

Assimilation of satellite observations in global reanalysis: A double-edged sword?

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*with contributions from the reanalysis and satellite
teams at ECMWF*

Observing the Earth from space: basic principles

An instrument
collects measurements,
from space,
while orbiting the Earth,
thereby remotely sensing
the Earth's environment.

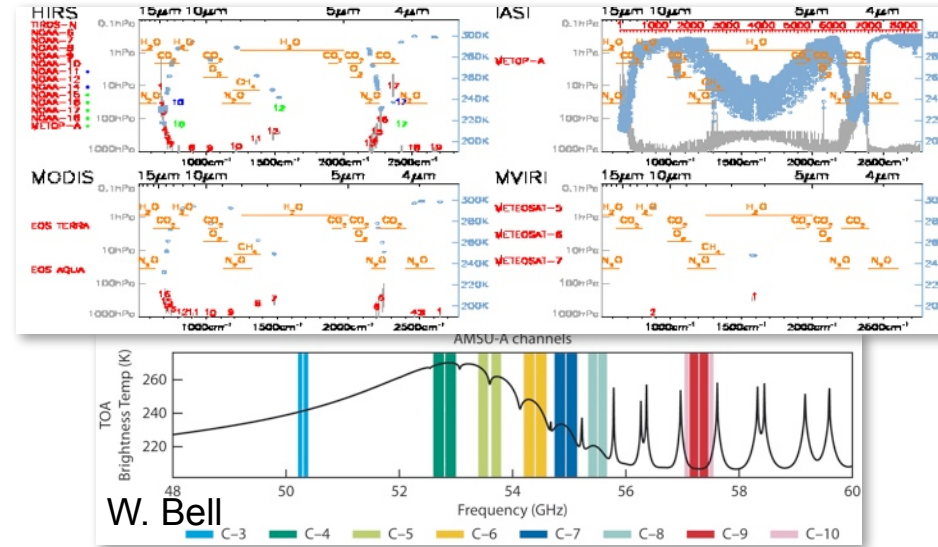
Questions addressed in this talk

- What satellite data are used in atmospheric reanalyses? how many are used? how are they used? what are the main differences between the recent reanalyses?
- What is the impact of these data? (double-edged sword)
- How can we improve the situation?
- Future challenges and conclusions

Fundamental interactions (leaving aside strong and weak nuclear forces)

● Electromagnetism

- Absorption and emission
 - Infra-red and micro-wave spectrometers collect spectral radiation, influenced by
 - ◆ Temperature, pressure,
 - ◆ Constituents (CO_2 , H_2O , O_3 , ...),
 - ◆ Anything along the line-of-sight: Earth surface behind, cloud cover, aerosols, rain...



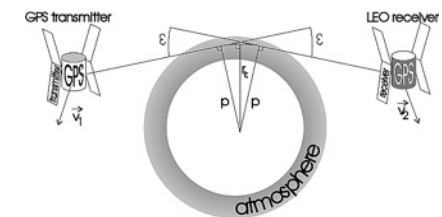
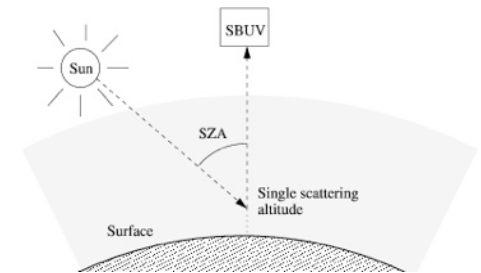
- Scattering

