



Benchmarking Ocean Biogeochemical Fields in GFDL's ESMs

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Project objective # 1

The current generation of fully coupled ESMs represent a variety of biogeochemical fields and processes.



Need For Diagnostics

There are relatively few collections of computerized analysis routines aimed at diagnosing these processes in ESMs

How are diagnostics useful to scientists at GFDL?

- Generalized analysis scripts to help see model biases, how the model is behaving and its characteristics.
- Plots can be generated automatically when experiments are run



Determining Biogeochemical Vital Signs

Initial research: What are the key biogeochemical variables in ESMs that should be monitored on a routine basis?

Ocean Topaz Tracers

- Alkalinity
- Dissolved Inorganic Carbon (DIC)
- Phosphate (PO₄)
- Nitrate (NO₃)
- Silica (SiO₄)
- Oxygen (O₂)
- Iron (Fe)
- Chlorophyll



Global Data Analysis Project (GLODAP)



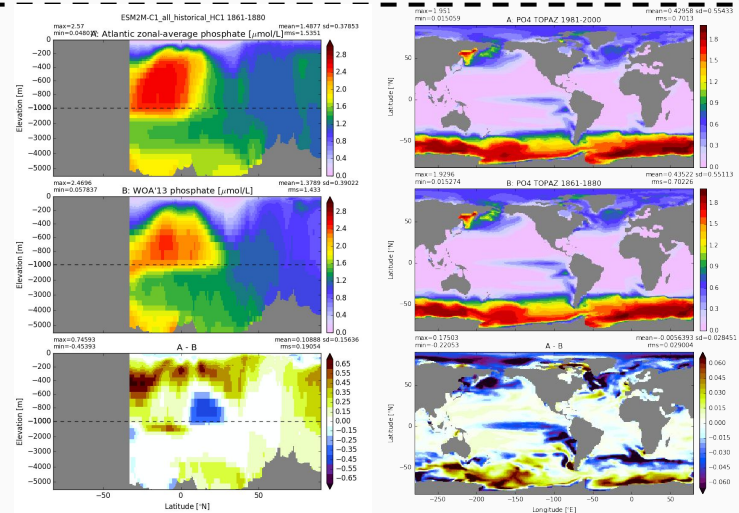
World Ocean Atlas (WOA)

Development of diagnostic tool:

- Regrid World Ocean Atlas (2013) data to the ESM2M model grid
 - FMS “horiz_interp” bilinear interpolation
 - Vertical remapping using ALE -- 102 vertical levels to 50 levels
 - Regridding performed via MIDAS (Matt Harrison)
- Analysis scripts based on common Python packages:
 - netCDF4
 - Numpy
- Makefile available for running and testing the scripts
- Scripts can easily be updated to work with ESM4
 - Variables names similar between TOPAZ and COBALT

Output:

- “Three Panel Plots” generated using “m6plot” (Alistair Adcroft)
- Generates surface and zonal mean vs. depth plots
 - Basin masking for Atlantic, Pacific, and Indian Oceans



Python & Jupyter Notebooks

Methods



GitLab

A screenshot of a Jupyter Notebook interface. The browser address bar shows 'ostics/NUTRIENTS_SURFACE-COMPARISON.ipynb'. The notebook title is 'NUTRIENTS_SURFACE-COMPARISON'. The code in the first cell defines a model file path, loads a dataset, and prints the shape of a model variable. The second cell prints the shape of a specific model variable. The third cell creates a contour plot of Nitrate concentration (mol/kg) over the globe, with a color scale from 0.000000 to 0.000048. The plot shows higher concentrations in the Southern Ocean. The fourth cell defines a future file path.

```
In [121]: ModelFile = '/archive/esm2m/fre/posruga_esm_20100603/ESM2M/ESM2M-C1_all_historical_HCL/prod/pp/ocean_topaz_tracers_monthly/ModelFile'
fModel = netCDF4.Dataset(ModelFile)
ModelVarName = 'no3'
ModelVar = fModel.variables[ModelVarName][:]
print ModelVar.shape

ModelVar = ModelVar[0,layidx,...]
print ModelVar.shape

ModelUnits = fModel.variables[ModelVarName].units
Model_long_name = fModel.variables[ModelVarName].long_name

(1, 50, 200, 360)
(200, 360)

NO3 Topaz 1861-1880

In [122]: ci = (ModelVar.min(), ModelVar.max())
mplot.pyplot(ModelVar, lon, lat, area=area,
             supTitle=ModelVarName,
             title=Model_long_name + ' ' + ModelUnits,
             c1m=ci, centerLabels=True, extend='both')

max=5.0181e-05      no3      min=5.5723e-06 sd=8.1065e-06
min=-2.9334e-09      Nitrate mol/kg      rms=1.0436e-05

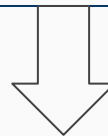
In [123]: futureFile = '/archive/esm2m/fre/posruga_esm_20100603/ESM2M/ESM2M-HCL_2006-2100_all_rcp85_ZC1/prod/pp/ocean_topaz_tracers
F = netCDF4.Dataset(futureFile)
```

A screenshot of a GitLab repository page for 'John Krasting / OBGc-diagnostics'. The page shows a list of recent commits with their authors, commit hashes, and descriptions. The commits are listed in chronological order from newest at the top to oldest at the bottom.

Author	Commit Hash	Description	Time Ago
Maria Pulido-Velosa	2675a2ef	Updated notebooks with Pre_ind DIC comparisons	8 days ago
Maria Pulido-Velosa	7a2bc13e	Makefile updated with all Model vs Model comparisons and its respec...	8 days ago
Keira Norford	4c5bbae	2D Version of regr2Model.py	8 days ago
Maria Pulido-Velosa	e1ce23ea	Updated .gitignore to ignore *.nc files	8 days ago
Maria Pulido-Velosa	63944e4	Zonal P bias script	8 days ago
Maria Pulido-Velosa	06654e01	Mask edits for GLODAP Alk	8 days ago
Maria Pulido-Velosa	077da413	Merge branch 'user/mpf/magenta' of gitlab.glo.noaa.gov:john.krast...	9 days ago
...
John Krasting	01b304a	Added masking for GLODAP TC02 to correct depth-average plots	9 days ago
John Krasting	4f5bbd9	Masking changes for obsivar and v10 [DIC GLODAP]	9 days ago
John Krasting	8ab815aa	Edits to Makefile for model-model comparison scrip	9 days ago
Maria Pulido-Velosa	dad3db44	zonal averages update	9 days ago
Maria Pulido-Velosa	0680456	update Makefile	9 days ago

Project objective # 2

Application of the diagnostic tool



Use the diagnostic tool created to:

Understand the changes to the biogeochemical fields under a climate change scenario relative to how much the model drifts.

