



PROGRAMME OF  
THE EUROPEAN UNION



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EUMETSAT



# JOINT TRAINING IN ATMOSPHERIC COMPOSITION

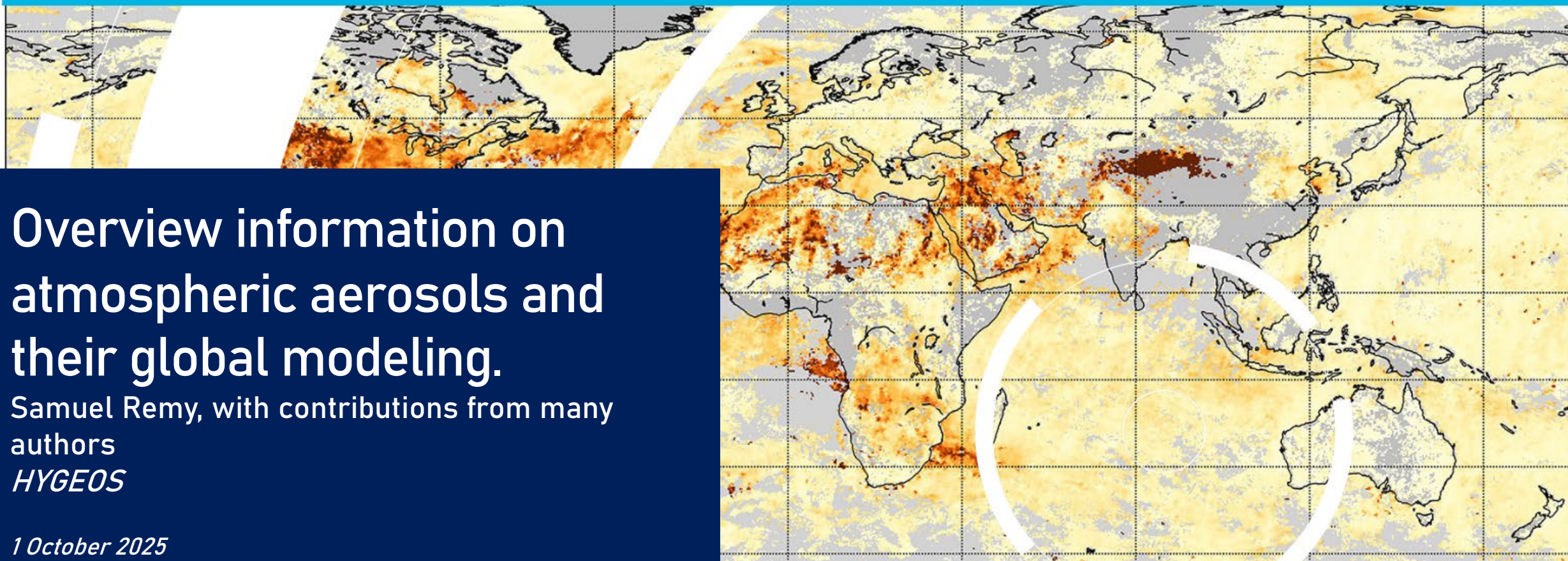
13 -17 OCTOBER 2025, BRUSSELS

Overview information on  
atmospheric aerosols and  
their global modeling.

Samuel Remy, with contributions from many  
authors

*HYGEOS*

*1 October 2025*





## Introduction

Aerosols – why do they matter?

Introduction to CAMS

Different aspects of global  
atmospheric composition modelling

AI/ML for aerosol modelling

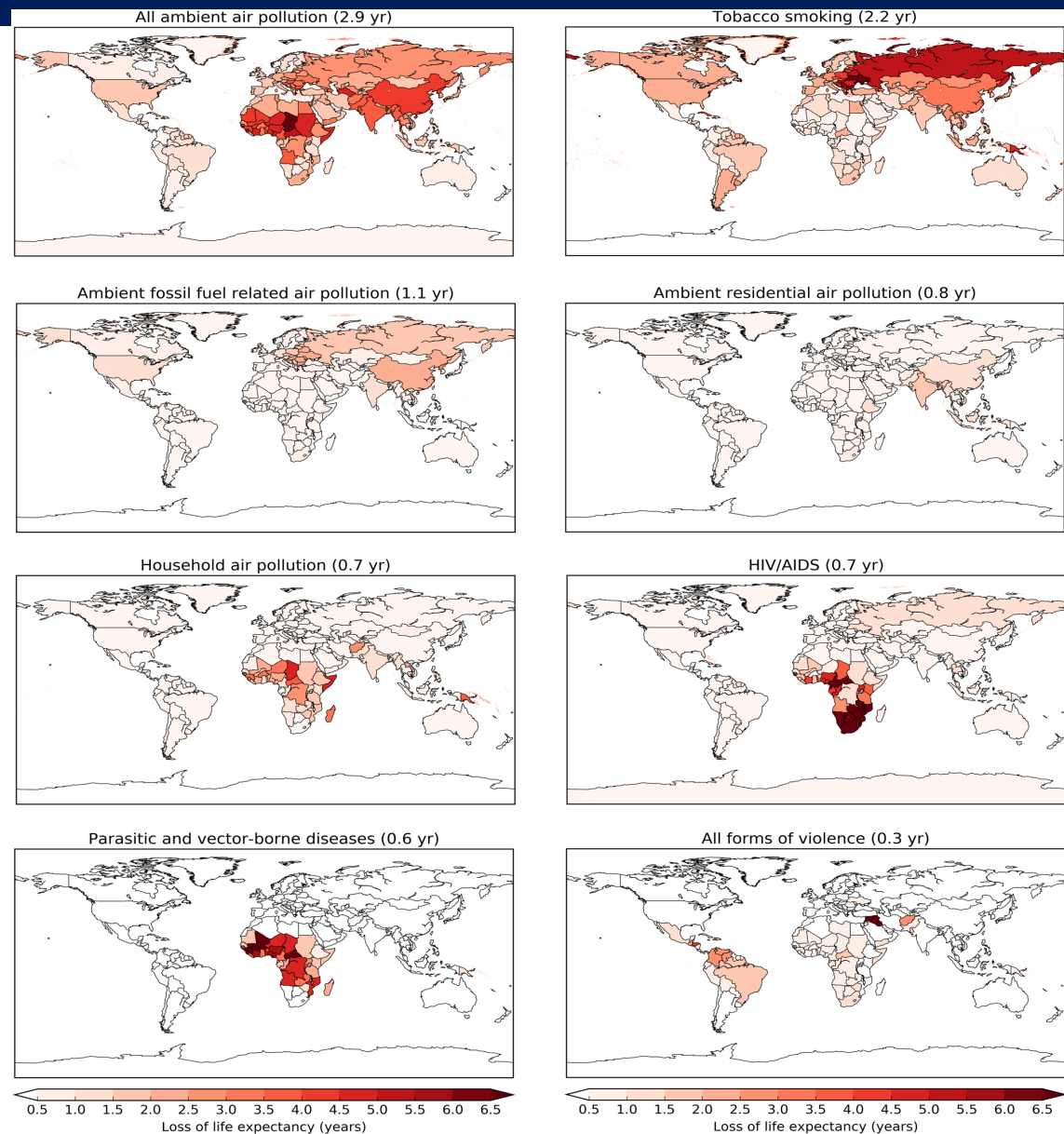




# Aerosols – why do they matter?

- Aerosols represent a major public health issue
- Estimated loss in life expectancy because of air pollution (PM) :

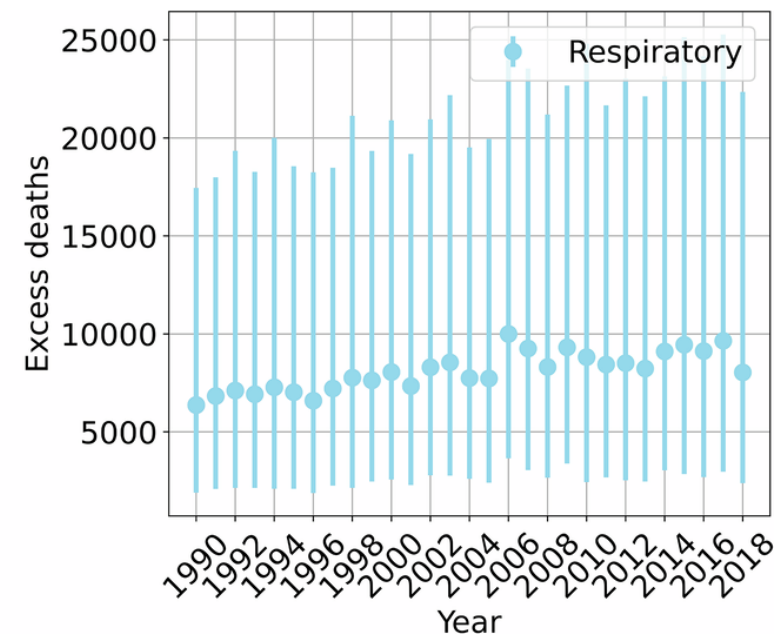
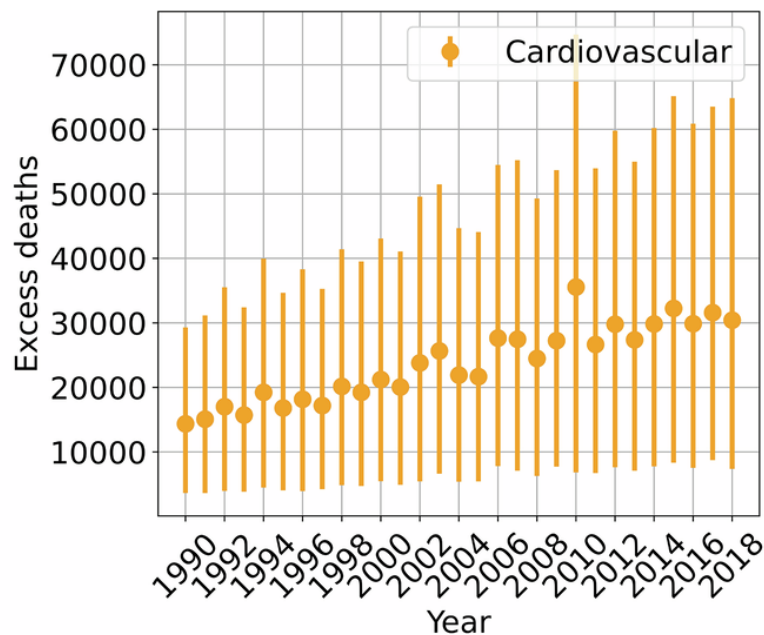
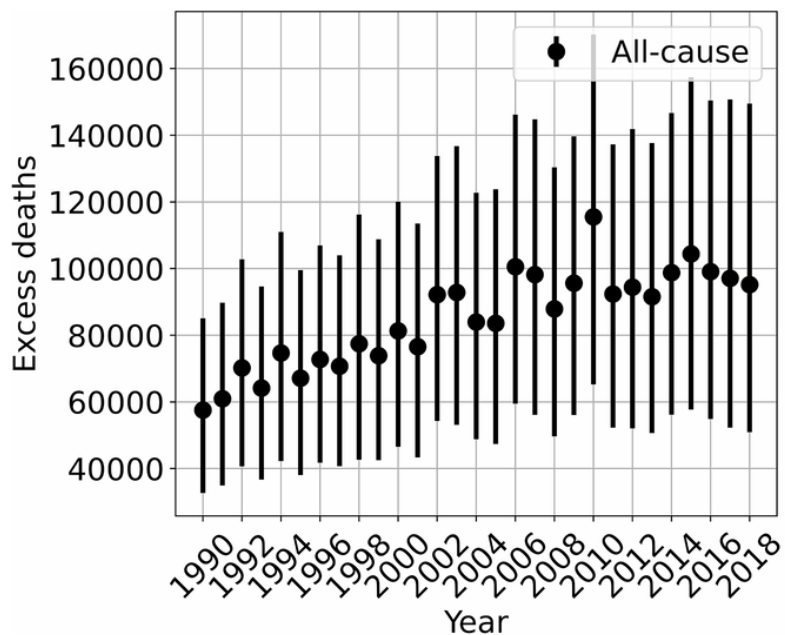
Mean global and country-level loss of life expectancy from different causes of death referring to the year 2015. Household air pollution is from the indoor use of solid biofuels. Ambient residential air pollution is mostly from household sources and can include fossil and biofuel use. Parasitic and vector-borne diseases include malaria, leishmaniasis, rabies, dengue, yellow fever, and others. Violence includes interpersonal, collective conflict, and armed intervention.