- Natural source: example Solar Ultra-Violet
- Man-made source: radar, lidar

- Refraction

- Bending angles from GPS radio occultation

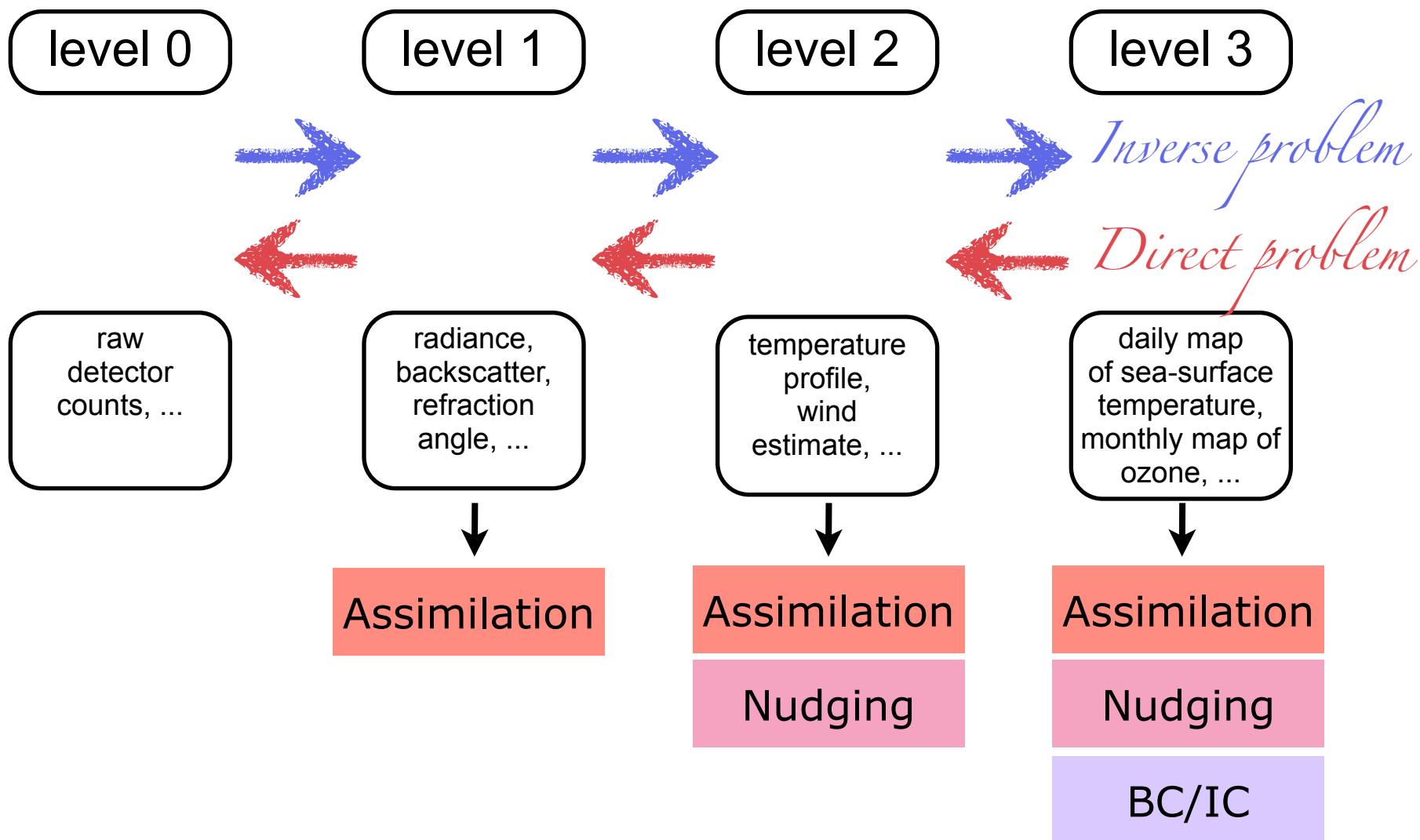
- Diffraction



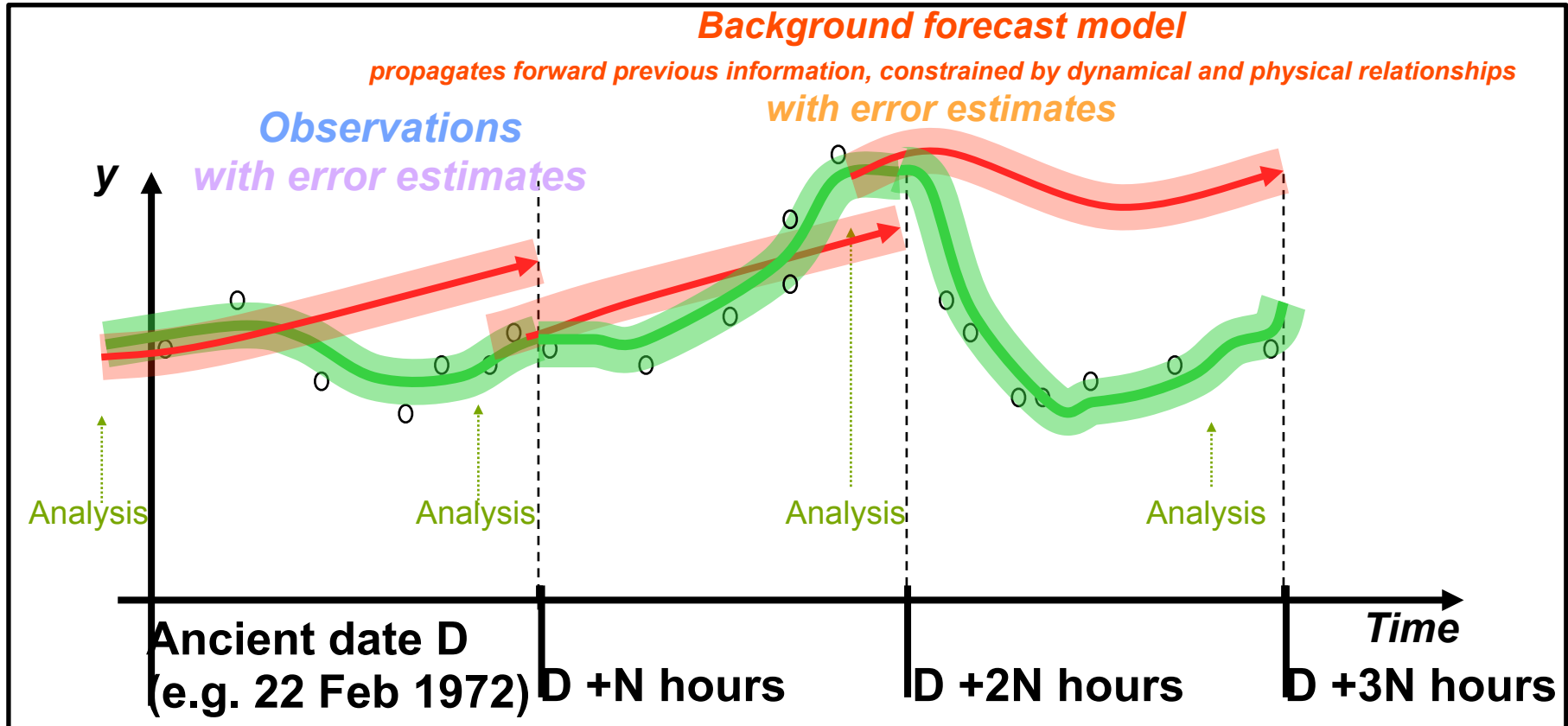
● Gravitation

- Mass distributions in the Earth system

How satellite data are used



Reanalysis: reconstructing past weather in a forward-integration



$$\mathbf{J}(\mathbf{x}, \hat{\mathbf{a}}) = (\mathbf{x} - \mathbf{x}_b)^T \mathbf{B}_x^{-1} (\mathbf{x} - \mathbf{x}_b) + (\hat{\mathbf{a}} - \hat{\mathbf{a}}_b)^T \mathbf{B}_a^{-1} (\hat{\mathbf{a}} - \hat{\mathbf{a}}_b) + \text{background constraint}$$

$$\left[\mathbf{y}^0 - h(M(\mathbf{x})) - b(M(\mathbf{x}), \hat{\mathbf{a}}) \right] \mathbf{R}^{-1} \left[\mathbf{y}^0 - h(M(\mathbf{x})) - b(M(\mathbf{x}), \hat{\mathbf{a}}) \right] \text{observation constraint}$$

$M(\mathbf{x})$ Simulates atmospheric evolution in time

$h(\cdot)$ Simulates observations, given atmospheric state

$b(\cdot)$ Simulates observations biases

Timeline of observations in ERA-Interim

1979-2012

Satellite data

Microwave

Radiance

Infra-red

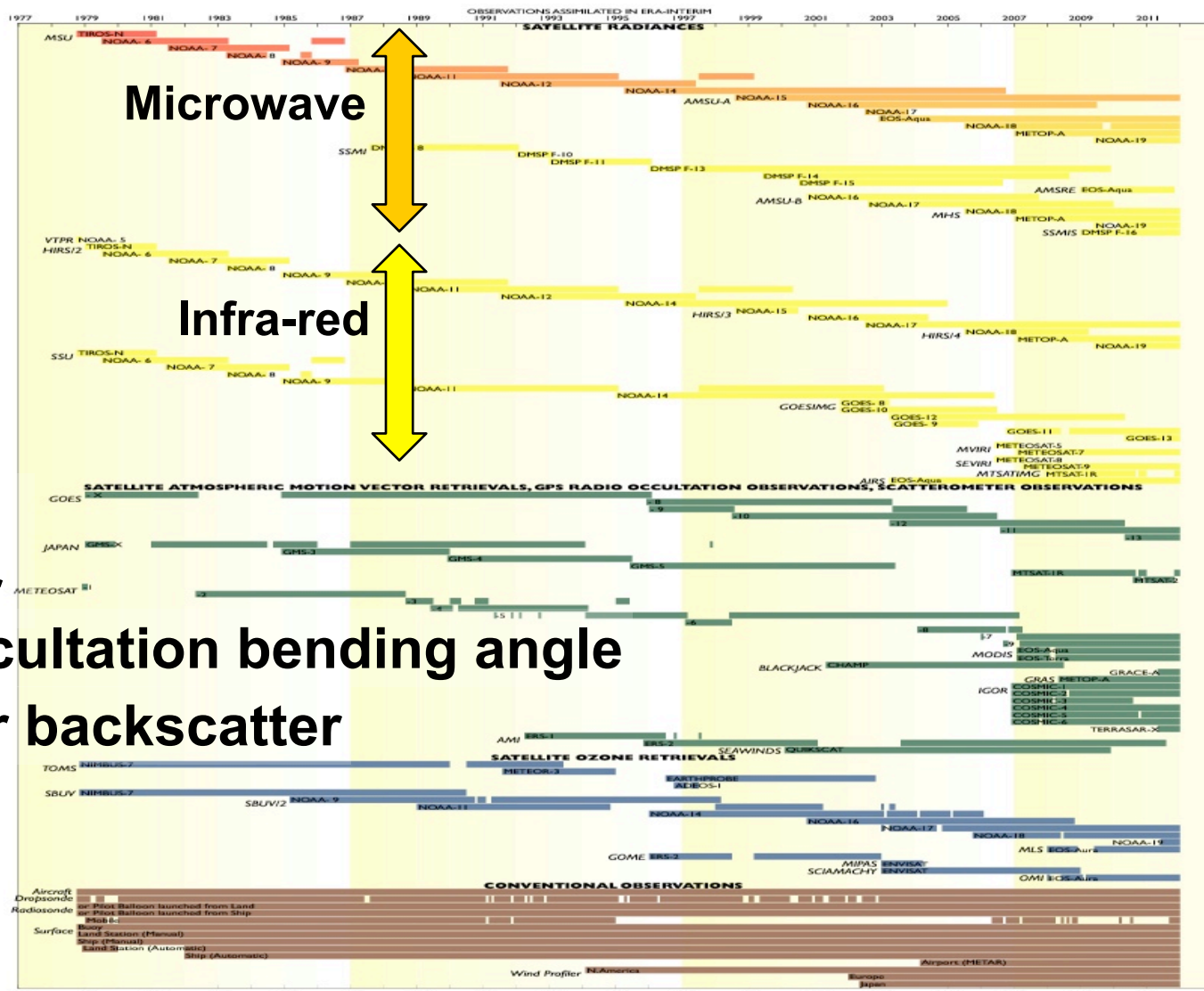
Atmospheric

motion vector

GPS radio occultation bending angle

Scatterometer backscatter

Ozone



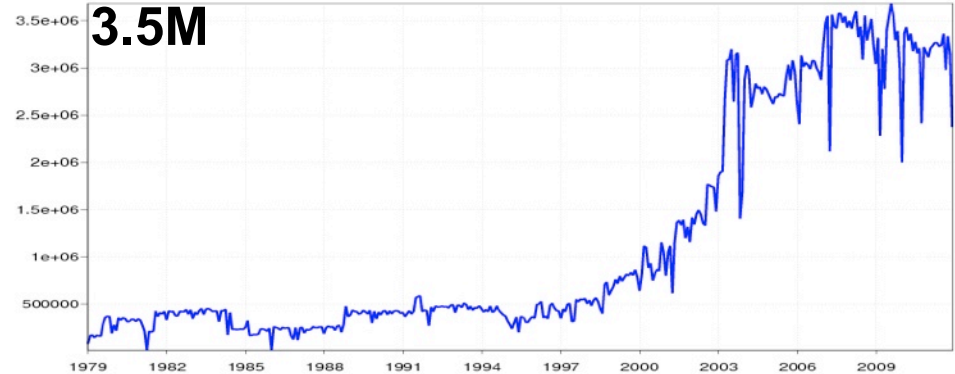
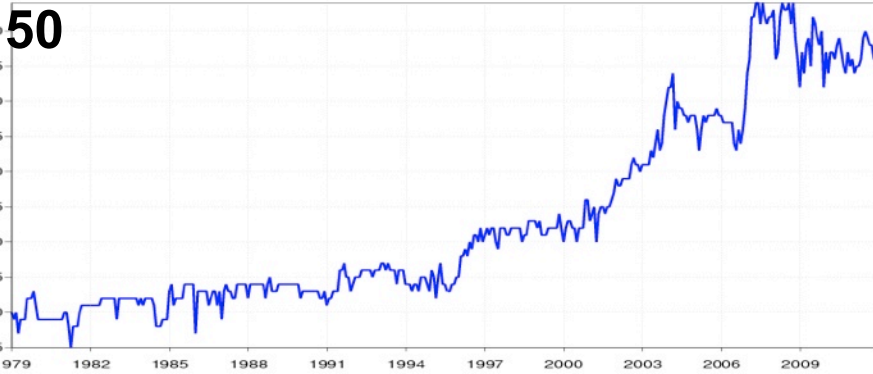
Radiosonde,

