

Reanalysis applications of GPS radio occultation measurements

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ECMWF

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Outline

- ERA-Interim and GPSRO data
- Bias issues in the reanalysis context
- Variational bias correction of radiance data (VarBC)
- Effect of COSMIC data on VarBC
- Impact of CHAMP in ERA-Interim

ERA-Interim: Preparation for a new European reanalysis

ERA-Interim: Atmospheric reanalysis from 1989 onward

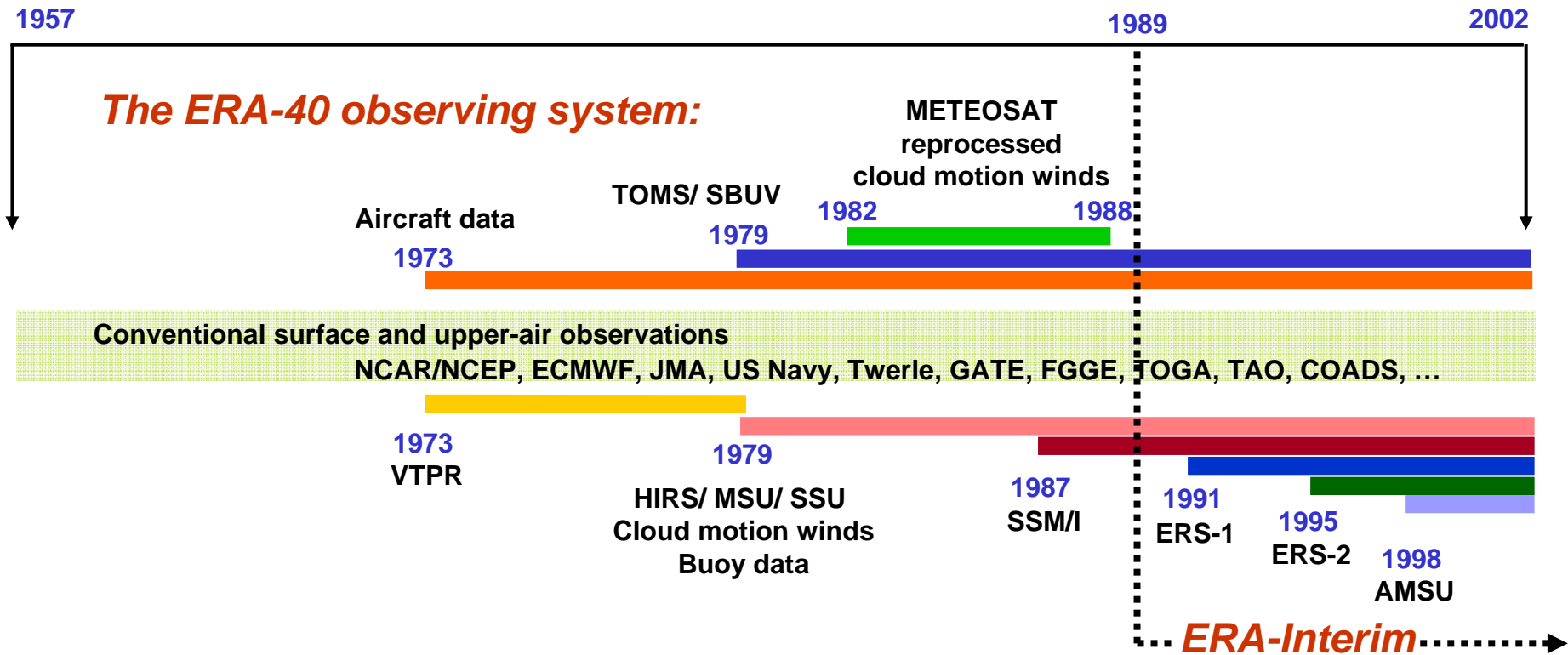
- **Currently processing 2004; real-time by the end of 2008**
- Will continue as a Climate Data Assimilation System

Main system characteristics:

- **T255 (~80km) horizontal resolution**
- 60 vertical layers; top level at 0.1 hPa
- Improved model physics (ECMWF model cycle 31r2)
- **4D-Var analysis using a 12h time window**
- Completely revised humidity analysis
- Wavelet-based background error covariances
- **Variational bias correction of radiance data**

Many product improvements compared to ERA-40:

- Better fit to observations
 - Much better hydrological cycle
 - Improved stratospheric transport
 - Improved forecast skill
-
- *See ECMWF Newsletters 110, 115 for additional details*
 - *Contact ECMWF Data Services for access to ERA-Interim data products*



Observations used in ERA-Interim:

- **ERA-40 observations until August 2002**
- **ECMWF operational data after August 2002**
- Reprocessed altimeter wave-height data from ERS
- Humidity information from SSM/I rain-affected radiance data
- Reprocessed METEOSAT AMV wind data
- Reprocessed ozone profiles from GOME
- **Reprocessed GPSRO data from CHAMP**

Use of GPSRO in ERA-Interim (currently August 2004)

- CHAMP: 2001 – 2009 (?) ~ 150 profiles/day
- COSMIC: 2006 – 2011 (?) ~ 1500 profiles/day
- GRAS: potentially from 2006 ~ 650 profiles/day
- GRACE: potentially from 2006 ~ 150 profiles/day

Expectations from a reanalysis perspective:

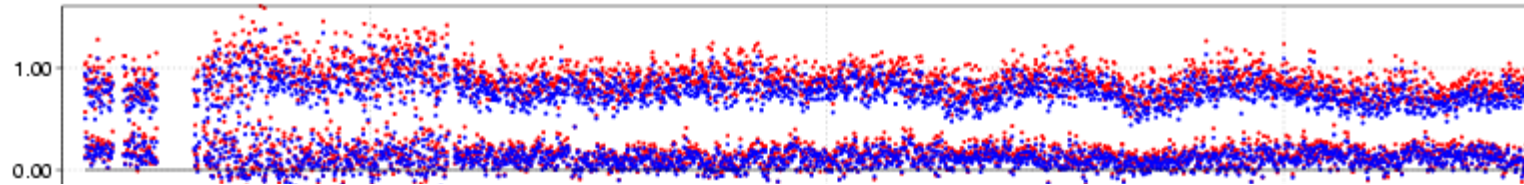
- GPS data should be especially valuable because they
 - resolve scales not well observed by other instruments,
 - provide global uniform sampling, and
 - do not require bias correction

Can GPS data provide a baseline for bias corrections of other instruments ?

CHAMP data in ERA-Interim: bending angle departures

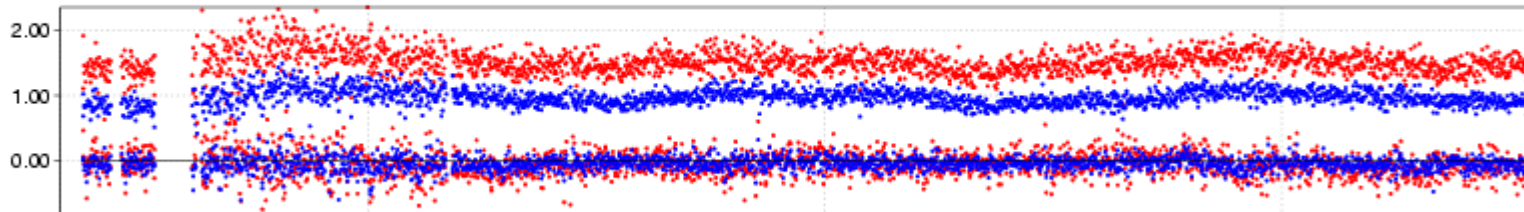
(normalized by observation errors)

