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# UCSC California Current System Data Assimilation Activities

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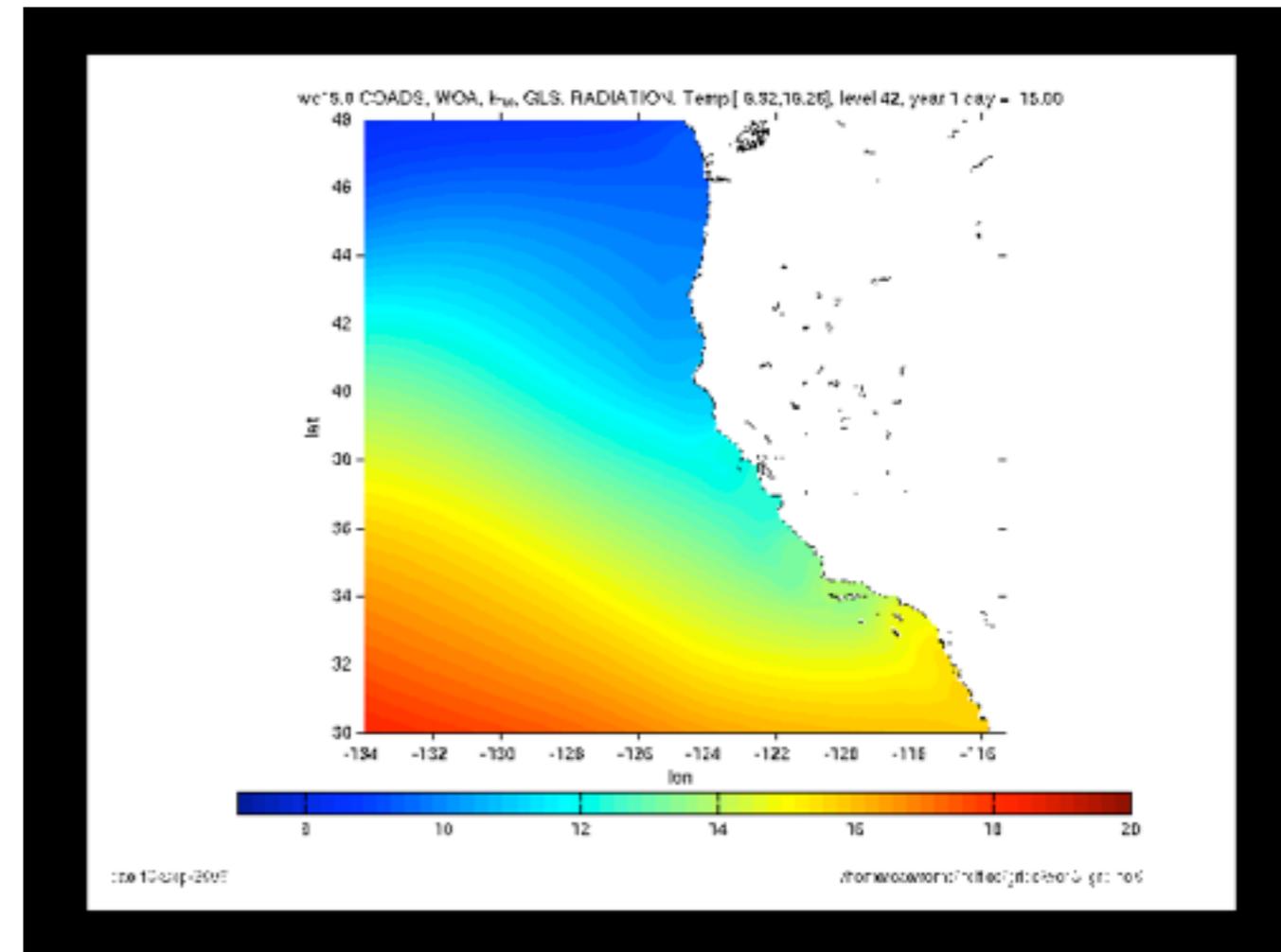
R. Milliff (CORA)  
P. Smith (UCSC)  
B. Powell (UH)  
J. Doyle (NRL)





# UCSC California Current System model

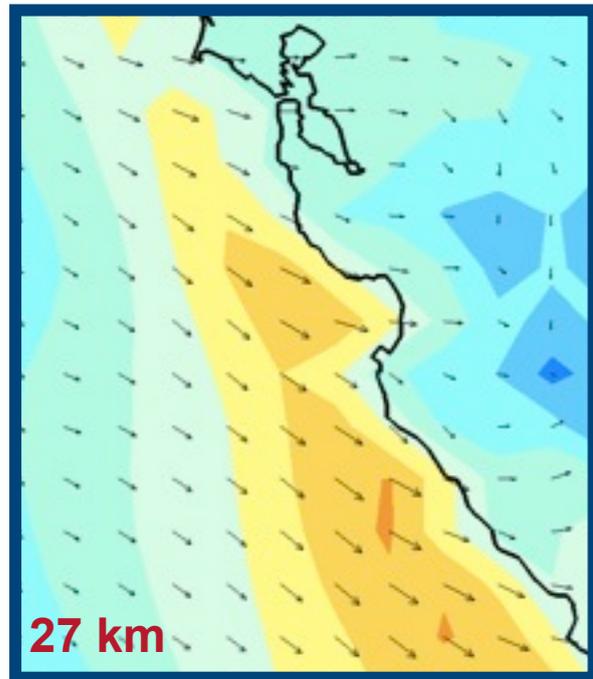
- Configuration
  - Regional Ocean Modeling System (ROMS)
  - Surface Forcing: COAMPS (NRL-Monterey)
  - Outer Boundary Conditions: ECCO-GODAE (MIT/JPL), SODA, Climatology
- Activities
  - Forward model
  - Data Assimilation
  - Ecosystem/Biogeochemistry
  - Floats/Larval Dispersal
- Various ROMS Grids:
  - $1/3^\circ$ ,  $1/10^\circ$ ,  $1/30^\circ$ ,  $1/90^\circ$ ,  $1/270^\circ$





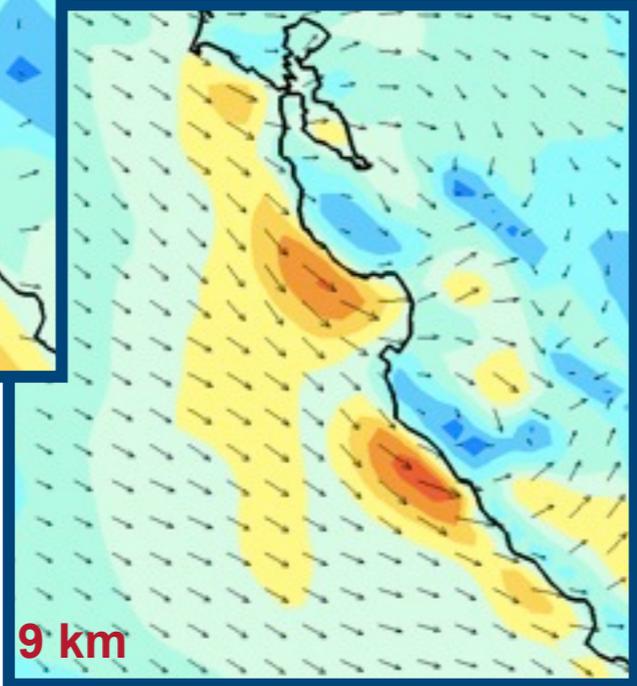
# COAMPS Real-Time Forecasts

## Products for Atmospheric/Oceanic Forecasting



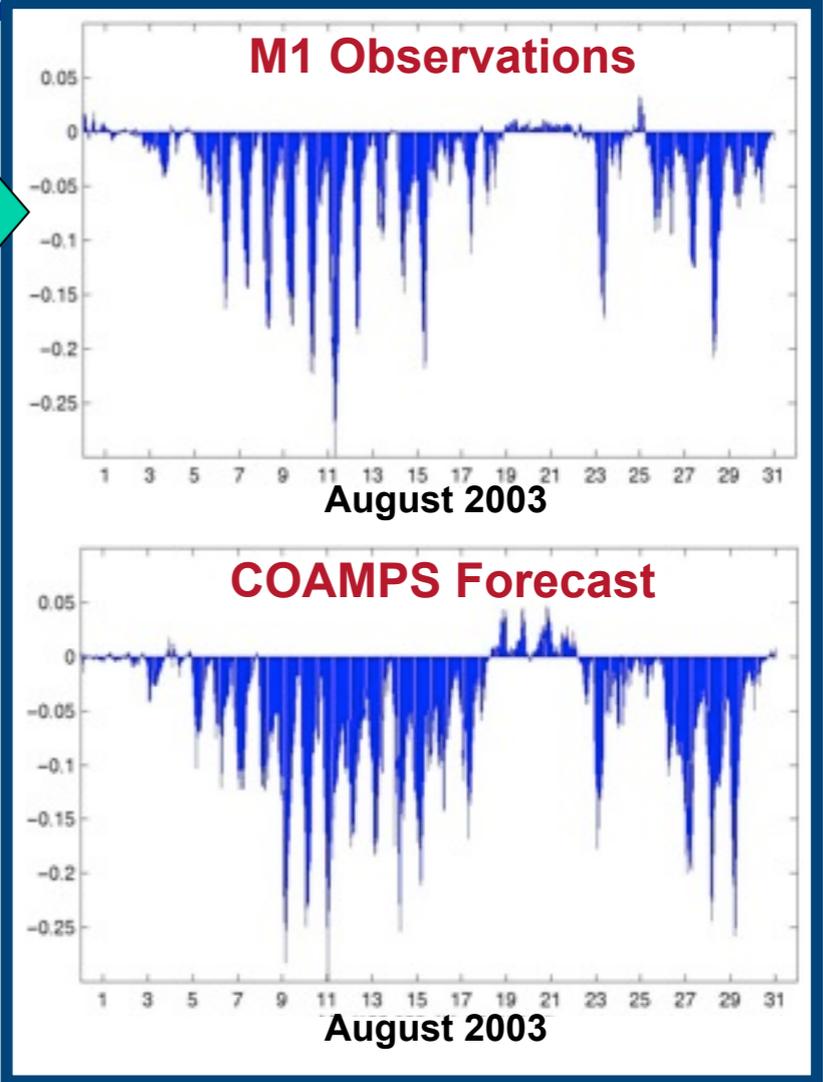
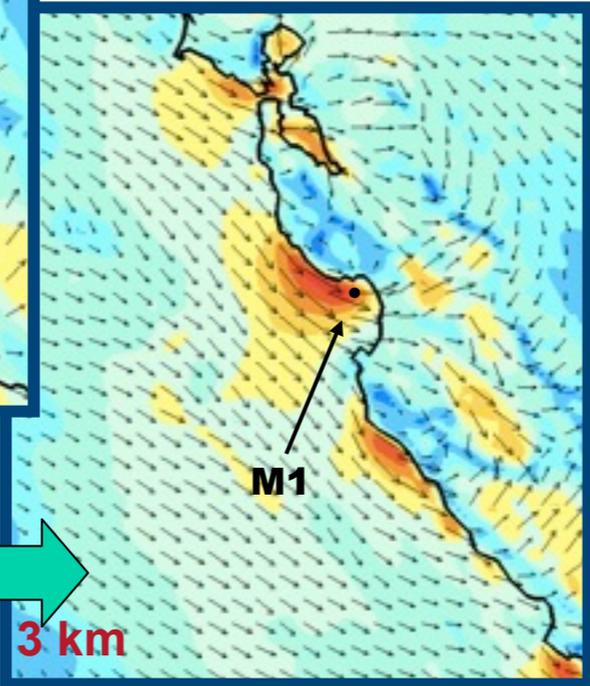
**COAMPS 3 km Forecast Surface Stress Compares Favorably to Observed Stress at M1 Buoy**

