

# State estimation and prediction in the NEC Bifurcation region

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SIO

# From the program

- One such method, that Lien advocated and that may inspire young scientists, is to analyse very high resolution data - obtained from in-situ measurements and high performance computers - using a geophysical fluid dynamics approach.
- Hua, McWilliams, Owens, An objective analysis of the Polymode dynamics program, Parts 1 and 2, JPO 1986

# State Estimation: find $x$ so $y = F(x)$

- “Mapping with benefits” (improved fields)
- The model is the hypothesis, including physics, resolution, parameters (e.g. topo), and forcing
- Don’t reject a model until other options have been explored (e.g. bad controls)
- Can enforce restricted balances if desired (QG)
- Goals: test the model, use dynamics to infer the complete ocean state from limited data

# Overview

- Trying to reach the goal of making models represent the real ocean, at least in a scale range
- Working from large scale to small, currently working down to 2.2 km resolution, with the goal of making it to sub-mesoscale. (SWOT)
- But: One person's new physics is another's computational nightmare. Large model state and strong nonlinearity are challenges

SSH

25 Nov 2005 (m)

Eta: 2005/11/25 (-0.0023299)

WBC transport  
Influences?

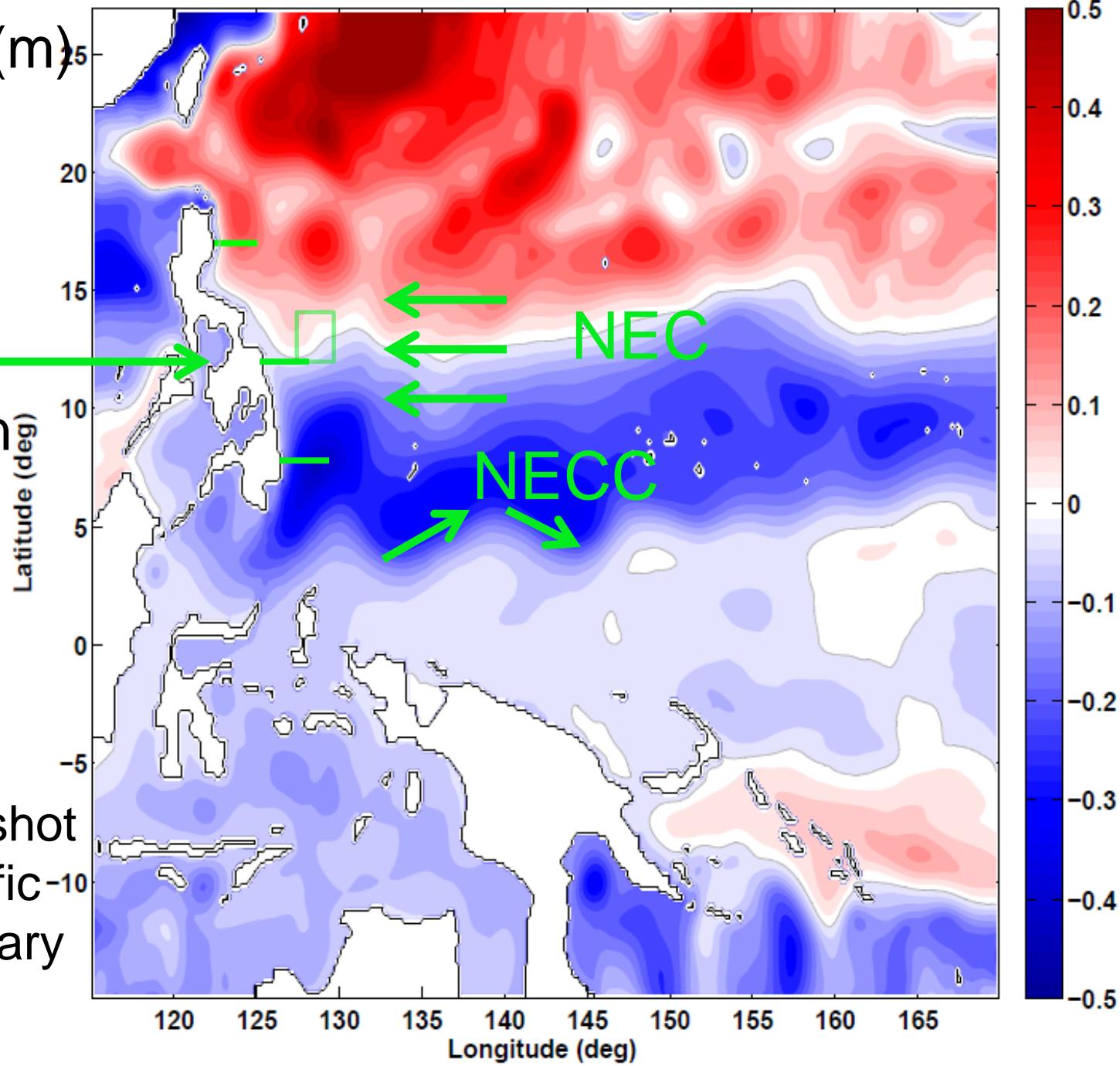
Qiu and Chen

JPO 2010

12-14N

127-130E

Example: snapshot  
Of tropical Pacific  
Western Boundary



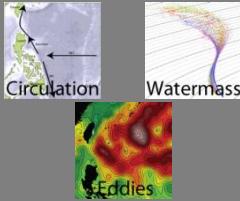
# Science motivation

- Influences and predictability of the Western Boundary Current (WBC) near the bifurcation
  - Which influences are most important?
  - What is predictable? Over what time range?
  - Pathways of forcing to the boundary
    - Waves? Eddies? Advection? (momentum and water masses)
- Test of model using the forecasts as cross-validation of the state estimate
- Evaluation of dynamical balances: how nonlinear?

