



PROGRAMME OF
THE EUROPEAN UNION



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JOINT TRAINING IN ATMOSPHERIC COMPOSITION

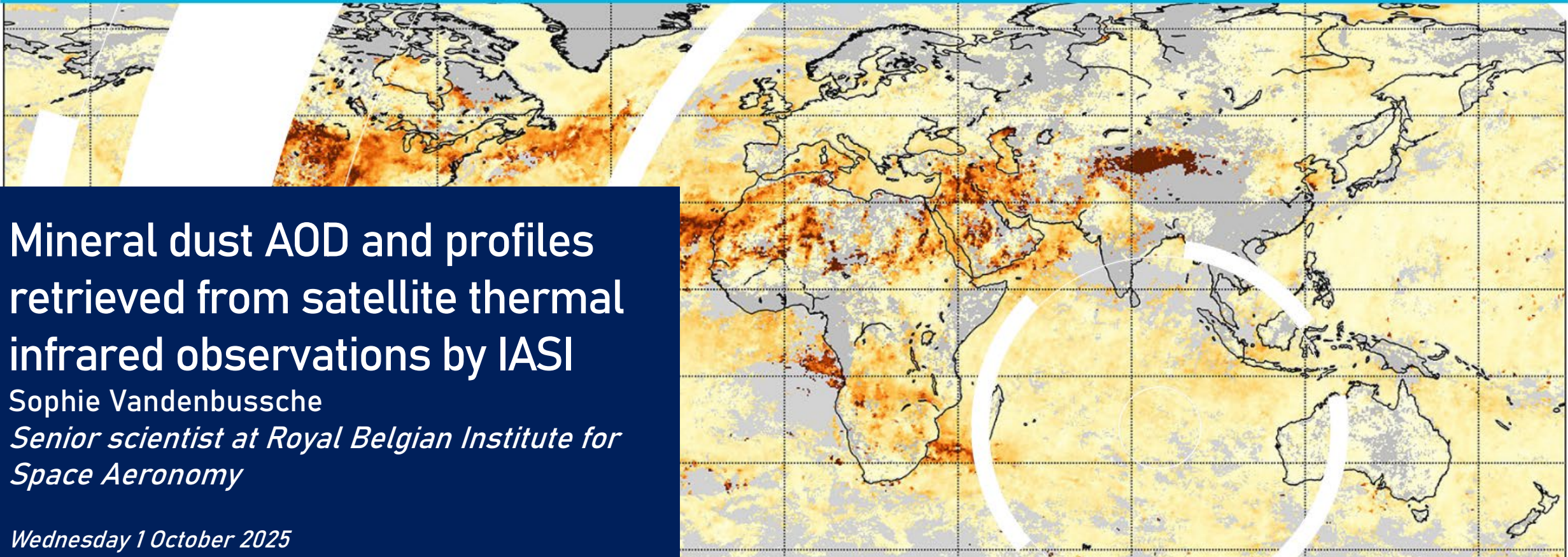
13 -17 OCTOBER 2025, BRUSSELS


Mineral dust AOD and profiles
retrieved from satellite thermal
infrared observations by IASI

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*Senior scientist at Royal Belgian Institute for
Space Aeronomy*

Wednesday 1 October 2025





Practicals on
Monday 13/10

Introduction

IASI and thermal IR observations

Existing IASI dust products

Dust AOD 10 μ m, 550nm, mean altitude, vertical profiles
– different algorithms

“The technical minute”

A bit on the Optimal Estimation Method

Potential applications

Source analysis, trends, aerosol alerts

Wrap up, future and questions



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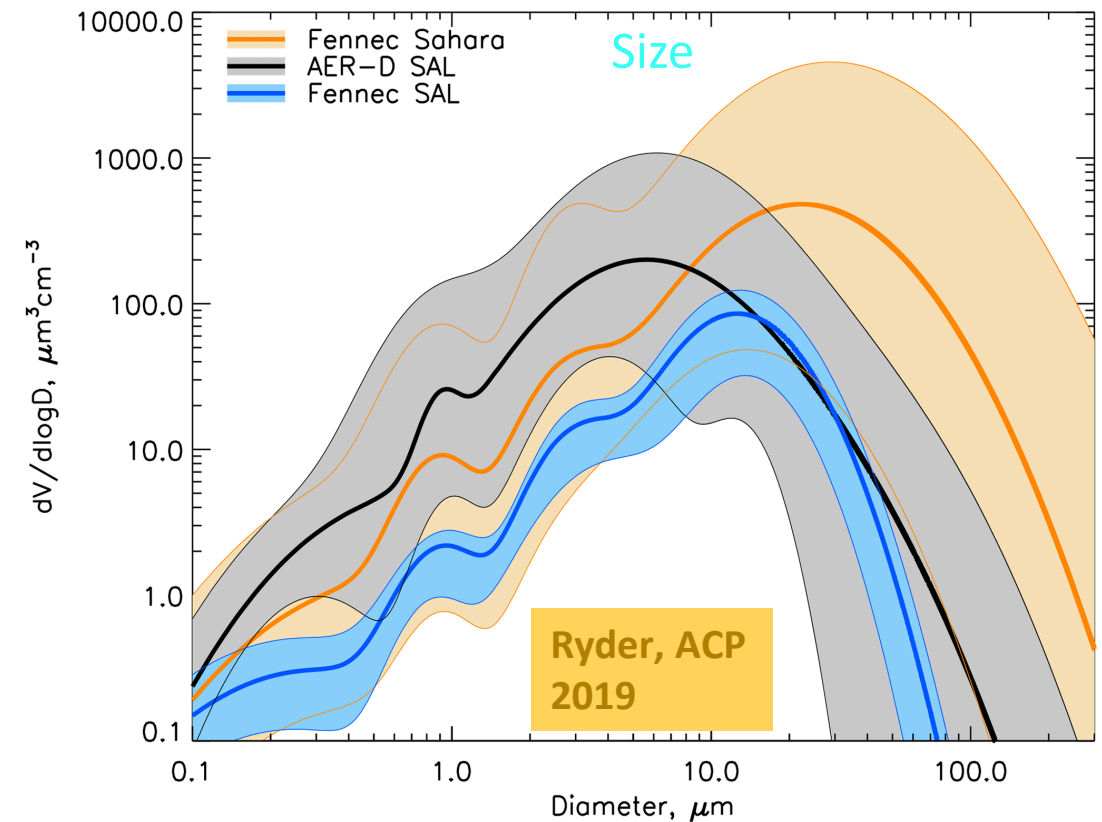
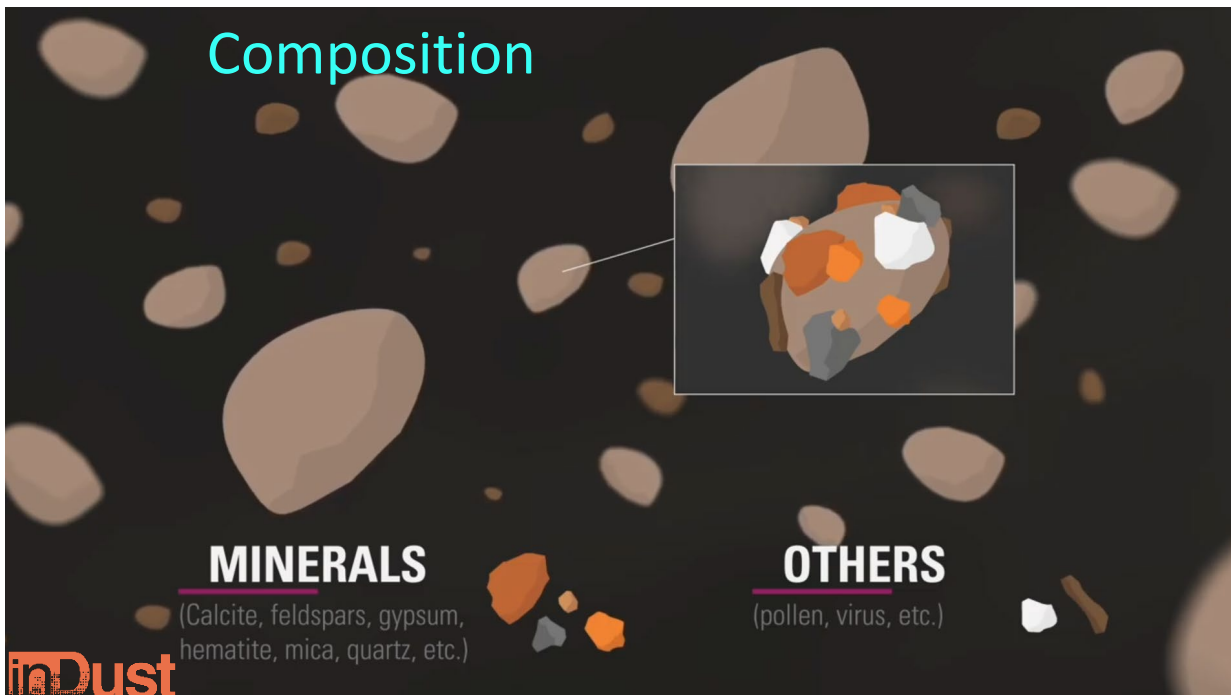
Mineral dust aerosols

Recall talk from Samuel Remy
this morning!



