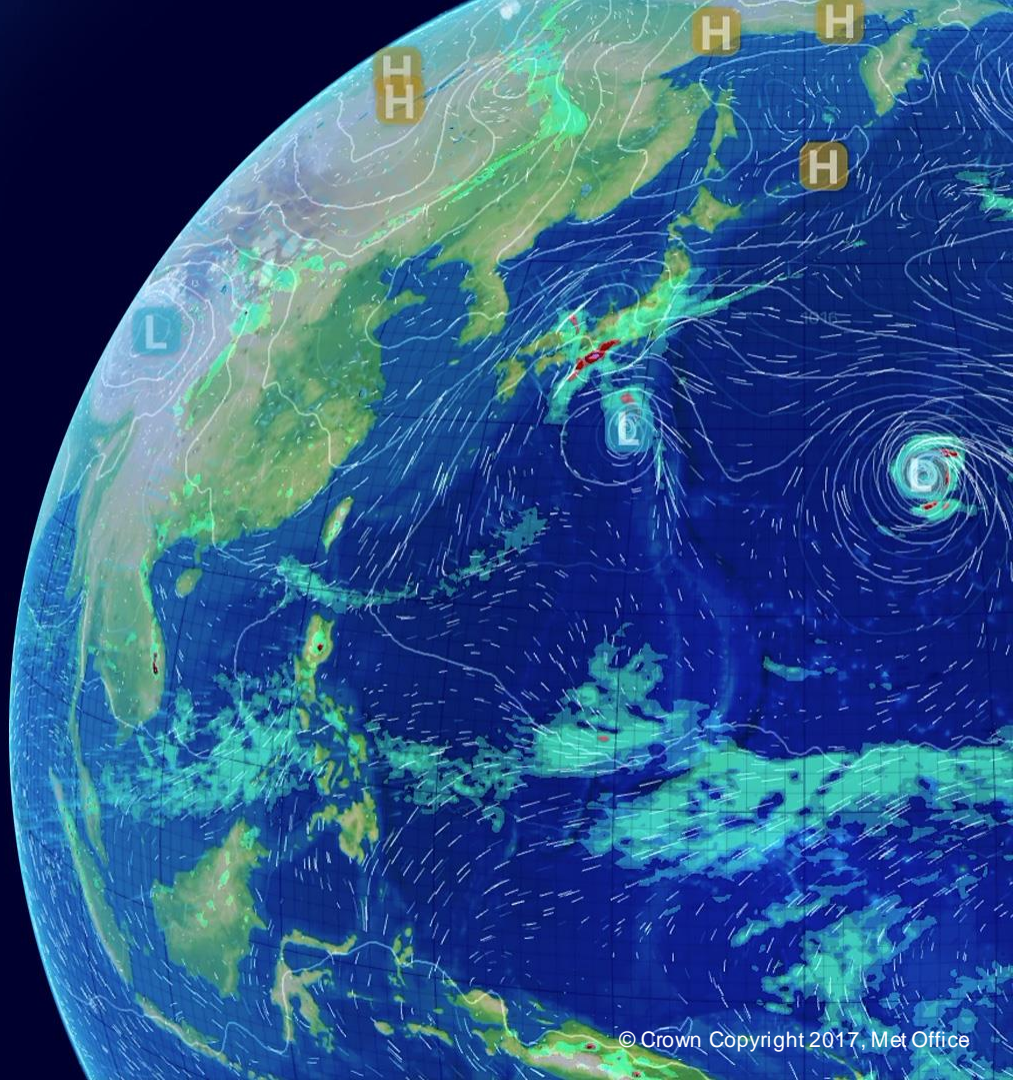


# Impact of satellite-derived winds in NWP

**Mary Forsythe**, James Cotton, Gemma Halloran  
(Met Office, UK) and Mike Rennie (ECMWF)

EUMeTrain Event week on Winds

28 Feb – 4 Mar 2022

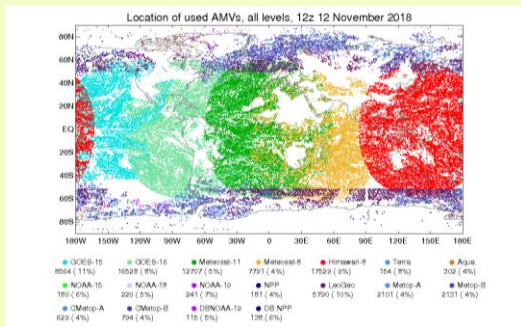


# Contents

- **What satellite-derived winds do we assimilate?**
- **What is their impact?**
- The role of the NWP SAF
- Thoughts for the future
- Conclusions

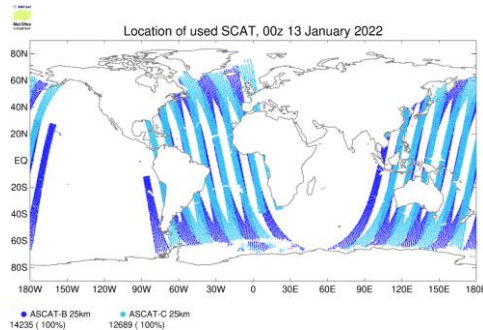
# What satellite-derived winds are assimilated?

## Atmospheric Motion Vectors (AMVs)



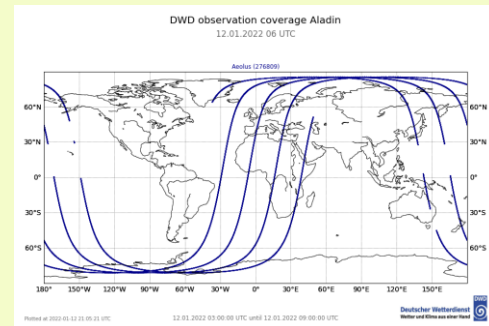
- Global tropospheric winds, but single level
- From tracking clouds and WV in satellite imagery
- Full wind vectors (speed and direction)
- Assimilated in global and regional models

## Scatterometer winds



- Near-surface (10m) wind observations over the ocean
- Active sensing
- Full wind vector (wind speed and direction) BUT ambiguous wind solutions
- Assimilated in global and regional models

## Doppler Wind Lidar (DWL)



- Wind profiles from surface to ~25 km
- Active sensing
- Only one component of the wind, horizontal line of sight (HLOS) ~zonal for much of orbit
- Only from Aeolus, still need to secure operational continuity
- Assimilated in global models

# Atmospheric Motion Vectors

In sequence of images – movement of clouds and moisture

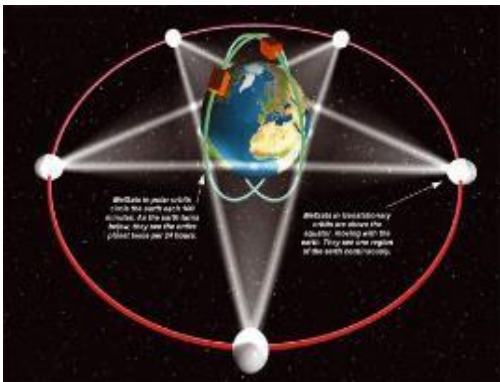


Courtesy of EUMETSAT

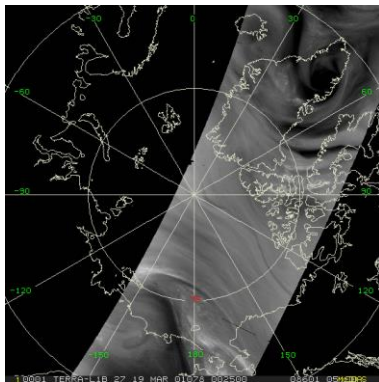


# Which satellites?

AMVs are produced from  
**geostationary** satellite  
imagery

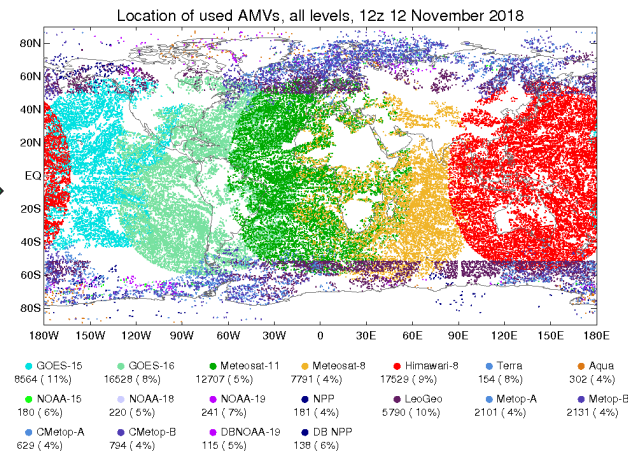


And from **polar**  
satellite imagery



Providing coverage over  
**tropics** and **mid-latitudes**

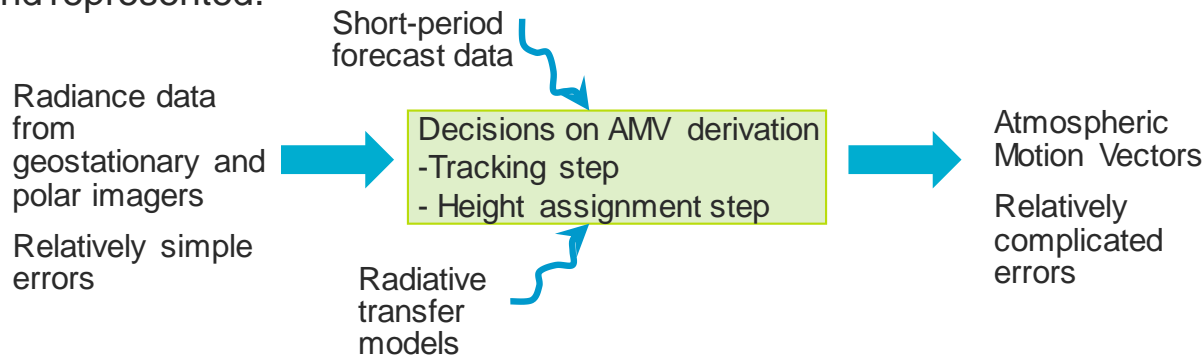
providing coverage  
in the **polar** regions,  
where the  
overpasses overlap.



