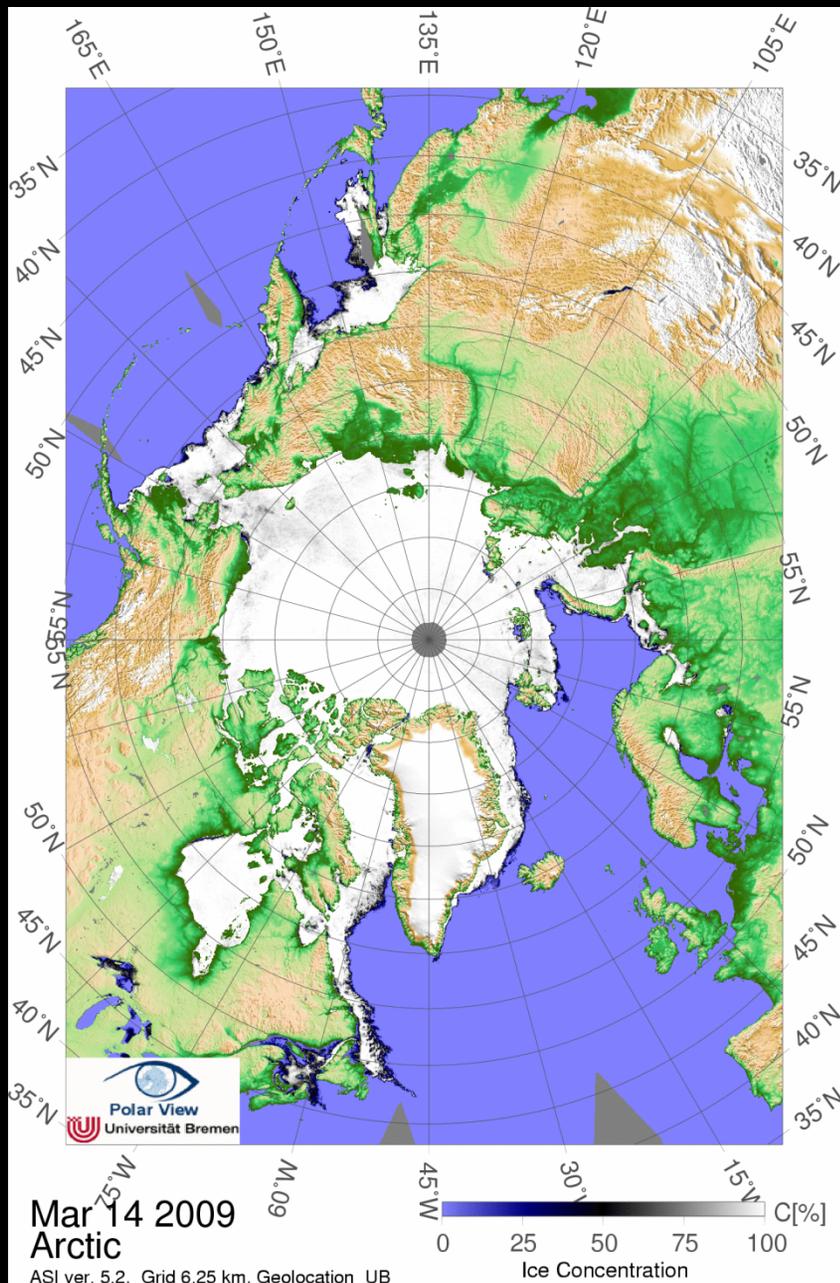


# Assimilation of Sea Ice Concentration Observations in a Coupled Ocean-Sea Ice Model using the Adjoint Method



Section 1

# **OCEAN-SEA ICE STATE ESTIMATION USING ADJOINT METHOD**

# Ocean - Sea Ice State Estimation

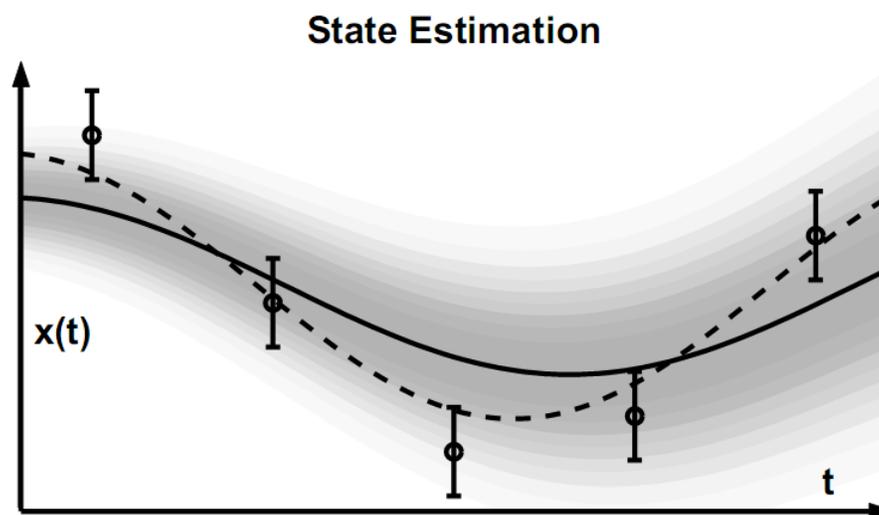
## Methodology: Adjoint Method

Goal is to generate a dynamical reconstruction of the three dimensional time-varying ocean-sea ice system : state estimate

Essentially , model and observations are reconciled in a least-squares sense

System evolves on the merits of the physics and thermodynamics encoded in the numerical model given *initial* and *boundary* conditions

Iteratively adjust *initial* and *boundary* conditions using information provided by the Lagrange multipliers of the system, as provided by model adjoint.



