# Observations: data rescue and reprocessing



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### In-situ observations



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Climate Change Outline

- I. Introduction: On the importance of observations in reanalysis
- II. Reanalyze, Rescue, Reprocess
- III. Axes of improvement
  - 1) Improving the availability
  - 2) Improving the quality
  - 3) Improving the usage
- IV. Discussion and conclusions



### Part I. On the importance of observations in reanalysis





### How useful are the observations? Let's look at explained variance

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$$d_b = y^0 - h(x^b) \qquad y^0 = y^t + \varepsilon_0 \qquad d_b =$$

$$EV_b = \frac{Var(y^0) - Var(d_b)}{Var(y^0)}$$

← Explained Variance (in the observations, by the background)

 $\varepsilon_0 - \varepsilon_b - \varepsilon_h$ 

$$EV_b = \frac{\sigma_t^2 + \sigma_0^2 - \sigma_b^2 - \sigma_h^2 - \sigma_0^2}{\sigma_t^2 + \sigma_0^2}$$



Explained Variance Gain

 $EGV = EV_{a} - EV_{b}$ 

Observation departure d

- $v^0$ Observation
- Background X<sub>h</sub>
- Analysis  $\mathbf{X}_{a}$
- **Observation operator** h()
- $v^{\tau}$ Truth in obs. space
- **Observation error E**<sub>0</sub>
- Background error  $\varepsilon_h$
- Representativeness error  $\varepsilon_h$
- Analysis error  $\epsilon_a$
- Standard deviation σ
- Assumed standard deviation σ'

Notes:

- 1. Assuming normal distributions, uncorrelated error sources
- 2. Normalization by assumed obs. error standard deviation,  $\sigma'_0$ , makes it possible to run this diagnostic across variables, across geographical regions, and across vertical levels.

3. For a large data sample, one would hope that  $\sigma_t^2 \gg \sigma_0^2$ (or else the observations would be of little value!)



 $d_b^n = \frac{y^{\upsilon} - h(x^b)}{1 - h(x^b)}$ 



### How useful are the observations? Explained variance gains in ERA5

% Expl. obs. variance









### Part II. Why aren't all observations already online and ready to use?

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Observations were (are) acquired <u>in all cases</u> for specific purpose(s) (*decision making*).

- This purpose was generally not, 'documenting the present for eternity'
- Observations do not escape principles of <u>Intellectual Property</u>
- Observations got lost, or got saved, for a myriad of different reasons.
  - With the notable exception of climatological archives, observations were rarely kept by design, more by circumstance. (e.g., as accepted good practice, as not for any individual to decide on destruction).
  - This lack of intention/long-term planning explains why so many archives got lost when institutions moved or changed guardianship
- Why so little interest in (what is perceived as) "investing in the past"?
  - The phrase says it all. It's about costs and timeliness. (the more) recent and present are the data → (the faster) the reaction time that is expected to handle them in order to make a decision. Conversely, the more distant (the older) the data → the lower the priority
  - However, from a pure cost point of view,
    the expenses of making the observation were already made.
  - <u>Saving</u> what still exists today, only costs a **fraction** of what it did cost at the time to acquire these observations in the first place.
- Unsurprisingly, there are *rather few* large-scale data rescue programmes.
  - But there are many bottom-up initiatives!



US Army signal service, Cape Mendocino (1888) Credits: NOAA

→ For more on this topic:
 Griffin, 2015
 DOI:10.1016/j.grj.2015.02.004





### Data rescue: Four myth-busters

- **X** "Data rescue consists in turning back the clock"
  - ✓ Data rescue consists in placing ancient data in the context of modern data and science.
- **X** "Old data can't possibly teach us anything we don't know already"
  - ✓ Forgotten observations, by definition, cannot have been confronted with present knowledge.
- X "We have many observations today (in digital form), why bother with adding just a few (from analog records)"
  - ✓ Any switchover date (analog to digital records) is an artefact of data management practices (or change in obs. system), and the Earth system may have changed before or after.
- X "Old data with their unknown errors can only corrupt large-sample-statistics obtained from modern data"
  - ✓ The value of observations that all agree is far inferior to that of outliers: these indicate that science needs to be refined.





