

# ECMWF - Future perspectives for time horizon 2040+



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With special thanks to Tony McNally (Head Earth System Assimilation at ECMWF) and many other ECMWF colleagues

## ESA's questions

- Which future operational or scientific users' needs will drive the definition of future system-of-systems?
- What should our European Earth Observation Ecosystem look like in 2040+?
- How do commercial Earth Observation data providers fit into the overall picture?

## ESA's questions

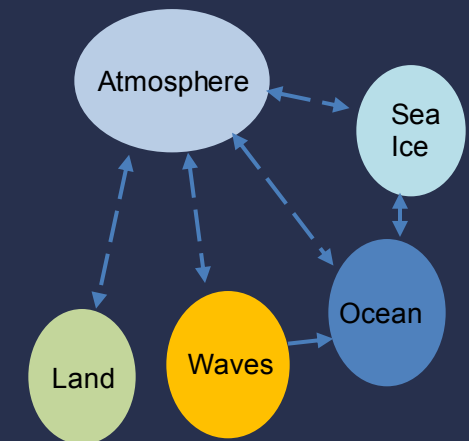
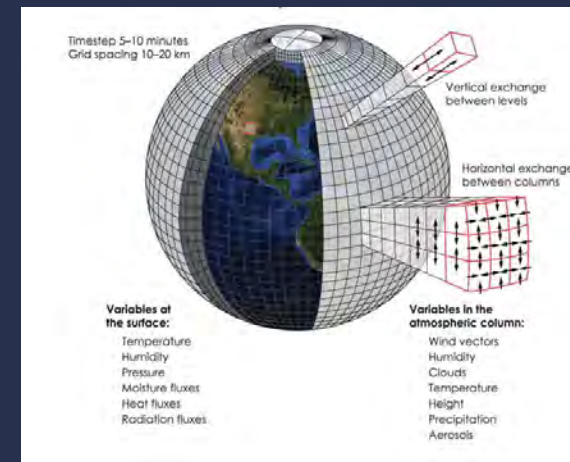
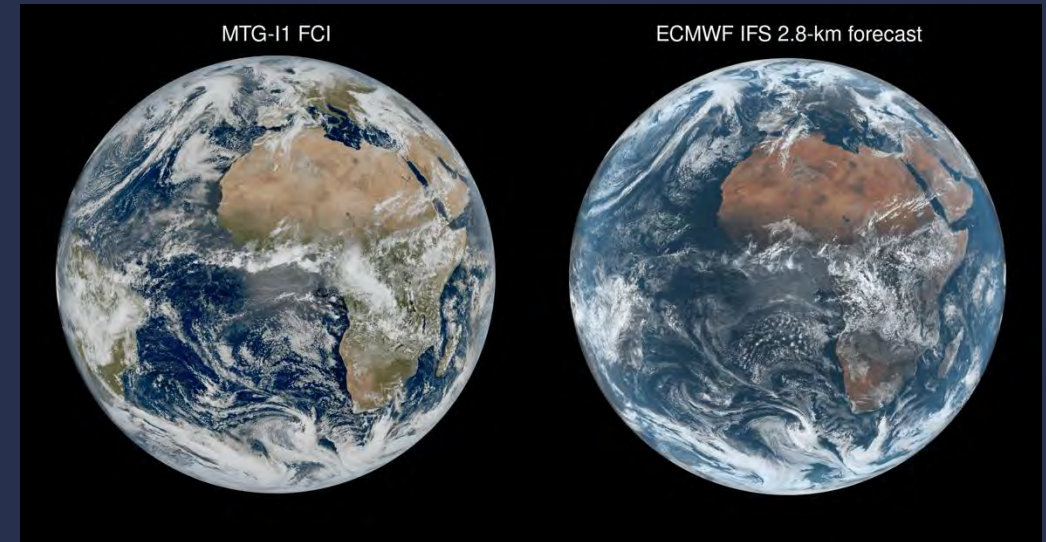
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# Recent evolutions in NWP...resolution and complexity

- Physics-based global NWP models have evolved to ever higher spatial resolution (km scale) and levels of complexity (i.e. full Earth system).
- This is very exciting! ...but presents some extreme challenges for DA / OBS to provide initial conditions of the required detail and accuracy for the required model parameters.

Real satellite observations

ECMWF 2.8km DestinE model



# Which future operational or scientific users' needs will drive the definition of future system-of-systems?



THE STRENGTH OF A COMMON GOAL



## Our Vision:

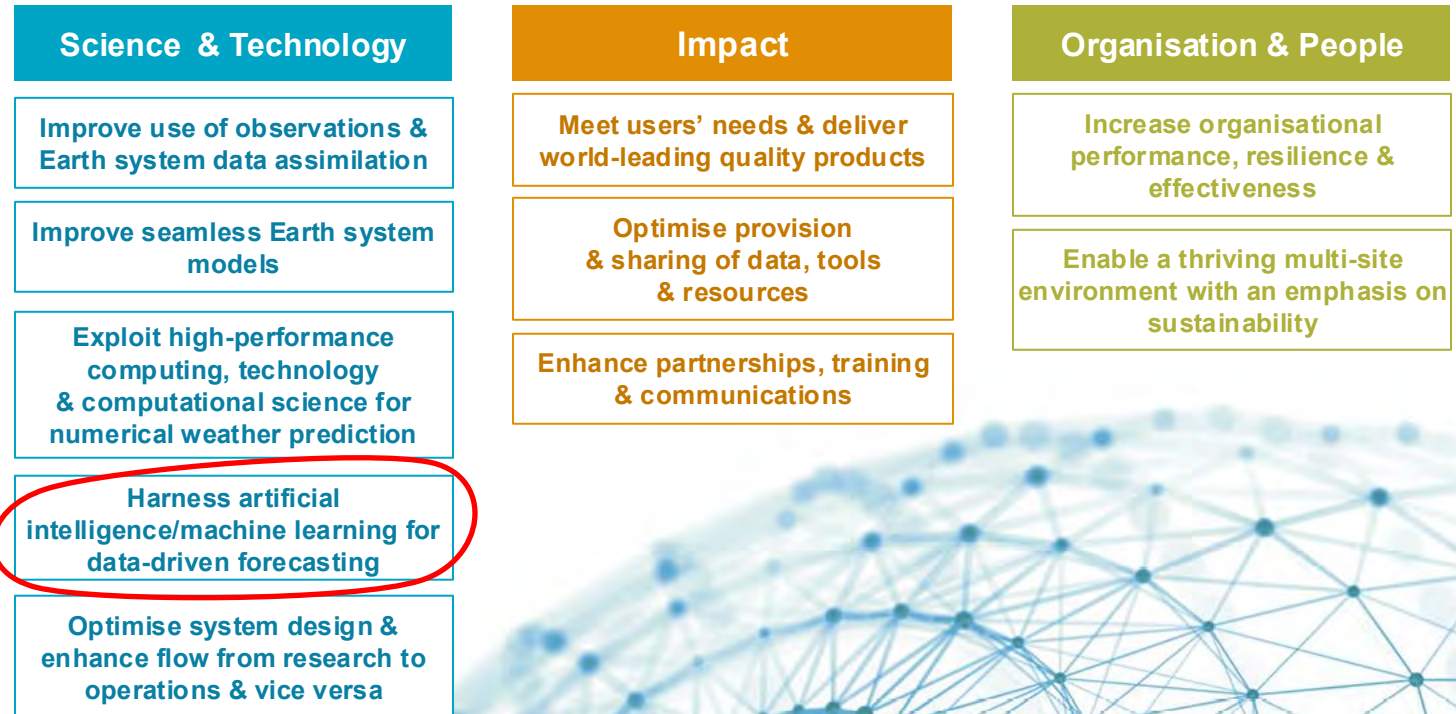
World-leading monitoring and predictions of the Earth system enabled by cutting-edge physical, computational and data science, resulting from a close collaboration between ECMWF and the members of the European Meteorological Infrastructure, will contribute to a safe and thriving society

