



# ***Status and Progress of NCODA Assimilation in HYCOM***

***James A. Cummings  
Naval Research Laboratory***

***11<sup>th</sup> HYCOM Consortium Meeting***

***Stennis Space Center, Mississippi  
24-26 April 2007***

## **Outline:**

Status of HYCOM/NCODA Assimilation Systems  
Assimilation Verification Results  
Model/Data Issues and Solutions  
Analysis Covariance Consistency  
Validation of Altimeter Assimilation Methods  
Plans for Transition of MVOI to 3D-Var

# Report Documentation Page

*Form Approved  
OMB No. 0704-0188*

Public reporting burden for the collection of information is estimated to average 1 hour per response, including the time for reviewing instructions, searching existing data sources, gathering and maintaining the data needed, and completing and reviewing the collection of information. Send comments regarding this burden estimate or any other aspect of this collection of information, including suggestions for reducing this burden, to Washington Headquarters Services, Directorate for Information Operations and Reports, 1215 Jefferson Davis Highway, Suite 1204, Arlington VA 22202-4302. Respondents should be aware that notwithstanding any other provision of law, no person shall be subject to a penalty for failing to comply with a collection of information if it does not display a currently valid OMB control number.

1. REPORT DATE <b>APR 2007</b>	2. REPORT TYPE	3. DATES COVERED <b>00-00-2007 to 00-00-2007</b>			
4. TITLE AND SUBTITLE <b>Status and Progress of NCODA Assimilation in HYCOM</b>		5a. CONTRACT NUMBER			
		5b. GRANT NUMBER			
		5c. PROGRAM ELEMENT NUMBER			
6. AUTHOR(S)		5d. PROJECT NUMBER			
		5e. TASK NUMBER			
		5f. WORK UNIT NUMBER			
7. PERFORMING ORGANIZATION NAME(S) AND ADDRESS(ES) <b>Naval Research Laboratory, Monterey, CA, 93943</b>		8. PERFORMING ORGANIZATION REPORT NUMBER			
9. SPONSORING/MONITORING AGENCY NAME(S) AND ADDRESS(ES)		10. SPONSOR/MONITOR'S ACRONYM(S)			
		11. SPONSOR/MONITOR'S REPORT NUMBER(S)			
12. DISTRIBUTION/AVAILABILITY STATEMENT <b>Approved for public release; distribution unlimited</b>					
13. SUPPLEMENTARY NOTES					
14. ABSTRACT					
15. SUBJECT TERMS					
16. SECURITY CLASSIFICATION OF:			17. LIMITATION OF ABSTRACT <b>Same as Report (SAR)</b>	18. NUMBER OF PAGES <b>29</b>	19a. NAME OF RESPONSIBLE PERSON
a. REPORT <b>unclassified</b>	b. ABSTRACT <b>unclassified</b>	c. THIS PAGE <b>unclassified</b>			



# *Status HYCOM/NCODA Assimilation Systems*

## **Global Model Assimilation**

- hindcast run – November 2003 to May 2005 (as of last week)
- real-time run – December 2006 to present
- ~9 km grid resolution
- 24-hr update cycle
- assimilation only in Mercator part of grid (south of 47° N)

## **Gulf of Mexico Model Assimilation**

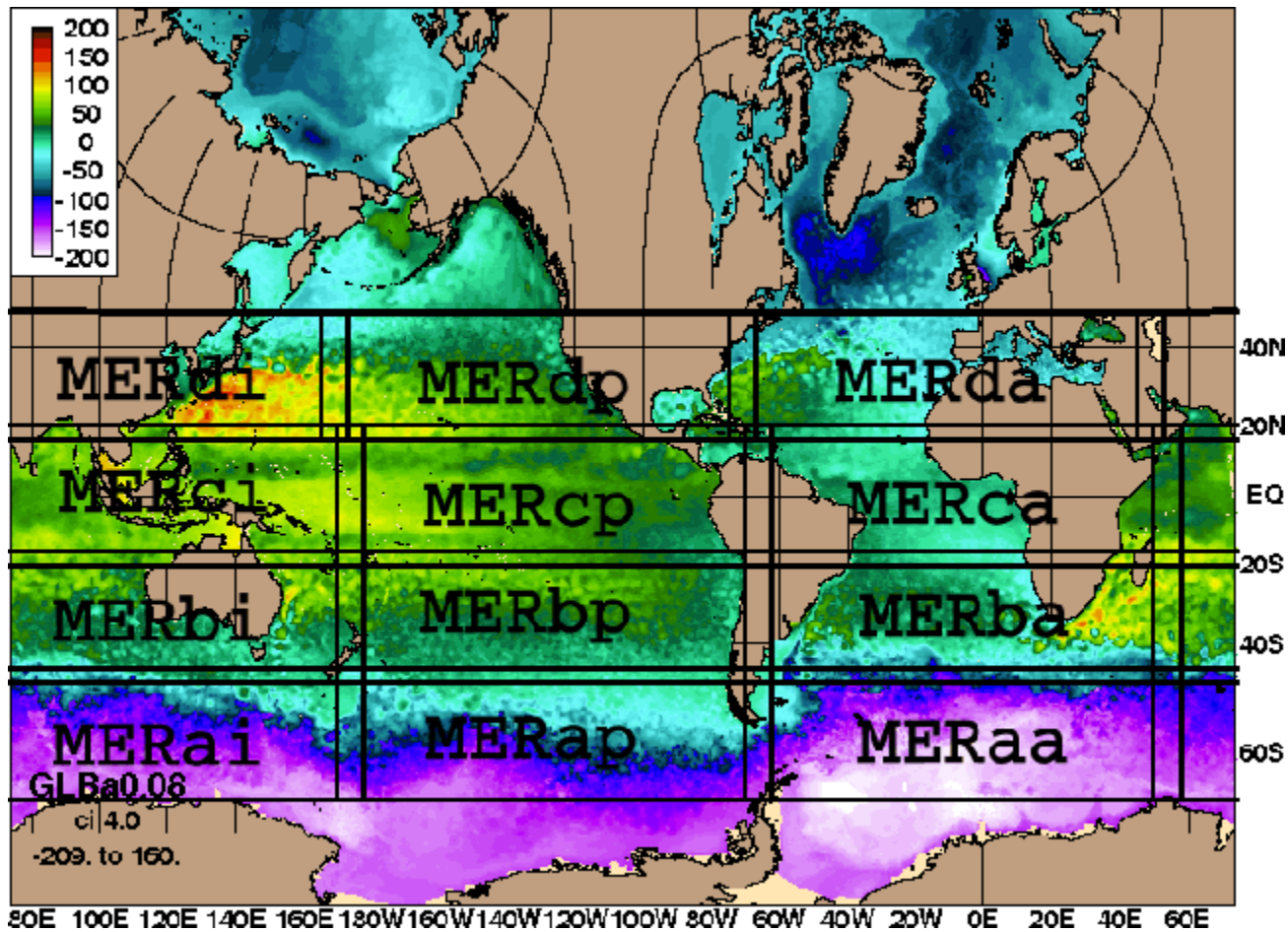
- real-time run – August 2006 to present
- ~3 km grid resolution
- 24-hr update cycle

Both systems assimilate all operational sources of observations

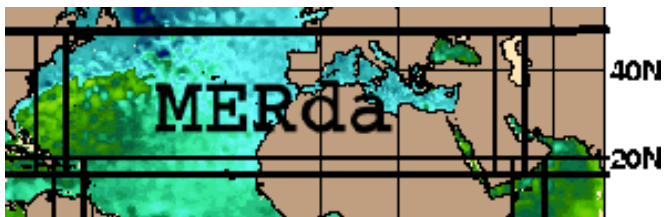
- AVHRR GAC and GOES (GoM only) satellite SST, in situ SST, altimeter SSH, TS profiles (Argo, CTD, XBT), SSM/I sea ice



# Global Model Assimilation Verification

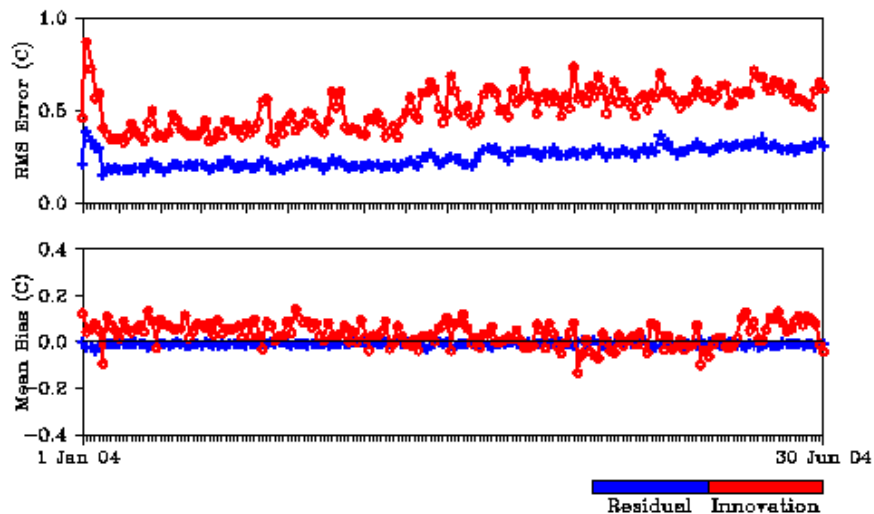


Analysis performed in 12 overlapping domains that define the Mercator part of the global grid