### Data rescue: One golden priority

## Golden priority: safeguard data "at risk" from complete loss

 e.g., ink fade, discs demagnetization, reading device (often specialized items at the time) obsolescence, destruction (war, earthquake, flood, fire...), unavailability (war, building unsafe, asbestos...), retirement of individuals with unique knowledge of how to read/interpret the data...





### Some data rescue programmes and activities

- Euro-Climhist: weather, climate, phenology, socio-political data, ... Change
  - Atmospheric Circulation Reconstructions over the Earth (ACRE)
  - International Environmental Data Rescue Organization (IEDRO)
  - **NASA:** Nimbus data  $\bullet$
  - US Geological Survey: Landsat data, bird phenology, glaciers, ...
  - Copernicus Climate Change Service Data Rescue Service (C3S)
  - under WMO-IDARE







### Why would an instrument like SSM/T (not used in NWP at the time) help today?





The 2022 GCOS ECVs Requirements

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Overv	Observati lew   Variables	on Requirer	ements Sp sents Layers	Therres	ed Capa Applica	abilities ation Area	Surface-bas	ed Capabilit	ies Analys	is .							Quick Searc	:h
ist	of all R	equir	ements				-											
nis tai	ble shows all re	quirement	It can be sort	ed by clic	king on t	he colum	n headers. The f	iter on the rig	ht allows to di	splay only spe	offo					🗷 Exp	ort × Filter tabl	
id *	Variable 0	t Technical	App Area	C Therr	and Relat	ATP	ty of the attribute	Layen's Quality	Coverage Quality	Stability / decade	Hor Res	Ver Res	Obs Cyc	Timeliness	Coverage 0	Conf	o Source d	Genera Comm
1017	Wind (horizontal)	M MUS	2.5 Atmospher Climate Forcecasti	ic 19	C	1.5	1 m.s <sup>-1</sup> 5 m.s <sup>-1</sup> 10 m.s <sup>-1</sup> 0.5			0.1 m.s <sup>-1</sup> 0.5 m.s <sup>-1</sup> 1 m.s <sup>-1</sup> 0.5	50 km 100 km 3000 km 0.5	1 km 2 km 3 km 0.5	60 min 6 h 24 h 0.5	6 h 18 h 2 d 0.5	Global	fim	GCOS-245: The 2022 ECVs Requirements (GCOS-245)	Requirer for uncer are speci 2-sigma
			and Monitaring															

### WMO OSCAR requirements

These requirements mostly act for new observing systems 'going forward'. However, the GCOS implementation plan 2022 includes several actions to help prepare climate archives for the future:

Theme	Actions	Implementing Bodies											
		OMV	SHM	space agencies	soos	teanalysis Centers	slobal Data Centers	tesearch organizations	Vational Agencies	arties to UNFCCC	kcademia	unding Agencies	scos
A: ENSURING	A1. Ensure necessary levels of long-term funding support for in situ networks, from observations to data	x	x	<i>.</i> ,				x	~		x	x	x
SUSTAINABILITY	delivery												
	A2. Address gaps in satellite observations likely to occur in the near future			х			_						
	A3. Prepare follow-on plans for critical satellite missions			х									
B: FILLING DATA GAPS	B1. Development of reference networks (in situ and satellite Fiducial Reference Measurement (FRM) programs)	x	х	х				x				х	x
	B2. Development and implementation of the Global Basic Observing Network (GBON)	x	х		х								x
	B3. New Earth observing satellite missions to fill gaps in the observing systems			х									
	B4. Expand surface and in situ monitoring of trace gas composition and aerosol properties		x					x	x			х	
	B5. Implementing global hydrological networks	x	x	х			x						
	B6. Expand and build a fully integrated global ocean observing system		х	х	х			x	x		х		
	B7. Augmenting ship-based hydrography and fixed-point observations with biological and biogeochemical				х			х					
	parameters						_						
	B8. Coordinate observations and data product development for ocean CO <sub>2</sub> and N <sub>2</sub> O	х			х			х	x				
	B9. Improve estimates of latent and sensible heat fluxes and wind stress		х	х	х		_	x			х		
	B10. Identify gaps in the climate observing system to monitor the global energy, water and carbon cycles							x				X	X
	C1. Develop monitoring standards, guidance and best practices for each ECV	x		х	х		_						x
DATA QUALITY,	C2. General improvements to satellite data processing methods			х				X			X		
	C3. General improvements to in situ data products for all ECVs		х				_	x			x		
	C4. New and improved reanalysis products			X		X					х		
REPROCESSING	C5. ECV-specific satellite data processing method improvements			x		x							
D: MANAGING	D1. Define governance and requirements for Global Climate Data Centres	х					x						х
DATA	D2. Ensure Global Data Centres exist for all in situ observations of ECVs	x	х		х				×			х	x
	D3. Improving discovery and access to data and metadata in Global Data Centres						x					х	х
	D4. Create a facility to access co-located in situ cal/val observations and satellite data for quality assurance of satellite products	x	x	х				x					
	D5. Undertake additional in situ data rescue activities	x	x							x		х	х
E: ENGAGING WITH	E1. Foster regional engagement in GCOS	x			х					х			x
COUNTRIES	E2. Promote national engagement in GCOS		х							х	х		х
	E3. Enhance support to national climate observations									х		х	х
F: OTHER	F1. Responding to user needs for higher resolution, real time data	x	х	х				x			х		x
EMERGING NEEDS	F2. Improved ECV satellite observations in polar regions			х				x			х		
	F3. Improve monitoring of coastal and Exclusive Economic Zones		х	х	х			x			х		
	F4. Improve climate monitoring of urban areas	х	х					х	х		х		x







### Metrics for measuring observation density

- WMO OSCAR and GCOS requirements:
  - Target horizontal resolution (as a distance, in km),
  - Target observation cycle (as a time difference, in hours)

every 6 hours

- Per variable, per application, and for several levels (threshold or target / breakthrough / goal)
- Looking at these, the following 'key levels' are retained: *example for surface pressure*

1 obs every 1° (111 km), 1 obs every 2° (222 km),

~GCOS breakthrough

### ~GCOS target



• We count as "1" each bin that has <u>at least</u> one observation. Otherwise, that bin counts as "0".

→ Doing this over all possible bins in a month yields monthly percentage of coverage, for a given target resolution.

every 3 hours









![](_page_16_Figure_0.jpeg)

![](_page_17_Picture_0.jpeg)

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Reanalyses for 27 February 1903 at 09:00 UTC

![](_page_17_Figure_2.jpeg)

![](_page_17_Picture_3.jpeg)

![](_page_18_Picture_0.jpeg)

### Merging archives: more complex than it seems, but well worth the effort

## 2018 merged datasets: CORA and EN4

![](_page_18_Figure_4.jpeg)

### DOI:10.17882/46219

![](_page_18_Picture_6.jpeg)

OCEAN

TAC

Lower line show CORA alone, upper line show CORA + EN4 (after CORA data removed). Shaded areas show the improvement in terms of number of profiles

N.B. data is cleaned from duplicates

the Horizon 2020 Framework Programme

Credits: Copernicus Marine Environment **Monitoring Service** 

![](_page_18_Picture_11.jpeg)

![](_page_18_Picture_12.jpeg)

![](_page_19_Picture_0.jpeg)

### Part III.2: Processes to obtain more (better) observations

## "Data reprocessing"

Observations were shared (or saved) fully

Observations were partially shared

Observations were not shared at all. But they are available 'somewhere'. Apply new processing methods, possibly with higher yield