*Lelieveld et al. 2020: Loss of life expectancy from air pollution compared to other risk factors: a worldwide perspective*



- Aerosols represent a major public health issue
- Estimated excess deaths from exposure to acute fire PM:



*Chowdury et al. 2025: Global health burden from acute exposure to fine particles emitted by fires*

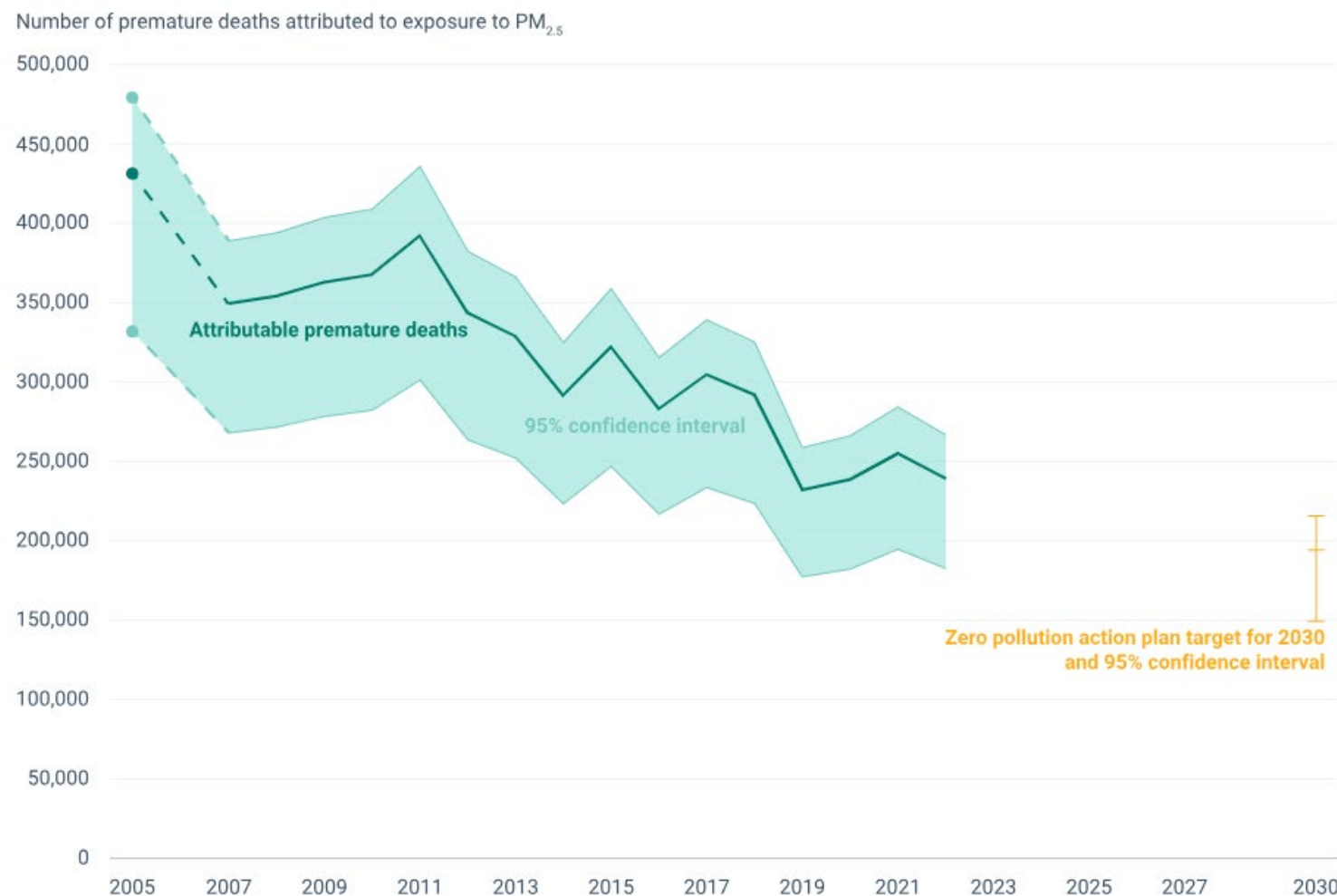




# Aerosols – why do they matter?

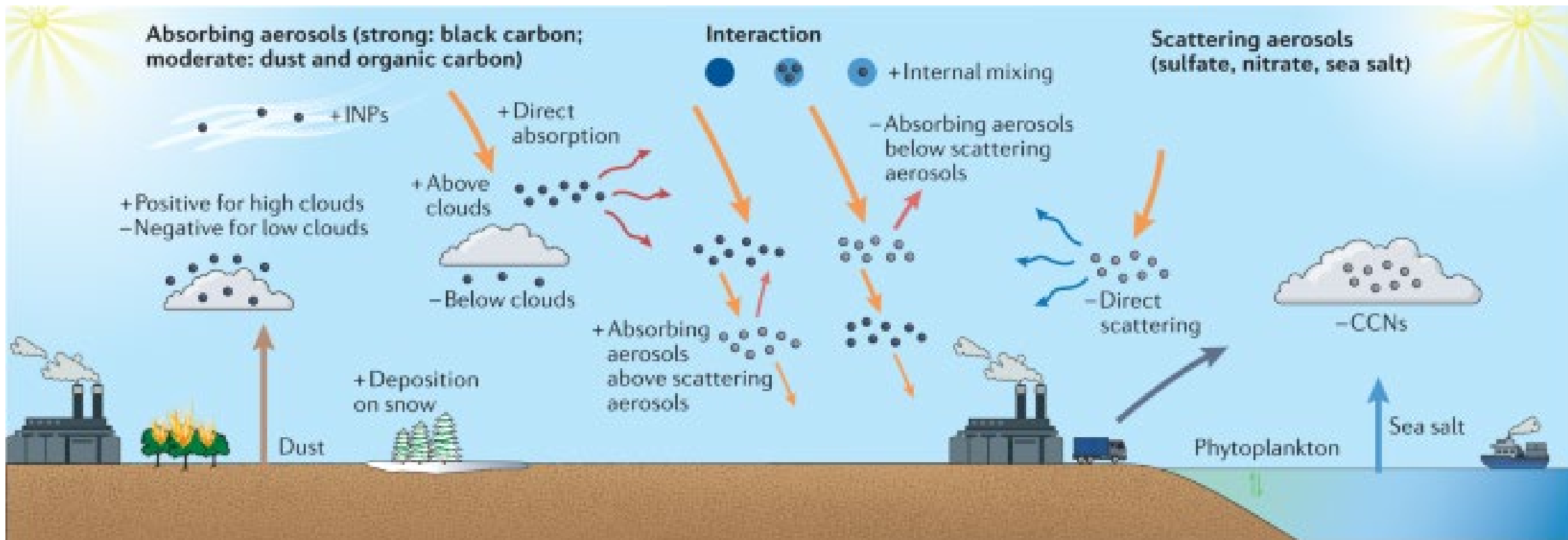
copernicus.eumetsat.int

- Aerosols represent a major public health issue
- Premature deaths attributable to exposure to fine particulate matter ( $PM_{2.5}$ ), EU



<https://www.eea.europa.eu/en/analysis/indicators/health-impacts-of-exposure-to>

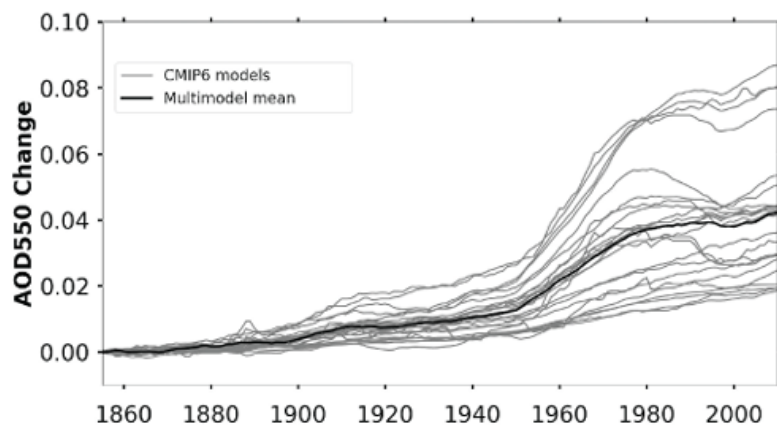
- Aerosols interact with weather – radiation and clouds



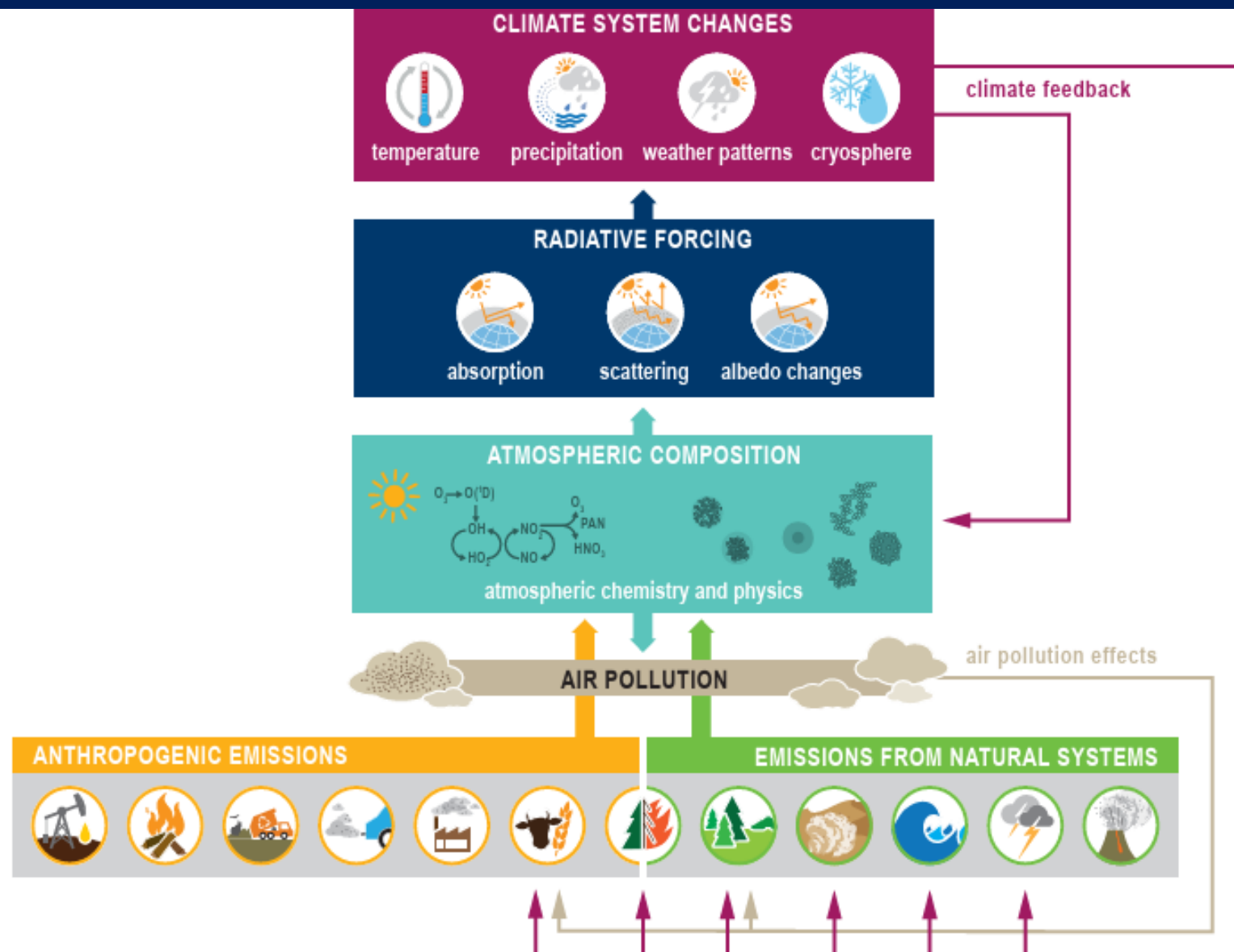
*Li et al. 2022: Scattering and absorbing aerosols in the climate system*

