



Climate Change

## The importance of GNSS Radio Occultation data in the ERA5 global reanalysis

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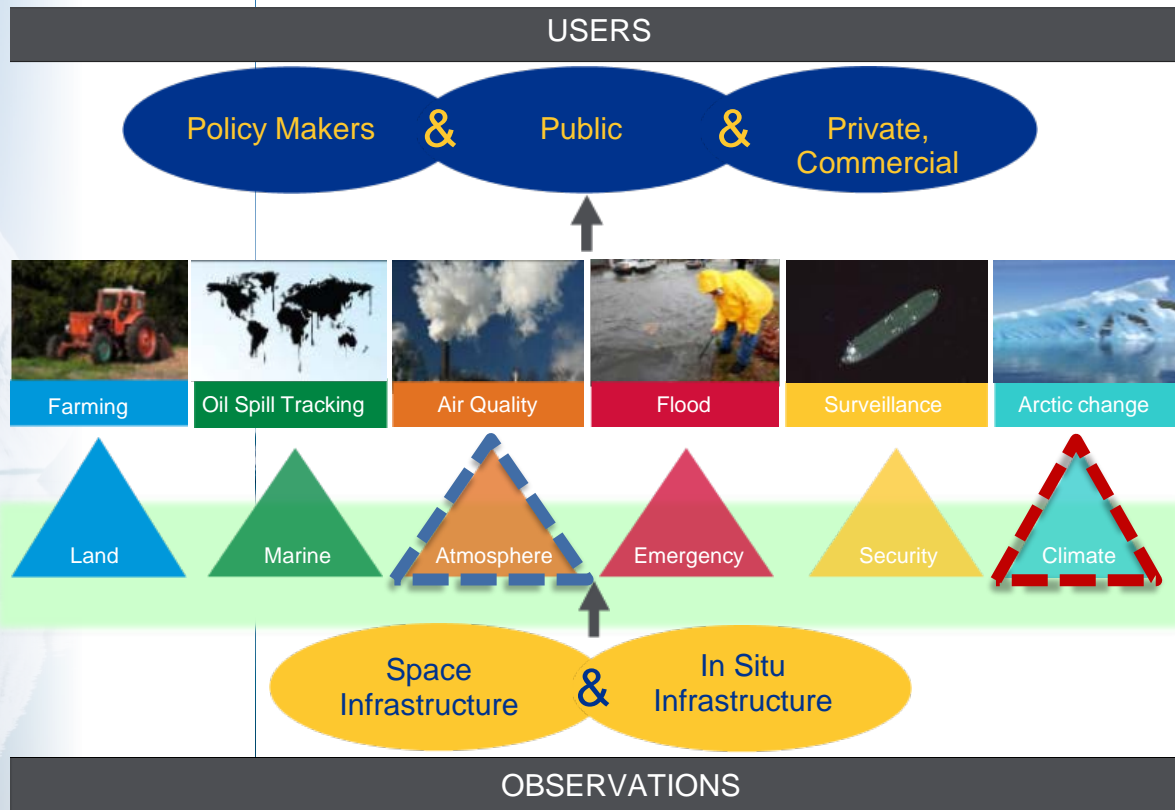
## Overview

- **Copernicus services**
- ERA5 configuration and performance
- The usage of GNSS-RO data
- Importance of GNSS-RO data
- Final remarks



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# The Copernicus Climate Change Service



Different Needs

Examples of areas covered

6 Information Services

Sustainable observation capabilities

ECMWF operates the **Copernicus Climate Change Service (C3S)** and **Copernicus Atmosphere Monitoring Service (CAMS)** on behalf of the European Commission.





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## The ERA5 global reanalysis

### ERA5 is in production at ECMWF for C3S

Atmosphere, land, ocean waves

#### *ERA5 has replaced ERA-Interim*

(ERA-I was stopped end August 2019)

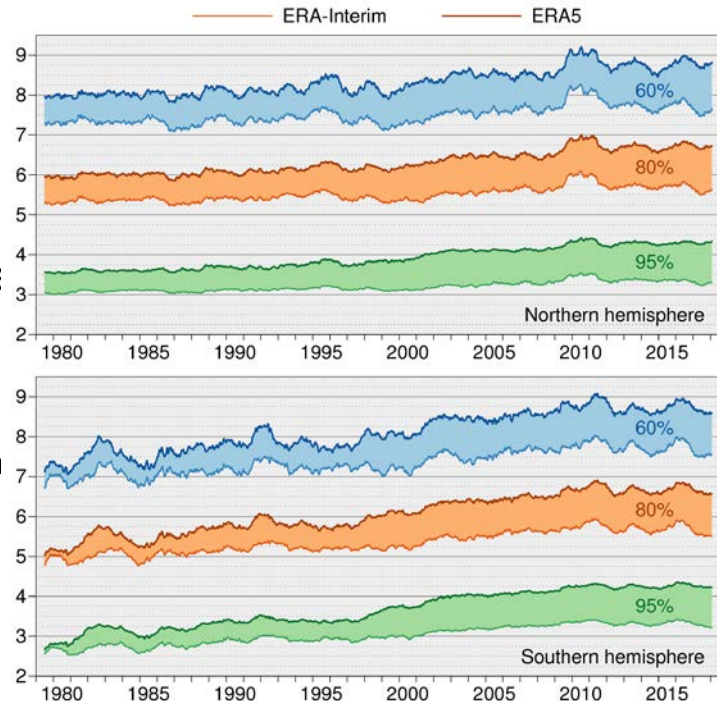
#### Improvements compared to ERA-Interim:

- Benefit from 10 years model development (2006 to 2016)
- Much higher resolution; **31km** versus 80km
- More and better input data
- **Hourly output**
- 10-member EDA-based **uncertainty estimate** (at 63km)
  - Perturbations to: SST, model tendencies & obs
- Will reach further back in time (1950 versus 1979)

#### Climate Data Store public release plan:

- **Published to date: Jan 1979– June 2019**
- **End 2019:** updates 2-5 days behind real time: **ERA5T**
- **Q2 2020: 1950-1978.**