Perfect Model: No biases introduced when spinning up the model

Drift = 0

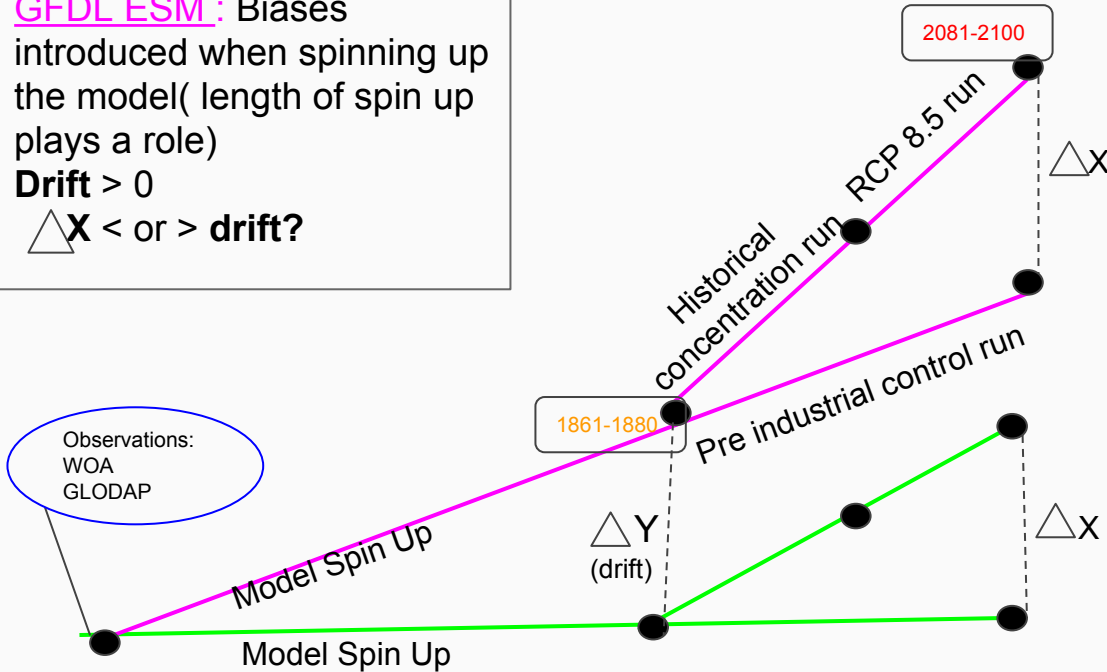
$\Delta X > \text{drift}$

GFDL ESM: Biases introduced when spinning up the model (length of spin up plays a role)

Drift > 0

$\Delta X < \text{or} > \text{drift}$

$\Delta Y = \text{Drift} = \text{Time evolution of the bias}$
 $\Delta X = \text{Climate change response}$



-To obtain 1860 initial conditions, biogeochemical tracers were initialized from **World Ocean Atlas observations** for $\text{NO}_3, \text{PO}_4, \text{SiO}_4, \text{O}_2$ and the **Global Data Analysis** project for **DIC** and **Alkalinity**.

ΔY (drift) = 1861-1880 - observations

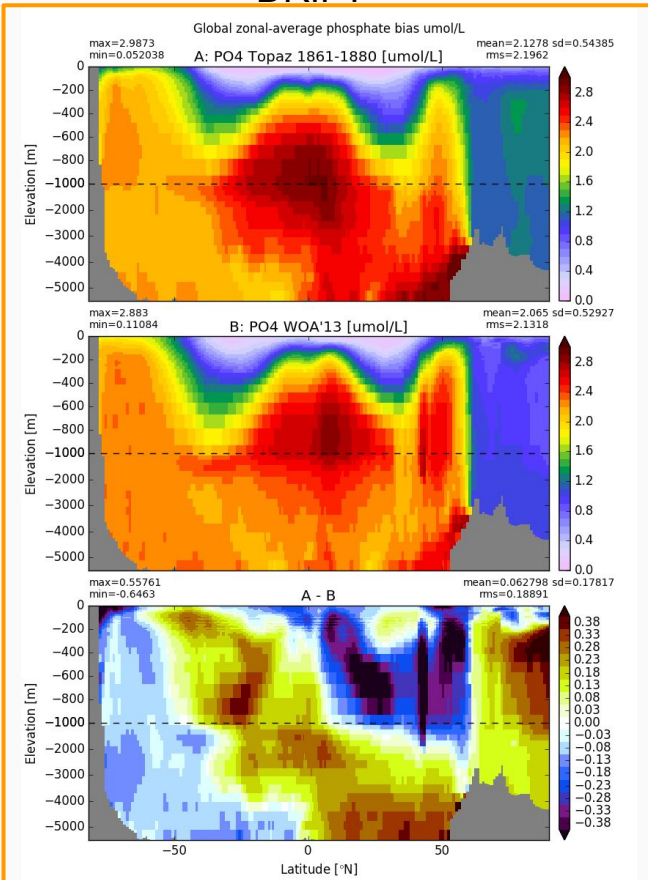
ΔX (Clim. change) = 2081-2100 - p.i control

What is ΔX (climate change response) relative to ΔY (drift) in each of the biogeochemical fields?

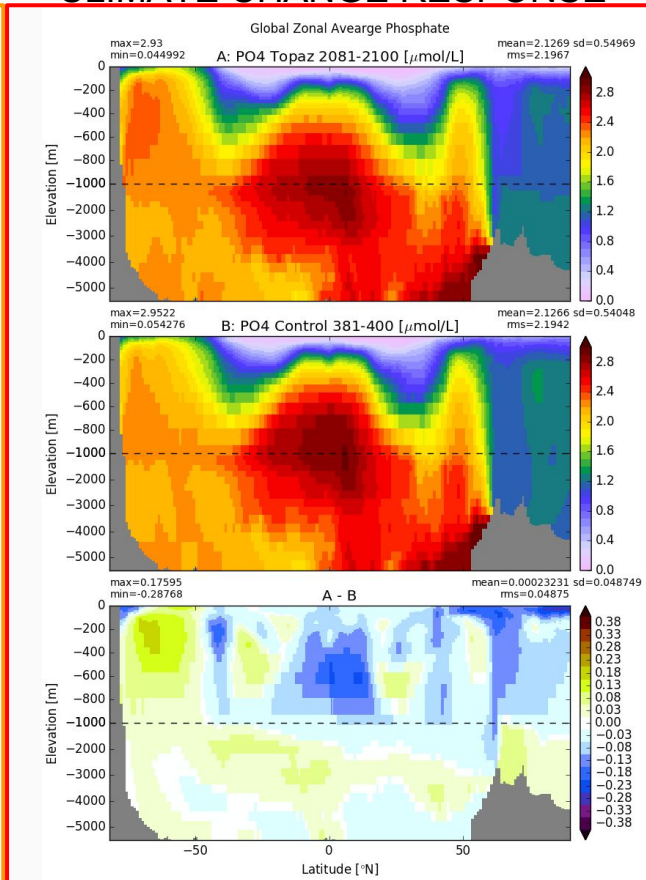
- if drift is larger than the climate change response, it makes it harder to interpret results of climate change experiments.

