

**Fourth WCRP International Conference on Reanalysis**  
**Silver Spring, 7 May 2012**



**Challenges of Reanalysis:  
Past, present and future**



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Chair, Steering Committee for the Global Climate Observing System**

# Objectives of this presentation

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## **To provide a basic introduction**

- to atmospheric data assimilation and reanalysis
- to evolution of the atmospheric observing system
- to various reanalysis activities in progress worldwide
- giving some common background to the other talks in this opening session
- identifying a number of general questions or challenges to be faced relating to the coordination and conduct of reanalysis

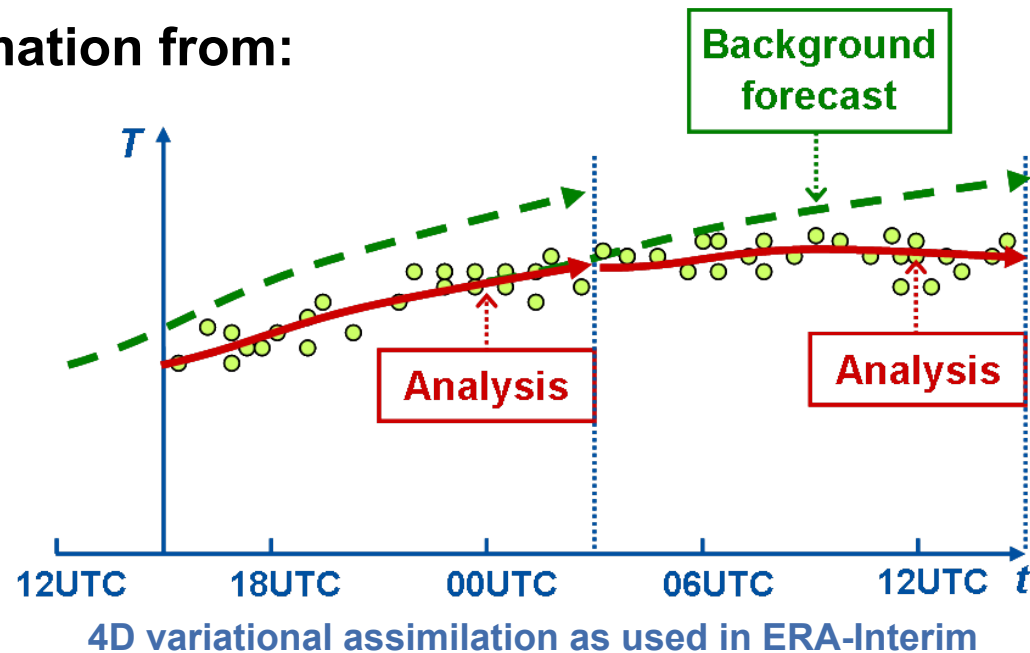
## **To present some recently updated results from ECMWF' s ERA-40 and ERA-Interim reanalyses**

- related to low frequency variability and trends
- identifying a number of more specific questions or challenges to be faced
- linking with several other talks and posters to be presented this week
- and presented with thanks to ERA team members past and present

# Data assimilation

## Data assimilation blends information from:

- observations
- a short “background” model forecast from previous analysis
- estimates of observational and background errors
- dynamical relationships built into the representation of background errors



to produce an estimate of the atmospheric state

**Model carries information from earlier observations forward in time and spreads it in space**

**Information is spread from one variable to another by the model and by background-error relationships**

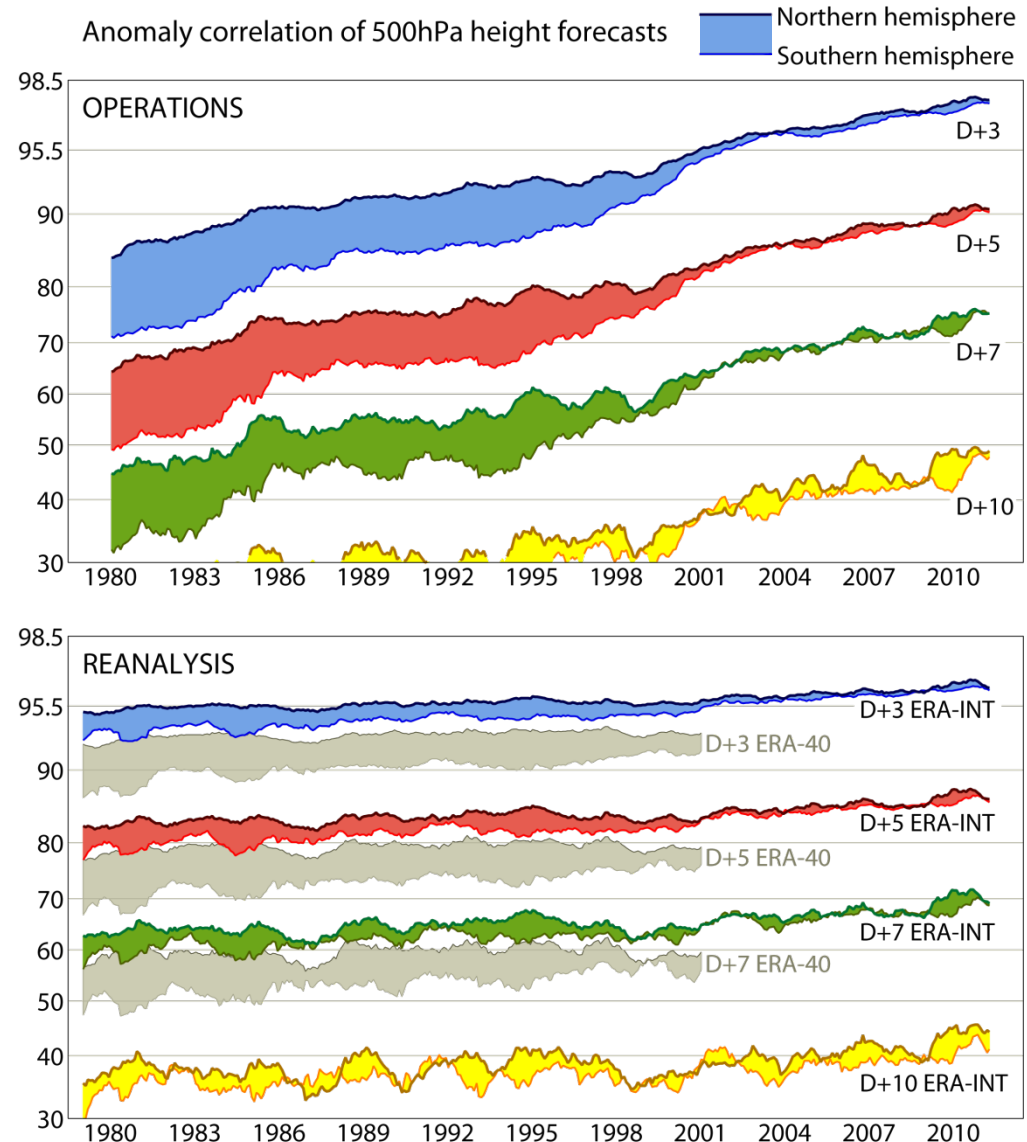
# Data assimilation and reanalysis

Data assimilation was developed to provide estimates of the state of the atmosphere, “analyses”, needed to start operational numerical weather forecasts

Large improvements in forecasts have stemmed from better data assimilation and observations

Improvement from 1980 to 2000 comes mostly from improvement to forecasting system

Improvement since 2000 comes from improvement to forecasting system and to observations



# Development of the observing system

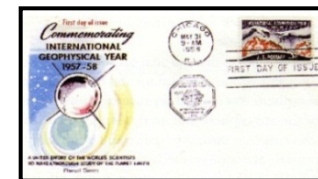
**Early years** Growth of network of surface measurements  
Development of measurements from balloons

**1940s** Establishment of network of radiosonde measurements from North Atlantic and North Pacific Weather Ships

Ship  
Alpha



**1957** Radiosonde network enhanced in southern hemisphere for the International Geophysical Year

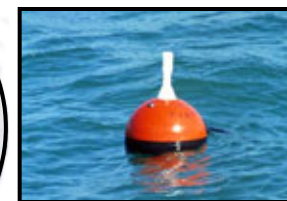


**1972** Operational sounding of temperature and humidity from polar-orbiting satellite  
Some data from commercial aircraft

NOAA-2  
15 Oct 1972



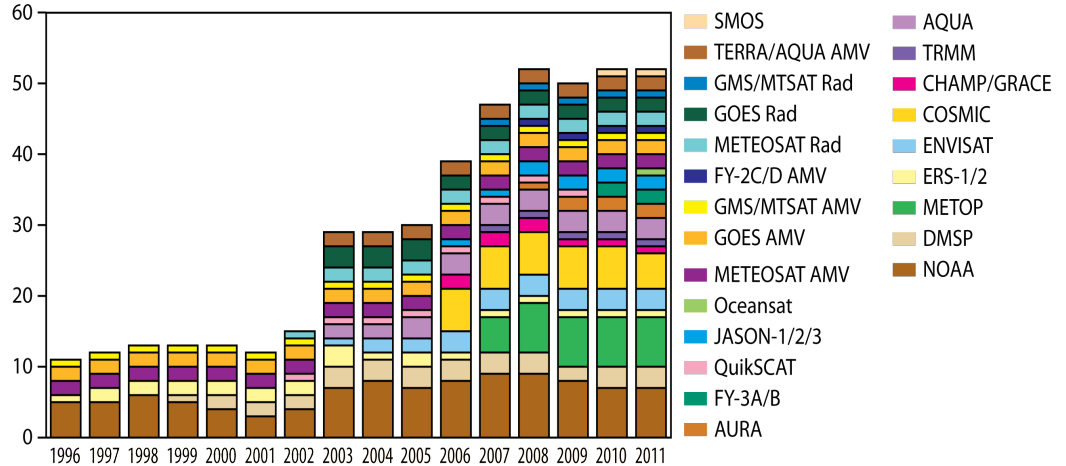
**1979** Improved sounding from polar orbiters  
Winds from geostationary orbit  
Much more data from commercial aircraft  
Drifting buoys



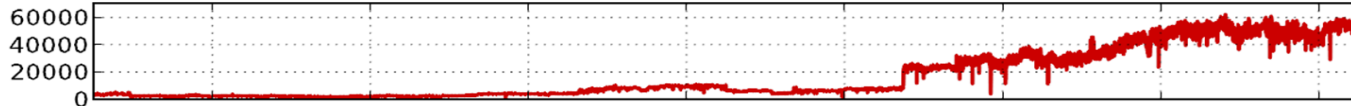
# Increases in observational types and numbers