Graphs on right show observed (upper) and COAMPS (lower) Surface Stress

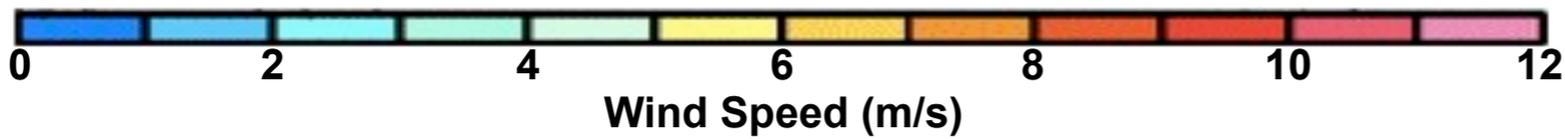


The leftmost 3 boxes show COAMPS wind speed (color) and direction (arrows) for 27, 9, and 3 km grids

**Representation of Coastal Jets, Wind Stress Curl, and Coastal Shear Zone Improved using Higher Resolution Grid**



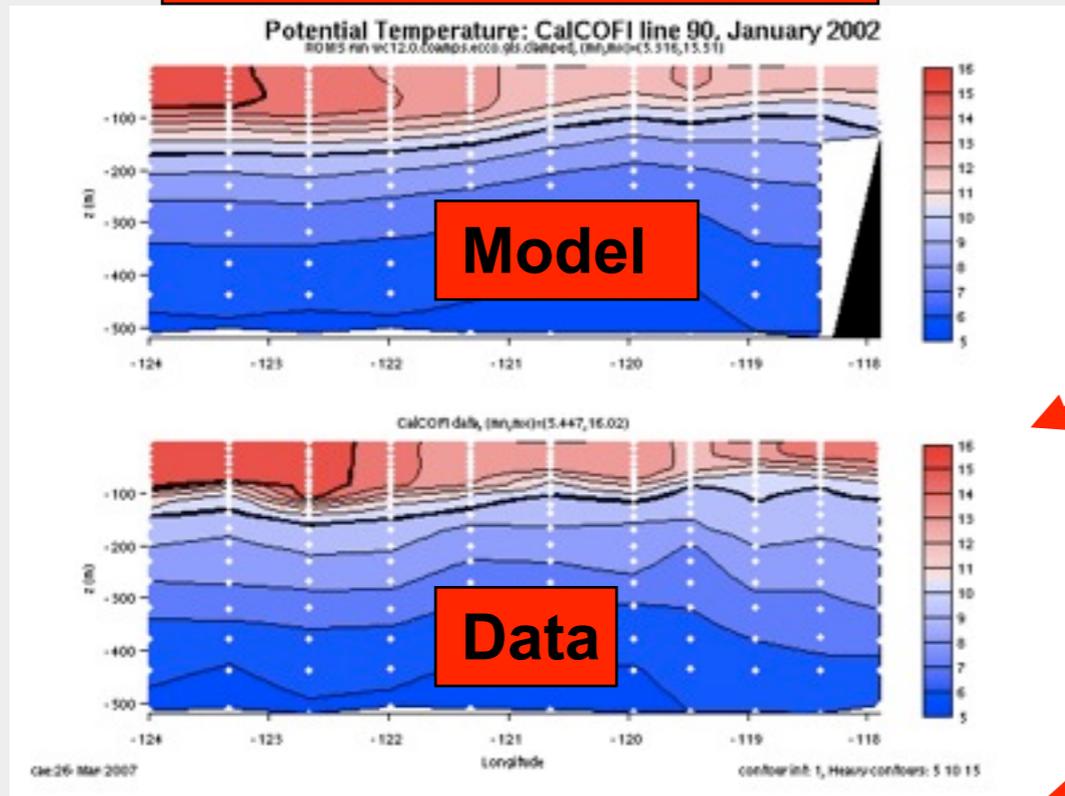
*Improved representation of the wind stress curl using the 3 km grid at the coast should drive improved representation of wind-driven processes (e.g., upwelling)*



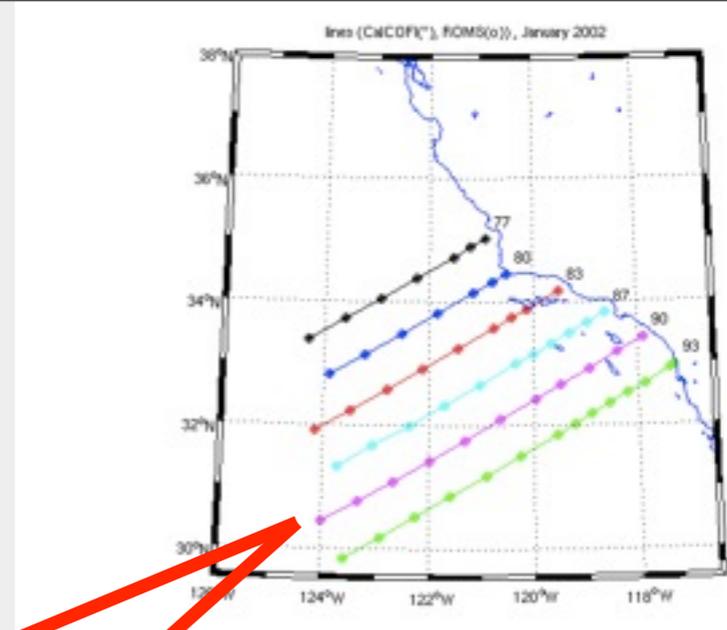
J. Doyle (NRL)

# Forward Model (10 km grid) Comparisons to CalCOFI

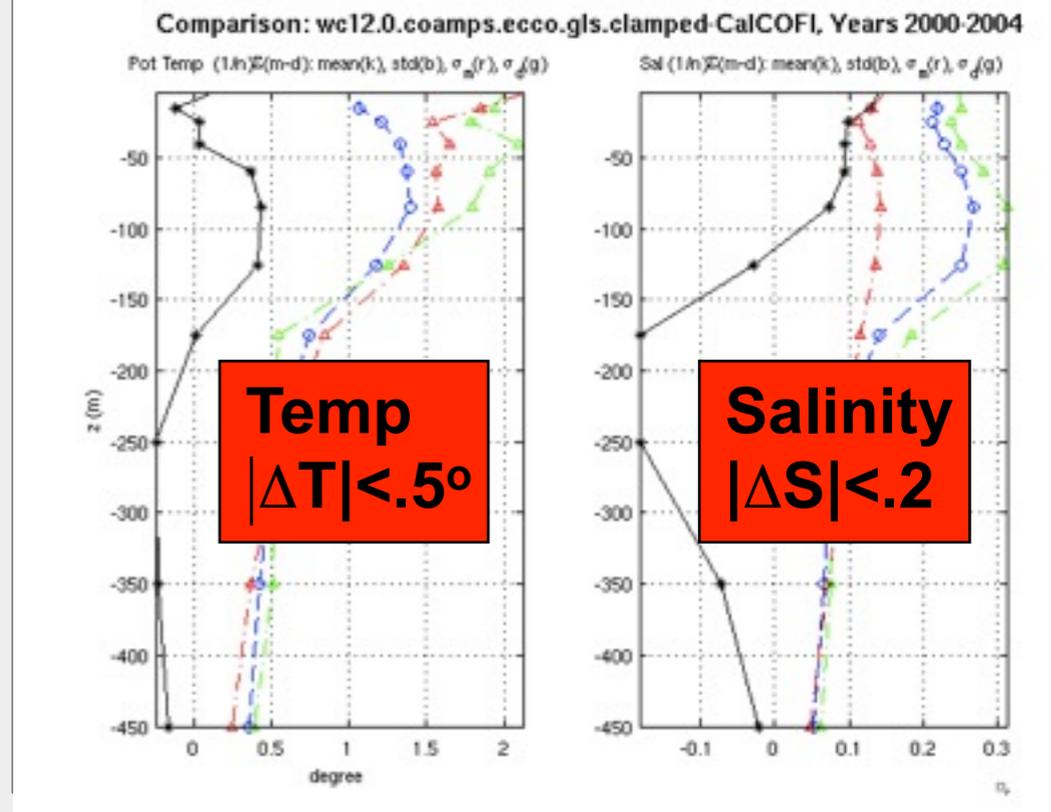
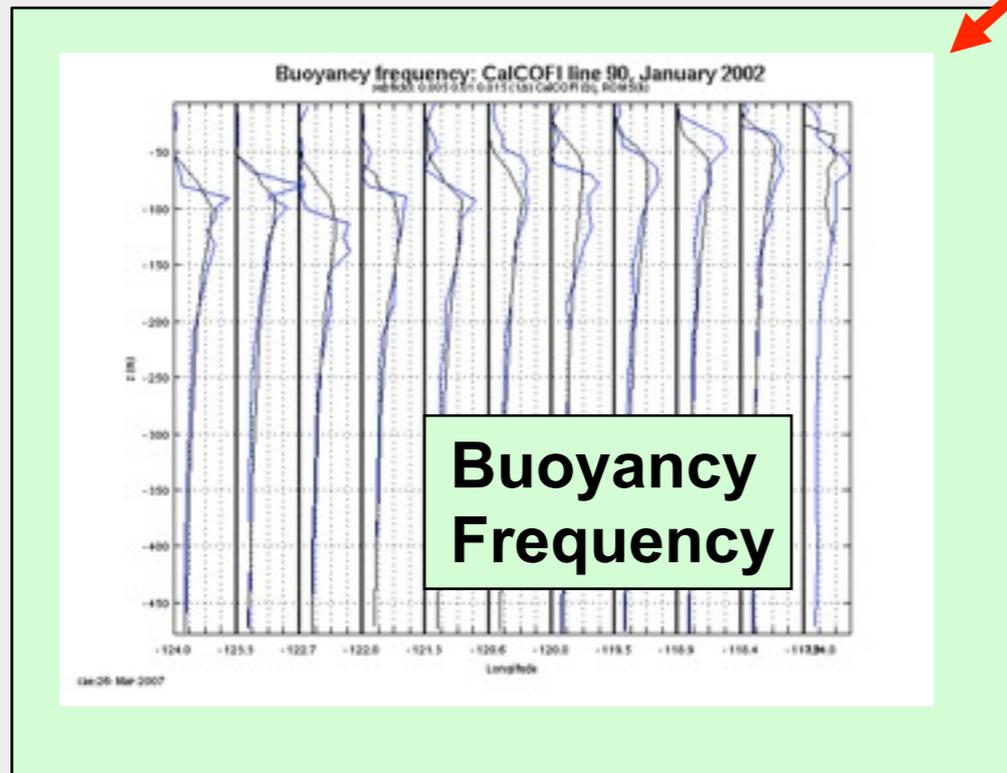
## Potential Temperature



