

# Satellite data in reanalyses

Sakari Uppala & colleagues

**ECMWF**

Seminar on Development in the Use of Satellite Observations in NWP, 3-7 Sept 2007

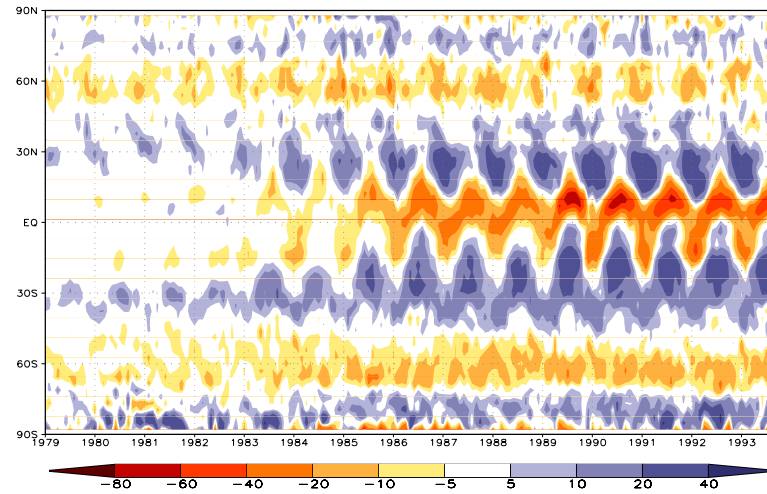
# Contents

- Motivation of reanalyses
- Observing system: reanalysis perspective
- Evolving analysis schemes
- Observing system changes → analysis quality
- The impact of satellite data:
  - ERA-15 → ERA-40 → ERA-Interim
- Future directions

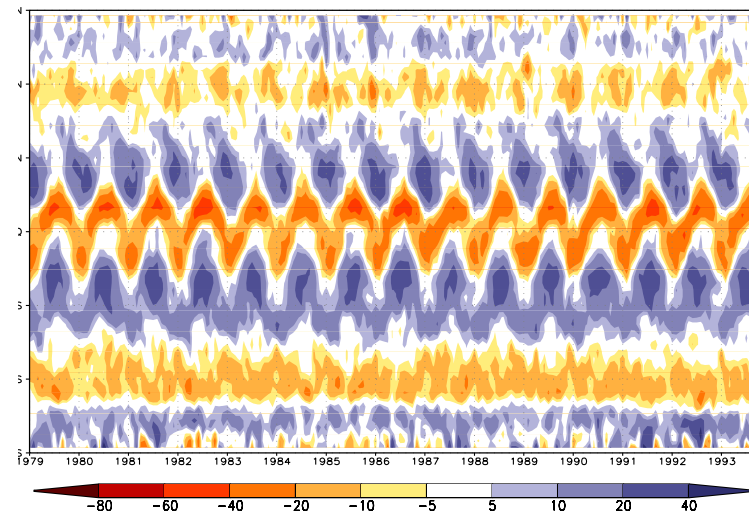
# Motivation of reanalysis

# Zonal mean vertical velocity mPa/s 1979-1993

**OPERATIONS**



**ERA-15 reanalysis**



(Stendel & Arpe, ERA-15 Report series No 6)

# Application of reanalyses (1)

## To improve understanding of

- Weather and climate
- General circulation of atmosphere
- Long term variability and trends
- Tele-connections
- Atmospheric transport
- Hydrological cycle
- Surface processes
- Predictability studies: daily → seasonal
- Extreme weather, storm tracking, tropical cyclones, ...

# Application of reanalyses (2)

**To provide:**

**Initial states, external forcing or validation data for**

- **Climate model integrations**
- **Ocean models**
- **Monthly and seasonal forecasting**
- **Chemical transport models**
- **DEMETER, ENSEMBLES, ENACT, CANDIDOZ, ...**

**A substitute for “observed statistics”**

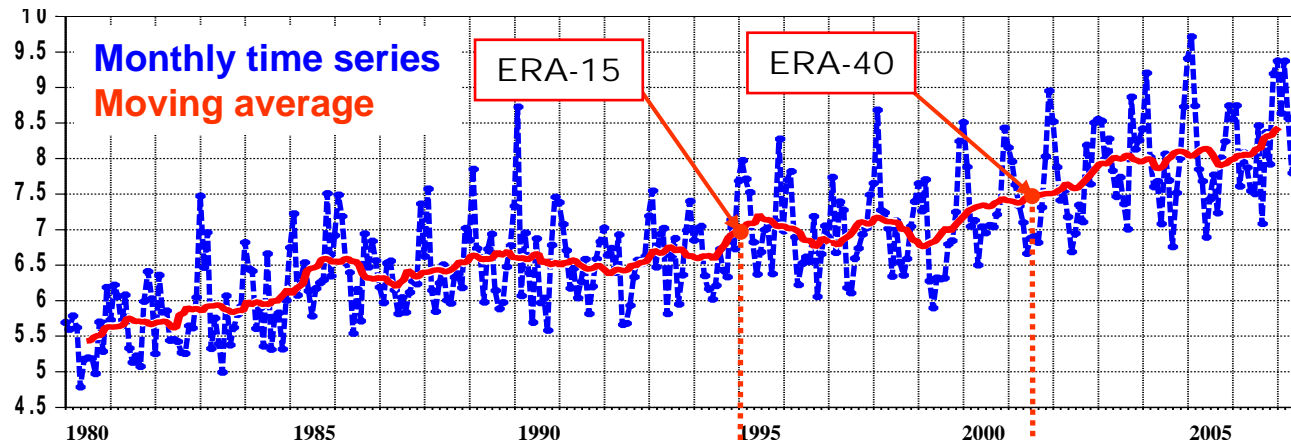
# Reanalysis projects

- NCEP/ NCAR 1948 → ... CDAS
- NASA/ DAO 1980 - 1995
- ECMWF, ERA-15 1979 - 1993
- ECMWF, ERA-40 1957 - 2002
- ECMWF, ERA-Interim 1989 → ... ECDAS
- JMA, JRA-25 1979 → ... CDAS
- In preparation
  - NASA/ MERRA 1979 →
  - New coupled NCEP reanalysis 1979 →
  - US Arctic Reanalysis System 2000 → 2010
  - New JRA reanalysis 1957 →

# Operational forecast performance 1980-2007

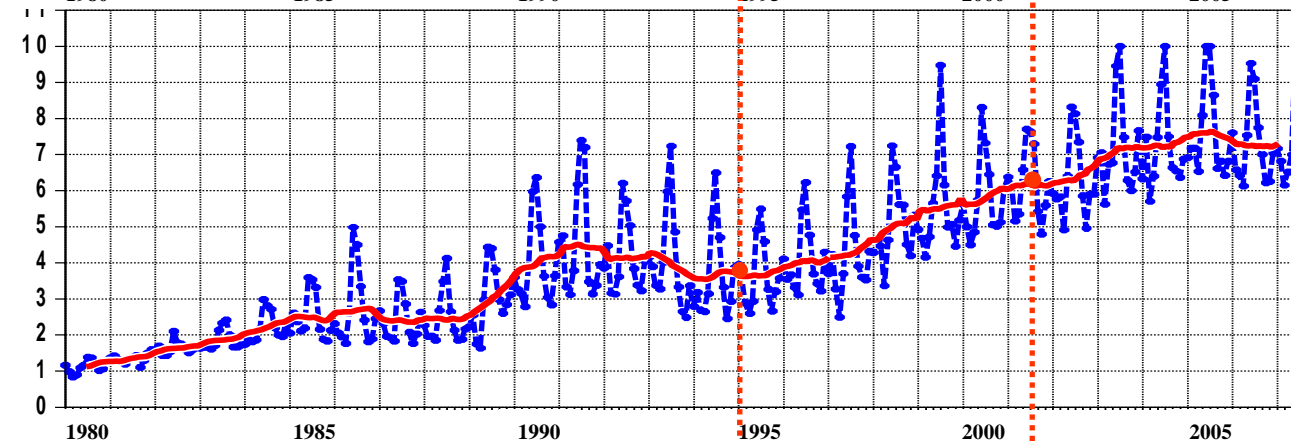
## Northern Hemisphere

500 hPa geopotential  
ANC reaching 60%



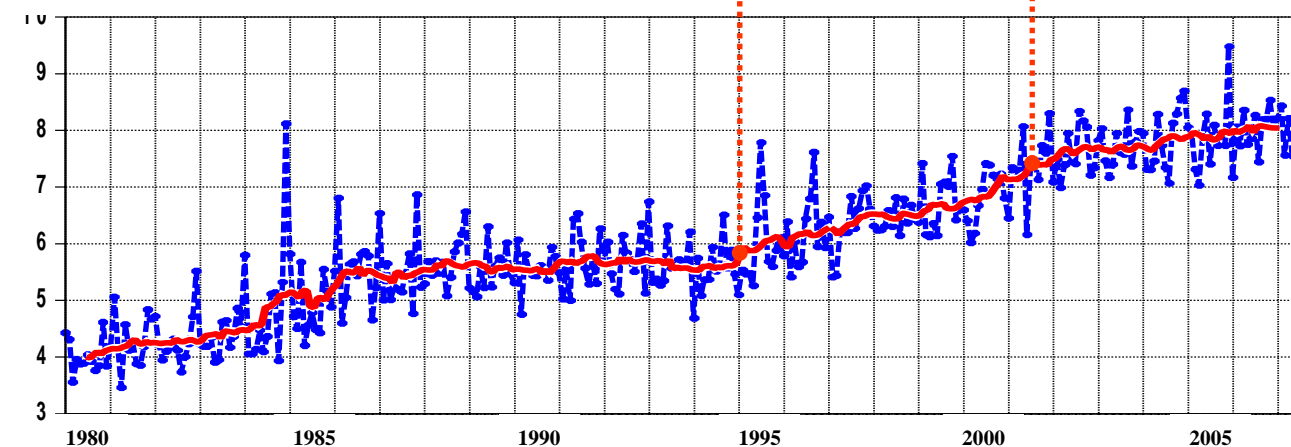
## Tropics

850 hPa wind vector  
ABC reaching 70%



## Southern Hemisphere

500 hPa geopotential  
ANC reaching 60%





# Reanalysis quality depends on:

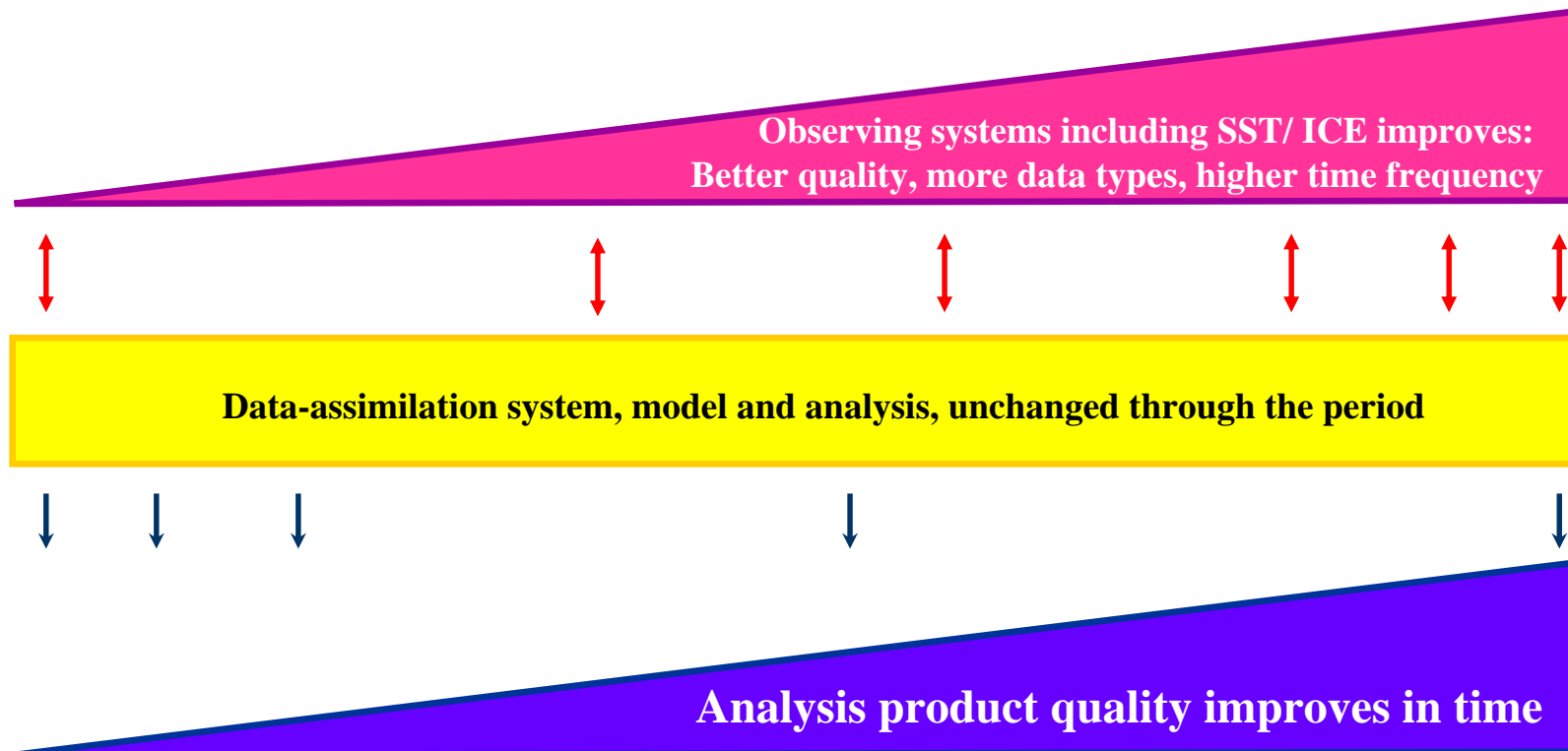
## 1) The available observational information:

- Conventional
- Satellite
- The spatial and vertical distribution of the previous
- Boundary forcing fields: SST and ice dataset

## 2) The data assimilation system:

- The analysis method and the assimilating forecast model
- The observation and background model errors

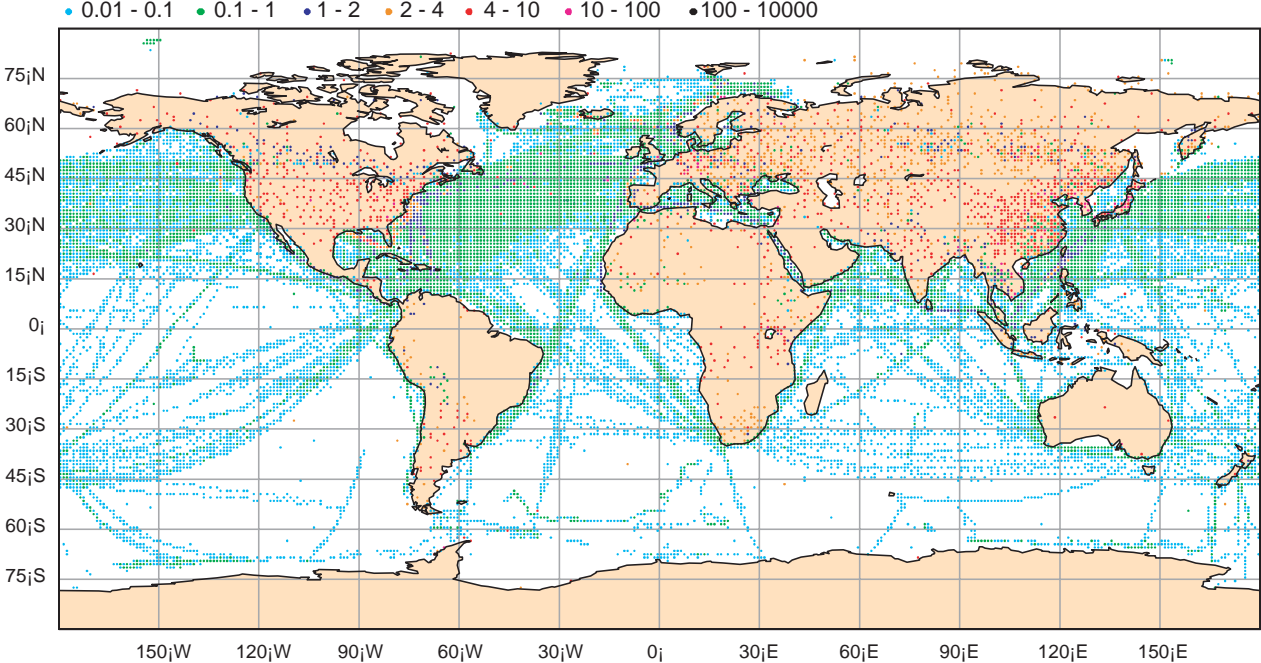
# Reanalysis schematically



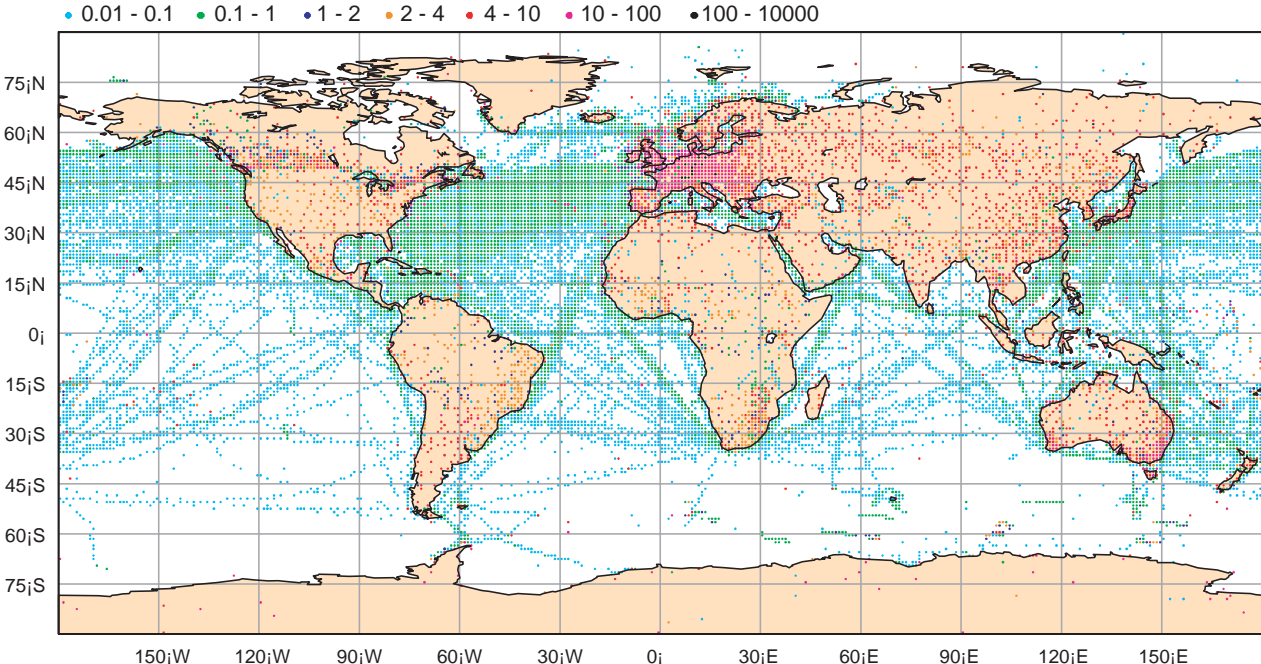
# Observations for reanalysis

# Surface observations

1958 March

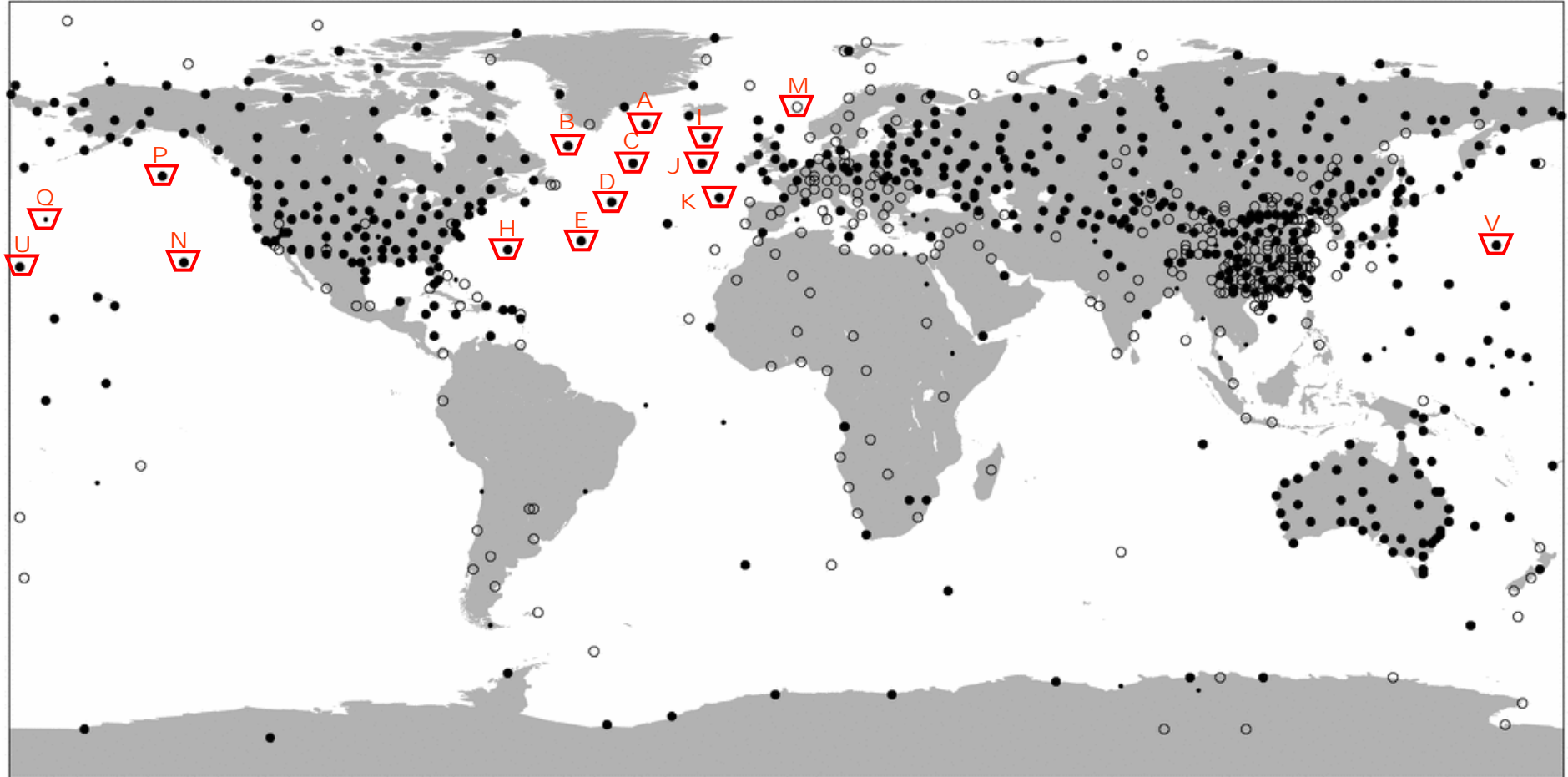


1998 March



# Radiosonde coverage for 1958

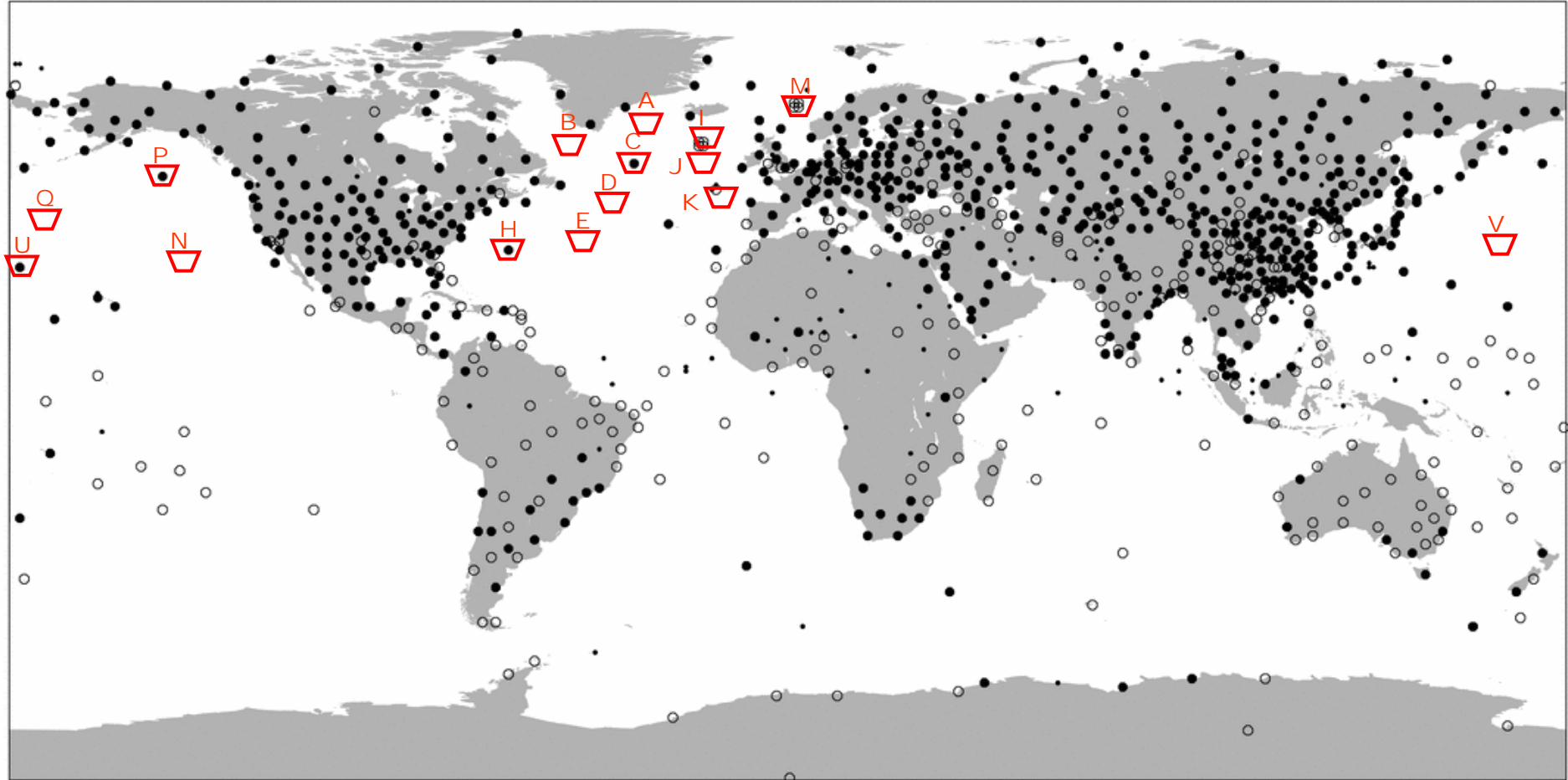
1°1° average in 3 categories: > 1 per week -> 0.5 per day: 0.5 per day -> 1.5 per day: > 1.5 per day