Small mineral (sand) particles uplifted by strong winds
from dry / bare areas

Composition



Mineral dust AOD and profiles retrieved from satellite thermal infrared observations by IASI



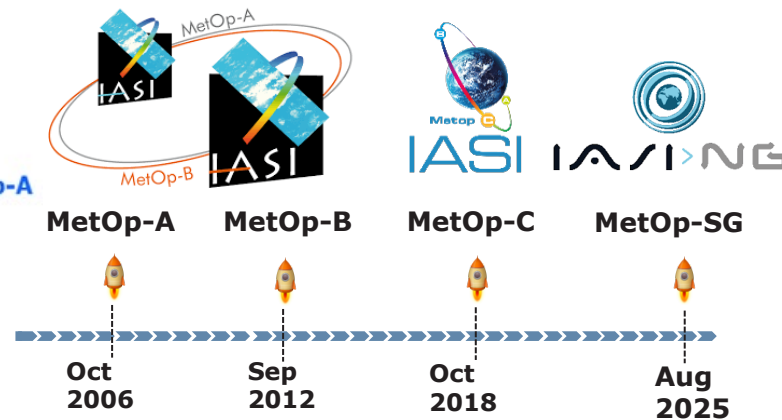
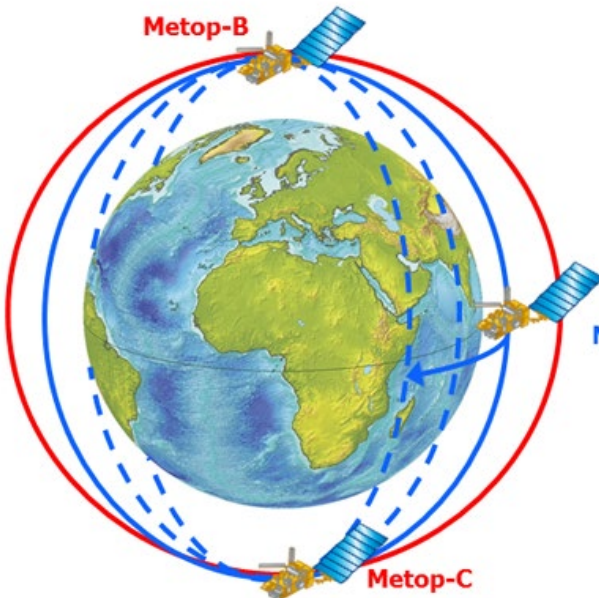
The IASI instrument

Orbital characteristics:

- Sun-synchronous (LEO)
- Overpass at local solar time:
~9h30 and 21h30

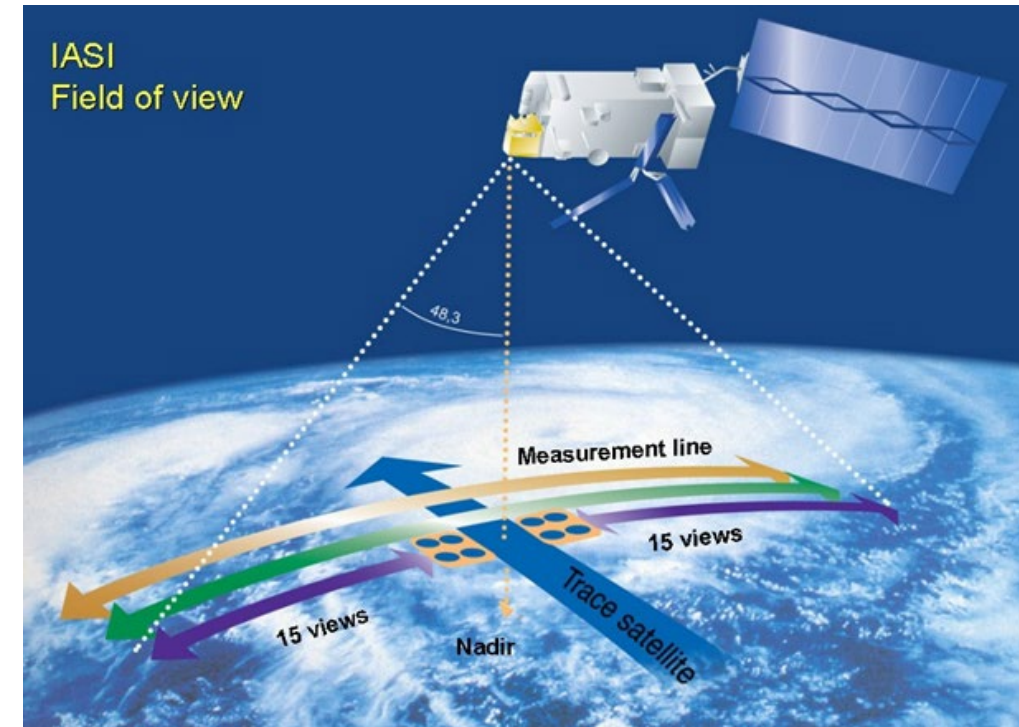


“descending” - “ascending”



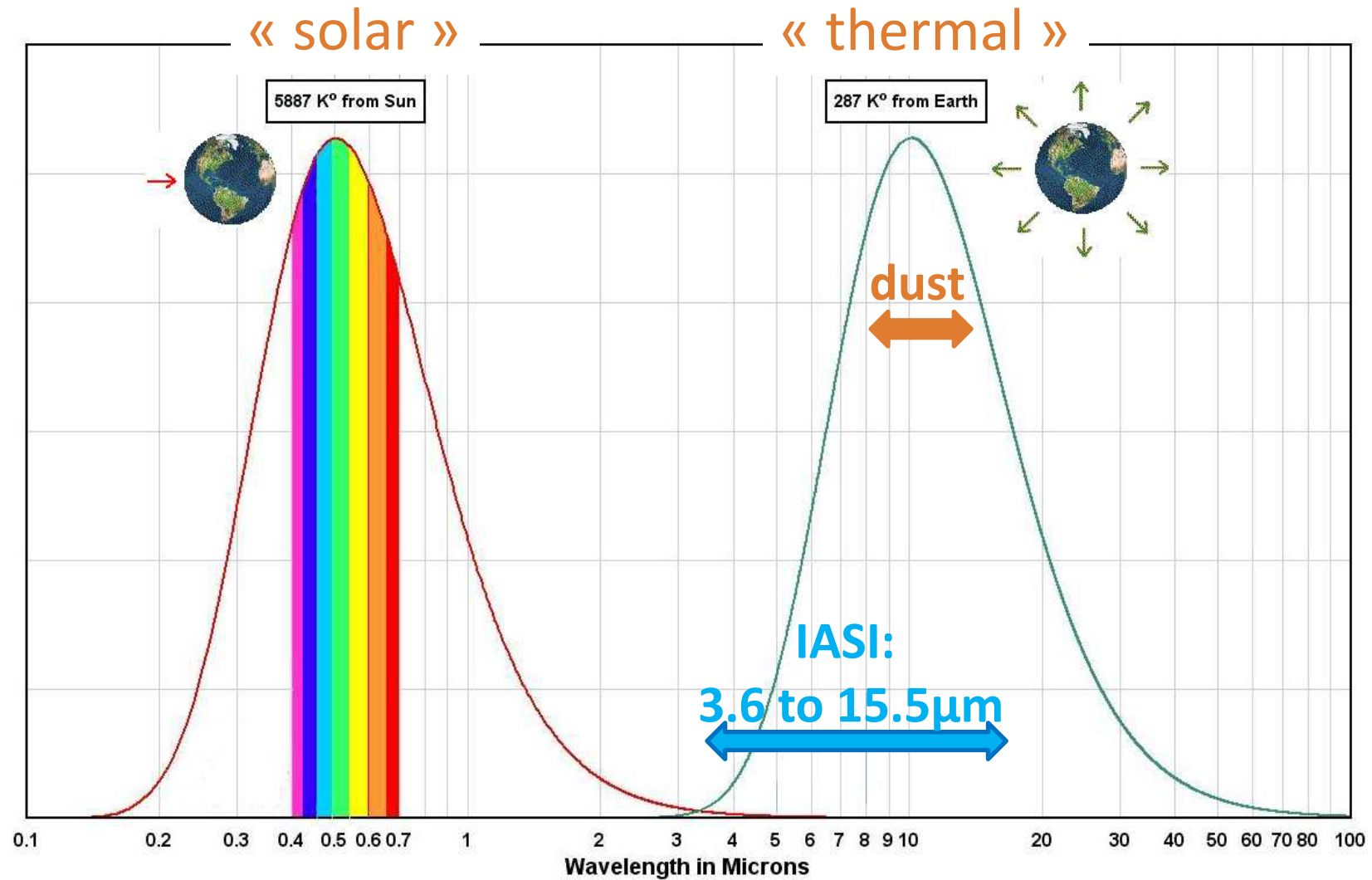
Observation technique:

- Nadir, across path scanning, FTIR
- 12km diameter pixels (at nadir)





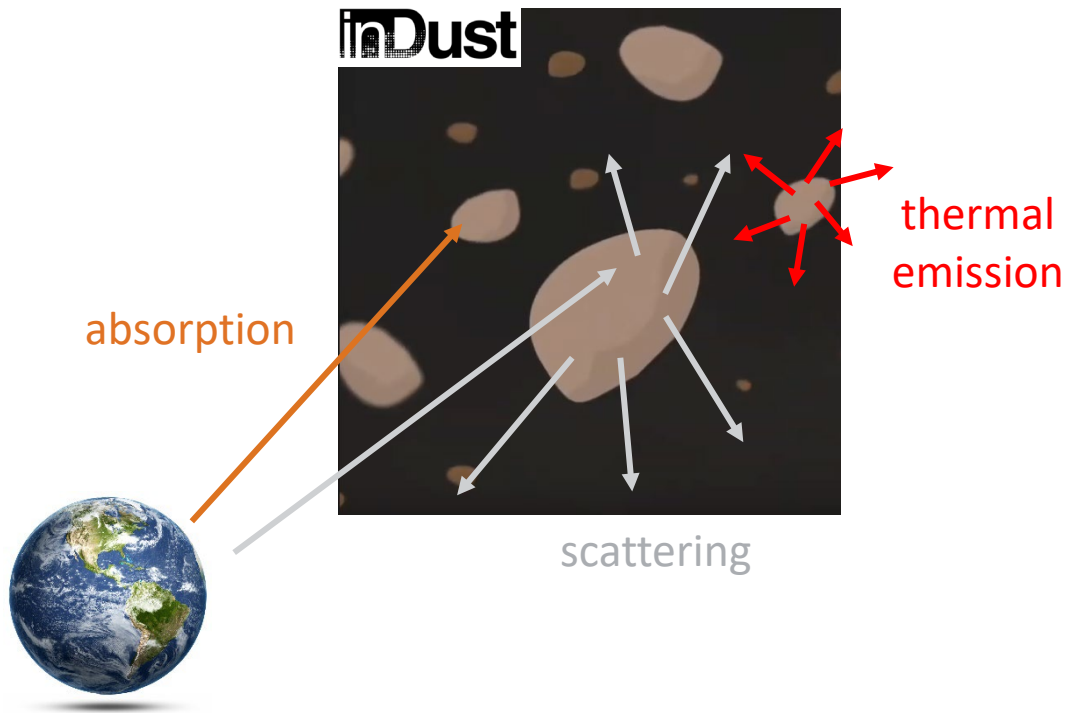
Spectral ranges



Mineral dust AOD and profiles retrieved from satellite thermal infrared observations by IASI



