### Wind information from Aeolus

#### EUMETSAT/ECMWF NWP-SAF Satellite Data Assimilation training course, 2024

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aeolus

DISC



#### Aeolus satellite mission

- European Space Agency "Earth Explorer" mission to measure profiles of wind globally
  - Chosen in 1999
  - Named from Greek mythology: "Keeper of the Winds"



- Payload: Doppler wind lidar (DWL); ALADIN: Atmospheric LAser Doppler INstrument
- Technology demonstration; 3-years
- Satellite and instrument built by Airbus Defence and Space
- Status of mission:
  - Launched on 22 August 2018 (10 yr delay due to technical issues!)
  - First wind lidar in space and first European lidar in space
  - Measured winds from 3 September 2018 until 5 July 2023. Exceeded nominal mission lifetime; deorbited on 28 July 2023 (lack of fuel!)







#### ESA-developed Earth Observation missions





#### Aeolus satellite mission

#### Scientific Objectives:

- Improve the quality of weather forecasts by providing global profile measurements of horizontal line-of-sight wind in troposphere and lower stratosphere
- 2. To advance understanding of atmospheric dynamics and climate processes

#### Long-term goal:

**Demonstrate** space-based Doppler wind lidar's capability for operational use

- Global Observing System still lacks globally distributed wind profiles
- Best NWP impact was expected in tropics due to lack of conventional wind profiles and atmospheric dynamical arguments on importance of wind versus mass (T, p) information near equator





**WEATHER FOREC** Weather Forect Weather Forect Weather Forect Weather Forect Weather Forect Wind field dominates the atmospheric dynamics, and three-dimensional wind measurements are important. Courtesy: ESA, 1999

#### Aeolus measurement principle



#### Cover<u>age in a day</u>





- Satellite: sun-synchronous, dawn-dusk (06/18 Local Solar Time) near polar orbit; 111 orbits per week
  - At terminator between day/night to keep solar panels illuminated and minimise reflected solar radiation (noise)
- Instrument:
  - Direct detection Doppler wind lidar at ~355 nm (long wave ultraviolet), fires ~50 laser pulses per second
  - Two receiver channels:
    - Mie to determine winds from cloud and aerosol backscatter ("cloudy"-air)
    - **Rayleigh** to determine winds from **molecular** backscatter (clear-air)
  - Lidar line-of-sight points:
    - 35° off-nadir to determine horizontal line-of-sight wind component (not vector wind)
    - Perpendicular to satellite-earth relative velocity
    - To dark side to minimise reflected solar radiation

Introduction to lidar, Doppler wind lidar and Aeolus' specific design





#### Lidar equation

• Total scattered **power received by lidar** at a time corresponding to range *R* is:

$$P(\lambda, R) = P_L \frac{A_0}{R^2} \xi(\lambda, R) \beta(\lambda, R) T^2(\lambda, R) \frac{c\tau_L}{2}$$

- $\lambda$  = laser wavelength
- R = range of scatterer from sensor
- $\beta$  = **atmosphere** volume backscattering coefficient
- *T* = one way transmission factor (Beer-Lambert law):  $T(\lambda, R) = e^{-\int_0^R \alpha(\lambda, R) dR}$
- *α* = **atmosphere** attenuation coefficient
- $P_L$  = average power in laser pulse
- $A_0$  = area of objective lens
- *c* = speed of light
- $\tau_L$  = laser pulse duration
- $\xi$  = calibration factor (depending on spectral transmission of receiver and overlap factor)



**Source:** Measures (1992); R.M. Measures, "Laser Remote Sensing. Fundamentals and Applications". John Wiley & Sons, 1984

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#### "Lidar curtain" of space-borne lidar (CALIPSO (532 nm)), attenuated backscatter: $\beta T^2$



532 nm Total Attenuated Backscatter, km<sup>-1</sup> sr<sup>-1</sup> UTC: 2016-04-13 02:37:53.8 to 2016-04-13 02:51:22.5 Version: 3.30 Standard Nighttime