0001 (DA) : CHAMP Ch 35 GLOBE Used data
St. dev. and bias OB-FG OB-AN



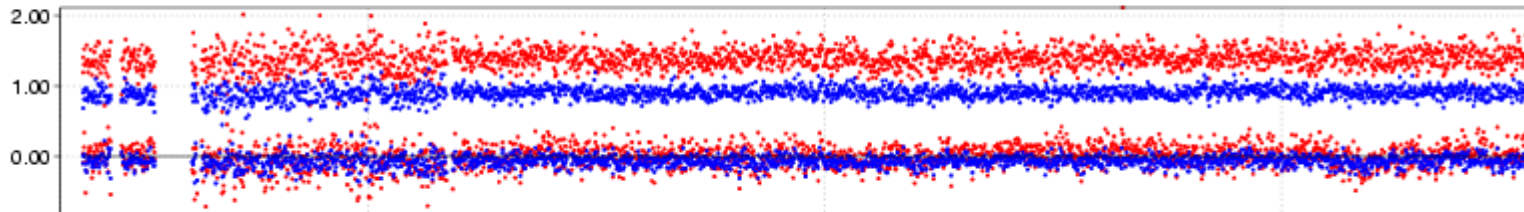
Binned at
~35 km

0001 (DA) : CHAMP Ch 25 GLOBE Used data
St. dev. and bias OB-FG OB-AN



~25 km

0001 (DA) : CHAMP Ch 15 GLOBE Used data
St. dev. and bias OB-FG OB-AN



~15 km

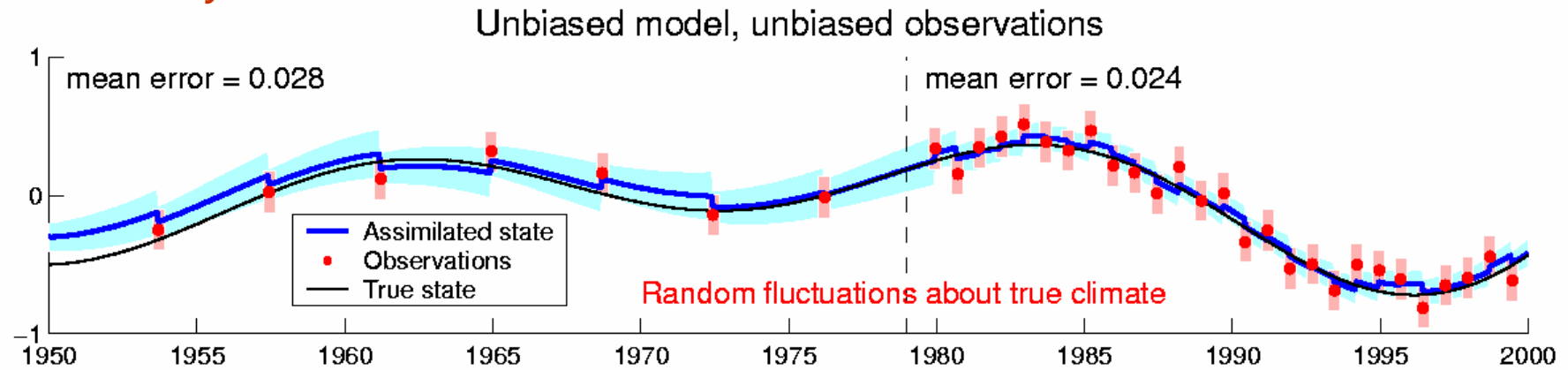
Data count (/12h)



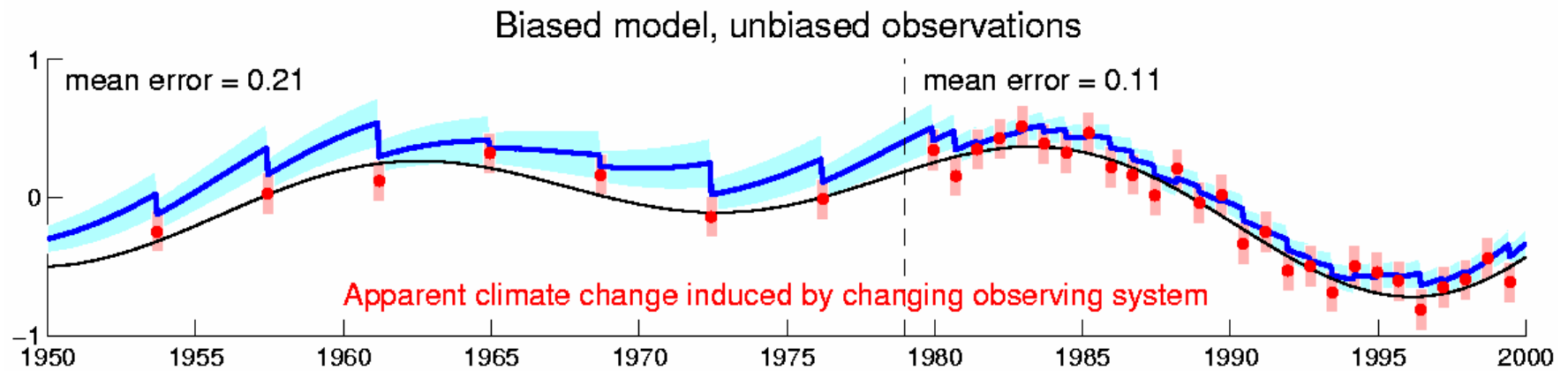
~150 profiles
per day

The bias problem in a reanalysis context

In theory:



In practice:



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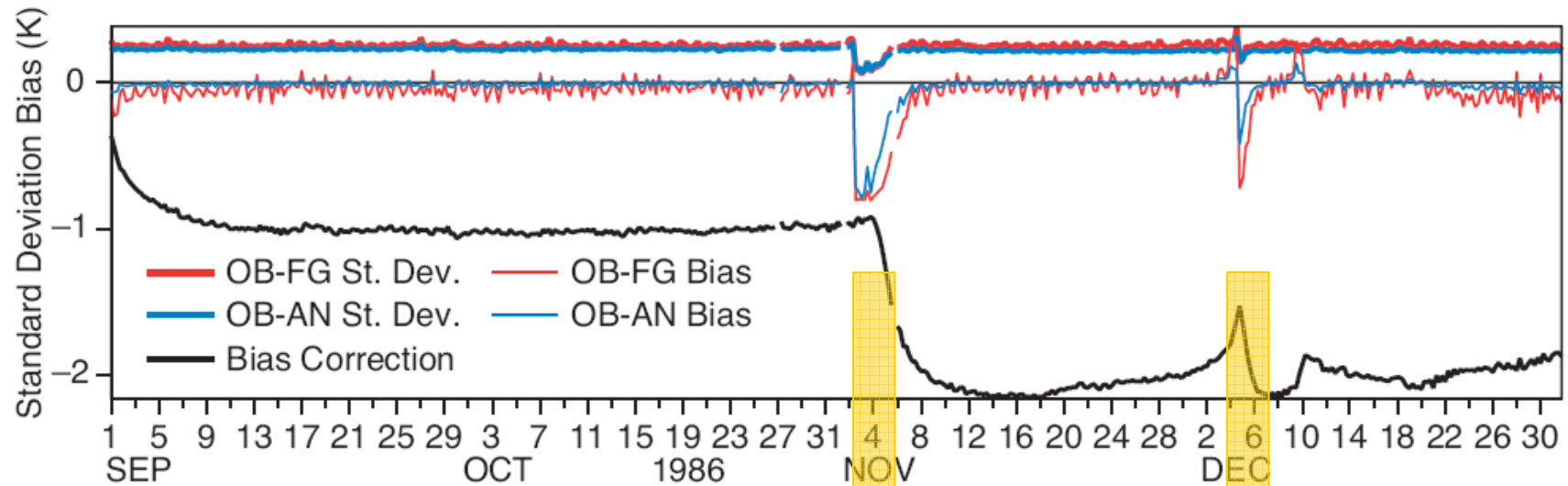
Variational bias correction (VarBC) applied to radiance data

The data assimilation system optimizes the bias corrections,
using all available information from observations and model

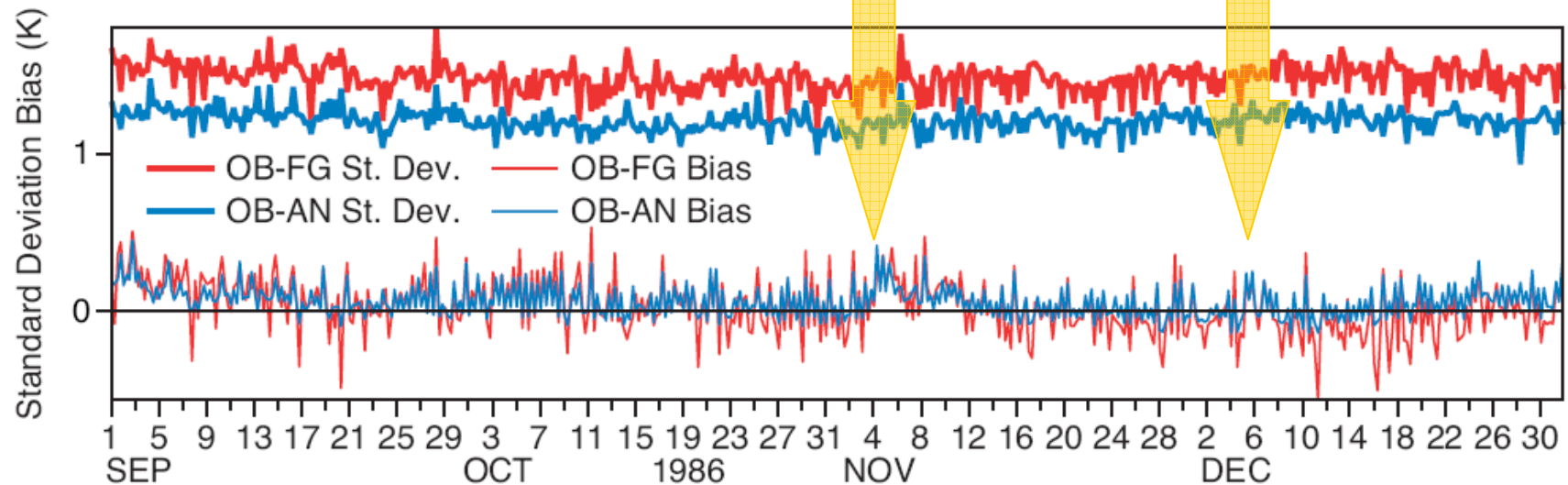
- **Global radiance bias expressed in terms of *bias predictors*:**
 - A constant offset
 - Instrument scan position
 - Functions of the observed atmospheric column (e.g. integrated lapse rate)
- Separately for each satellite/sensor/channel: $b(\beta, \mathbf{x}) = \beta_0 + \sum_i \beta_i p_i$
- **Estimate the bias parameters in the variational analysis (Derber and Wu 1998)**