Phosphate Global Zonal Average vs. depth

DRIFT



CLIMATE CHANGE RESPONSE



Drift:

rms=0.189

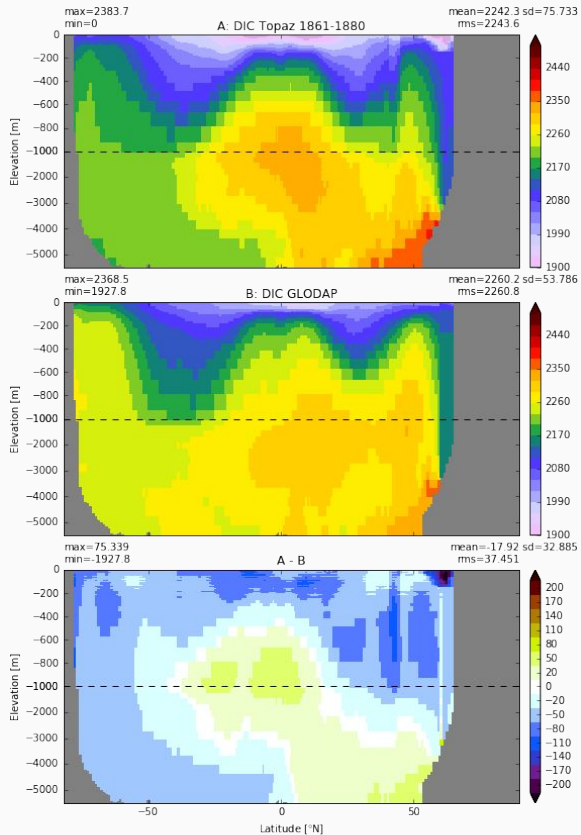
Climate change response:

rms= 0.049

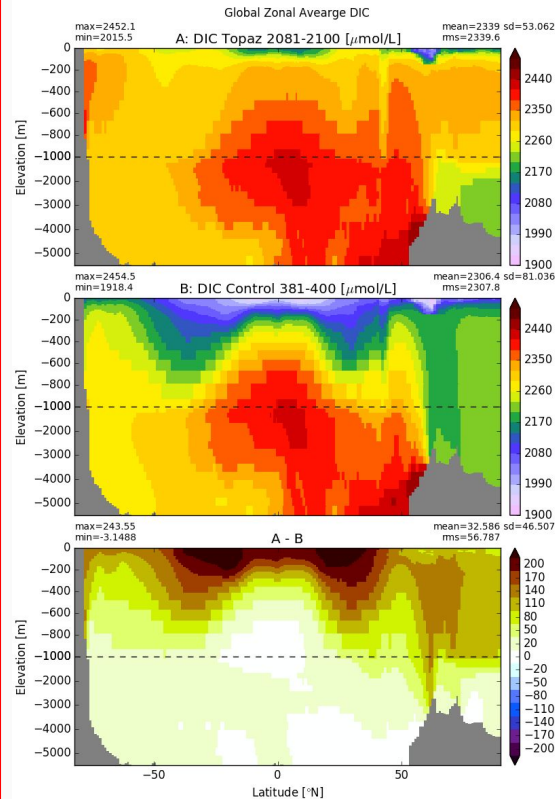
Drift > clim. change response
for PO4, NO3, SIO4, O2 and
Alkalinity

Dissolved Inorganic Carbon Zonal Average vs. depth

DRIFT



CLIMATE CHANGE RESPONSE



Drift:

rms=37.451

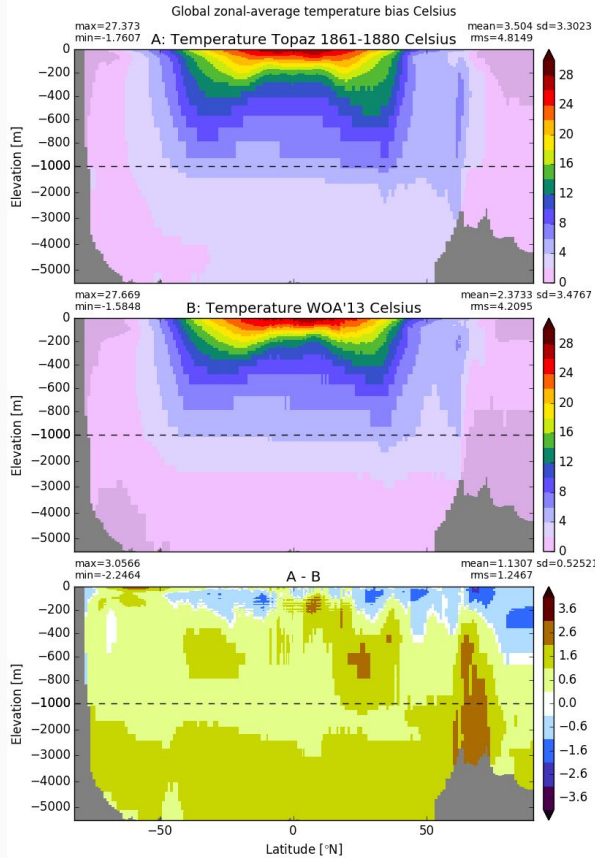
Climate change response:

rms= 56.787

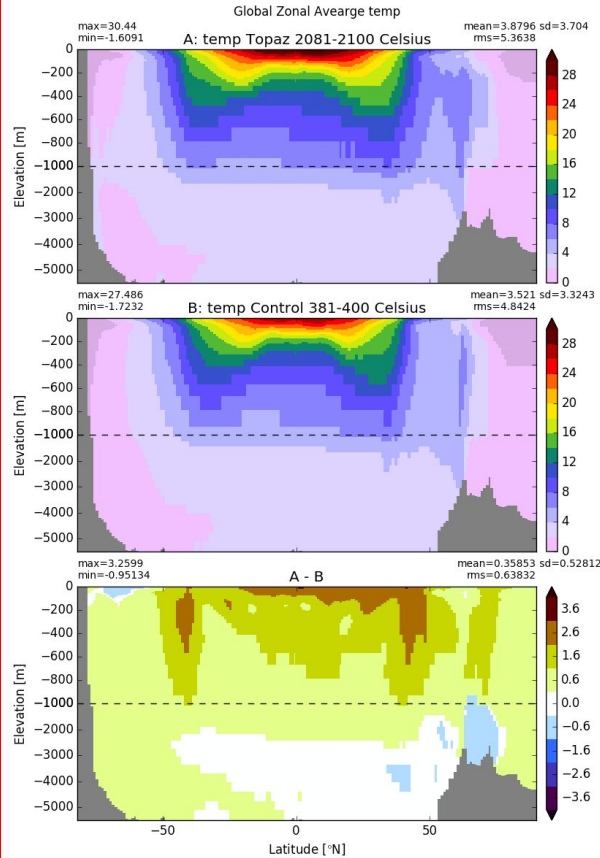
Clim. change response > Drift

Temperature Global Zonal Average vs Depth

DRIFT



CLIMATE CHANGE RESPONSE



Drift:

rms=1.2467

Climate change response:

rms=0.638

Drift > Climate Change
Response

Normalized RMS

Variable	Drift <i>(Model vs. Obs)</i>	Climate Change Response <i>(RCP8.5 vs. Control)</i>
PO4	0.09	0.02
NO3	0.08	0.02
SIO4	0.19	0.05
O2	0.11	0.05
DIC	0.017	0.025
Alkalinity	0.009	0.003
Temperature	0.5	0.18