# AMV challenges

## 1. Complicated errors

To derive AMVs, we move a long way from the raw radiance data where the errors may be more easily understood and represented.

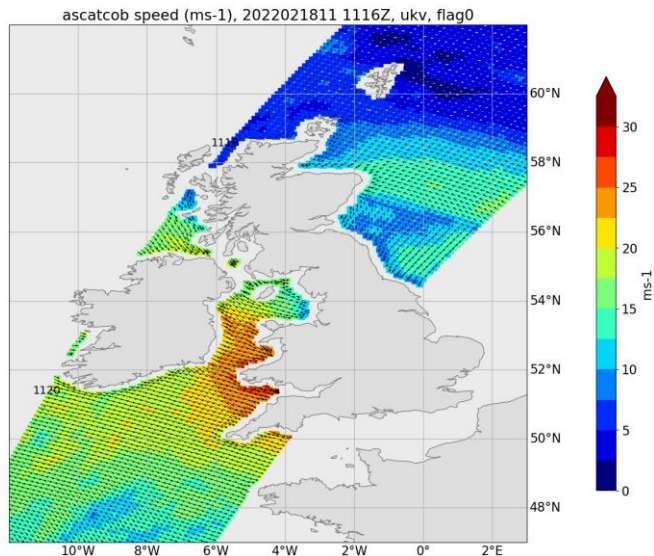


## 2. Assumptions in derivation and assimilation

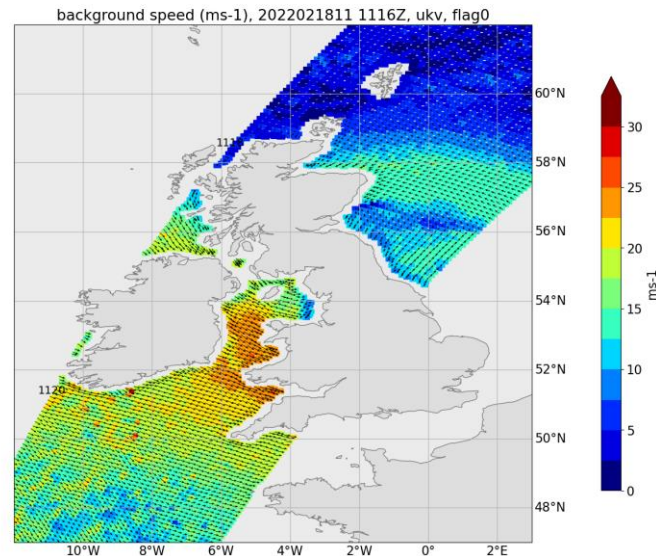
e.g. assume point winds, clouds act as passive tracers, spatially and temporally uncorrelated errors.

# Scatterometer winds

Extratropical Storm Eunice impacting the UK on 18 Feb 2022. Red wind warnings issued by the Met Office.



Metop-B ASCAT



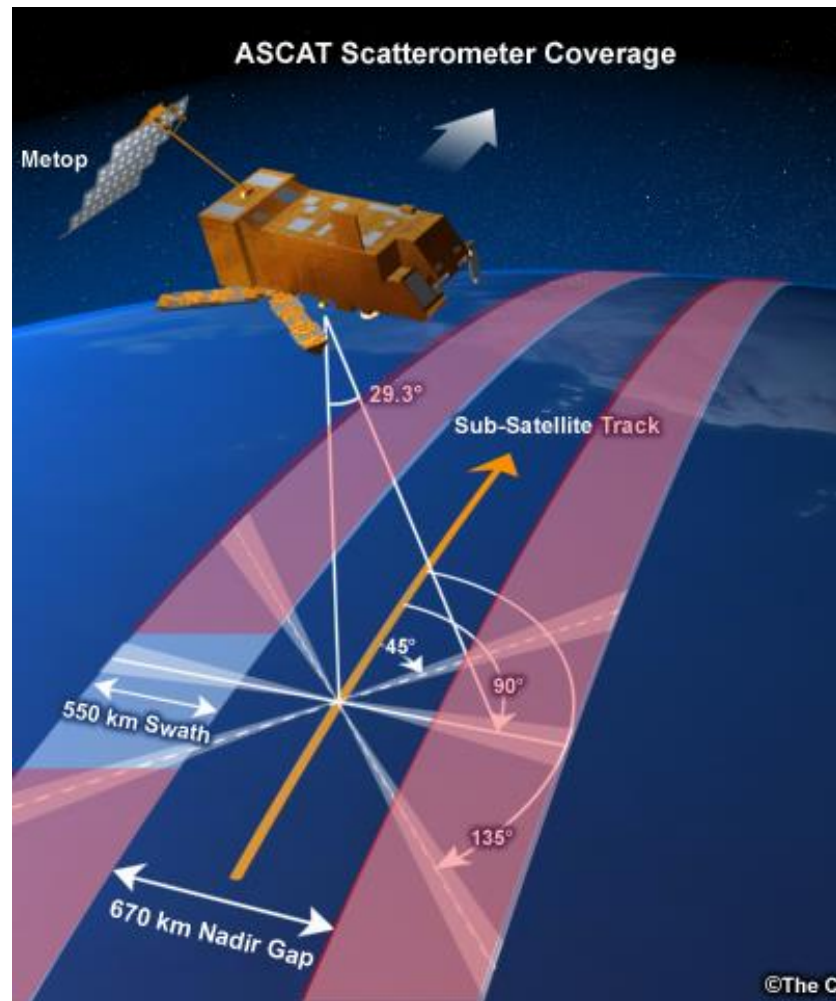
UKV model

Scatterometers are 'active' radar instruments

- Emit a pulse and measure returned signal
- Normally flown on-board polar orbiting satellites
- Operate in microwave spectrum: 'see' through clouds, rain impacts
- Don't measure the wind... measure backscatter

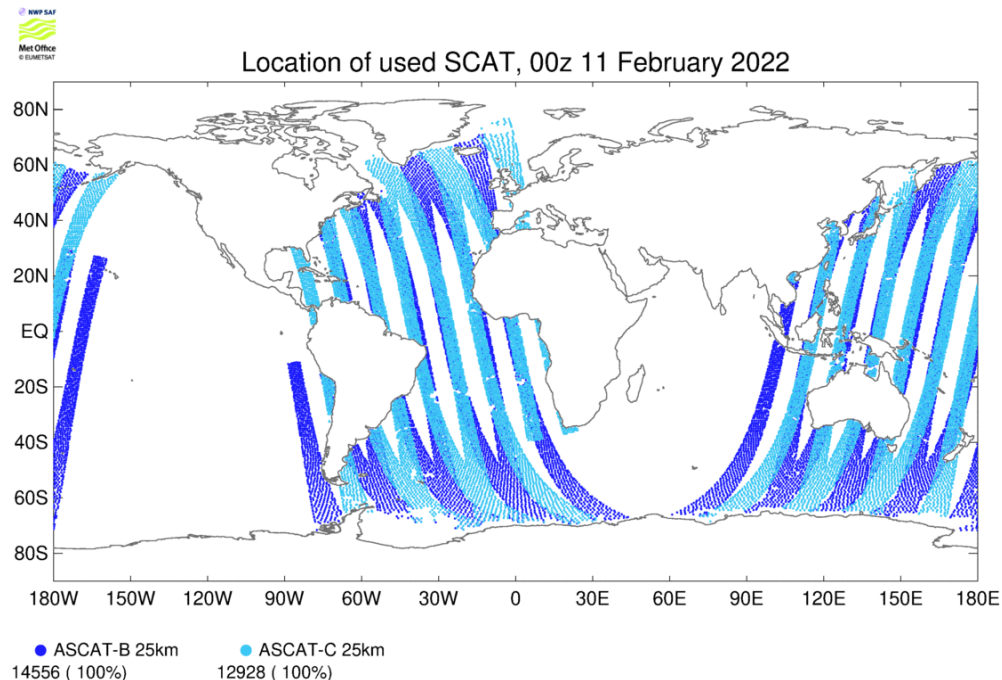
Backscatter response is sensitive to

Ocean	surface wind (via roughness)
Land	soil wetness
Ice	ice age (extent/drift)





# Scatterometer coverage



At the Met Office we assimilate data from 2 Metop satellites.