Average number of soundings per day: 1609

# Radiosonde coverage for 1979

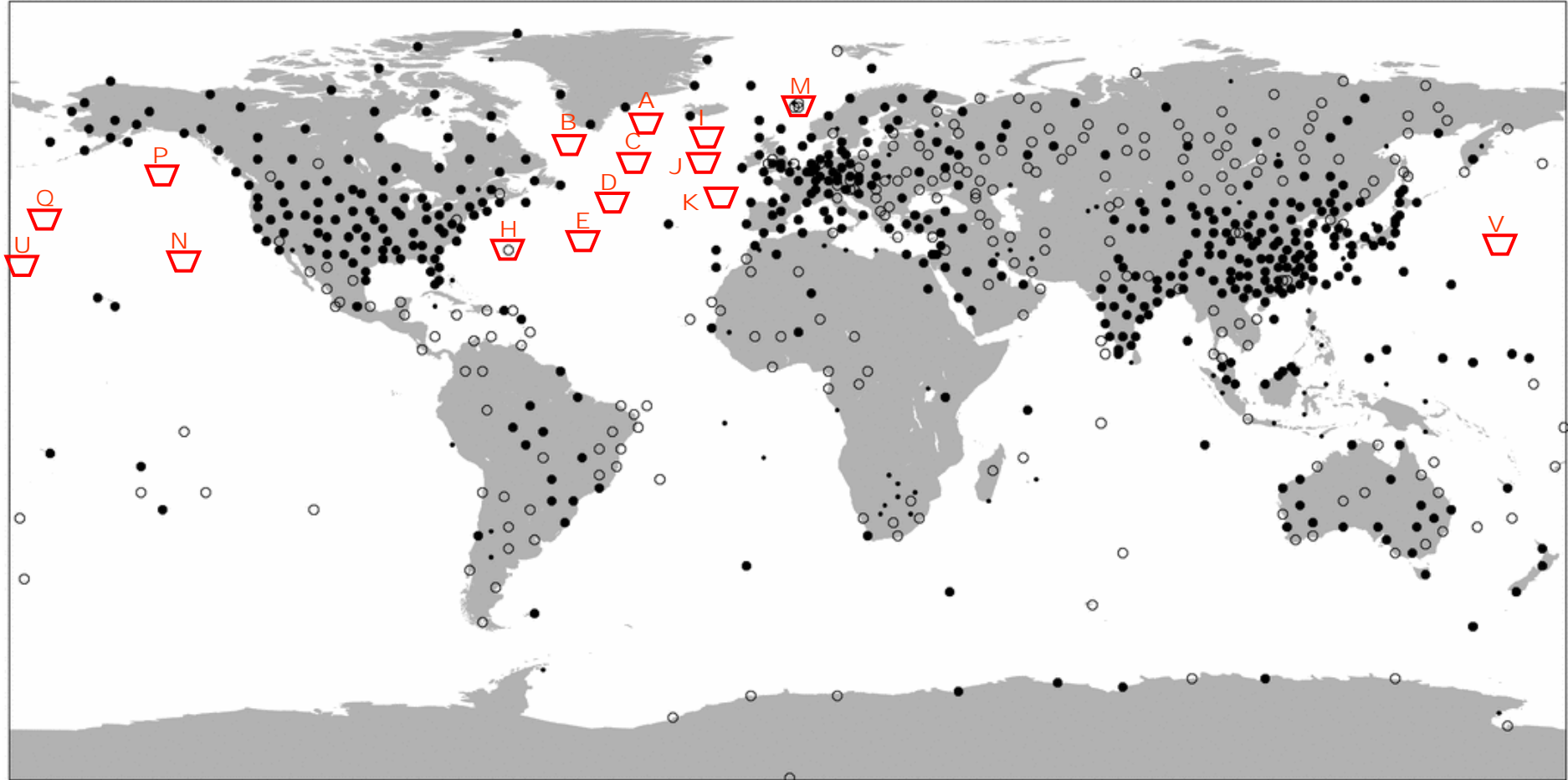
1°1° average in 3 categories: > 1 per week -> 0.5 per day: 0.5 per day -> 1.5 per day: > 1.5 per day



Average number of soundings per day: 1626

# Radiosonde coverage for 2001

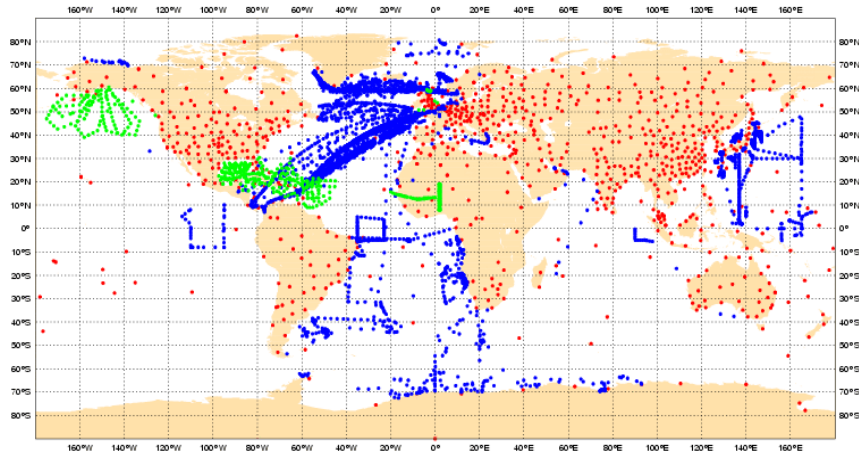
1°1° average in 3 categories: > 1 per week -> 0.5 per day: 0.5 per day -> 1.5 per day: > 1.5 per day



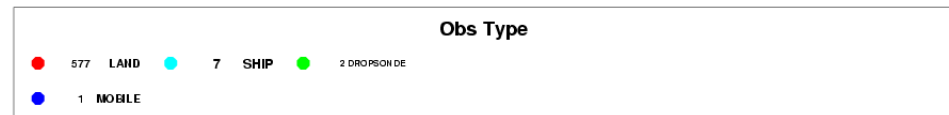
**Average number of soundings per day: 1189**

Year 2000

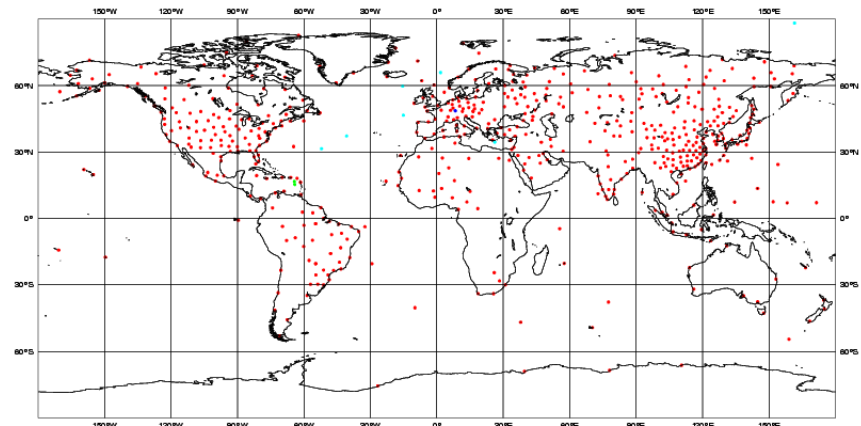
mobile ships, Dropsondes and radiosondes



A single analysis time

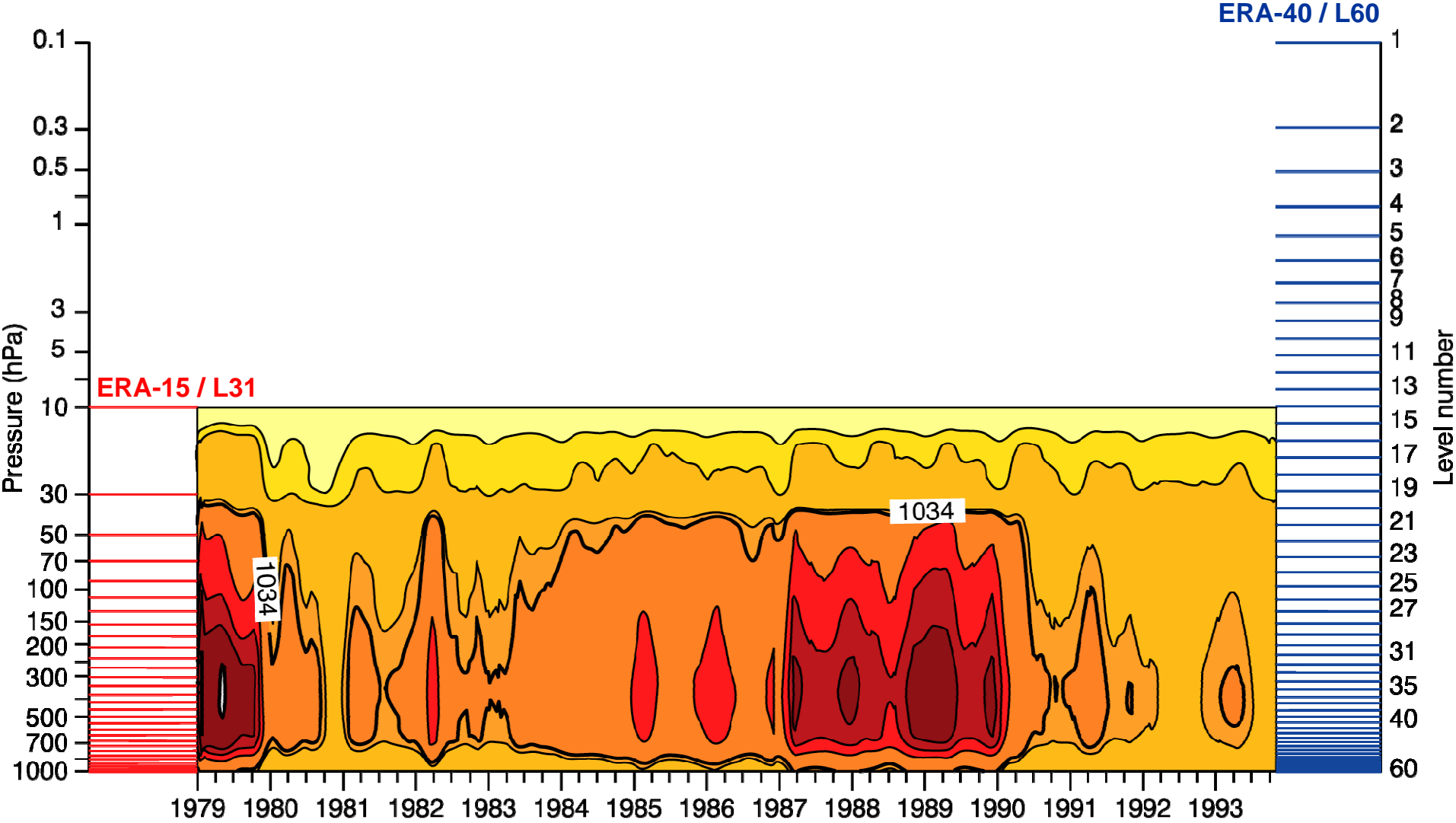


ECMWF Data Coverage (All obs DA) - TEMP  
01/SEP/2007; 12 UTC  
Total number of obs = 587

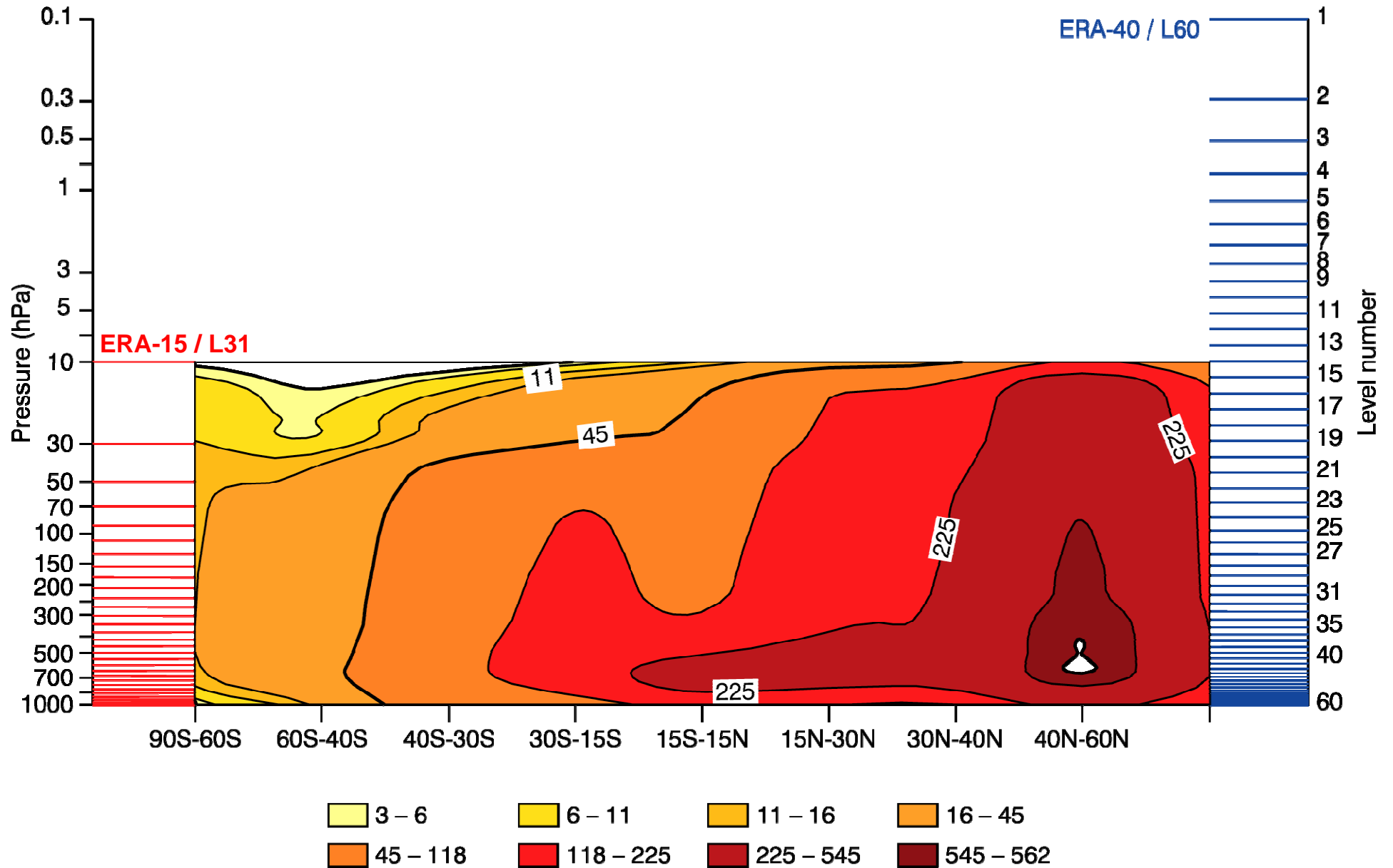




# Daily number of radiosondes in the Northern Hemisphere



# Zonal mean number of radiosondes



# **GARP**

## **THE GLOBAL ATMOSPHERIC RESEARCH PROGRAM (1969)**

### **MAIN OBJECTIVES**

Improved understanding of the physical processes of the general atmospheric circulation

Formulation of improved physico-mathematical models of the atmosphere

Optimum design for a global observing system

Program components: Tropical (GATE), Global, other (MONEX,POLEX,...)

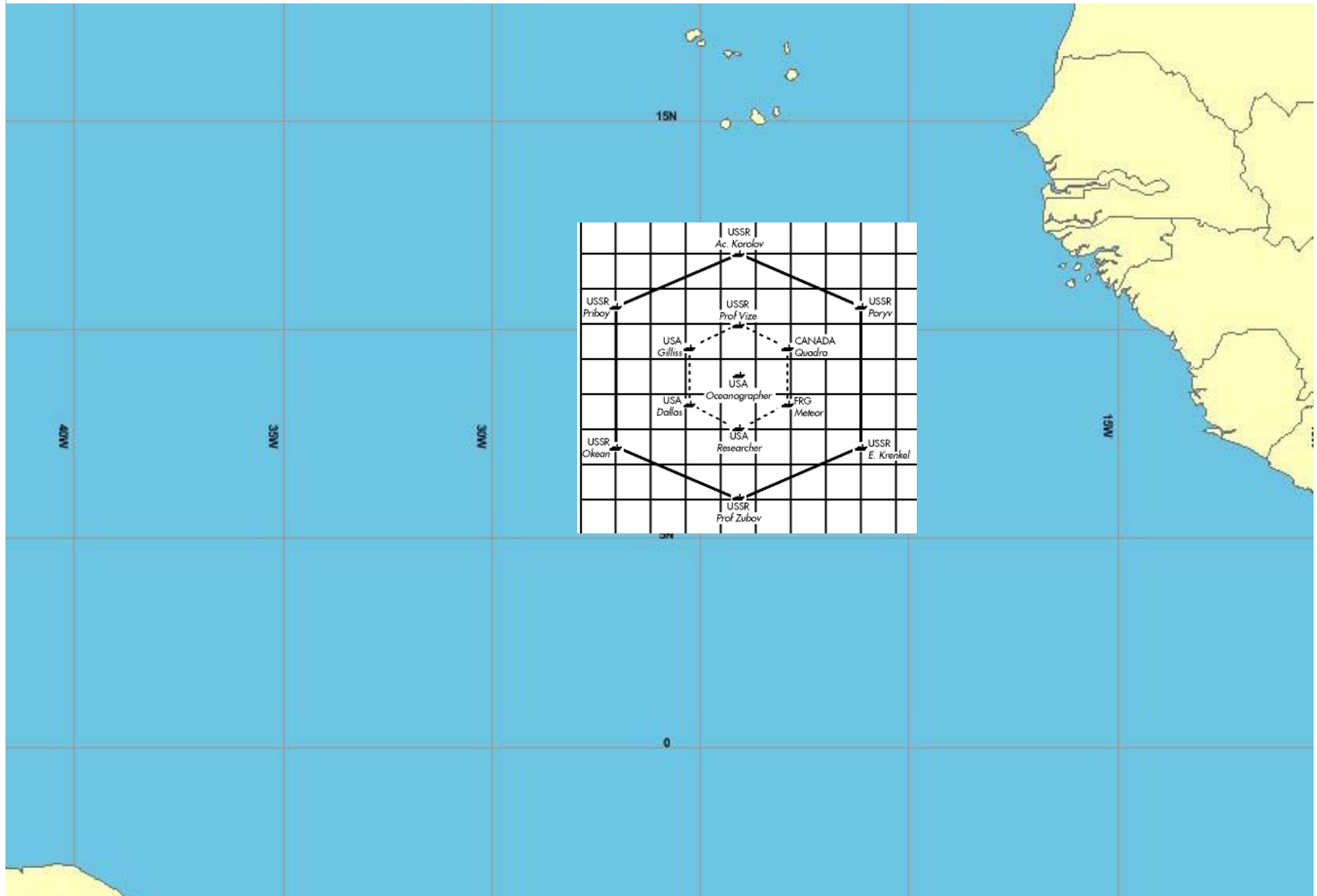
Research projects

Numerical experimentation

Technological developments

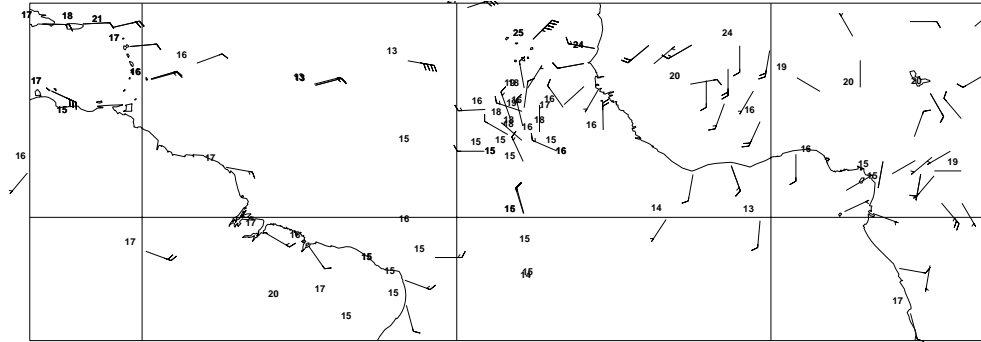
**FIRST GARP GLOBAL EXPERIMENT**  
**FGGE**  
**December 1978 → November 1979**

# GATE EXPERIMENT 15 June → 19 September 1974

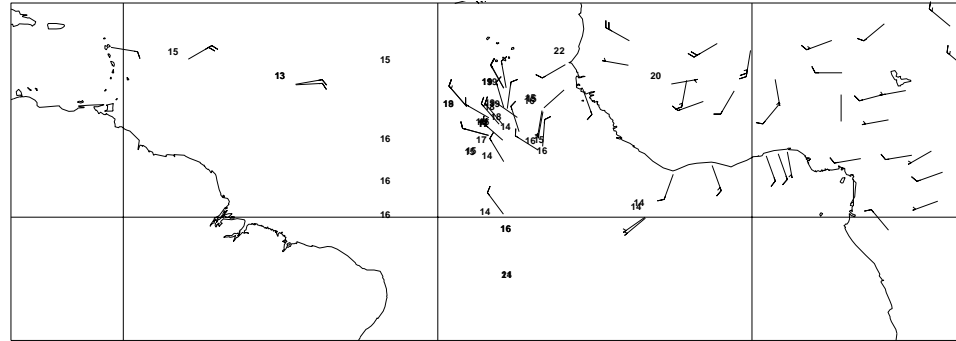


# GATE

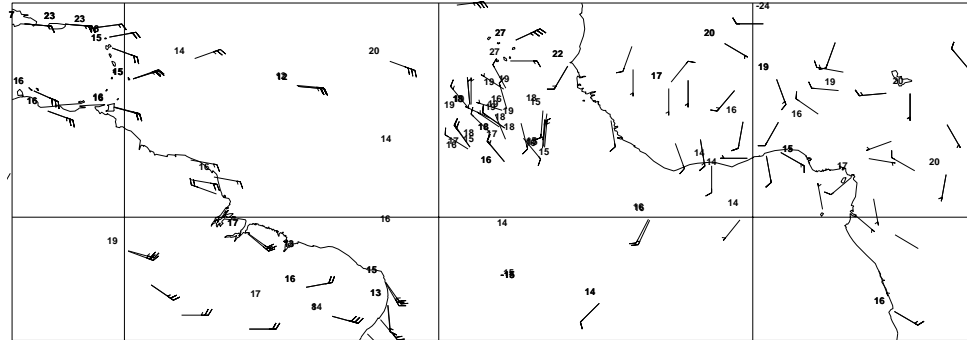
Example day  
19740710  
850 hPa  
Pilot & Temp