## ECMWF in 2035:

- Innovating at the cutting edge of physical, computational and data science for environmental monitoring and prediction
- Delivering forecast tools and products of unprecedented quality, exploiting data-driven methods anchored on physics-based modelling
- Integrated in and collaborating with the wider European meteorological community to deliver maximum value to society

**Our Mission:** Deliver global numerical weather predictions focusing on the medium-range and monitoring of the Earth system to and with our Member States

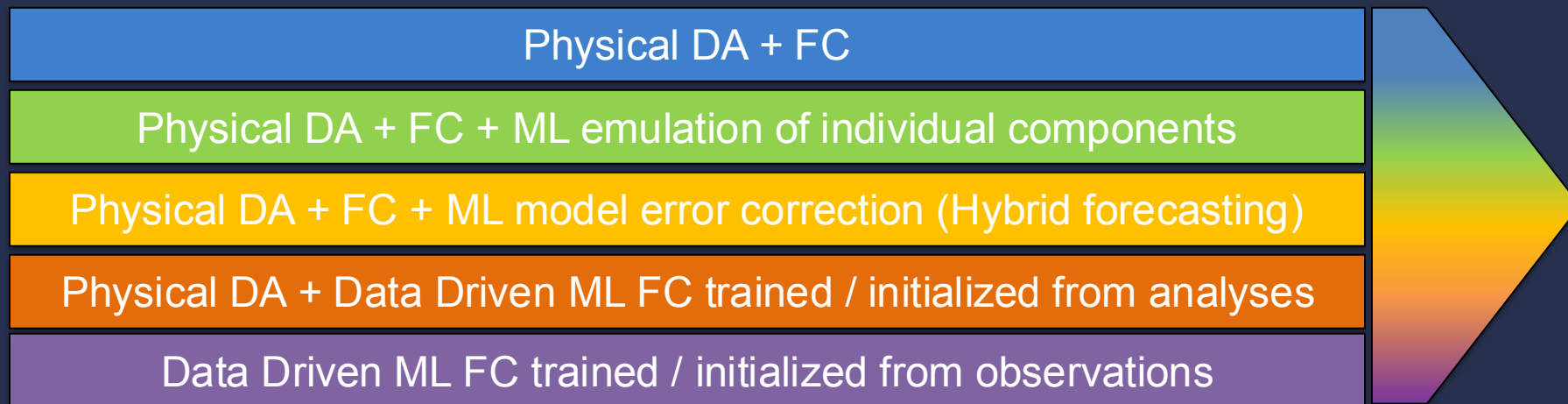
## Strategic Pillars and Actions:



# Strategic development threads of the ECMWF NWP system

Strategic drivers: →

- Performance (accuracy / delivery to users)
- Resource landscape (HPC, skills, partnerships)
- Long-term operational sustainability of approach
- Maintaining support of member state activity



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# What should our European Earth Observation Ecosystem look like in 2040+?

## Some high-level thoughts

Observations (and compute power) are the only fundamental resource in our business

Who provides the observations is potentially subject to change

Who uses the observations is potentially subject to change

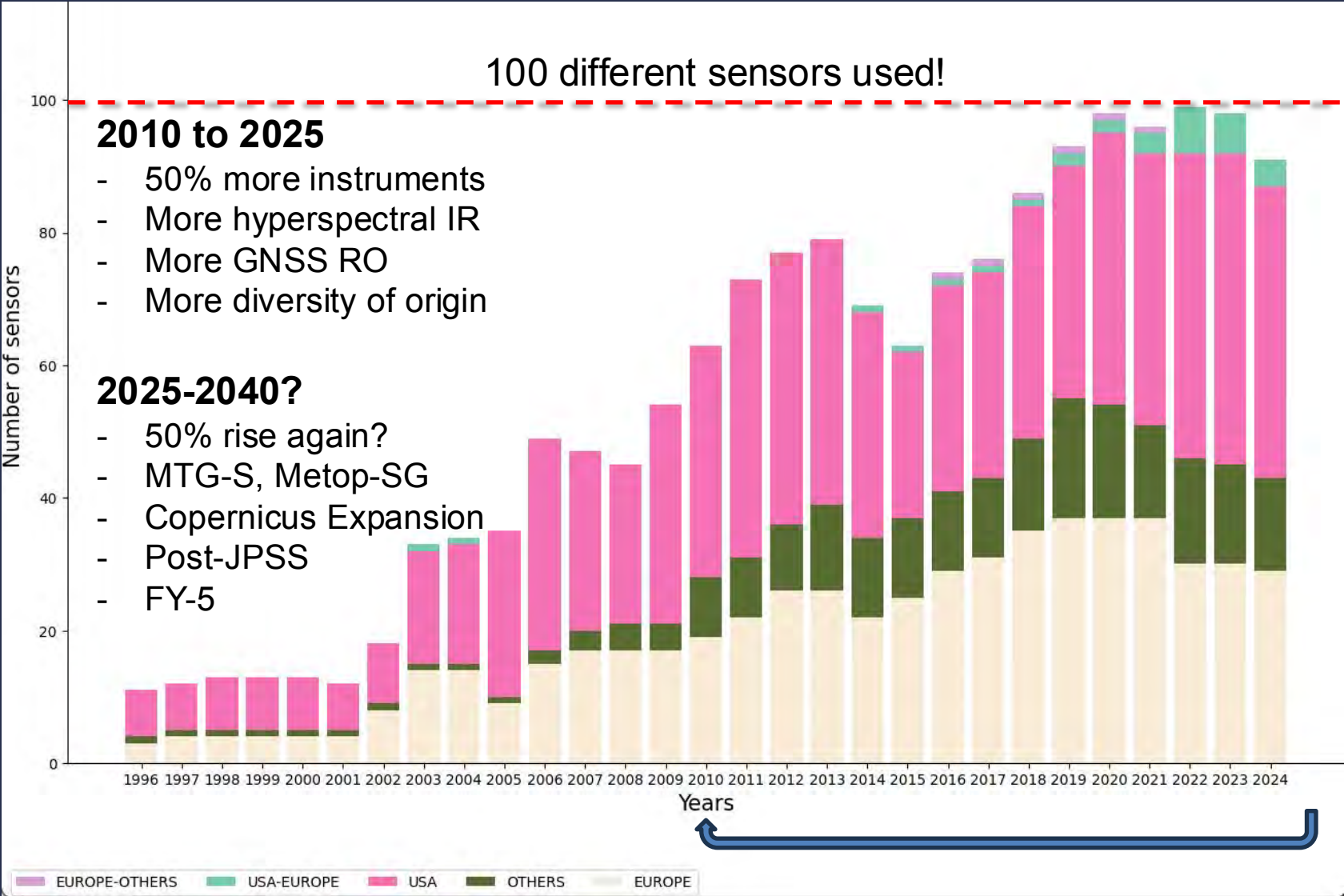
Which observations are needed is potentially subject to change

...our predictive horizon for the above has been significantly reduced by the advent of private sector space and AI/ML

(in other words 2040+ feels a long way off now!)