Range (days) when 365-day mean 500hPa height AC (%) falls below threshold

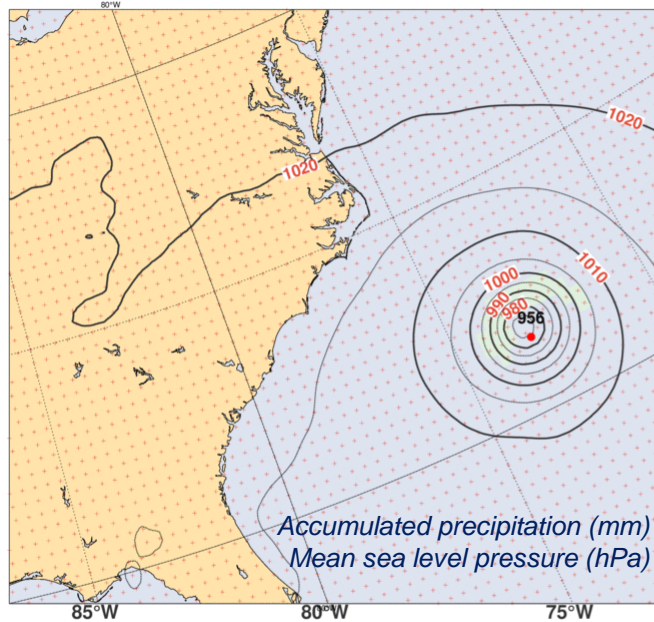




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Better model, more and better observations, higher resolution, hourly output

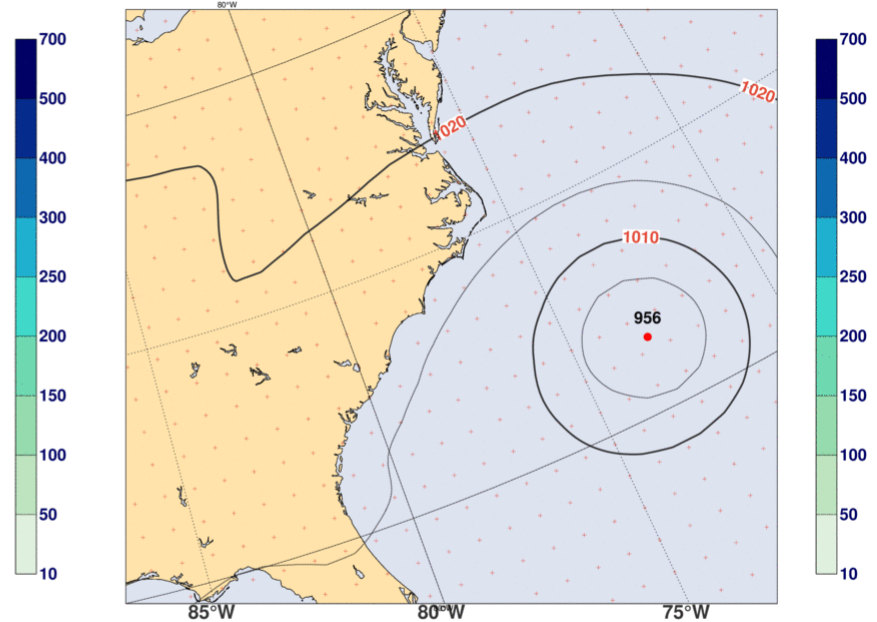
Florence Thu 13 Sep 2018, 01 UTC for ERA5