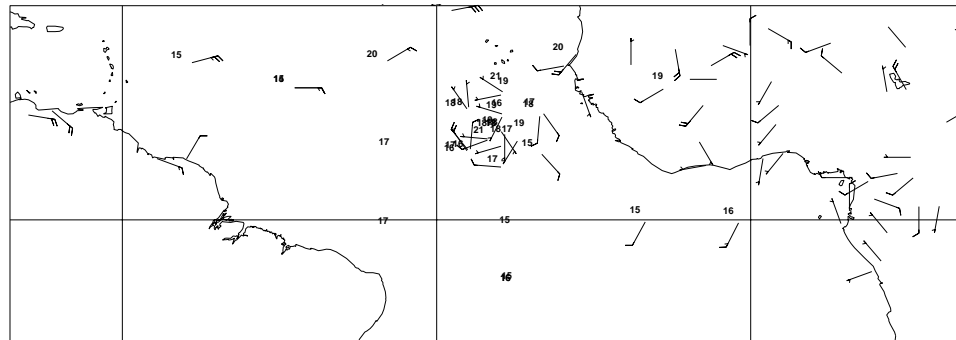
00UTC



06UTC

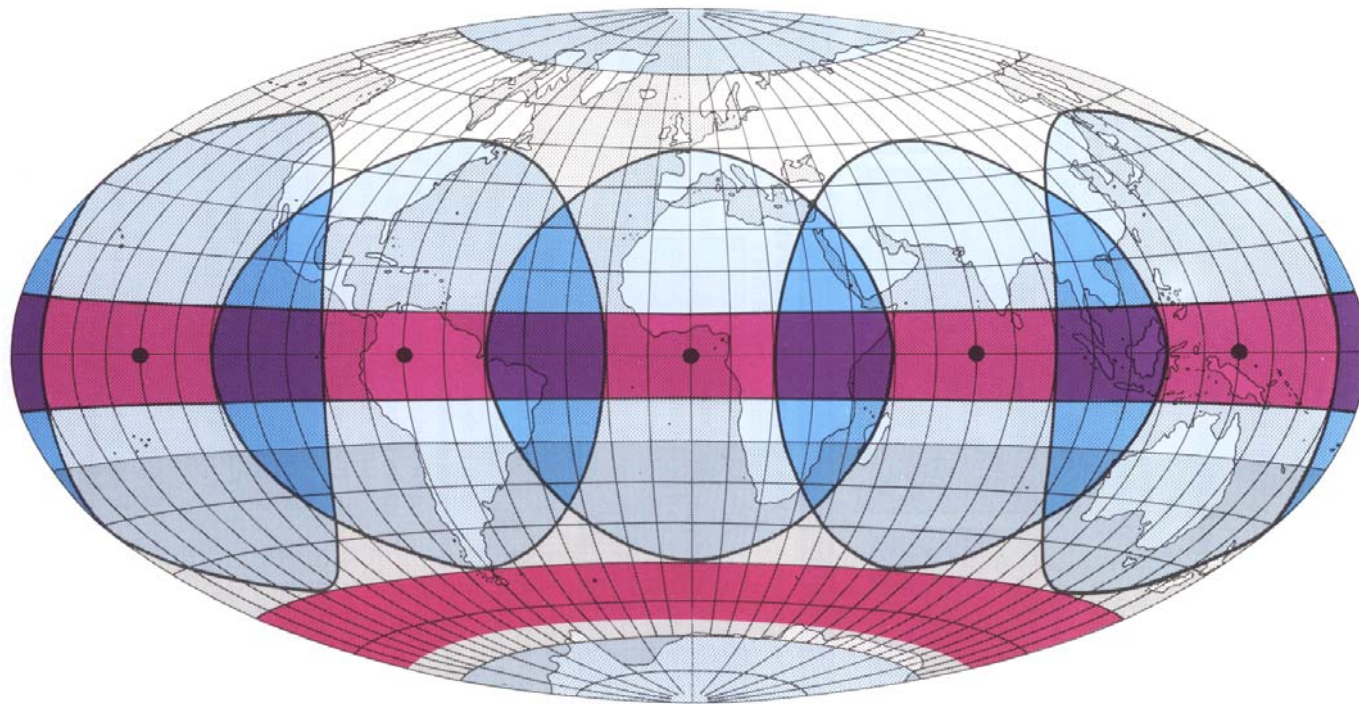


12UTC

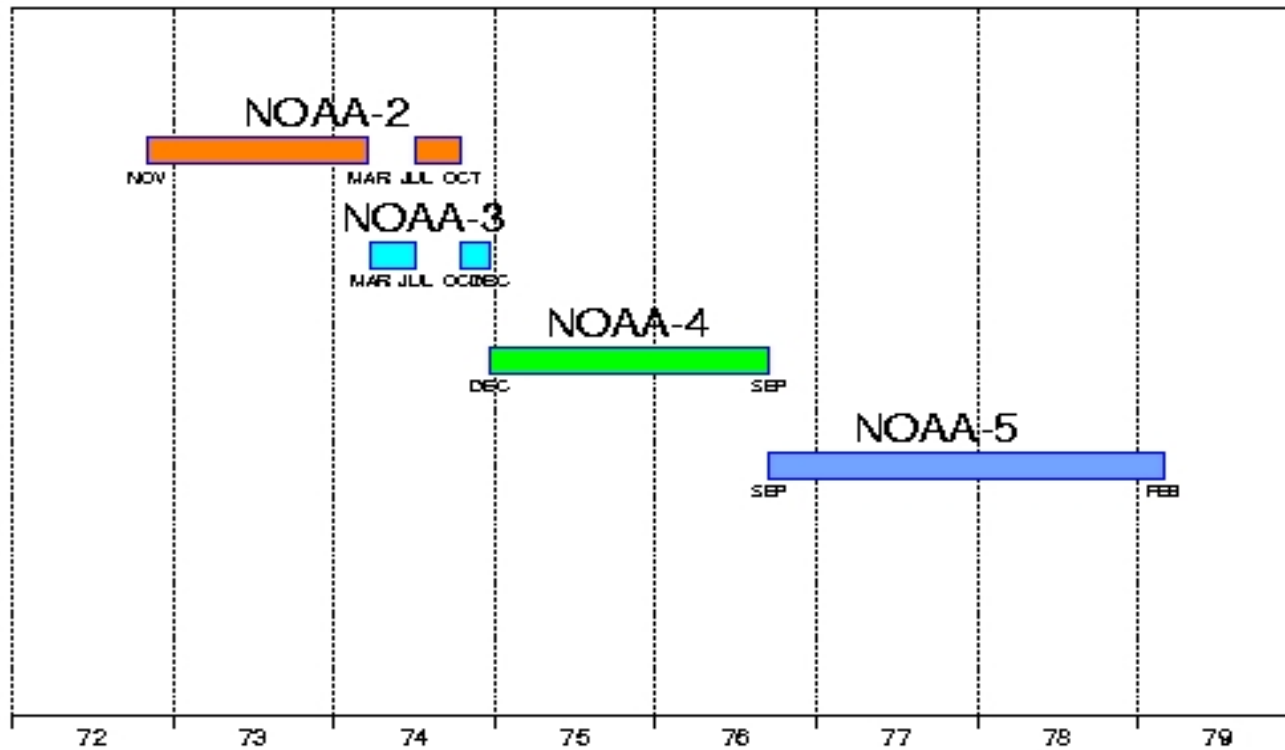


18UTC

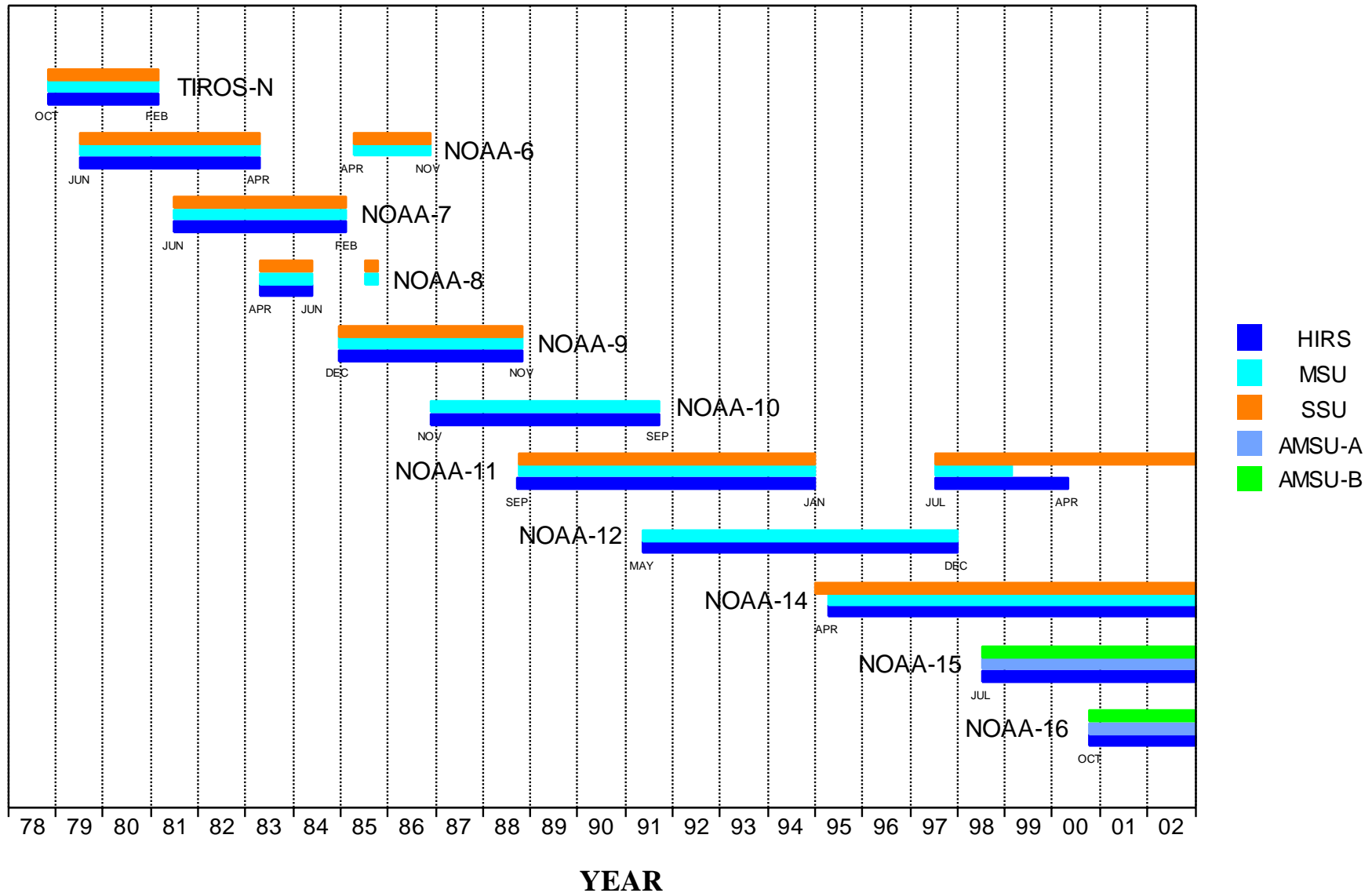
**First Garp Global Experiment  
FGGE 1979  
Definition of the observing system**



# Satellites with VTPR instruments



# TOVS/ATOVS satellite data 1978-2002

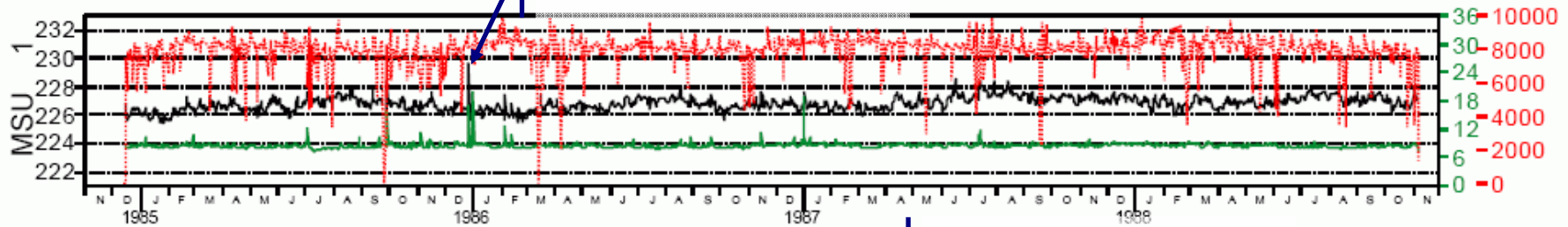




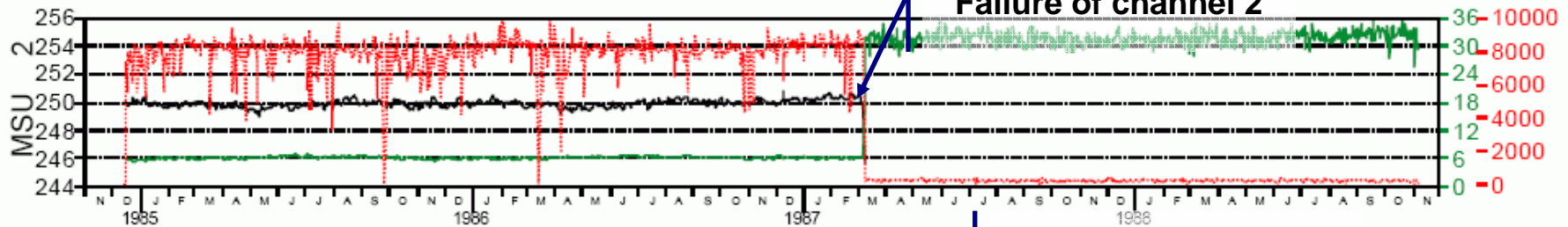
ERA-40 TOVS 1C RADIANCES  
NOAA-9 198411 - 198811  
90 S - 90 N Central scan pos

— MEAN BRIGHTNESS TEMP. (K)  
— STD (K)  
- - - NUMBER OF OBS

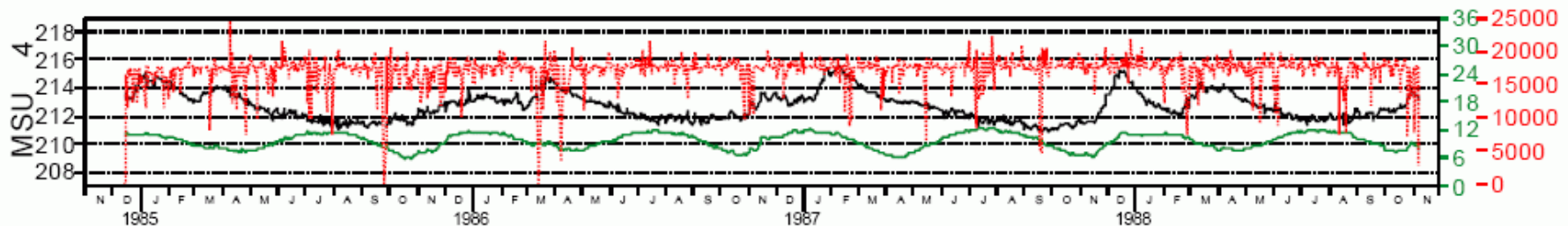
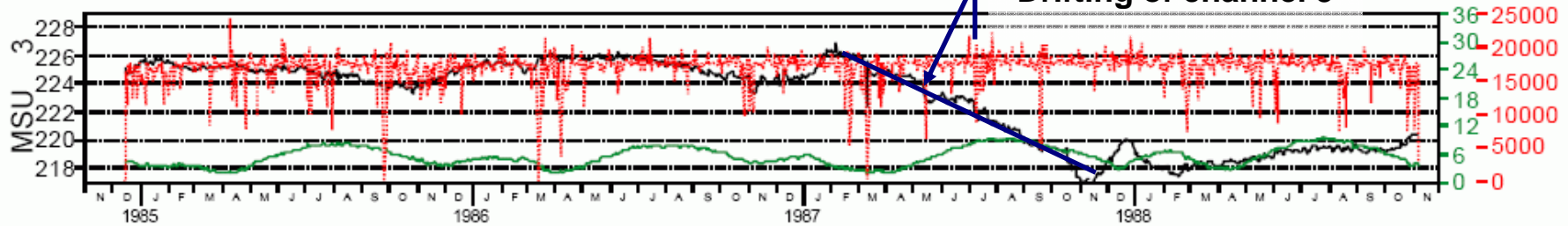
Bad earth location



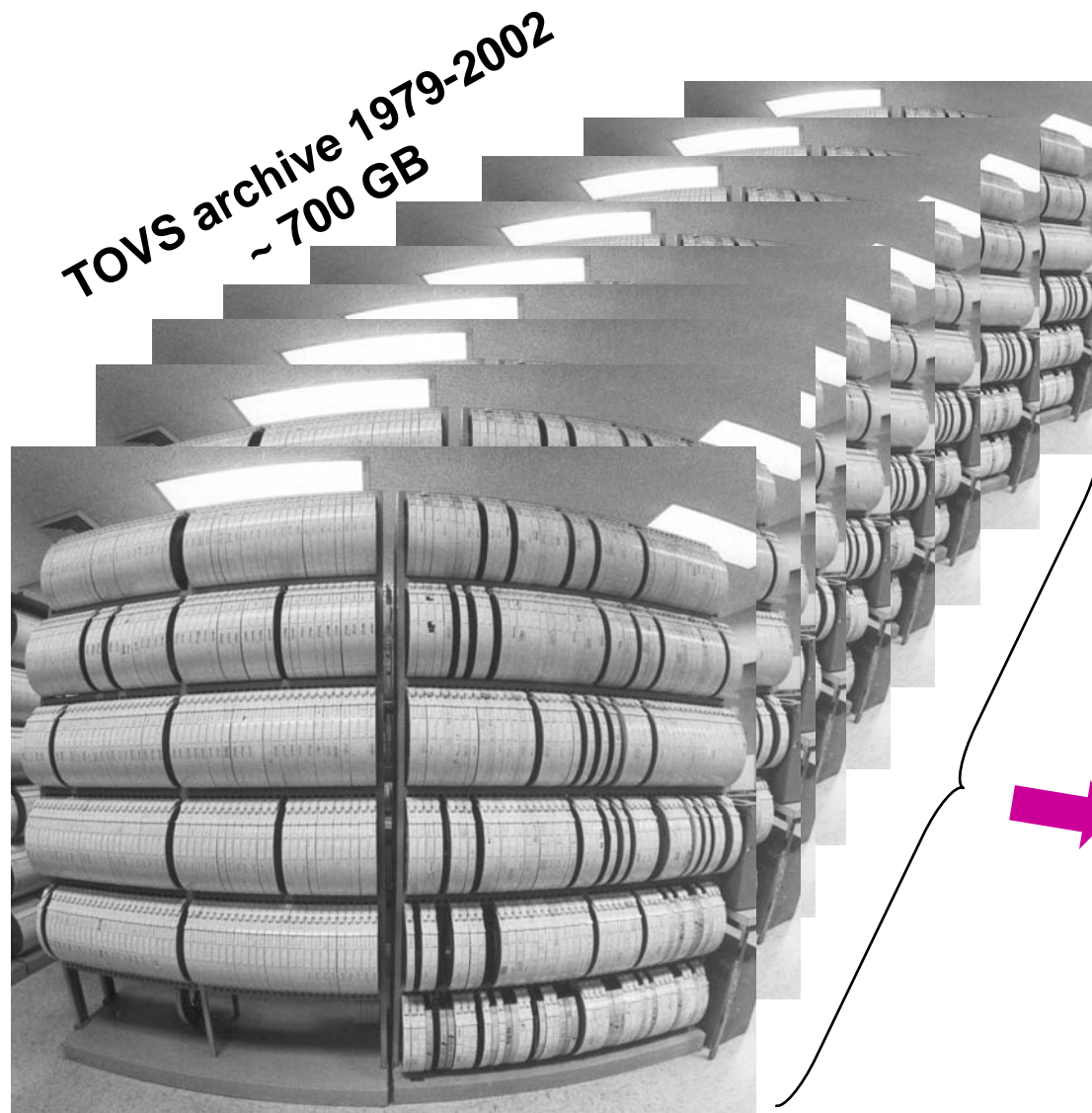
Failure of channel 2



Drifting of channel 3



# Technological advances



**In the past**  
Thousands of tapes/ cartridges

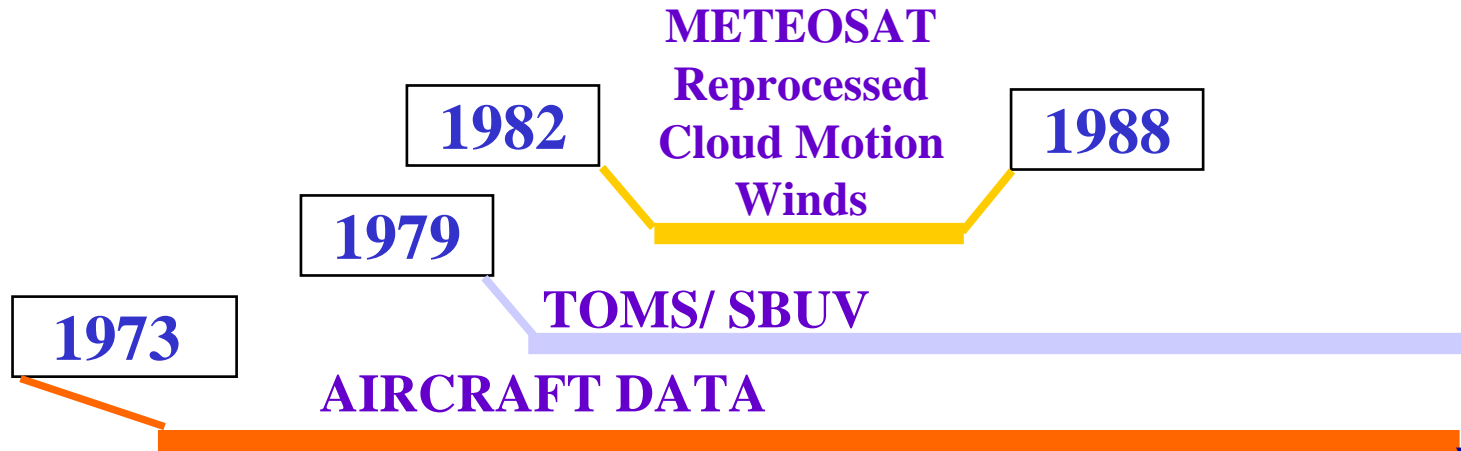
**Today**  
1 Super DLT capacity ~800GB



1957

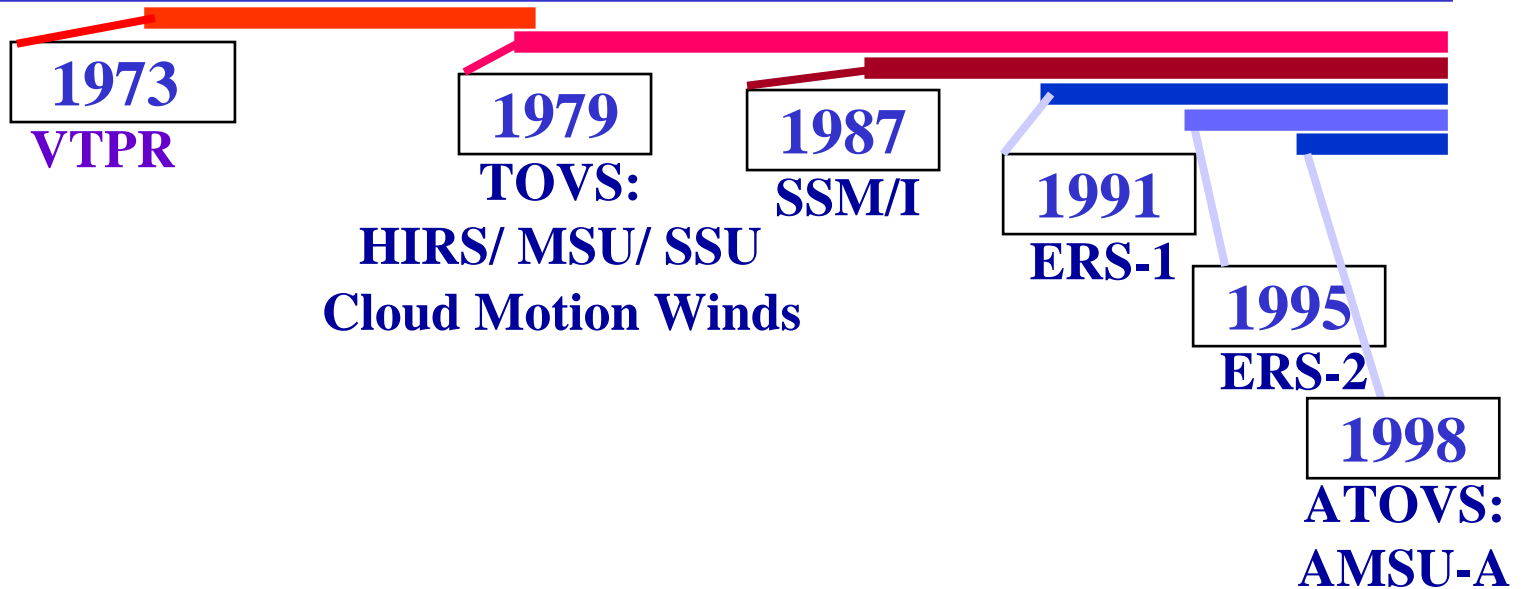
# Observing Systems in ERA-40

2002

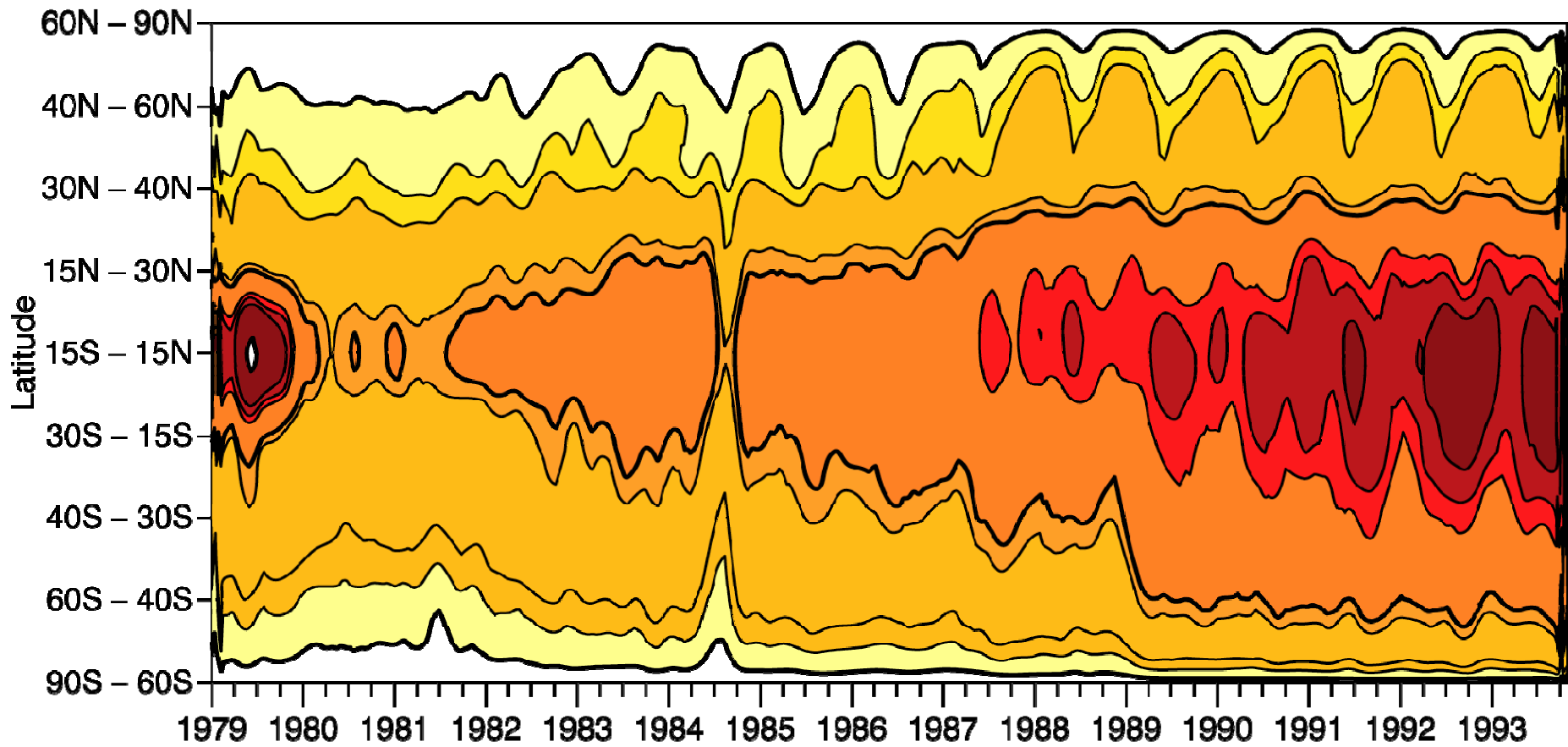


## CONVENTIONAL SURFACE AND UPPERAIR OBSERVATIONS

NCAR/ NCEP, ECMWF, JMA, US Navy, Twerle, GATE, FGGE, TOGA, TAO, COADS, ...



