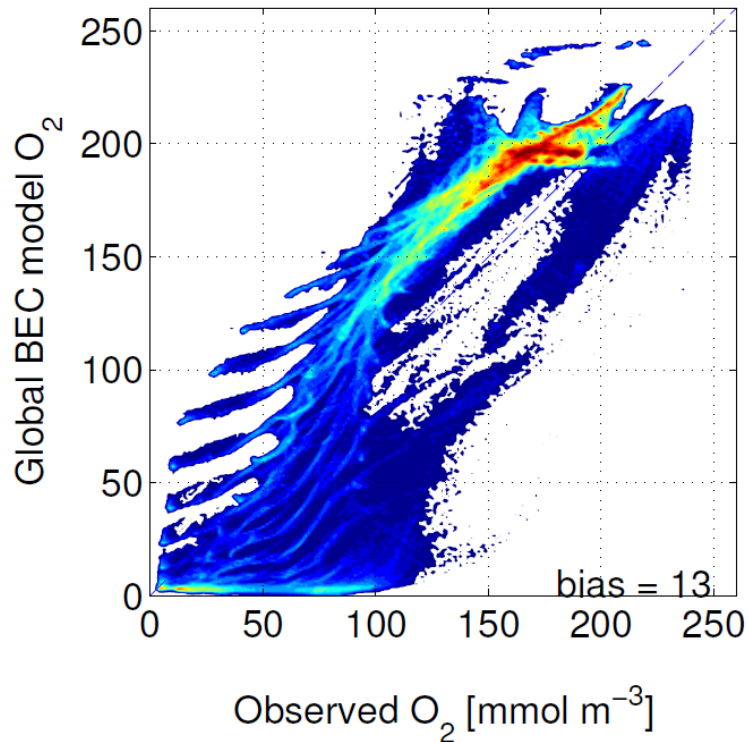
# What happens if we change the boundary to 35S ?



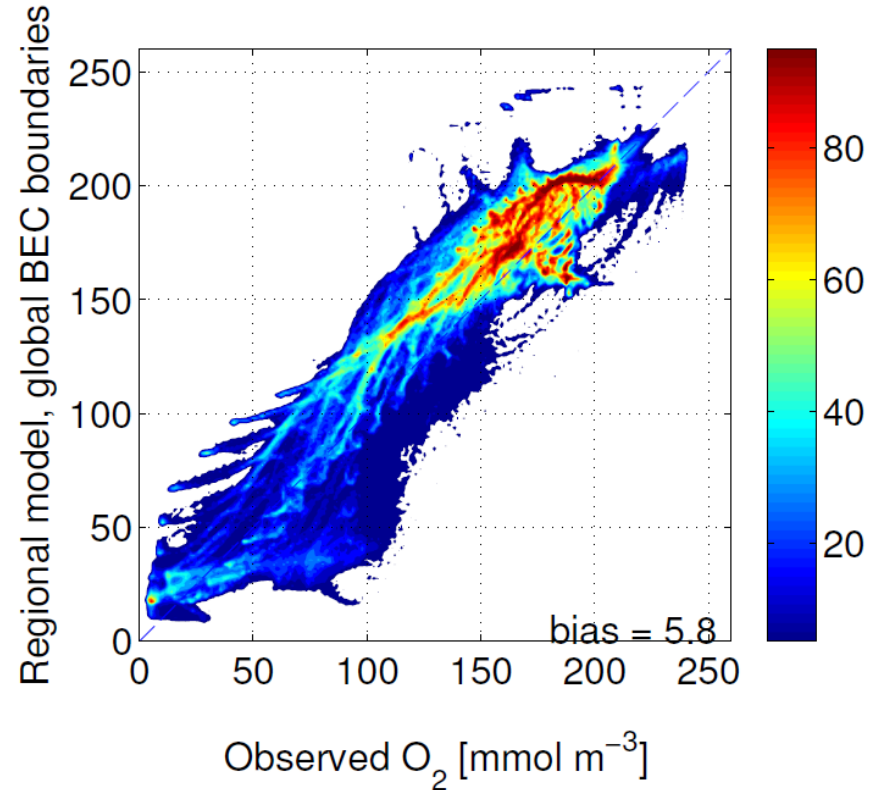
# What happens if we change the boundary to 11S ?