$$\begin{aligned} & \mathbf{J}_b: \text{background constraint for } \mathbf{x} & \mathbf{J}_\beta: \text{background constraint for } \beta \\ & \underbrace{\hspace{10em}} & \underbrace{\hspace{10em}} \\ \mathbf{J}(\mathbf{x}, \beta) = & (\mathbf{x}_b - \mathbf{x})^T \mathbf{B}_x^{-1} (\mathbf{x}_b - \mathbf{x}) + (\beta_b - \beta)^T \mathbf{B}_\beta^{-1} (\beta_b - \beta) \\ & + \underbrace{[\mathbf{y} - \mathbf{b}_o(\mathbf{x}, \beta) - \mathbf{h}(\mathbf{x})]^T \mathbf{R}^{-1} [\mathbf{y} - \mathbf{b}_o(\mathbf{x}, \beta) - \mathbf{h}(\mathbf{x})]}_{\mathbf{J}_o: \text{bias-corrected observation constraint}} \end{aligned}$$

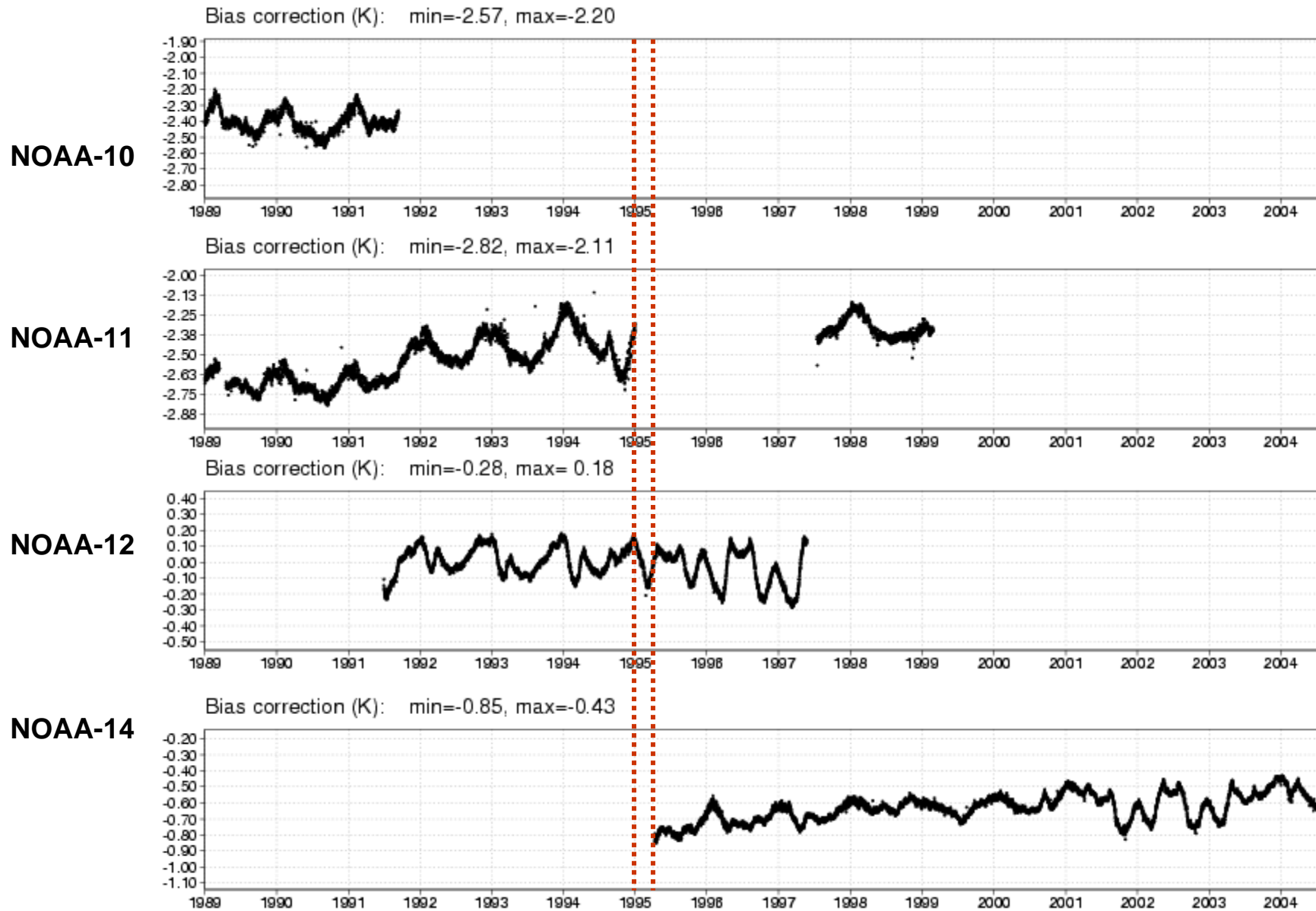
Example: NOAA-9 MSU channel 3, solar flare disruption



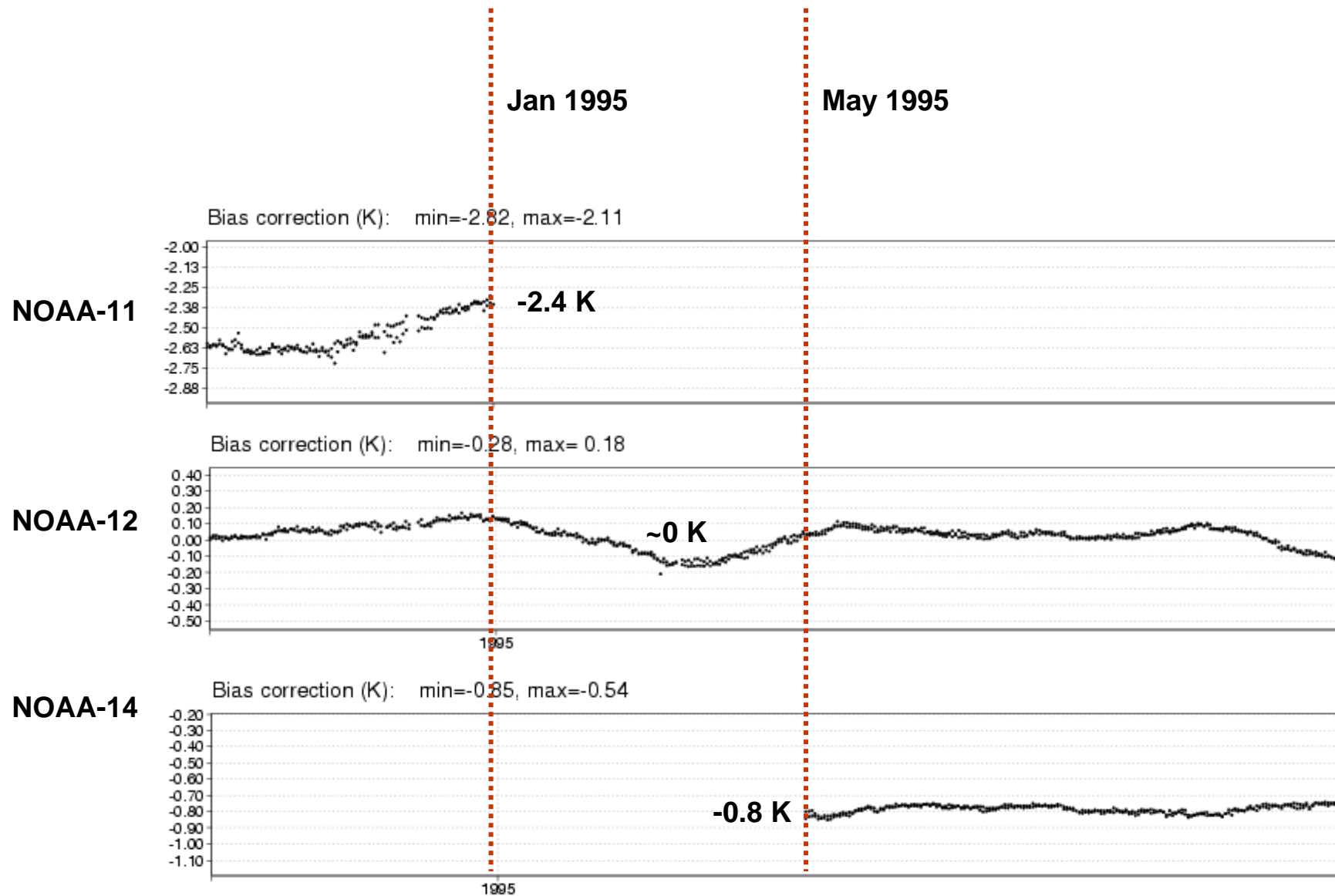
200 hPa temperature departures from radiosonde observations