aircraft, station, buoy, wind profiler, dropsonde

Satellite Data Coverage in ERA-Interim

Number of satellite sensors/ AMV retrieval types

Number of data, every 12 hours

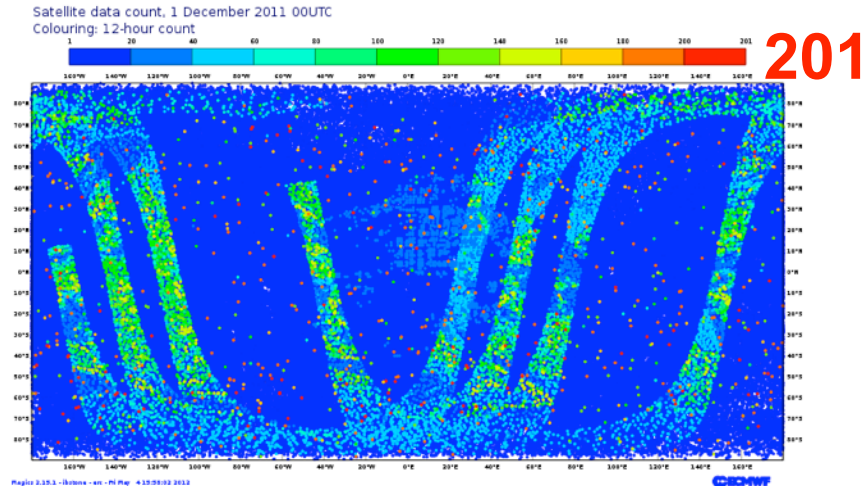
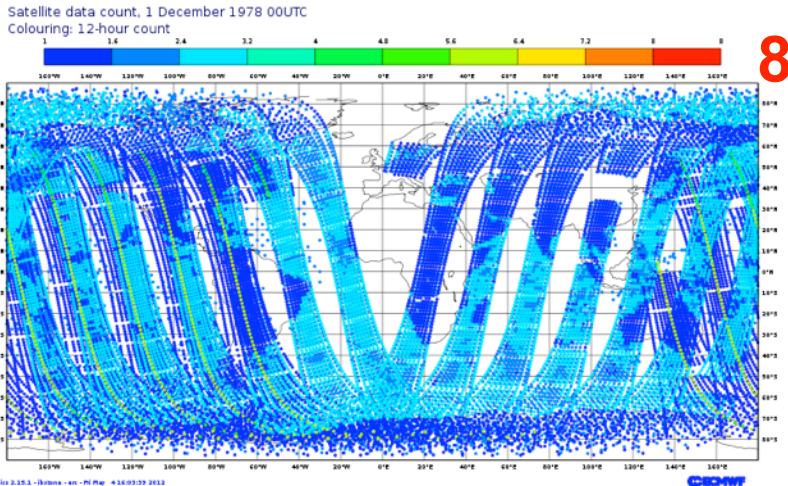


1979

2012

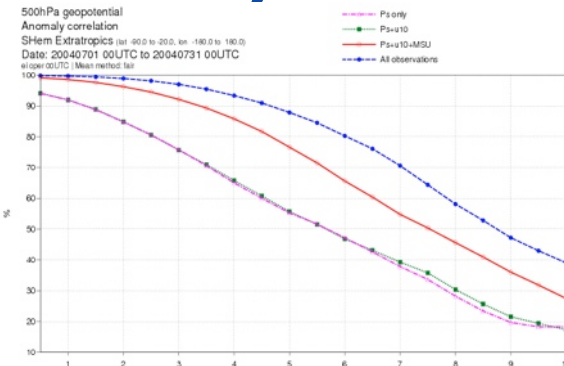
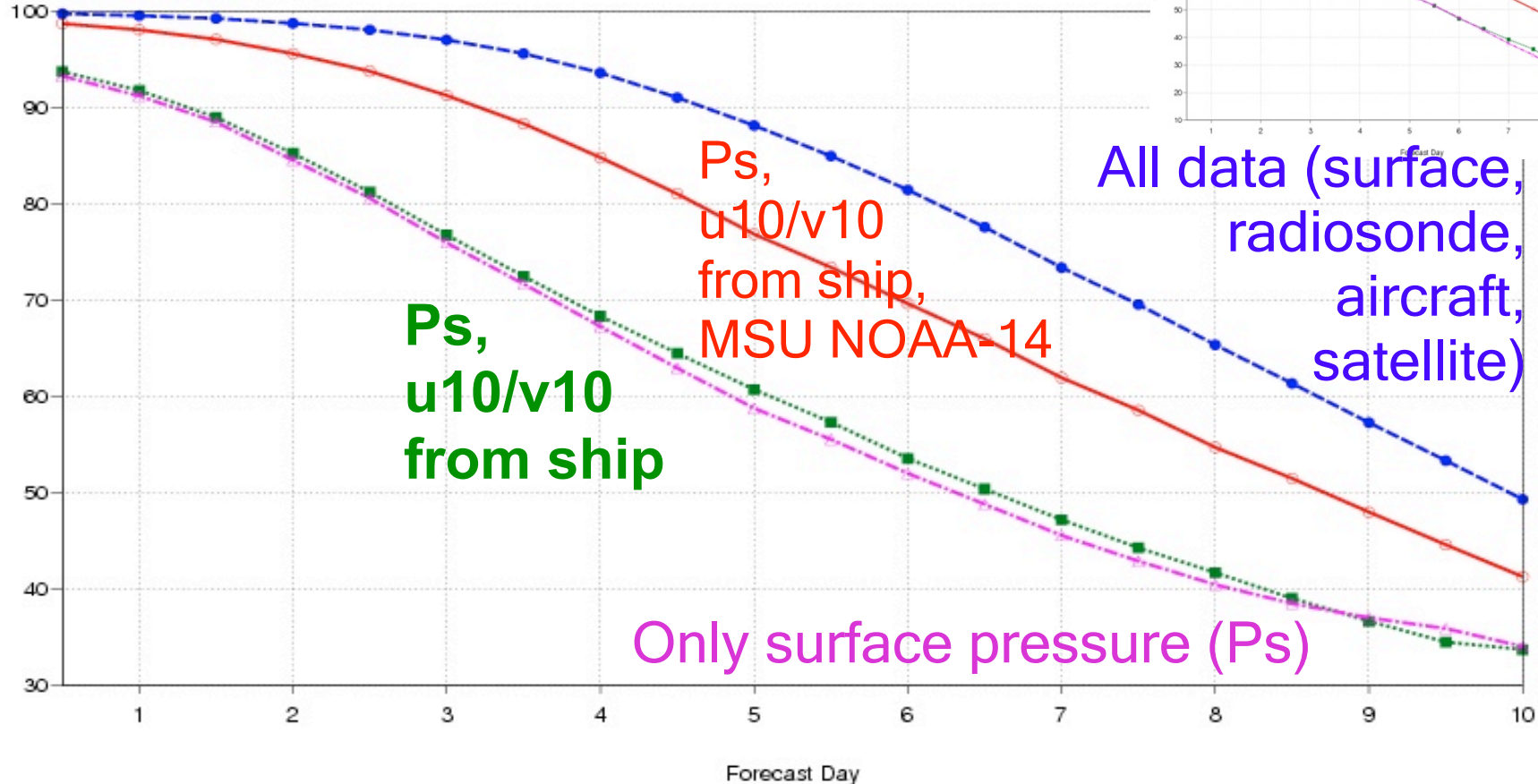
Number of satellite data used, 1 deg x 1 deg, 12-hour count
1 Dec 1978, 00UTC

