



# Use of satellite data in Polar regions

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Acknowledgements

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**ECMWF**

**or**

**(from Mark Drinkwater's talk)**

**European Centre for Medium-range  
“*Geophysical Noise*” Forecasts**



# Overview

**...what atmospheric information (for NWP, reanalysis, climate) can we estimate from satellite observations in polar regions ? ...**

- types of satellite observation available
- the data assimilation system
- radiative transfer (forward) modelling
- quality control and data selection
- surface ambiguity
- handling of systematic errors
- some successes
- summary



# Satellite observations available / used

**NOAA satellites (N15/N16/N17/N18)**  
(**AMSUA**, **AMSUB**, **HIRS**, **SBUV**)

**NASA AQUA/TERRA**  
(**AIRS**, **AMSUA**, **MODIS-AMV**)

**NASA QuikSCAT**  
(**SeaWinds**)

**DMSP satellites (F13,F14,F15,F16)**  
(**SSM/I**, **SSM/IS**)

**GPS satellites**  
(**CHAMP**, **COSMIC**)

**ESA ENVISAT**  
(**MIPAS**, **GOMOS**, **SCIAMACHY**)

**red = radiance observations**

**green = retrieved products**

*Note that we make no great distinction between “operational” and “research” missions*



# What do these instruments measure ?

They **DO NOT** measure TEMPERATURE  
They **DO NOT** measure HUMIDITY or OZONE  
They **DO NOT** measure WIND  
They **DO NOT** measure SNOW/ICE properties

Satellite instruments (active and passive) can only measure the **radiance**  $L$  that reaches the top of the atmosphere at given frequency  $\nu$   
The measured radiance is **related to geophysical atmospheric variables** by the **radiative transfer equation**

$$L(\nu) = \int_0^{\infty} B(\nu, T(z)) \left[ \frac{d\tau(\nu)}{dz} \right] dz + \text{Surface emission} + \text{Surface reflection/scattering} + \text{Cloud/rain contribution} + \dots$$

atmospheric term

surface terms



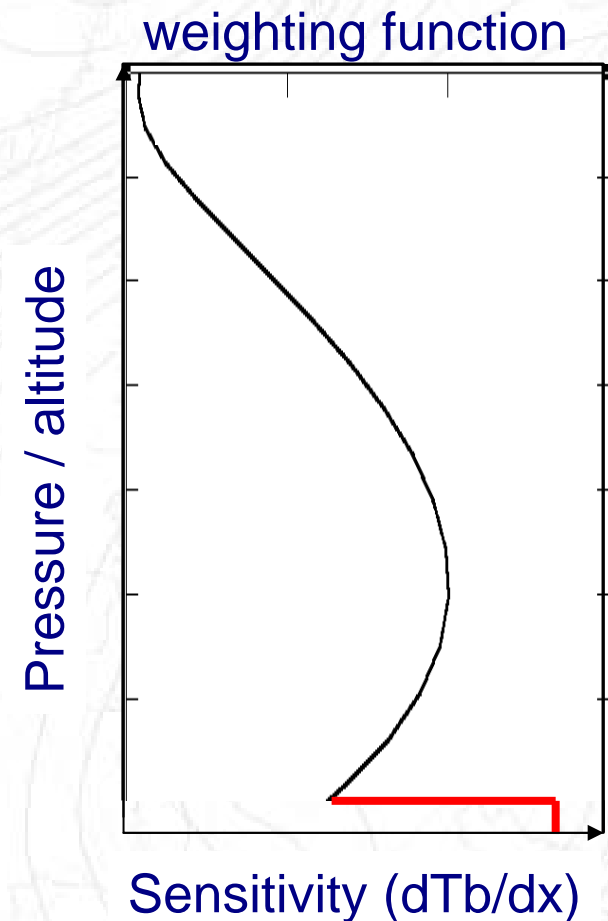
# Radiance Observations



# Sensitivity and Weighting Functions

The sensitivity of a particular radiance observation to temperature (or indeed other geophysical parameters) at different altitudes is described by its **weighting function** (closely related to the jacobian of the radiative transfer model).

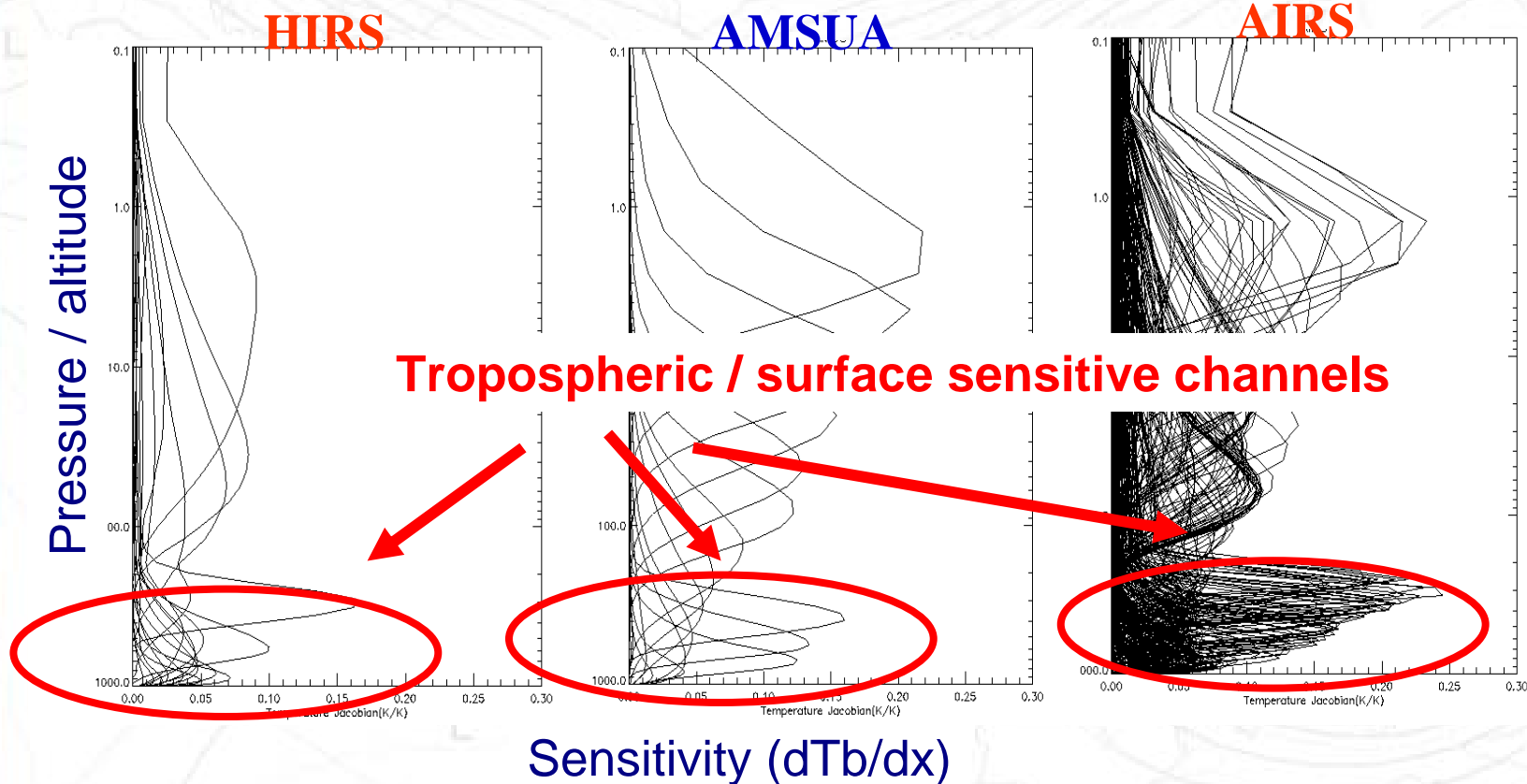
In general these have a **broad vertical extent** and e.g. data sensitive to the lower troposphere are also **sensitive to the surface**.





# Tropospheric / surface sensing channels

Radiance observations made in channels (=frequencies) where the atmospheric absorption is relatively **weak** are sensitive to the lower troposphere and surface.

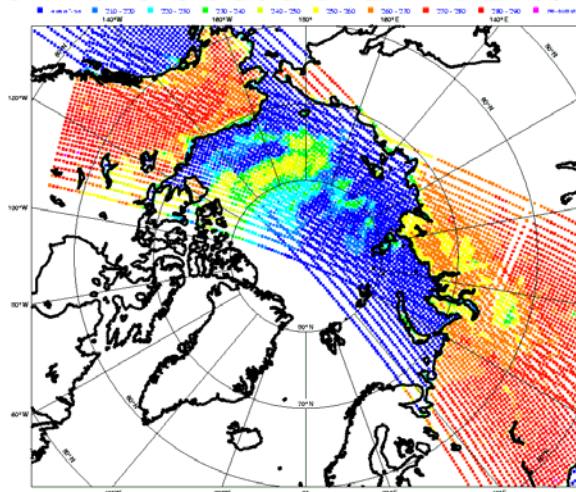






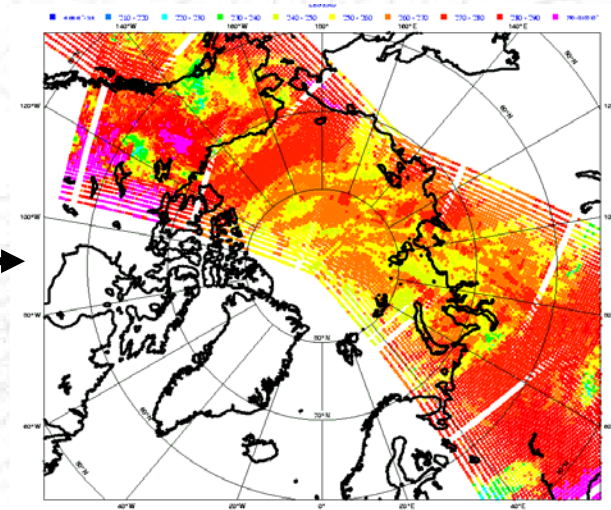
# Tropospheric / surface sensing channels

## Microwave AMSU-A

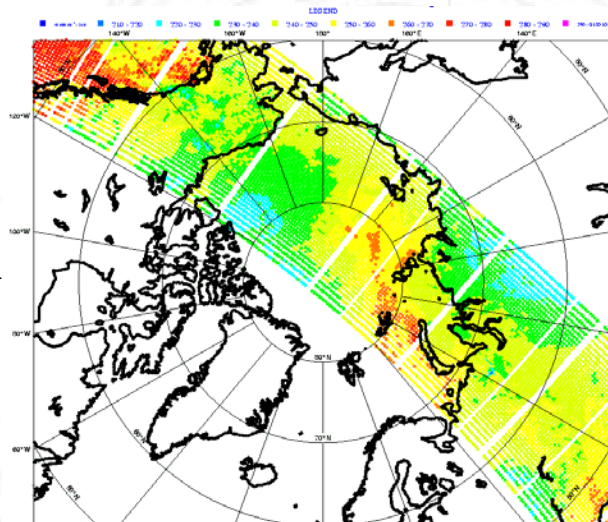
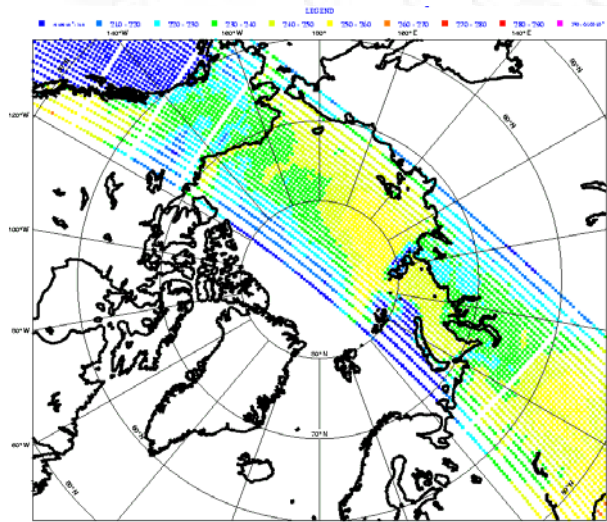


