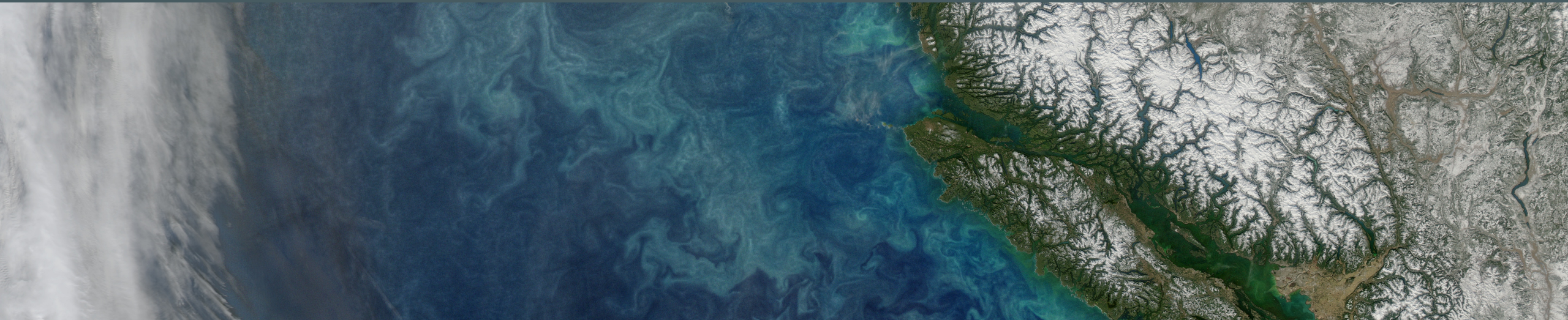


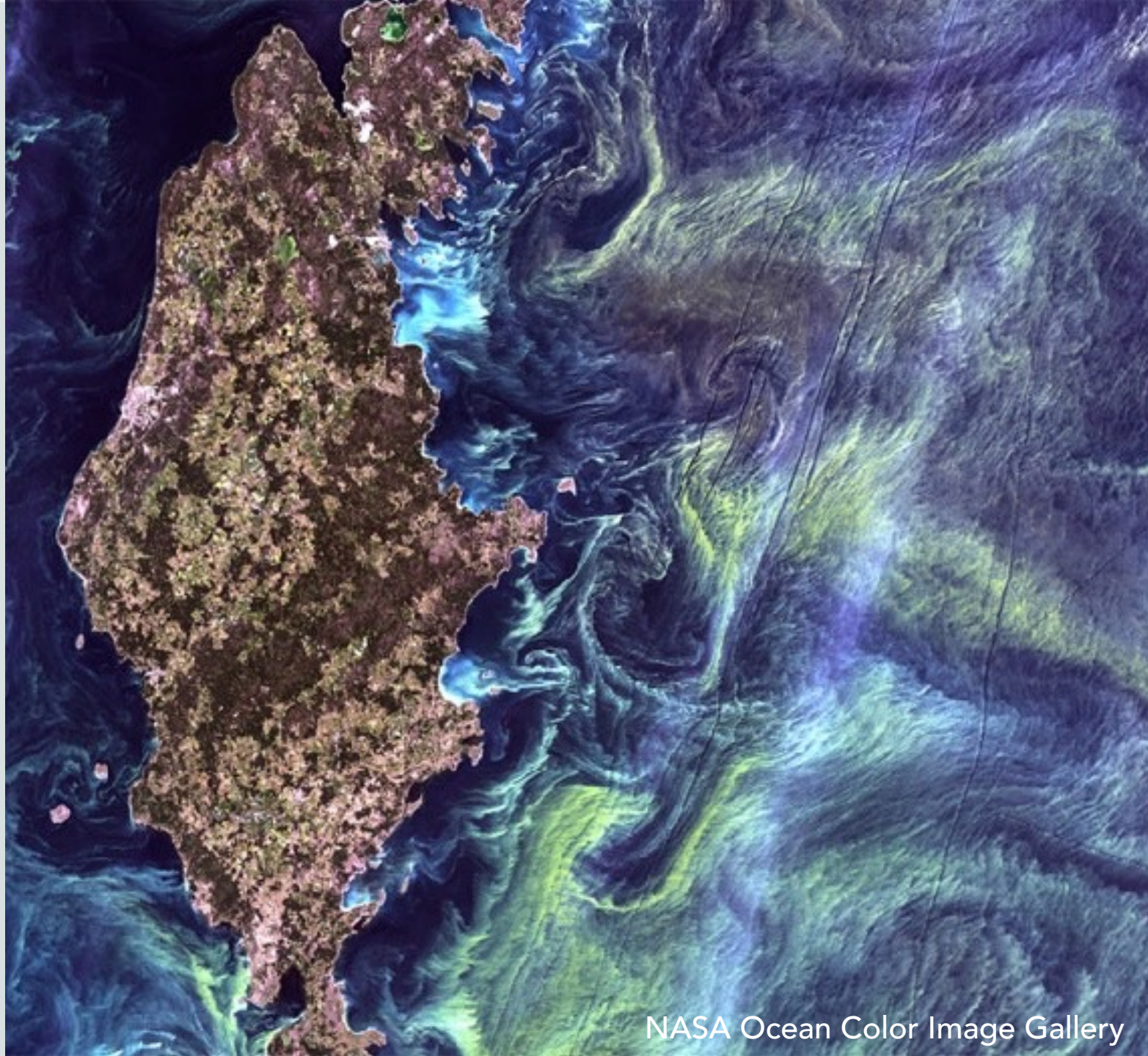
# Implementing a satellite emulator in CESM2 to evaluate the impact of clouds on ocean chlorophyll observations

Genevieve Clow, Nikki Lovenduski, Mike Levy, Keith Lindsay & Jen Kay



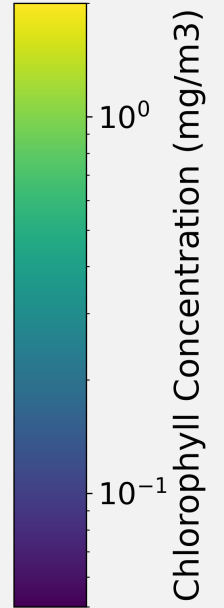
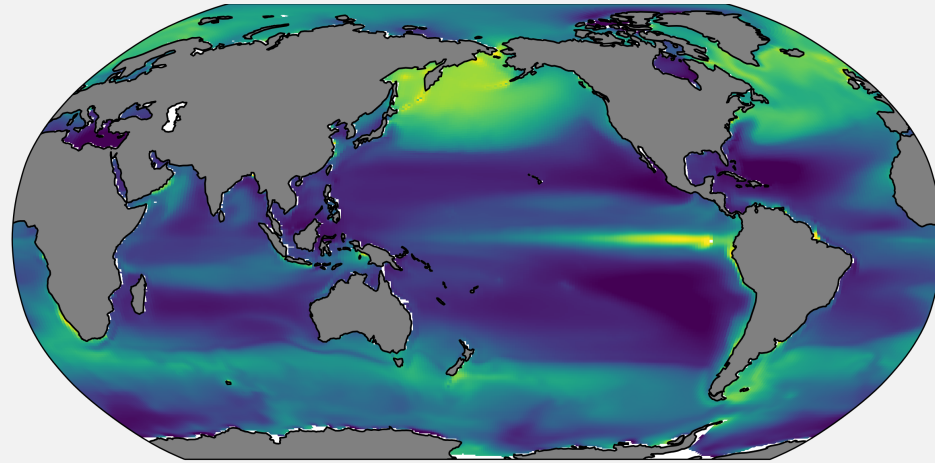
# Phytoplankton

- Base of the marine food web
- Responsible for 50% of primary productivity on Earth
- Global abundance estimated through remote sensing of chlorophyll (chl.)