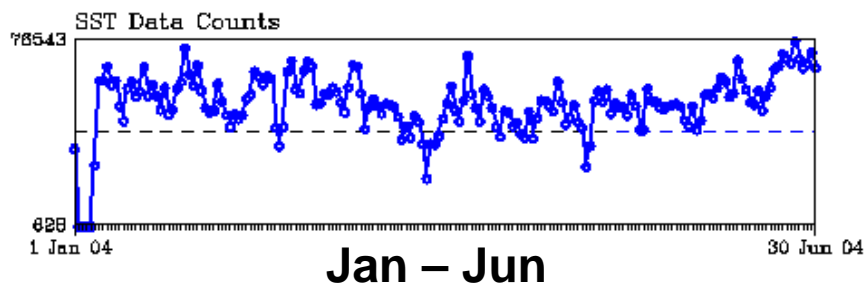


# Global Model Assimilation 2004 SST Verification

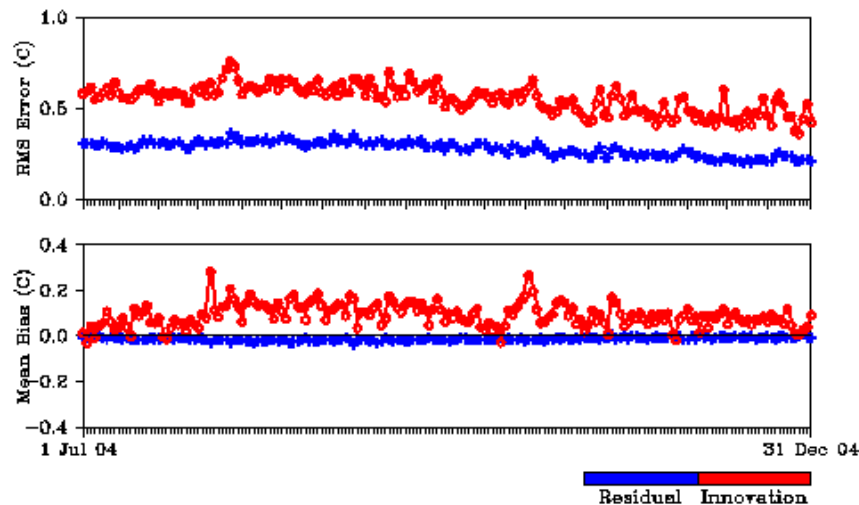
MERda0.08 9 Km Grid  
SST Verification



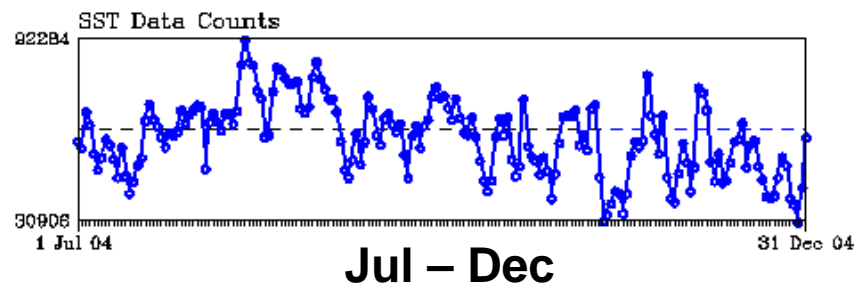
Residual Innovation

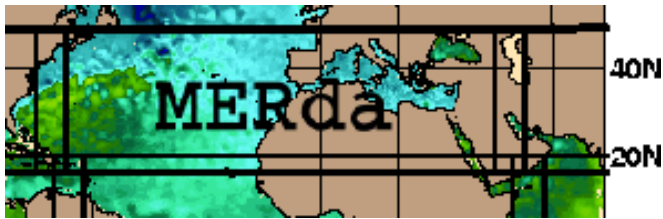


MERda0.08 9 Km Grid  
SST Verification



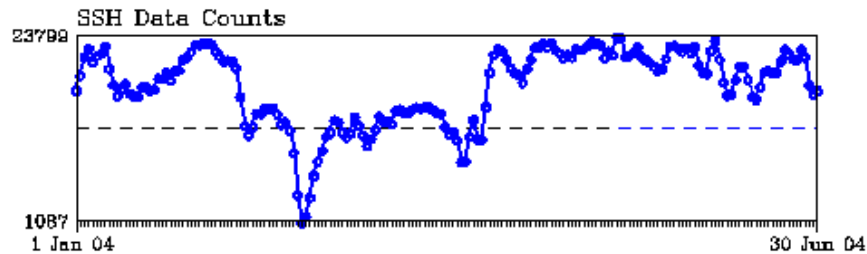
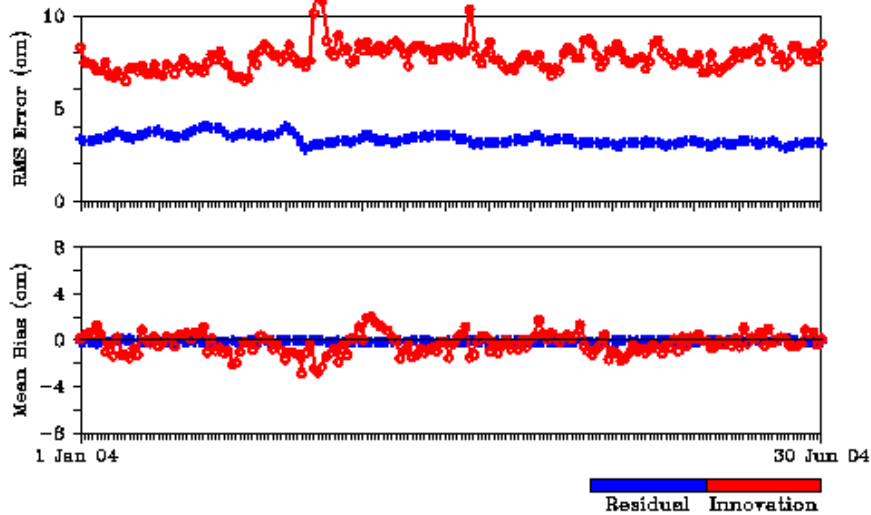
Residual Innovation





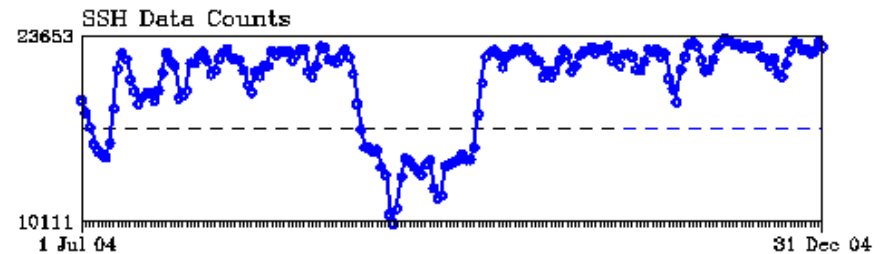
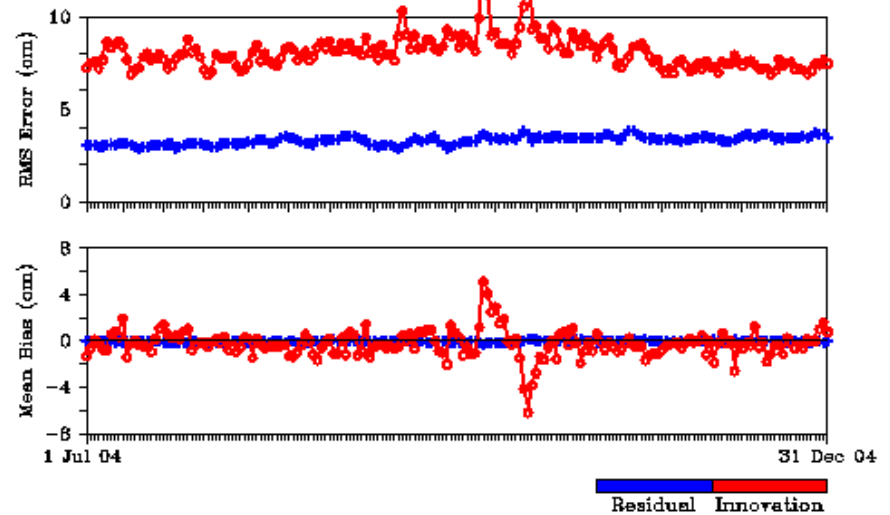
# Global Model Assimilation 2004 SSH Verification

MERda0.08 9 Km Grid  
SSH Verification

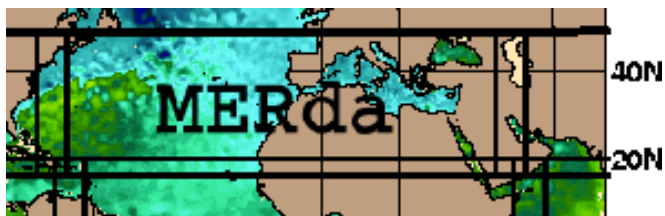


Jan - Jun

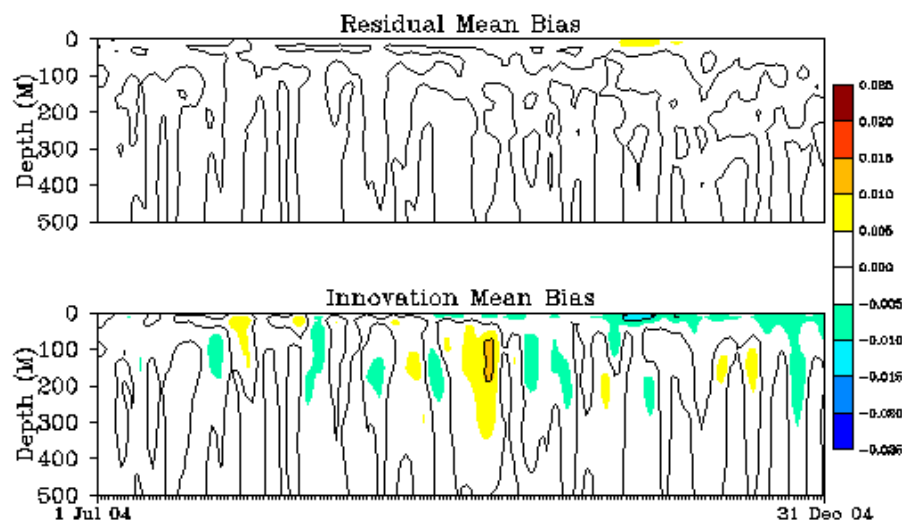
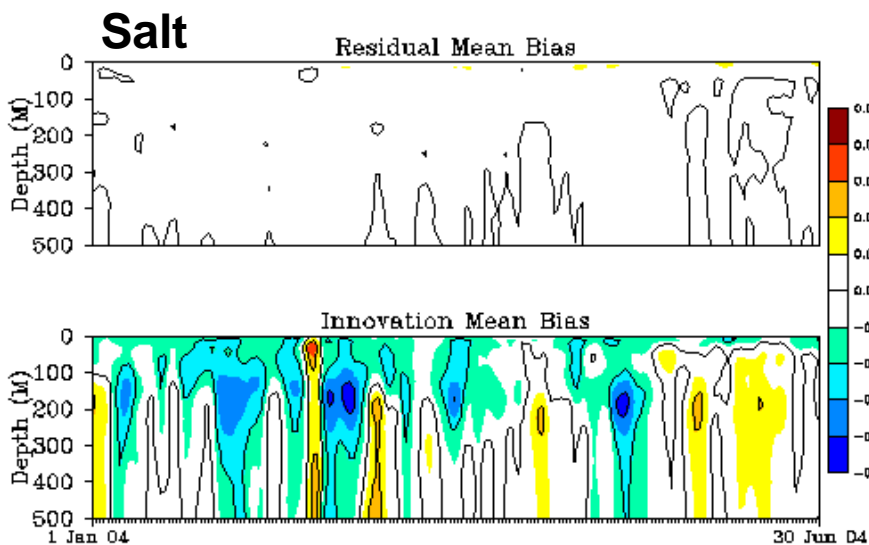
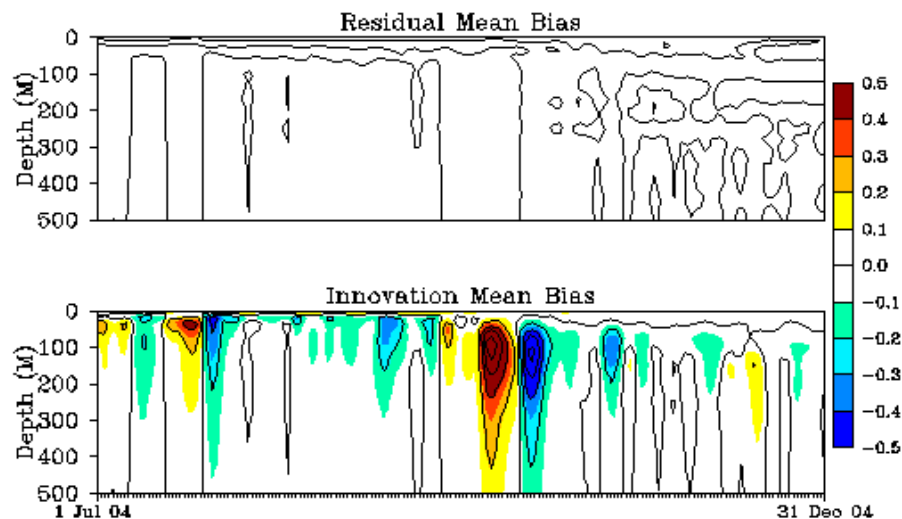
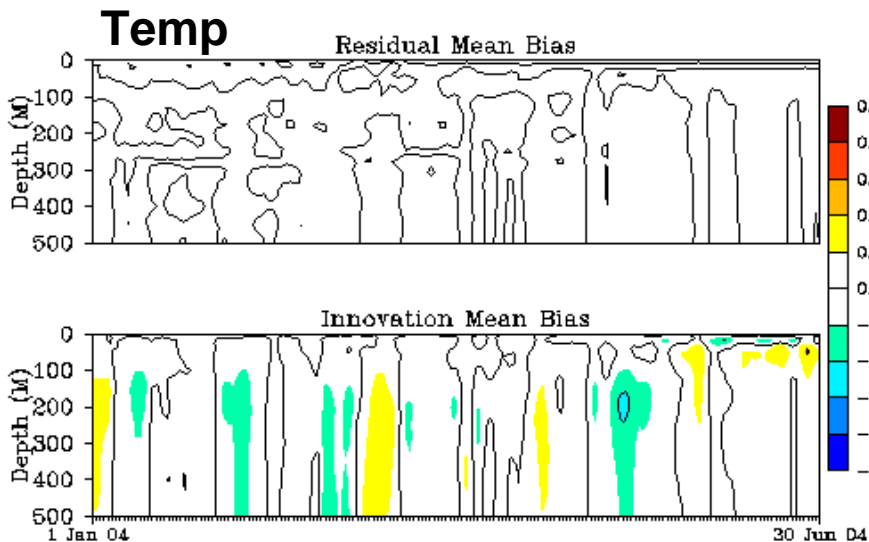
MERda0.08 9 Km Grid  
SSH Verification