Number of satellite instruments from which data were passed through the ECMWF assimilation system from 1996 to 2011

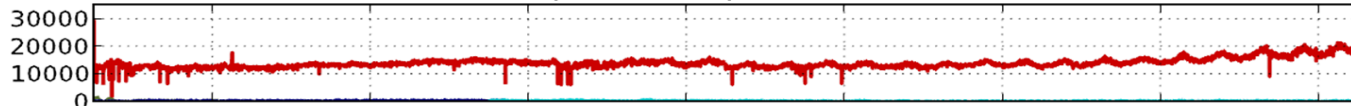
ERA-Interim did not process some of these data. The number increases if atmospheric composition data are included



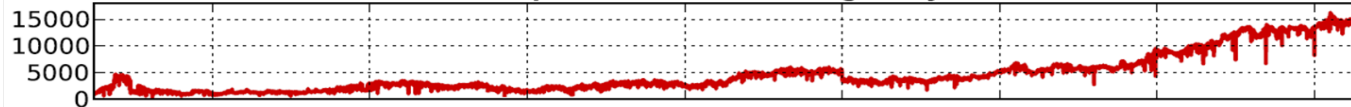
Temperature (85-275hPa) from aircraft



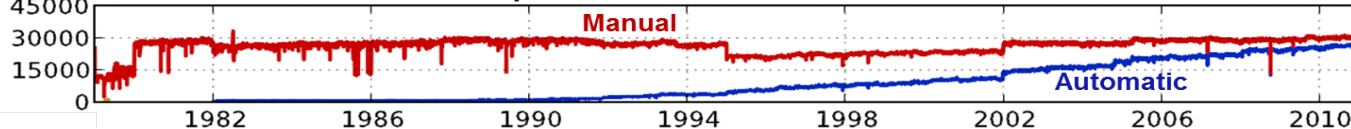
Temperature (275-775hPa) from radiosondes



Surface pressure from drifting buoys



Surface pressure from SYNOP stations



Examples of daily counts of *in situ* data used in ERA-Interim from 1979 to 2011

# Observational metadata products

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## **Atmospheric reanalysis generates not only**

- gridded meteorological, ocean-wave and land-surface products

## **but also**

- quality-control information on each observation
- fits of background forecast and analysis to each observation
- estimates of biases of some types of observation

## **The observational metadata support informed use for climate purposes**

- of products (e.g. enabling inferences from drifts in background and analysis fits to observations over time)
- of observational data (e.g. through use of quality control or bias information)

## **Enabling this fully is a technical and data-policy challenge**

- and pursuing this in the past has been a user challenge, met for example by Haimberger in determining break points for homogenising radiosonde data

# Atmospheric reanalysis

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## **Proposed in 1988 by Bengtsson & Shukla and Trenberth & Olson**

- for climate studies, following ECMWF and GFDL “FGGE” reanalyses for 1979

## **Three responses in the mid 1990s**

- ERA-15 (1979 - 93), NASA/DAO (1980 - 93) and NCEP/NCAR (1948 - ...)

## **Second round followed**

- ERA-40 (1958 - 2001), JRA-25/JCDAS (1979 - ...) and NCEP/DOE (1979 - ...)

## **Now towards end of third generation of comprehensive global reanalysis**

- CFSR (1979 – 2010?), ERA-Interim (1979 - ... ), JRA-55 (1958 - 2012) and MERRA (1979 - ...)

## **With more diverse contributions**

- 20<sup>th</sup> Century reanalysis (1871 – 2010) using surface pressure and SST data
- Reanalyses focused on atmospheric composition, regional reanalyses, ...



# Organisational questions

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## **How do producers secure funding with a sufficient time horizon?**

- to enable appropriate planning, preparation and execution of reanalyses
- to allow appropriate international coordination

## **How many comprehensive global reanalyses do users need?**

- covering which periods, how often refreshed, when to be terminated?
- are three or four main centres producing for global consumption enough?
- how many from around the Capital Beltway?
- is regional reanalysis a better focus for potential new entrants?

## **To what extent is international coordination needed?**

- over development of input datasets (observations, forcing fields, emissions, ...)
- over timing of mainstream production
- over running of supplementary data assimilations and model integrations
- over linking of activities with climate modelling

**and how formal can or should this be?**

# Implementational challenges

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## **Ongoing business remains challenging and important**

- recovery of observational data from past years
- improvement of assimilating models
- improvement of assimilation methods, including the treatment of model error

## **But we tend to shift from direct use of tried-and-tested NWP systems**

- adjusting (statically or dynamically) background errors for earlier, more poorly observed periods
- developing longer-window data assimilation, in which reanalysis can benefit from additional observations made after the analysis time

## **And there are questions to be asked**

- should we expect a single method to be optimal across the centuries?
- how quickly and fully should coupling be introduced with the ocean circulation, with atmospheric chemistry, ...?
- should global producers provide global downscaling to higher resolution?
- ...

# Capturing realistic low-frequency variations and trends: challenges

## Observations have biases, and these biases change over time

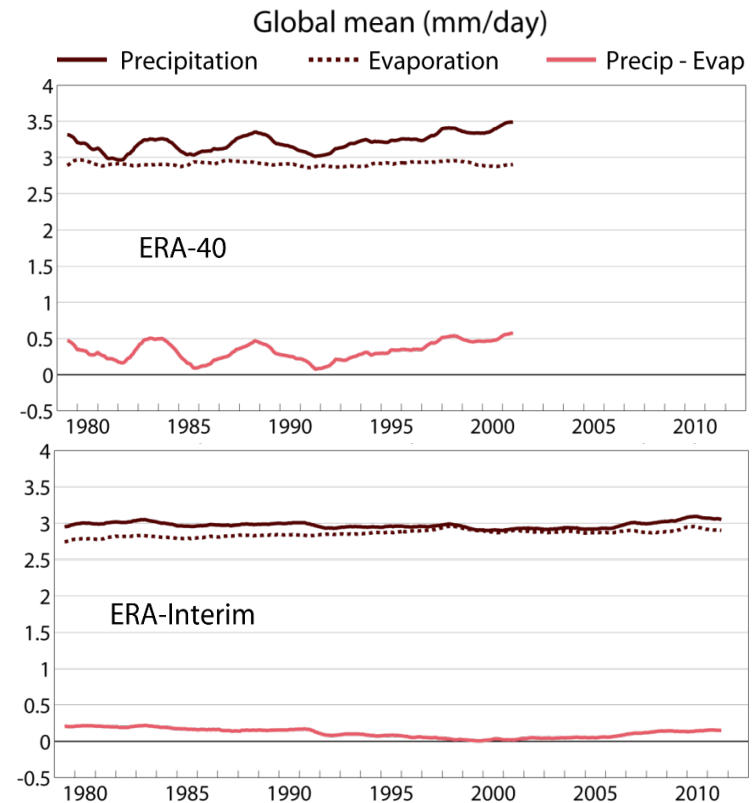
e.g. daytime warm bias in radiosonde measurements of stratospheric temperature

## Models have biases, and changes over time in observational coverage change the extent to which these biases are corrected by the assimilation process

e.g. 1970s transition of observing system in southern hemisphere; introduction and later changes in availability of SSMI humidity data

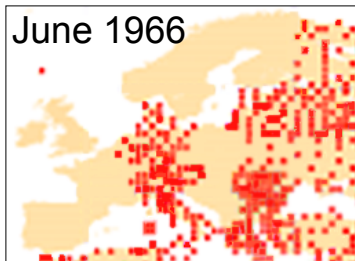
## Data assimilation can introduce biases that depend on observational coverage

e.g. humidity/rainfall problem over tropical oceans in ERA-40



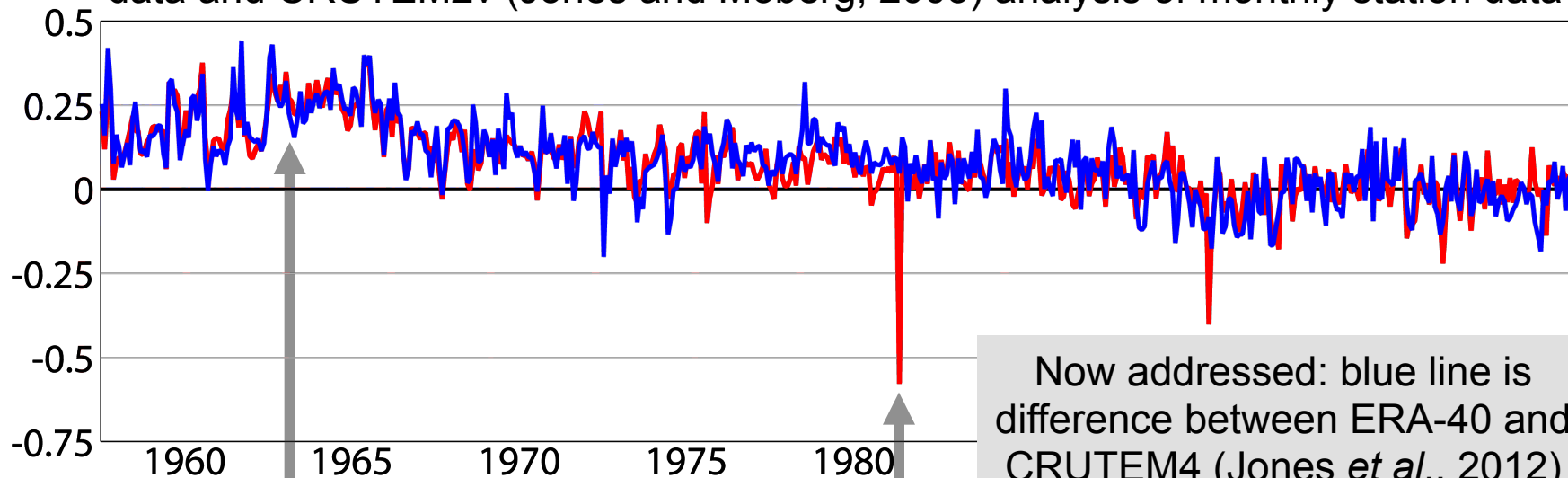
Should balance be enforced, or used as a diagnostic?