1 Dec 2011, 00UTC



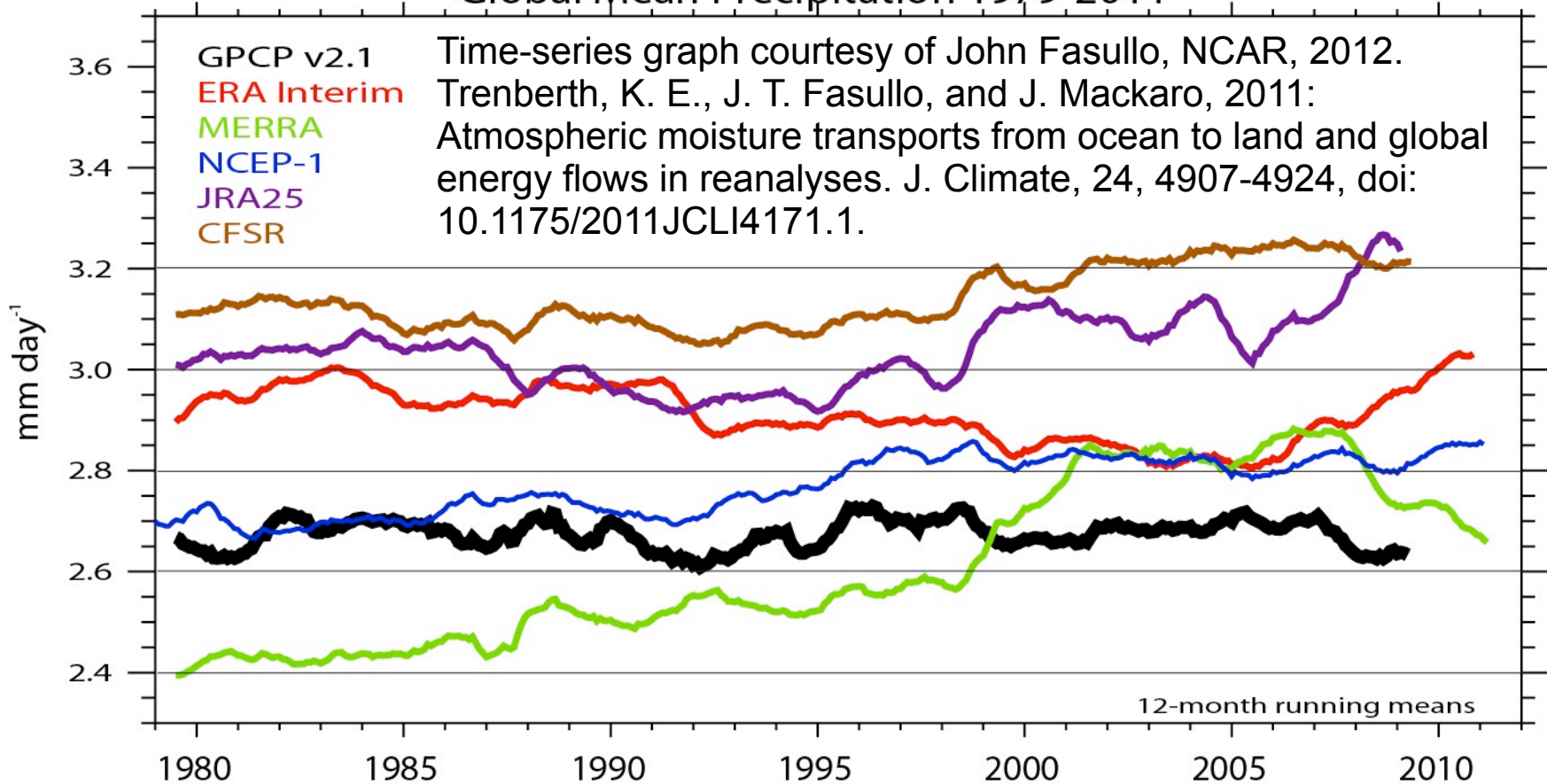
Impact of a single microwave instrument on reanalysis quality (NOAA-14 MSU)

500hPa geopotential
 Anomaly correlation
 NHem Extratropics (lat 20.0 to 90.0, lon -180.0 to 180.0)
 Date: 20040701 00UTC to 20040731 00UTC
 el oper 00UTC | Mean method: fair



Precipitation in reanalyses and GPCP

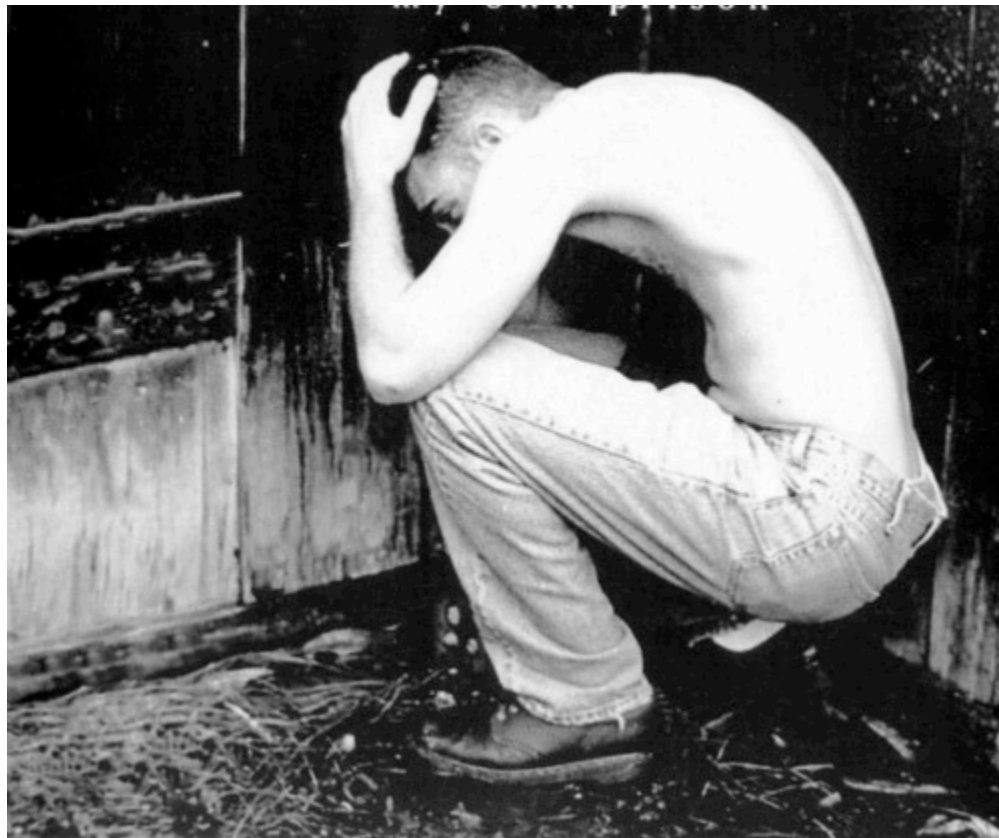
Global Mean Precipitation 1979-2011



ALREADY DISCUSSED THIS WEEK: MANY BREAKS IN THIS TIME-SERIES, DIRECTLY RELATED TO CHANGES IN THE SATELLITE INPUT: ATOVS FOR CFSR AND MERRA, SSM/I FOR ERA-INTERIM

Satellite data assimilator in reanalyses?

(considering reconversion to in-situ-observations-only reanalyses?)



What data were actually used?

Material in this table mostly gathered from papers/websites, but I still asked verification – and found I hadn't gotten it completely right.

Thoughts: need to be more clear to users about what/how/when satellite data are used.