Jul - Dec



# Global Model Assimilation 2004 Temperature/Salinity Mean Errors



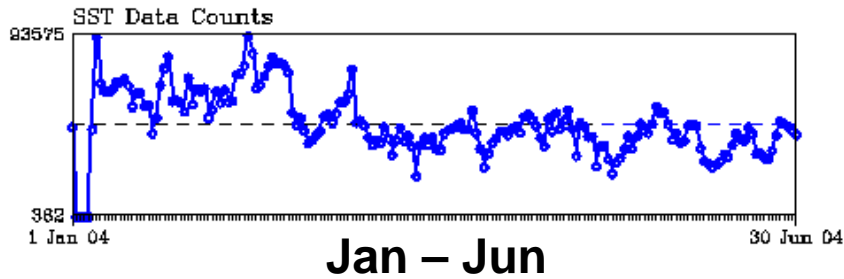
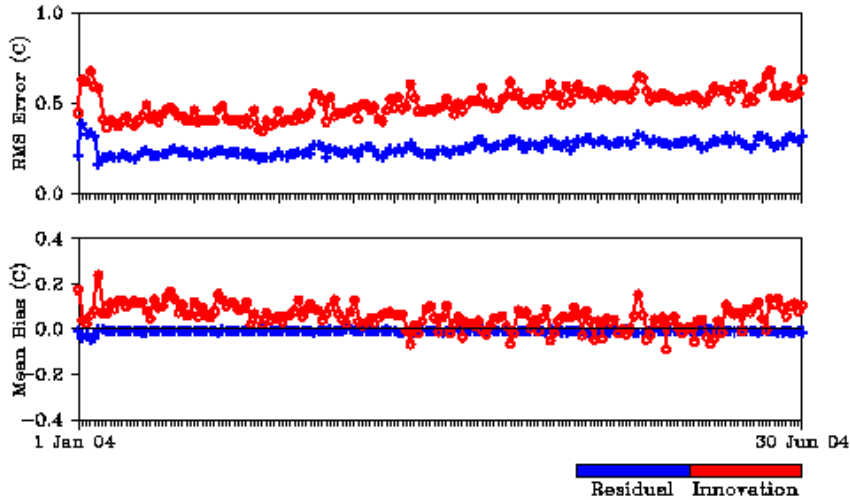
Jan – Jun

Jul – Dec

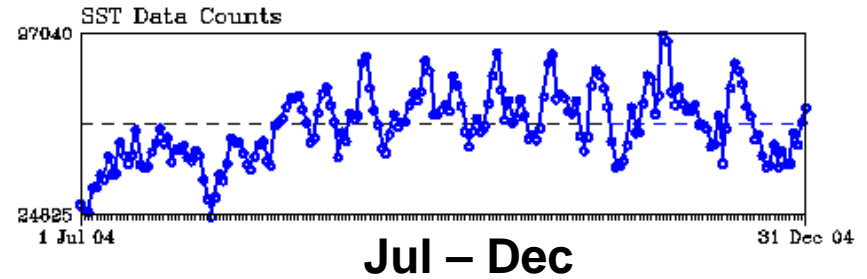
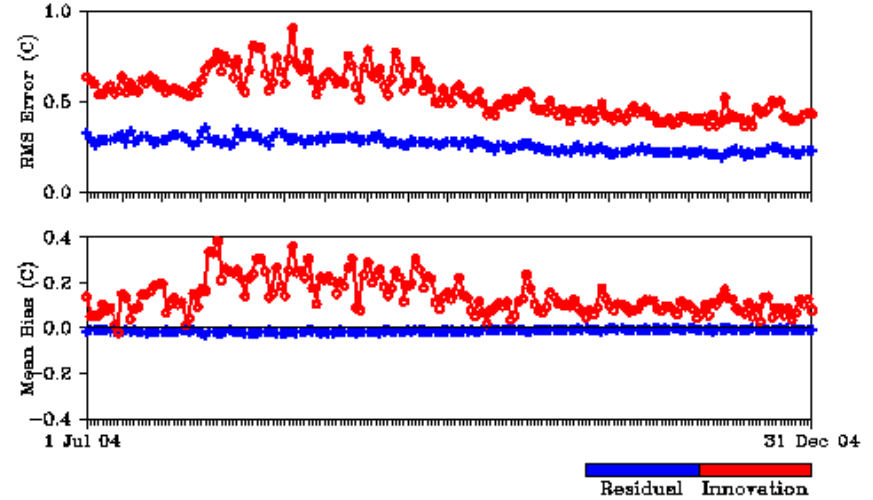


# Global Model Assimilation 2004 SST Verification

MERdp0.08 9 Km Grid  
SST Verification



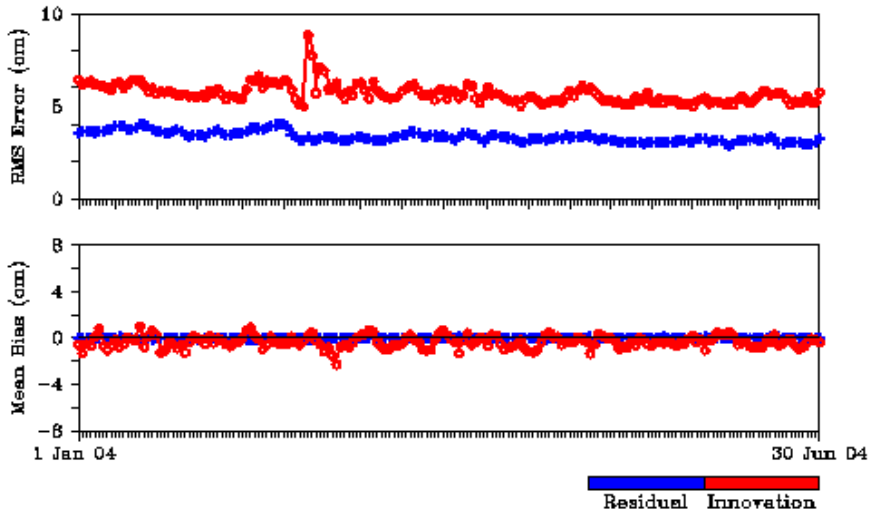
MERdp0.08 9 Km Grid  
SST Verification



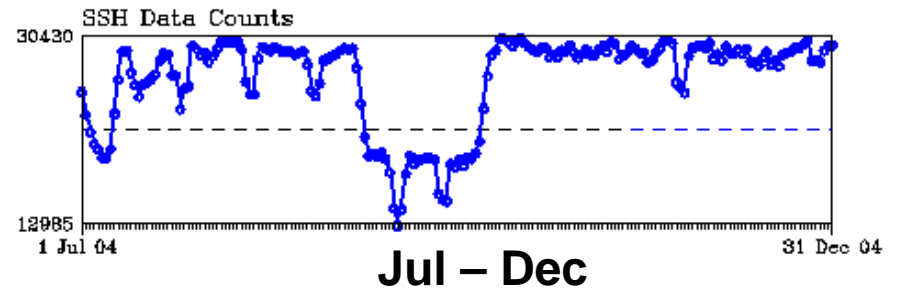
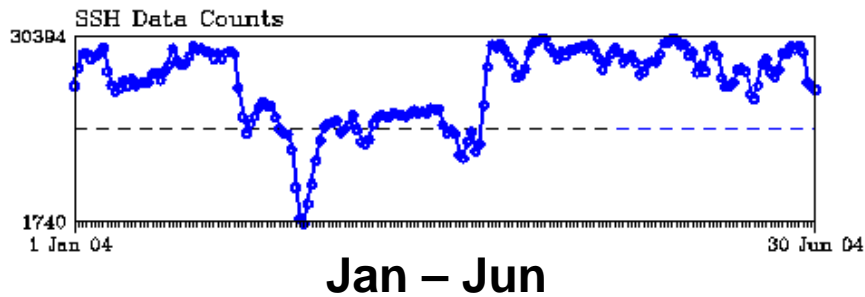
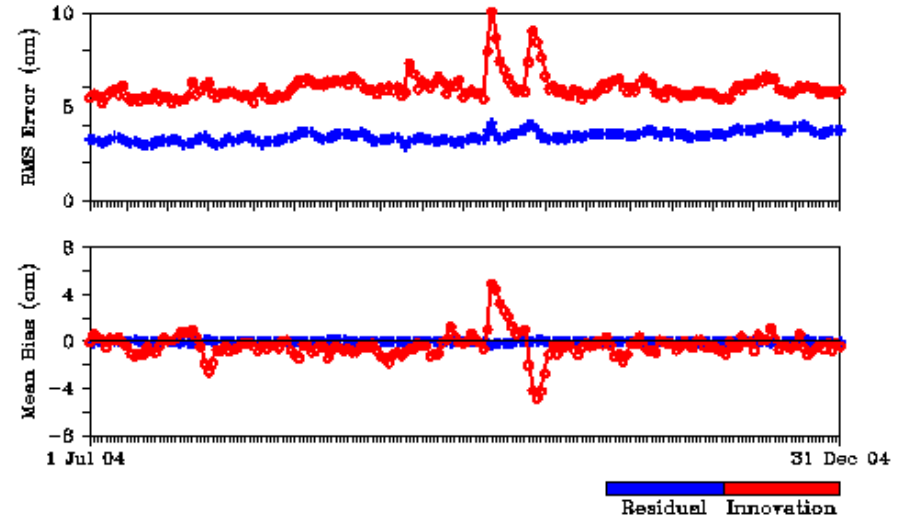


# Global Model Assimilation 2004 SSH Verification

MERdp0.08 9 Km Grid  
SSH Verification



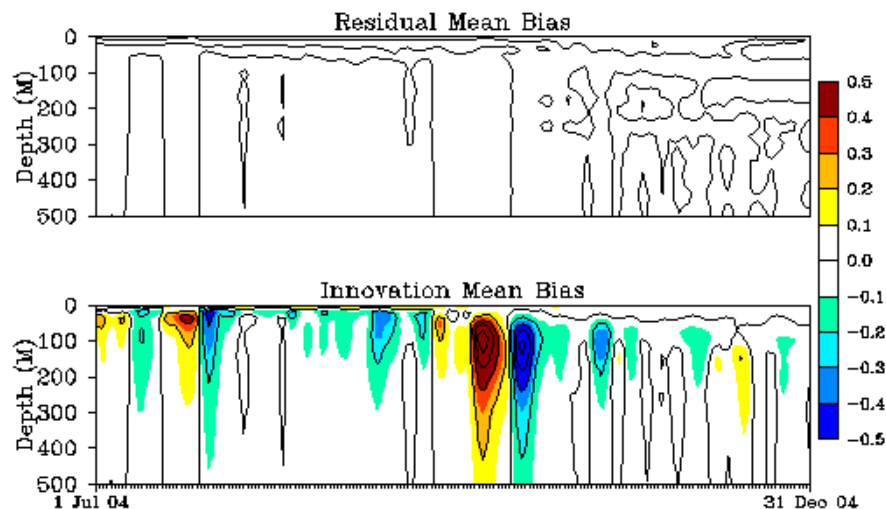
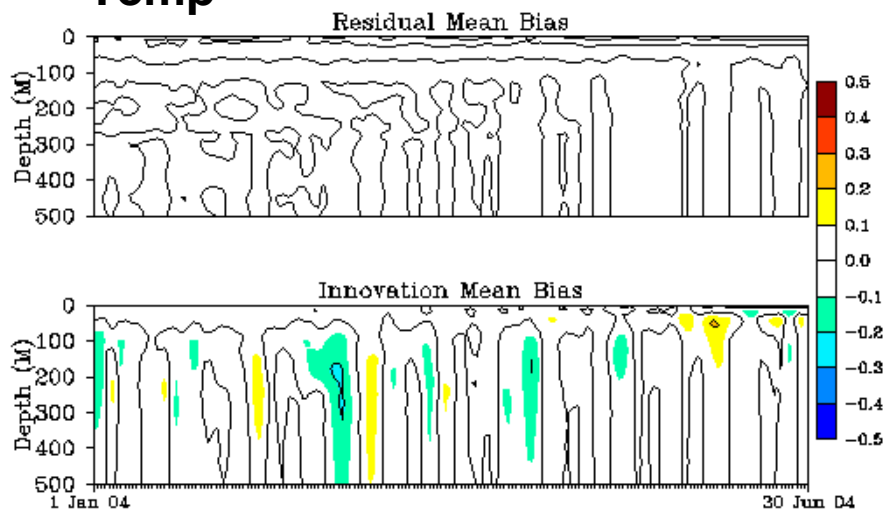
MERdp0.08 9 Km Grid  
SSH Verification