Drift > Climate Change Response

Climate Change Response > Drift

Normalized RMS =
$$\frac{\left(\sqrt{\sum_i^N (X_{model_i} - X_{reference_i})^2} \right) / N}{\bar{X}_{reference}}$$

Conclusions



Over the course of the model spin up, the model has drifted and changed more than the climate change response



For a higher resolution model (CM4) that is more computationally expensive, it would be beneficial **to reduce the spin-up time in order to minimize the drift and bias.**

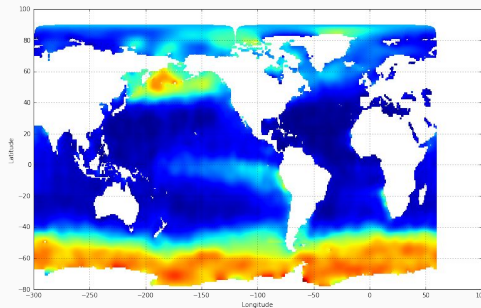


As strategies emerge to shorten the spin up time of the coupled model, a useful next question would be:

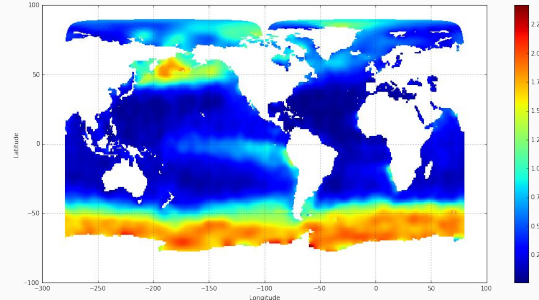
At what time in the spin up does the drift equal the climate change response for the biogeochemical fields in other versions of GFDL ESMs?

Outstanding Issues

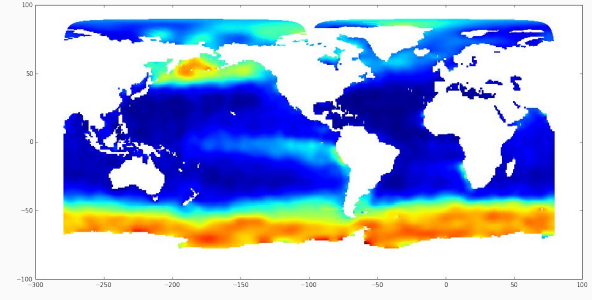
- Further validate horizontal and vertical regridding
 - Regridding in the Arctic seems sensitive to model resolution
 - Tried different regridding tools



**PO₄ - MOM6 0.25 degree
GFDL FMS Horiz Interp**



**PO₄ - MOM4p1 1 degree
GFDL FMS Horiz Interp**



**PO₄ - MOM4p1 1 degree
Earth System Modeling Framework (ESMF)
(*bilinear conservative*)**

- Uncovered bug in the MIDAS implementation of ALE
 - Piecewise-linear (plm) remapping fails on MOM4p1 output
 - Only piecewise-constant (pcm) remapping was successful

Next Steps



Include more biogeochemical fields



When ESM4 is ready:

- Regrid WOA nutrients to new 0.5 degree grid
- Double-check variable names
- Integrate Makefile into the workflow

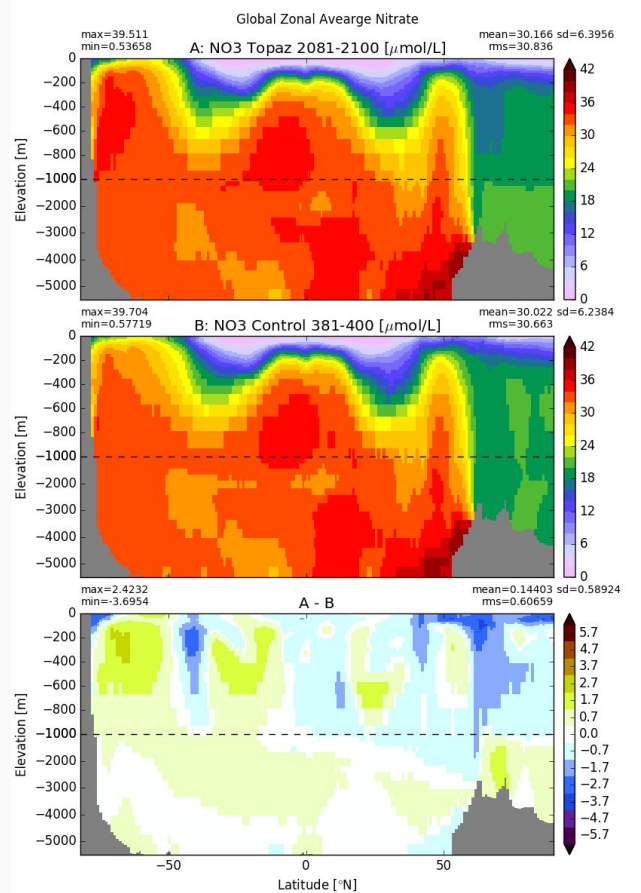
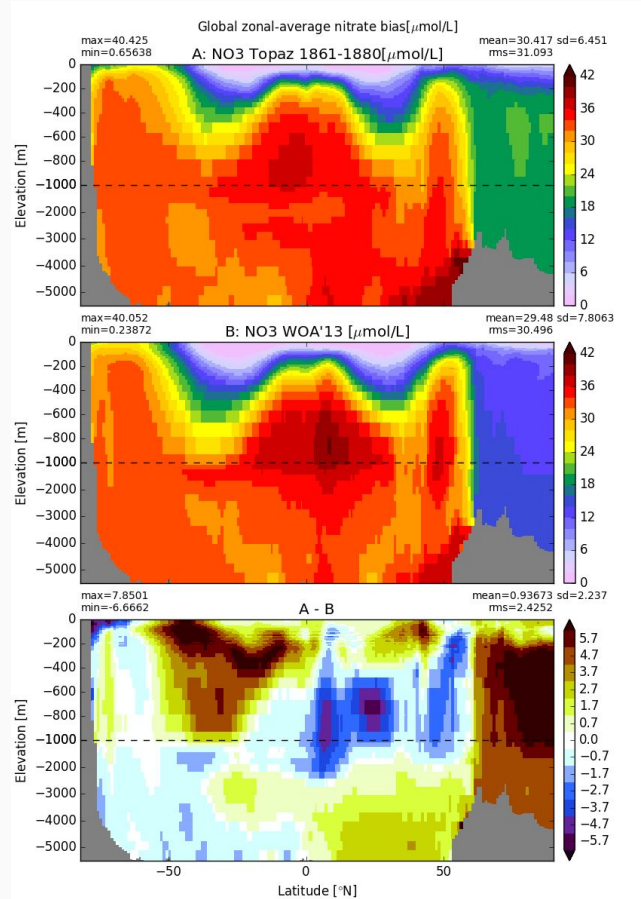