### Number of used SATOB data – 850 hPa V-COMP

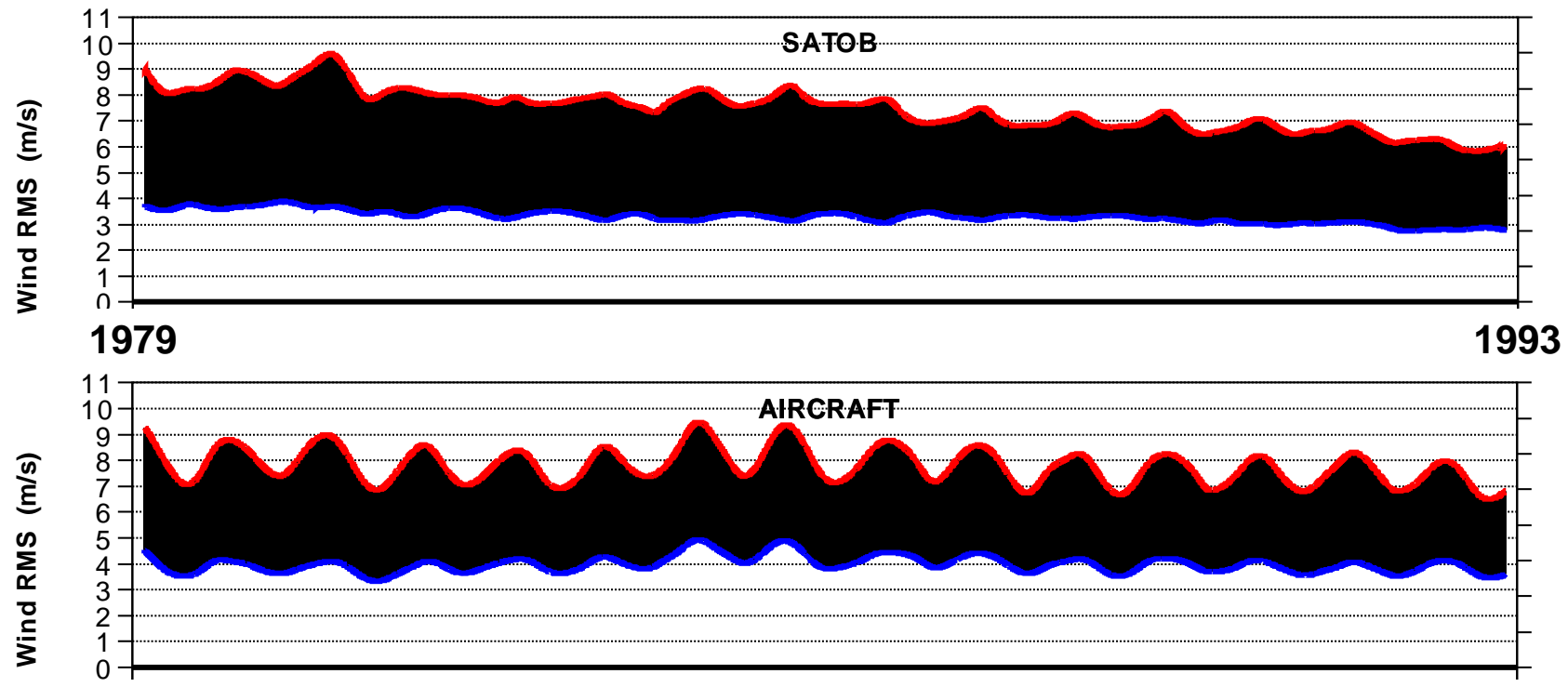


1 Jan 1979 – 31 Oct 1993: 00+06+12+18 UTC data, Ver = 1

# Quality of Cloud Motion Winds improves

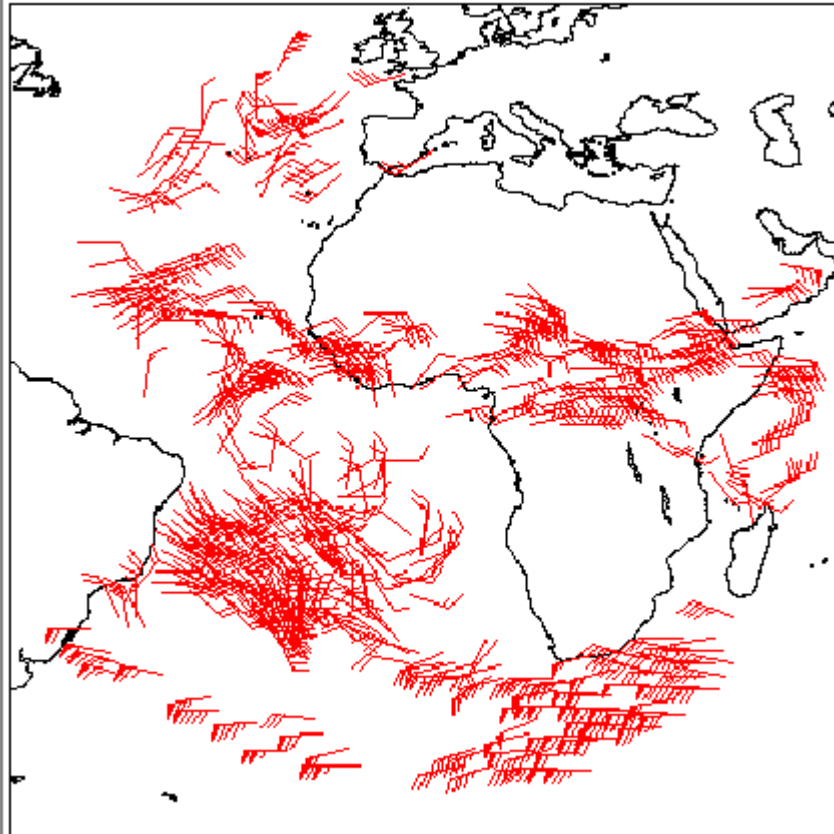
Moving average of daily  $\text{Sqrt}(U_{\text{rms}}^2 + V_{\text{rms}}^2)$

Latitude band 30N-15N (OB-AN, OB-FG) levels 300-200 hPa

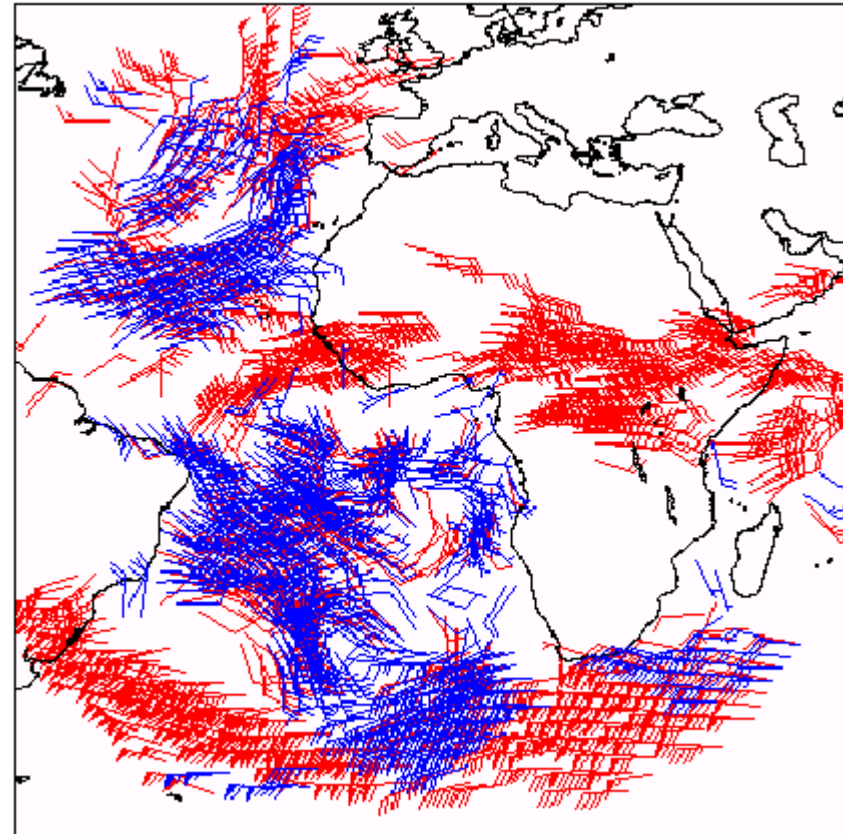


# METEOSAT Reprocessed Winds

a) Old operational IR data



b) Reprocessed ELW data, IR and VIS



# Sea Surface Temperature and Ice data

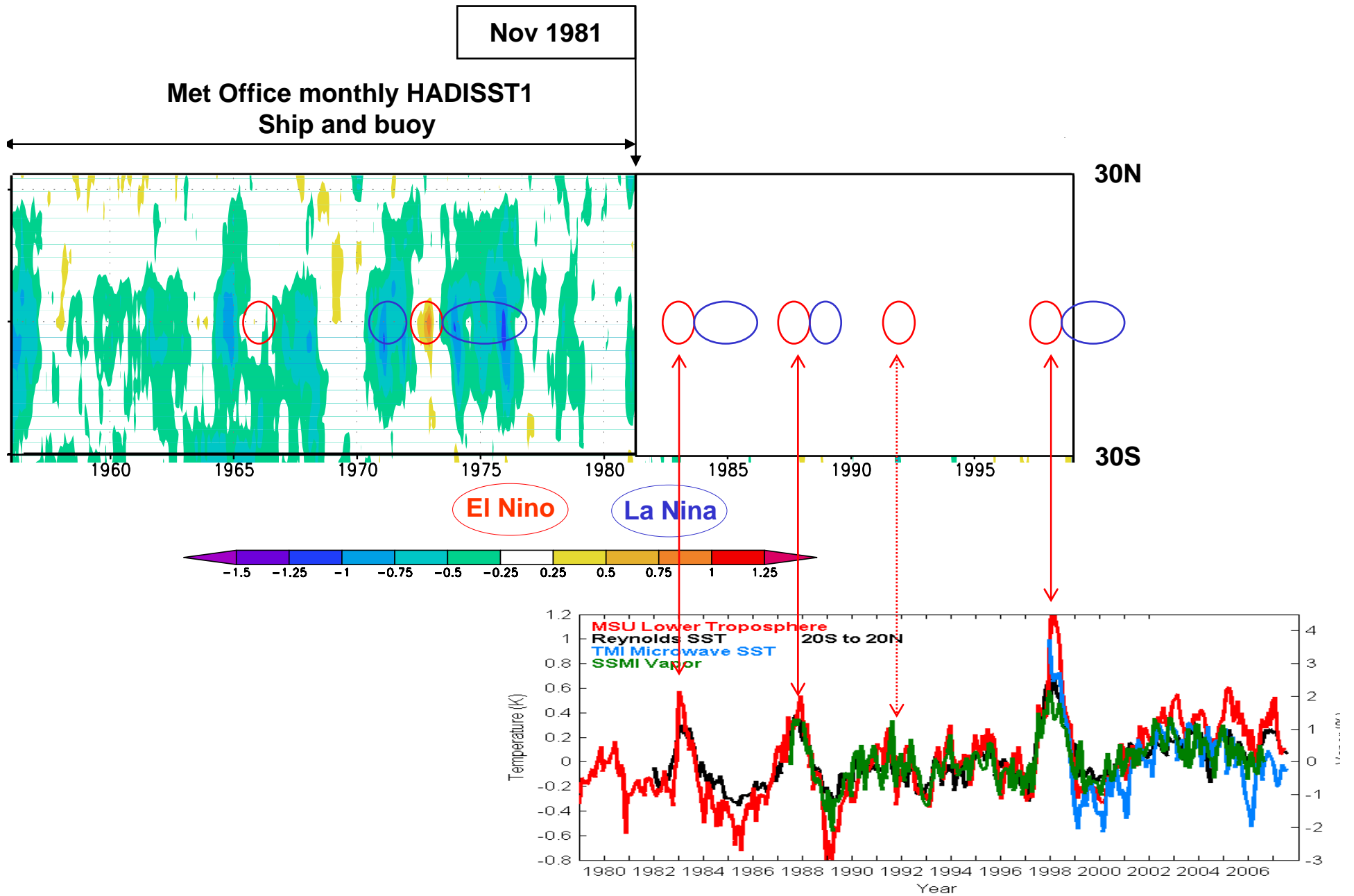
## **Before November 1981 (HADISST1, Met Office)**

- Monthly SST analysis based on ship and buoy measurements
- Sea ice extent has large uncertainty

## **From November 1981**

- Retrievals of SST from Advanced Very High Resolution Radiometer after cloud clearing
- Buoy and ship data
- OI or 2D-Var weekly SST analysis (R. Reynolds, NCEP)
- Background is the previous SST analysis
- Bias correction applied to satellite SSTs
- Sea ice extent determined from ice concentrations retrieved from SSMR and SSMI instruments

## **Interpolation to daily values**



(F. Wentz, Remote Sensing Systems)



# ECMWF reanalyses

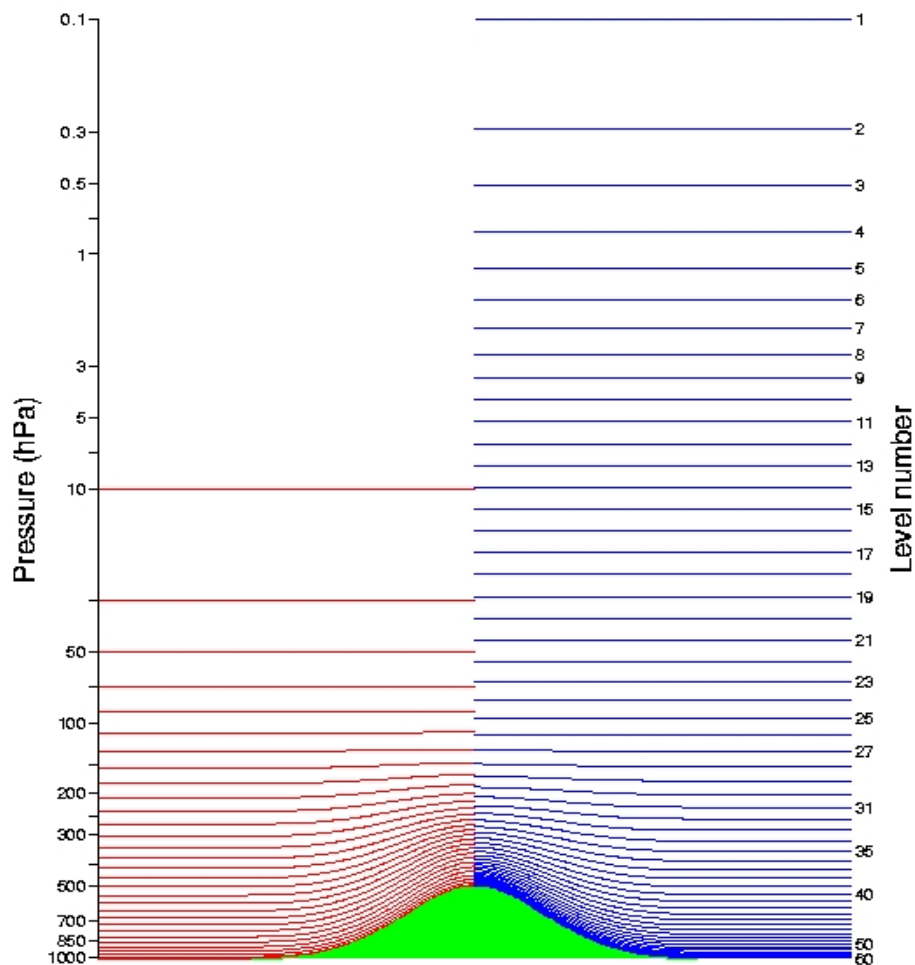
ERA-40 1957-2002

ERA-15 1979-1993

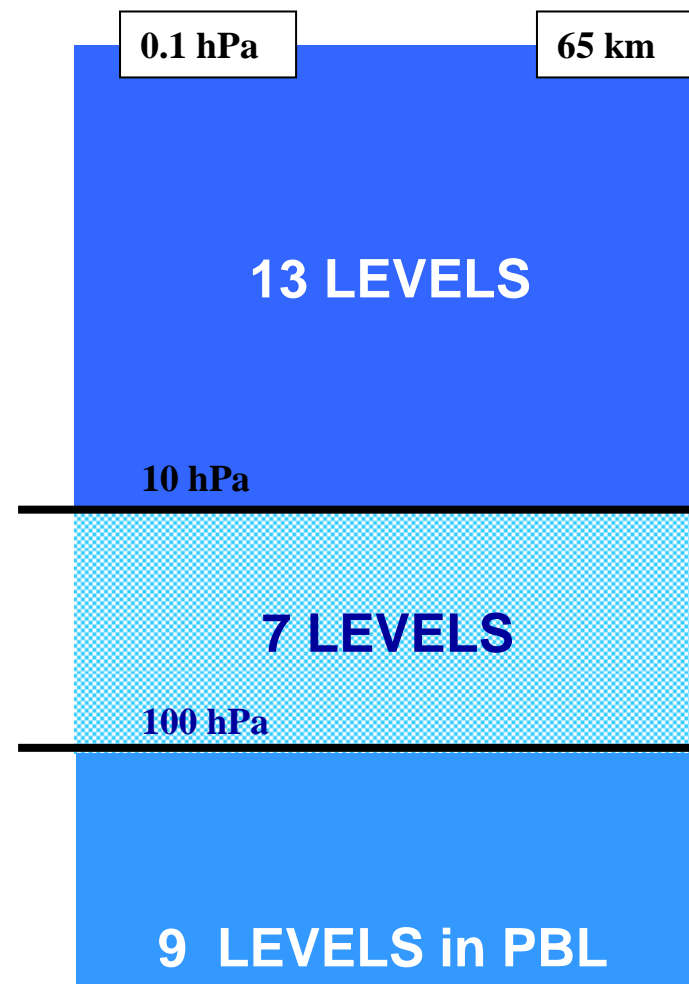
- Improved data assimilation system
  - Assimilating model T159L60
  - Optimum Interpolation → 3D-Var FGAT
  - Analysis of O<sub>3</sub>
- More extensive use satellite radiances (from CCR → Level 1c radiances)
- ERA-15 experience → ERA-40 blacklist
- More comprehensive use of conventional observations
- Use of Meteosat reprocessed winds, CSR data passive
- Improved SST & ICE dataset
- Ocean wave height analysis

# Model levels

**ERA-15/ L31**   **ERA-40/ L60**



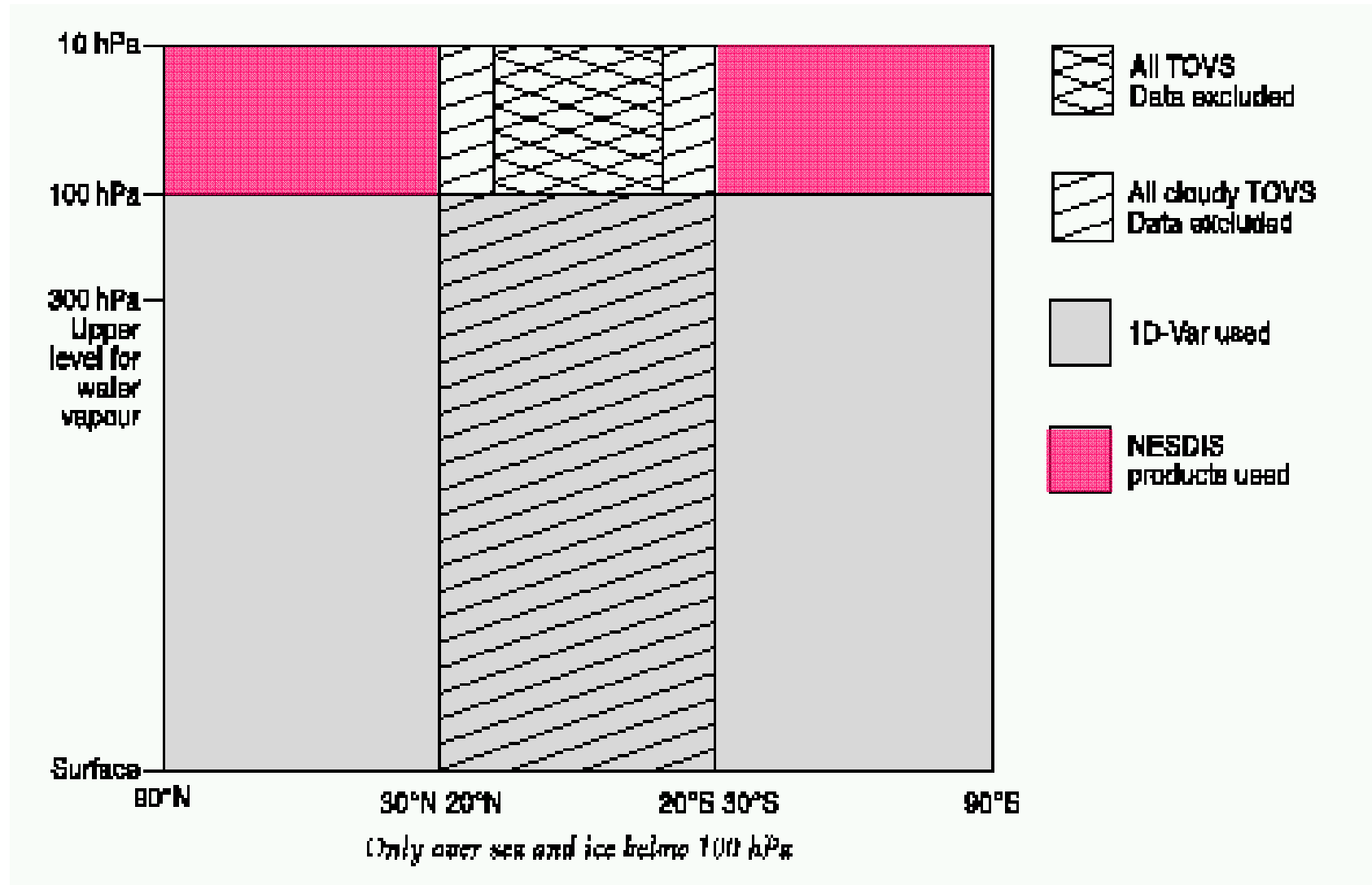
## Levels added



# Use of atmospheric satellite data in reanalyses

	VTPR/ TOVS/ ATOVS					DMSp	GEO
	SSU	VTPR	HIRS	MSU	AMSU	SSM/I	
<b>NCEP</b> 1948 →	NESDIS operational T & q retrievals					-	Oper AMWs
<b>ERA-15</b> 1979-1993	-	-	1D-Var retrievals of T & q using CCR. Above 100hPa NESDIS retrievals.	-	-	Oper AMWs	
<b>ERA-40</b> 1957-2002	1c	1c	1c	1c	1c	1D-Var retrievals of TCWV & wind speed	Oper+reprocessed AMWs, CSR passively
<b>JRA-25</b> 1979 →	1c	-	1c	1c	1c	JMA retrievals of TCWV	Oper+reprocessed AMWs
<b>ERA-Interim</b> 1989 →	1c	-	1c	1c	1c	1c radiances and 1D-Var retrievals of rainy radiances	Oper+reprocessed AMWs, CSR passively

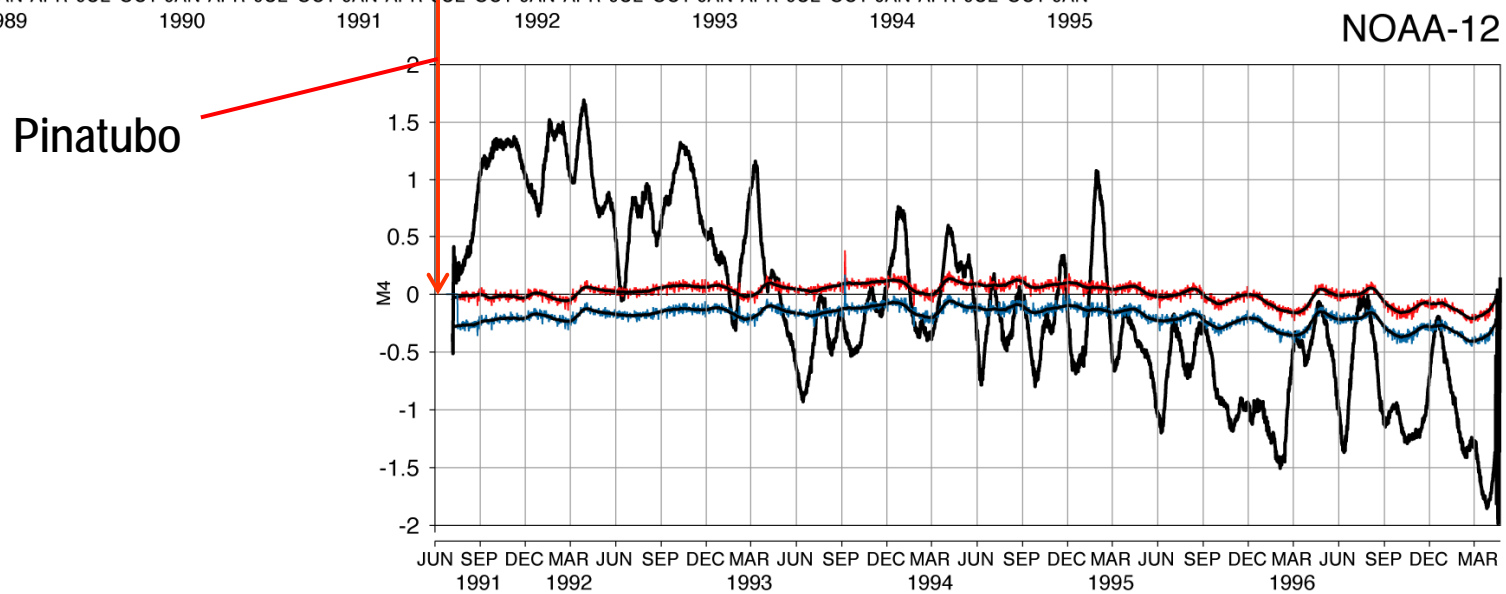
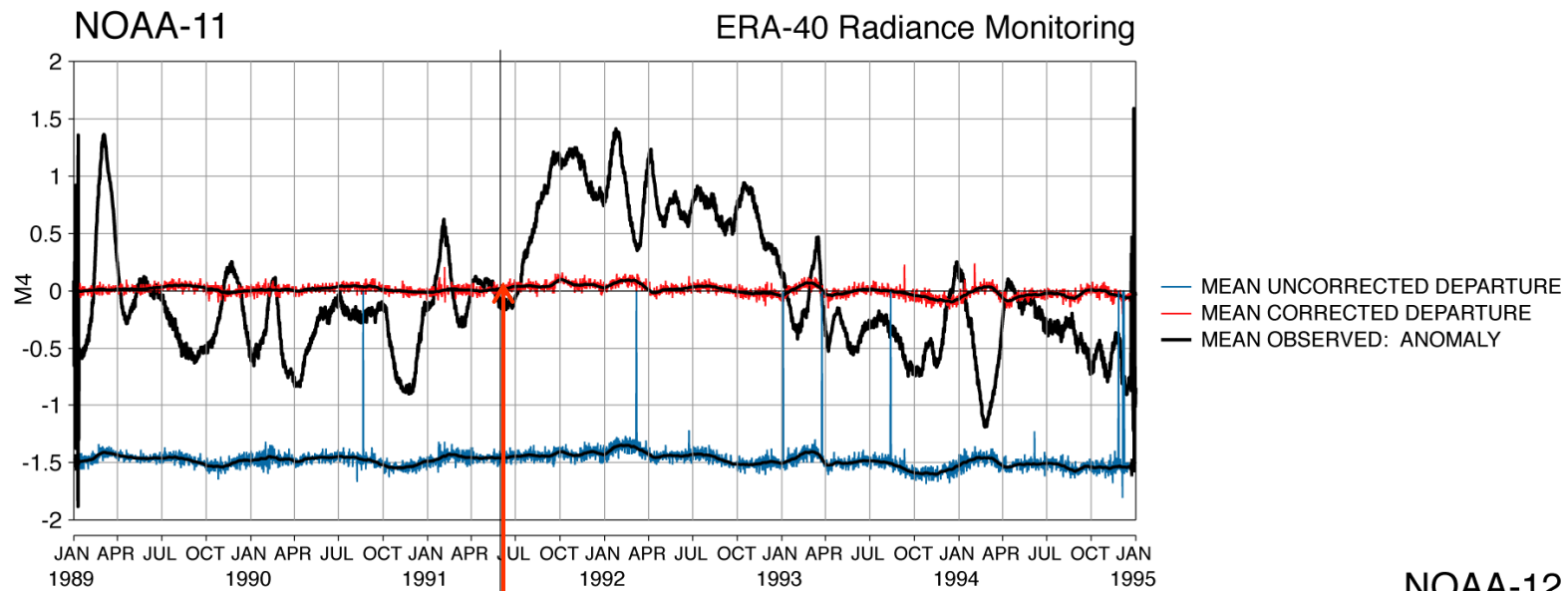
# Use of TOVS data in ERA-15