J. Gebbie 2004 Thesis

Circle/bars : observations + uncertainties  
Solid : initial state trajectory  
Dashed : improved state estimate

## Practical Lagrange Multipliers for Thermodynamic Sea Ice Model

Information in the Lagrange multipliers is used to choose adjustments to model initial and boundary conditions so as to reduce model-data misfit

Lagrange multipliers evolve through the ocean-ice adjoint model, which is itself driven by model-data misfit

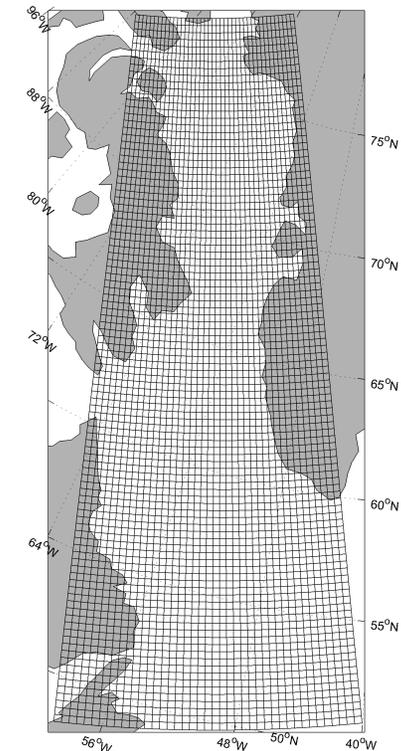
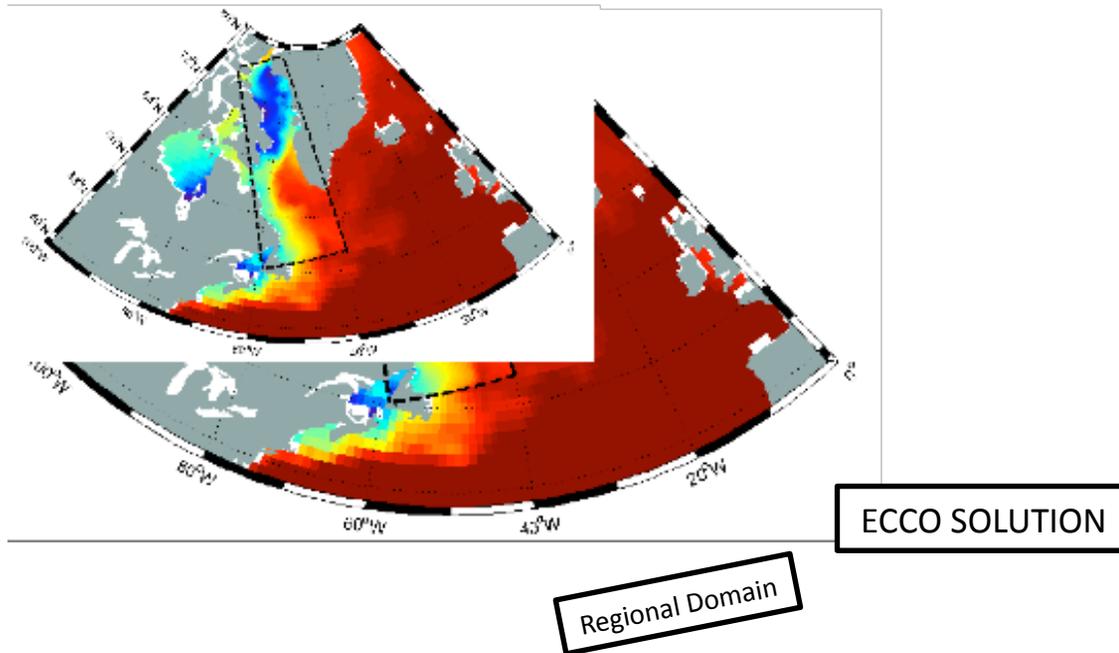
Thermodynamic sea ice model adjoint driven by sea ice concentration misfit

Complications arise when an observation indicates sea ice but forward model trajectory is ice free.

In this case the Lagrange multipliers evolving through the pure sea ice adjoint are zero.

- Assume model is ice-free because of ocean has not yet been forced to the freezing point
- Sea ice concentration observations →
  - Proxy SST
  - Proxy upper ocean stratification
- Proxy SST
  - Assume SST under sea ice is at the salinity determined freezing point
  - Effect is to change atm. state so as to increase air-sea heat fluxes and decrease initial thermal reservoir in the upper ocean
- Proxy Stratification
  - Assume a well stratified ~ 50 m stratified mixed layer beneath ice, stratified by salinity
  - Effect is to modify initial and lateral open boundary ocean conditions.