# Surface air temperature anomaly (K) with respect to 1987-2001



Many gaps in SYNOP coverage  
in ERA-40 prior to 1967

Red line is average difference over Europe between ERA-40 analysis of synoptic data and CRUTEM2v (Jones and Moberg, 2003) analysis of monthly station data



Now addressed: blue line is  
difference between ERA-40 and  
CRUTEM4 (Jones *et al.*, 2012)

Warm bias in ERA-40 due to  
inadequate SYNOP coverage

Warm bias in CRUTEM2v  
due to erroneous station data

# Monitoring large-scale temperature change

Differences in 16-year means of  
2m temperature (K)  
(1995 to 2010) – (1979 to 1994)

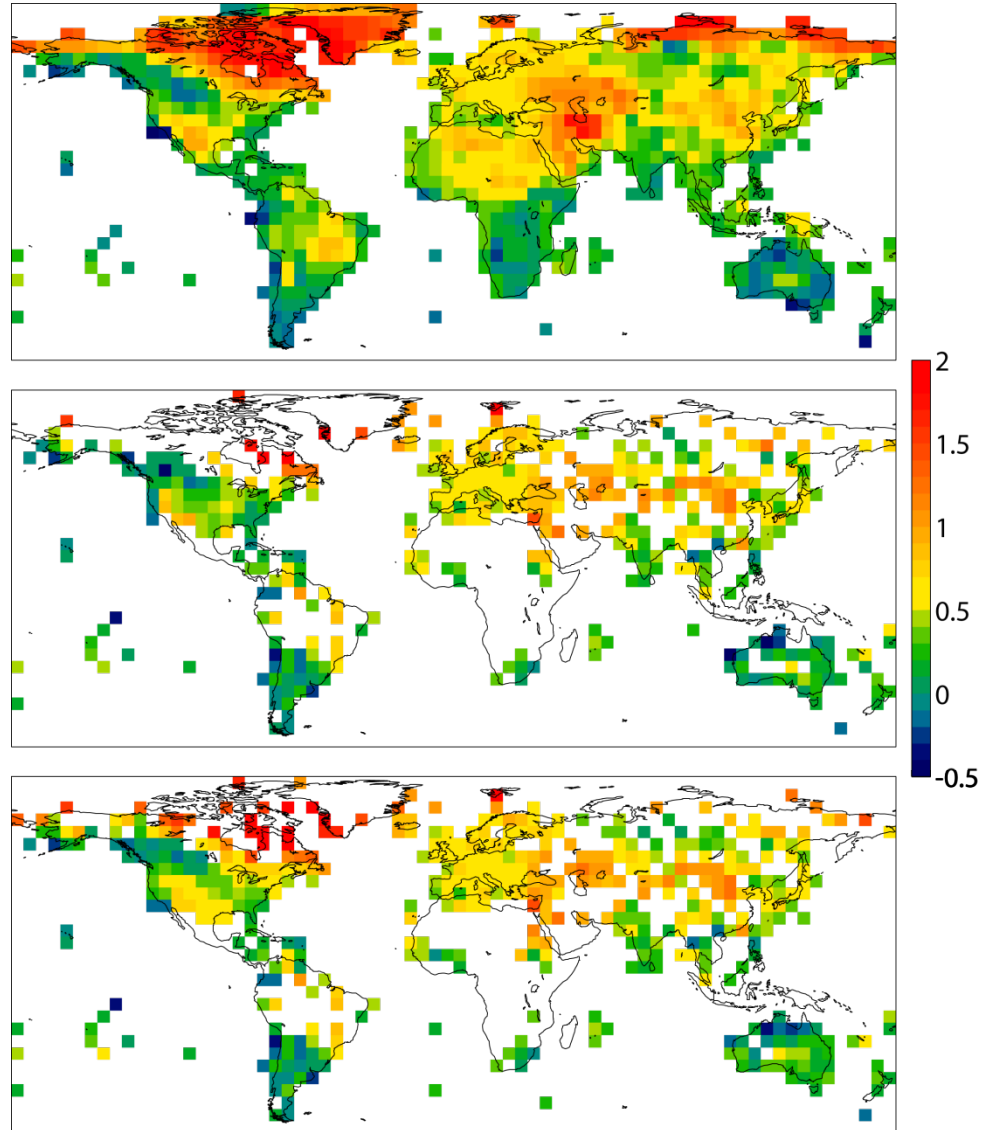
ERA-Interim (averaged onto CRU grid)

ERA-Interim analyses synoptic  
observations using a model background  
CRUTEM analyses monthly station data  
using station climate as the background

CRUTEM3 (Brohan *et al.*, 2006)

At common grid boxes, RMS differences  
between ERA-Interim and CRUTEM are:  
0.241K for CRUTEM3  
0.227K for CRUTEM4

CRUTEM4



# Consistency over time of global sea-surface temperature analysis

HadCRUT3 is effectively HadSST2

Global averages (K) over model sea areas are shown. ERA used :

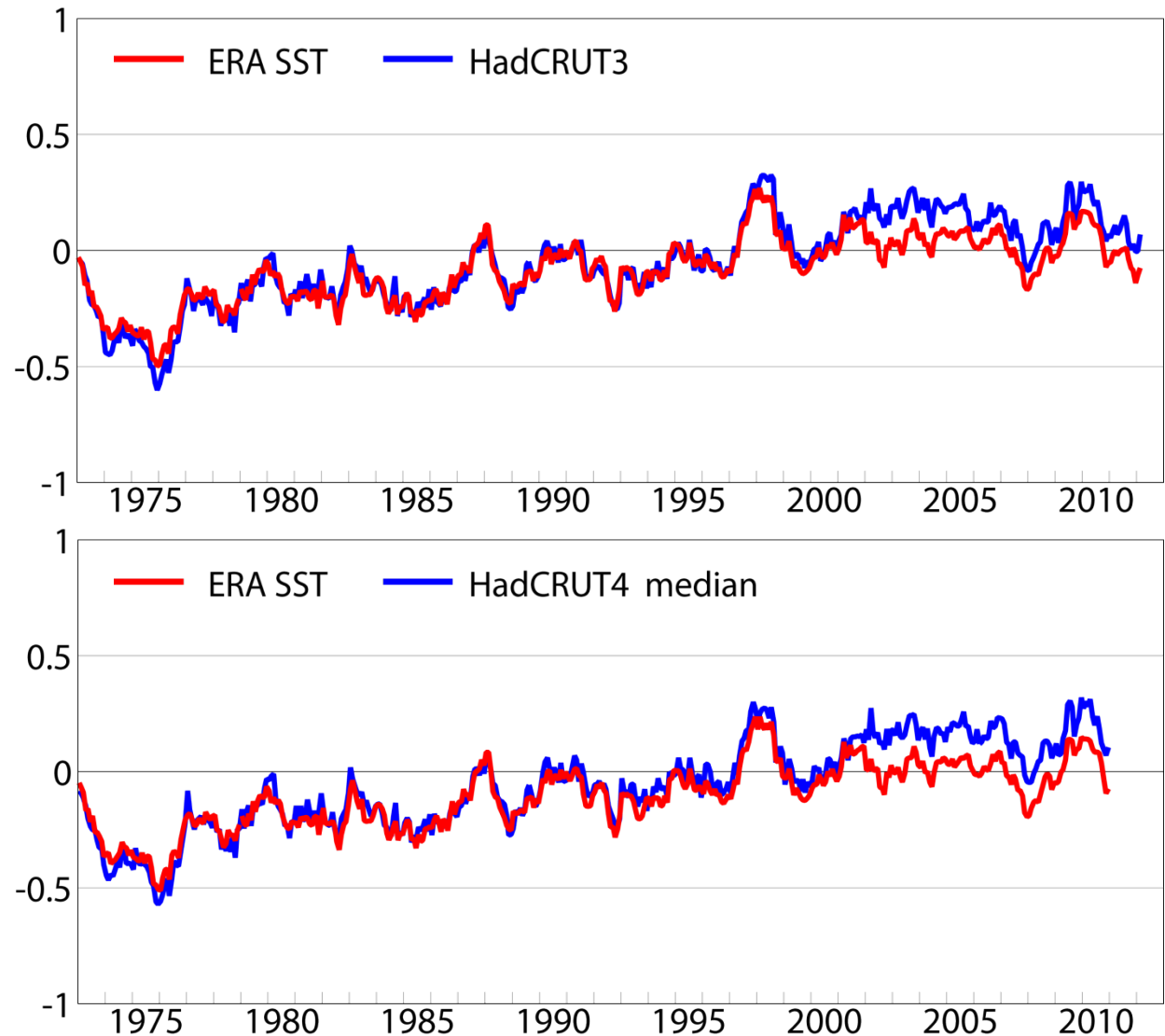
HadISST1 to Nov 1981

NCEP 2D-Var to Jun 2001

NCEP ops to Sept 2008

Met O. OSTIA thereafter

HadCRUT4 is effectively HadSST3



# Consistency over time of tropical sea-surface temperature analysis

HadCRUT3 is effectively HadSST2

Tropical averages (K) over model sea areas are shown. ERA used :

