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# OCEAN PREDICTION

PREDICTABILITY OF OCEAN PARAMETERS  
RELATED TO ATMOSPHERIC FORECASTS:  
*RESEARCH NEEDS, GAPS, AND RECENT ADVANCES*

JOINT PSMI/PPAI SESSION ON QUANTIFYING  
IMPROVEMENTS IN PREDICTION/PROJECTIONS  
US CLIVAR SUMMIT, AUGUST 5, 2015, TUCSON, AZ

# PHILOSOPHIES

- Use best available data assimilation methods from Geophysical Dynamical Systems Theory
- The Earth is one system
- Bridge disciplines
- Use all data
- Think Big

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# DATA ASSIMILATION

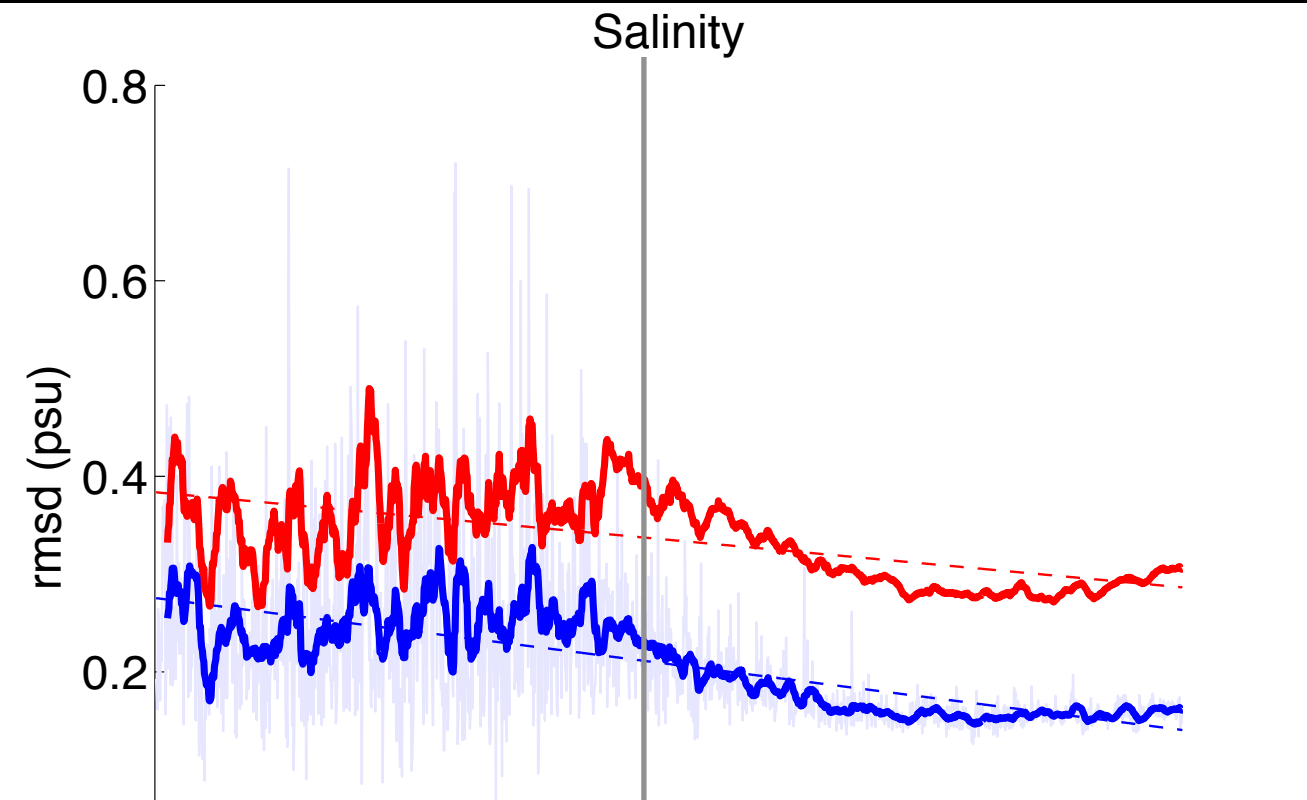
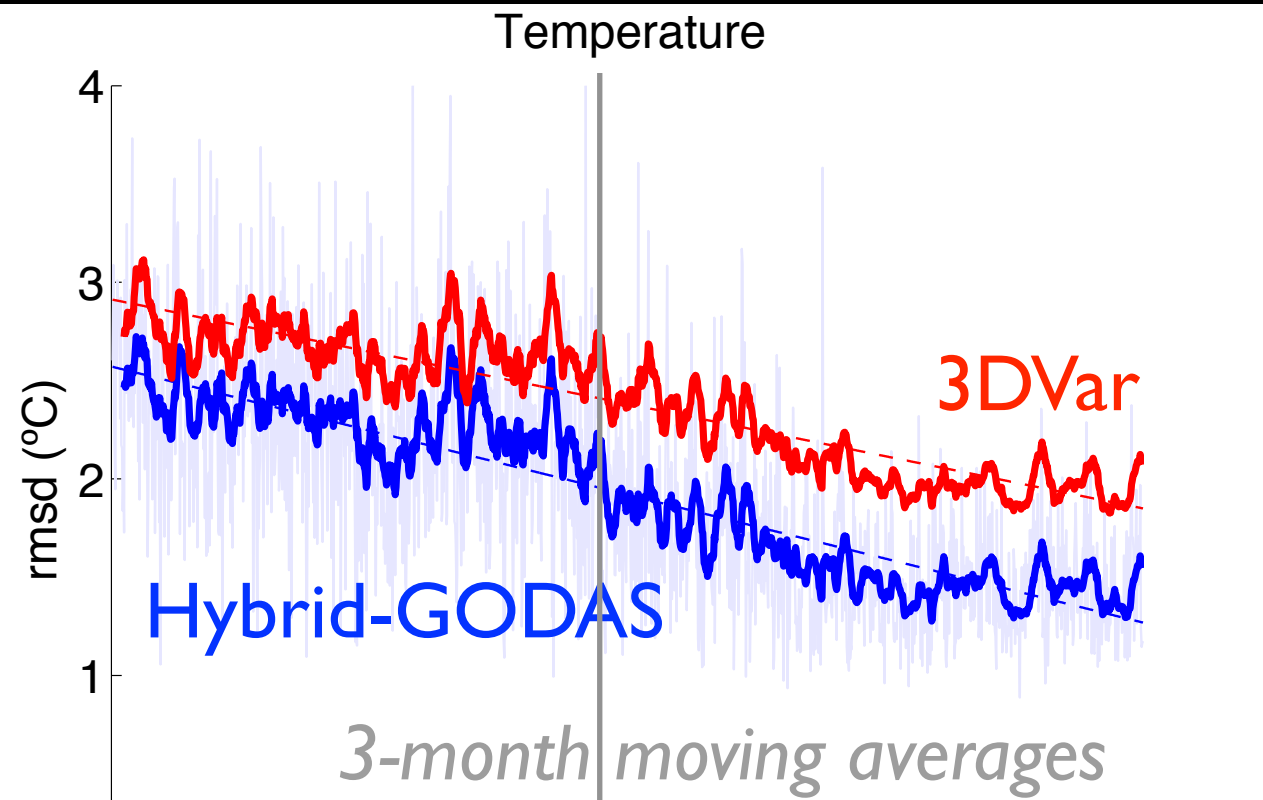
- Reanalysis  $\neq$  Observed
- Modeler perspective:  
DA initializes the model
- Observationalist perspective:  
DA interpolates the observations
- DA is a careful balance of observations, models, and theory, and experiences the strengths and weaknesses of these inputs.