Line 90



model-data (2000-2004)





# UCSC Ocean Modeling

## 4D-VAR Data Assimilation

**CalCOFI & GLOBEC**

**SST & SSH**

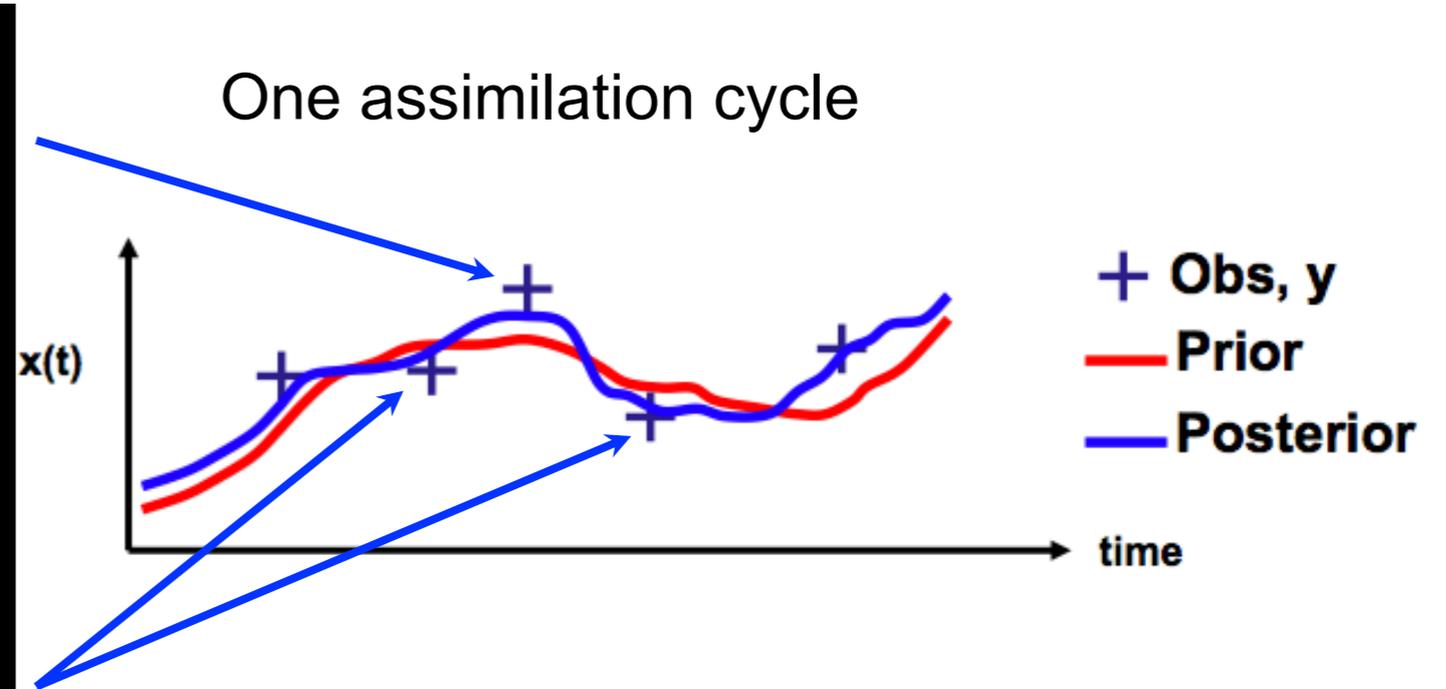
**TOPP Elephant Seals**

Photo Dan Costa

Data from Dan Costa

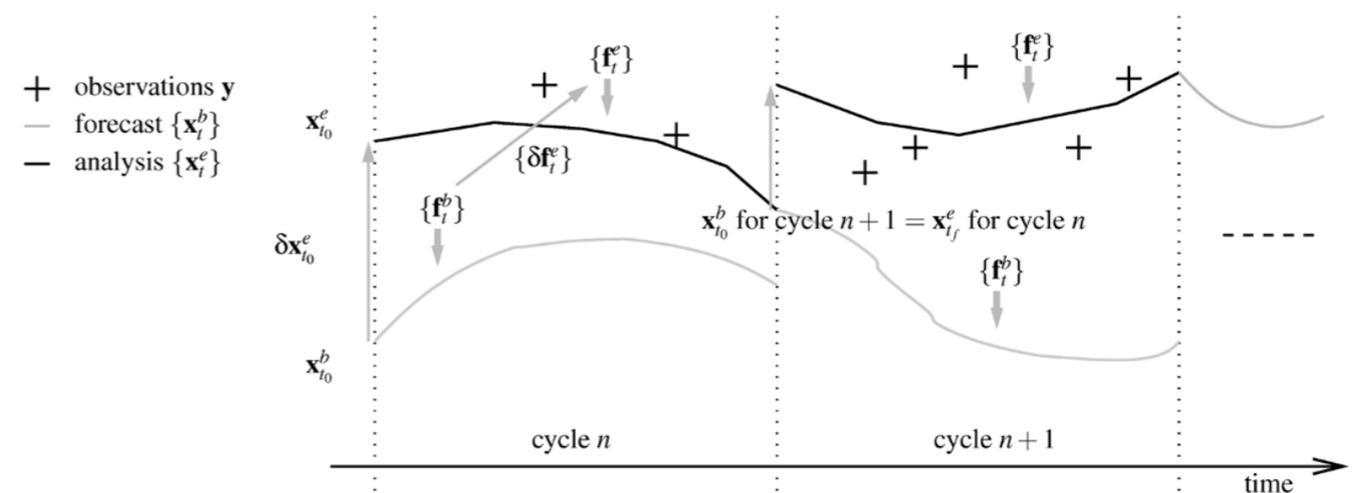
**Argo**

**Ingleby and Huddleston (2007)**



- **Ocean Dynamics** connect temporally separated observations
- Up to 14d assimilation cycles
- Controls (ocean initial conditions, surface forcing, boundary conditions)