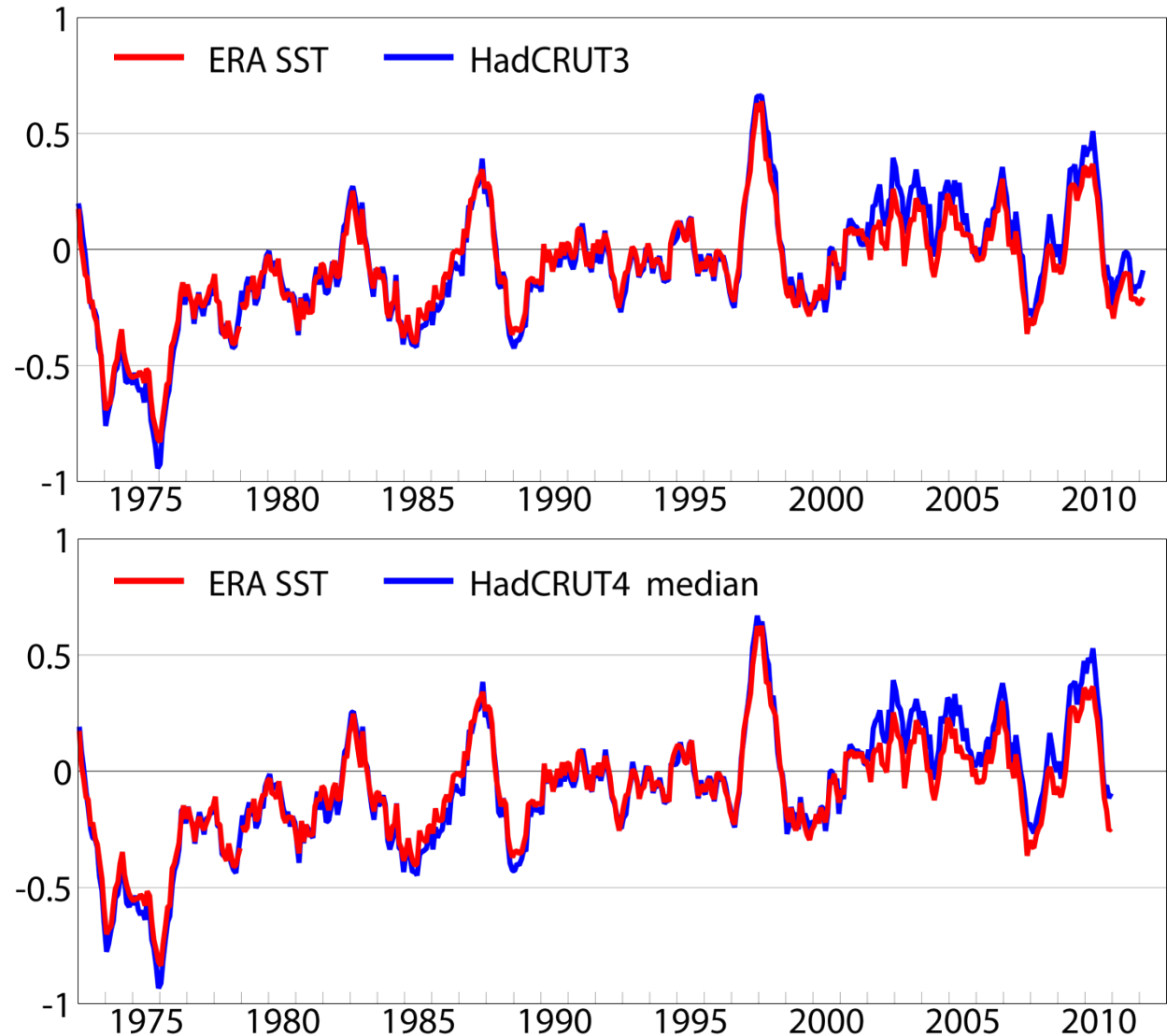
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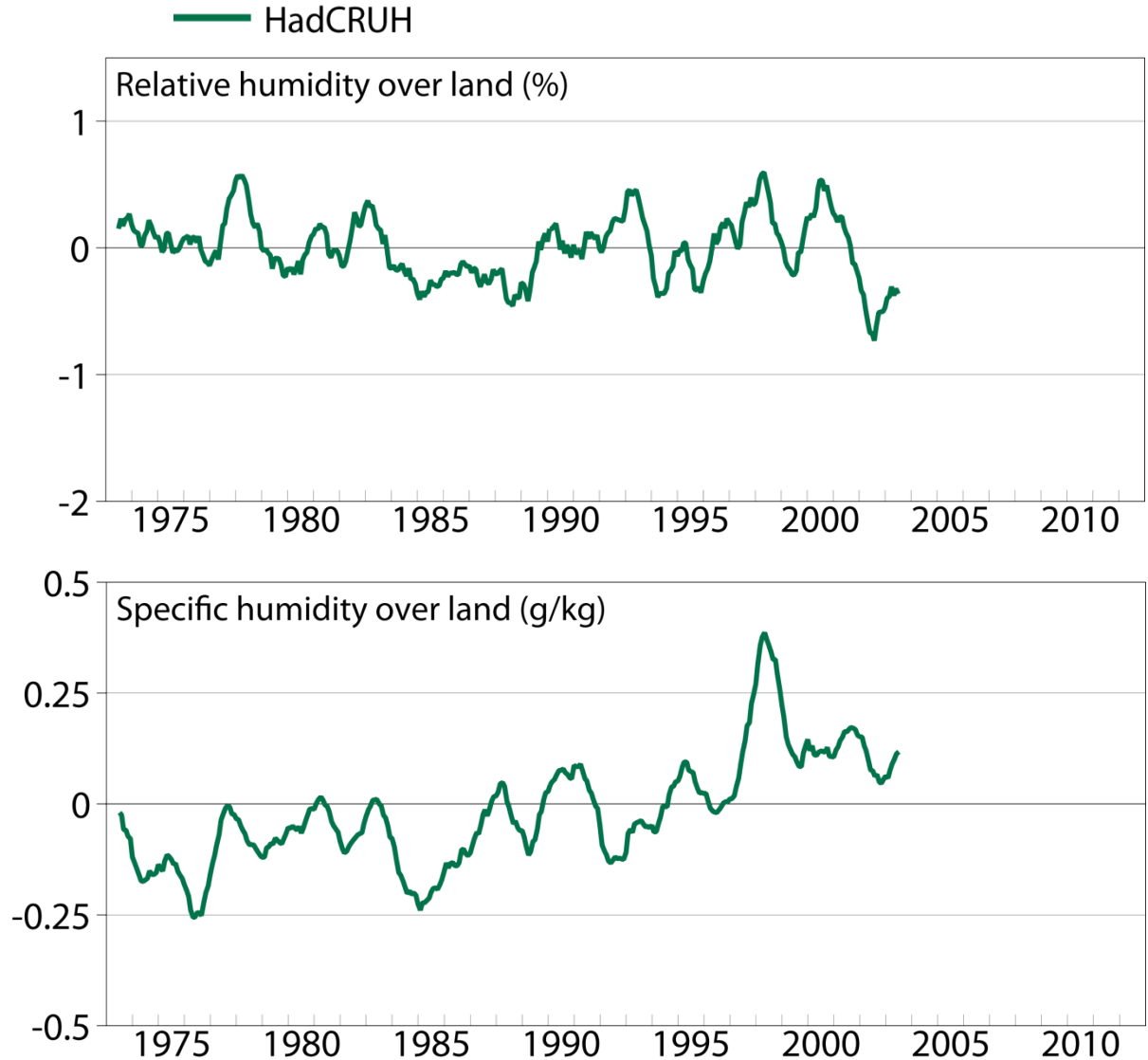
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# Global average of near-surface humidity over land

Global averages of relative humidity (%) and specific humidity (g/kg) over land are shown for the HadCRUH (Willett *et al.* 2008) dataset of gridded anomalies from synoptic observations

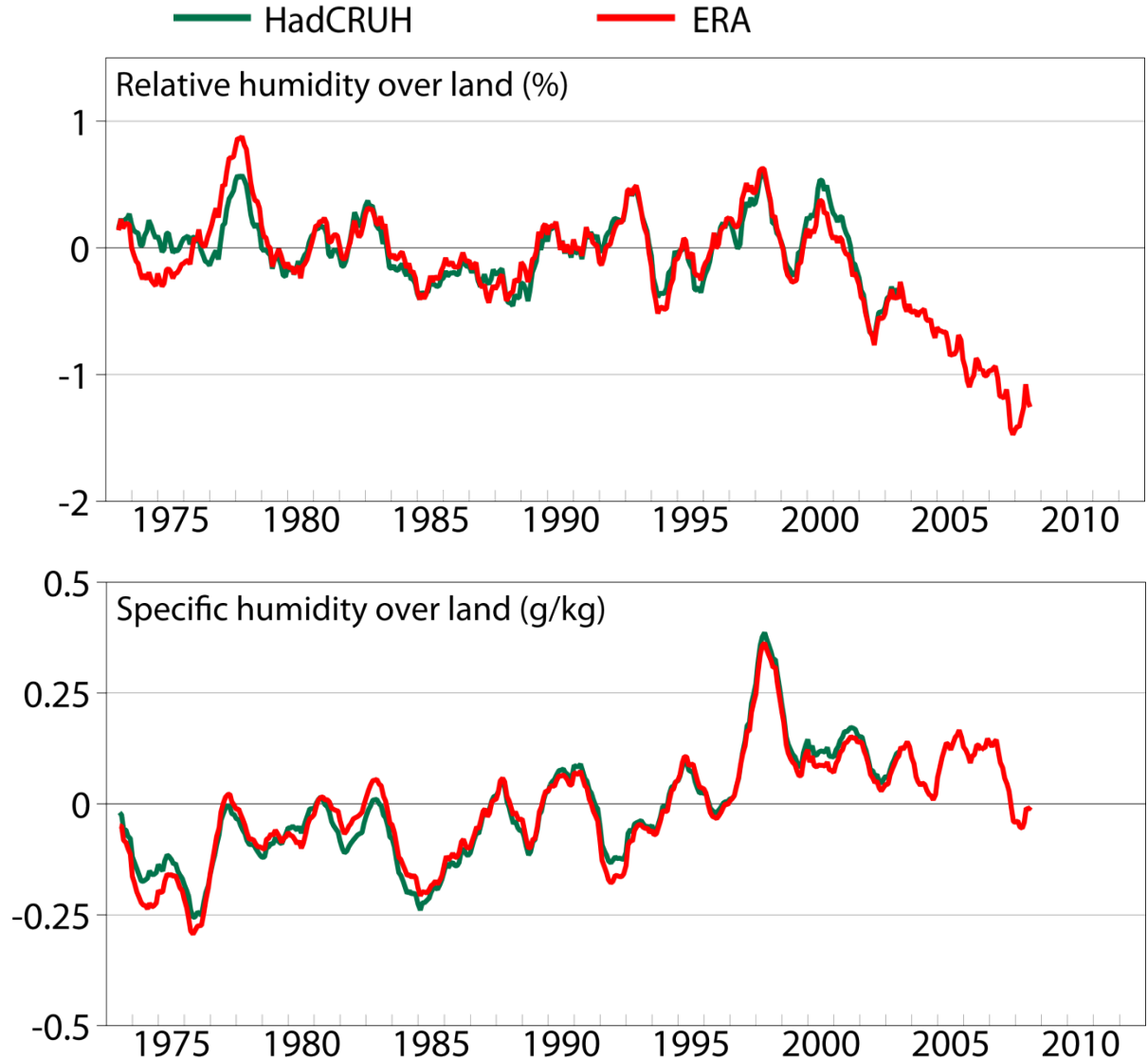




# Global average of near-surface humidity over land

Global averages of relative humidity (%) and specific humidity (g/kg) over land are shown for the HadCRUH (Willett *et al.* 2008) and ERA datasets of gridded anomalies from synoptic observations