Thermal IR specificities



Thermal Infrared radiative considerations

- **Surface as source**: temperature, emissivity
- **Atmosphere as source**: gases, aerosols, clouds (and their temperature)
- Atmosphere as **sink**: absorption and scattering by gases, aerosols, clouds
- No solar light needed -> **day & night**

Aerosol signature (in TIR)

- Absorption/emission → minerals
→ **dust and ash**
- Scattering → coarse mode (**large particles**)



Thermal IR specificities: sensitivity

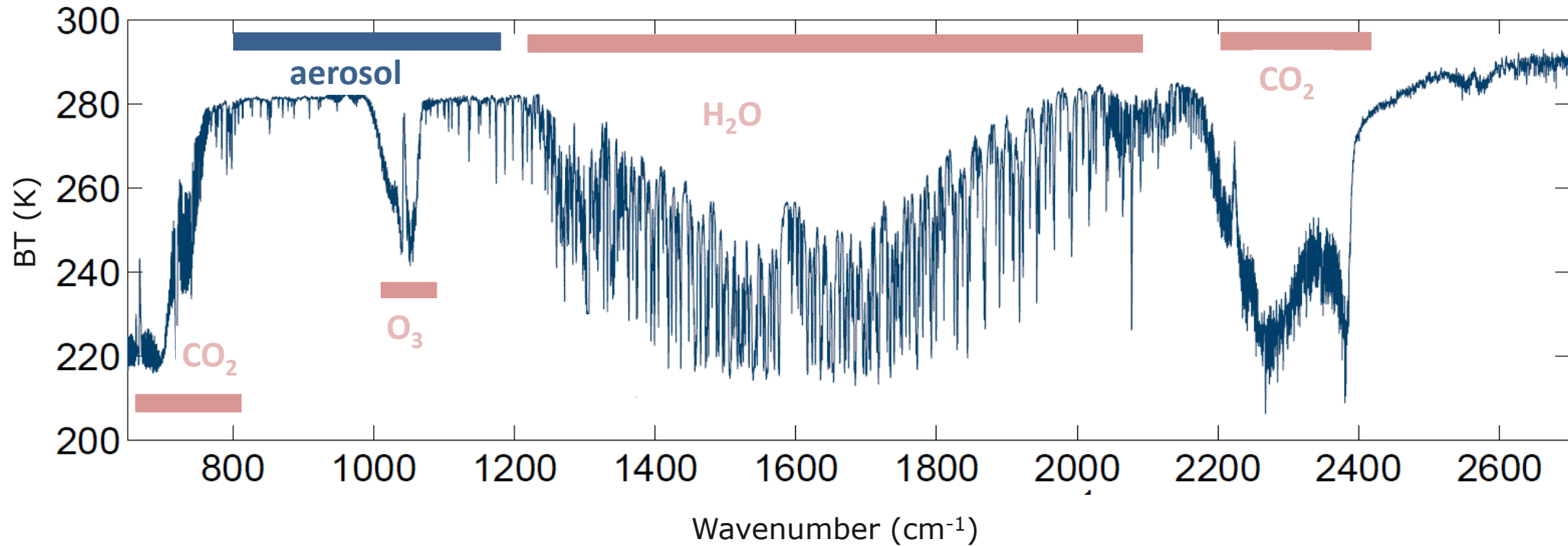
- **Radiance intensity** -> mostly surface temperature + surface emissivity
- **Impact of the dust** on the signal -> total amount of dust
thermal contrast <-> altitude
- Need for **silicates** in the composition -> not Iceland dust
- Difficulty to **discriminate** dust from **thin clouds** – and dust is a CCN and ICN



Example IASI spectrum

Brightness temperature: a way to measure radiance / energy

$$\text{wavenumber} = \frac{1}{\text{wavelength}}$$



Spectral characteristics:

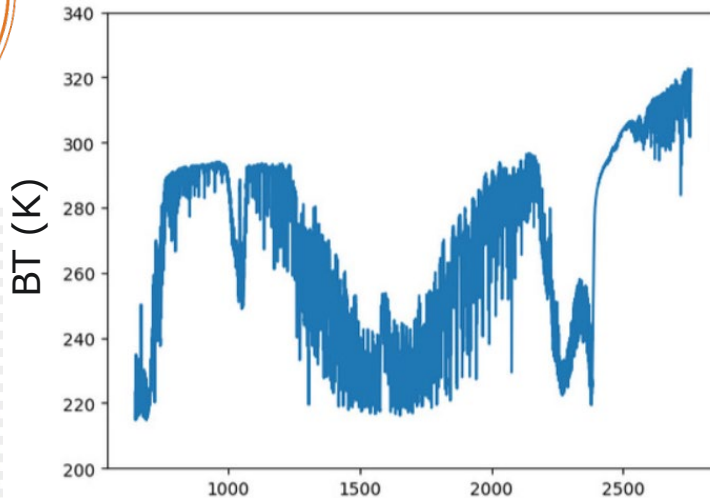
- Resolution 0.25cm^{-1} FWHM 0.5cm^{-1} (gaussian ILS)
- Noise varies with wavenumber, $<0.2\text{K}$ in most of the spectrum



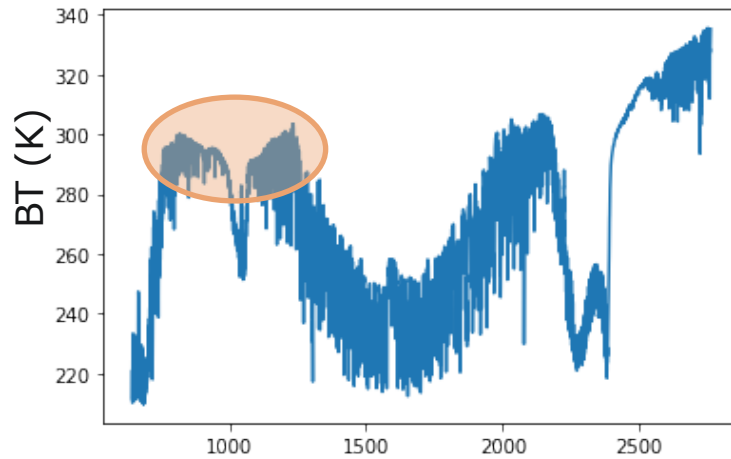
Mineral dust observations with IASI

Brightness temperature: a way to measure radiance / energy

$$\text{wavenumber} = \frac{1}{\text{wavelength}}$$



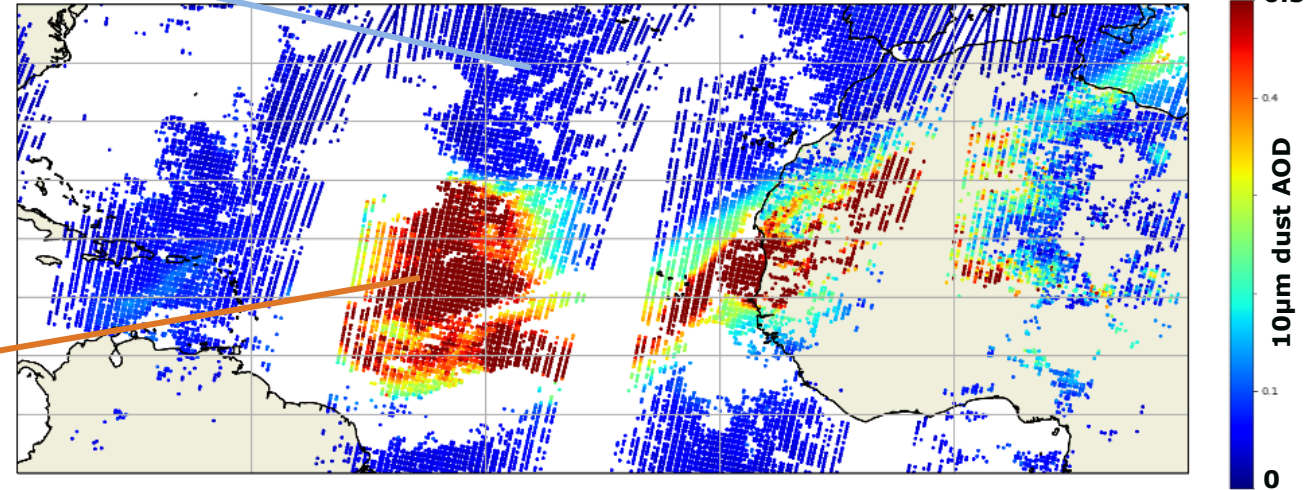
Wavenumber (cm⁻¹)



Wavenumber (cm⁻¹)

Godzilla dust storm, (20) June 2020

Descending orbit, local morning 9h30



MAPIR: Mineral Dust Profiling from Infrared Radiances



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Mineral dust observations with IASI

4 very different algorithms provide full data sets



ULB Dust



Dust index converted to AOD through NN

Parameters: dust AOD - dust index

Availability: CDS (level 3) - EUMETSAT and (level 2) <https://www.aeris-data.fr>

Infrared Mineral Aerosol Retrieval Scheme (IMARS)

Probabilistic estimations (dust/ice)

Parameters: dust AOD and layer T, dust size and composition

Availability: CDS (level 3)



LMD Dust

Lookup tables (3 steps)

Parameters: dust AOD and mean altitude, dust effective radius (not public)

Availability: CDS (level 3, not the radius) and (level 2) <https://www.aeris-data.fr>

Mineral Aerosol Profiling from Infrared Radiances (MAPIR)



Optimal estimation

Parameters: dust AOD, mean altitude, vertical profile

Availability: CDS (level 3, not the profiles) and (level 2) <https://iasi.aeronomie.be>