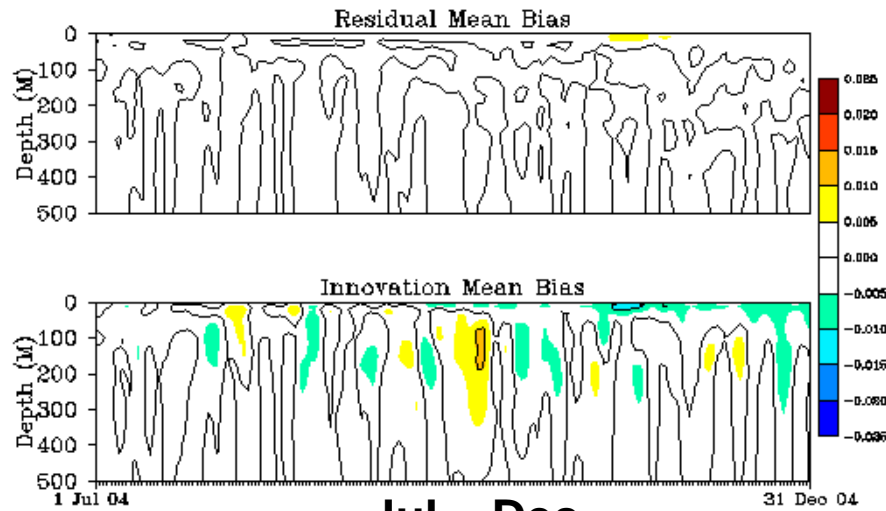
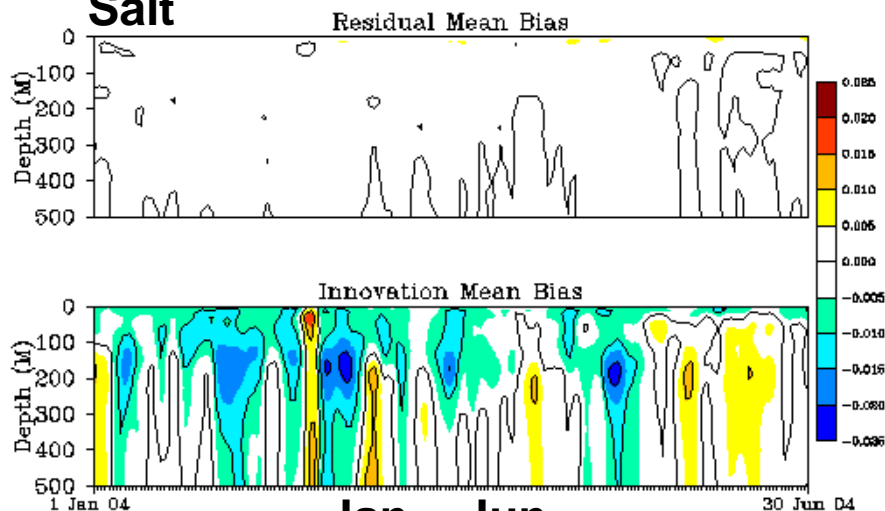


# Global Model Assimilation 2004 Temperature/Salinity Mean Errors

## Temp



## Salt



Jan - Jun

Jul - Dec



## Summary 2004 Global Model Verification

- analysis residuals show consistent error reduction from 24-hr forecast
- analysis residuals unbiased, except for a small positive salinity bias ( $\sim 0.01$  PSU,  $< 50$ m) in tropical Pacific (MERcp) domain (not shown)
- SST bias increases in later half of 2004 - somewhat true in NW Atlantic (MERda) domain, especially true in NE Pacific (MERdp) domain
- SSH prediction errors dominated by GFO data issue during Sep/Oct
- salinity errors at depth spuriously large in first half of 2004 in NW Atlantic (MERda) and NE Pacific (MERdp) domains

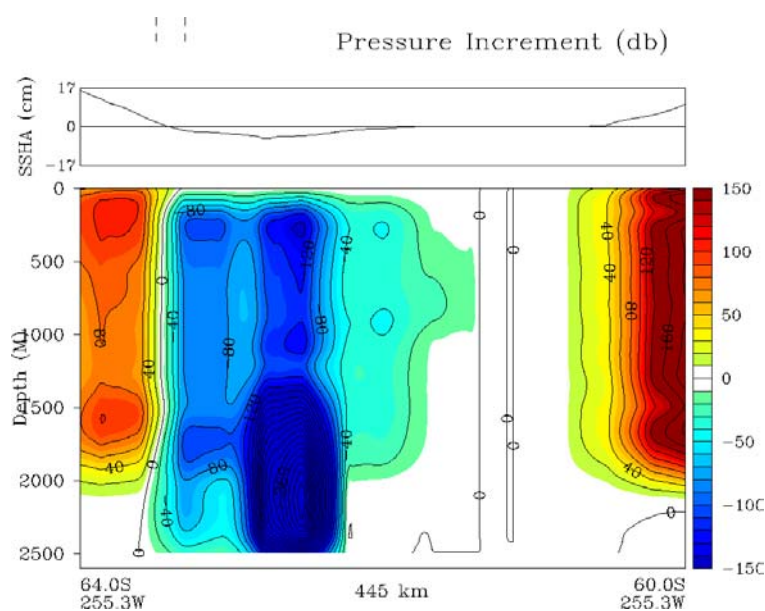
Monitoring of assimilation error time series should be routine (NAVO?)

Need to understand cause – forcing errors, model drift, analysis error?



# Model/Data Issues and Solutions

## Large layer pressure increments at depth



Cross section of layer pressure increments along 104.7°W from 64°S to 60°S 1 Dec 2004

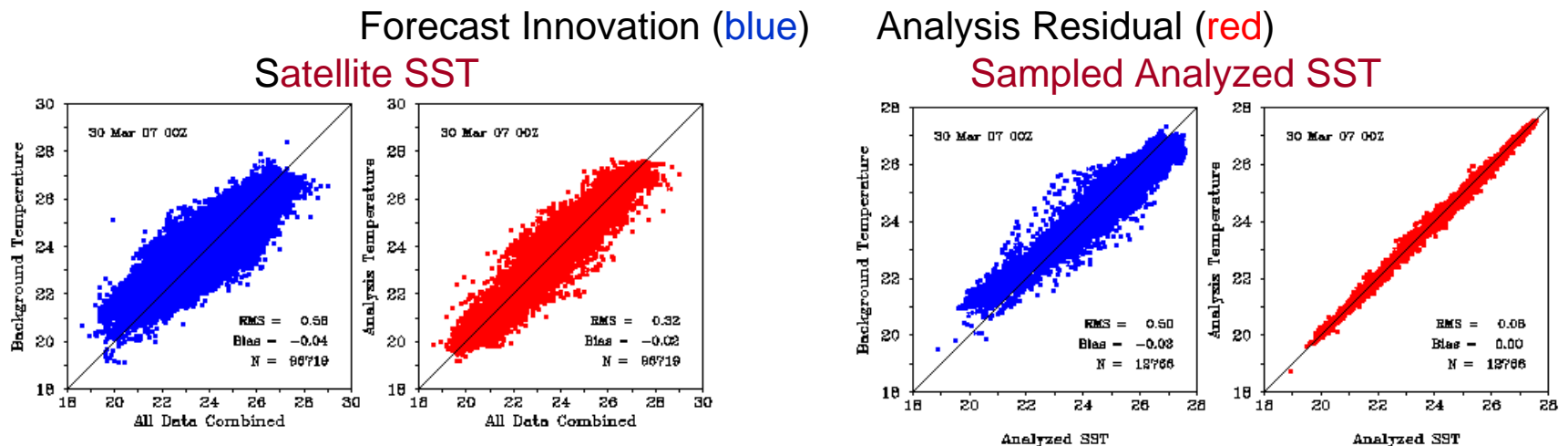
- tends to occur at high latitudes in weakly stratified water columns (also Med Sea)
- potential source(s) of problem:
  - assimilation of SSHA with large barotropic signals using Cooper Haines (CH) method
  - density inversions in model forecast
- solution to problem:
  - allow for weak model density inversions when computing layer pressure innovations
  - do not generate CH profile if Brunt-Vaisalla frequency of forecast profile is  $< 1$  cph
  - reject CH profile if residual of iterative fit to measured change in SSH is  $> 1$  cm



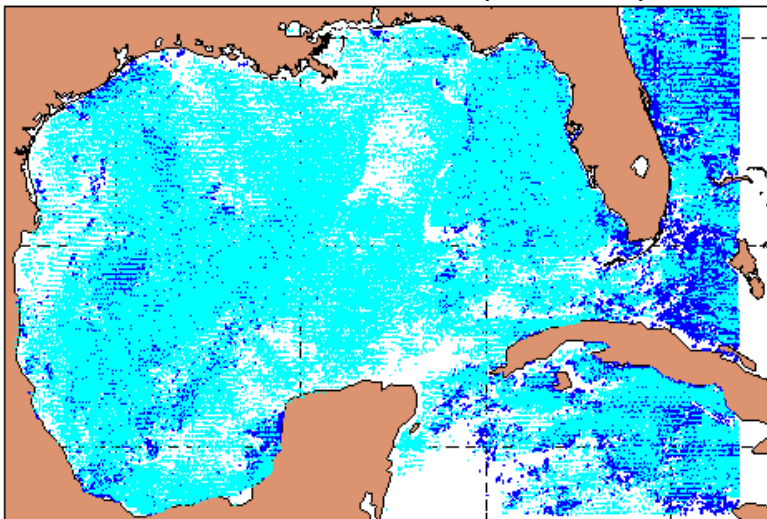
# Model/Data Issues and Solutions

## High Density SST Observations

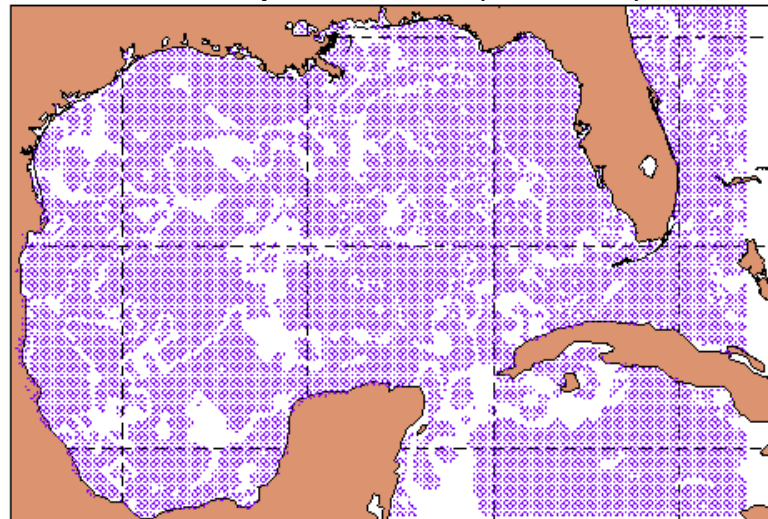
- multiple sources SST data – AVHRR GAC/LAC, GOES, AMSR-E, AATSR, and soon METOP (potential for global 1 km data).
- large number of SST data increase analysis run time: post-multiplication step mapping from observation to grid space (matrix/vector operation).
- solution to problem:
  - perform 2D SST analysis using all data sources (HYCOM SST forecast first guess)
  - sample SST increments to select analyzed SST observations for 3D analysis
  - implemented in Gulf of Mexico HYCOM – decreased run time from 1.5 hrs to 11 min



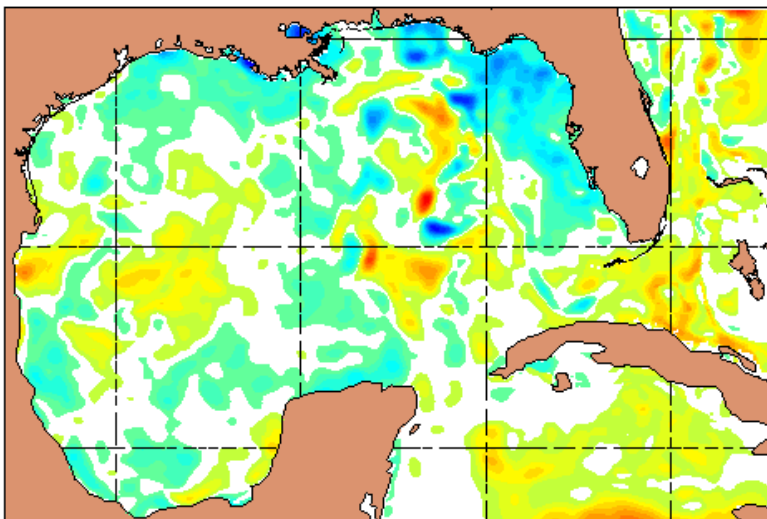
Satellite SST (92,989)