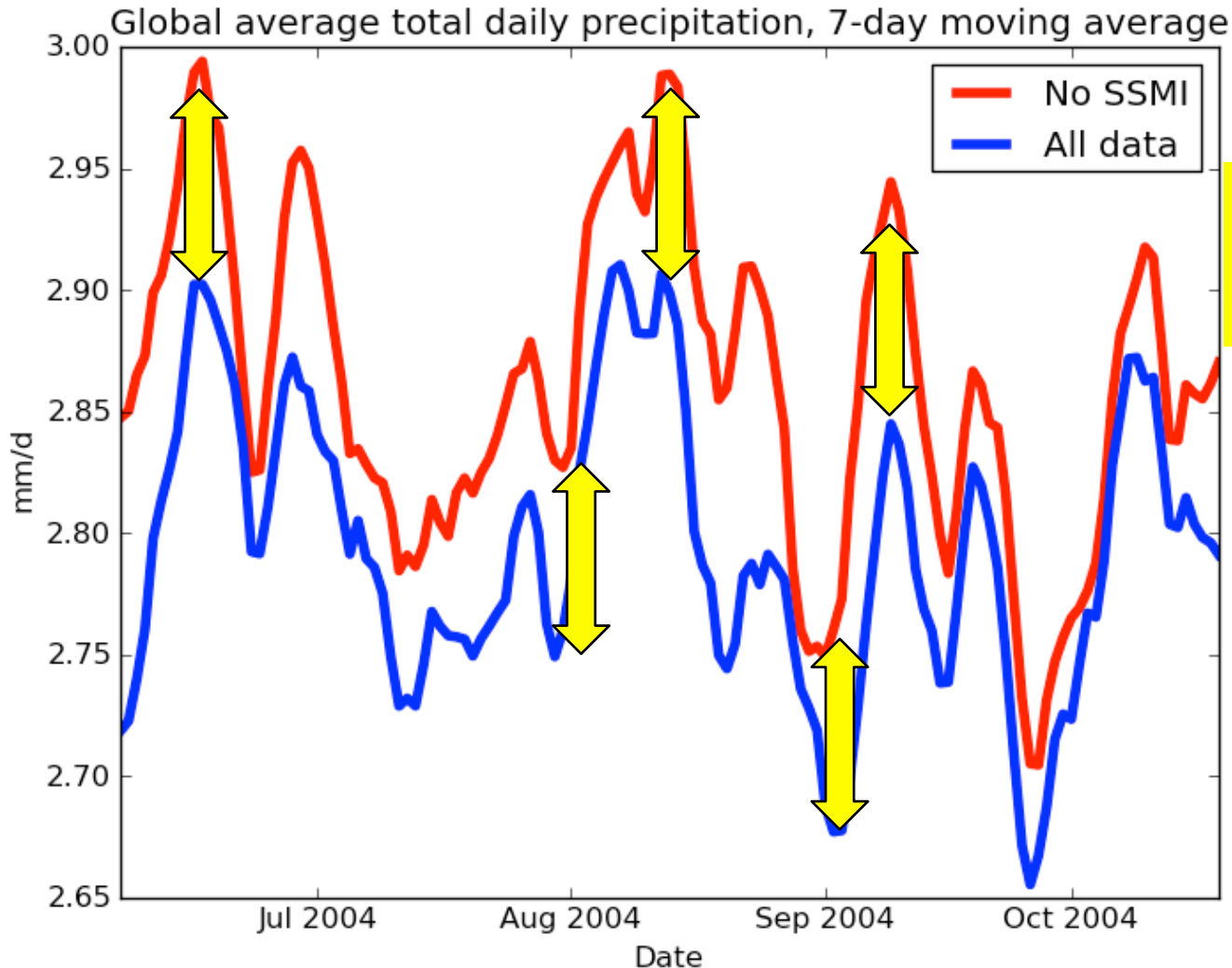
Instrument, Observable	CFRSR	MERRA	JRA-25	JRA-55	ERA-Interim
MSU Radiances	ch. 1,2,3,4 For NOAA-10 to -14, NESDIS SNO corrected calibration coefficients; Exclusions: tighten qc limits in tropics and over high terrain; window test ch. 2	ch. 1,2,3,4 NESDIS SNO corrected calibration coefficients; Exclusions: snow, ice, mixed surfaces for ch. 1, 2	ch. 2, 3, 4 Exclusions: land or rain for ch. 2-3	ch. 2, 3, 4 Exclusions: land or rain for ch. 2, land for ch. 3	ch. 2, 3, 4 Exclusions: land or rain for ch. 2, land for ch. 3
AMSU-A Radiances	ch. 1-13, 15 Exclusions: estimated cloud liquid water large for ch. 1-5, 15; Scattering index too large for ch. 1-6, 15; Channel 4 gross check large for ch. -5, 15; Ch. 6 gross check large for ch. 6, 15; Cloud check for ch. (> 2000m) for ch. 1-5, 15; large fit to emissivity or T _s for ch. 1-5, 15	ch. 1-15 Exclusions: snow, ice, mixed surfaces for ch. 1-6, 15, no offset bias correct for ch. 14	ch. 4-13 Exclusions: sea-ice or land for ch. 4-5, high terrain for ch. 6-7, rain for ch4-6	ch. 4-13 Exclusions: sea-ice or land for ch. 4-5, high terrain for ch. 6-7, rain for ch4-8	ch. 6-14 Exclusions: high terrain for ch. 5-6, rain for ch. 5-7, no offset bias correct for ch14
SSM/I Radiances				ch. 1,3,4,6 Exclusions: land, rain	ch. 1-7 Exclusions: land, rain
AMSU-B / MHS Radiances	ch. 1-6 Exclusions: scattering index too large, channel 1 fit too large, any channel failing gross check, high orography (>2000m).	ch. 1-6 Exclusions: snow, ice, mixed surfaces for ch. 1, 2, 5	ch. 3-5 Exclusions: land, sea-ice, rain	ch. 3-5 Exclusions: land, sea-ice, rain	ch. 3-5 Exclusions: sea-ice, rain, high terrain for ch. 3-4, land for ch. 5
HIRS Radiances	ch. 2-15 Exclusions: Over water wavenumbers > 2400 during day; high orography (> 2000); above model top; only use channels with signal above clouds; surface sensing channels with large difference.	ch. 2-15 Exclusions: land for channels 5-8	ch. 2-7, 11, 12, 14, 15 Exclusions: clouds or land for ch. 4 and above	ch. 2-7, 11, 12, 14, 15 Exclusions: land for ch. 4-7, 11, 14, 15, high terrain for ch. 12, clouds for ch. 3 and above	ch. 2-7, 11, 12, 14, 15. Exclusions: clouds, land for ch. 4-7, 11, 14, 15, high terrain for ch. 12
SSU Radiances	ch. 1,2,3 All channels bias-corrected.	ch.1,2,3 No offset bias correct. for ch.3	ch. 1,2,3	ch. 1,2,3	ch. 1,2,3 No offset bias correct. for ch.3
GEO Radiances	GOES sounder, 5x5 1993-2007, 1x1 2007-	GOES sounder		GOES, METEOSAT, GMS, MTSAT imagers	GOES, METEOSAT, MTSAT imagers
SSM/I Retrievals	Ocean surface wind speed	Ocean surface wind speed, Rain rate	Total column water vapor, Snow cover	Snow cover	Total column water vapor in rainy areas
Imager Upper-air winds	GOES, METEOSAT, GMS, MTSAT, MODIS	GOES, METEOSAT, GMS, MODIS	GOES, METEOSAT, GMS, MTSAT, MODIS	GOES, METEOSAT, GMS, MTSAT, MODIS	GOES, METEOSAT, GMS, MTSAT, MODIS
Scatt Ocean surf. wind	ERS, Quikscat, ACATW	ERS, Quikscat	ERS, Quikscat, ASCAT	ERS, Quikscat, ASCAT	ERS, Quikscat
Ozone Retrievals	SBUV V8 Retrievals	SBUV V8 Retrievals	TOMS, OMI (nudging)	TOMS, OMI (nudging)	TOMS, SBUV, GOME, MIPAS, SCIAMACHY, MLS, OMI
Other notable elements	AIRS, IASI, GPS radio occultation, AMSR-E, reprocessed ERS, reprocessed GMS, AMSU-B NOAA-15	TMI rain rate, AIRS, AMSU-B NOAA-15	Reprocessed GMS from AIRS, ERS, reprocessed GMS, NOAA-15 (not used)	Reprocessed winds from GOES-8/9, reprocessed radiances from GMS/GOES-8/MTSAT, TMI (from US), AIRS-E (from AIRS), GPS radio occultation from GPS/NOAA-15 and later not used	GPS radio occultation, AIRS, S-Band, reprocessed GMS NOAA-15
Input/checked by	J.Woollen, B.Kistler, D.Kleist, J.Derber	R. Gelaro, M. Bosilovich	S. Kobayashi		P. Poli