### Sequential assimilation cycles

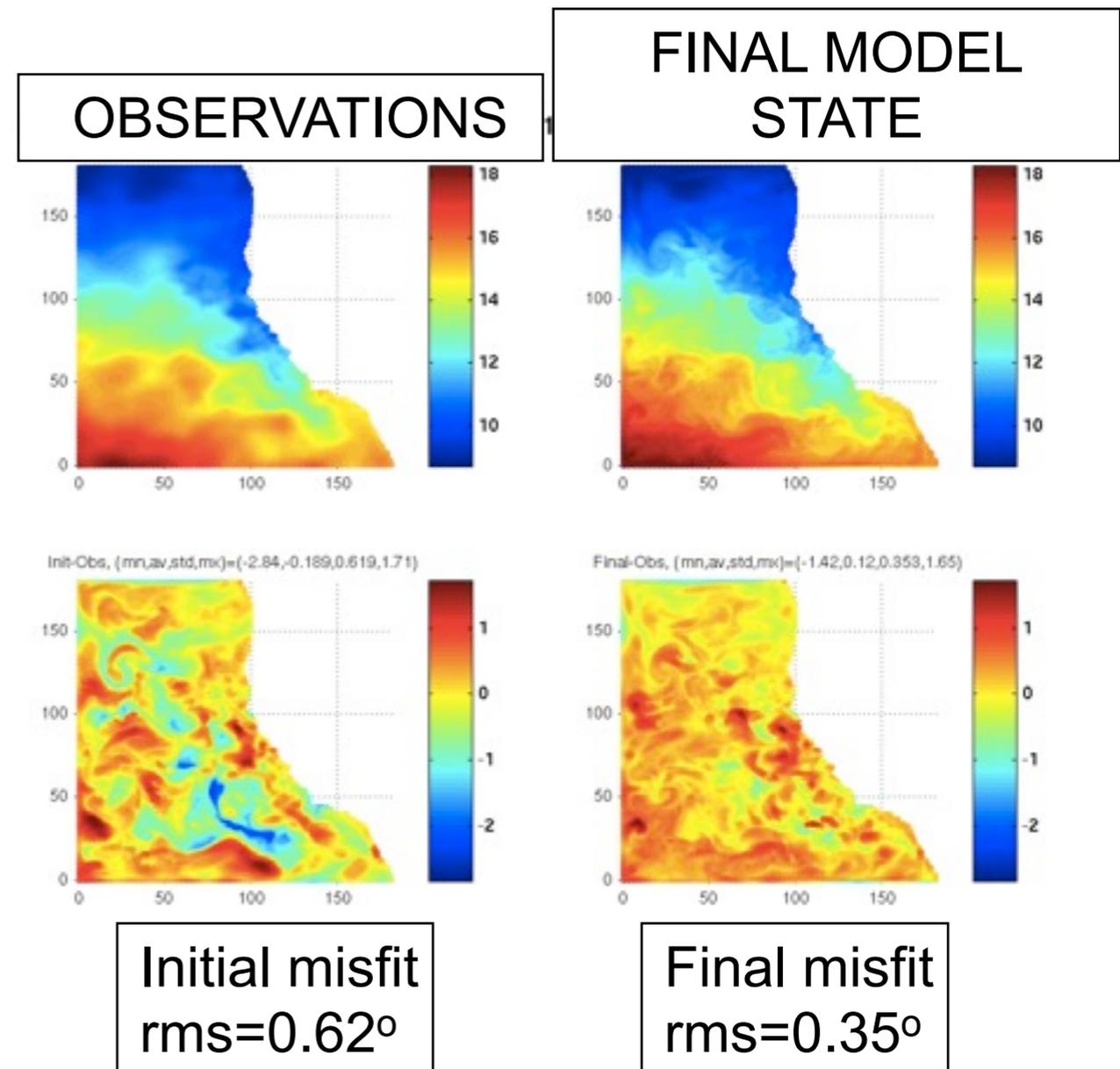


Broquet et al. 2009a,b, 2010  
Moore et al. (2011a,b)



# Strong Constraint, I4DVAR example

- Minimizes cost function that is weighted sum of squared model-data misfit and squared deviations from background model state.
- Model error variances from nonlinear model
- Univariate background error covariances (Weaver and Courtier, 2001)
- 30km horizontal & 50m vertical length scales
- COAMPS SST (now using OSTIA)
- AVISO Merged SSH
- 7-14 Day Assimilation Window
- Initial Conditions adjusted only

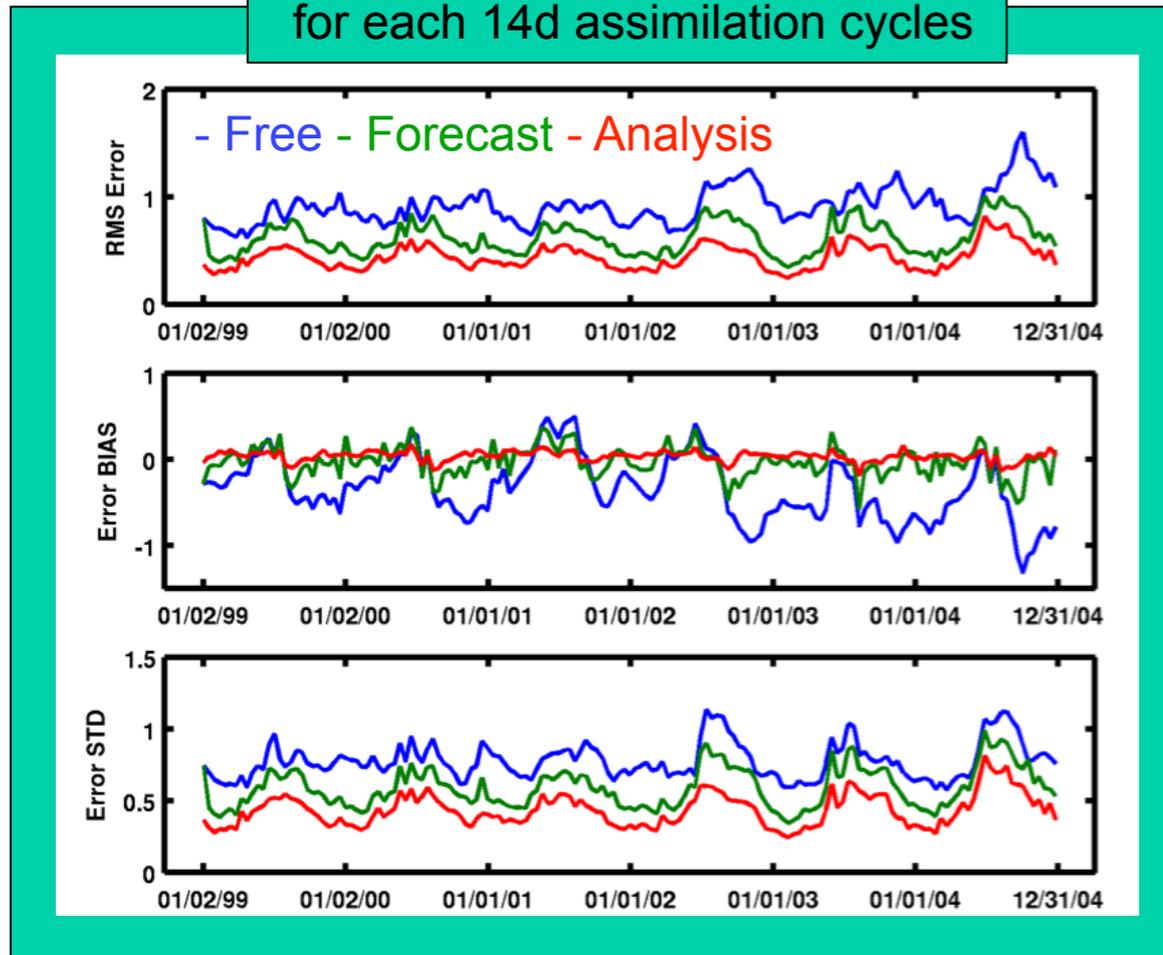




# Strong Constraint I4DVAR Assimilation Performance, 10km grid

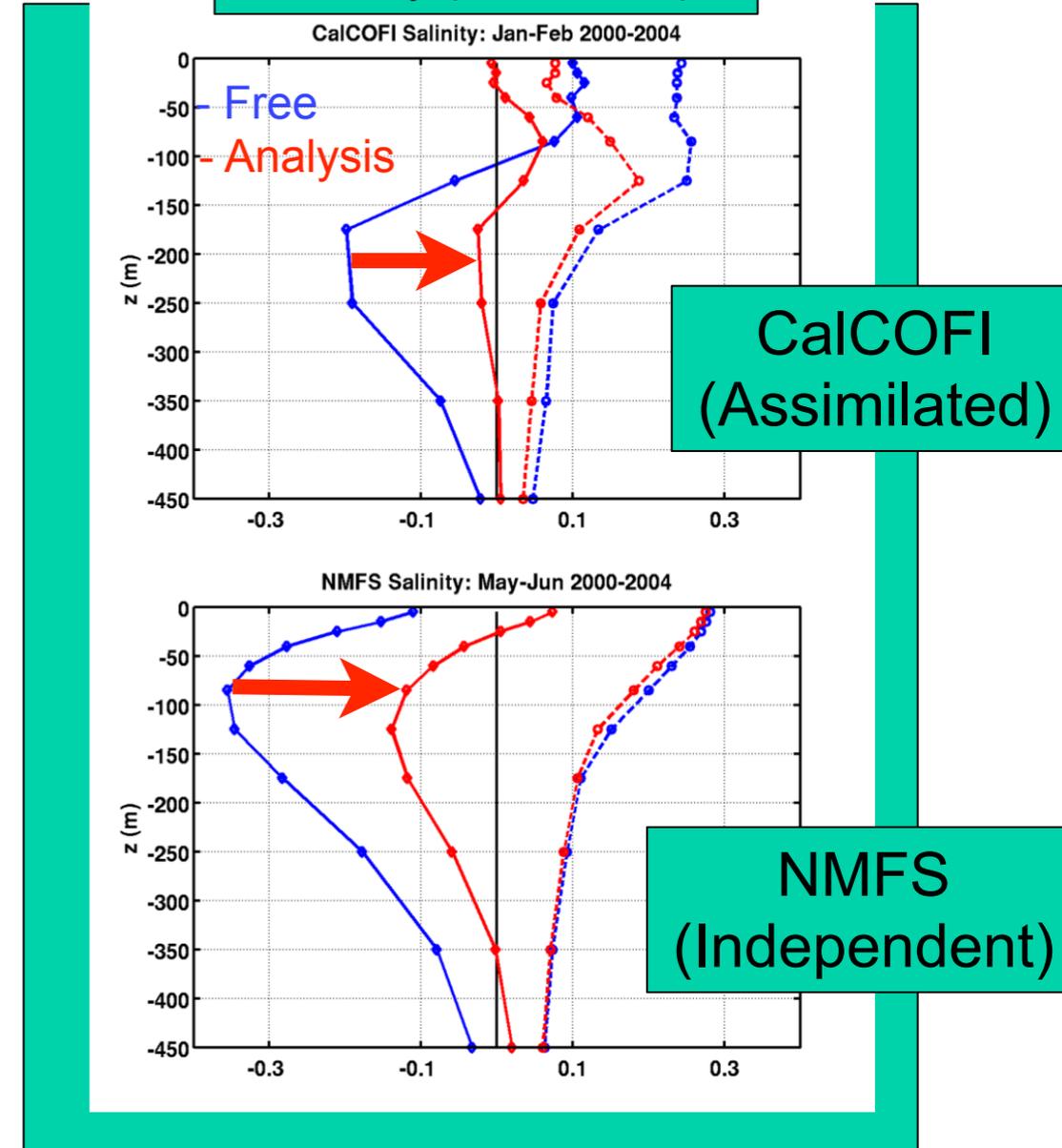
## SST

Error statistics for COAMPS SST for each 14d assimilation cycles



## Salinity

Error statistics for in situ salinity (2000-2004)