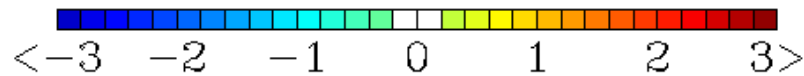
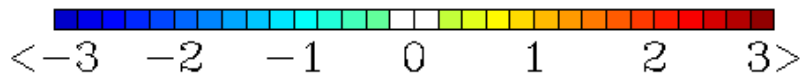
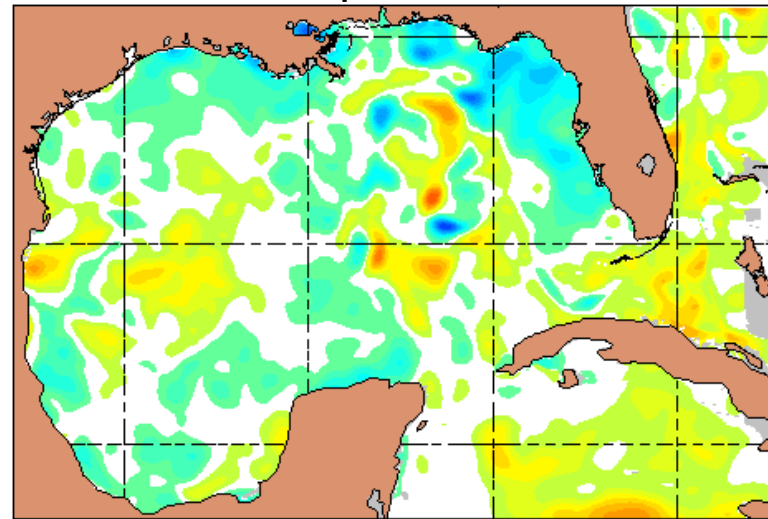
Sampled SST (14,228)



SST Increments



Surface Temperature Increments



Selection Criteria:  $\delta T$  0.1 °C, sample every 4<sup>th</sup> grid node



# Model/Data Issues and Solutions

## Dropped Analysis Volumes

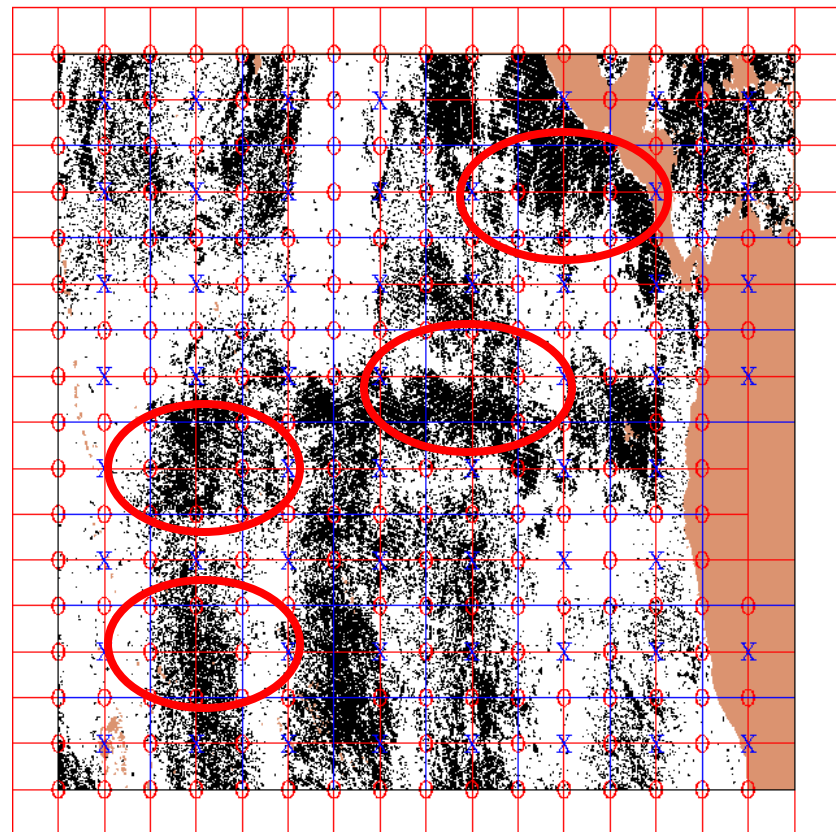
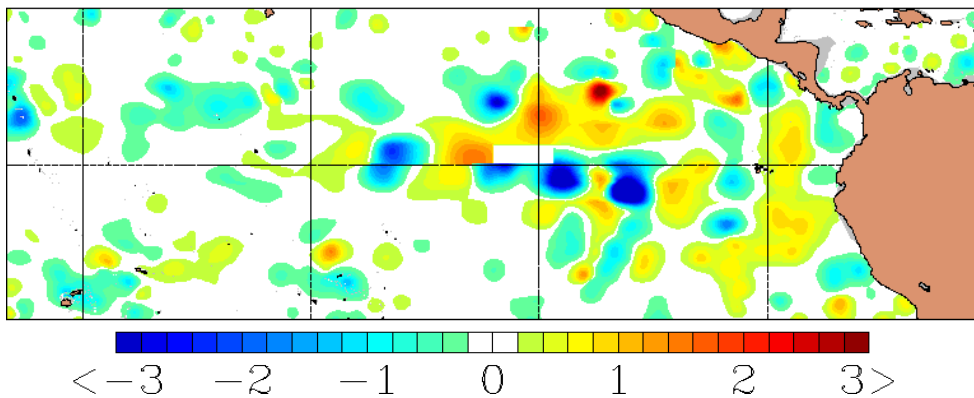
Effect of observation density and high resolution grid.

Processor work computed as product of number of data and number of grid points – used in load balancing algorithm.

Computed work value exceeded 32-bit integer – result is a negative number

Volume would be skipped (no work to do)

Temperature Analyzed Increment (C) 73 M Depth  
10 Mar 04 00Z Tau 000 9 km grid



Analysis (X) and overlap volumes (o)

Ovals indicate missing volumes

Increments show discontinuities at missing volume edges



# Analysis Covariance Consistency

$$J_{\min} = [\mathbf{y} - \mathbf{H}(\mathbf{x}_b)]^T (\mathbf{H}\mathbf{P}_b\mathbf{H}^T + \mathbf{R})^{-1} [\mathbf{y} - \mathbf{H}(\mathbf{x}_b)]$$

$\mathbf{P}_b$  – background error covariance       $\mathbf{R}$  – observation error covariance

$\mathbf{y}$  – observation vector       $\mathbf{H}$  – linearized forward operator

$\mathbf{x}_b$  – background       $[\mathbf{y} - \mathbf{H}(\mathbf{x}_b)]$  – innovation vector ( $\mathbf{d}$ )

If  $\mathbf{P}_b$  and  $\mathbf{R}$  are specified consistent with the innovations,  $J_{\min}/n_{\text{obs}} = 1$ .

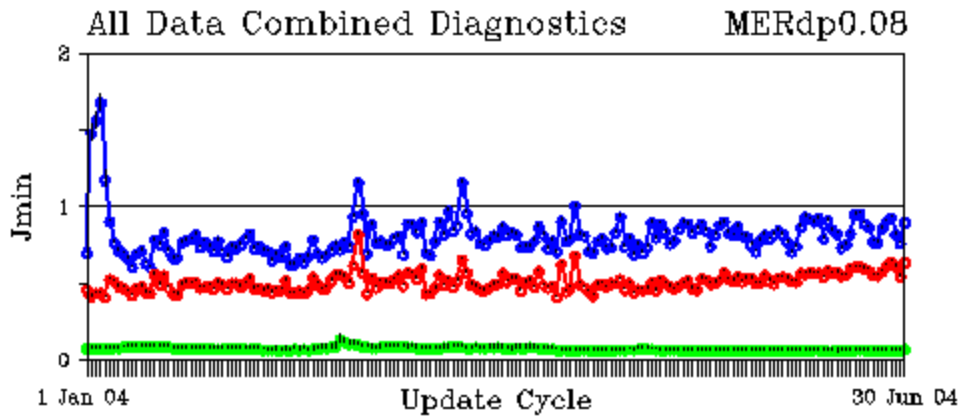
Note that the gain matrix  $(\mathbf{H}\mathbf{P}_b\mathbf{H}^T + \mathbf{R})^{-1}$  is the covariance of the innovations,

$$\mathbf{H}\mathbf{P}_b\mathbf{H}^T + \mathbf{R} = \mathbf{E}(\mathbf{d}\mathbf{d}^T).$$

If  $J_{\min} > 1$ , specified errors are too small (or erroneous data assimilated).

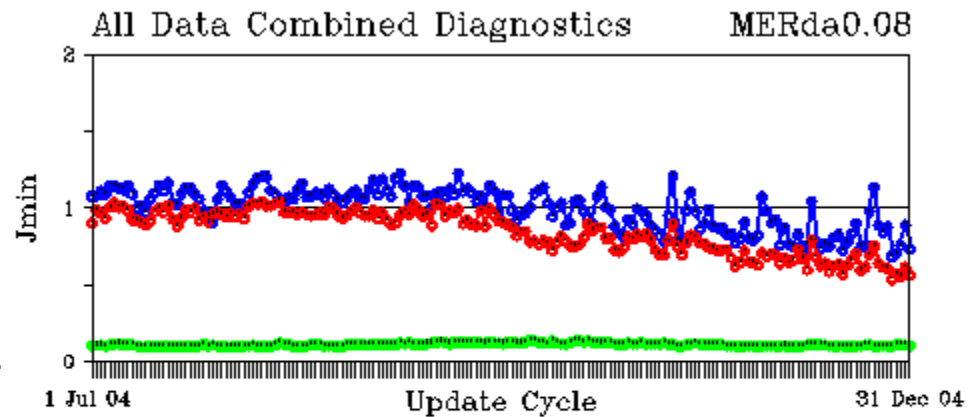
If  $J_{\min} < 1$ , specified errors are too large.

NCODA computes  $J_{\min}$  for all observing systems at each update cycle  
– used to monitor the background and/or observation error statistics.



NE Pacific – Jan to Jun 2004

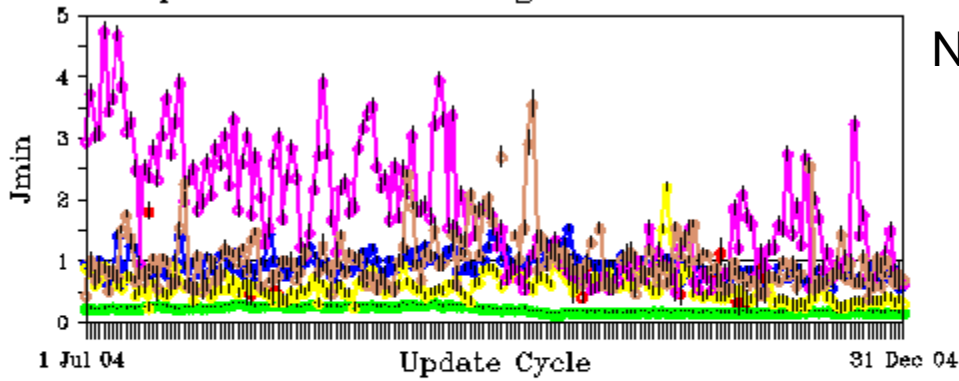
- Sea Surface Height
- Temperature Profiles
- Sea Surface Temperature