# Model, Initialization, and Boundary Forcing



Ocean : 3-D prognostic Ocean Model (MITgcm) + KPP Mixed Layer

Ice: Hibler VP + Semtner 0-Layer Ice Thermo + Snow

Initial Condition Guess : ECCO ocean state estimate

NCEP 6 hourly reanalysis (Fluxes calculated by model)

Time Window : 1 year and 12 years

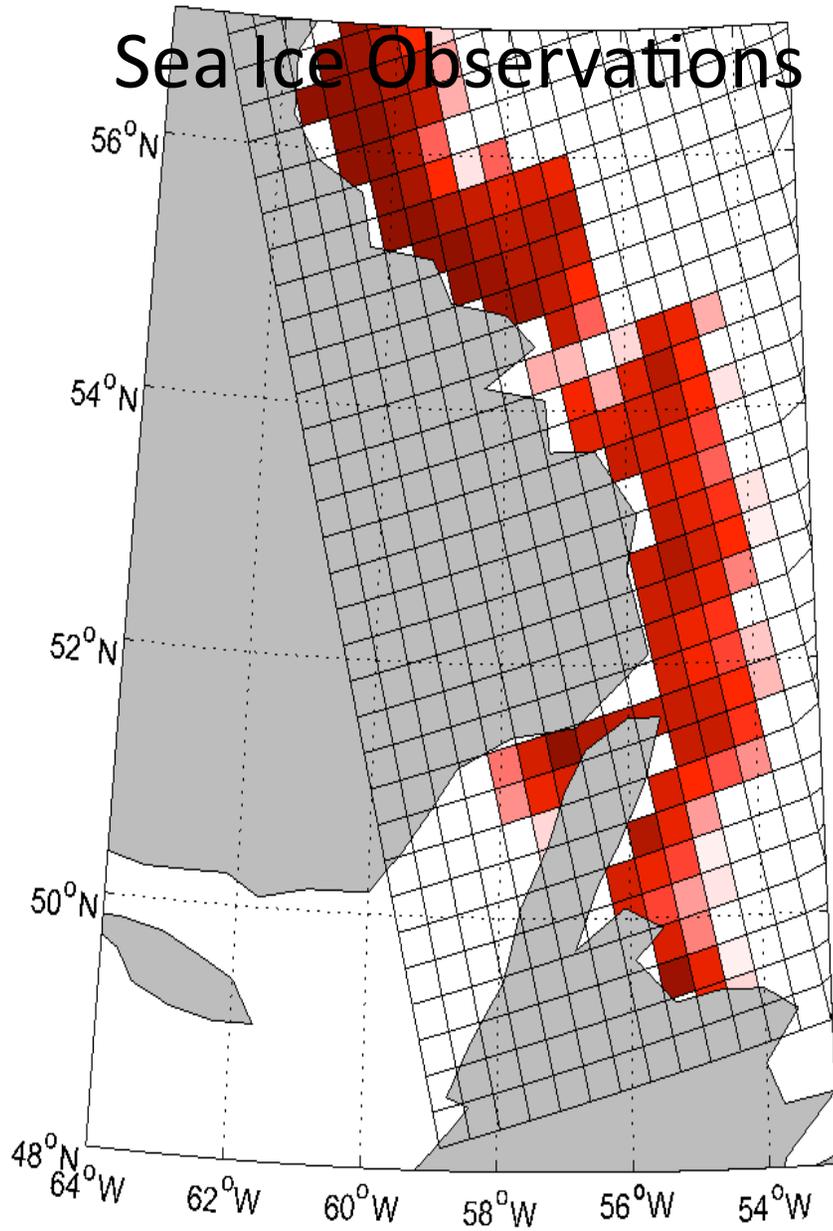
Section 2

# **ATMOSPHERE-OCEAN-SEA ICE OBSERVATIONS AND THEIR UNCERTAINTIES**

SSM/I

MODIS : May 9, 1999

# Sea Ice Observations



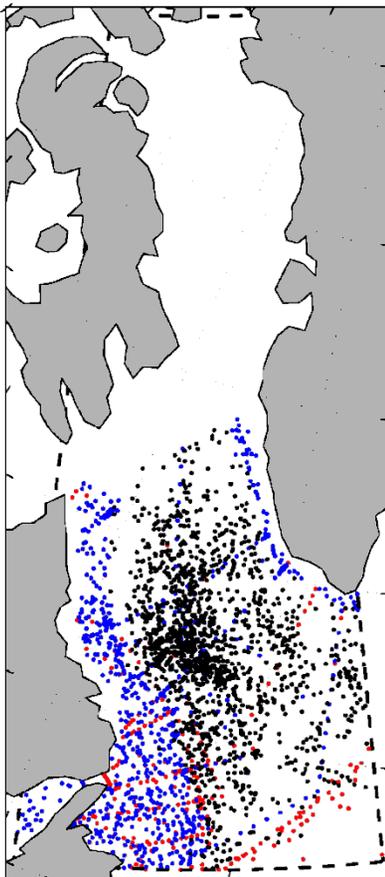
**Credit**

Provided by the SeaWiFS Project, NASA/Goddard Space Flight Center,  
and ORBIMAGE