**ERA5**



Florence Thu 13 Sep 2018, 01 UTC for ERA-Interim



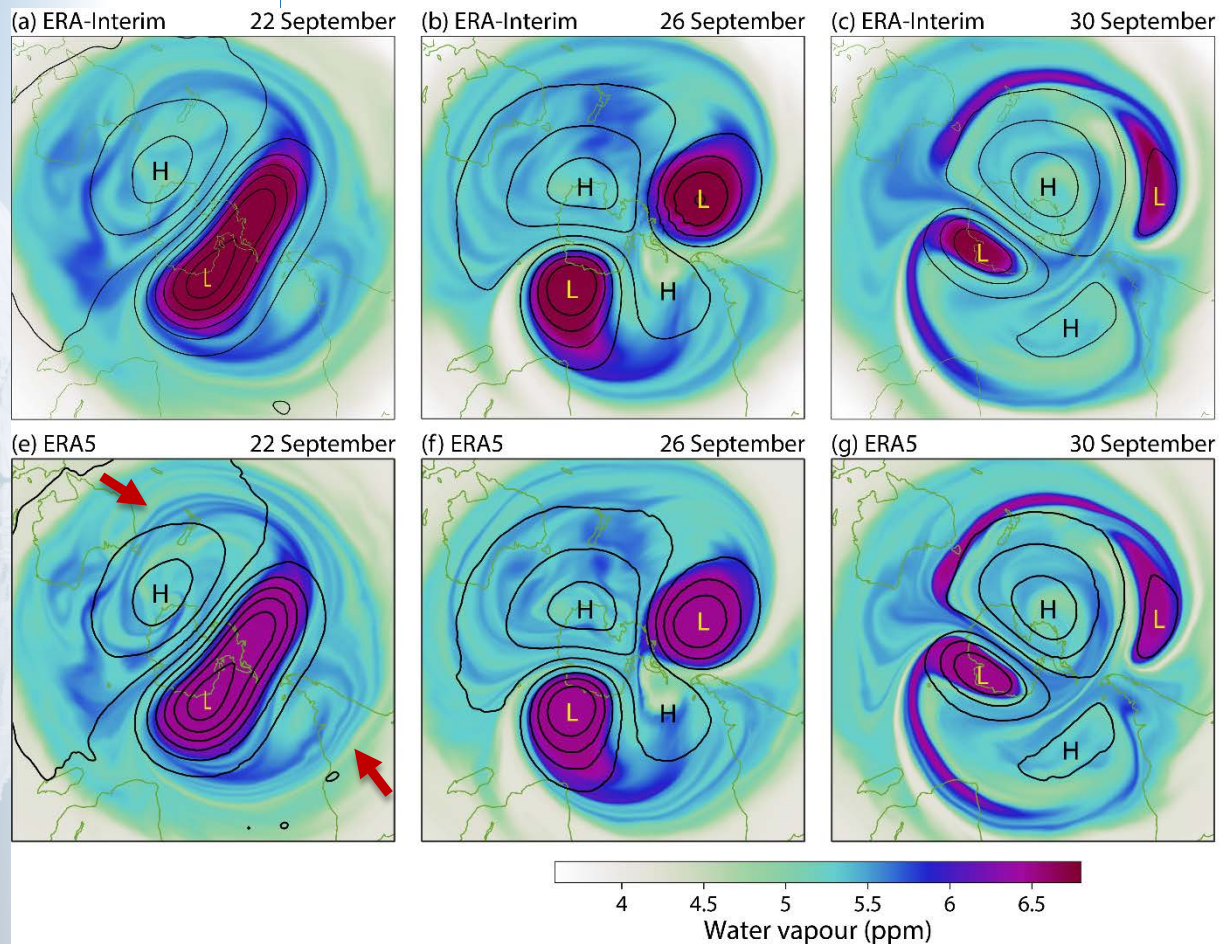
**ERA-Interim**





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# Breakup southern polar vortex in September-October 2002



Water vapour (colours),  
Montgomery potential on  
850K isentropic surface

ERA5 shows finer details



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# The ERA5 observing system

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**0.75 (1979) – 24 Million (2019) obs per day**  
Over 200 types of reports

## Reprocessed data sets

Radiances: SSM/I brightness temp from CM-SAF  
MSG from EUMETSAT

Atmospheric motion vector winds: METEOSAT, GMS/GOES-9/MTSAT,  
GOES-8 to 15, AVHRR METOP and NOAA

Scatterometers: ASCAT-A (EUMETSAT),  
ERS 1/2 soil moisture (ESA)

**Radio Occultation:** COSMIC, CHAMP, GRACE, SAC-C, TERRASAR-x (UCAR)

Ozone: NIMBUS-7, EP TOMS, ERS-2 GOME, ENVISAT SCIAMACHY, Aura  
MLS, OMI, MIPAS, SBUV

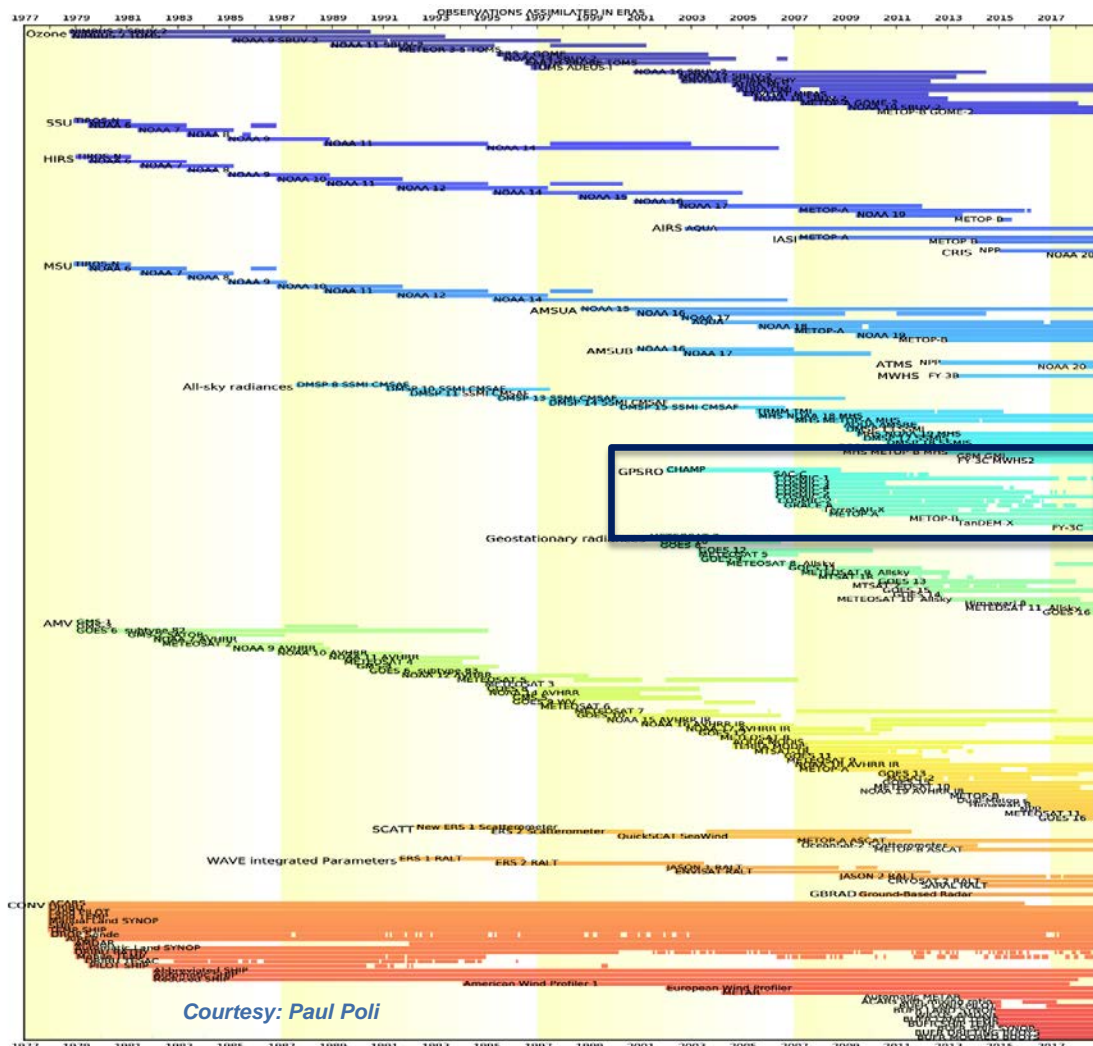
Wave Height: ERS-1, ERS-2, Envisat, Jason

## Latest instruments

IASI, ASCAT, ATMS, CrIS, MWHS, Himawari, ...