NW Atlantic – Jul to Dec 2004

- Sea Surface Height
- Temperature Profiles
- Sea Surface Temperature

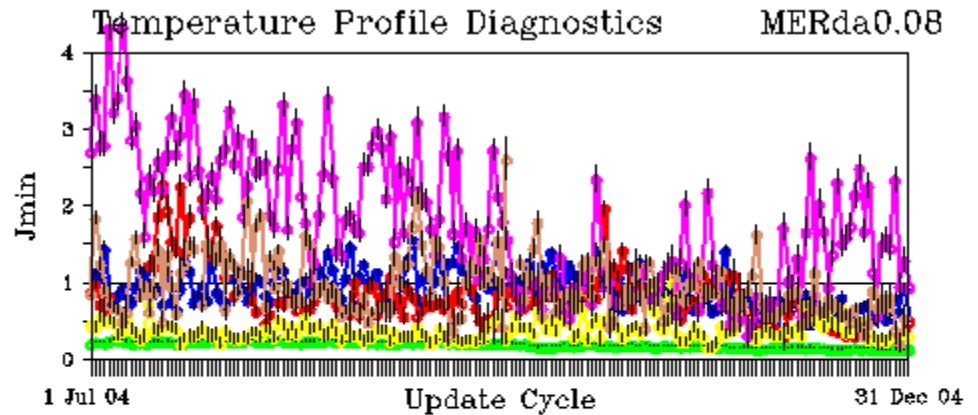
### Temperature Profile Diagnostics



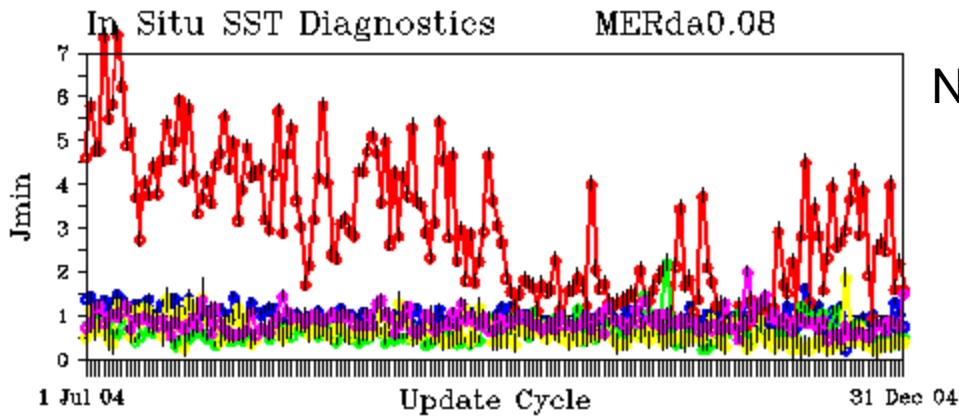
NE Pacific – Jul to Dec 2004

- expendable BT
- Fixed BUOY Temp
- Drifting BUOY Temp
- Direct Temperature
- TESAC Temperature
- Argo Float Temp

NW Atlantic – Jul to Dec 2004

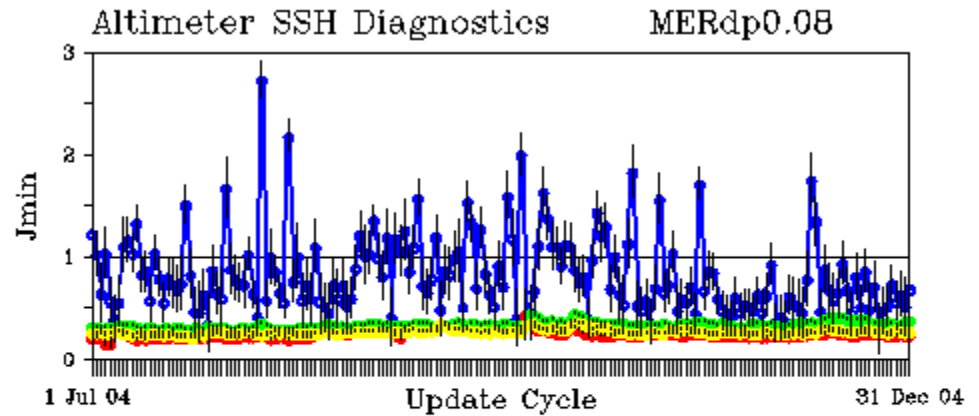


- expendable BT
- Fixed BUOY Temp
- Drifting BUOY Temp
- Direct Temperature
- TESAC Temperature
- Argo Float Temp



NW Atlantic – Jul to Dec 2004

- Hull Sensor SHIP
- Bucket SHIP
- Drifting BUOY Temp
- Fixed BUOY Temp
- ERI SHIP



NE Pacific – Jul to Dec 2004

- Envisat SSH
- Jason SSH
- GFO SSH
- In Situ SSH



# Summary Analysis Covariance Consistency

## Possible Reasons for Discrepancies – Need for Tuning

SSH ( $J_{\min} \ll 1$ )

- background errors too large (assuming we know the measurement errors)
- correlated errors – true with the background (data used more than once); spatially correlated error may exist among observations (orbit error, etc)
- neglecting correlated error results in giving altimeter SSH data too large a weight in analysis

Fixed Buoy Observations ( $J_{\min} \gg 1$ )

- prescribed observation errors are too small
- fixed buoy preprocessing (averaging hourly reports) creates erroneous data

Large Day-to-Day Fluctuations

- actual error in the forecast background likely to have significant variations
- specified background error covariance may be correct on average, but not in individual situations



# Validation of Altimeter Assimilation Methods

## Two Approaches in General Use

- Direct Method (Cooper Haines) – forecast model dependent
  - adjusts forecast density profile to be consistent with change in sea surface height from model forecast as measured by the altimeter
  - temperature and salinity adjustments are computed simultaneously, water mass properties on subsurface isopycnals are conserved
- Synthetic BT Method (MODAS) – forecast model independent
  - computes temperature at depth from SSHA using stored regressions of climatological temperature anomalies and dynamic height
  - salinity is computed from the synthetic (or float) temperatures using climatological temperature-salinity relationships

Both methods generate  $T(z)$  and  $S(z)$  using SSH and SST predictor variables



# Altimeter Assimilation Validation Experiment

## Compare $T(z)$ and $S(z)$ Profiles from SSH against Argo Profiles

Two Sources SSH predictor - *in situ* (Argo float) and altimeter

- Direct Method: (1) change of *in situ* SSH from successive float cycles  
(2) altimeter measured change of SSHA from float cycles
- Synthetic BT: (1) observed float SSHA  
(2) altimeter SSHA at float location and sampling time

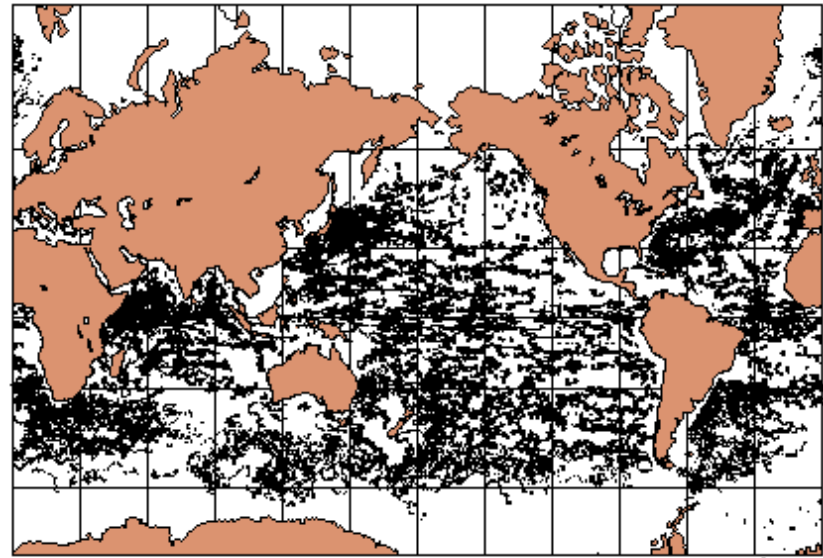
SST predictor taken from shallowest pressure level of verifying float

### Metrics

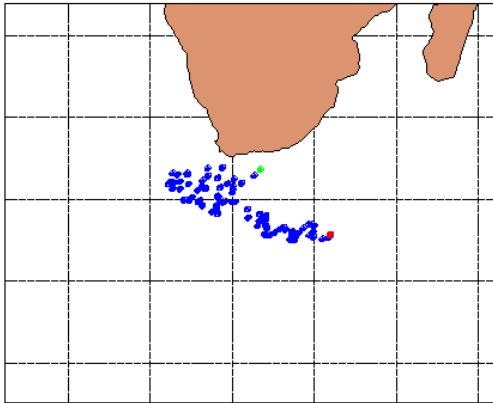
1. Do derived TS profiles predict float TS profiles of cycle  $N$  better than simple persistence forecast of cycle  $N$  from cycle  $N-1$ ?
2. Are solutions different when Argo *in situ* SSH is used as the predictor variable versus altimeter SSHA?
  - issue of non-steric effects in satellite altimeter observations
  - sensitivity of method to uncertainty in mapped altimeter SSHA data



## ***Argo Float Observations 2003 - 2005***

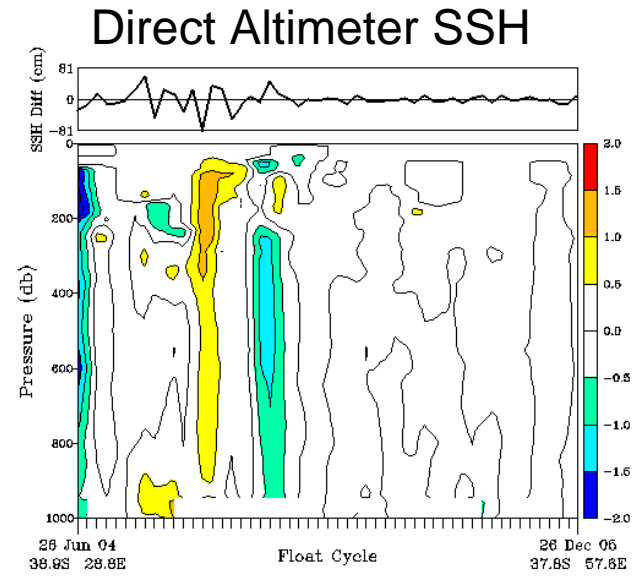
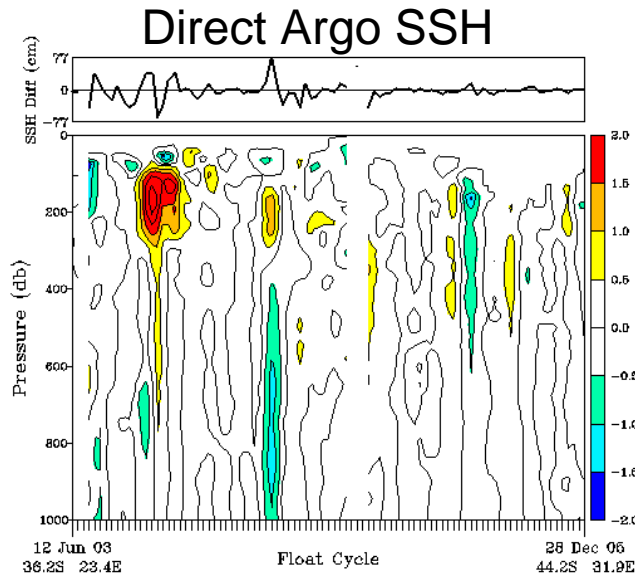


- float cycles retrieved from Monterey Argo GDAC;  
both R-mode and D-mode data used (no GTS DAC data)
- accept observed float pressure level if:
  - ascending profile, cycle number  $> 0$
  - T,S QC code = 1 or 5, pressure QC code = 0 or 1
- inconsistencies found in R-mode QC codes (D-mode data OK)
- result:
  - 2,080 call signs
  - 72,769 valid profiles (out of 86,338)
  - 10,636 delayed mode profiles