# Aerosols – why do they matter?

- Aerosols interact with weather – radiation and clouds

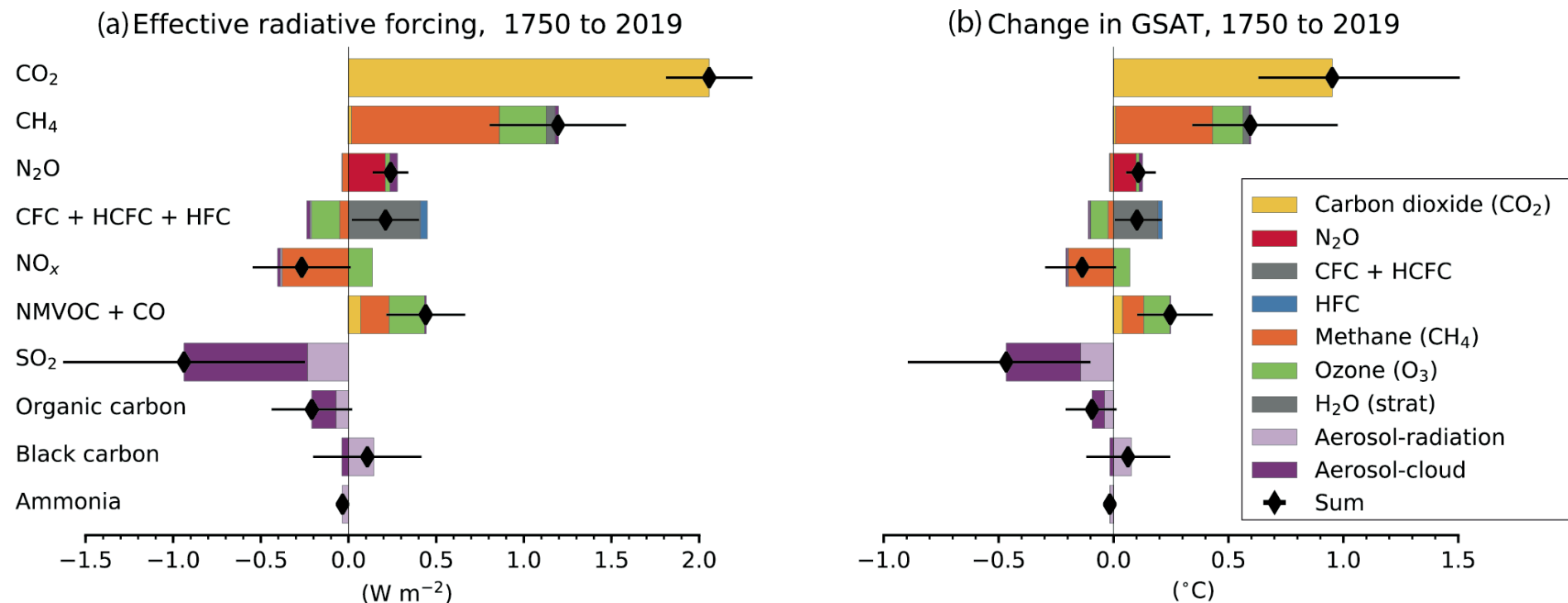


*Time evolution of changes in global mean aerosol optical depth (AOD) at 550 nm*





- Aerosols interact with weather – radiation and clouds



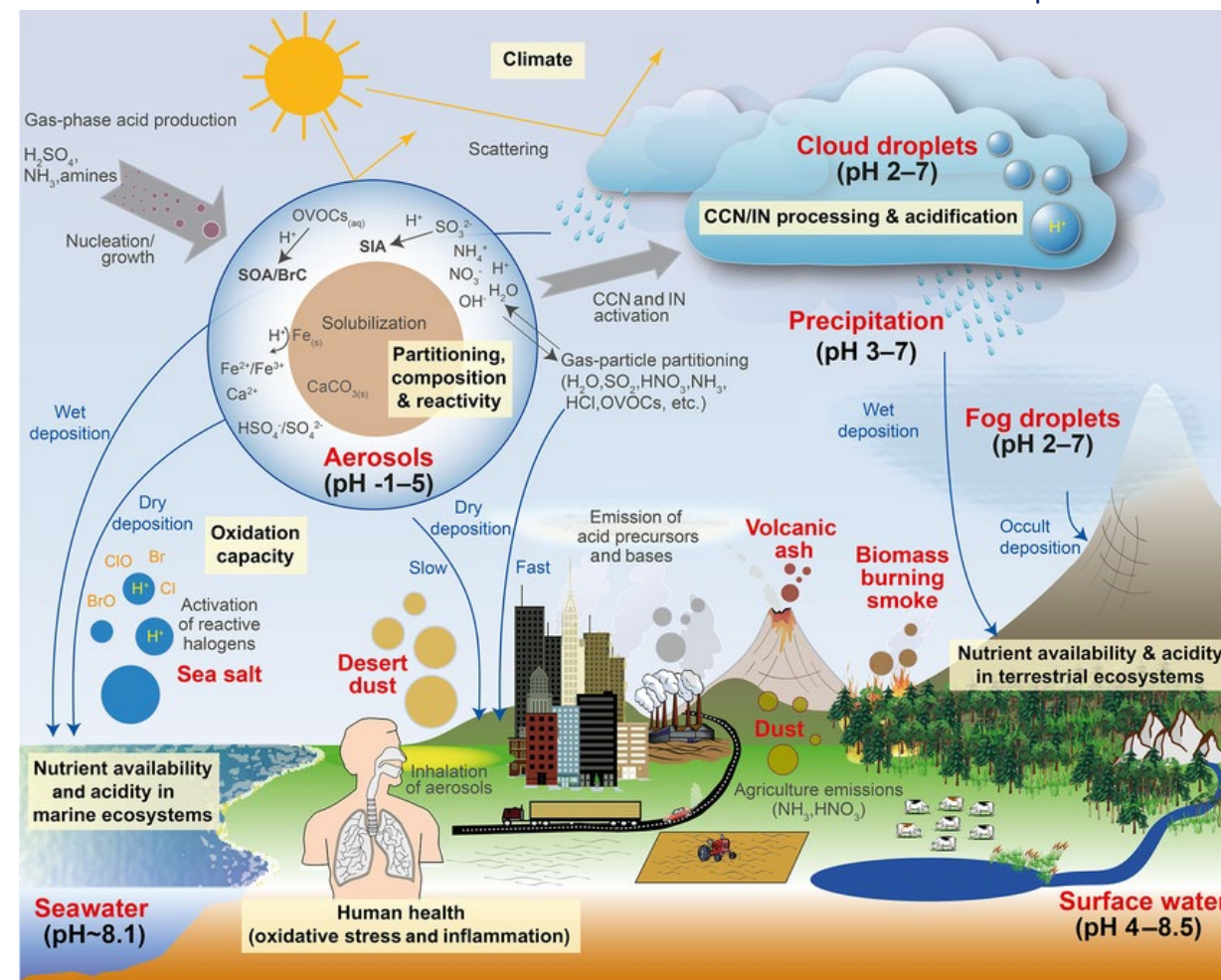
IPCC AR6 (Short Lived climate forcers) – Szopa et al 2021

# Aerosols – why do they matter?

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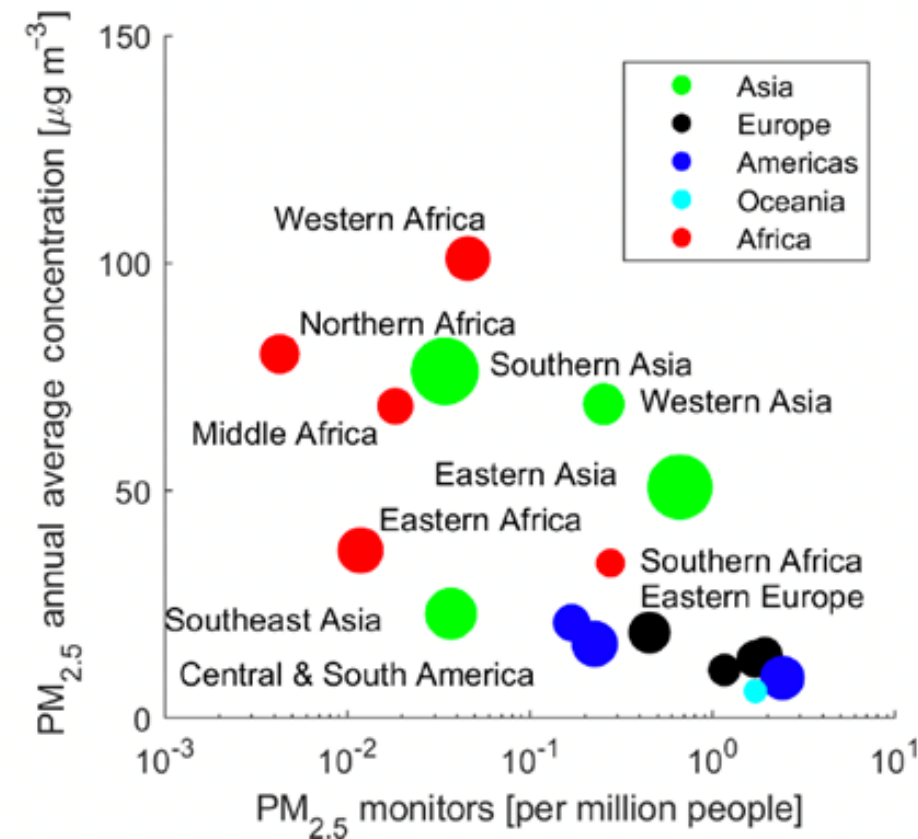
- Aerosols and gases impact the acidity of precipitation

Sources and receptors of aerosol and cloud droplet acidity. Major primary sources and occurrence in the atmosphere are identified in bold red text: sea salt, dust, and biomass burning (sources); and aerosols, fog droplets, cloud droplets, and precipitation (occurrence). Key aerosol processes are indicated by arrows and gray text: nucleation/growth, light scattering, cloud condensation nuclei (CCN) and ice nuclei (IN) activation, and gas-particle partitioning. Sinks (wet, dry, and occult deposition) are indicated by blue lines and text. The effects that aerosols have in the atmosphere, and on terrestrial and marine ecosystems and human health, are highlighted in pale yellow boxes. Approximate pH ranges of aqueous aerosols and droplets, seawater, and terrestrial surface waters are also given.



*Pye et al (2020)*

- Test our theories and understanding
- Provide air quality information in areas with a lack of observations
  - Spatial coverage
  - Temporal coverage (consistent time series)
  - Species and processes not well observed such as deposition
- Make air pollutions forecasts for the next days (or historic periods)
- Support air quality policy measures (impact emission reductions)
- Test and support validity of observations and support satellite retrievals



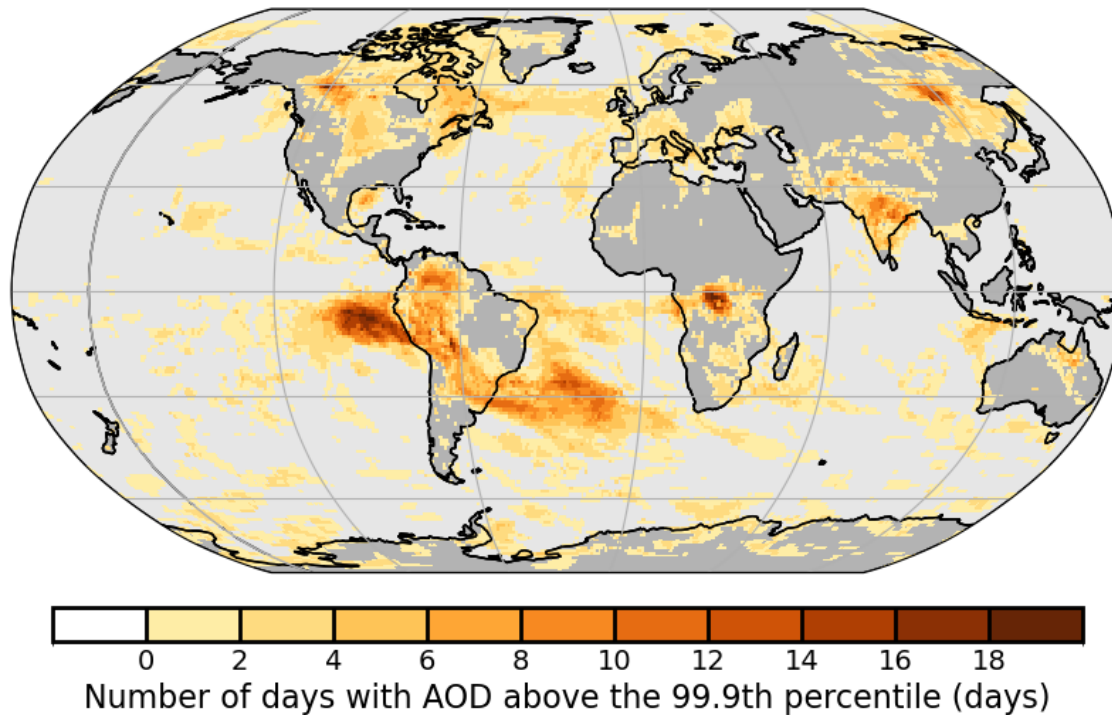
*Estimated annual PM<sub>2.5</sub> concentration versus density of (regulatory-grade) monitoring stations). Figure from Malings et al (2020).*



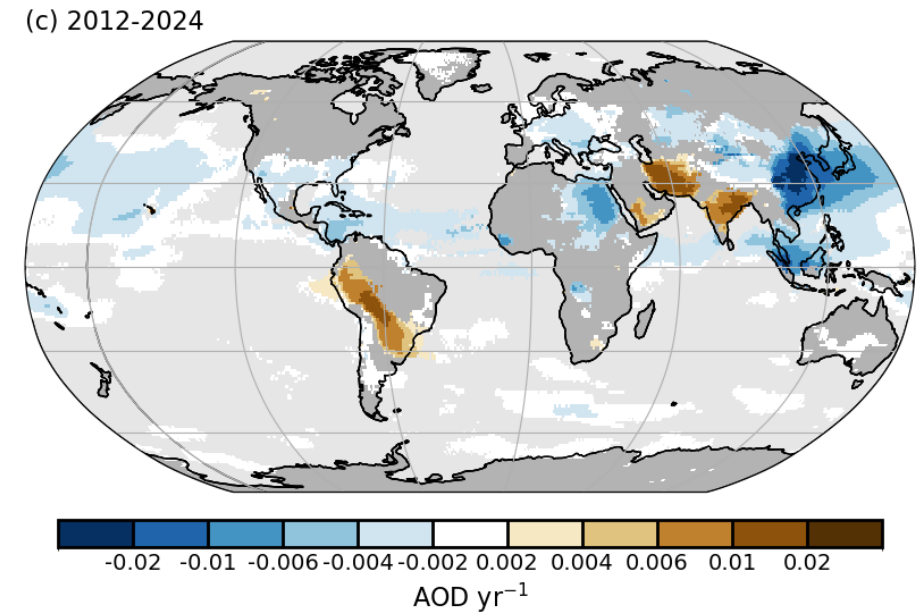
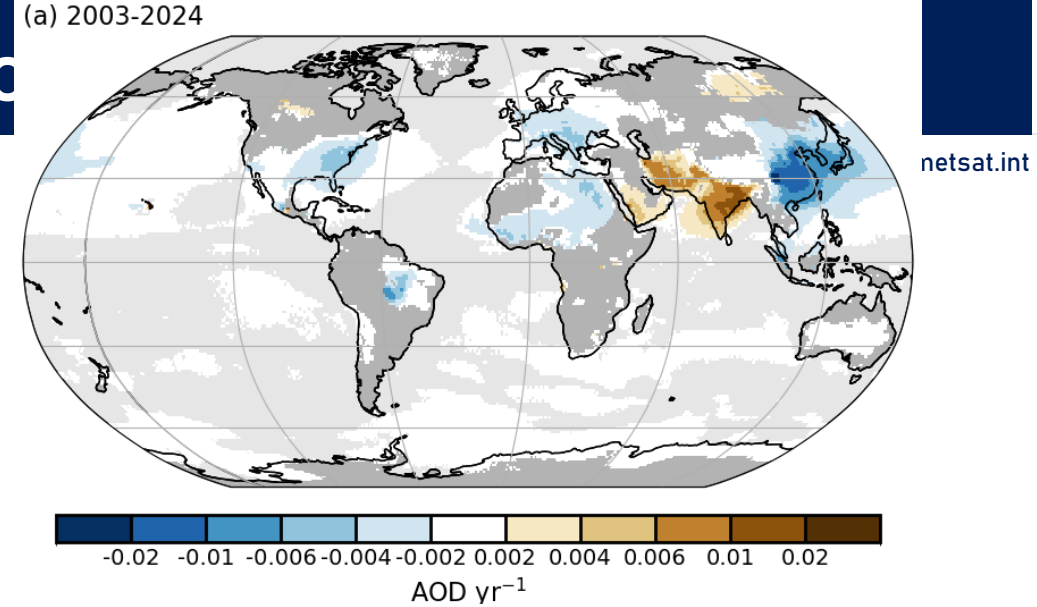