# Handling of biases in ERA-40

- Radiosonde temperature biases 1980 onwards
- VTPR, TOVS, SSMI and ATOVS radiances
- ERS scatterometer wind bias correction

	ERA-15	ERA-40	
	TOVS	VTPR/ TOVS/ ATOVS	SSMI
Input radiance	Cloud Cleared and nadir corrected Radiances	Level-1c calibrated at ECMWF from Level-1b	Level-1c data from RSS & ECMWF. Satellite to satellite calibration with reference to the 1st satellite, F. Wentz
Method	Static J. Eyre based on W. Smith & H. Woolf	Static B. Harris & G. Kelly	Static B. Harris & G. Kelly
Scan bias	Global offset with 0 at center	18 latitude bands	18 latitude bands
Air-mass dependent bias	Predictors: MSU-2,3 and 4, which are unaffected by clouds	Predictors: Model values , DZ(1000-300), DZ(200-50), Tskin and TCWV	Predictors: Model values ,10 m wind speed, Tskin and TCWV
Update frequency	monthly	Once per satellite life time or after a jump in instrument based on about two week statistics	Once per satellite life time or after a jump in instrument



# ERA-15 Tropical temperature

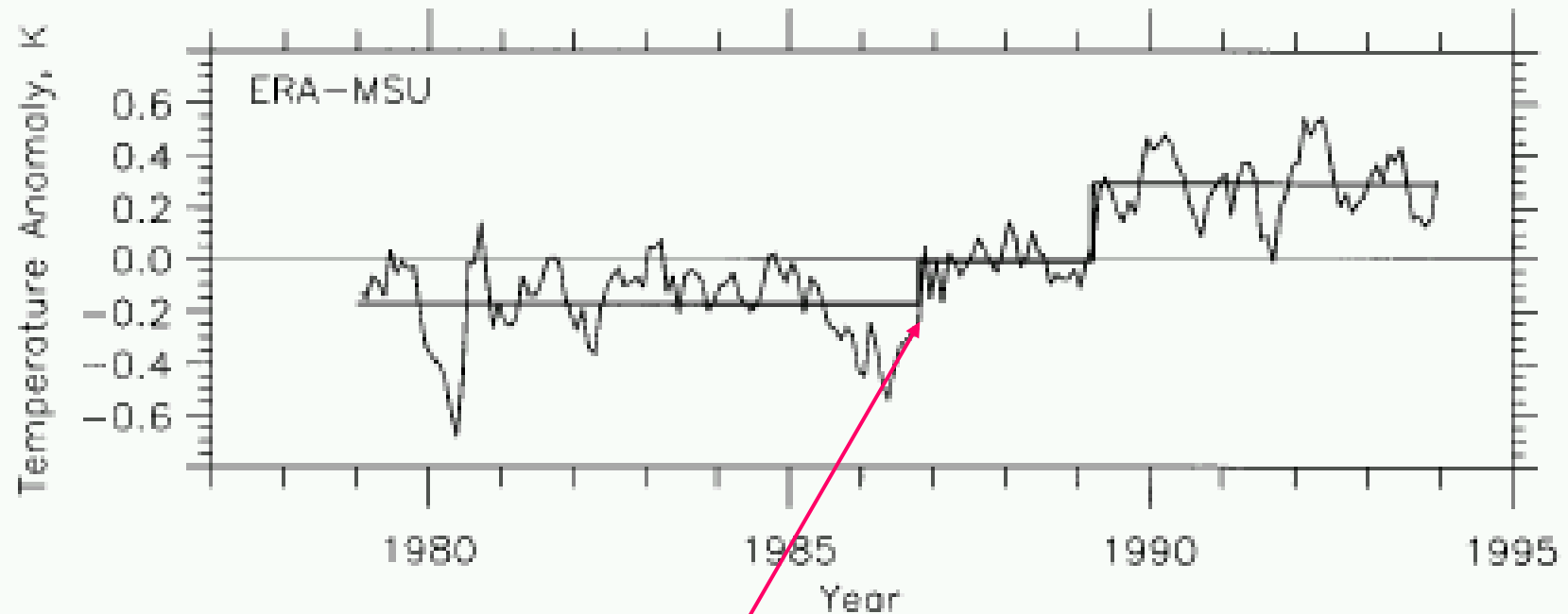


FIG. 3. Difference in time series of the monthly mean tropical (20°N to 20°S) 2LT temperatures from MSU and ERA-15, as ERA-MSU. A straight line fit has been added to the series to show the two discontinuities.

**Trenberth et al. (2000)**

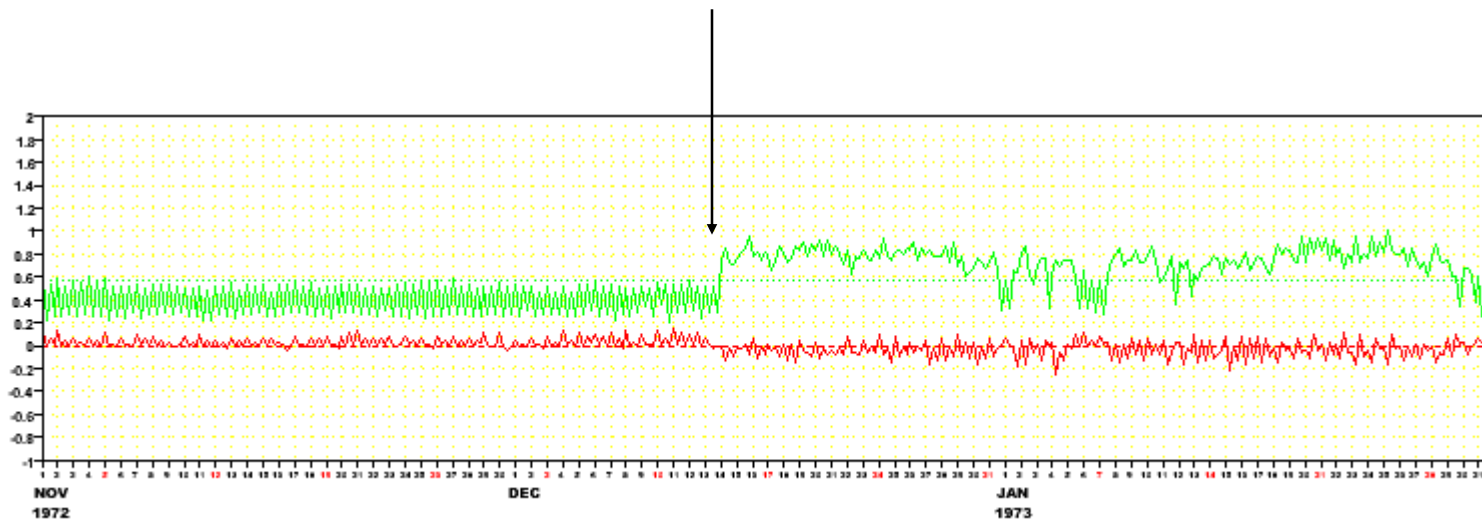
**NOAA-9 MSU-3 problem  
November 1986**



# **Quality of Analysis & Background**

# Global 500 hPa Temperature analysis **mean increment** and **STD**

**VTPR introduced**

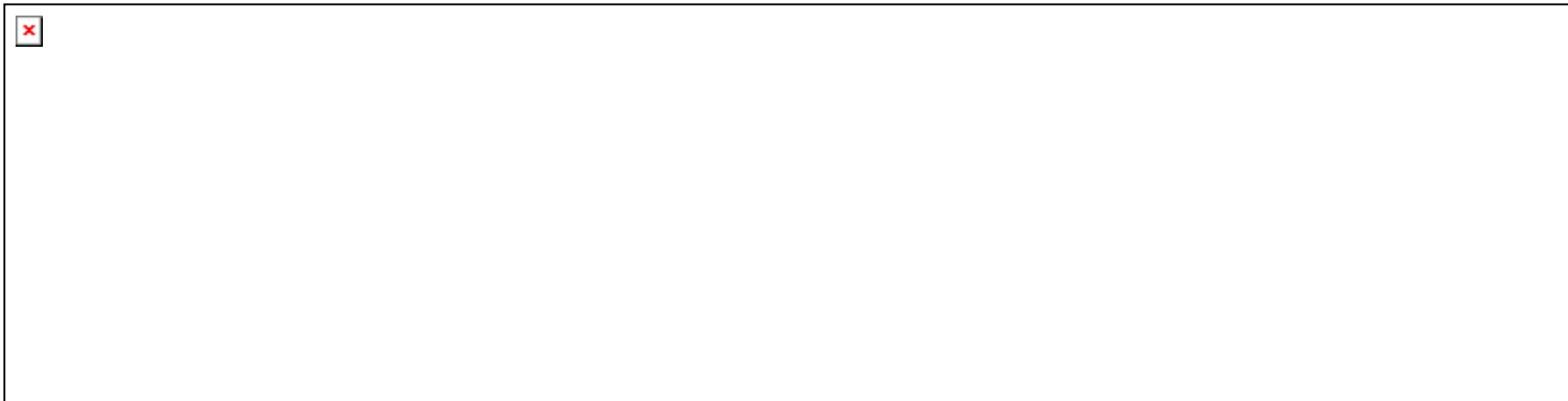


## Tropical TCWV analysis **mean increment** and **STD**

VTPR

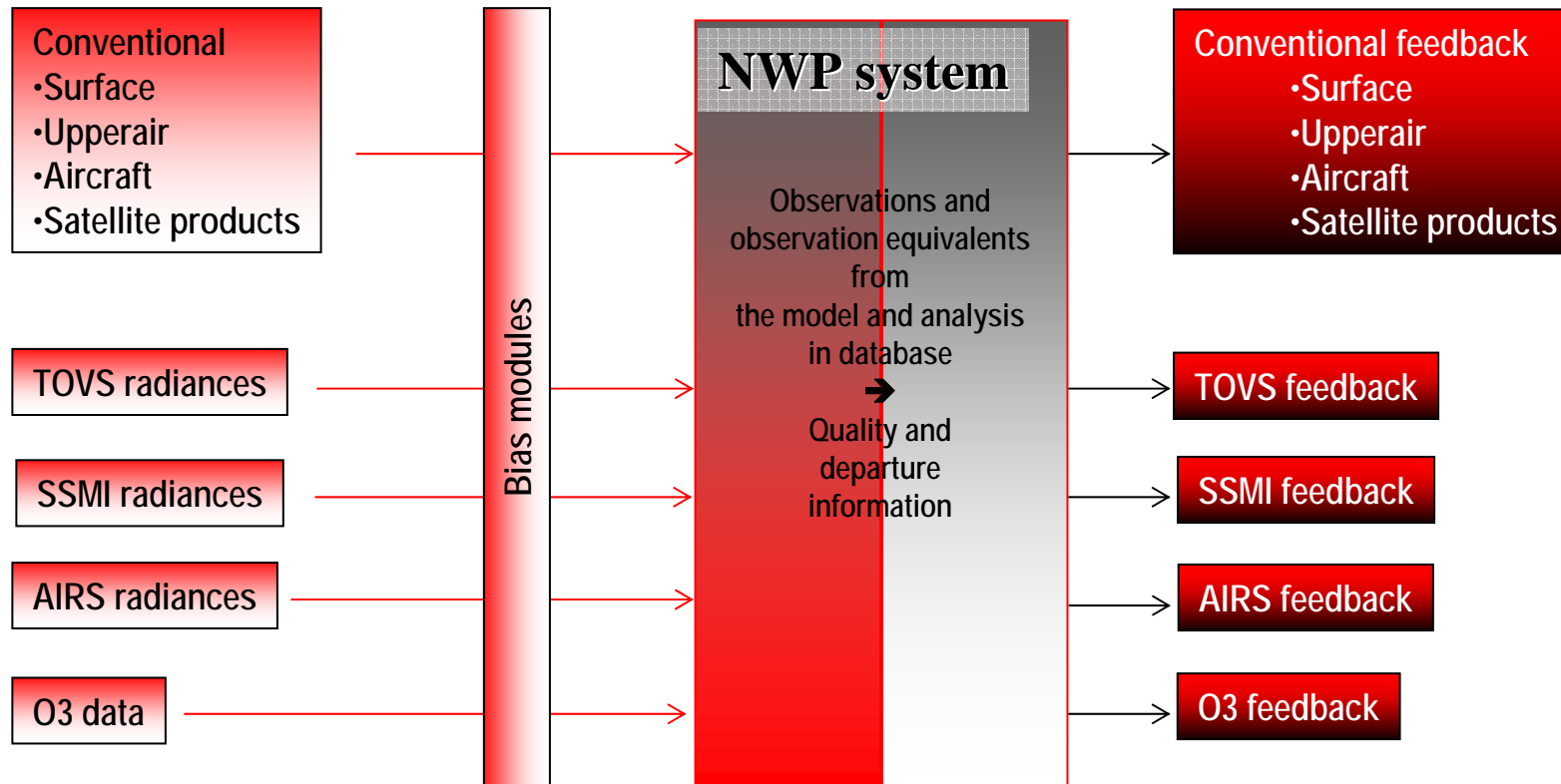


## Tropical mean TCWV (kgm<sup>-2</sup>) **background** and **analysis**

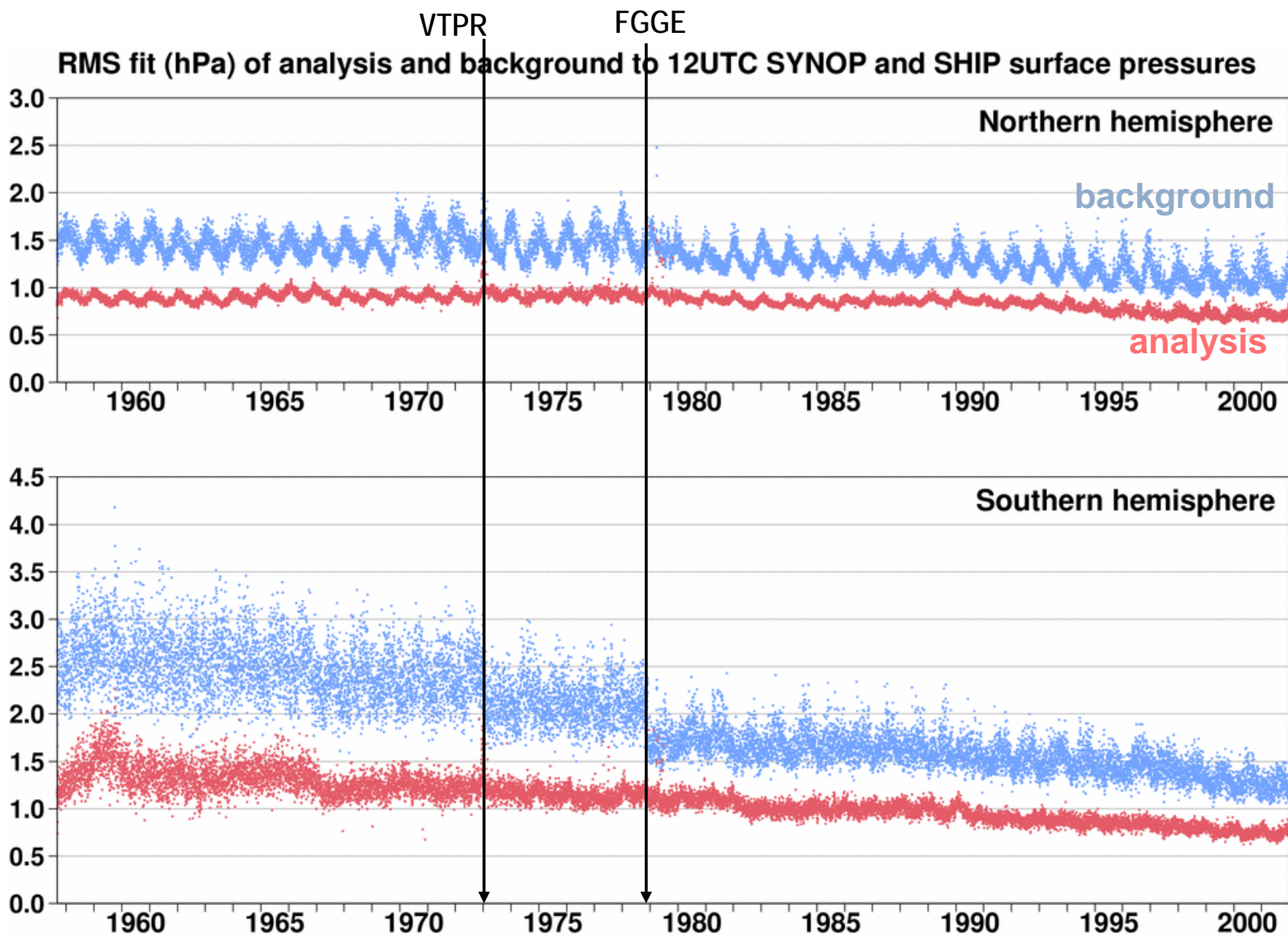


## Input observations

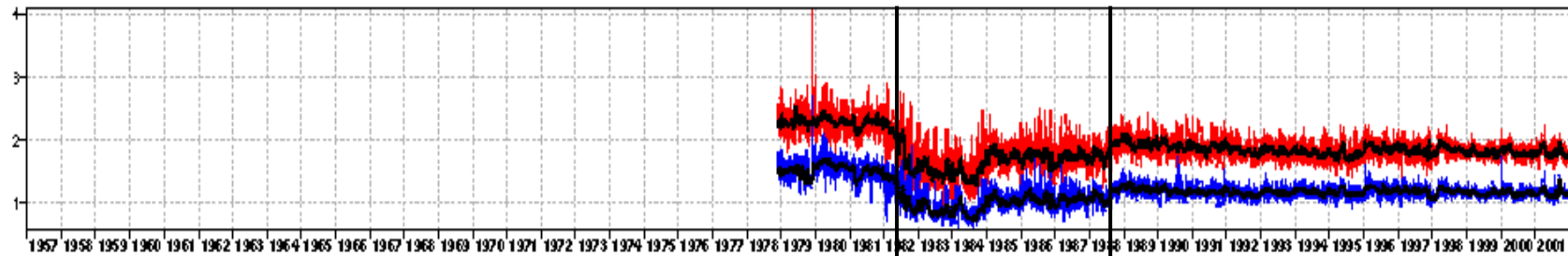
## How the observations were used in the analysis (feedback)



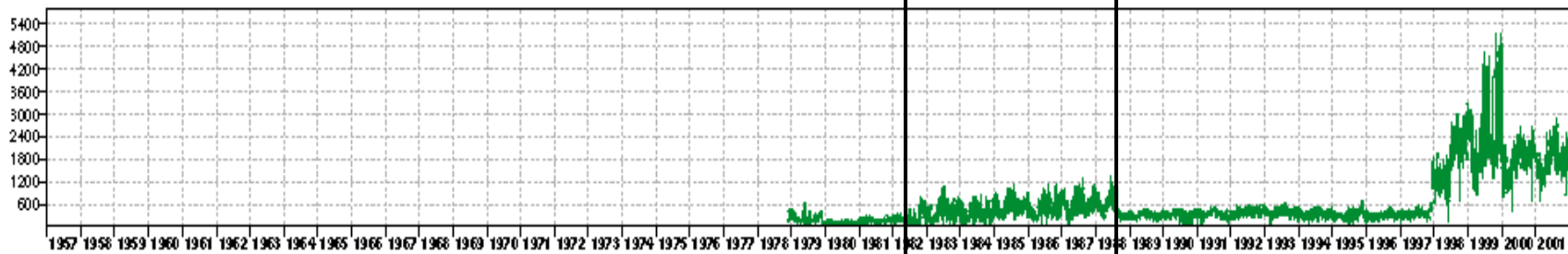
- Input and feedback observations in BUFR code as well as as the runtime database, ODB, through the period)



ERA-40: SATOB U- Wind 850 00 UTC Tropics RMS (m/s) **OB-FG** **OB-AN** 15 days MA

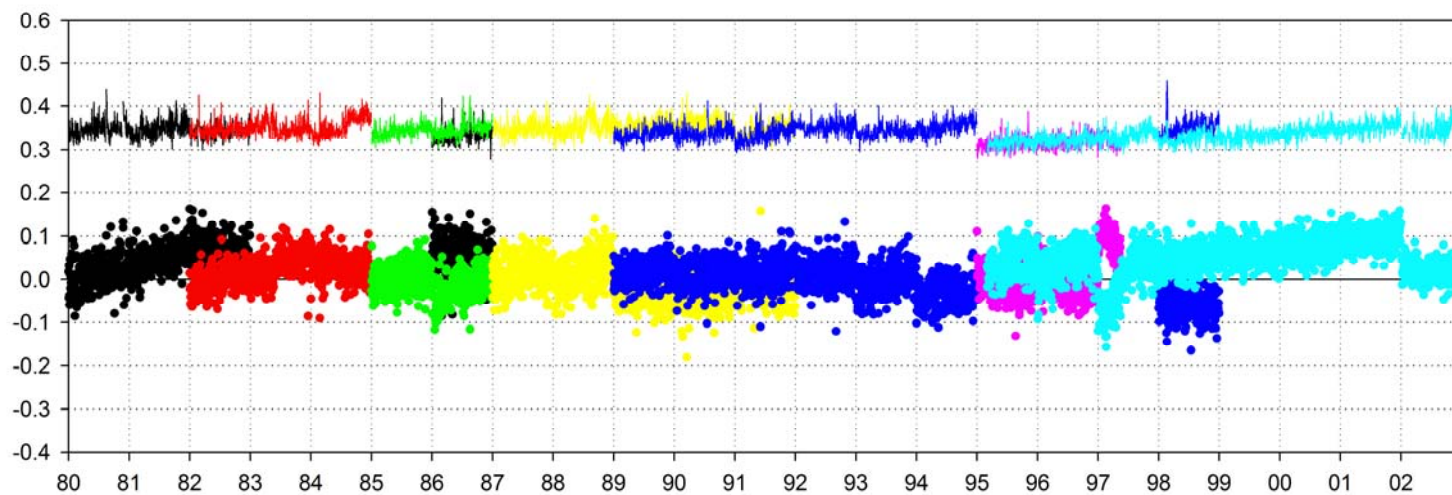


Number of used observations per day



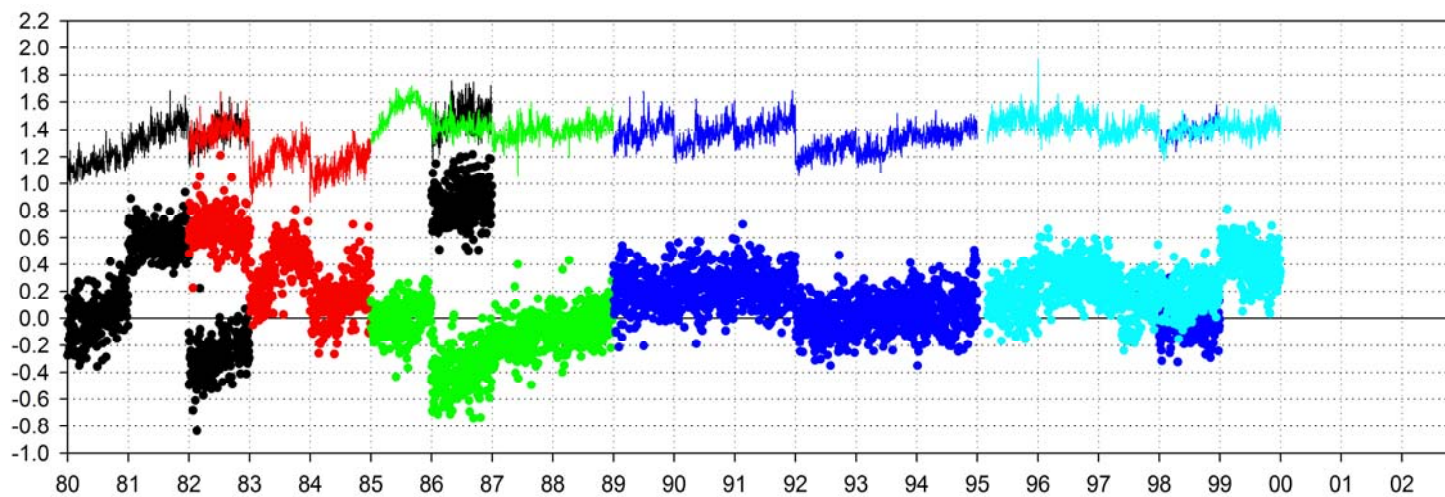
**Meteosat  
Reprocessed winds**

Global OB-BG STD/ mean MSU-Ch 4 Max energy 90 hPa



- NOAA-6
- NOAA-7
- NOAA-9
- NOAA-10
- NOAA-11
- NOAA-12
- NOAA-14

Global OB-BG STD/ mean SSU-Ch 3 Max energy 1.5 hPa

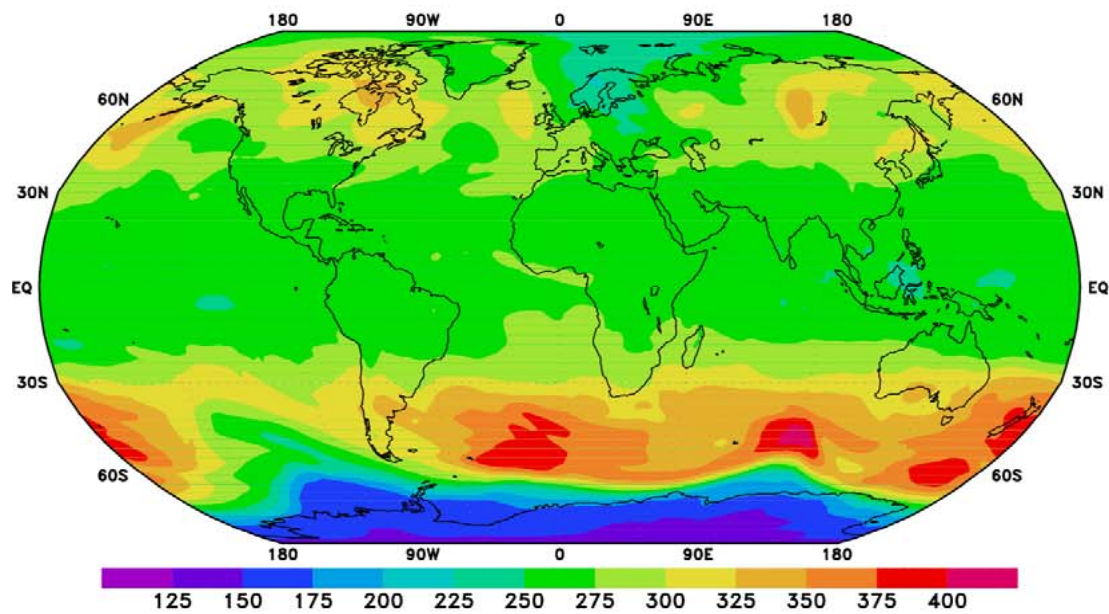


# **Analysis of ozone**

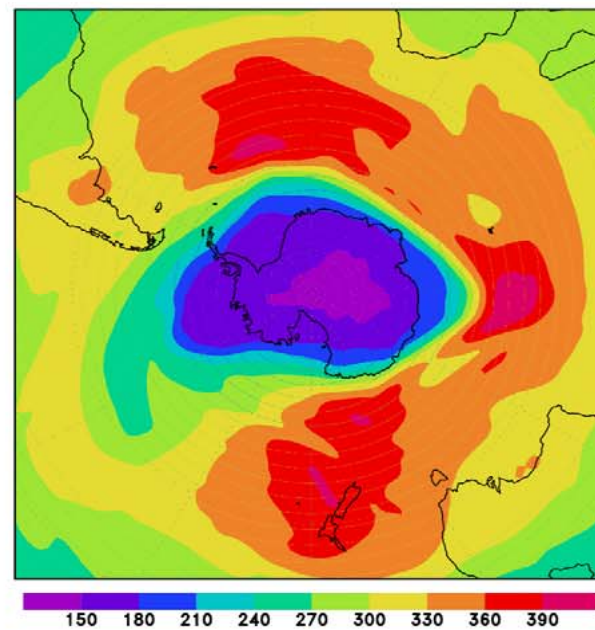
**The three-dimensional ozone field is consistent both with available ozone observations and the dynamical state of the atmosphere**