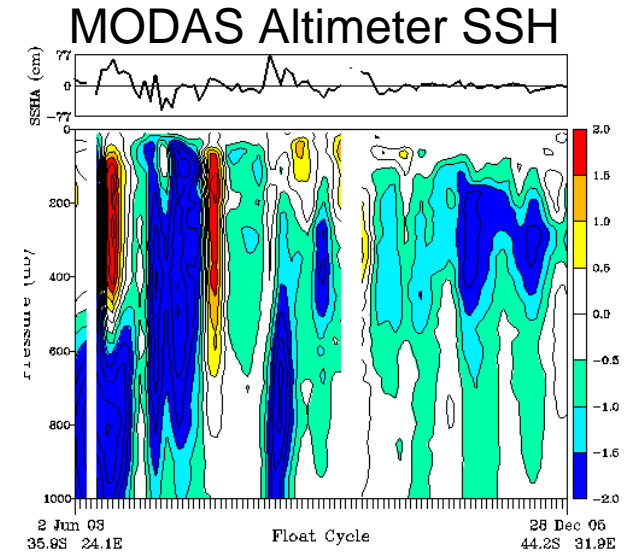
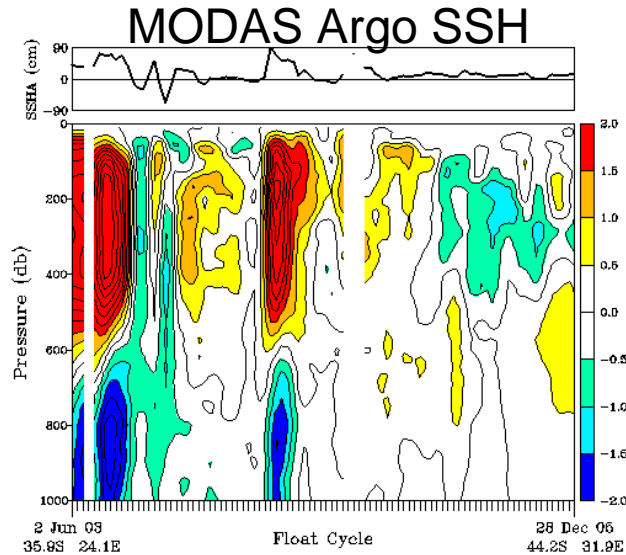
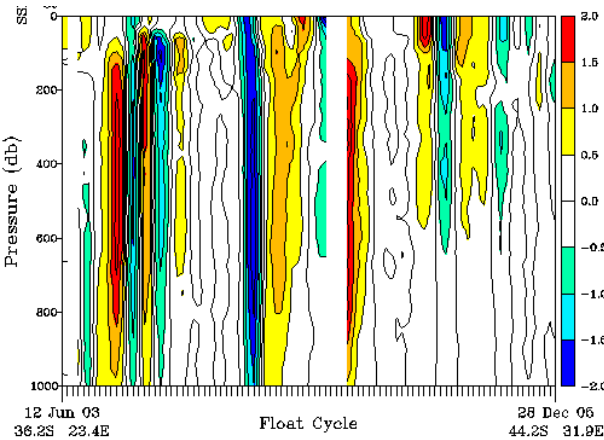


**1900221**

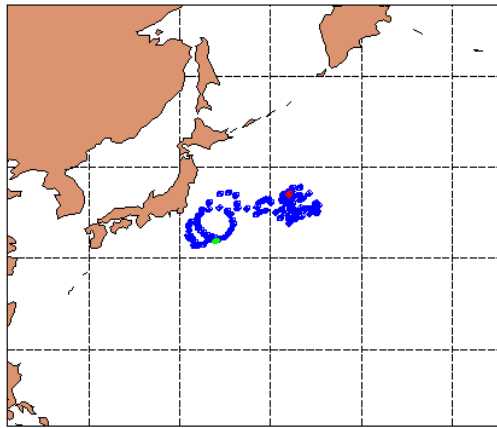
**2 Jun 03 - 28 Dec 05**



**Persistence**



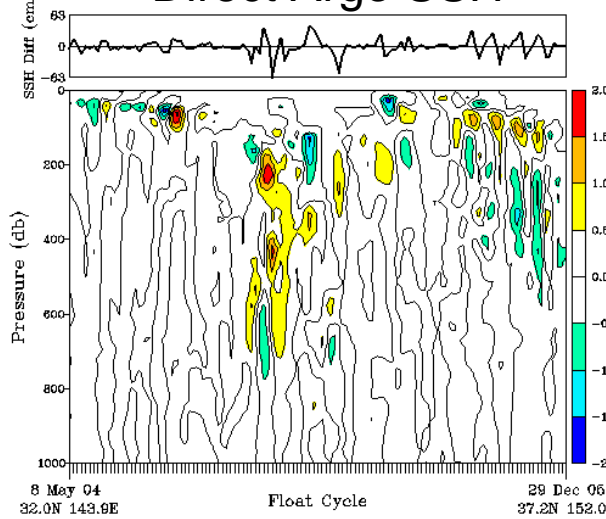
color slicing +/- 2°C



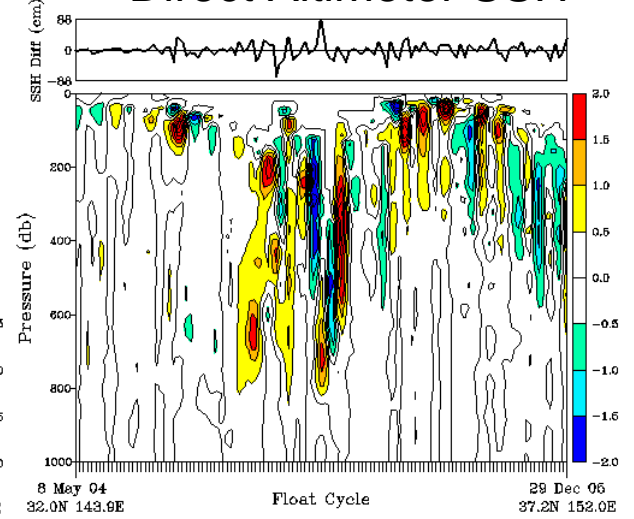
**2900139**

**5 May 04 - 29 Dec 05**

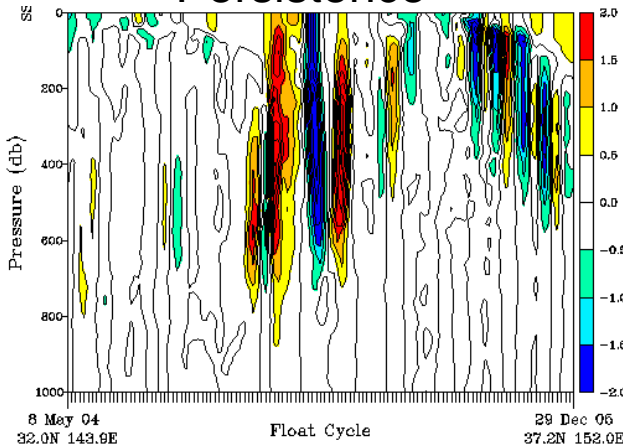
### Direct Argo SSH



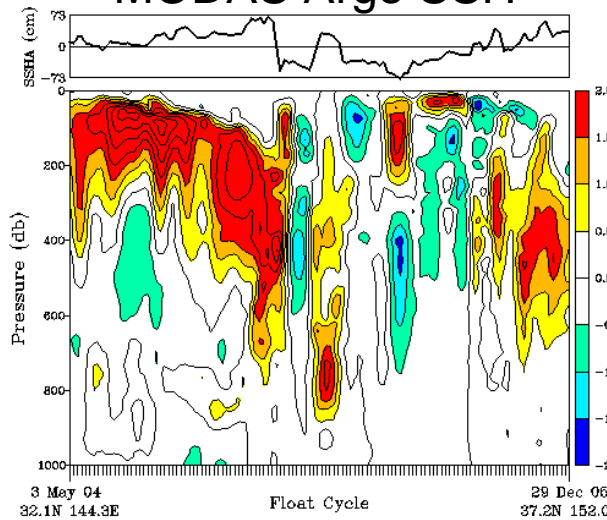
### Direct Altimeter SSH



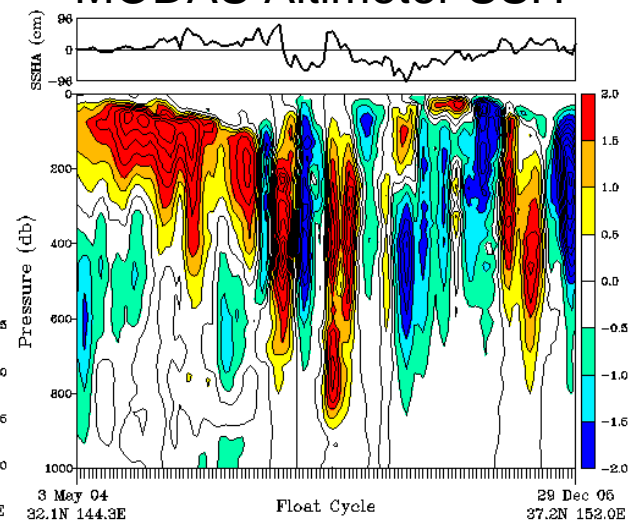
### Persistence



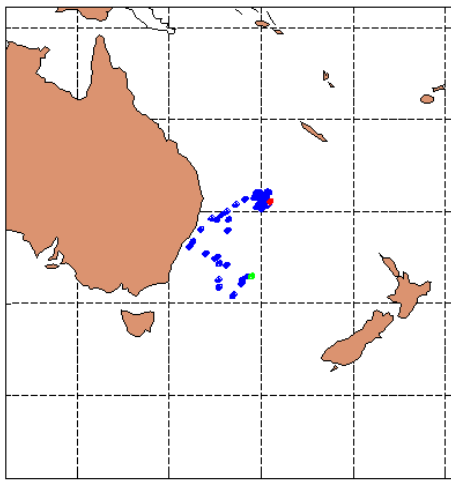
### MODAS Argo SSH



### MODAS Altimeter SSH

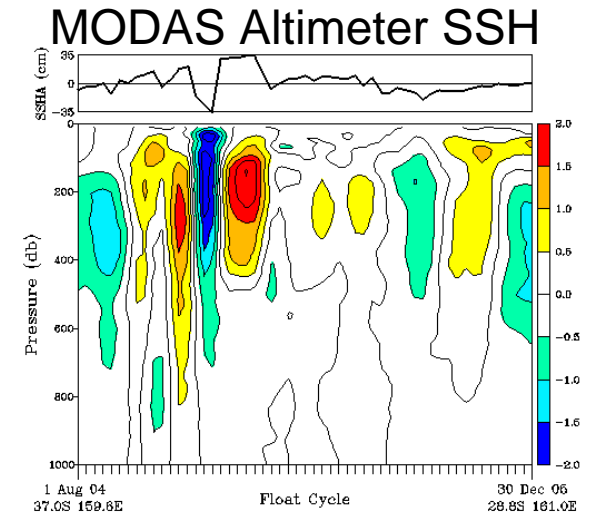
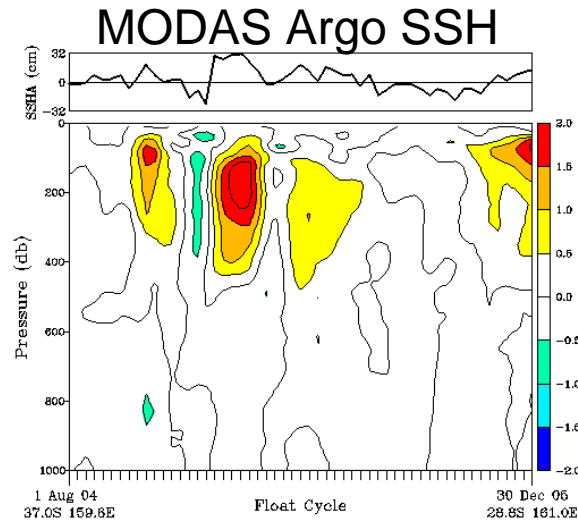
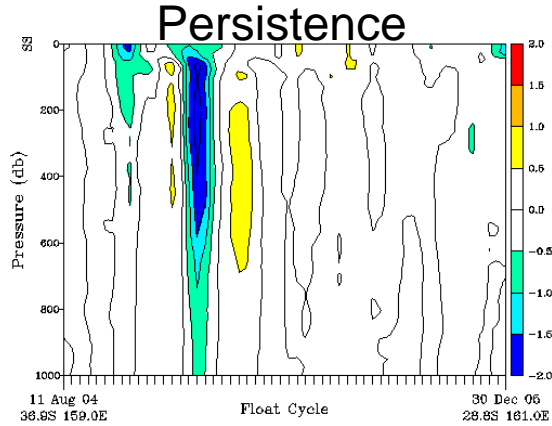
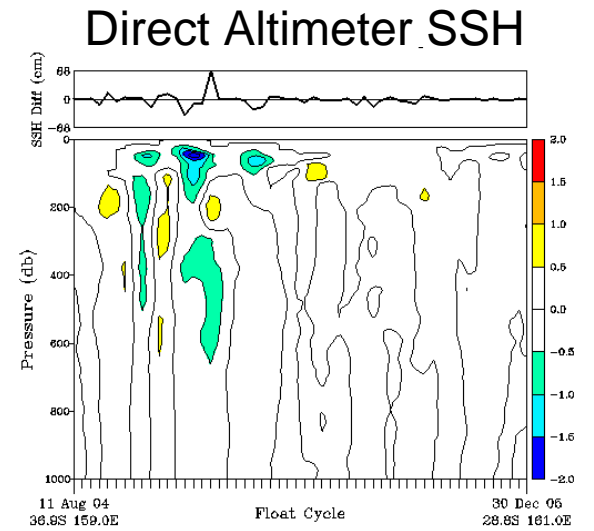
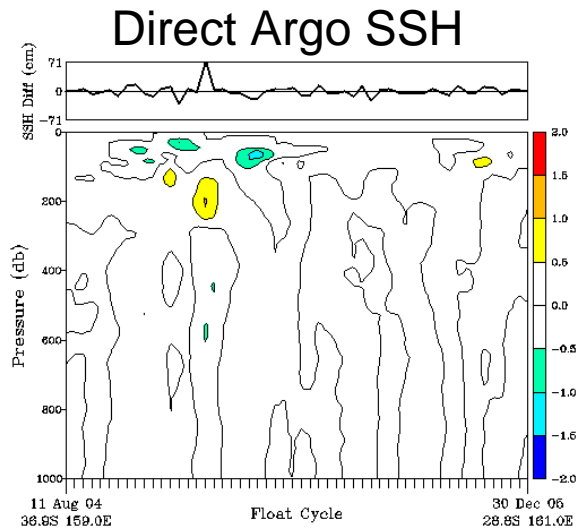