channels used over land

Had systematic impact in the 2006 ECMWF system

Microwave imager usage improvement: Impact on mean state

in current (2012) ECMWF data assimilation system

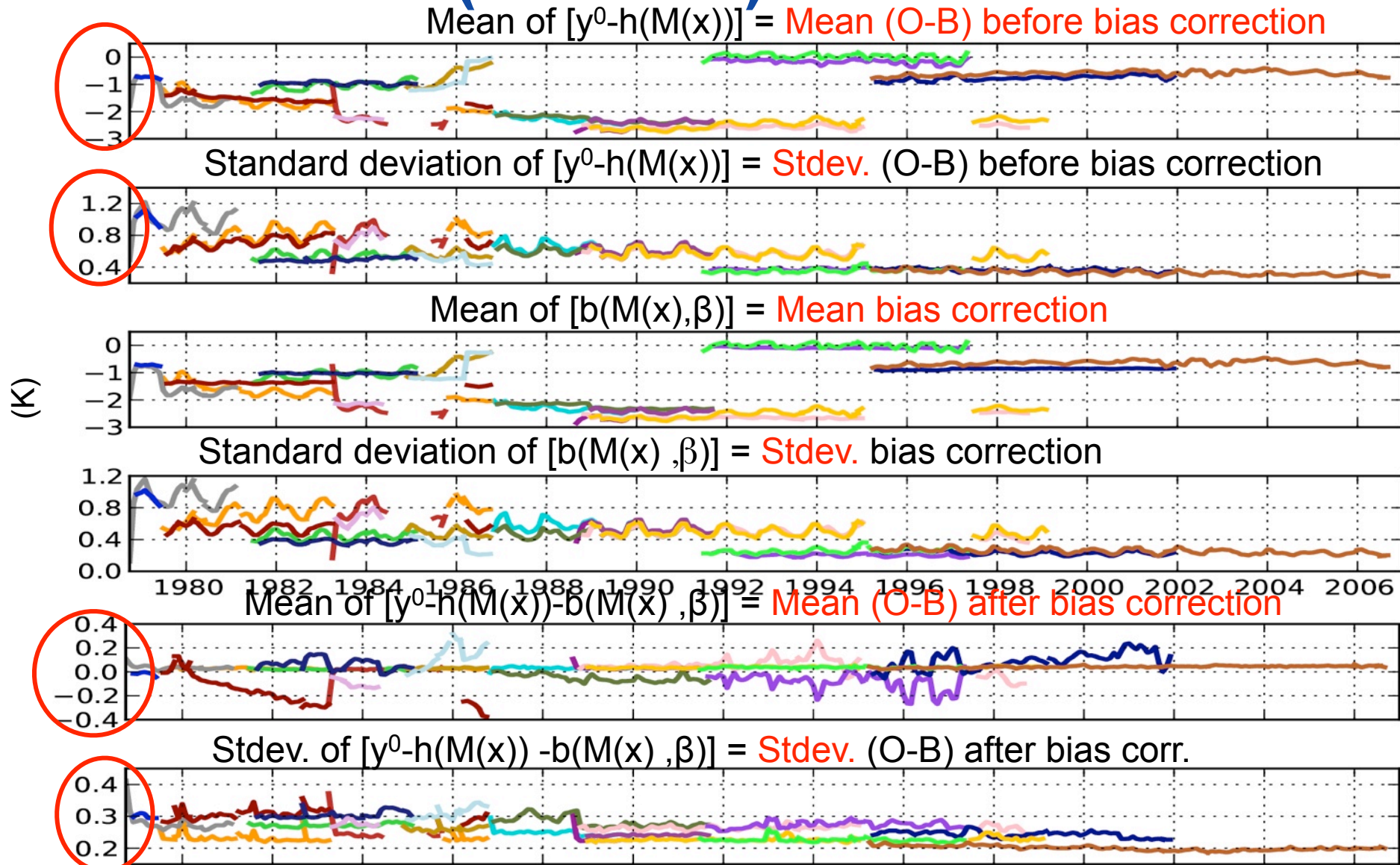


With current ECMWF system: ~0.07 mm/day

In ERA-Interim: was probably ~0.18 mm/day

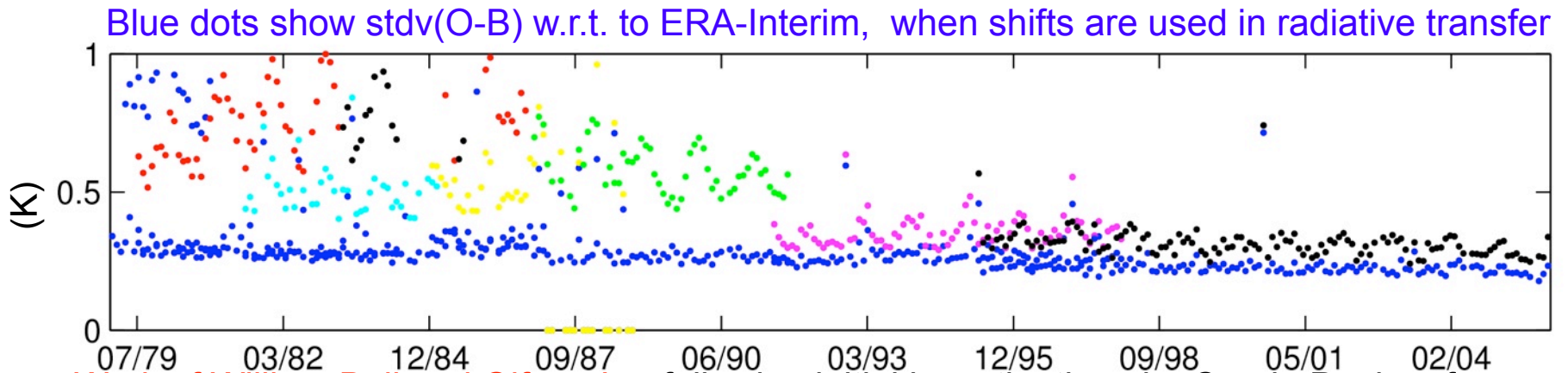
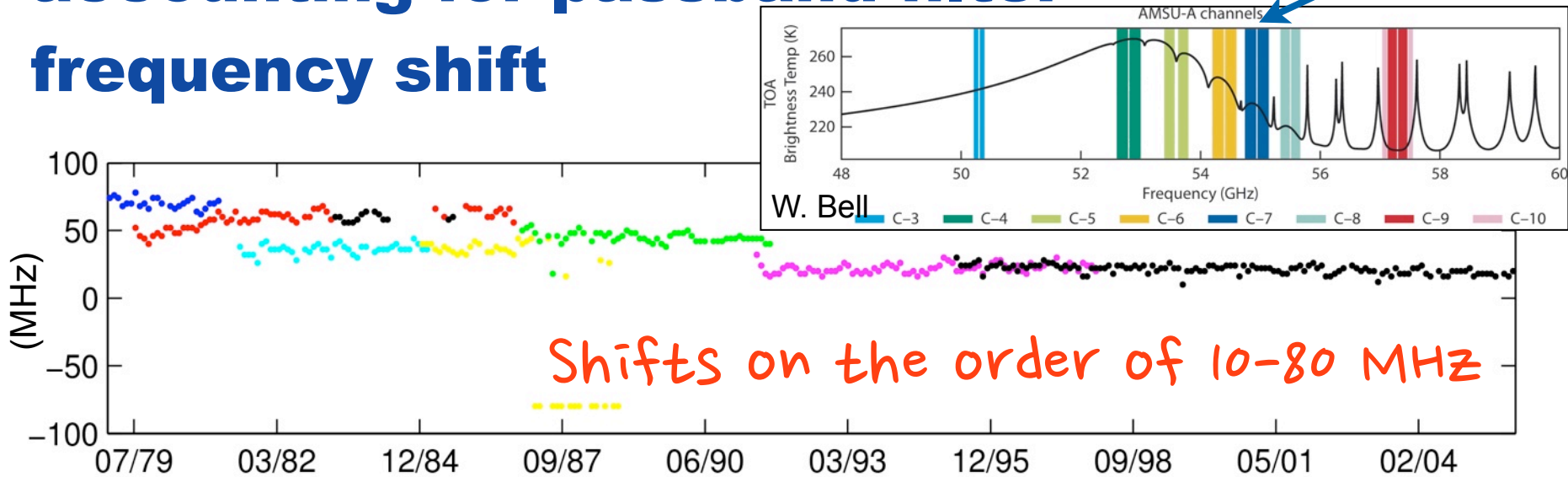
28-year time-series (1979-2006)

MSU channel 3 (a.k.a TTS) w.r.t ERA



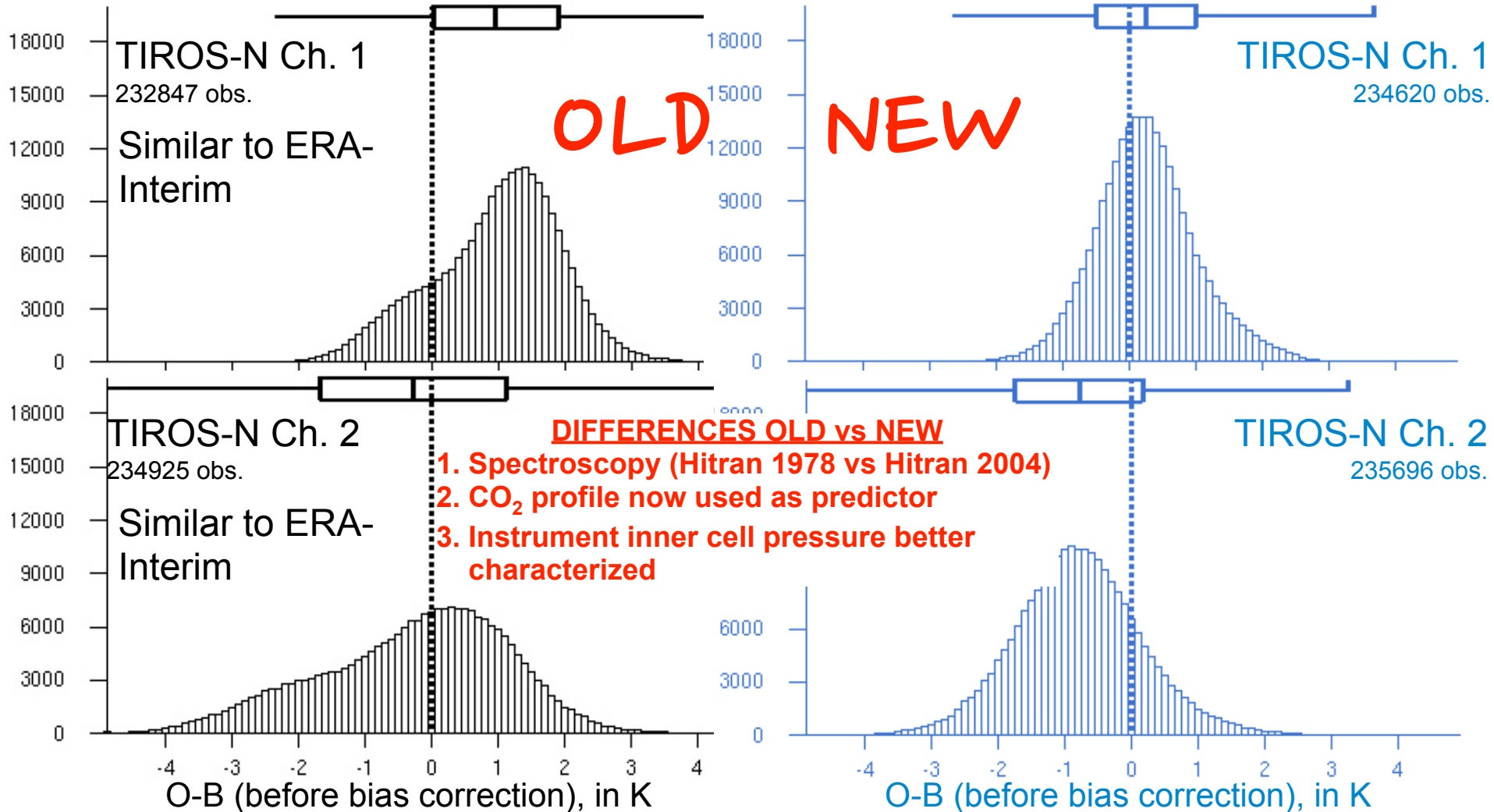
Microwave sounder usage improvement: accounting for passband filter frequency shift