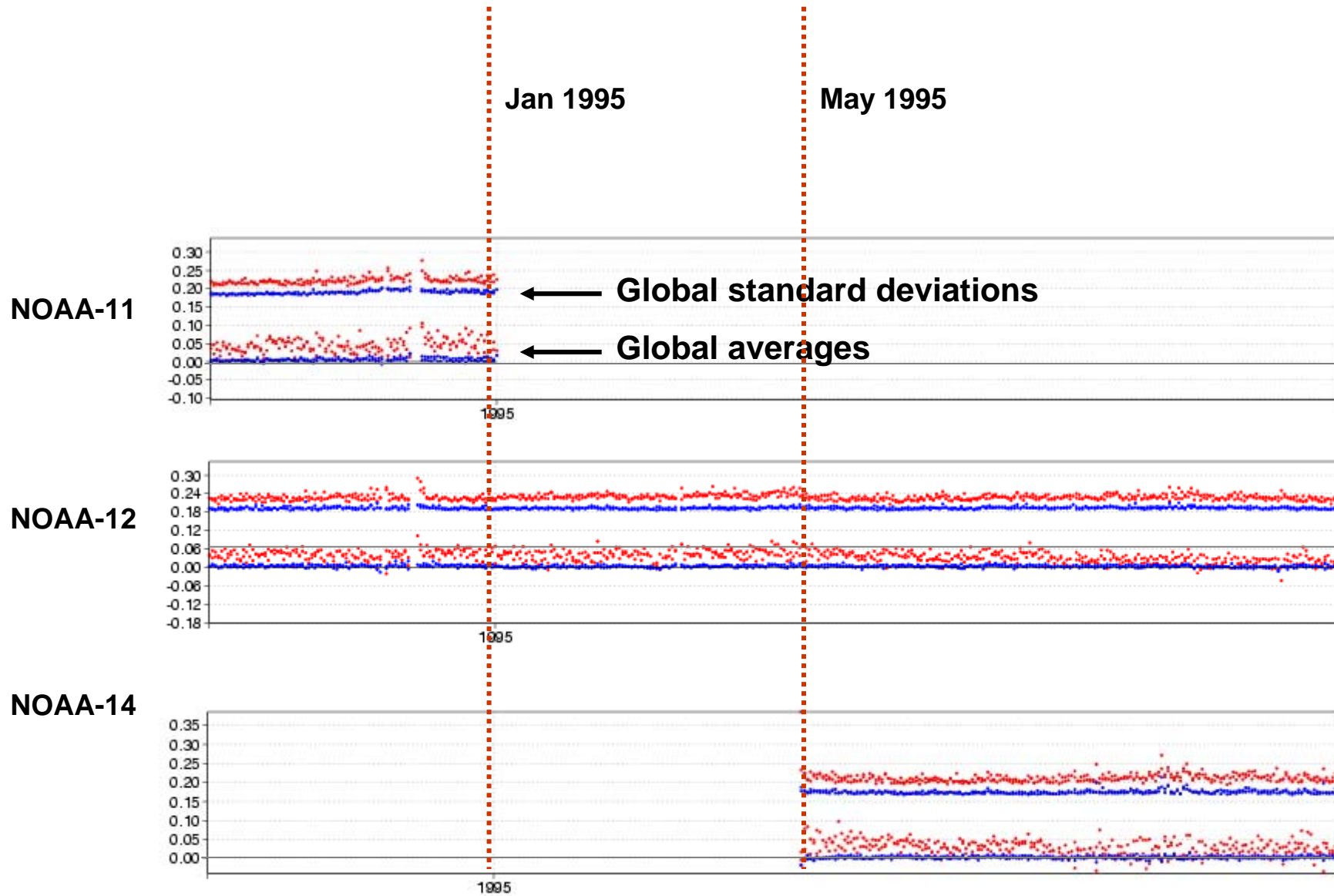
MSU Ch3 variational bias corrections in ERA-Interim



Inter-satellite calibration based on VarBC



MSU Ch3 bias-corrected Tb departures



Limitations of variational bias correction

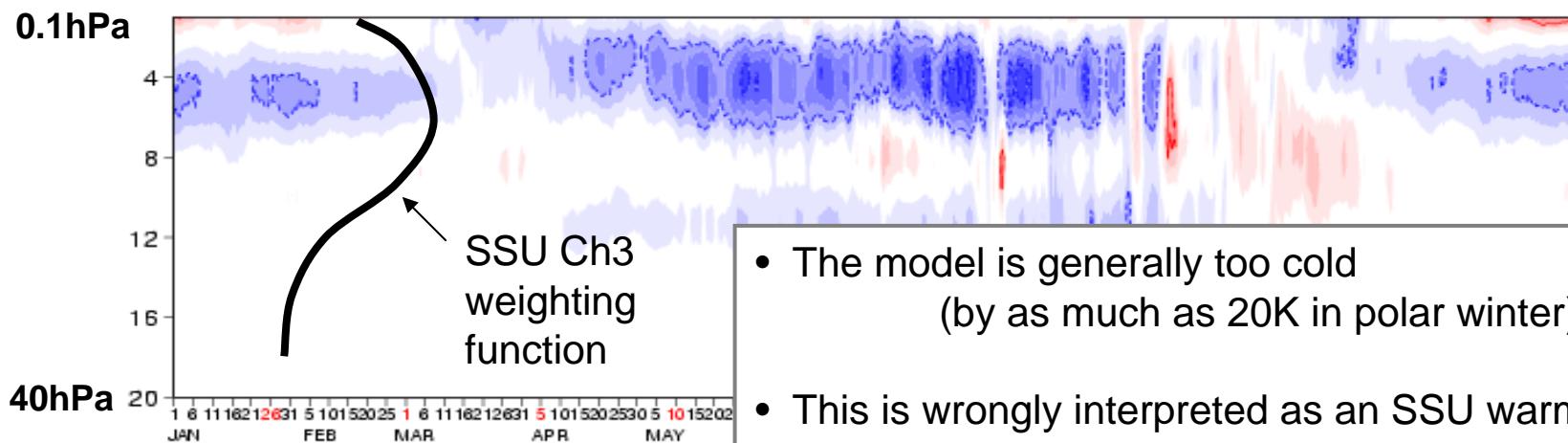
The analysis adjusts the bias parameters in order to optimize the consistency among the various information sources:

$$\begin{aligned} & \mathbf{J}_b: \text{background constraint for } \mathbf{x} & \mathbf{J}_\beta: \text{background constraint for } \beta \\ & \underbrace{\hspace{10em}} & \underbrace{\hspace{10em}} \\ \mathbf{J}(\mathbf{x}, \beta) &= (\mathbf{x}_b - \mathbf{x})^T \mathbf{B}_x^{-1} (\mathbf{x}_b - \mathbf{x}) + (\beta_b - \beta)^T \mathbf{B}_\beta^{-1} (\beta_b - \beta) \\ & \quad + \underbrace{[\mathbf{y} - \mathbf{b}_o(\mathbf{x}, \beta) - \mathbf{h}(\mathbf{x})]^T \mathbf{R}^{-1} [\mathbf{y} - \mathbf{b}_o(\mathbf{x}, \beta) - \mathbf{h}(\mathbf{x})]}_{\mathbf{J}_o: \text{bias-corrected observation constraint}} \end{aligned}$$

- One has to be careful about which (and how many) sources to correct
- It won't work unless there is sufficient information to anchor the system
- Since VarBC corrects the (mean) departures, systematic errors in the forecast model may interfere

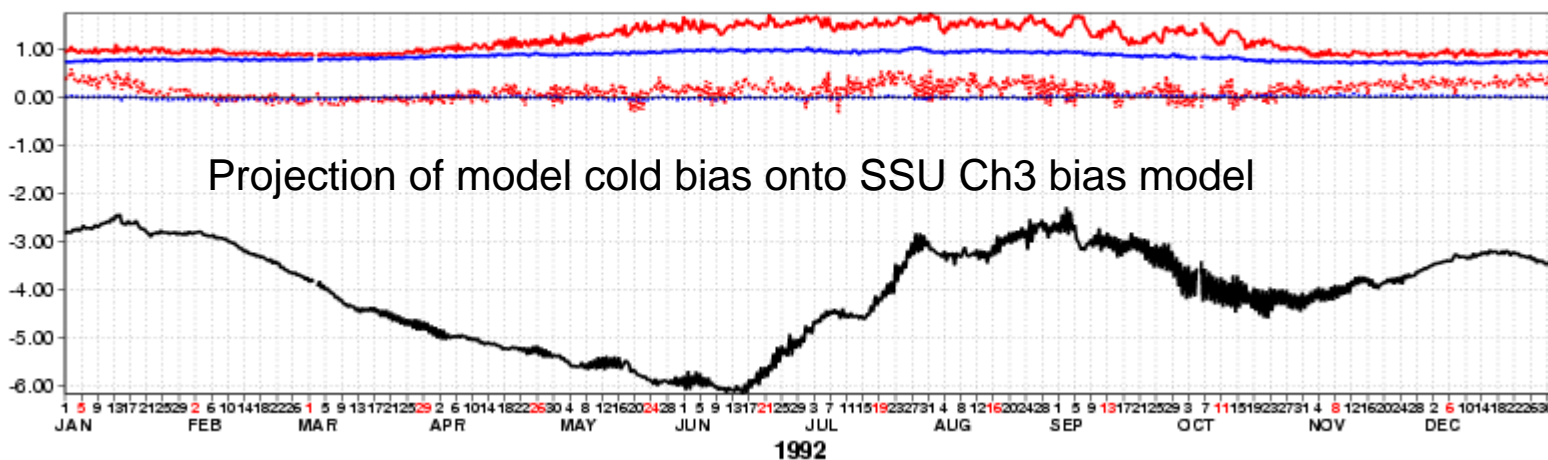
Limitation of VarBC: Interaction with model bias