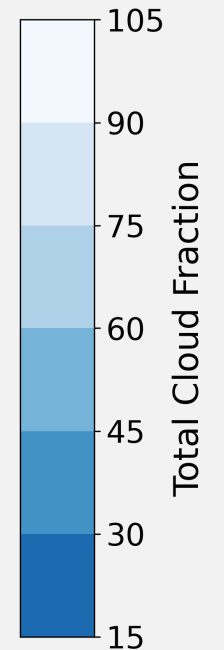
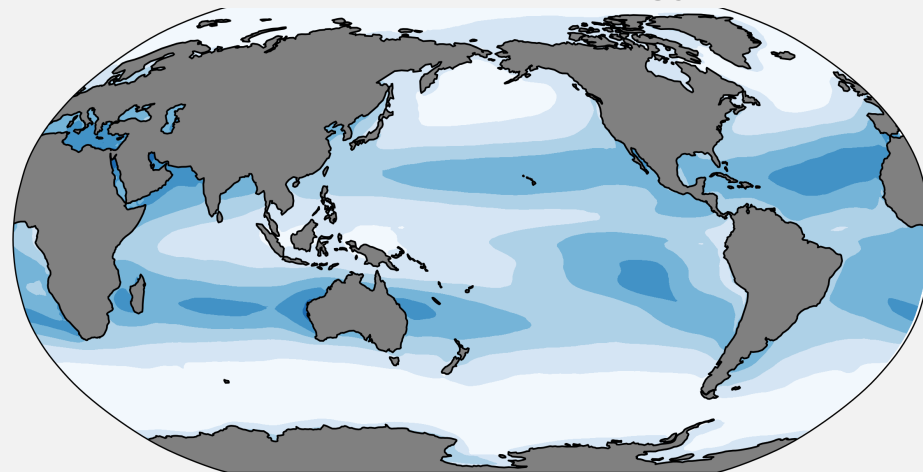


We are unable to reliably detect phytoplankton from satellite observations in the regions where they are most abundant.

Chlorophyll Climatology

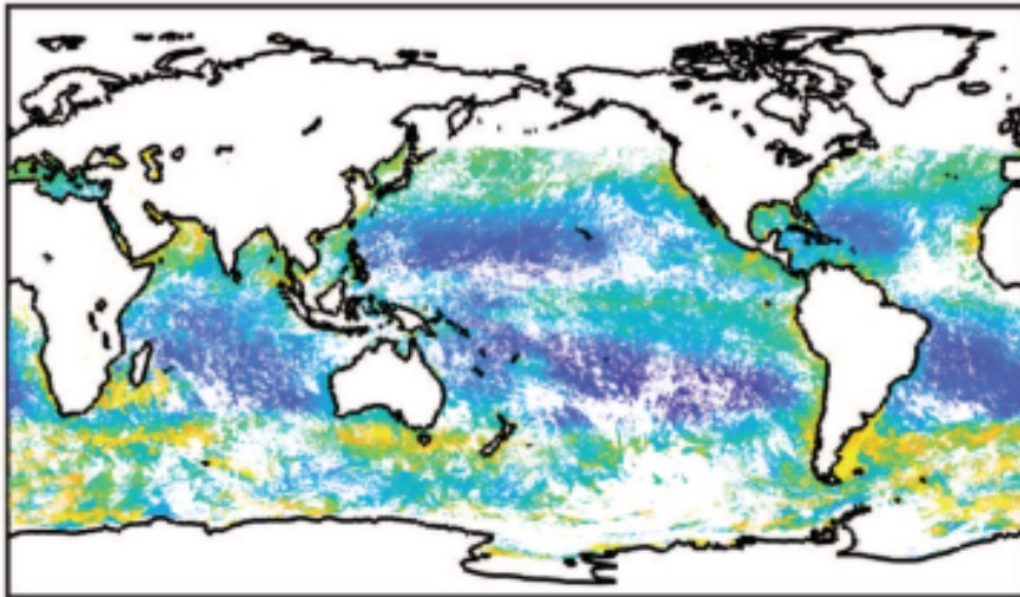


Cloud Climatology

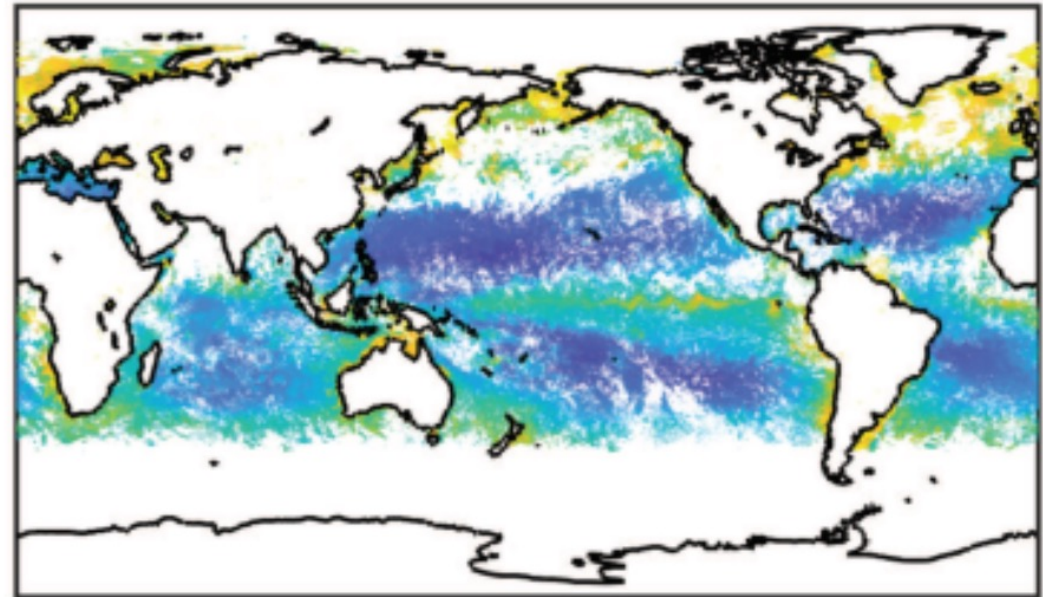


# Chlorophyll Satellite Observations

VIIRS Chlorophyll, January 1-8 (2020)

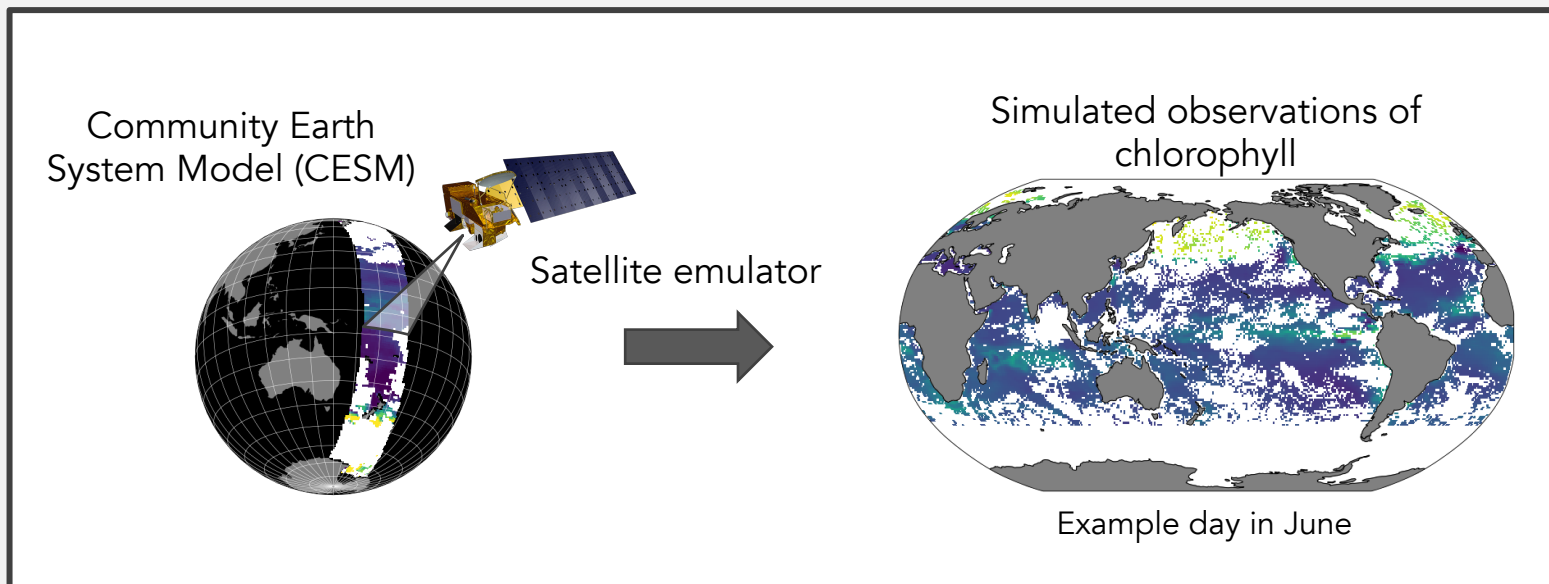


VIIRS Chlorophyll, June 1-8 (2020)



Natural log of the 8-day averaged surface ocean  
chlorophyll concentration in  $\text{mg}/\text{m}^3$