MSU ch. 3



Work of William Bell and Qifeng Lu, following initial investigations by Carole Peubey for EUMETSAT post-MetOp mission specifications

Infrared sounder usage improvement: Stratospheric Sounding Unit

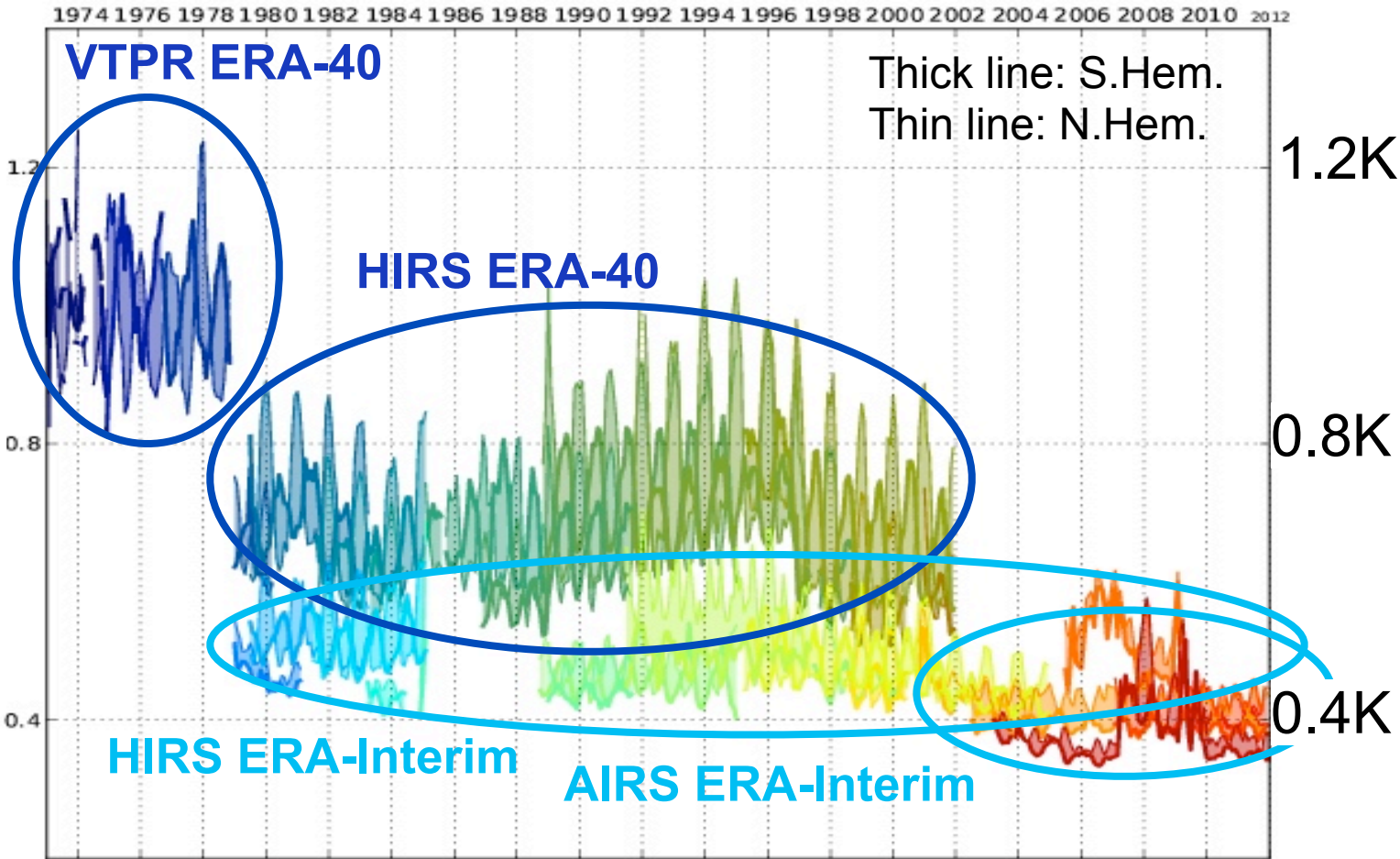


Full assimilation run, 1 Feb 1981 – 17 Mar 1981, ECMWF IFS CY36R4, NWP-SAF RTTOV-10, following work first conducted by S. Kobayashi

39-year time-series (1973-2012)

Infrared channel $\sim 746 \text{ cm}^{-1}$ std. dev. w.r.t. ERA

Stdev(O-B),
without bias
correction (K)



VTPR1, ch.7, 747.65 cm^{-1}
VTPR2, ch.7, 747.55 cm^{-1}
HIRS, ch.6, 748.27 cm^{-1}
AIRS, ch.333 746.01 cm^{-1}

HIRS Ch. 7 or

AIRS Ch. 333

- NOAA-2
- NOAA-3
- NOAA-4
- NOAA-5
- TIROS-N
- NOAA-6
- NOAA-7
- NOAA-8
- NOAA-9
- NOAA-10
- NOAA-11
- NOAA-12
- NOAA-14
- NOAA-15
- NOAA-16
- NOAA-17
- NOAA-18
- METOP-A
- NOAA-19
- EOS-AQUA



39-year time-series (1973-2012) of reanalysis bias corrections, infra-red channel near 746 cm⁻¹

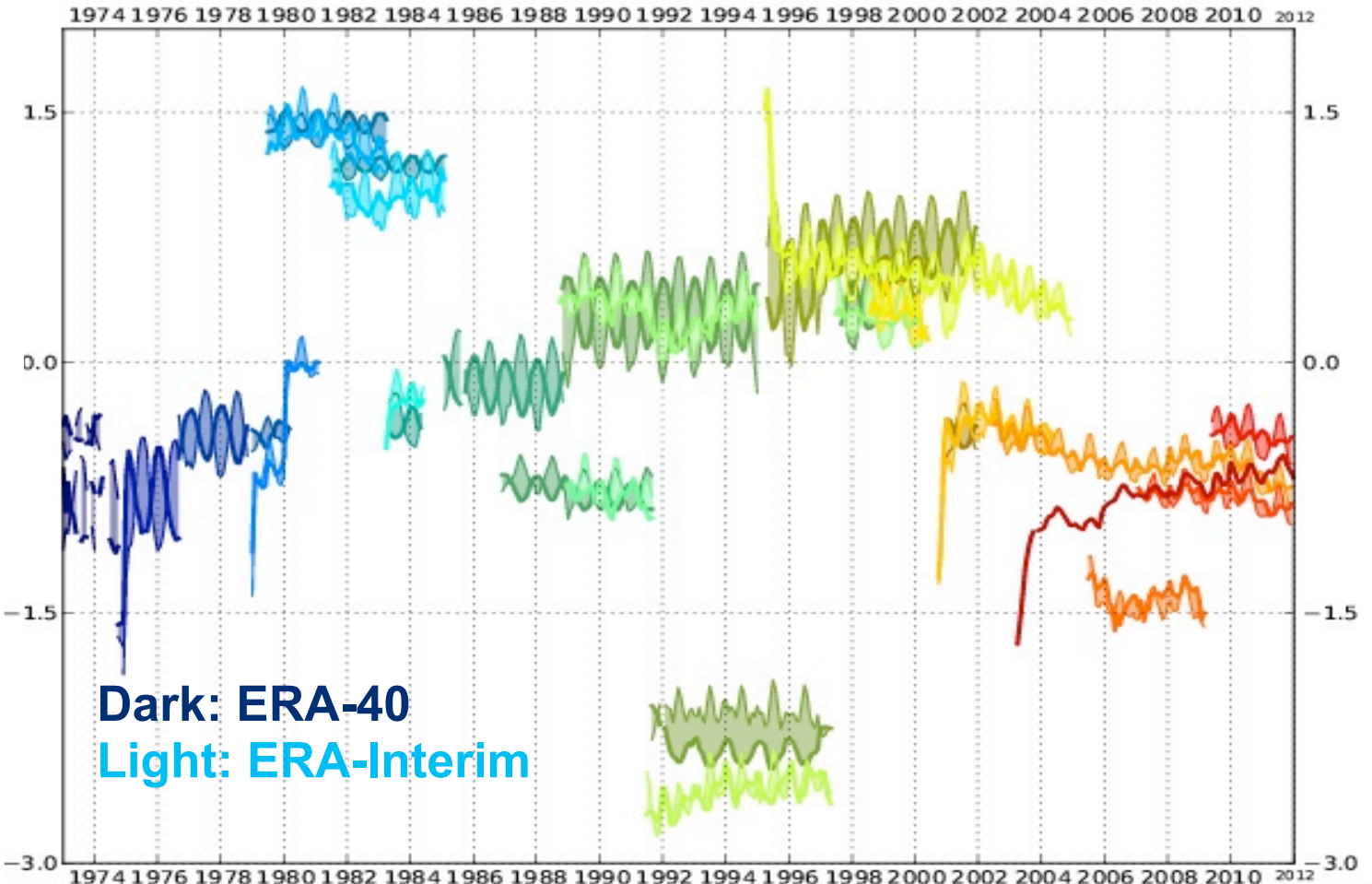
Mean bias correction (K)