# Why do we need atmospheric compo

- Temporal coverage (consistent time series)



*Number of extreme AOD at 550nm days from the CAMS Reanalysis. Aerosol section of the BAMS State of the climate 2024*



*AOD at 550nm trend sin 2003-2024 and 2012-2024 from the CAMS Reanalysis. Aerosol section of the BAMS State of the climate 2024*



# Copernicus Atmosphere Monitoring Service

[copernicus.eumetsat.int](https://copernicus.eumetsat.int)

CAMS is one of six thematic information services provided by the Copernicus Earth Observation Programme of the European Union.



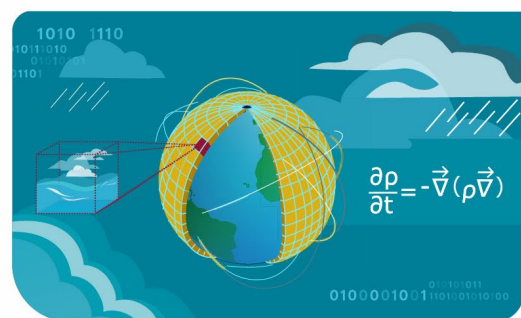


CAMS provides consistent and quality-controlled information related to air pollution and health, solar energy, greenhouse gases and climate forcing, everywhere in the world.

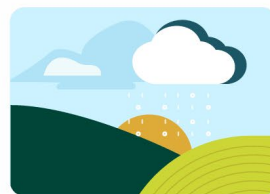
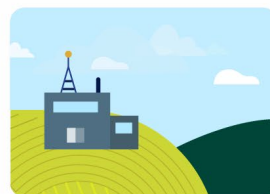
## AIR QUALITY OBSERVATIONS



## MODELLING



## OUTPUTS



### 1. Monitoring the current situation

- Air quality
- Solar radiation
- Greenhouse gases
- Fire emissions

### 2. Forecasts for the next few days

- Global
- Europe

### 3. Tools to explore further

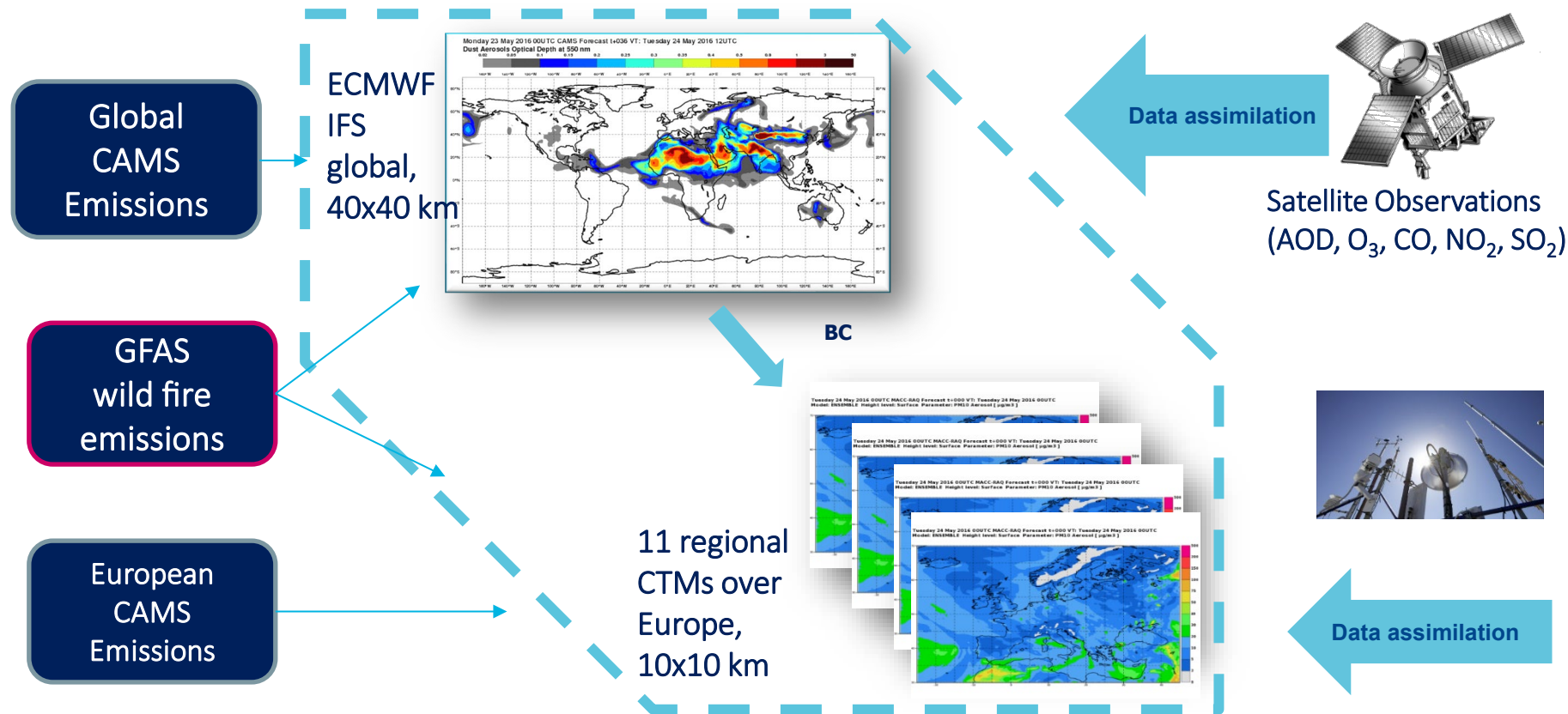
- Emissions and impact of reductions
- Origins of pollution
- Annual air quality assessments

## USERS

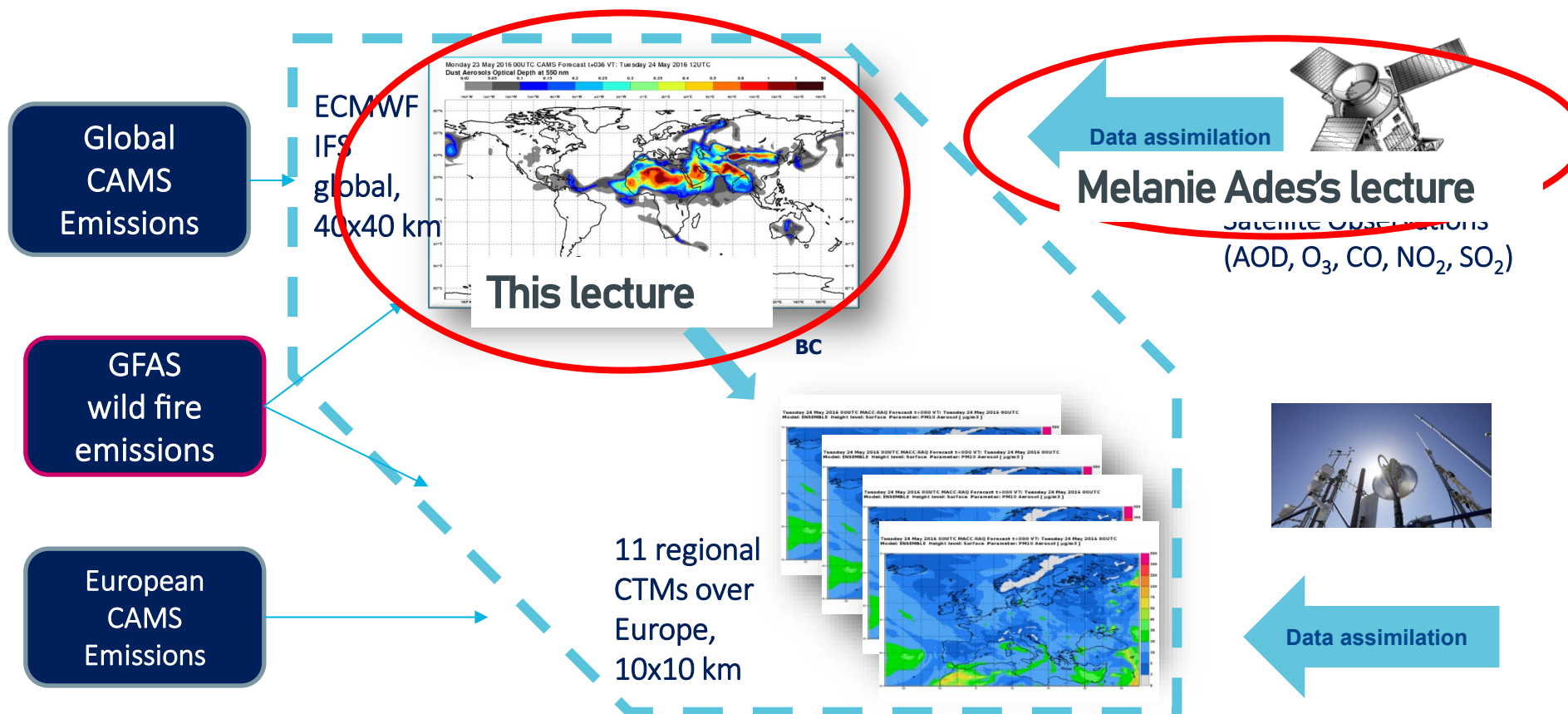
- Industry
- Businesses
- Government and policymakers
- Scientific community
- The public



## CAMS includes a global and a regional component



## CAMS includes a global and a regional component

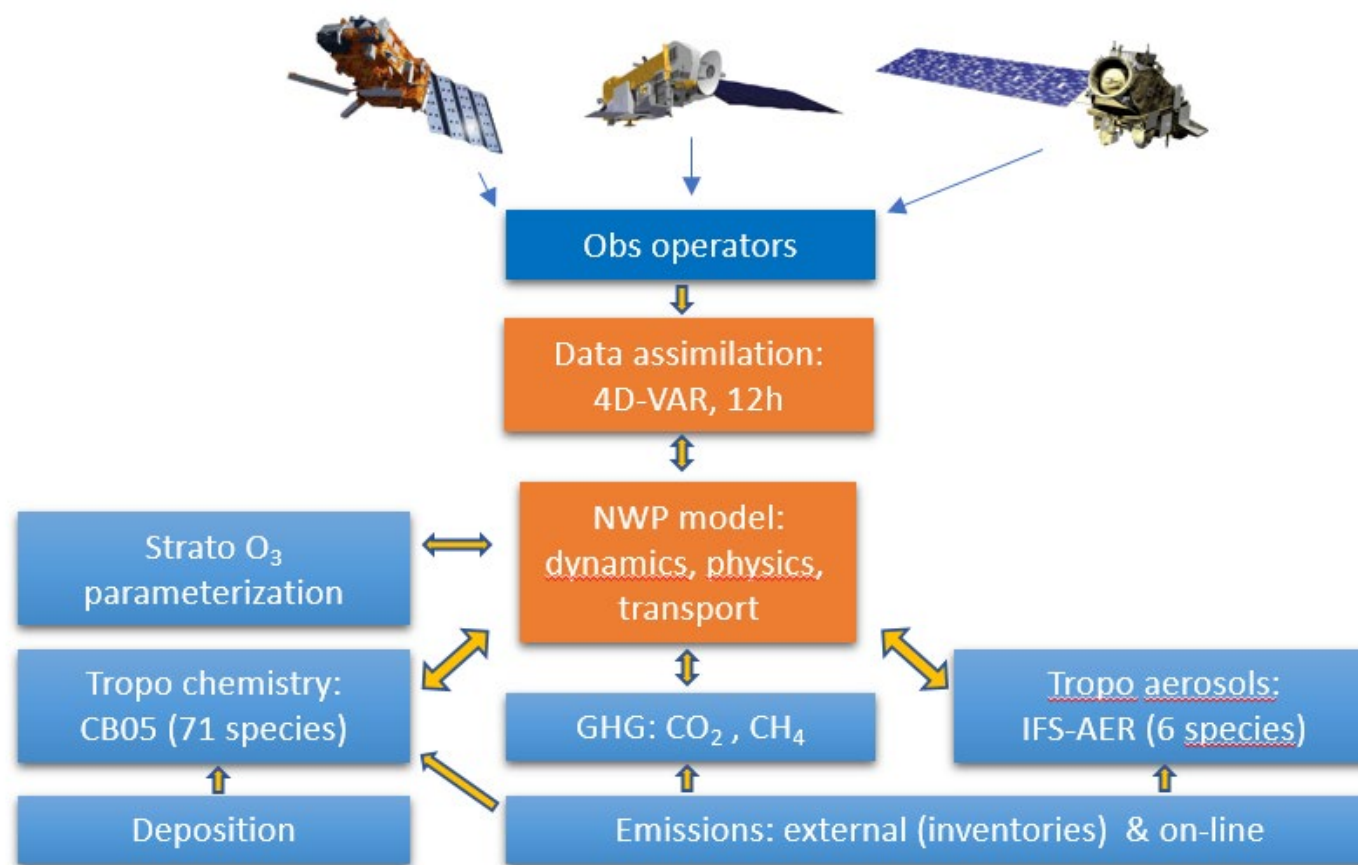




# The CAMS global system : IFS-COMPO

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IFS-COMPO is the ECMWF Integrated Forecasting System (IFS – the Numerical Weather Prediction system) with atmospheric composition extensions