# OCEAN ASSIMILATION ADVANCEMENTS AT NCEP TO DATE:

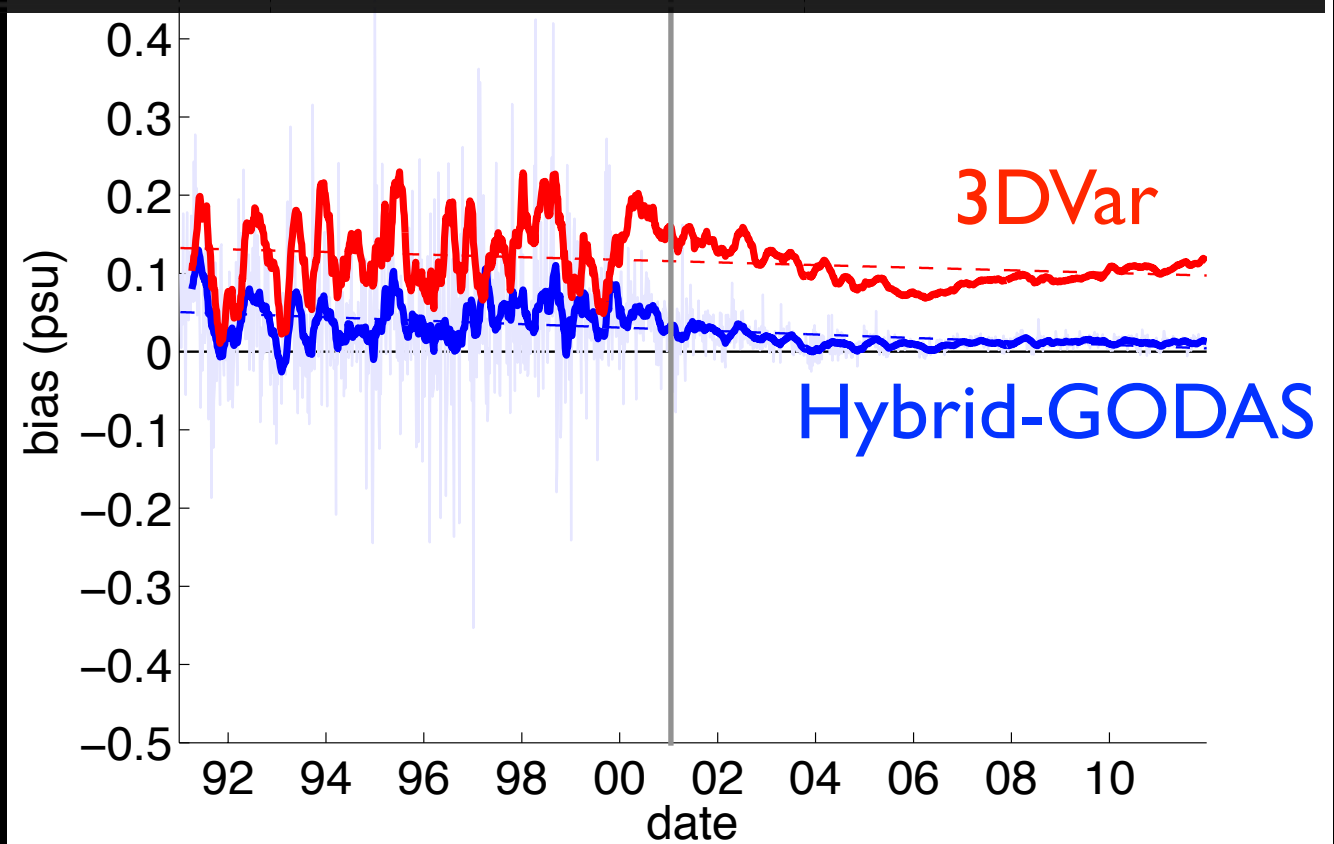
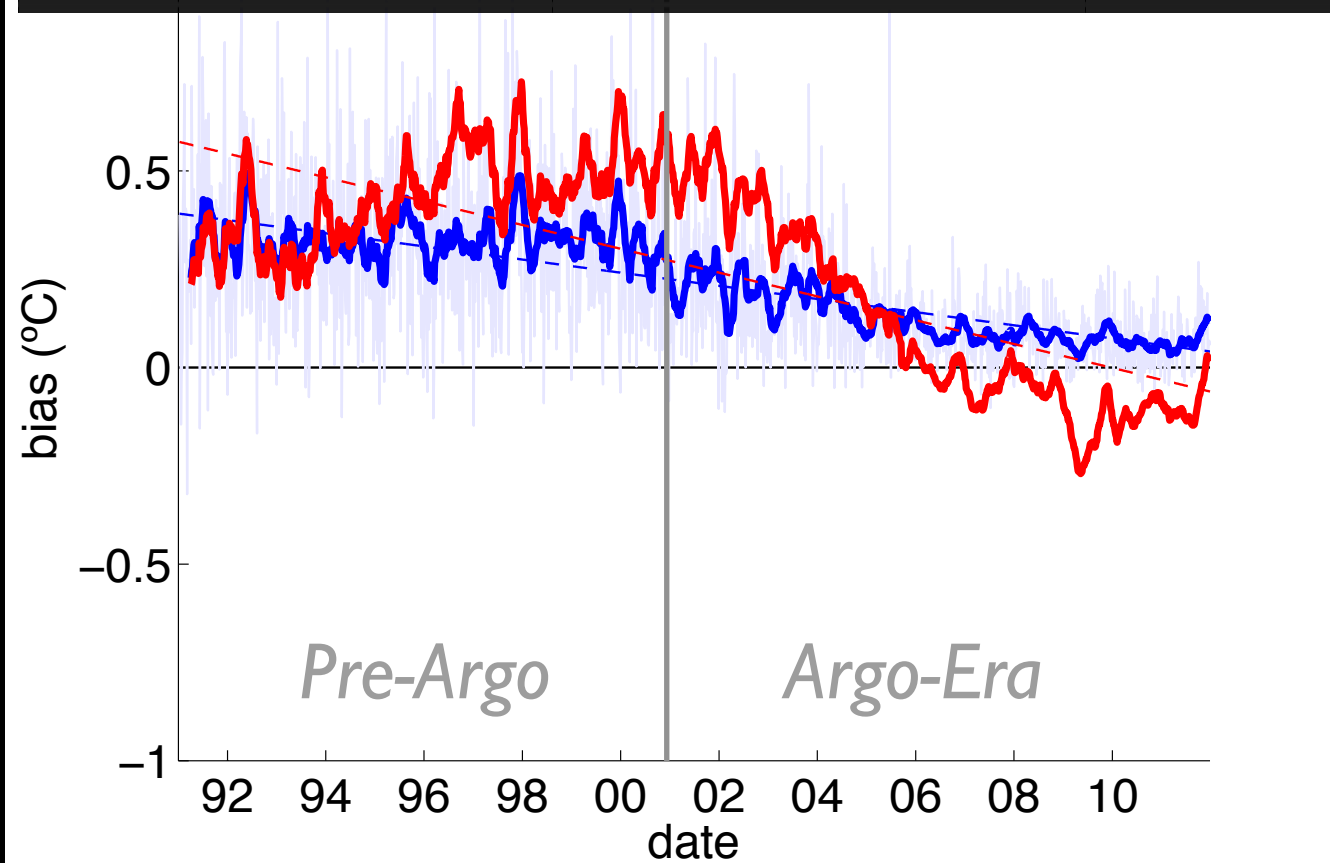
- Oceanic Local Ensemble Transform Kalman Filter (Ocean-LETKF) system (Penny et al., 2013)
- Hybrid-Gain assimilation method (Penny 2014)
- Hybrid 3DVar/LETKF Global Ocean Data Assimilation System (Hybrid-GODAS) at NCEP (Penny et al., 2015)
- 21-Year Hybrid GODAS Reanalysis (Penny et al., in preparation)