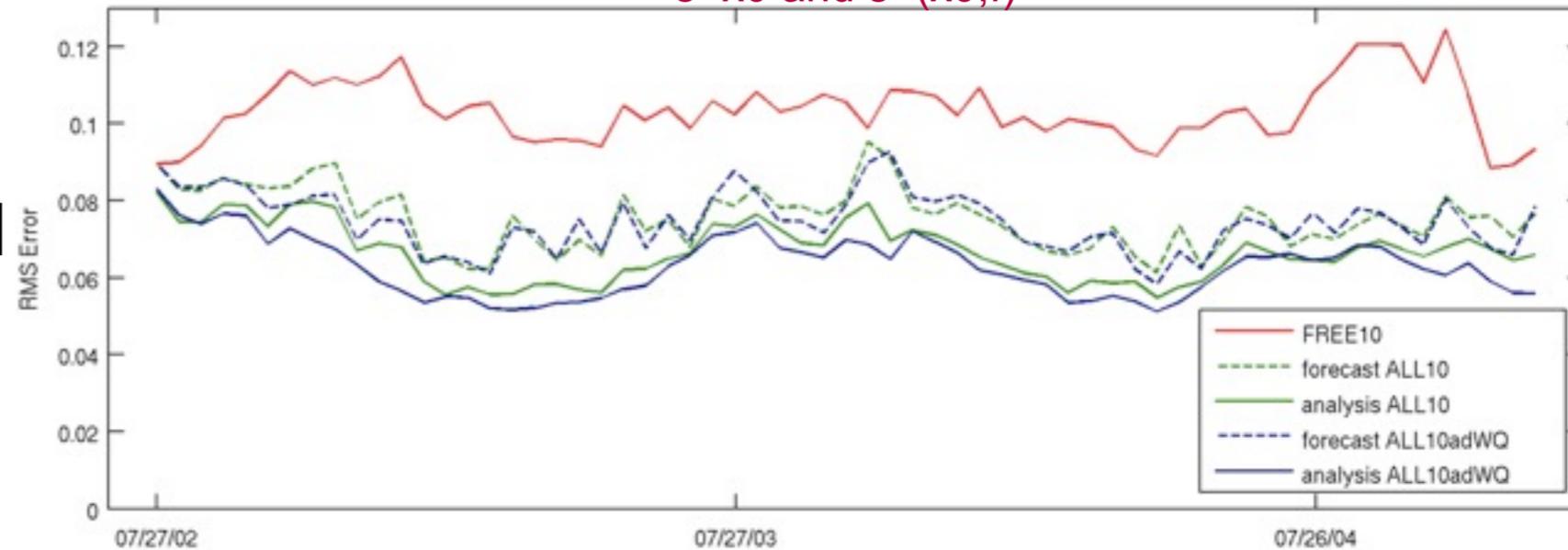
- $(\text{RMS Error})^2 = (\text{Error bias})^2 + (\text{Error STD})^2$
- correction of all components of error
- forecasts still show improvements - sensible corrections on the non observed part of the state



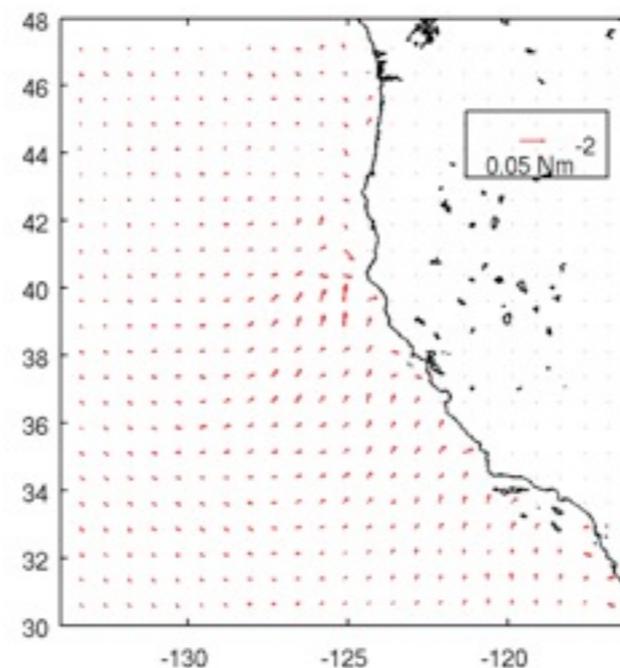
# Strong Constraint I4DVAR With Adjustments to Surface Forcing

- RMS Analysis error is reduced
- Forecast shows effectively no sustained improvement
- Surface forcing adjustments at odds with independent observations
- Suggests other source of error

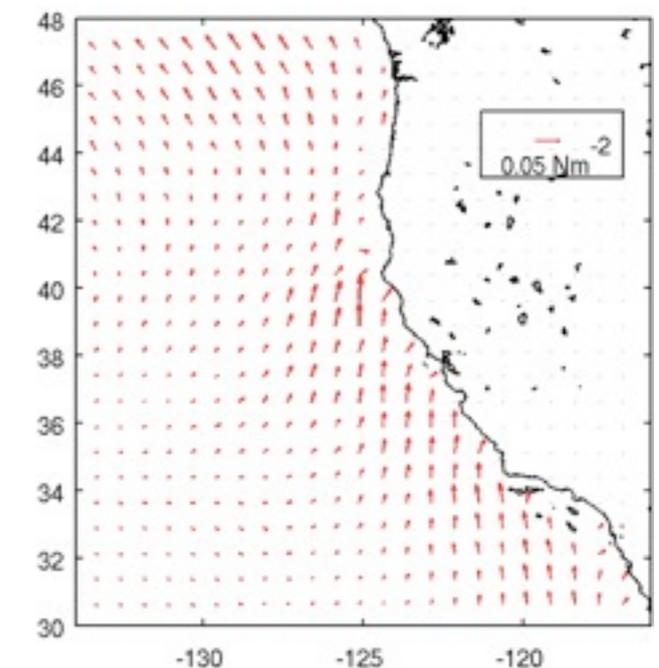
WC10: RMS Errors to SSH data (in m) for each assimilation cycle during free model and analysis with assimilation of SSH/SST/EN3 data using  $s=x_0$  and  $s=(x_0,f)$



Prior wind stress error



Analysis wind stress error

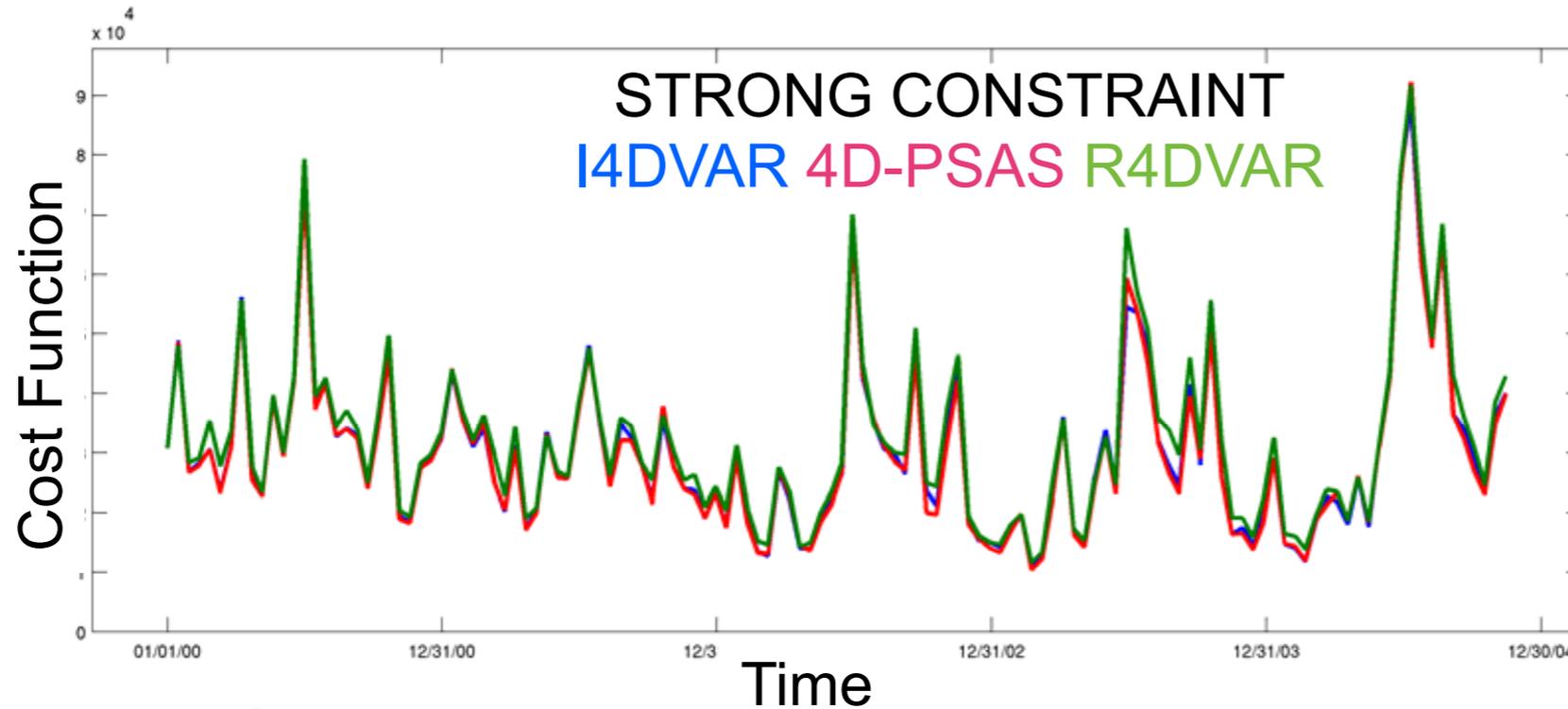


Broquet et al. (2010)

Summer bias in  $\tau$  relative to QuikSCAT data (in  $\text{Nm}^{-2}$ ) for 2003-2004