# Satellite Emulator for Chlorophyll

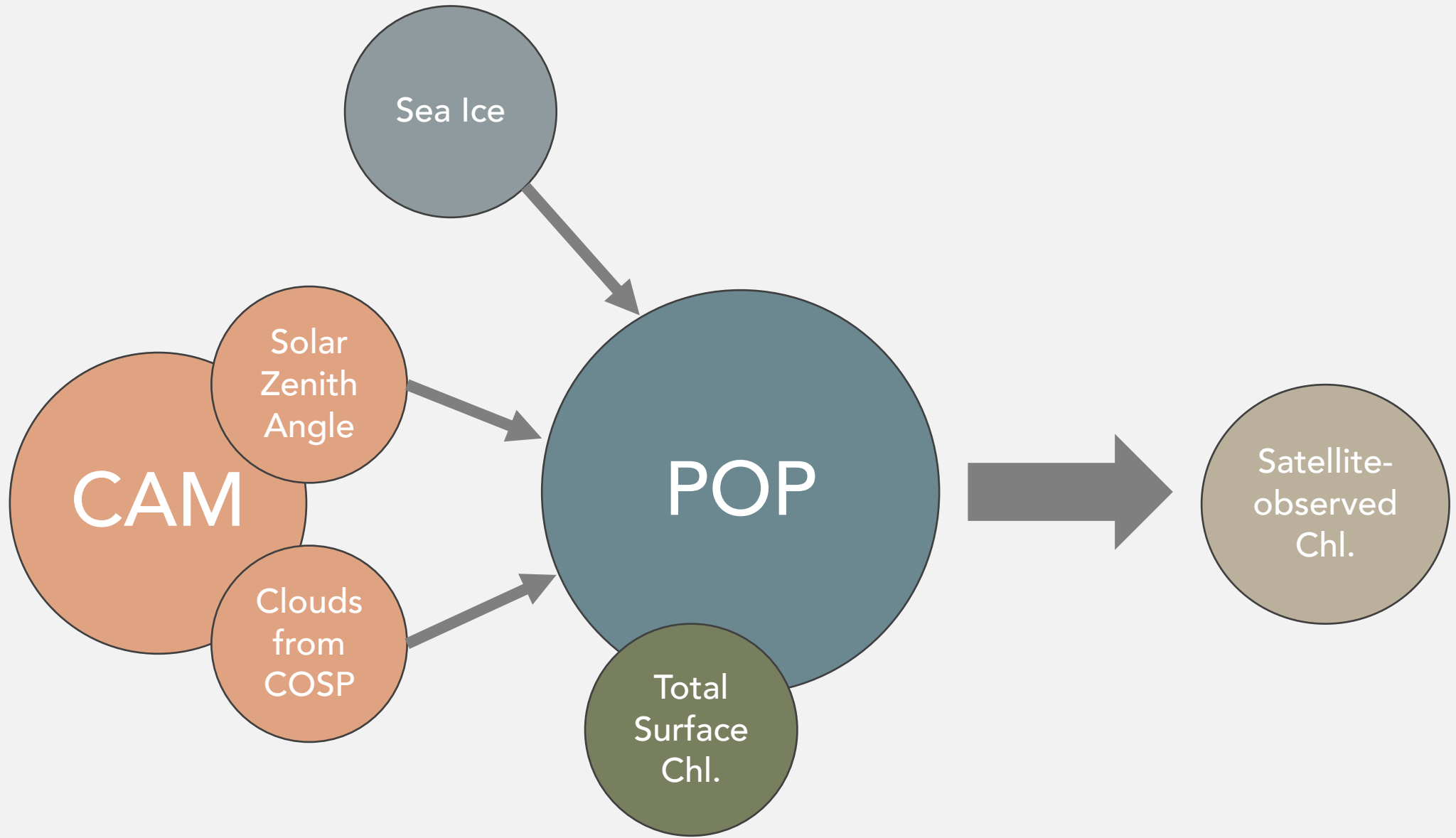


## Included in emulator:

- Clouds
- Sunlight
- Sea ice

## Not included yet:

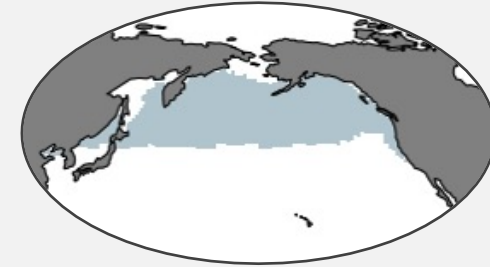
- Sun glint
- Sensor viewing angle
- White caps
- Coccolithophores
- Aerosols



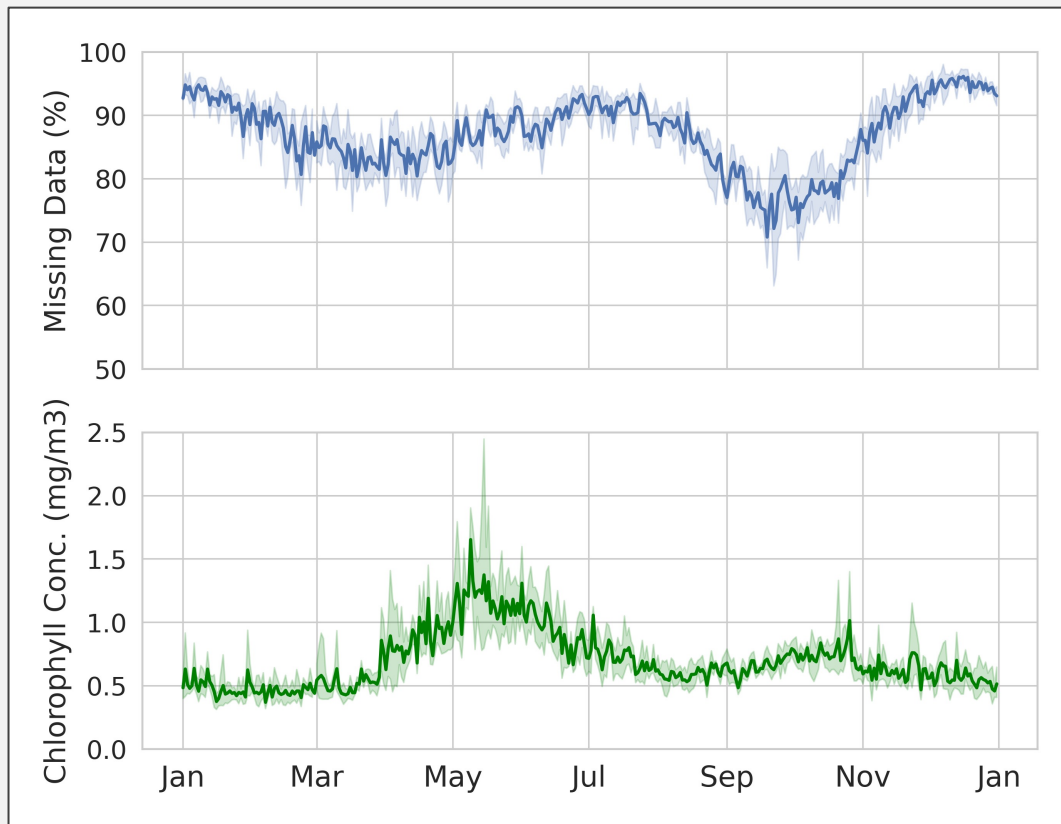
## CESM 2.2 Setup

Atmosphere model	CAM6 with COSP enabled
Ocean model	POP2 with MARBL
Component set	B1850
Grid	f09_g17
Run Length	50 years (analyzed the last 30)