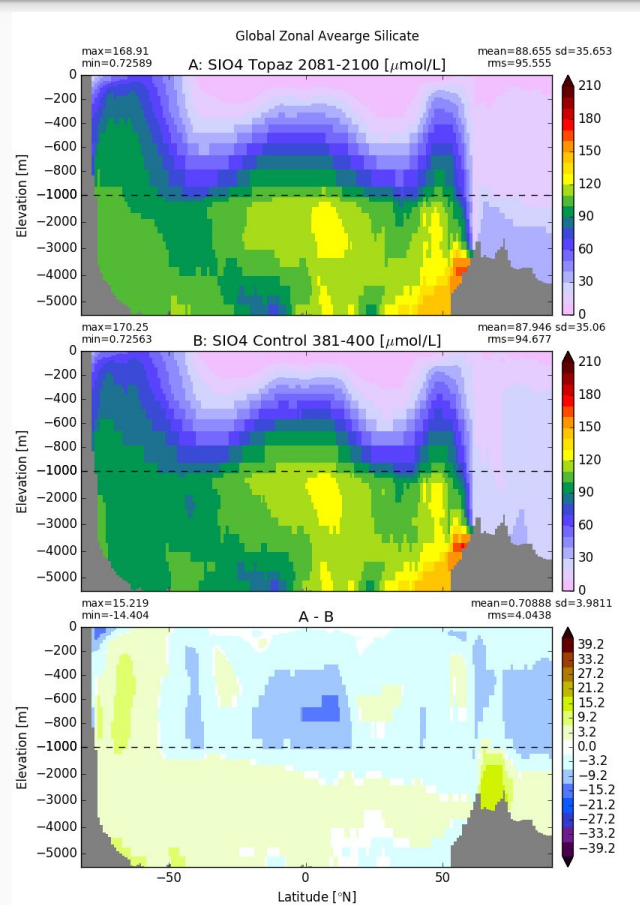
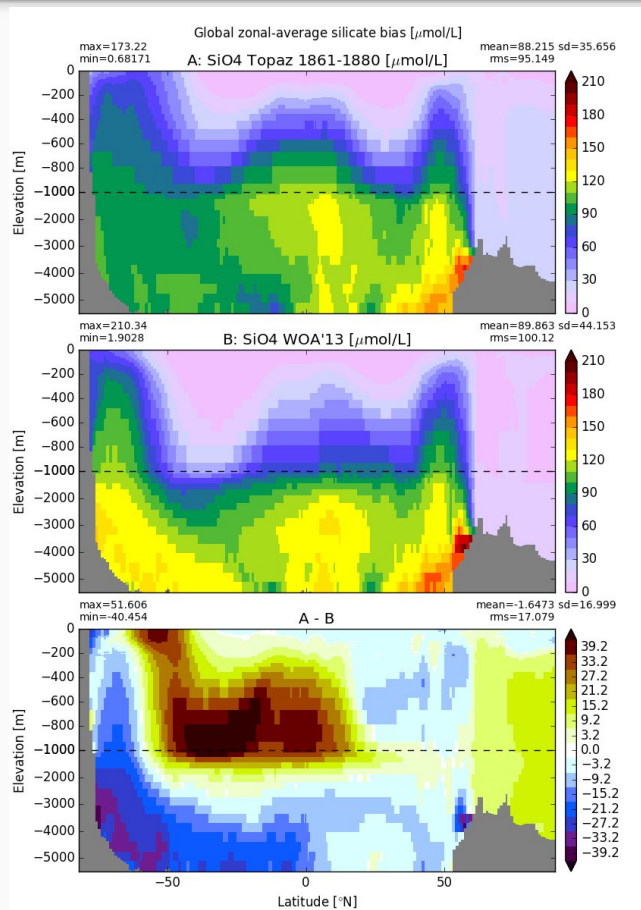
Scripts are GFDL specific but eventually should be generalized (i.e. other CMIP models)

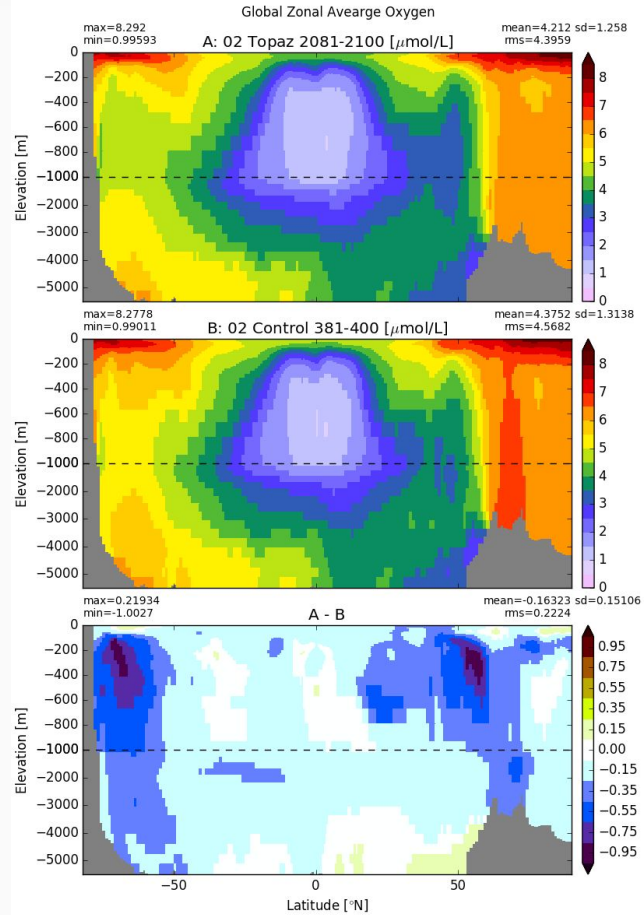
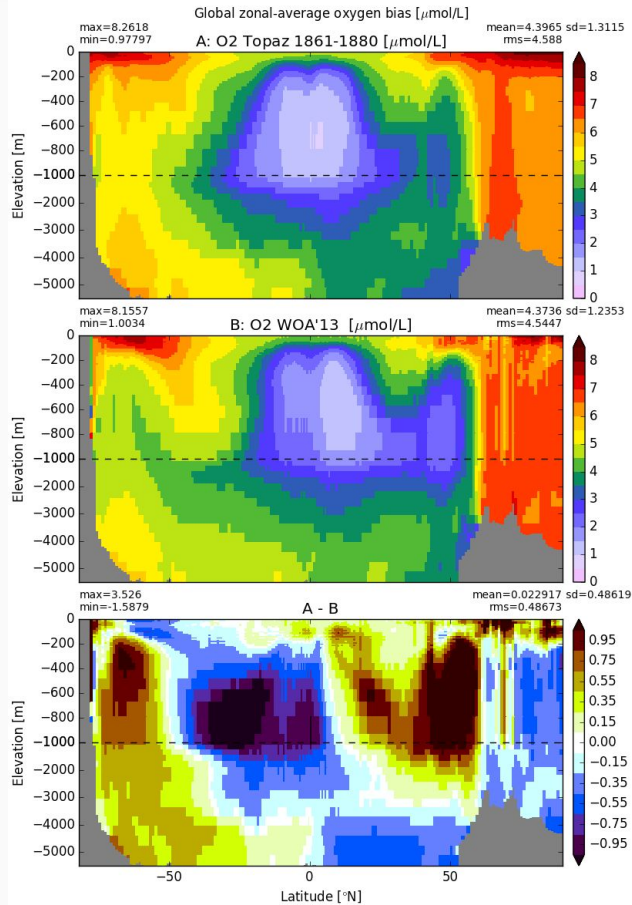
Acknowledgments:

- John Krasting
- Jasmin John, John Dunne, Charles Stock, Alistair Adcroft, and everyone in B group
- Matt Harrison

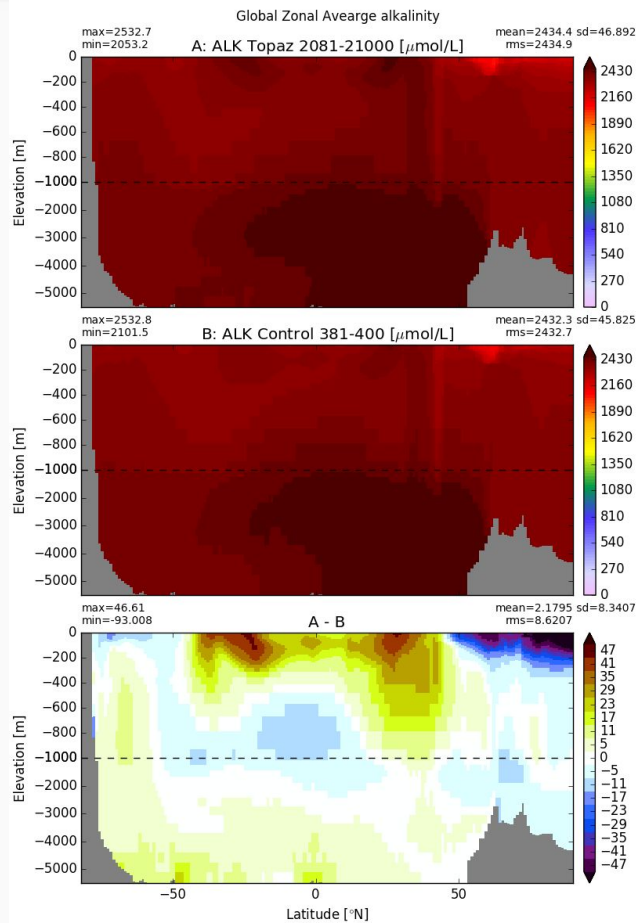
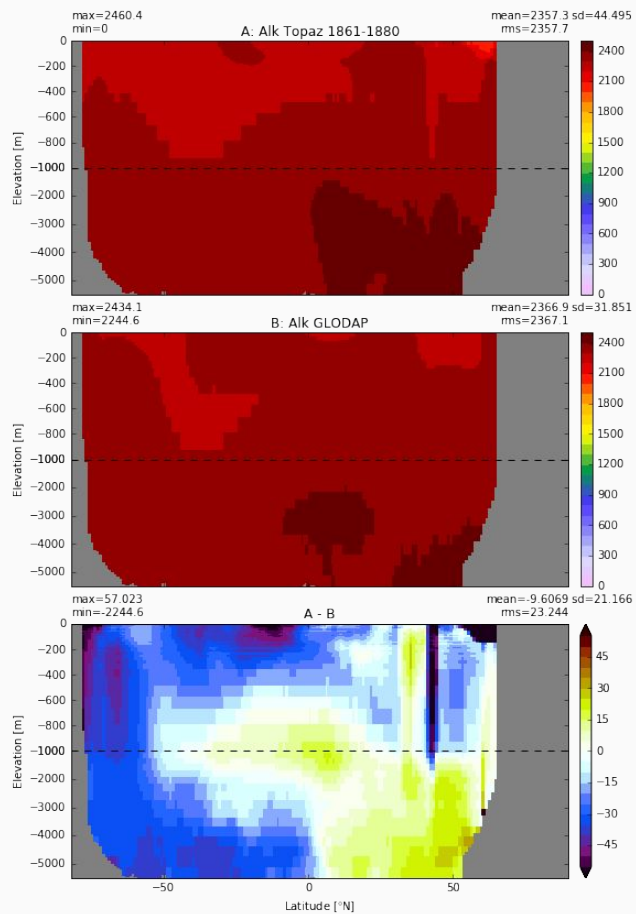
Supplemental Materials



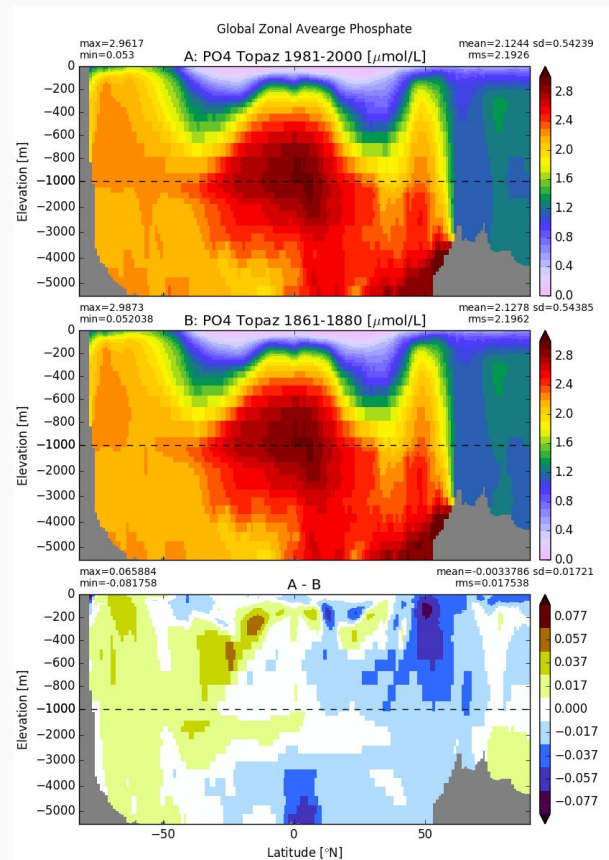
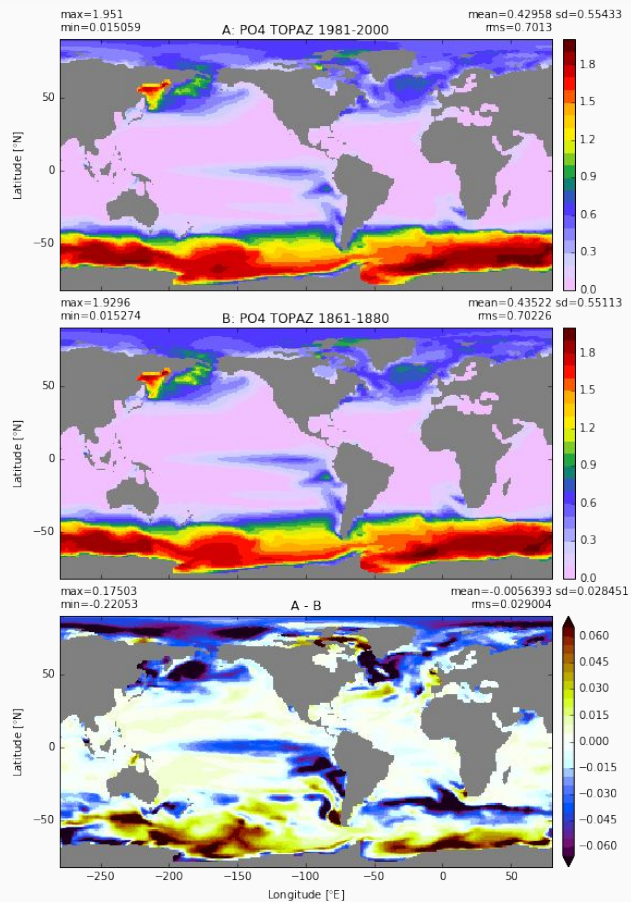