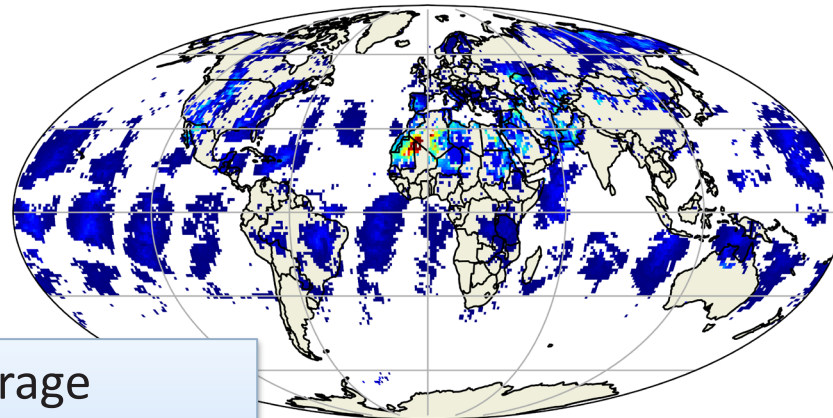
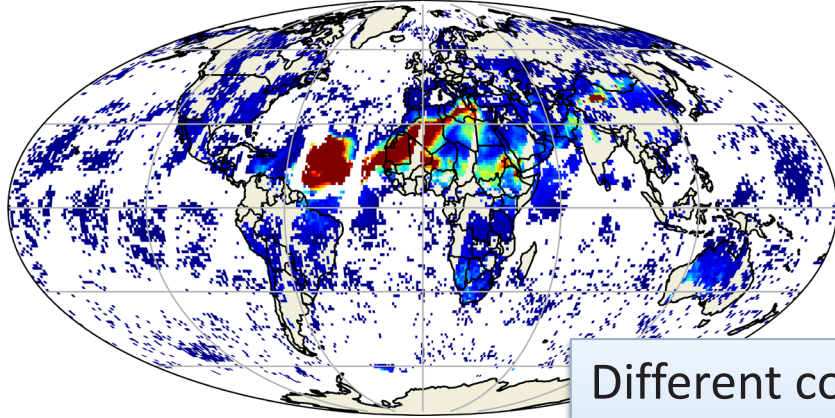
Mineral dust AOD and profiles retrieved from satellite thermal infrared observations by IASI



IASI dust AOD $10\mu\text{m}$

Example: « Godzilla » storm, 20 June 2020 9h30 LST
(last version available, for each algorithm)

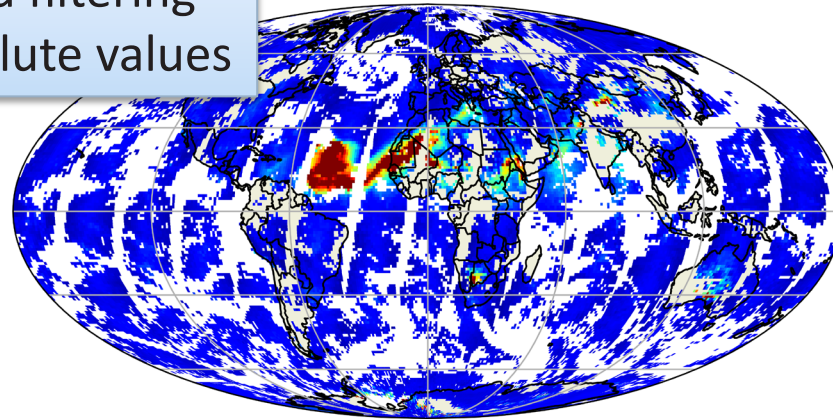
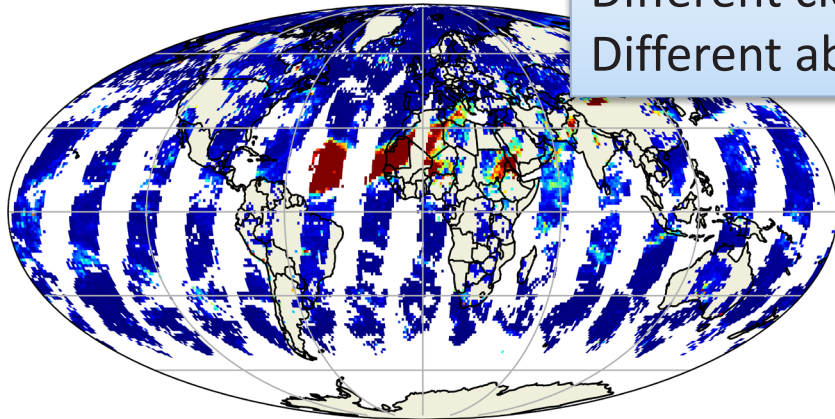
ULB
v9



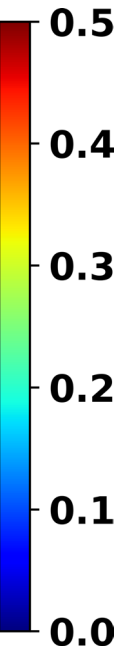
IMARS
v7.1

Different coverage
Different cloud filtering
Different absolute values

LMD
v2.2



MAPIR
v5.11





IASI dust AOD 550 nm: « conversion »

IASI data : TIR, dust coarse mode AOD obtained at $\sim 10\mu\text{m}$ (1000cm^{-1})

Most other data : IV, VIS, Total AOD usually reported at 500-550nm



Dust AOD conversion $10\mu\text{m} \rightarrow 550\text{nm}$

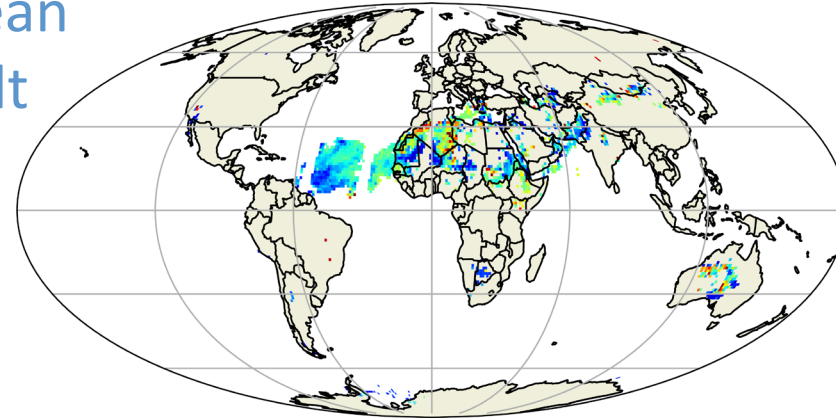
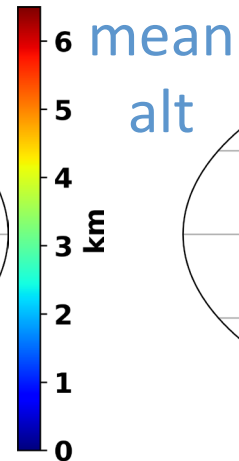
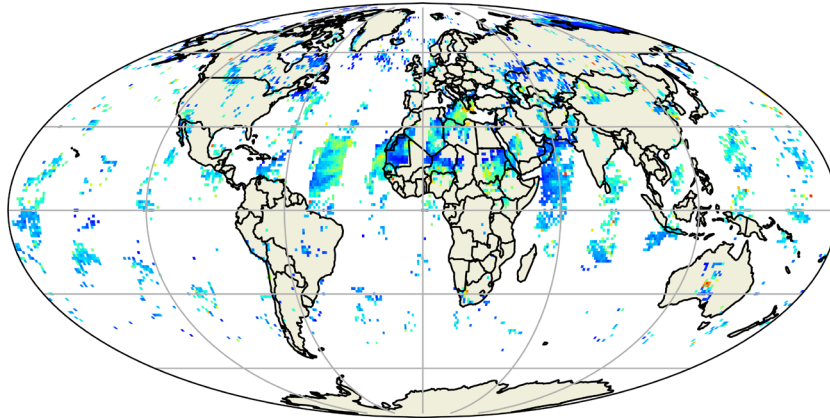
- Requires assumptions on particle optical properties – the conversion is more sensitive to those properties than the retrieval itself!
 - Increases the uncertainty
- Converts only what is observable at $10\mu\text{m}$ (= coarse dust particles)



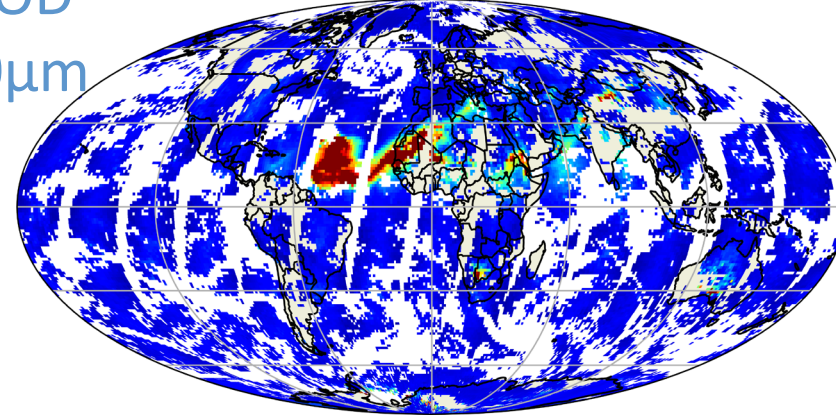
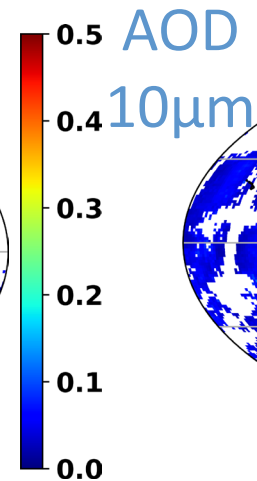
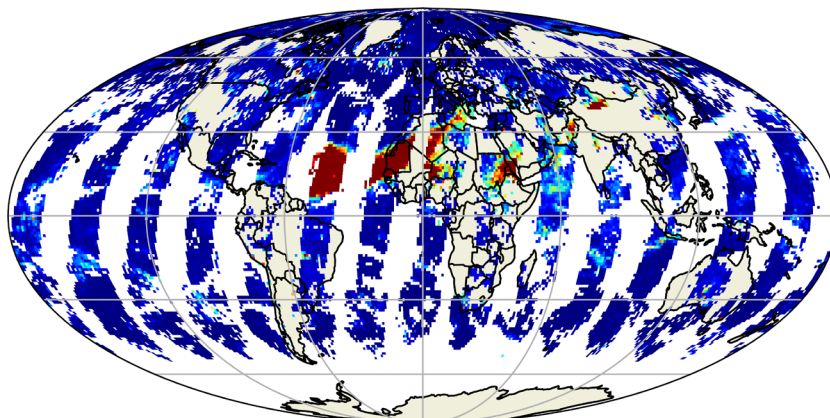
IASI dust mean altitude