#### What's different about a Doppler lidar?

• Atmospheric composition lidars use **amplitude of backscatter signal** and **polarisation** to provide information about the **atmospheric composition** 

- **Doppler lidars** measure **change in the frequency** (Doppler shift) of received relative to emitted light **to determine line-of-sight wind** 
  - Aeolus also provides an atmospheric composition product; a useful demonstration of spacebased high-spectral resolution (HSRL) UV lidar; ESA's EarthCARE ATLID lidar will specialise in this





### Doppler wind lidar

A DWL measures the Doppler frequency shift of backscattered light

Blue shift

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- Doppler frequency shift:  $\Delta f = 2f_0 v_{LOS}/c$ 
  - $\Delta f$  = change in frequency
  - $f_0$  = emitted frequency e.g. ~845 THz for Aeolus
  - c = speed of light
  - $v_{LOS}$  = component of atmosphere's wind velocity along line-of-sight direction. Average speed of molecules/particles in volume of air.
- Doppler shift frequency is very small,  $\frac{\Delta f}{f_0} \approx 10^{-8}$  for 1 m/s LOS wind change; need **very sensitive instrument**
- Backscatter comes from:
  - Air molecules (clear air), particles (aerosol/cloud) and Earth's surface



#### Aeolus operates lidar at 355 nm wavelength – scattering behaviour





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#### Winds from **clear sky** conditions; **Rayleigh** scattering

- For Rayleigh scattering:  $I \propto \frac{1}{\lambda^4}$ ; scatterer size  $<\frac{\lambda}{10}$ 
  - · For strong scattering from air molecules need short wavelength, hence Aeolus uses UV laser
- **Thermal motion** of molecules leads to **Doppler** broadening
  - e.g. T=15 °C get  $\sigma_v$ =459 m/s!
  - Brillouin scattering effect due to acoustic waves (at higher pressure) also matters
- Wind measured as frequency shift in mean of broadened spectrum (1 m/s HLOS wind=3 MHz  $\Delta f$ ) from wind

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# Winds from "**cloudy**" conditions i.e. scattering from cloud water/ice droplets and aerosols; **Mie** scattering

- Particle sizes  $\geq \lambda$ ; intensity weakly dependent on  $\lambda$
- Doppler broadening negligible (particles "heavy")
  - Narrow spectrum
  - No temperature, pressure dependence
- <u>Wind</u> measured as frequency shift in mean of narrow Mie spectrum
- Since light is strongly attenuated by most clouds, then measure winds mostly from the top of clouds (from space)



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Doppler shift from wind

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 $\Delta f$  (GHz)

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#### Rayleigh channel method

### Doube-edge Fabry-Pérot interferometer

transmission maximum
 occurs for a specific
 wavelength of light; which
 differs for each interferometer





- Rayleigh spots imaged on accumulation CCD
- Contrast of spots  $R = \frac{A-B}{A+B}$ calibrated against frequency

From Reitebuch (2012): Wind Lidar for Atmospheric Research, in Springer Series

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#### Mie channel method





Figure from Reitebuch (2012): Wind Lidar for Atmospheric Research, in Springer Series

### Mie fringe on ACCD



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Fringe position  $\propto f$ , calibration required

- Narrowband Fizeau
  interferometer
- Transmission max. for *f* depends on x-position – thickness of gap (*wedge* shape)

Figure from Reitebuch (2012) The Spaceborne Wind Lidar Mission ADM-Aeolus, Springer

 $d_2$ 



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#### Real Mie channel signals (L1B data) over an orbit



#### Features of Doppler Wind Lidar

- Advantages:
  - Provides Doppler shift (hence LOS wind speed) profiles
  - Good vertical and horizontal (along-track) resolution is possible
    - Complementary to relatively poor *vertical* resolution of passive sensing instruments
  - Not many processing steps and assumptions to get wind i.e. reasonably direct measure of the geophysical variable
- Disadvantages:
  - Totally attenuated by optically thick cloud or aerosol, need radar to see within clouds
  - Space-borne DWL:
    - Complicated technology
    - Several LOS "looks" are required to get <u>vector</u> wind, nominally have wind component along the LOS
    - · Limited sampling across-track i.e. "poor swath"
    - Due to 1/R<sup>2</sup> dependence of signal, then relatively *low altitude orbit* (closer to target) hence fuel issues
  - Calibration can be tricky