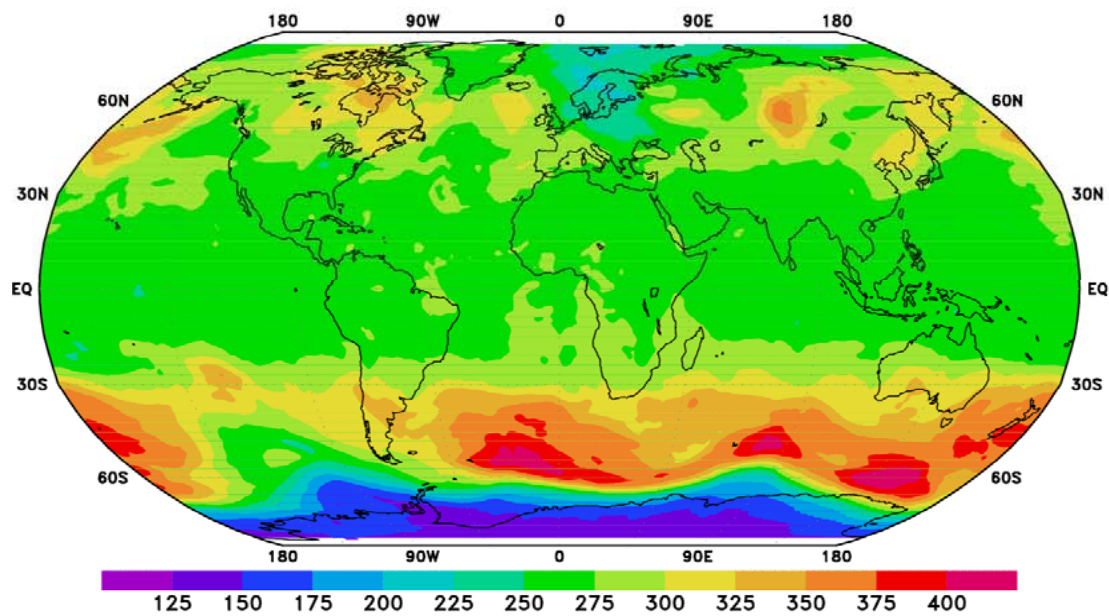
Total ozone [DU] ERA-40 1993092512



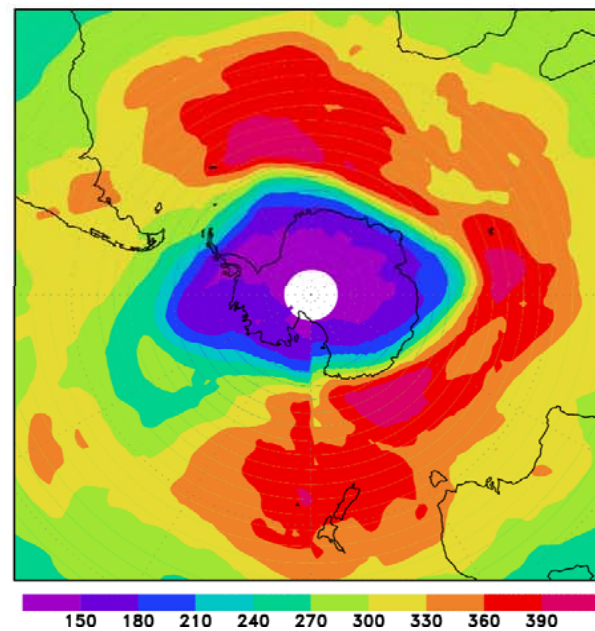
ERA-40 1993092512



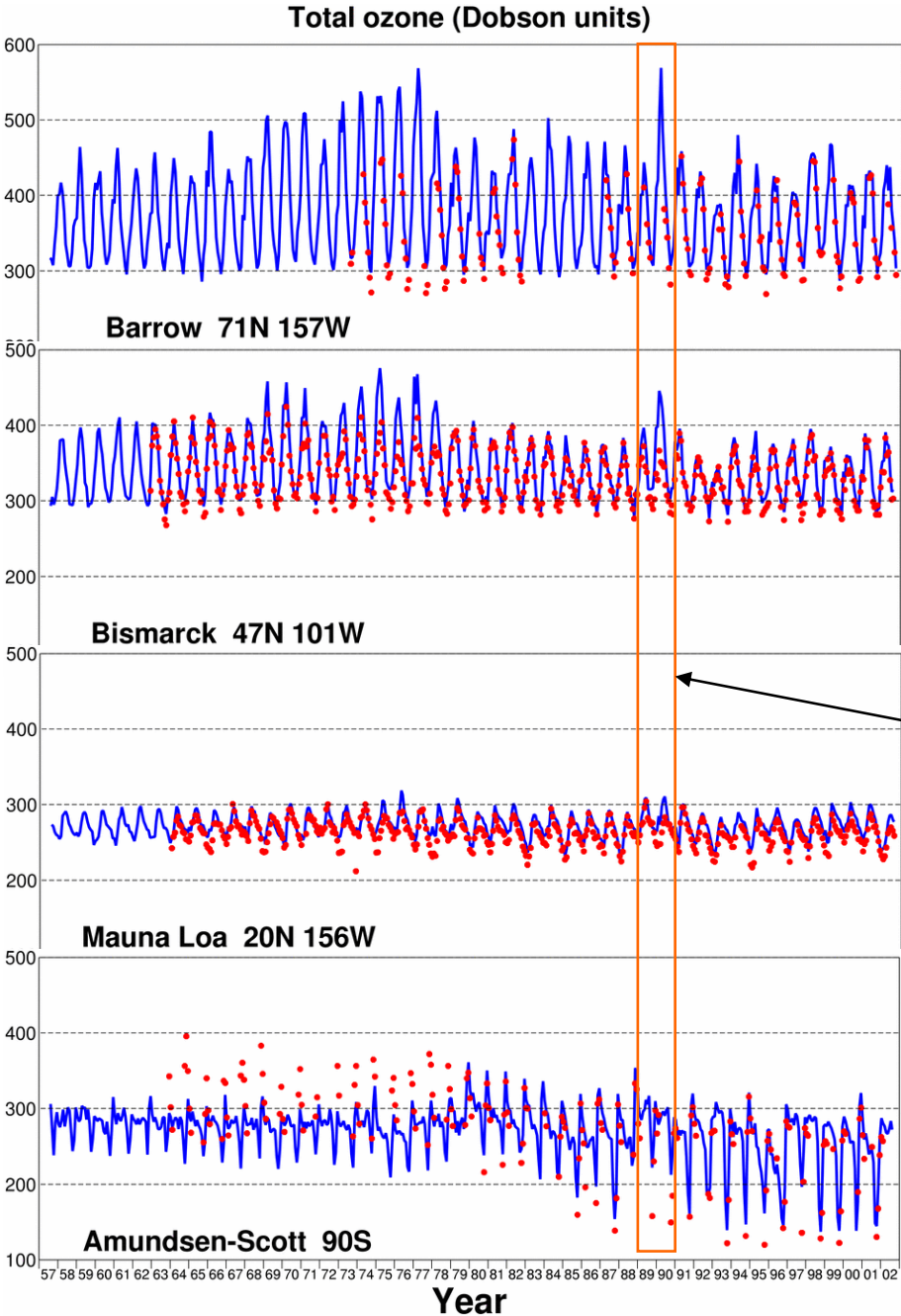
Total ozone [DU] TOMS 19930925



TOMS 19930925



# Monthly mean values



ERA-40 analysis

TOMS and SBUV data assimilated 1979-1988 and 1991-2002.

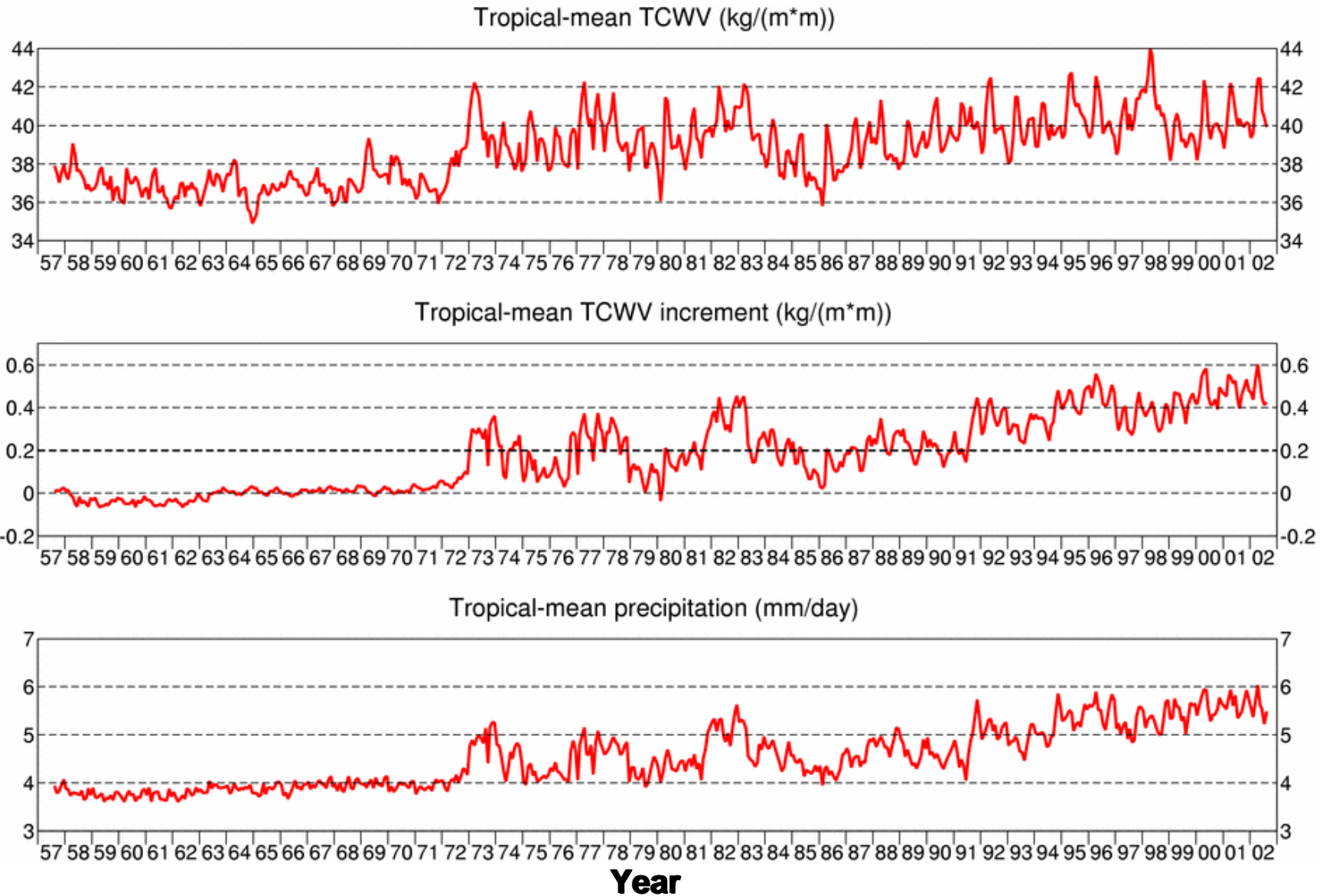
Ground-based measurements

From NOAA/ CMDL and not used in analysis.

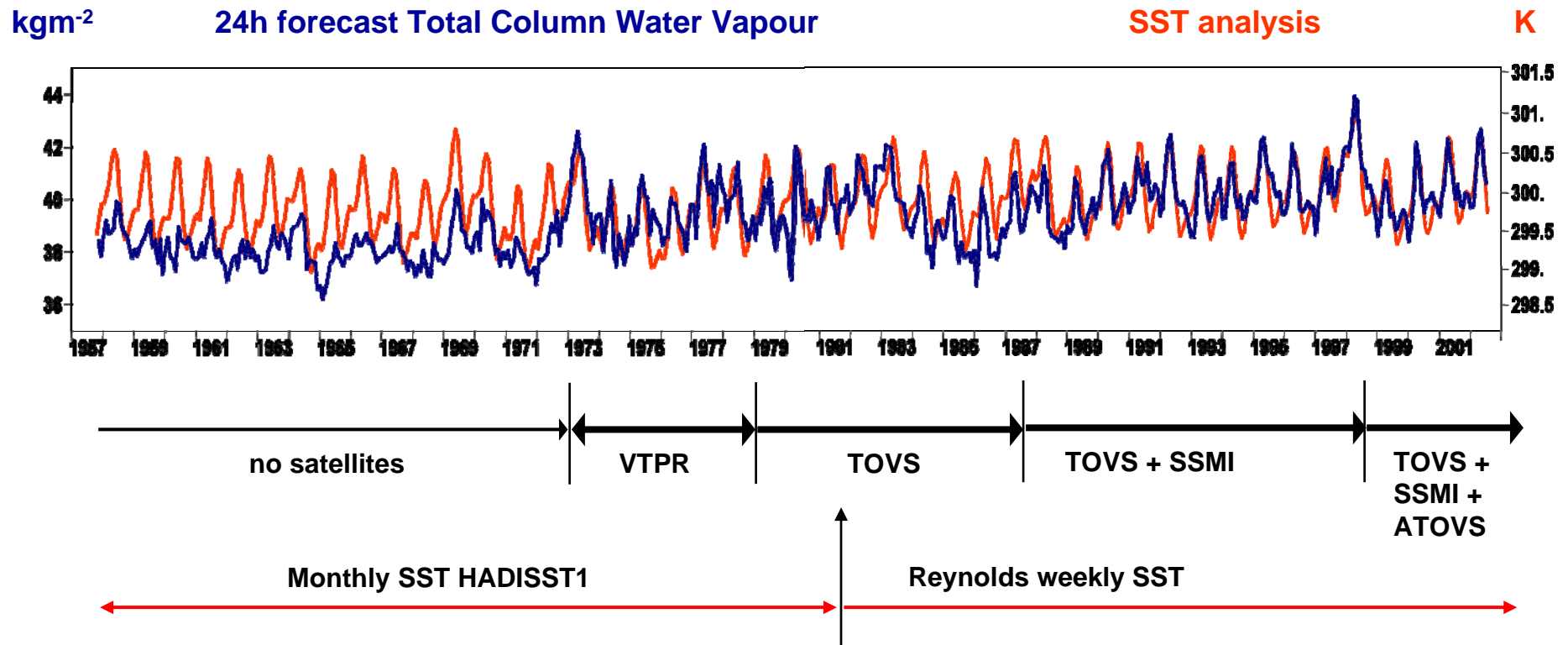
No data assimilated in 1989 and 1990.

# **Moisture analysis**

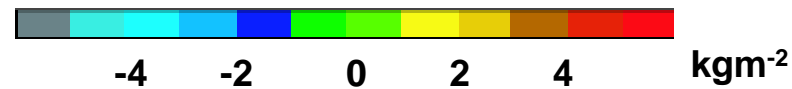
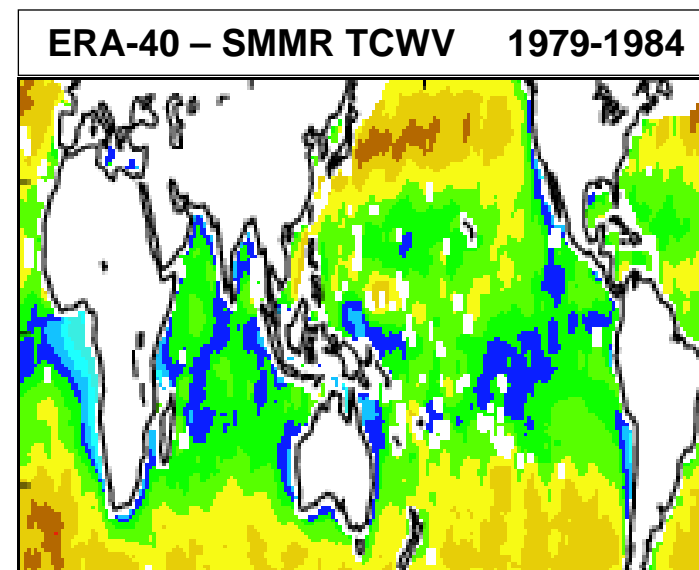
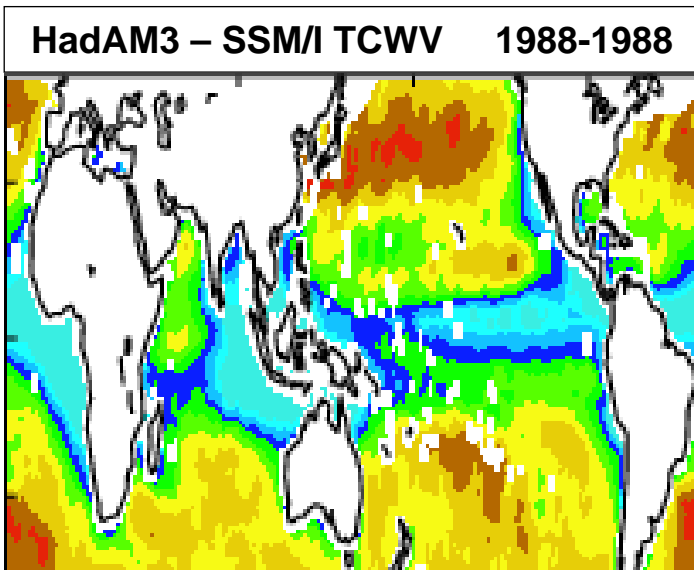
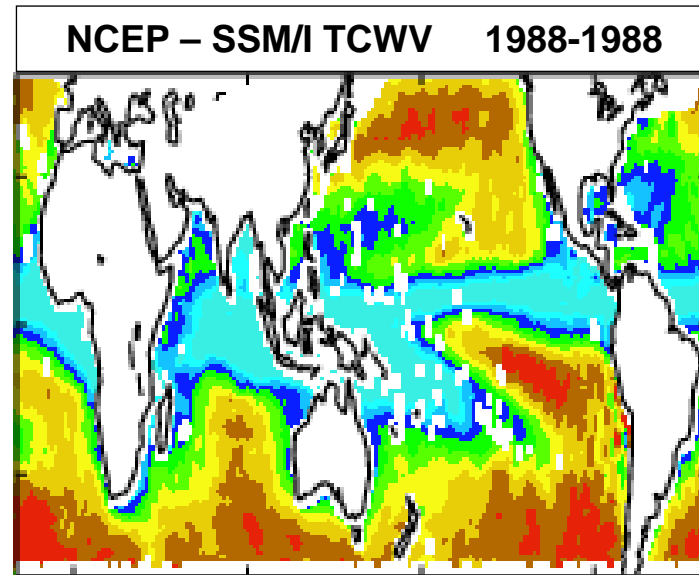
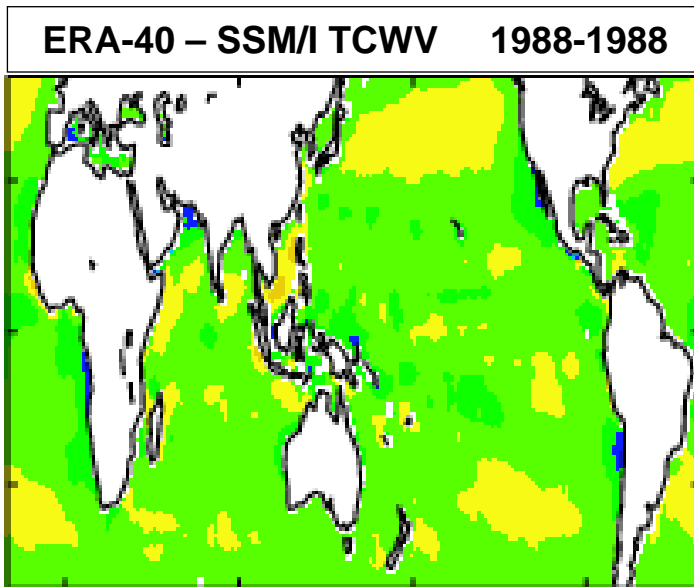
# Aspects of tropical humidity analysis in ERA-40



# Tropical oceans: SST $\leftrightarrow$ TCWV



# Detection of tropical cyclones

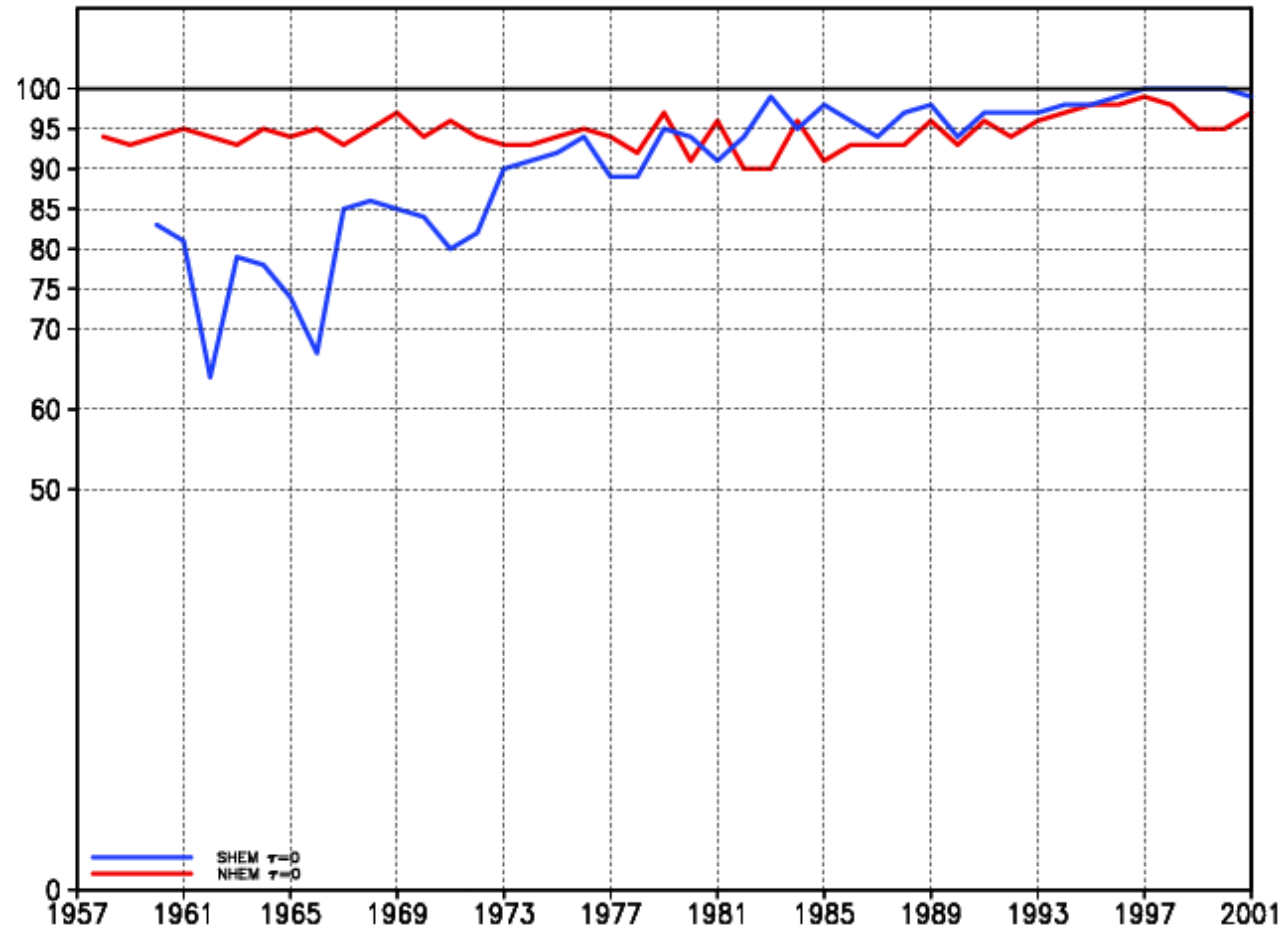


(from Richard Allan)