# Procedure

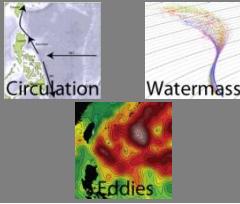
- Regional, month-long state estimates 2010-2013
- Combine most observations with dynamics
- Use as ocean reanalysis for the observations
- Diagnose physical controls and mechanisms
- Assess predictability, use prediction as a cross-validation of the state estimate against independent future observations.

# Example Interests



- Bifurcation latitude (Qiu and Chen 2010, ...)
- NEC strength, transport
- Sub-surface countercurrent transport
- Kuroshio transport at various latitudes
- Mindanao Current strength
- Water mass properties
- Salinity variance on isopycnals
- Other integrated measures (?)

# MITgcm configuration



1/6 degree regional: 115E-170E, 15S-30N

50 levels with 2.5m spacing in the upper ocean

Surface forcing is derived from NCEP/NCAR  
Reanalysis (1 degree, daily averaged)

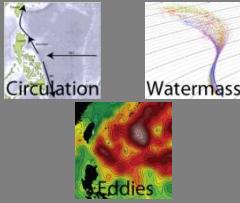
Initial and boundary conditions from global  
HYCOM-NCODA (tend to be very good)

Testing included simulating 2004 -2012 and  
comparing to AVISO SSH

# State Estimation for OKMC

- Fit model to observations using 4D-Var (adjoint):  $\min(y - F(x))$  by adjusting  $x$
- Adjust initial conditions, boundary conditions, and forcing (within error bars)
- Estimate is a free forward run of the model that should match the observations (within error bars) (i.e. “Phase validation”)
- Is a dynamically-consistent reanalysis for research use, including sensitivities

# Observations



- Along-track altimeter sea surface height
- Temperature and salinity profiles from Argo, Spray gliders
- Geoid constraints from GRACE (“HMEAN”)
- SST from TMI and AMSR-E (microwave)
- To add: Seagliders, moorings, etc.
- 1 month windows, use observations only in a sub-region of the model domain
- Analysis starts Jan 2010

# Glider observations of the North Equatorial Current

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Daniel L. Rudnick

Scripps Institution of Oceanography  
24 February 2014



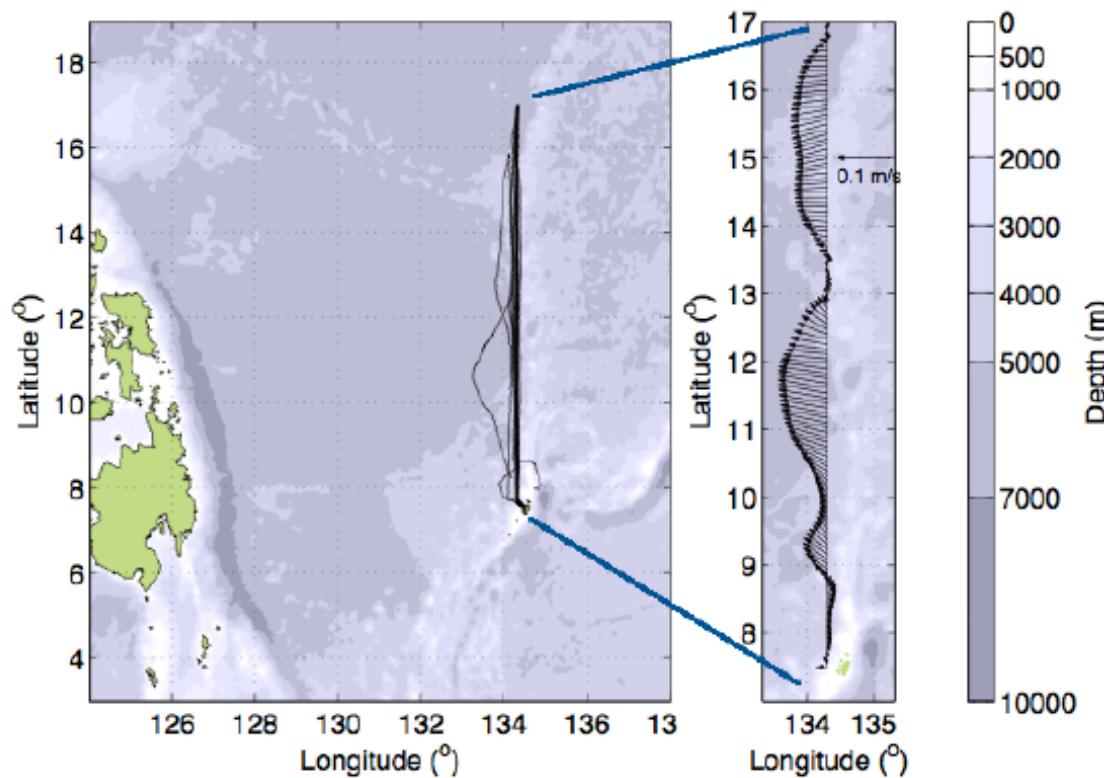


# Glider Observations



## North Equatorial Current (NEC) Section:

134.3 E, 7.5 N to 17 N



## Objectives:

- Provide an estimate of NEC mean transport and variability
- Determine water masses and their large scale variability
- Provide an estimate of fine scale variability of water masses