summer

## Infrared HIRS / AIRS



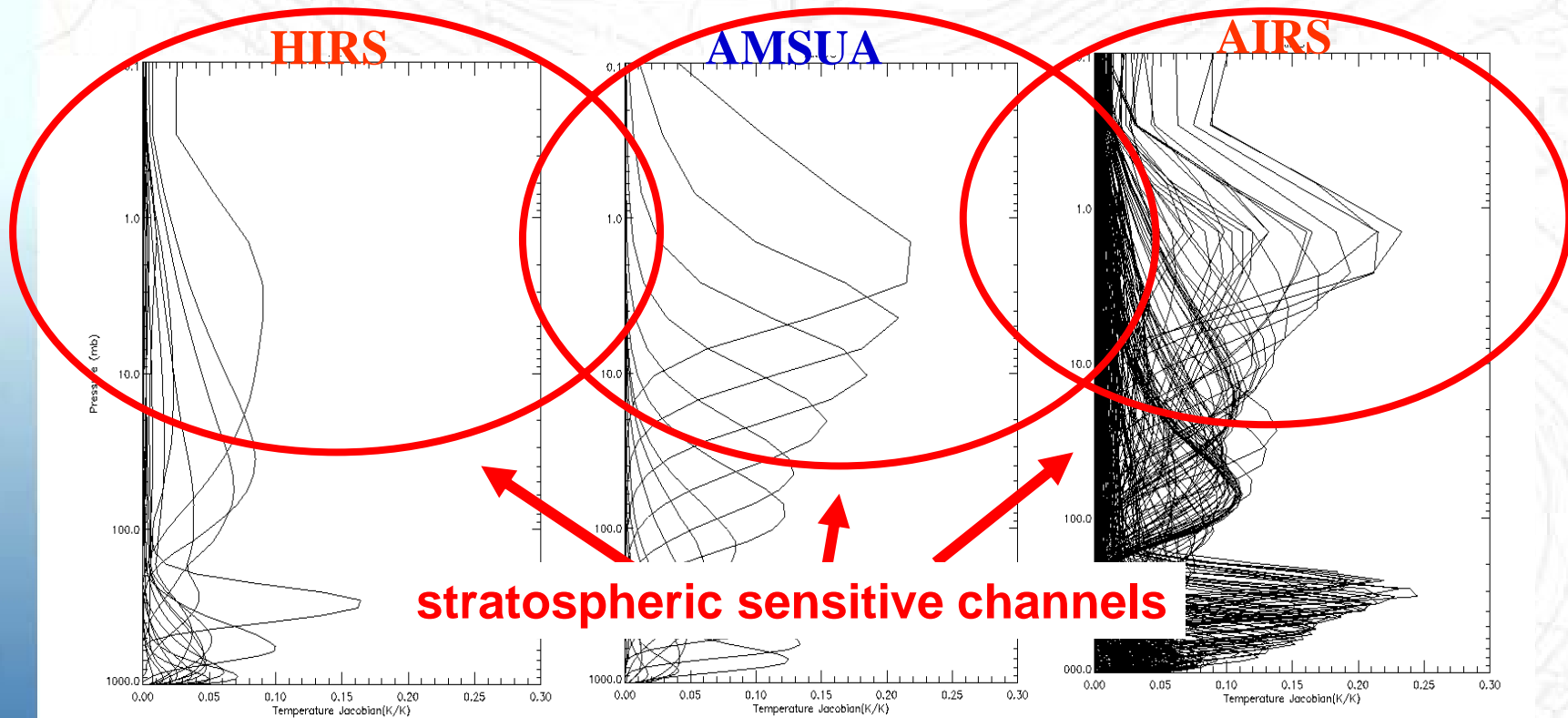
winter





# Stratospheric sensing channels

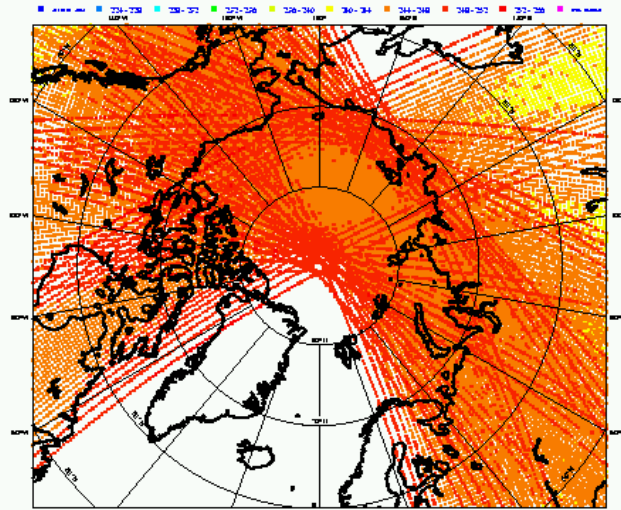
Radiance observations made in channels (=frequencies) where the atmospheric absorption is **strong** are sensitive to the upper troposphere and stratosphere.





# Stratospheric sensing channels

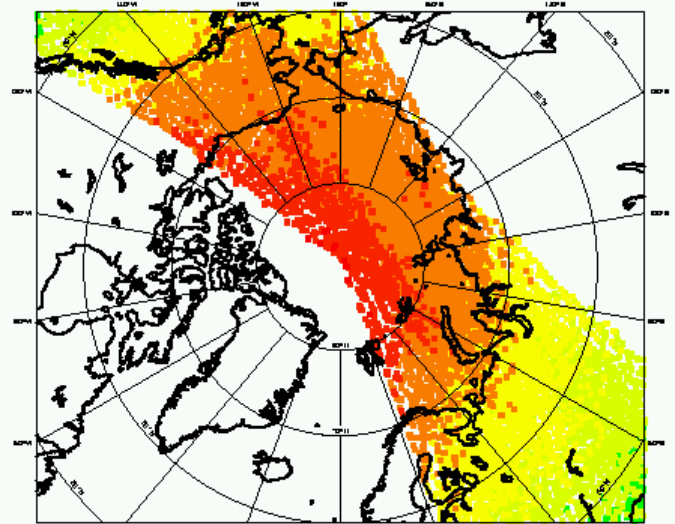
Microwave AMSU-A (~5hPa)



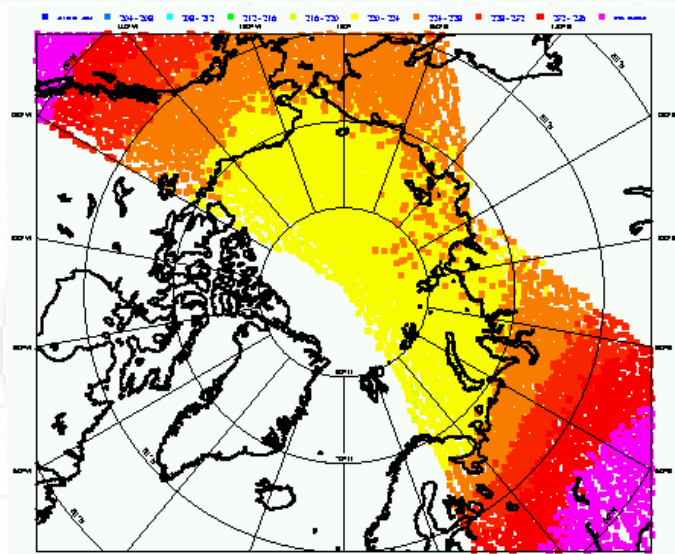
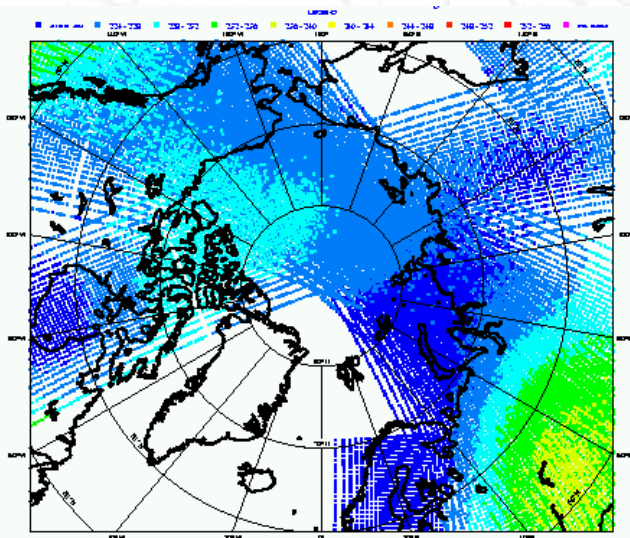
summer



Infrared AIRS (~1hPa)



winter





# Retrieved Products





# Retrieved Products

Observed radiance observations are **pre-converted** to geophysical products (externally) before being provided to the NWP data assimilation system.

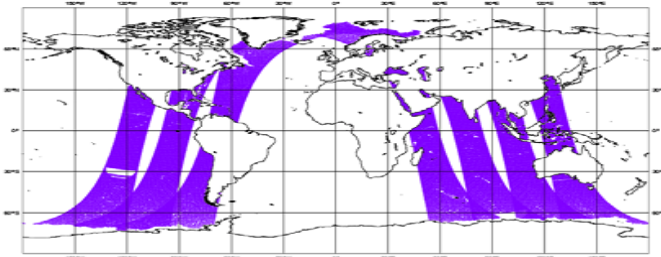
In most cases these have been phased out and replaced with the **preferred direct assimilation** of the original radiance observations.

However some have been retained and are still assimilated.



# Satellite retrieved products

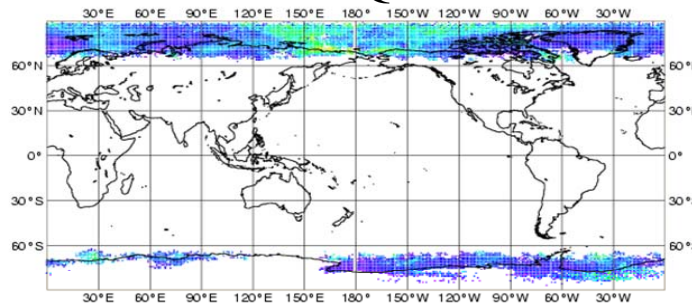
NASA QuickScat



Sea surface  
wind vectors



TERRA / AQUA MODIS



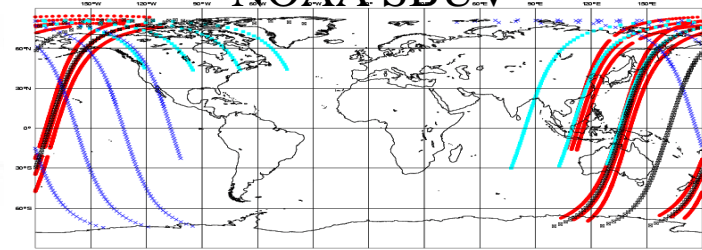
atmospheric wind  
vectors



ozone  
concentrations



NOAA SBUV



Plus composite products  
of SSM/I, AVHRR feeding  
Into sea ice / SST fields



# Satellite radiance assimilation



# The data assimilation system

**Radiances** are assimilated **directly in to the 4D-Var** analysis system, which finds the trajectory of atmospheric states that best minimizes a cost or penalty function

$$\begin{aligned} J(x) &= (x - x_b)^T \mathbf{B}^{-1} (x - x_b) && \leftarrow \text{Fit to the background} \\ &+ \sum_i (y_i - \mathbf{H}[x_i])^T \mathbf{R}^{-1} (y_i - \mathbf{H}[x_i]) && \leftarrow \text{Fit to the observations} \\ &+ J_c && \leftarrow \text{Other constraints} \end{aligned}$$

Subject to the additional implicit *hard constraint* that the atmospheric states follow the model equations

$$\forall i, x_i = \mathbf{M}_0 \rightarrow i(x)$$





# The key elements of satellite radiance assimilation

- Radiative Transfer (or forward) Model ←
- Quality Control (data screening) ←
- Handling of surface ambiguity ←
- Observation errors (inc errors in RTM)
- Handling of systematic errors (biases) ←
- Background errors



# Radiative Transfer



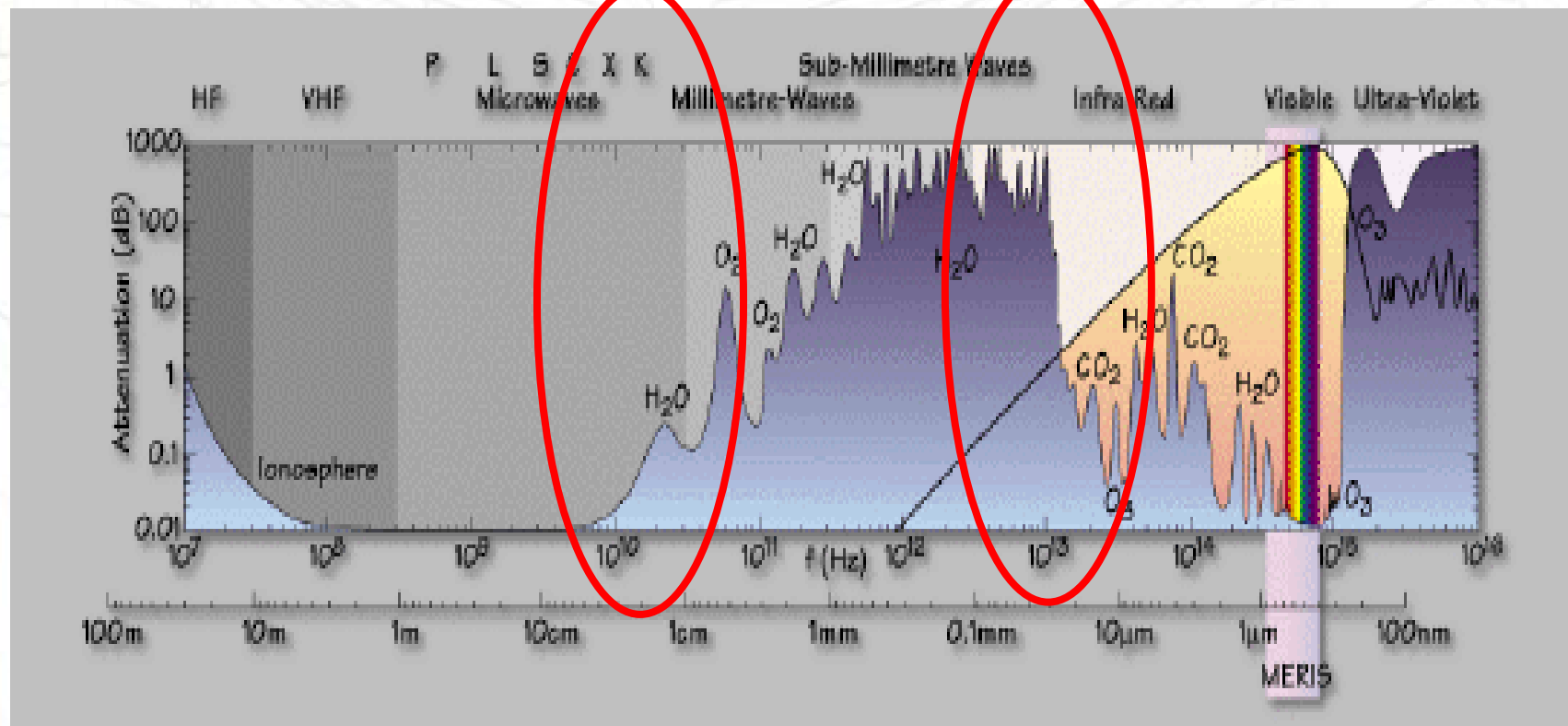
# Radiative Transfer (1)

