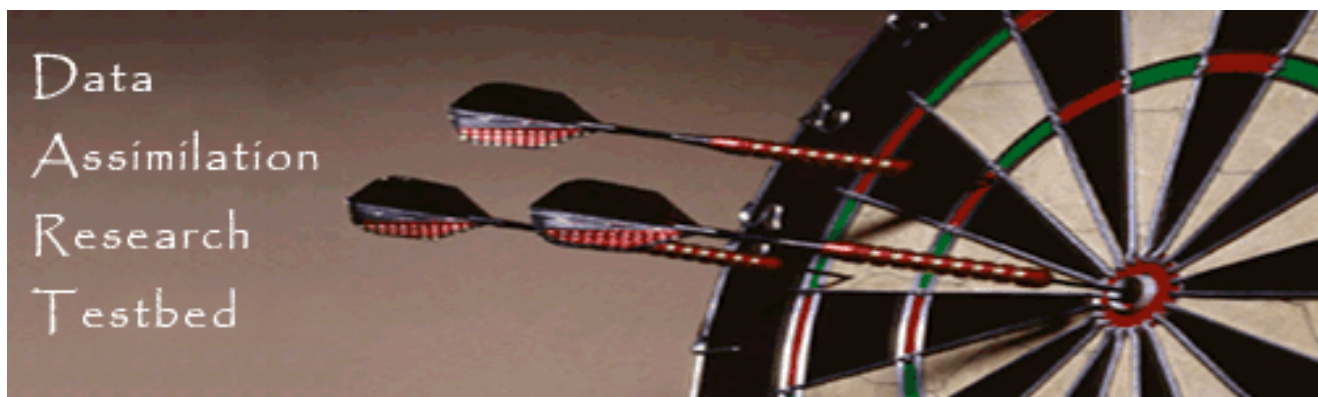


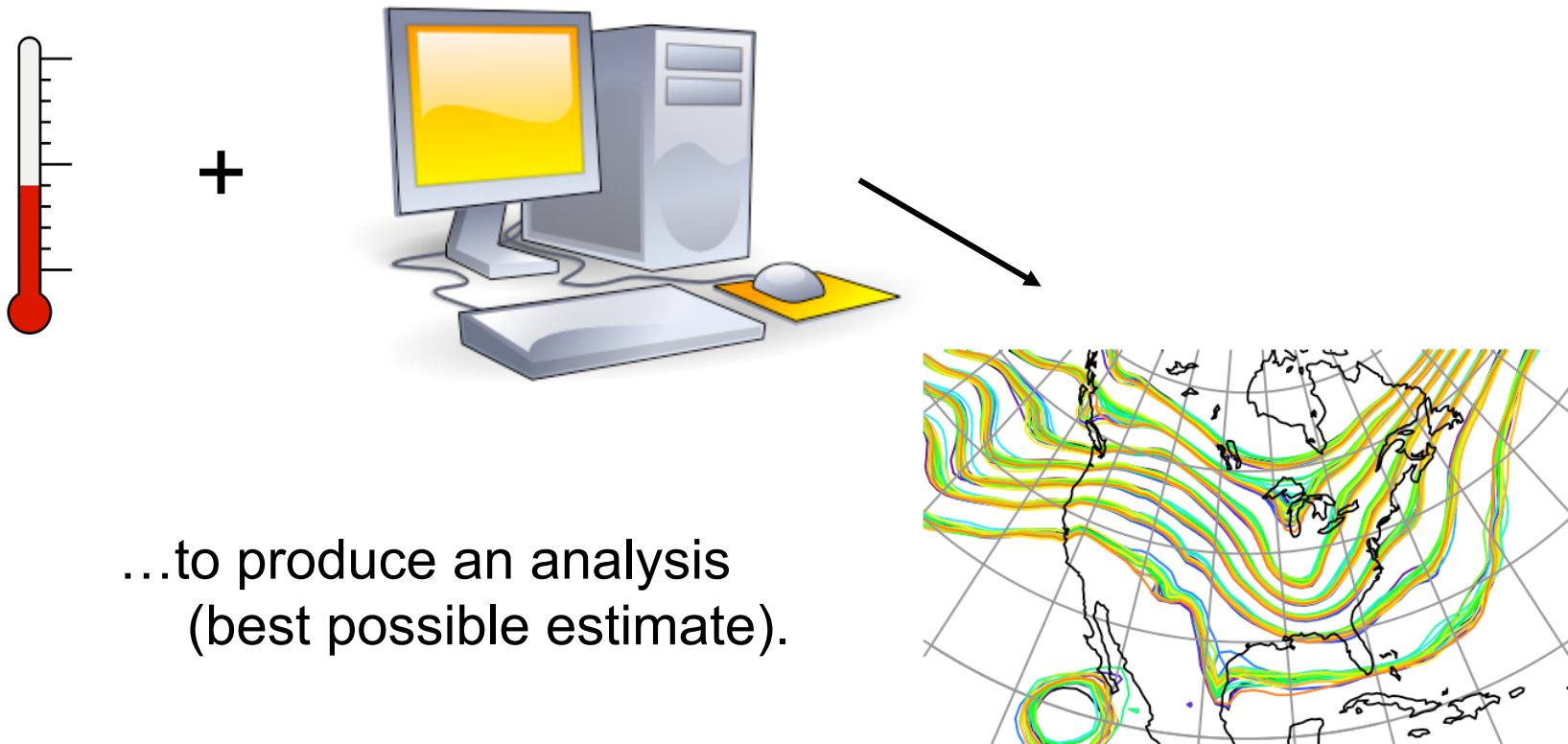
# Ensemble Data Assimilation for POP



Tim Hoar, Nancy Collins, and Jeffrey Anderson  
NCAR Institute for Math Applied to Geophysics  
Data Assimilation Research Section

# What is Data Assimilation?

Observations combined with a Model forecast...





DART is:

Public domain software for Data Assimilation

- Well-tested, portable, extensible, free!

Models

- Toy to HUGE

Observations

- Real, synthetic, novel

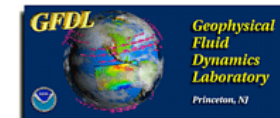
An extensive Tutorial

- With examples, exercises, explanations

People: The DAREs Team



used at -



and many more.