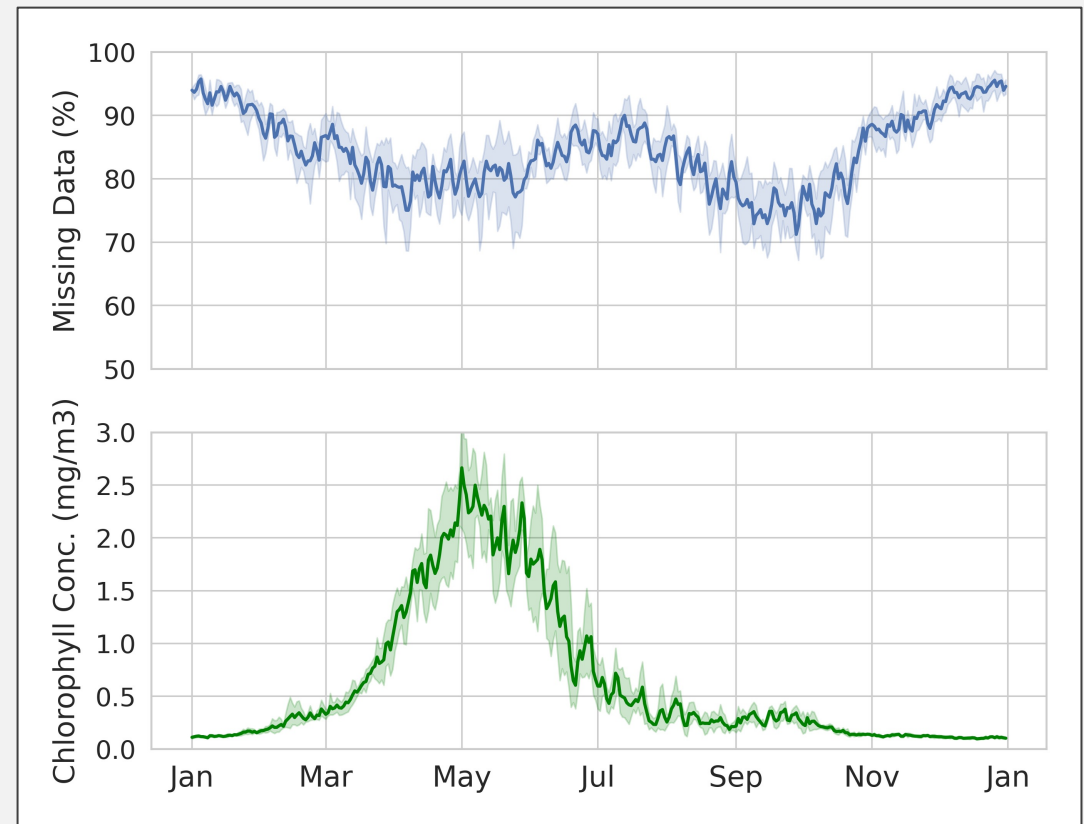
# North Pacific Satellite Data Comparison



Satellite Data  
(MODIS & VIIRS, 2014 - 2019)



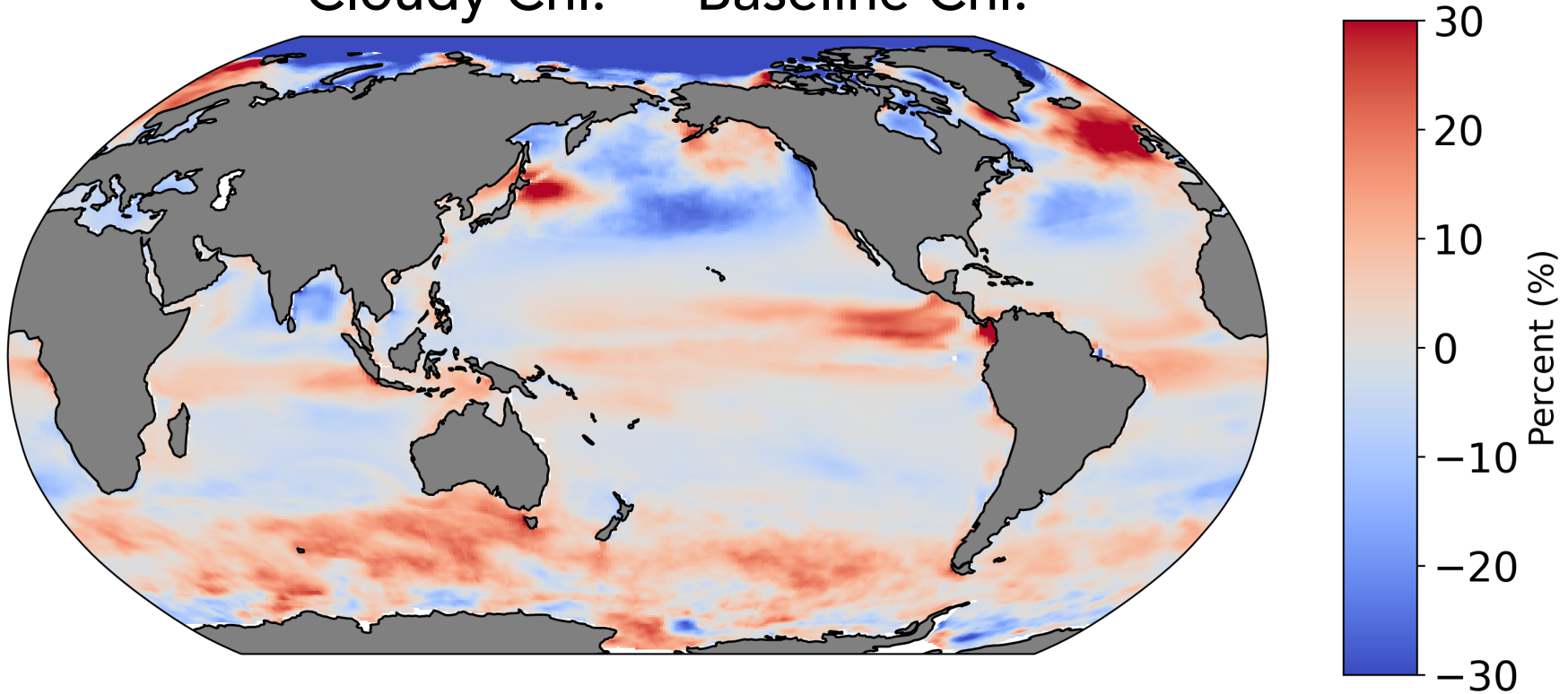
CESM Satellite Emulator  
(5 years pre-industrial)