Collaborators: D. Behringer, J. Carton, E. Kalnay, T. Miyoshi, K. Ide, G. Chepurin, Y. Xue

# 21-YEAR HYBRID-GODAS REANALYSIS



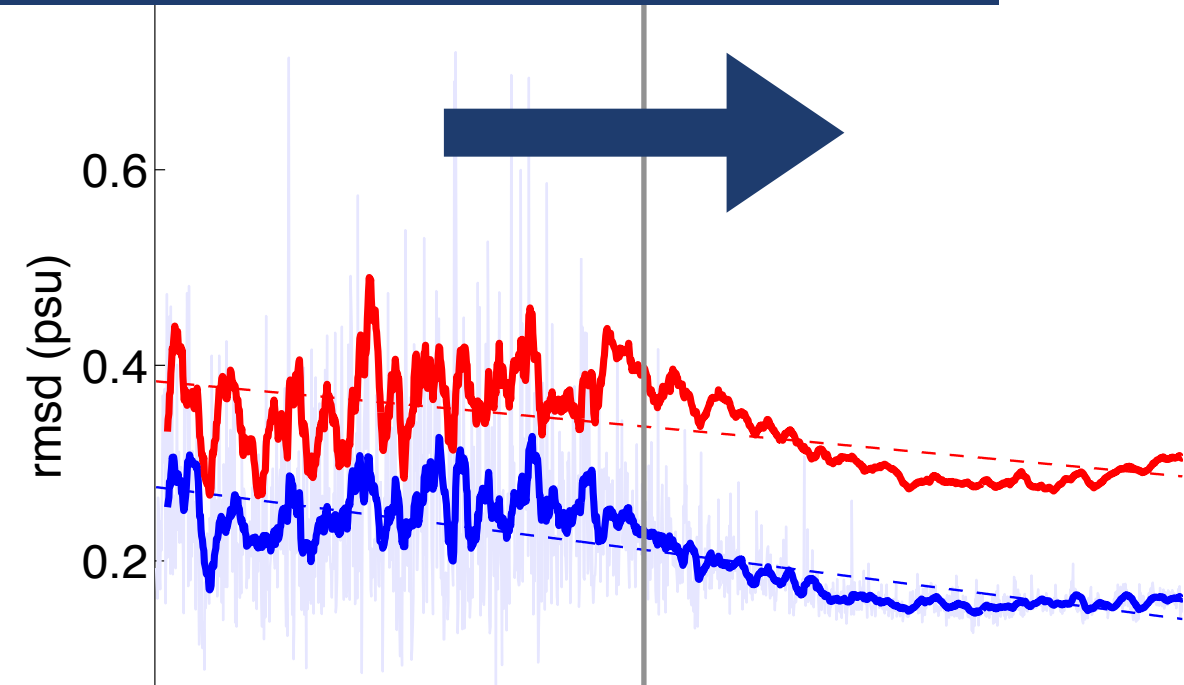
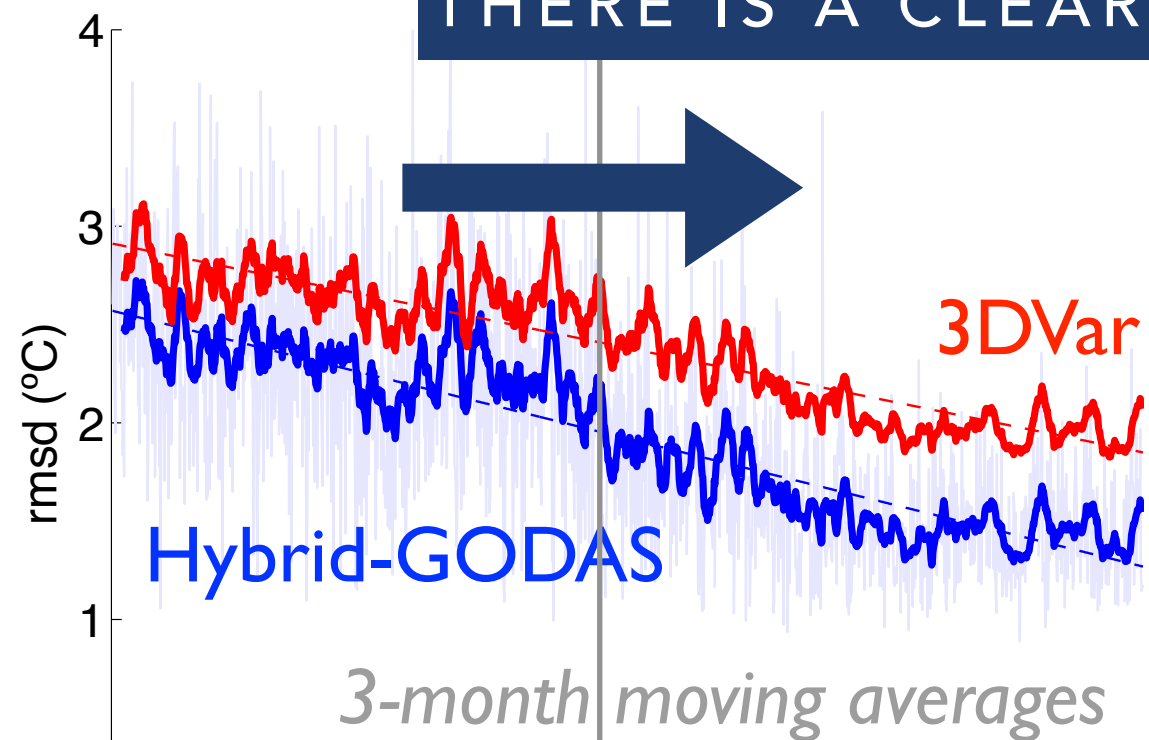
TEMPERATURE AND SALINITY (O-F) RMSD AND BIAS REDUCED  
USING THE HYBRID-GODAS (5-DAY FORECASTS)