## Dates of Observation:

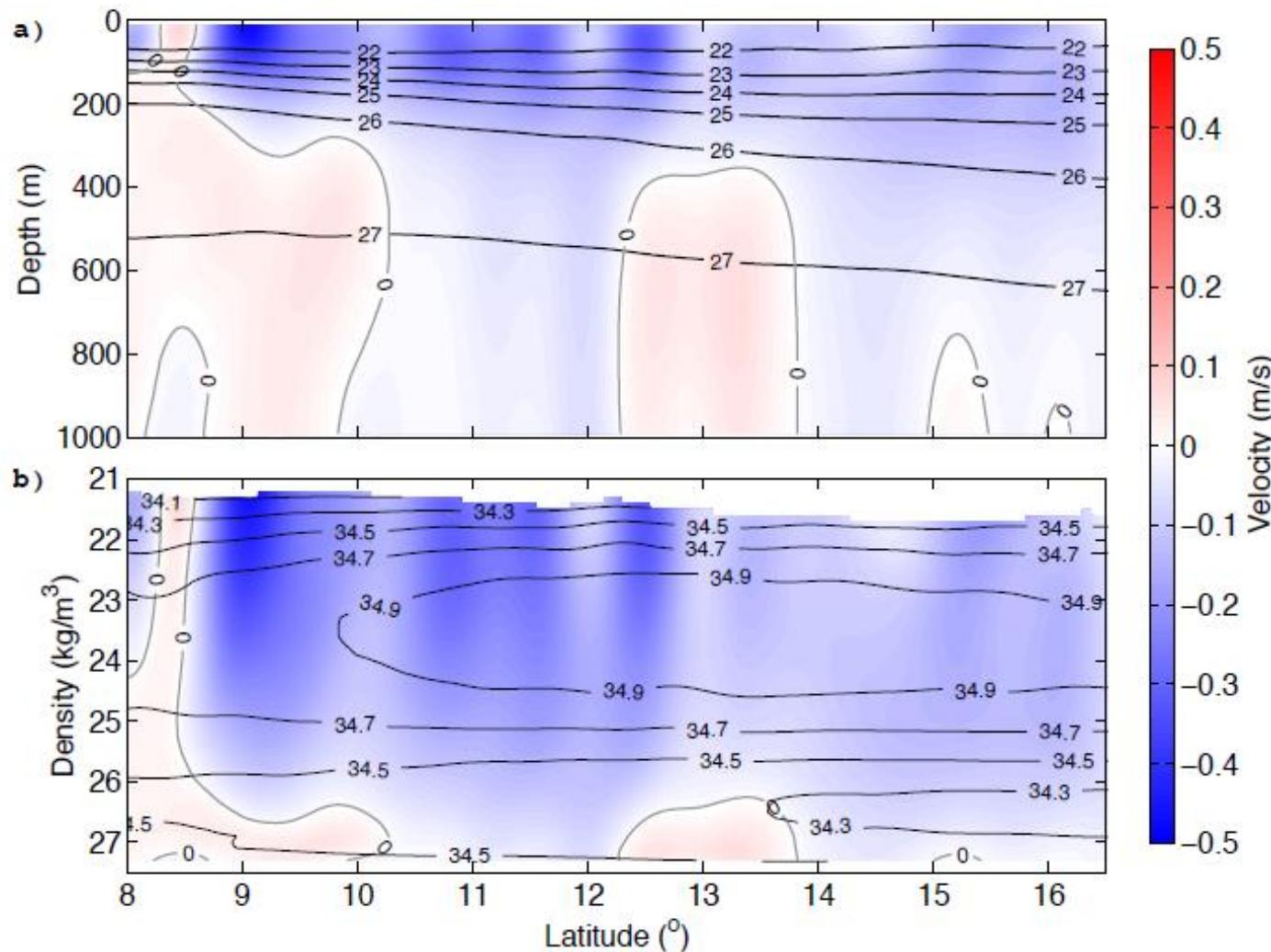
June 2009 - January 2014

Number of NEC sections: 18

Number of dives: 4281



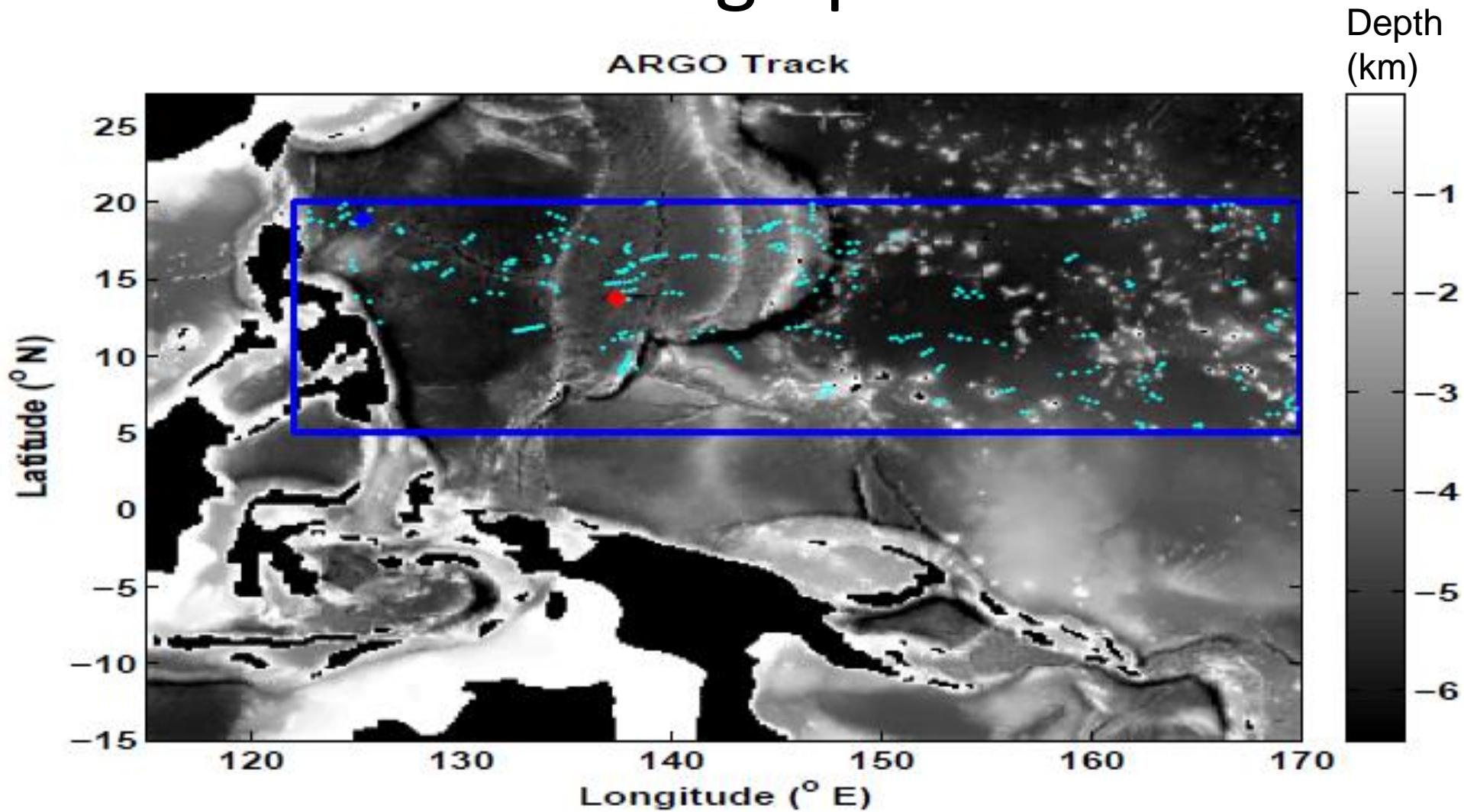
## Geostrophic Velocity: Mean Section



- Mean sections are from objective map of all data.
  - Negative indicates westward.
  - Maximum mean surface velocity:
    - 0.47 m/s
  - Undercurrents present in all sections, mean location 9.6 N and 13.1 N
  - Top of undercurrents at 26  $\sigma_\theta$