# Origin of satellite used at ECMWF



## USA

- AQUA
- AURA
- C-NOFS
- CORIOLIS
- COSMIC2
- COSMIC
- DMSP
- GOES
- JPSS
- PlanetQ
- POES
- QuikSCAT
- SAC-C
- SMAP
- TERRA

## EUROPE

- Aeolus
- CHAMP
- CRYOSAT
- ENVISAT
- ERS
- JASON
- METEOSAT
- METOP
- Sentinel
- SMOS
- TanDEM-X
- TerraSAR-X

## USA-EUROPE

- GRACE
- JASON
- Sentinel-6A
- SPIRE-Lemur-3U
- SPIRE

## OTHERS

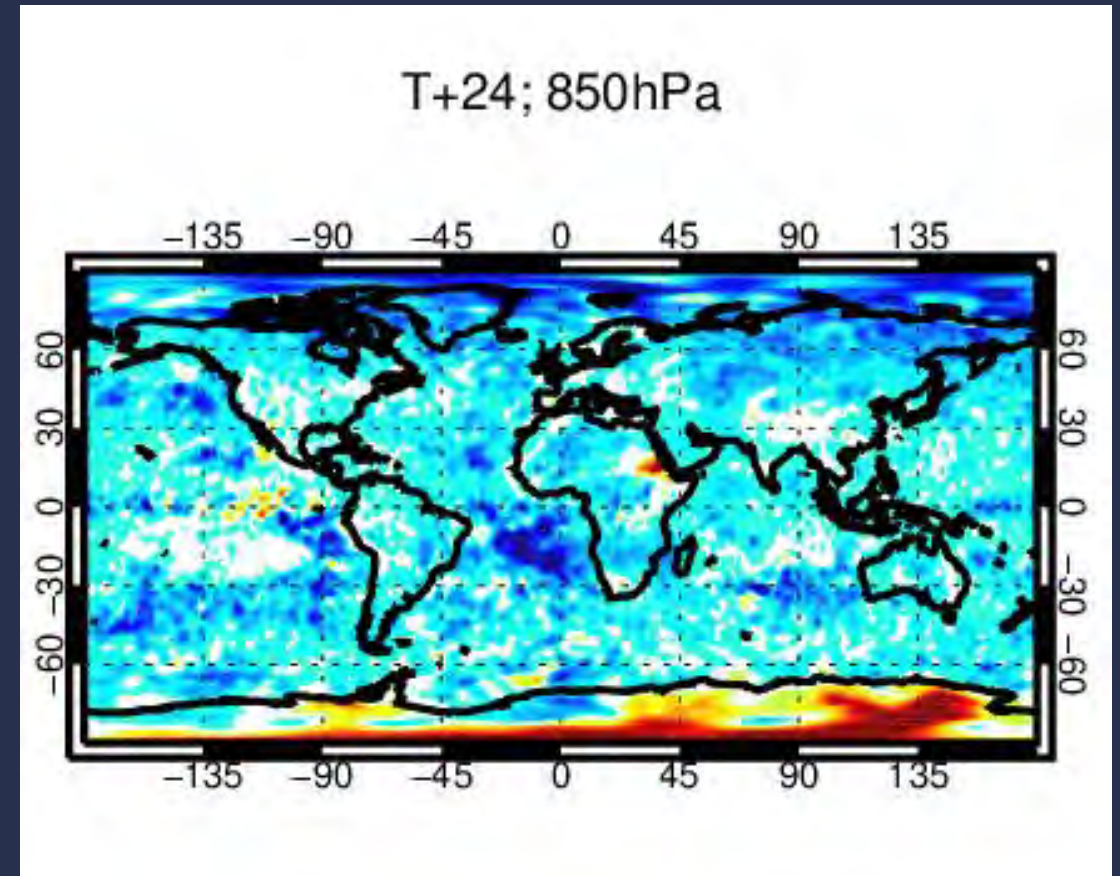
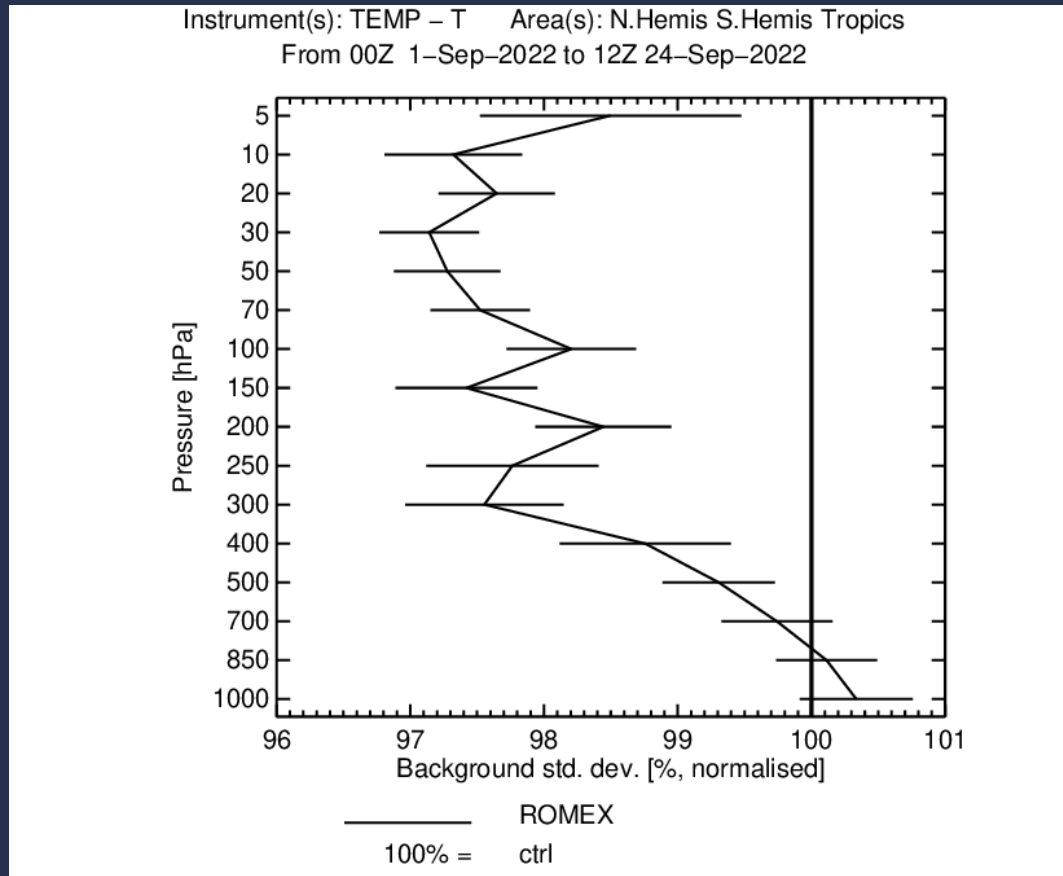
- COMS-1
- FY2
- FY3
- GCOM
- GPM
- HIMAWARI
- HY2
- INSAT-3D
- KOMPSAT-5
- MTSAT
- OceanSat-2
- SARAL
- TRMM