ERA is sampled to match the sampling of HadCRUH



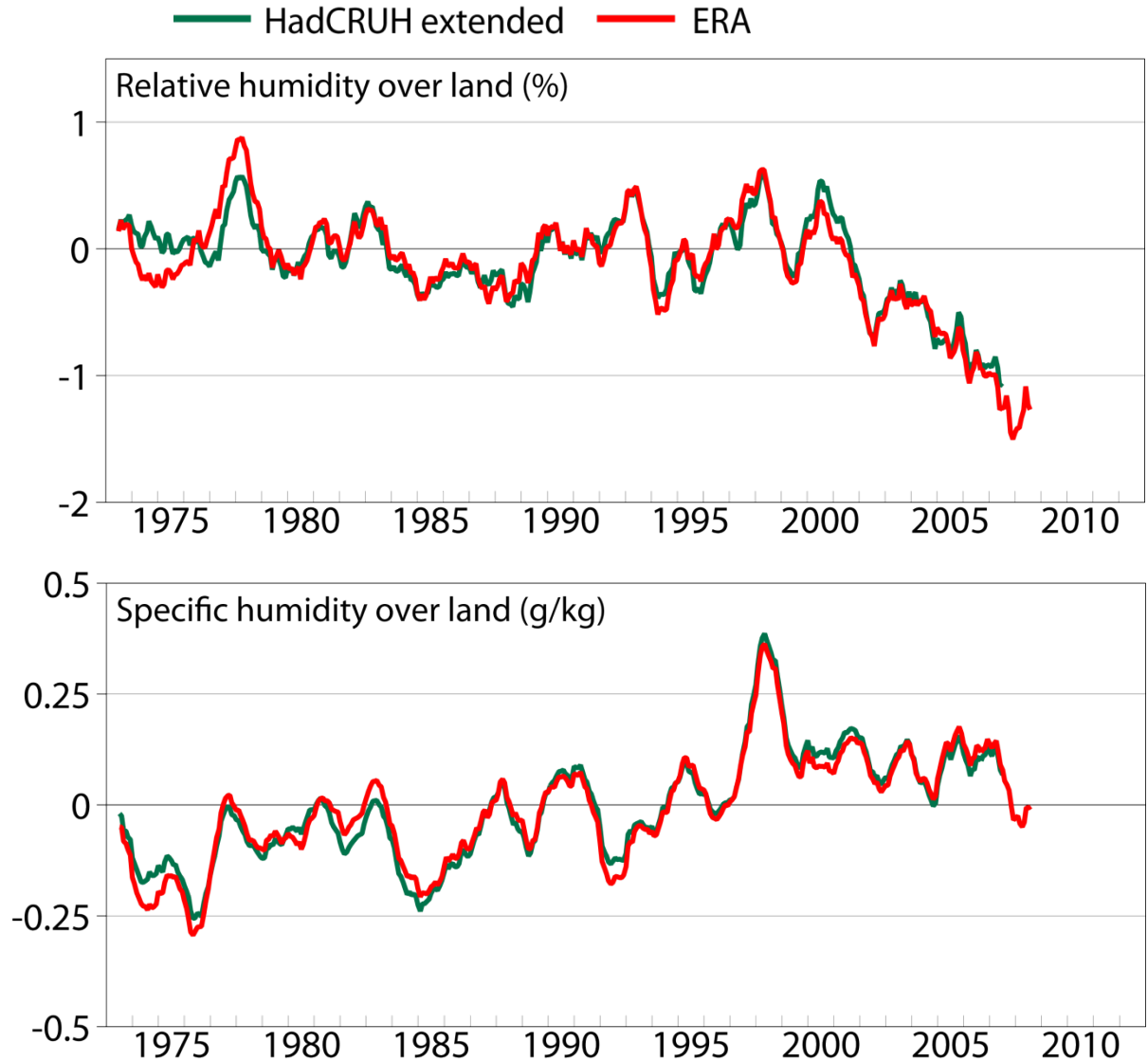
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HadCRUH is extended by four years (Simmons *et al.*, 2010)

ERA is sampled to match the sampling of HadCRUH

**Comment:** Full updating of HadCRUH is needed



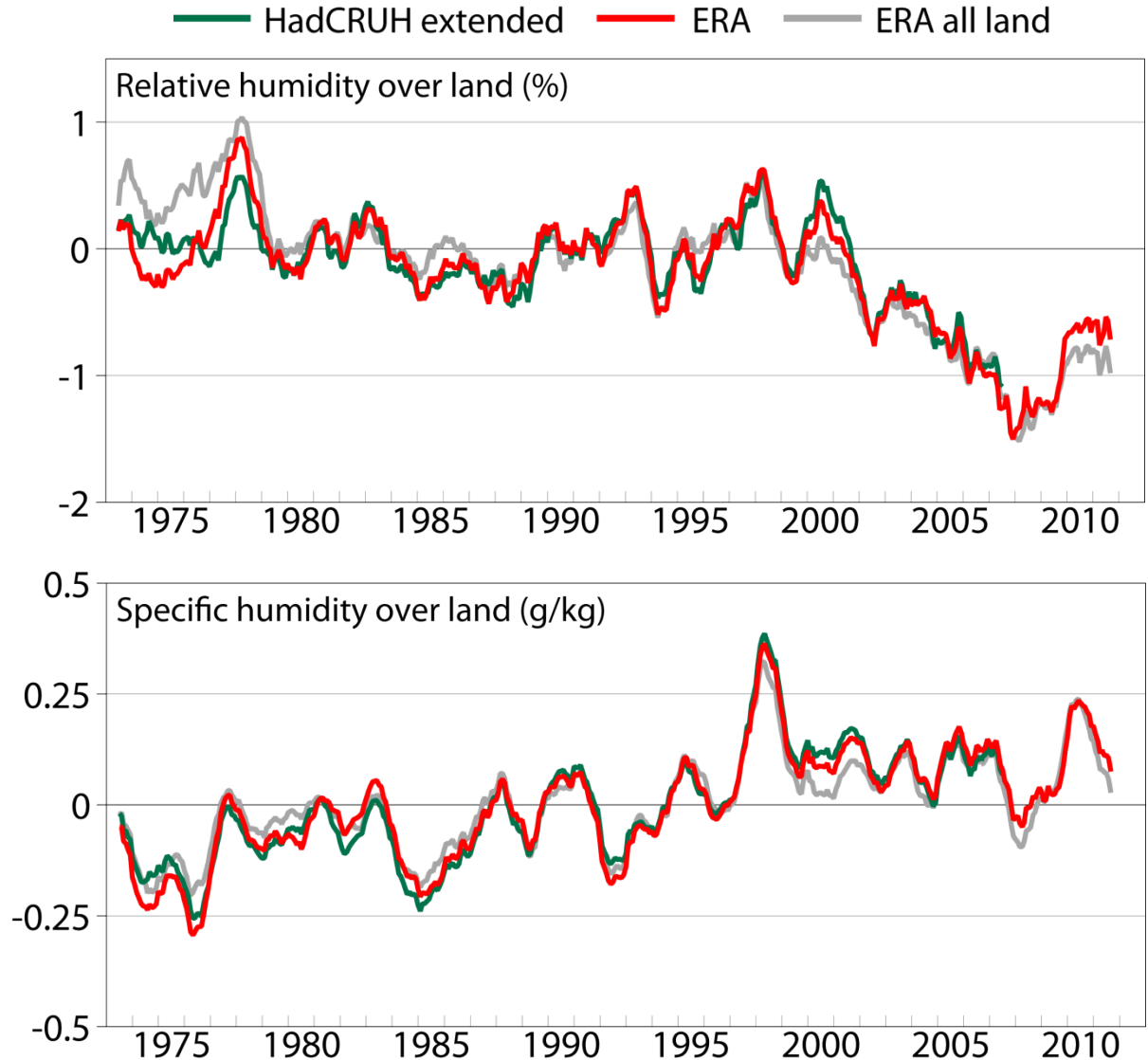
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ERA is shown with/without HadCRUH sampling

**Comment:** Full updating of HadCRUH is needed



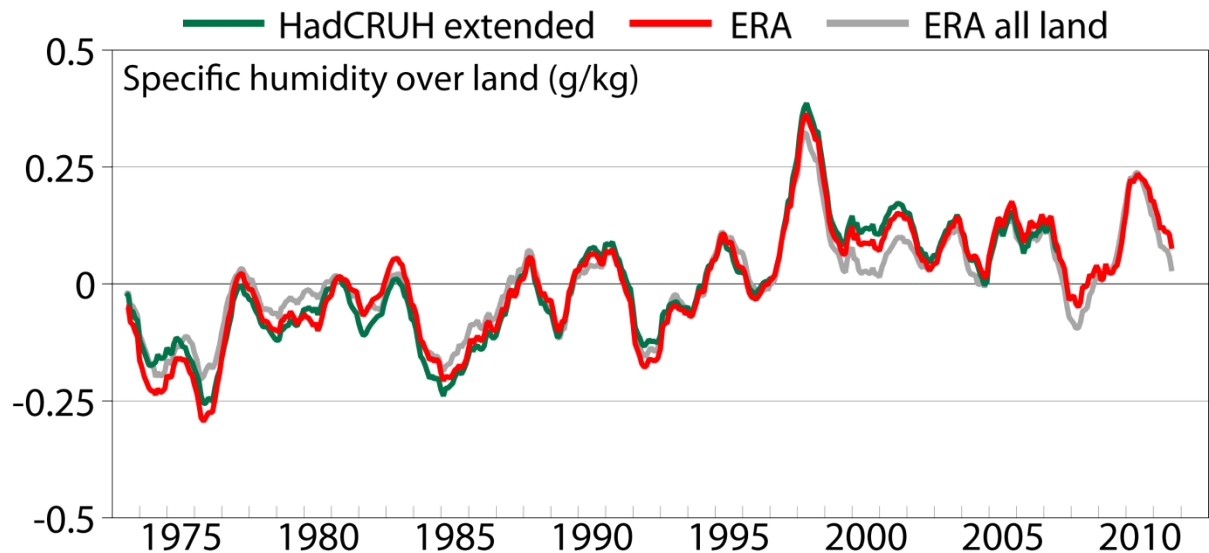
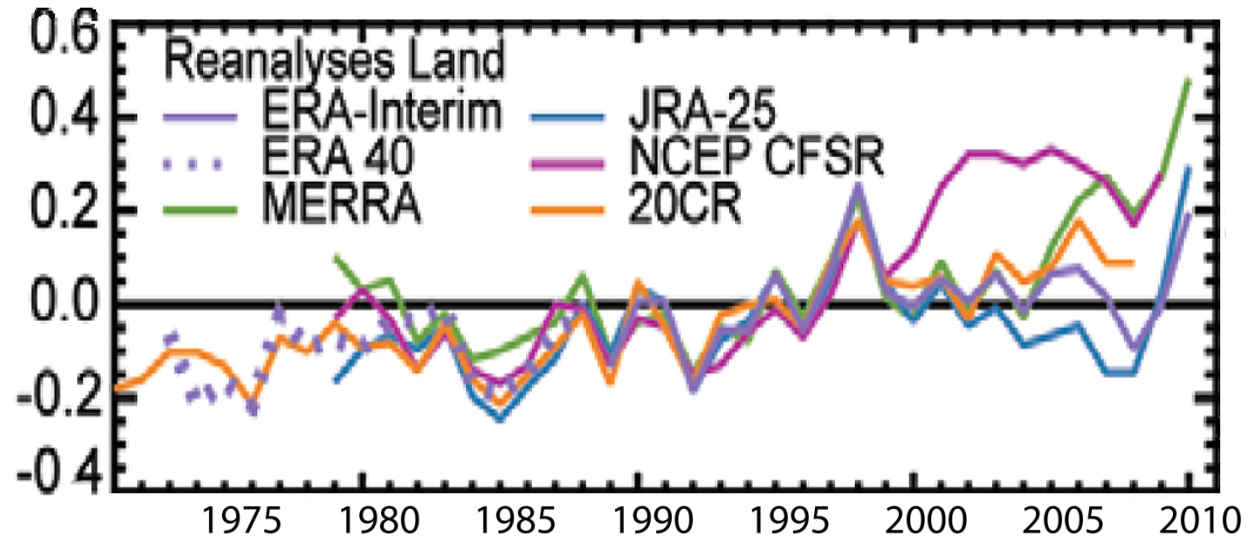
# Global average of near-surface humidity over land