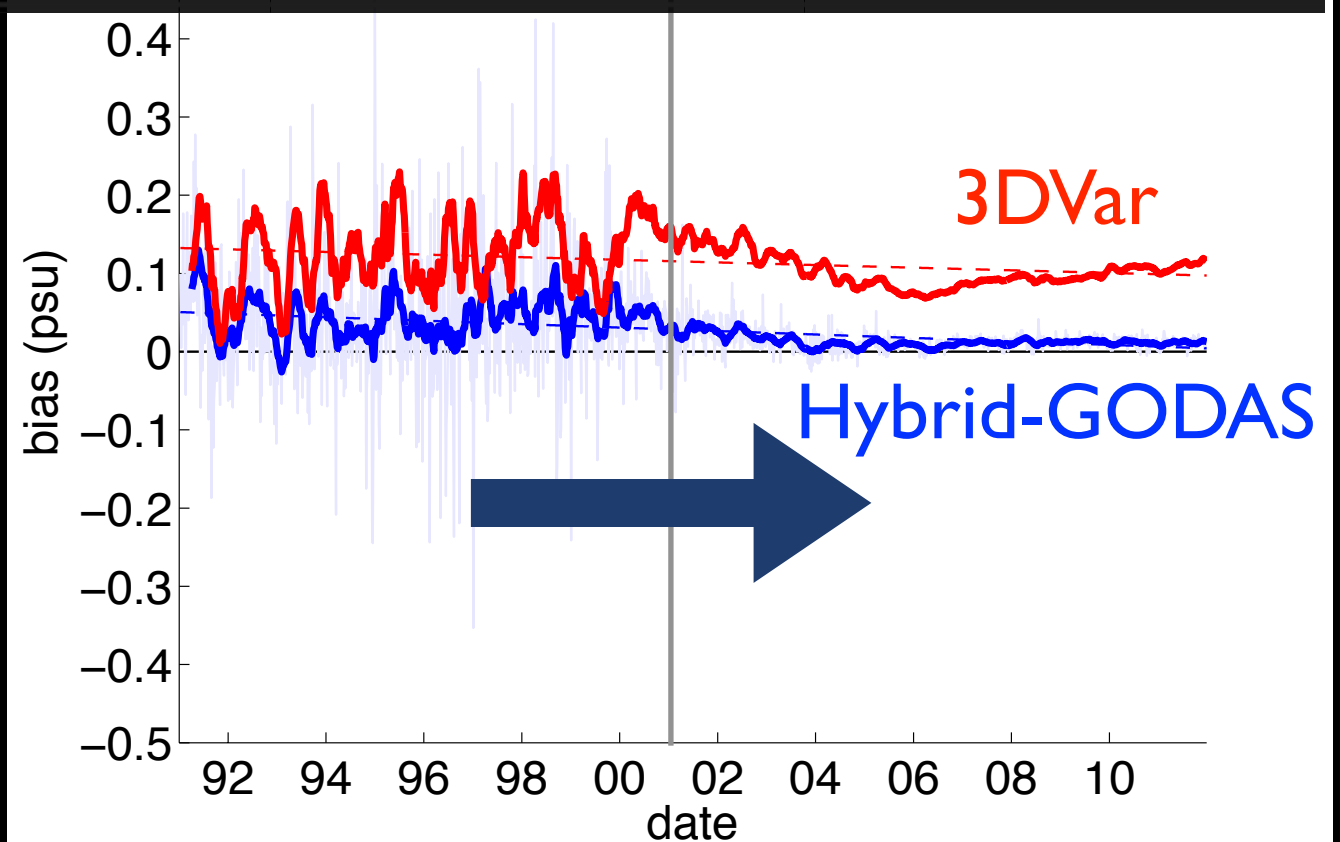
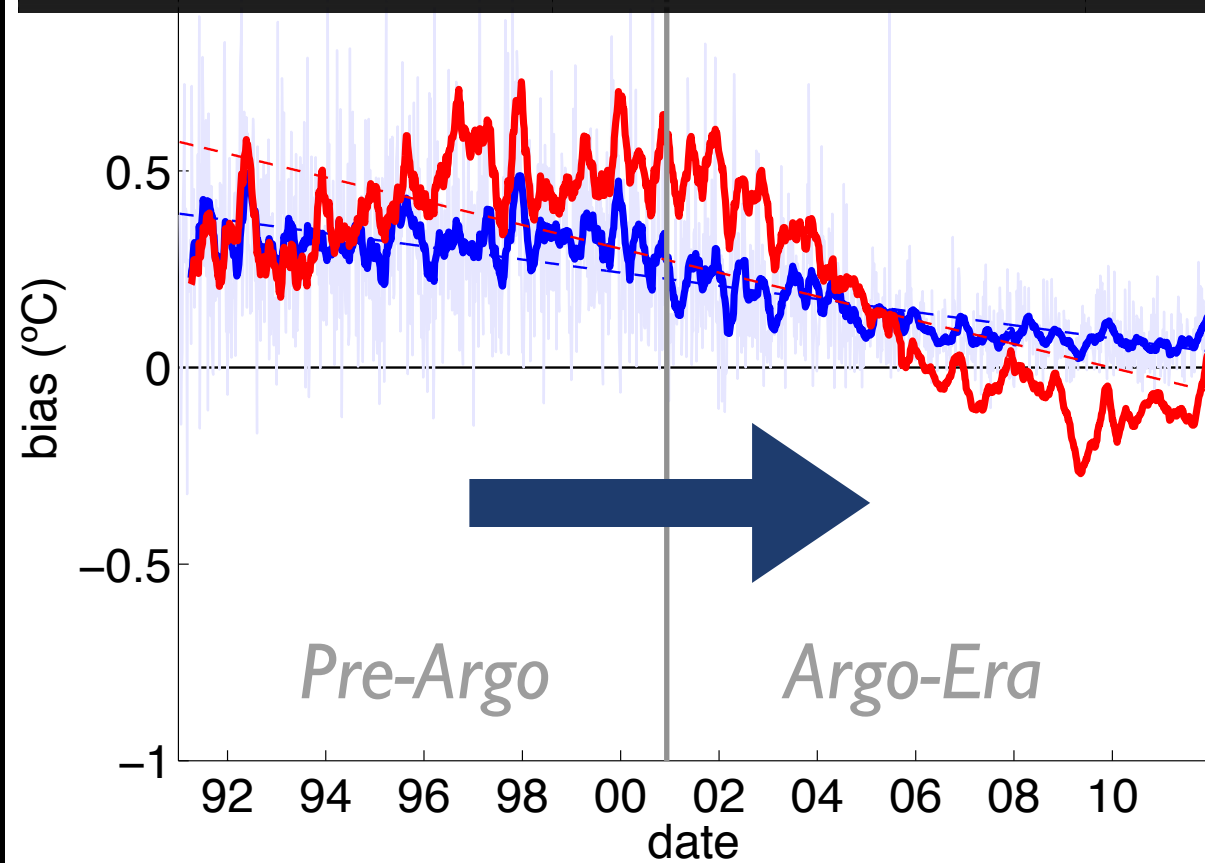