> Identify gaps within existing data series

Find original sources and exploit them from scratch

"Data rescue"

![](_page_19_Picture_10.jpeg)

## Improving geolocation quality: reprocessing drifting buoy trajectories

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![](_page_20_Figure_1.jpeg)

Credits: Rodriguez and Rannou, 2022. https://doi.org/10.13155/92124 Copernicus In Situ EEA C-RAID project

![](_page_21_Figure_0.jpeg)

European Space Operations Centre in 1978 (<u>credits: ESA</u>)

Credits: EUMETSAT (C3S)

 $\rightarrow$  Differences on the order of 1-2 pixels, i.e. 5-10 km

![](_page_21_Picture_3.jpeg)

![](_page_22_Figure_0.jpeg)

Credits: EUMETSAT (C3S)

![](_page_23_Figure_0.jpeg)

![](_page_24_Picture_0.jpeg)

### Recovering data from a 'forgotten' instrument: DMSP SSH

- Example with the Special Sensor H, also known as Multichannel Filter Radiometer (MFR), flown on 4x DMSP block 5D-1 satellites F-1 to F-4 (1976-1980)
- Important sensor to potentially improve reanalyses in the late 1970s •
- Issue: the data documentation is inconsistent about channel ordering •

![](_page_24_Figure_6.jpeg)

![](_page_25_Picture_0.jpeg)

### DMSP SSH sampling: F1 1977/06/20

Data encoded with FRAMIS database running on VAX 11/780 computer with a VMS operating system. NASA restored the data from ageing tapes. Acknoweldgements to the Nuclear Energy Agency (NEA) of the Organisation for Economic Co-operation and Development (OECD) for having kept a copy of this code.

![](_page_25_Picture_3.jpeg)

Radiance in the original data (for all channels)

B.T. in the original data, but for a few channels <u>only</u>, e.g., window channel

![](_page_25_Figure_6.jpeg)

![](_page_25_Figure_7.jpeg)

![](_page_25_Figure_8.jpeg)

### Using ERA5, simulation of the FORUM instrument at 0.3 cm<sup>-1</sup> resolution

![](_page_26_Figure_1.jpeg)

- Correlate the simulated radiances with the observed radiances
  - For each simulated FORUM channel (100-1600 cm<sup>-1</sup>)
  - Results in blue
- Repeat this after applying a window check for cloud detection
  - Obs Calc in the range [-2K,3K]

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Results in orange

## Zoom on high correlations [0.95 – 1.00]

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![](_page_27_Figure_2.jpeg)

## We may then figure out a "most likely" wavenumber

Then, given the limited number of expected wavenumbers from documentation (16), we can find the most likely channel width by applying a moving average of varying width

Beware not to over-interpret the results, given biases in the R.T. simulations!

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![](_page_28_Picture_0.jpeg)

### SSH wavenumbers estimated from simulations

### Nominal Estimated, by comparing with FORUM simulations using ERA5

Satellite	tellite F1			F2		F3	F4			
	<u> </u>		_	_	_	_	_	_		
Channel	$\nu_N$	$\nu_E$	$\nu_N$	$\nu_E$	$\nu_N$	$\boldsymbol{\nu}_E$	$\boldsymbol{\nu}_N$	$\boldsymbol{\nu}_E$		
1	354	347± 4	355	346± 4	353	346± 2	353	346± 2		
2	356	424±10	356	361± 6	356	424± 9	355	346± 4		
3	373	380± 6	373	362± 8	374	362± 3	375	362± 4		
4	398	390± 9	399	405± 1	399	381±6	399	390±10		
5	410	409±10	407	410±10	410	411±10	409	410±10		
6	418	428± 4	419	390± 4	419	390± 9	419	405± 2		
7	442	439± 5	442	428± 4	444	428± 4	442	428± 4		
8	-	-	534	534± 5	535	534± 6	535	534± 6		
9	669	669± 4	669	670± 1	669	669± 2	668	669± 2		
10	678	673±10	678	680± 0	678	673±0	679	673± 0		
11	694	695± 3	694	694± 5	694	694± 5	694	694± 0		
12	708	708± 0	707	707± 2	708	708± 2	707	707± 6		
13	726	725± 9	724	724± 6	725	725± 8	724	724± 5		
14	747	746± 0	746	746± 2	748	748± 9	749	749± 7		
15	839	900± 6	835	900± 6	834	900± 0	835	900± 5		
16	1020	1025± 6	1019	1020± 4	1020	1024± 8	1021	1021± 3		
Dates	-	19770702,	19780825	, 19790825	19780825	, 19791212		19790825		
		19770421						19791212		
All		90,418		96,649		66,801		116,358		
Clear		16,210		17,700		11,238	20,			