## Atmospheric Radiation Spectrum

Scat, Altimeter  
AMSU, SSM/I

HIRS GOES  
METEOSAT  
AIRS

SBUV





## Radiative Transfer (2)

The RTM is used to simulate radiance from the NWP model fields for comparison to the satellite observed radiances. The main issues in **polar areas** are:

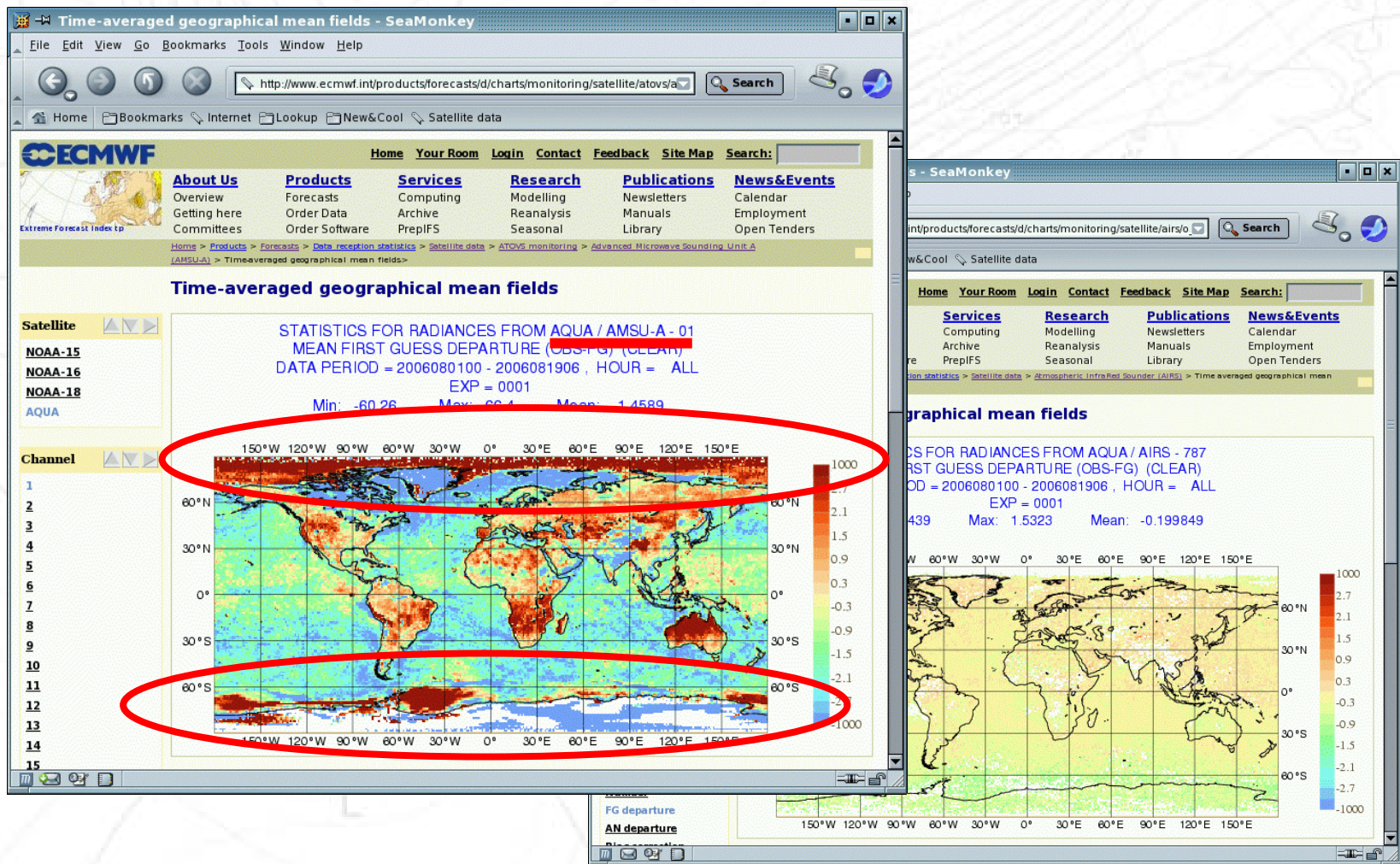
- We must ensure that if fast RTM is based on regression against LBL, that the atmospheric profiles used in training are representative of possibly **extreme polar situations**.
- Assumptions about **trace gas concentrations** may not be appropriate to extreme polar atmospheres (e.g. polar night)
- Great care must be taken with the modelling of **surface emissivity**





# Radiative Transfer (3)

Modelling the **surface emission contribution** is particularly problematic for microwave channels (especially cross-track scanning as opposed to conical scanning instruments, single v many angles mixed polarized)





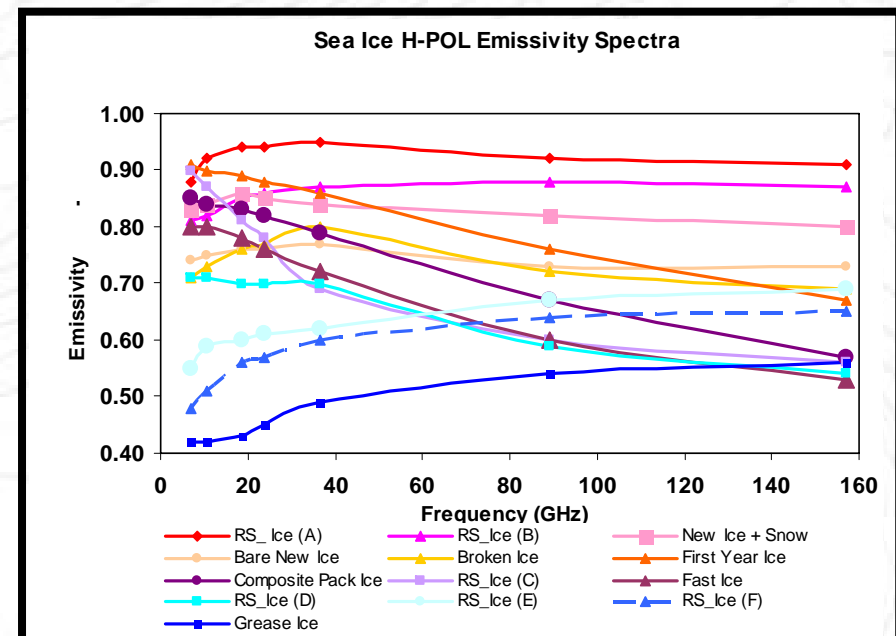
# Radiative Transfer (4)

Microwave surface emissivity over sea ice and snow is highly variable and poorly known



Large meltponds can further complicate the sub satellite surface emissivity

emissivity for different types of ice  
At different microwave frequencies

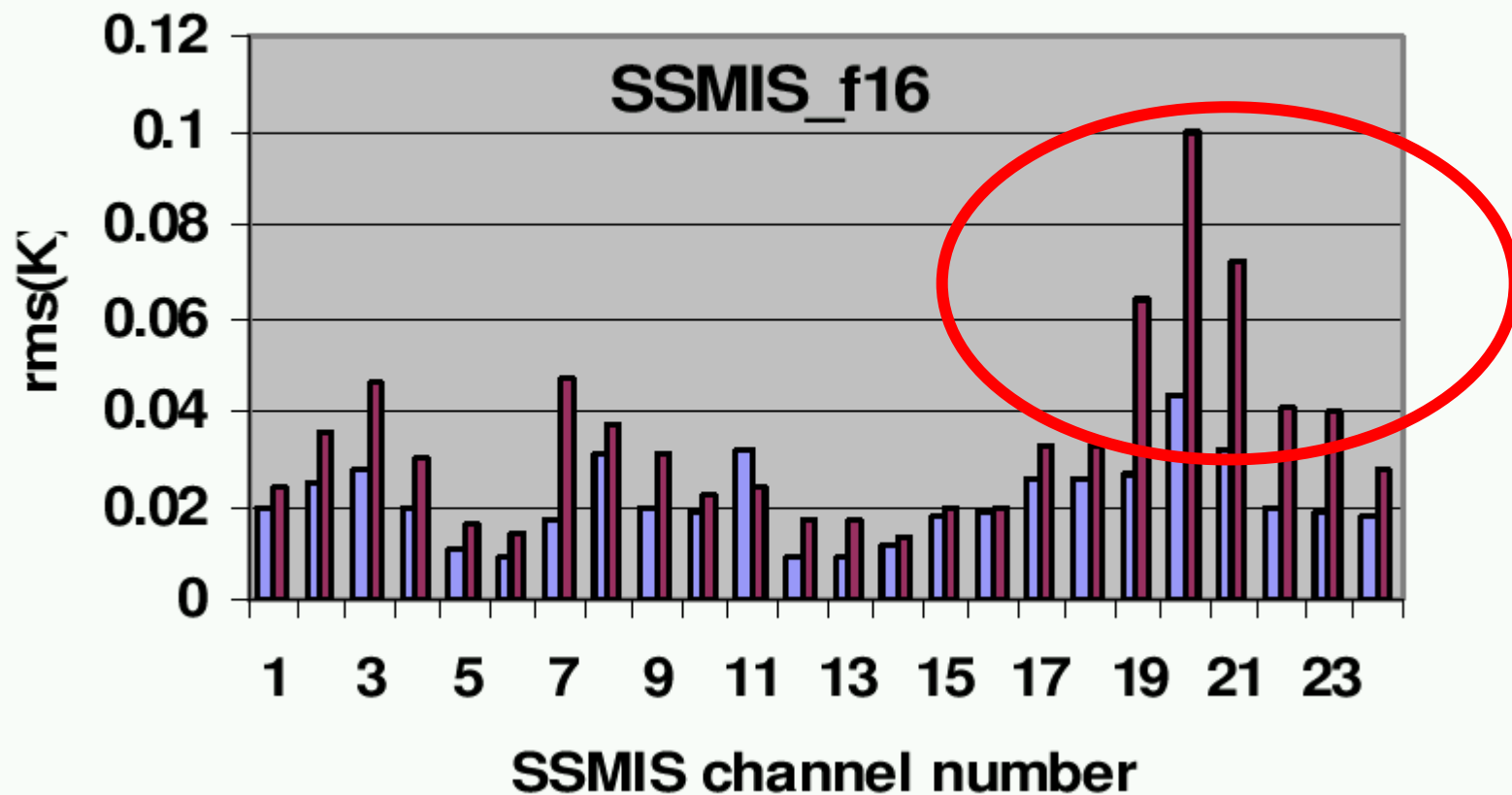


**NB. Incorrectly specifying the emissivity introduces errors of 10s of kelvin !**



## Radiative Transfer (5)

Zeeman splitting of microwave absorption lines combined with strong mesospheric lapse rates can result in significant errors if the effect is not parameterized.





# Quality Control





# Quality Control (1)

With modern day instruments QC is more concerned with identifying situations where our assumptions (both discrete and statistical) are invalid, rather than identifying **bad** observations....e.g. ...

- Cloud contamination (IR and MW)
- Rain (precipitation) contamination (MW)
- Poor surface characterization (or heterogeneous scenes)



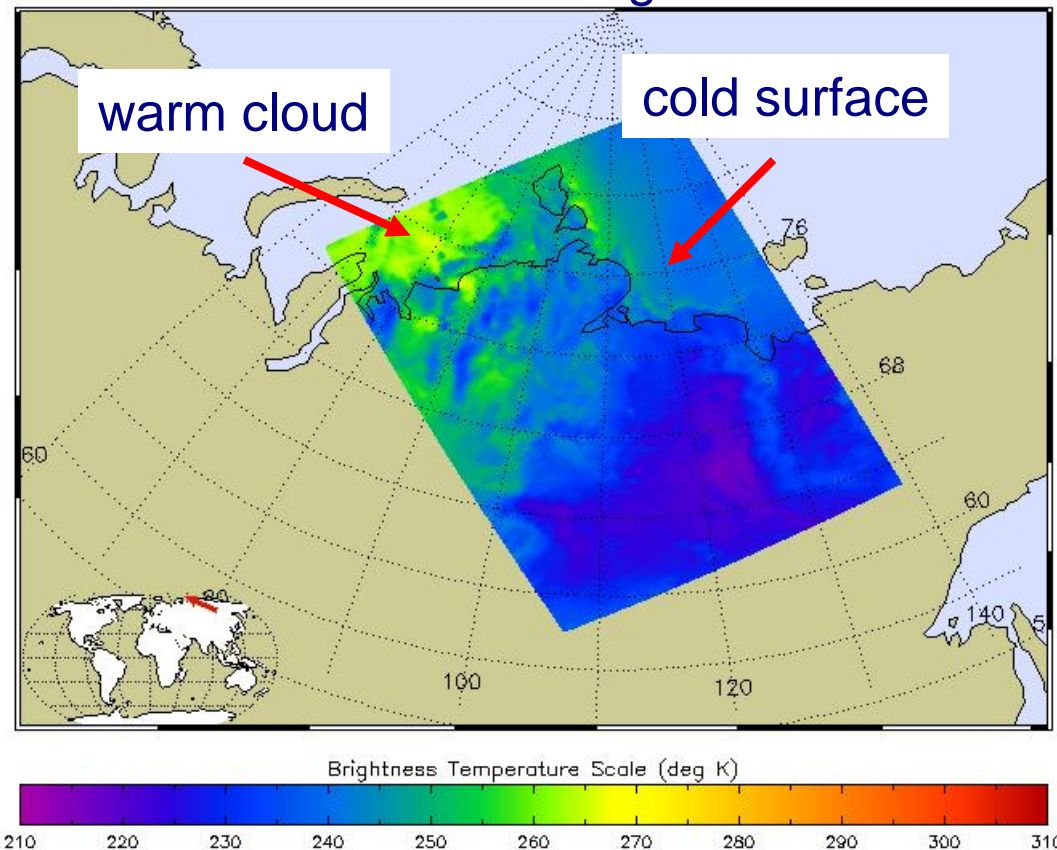
## Quality Control (2)

### Cloud detection in polar areas:

Clouds over very cold surfaces can often appear **warmer** in infrared data compared to the underlying surface.