Global averages of specific humidity (g/kg) over land are shown for reanalyses as presented in the BAMS State of the Climate 2010 article

Corresponding plots for ERA and the extended HadCRUH are also shown

## Question:

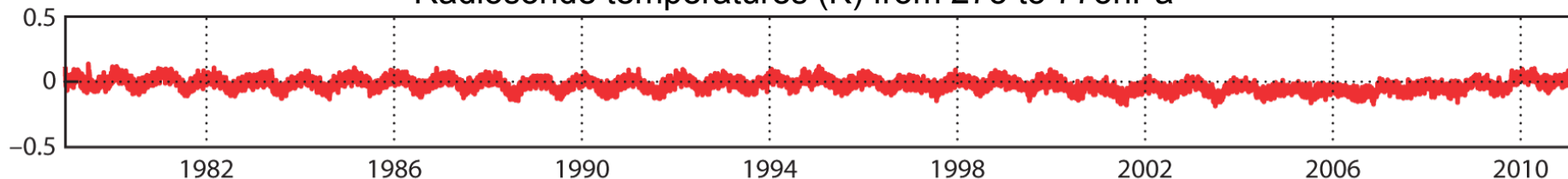
Should all submitted results from reanalyses be accepted for SoC article regardless of demonstrated quality?



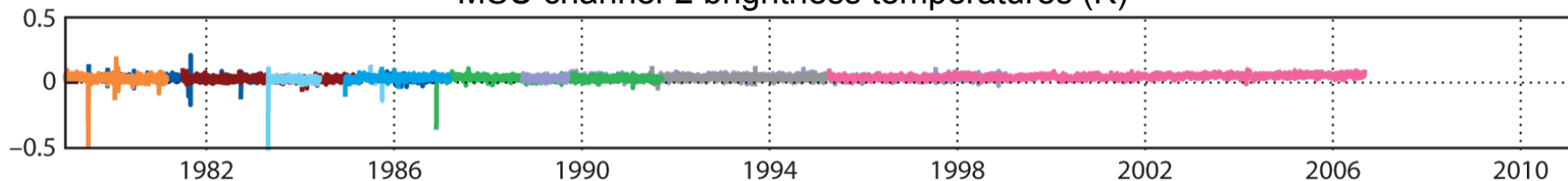
# Temporal consistency of ERA-Interim

Global-mean differences between background forecasts and observations

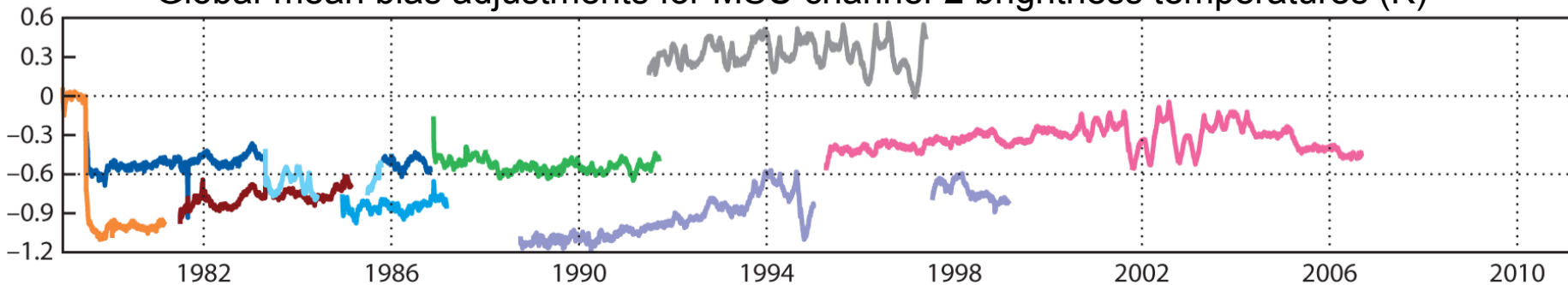
Radiosonde temperatures (K) from 275 to 775hPa



MSU channel-2 brightness temperatures (K)

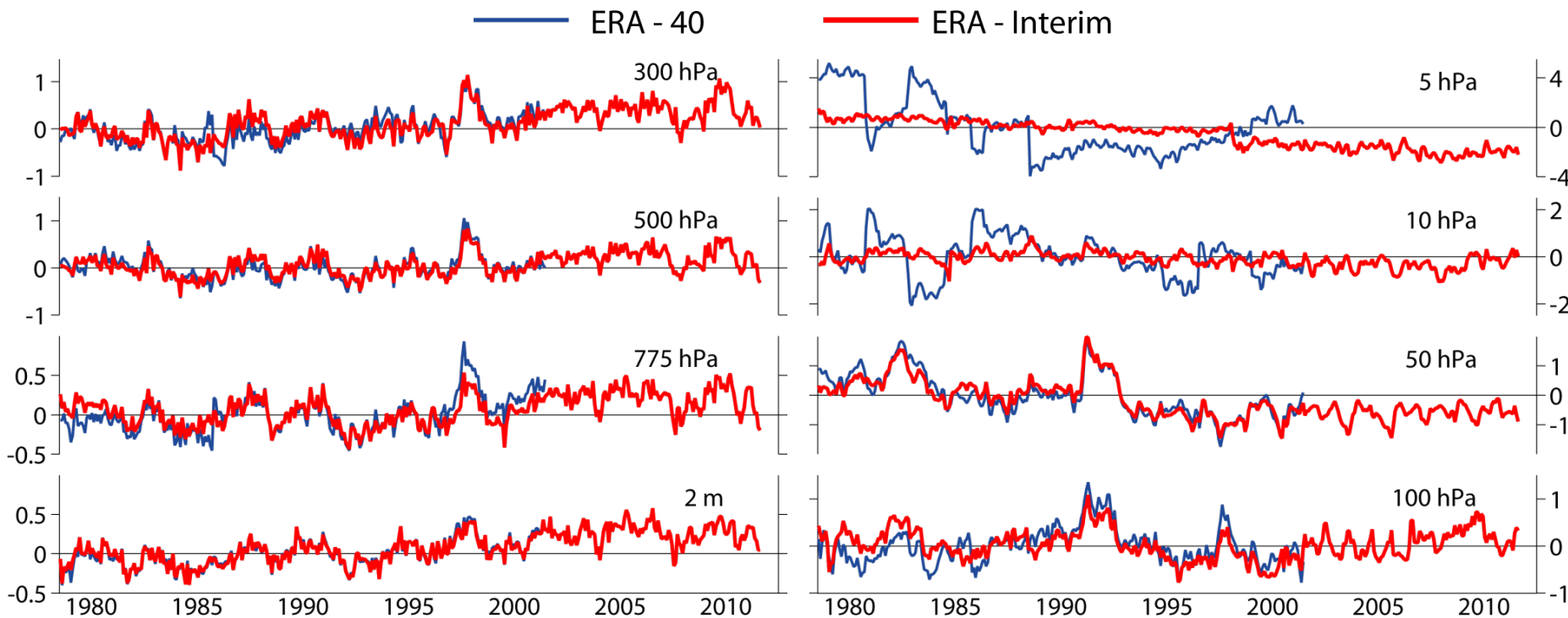


Global-mean bias adjustments for MSU channel-2 brightness temperatures (K)



Radiosonde temperature adjustments follow Haimberger *et al.* (2008) and Andrae *et al.* (2004)