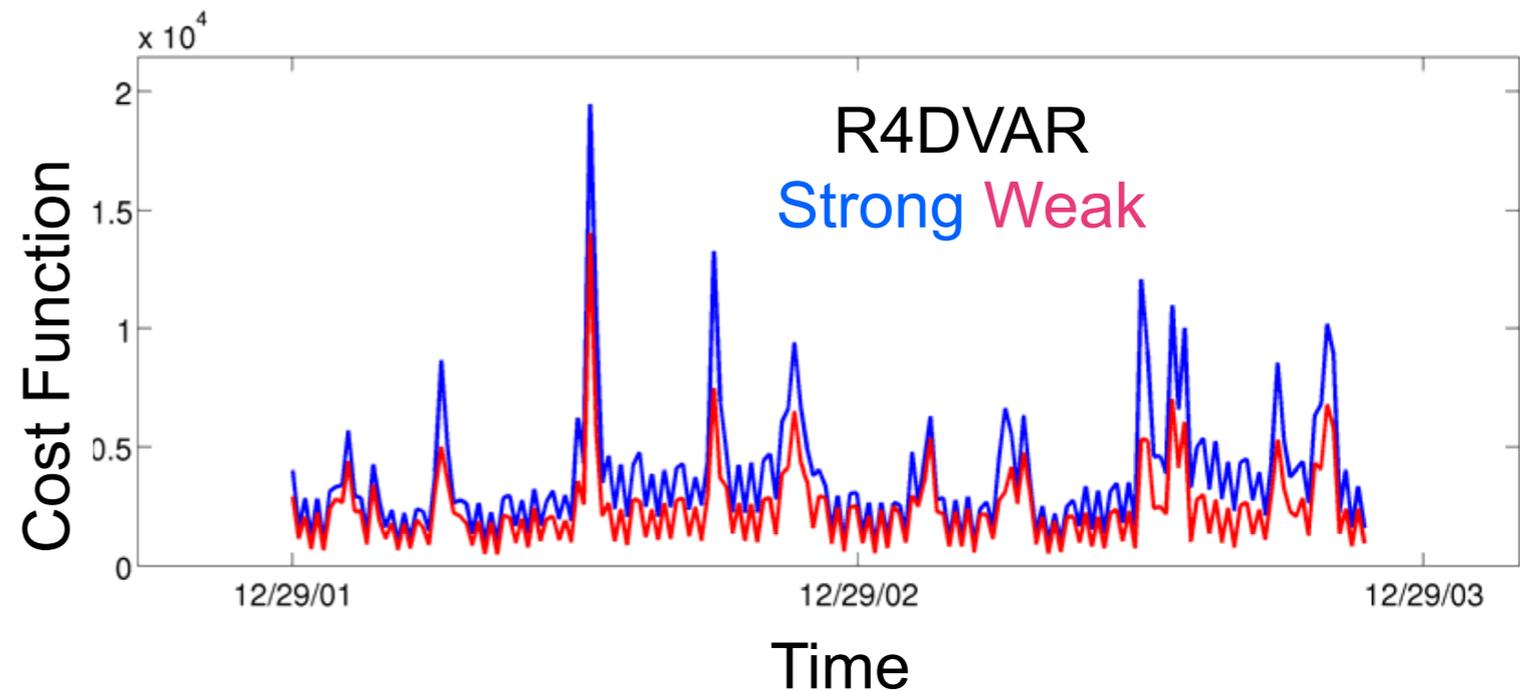
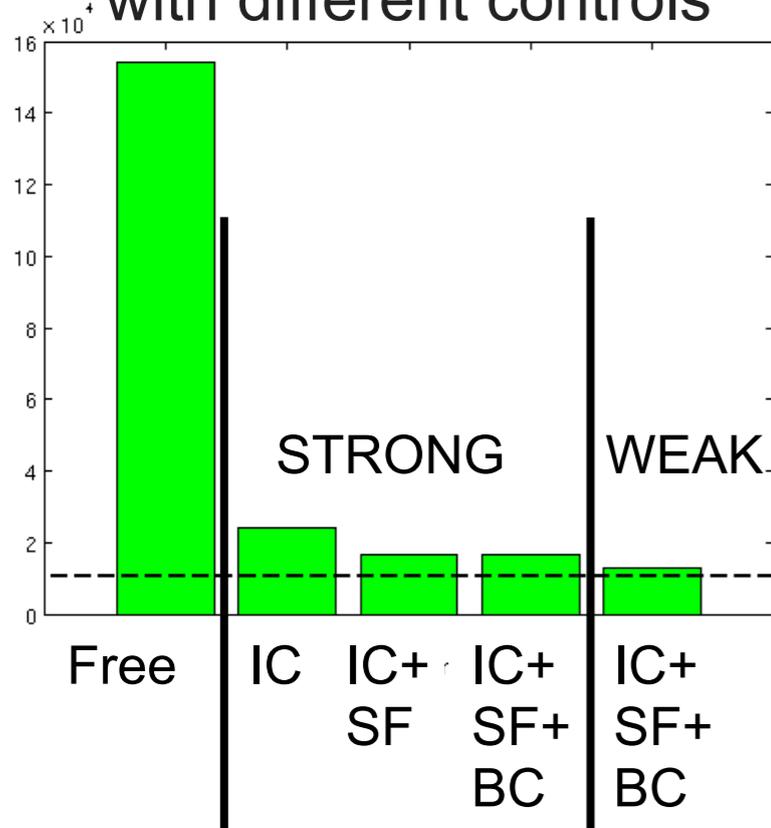
# Investigating Weak Constraint Assimilation



3 different 4DVAR approaches within ROMS:

- 1) Incremental
- 2) Physical-space Statistical Analysis System (PSAS)
- 3) Indirect Representer

Final cost function with different controls





# Summary

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- High resolution, regional modeling requires high quality, high resolution atmospheric forcing products.
- CCS implementation using ROMS.
- Incremental 4DVAR approach yields improved state estimate.
  - Over time, adjustment extends to non-observed portions of the domain.
  - Skill remains in forecast mode, beyond 14-day limit suggested by linearity assumptions.
- Surface forcing adjustments can further reduce model-data misfit.
  - Adjustments inconsistent with independent observations
  - Forcing uncertainty likely too large.
  - Suggest another source of error.
- Impact of model error can be investigated through weak constraint 4DVAR
  - Both PSAS and indirect Representer method are coded within ROMS.
  - Cost function systematically reduced through weak constraint approach.



# Related Activities

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- Quasi-near-real-time system (nearly implemented)
  - Weekly hindcast cycles with 1-2 day forecast
  - AVISO SSH, NOAA tidal SSH, OSTIA SST, glider TS
  - Strong Constraint Incremental (I4DVAR) approach
  - Web accessible
- 10-year, 30-year Reanalysis Effort (next few years)
- Biogeochemical Modeling (in progress)