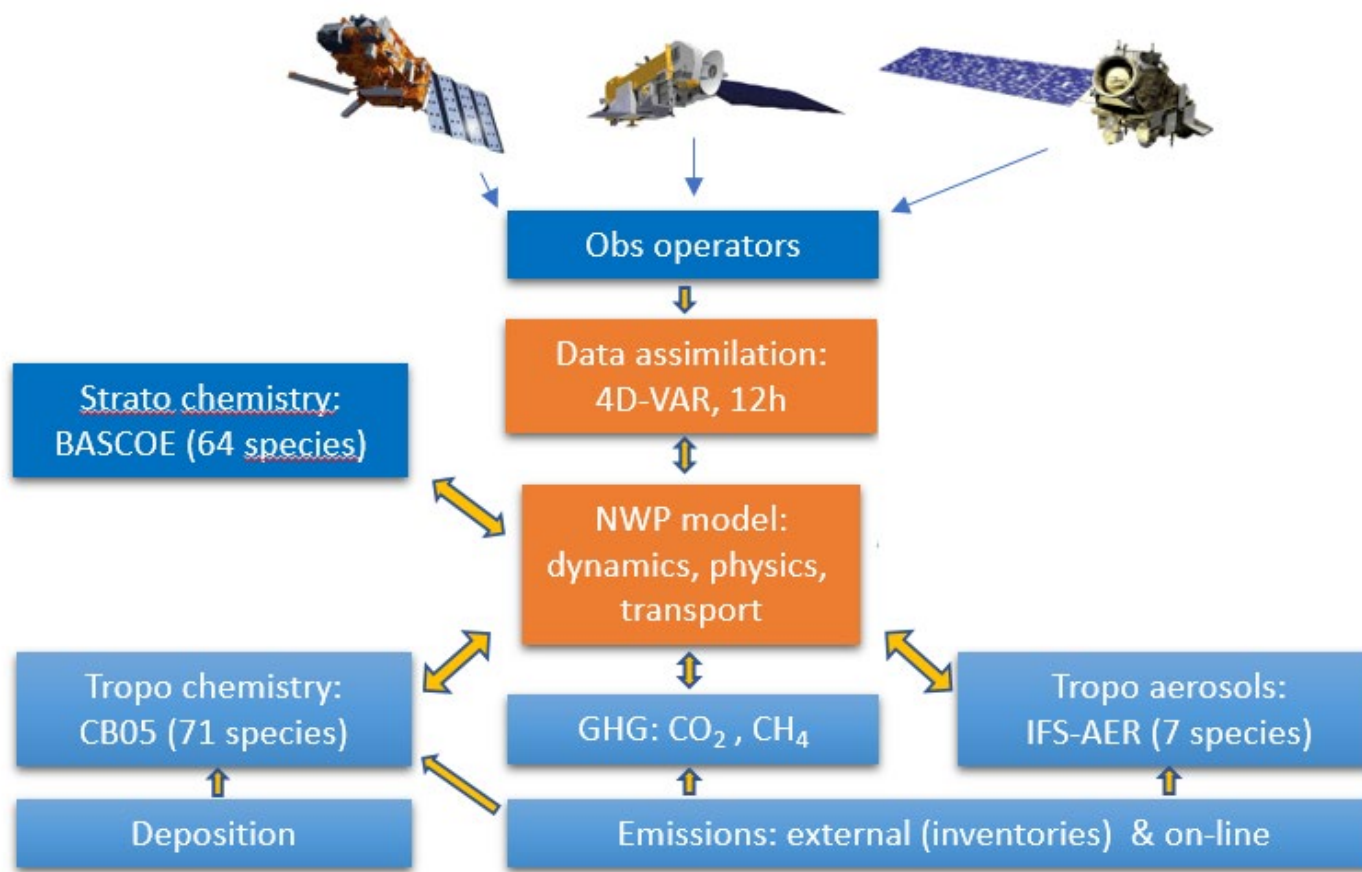
*Cycle 47R3 IFS-COMPO (operational July 2021 – June 2023)*



# The CAMS global system : IFS-COMPO

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IFS-COMPO is the ECMWF Integrated Forecasting System (IFS – the Numerical Weather Prediction system) with atmospheric composition extensions



*Cycle 48R1 IFS-COMPO (operational June 2023 – November 2024)*

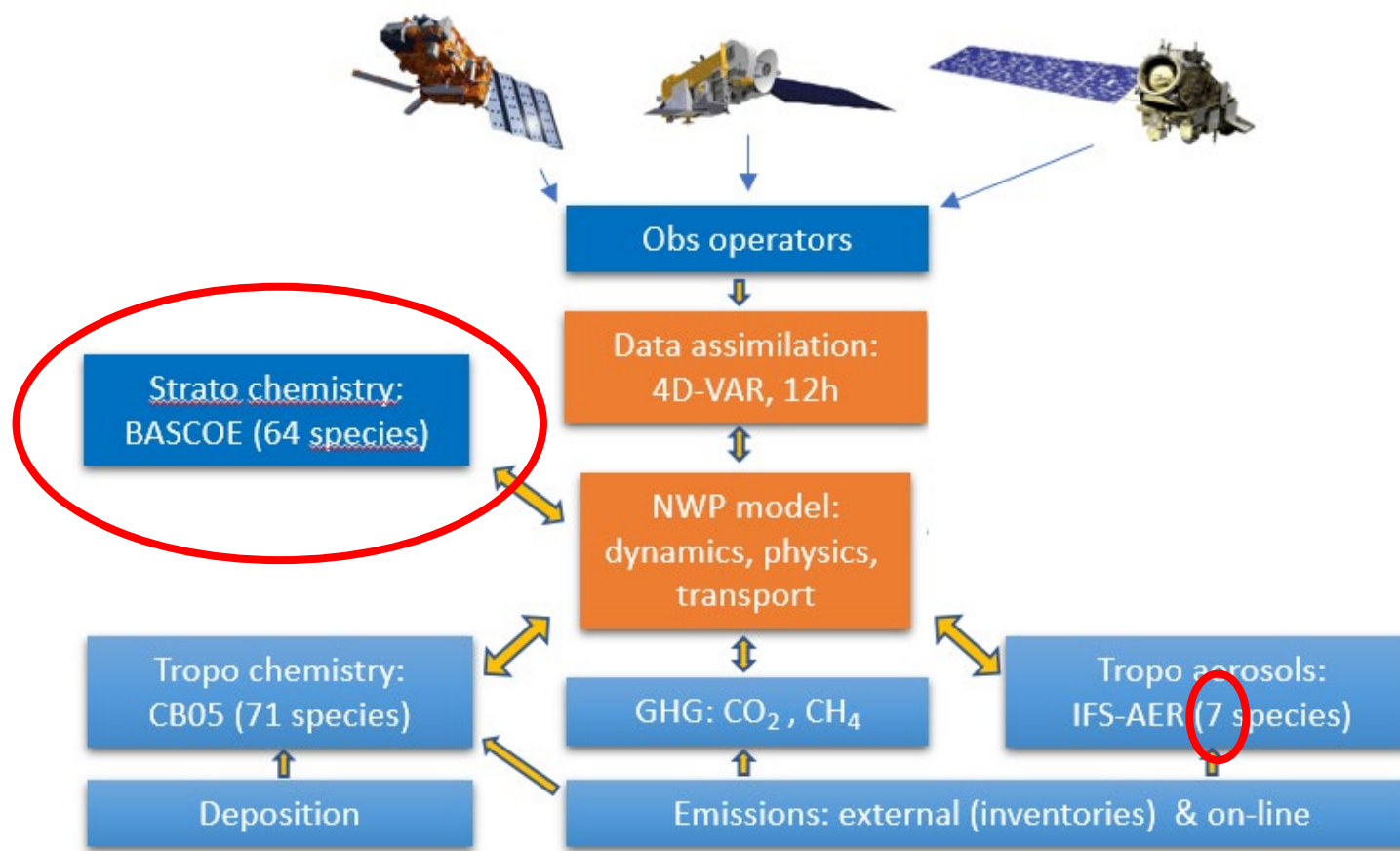




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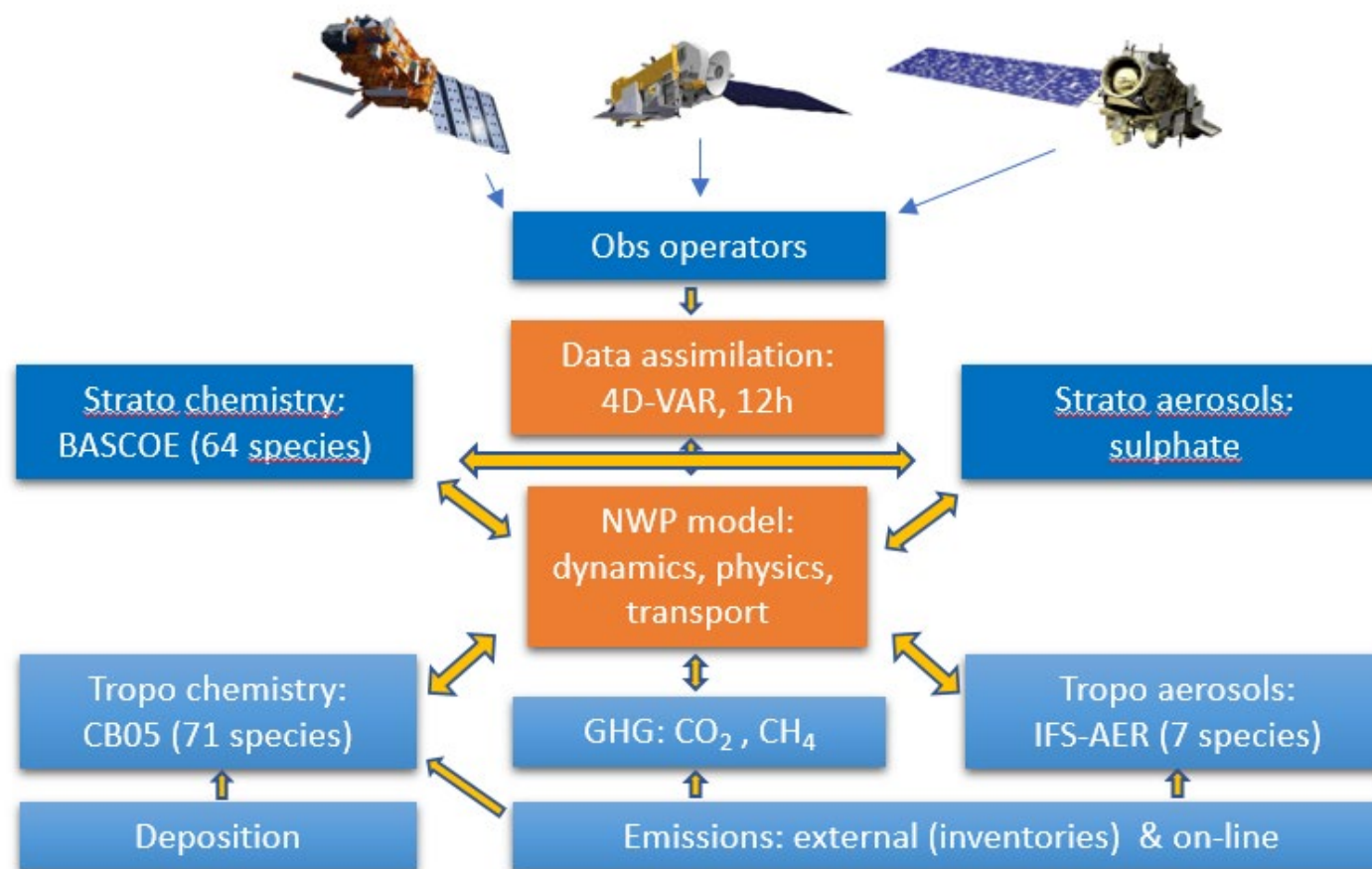
*Cycle 48R1 IFS-COMPO (operational June 2023 – November 2024)*