# Example of Aeolus Level-2B horizontal line-of-sight (HLOS) winds



12-hours of L2B **Mie-cloudy** HLOS winds

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#### Rayleigh and Mie winds are complementary

#### 24 24 20 20 Altitude, wrt geoid (km) 16 16 12 12 8 -63.8 -89.9 -17.2 -72.2 -40.8 -78.2 77.2 -41.3 -40.8 -78.2 -63.8 -89.9 Lat: Lon: 77.5 98.9 77.2 -41.3 54.1 -57.7 30.4 -63.4 6.6 -67.8 -81.1 -155.7 -65.8 126.4 -42.9 113.5 -19.4 107.3 4.4 102.8 28.2 98.5 51.9 93.0 75. Lat: 78. Lon: 77.5 98.9 54.1 -57.7 30.4 -63.4 6.6 -67.8 -17.2 -72.2 -81.1 -155.7 -65.8 126.4 -42.9 113.5 -19.4 107.3 4.4 102.8 51.9 93.0 28.2 98.5 75.1 78.9 HLOS wind O (m/s) HLOS wind O (m/s) Mean=-0.21 Mean=-0.07 Std.dev.=15.30 Count=344( Std.dev.=19.70 Count=8986 -47.61 -22.26 3.10 28.46 53.81 -72.97 -47.61 -22.26 3.10 28.46 -72.97 79.17 53.81 79.17 ~14 km horizontal averages ~86 km horizontal averages

Mie-cloudy L2B HLOS winds

Allitude, wit geold (Kiti)

#### Rayleigh-clear L2B HLOS winds



### Use of Aeolus in NWP at ECMWF



#### What to assimilate from Aeolus for NWP?



#### L2B HLOS (horizontal line-of-sight) wind assimilation



- Assigned observation error (R matrix) uses L2B processor estimated instrument noise
- Aeolus was operationally used at ECMWF from 9 Jan 2020 to 30 April 2023



### Aeolus signal levels during mission – signal dropped at steady rate for FM-A laser (first time) and FM-B. But last attempt with FM-A proved to be quite stable.



## Global HLOS wind **O-B** departure statistics for L2B **Rayleigh-clear**, **15 July 2019 (at its best)!**



- Global average bias is reasonable
- *Estimated* observation error from O-B departures

$$\sqrt{st.dev.(O-B)^2-{\sigma_B}^2}$$

- Profile average ~ 4 m/s
- Still larger than we hoped for before launch
- Compare: radiosonde u-wind assigned obs. error is ~2 m/s



#### Global HLOS O-B statistics for L2B Mie-cloudy, 15 July 2019

- Global average bias is reasonable and stable with time
- *Estimated* observation random error from O-B departures

$$\sqrt{st.\,dev(O-B))^2-{\sigma_B}^2}$$
 is

- Profile average ~3 m/s
- Mie averaging length scale is ~10-20 km (Rayleigh is ≤ ~86 km)
- Mie noise better despite finer horizontal resolution than Rayleigh

### Aeolus Level-2B HLOS (horizontal line-of-sight) wind data quality

#### Rayleigh-clear

- Large variability of random errors (variable signal levels)
- Recent NRT FM-A laser good (best processing, reduced readout noise, reasonable signal)



#### Mie-cloudy

- Noise quite stable and small compared to Rayleigh-clear
- But data count variable with signal levels/aerosol load