# Ensemble Filter for Large Geophysical Models

1. Use model to advance **ensemble** (3 members here) to time at which next observation becomes available.

Ensemble state  
estimate after using  
previous observation  
(analysis)

$t_k$



Ensemble state  
at time of next  
observation

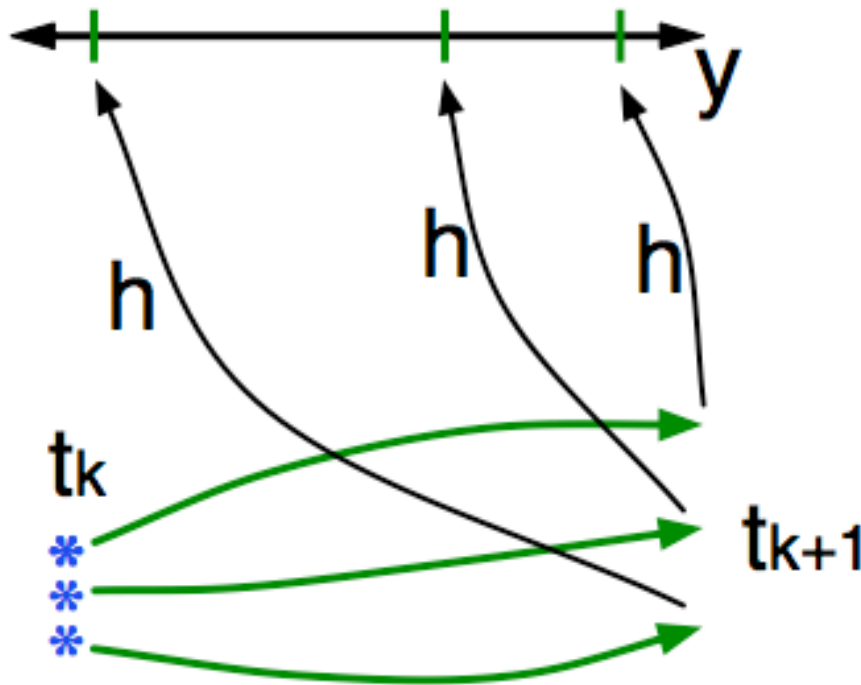
(prior)

$t_{k+1}$



# Ensemble Filter for Large Geophysical Models

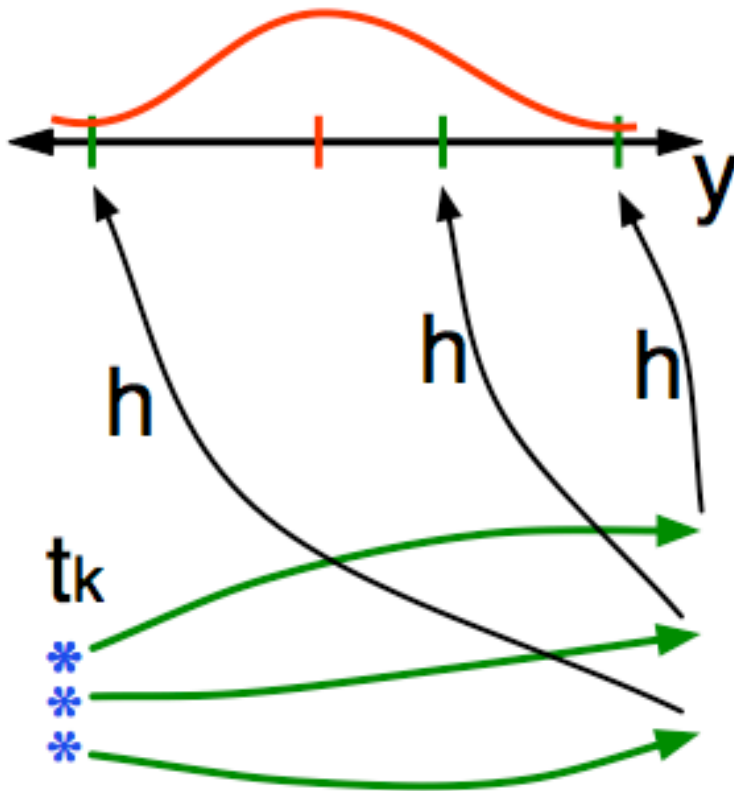
2. Get prior ensemble sample of observation,  $y = h(x)$ , by applying forward operator  $h$  to each ensemble member.



Theory: observations from instruments with uncorrelated errors can be done sequentially.

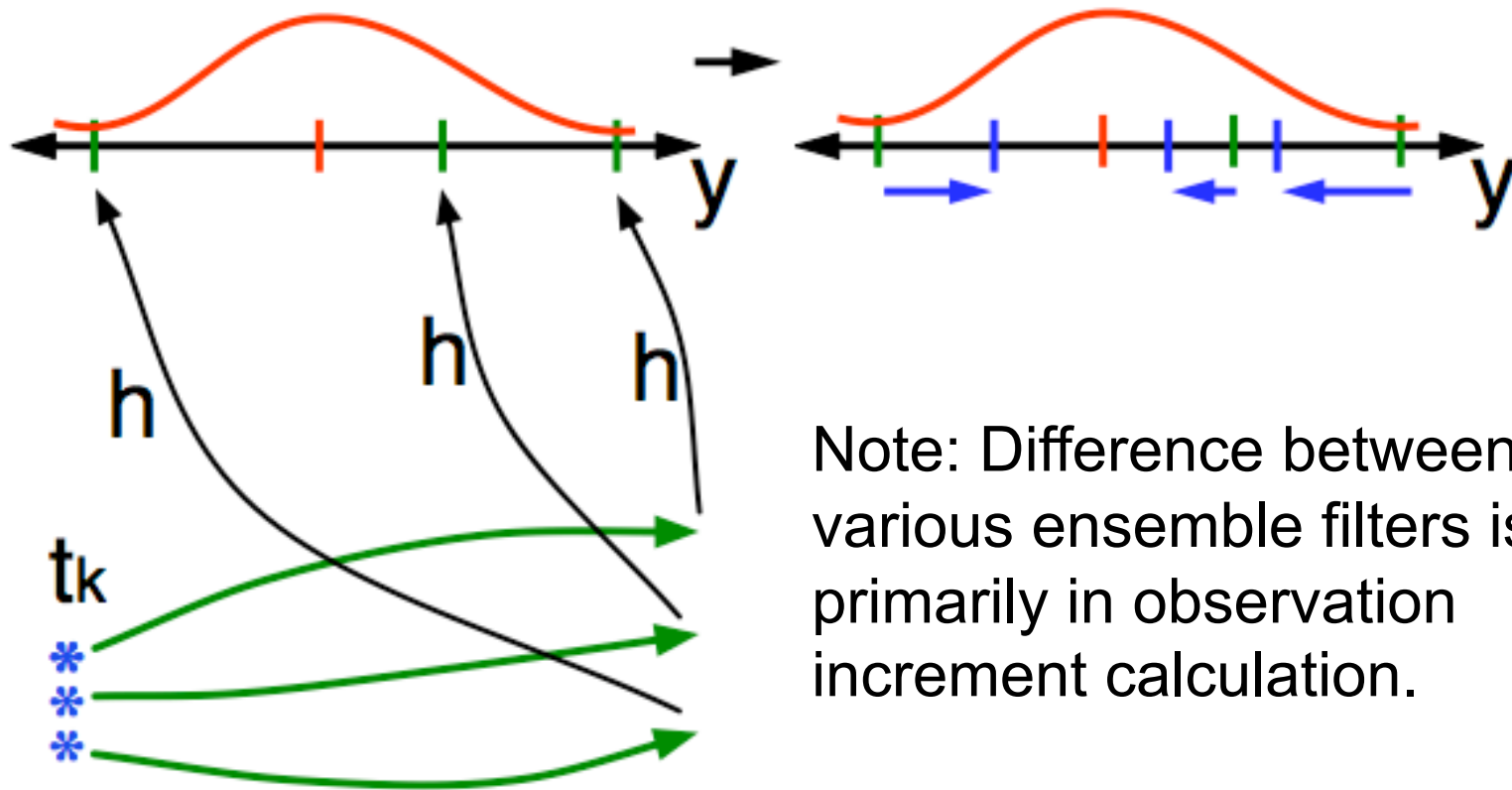
# Ensemble Filter for Large Geophysical Models