Data is also available from HY-2B/C, CFOSAT

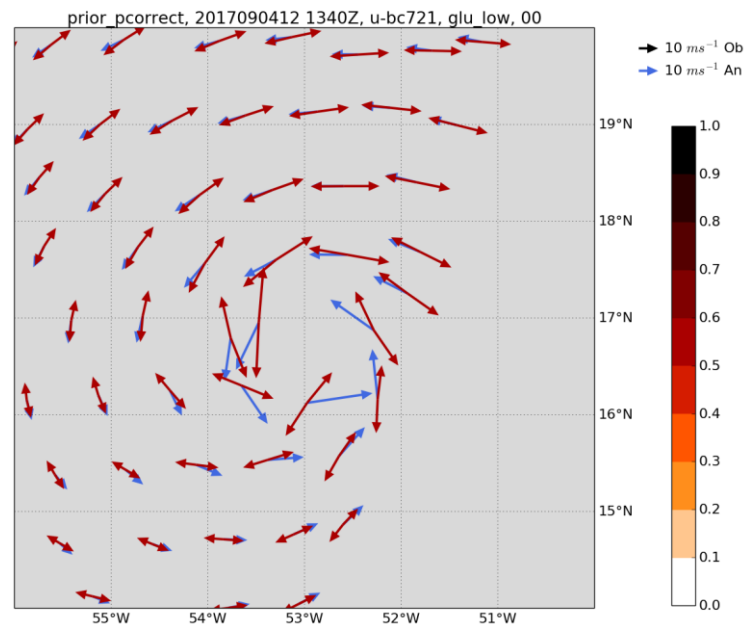
Over the next few years we will see data from Metop-SG, FY-3E, OceanSat-3/3A

# Ambiguity Removal

In general scatterometers have 2-4 wind solutions per wind vector cell.

How to handle ambiguity?

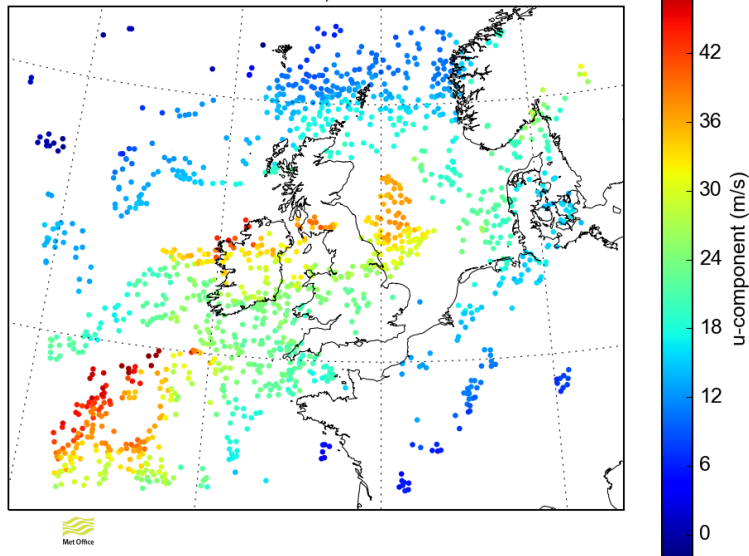
- Smallest inversion residual
- Use producers 'chosen' wind ([nowcasting/visualisation](#))
- Closest to background wind field ([O-B monitoring](#))
- Ambiguity removal based on [data assimilation](#) (e.g. 4D VAR)



ASCAT = red, model = blue

# Wind assimilation in regional models

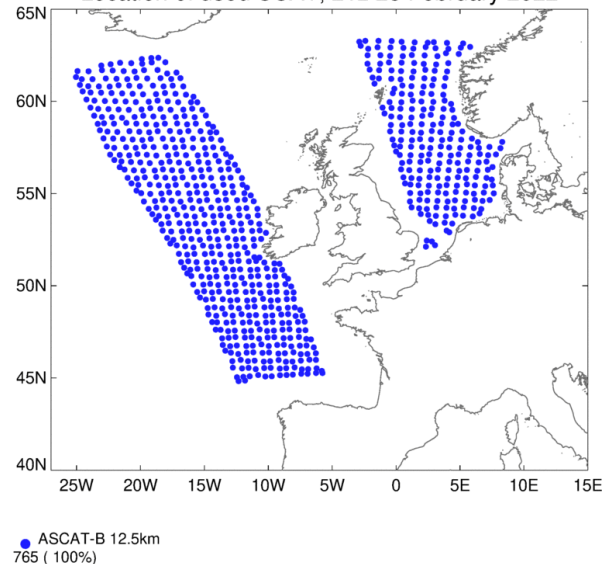
u-component for 2022021222 : 1409 obs  
mean=22.286, RMS=9.708



**AMVs:** Run the NWC SAF AMV software to generate higher resolution AMVs for our UKV model

NWC SAF  
Met Office  
© Crown Copyright

Location of used SCAT, 21z 28 February 2022



**Scatterometer winds:** assimilate higher resolution products produced by the OSI SAF.

# Doppler Wind Lidar (DWL)

DWL measures Doppler frequency shift of backscattered light

Scattering from

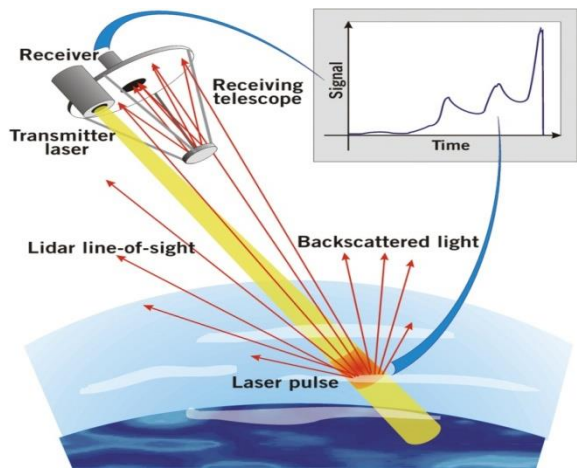
- Air molecules (clear air) – Rayleigh scattering
- Particles (aerosol/cloud) – Mie scattering

Atmospheric backscatter from a laser pulse collected by a telescope, range-gated, and spectrally analyzed to determine the Doppler shift. The range gates, Doppler shift, telescope look-angle and satellite orbit can be used to calculate the wind velocity as a function of altitude.



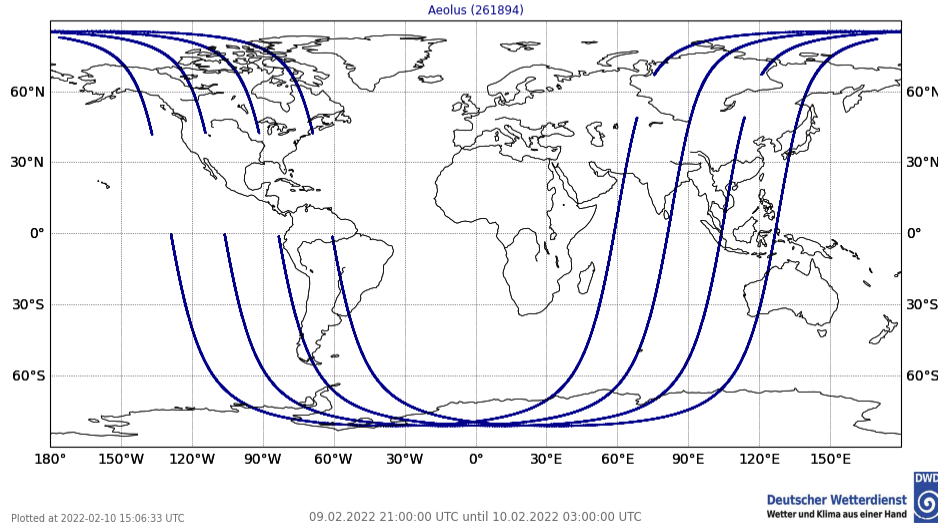
## Aeolus mission

- ESA Earth Explorer Core Mission chosen in 1999
- Technology demonstration, ~3 years
- Launched Aug 2018



# Aeolus winds

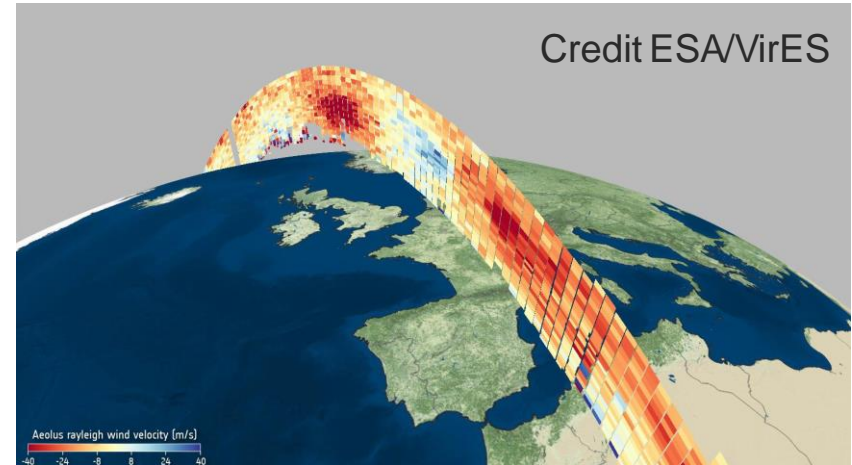
DWD observation coverage Aladin  
10.02.2022 00 UTC



Observations available along the satellite ground-track (no swath)

Only one component of the wind along line of sight of the laser - perpendicular to ground track

Profile of winds from surface to ~25 km.