Aeolus NWP impact at ECMWF



#### Methods for Aeolus L2B wind NWP impact assessment at ECMWF

- Observing System Experiments (OSEs):
  - For robust assessment of impact into the medium-range
  - 2<sup>nd</sup> reprocessed FM-B period (**OSE for long period**):
    - Rayleigh-clear + Mie-cloudy as in current operations; **29 June 2019 to 9 October 2020**
- Forecast Sensitivity Observation Impact (FSOI):
  - Assessment of short-range forecast impact with some limitations
  - Operational FSOI; since 9 January 2020
  - FSOI via 2<sup>nd</sup> reprocessed dataset OSE (Aeolus "on" experiment)



#### Assimilating Aeolus winds has strong effect on zonal wind analyses



Mean difference in *u* analysis at **100 hPa** -0.9 -0.8 -0.7 -0.6 -0.5 -0.4 -0.3 -0.2 -0.1 02 03 04 05 06 07 08 0.1 m/s 120°E 120°W 60°W 0°E 60°N 60°N 30°N 0°N 30°S 60°S 60°S 120°W 60°W 60° 120°E

Largest changes made to tropical upper troposphere and SH extratropics – in climatological **convergence zones**; larger background wind errors associated with convection

#### Independent wind observations confirm improvements from assimilating Aeolus

Fit to vector wind from aircraft, radiosondes and radar wind profilers



Positive impact in mid-troposphere to lower stratosphere Largest impact on **wind in upper troposphere and lower stratosphere in tropics** 

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#### Improved winds lead to better NWP temperature and humidity forecasts



#### Aeolus significantly improves NWP forecasts in most areas and forecast ranges



#### Short-range forecast impact by Forecast Sensitivity to Observation (FSO) time-series Aeolus absolute FSOI, global 20000 Aeolus Rayleigh-clear summed FSOI, 14 day rolling average Impact depends ٠ Aeolus Mie-cloudy summed FSOI, 14 day rolling average 18000 on random error Total Aeolus summed FSOI, 14 day rolling average and data counts 16000 (some gaps, 14000 QC) FSOI (10<sup>-5</sup>Jkg<sup>-1</sup>) 12000 Impact was boosted by 10000 increased signal 8000 levels of FM-A in final 5 months 6000 4000 FM-B laser FM-A 2000 2019-09-01 2019-07-01 2019-11-01 2020-01-01 2020-03-01 2020-05-01 2020-07-01 2022-03-01 2022-09-01 2022-11-01 2023-01-01 2023-03-01 2020-09-01 2020-11-01 2021-01-01 2021-03-01 2021-05-01 2021-11-01 2022-01-01 2022-05-01 2022-07-01 2021-07-01 2021-09-01 Date (YYYY-MM-DD) Impact with FM-A laser in late 2022 into 2023 increased by 39 ~60% compared to **end** of FM-B – thanks to better signal

#### Aeolus punched above its weight given the amount of data



#### An impression of analysis u-component wind **random errors**: stdev of **ECMWF minus Met Office** analysis differences: 1 Jan to 20 Feb 2023



#### An impression of analysis u-component wind **systematic errors**: mean of **ECMWF minus Met Office** analysis differences: 1 Jan to 20 Feb 2023



#### Some other demonstrated benefits in atmospheric sciences from Aeolus

- Applications in *atmospheric dynamics* research:
  - gravity waves, equatorial waves, SSW events, QBO monitoring improving understanding of Earth's climate

e.g. https://doi.org/10.5194/acp-24-2465-2024



- Optical properties for *atmospheric composition* research:
  - Wildfire smoke, Saharan dust, volcanic eruption plumes, atmospheric composition data assimilation
  - Unique ability of Aeolus to measure dynamics and optical properties should be exploited further – coupled composition and dynamics forecasts
  - Cloud properties. Mark Fielding (ECMWF) has been testing assimilating cloud information from Aeolus
- Aeolus winds are useful for verifying/improving usage of other satellite wind observation types e.g. Atmospheric Motion Vectors and checking if other observation types are improving wind