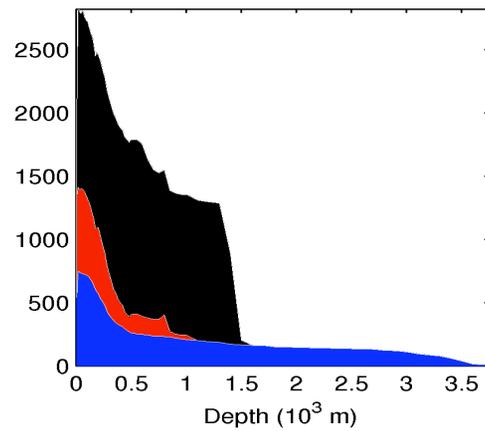
# *in situ* ocean observations

[Sep 1996 -August 1997 ]

Observation  
Locations

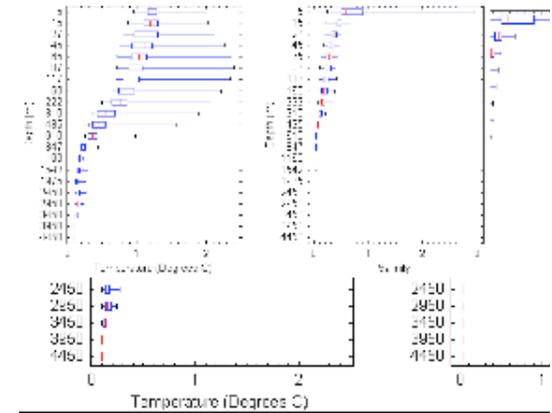


Number of Observations  
with depth



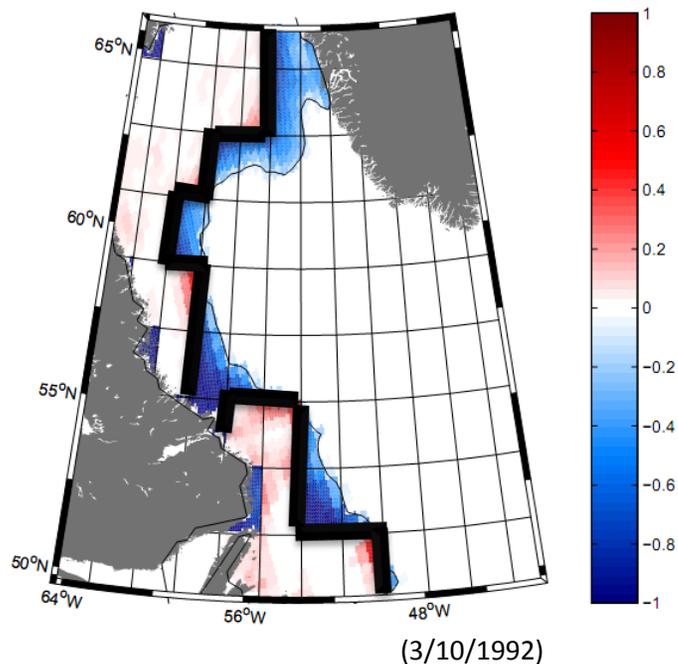
Blue = CTD  
Red = XBT  
Black = Profiling Floats  
(PALACE, ARGO, etc)