# 21-YEAR HYBRID-GODAS REANALYSIS

THERE IS A CLEAR OBSERVING SYSTEM IMPACT



TEMPERATURE AND SALINITY (O-F) RMSD AND BIAS REDUCED USING THE HYBRID-GODAS (5-DAY FORECASTS)



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# THE EARTH IS ONE SYSTEM

- There are no boundaries, these are fictions.
- There are no ocean parameters that don't matter to atmospheric forecasts (at least on some timescale).
- NCEP is moving toward a fully coupled (via NEMS) Next Generation Global Prediction System (NGGPS) for 'seamless' ensemble-based prediction.
- That means: the same forecast system for weather, subseasonal, and seasonal timescales

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- 
- Eliminate mental boundaries and explore 'nearby' disciplines.
  - Observations must include those of the domain interfaces, and can and should bridge these interfaces.
  - Models must revisit their boundary layer formulations



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# USE ALL DATA

- The ocean is a drastically under-observed domain
- The ocean models can and must 'learn' from the atmosphere, land, aerosol, and sea-ice measurements
- Covariances across domain 'boundaries' are a statistical representation of physical processes

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# 'THINK BIG'

- Stay ahead of future computing trends
- Pay attention to 'Big-Data' technology advancements
- Large amounts of metric data can be stored and mined for important error correlations, teleconnections, etc.
- GOES-R will produce 3.5 TB of data per day\*
- The CERN Data Center processes 1 PB per day. The Meyrin site currently provides 45 PB of data storage on disk.
- The NSA's Bumblehive is capable of storing a yottabyte of data (that's one billion PB)\*\*

\* <http://www.goes-r.gov/mission/top-five.html>

\*\* <http://www.bbc.com/news/business-26383058>



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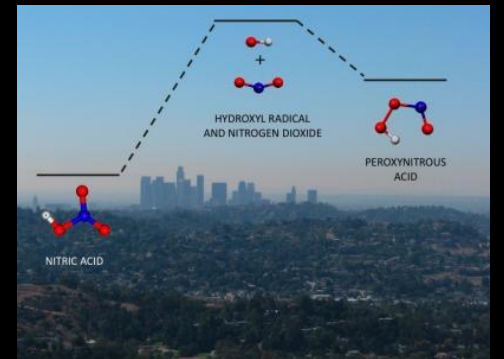
# ENSEMBLE PREDICTION IS BECOMING THE STANDARD AT NCEP

- NCEP weather forecasts (today)
- Hybrid-GODAS ocean prediction (near future)
- Next Generation Global Prediction System (NGGPS) and Climate Forecast System (CFSv3) (future)
- That means uncertainty in surface fluxes (heat, momentum, freshwater), ocean parameters (SST, SSS, SLA), thermocline depth, and more, can be represented and propagated until sufficiently constrained by observations.