# Comparison: Global CMIP5 O<sub>2</sub> versus Regional Model with Global CMIP5 O<sub>2</sub> boundaries



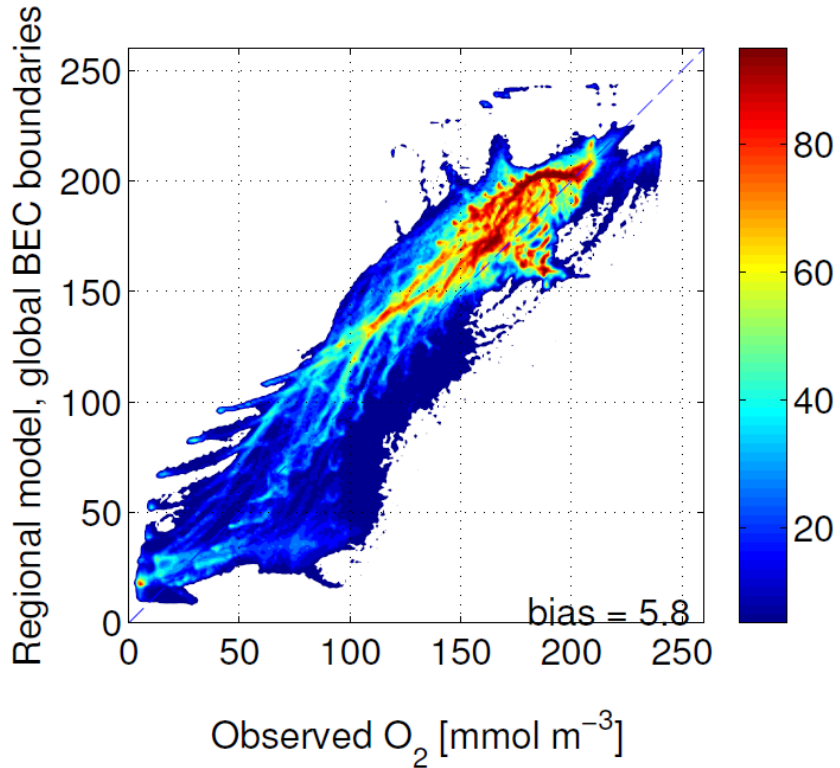
Global CMIP5 BEC Simulation  
O<sub>2</sub> in the region



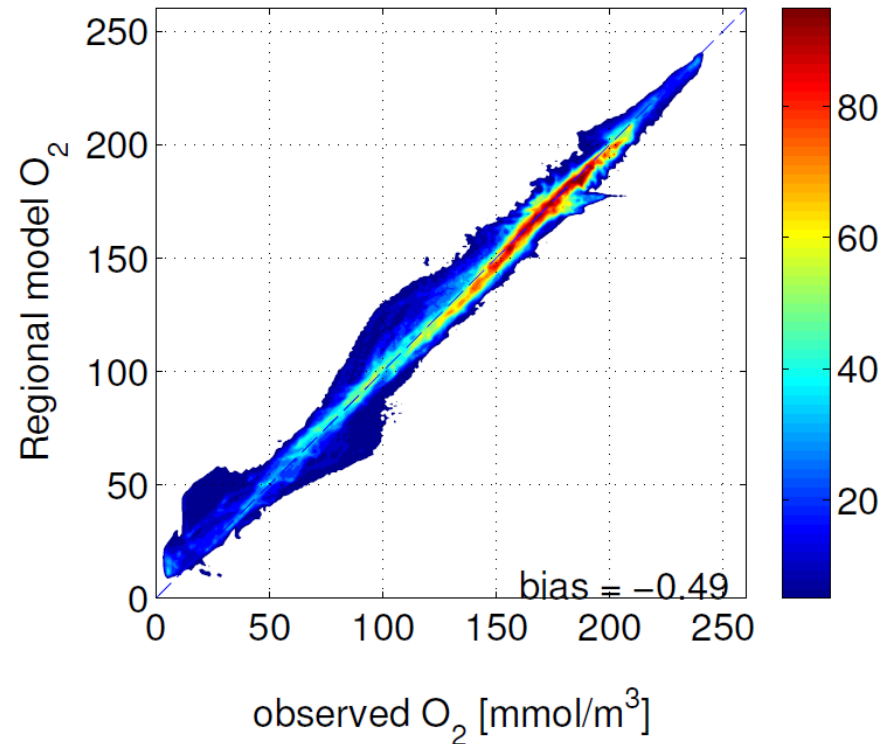
CMIP5 BEC Simulation  
O<sub>2</sub> Boundaries on Regional Model

# Comparison:

## Regional Model with Global CMIP5 O<sub>2</sub> boundaries versus observational O<sub>2</sub> boundaries



CMIP5 BEC Simulation O<sub>2</sub> Boundaries on Regional Model



Observational O<sub>2</sub> Boundaries on Regional Model