## Improved data usage

all-sky vs clear-sky assimilation,  
latest radiative transfer function, corrections,  
extended variational bias control



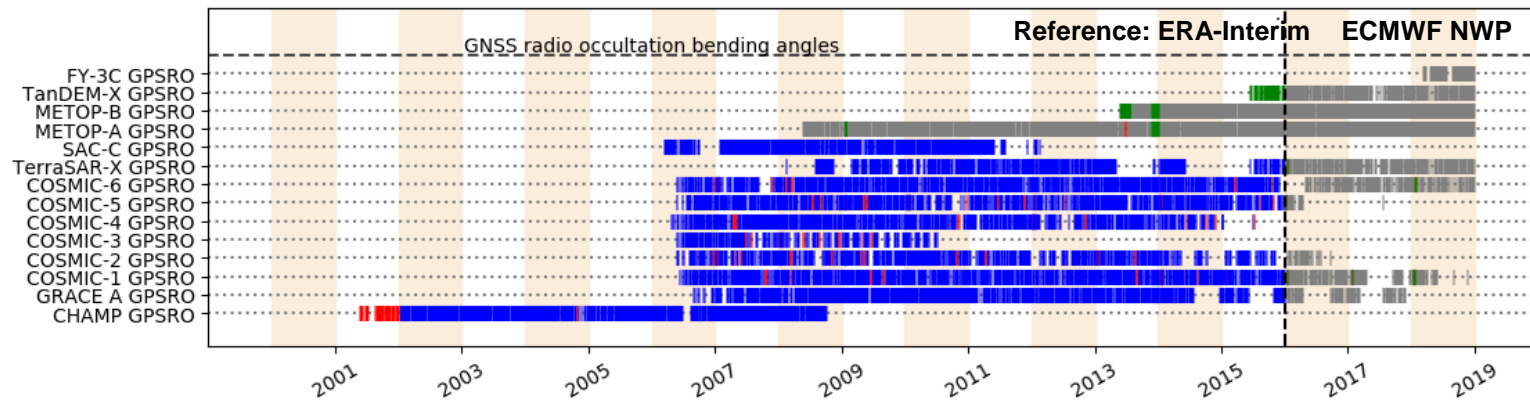
Courtesy: Paul Poli



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# GNSS-RO observations assimilated in ERA5

Reprocessed      In reference, but not ERA5      In ERA5, but not reference      Used in both



## Reprocessed (from UCAR):

CHAMP, GRACE-A, SAC-C  
TerraSAR-X, COSMIC 1-6

## Operational product:

METOP-A and B  
TanDEM-X  
FY-3C  
KompSAT-5 (from end July 2019)



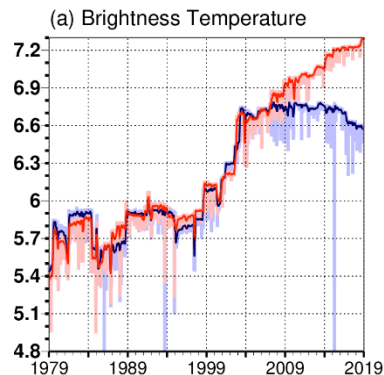
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## ERA5 data counts

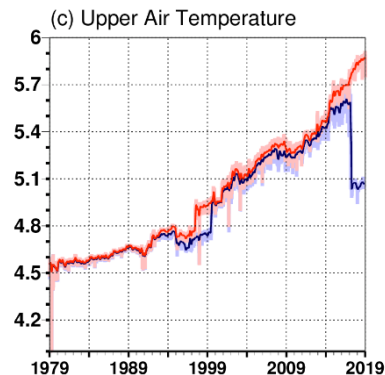
**ERA5** data usage has increased from 0.75 (1979) to 24 million/day (2019).

87 Billion observations assimilated  
( 1979 - 2019 )

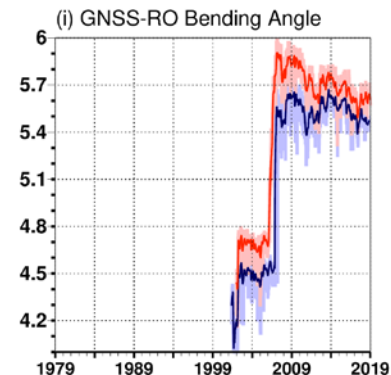
### Number of used observations per day ( $\log_{10}$ scale) for **ERA5** and **ERA-Interim**



**Radiances:**  
Largest volume



**Conventional:**  
Radiosondes, aircraft

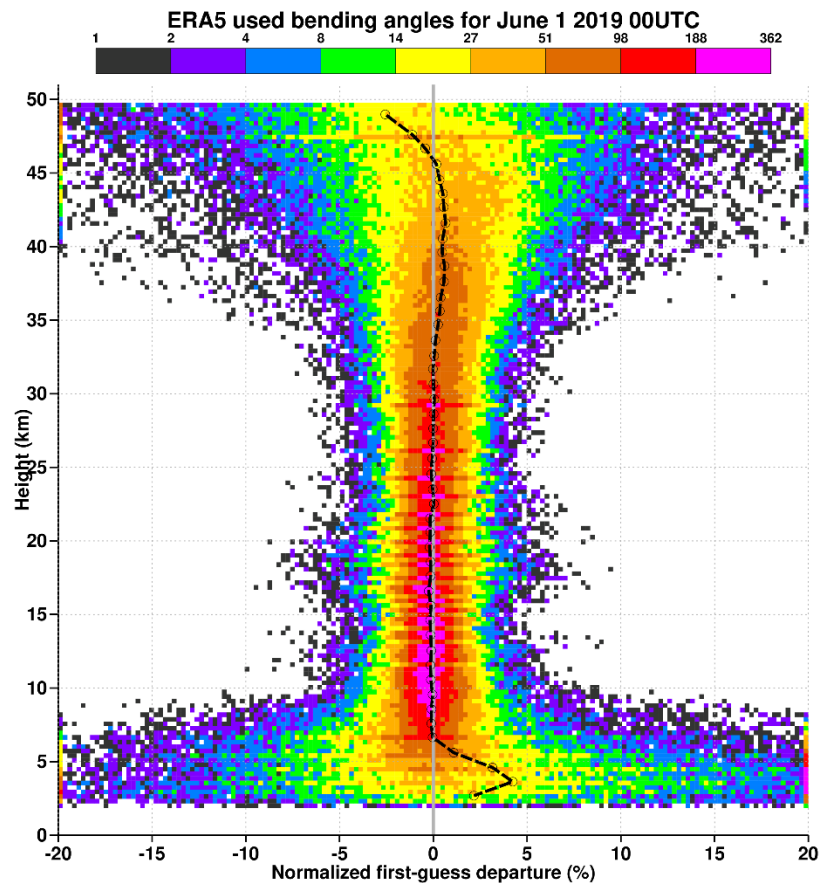


**GNSS-RO:**  
Initially low numbers  
Counts  $\sim$  conventional  
Some recent decline



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## Assimilation of GNSS-RO data in ERA5