## EUROPE-OTHERS

- MEGHA-TROPIQUES

# How much data do we need ? ...ROMEX

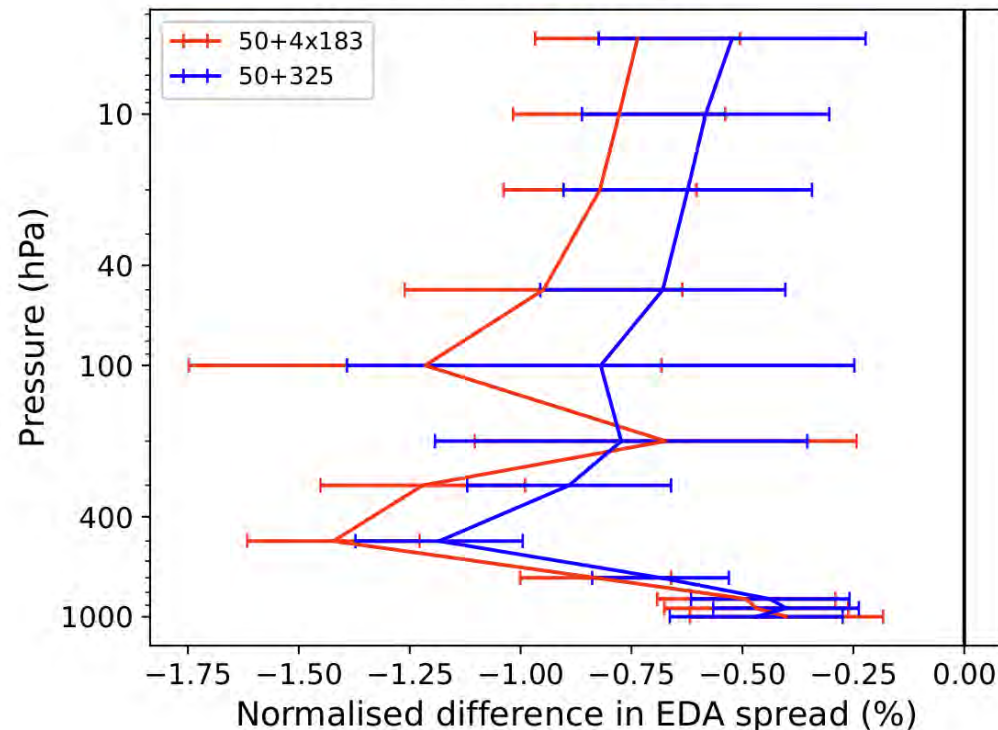
- Highly-significant impact of the full additional ROMEX data-set on top of present RO data
- Experiments continue to examine linearity of impact improvement with OBS numbers



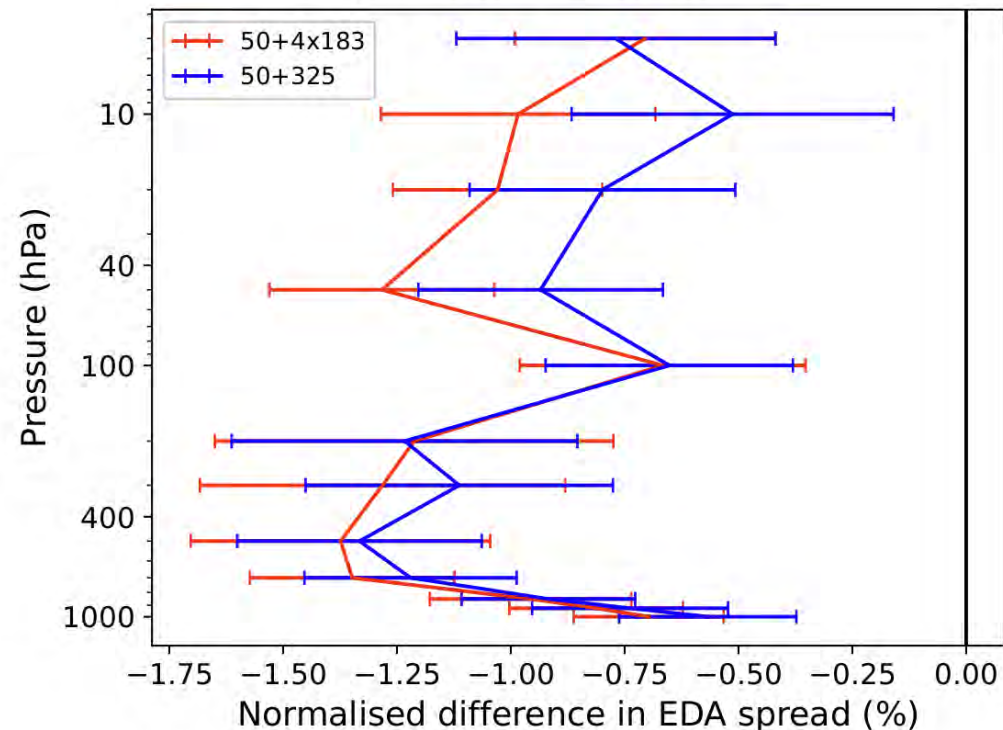
## Assessing the new EPS-Sterna 325 GHz humidity channels in the EDA

- The new 325 GHz humidity channels from EPS-Sterna give a similar impact as corresponding 183 GHz channels when added to the temperature-sounding channels.
- First time these channels are used in NWP – still lots to learn!

(a) U wind, N.Hem.



(b) U wind, S.Hem.