# **Climate variability and trends**

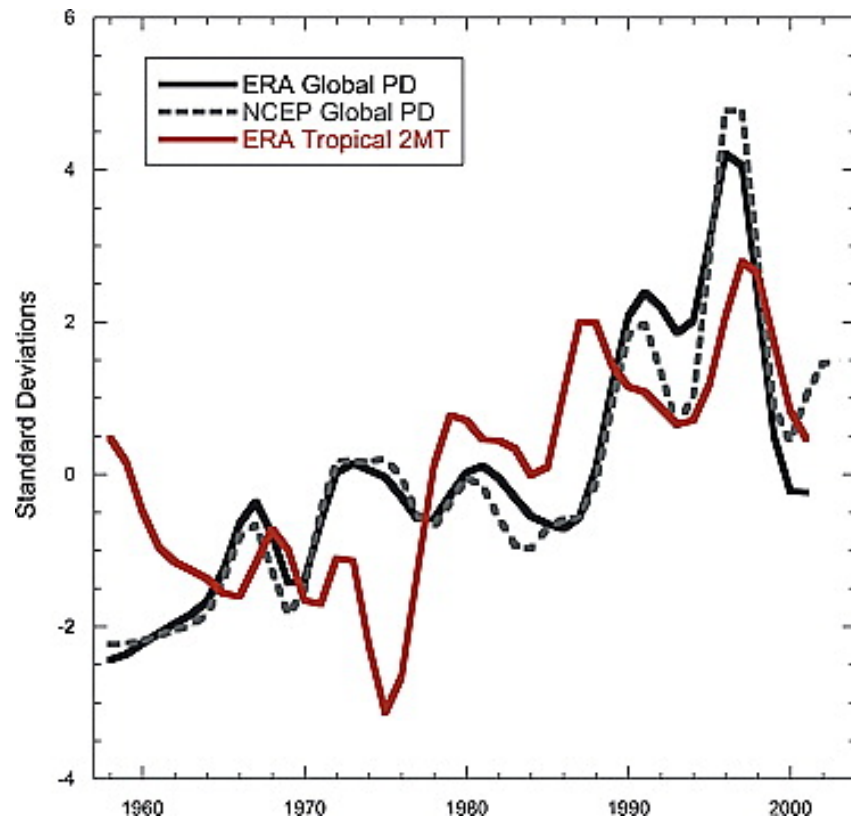
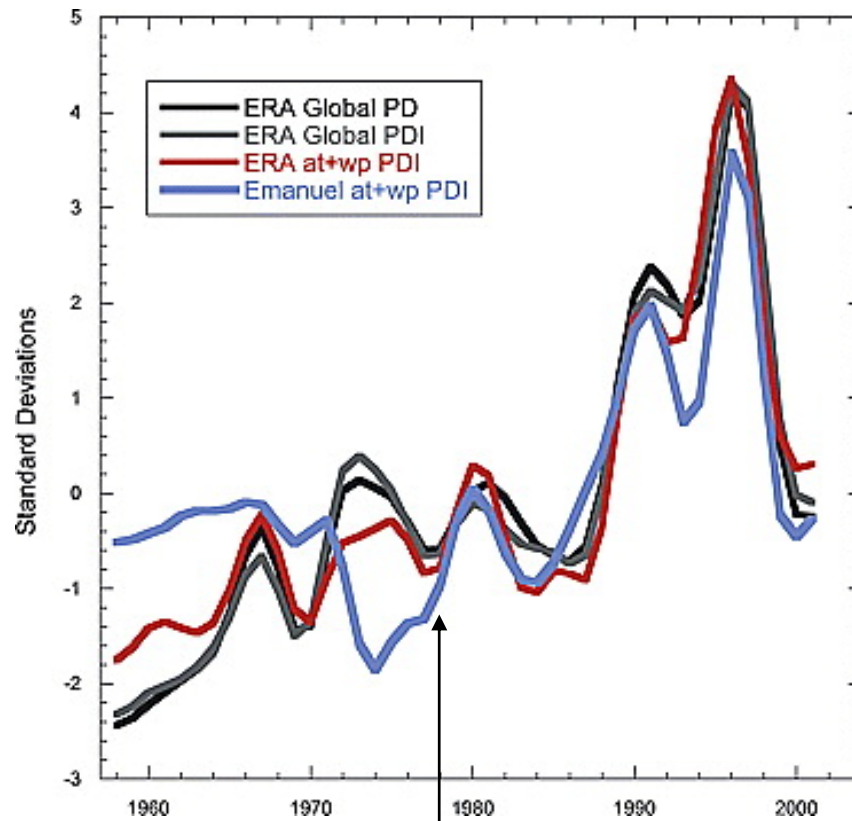
# Detection of tropical cyclones

ERA-40 fc TC stats: POD [%] period: 1958 - 2001  
Models: ERA-40(e40) | Taus: 1) 0; 2) 72  
Basins: 1) NHEM; 2) SHEM | Veri Rules: Hetero JTWC(mod)





# Debate on the trends in tropical cyclone intensity



(Note: No TC bogus data in ERA-40 or NCEP !)

- Ryan L. Sriver and Matthew Huber, 2006, Geophysical Research Letters  
“Low frequency variability in globally integrated tropical cyclone power dissipation”
- R. N. Maue and R. E. Hart, 2007, comment to the previous
  - Ryan L. Sriver and Matthew Huber, 2007, Reply to comment

# Observations only ↔ Reanalysis

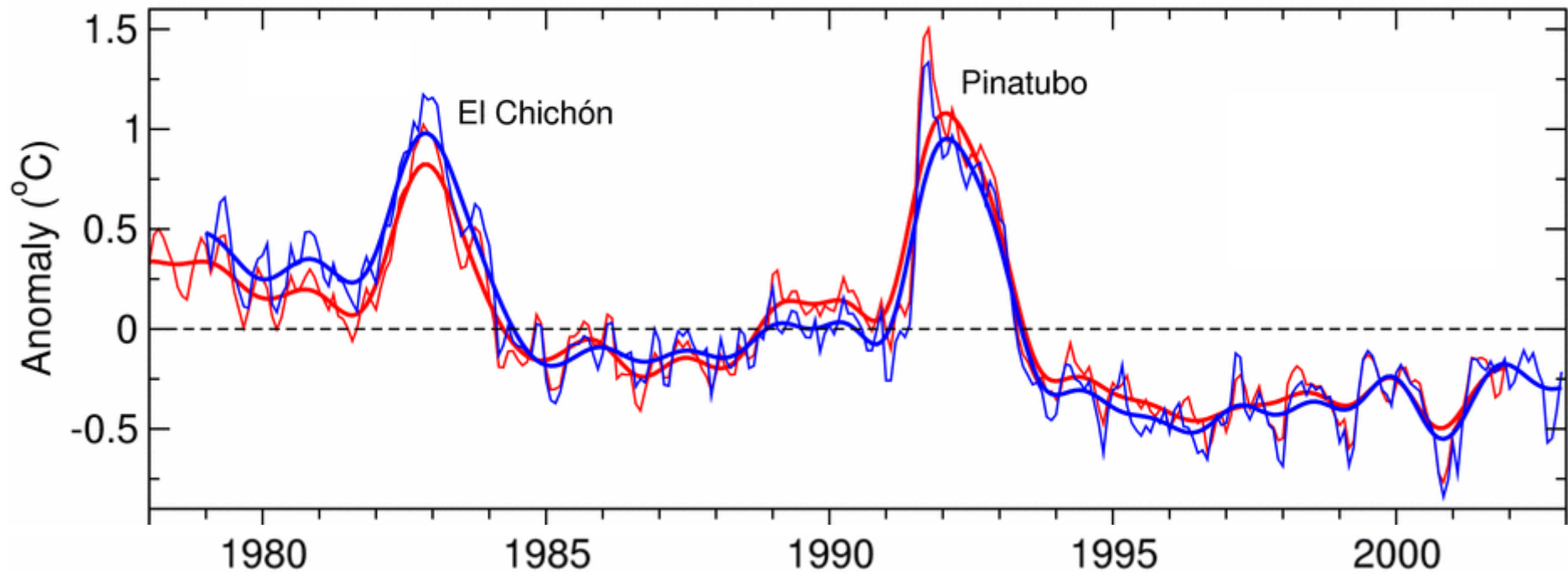
....

One of the most important and difficult to characterize sources of long-term drift in the data is due to the evolution of the local observing time due to slow changes in the orbital parameters of each NOAA platform, which can alias diurnal temperature changes into the long-term time series. To account for this effect, we have constructed monthly diurnal climatologies of MSU Channel 2 brightness temperature using the hourly output of a general circulation model as input for a microwave radiative transfer model.

....

(Carl A. Mears et al: Correcting the MSU Middle Tropospheric Temperature for Diurnal Drifts, Remote sensing Systems)

# Trend and variability in lower stratospheric temperature



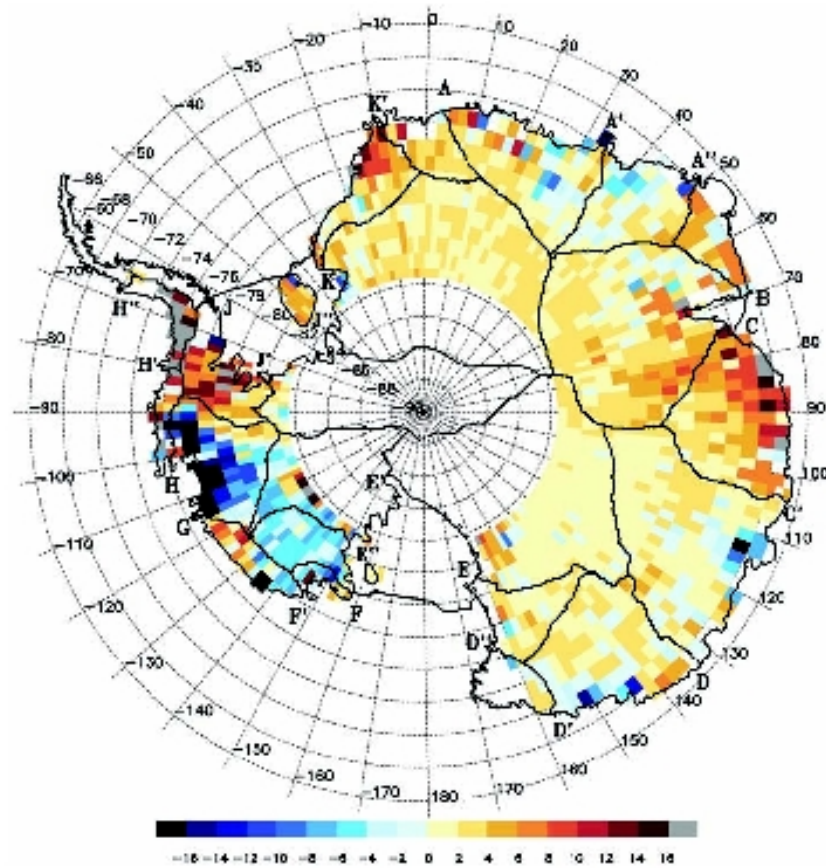
**MSU-4 data analyzed by Mears et al. (2003)**

**ERA-40 equivalent from Ben Santer**

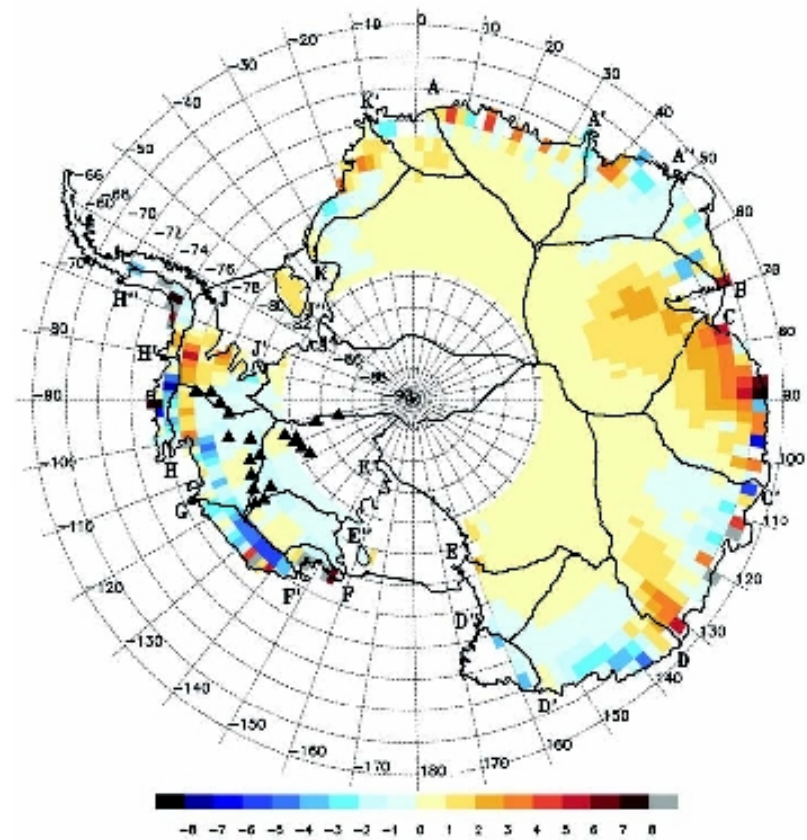
<b>Linear trend:</b>	<b>MSU-4</b>	<b>- 0.39°C/decade</b>
	<b>ERA-40</b>	<b>- 0.30°C/decade</b>
	<b>NCEP</b>	<b>- 0.82°C/decade</b>

# Satellite radar altimeter 1992-2003

(Davis et al. Science 2005 Vol 308 No. 5730)

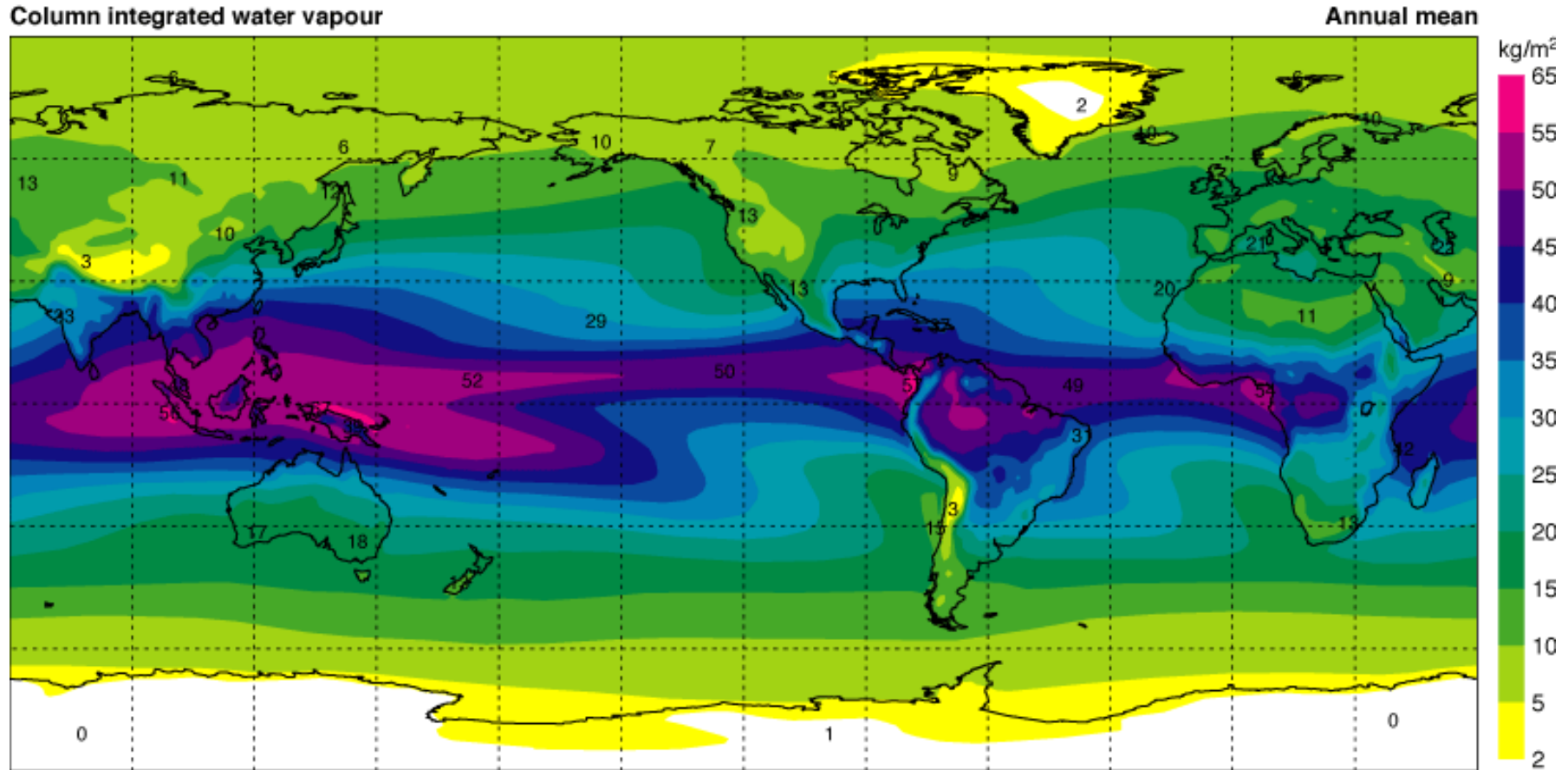


Surface elevation change rate (cm per year):  
1992 → 2003



Precipitation change (cm of snow per year):  
ERA-40 (1992-2001)+ ECMWF OP (2002-03)

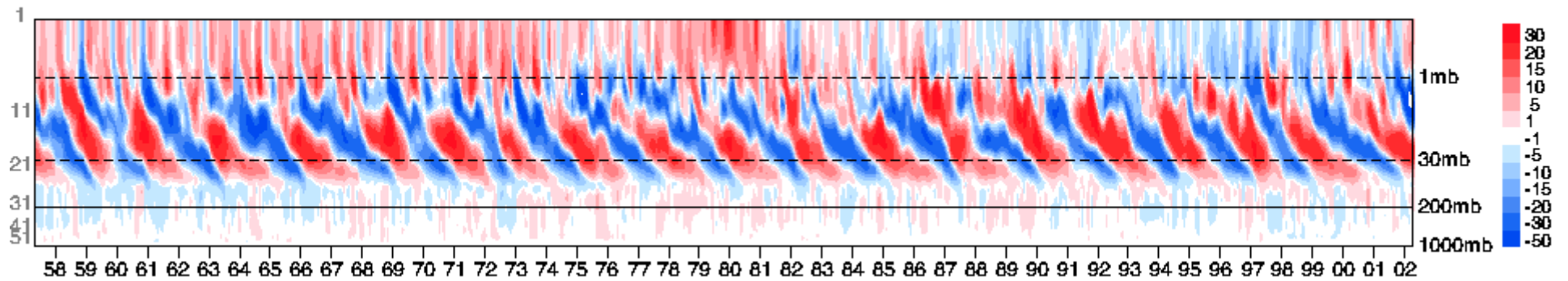
# ERA-40 Atlas 1979-2001



[http://www.ecmwf.int/research/era/ERA-40\\_Atlas/docs/index.html](http://www.ecmwf.int/research/era/ERA-40_Atlas/docs/index.html)

# Quasi-Biennial Oscillation

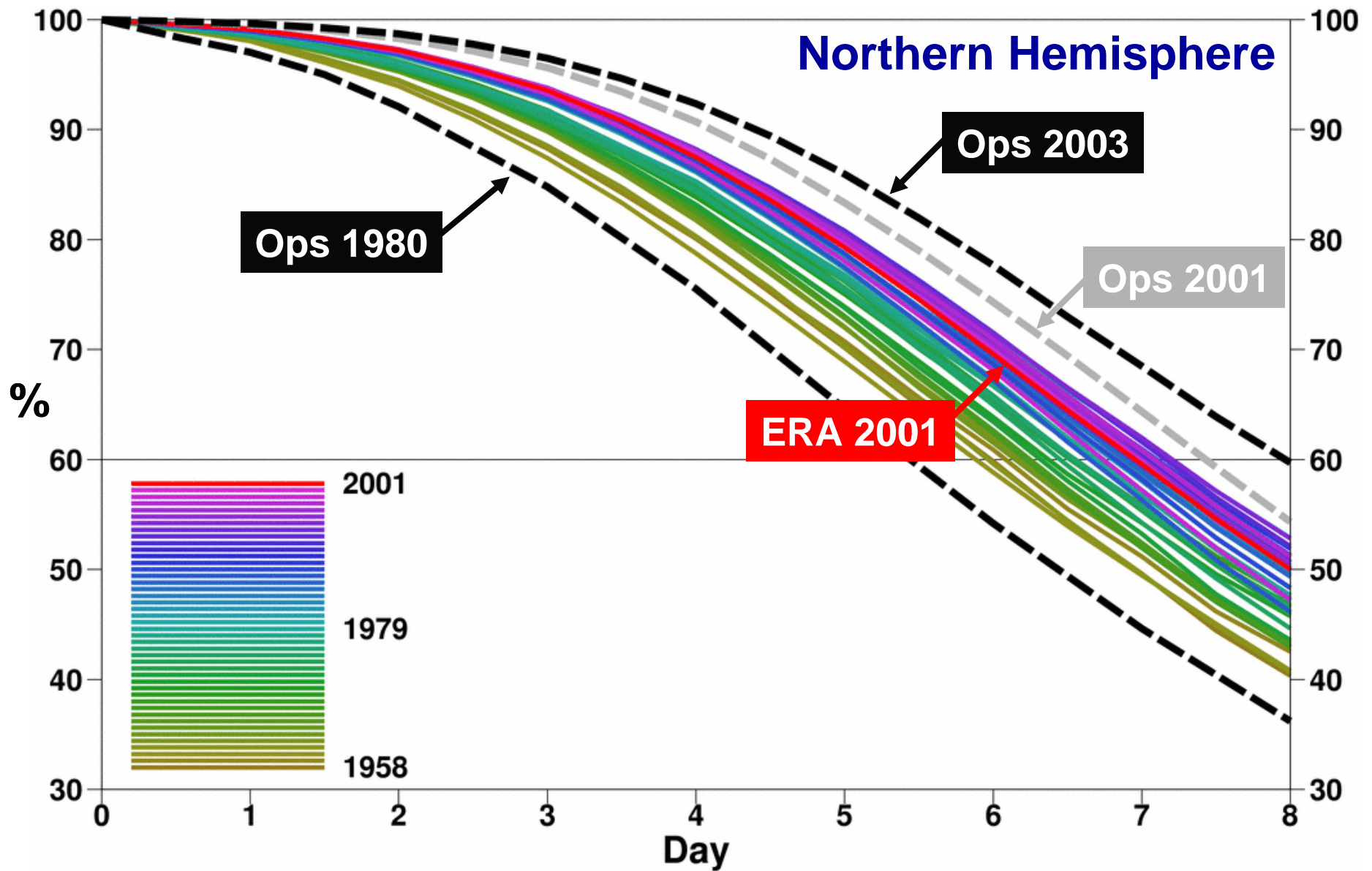
Equatorial band 2S-2N  
Monthly mean zonal wind anomaly (m/sec) to 1979-2001 climate