VTPR1, ch.7, 747.65 cm⁻¹
 VTPR2, ch.7, 747.55 cm⁻¹
 HIRS, ch.6, 748.27 cm⁻¹
 AIRS, ch.333 746.01 cm⁻¹

HIRS Ch. 7 or

AIRS Ch. 333

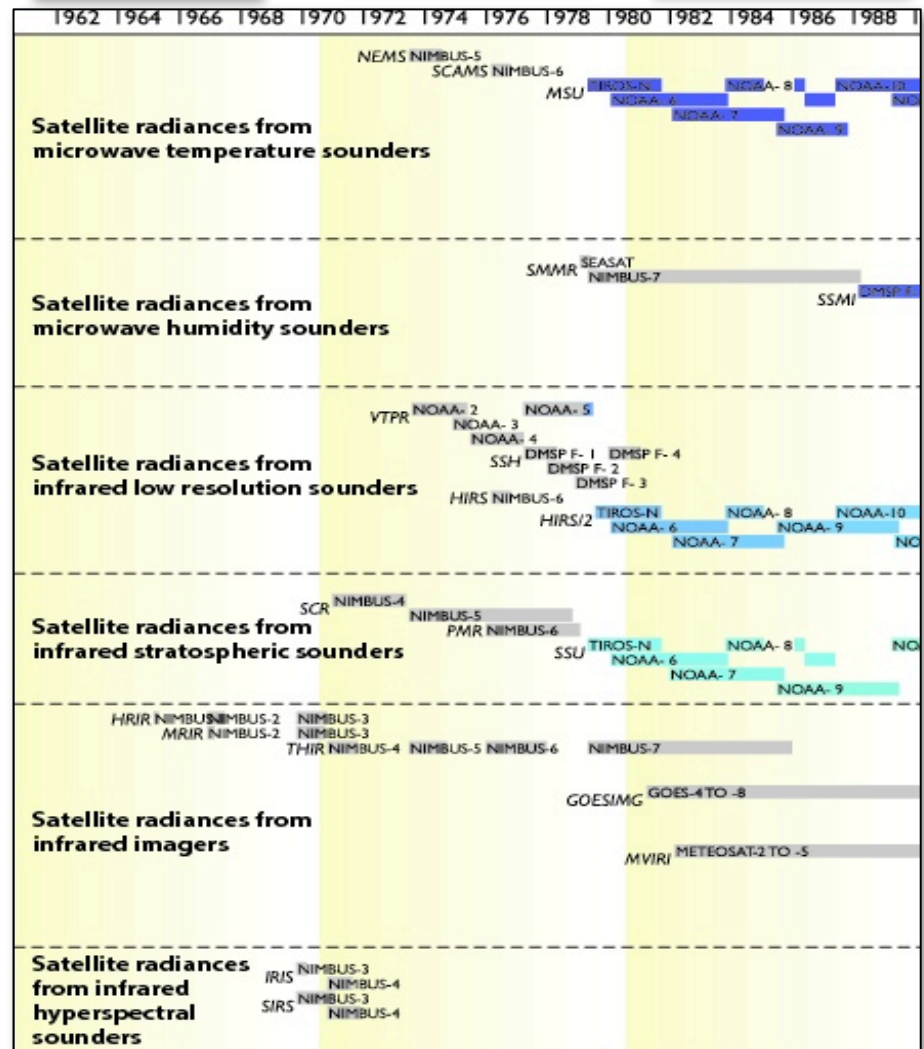
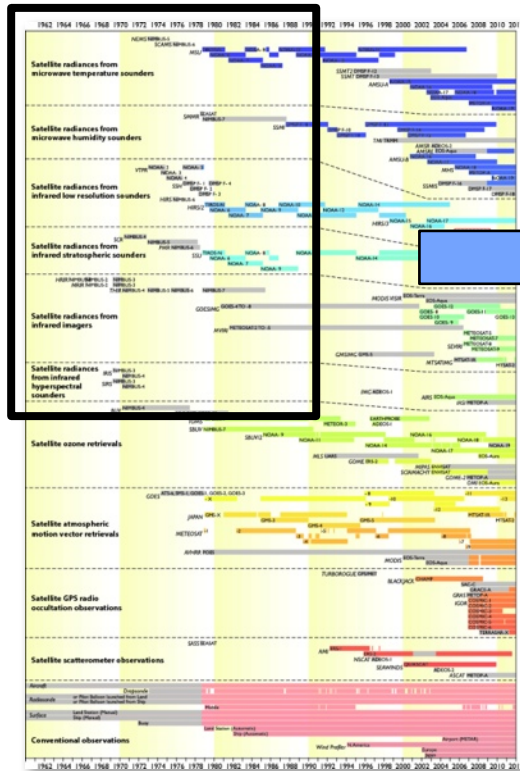
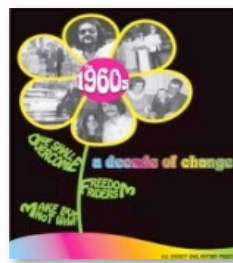
Dark: ERA-40
 Light: ERA-Interim



- NOAA-2
- NOAA-3
- NOAA-4
- NOAA-5
- TIROS-N
- NOAA-6
- NOAA-7
- NOAA-8
- NOAA-9
- NOAA-10
- NOAA-11
- NOAA-12
- NOAA-14
- NOAA-15
- NOAA-16
- NOAA-17
- NOAA-18
- METOP-A
- NOAA-19
- EOS-AQUA



Satellite data since the 1960s



ERA-CLIM study, in collaboration with Met Office: R. Saunders, J. Viju, G. Kelly. See forthcoming talk by R. Saunders

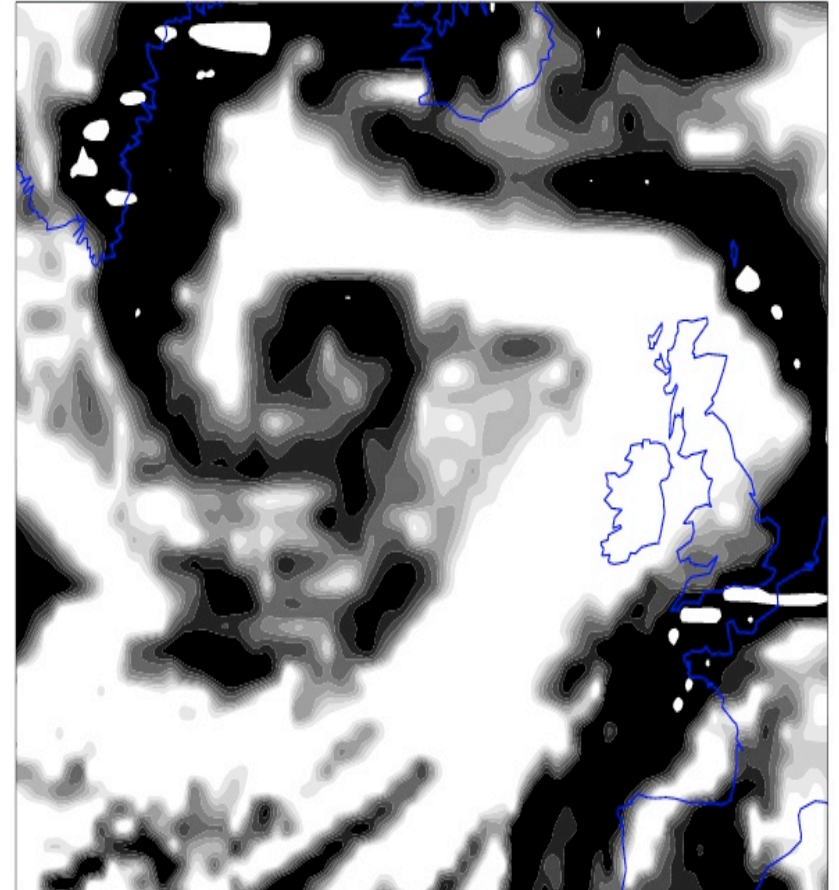
Millions of images, waiting to be assimilated

TIROS-N AVHRR VIS
19 May 1979, 15 UTC



ERA-Interim total cloud cover
19 May 1979, 15 UTC

Saturday 19 May 1979 12UTC ECMWF Forecast I+3 VT: Saturday 19 May 1979 15UTC Surface: Total cloud cover



Questions regarding the future of satellite data use by reanalyses

- Towards *experimental* satellite-focused reanalyses, side-by-side with in-situ-focused reanalyses?
- Towards more assimilation/direct use of raw measurements, and less use of gridded / retrieved products?
- Towards pre-homogenized satellite inputs, side-by-side with efforts to better understand the physical roots of discrepancies between satellite records?
- Towards earlier use of satellite data, as far as the 1960s?

Satellite observations in reanalysis:

Conclusions

- Satellite data used in reanalyses are **of a varied nature**.
- They are **linked to some problems** in modern reanalyses.
- **Satellite data are not the problem.**
- **They are (part of) the solution to our problem,** provided **efforts are made to better use these observations.**
- **Extending the satellite record backwards for reanalysis,** including **reprocessing old data**, would bring new information.
- **International collaboration** is essential to ensure a continuous record of Earth observations from space--
...towards a more balanced share of responsibilities for systematic Earth observation: EU, US, JP, BRICS?