# Global-mean near-surface, tropospheric and stratospheric temperature anomalies (K)

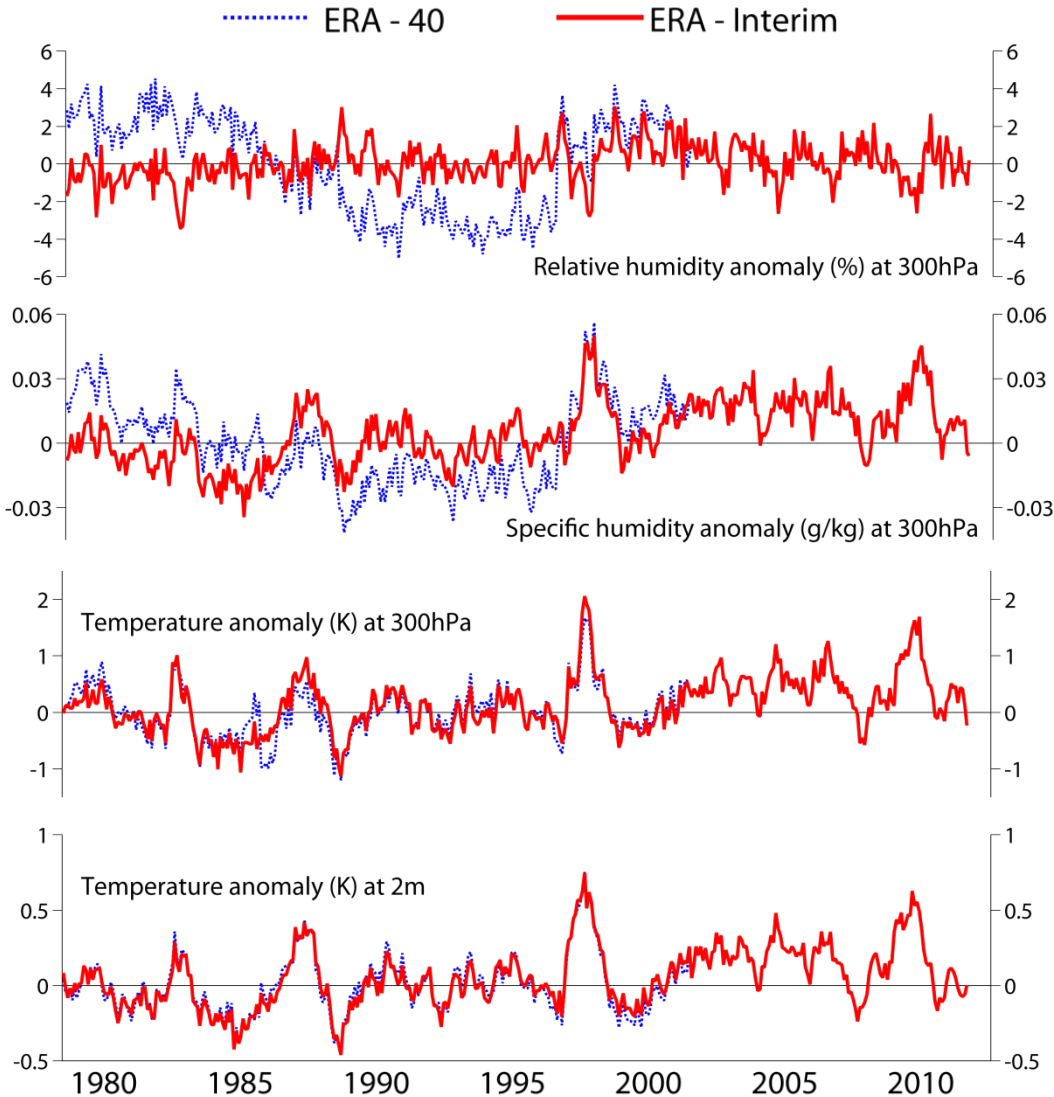


Tropospheric time series do not much from ERA-40 to ERA-Interim, but improve a little

ERA-Interim is much more consistent over time in mid to upper stratosphere, but it is hard to avoid a shift at high levels due to the change from SSU to AMSU

ERA-Interim also shifts near the tropopause due to increasing amounts of biased aircraft data and due to correction of model bias by recently available GPS occultation data

# Near-surface and upper-tropospheric tropical temperature and humidity anomalies



ERA shows strong correlation and amplification of tropical temperature anomalies by factor  $\sim 2.2$  from surface to upper troposphere

Consistent with longstanding model results but not raw radiosonde data, to be discussed later by Haimberger

ERA-Interim shows strong correlation between temperature and specific humidity anomalies in the tropical upper troposphere

Relative humidity is quite uniform over time in ERA-Interim, especially early on

**Comment:** Looks good, but ERA-Interim satellite bias adjustments need to be checked against independent estimates

# Annual anomalies in precipitation (mm/day) for 2011 relative to the 1981-2010 mean

ERA-Interim uses no rain-gauge data

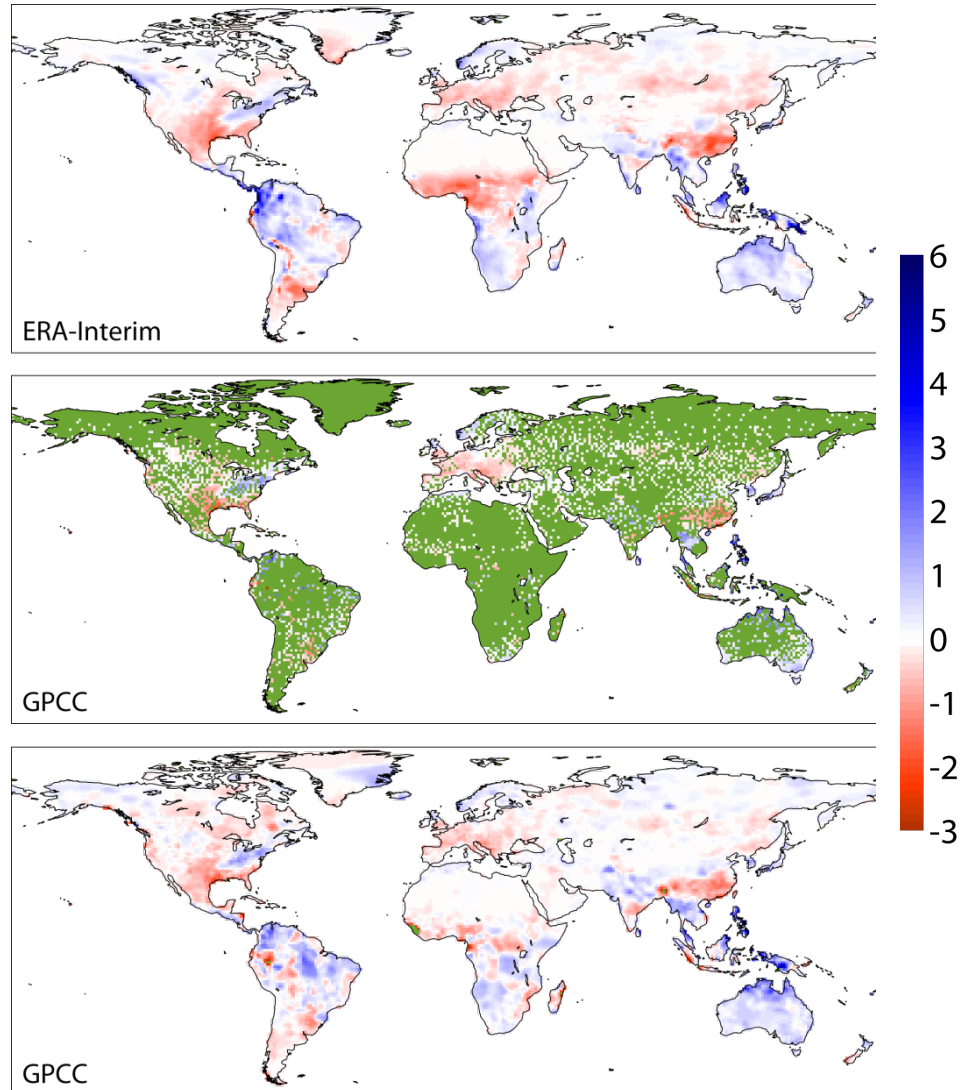
Anomalies in 12-24h forecast precipitation from ERA-Interim are compared with analyses of rain-gauge data produced by the Global Precipitation Climatology Centre (GPCC) at Deutscher Wetterdienst

GPCC analyses are plotted

for all  $1^{\circ} \times 1^{\circ}$  grid boxes that contain data from at least one gauge for every month in 2011

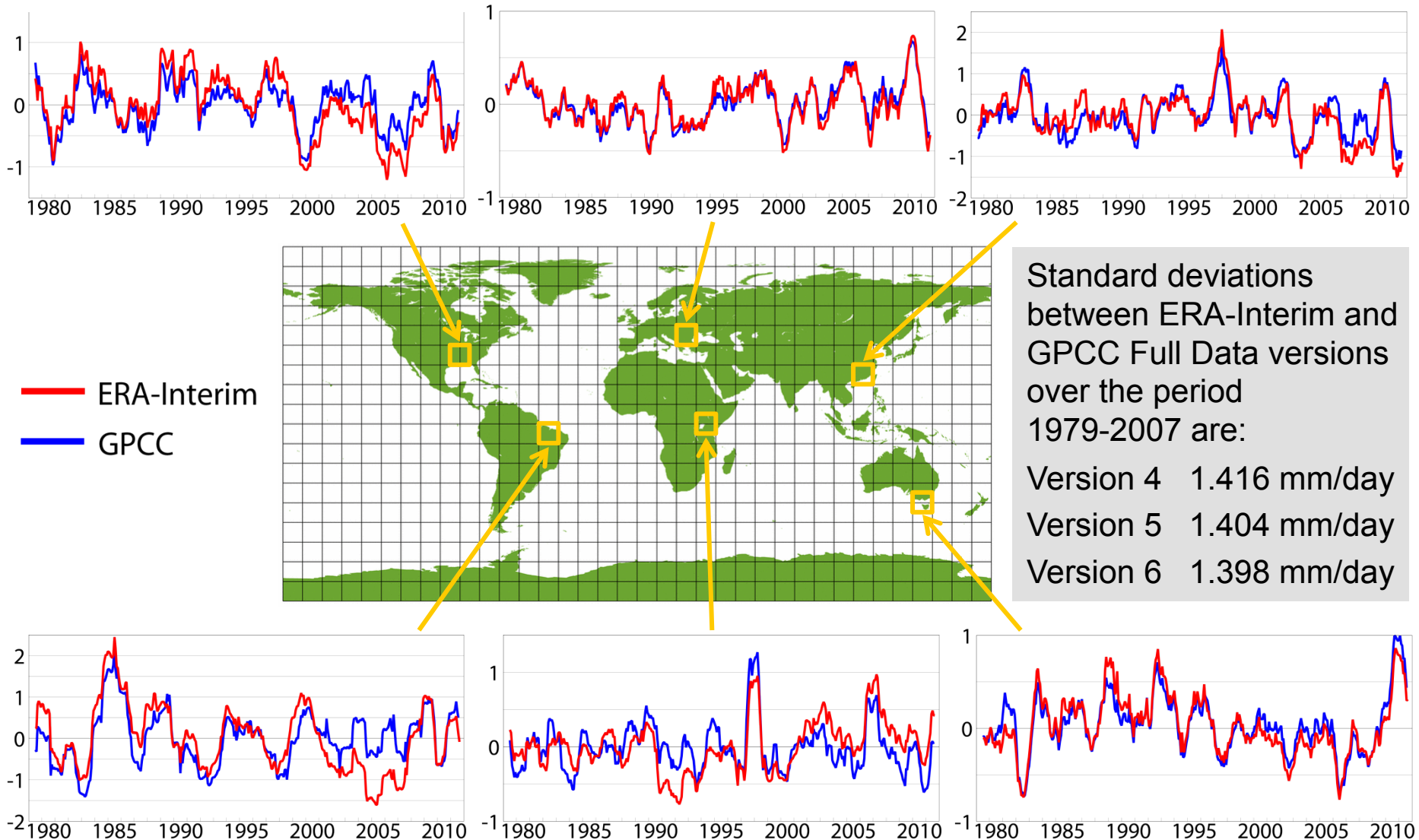
for all  $1^{\circ} \times 1^{\circ}$  grid boxes for which values are provided by the GPCC