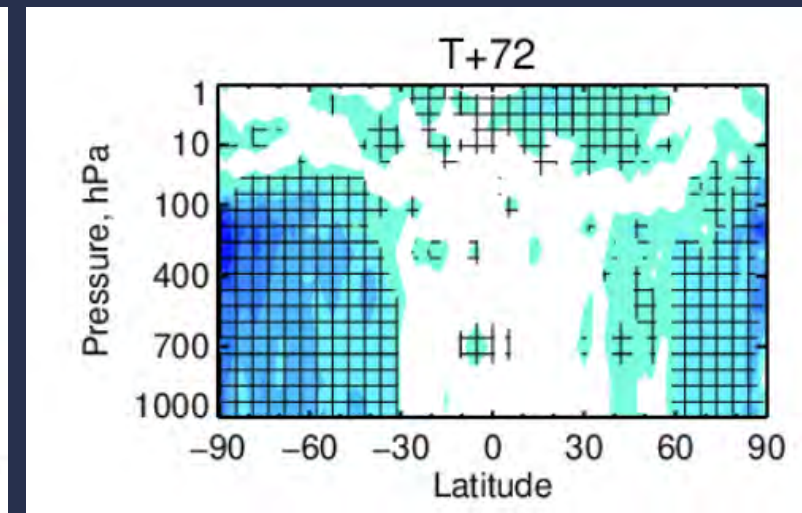
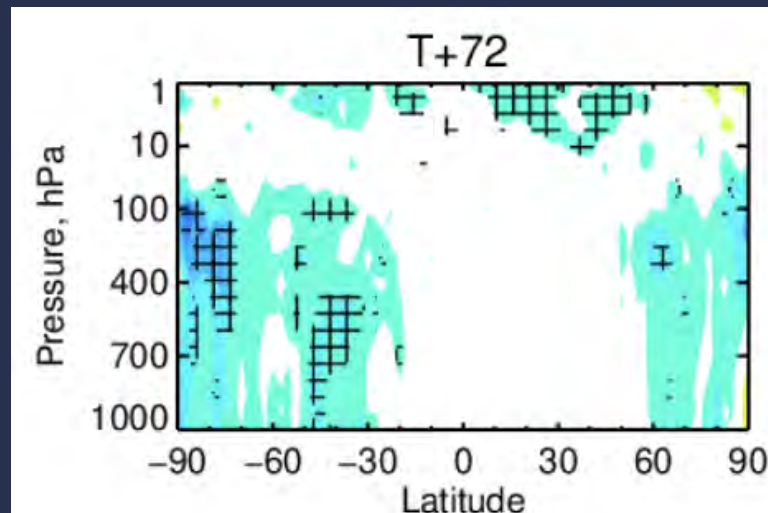
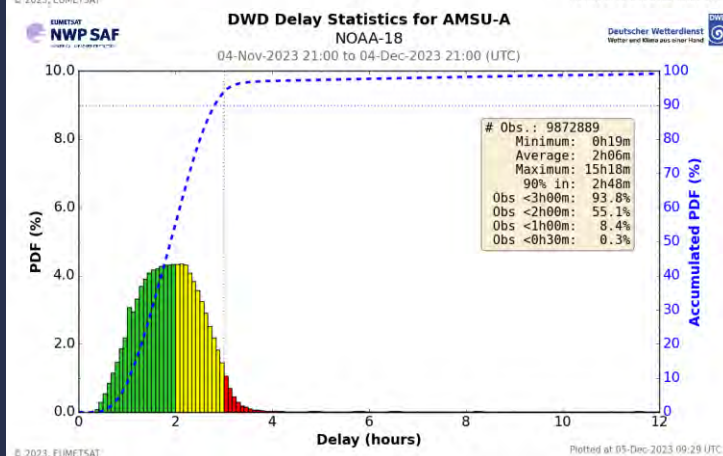
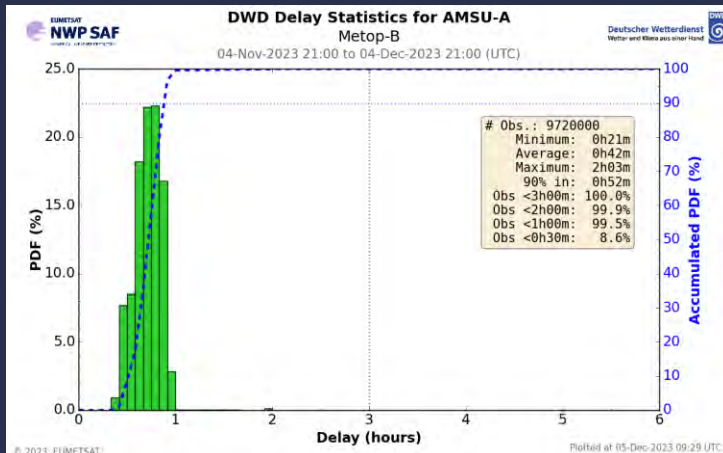
# Forecast impact of data timeliness

- End of window observations are the most recent and informative of the current state of the Earth System
- Since the introduction of Continuous DA, ECMWF is able to exploit observations made very close to the assimilation window end...as long as they arrive in time!!

The impact of observation timeliness on forecast skill can be of the same order as adding a new satellite!

50 min vs 100 min  
(1 vs 2 polar down links)

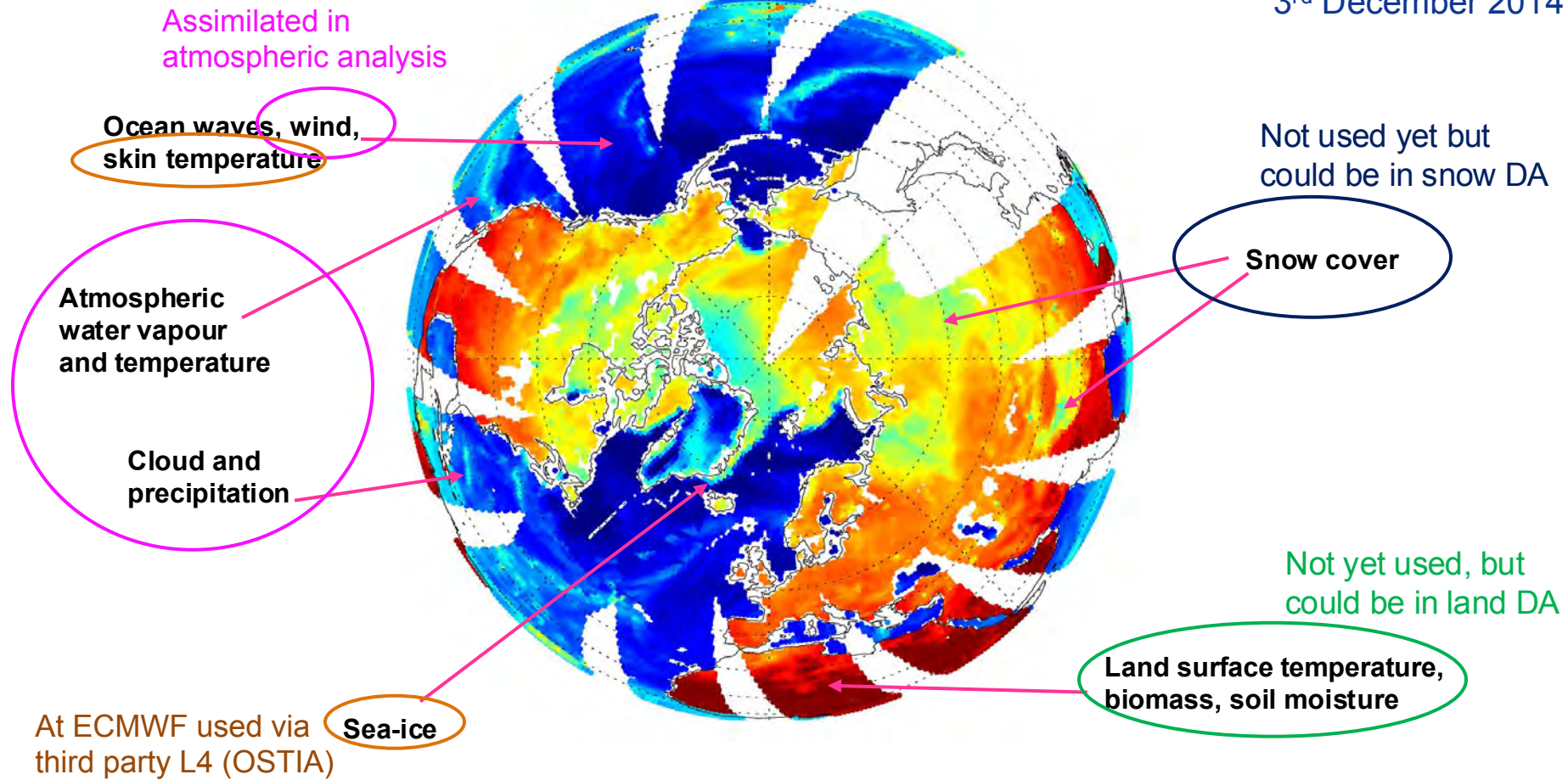
20 min vs 100 min  
(1 polar down link vs DbNet)