Example: « Godzilla » storm, 20 June 2020 9h30 LST
(last version available, for each algorithm)

LMD
v2.2



MAPIR
v5.11

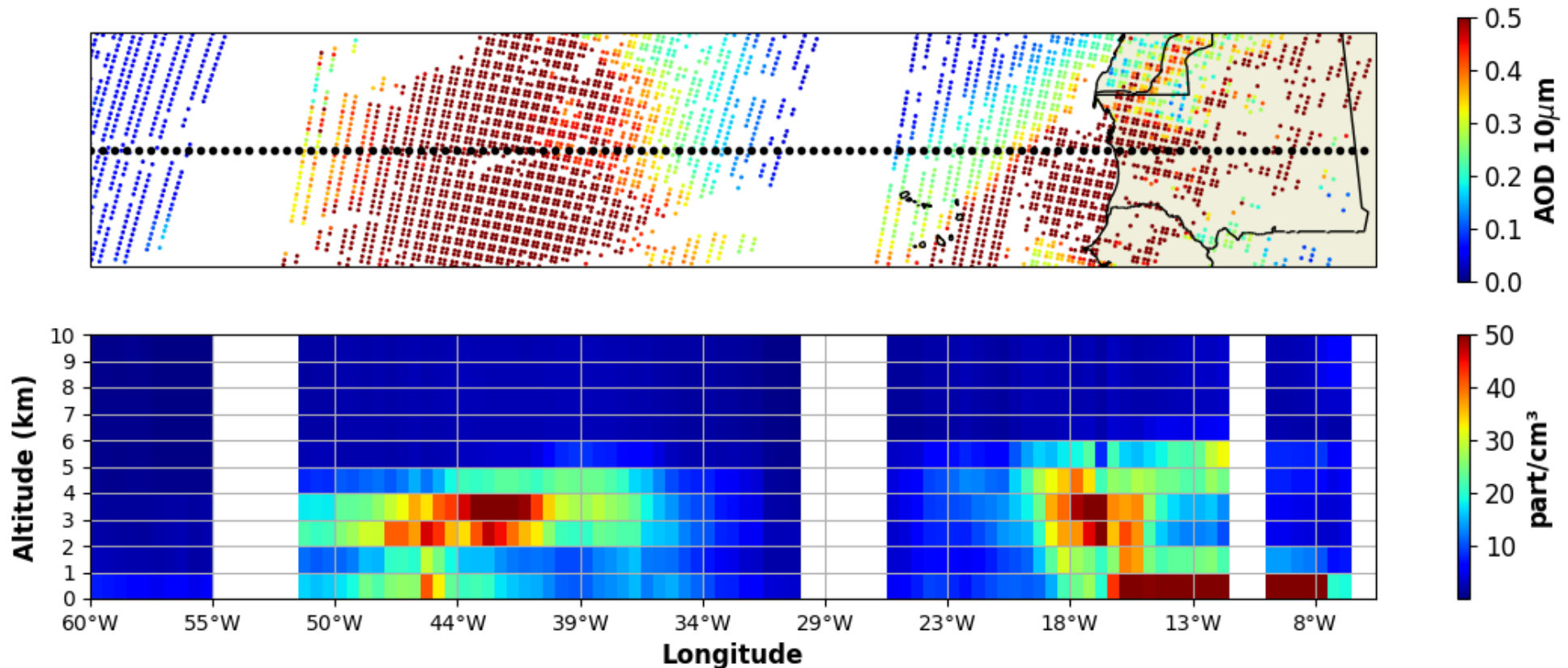




IASI dust MAPIR vertical information

MAPIR contains profile information, can separate 2 distinct layers

20 June 2020, « Godzilla », morning overpass



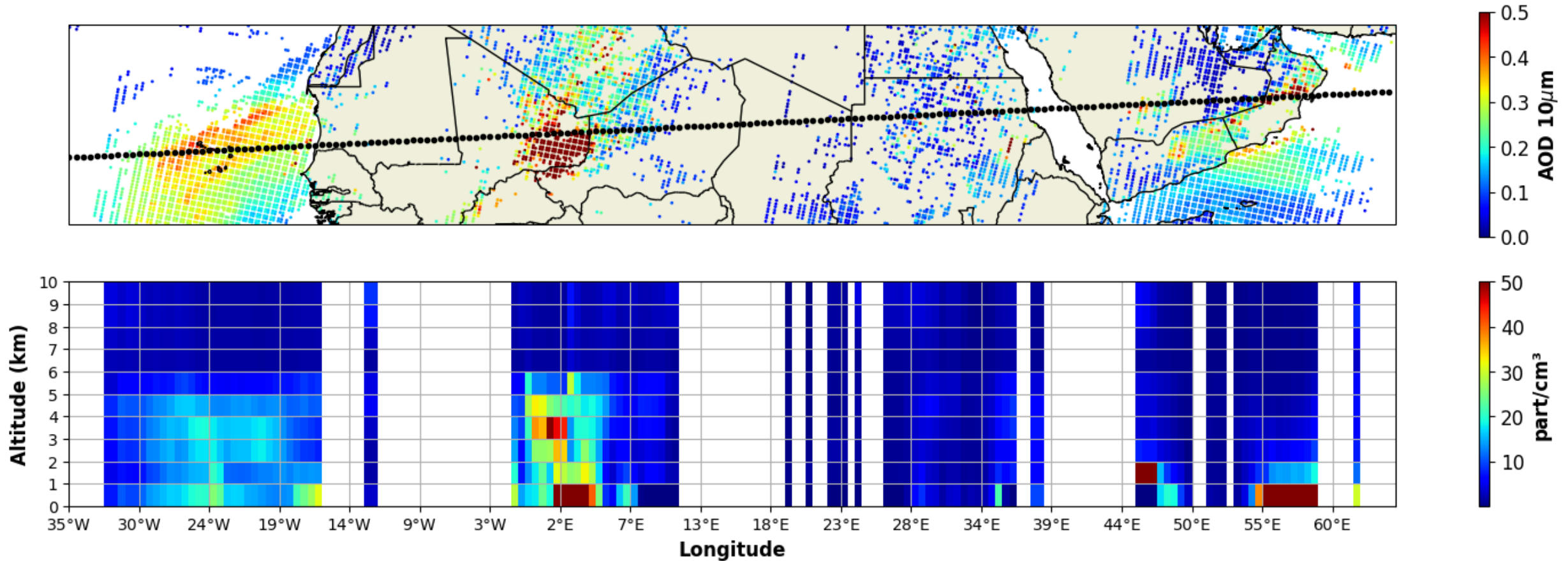
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IASI dust MAPIR vertical information

MAPIR contains profile information, can separate 2 distinct layers

9 June 2018



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“The technical minute”

A bit on the Optimal Estimation Method

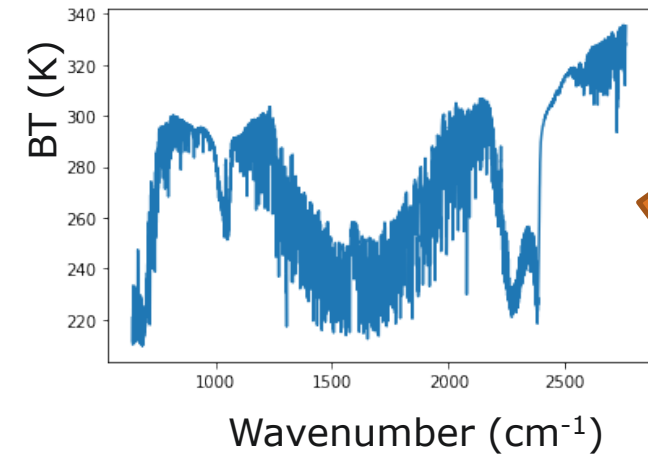
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The optimal estimation method



Radiative transfer model, also called « forward » model

It computes the **radiance** that should be observed given:

- An atmospheric state and Earth surface description
- The physics of the light interaction with surface and atmosphere components
- The properties of the instrument one wants to simulate



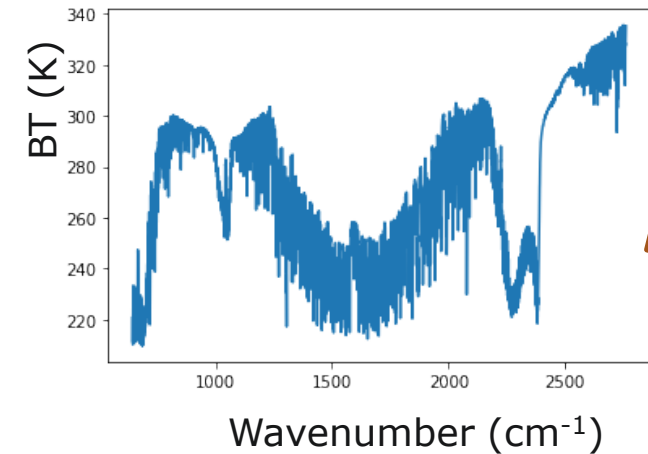
The optimal estimation method

This is usually called **the « inverse » problem** and it requires **numerical computing**

- More observations than unknowns
- Observations are « **noisy** » and often partially **correlated**
- The « forward » model is most commonly **non linear**
- The **sensitivity** of the observation to the atmospheric and surface state is not perfect, can even be completely masked
- A large number of atmospheric and surface state parameters are fixed, and their **uncertainty** affects the finding of a solution

Different methods exist (based on statistics), and require an **iterative resolution, with constraints, minimizing a defined « cost function »**, and with defined criteria deciding when to stop the process

The solution obtained is not the truth, but a best estimate of it, given some « a priori » knowledge





The optimal estimation method

Spectrum
(or a selected
part of it)

Radiative transfer (forward) model

$$\mathbf{y} = F(\mathbf{x}, \mathbf{b}) + \epsilon$$

Noise (spectral, model, ...)