![](_page_28_Picture_4.jpeg)

![](_page_28_Picture_5.jpeg)

![](_page_29_Picture_0.jpeg)

### Part III.3: Improving how the observations are used: in situ data location

- Station positions: latitude, longitude, elevation. Difficulties:
  - 1. Referentials have changed over time. Now it is rather stable: WGS84 for latitude, longitude. Still no unique referential for vertical (EGM96 or EGM2008...). However, differences get generally to be small (e.g., RMS 0.5 m between these two)
  - 2. Precision of encoding. Now WMO mandates 0.001 degrees for metadata but is has not always been the case.
  - 3. Stations have physically moved. Actual position changes were sometimes not propagated in the data at the same time.
  - 4. And all this is saying nothing of the installation of instrumentation itself
- Example: International Surface Pressure Databank v4.7: DOI:10.5065/9EYR-TY90, (Compo et al., 2019) Comparison of land stations' altitudes with ETOPO2022 DOI:10.25921/fd45-gt74 (NOAA NCEI, 2022): dataset combining elevation over land and bathymetry over ocean
  - Enables better to spot differences between stations altitudes (often near sea-level) and the bedrock bathymetry.
  - Suspicous land stations from 1940:

![](_page_29_Figure_10.jpeg)

red = 466 locations with nearest coastline at least 50 km away; orange = 58 locations with nearest coastline between 20 and 50 km away; blue = 60 locations with nearest coastline within 20 km ;

green = 16 locations over a land mass but max. elevation reported to be at least 10 meters minus below sea-level)

Looking at <u>each site</u>, one finds:

Confirmed locations of **moored buoys, met. ships, or ocean platforms** (~85) Several stations sometimes positioned at **(0,0)** 

several stations sometimes positioned at (0,0) exactly, for a short part of the record Stations with a matching name found by swapping the sign of the latitude or longitude (or both), or by changing a single digit in latitude or longitude (~55)

![](_page_29_Picture_16.jpeg)

### Confirmation of 'better' locations: Assimilation of wrong & corrected positions

![](_page_30_Figure_1.jpeg)

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Considering all data: Easy to see which one has the wrong vs corrected position...

ECMWF IFS, June 1980

	(Lat, Lon), and Estimated sigma_o (and number of assimilated data)							
Station	Original location	Modified location						
"GELA"	(37N, 14W) 1.23 hPa (12)	(37N, 14 <b>E</b> ) 0.50 hPa (190)						
"OSAN AB"	(37N, 127 <b>W</b> ) 0.67 hPa (12)	(37N, 127 <mark>E</mark> ) 0.43 hPa (222)						
"GRAFENWOEHR"	(50N, 12 <b>W</b> ) 1.83 hPa (5)	(50N, 12 <b>E</b> ) 0.26 hPa (16)						

### Wrong position:

- ➔ Many data rejected
- ➔ Still quite a few data assimilated!

Corrected position:

- ➔ More data assimilated
- ➔ Reduced sigma\_o estimate

![](_page_30_Picture_11.jpeg)

![](_page_31_Figure_0.jpeg)

If the changes in the satellite viewing angle are 'large enough' to be visible (and explained) in differences between simulations, then it will quite likely propagate into regional applications - unless it is corrected, or accounted for, somehow...