### Summary on Wind Information from Aeolus

- Novel space-based technology is required to actively sense wind profiles – Aeolus Doppler Wind Lidar demonstrated this
- Measured signals have a reasonably direct link to wind geophysical variable
- Positive NWP impact corroborates dynamical reasoning on importance of global, vertically resolved wind profiles
- Applications in atmospheric clouds, dynamics and composition research

#### In upcoming years:

- Focus on achieving best quality reprocessed datasets for research and reanalysis (ERA6) and maximising impact
- Operational follow-on mission (EPS-Aeolus) with two satellites (one after other) in 2031 time-frame is being prepared by ESA/EUMETSAT – decision on "programme" by EUMETSAT member states in 2025
  - Many improvements planned relative to Aeolus so increased impact



Thanks for listening. Any questions?



Backup slides



#### Aeolus' orbital parameters

Aeolus track in July



Aeolus track in October



- Dawn-dusk sun synchronous (18:00 ascending node)
- 7 day repeat cycle (111 orbits)
- Inclination: ~97 degrees
- Altitude: ~320 km
- The laser points towards the dark side of the terminator to reduce UV solar background noise – but this can't be avoided over the poles in summer



#### Types of Doppler wind lidar

- Coherent detection
  - Detecting beat signal mixing of returned signal with internal reference
  - Particulate (Mie) scattering only
- Direct detection:
  - Aeolus uses this
  - Measurement is signal intensity (or photon counts) through optical filters (interferometers) which varies with the frequency of light
  - <u>Molecules and particles</u> are the source of the backscattered signal
    - Useful for NWP to have both clear air + cloud/aerosol winds



#### Aeolus Rayleigh channel

Uses "filter method", specifically the double-edge technique

- Two frequency filters (A and B) sample sides of Rayleigh-Brillouin spectrum, providing photon counts
- Contrast function (response) calculated from counts:  $R = \frac{A-B}{A+B}$
- R is measured for both internal reference (i.e. outgoing laser spectrum) and for atmospheric return
- Calibration is needed for both internal and atmospheric responses to relate response to frequency
- Change in frequency of atmospheric relative to internal frequency is obtained  $\Delta f = f_{atm} f_{int}$  i.e. the Doppler shift, hence LOS wind

#### Aeolus Mie channel

Wind derived from the narrow Mie spectrum obtained by "Fringe Imaging Technique"

- Position of interference pattern (called a "fringe") is related to frequency (by calibration), both for the internal and atmospheric returns
- Measured fringe centroid for both internal and atmospheric signals is then converted to frequency, hence calculate  $\Delta f = f_{atm} f_{int}$  i.e. the Doppler shift, hence LOS wind

#### How Aeolus products were produced in NRT

Wind products were produced in NRT for the benefit of operational NWP – *despite being only a demonstration mission* 



#### There are 24 vertical range-bins to assign

- Range-bin thickness can vary from 0.25 to 2 km thick in 0.25 km increments
- Rayleigh and Mie range-bin settings can be different

- Range-bins settings can vary according to latitude/longitude boxes that are defined on-board the satellite
  - An attempt has been made to optimise the settings for NWP impact - varying with latitude





### Example of Level-1B signal amplitude (photon counts, i.e. *not winds*) for a 3000 km stretch of data

Each data point is ~2.7 km across (a flexible instrument setting)

Rayleigh channel signal

Mie channel signal



#### Real Aeolus measurement signal amplitudes





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#### Level-2B wind processing algorithm overview

- Line-of-sight (LOS) or Horizontal LOS wind components suitable for use in NWP/research
  - Using measurement-level L1B data and calibration products
- Enhancements compared to L1B observations:
  - Grouping of measurements: control of horizontal resolution and noise
  - Classification of measurements: into different types using optical properties (clear/cloudy); to avoid significant Mie contamination of Rayleigh
  - Accumulation: of L1B signal of grouped and classified measurements
  - Wind retrieval for different observation types:
    - Rayleigh-clear; Mie-cloudy; Rayleigh-cloudy; Mie-clear
  - Rayleigh corrections:
    - **Temperature**, **pressure** sensitivity (**R**ayleigh-**B**rillouin **C**orrection) using *a priori* (AUX\_MET) information
      - without this correction several m/s HLOS wind biases could occur
    - Account for Mie signal on Rayleigh channel using L1B scattering ratio