# **FORECAST PERFORMANCE**

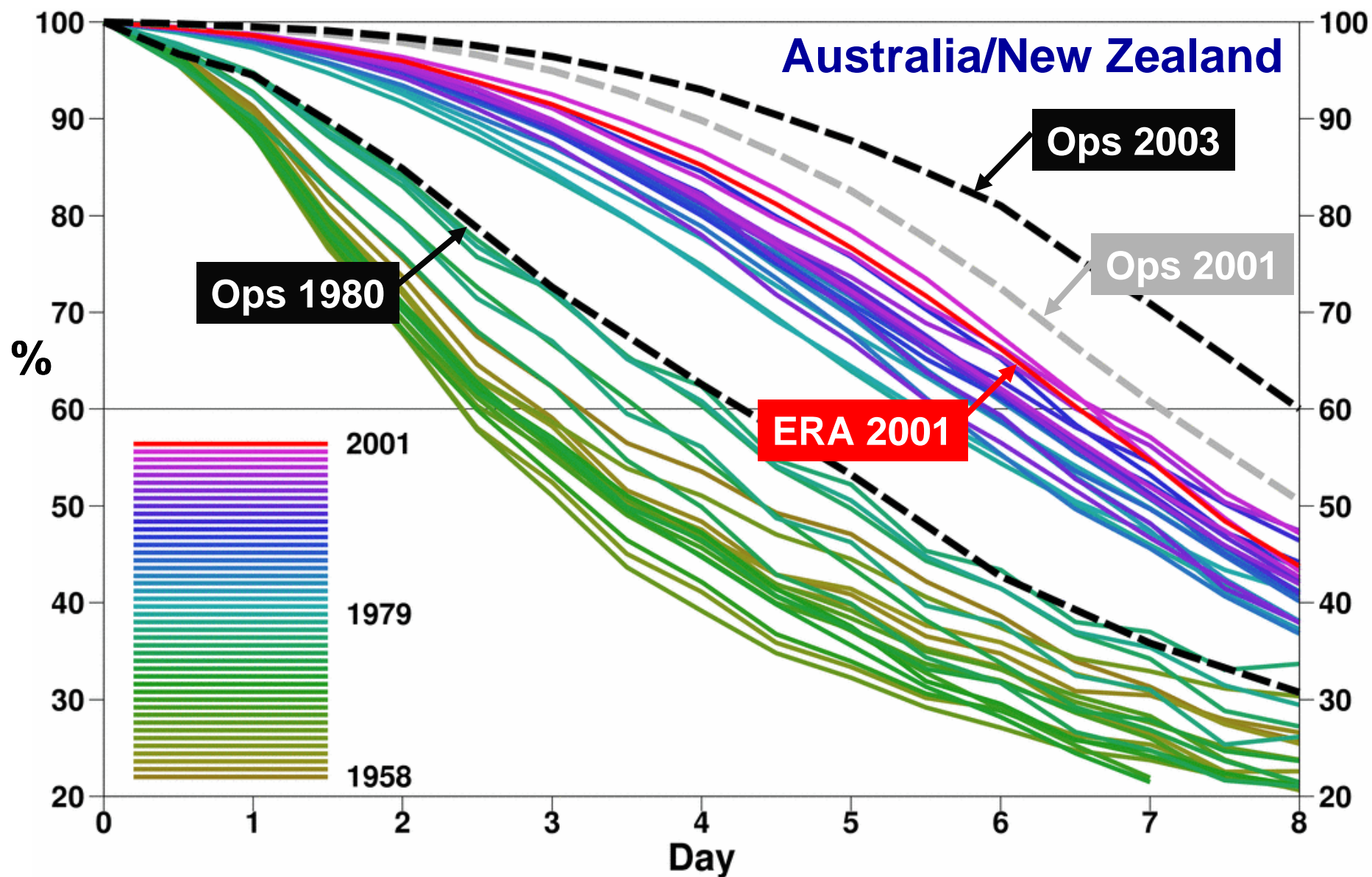
**1957-2002**

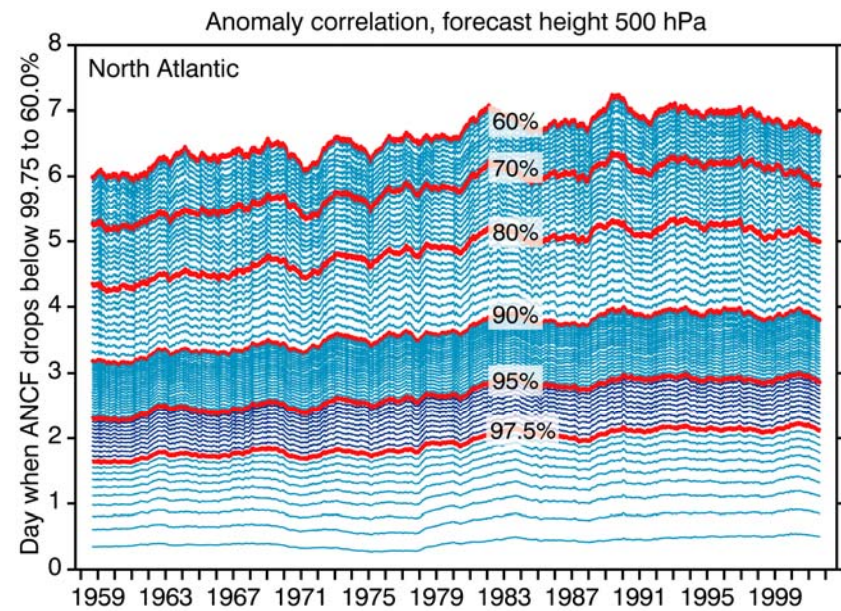
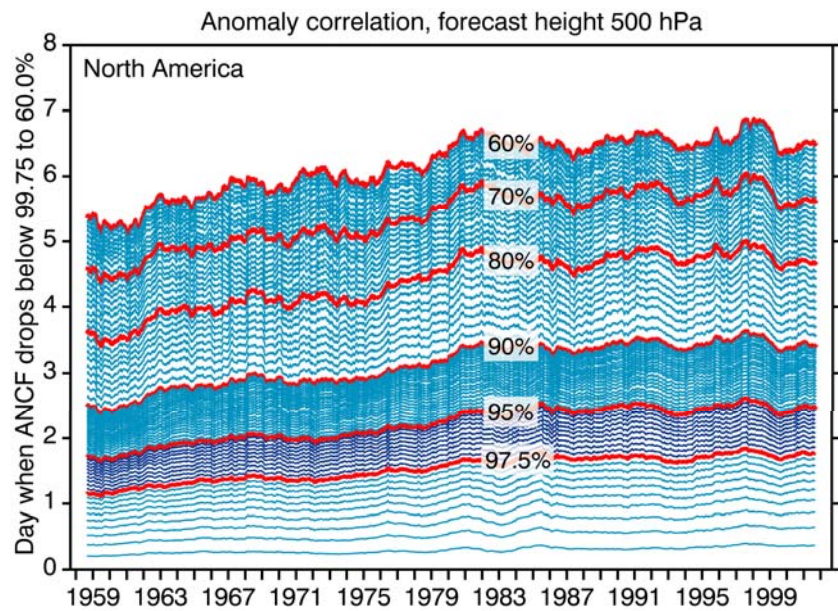
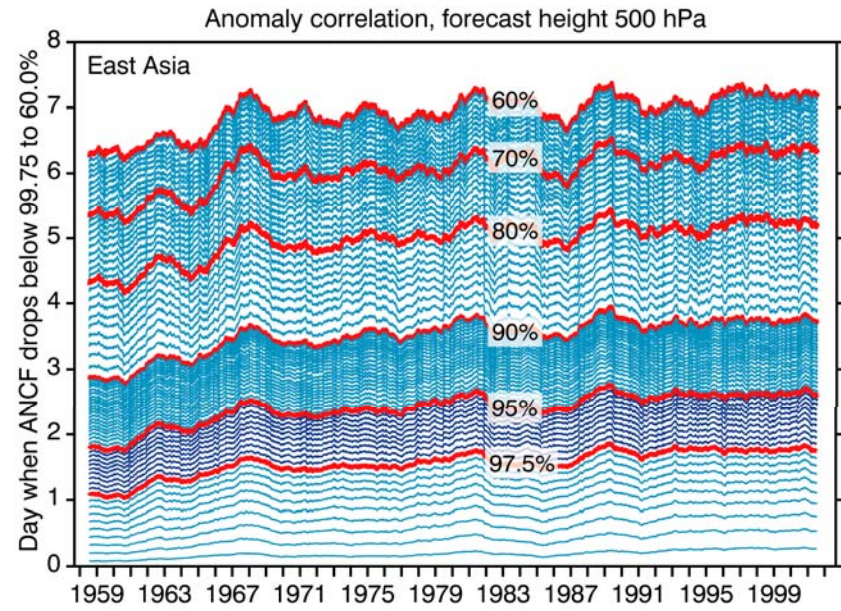
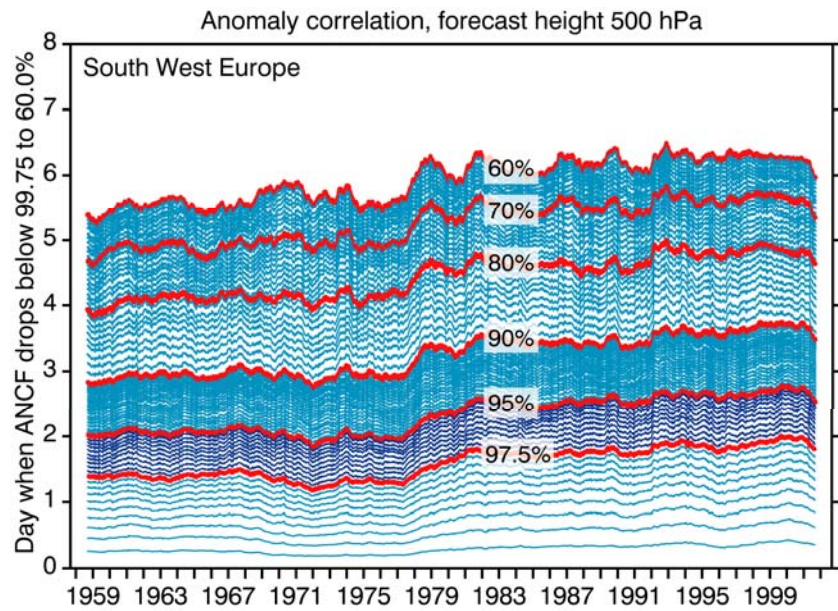
# Anomaly correlations of 500hPa height forecasts





# Anomaly correlations of 500hPa height forecasts





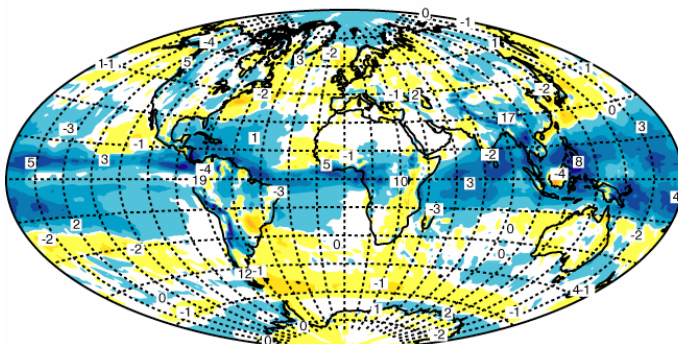
**ERA-Interim 1989 → to continue as CDAS →**

**ERA-40 1957-2002**

- **Data-assimilation system**
  - T159L60 → T255L60 / 12 hour 4D-Var
  - New humidity analysis and improved model physics
- **Satellite level-1c radiances**
  - Better RTTOV and improved use of radiances especially IR and AMSU
  - Assimilation of rain affected radiances through 1D-Var
  - Variational bias correction
- **Improved use of radiosondes**
  - Bias correction and homogenization based on ERA-40
- **Correction of SHIP/ SYNOP surface pressure biases**
- **Use of reprocessed**
  - Meteosat winds
  - GPS-RO data CHAMP / UCAR 2001 →, GRACE and COSMIC
  - GOME O3 profiles 1995 →
- **New set of Altimeter wave height data 1991→**

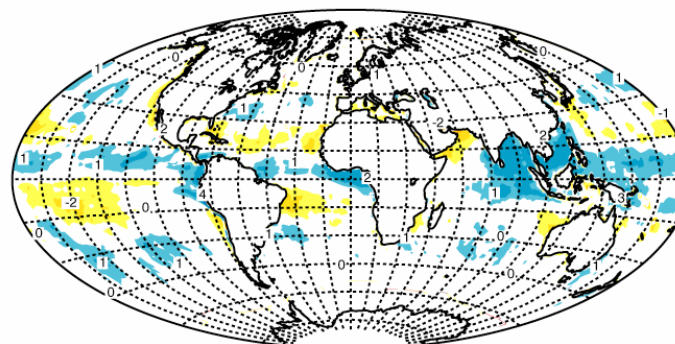
Mean daily precipitation rate

**a** ERA-Interim minus GPCP

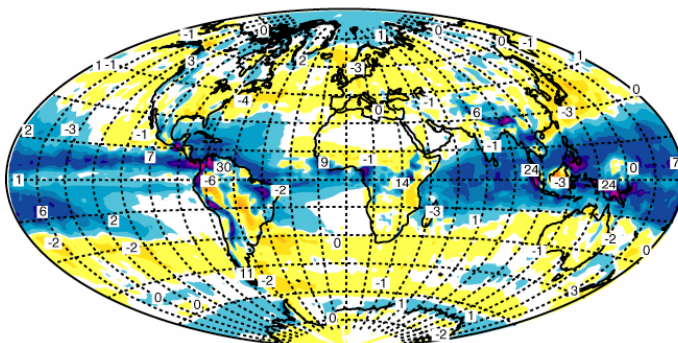


Mean total column water vapour

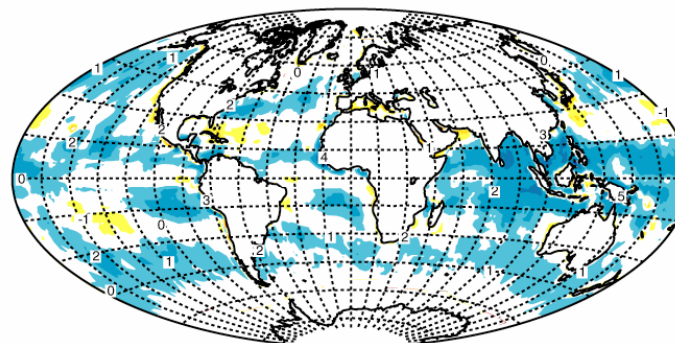
**d** ERA-Interim minus RSS



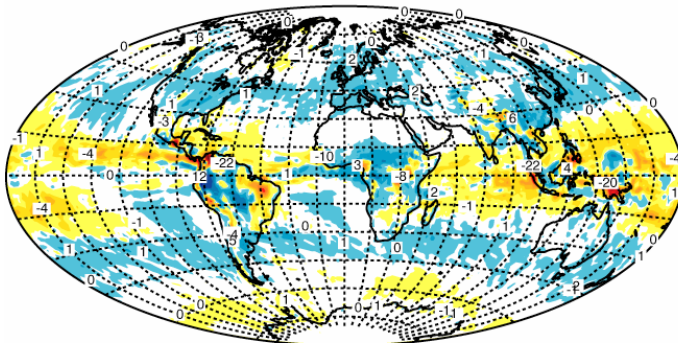
**b** ERA-40 minus GPCP



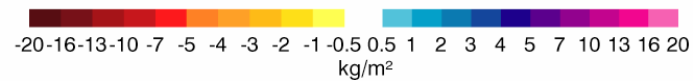
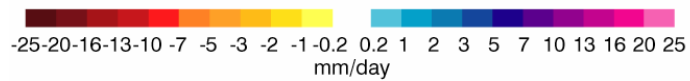
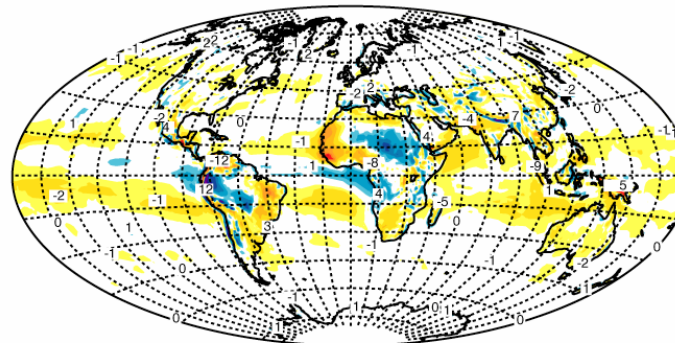
**e** ERA-40 minus RSS

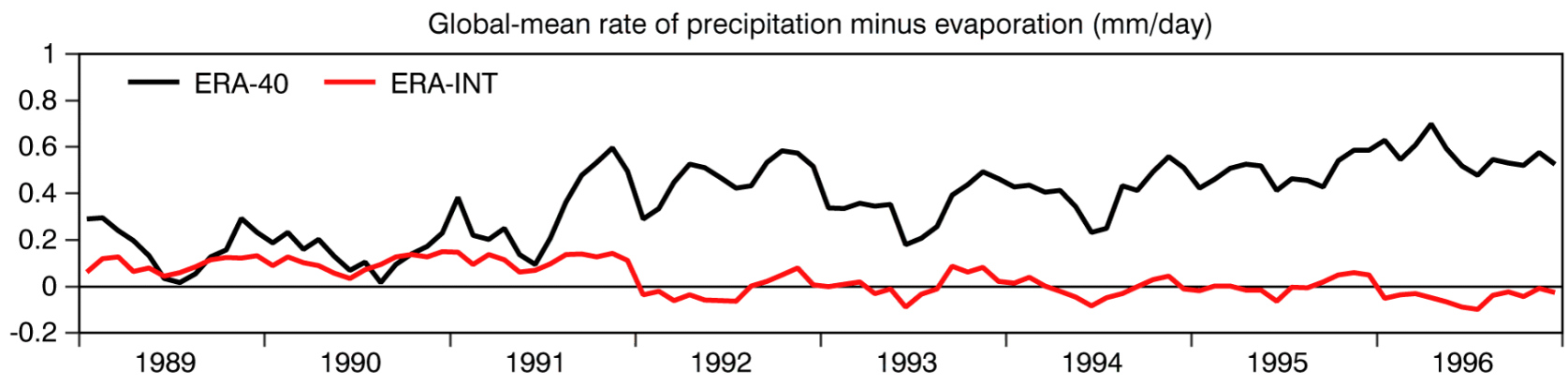
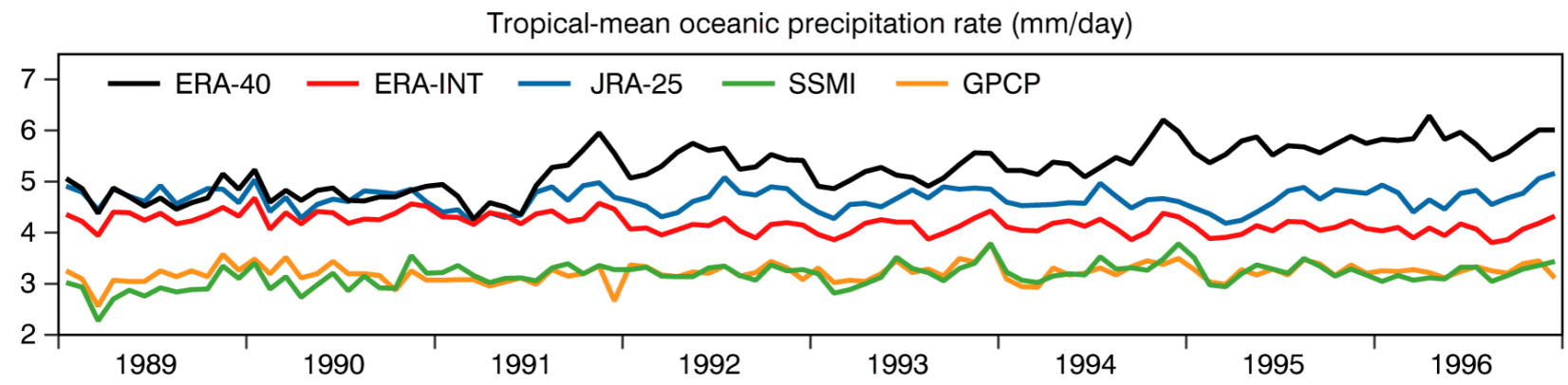
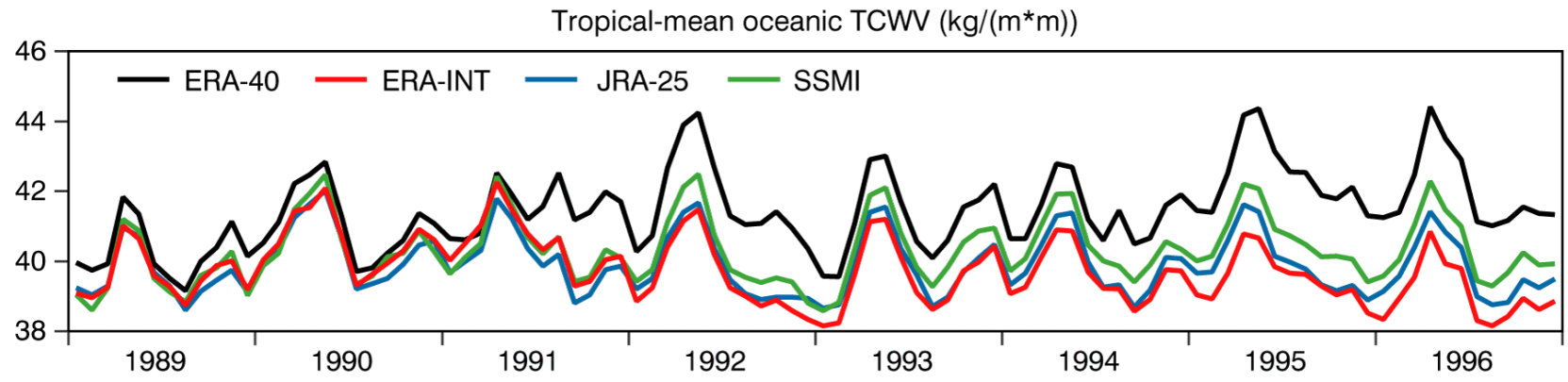


**c** ERA-Interim minus ERA-40



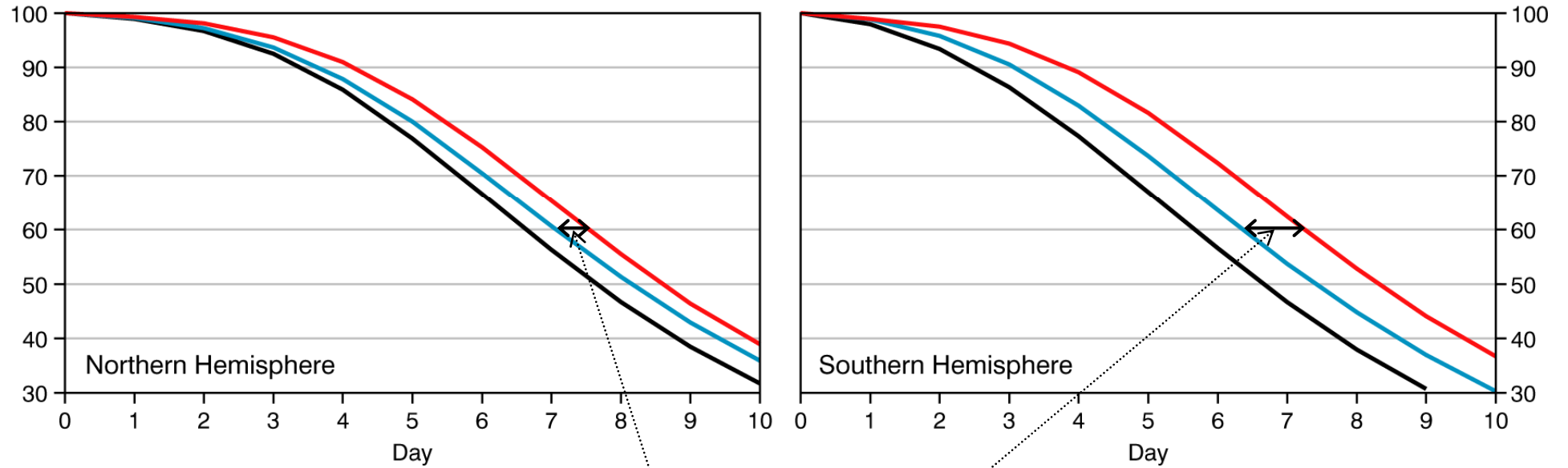
**f** ERA-Interim minus ERA-40



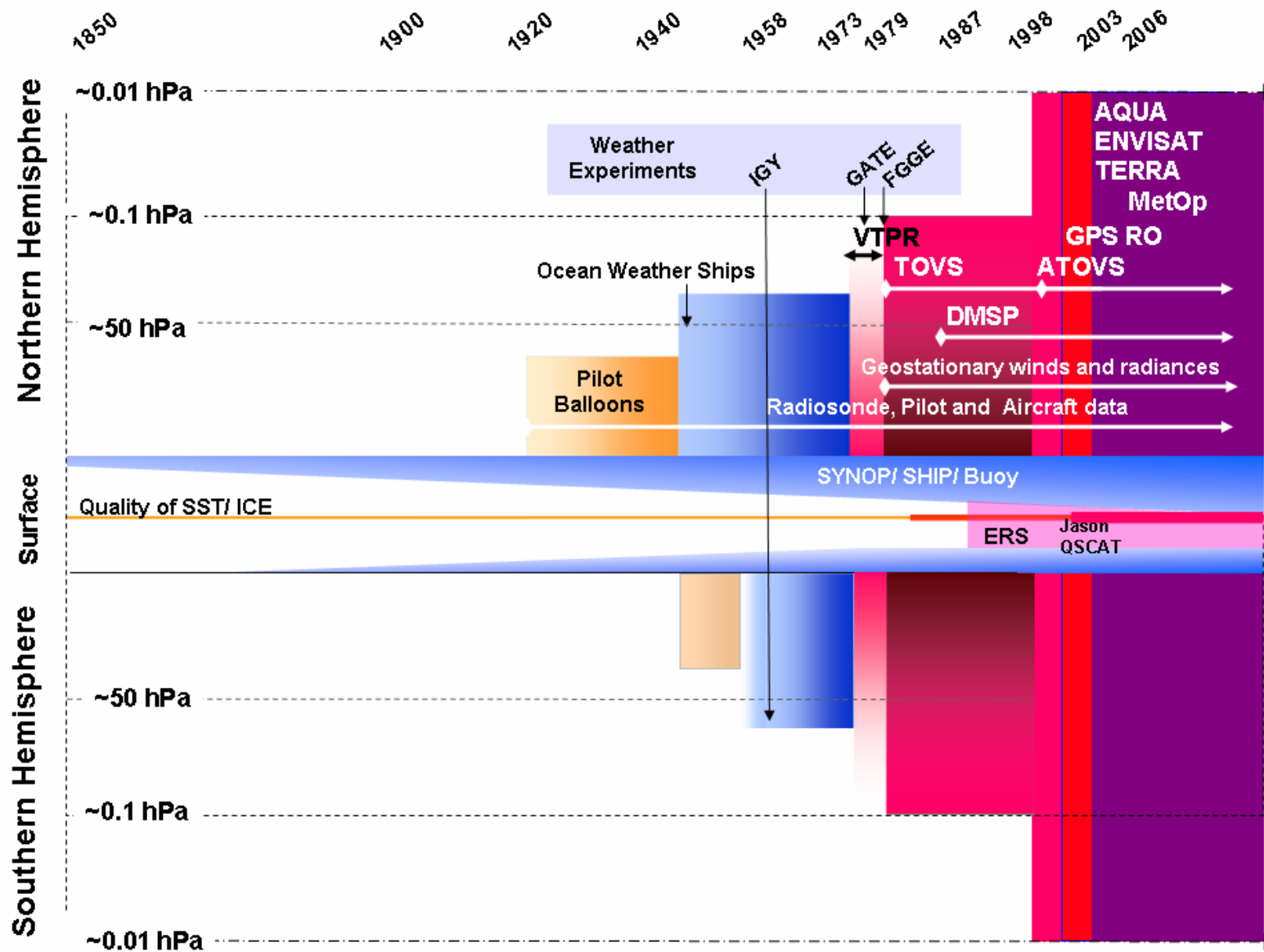


### Anomaly correlation of 500hPa height forecasts

— ERA-Int    — ERA-40    — OPS



**Improvement: NH ~ 0.5d SH ~ 1d**



(Uppala S, A Simmons, D Dee, P Kållberg and J-N Thépaut, "Atmospheric reanalyses and climate variations" in the book "Climate variability and extremes during the past 100 years", Advances in Global Change Research, Springer (2007, in press, Eds. Brönnimann, S., J. Luterbacher, T. Ewen, H. F. Diaz, R. Stolarki, and U. Neu)

ERA-75?

ERA-Interim

- Could start ~ 2011 depending on resources
- ~ 1938 → 2013 and continue as CDAS
- Important components

Recovery, organization and homogenization of observations

Improved SST & ICE dataset

Variational analysis technique aimed for reanalysis

Comprehensive adaptive bias handling

Handling of model biases

Coupled atmospheric-ocean reanalysis?

} !!



# Summary

- Reanalyses have, in part, reached the level required for climate studies
- Satellite data have an increasing role in reanalysis
- The composite observing system improves over time
- Due to the use of satellite data reanalysis has substantially better and more uniform quality after 1978 especially over the Southern Hemisphere
- Reanalysis is seen as an iterative process, where improvements in the data assimilation/ bias adjustment/ increasing resolution bring new qualities to reanalyses and therefore to the applications
- Reprocessing/ recalibration of satellite data improves reanalysis quality and should also be done iteratively
- Improving the homogeneity of satellite data record is important
- Satellite missions with long period and overlapping important for reanalyses