Temperature  
Uncertainty

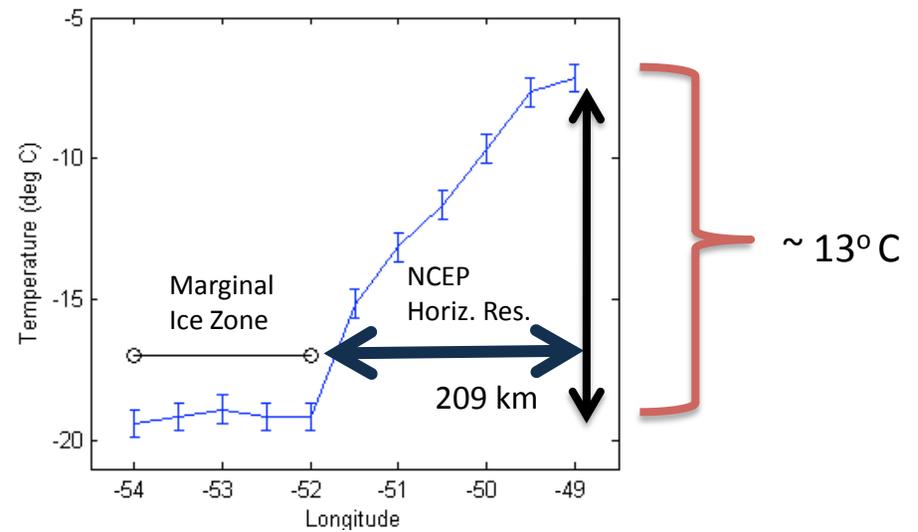


# NCEP Reanalysis errors across the MIZ

Reanalysis ice mask -  
SSM/I Ice Concentrations



Observed near surface air  
temperature across  
marginal ice zone

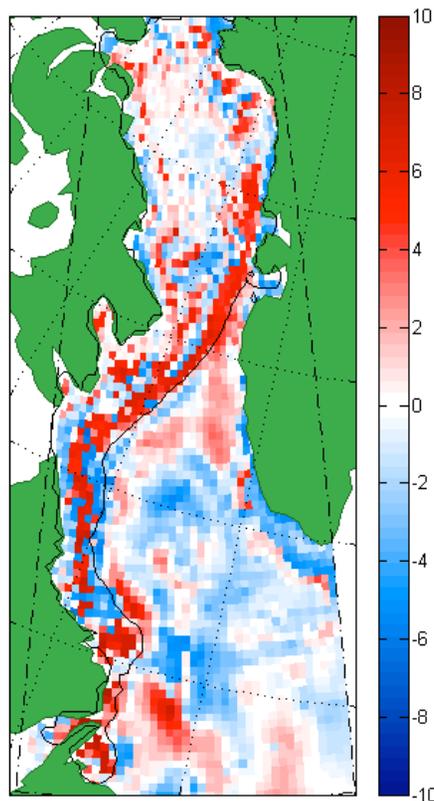


Adapted from Renfrew et al 1999

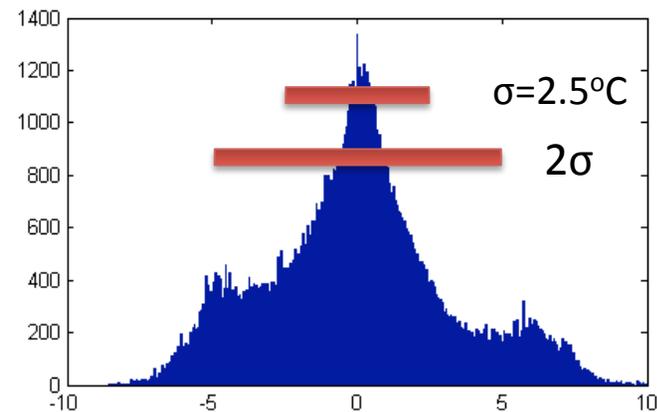
Section 3

# **ADJUSTMENTS TO MODEL CONTROLS**

# Adjustments to NCEP Surface Air Temperature [Time Varying]



May 7-14, 2007



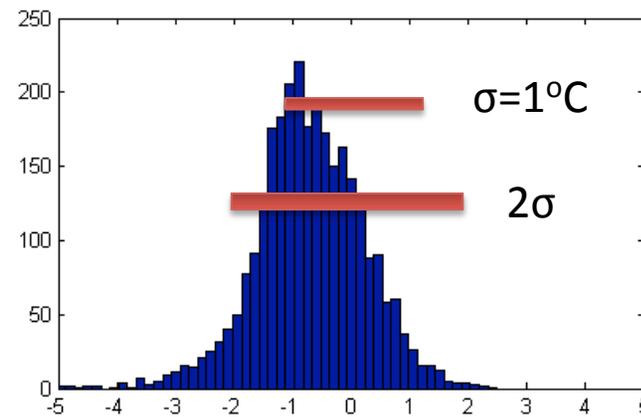
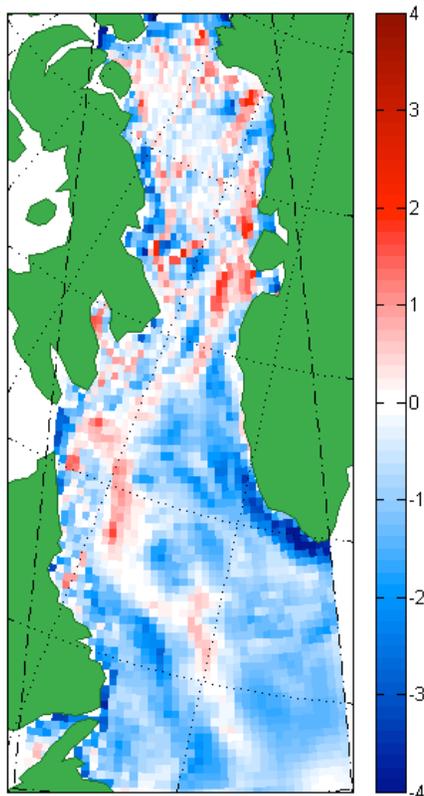
Adjustments compensate for errors in  
Ocean-ice model and atmospheric  
forcing errors

- Reanalysis : Crude sea ice mask
- Model : Unresolved MIZ eddy motion



Image Credit NASA

# Adjustments to NCEP Surface Air Temperature [Annual Bias]



Adjustments compensate for errors in  
Ocean-ice model and atmospheric  
forcing errors