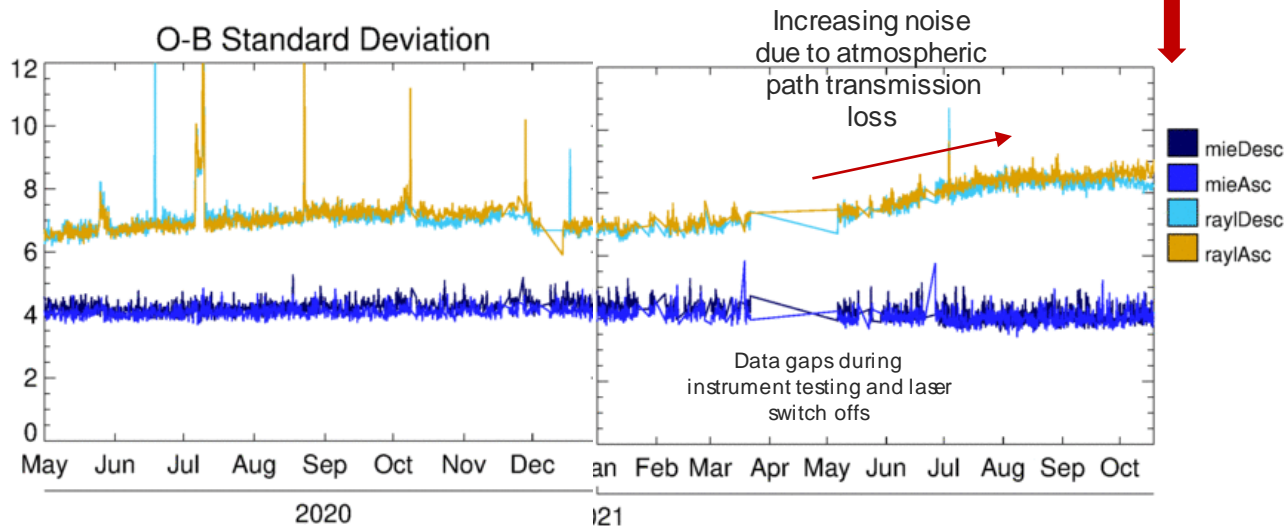


# Aeolus Challenges

Aeolus is a novel science mission. There have been a number of challenges:

1. Increased dark current “hot pixels” – leading to range bin biases – mitigated by using DUDE cycles
2. M1 mirror temperature bias, more problematic for Rayleigh channel, mitigated using a bias correction scheme

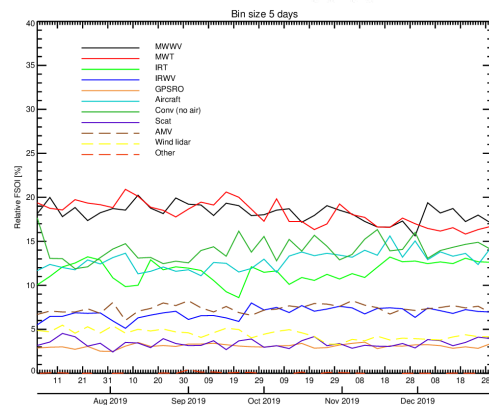
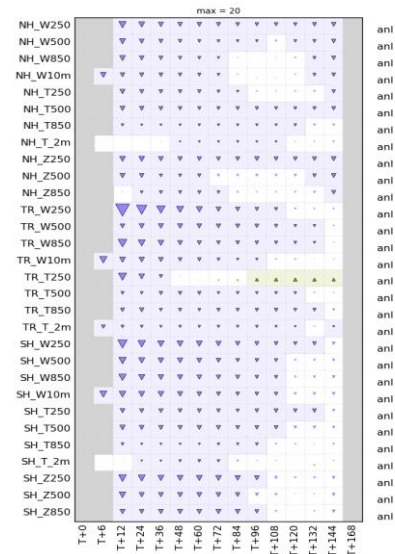
3. Increasing noise due to loss of signal in optical path, thought to be due to laser induced contamination. Optimisations made in order to reduce noise. Cannot be fully resolved.



# Impact in NWP

- Data denial experiments
- Forecast Sensitivity to Observations Impact (FSOI)

% Difference (AMV data denial vs.  
Control) - overall -0.9%  
RMSE against ecanal for 20190823 to 20191115



# Data Denial Experiments

Periodically run a series of data denial experiments

Most recently for a 3 month period: 15<sup>th</sup> Aug 2019 - 15<sup>th</sup> Nov 2019

- Remove a range of observation categories from the data assimilation step (hybrid 4D-Var)
- Forecasts compared to a *control* which uses all observations operational in late 2019 (OS43).  
Notable absences: Aeolus, Metop-C, some new RO datasets (COSMIC-2, Spire)

Simplification compared to operations

- Reduced horizontal resolution N320
- Effect of withdrawal of observations from ensemble system is ignored (ensemble feeds into deterministic forecasts via forecast error covariance matrix within hybrid 4D-Var)

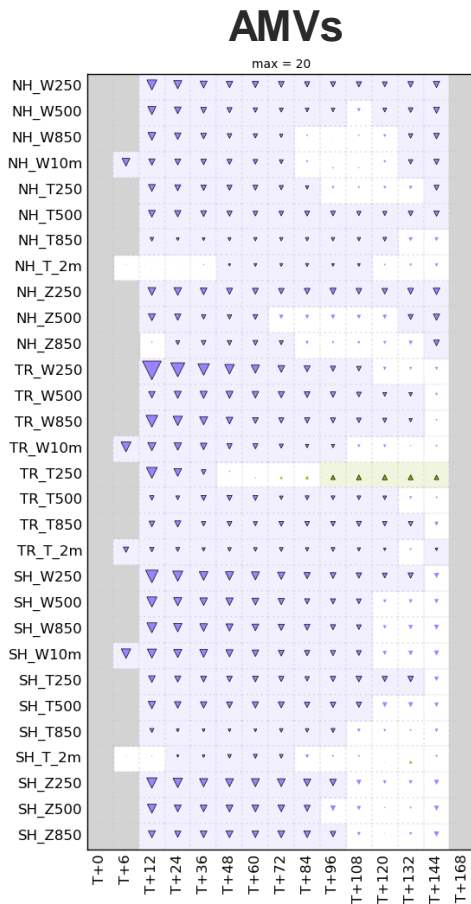
# Observation categories withdrawn

Category	Description	Key instruments
<b>Aircraft</b>	temperatures,U,V & RH from aircraft	AMDAR
<b>AMVs</b>	wind vectors from visible and IR imagers onboard geostationary and polar platforms	MSG/SEVIRI, Himarawi/AHI, GOES/ABI. high latitude winds from AVHRR & VIIRS
<b>Geostationary CSR</b>	clear sky radiances from geo IR imagers	MSG/SEVIRI, Himarawi/AHI, GOES/ABI
<b>Ground-based GNSS</b>	total zenith delay, sensitive to total column water vapour and surface pressure from GNSS receivers at a network of stations	Networks in Europe & US
<b>GNSS RO</b>	bending angles sensitive to temperature and humidity	receivers onboard Metop satellites, FY-3C,D
<b>Hyperspectral IR</b>	radiance sensitive to temperature and humidity	AIRS, CrISx2, IASi x2
<b>MW sounders and imagers</b>	radiance sensitive to temperature and humidity	AMSU-Ax5, ATMSx2, AMSR2, SSMIS, GMI, MHSx3, MWHS-2, MWRI
<b>Radiosondes</b>	profiles of temperature, winds and relative humidity	
<b>Scatwind</b>	wind vectors over ocean	ASCATx2, WindSat, ScatSat
<b>Surface - land</b>	temperature, relative humidity, pressure and winds from land stations	
<b>Surface - ocean</b>	temperature, relative humidity, pressure and wind over ocean from buoys, ships and rigs	

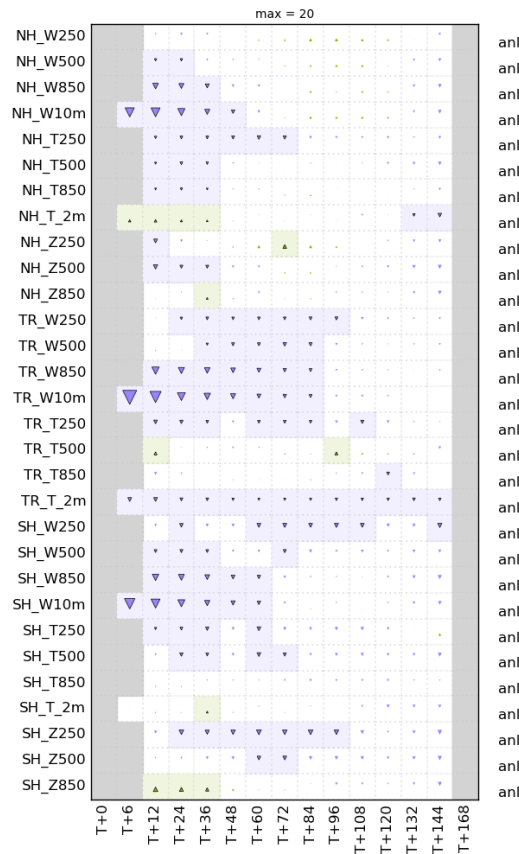
# Forecast scorecards

**Scorecards** verified using independent operational analyses (from ECMWF)

Downward triangles in **purple** denote detriment in RMS forecast error (against control) – highlighting that the withdrawn data provides benefit