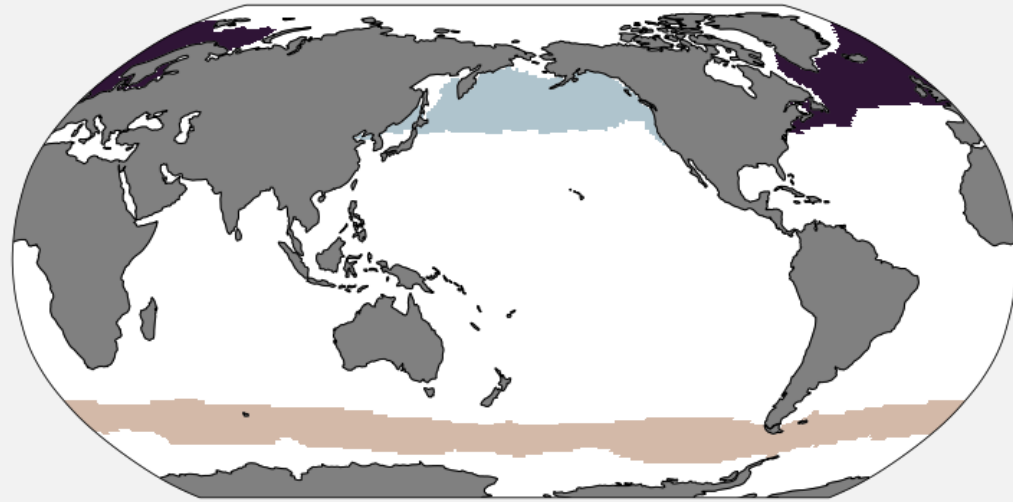


# Climatology Differences

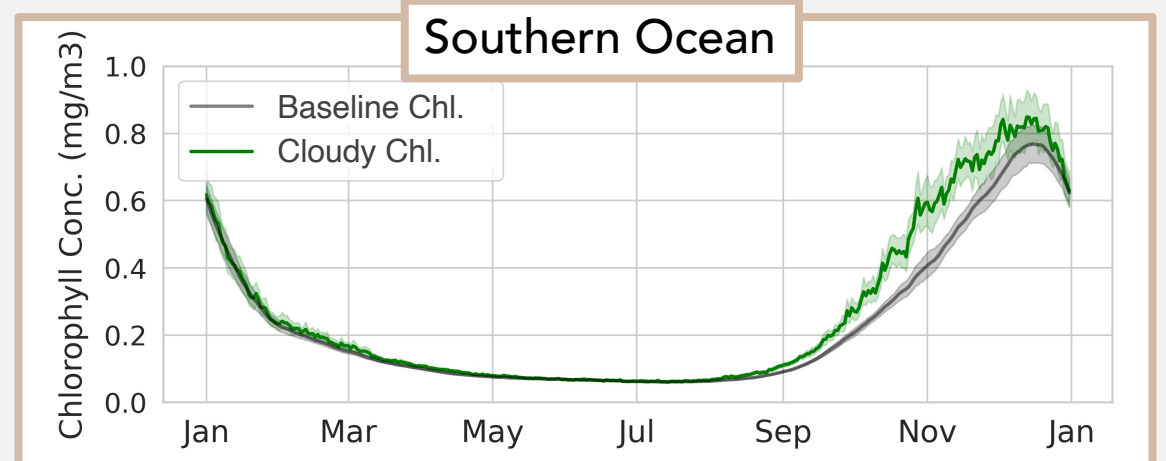
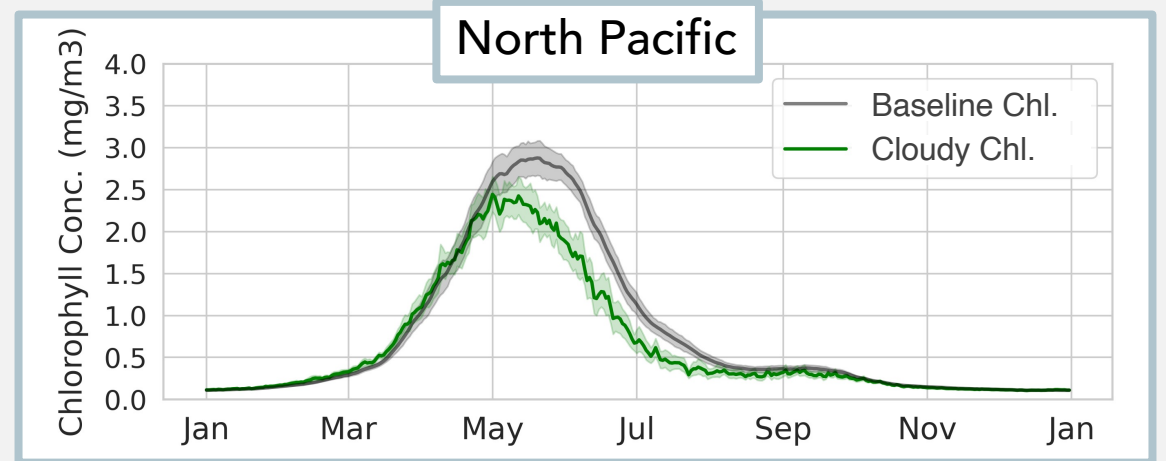
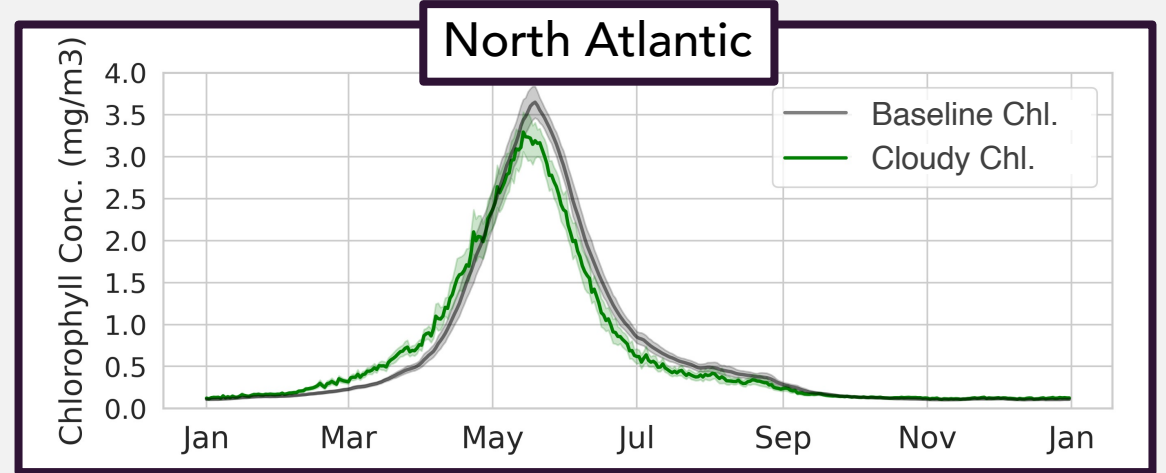
Cloudy Chl. — Baseline Chl.



# Mean Seasonal Cycle Over Biomes

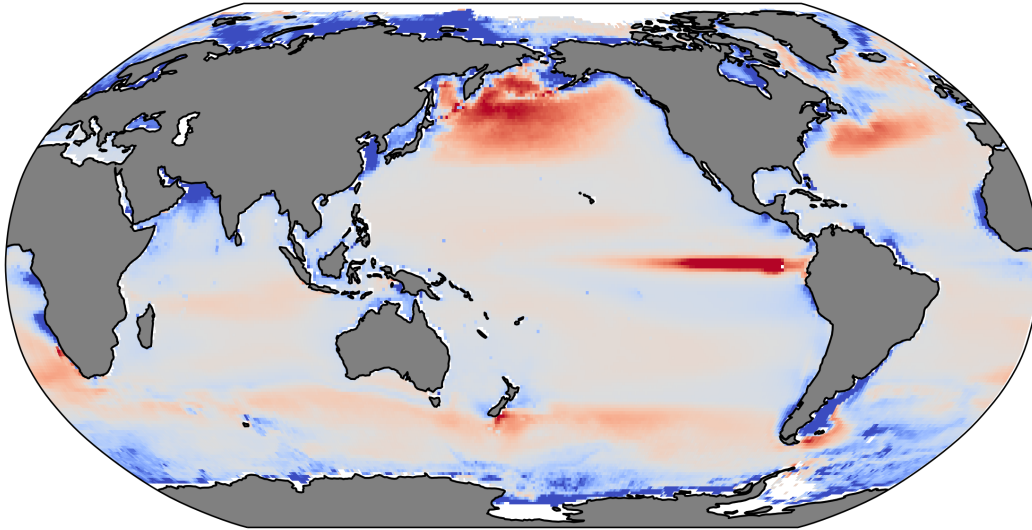


Biomes from Fay & McKinley 2014

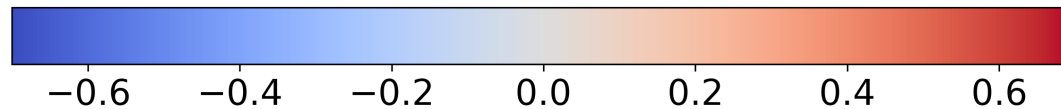
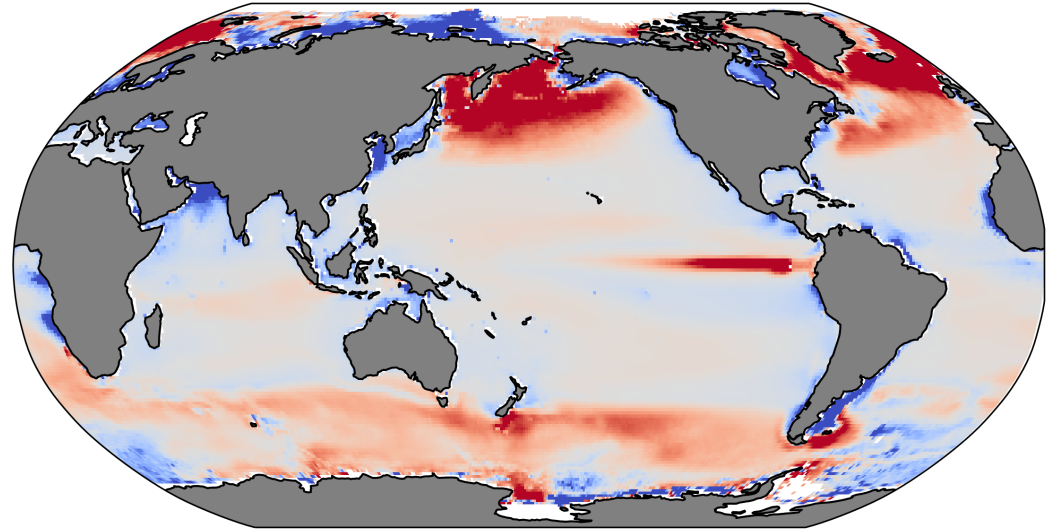


# Application: Model Tuning

Apparent Bias  
(Model - observations)



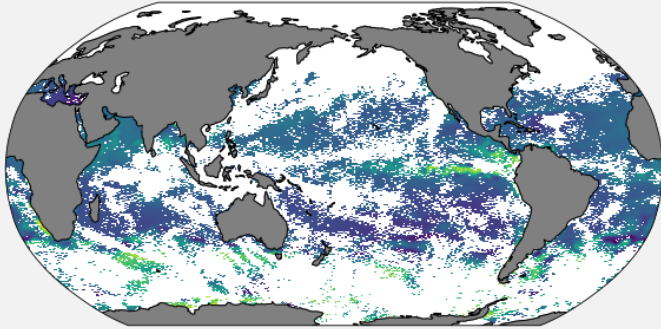
Actual Bias  
(Simulated observations - observations)