Parameters that you do not retrieve (fixed)

“State vector” = what you want to retrieve

a priori:
«knowledge» of
the atmosphere
-> Climatology

Function to
minimize

“Residual” = observed – modelled spectrum

$$\chi^2 = [\mathbf{y} - F(\mathbf{x}, \mathbf{b})]^T \mathbf{S}_\epsilon^{-1} [\mathbf{y} - F(\mathbf{x}, \mathbf{b})] + [\mathbf{x} - \mathbf{x}_a]^T \mathbf{S}_a^{-1} [\mathbf{x} - \mathbf{x}_a]$$

Noise covariance matrix

“How good we
reproduce the
observation, knowing its
uncertainty”

Departure from the a priori

A priori covariance matrix

“How far we are from the
a priori, knowing its (co)-
variance”
-> **constraint**



The optimal estimation method

Iterative resolution

A priori covariance matrix

Noise covariance matrix

$$\mathbf{x}_{i+1} = \mathbf{x}_i + \left((1 + \gamma) \mathbf{S}_a^{-1} + \mathbf{K}_i^T \mathbf{S}_\epsilon^{-1} \mathbf{K}_i \right)^{-1} \left(\mathbf{K}_i^T \mathbf{S}_\epsilon^{-1} (\mathbf{y} - \mathbf{F}(\mathbf{x}_i)) - \mathbf{S}_a^{-1} (\mathbf{x}_i - \mathbf{x}_a) \right)$$

Initial value \mathbf{x}_0 :
“first guess”,
often \mathbf{x}_a but not
mandatory

“Residual” = observed – modelled spectrum

“Jacobians” = derivatives of radiance wrt \mathbf{x}

Departure from the a priori

Important note: in MAPIR the state vector is $\log(\text{concentration})$, to avoid negative values



The optimal estimation method

“Averaging kernel” or “smoothing functions”

Sensitivity of the retrieval to true state.

Shows how the observation+retrieval system smoothes a vertical profile.

“Jacobians” or “Kernel” or “weighting functions”

= derivatives of radiance wrt x

→ Sensitivity of the forward model to x

$$A = G K$$

Noise covariance matrix

$$G = (K^T S_\varepsilon^{-1} K + S_a^{-1})^{-1} K^T S_\varepsilon^{-1}$$

“Gain” or “contribution functions”

→ Sensitivity of the retrieval to observation

A priori covariance matrix

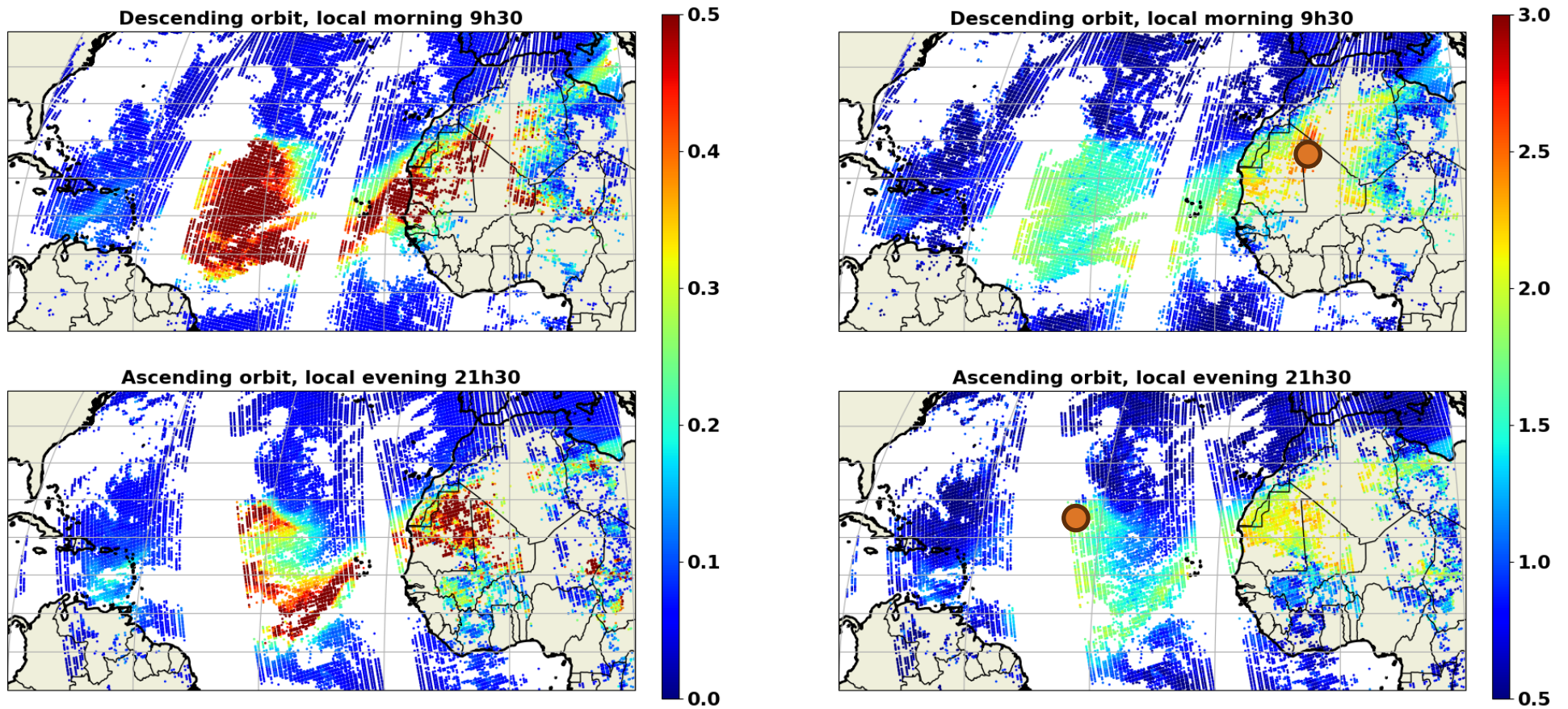
Trace(A) -> number of degrees of freedom (**DOFs**) / of independent pieces of information

see Mel Ades tomorrow and practicals on Wed 15/10



IASI dust MAPIR DOFs

Example: « Godzilla » storm, 20 June 2020



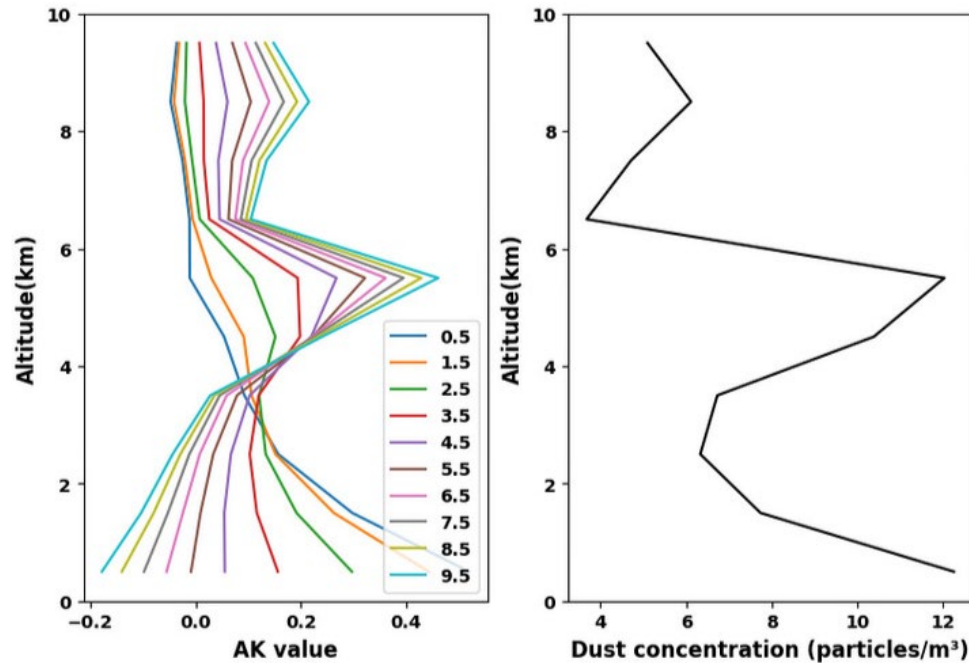
!! Retrieval runs on $\log(\text{concentration})$ -> AKs are different, tend to peak where the dust concentration is high



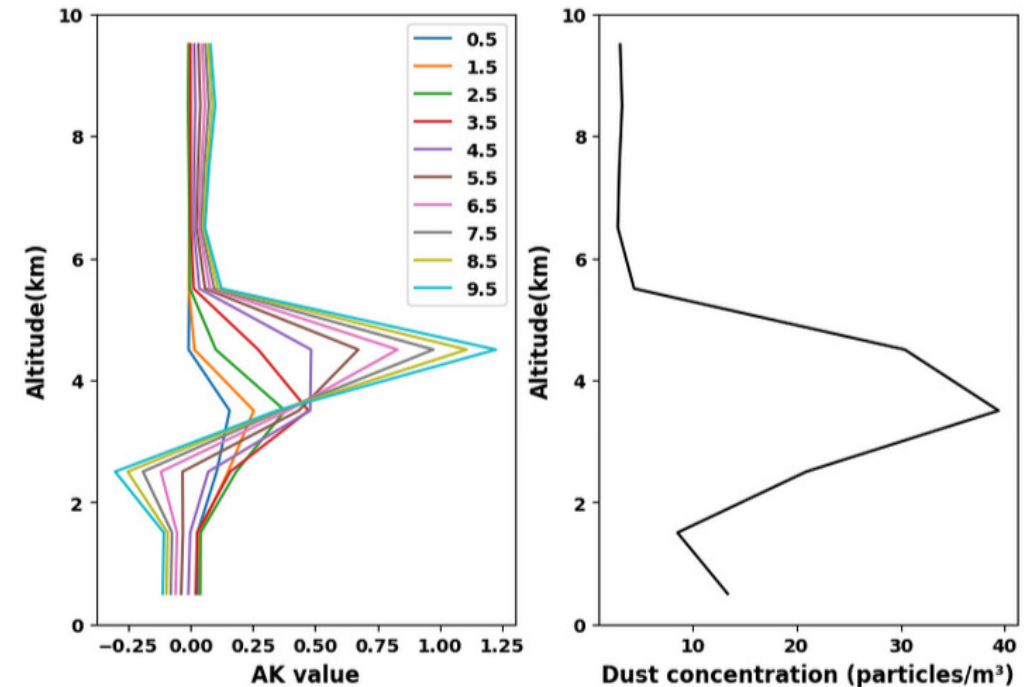
IASI dust MAPIR AKs

Example: « Godzilla » storm, 20 June 2020

Over the desert, $\text{DOF} > 2$



Over the ocean, $\text{DOF} = 1.5$



!! Retrieval runs on $\log(\text{concentration})$ -> AKs are different, tend to peak where the dust concentration is high