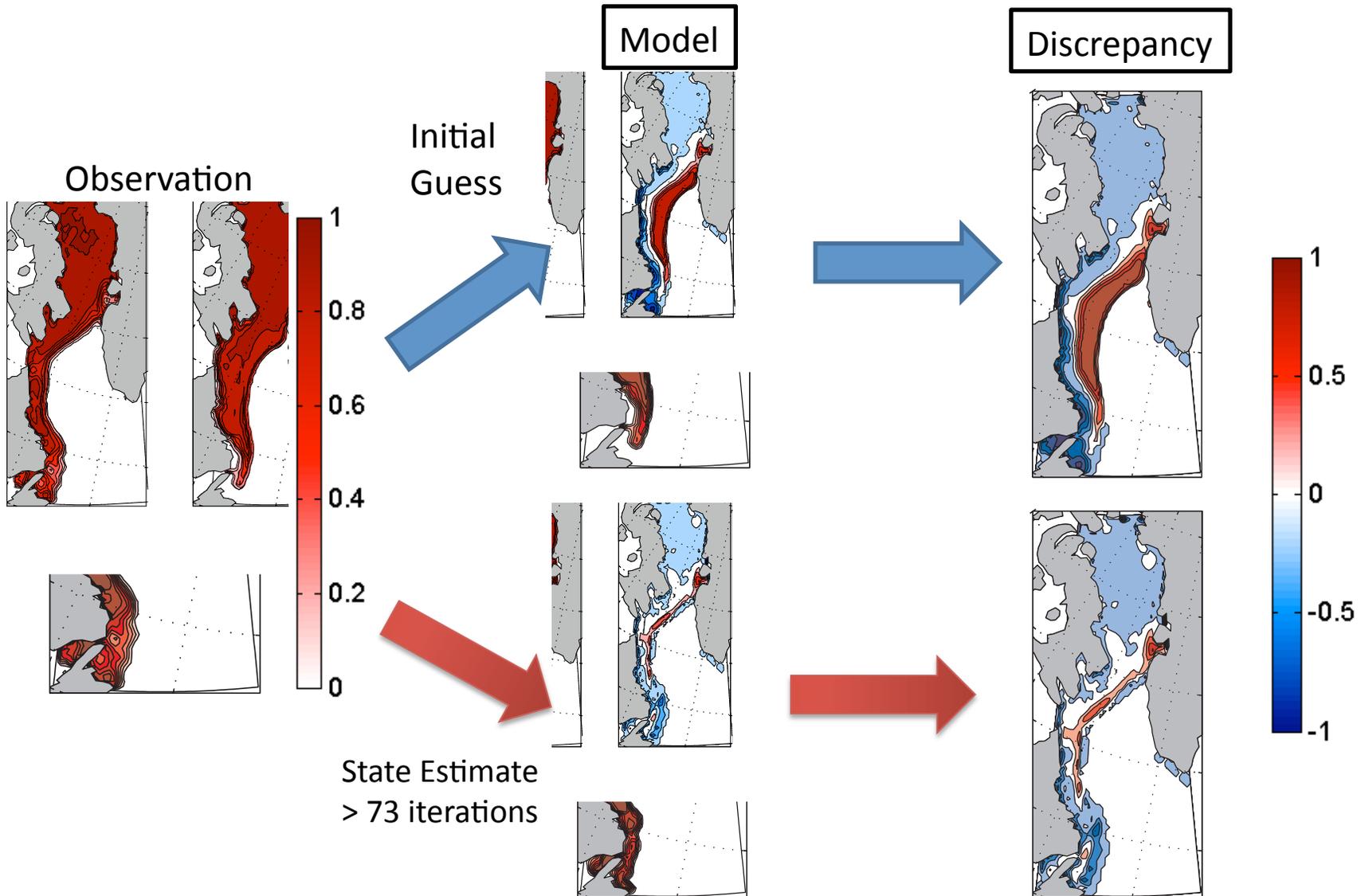
- Reanalysis : Warm Bias
- Model : 1) WGC inflow too warm  
2) Incomplete penetration of  
WGC through Davis Strait

Section 4

# **IMPROVEMENTS ON FIRST-GUESS MODEL TRAJECTORY**

# Improvement of Sea Ice Concentration

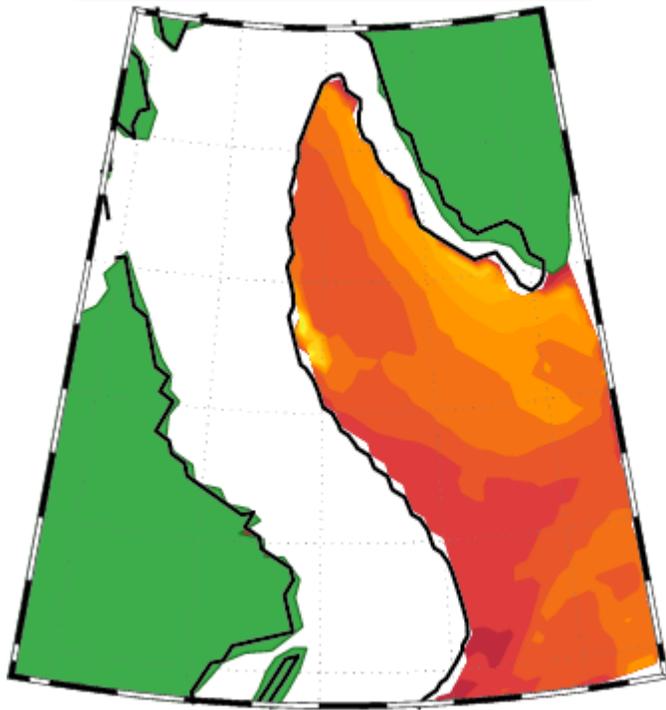
[March 2004]