Version 6 of the GPCC Full-data Product is used up to 2010; the GPCC Monitoring Product is used for 2011



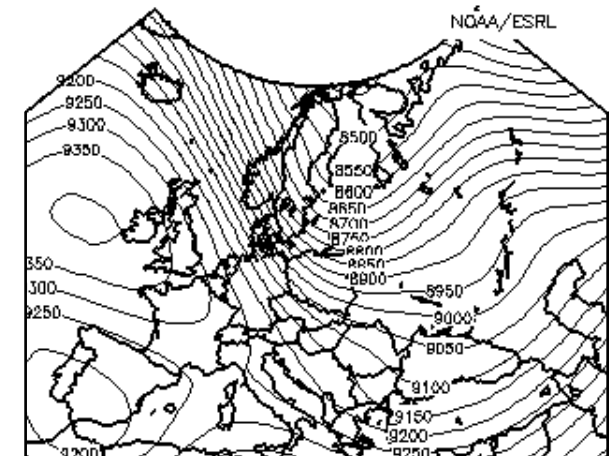
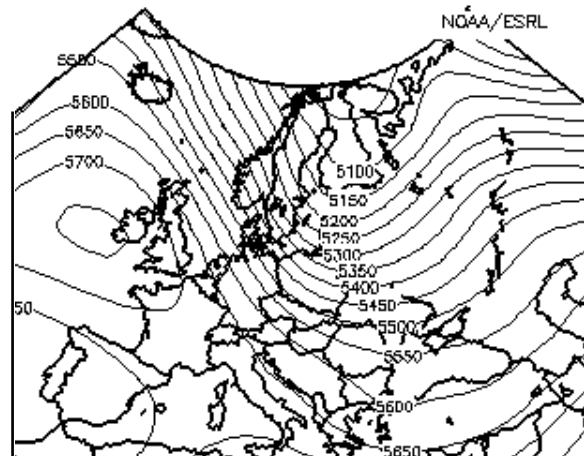
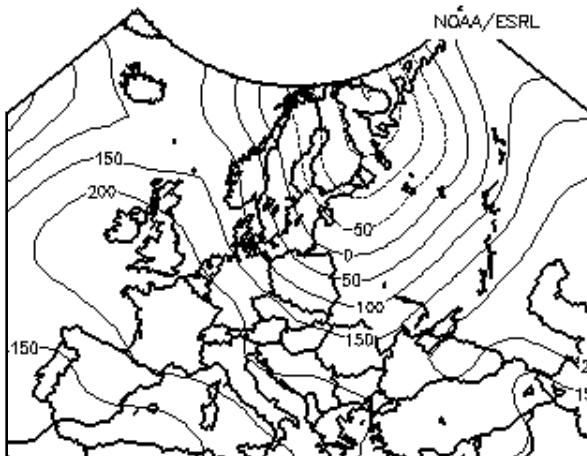
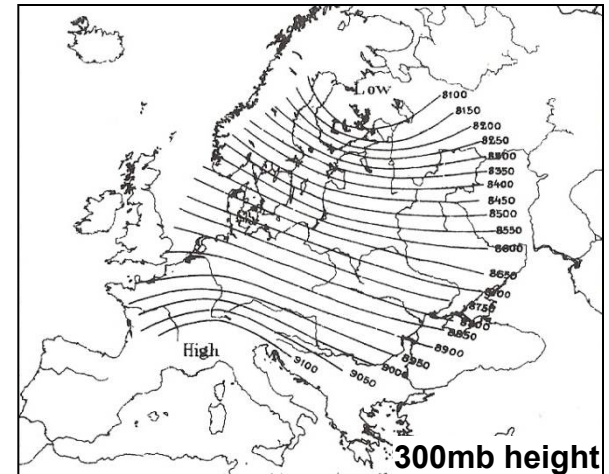
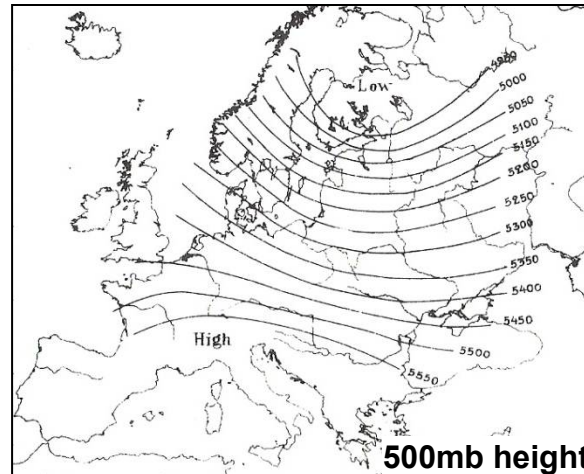
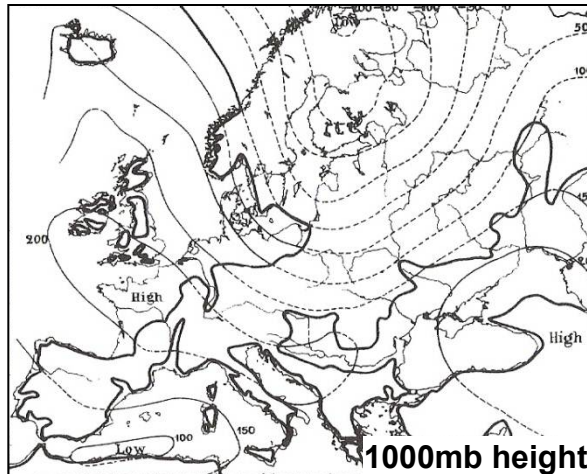


# 12-month running-mean precipitation anomalies (mm/day) for six 10°x10° domains



# Revisiting Bjerknes and Sandström (1910) Original isobaric maps for 7 November 1901

First demonstration of isobaric charts, using surface data, and balloon data from five locations



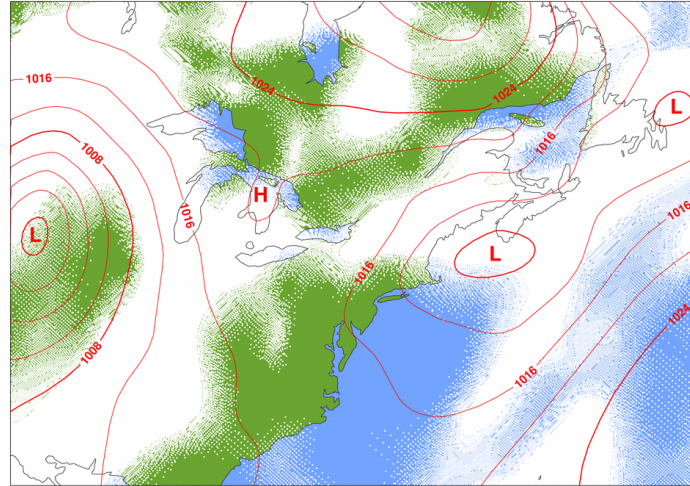
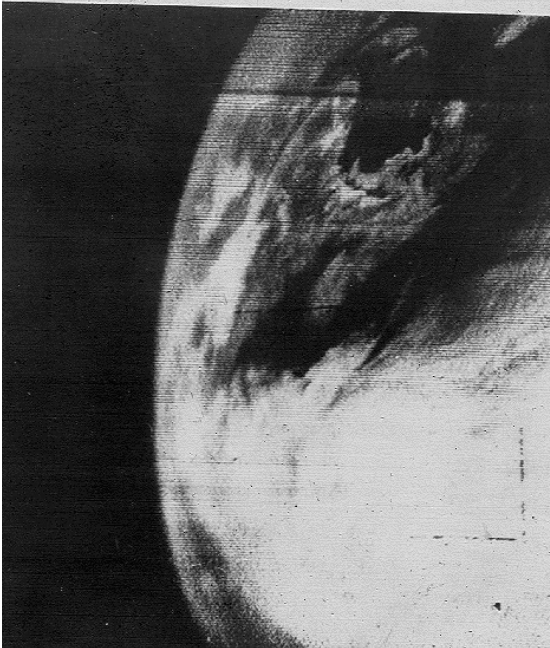
20<sup>th</sup> Century Reanalysis (Compo *et al.*, 2011) for 12UTC; contour intervals differ by factor  $\sim 0.98$

# Revisiting the early images from TIROS-1

## Cloud cover on 1 and 2 April 1960

ERA-40 1500UTC 1 April 1960

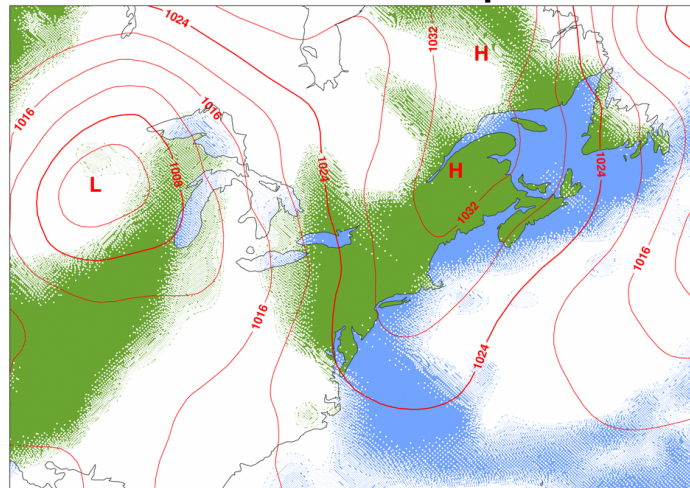
FIRST TELEVISION PICTURE FROM SPACE  
TIROS I SATELLITE  
APRIL 1, 1960



Actual first TV picture from space, as supplied by NASA Goddard librarian

Now confirmed by NASA Goddard librarian as taken at 1608UTC 2 April 1960

ERA-40 1500UTC 2 April 1960



# Concluding remarks

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## **This has been an introduction**

- to atmospheric data assimilation and reanalysis
- to evolution of the atmospheric observing system
- to various reanalysis activities in progress worldwide

## **and an illustration of some progress and issues**

- related to low frequency variability and trends

## **Some questions have been raised, but it is the beginning of the week**

- and we will learn much more this week on many topics
- and perhaps discuss some of the questions

## **So conclusions are for Friday ...**