Mean temperature [K] 120-hour forecast errors for experiment 1112 : Antarctica

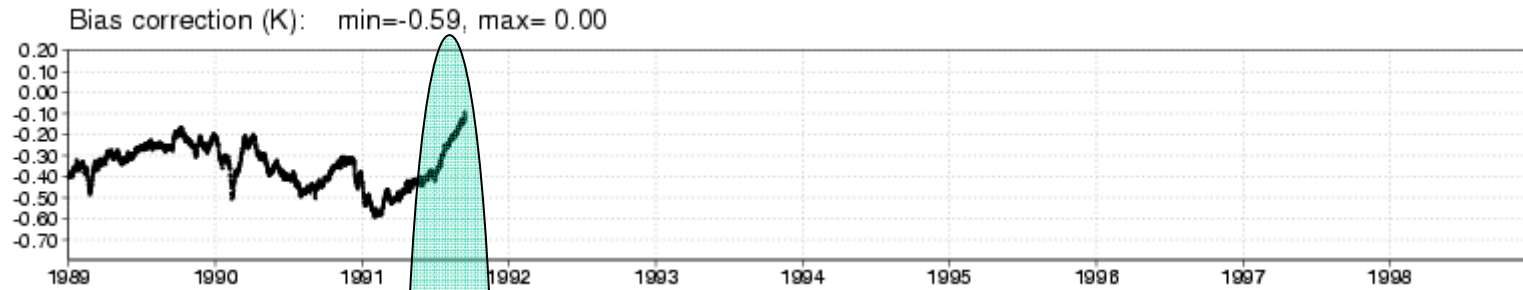


- The model is generally too cold (by as much as 20K in polar winter)
- This is wrongly interpreted as an SSU warm bias
- SSU is then “corrected” to agree with the model

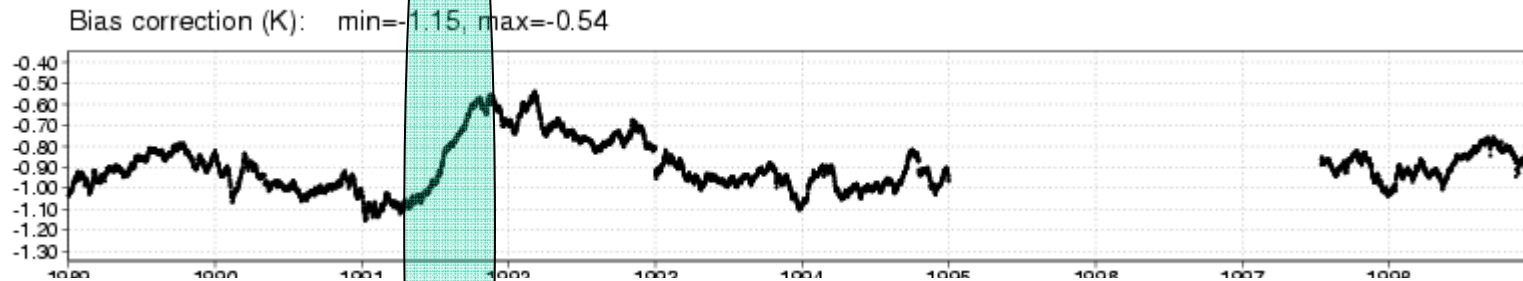
1112 (DA) : TOVS-1C_NOAA-11_SSU_Tb Ch rms and bias (K) OB-FG (red) OB-AN (blue) BIASCOR (mean)



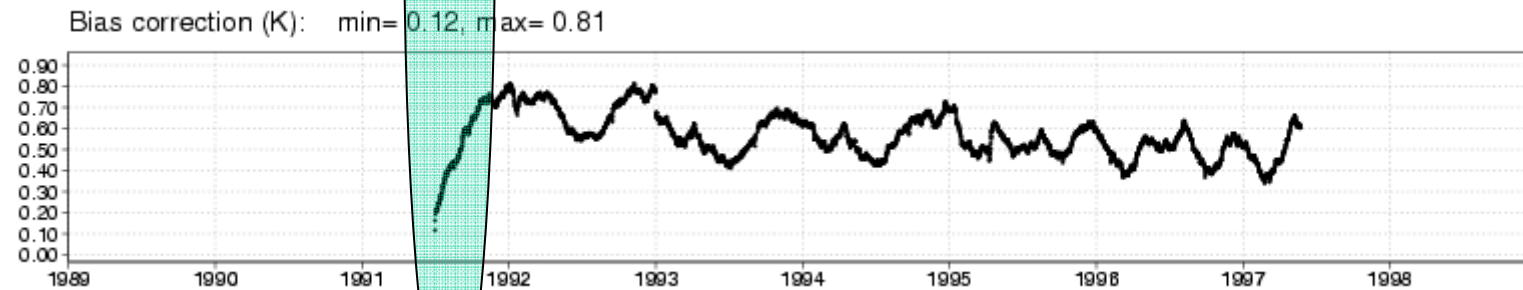
MSU Ch4: Tropical mean bias corrections



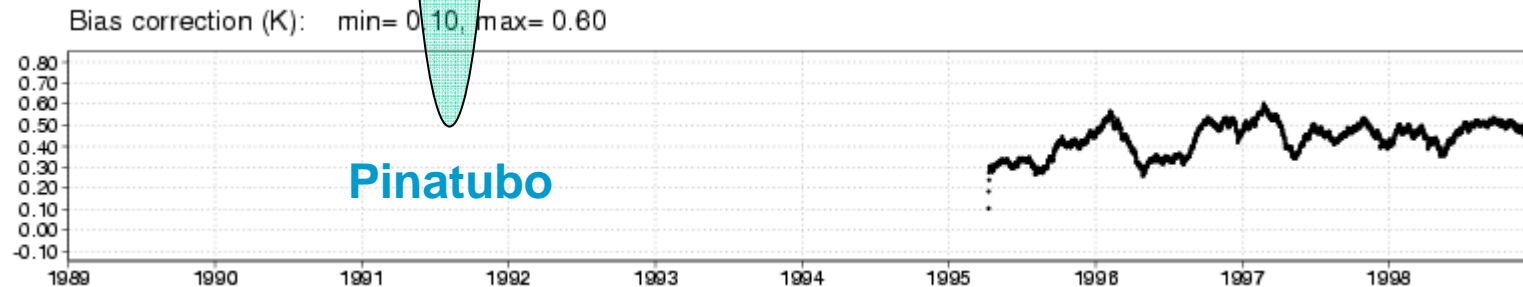
NOAA-10



NOAA-11



NOAA-12



NOAA-14

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GPS as a baseline for other instruments

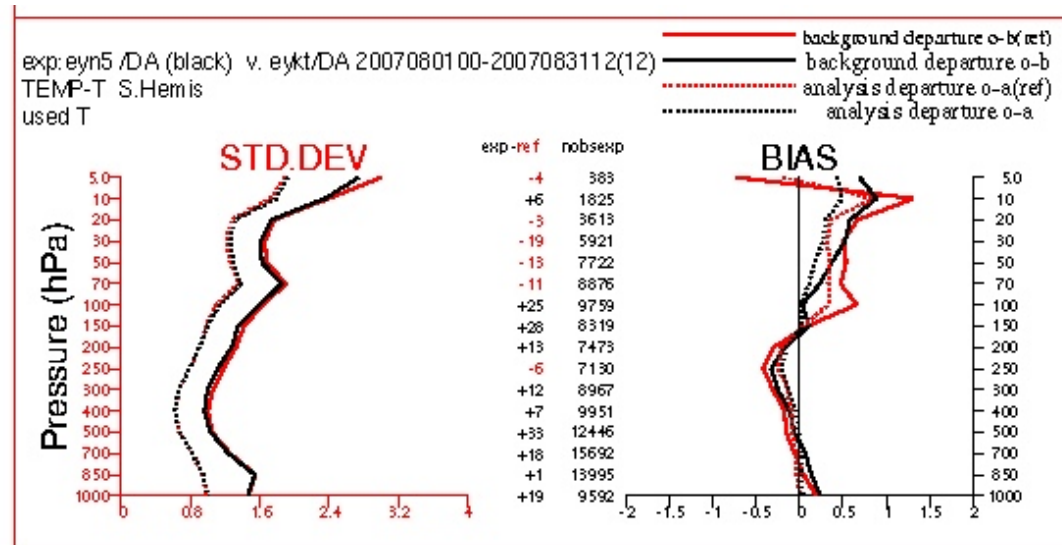
How do GPS data affect the bias corrections of other instruments?