This is the **opposite** signal many cloud detection schemes are looking for.

11 micron infrared image from MODIS



Granule Id = AIRRBRAD\_A2004353\_0423\_003\_200819614D454.hdf



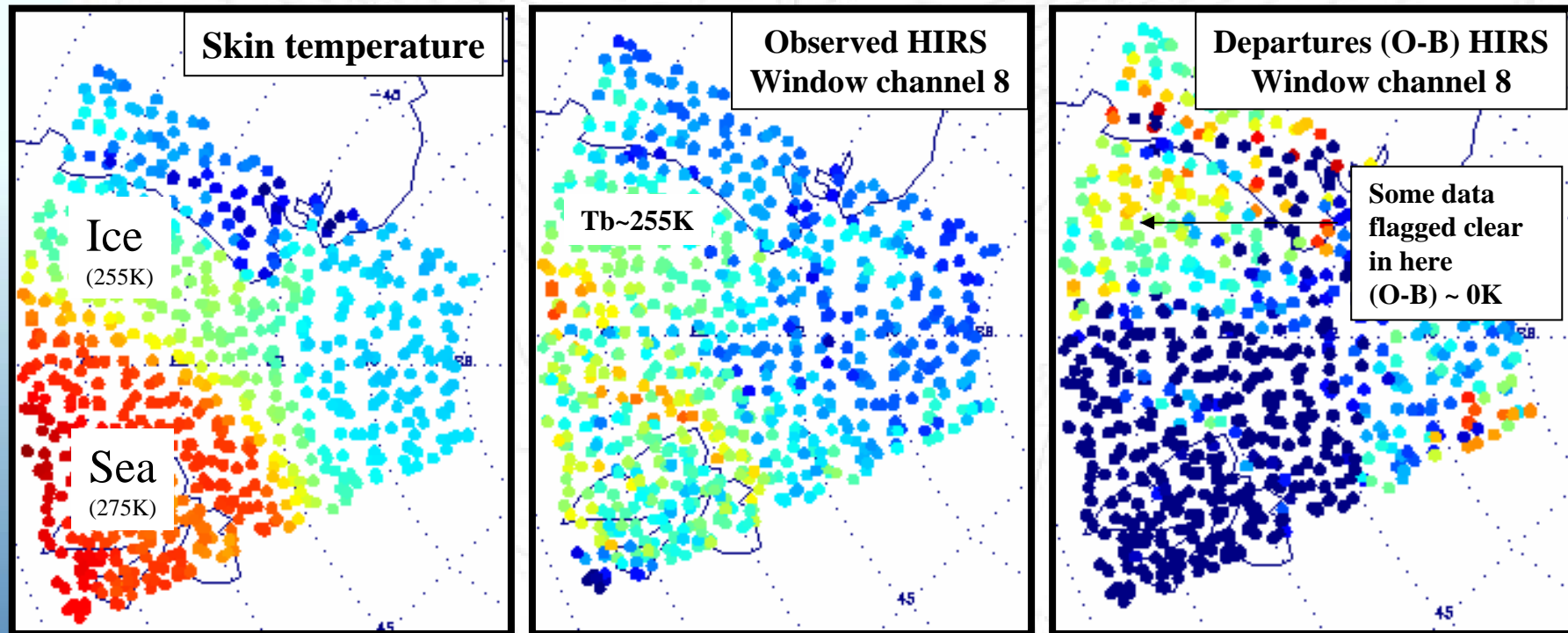
## Quality Control (3)

- Cloud detection algorithms generally rely on an accurate **a priori knowledge** of the underlying surface emission.
- Errors in the modelling the underlying surface emission ( $T^*$  or  $E$ ) can compromise our ability to **safely detect clouds**
- Single channel cloud detection (i.e. window channel checks) can be **dangerous** (cloud compensates in window channel, but not channels above)
- If these problems are severe, we may have to **blacklist** (i.e. a priori reject) the radiance observations



# Quality Control (4)

Single window channel cloud detection checks must be tuned to allow for warm departures over cold surfaces, but even then can be problematic if the cloud is at the same temperature as the surface.



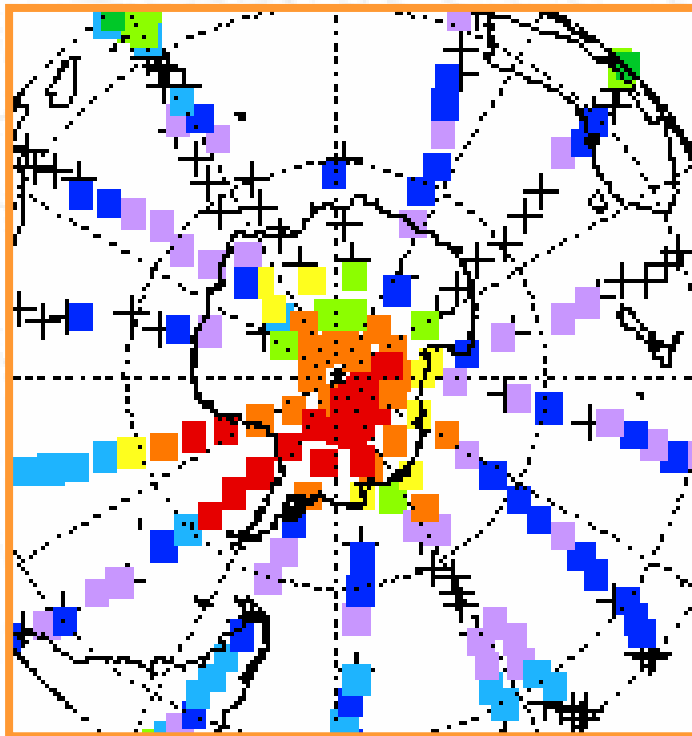
(\* without more information we cannot eliminate the possibility that a cloud at the same temperature as the ice actually stops at exactly the ice edge ... although unlikely ?)



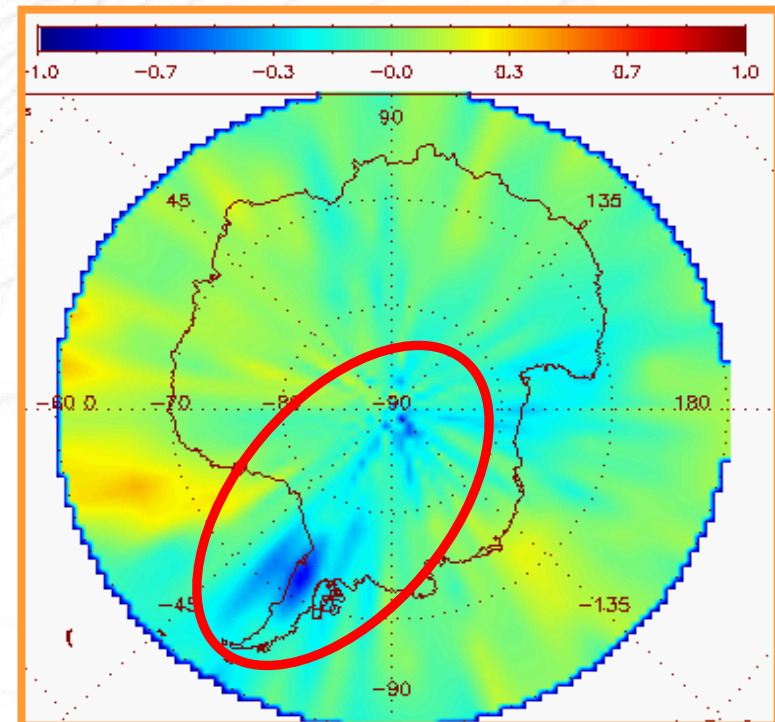
## Quality Control (5)

Cloud detection schemes **must be also extended into the polar stratosphere** as undetected **PSCs** can alias into erroneous temperature and ozone increments

Cloud level from MIPAS



AIRS channel 64 Departure (K)



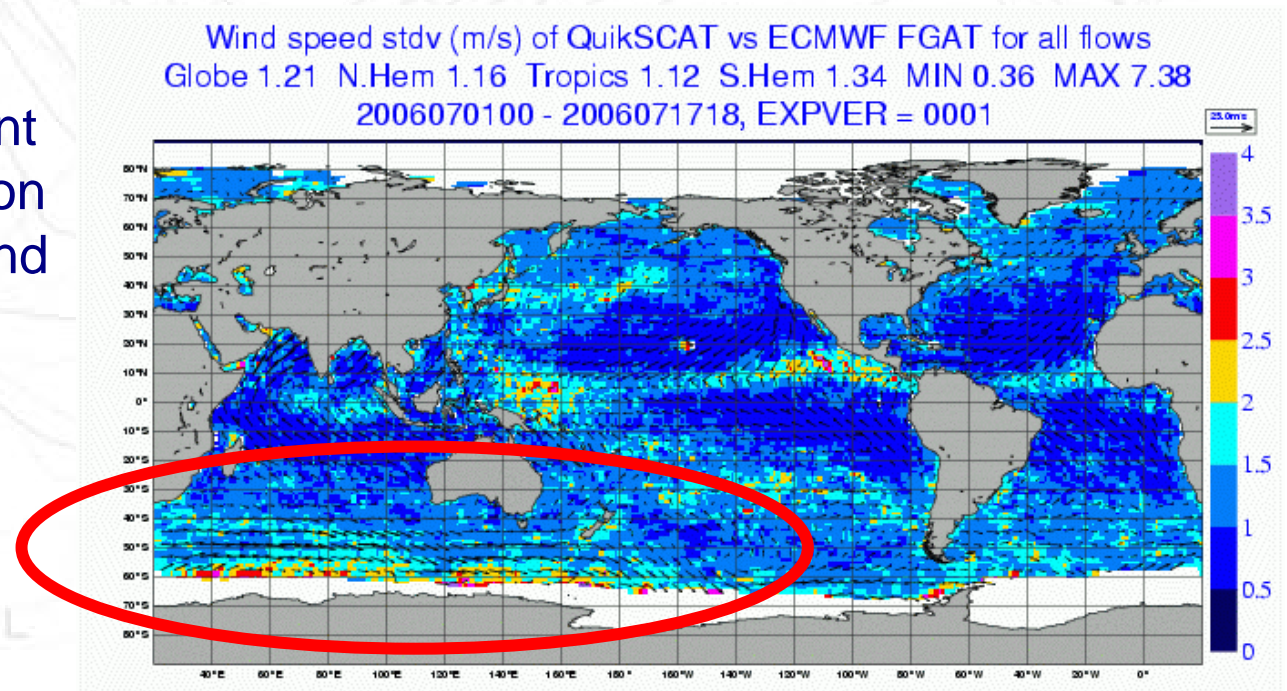




## Quality Control (6)

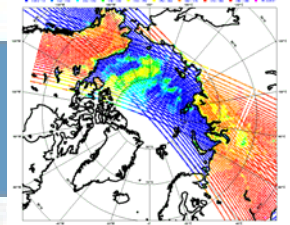
Due to the large variation in microwave surface radiative properties even a **slightly heterogeneous surface** (compared to the satellite field of view) can **alias large errors into the analysis if undetected**

e.g. a small amount of ice contamination produces large wind departures in scatterometer sea surface wind retrievals





## Handling Surface Ambiguity (1)



The **variability of the polar surface** (particularly in terms of microwave surface emissivity) is significant. Channels designed to provide temperature information in the **mid-troposphere** still have **~ 10% sensitivity to the surface**.


In channels such as **AMSU-5 and MSU-2** (very important for NWP and reanalysis) the surface variability (e.g. going from sea to ice) is **~ 2K** whereas the atmospheric variability (i.e. due to temperature variations) is typically less than **0.5K**.