3. Get **observed value** and **observational error distribution** from observing system.



# Ensemble Filter for Large Geophysical Models

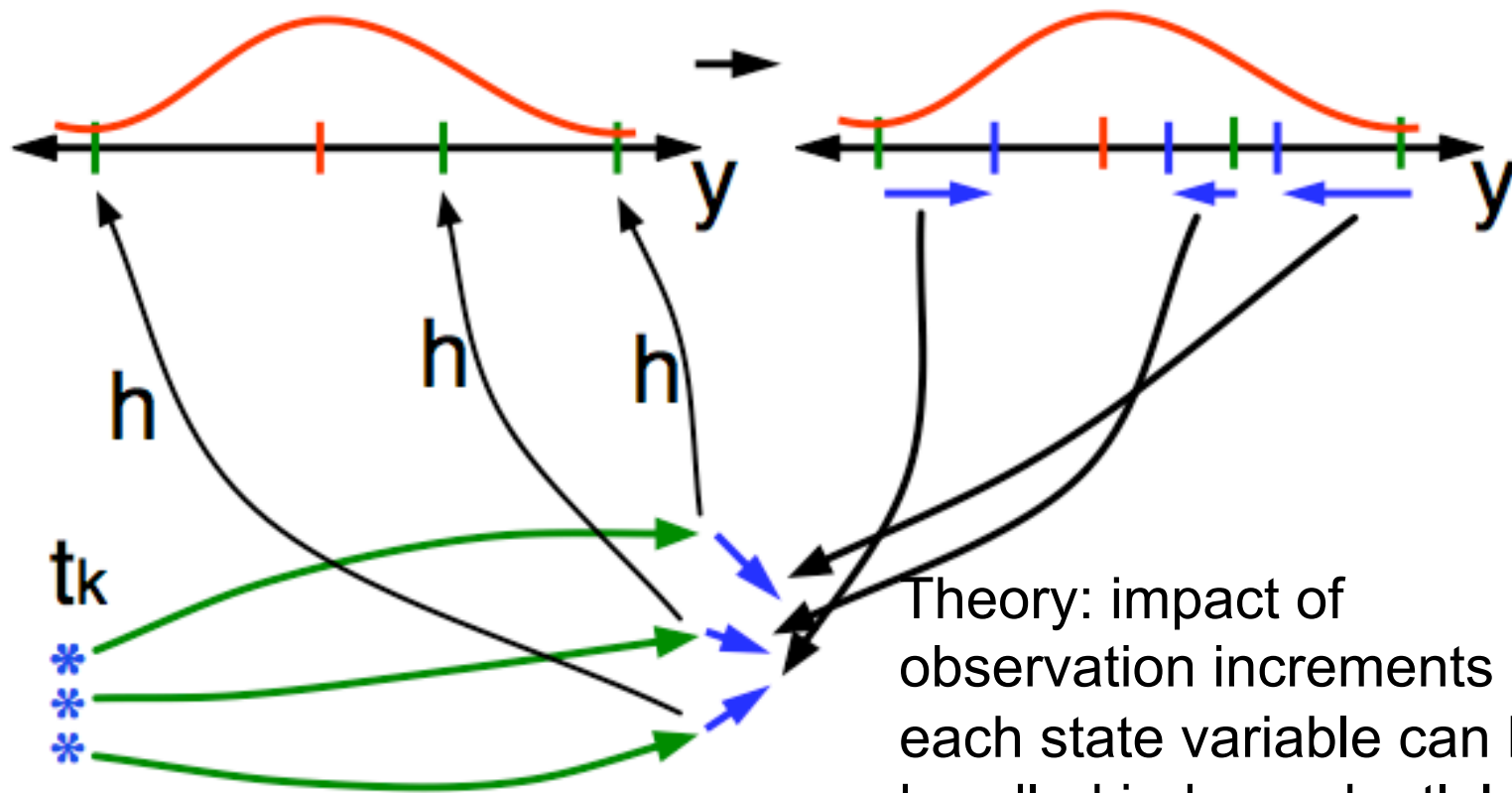
4. Find the **increments** for the prior observation ensemble (this is a scalar problem for uncorrelated observation errors).



Note: Difference between various ensemble filters is primarily in observation increment calculation.