# Example: December 2012

## Locations of Argo profiles used

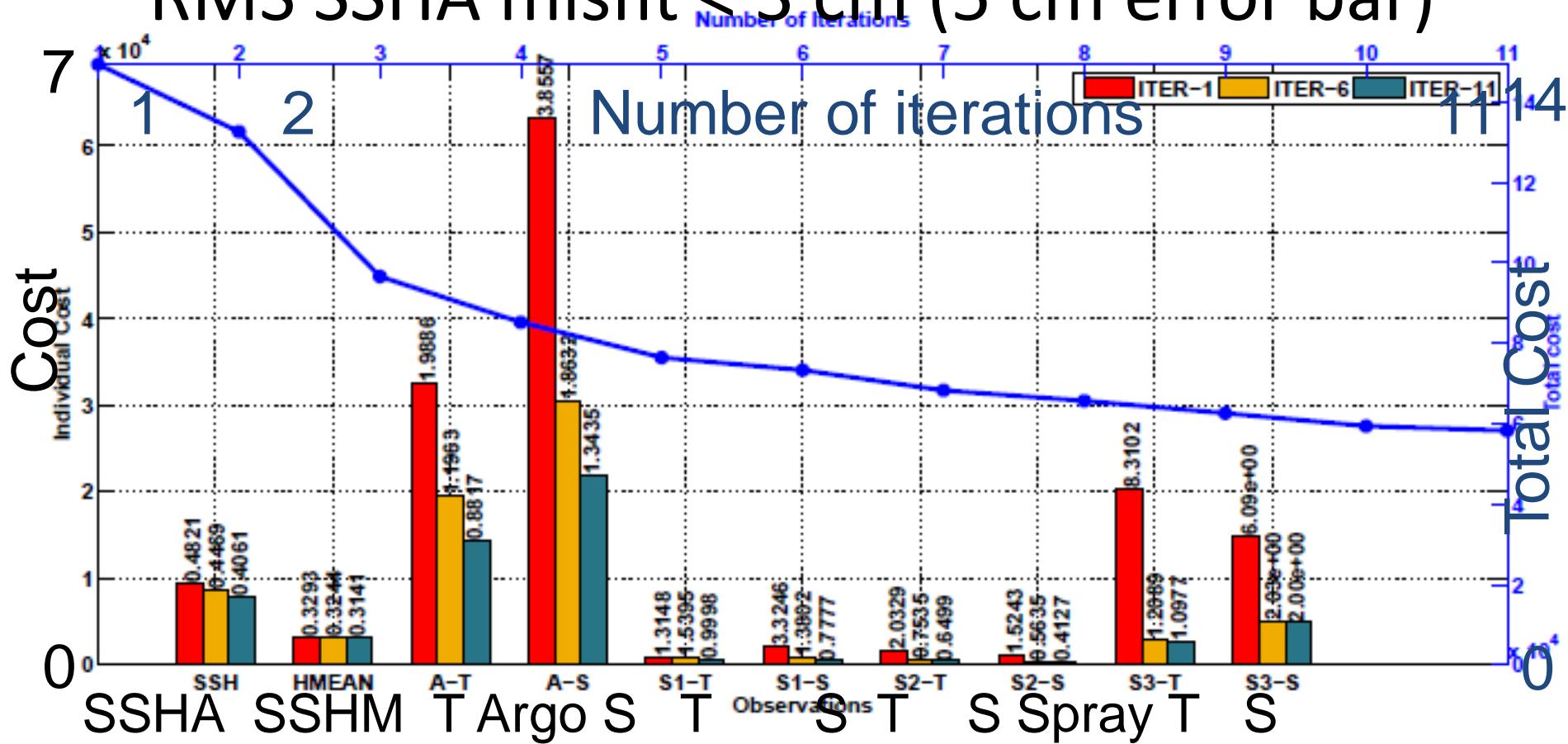


# Example: December 2011

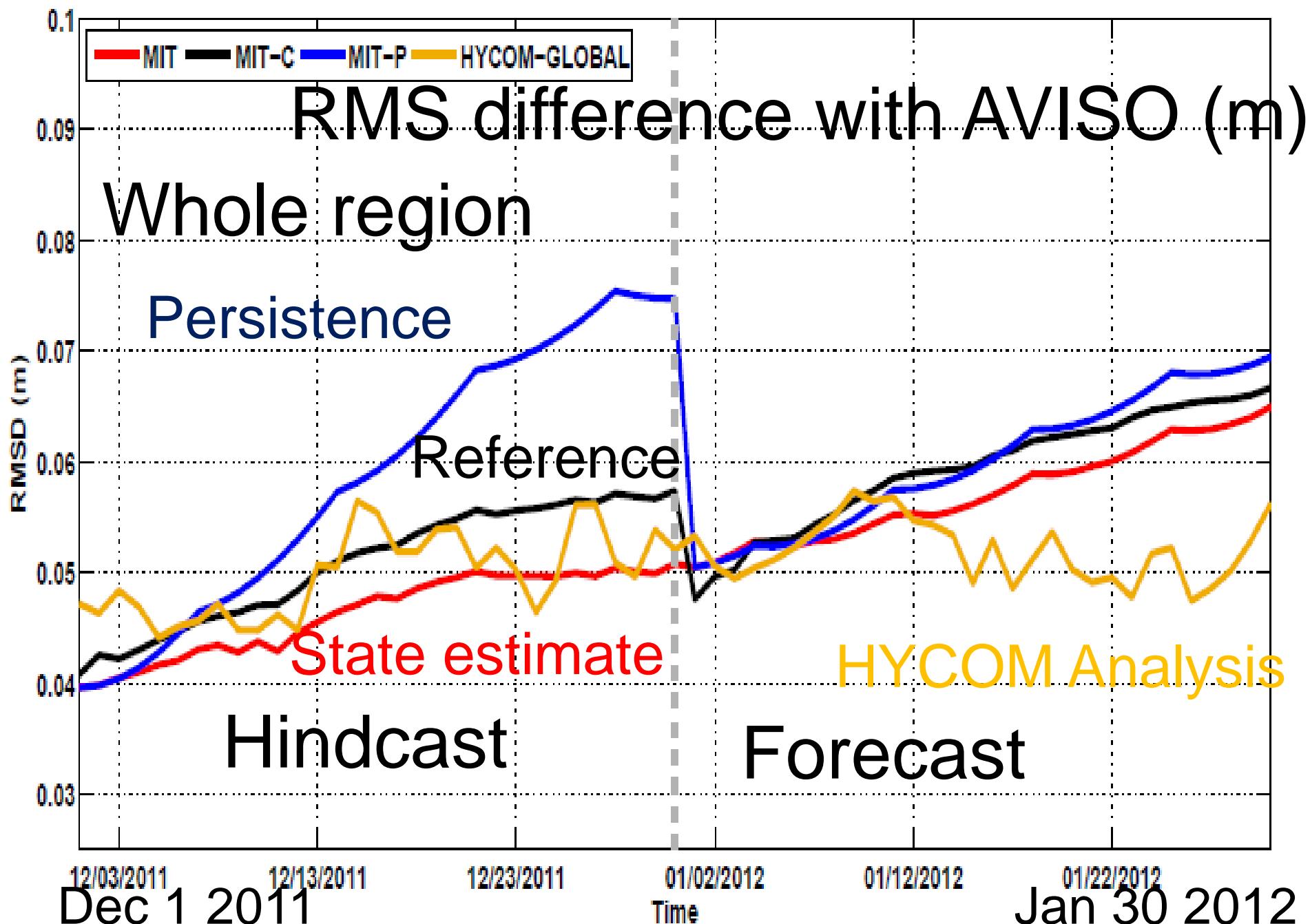