Thus errors in modelling the surface emission in these channels can completely **dominate the useful atmospheric signal!**



## Handling Surface Ambiguity (2)

### Options for handling the surface contribution:

1. Model the surface emissivity **explicitly** from our knowledge of the surface conditions (e.g. ice type, snow cover ...) and then use a fixed value in the RTM
2. Use indicators from the radiance observations to estimate or **classify the surface** and then fix in the RTM 
3. Add emissivity to the analysis variables and estimate it **simultaneously** with other geophysical variables within the assimilation
4. Use radiances from sensors better suited to handling surface effects (e.g. **conical scanning SSM/IS** rather than cross-track scanning AMSUA)





# **Systematic Errors (biases)**



## Systematic Errors (1)

- Biases in satellite observations and / or RTM are a serious problem as they can quickly propagate into **large scale biases in the analysis**.
- Traditionally satellite bias corrections are estimated from **monitoring data against the NWP system** (in the absence of any other globally available ground truth)



## Systematic Errors (2)

- **Satellite instrument**

(calibration / characterization / environmental effects)

- **Radiative transfer (RT) model**

(physics / spectroscopy / emissivity)

- **Pre-processing of observations**

(cloud-precipitation detection / level-2 processing)

- **NWP model \***

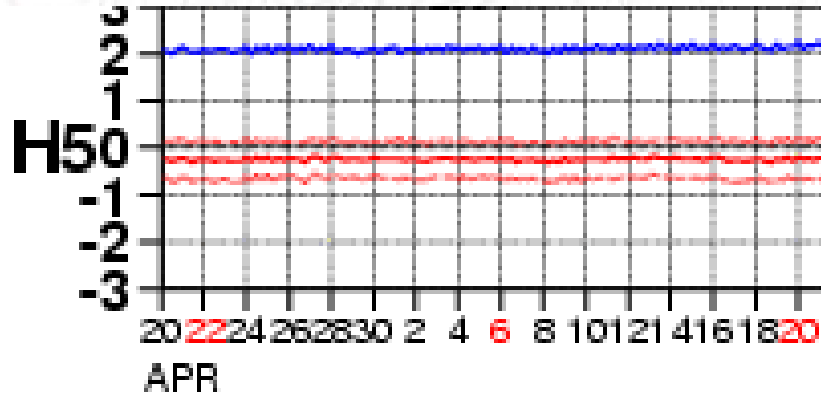
(systematic errors in the background state)

most acute over  
the poles



# Systematic Errors (3)

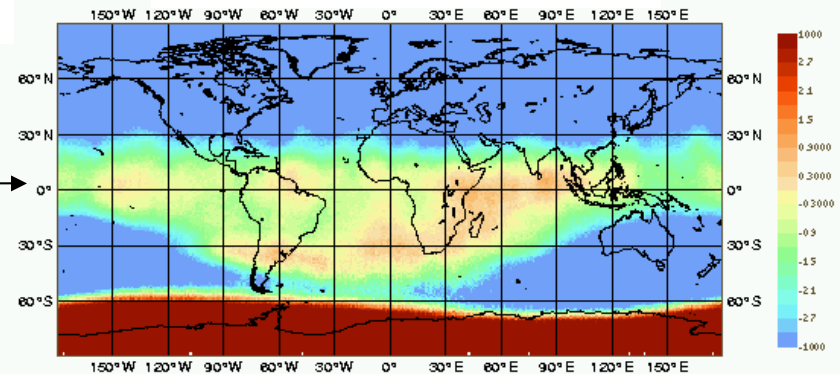
### HIRS channel 5



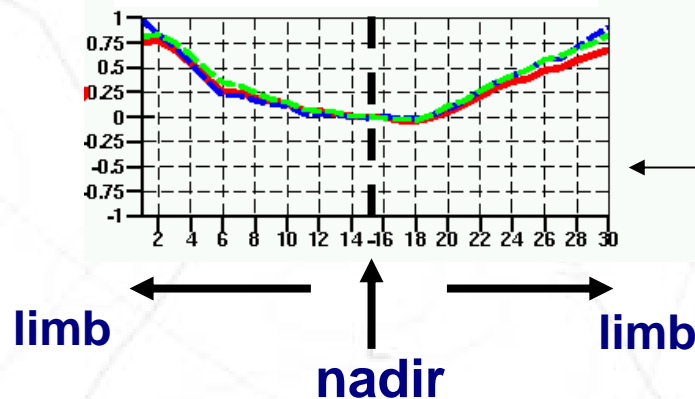
*simple flat offset biases that are constant in time*

*biases that vary depending on location or air-mass*

### AMSU-A channel 14



### AMSU-A channel 7



*biases that vary depending on the Scan position of the satellite instrument*



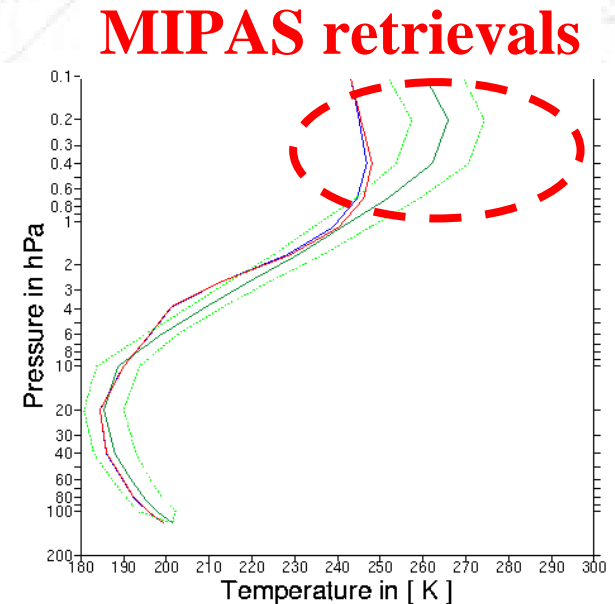
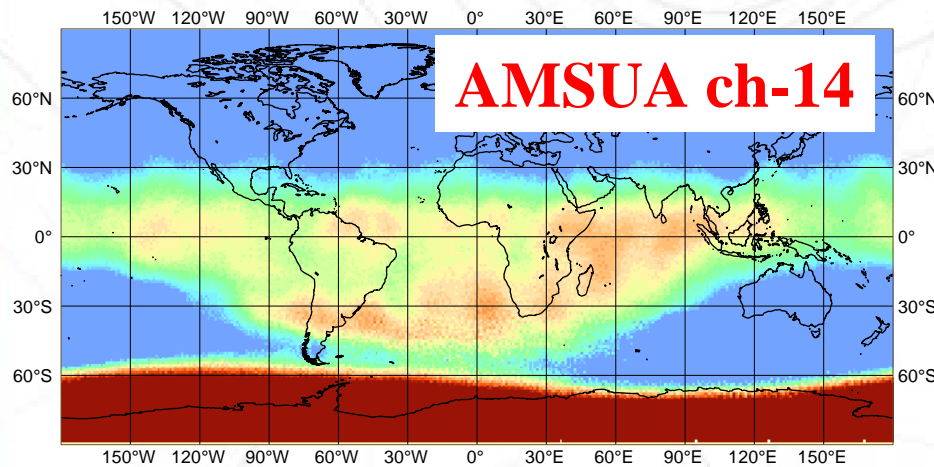
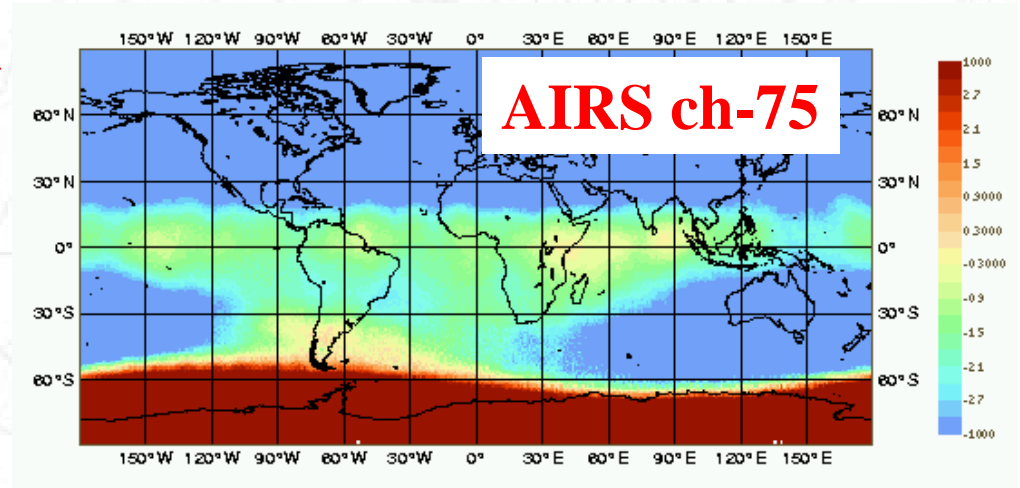
## Systematic Errors (4)

- Over the **polar regions** (particularly in the stratosphere) we can have **large systematic errors in the NWP model** (suggesting *apparent* air-mass and scan dependent biases in the satellite observations)
- It is important that we do not derive observation bias corrections that **actually compensate for systematic errors in the NWP model** as this will perpetuate or even reinforce the system bias



# Systematic Errors (5)

A number of **independent sensors** confirm the existence of a **significant cold temperature bias in the NWP model** for the polar night stratosphere



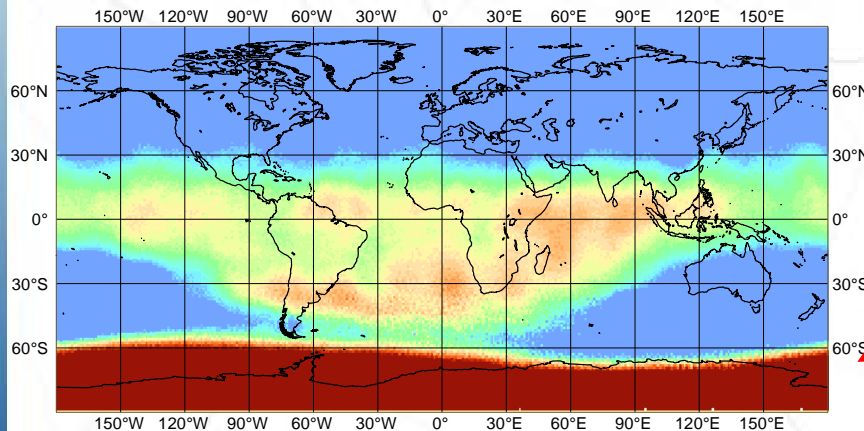
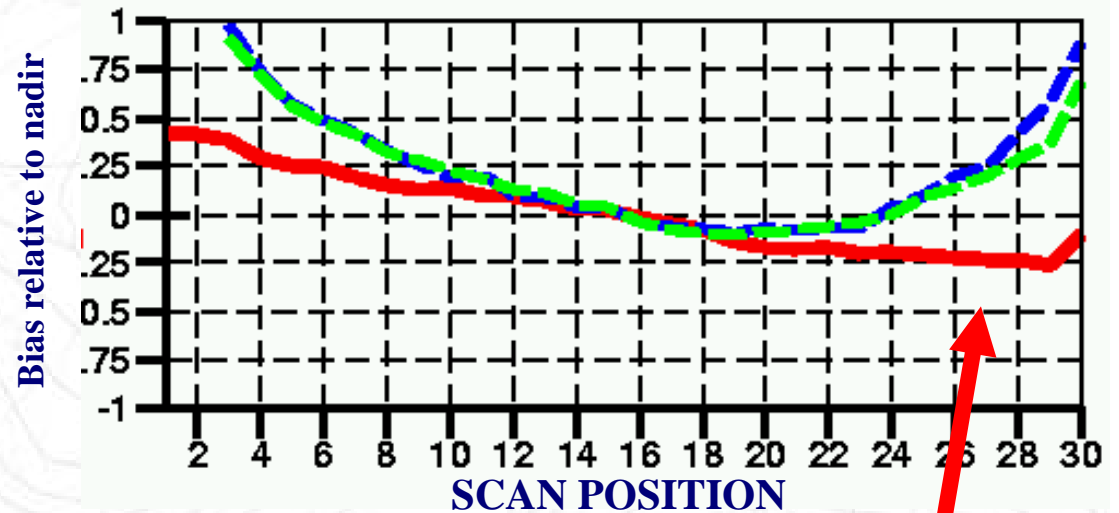




## Systematic Errors (6)

In addition, systematic errors in the NWP model lapse rate for the polar night stratosphere will also compute the **wrong limb effect**. This will give an apparent satellite **scan bias** between the NWP model and observations

### AMSUA channel 14 (1hPa)



Asymmetric scan dependent bias associated with large systematic lapse rate error in the polar night



## Systematic Errors (7)

So what can we do if the NWP model has a significant bias ?

- **Force** the (**uncorrected**) satellite observations into the data assimilation system to correct the NWP model bias (can be problematic).

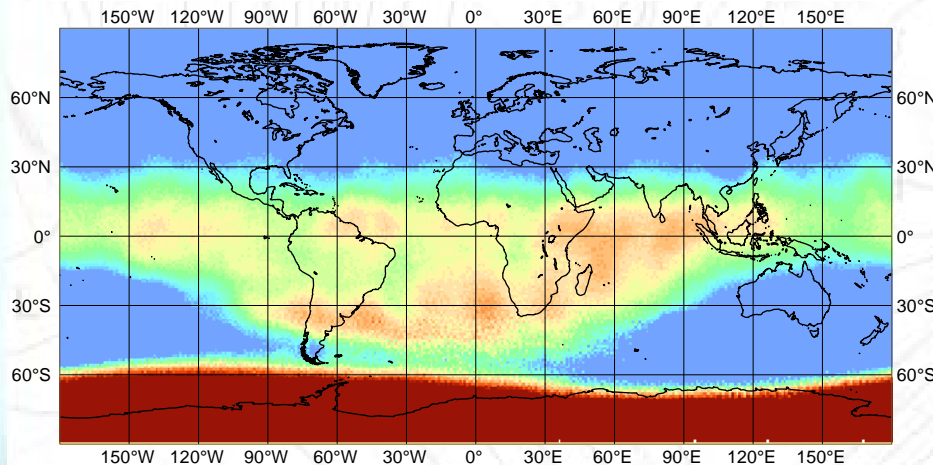
or

- **Pragmatically** apply a bias correction to the observations to **compensate** for the model error (produces a biased analysis).