Thanks to Peter Lean and Niels Bormann

# Interface Observations

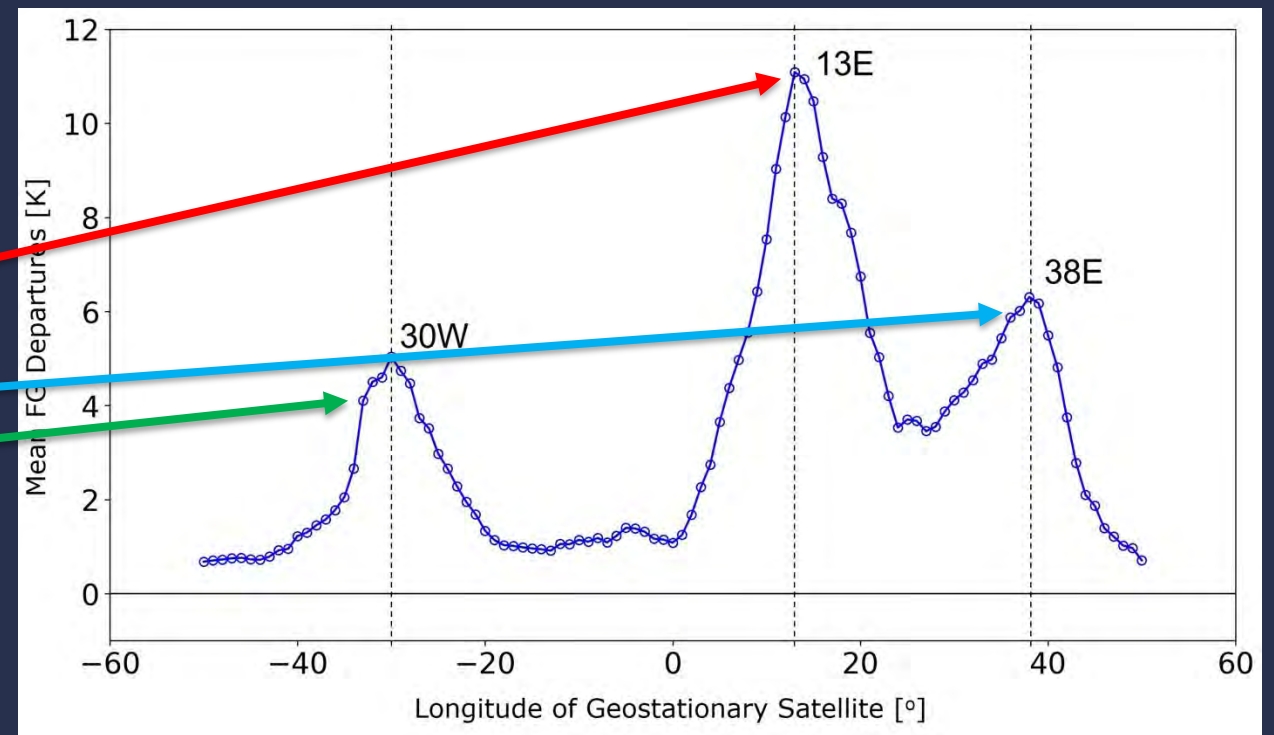
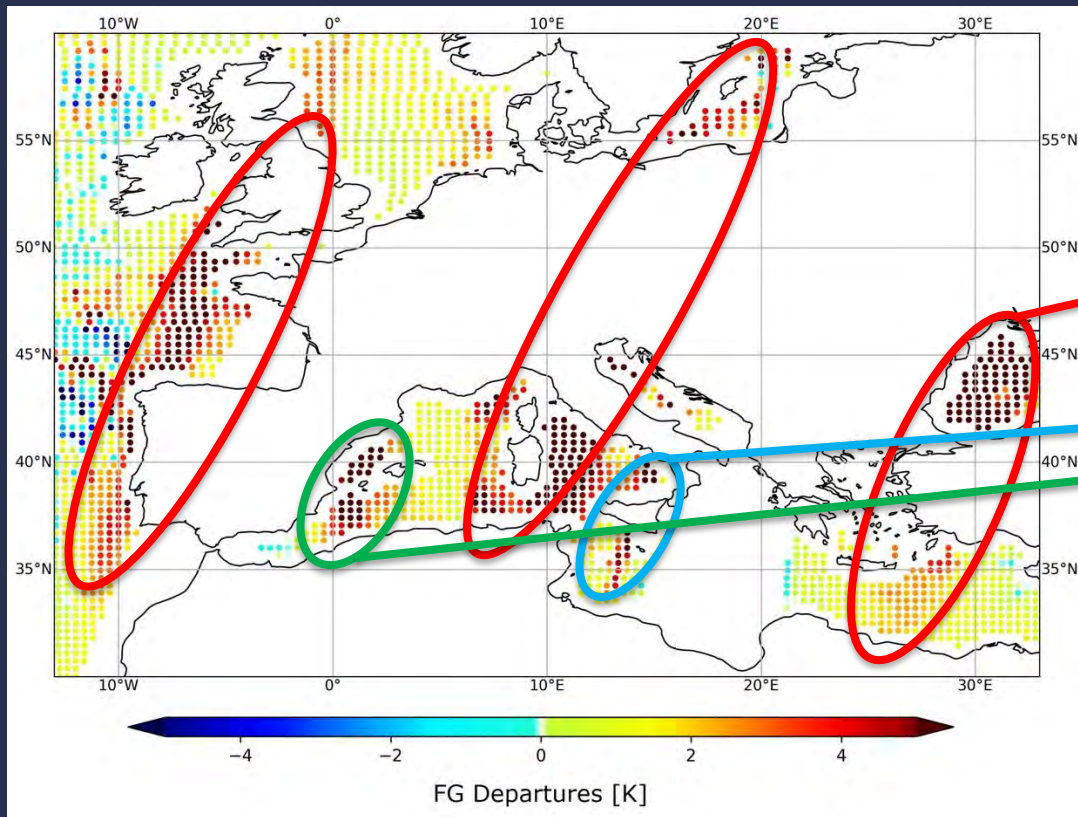
SSMIS F-17 channel 13 (19 GHz, v)  
Microwave brightness temperatures  
3<sup>rd</sup> December 2014



# RFI detection and mitigation

RFI caused by reflections of signals from direct broadcast satellites in geostationary orbit – clearly visible in background departures at 10 GHz.