### Scatterometer winds



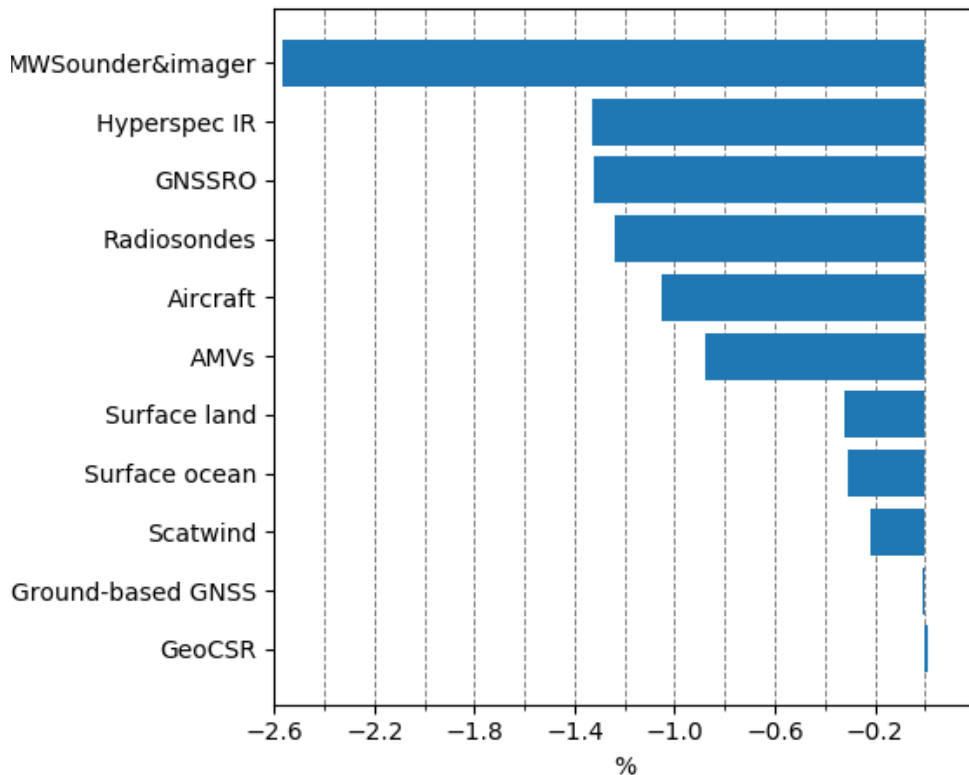
**AMVs**  
*largest change – tropical and SH wind fields*

**Scatterometer winds**  
*largest change – 10 m wind fields globally.*



# Data Denial Impact summary

**s** Mean change in scorecard versus ECMWF analysis



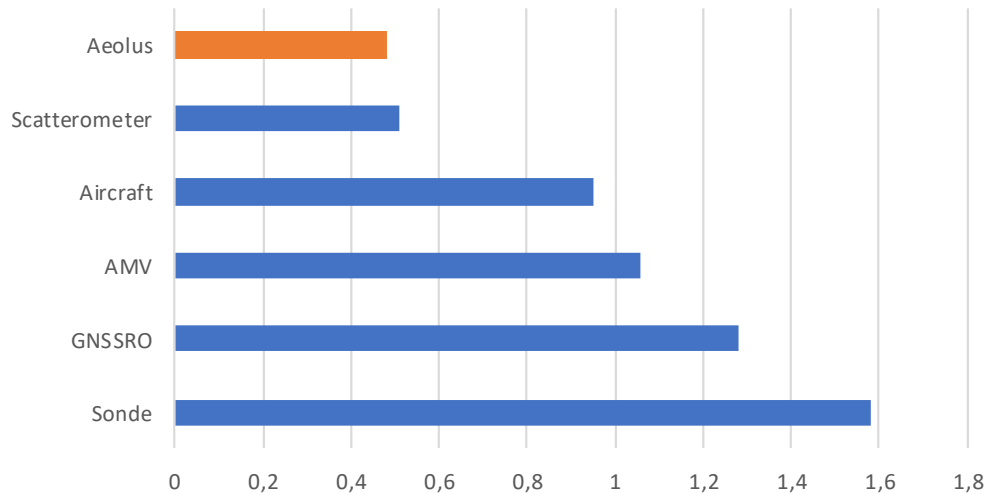
Satellite Sounders, GNSSRO and radiosondes give largest impact.

AMVs & Aircraft also important.

Nearly all observation categories yield benefit.

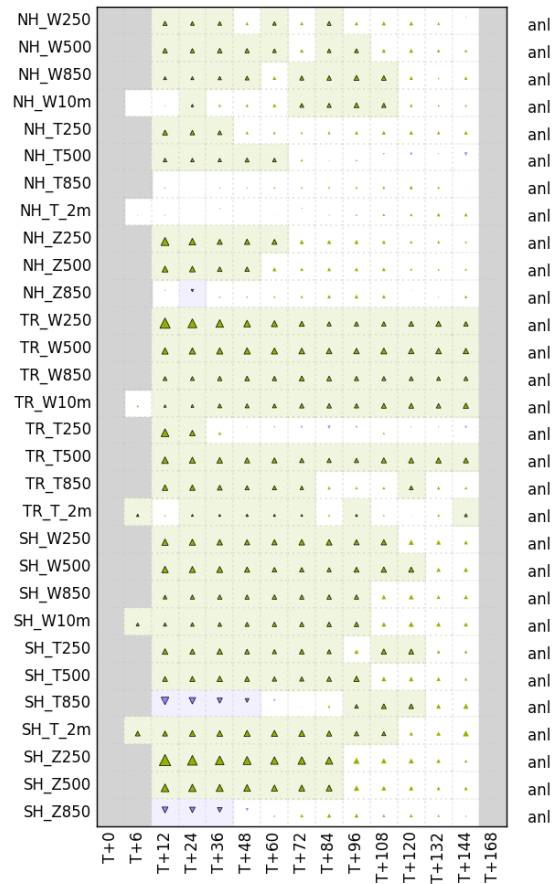
# How does Aeolus compare?

Mean change in scorecard versus ECMWF analyses



We ran a shorter data denial period in 12 Sep – 16 Oct 2018 to gauge the impact of Aeolus compared to other observation types.

Aeolus impact similar to impact from scatterometer constellation (4 satellites). Impressive for a single satellite instrument.



Operationally assimilating Aeolus winds for over 2 years

They have run numerous assimilation experiments

The most interesting is a very long, higher resolution (~18 km compared to 29 km in earlier experiments) assimilation trial using reprocessed Aeolus data. Nominal set-up; **29 June 2019 to 6 Feb 2020** (still running – **longest OSE for Aeolus!**).

Shows the **best impact** we have seen so far from Aeolus

**Statistically significant and good magnitude** positive impact on **wind, temperature, geopotential and humidity** forecasts in **tropics and polar regions**:

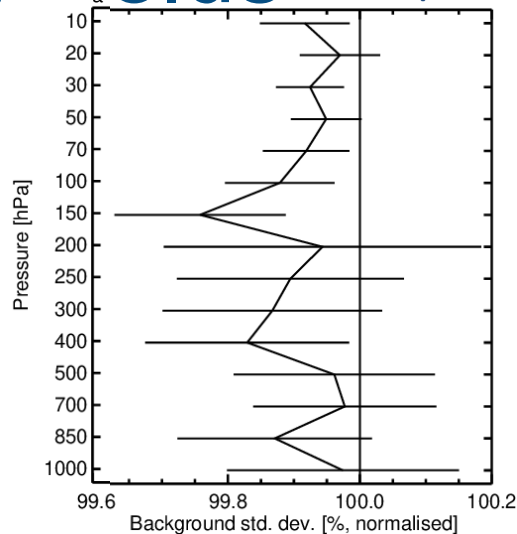
- Up to **10 days** in tropics and S. Hemi. extratropics at 100 and 50 hPa
- **Even N. Hemi. extratropics geopotential at 500 hPa is improved to day 4 by ~1%**