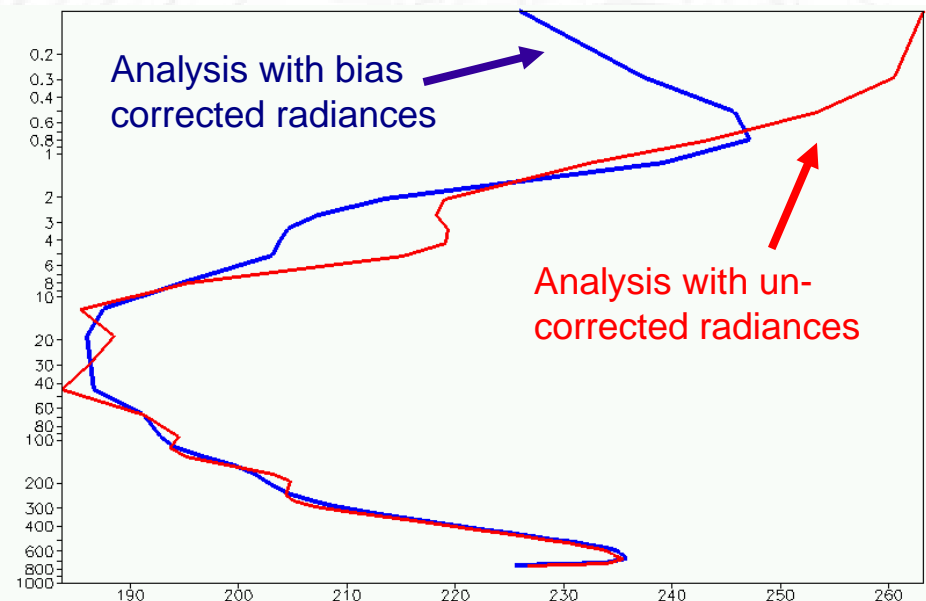
# Systematic Errors (8)

## AMSUA ch-14 mean departures



Forcing these data uncorrected into the assimilation **improves the NWP model top**, but causes significant **spurious oscillations** in the temperature profile below

The temperature changes at the model top ( $> 30\text{K}$ ) **verify well with other independent data**, but the spurious oscillations are in the null-space of the radiances and are essentially an **artefact of the assimilation system**





## Miscellaneous issues in polar areas

- **Observation weights** (errors and spatial correlations) and thinning to account for high density of radiance observations over the poles
- **Constituent estimation** (humidity, CO<sub>2</sub> and ozone) from passive sensors is very difficult in some isothermal polar atmospheres.
- **Assimilation of rain / snow** affected microwave radiances very difficult over bright frozen surfaces
- A general lack of **verification** / validation information



**... but on the brighter side ...**



# **Examples of the successful exploitation of satellite data in polar regions**



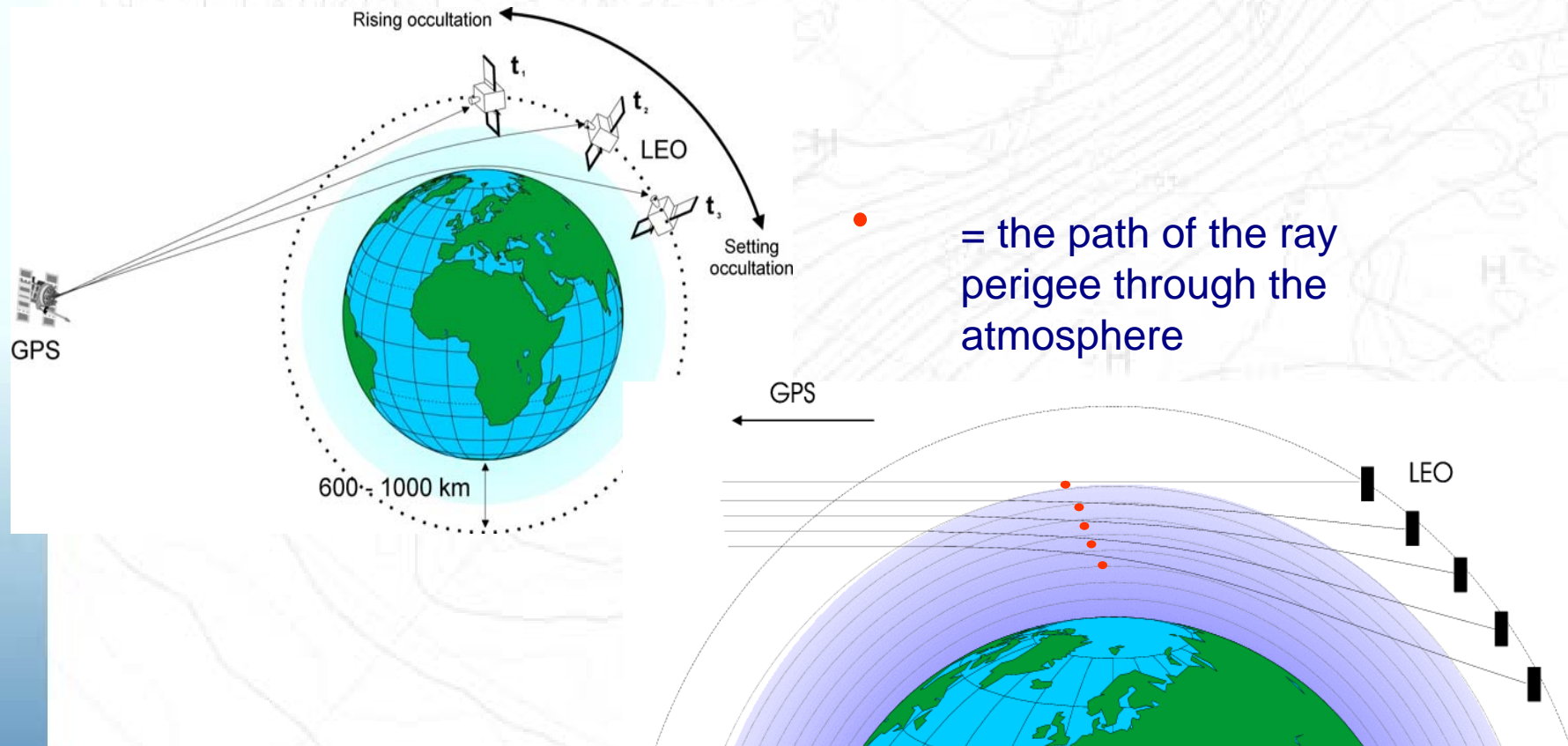


## Polar successes with satellite data

- Validation of ERA-40 and operational analyses suggest that satellite radiance observations are used well in polar areas and are a vital component of the observing system
- Surface mapping products now taken for granted and are a mainstay of polar studies
- Monitoring / forecasting sudden warming of the polar stratosphere
- Polar ozone analysis
- MODIS winds products have a good impact on forecasts
- Constraining the polar wind field with temperature sounder data
- Synergy between nadir and limb sounding data
- Tuning physical parameterizations with satellite observations



# Synergy between nadir and limb (GPS) sounding

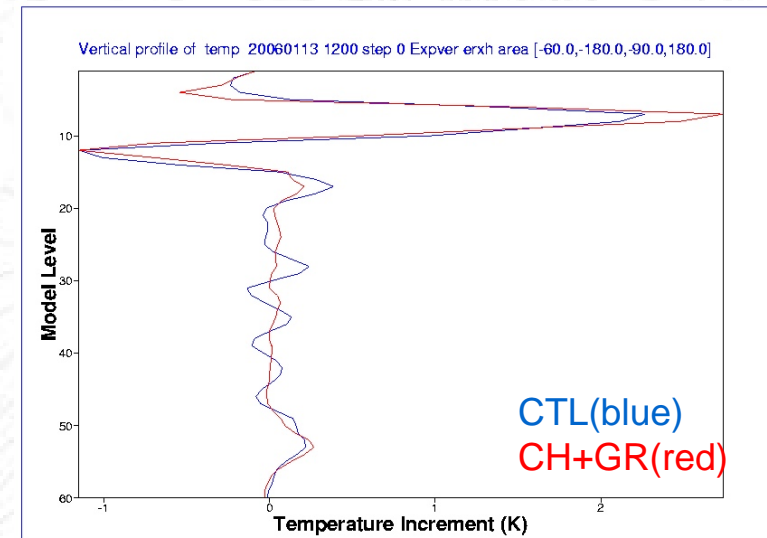




# GPS controlling Polar oscillations

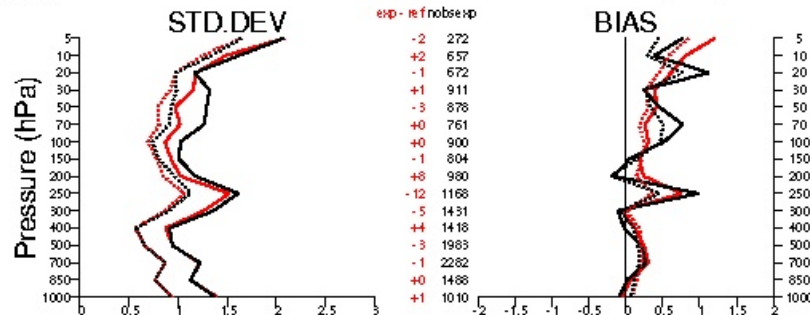
Nadir radiance data (AIRS,AMSUA) can be **forced** into the assimilation system with little or no bias correction if **GPS data** (with very high vertical resolution) are used to **control oscillations** in the stratosphere

Mean increments



exp: erxh/DA (black) v. erx4/DA 2006011300-2006021612(12)  
TEMP-T S.PolarC  
used T

— background departure o-b(ref)  
— background departure o-b  
- - - analysis departure o-a(ref)  
- - - analysis departure o-a



radiosonde observations confirm that the GPS data are very effective at controlling the spurious oscillations

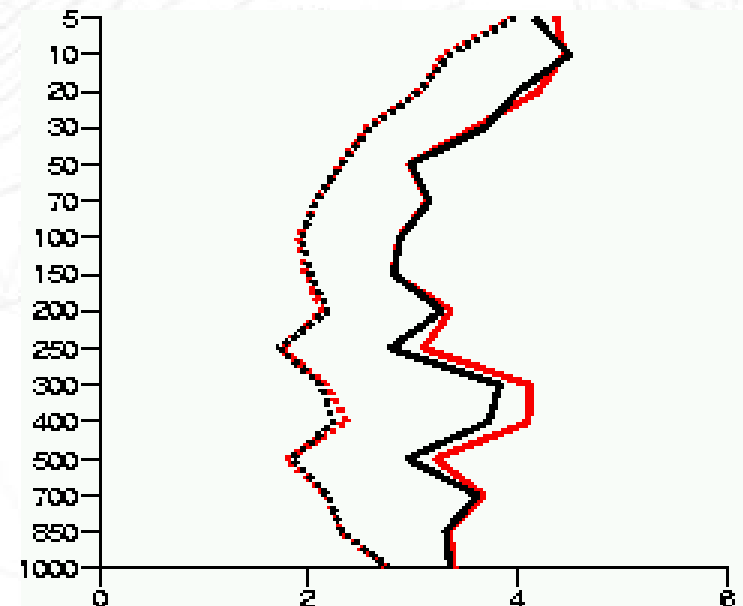
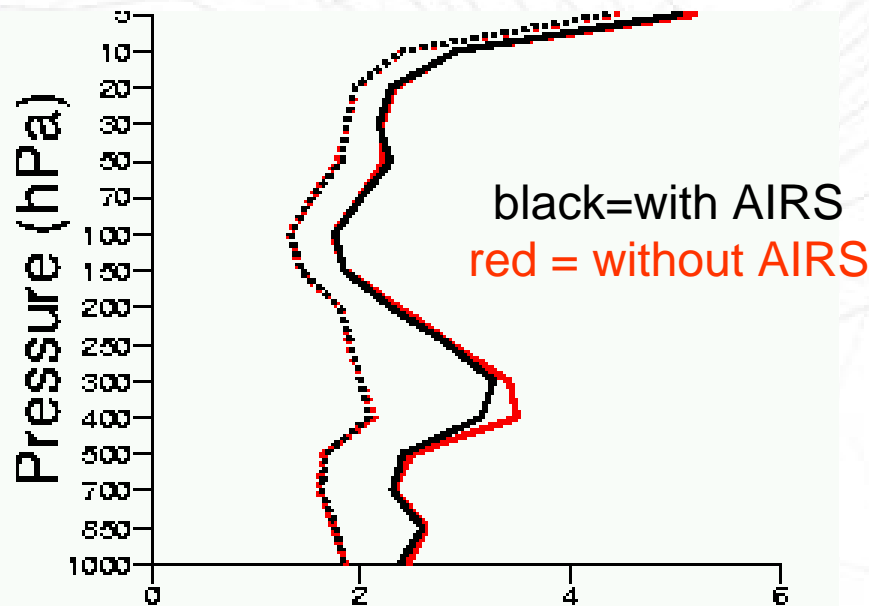


# Temperature sounding radiances controlling the polar wind field

The assimilation of temperature sensitive radiance data (particularly AIRS) constrains the wind field and results in a better fit to radiosonde wind observations in Polar regions

analysis and background fit to radiosonde  
**wind data** (u-comp) averaged over the **N Pole**

analysis and background fit to radiosonde  
**wind data** (u-comp) averaged over the **S Pole**

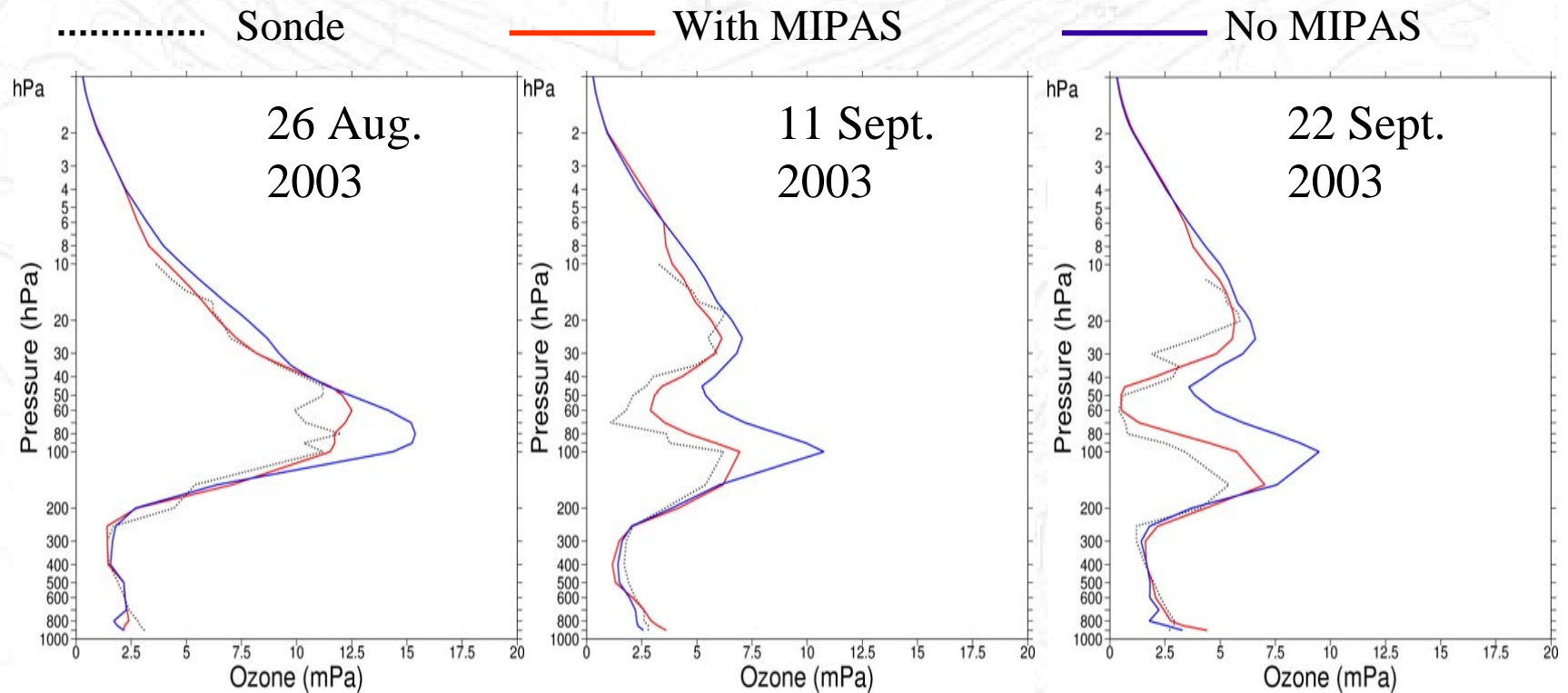


(2 week average in June 06)