### Observation operator for bending angle:

- ✓ 2-Dimensional
- ✓ Sensitive to both temperature and humidity
- ✓ Accounts for tangent drift point

### Assimilation:

- ✓ Increased weight compared to ERA-Interim
- ✓ Use between 2-50 km

### Anchor measurements

- ✓ Do not bias correct
- ❖ Note: radiosonde temperatures *are* subject to *prescribed* corrections (e.g., RICH)



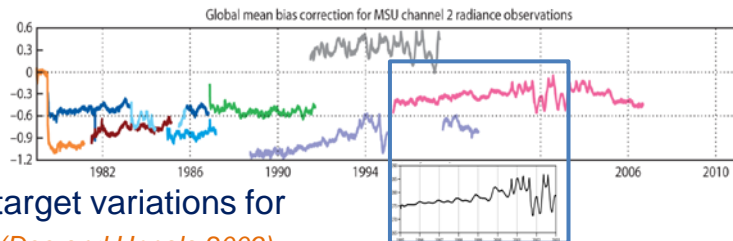
## The merits of variational bias correction

Like ERA-Interim, ERA5 has a dynamic way of estimating biases in the observing system:

- ✓ time-evolving biases (both gradual and abrupt)
- ✓ relative biases between different components
- ❖ Note: need **anchors**.

The bias parameters are included in the variational control:

$$\mathbf{J}(\mathbf{x}, \boldsymbol{\beta}) = (\mathbf{x}_b - \mathbf{x})^T \mathbf{B}^{-1} (\mathbf{x}_b - \mathbf{x}) + [\mathbf{y} - \mathbf{h}(\mathbf{x}, \boldsymbol{\beta})]^T \mathbf{R}^{-1} [\mathbf{y} - \mathbf{h}(\mathbf{x}, \boldsymbol{\beta})]$$



On-board warm target variations for  
MSU NOAA-14: *(Dee and Uppala 2009)*

Resulting bias estimates also provide a path to more homogeneous observational records



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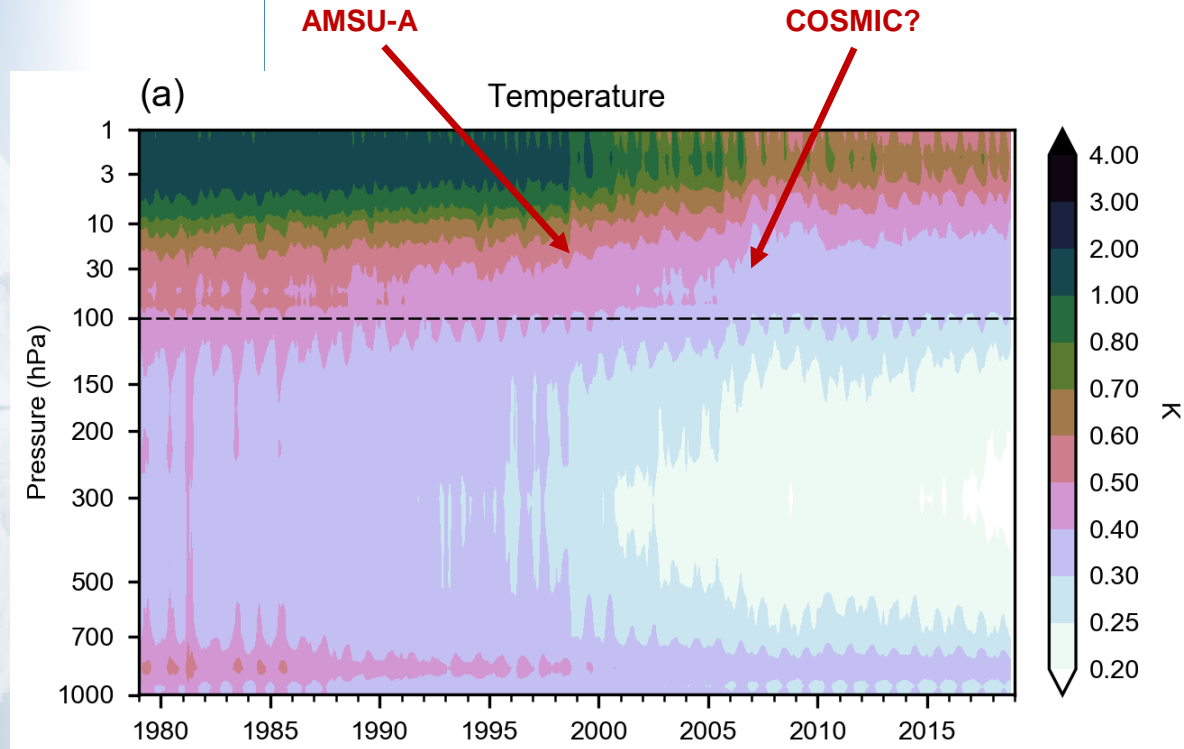
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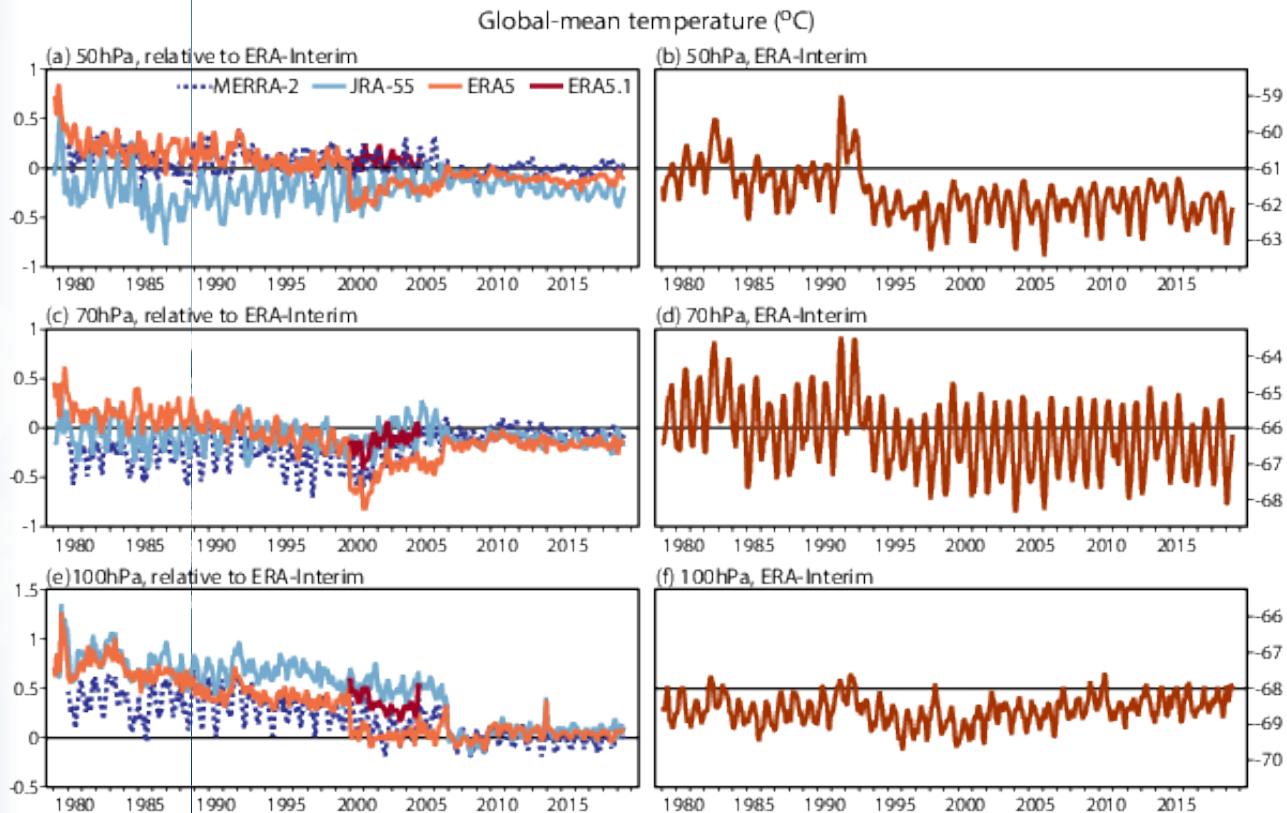
# Ensemble spread as a measure for the *synoptic* ERA5 uncertainty