Experiment in a simplified NWP system (Sean Healy):

- Period: June 15th to August 31st, 2007
- T511/159 Cy32r3
- **CONTROL**: Assimilates all conventional measurements + AMSU-A and MHS instruments from the METOP-A satellite
- **COSMIC**: As control, but with all COSMIC measurements assimilated
- **VarBC switched on**. How do the COSMIC measurements modify the evolution of the bias correction of AMSU-A radiances?

Fit to radiosonde and COSMIC measurements (SH)

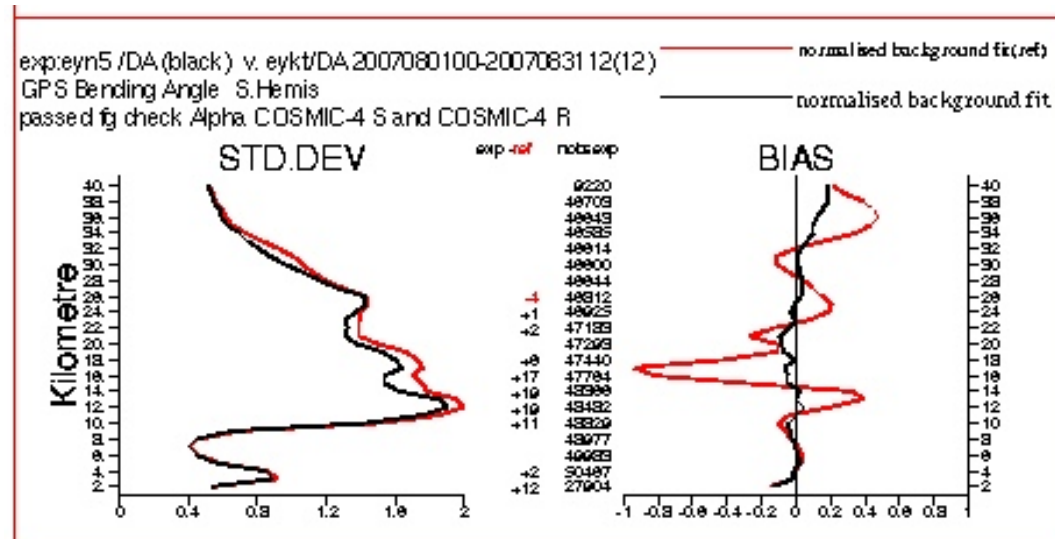
Radiosonde temperature

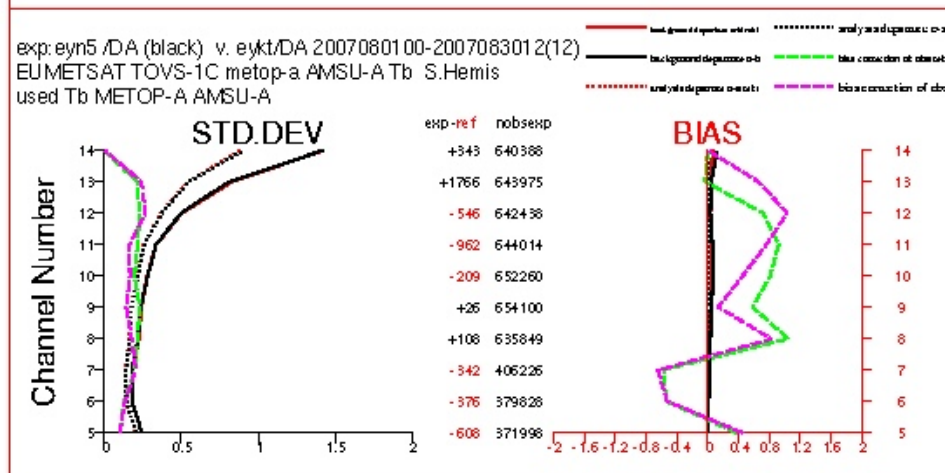
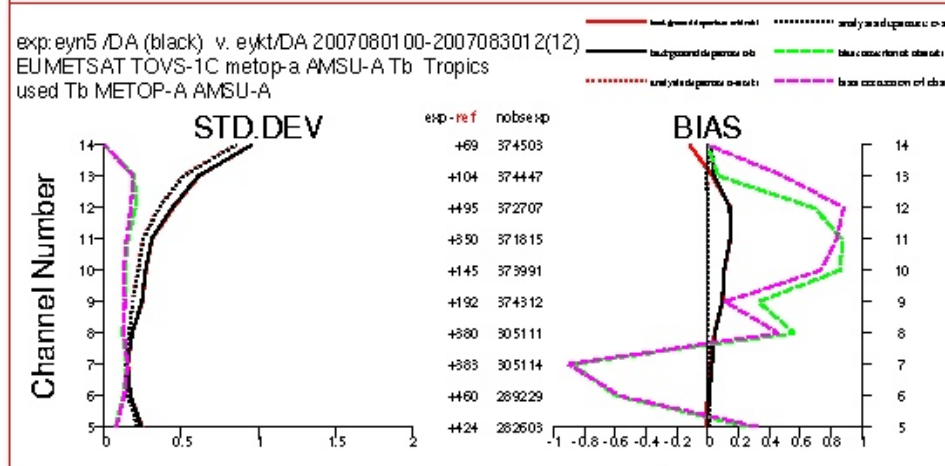
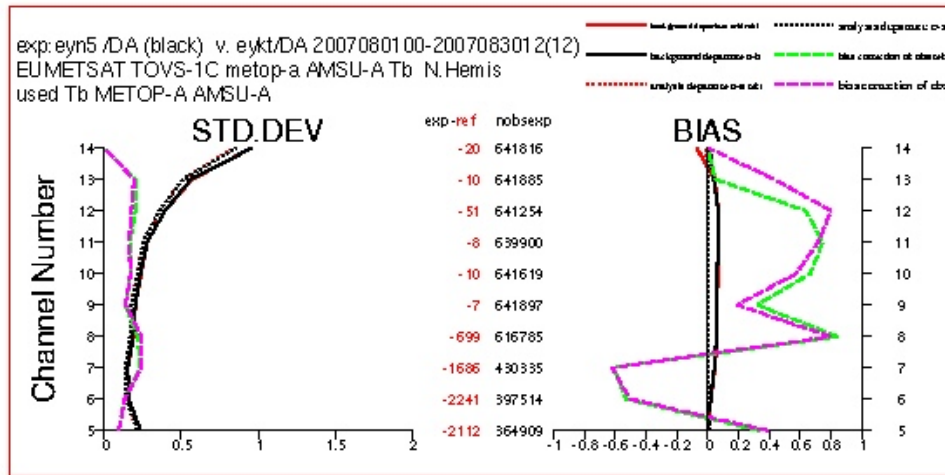


CONTROL: red
COSMIC: black

Bending angle COSMIC-4

(normalised O-B
 departures)





Bias correction applied to AMSU-A radiances for August 2007

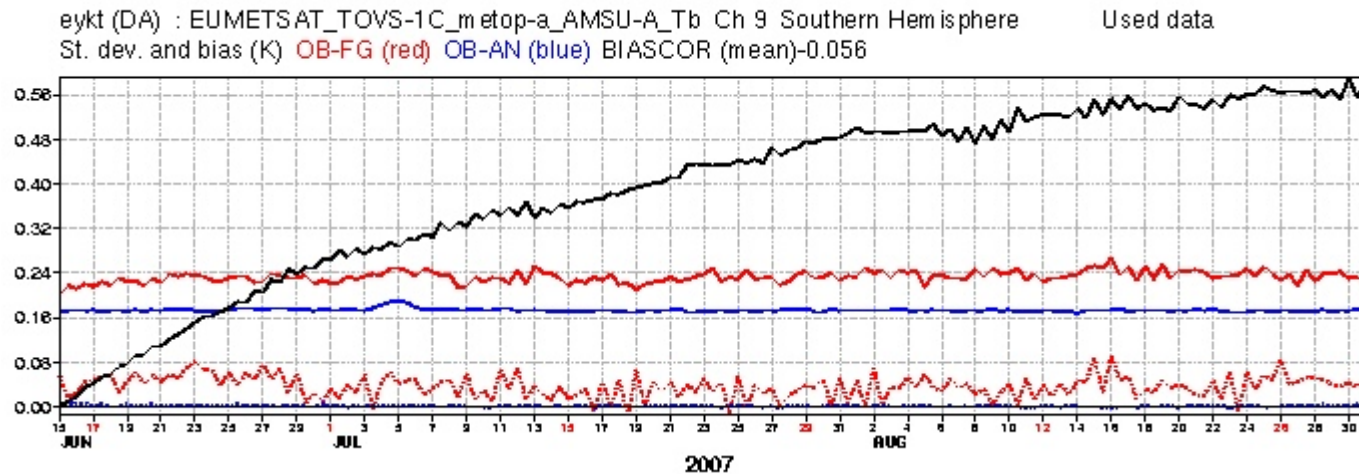
Green = Control
 Pink = COSMIC

Bias correction applied to channels 8,9,10,11 generally smaller with COSMIC assimilated.