# CLIMATE FORECAST SYSTEM V3

Atmosphere



Aerosol

Land



Wave



Ocean



Sea Ice

Current CFSv3  
components



# WEAKLY COUPLED DATA ASSIMILATION

Atmosphere

Atmos DA



Aerosol

Land

Land DA

Wave

Wave DA

Sea Ice DA

Sea Ice

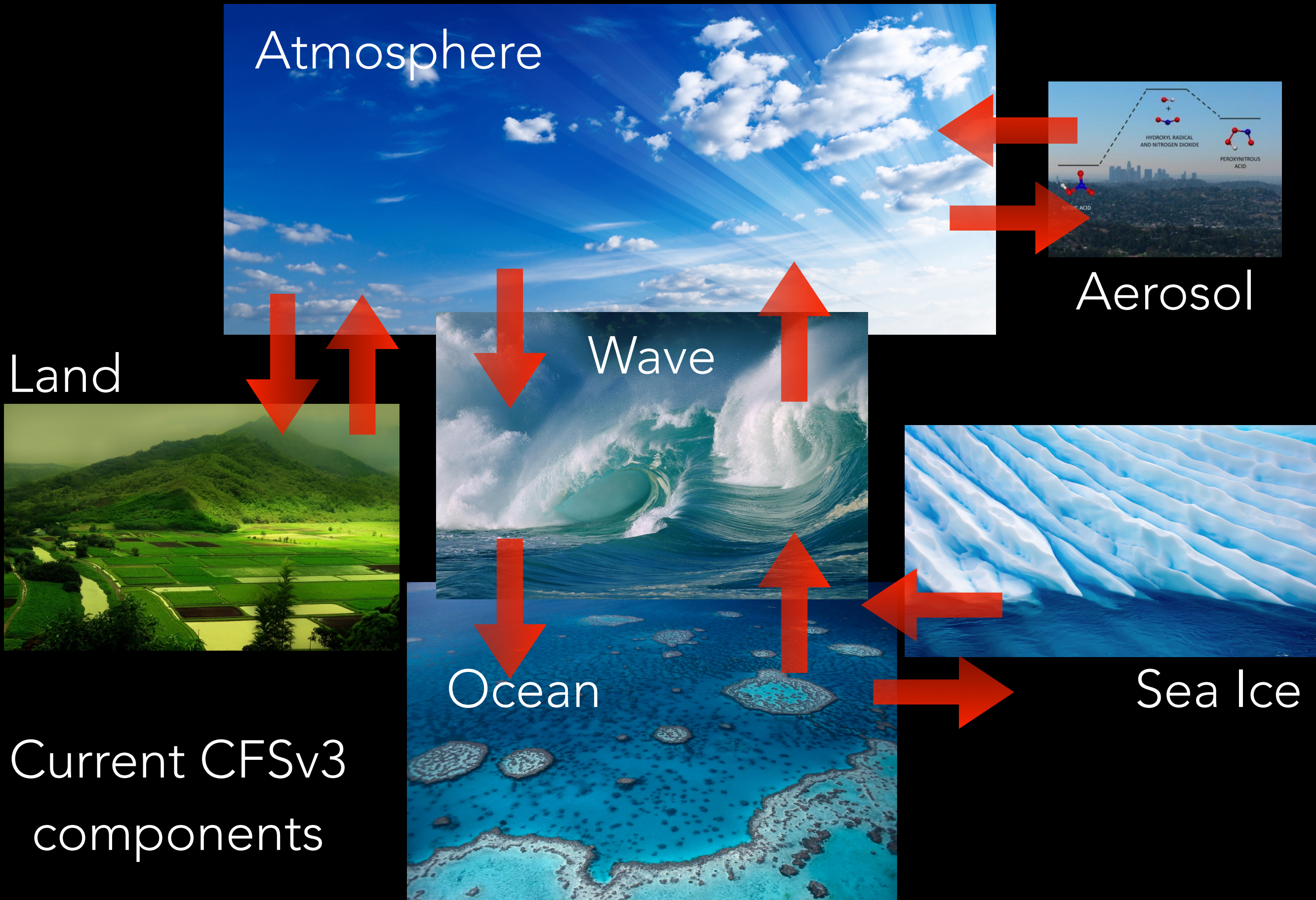
Current CFSv3  
components

Ocean

Ocean DA



# COUPLING ONLY ON FORECAST

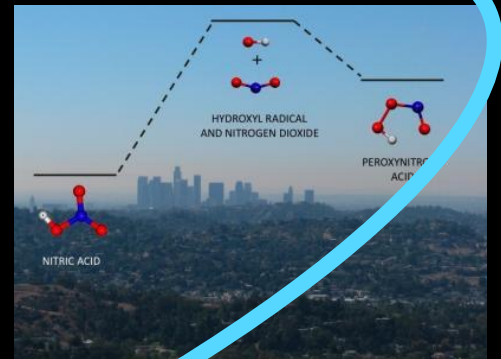




# STRONGLY COUPLED DATA ASSIMILATION

Atmosphere

EACH DOMAIN IS  
INFLUENCED BY  
OBSERVATION INNOVATIONS  
FROM ALL OTHER DOMAINS



Aerosol

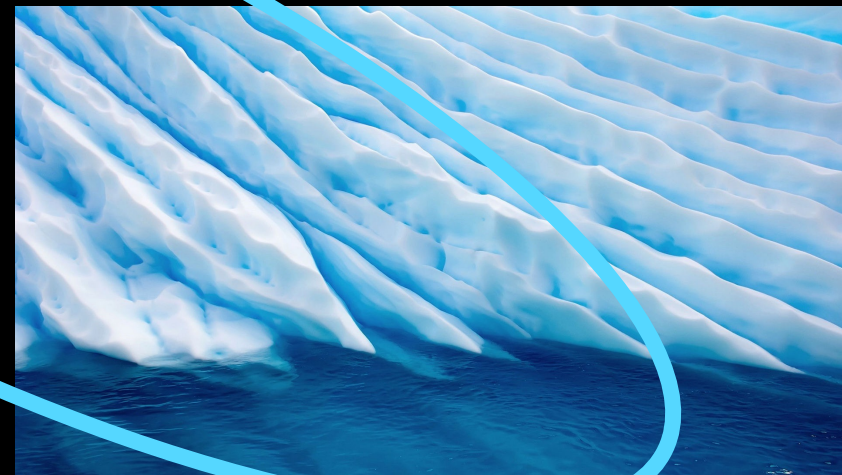
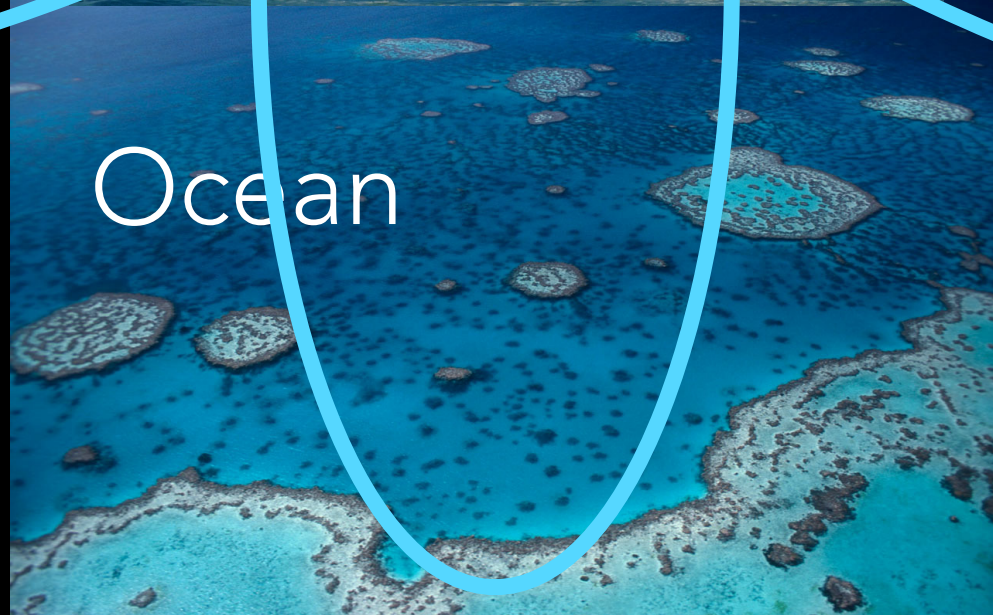
Land