# Ensemble Filter for Large Geophysical Models

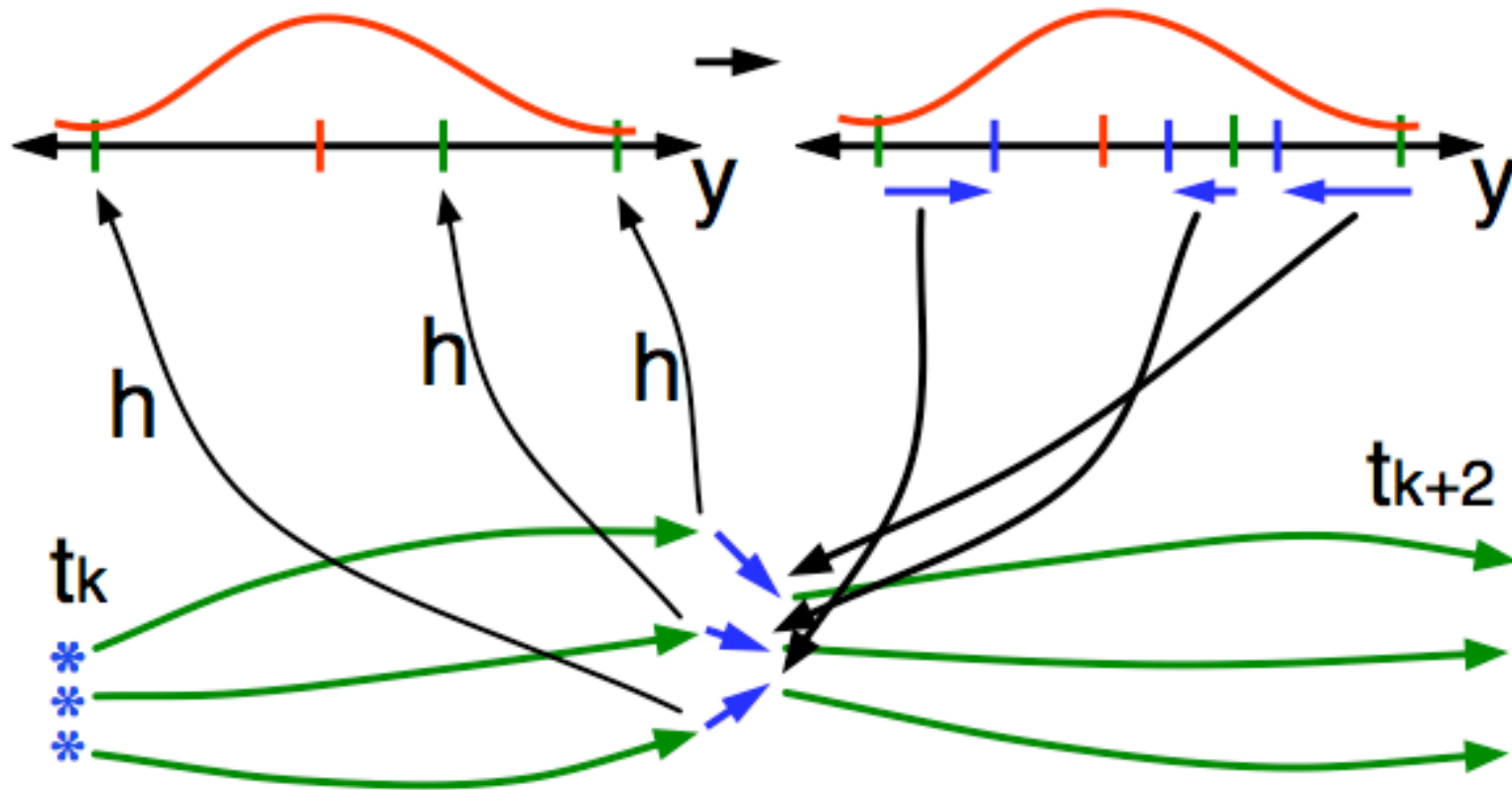
5. Use ensemble samples of  $y$  and each state variable to linearly regress observation increments onto state variable increments.





# Ensemble Filter for Large Geophysical Models

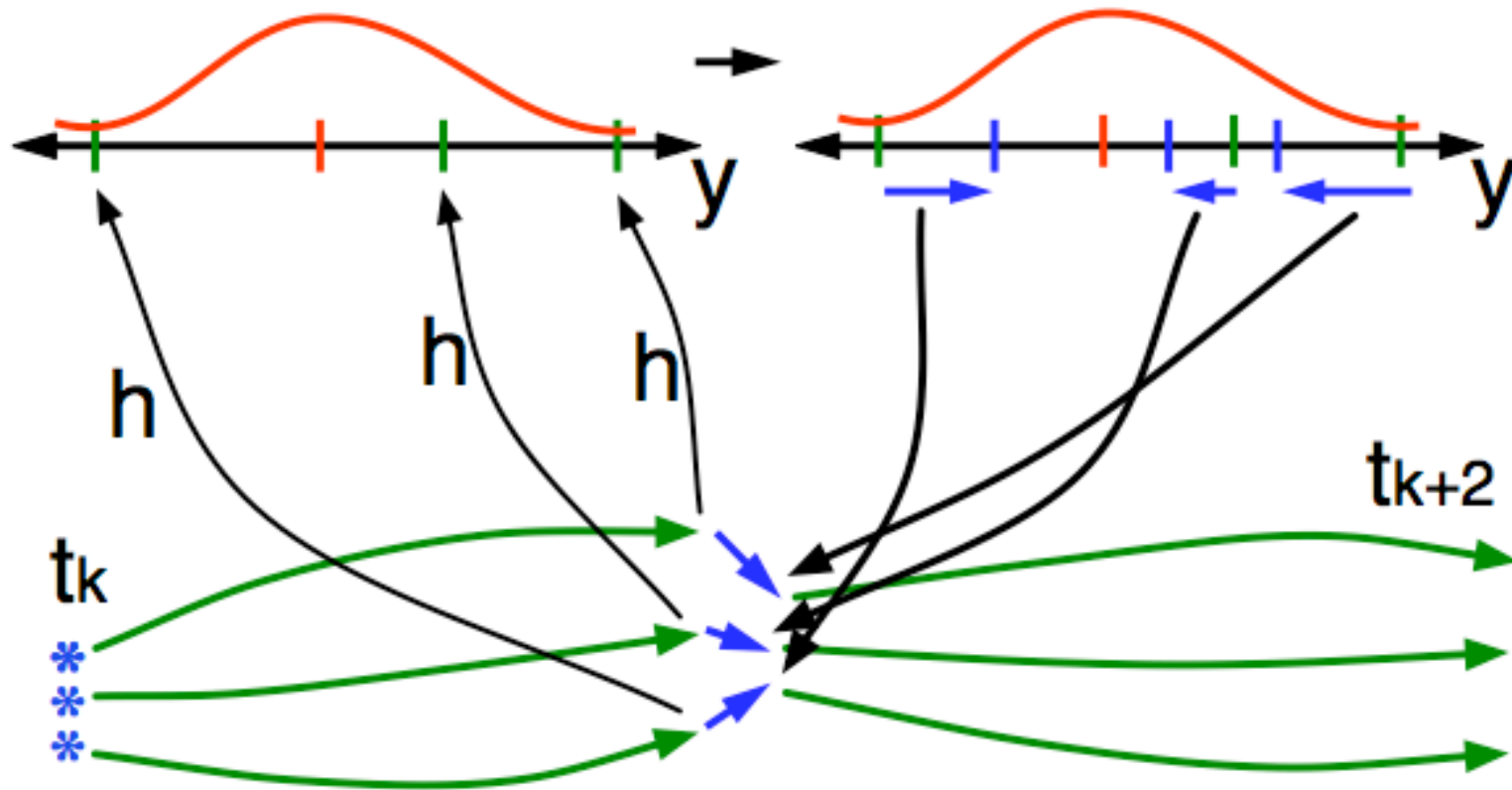
6. When all ensemble members for each state variable are updated, there is a new analysis. Integrate to time of next observation ...