# The Assimilation of MIPAS Ozone Retrievals

High vertical resolution **MIPAS ozone retrievals** are very effective in constraining the vertical distribution of ozone in the assimilation system (nadir data cannot)



Ozone profiles at Neumayer (71 S, 8 W)

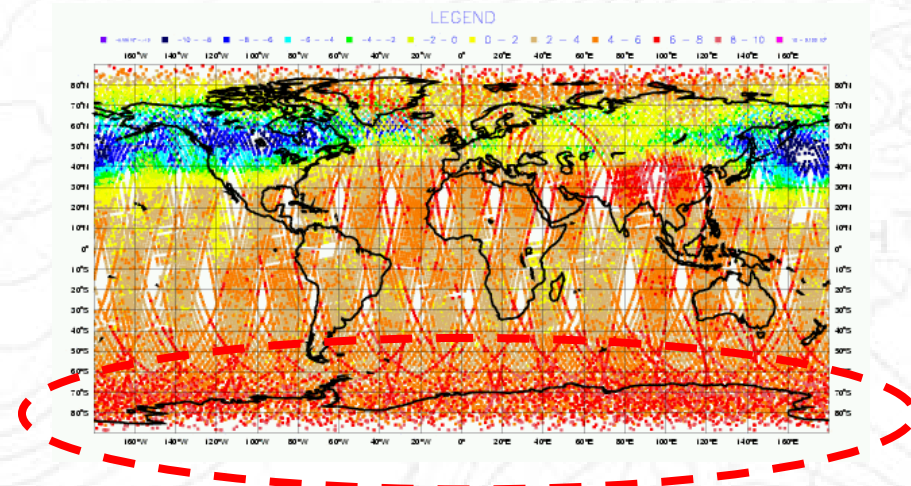




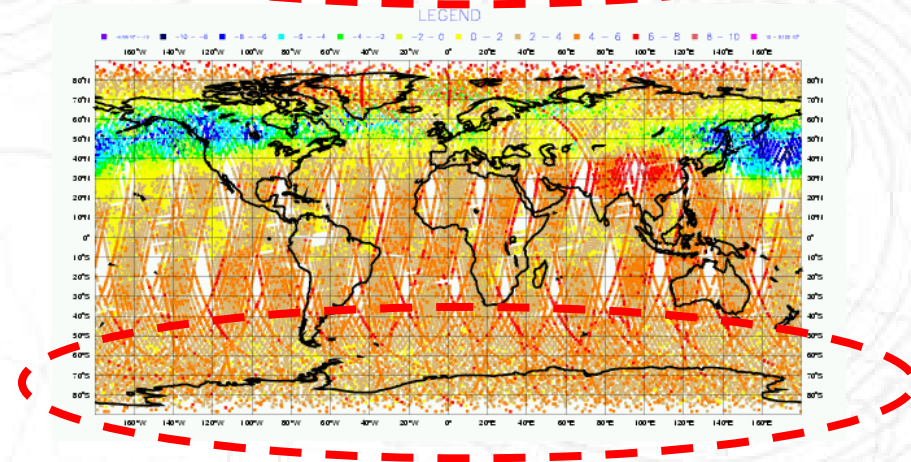
# Tuning NWP model parameters to observations

Some of the temperature biases in the stratosphere have been reduced by tuning parameters such as Rayleigh friction

Mean AMSUA ch-14 radiance departures with **OLD** Rayleigh friction



Mean AMSUA ch-14 radiance departures with **NEW** Rayleigh friction

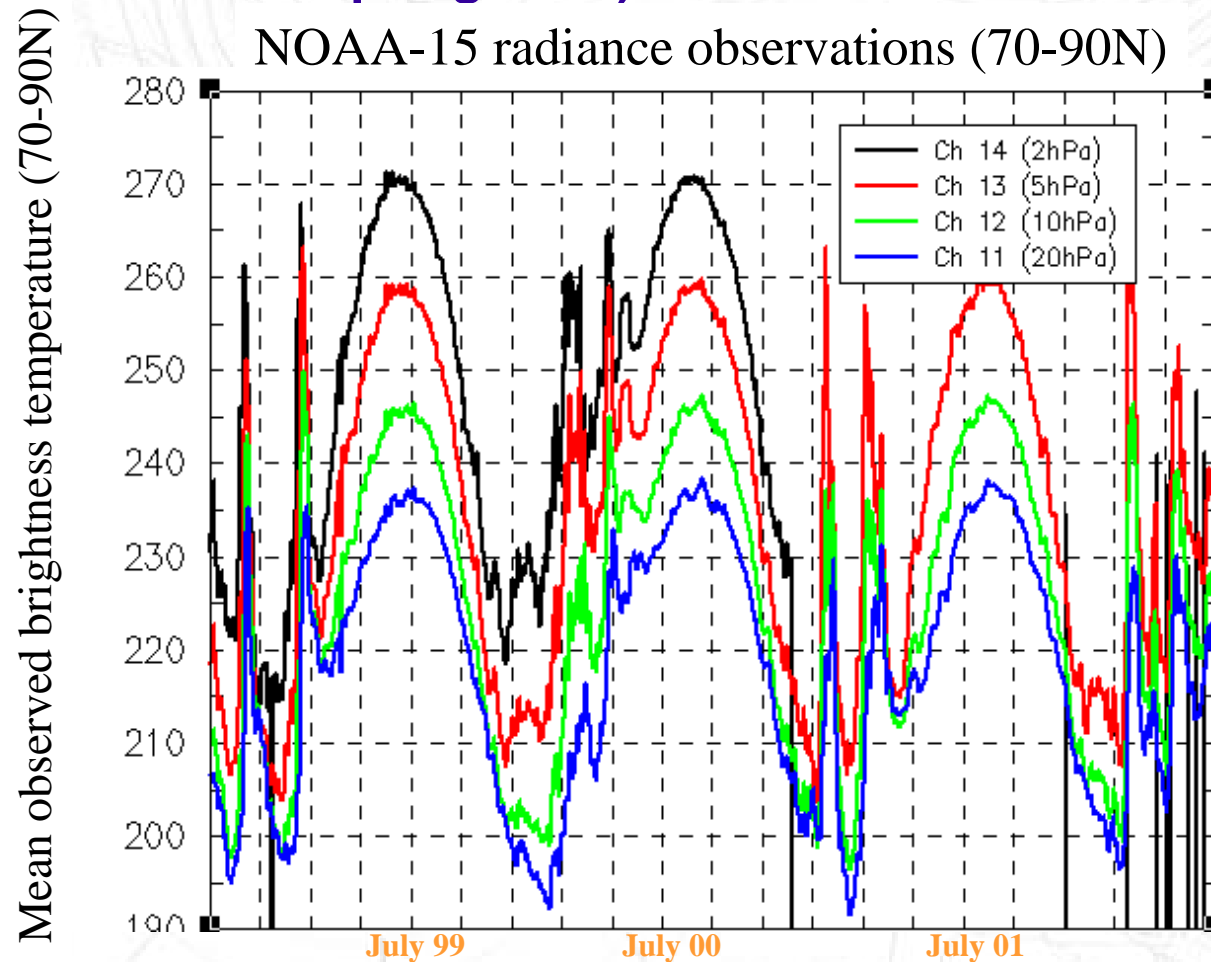






# Occurrence of sudden warmings

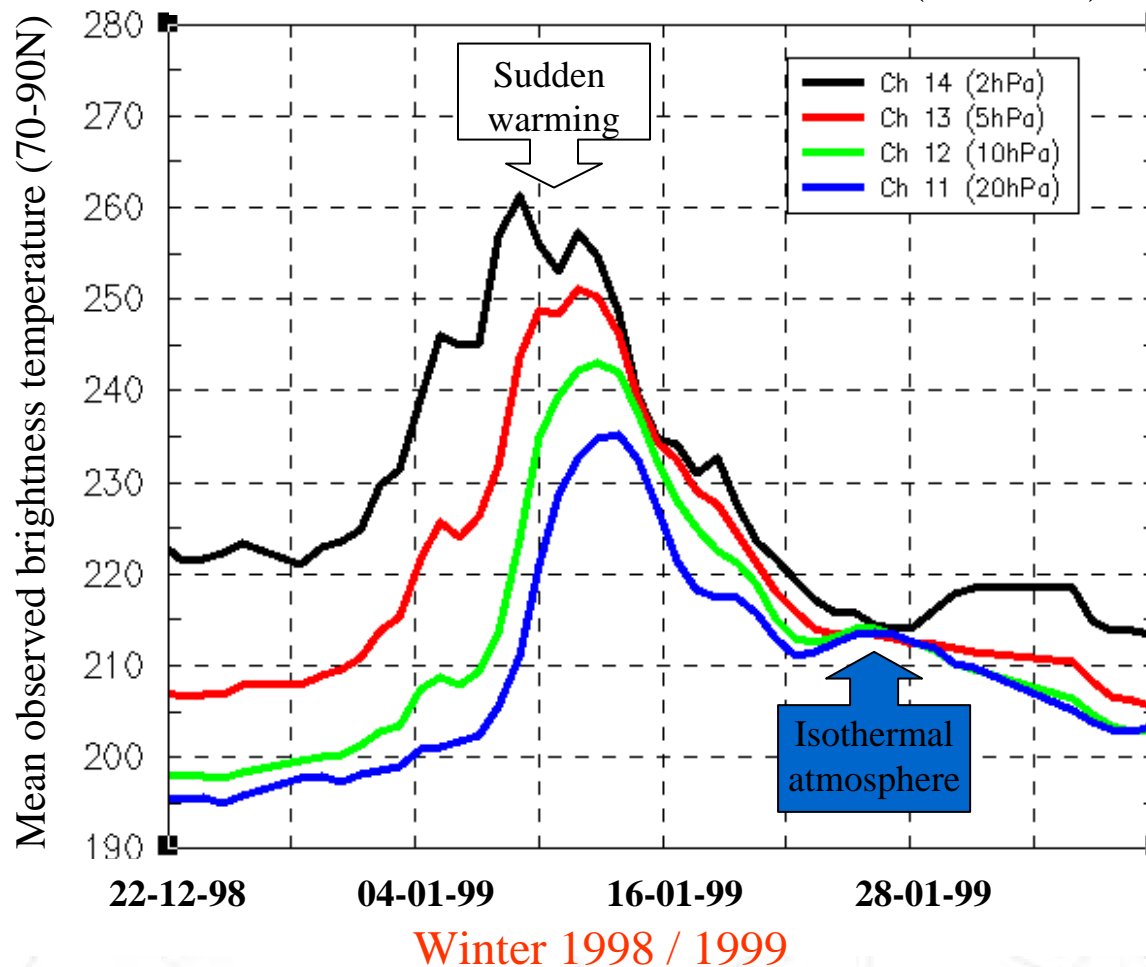
NOAA-15 AMSU-A  
(Autumn 98 – Spring 2002)





# Vertical structure of sudden warmings (from AMSUA and AIRS)

NOAA-15 radiance observations (70-90N)