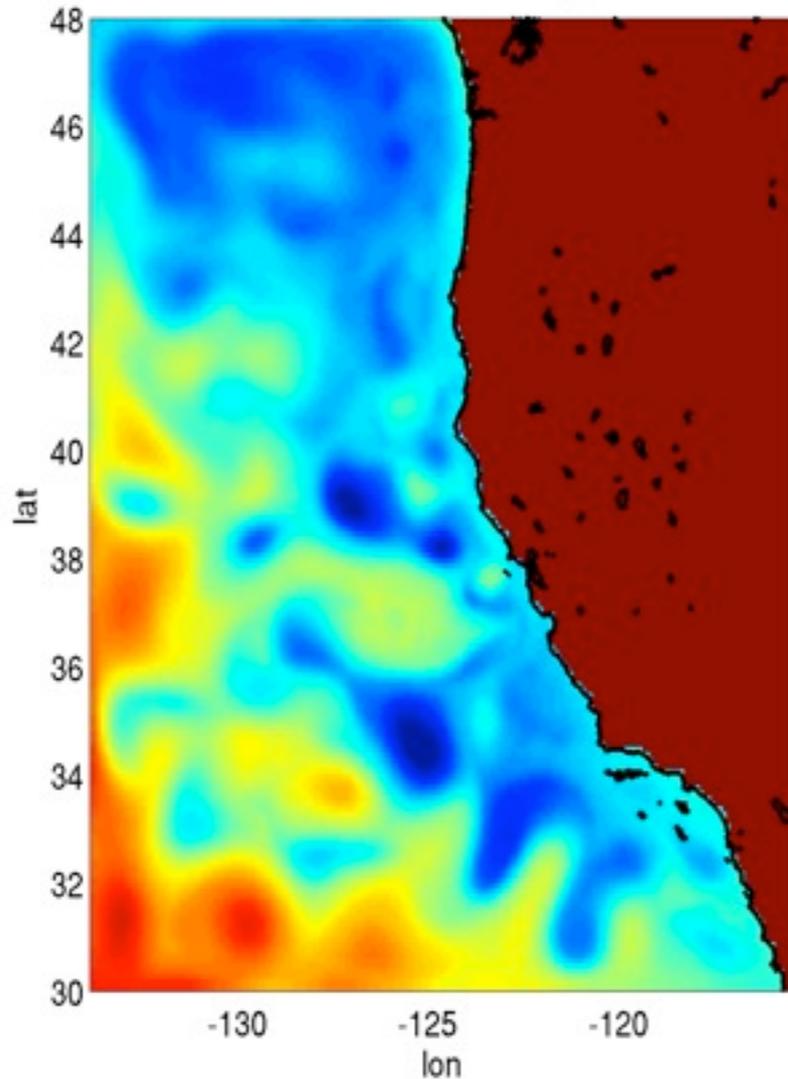




# Example assimilation, automated NRT System

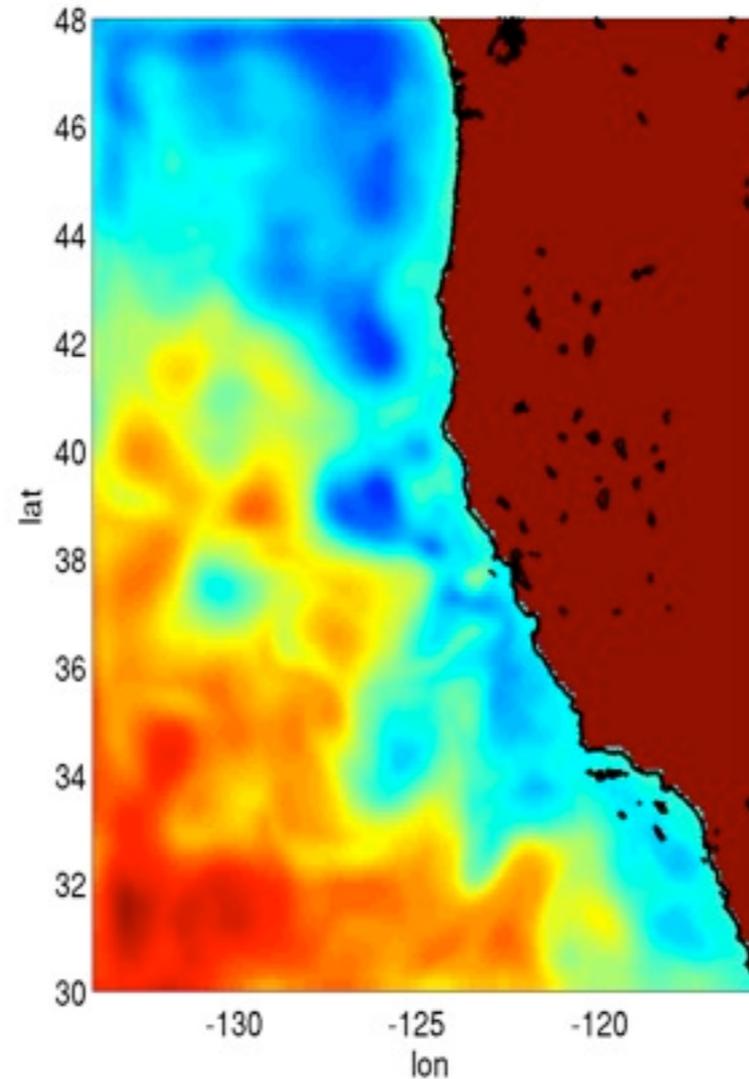
## SSH Before Assimilation

ROMS ssh Jan. wc12.0 prior



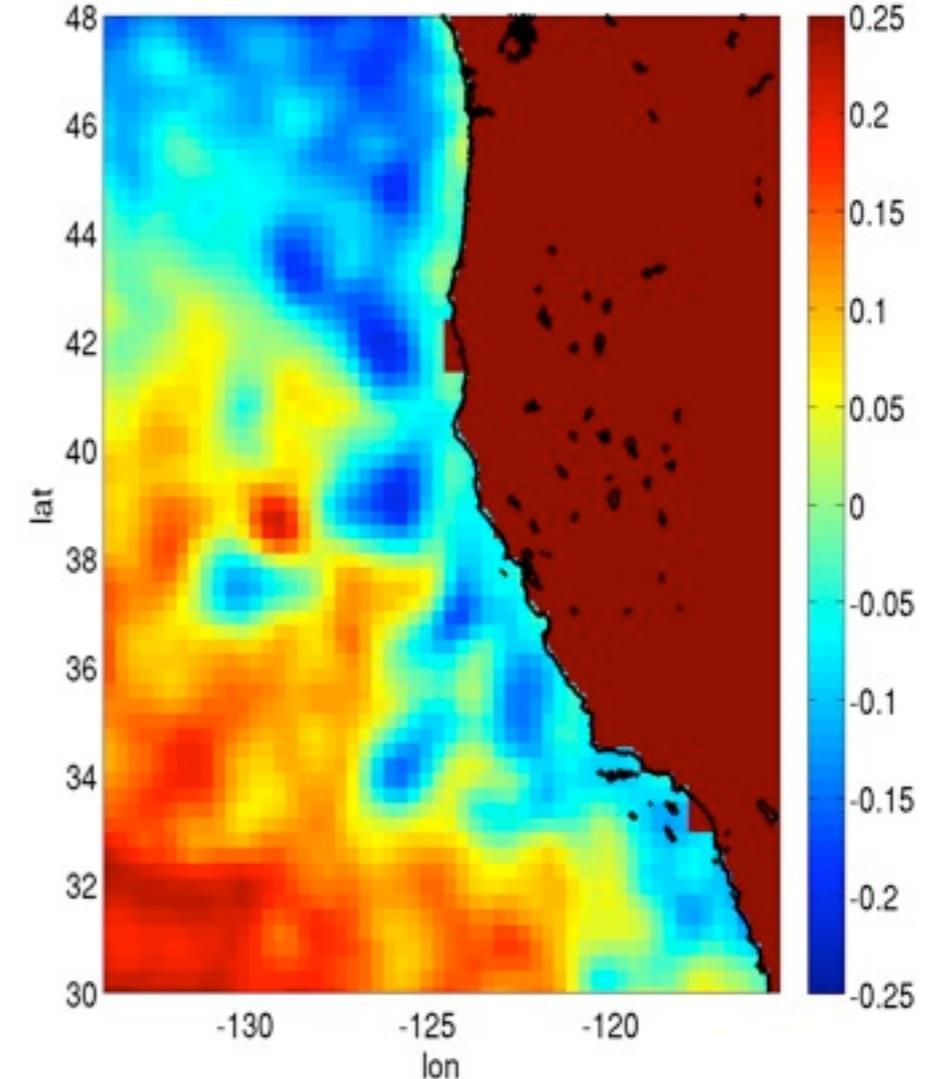
## SSH After Assimilation

ROMS ssh Jan. wc12.0 posterior



## SSH Satellite

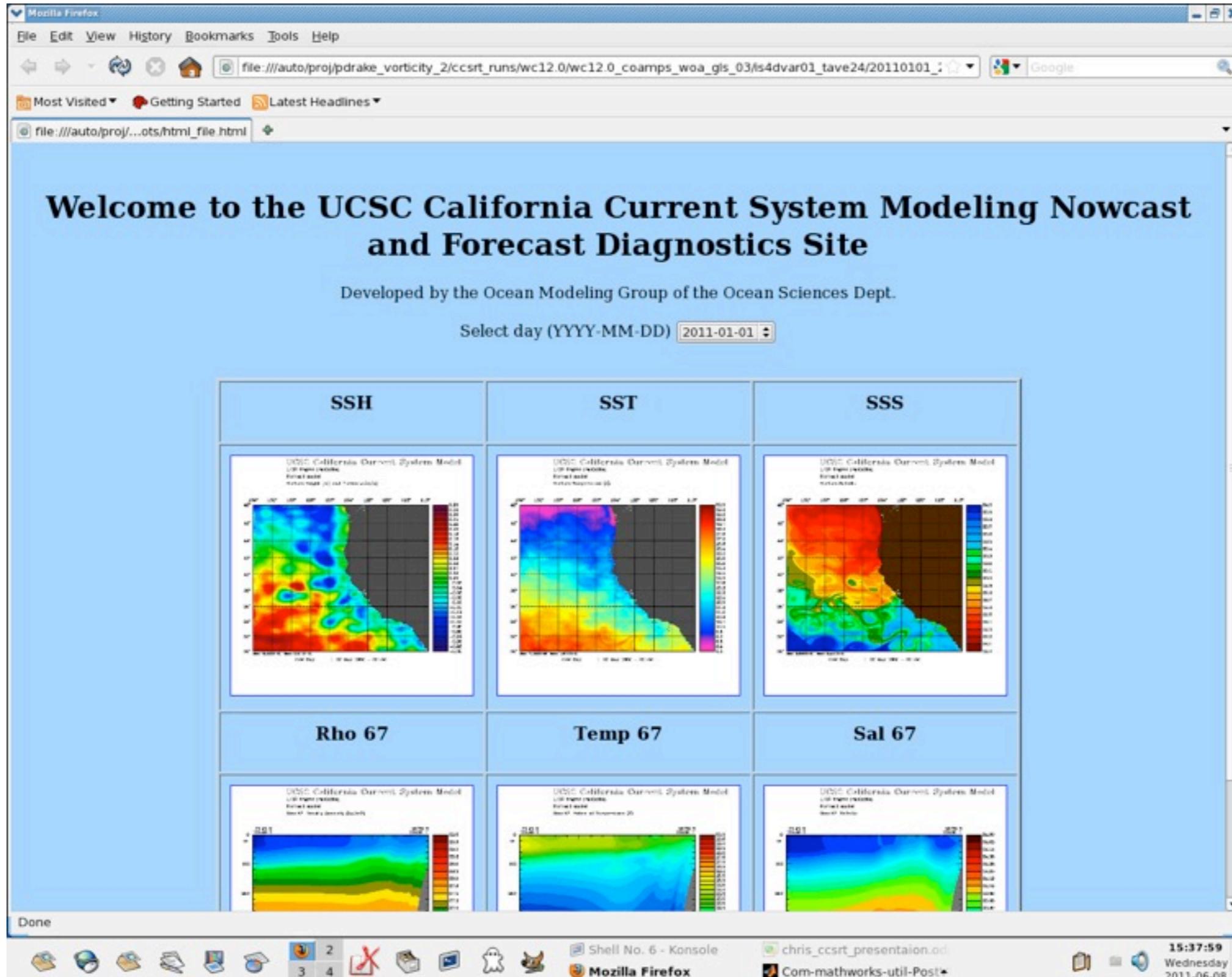
AVISO data ssh Jan.



time-average of 1-week cycle, Jan. 2011



# Example screenshot: NRT output

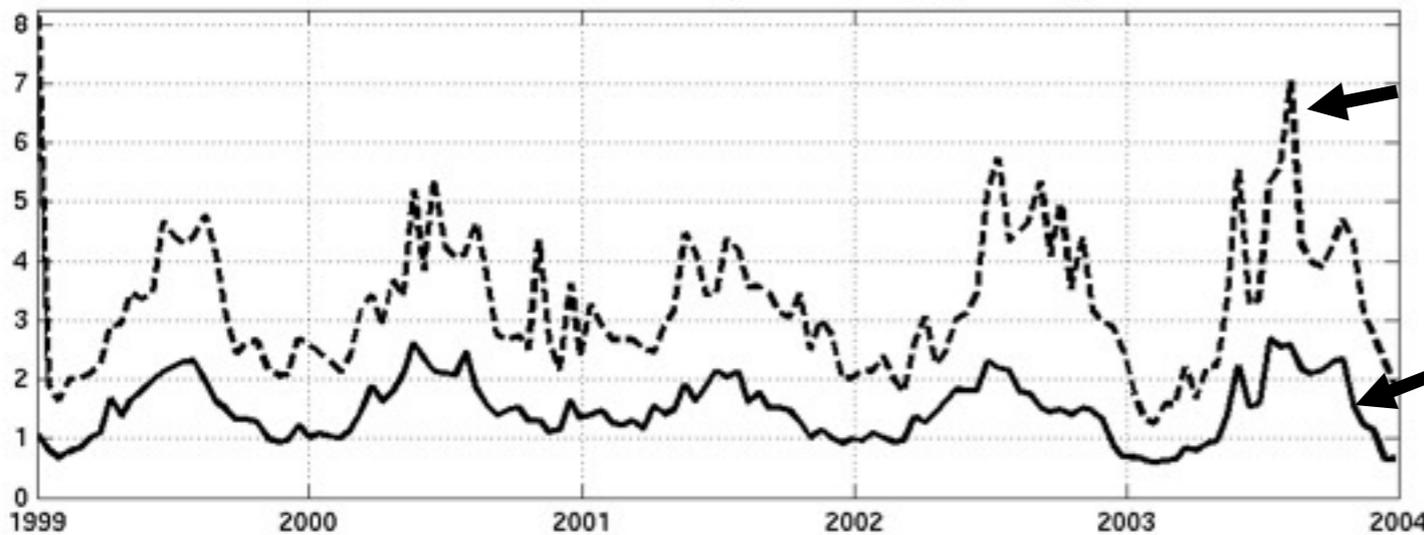




# Analysis of sensitivities

5-year run, 30 km grid, 14 day window

Total normalized cost function, (2J/Nobs) initial(--) and final(-)