Chlorophyll Concentration ( $\text{mg}/\text{m}^3$ )

# Application: Gap-filling Testbed

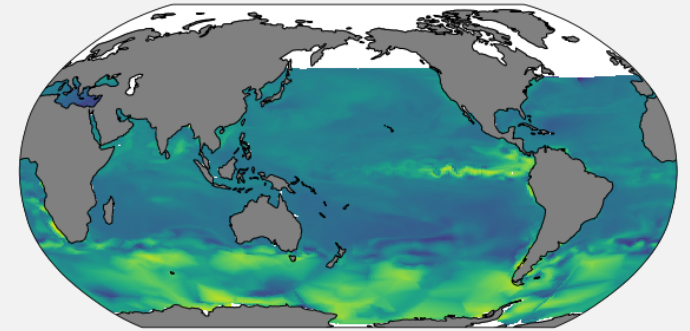
Simulated Observations



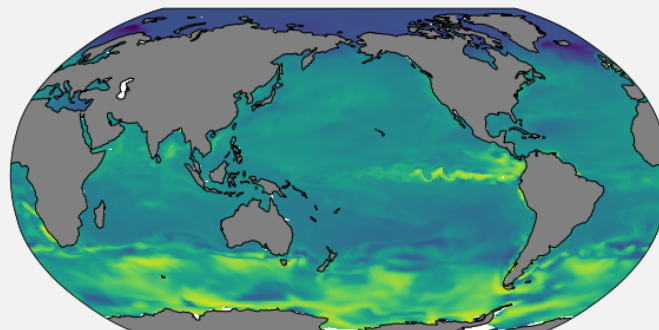
Fill Data Gaps  
(linear interpolation, random forest, neural networks, etc.)



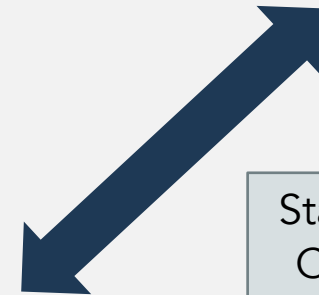
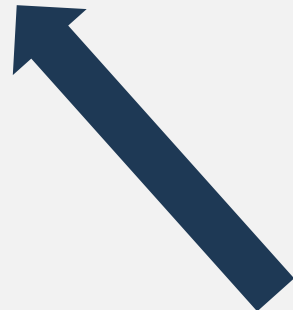
Interpolated Result



Model Truth

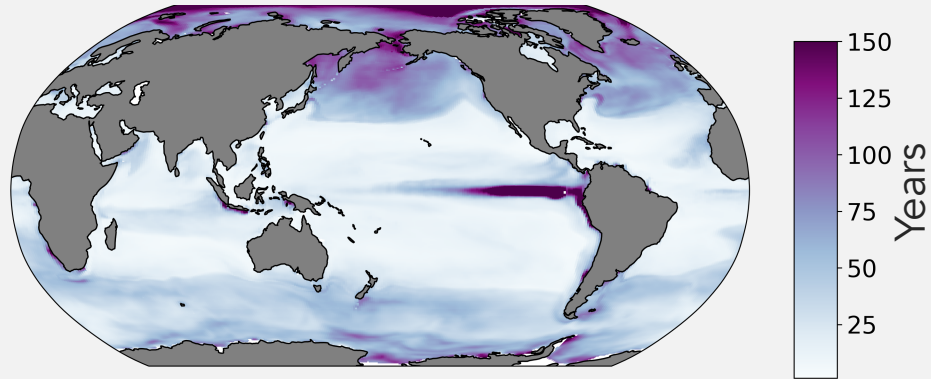


Statistically Compare

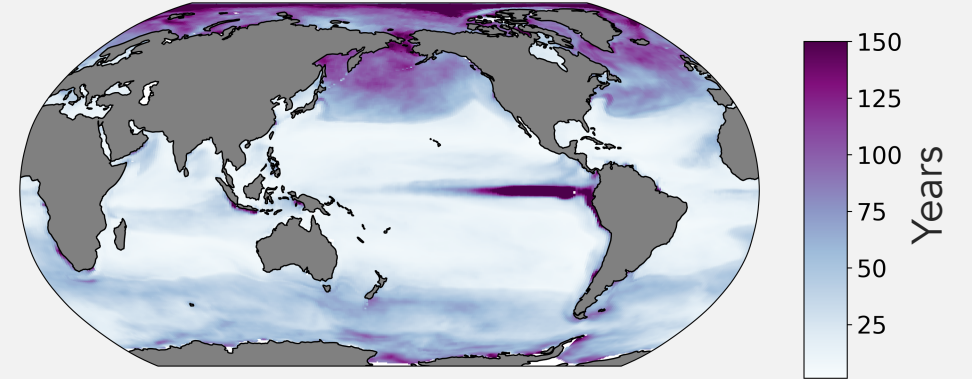


# Application: Trend Emergence

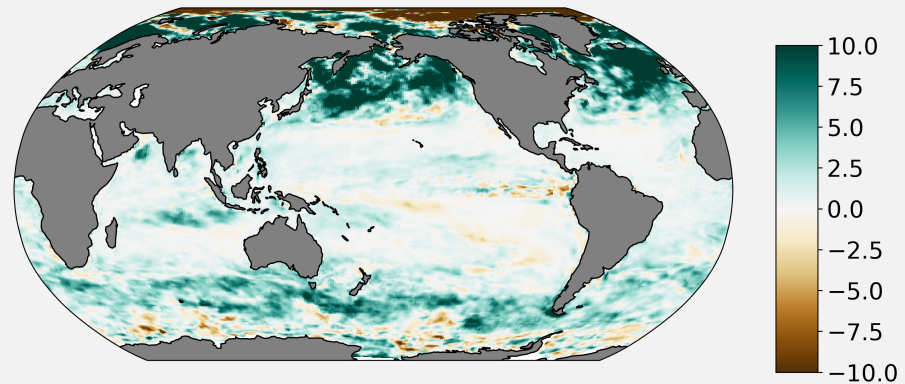
Time to Emergence:  
Baseline Chl.



Time to Emergence:  
Cloudy Chl.

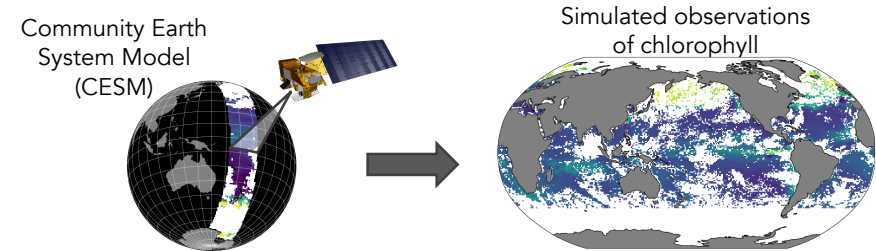


Difference:  
Cloudy Chl. — Baseline Chl.



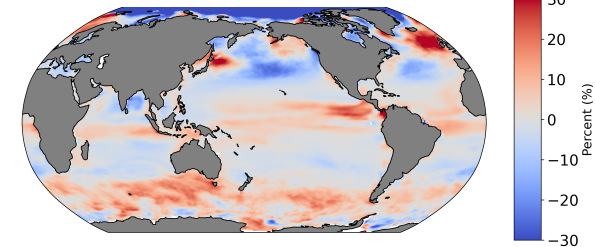
# Conclusions:

We developed a satellite emulator for ocean chlorophyll in CESM



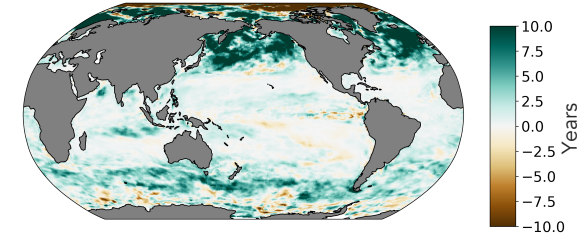
Initial results indicate that the chlorophyll climatology and mean seasonal cycles are biased due to missing data from cloud cover

Cloudy Chl. — Baseline Chl. Climatology



Future applications:  
model tuning, gap-filling, trend emergence

Difference in time to emergence:  
Cloudy Chl. — Baseline Chl.