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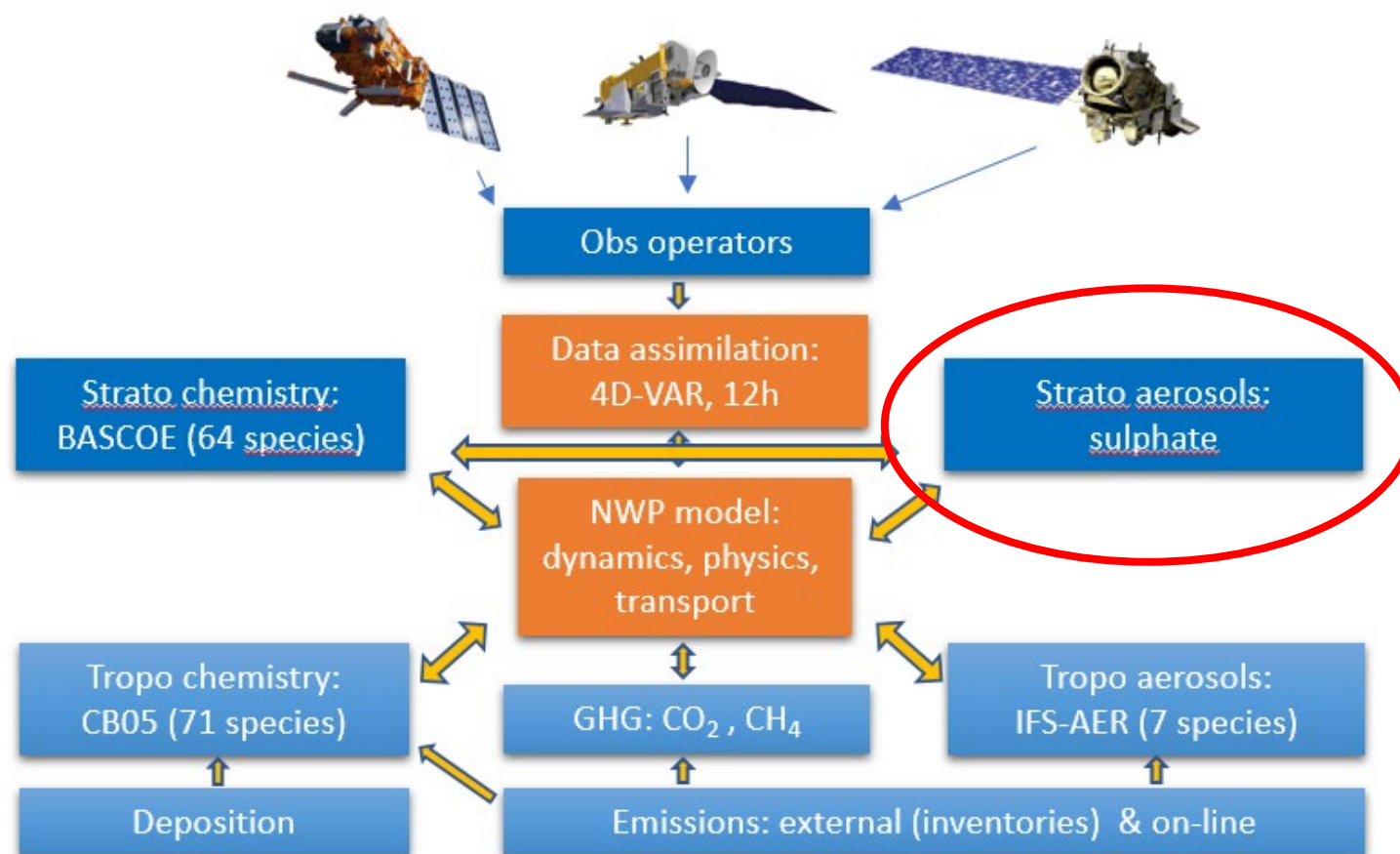
*Cycle 49R1 IFS-COMPO (operational November 2024 - )*



# The CAMS global system : IFS-COMPO

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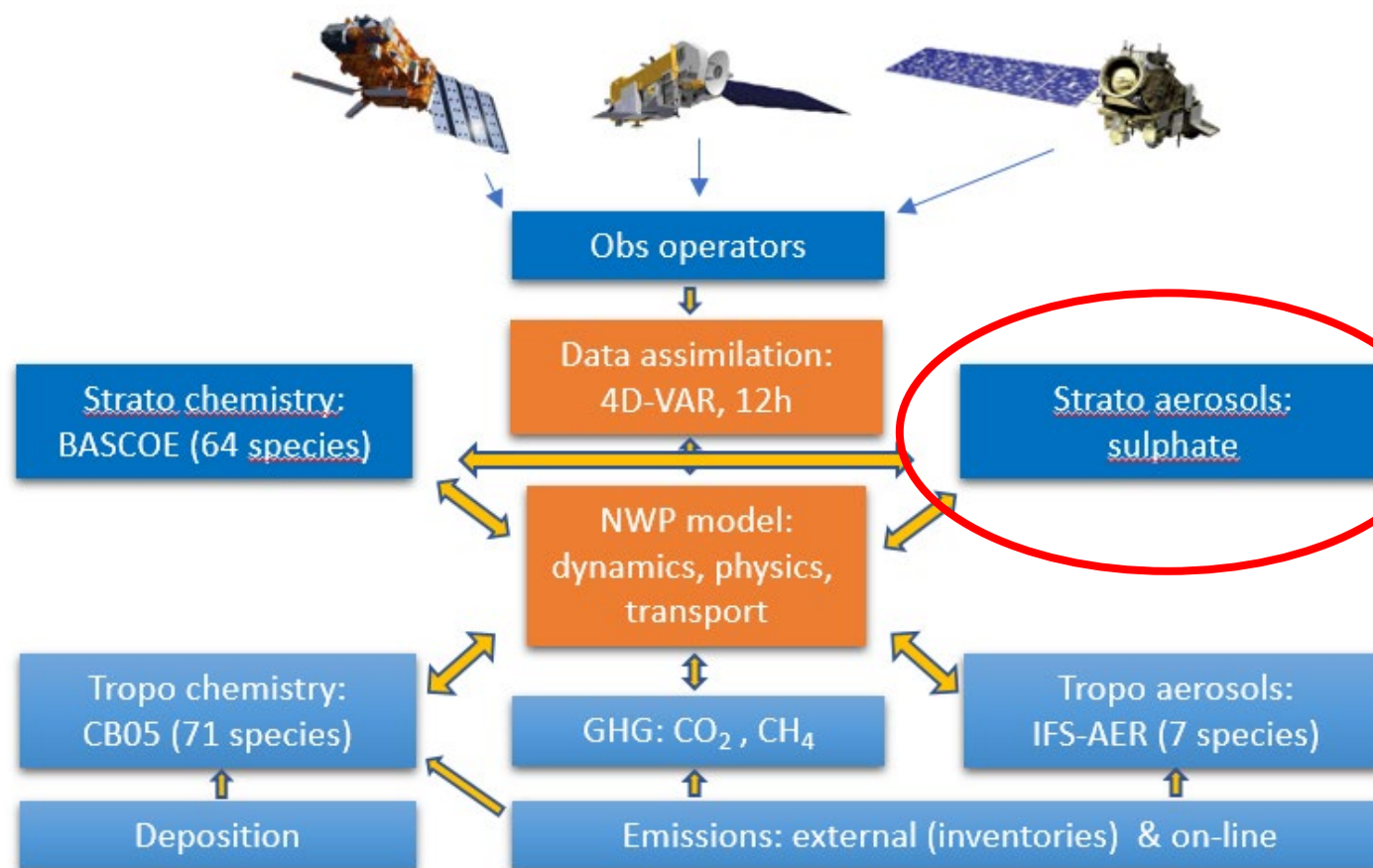
IFS-COMPO is the ECMWF Integrated Forecasting System (IFS – the Numerical Weather Prediction system) with atmospheric composition extensions



*Cycle 49R1 IFS-COMPO (operational November 2024 - )*



IFS-COMPO is the ECMWF Integrated Forecasting System (IFS – the Numerical Weather Prediction system) with atmospheric composition extensions



More about stratospheric aerosols in the talk by V. Sofieva.

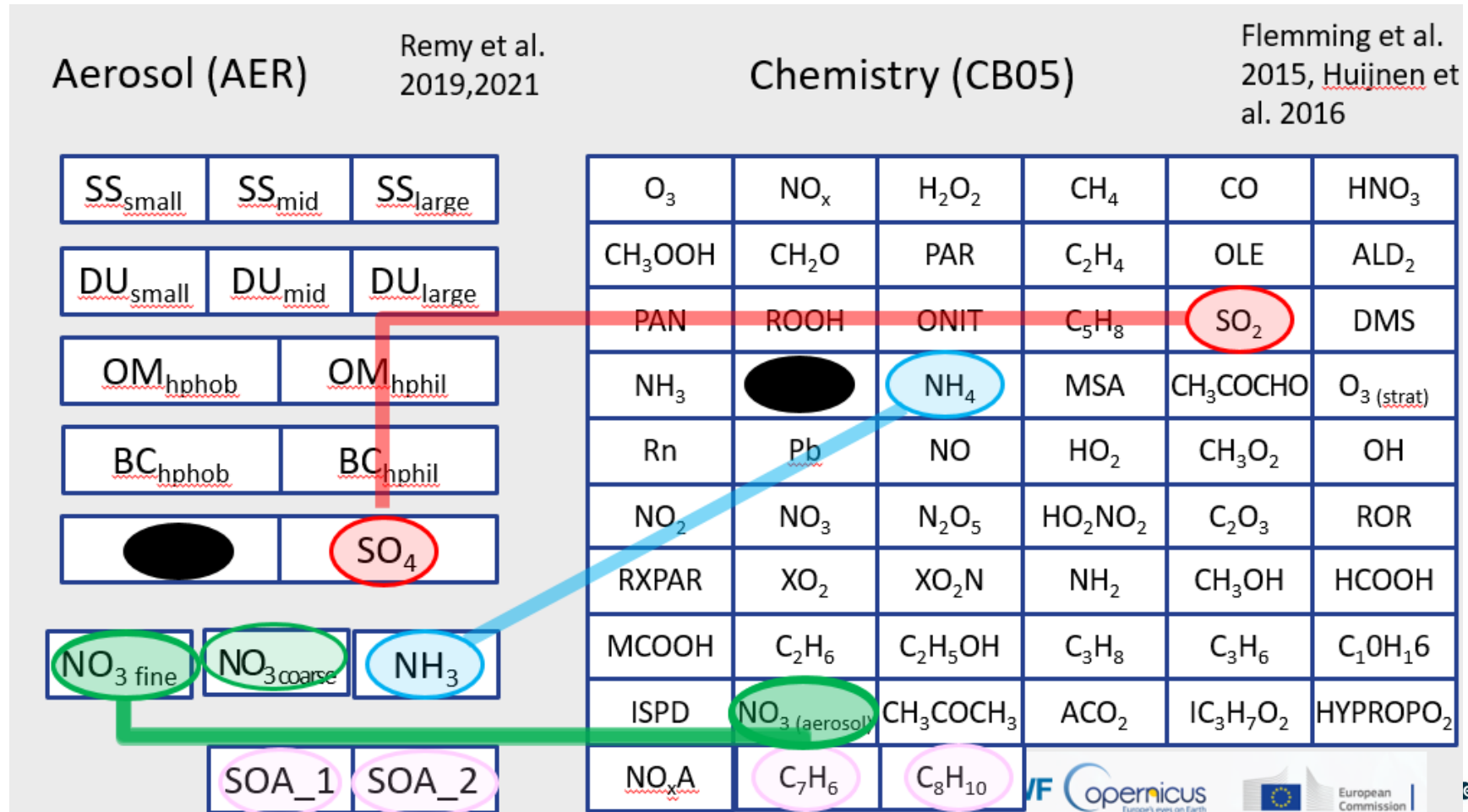
*Cycle 49R1 IFS-COMPO (operational November 2024 - )*