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Credits: EUMETSAT (C3S)

### Using uncertainty information to avoid 'bad' time periods

![](_page_32_Figure_1.jpeg)

![](_page_33_Figure_0.jpeg)

experiment >>

See also webinar by Ingleby

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Desroziers et al. (2005),

DOI:10.1256/qj.05.108

ERA5 (K). The difference between non-displaced (or base) sonde statistics (in orange) and displaced-sonde statistics (in red) is shown in purple. The positive values indicated by the purple line correspond to improvements, i.e., higher consistency between the sonde observations and ERA5.

Data from Vienna Hohe Warte, Austria.

Credits: Haimberger, Voggenberger, Ambrogi, 2023. UNIVIE (C3S)

![](_page_34_Figure_0.jpeg)

### Using early hyperspectral sounder on Nimbus-4 (1970)

![](_page_34_Figure_2.jpeg)

- Operated on Nimbus-4, from April 1970 January 1971
- Nadir only observations. Coverage to 80°N to 80°S
- Spectral range 400 1600 cm<sup>-1</sup>, resolution: 2.53 cm<sup>-1</sup> to 2.69 cm<sup>-1</sup>
- 94 km footprint, 13 s measurement time
- Assimilation experiment: TCO399 (25 km res.), L137, 01 June 12 Aug 1970
- 60 CO<sub>2</sub> temperature sounding channels actively assimilated (624 706 cm<sup>-1</sup>)
- Diagonal errors: R = 1.0K, VarBC: Offset and 4 thickness predictors
- McNally & Watts cloud detection, parameters from Poli & Brunel (2016)
- IRIS RTTOV coefficients include several advanced effects (spectral shift, numerical apodisation, self-apodisation due to finite field-of-view...)

![](_page_34_Figure_12.jpeg)

![](_page_35_Picture_0.jpeg)

### Part IV. Is there more to do? Example of 'never-shared data': Unterseebooten

![](_page_35_Picture_2.jpeg)

Data source: Records from the German Naval Archives microfilmed by the United States Navy, Office of Naval Intelligence (ONI) at the Admiralty, London. "Kriegestagebuch der Unterseebootes U 85, Kommandant Greger". PG 30079, National Archives Microfilm Publication T1022, roll 2932.

![](_page_35_Picture_4.jpeg)

![](_page_36_Picture_0.jpeg)

### How would such an observation help?

ERA5 mean-sea-level pressure (black contours) and 2-m temperature (colors) on 15 Jan 1942, 03 UTC

![](_page_36_Figure_3.jpeg)

- 20

![](_page_37_Figure_0.jpeg)

![](_page_38_Picture_0.jpeg)

### Conclusions

- The pool of past observations is **finite**, and **at risk** -- until secured in modern archives
- Getting out of this loop requires **long-term data management planning** (e.g., ISO/TC 171/SC 1 on "Quality, preservation and integrity of information")
- Citizens' science allows to widen the effort base towards data rescue
- Assembling datasets requires consolidating the information gained over time, keeping traceability to the sources, learning from other efforts, with pre-assimilation feedback, post-assimilation observation feedback exchange, and sharing of issues found
- Data reprocessing allows to extract more information from previous records
- Importance of **quantifying the impact**: Value Of Information (Weatherhead et al., 2017)
- Planning future new systems:
  - Data assimilation systems, radiative transfer models: support 'old' obs. (e.g., EUMETSAT NWP-SAF RTTOV)
  - **Observing systems**: long-term data management incl. reprocessing, GCOS requirements, high calibration standards

![](_page_38_Picture_11.jpeg)

![](_page_38_Picture_12.jpeg)

# Observations: data rescue and reprocessing

![](_page_39_Picture_1.jpeg)

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Thank you for your attention!

![](_page_39_Picture_4.jpeg)

![](_page_39_Picture_5.jpeg)