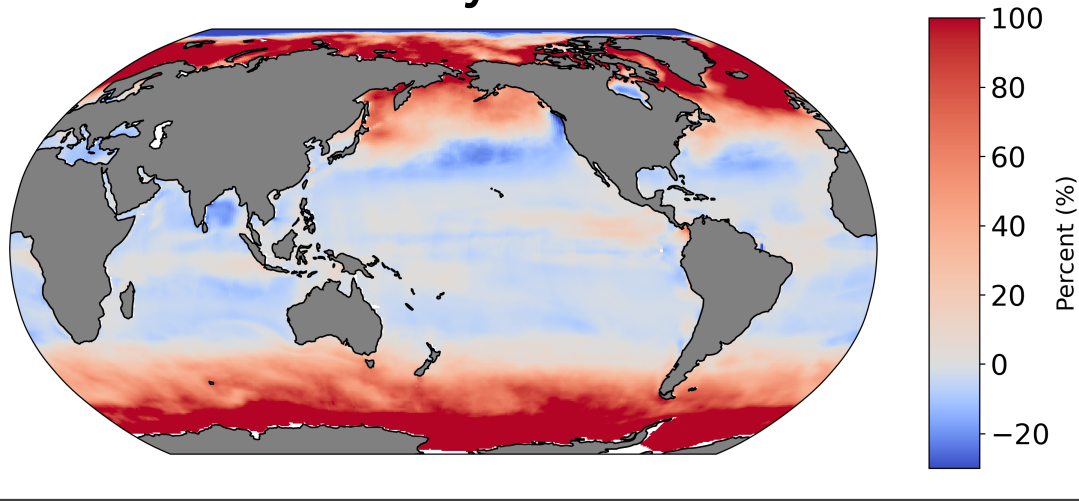


Thank you! Contact Info: [genevieve.clow@colorado.edu](mailto:genevieve.clow@colorado.edu)

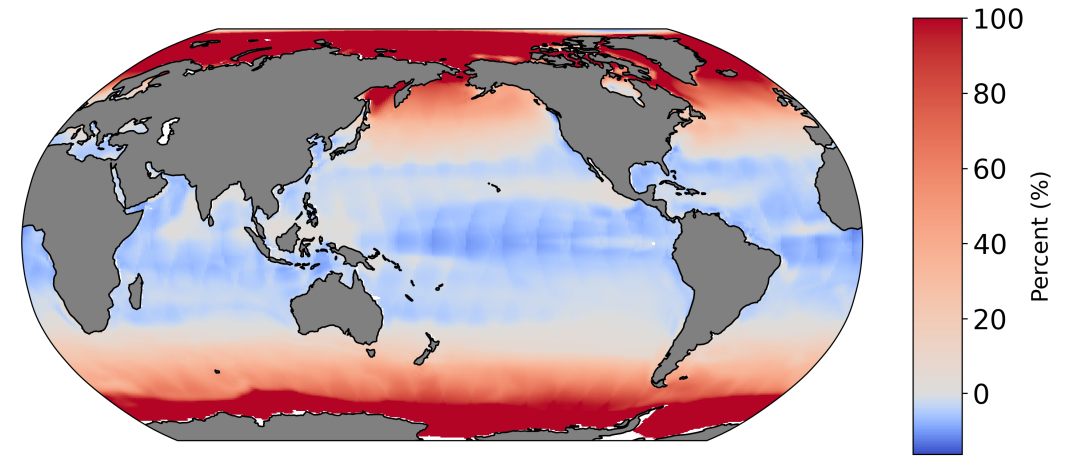
EXTRA SLIDES

# Chlorophyll Climatology Differences

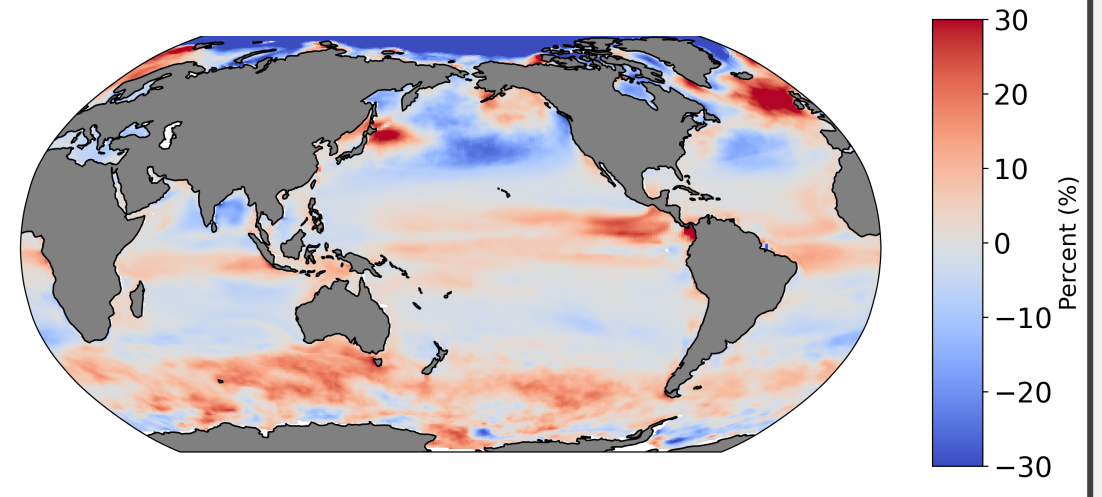
Total bias in simulated observations:  
**Cloudy Chl – Total**