Cost function reduced by 60%

Largest reductions: T and S, Argo and Spray

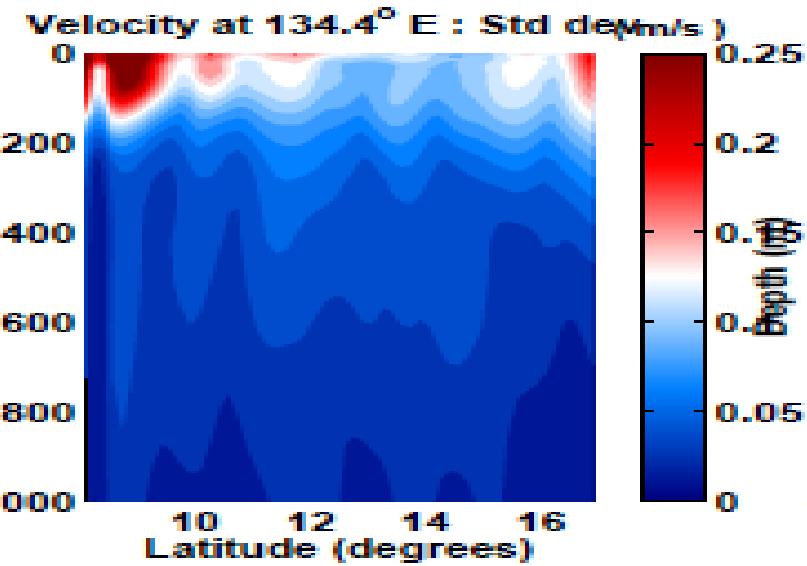