# Background (short-range forecast) fit to

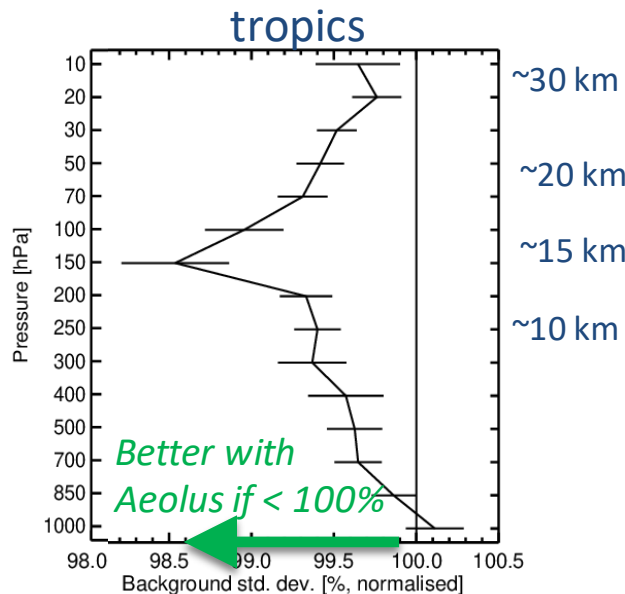
other observations when assimilating  
wind profilers

Fit to “conventional” wind observations: from aircraft, radiosondes and radar

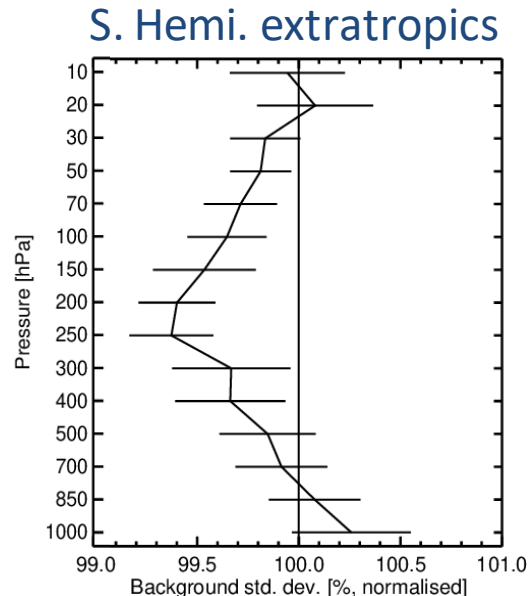
Aeolus



Small positive in  
NH extratropics



V. good impact in the tropics



Good impact in SH  
extratropics; apart from > 850

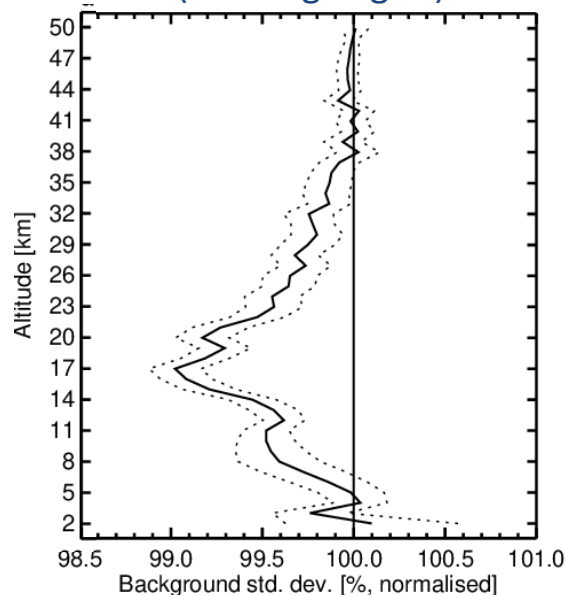
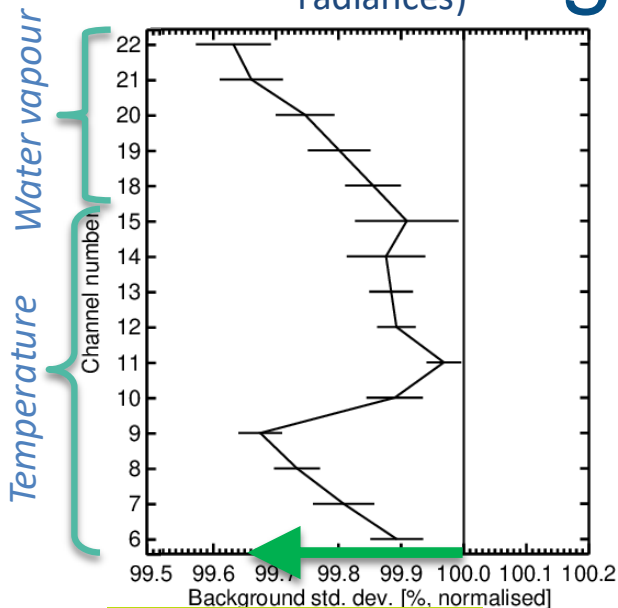
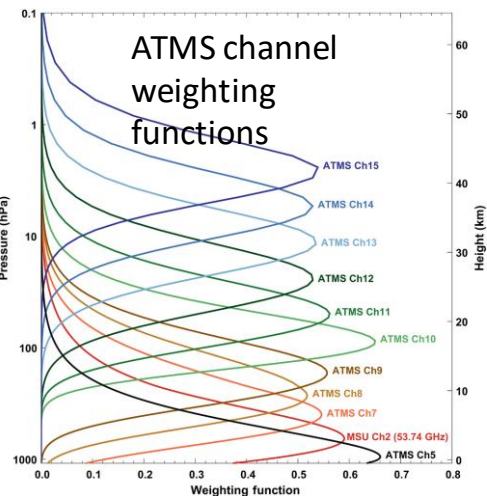
Aeolus' impact largest in tropical upper troposphere – similar previous OSEs

# background fit to other observations

when assimilating Aeolus

Global, ATMS (microwave radiances)

Global, GNSS radio occultation (bending angles)



Better with Aeolus if  
< 100%

**Strong positive impact: Aeolus improves wind, temperature and humidity background fits, most strongly in upper troposphere**



# Met Office Impact of Aeolus: forecast

Vector wind RMSE zonal average

Temperature RMSE zonal average

Short-range verification by analysis is not trustworthy

Vector wind RMSE 500 hPa ( $\pm 10\%$ )

2 days

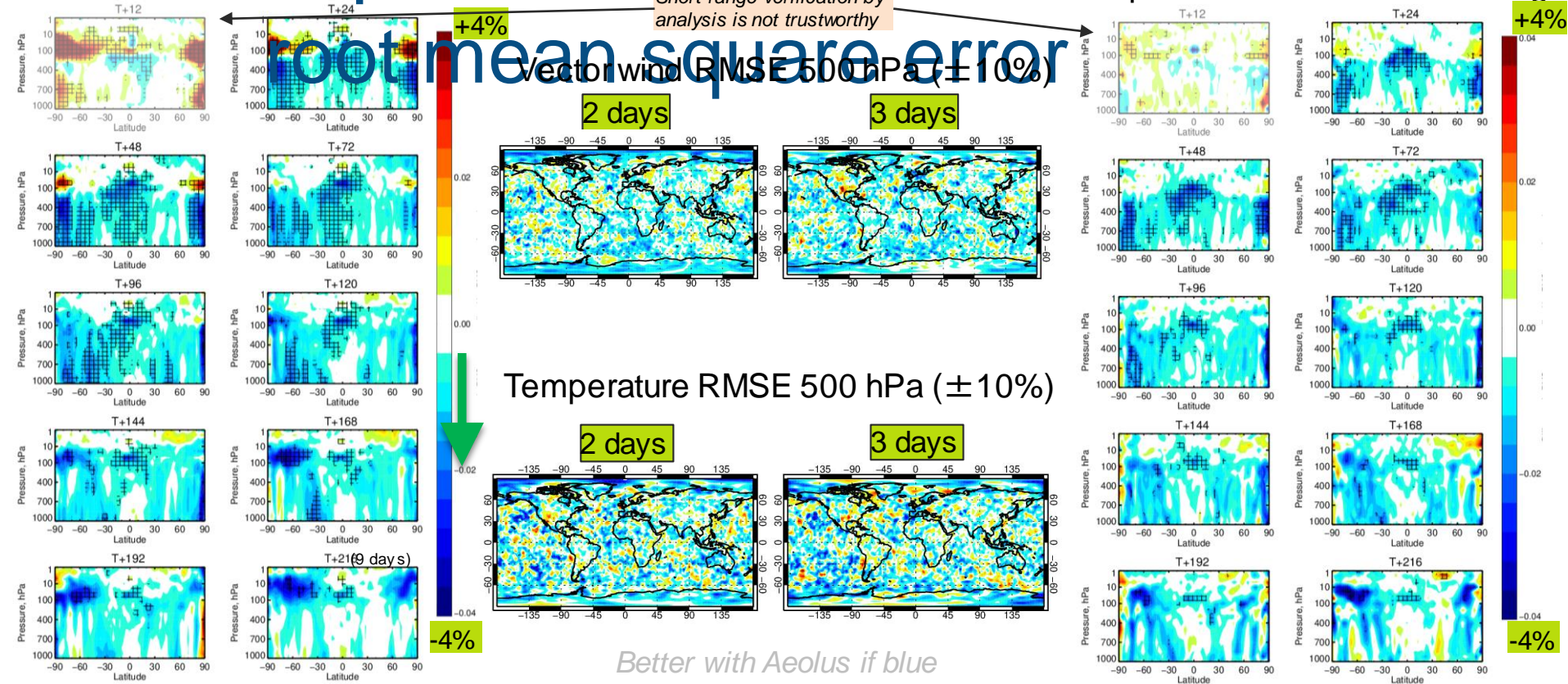
3 days

Temperature RMSE 500 hPa ( $\pm 10\%$ )