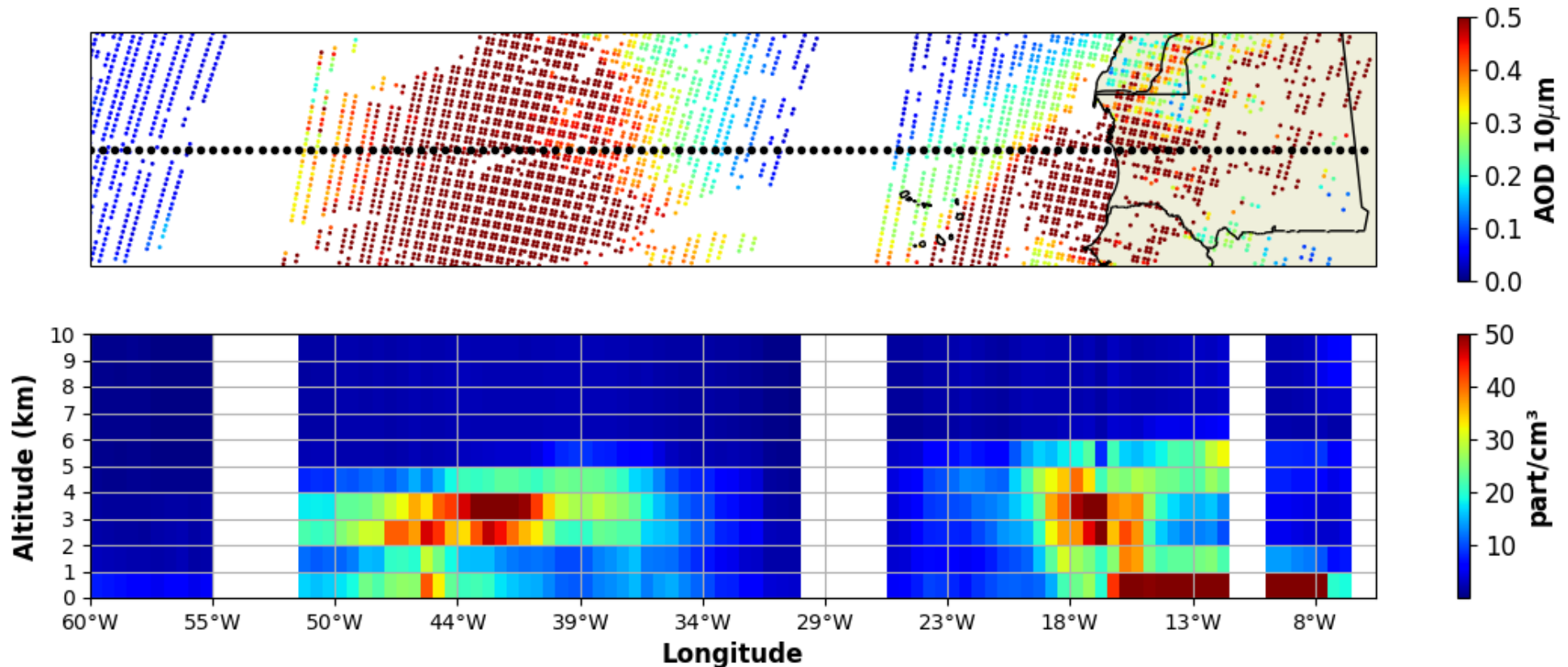
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20 June 2020, « Godzilla »