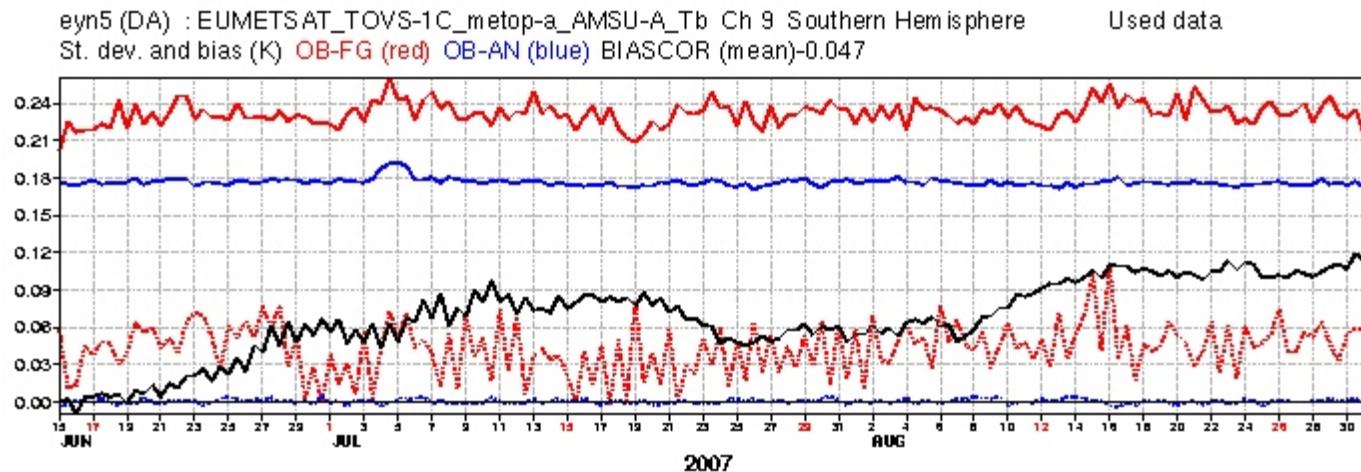
Larger for channels 12,13.

Evolution of the bias correction for AMSU-A, channel 9 (Southern Hemisphere)

CONTROL (NO COSMIC MEASUREMENTS)



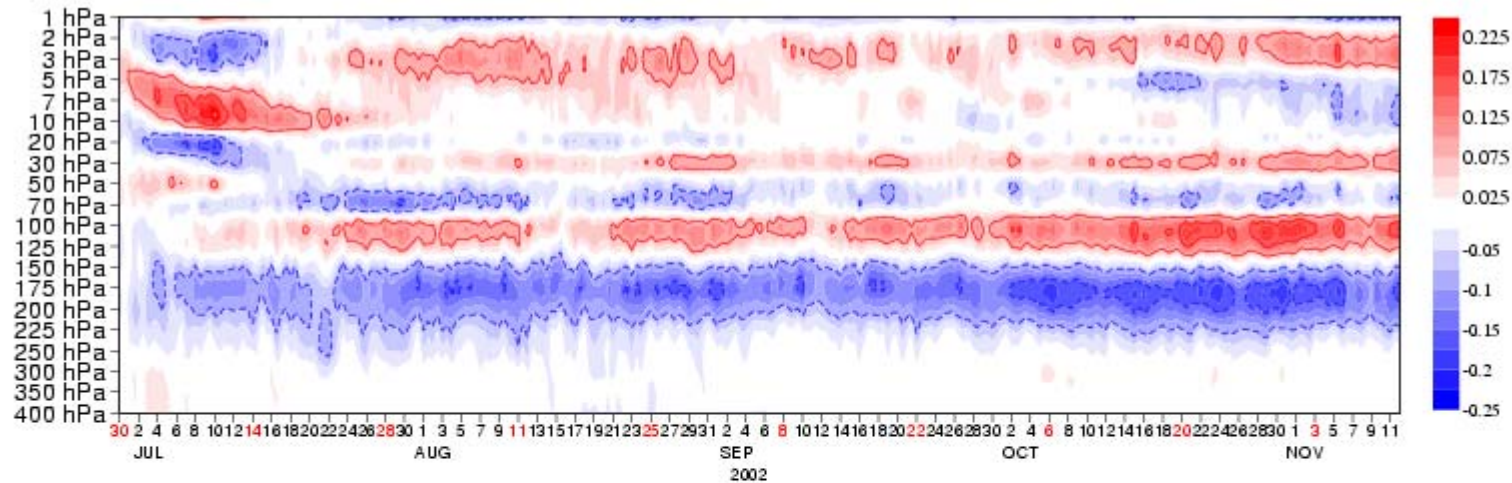
COSMIC MEASUREMENTS ASSIMILATED



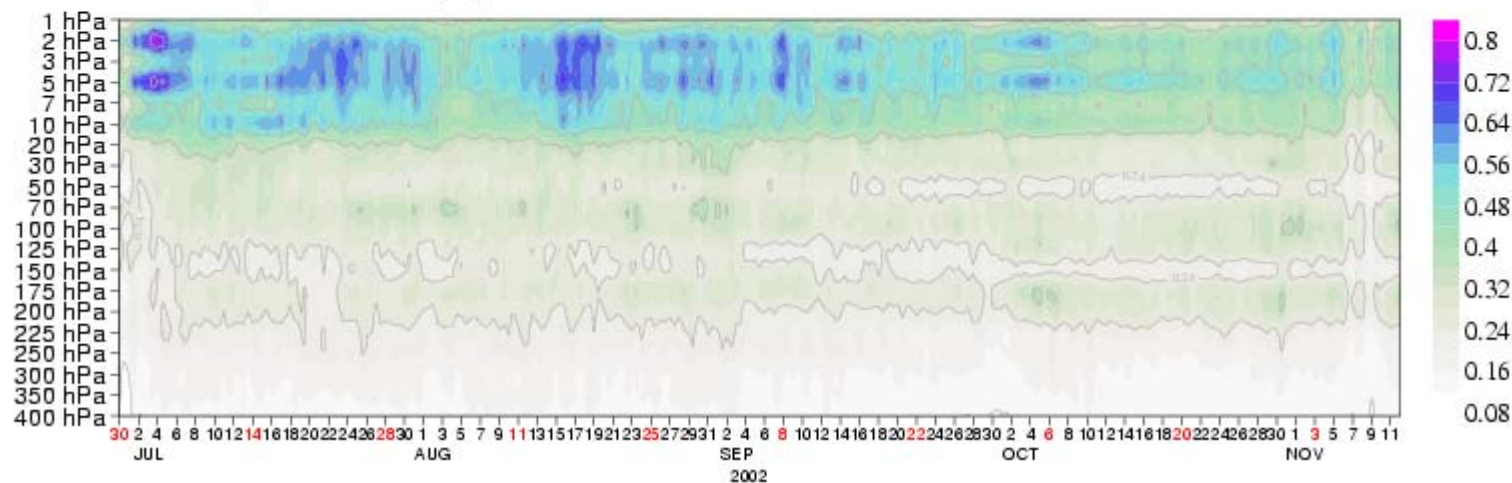
Impact of CHAMP data in ERA-Interim

A preliminary impact experiment was performed ahead of ERA-Interim:

Mean temperature [K] differences 1230 an - 1228 an : Global



Rms temperature [K] differences 1230 an - 1228 an : Global

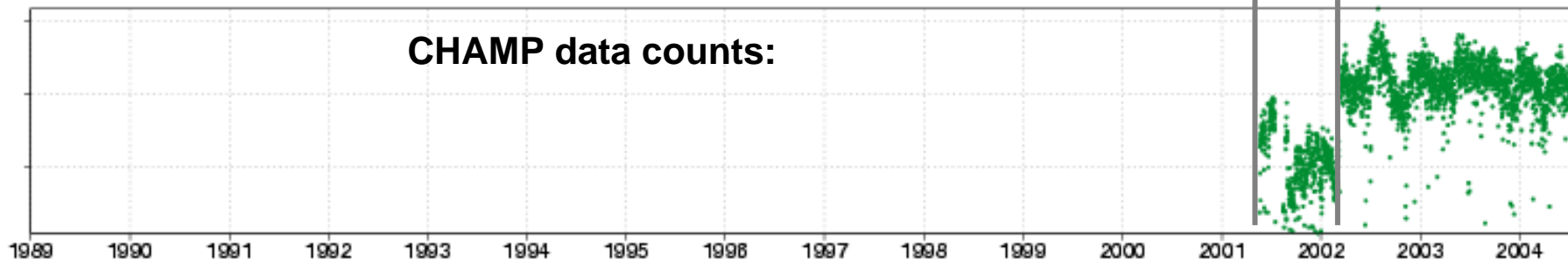


Impact of CHAMP data in ERA-Interim

Actual impact in ERA-Interim is more difficult to assess, since

- The number of CHAMP profiles is small
- The period is relatively short
- There are many other changes in the observing system during the same period