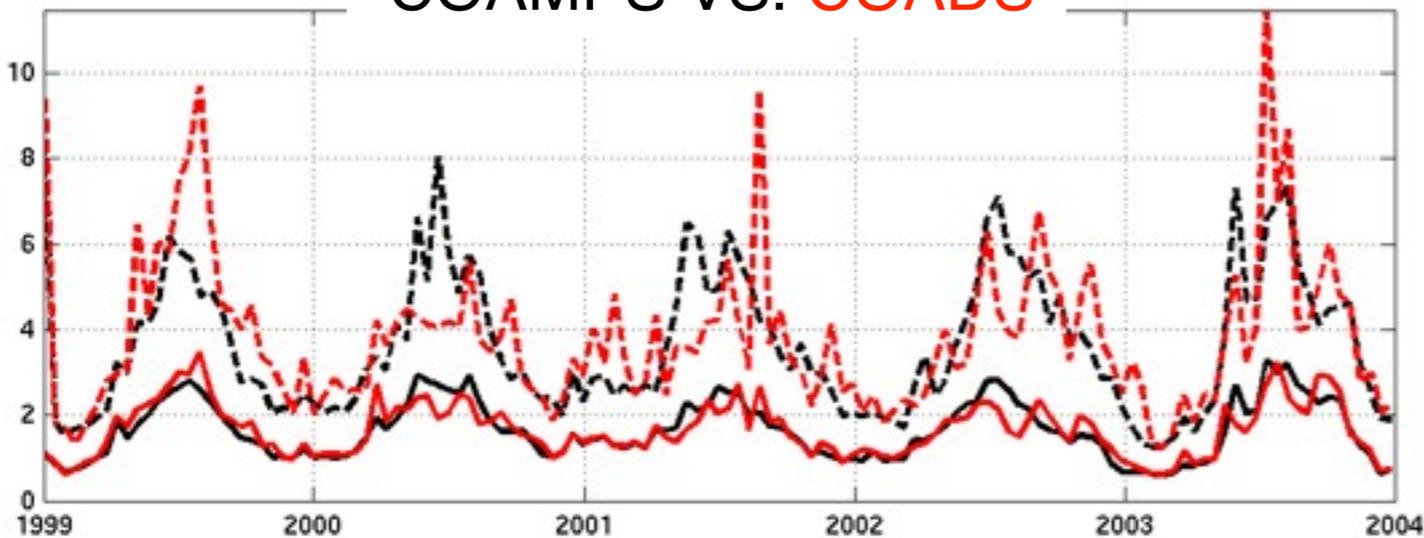


Initial Cost function

Final Cost function

ADJUSTMENTS  
to Initial Temperature

COAMPS VS. COADS (-)



$$\text{rms}(\overline{\Delta T}) = 0.04^\circ$$

$$\overline{\sigma_T} = 0.28^\circ$$

$$\text{rms}(\overline{\Delta T}) = 0.07^\circ$$

$$\overline{\sigma_T} = 0.31^\circ$$

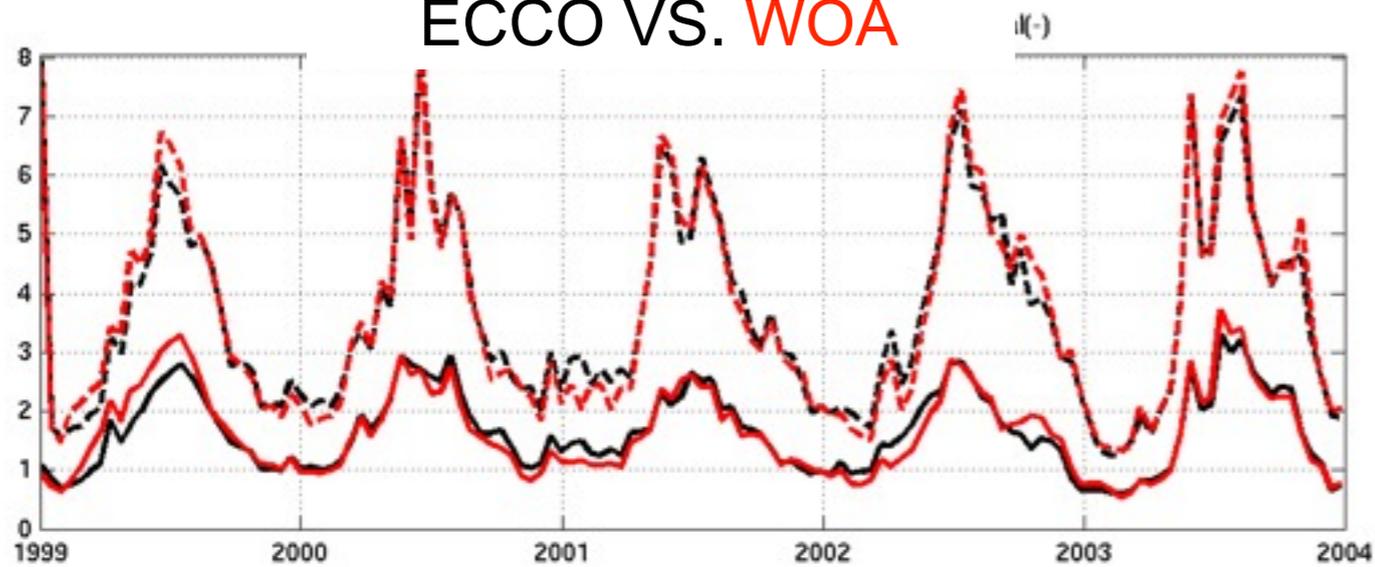


# Analysis of sensitivities

5-year run, 30 km grid, 14 day window

ADJUSTMENTS  
to Initial Temperature

ECCO VS. **WOA**



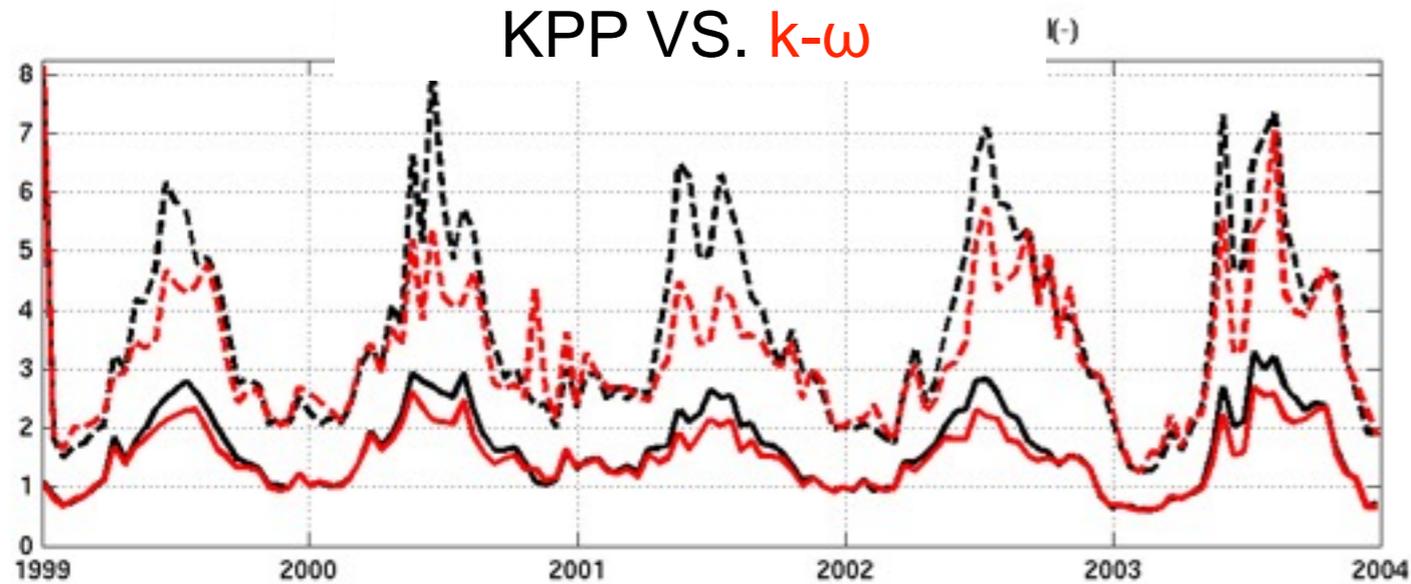
$$\text{rms}(\overline{\Delta T}) = 0.04^\circ$$

$$\overline{\sigma_T} = 0.28^\circ$$

$$\text{rms}(\overline{\Delta T}) = 0.04^\circ$$

$$\overline{\sigma_T} = 0.29^\circ$$

KPP VS. **k- $\omega$**



$$\text{rms}(\overline{\Delta T}) = 0.04^\circ$$

$$\overline{\sigma_T} = 0.28^\circ$$

$$\text{rms}(\overline{\Delta T}) = 0.04^\circ$$

$$\overline{\sigma_T} = 0.27^\circ$$