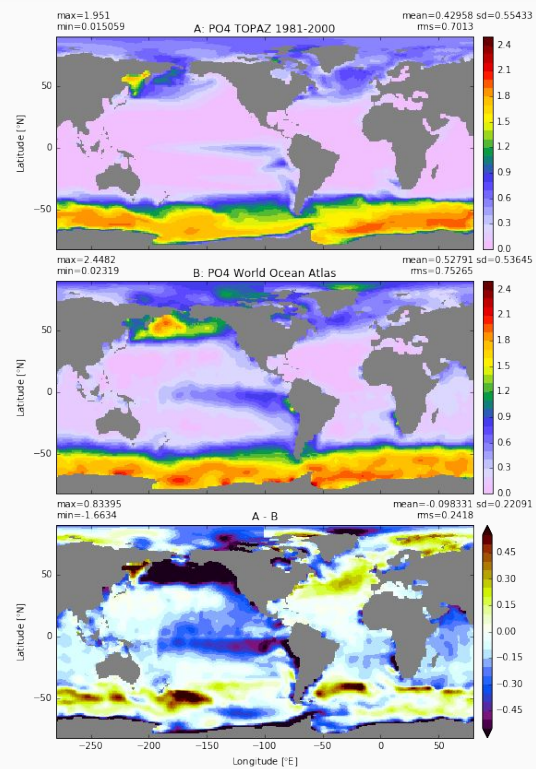
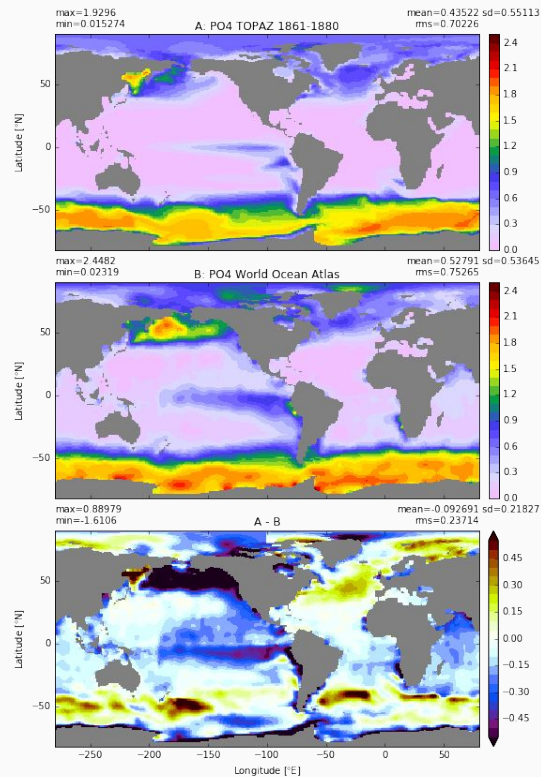
Alkalinity



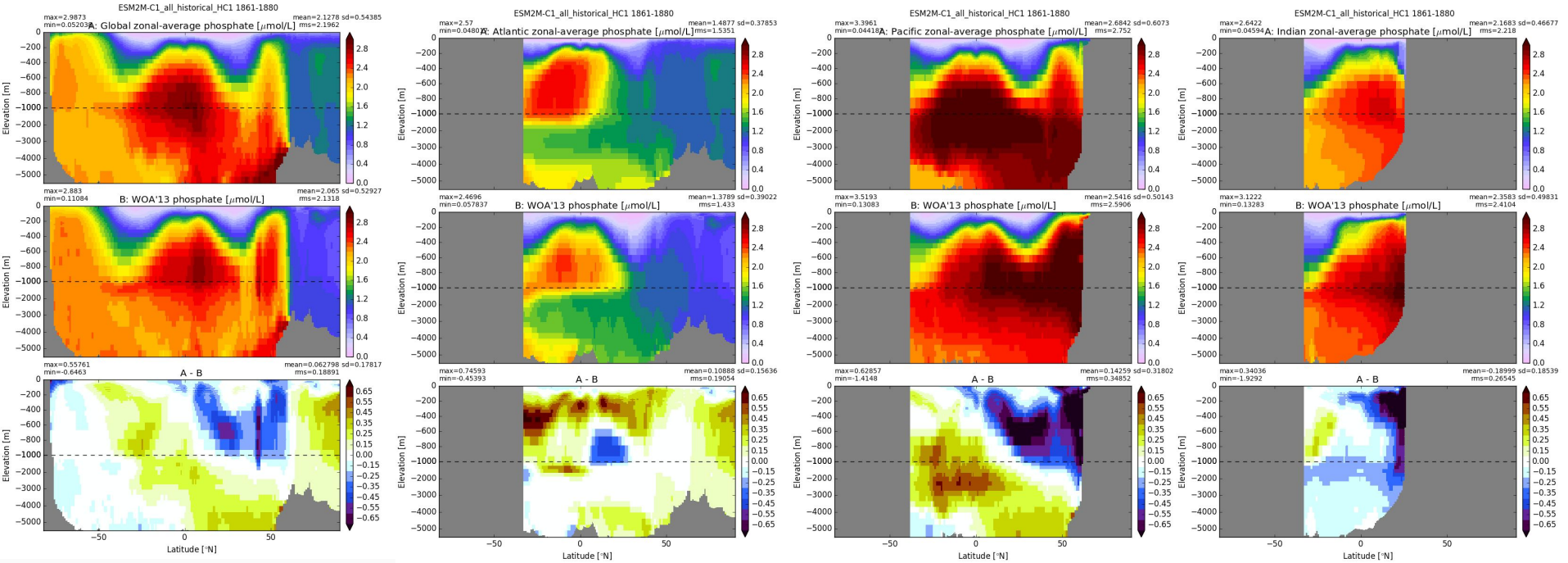
Differences between start and end of the historical run