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# Inter-comparison of global reanalyses: convergence from 2006 (COSMIC)







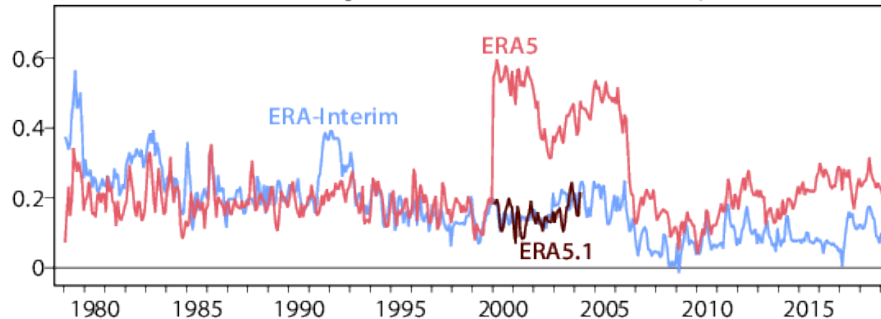
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## Radiosonde first-guess departure statistics

### Between 2000-2006 the ERA5 temperature mean state has a problem in the stratosphere

- ERA5 model is more biased than ERA-Interim
  - Cold in lower stratosphere
  - Warm above 20 hPa
- background-error covariance matrix with shorter correlation lengths
- Weight radiosonde temperatures reduced
- **Insufficient RO observations to anchor model bias**
  - ❖ Bias estimates of satellite data alias model error

Global-mean ob-bg for 60-40hPa radiosonde temperatures (K)



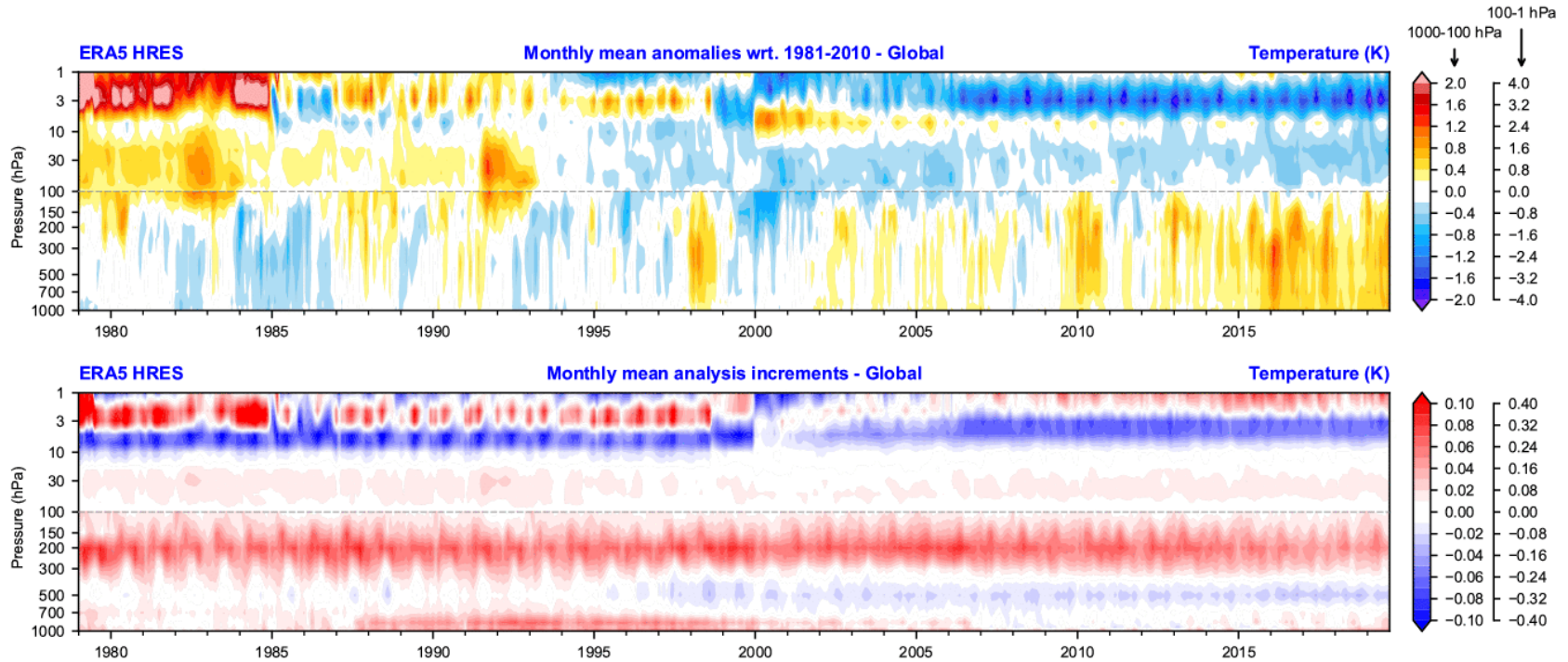
### Solution:

- Use more appropriate background-error covariance matrix, as from 1979-1999
- **ERA5.1**: to be made available early 2020
- 2000 until advent of COSMIC in 2006



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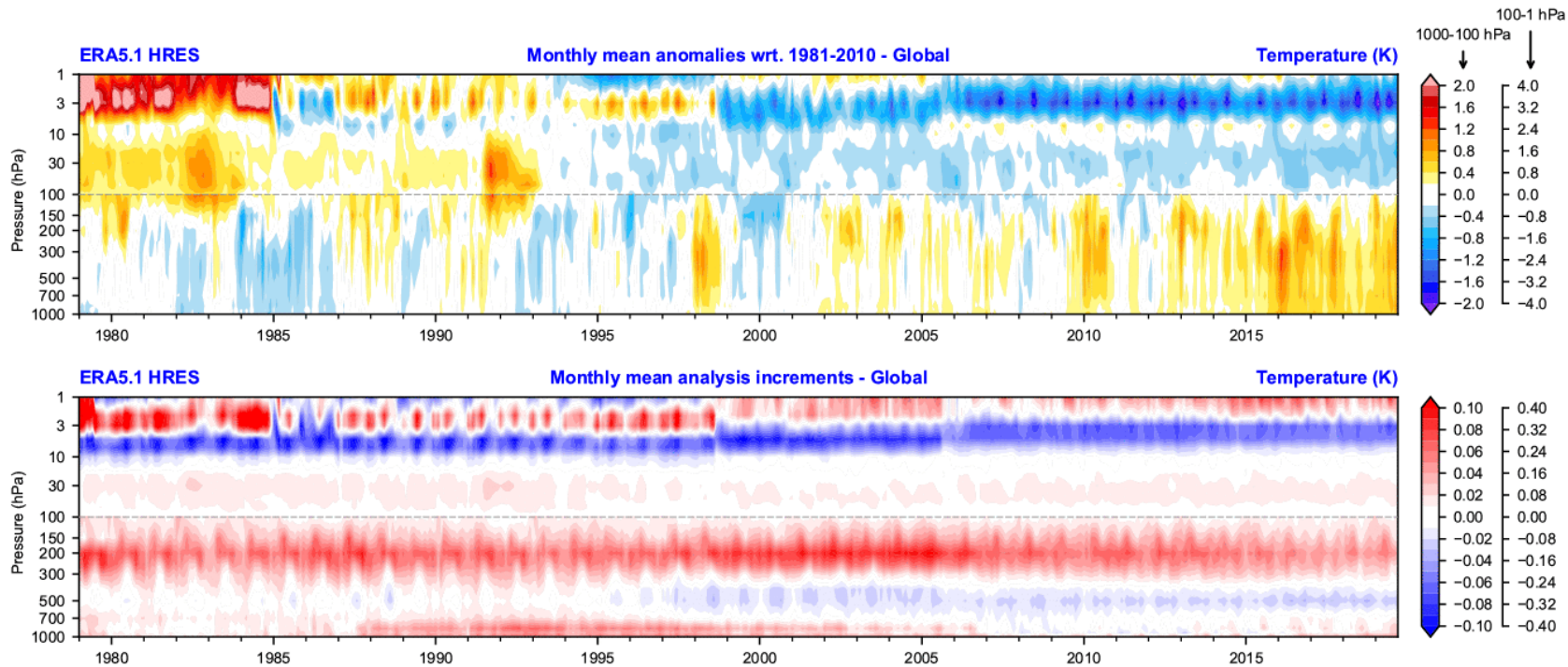
# ERA5 anomalies compared to 1981-2010





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# ERA5.1 anomalies compared to 1981-2010





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## More information

### The ERA5 Global Reanalysis

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- Submitted September 2019 to QJRMS
- In the meantime, see: Hersbach *et al* 2018, *Operational global reanalysis: progress, future directions and synergies with NWP* (from <https://www.ecmwf.int/en/publications/> )
- For ERA5 data from the C3S Climate Data store: <https://cds.climate.copernicus.eu>



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## Final remarks and outlook

### **ERA5 is available from 1979 and has replaced ERA-Interim.**

- Produced at ECMWF by C3S
- Much higher resolution, better model, better and more observations
- The ensemble provides information on the evolving confidence of its products
- 1950-1978 to come, as well as ERA5.1

### **Although ERA5 uses VarBC, anchor observations are essential**

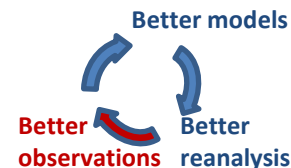
- To guarantee the temporal consistency of the reanalysis mean state
- To avoid the aliasing of model bias into satellite observation bias estimates

### **Sufficient amounts of GNSS-RO observations from 2006 onwards are important**

- To estimate the large-scale model bias, by using e.g., weak-constraint 4D-Var (*Patrick Laloyaux, Monday 23 Sept.*)
- which may be mapped back in time as forcing term to also improve the mean state before 2006

### **Future C3S reanalysis will build on better observations and models:**

- satellite reprocessing (EUMETSAT), data rescue, consolidation of historical datasets
- DMI, Orsted occultations (1999)





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Backup slides



# Back-up slides



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## What is new in ERA5?