# Ensemble Filter for Large Geophysical Models

To work with POP, DART just needs:

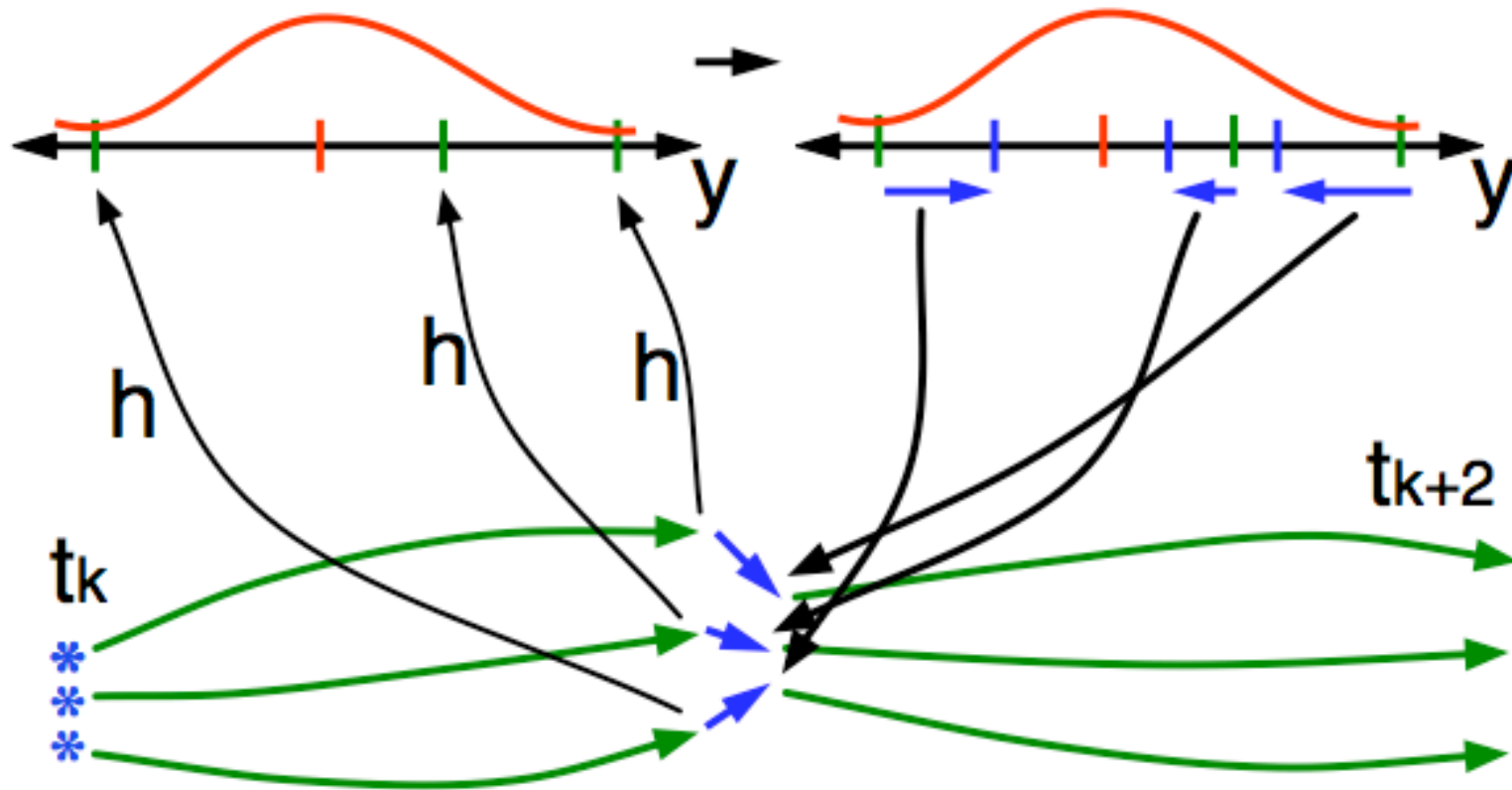
1. A way to make model forecasts (done by CGD);



# Ensemble Filter for Large Geophysical Models

To work with POP, DART just needs:

1. A way to make model forecasts (CGD, PetaApps);
2. Forward operators,  $h$ . Interpolation (DAReS).



# DART/POP Assimilation Experiments

1. POP 1 degree displaced pole;
2. 23 Ensemble members;
3. All 23 oceans forced by same observed atmosphere;
4. Start from 'climatological ensemble';
5. Assimilate all available observations once a day;
6. Use all observations in +/- 12 hour window;
7. January 1998 through December 1999.

# Observations for 1998-1999

Temperature and salinity from World Ocean Database 2005.

FLOAT_SALINITY	68200
FLOAT_TEMPERATURE	395032
DRIFTER_TEMPERATURE	33963
MOORING_SALINITY	27476
MOORING_TEMPERATURE	623967
BOTTLE_SALINITY	79855
BOTTLE_TEMPERATURE	81488
CTD_SALINITY	328812
CTD_TEMPERATURE	368715
STD_SALINITY	674
STD_TEMPERATURE	677
XCTD_SALINITY	3328
XCTD_TEMPERATURE	5790
MBT_TEMPERATURE	58206
XBT_TEMPERATURE	1093330
APB_TEMPERATURE	580111