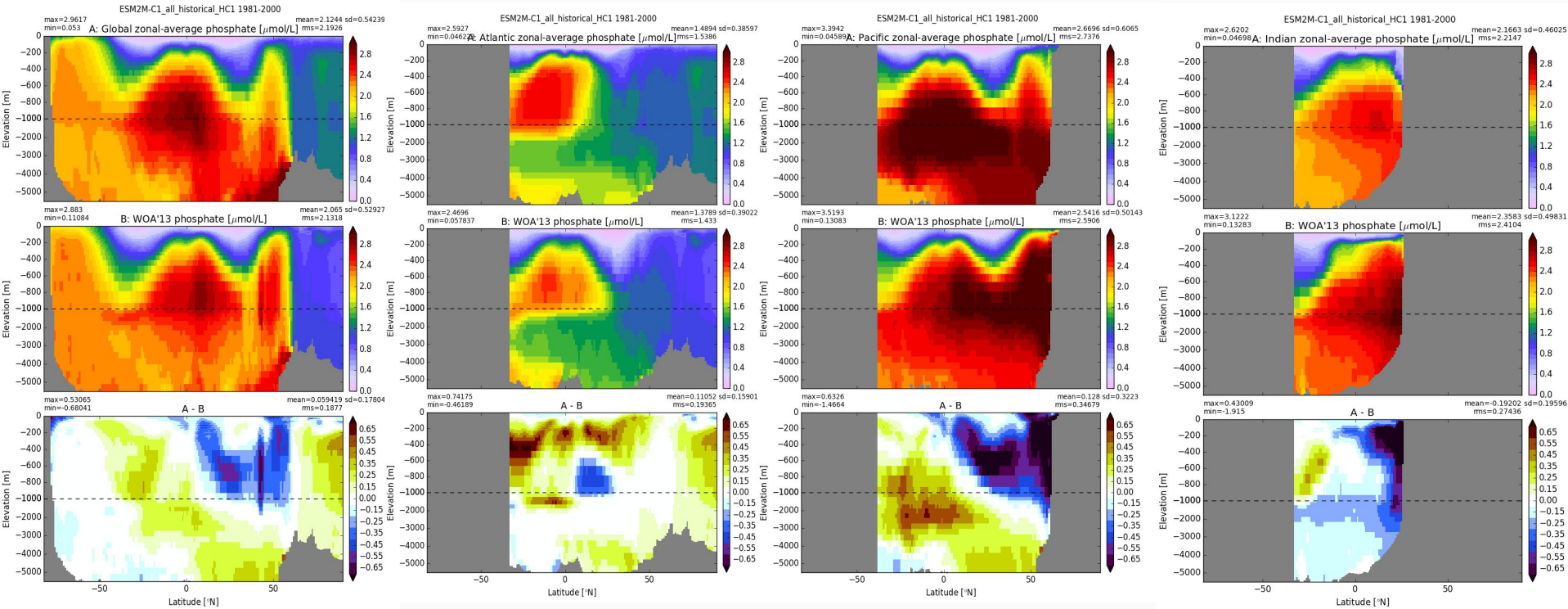
Phosphate Drift: 1861-1880 & 1981-2000 vs. WOA

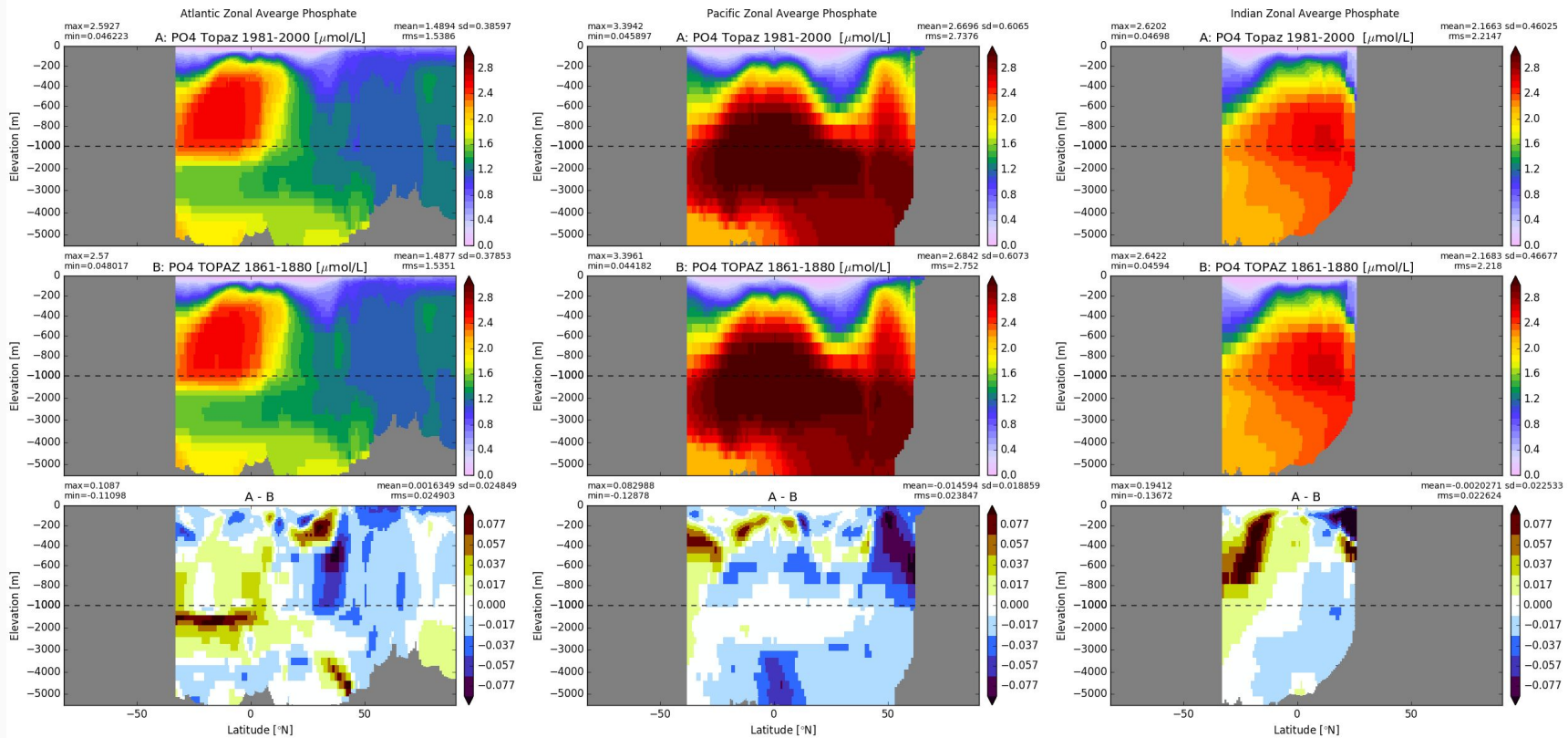


Phosphate Drift: 1861-1880 vs WOA



Phosphate Drift: 1981-2000 vs WOA





PO4 Climate change Scenario: 1981-2000 vs Control