We can identify where the relevant satellites are by calculating the glint for a given satellite position and analysing the background departures.

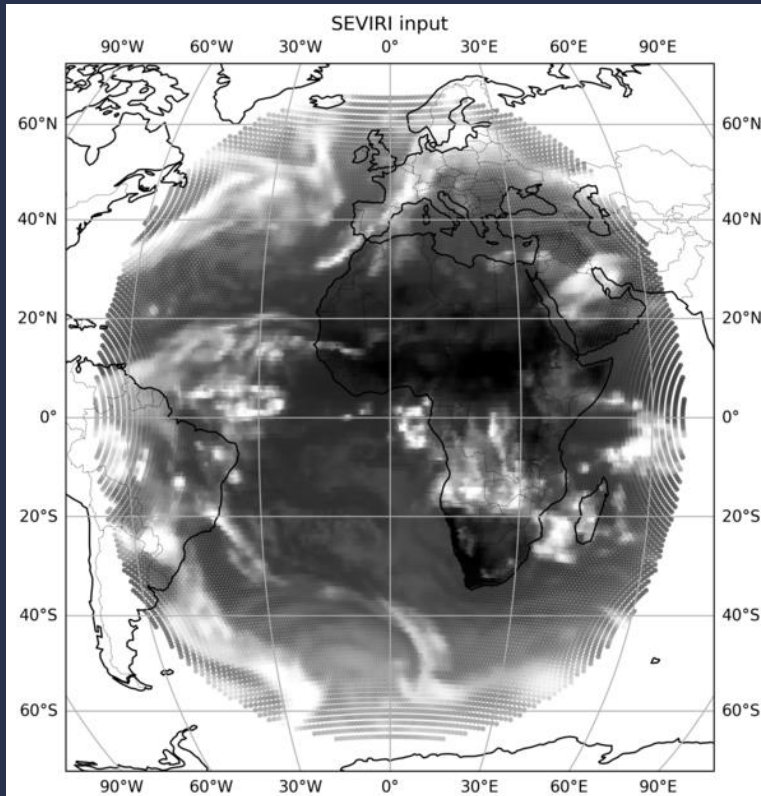




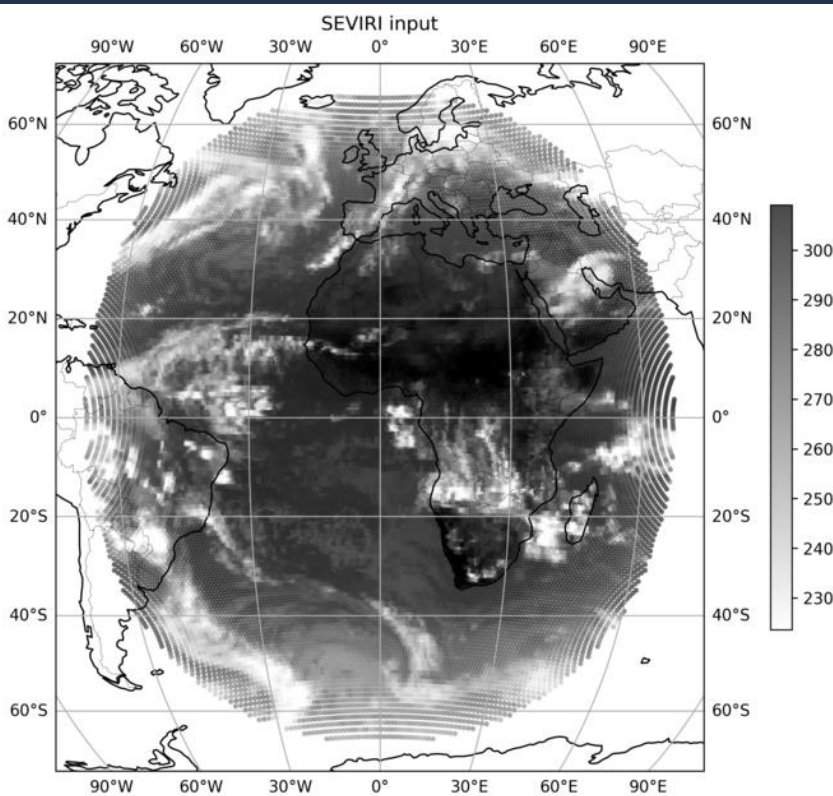
# ML Forecasts directly from observations:

The AI-DOP system learns an internal representation of the atmosphere purely from historical records of raw observations

AI-DOP model



Target real observations



DATA DRIVEN WEATHER FORECASTS TRAINED AND INITIALISED DIRECTLY FROM OBSERVATIONS

A PREPRINT

Anthony McNally, Christian Leisig, Peter Lean, Estelle Boucher, Mihai Alexe

Ewan Pinnington, Matthew...

Florian Pinault, E...

European Centre...

GRAPHDOP: TOWARDS SKILFUL DATA-DRIVEN MEDIUM-RANGE WEATHER FORECASTS LEARNED AND INITIALISED DIRECTLY FROM OBSERVATIONS

A PREPRINT

Mihai Alexe, Estelle Boucher, Peter Lean, Ewan Pinnington, Patrick Laloux, Anthony McNally, Simon Lang, Matthew Chantry, Chris Burrows, Marcia Chouet, Florian Pinault, Eberd Vilkenewe, Niels Bornemann, Sean Hooley

European Centre for Medium-Range Weather Forecasts (ECMWF)

December 20, 2024

ABSTRACT

We introduce GraphDOP, a new data-driven, end-to-end forecast system developed at the European Centre for Medium-Range Weather Forecasts (ECMWF) that is trained and initialised exclusively from Earth System observations, with no physics-based (re)analysis inputs or feedback. GraphDOP learns the correlations between observed quantities - such as brightness temperatures from polar orbiters and geostationary satellites - and geophysical quantities of interest (that are measured by conventional observations), to form a coherent latent representation of Earth System state dynamics and physical processes, and is capable of producing skillful predictions of relevant weather parameters up to five days into the future.