2 days

3 days

Better with Aeolus if blue

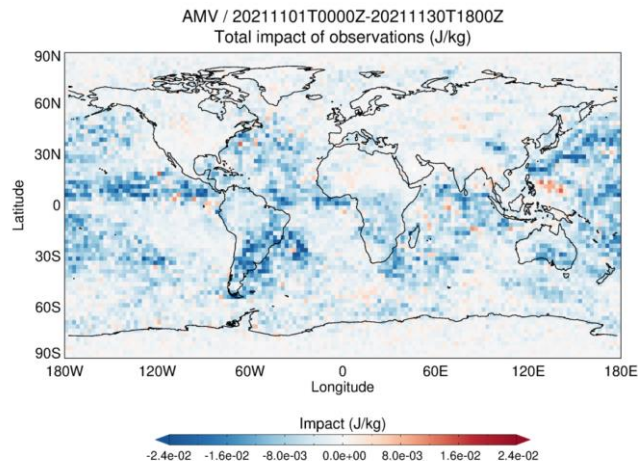
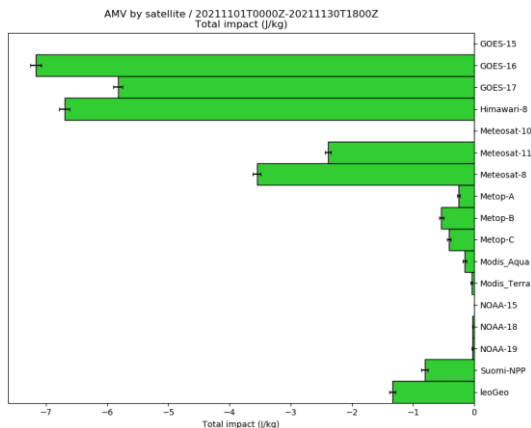


- A lot of positive impact!

# Forecast Sensitivity to Observations Impact (FSOI)

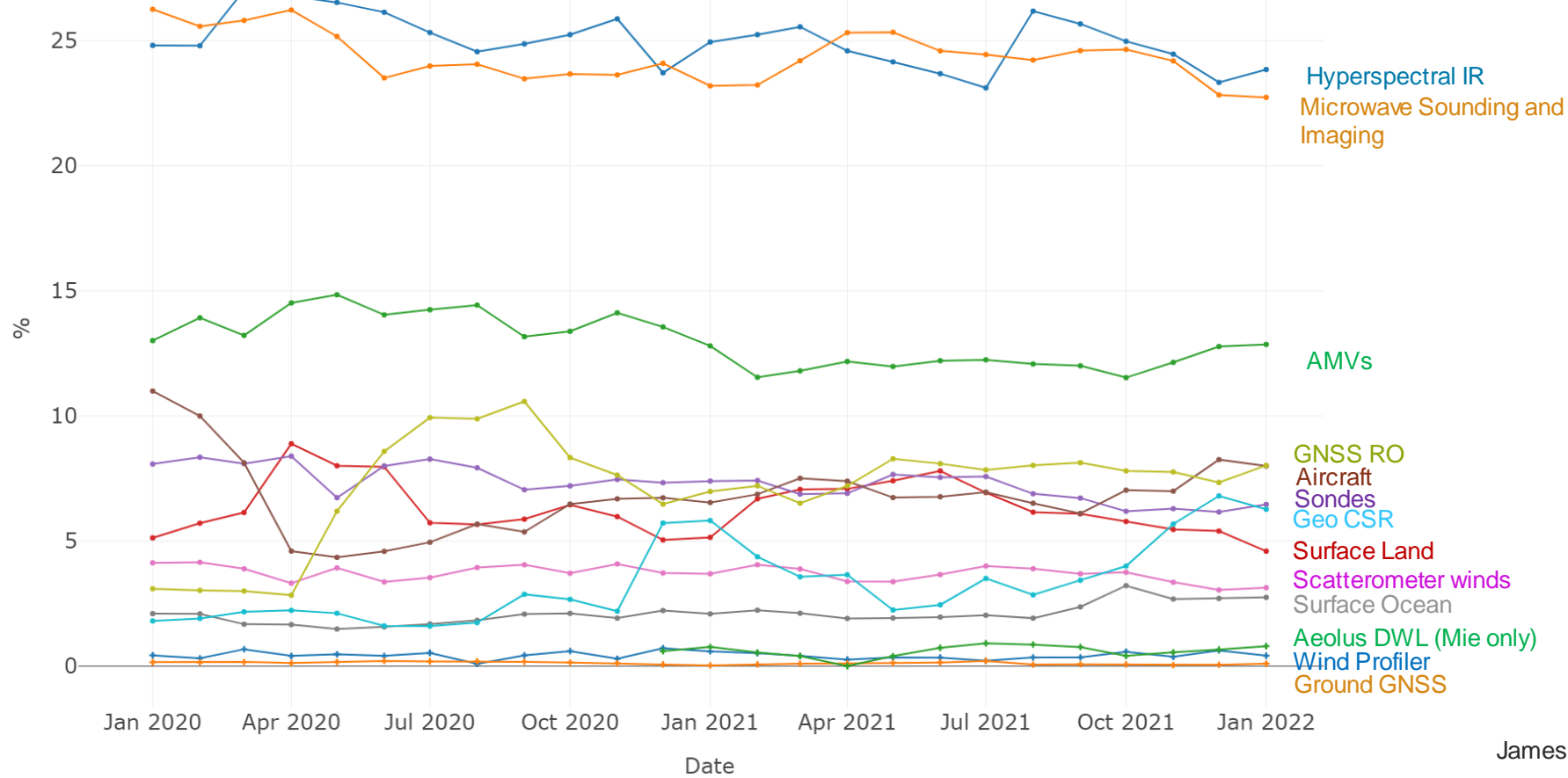
- FSOI is a technique to measure the impact on forecast error due to the assimilation of each individual observation. See Lorenc and Marriott (2013)
- Verification:** considers the impact at a single forecast lead time, in this case 24 hours.
- Metric:** global, total (moist) energy norm, calculated from surface up to 150 hPa.
- Negative FSOI values indicate a beneficial impact i.e., a reduction in forecast error
- Satellite data account for around 70% of the total impact

*Lorenc, A. C. and Marriott, R. T.  
(2013) Forecast sensitivity to  
observations in the Met Office  
Global numerical weather  
prediction system Q. J. R.  
Meteorol. Soc., 140, 678, pp  
209-224*