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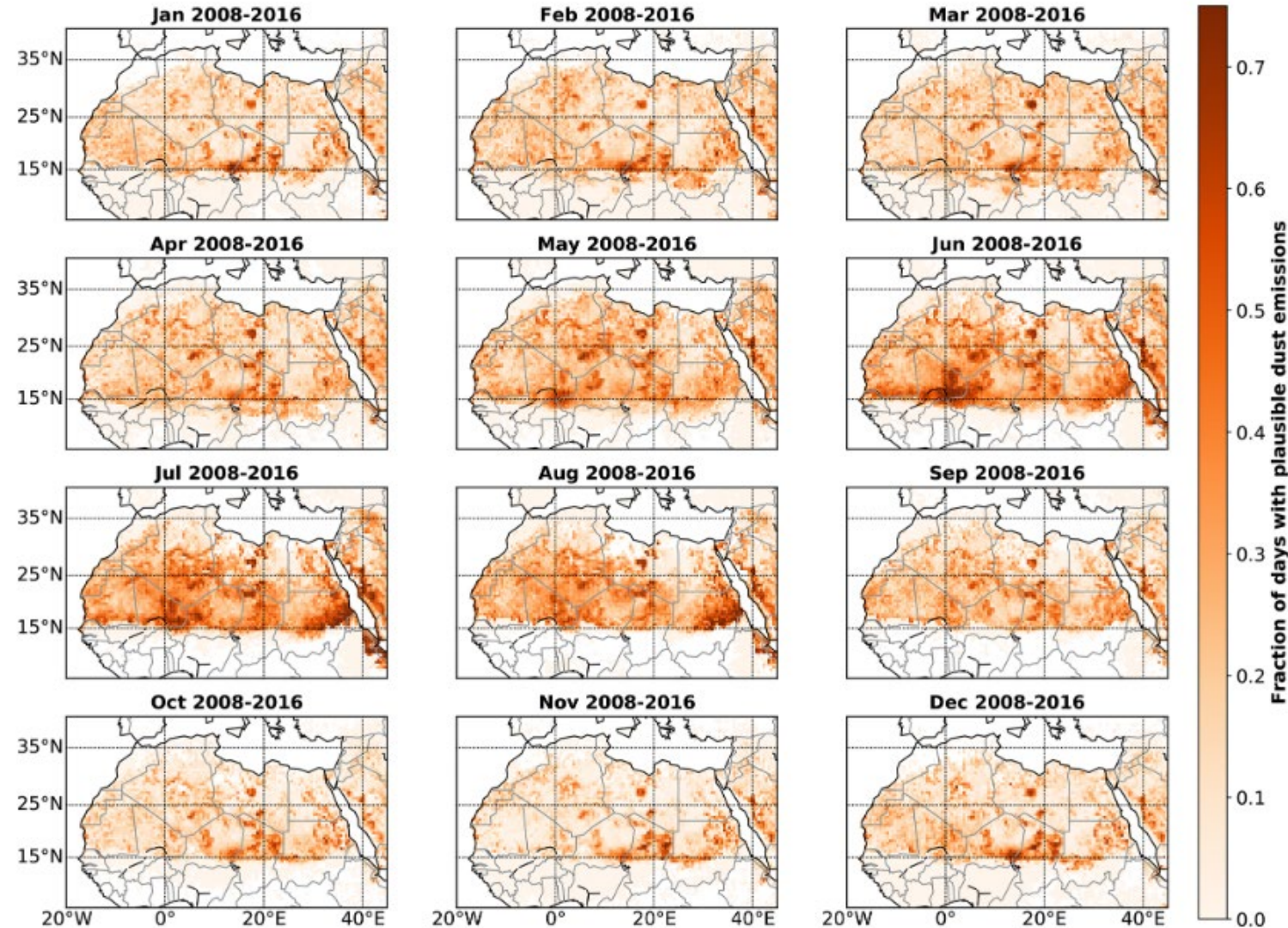
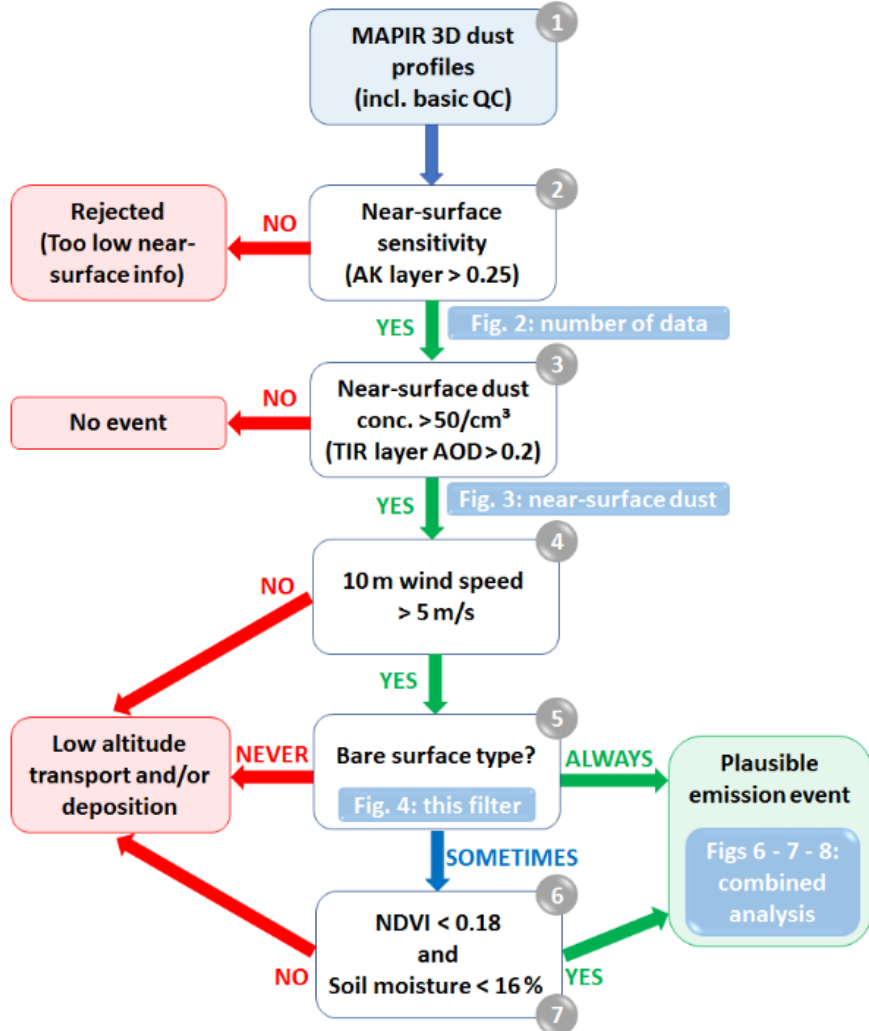
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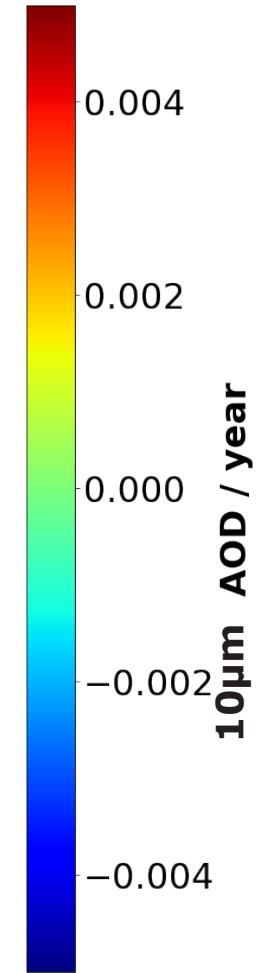
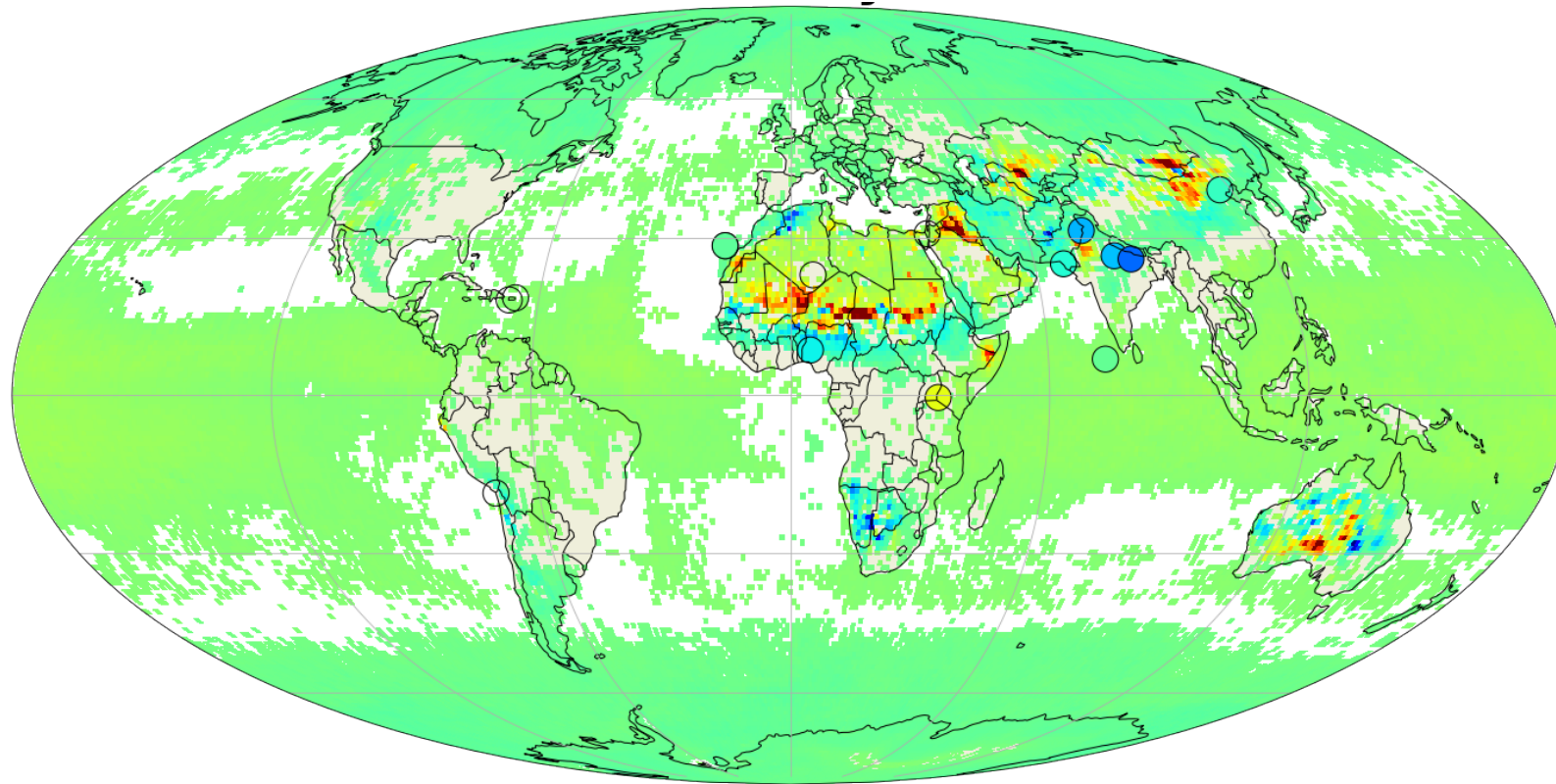
Applications? Sources analyses





Applications? Trends

Trends in IASI MAPIR daily mean



IASI / Metop-A
07/2007 – 06/2021
(14 years)
Daily AOD
5% extreme removal
Theil-Sen estimator
Seasonal sin removal

AERONET stations:

- Coarse mode SDA
AOD 500nm
(dust, sea salt, volcanic)
- Stations with med
CAOD>0.05
- Covering the same
time span



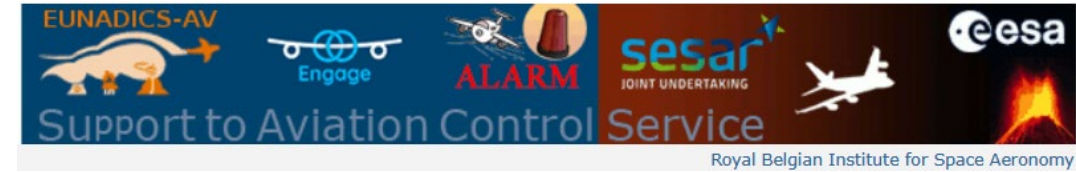
!! AERONET trend at 500nm
converted to 10 µm AOD trend !!

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Applications? Aerosol alerts

- aerosol-alerts.atmosphere.copernicus.eu
-> see Mel Ades tomorrow
- sacs.aeronomie.be
-> see practicals on Tuesday 14/10
- dust.aemet.es (SDS WAS)



WORLD
METEOROLOGICAL
ORGANIZATION

Some are in development for using IASI dust data ...



Applications? Weather forecast

Mineral dust impacts:

- the atmospheric temperature profile (local heating)
- the atmospheric circulation
- the surface temperature (local cooling)
- The cloud properties, lifetime and rain amount / location

-> It needs to be accounted for in weather forecast models

-> Some thinking and discussions have started about using IASI, some centres would prefer to have geostationary data with higher repetitions



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TIR aerosol observations: wrap up

Four algorithms... results are **similar overall** but not in details...



A big issue: clouds...

- Wrong classification -> no data...
- Dust is CCN and IN -> quite often mixed...

Difficult over cold surfaces and for low AOD (low sensitivity, higher uncertainty, noise, and lower information content)

« Mineral-specific » but actually **requires silicates** (local high-latitude dust not observed)



Thermal IR retrievals are « **mineral-specific** »... while other retrievals have a hard time separating different aerosol types

Night-time observations are available

Vertical sensitivity (limited) with **global coverage**



Always keep in mind...

IASI « sees » **coarse dust** only
IASI dust product is obtained **at ~10 μ m**
→ **Converting to 550nm** requires assumptions
and increases uncertainty



And towards the future



IASI-NG onboard Metop-SG, launched 13 August 2025

The same AC-SAF products are planned as for IASI (dust index, AOD, profiles)
Expected small improvement in quality due to the lower spectral noise.



InfraRed Sounder (IRS) onboard Meteosat Third Generation, launched 1 July 2025

Geostationary instrument over Europe and Africa
High repetition time, very interesting to follow emissions and plumes
Very interesting for alerts and weather forecast
Planned within AC SAF: dust flag
Project currently under evaluation: dust profiles



Some links to data



Level 3:
Gridded
averaged data

Level 2: each
satellite obs

"descending"
"ascending"



Level 3 data (DOD, mean altitude, daily, monthly, morning / evening / combined), documentation and quality information: <https://cds.climate.copernicus.eu>

Level 2 data for LMD (with mean altitude) and ULB:
<https://www.aeris-data.fr>

Level 2 data for MAPIR (with vertical profiles):
<http://iasi.aeronomie.be>

Near-real-time data through EumetCast:

- ULD AOD and dust index (level 2)
- Soon: MAPIR profiles, AOD and mean altitude



Some references

Retrieval algorithms (not always the last version)

- ULB: 10.1029/2018JD029701
- LMD: 10.1016/j.rse.2017.12.008
- IMARS: 10.1016/j.rse.2014.09.036
- MAPIR: 10.5194/amt-12-3673-2019

MAPIR applications:

- Sources: 10.5194/acp-20-15127-2020
- Trends: presented at conferences only



Thank you!
Questions are welcome.