color slicing +/- 2°C

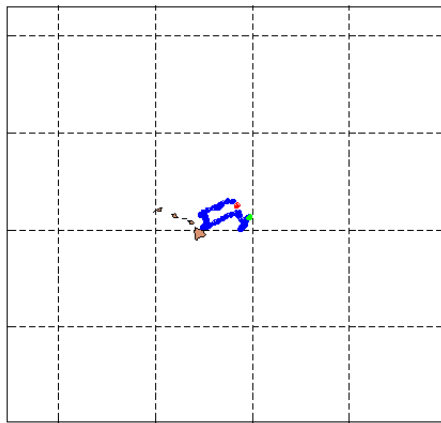


**5900602**

11 Aug 04 - 30 Dec 05

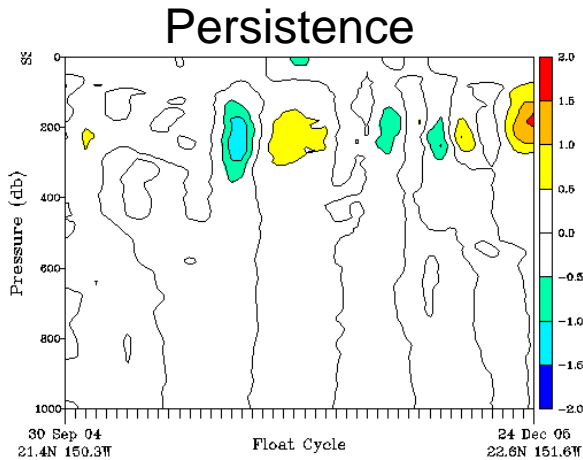
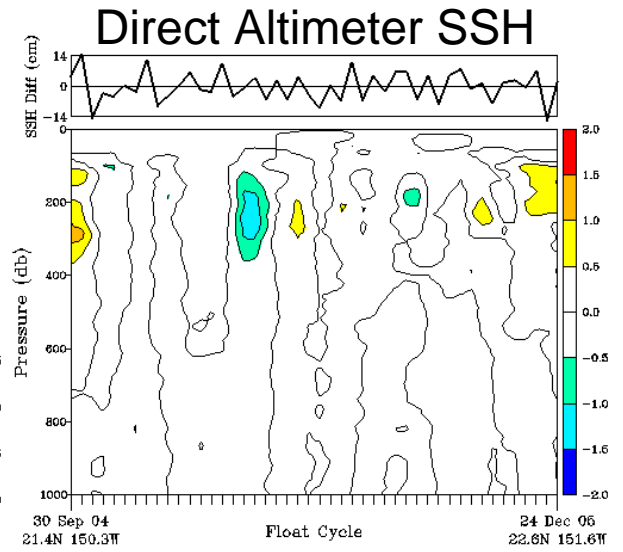
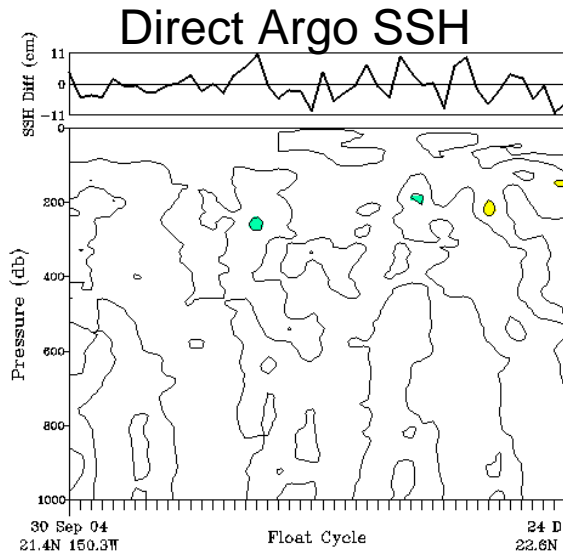


color slicing +/- 2°C

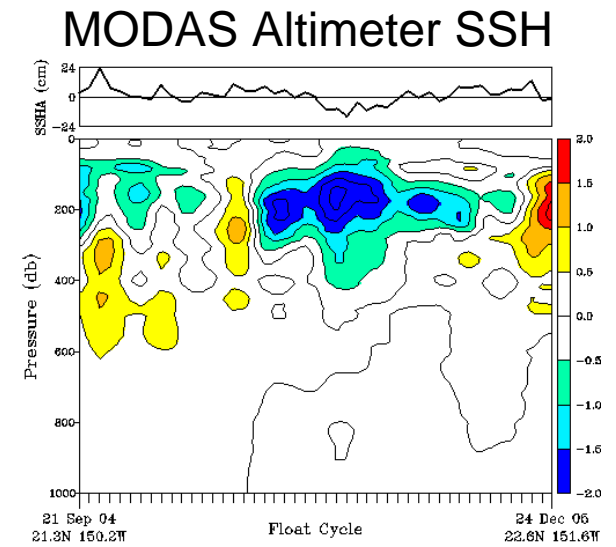
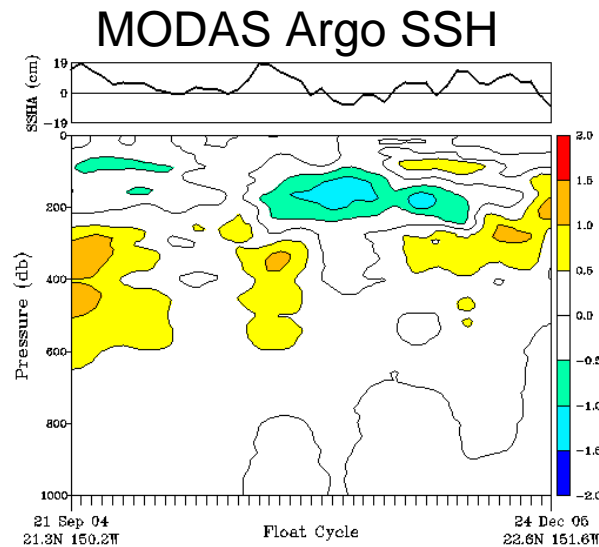


**5900648**

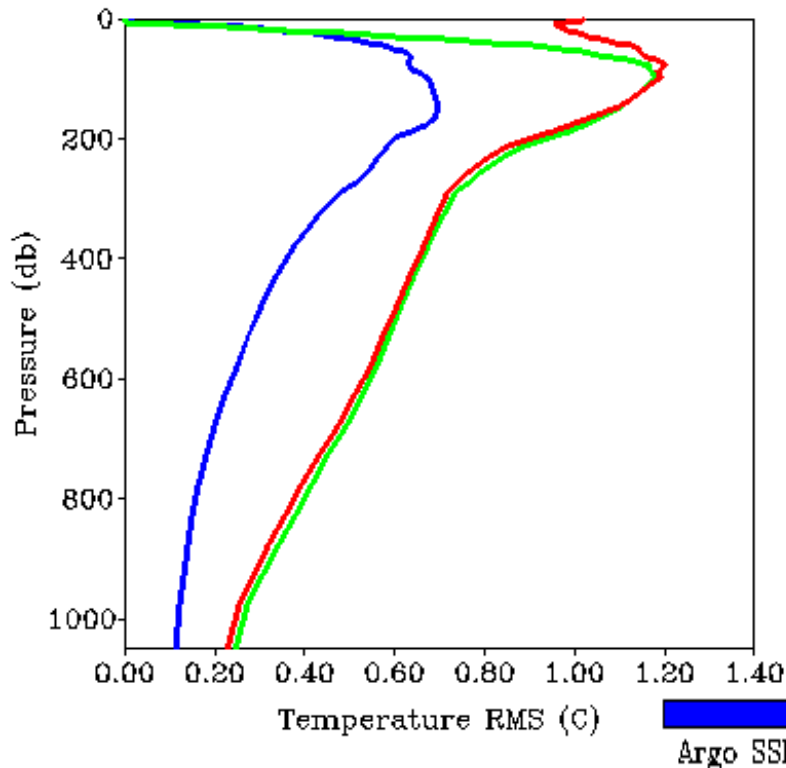
**30 Sep 04 - 24 Dec 05**



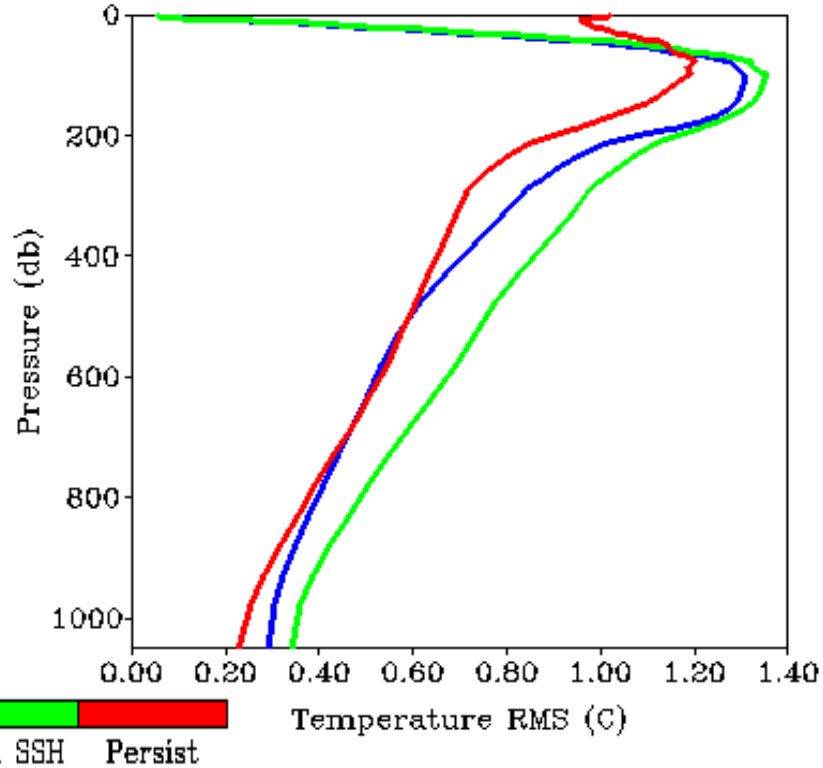
color slicing +/- 2°C



## Copper-Haines Direct Method



## MODAS Synthetic BT Method



- Skill sensitive to source of SSH predictor variable - best results obtained with true steric height computed from Argo float profiles
- MODAS worst than persistence. Why? - use of a climate basis function (large variance to model), historical profile sampling limitations, salinity affects, etc.
- Direct method errors may be artificially low – previous Argo float represents perfect model forecast - issues of model forecast errors, model drift remain in operational application of the method.



## *Transition 3D-MVOI to 3D-Var*

- funding in place for FY07 – FY09; work is on-going
- ocean 3D-Var based on NAVDAS (Roger Daley's 3D-Var for the atmosphere)
- advantages of 3D-Var are numerous
  - global solve – no more overlapping volumes (should run faster as a result)
  - greater flexibility for assimilating different observation data types
  - general framework for using more sophisticated background-error covariance models
- phased implementation approach planned
  - year 1: replace MVOI solver with 3D-Var solver (pre/post processing same)
  - year 2: relax horizontal and vertical grid restrictions, allow for non-separable vertical and horizontal correlations
  - year 3: incorporate new multivariate balance operators based on Anthony Weaver's work

***END***