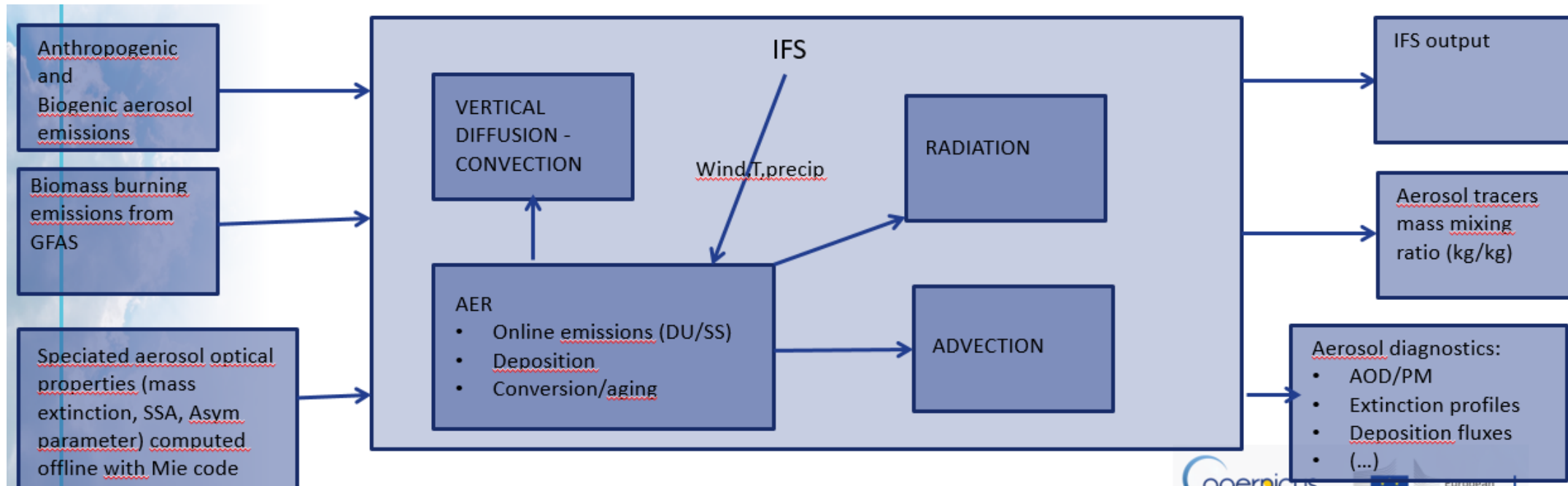


- 8 species considered:
  - Desert dust (DD): 3 tracers
  - Sea-salt aerosol (SS): 3 tracers
  - Organic Matter (OM): 2 tracers
  - Black carbon (BC): 2 tracers
  - Sulfate (SO<sub>4</sub>) + precursor SO<sub>2</sub> when running uncoupled from chemistry
  - Nitrate: 2 tracers (from gas/particle partitioning, and from het. reactions) **since cycle 46R1**
  - Ammonium: 1 tracer **since cycle 46R1**
  - SOA: 2 tracers (biogenic and anthropogenic) **since cycle 48R1**
- Bulk/bin approach : bulk for OM/BC/SO<sub>4</sub>, 3 size bins for SS/DD
- For OM and BC, hydrophobic (fresh) and hydrophilic (aged) components are considered
- Sea-salt aerosol and Sulfate are also hydrophilic
- 16 tracers representing dry aerosol mass mixing ratio **except for sea-salt aerosol: mass mixing ratio at 80% RH**
- IFS-AER is relatively cheap: in its cycle 48R1 version, it represents only 0.8% of the computing cost of a model integration (including tropospheric and stratospheric chemistry)
- AER variants are implemented in the IFS, in OpenIFS/AC (cycle 43R3) and in the CNRM climate model (TACTIC, Michou et al. 2015)

- Originally aerosols were standalone in IFS-COMPO – no interaction with chemistry
- Production rates of sulphate and SOA are provided by chemistry
- Production rate of nitrate/ammonium are computed by EQSAM4Clim using gaseous and particulate inputs
- Other couplings : use of aerosol input in chemical photolysis and heterogeneous reactions



- Originally developed by J.J. Morcrette and O. Boucher during the GEMS project (2006–2008)
- Designed as a part of the ECWMF Integrated Forecasting System (IFS)
- First versions were standalone, ie not coupled with chemistry
- Coupling with radiation (direct effect) implemented from the start
- No coupling with clouds/microphysics



- Modal approach is often closer to observed reality
- Modal approach allows for an easier coupling with clouds and microphysics
- Sectional/bulk approach can be cheaper computationally
- Modal approach often more complex, but additional complexity doesn't always translate in improved skill!



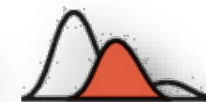
versus

**Nucleation**

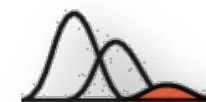
**Aitken**



**Accumulation**



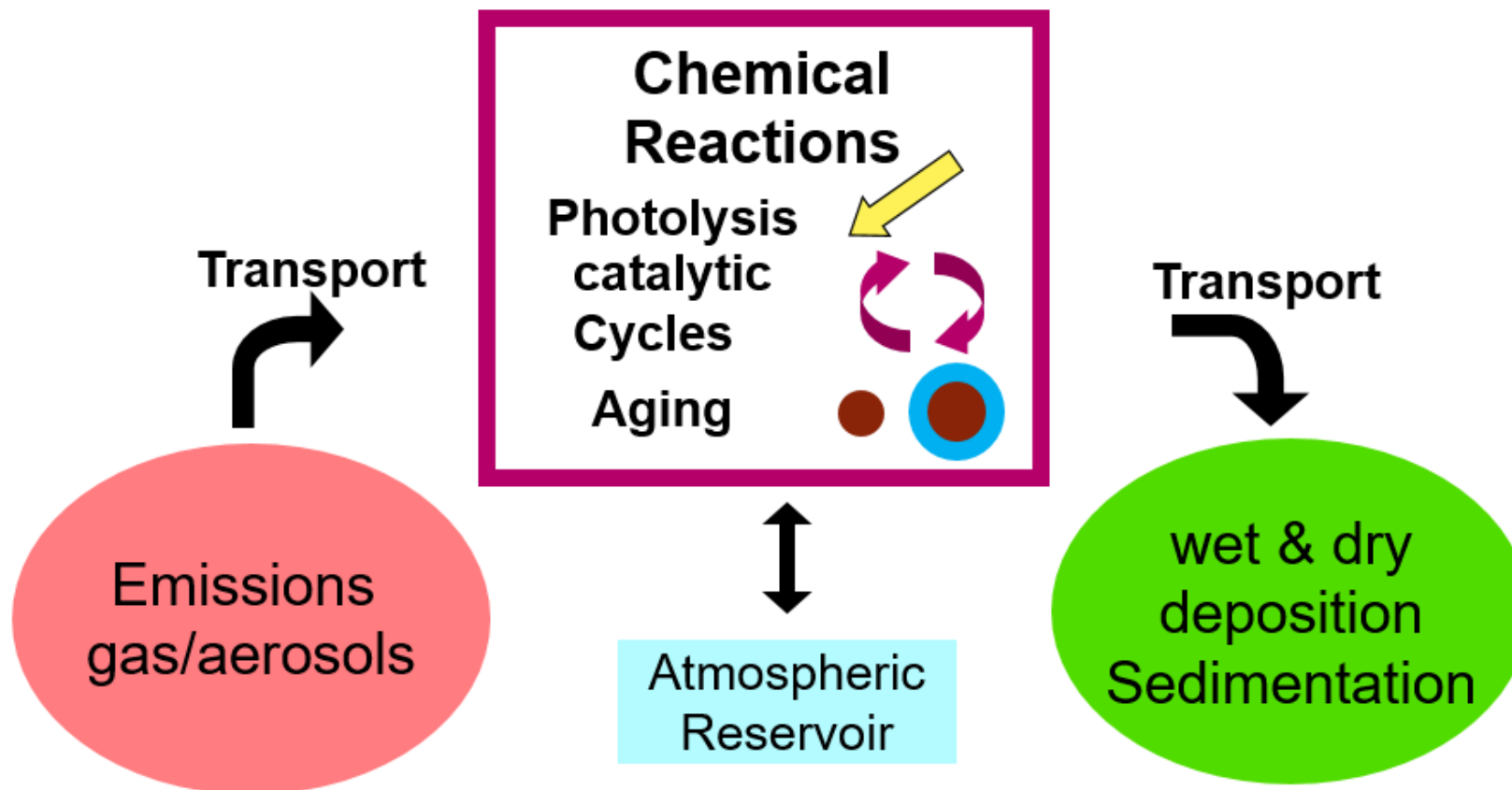
**Coarse**







## General processes in Atmospheric composition



## Mass balance equation for chemical and aerosol species

$$\frac{\partial c_i}{\partial t} + \underbrace{\mathbf{V}_h \cdot \nabla_h c_i + \frac{\partial}{\partial z} w_c c_i}_{\text{Advection}} - \underbrace{\frac{\partial}{\partial z} K_z \frac{\partial c_i}{\partial z}}_{\substack{\text{Turbulent} \\ \text{Mixing}}} = \underbrace{E + R - D}_{\text{Source and Sinks}}$$

$c_i$  concentration of species  $i$   
 $E_i \neq f(c_i)$  ... Emission  
 $R_i = f(c_i, c_j, c_k, c_m, \dots)$  ... Chemical conversion  
 $D_i = l_{Dep} c_i$  ... Deposition

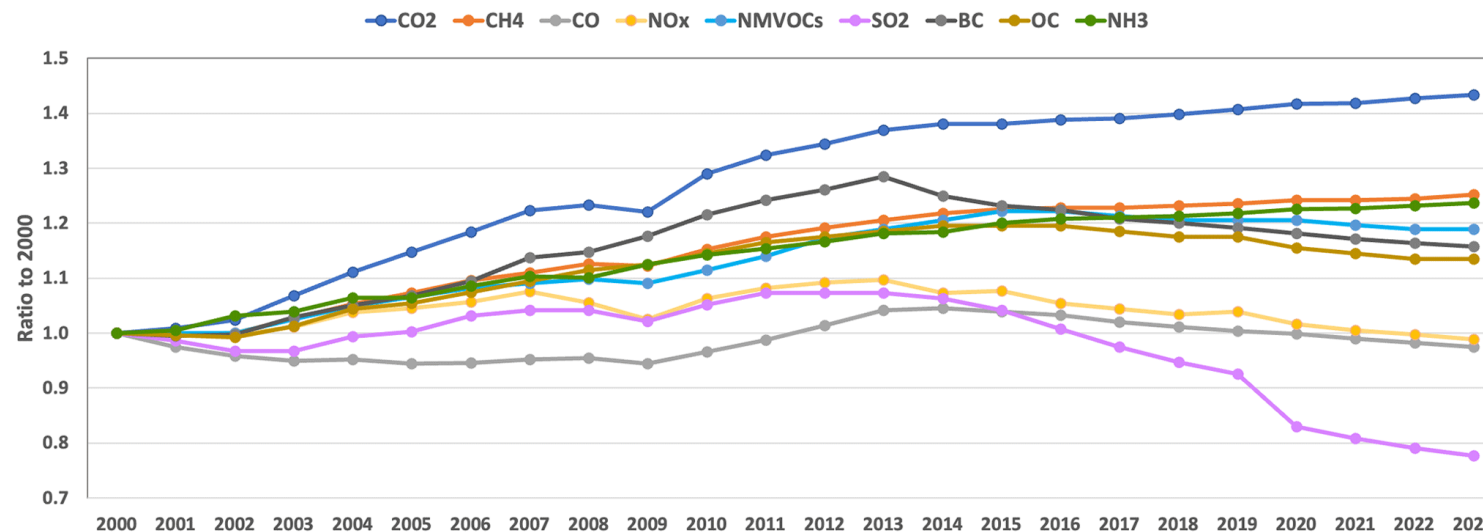


- Anthropogenic emissions (industry, power generation, traffic, transport, aviation )
  - provided as inventories based on socio economic data
  - Specific for base years with projections for future
  - Large variety between different inventories
- Wildfire emissions
  - based on fire radiative power or burned area satellite observations
- Natural Emissions from soils, oceans and volcanoes
  - Desert dust suspension, sea salt aerosol, NO<sub>x</sub> soil emissions, DMS emissions from oceans, NO<sub>x</sub> emissions from lightning
  - strong dependency on meteorology and land surface
  - modelled on-line
- Biogenic emission of volatile organic compounds – e.g. isoprene
  - Strong dependency on temperature, PAR and LAI and vegetation types
  - Modelled – online but also with dedicated BVOC models (MEGAN)
- **Emissions are often considered the most important input parameter to AC models**

- Global emissions inventories for anthropogenic, biogenic, shipping, volcanic outgassing, soil NO<sub>x</sub>
- Geographical and sectoral temporal profiles
- Regular updates to include, e.g., specific information on regional (including China, India, & SE Asia) emissions
- Public releases and documentation available via CAMS Atmosphere Data Store

<https://ads.atmosphere.copernicus.eu/cdsapp#!/dataset/cams-global-emission-inventories>

<https://eccad.aeris-data.fr/>

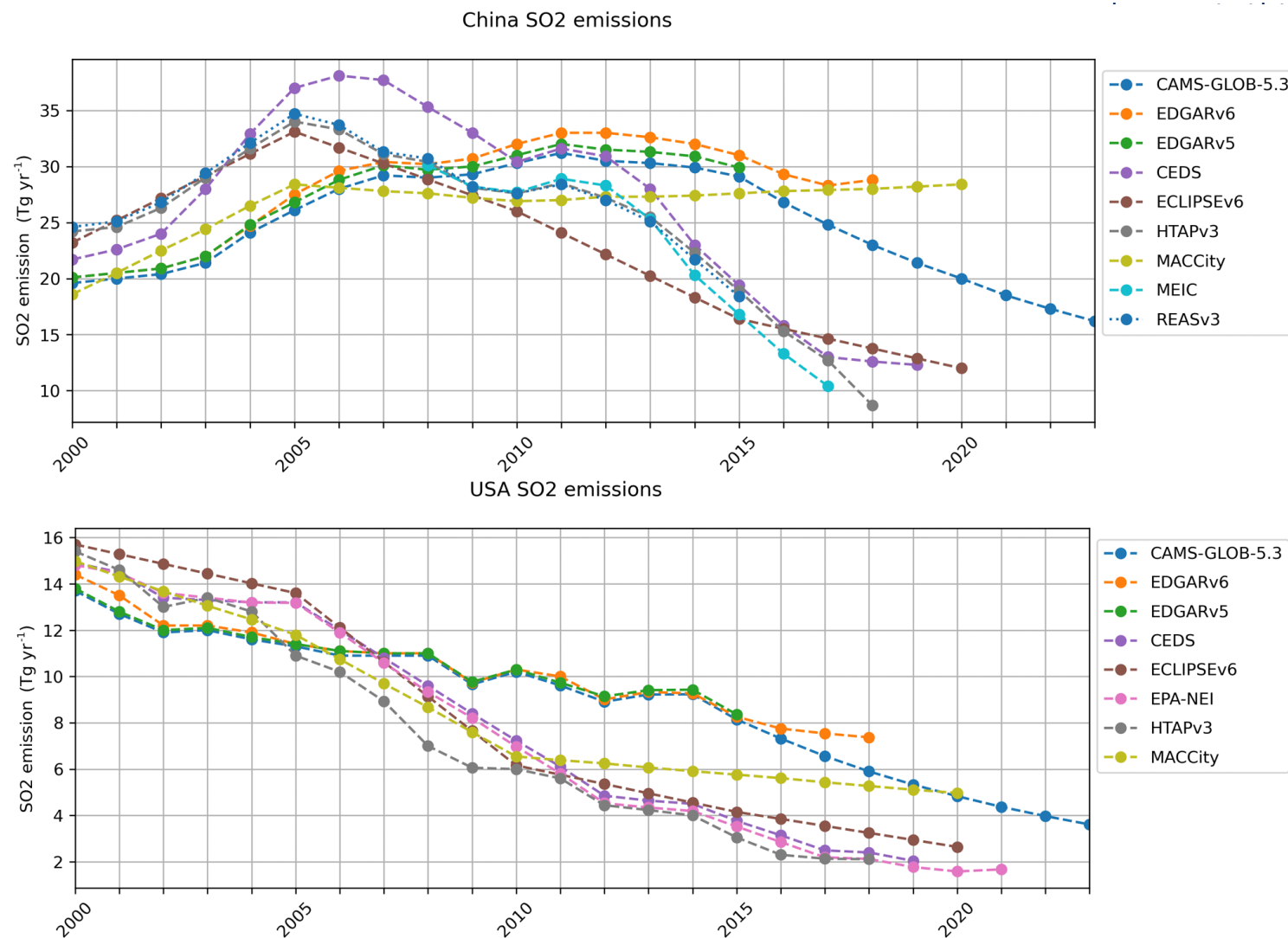


*From Soulié et al (2023), CAMS\_GLOB\_ANT emission inventory, relative change of emissions of various species relative to 2000*