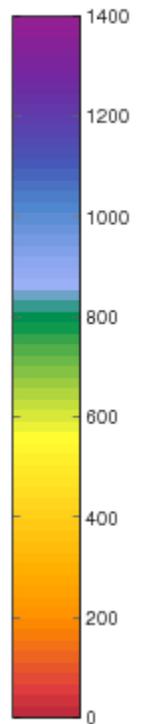
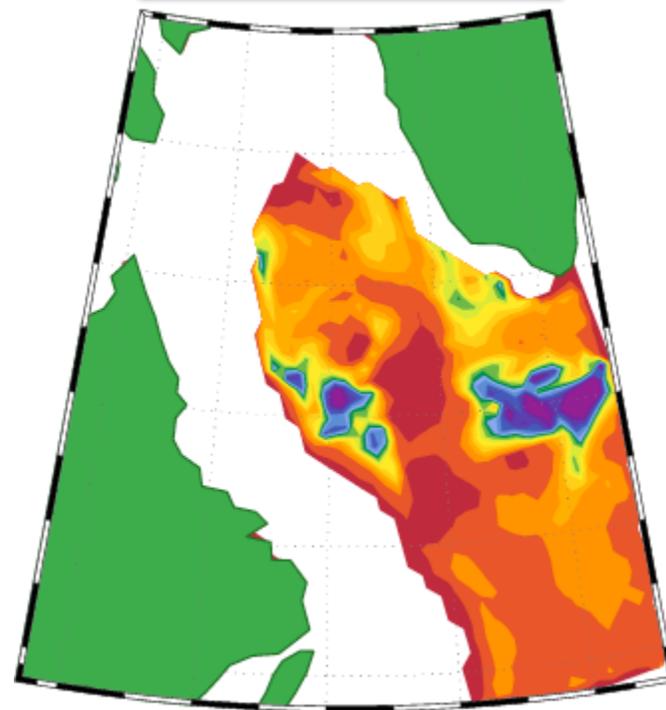
# State Estimate vs. Forward Model Run

Feb 97 – Mar 97

Model Initial Guess MLD



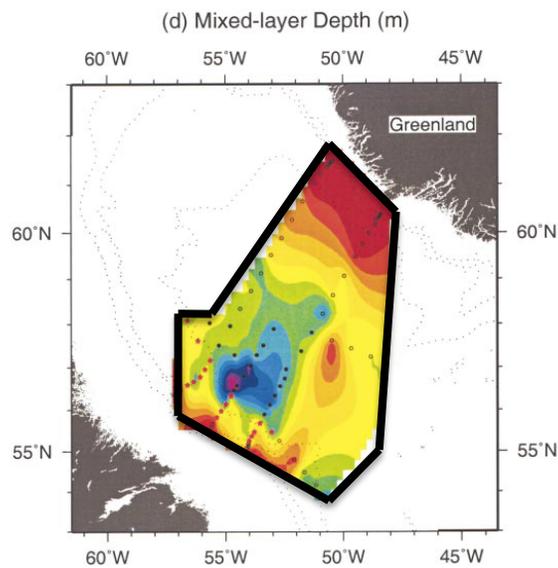
State Estimate MLD



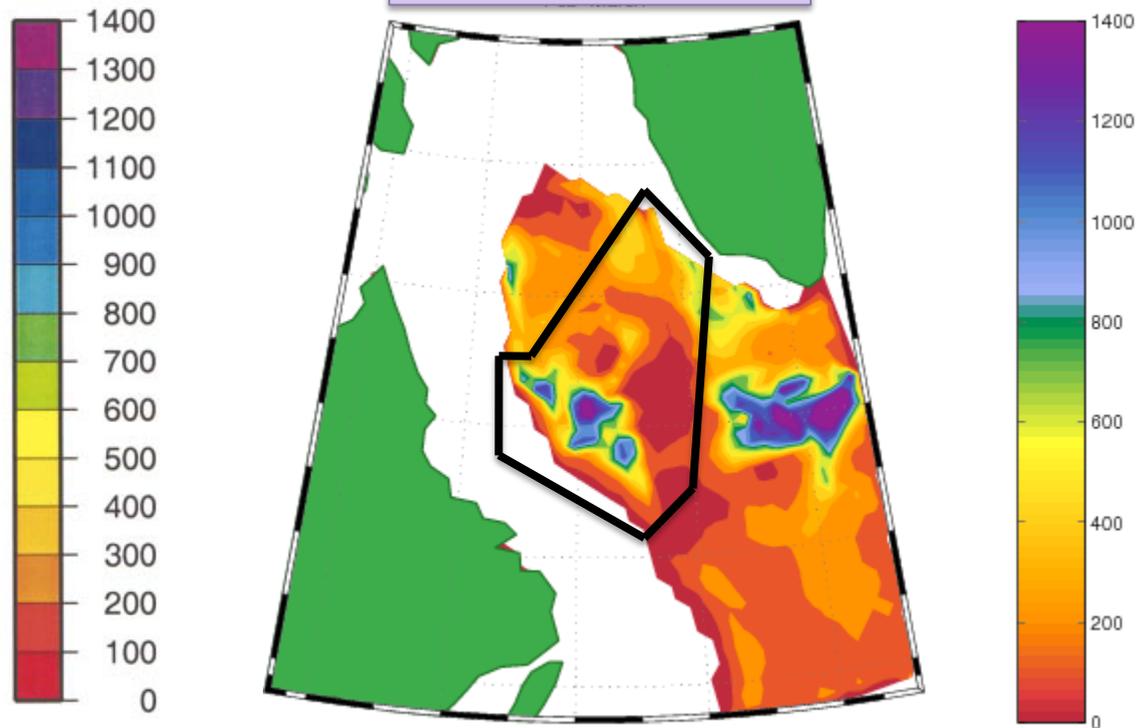
# State Estimate vs. Profiling Floats + CTD