# FSOI time series

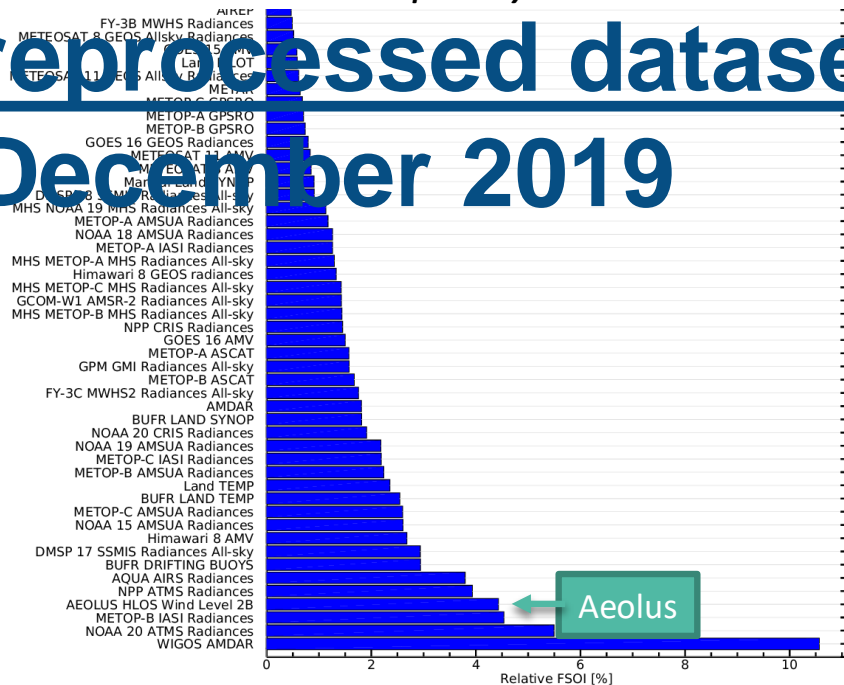
Met Office, UK



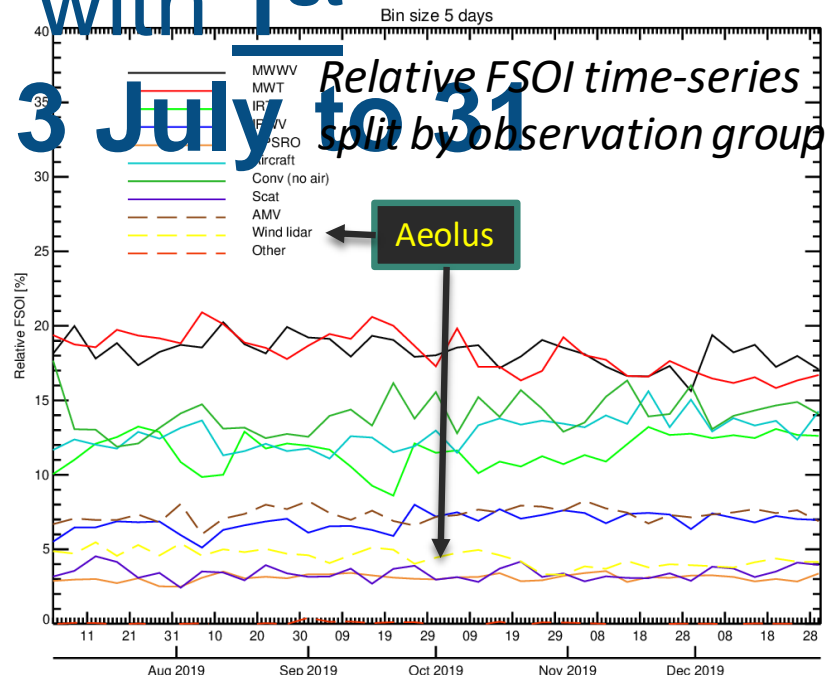
# ECMWF Relative FSOI with 1st

## reprocessed dataset; 3 July to 31

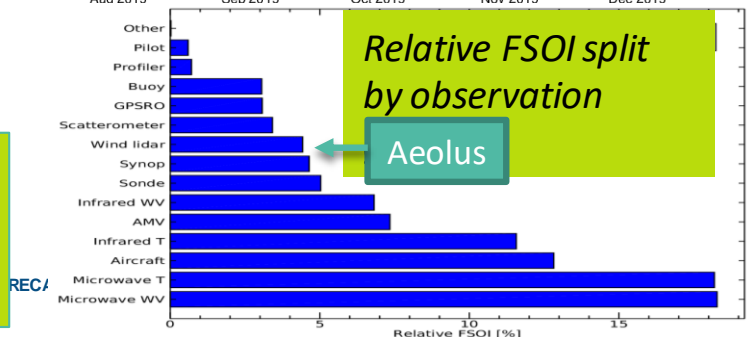
December 2019



## Relative FSOI time-series split by observation group



## Relative FSOI split by observation



Mike Rennie

- Aeolus does well for **one satellite instrument**
- Aeolus relative FSOI impact decreases with time:
  - ~5% in July 2019; ~4% in Dec. 2019, ~2.5% now

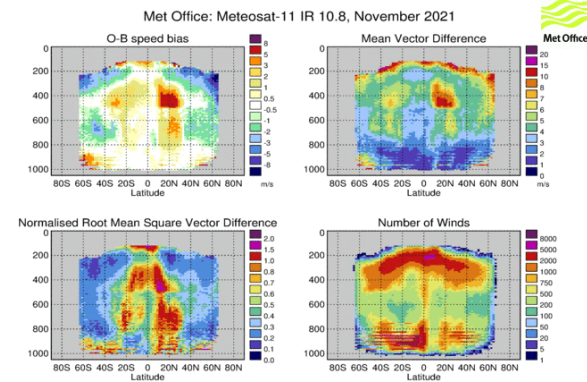
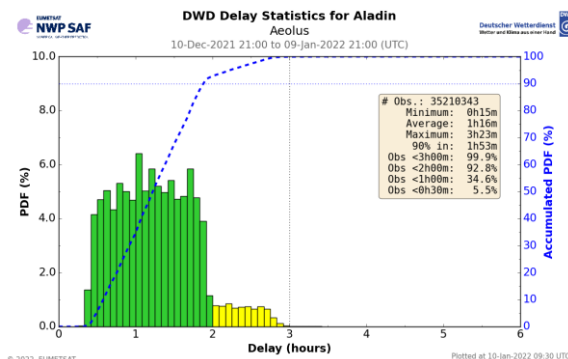
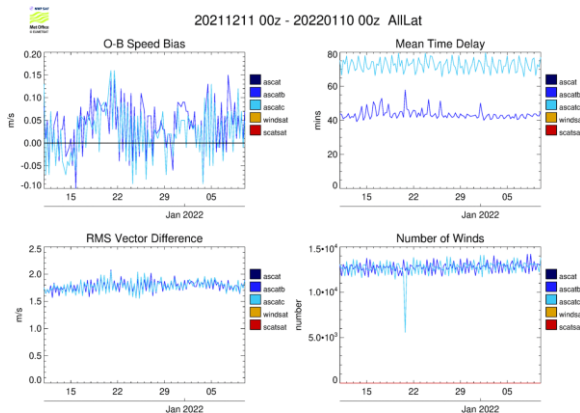
# NWP SAF winds monitoring and analysis



The NWP SAF aims to improve and support the interface between satellite data/products and European activities in NWP.

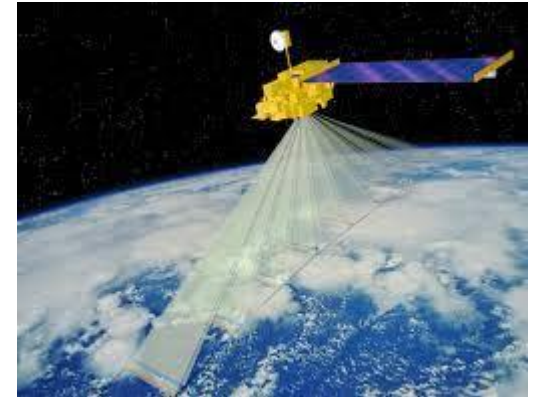
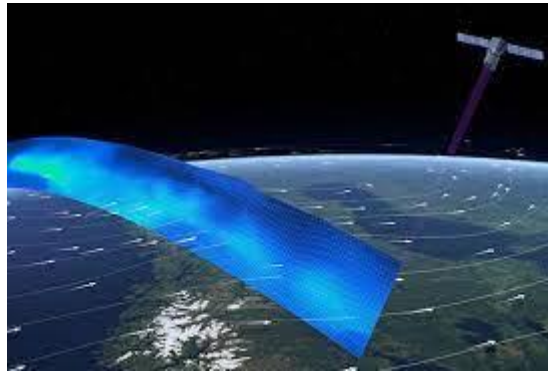
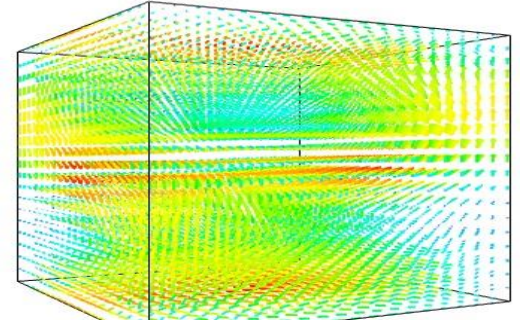
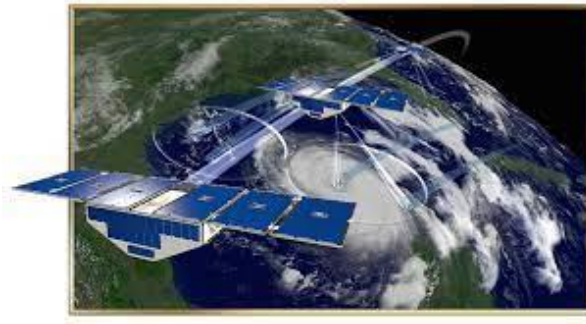


# Aims of the NWP SAF monitoring



1. Near real-time monitoring to pick up data outages and problems with the data
2. Data coverage and timeliness to help with decision making on which data to assimilate in which models
3. Monthly monitoring to identify more persistent problems in the data
4. Analysis report of AMV monthly monitoring to dig into what is causing the problems – ultimately leading to improvement in AMV derivation and assimilation strategy.

# Some thoughts for the future



# Future satellite-derived wind datasets...

- Expect AMVs and scatterometer winds will continue to be a significant part of the Global Observing System for the foreseeable future.
- As we gain increasing benefit from direct cloudy radiance assimilation in 4D-Var we may see the impact of AMVs taper.
- What else?
  - **Future Doppler Wind Lidar missions** - Aeolus follow-on being explored for 2030->
  - **Profile wind information from hyperspectral sounders** MTG-IRS, small satellite constellations (Régis Borde's talk)
  - Other sources of surface wind data – **GNSS-R winds**
  - **High resolution wind products** – for regional models / nowcasting (Jason Apke's talk)
  - Other possibles: WIVERN Doppler radar winds, stereo height AMVs...

# Talk Summary

1. Satellite-derived winds are an important source of wind information for the models, showing beneficial impact in data denial experiments and FSOI.
2. Atmospheric Motion Vectors, scatterometer winds and the more recent Doppler Wind Lidar provide complementary information.
3. Wind profile information has been a key unmet need in the global observing system. Aeolus has helped to fill this gap. Follow-on DWL and higher temporal resolution hyperspectral sounders (e.g. MTG-IRS) may help in the future.