Wave  
DA



Ocean



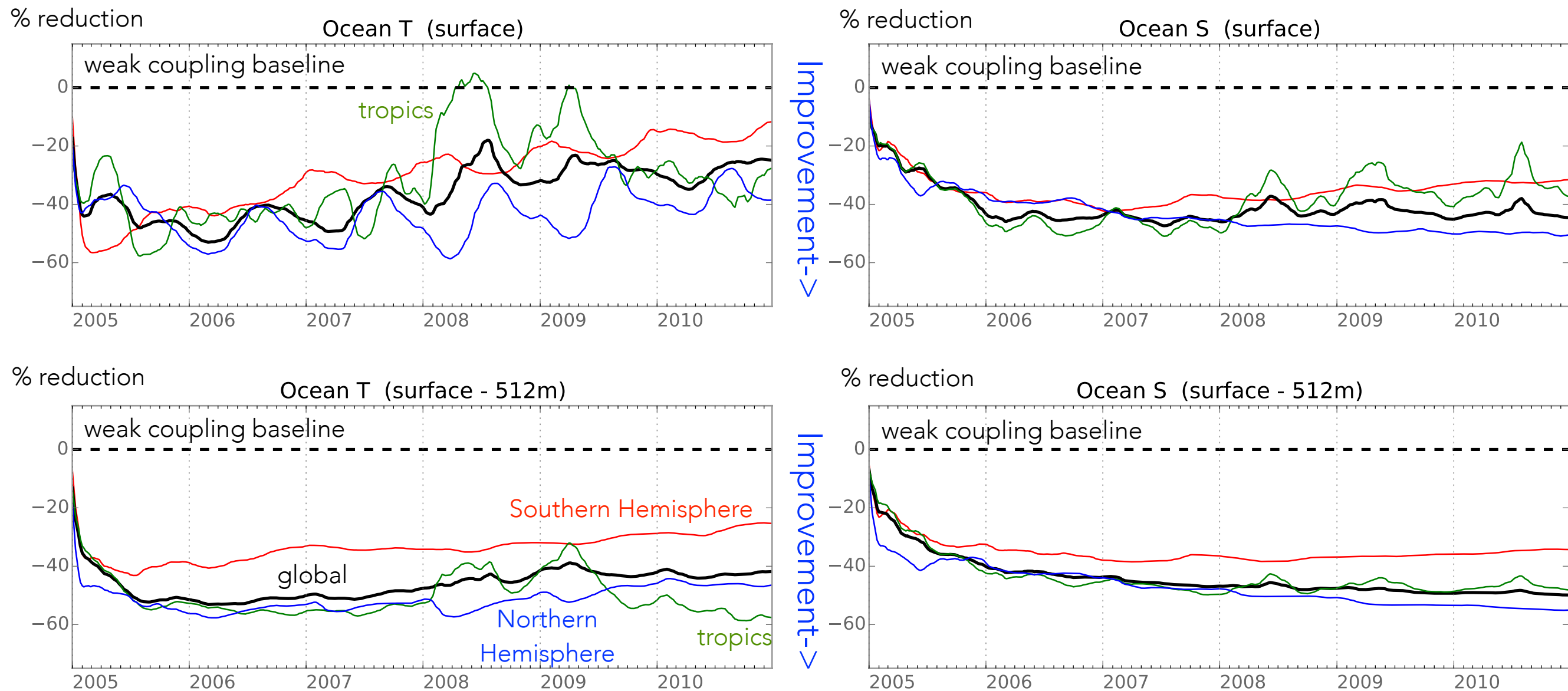
Sea Ice

Current CFSv3  
components



# STRONGLY COUPLED DA REDUCES ERRORS (vs. weakly coupled DA)

For example, assimilating only  
atmospheric observations leads to  
significant improvements in ocean:



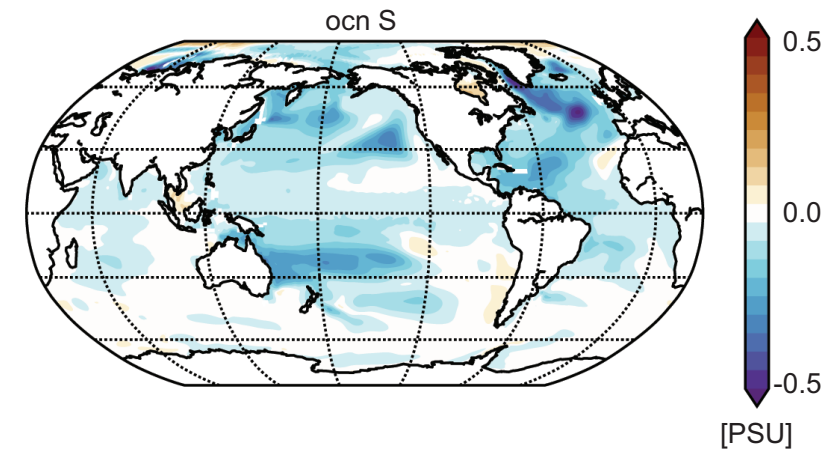
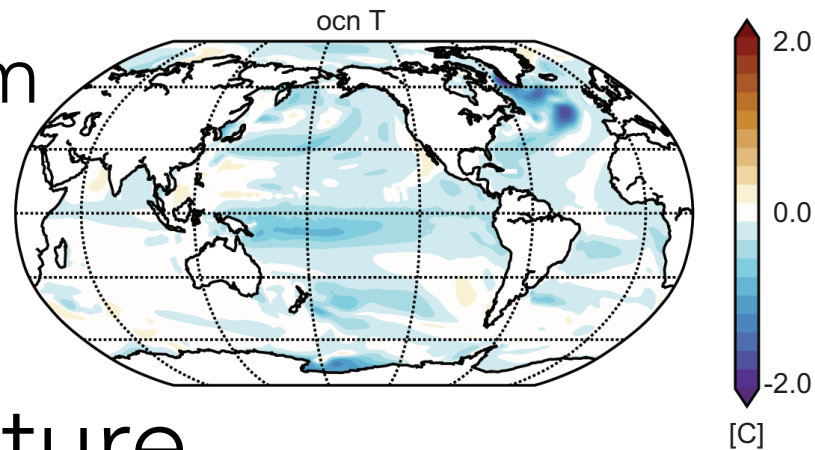
(Note: Observing System Simulation Experiments (OSSEs), not real data)  
Experiments by Travis Sluka with coupled SPEEDY/NEMO, UMD PhD Student



# STRONGLY COUPLED DA REDUCES ERRORS (vs. weakly coupled DA)

Again, assimilating only atmospheric observations:

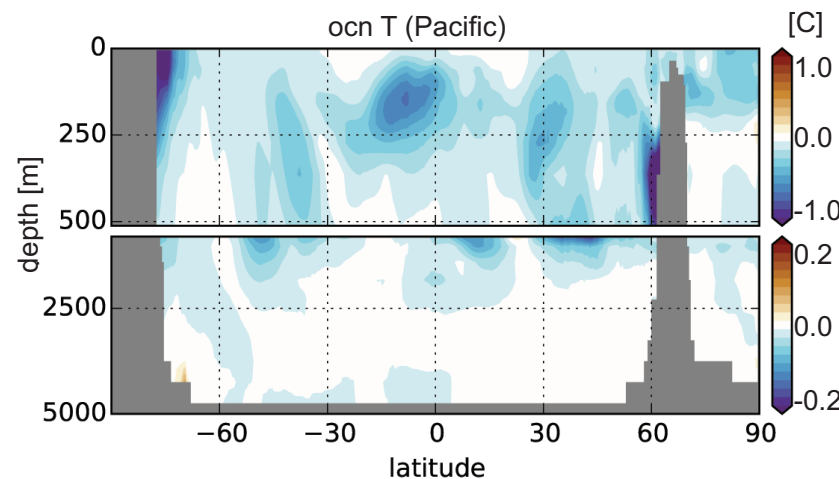
Upper 500m



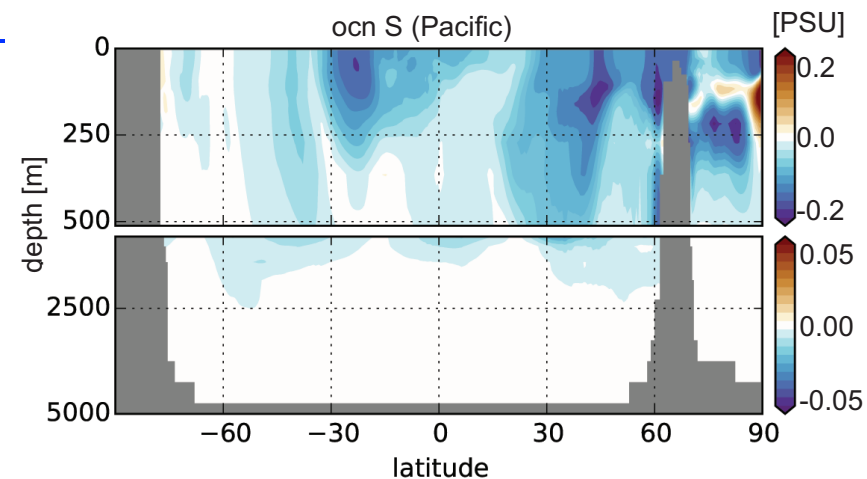
Temperature

Salinity

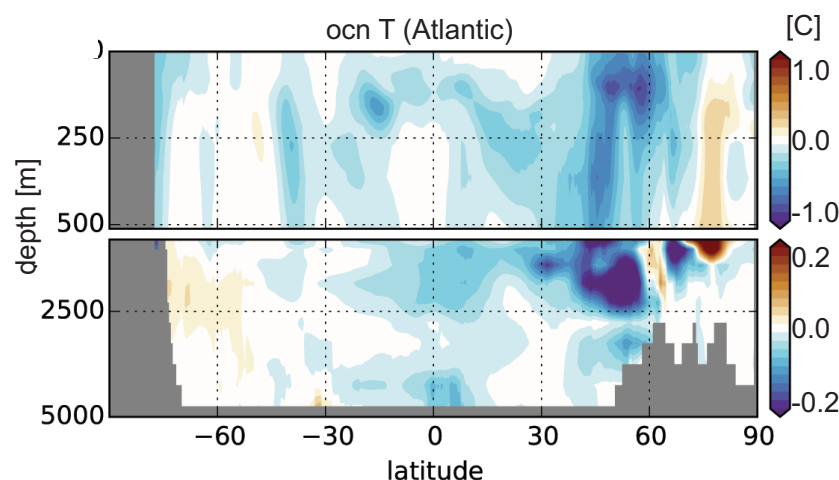
Pacific



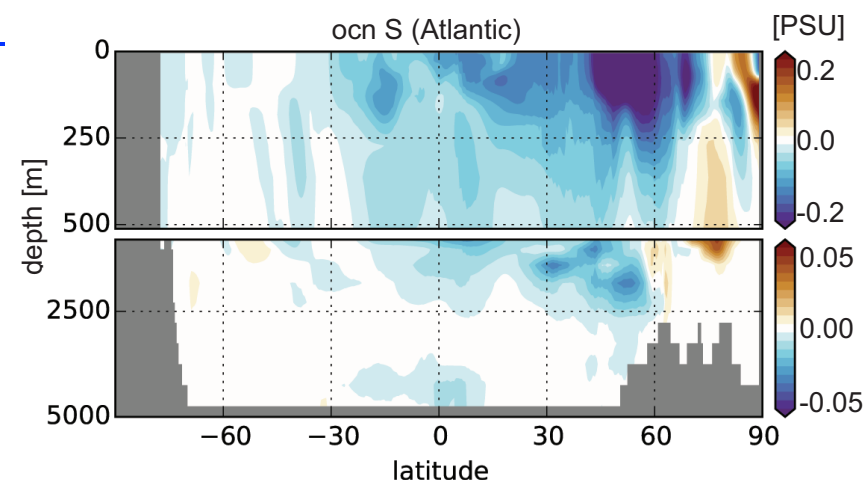
Improvement->



Atlantic



Improvement->



Again, these are OSSEs. Real-data experiments with the CFSv2 will come next.

# OBSERVING / MODELING GAPS

- All new instruments should have a forward model constructed (mapping a simulated earth system state to a simulated observational value)
- Comparisons between models and new observed quantities can be made more more easily
- These data can more readily be included into operational data assimilation

# REALTIME DATA METRICS

- The CFSv3, for example, will produce a set of *observation-space* metrics that will be valuable for model and forecast evaluation
- For example, the following may imply:  
$$\|O-F\|_i \gg 0 \text{ and } \|A-F\|_i \ll 1 \quad \Rightarrow \text{poor model uncertainty}$$
$$\|O-A\|_{i-1} \ll 1 \text{ and } \|O-F\|_i \gg 0 \quad \Rightarrow \text{model off true attractor or obs error is large}$$

(let  $i$  = timestep)

$$\text{EnsStDev}(\{O-F\}_i) \ll \|O-F\|_i \quad \Rightarrow \text{not enough dynamical instability in model}$$

# NEED DEEP OCEAN MEASUREMENTS

- The deep ocean is invisible to most operational DA implementations: neither resolved by observations or models.
- Need more, e.g.
  - Expanded Deep Argo (perhaps varying drift depths)
  - North Atlantic deep convection and overflow regions
  - Deep equatorial currents

*(DEEPSEA CHALLENGER)*



# NEED NEAR SURFACE MEASUREMENTS

- To best resolve the diurnal cycle:
- Need more, e.g.
  - High spatial and temporal resolution upper ocean measurements
  - Especially in the tropics
  - Evaluating surface ocean, atmosphere, and fluxes



# RESEARCH NEEDS FOR IMPROVED METRICS

- Greater attention is needed toward estimating the instantaneous statistical modes
- Error in the instantaneous 1st moment (ensemble mean) creates the short-timescale model biases that compound to form long-term model drift
- Error in the instantaneous second moment (ensemble variance) leads to diverging attractors and thus to poor prediction skill



# MODELING GAPS: TO SUPPORT ENSEMBLES

Last Slide!

- Mixed-resolution ensembles are inevitable. This requires statistics of the low-res models to match the statistics of the high-res model ensembles.  
(e.g. Parameterizations determining uncertainty at low resolution must correspond to uncertainties at higher resolutions. e.g. stochastic parameterizations.)
- Automated 'model output statistics' act as a transformation from the model attractor to the true attractor.  
(improvements to the hindcast/reforecast approach needed)

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