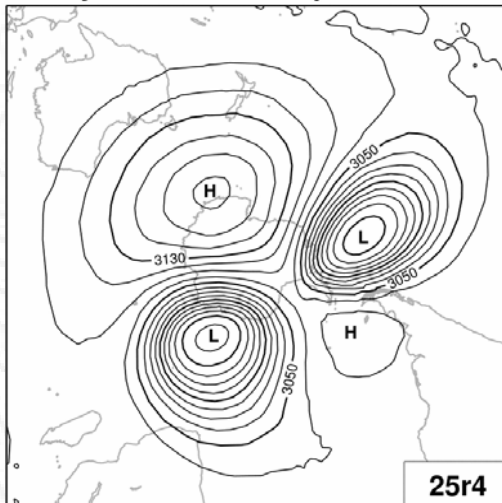


# Forecasts of Southern Polar Vortex Split

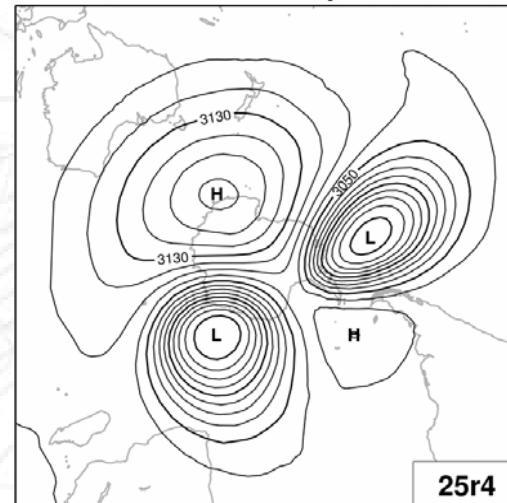
Verifying analyses



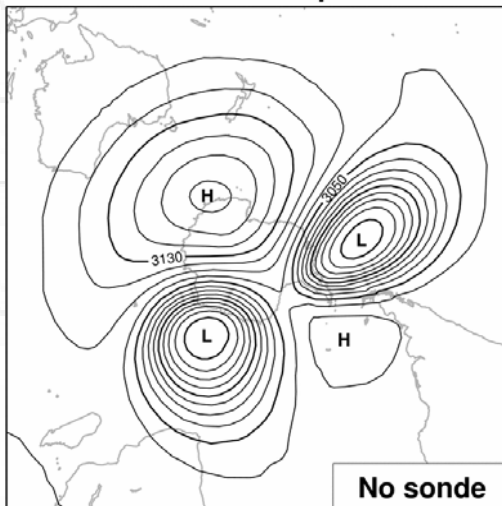
Analysis 12UTC 25 September 2002



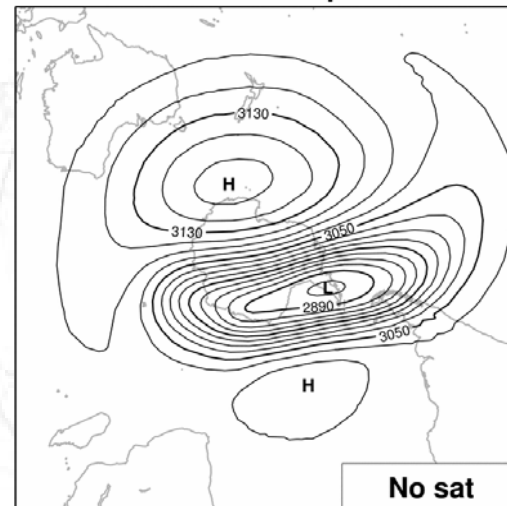
D+5 valid 12UTC 25 September 2002



D+5 valid 12UTC 25 September 2002



D+5 valid 12UTC 25 September 2002



Day-5 forecats



# Summary

- There is a vast amount of satellite data available at the poles, however the polar regions present some particular assimilation challenges:
- The variability of the polar surface (and our poor knowledge of it) makes mid-lower tropospheric radiance data difficult to use safely (both from a RT perspective and the detection of clouds when the surface variability far exceeds the atmospheric signal).
- However, microwave and infrared radiance data sensitive to the upper troposphere and stratosphere are used extensively and have a significant measurable impact on Polar NWP / reanalysis.
- Systematic errors in the NWP model can be large in the polar stratosphere and care must be taken how the radiance data are bias corrected and introduced into the assimilation system.



**End**

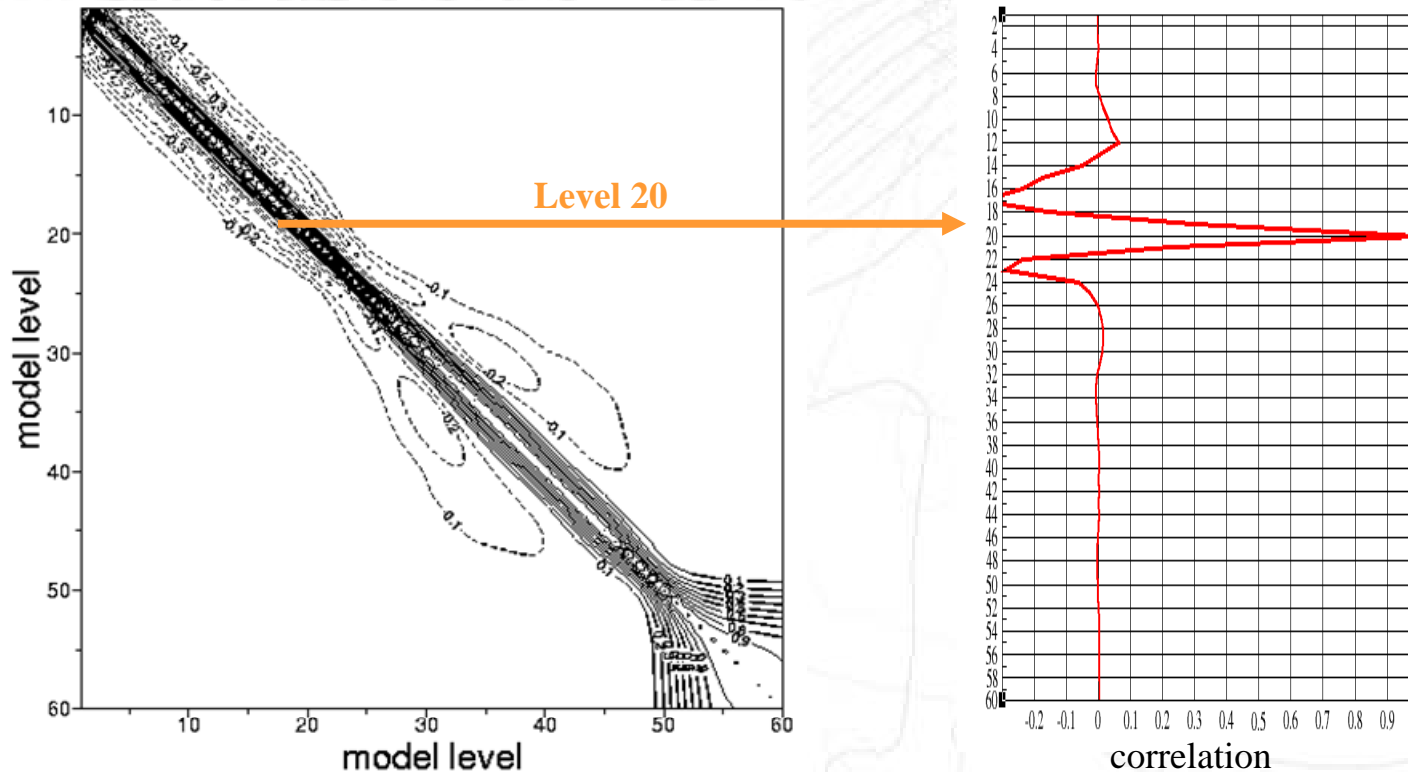


# Systematic Errors (9)

## Vertical correlation of background temperature errors

These are generally very **sharp** (describing random background errors) and as such do not prevent oscillating increments in between broad overlapping channels

Globally averaged correlation of temperature errors in 4DVAR

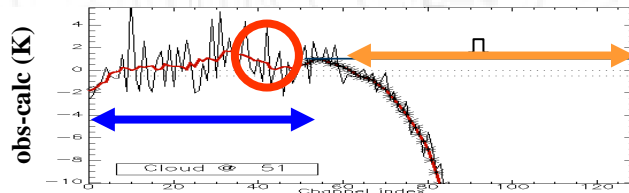






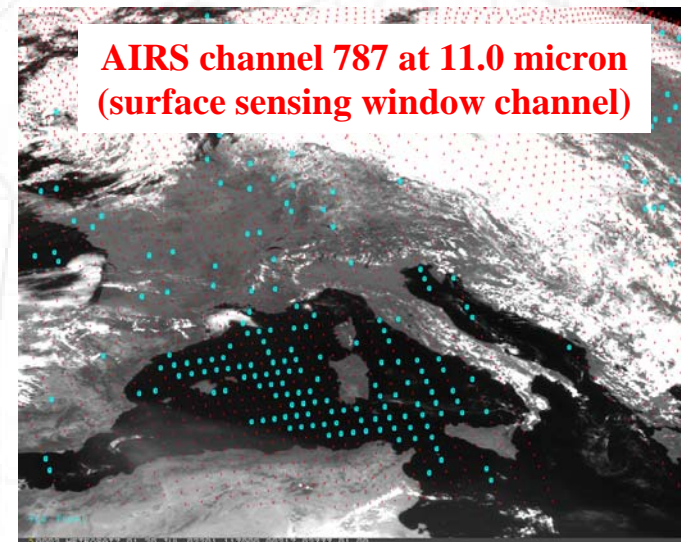
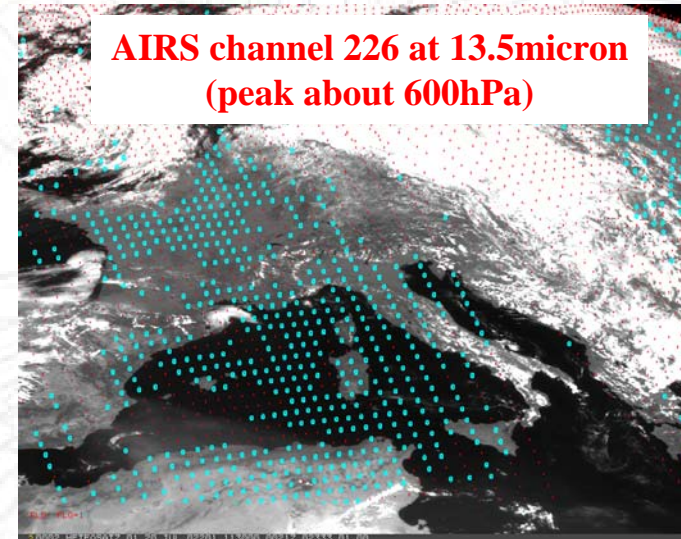
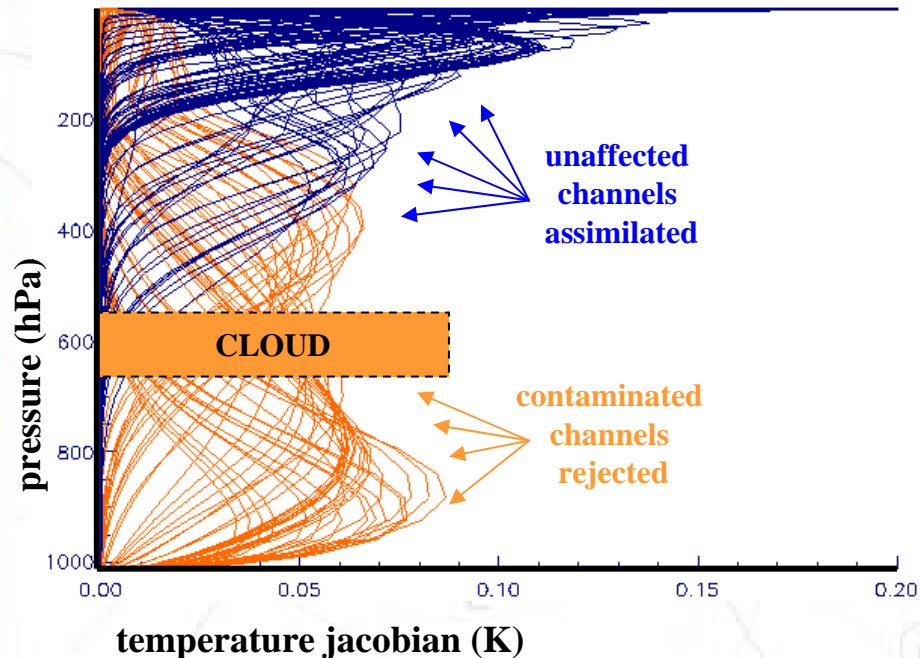
# Multispectral Cloud detection scheme for AIRS

A non-linear pattern recognition algorithm is applied to departures of the observed radiance spectra from a computed clear-sky background spectra.



Vertically ranked channel index

This identifies the characteristic signal of cloud in the data and allows contaminated channels to be rejected

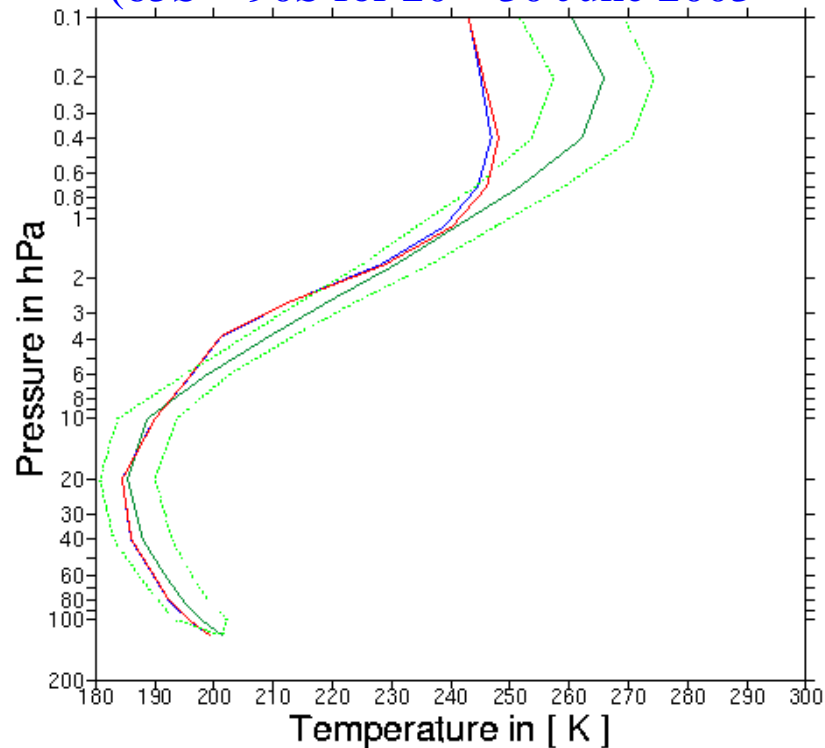




## Systematic Errors (8)

### Analysis fit to MIPAS temperature data (with and without AIRS radiances)

26R3 – **WITHOUT** AIRS radiances  
(65S – 90S for 20 – 30 June 2003)



26R3 – **WITH** AIRS radiances  
(65S – 90S for 20 – 30 June 2003)