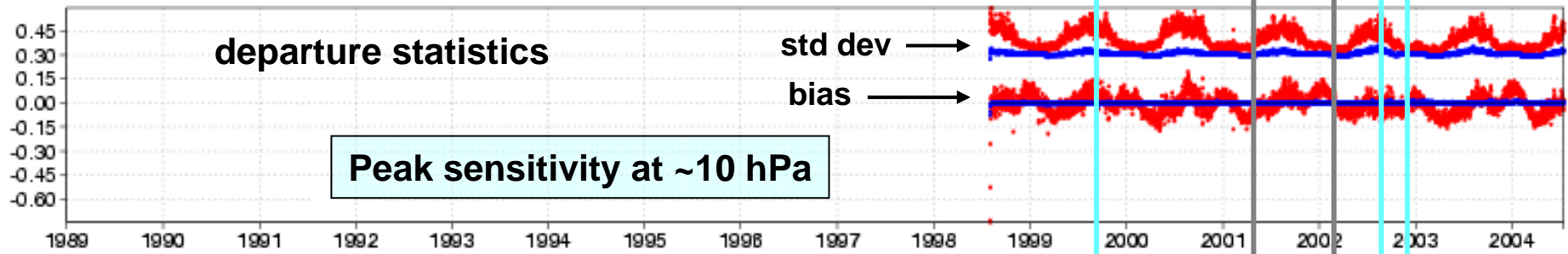
~150 bending angle profiles/day



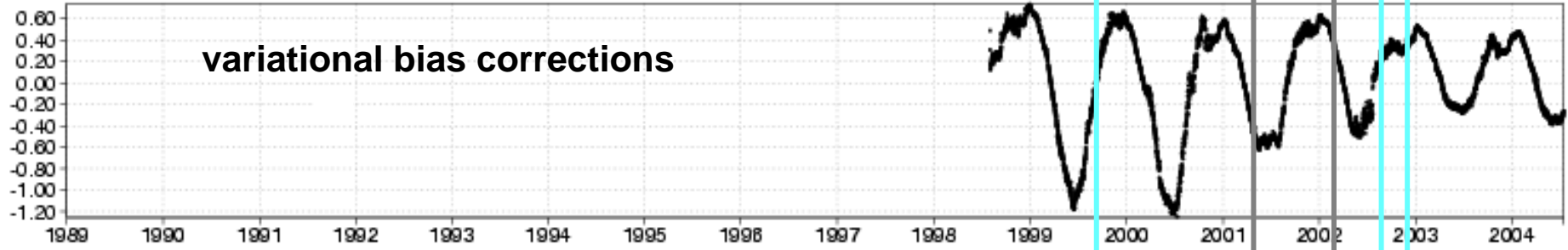
Impact of CHAMP: Constraining VarBC

NOAA-15 AMSU-A Ch 12 Tb (Southern Hemisphere)

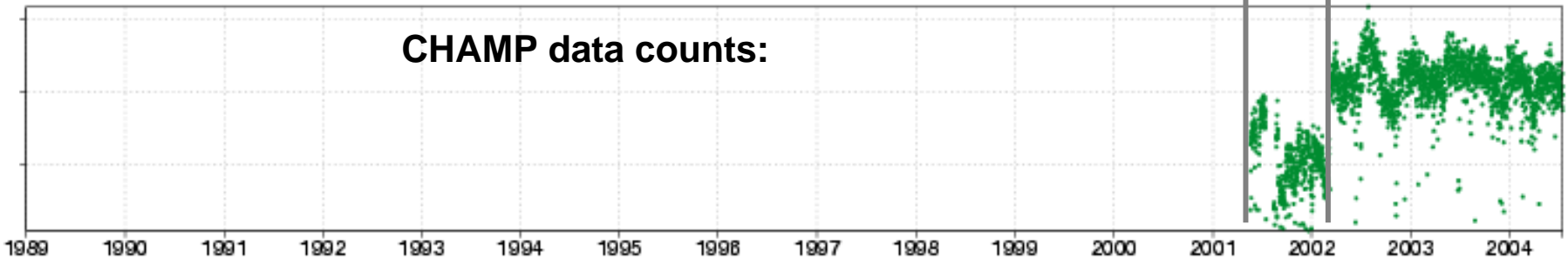
St. dev. and bias (K) OB-FG OB-AN



Bias correction (K): min=-1.25, max= 0.73



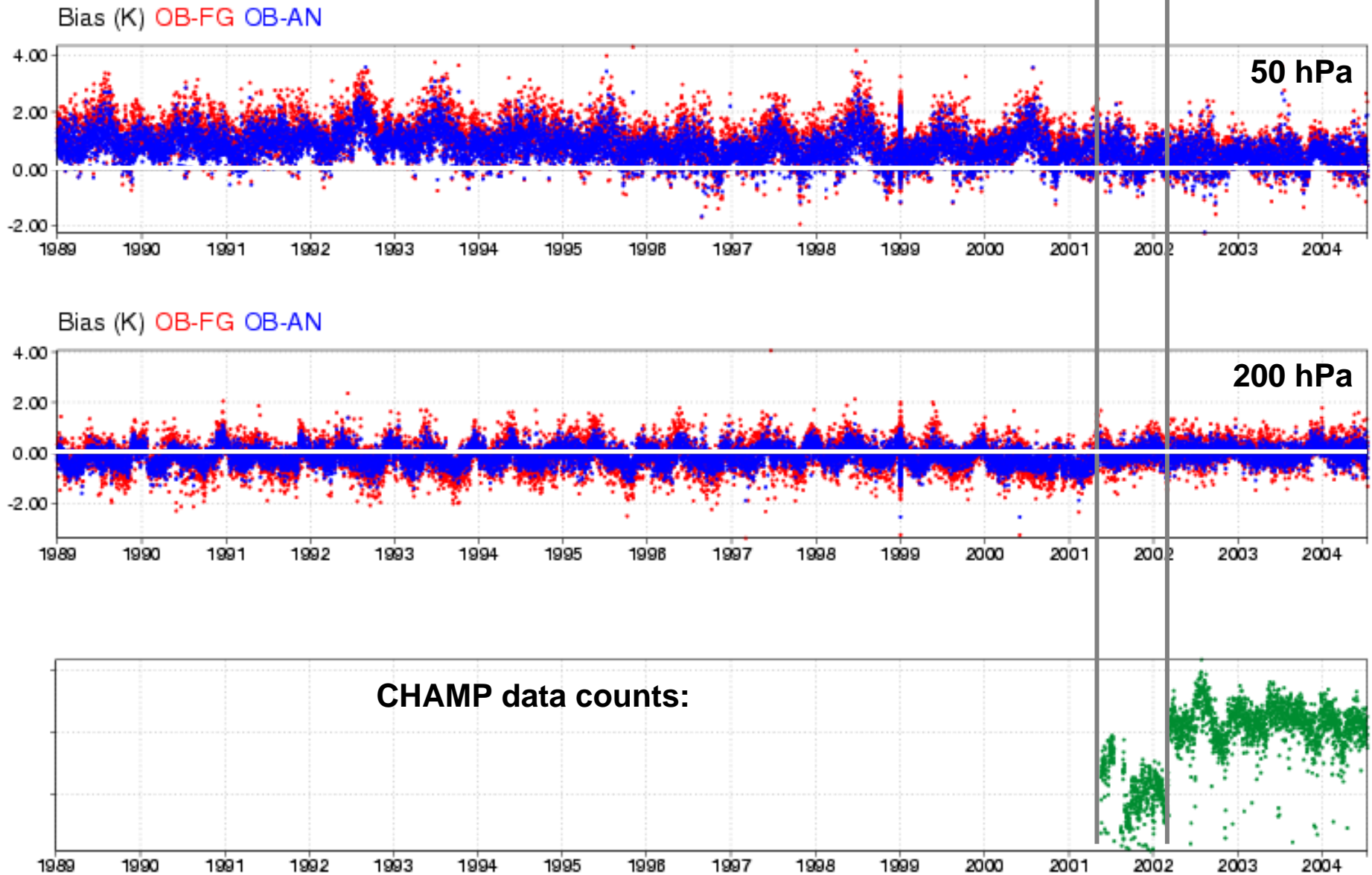
Data count (/12h)



Impact of CHAMP: Better fit to radiosonde data

Radiosonde temperature mean departures (S Polar Cap)

~150 bending angle profiles/day



Summary

Expectations from the reanalysis perspective:

GPS data should be especially valuable because they

- resolve scales that are not well observed by other instruments,
- provide global uniform sampling, and
- do not require bias correction

Can GPS data provide a baseline for bias corrections of other instruments ?

- Early experience with ERA-Interim seems to confirm these points.
- Potential of GPSRO for climate monitoring: *no inter-satellite biases?*
- Reprocessing activities are extremely valuable and should be encouraged