#### ... continued

- Uncertainty estimates (dynamic instrument error estimate) and quality flags for each wind result
- Wind observations are essentially independent however profile also provided pointing to observation index
- Most processing options controllable via settings file (flexible)
- Software freely available and highly portable: <u>https://confluence.ecmwf.int/display/AEOL</u>
- Additional tools in software package:
  - L2B EE to BUFR converter for NWP users
  - Various tools to write products to ASCII

• Aeolus L2B data can be browsed in the ADDF archive (<u>https://aeolus-ds.eo.esa.in</u>t) and browsed and plotted by the VirES tool (<u>https://aeolus.services/</u>)



#### A very windy day in north-west Europe (10 March 2019)



Photo from near Reading: apart from low level clouds, sky was clear

What Aeolus observed (Rayleigh + Mie winds) near the low





# A breakthrough in 2019: explanation for dominant source of Rayleigh wind bias which varies on less than one orbit time-scales was found

- Investigations showed Rayleigh **wind bias**, which varies along the orbit, is strongly correlated with telescope **primary mirror temperatures variations**
- Temperatures vary due to varying Earthshine and the mirror's thermal control
  - Temperature variations correlate with outgoing SW and LW radiation
- *Probable mechanism:* thermal variations alter primary mirror shape, causing angular changes of light onto spectrometer, causing apparent frequency changes
- **Bias correction** using measured telescope primary mirror temperatures was demonstrated to work in offline testing and is being implemented in next processor versions:
  - See references for more details:
  - <u>https://rmets.onlinelibrary.wiley.com/doi/full/10.1002/gj.4142</u>
  - https://amt.copernicus.org/articles/14/7167/2021/amt-14-7167-2021-discussion.html



#### Aeolus L2B wind usage in global NWP

- Positive NWP impact was demonstrated
  - Operationally assimilated at ECMWF from 9 January 2020 to 30 April 2023
- Other NWP centres found positive impact; operationally assimilated at: DWD, Météo-France, Met Office and NCMRWF
- Being a demonstration mission, still finding ways to improve ground processing algorithms (L1B, L2B, calibration processors) and its usage:
  - Data quality was not as good as hoped for i.e. significantly noisier winds, larger biases than expected
  - Lower signal levels -> larger noise
  - Unexpected sources of **wind bias** e.g. primary mirror temperature-gradient sensitivity (0.3K range of gradient across mirror<sup>100</sup> Acous Rayleigh-clear bias correction for period: 20190802\_2019087







#### **Rayleigh has large biases which vary with geolocation**

#### Regression of <O-B> versus M1 temperature function Best results on 8/8/19 obtained with:

Outer temp. average: AHT-27, TC-20, TC-21 Inner temp. average: AHT-24, AHT-25, AHT-26, TC-18, TC-19





#### Bias correction to the ECMWF model

- Implemented bias correction scheme: <O-B> vs. "orbit's argument of latitude" and longitude
- Updates to bias correction look-up table done typically done every few days in experiments
- Mie biases very stable and do not require the longitude dimension



### Example of how **Rayleigh**



#### ECMWF operational relative FSOI (1 Jan to 30 April 2023)

## Aeolus does well for one instrument compared to existing multi-instrument satellite systems



#### Summary of Aeolus NWP impact at ECMWF

- Aeolus provides a **strong impact** for one satellite instrument
  - Positive impact in most areas and ranges for wind, temperature and humidity
  - Largest impact in tropical and polar UTLS; into medium range
- Shows importance of additional wind observations in NWP wind is still not a well-observed variable



# Relative FSOI with <u>2<sup>nd</sup> reprocessed dataset</u>; 3-29 July 2019 (when Aeolus had its smallest random errors)



- Aeolus has good impact for one satellite
  instrument
  - When have reasonable Rayleigh-clear random errors