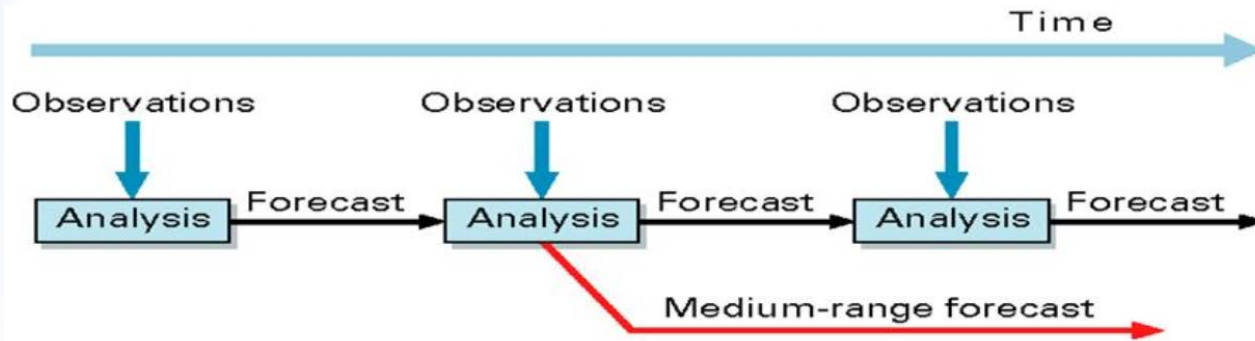
	ERA-Interim	ERA5
<b>Period</b>	1979 – present	<b>1950 – present</b> , produced in 2 phases
<b>Availability behind real time</b>	2-3 months	2-3 months (final product) <b>2-5 days</b> (ERA5T)
<b>Assimilation system</b>	2006 (31r2), 4D-Var	<b>2016</b> (41r2), <b>4D-Var, hybrid EDA providing B</b>
<b>Model input (radiation and surface)</b>	As in operations, (inconsistent SST and sea ice)	<b>Appropriate for climate</b> , e.g., evolution greenhouse gases, volcanic eruptions, sea surface temperature and sea ice
<b>Spatial resolution</b>	79 km globally 60 levels to 10 Pa	<b>31 km globally</b> 137 levels to 1 Pa
<b>Uncertainty estimate</b>		<b>from</b> 10-member <b>EDA at 62 km</b>
<b>Output frequency</b>	6-hourly Analysis fields	<b>Hourly</b> (three-hourly for the ensemble), Extended list of parameters ~ 9 Peta Byte (1950 - timely updates)
<b>Extra Observations</b>	Mostly ERA-40, GTS	Various <b>reprocessed CDRs, latest instruments</b>
<b>Variational Bias control radiosondes</b>	Satellite radiances, RAOBCORE	Also ozone, aircraft, surface pressure, RISE
<b>Land downscaling product</b>	ERA-Interim land, 79km	ERA5L, <b>9km</b> (forced by ERA5)





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## Numerical Weather Prediction and Climate Reanalysis



- NWP is primarily concerned with **prediction** (the Medium Range Forecast)
  - NWP models are upgraded every 6-12 months
  - Observations lose (most of their) value after ~0.5 day
- Reanalysis is concerned with the **retrospective analysis** of the atmosphere, in a **consistent** way, over **many decades**
  - Uses state-of-the-art NWP systems (but using a fixed configuration over decades)
  - Observations (*esp.* reprocessed/ recalibrated) continue to have value
  - Reanalyses updated every 5-10 years (ERA5 is the 5<sup>th</sup> generation ECMWF reanalysis)



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# ERA5 in the Climate Data Store

The screenshot shows the homepage of the Climate Data Store. At the top, there are logos for the European Union, Copernicus, ECMWF, and the Climate Change Service. A 'Login/register' button is in the top right. Below the logos is a navigation bar with links for Home, Search, Datasets, Applications, Toolbox, and FAQ. The main content area features a large heading 'Welcome to the Climate Data Store' and a sub-heading 'Dive into this wealth of information about the Earth's past, present and future climate.' Below this is a paragraph explaining that the data is freely available and functions as a one-stop shop. A search bar with the placeholder 'Enter search term(s)' and buttons for 'Dataset' and 'Search' is provided. At the bottom, there are three featured sections: 'Climate Data Store Toolbox' with a line graph, 'Climate Data Store API' with a code snippet, and 'Access the C3S Forum' with a blue abstract graphic.

ERA5 in the Climate Data Store

Home Search Datasets Applications Toolbox FAQ

## Welcome to the Climate Data Store

Dive into this wealth of information about the Earth's past, present and future climate.

It is freely available and functions as a one-stop shop to explore climate data. [Register for free](#) to obtain access to the CDS and its Toolbox.

We are constantly improving the services and adding new datasets. For more information, please consult the [catalogue](#), our [FAQ](#) or the [C3S forum](#).

Enter search term(s) [Dataset](#) [Search](#)

Climate Data Store **Toolbox**

Climate Data Store **API**

Access the **C3S Forum**

Copernicus Europe's eyes on Earth

European Commission

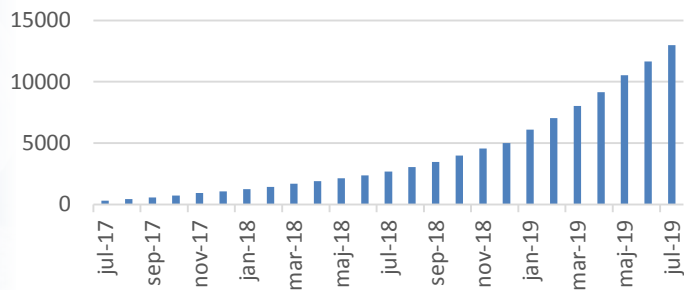
ECMWF



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# ERA5 user uptake

C3S ERA5: total number of data users



C3S ERA5 downloads (TB)