1 Introduction

In recent years, data-driven approaches to numerical weather prediction (NWP) have taken the field by storm, with several global models demonstrating forecast skill scores comparable or superior to that of leading physics-based NWP systems across a wide range of weather variables and lead times (Patil et al., 2022; Lane et al., 2023; Wu et al., 2023; Bodnar et al., 2024; Lang et al., 2024a). Without exception, these data-driven models have been trained on reanalysis products such as ECMWF's ERA5 (Herrbach et al., 2020). To produce a forecast, the models must be initialised from a weather (re)analysis, valid at the initial time of the forecast.

A (re)analysis is the product of data assimilation, a family of algorithms that aim to optimally combine the best available estimate of the current global atmospheric state - e.g., a previous short-range forecast from a physics-based weather

arXiv:submit/6084865 [physics.aos-ph] 20 Dec 2024

22 Jul 2024 [physics.aos-ph]

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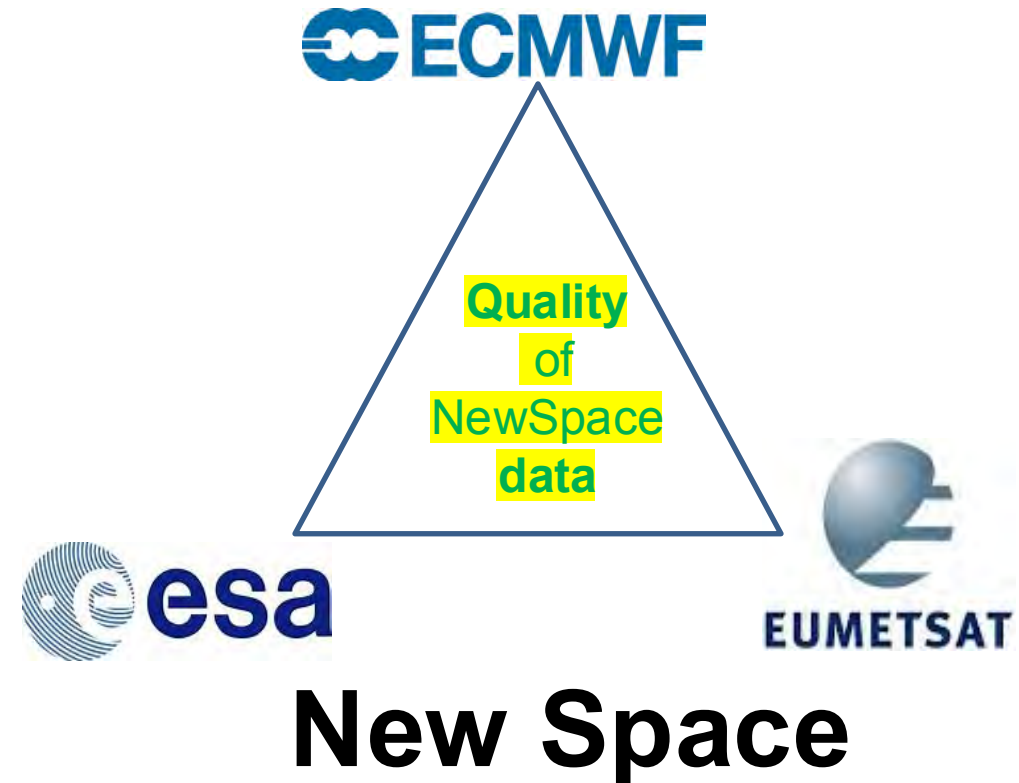
## Who provides the observations is potentially subject to change

Expanded access to space for the private sector observation deployment is likely to accelerate

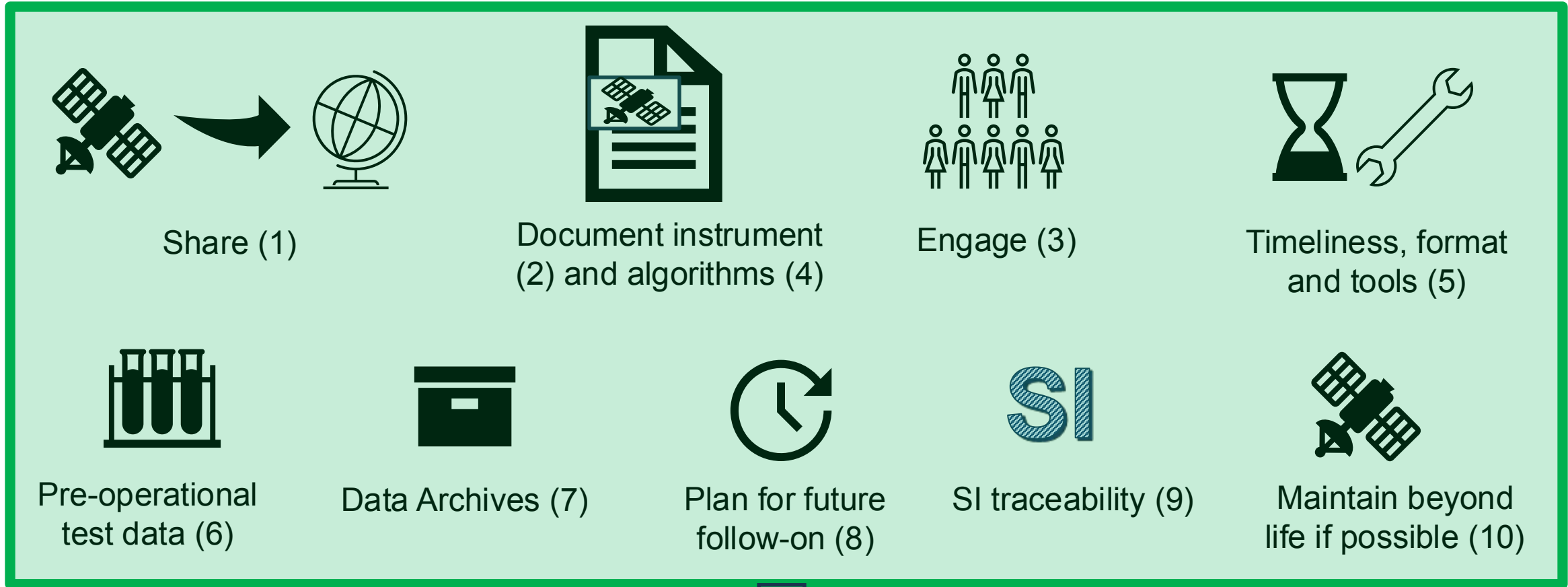
Space-based observation deployment (for NWP) being influenced by GEO return, technology demonstration or artificial market forces is likely to reduce

Private sector OBS players may move away from selling OBS and instead keep unique measurements to add USP value to their own commercial forecast services

AI/ML will democratize access to NWP for low cost OBS providers



# WMO position paper on requirements: providing guidance to all sectors



Happy users

This best practice is largely followed by the main space agencies whose data is widely used and critically important in global NWP

## Strategy?

Agility to react to potentially rapid evolutions and deliver observations (ESA, EUMETSAT and others) that are actually needed (and have a robust mechanism to evaluate these needs).

To examine critically what is the verified added value of Space Agencies and NWP processing instead of somebody else doing it...prioritizing resources on these areas.

Consider that users may be evolving towards wanting raw data and tools and not products.