Bias due to daylight-only sampling and sea ice:  
**Baseline – Total**

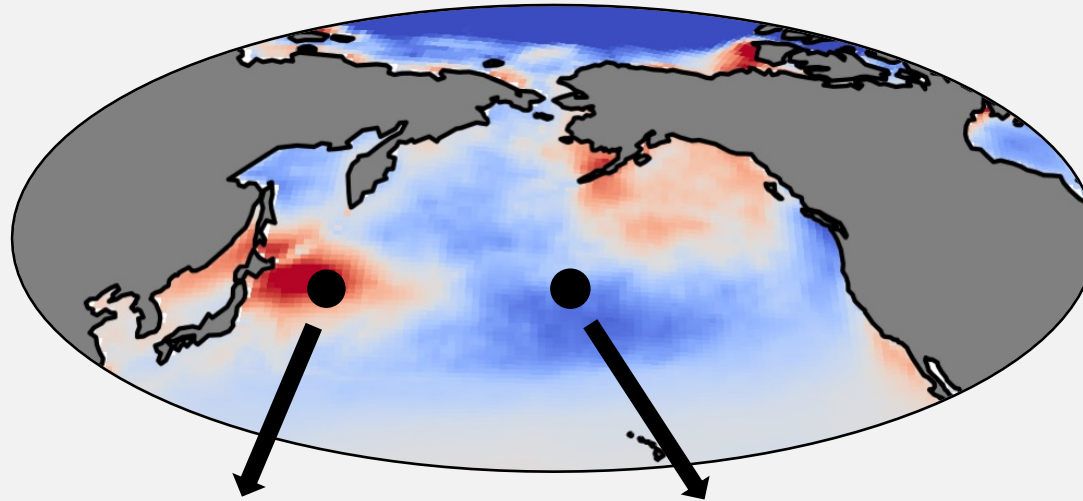


Bias due to cloud cover:  
**Cloudy Chl – Baseline**



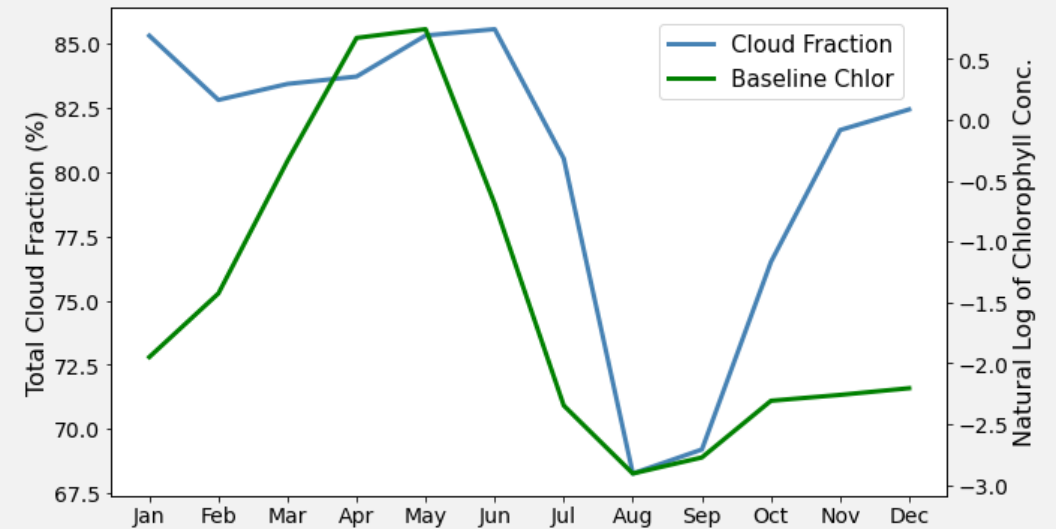
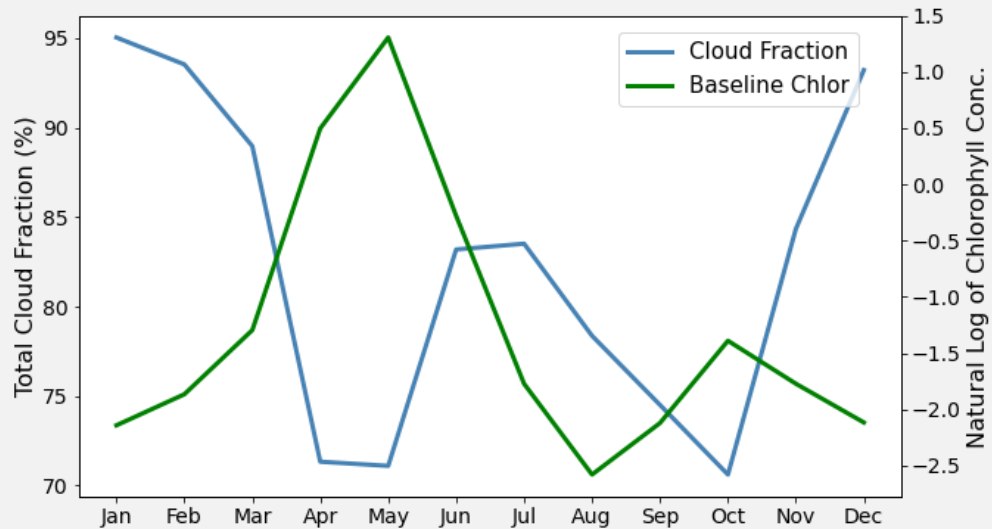


# Differences in Seasonal Cycle



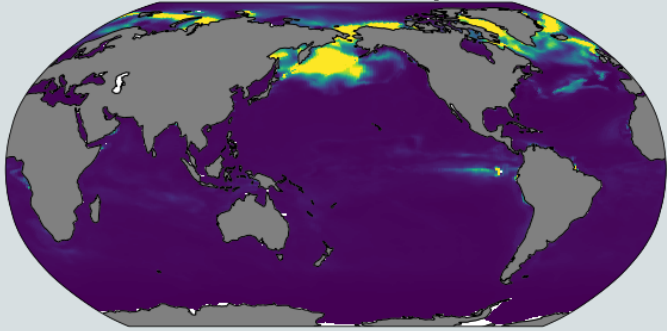
High chlor, low clouds  
= overestimation

High chlor, high clouds =  
underestimation

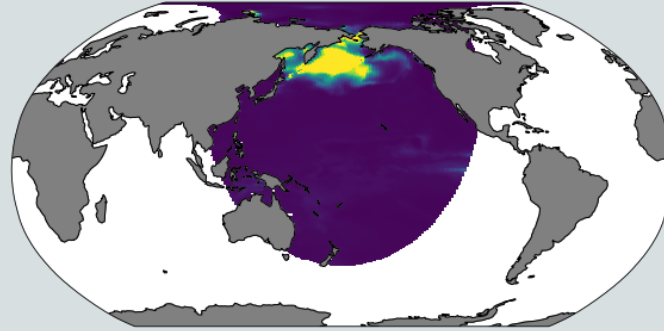


# New Hourly Model Outputs

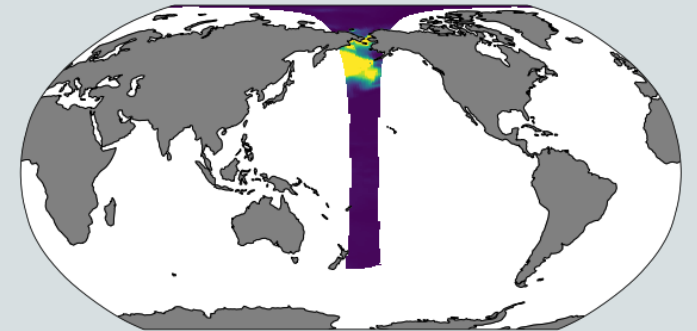
**Total Chlorophyll (Surface):**  
Sum over all phytoplankton functional types



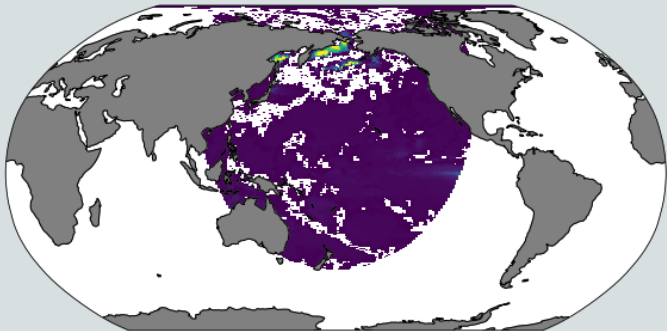
**Baseline Chlorophyll:**  
Total chlorophyll with daylight and sea ice masks



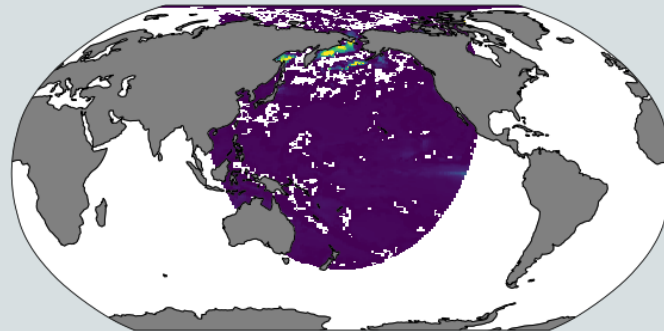
**Baseline Chlorophyll with Aqua MODIS swath:**



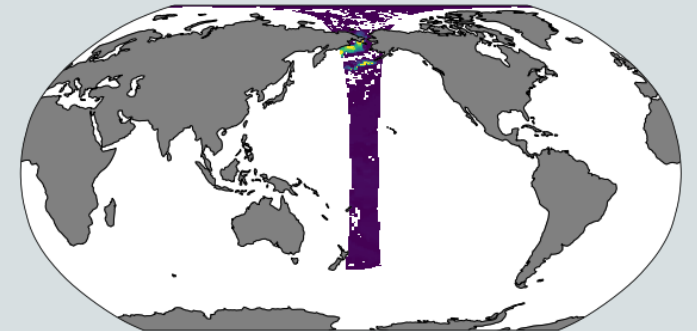
**ISCCP Chlorophyll:**  
Baseline with ISCCP clouds used for weighting



**MODIS Chlorophyll:**  
Baseline with MODIS clouds used for weighting

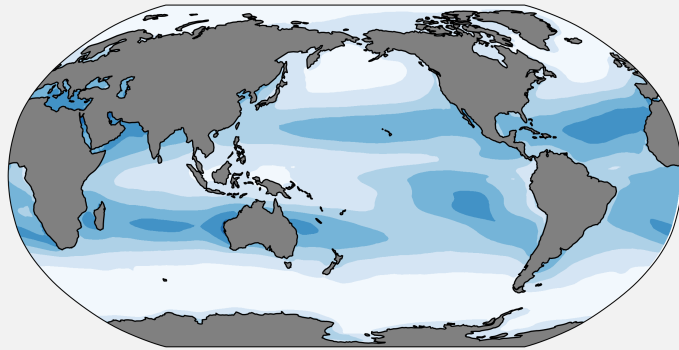


**MODIS Chlorophyll with swath:**

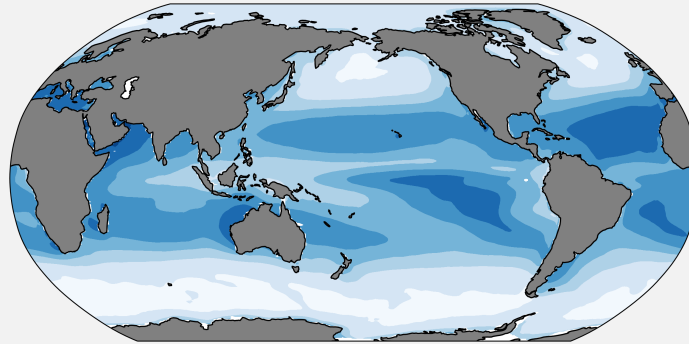


# Cloud Comparison

Total Cloud Fraction



ISCCP Clouds



MODIS Clouds