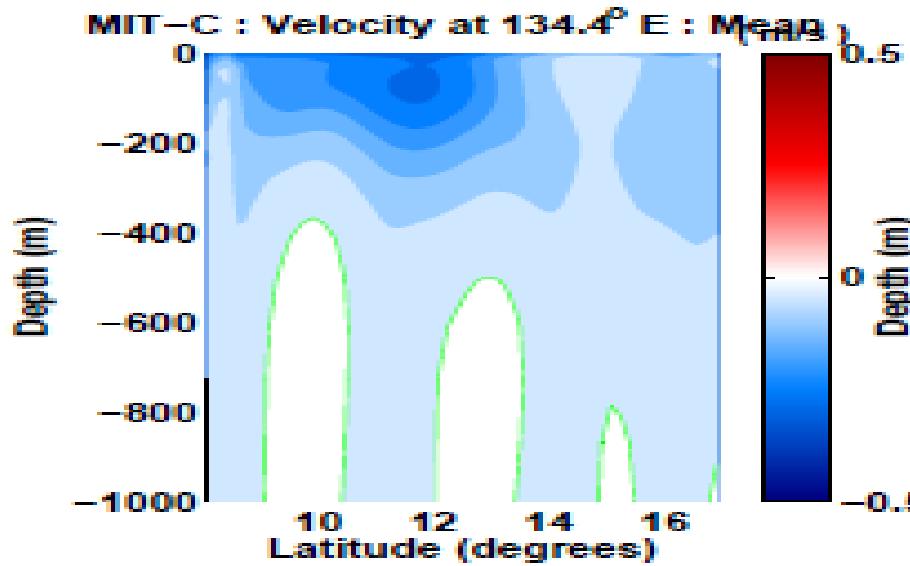
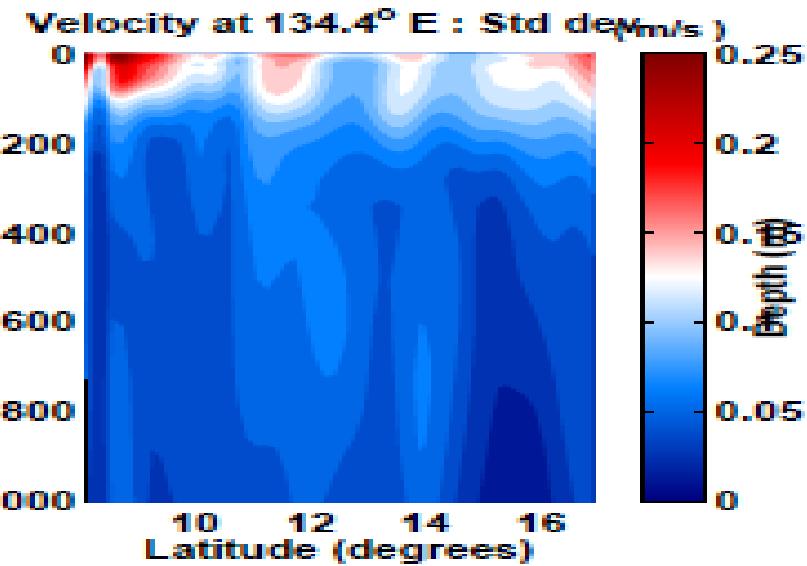
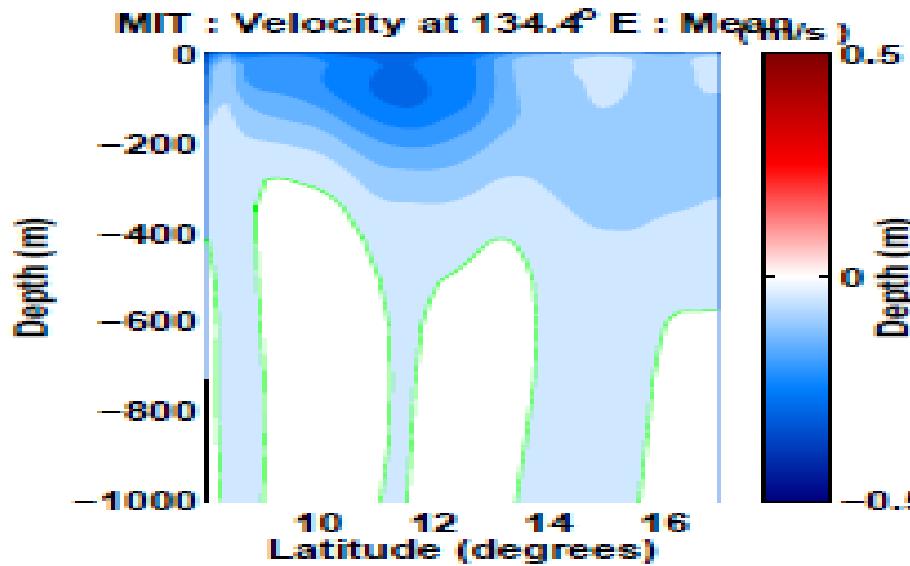
RMS SSHA misfit < 3 cm (5 cm error bar)