## Observations for 1998-1999

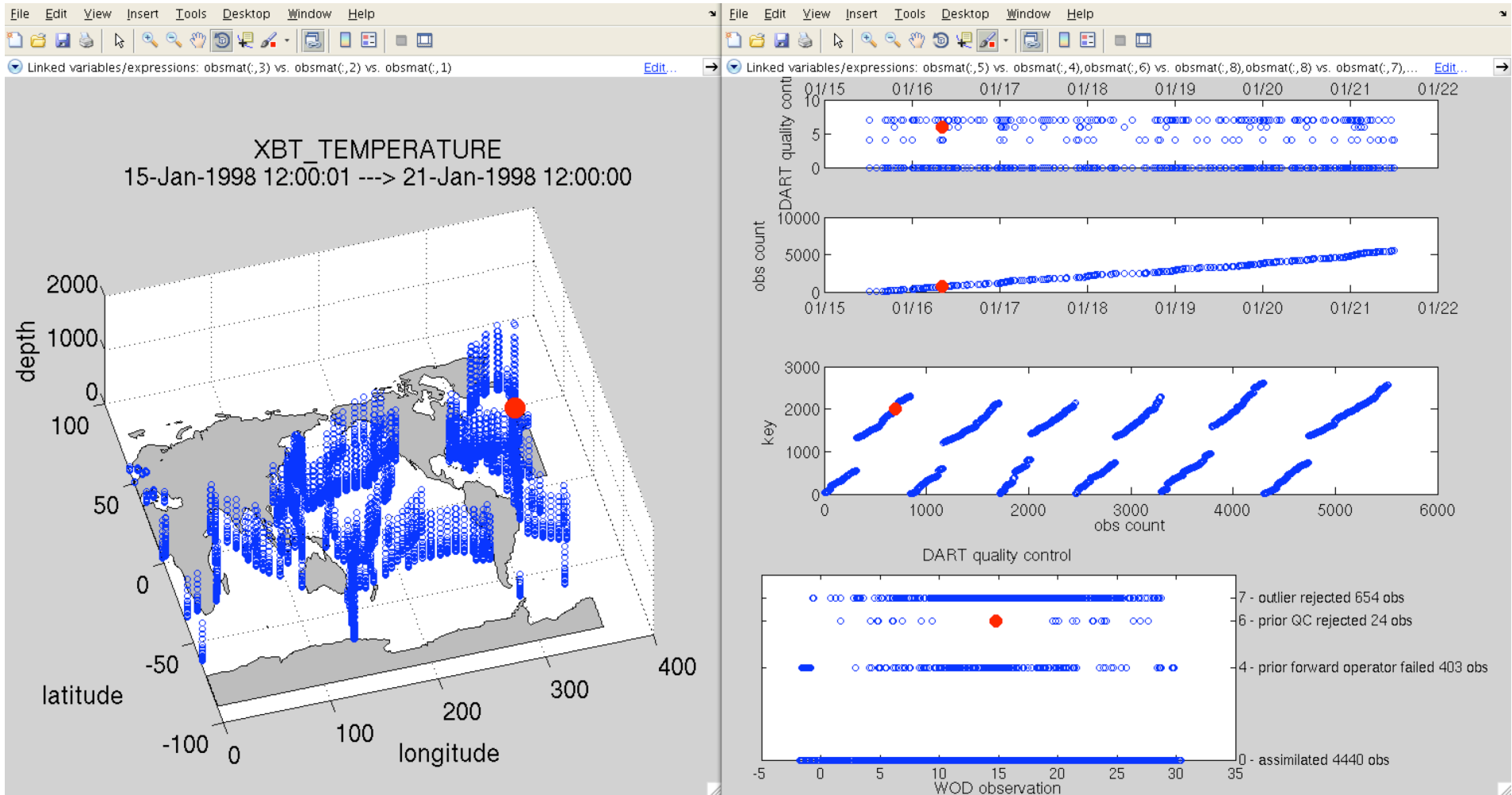
Temperature observation error standard deviation 0.5 K;  
Salinity observation error standard deviation 0.5 msu.

System is also ready to assimilate:

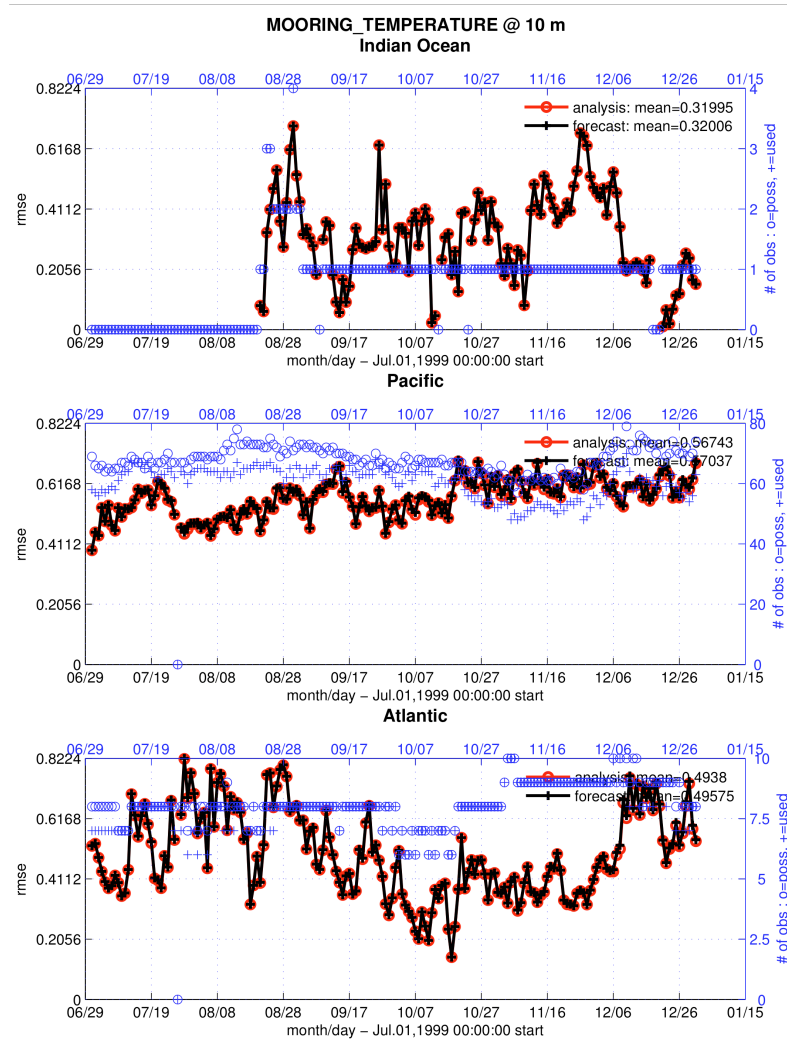
Currents;

Sea surface height.