Feb 97 – Mar 97

Interpolated from CTD



State Estimate MLD

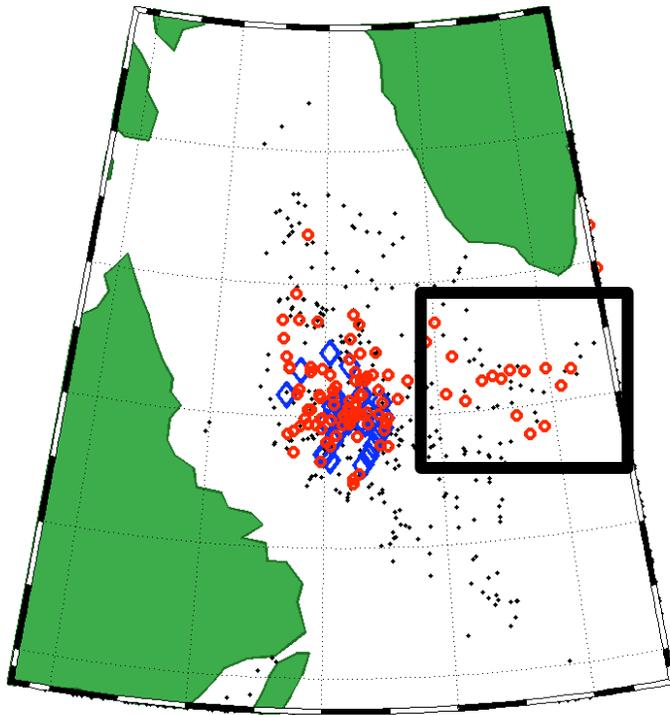


Pickard et al 2002

# State Estimate vs. Profiling Floats + CTD

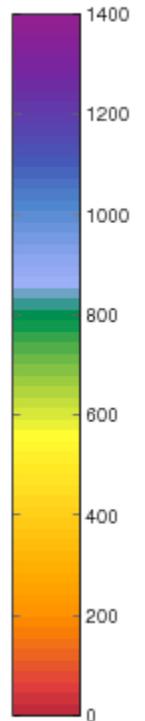
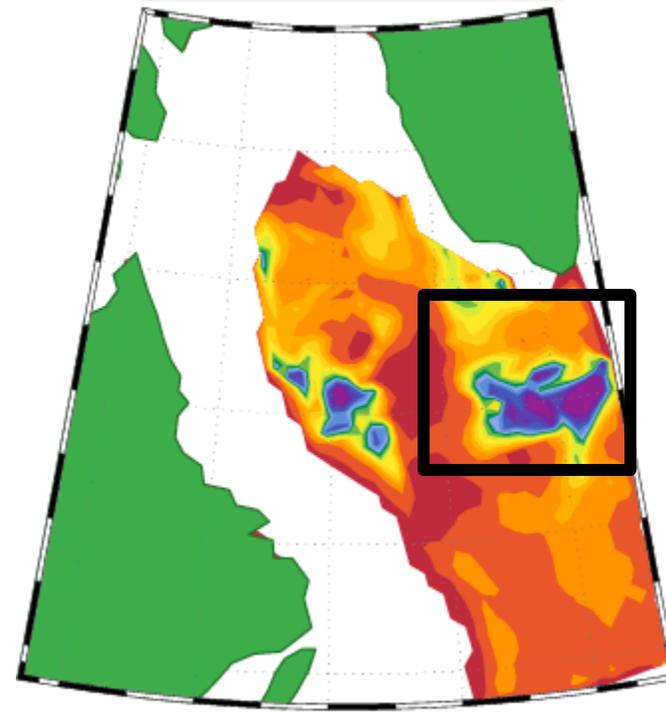
Feb 97 – Mar 97

MLD from Floats + CTD



- : < 500 m
- : > 500 m < 1000 m
- ◆ : > 1000 m

State Estimate MLD



# Conclusions

- Sea ice concentrations assimilated into ocean-Sea ice state estimate using the adjoint method
- State estimate using ice and ocean observations in the Labrador Sea modifies NCEP reanalysis atmospheric state in ways which are consistent with estimated reanalysis errors
- Inclusion of sea ice concentration leads to a state with significantly improved sea ice concentrations and mixed layer depths