## SSH RMSD : AVISO



# NEC: State Estimates (top), First guess 2010 mean



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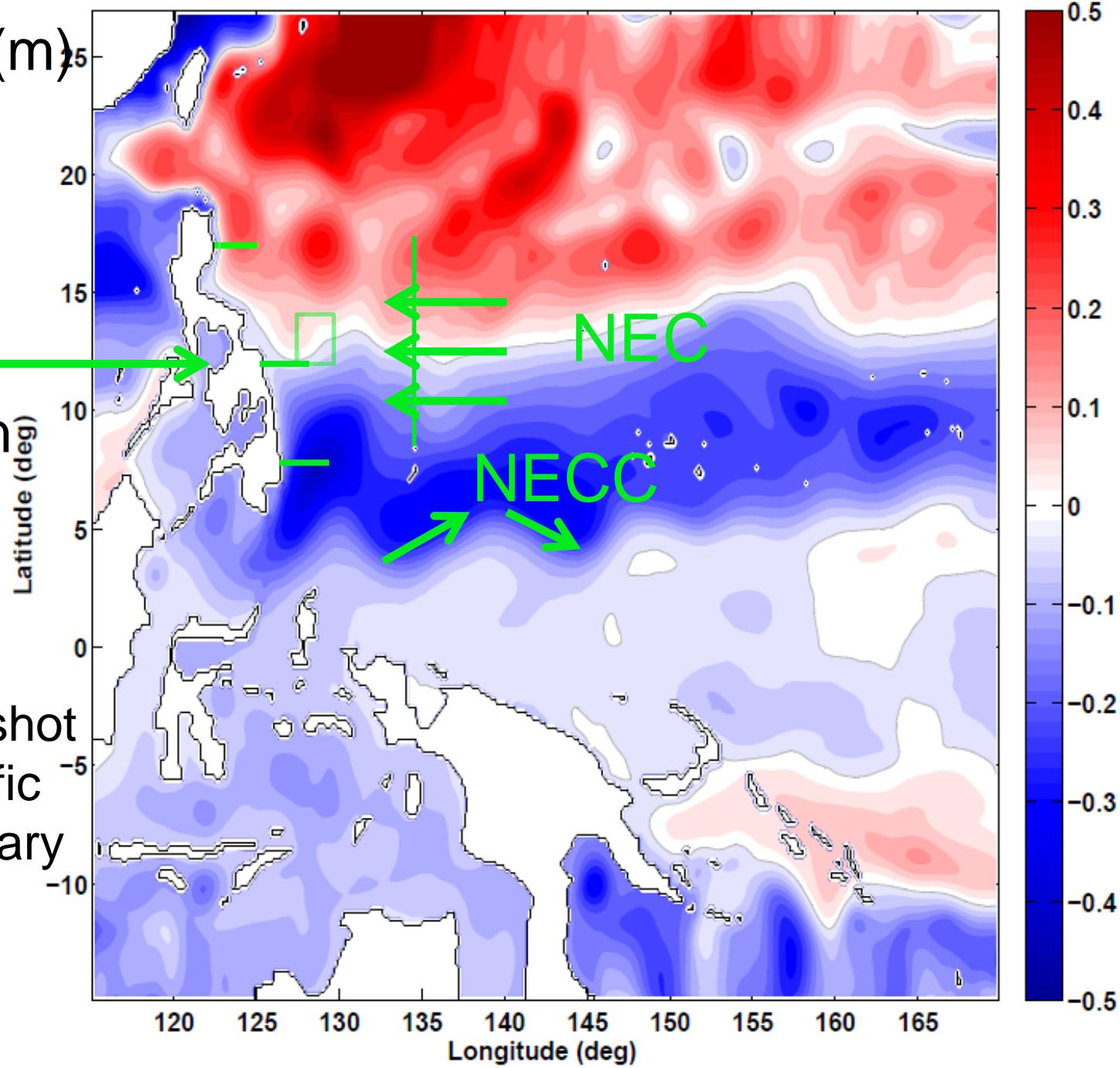
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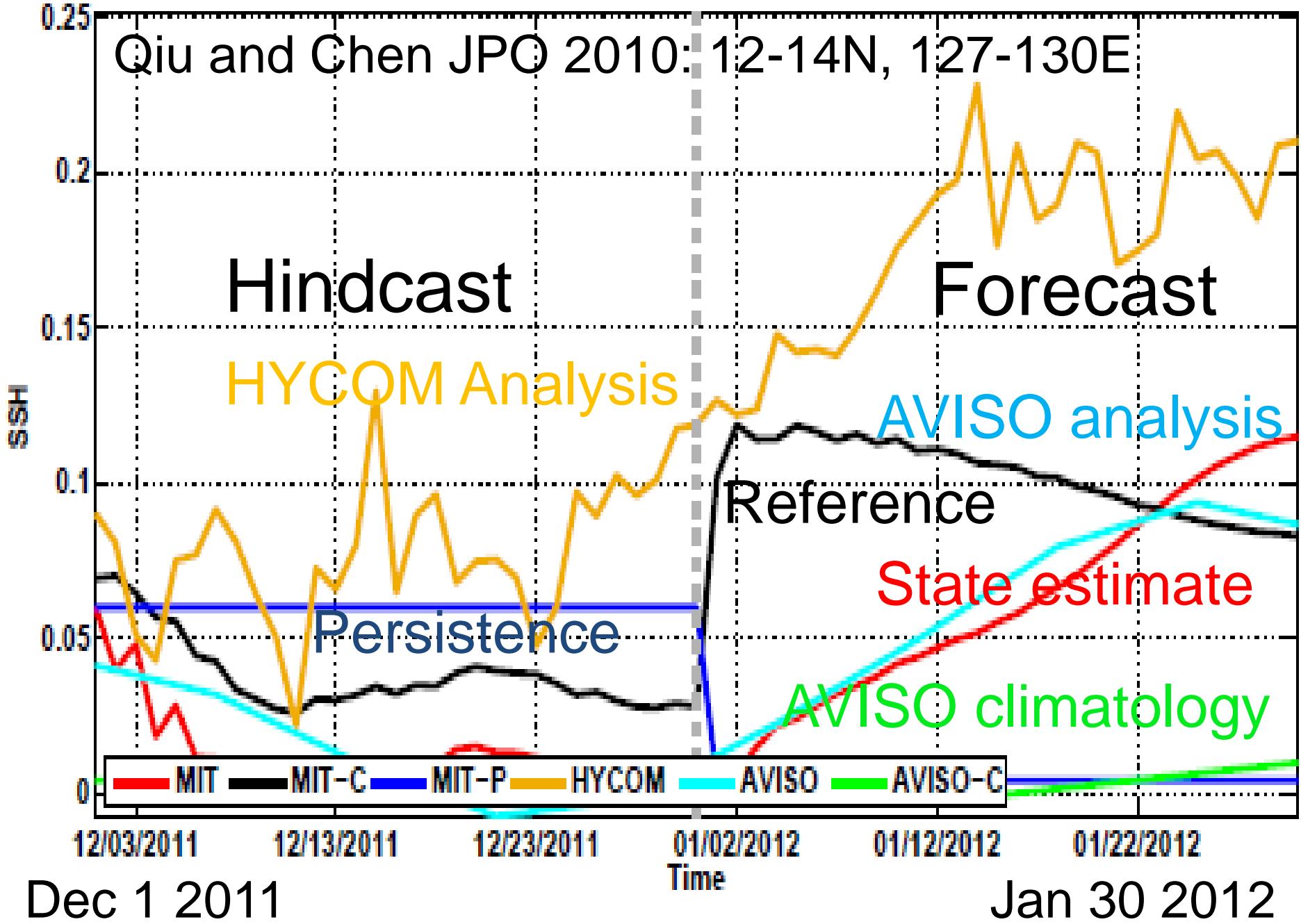
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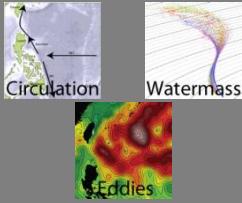


# Average SSH in region (m)

SSH INDEX at 12 N



# Conclusions/Discussion



- State estimation works in the region, but needs to be refined: ongoing work
- State estimation tested by forecast
- North Equatorial Undercurrents are enhanced by state estimate in 2010 mean
- Will use the model to diagnose the controls in the undercurrents, boundaries