# Observation Visualization Tools



# Observation Space Diagnostics (July-Dec. 1999)

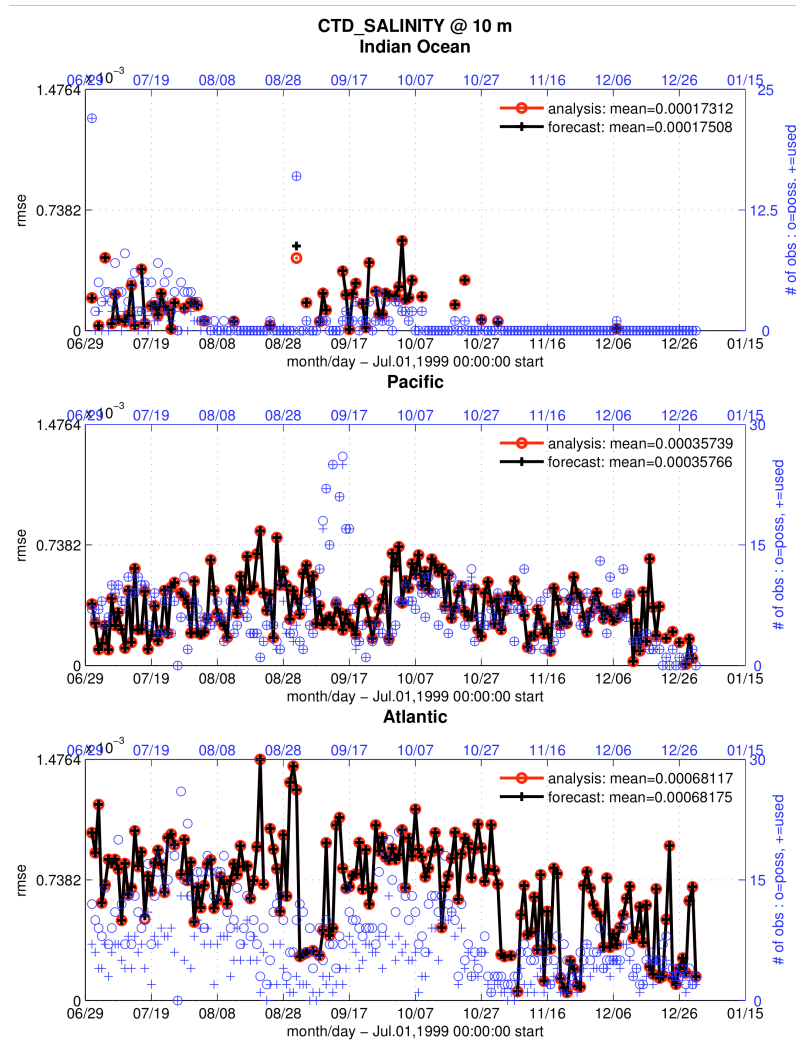


## 10m Mooring Temperature

1. Ensemble mean analysis difference from obs.
2. Ensemble mean 1-day forecast difference from obs.
3. Blue circle is # of obs.
4. Blue + is # assimilated.
5. Obs. are rejected if they are too far from ensemble mean (3 standard deviations here).



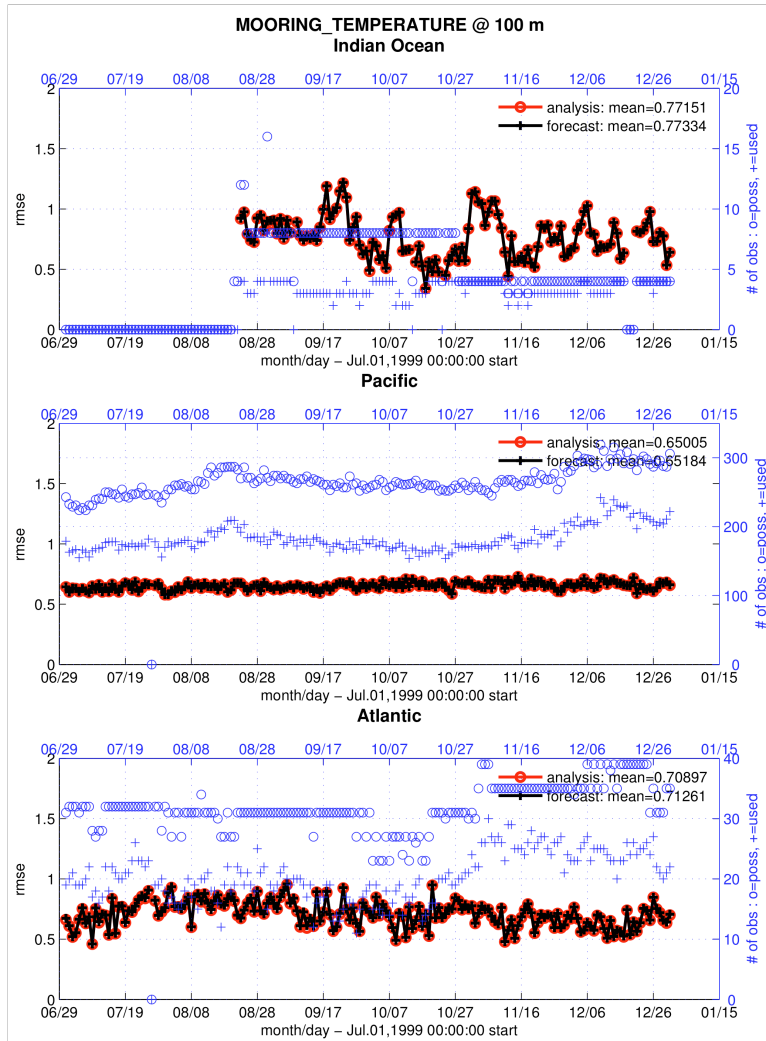
# Observation Space Diagnostics (July-Dec. 1999)



## 10m CTD Salinity

1. Ensemble mean analysis difference from obs.
2. Ensemble mean 1-day forecast difference from obs.
3. Blue circle is # of obs.
4. Blue + is # assimilated.
5. Obs. are rejected if they are too far from ensemble mean (3 standard deviations here).

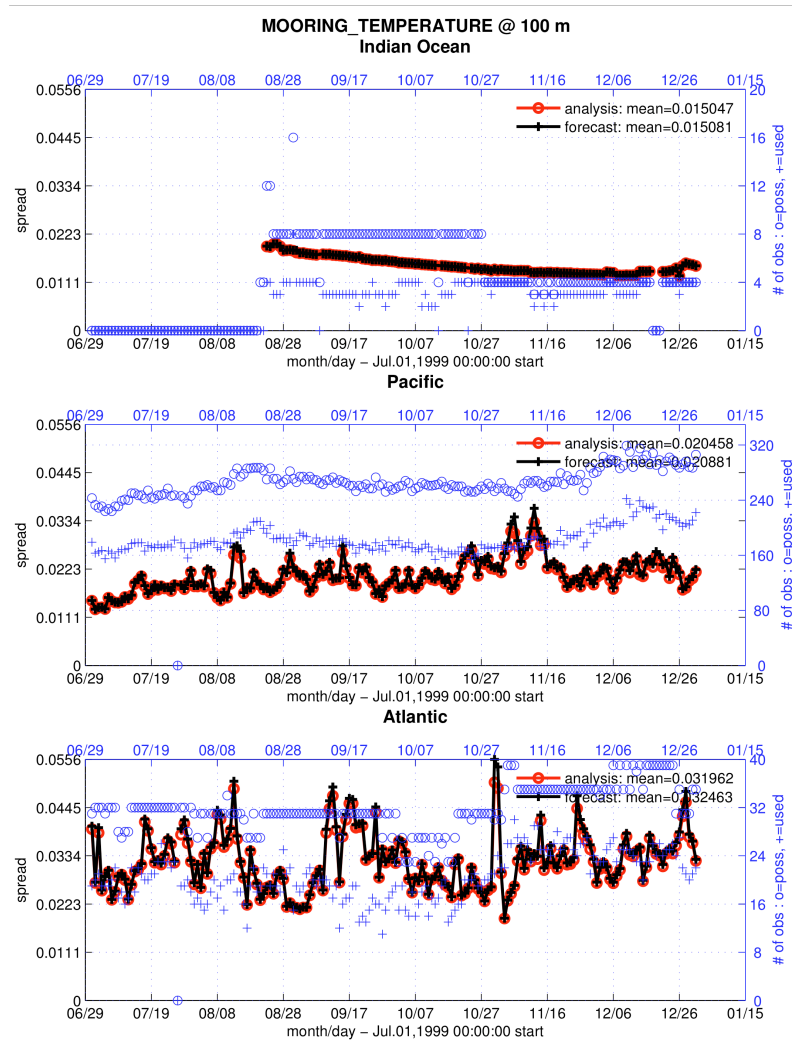
# Observation Space Diagnostics (July-Dec. 1999)



## 100m Mooring Temperature

1. Blue circle is # of obs.
2. Blue + is # assimilated.
3. Obs. are rejected if they are too far from ensemble mean (3 standard deviations here).
4. About 1/3 of obs. rejected.
5. Model bias in thermocline?

# Observation Space Diagnostics: Ensemble Spread

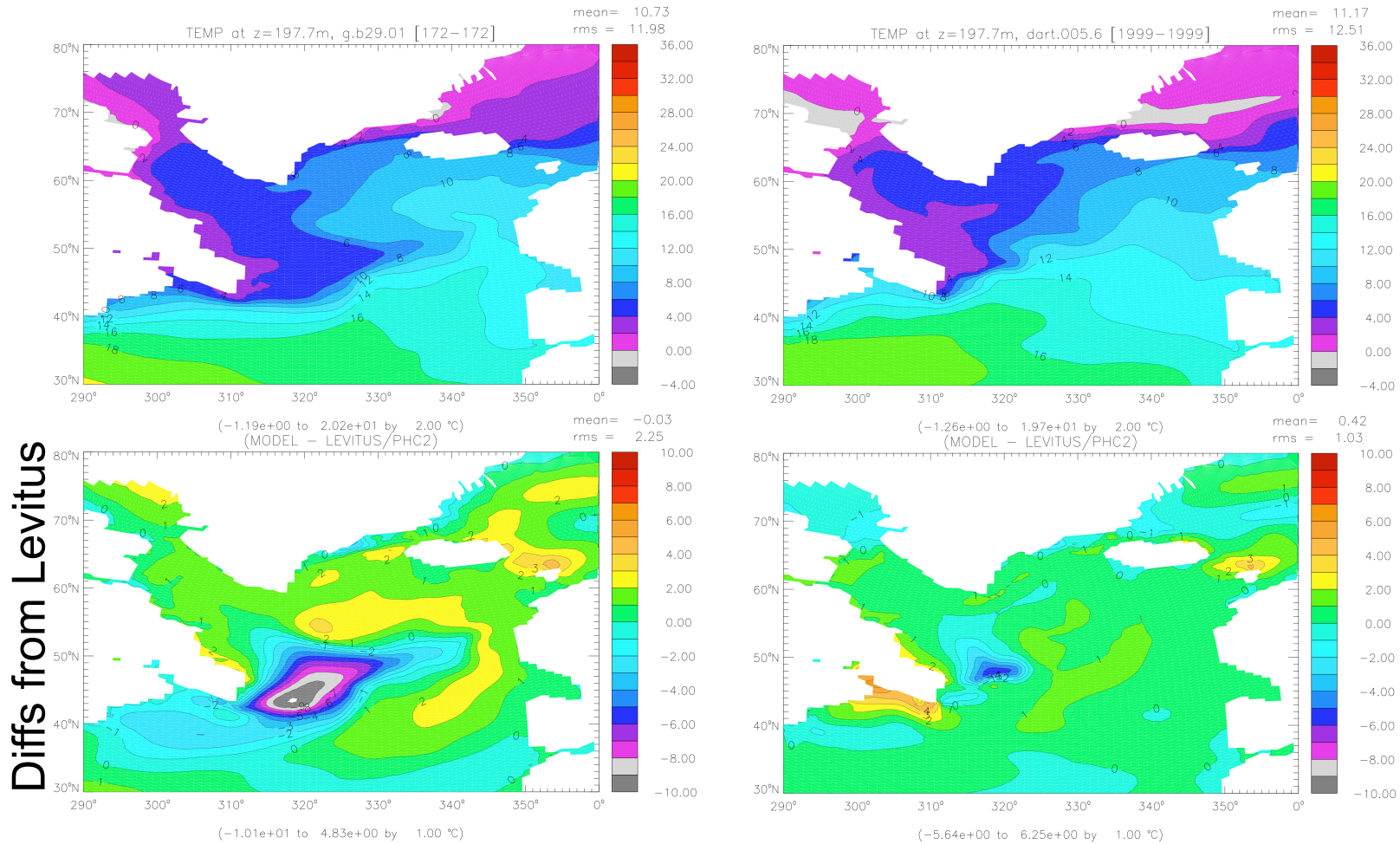


## 100m Mooring Temperature

1. Spread is way too small (trust me, we know);
2. Model bias makes this even worse;
3. Using single atmospheric forcing is part of the problem;
4. Automatic spread correction tools in DART won't work with POP (yet).



# Physical Space Preview: 200m Temperature Means



POP Free Run

DART



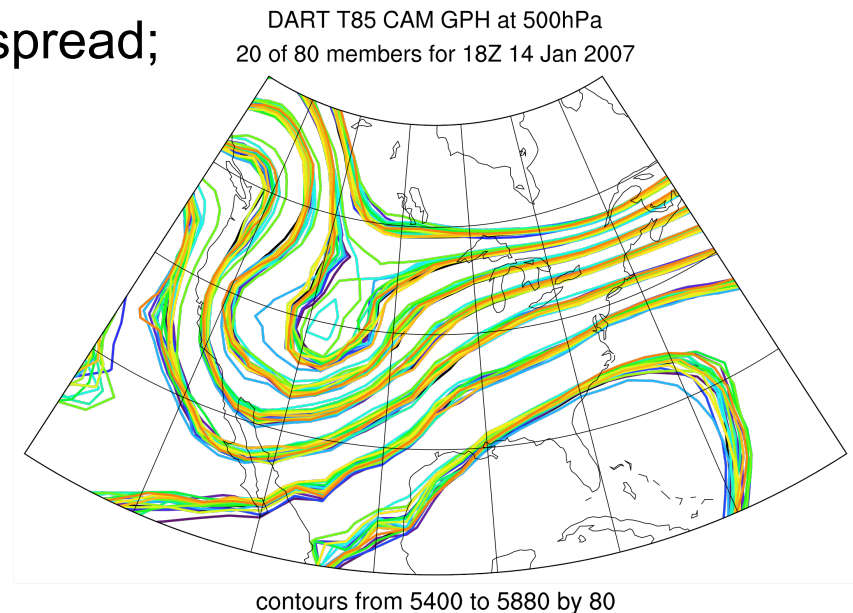
OMWG -- 11 December 2009

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## Next Step

1. Force each ensemble member with a different member from an atmospheric ensemble reanalysis;
2. DART can produce reanalyses with CAM, GFDL's AM2, or NCEP GFS;
3. Should give some additional spread;
4. Plan to test for 2006-07.
5. May try larger ensemble.



Learn about ensemble assimilation and DART tools at:



<http://www.image.ucar.edu/DAReS/DART/>