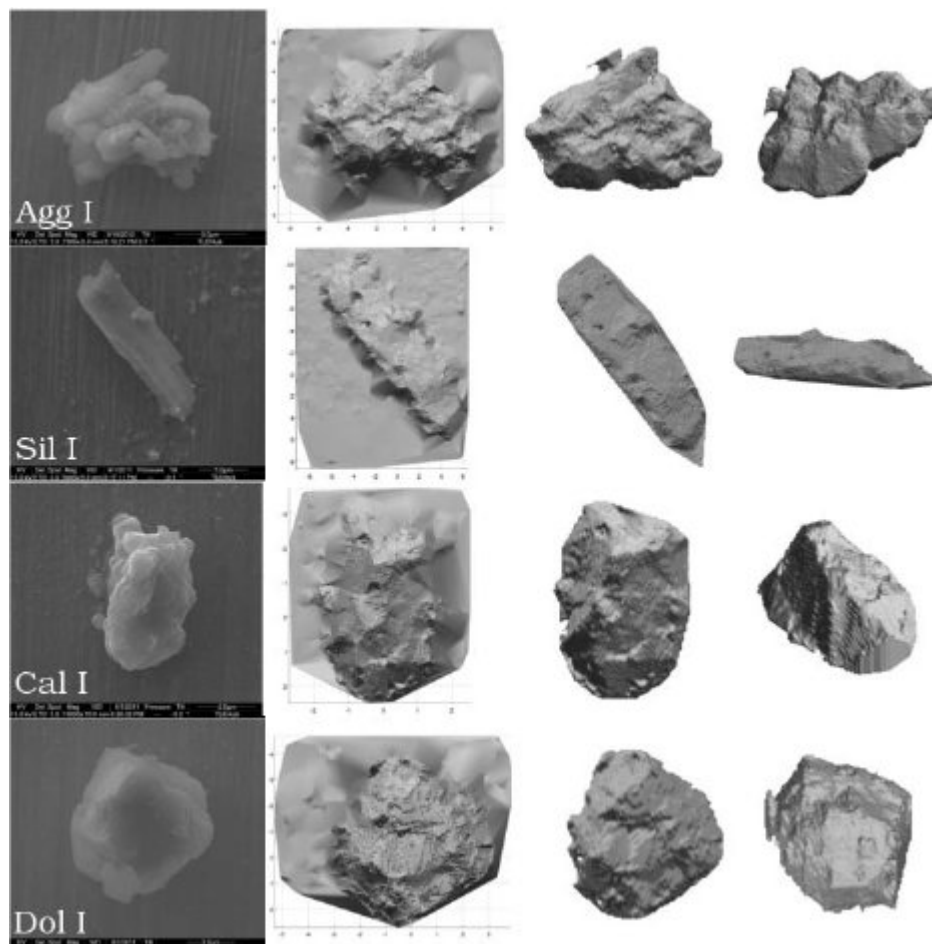
## Large uncertainties and variability between different emissions datasets



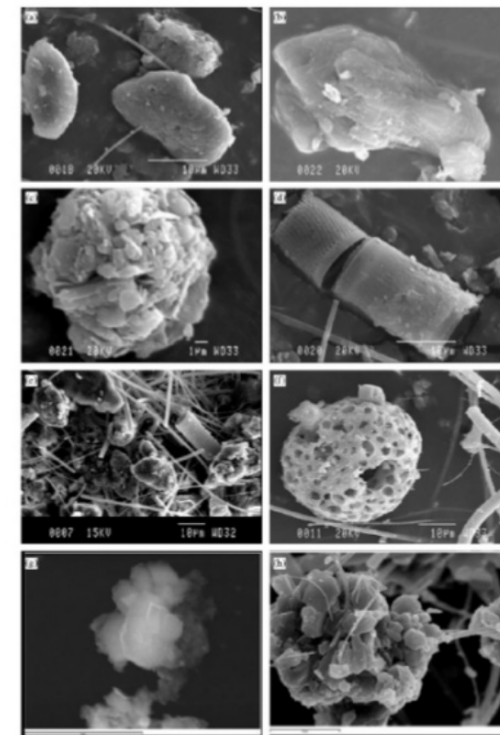
*From Soulié et al (2023), CAMS\_GLOB\_ANT emission inventory SO<sub>2</sub> emissions compared to other inventories over China and the USA*



Dust is composed of aggregates of a wide variety of minerals: quartz, feldspar, dolomite, illite, smectite, hematite, kaolinite, etc. with different shapes, colors, etc.



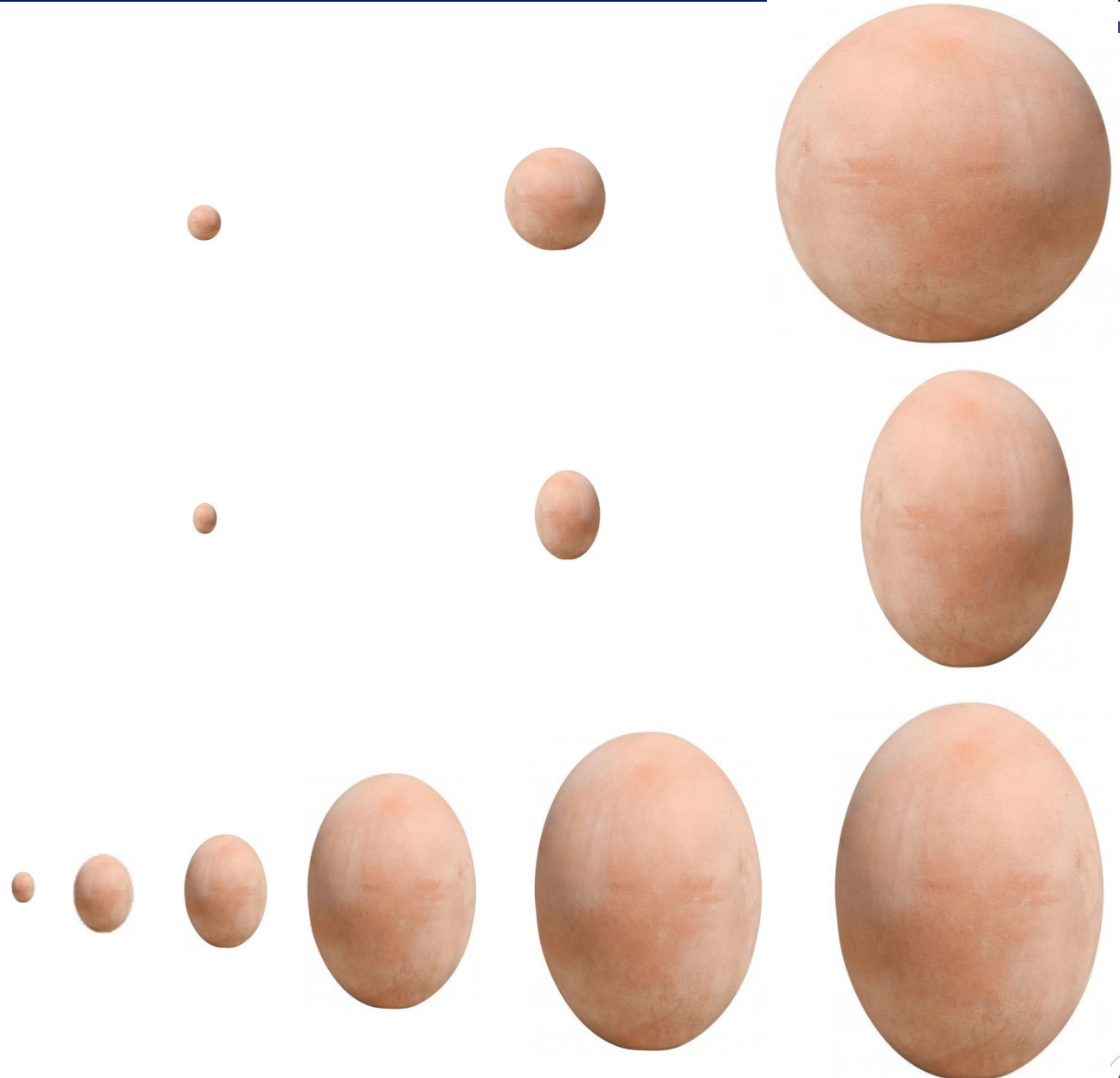
*Lindqvist et al (2014)*



*Alastuey et al (20105)*

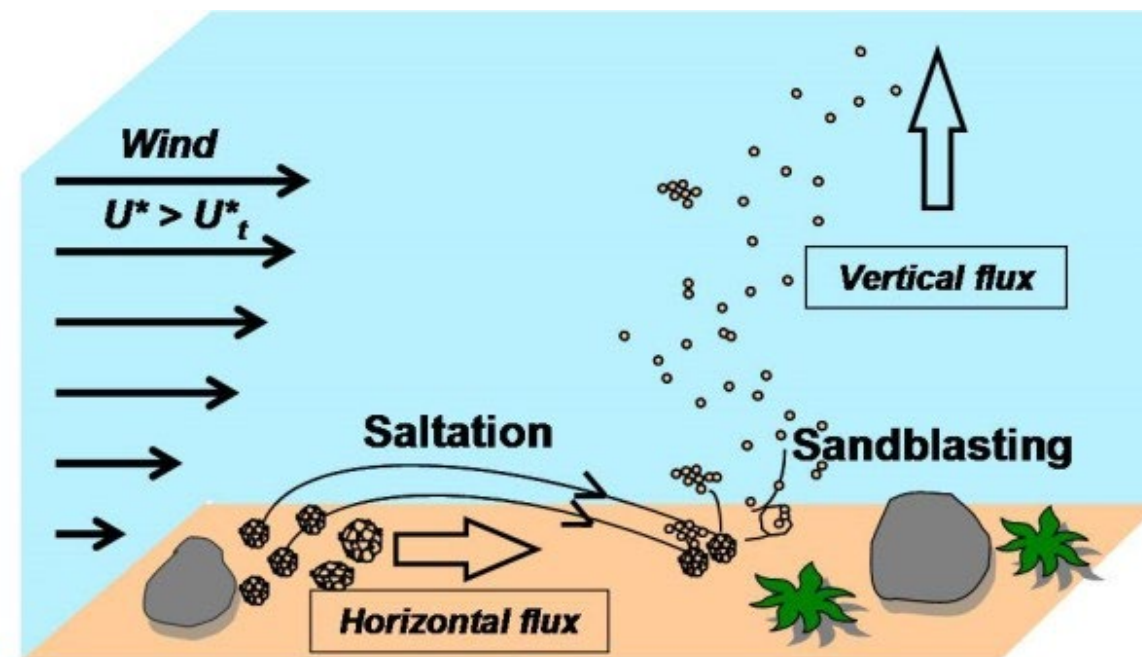


- Desert dust in cycle 48R1 IFS-COMPO : three size bins, assumed spheres
- Desert dust in cycle 49R1 : three size bins, spheroids with aspect ratio 1.6
- Desert dust in future cycle 51R1 : six size bins, spheroids with aspect ratio 1.6



- Dust is emitted in the atmosphere through the saltation and sandblasting processes,
- These processes depend on meteorological (friction velocity) and surface (soil wetness, silt/sand/clay fraction) parameters,
- In CAMS, we use the Marticorena and Bergametti (1995) scheme to represent saltation and sandblasting, associated with a Kok et al (2011) dust size distribution at emissions,
- Several challenges:
  - Uncertainty of some inputs (soil typology in particular)
  - Representation of small scale processes with a 40x40km grid cell
  - Mismatch between the complexity of dust species and its representation as a single species

Observations are key! See talk by S. Vandenbussche this afternoon

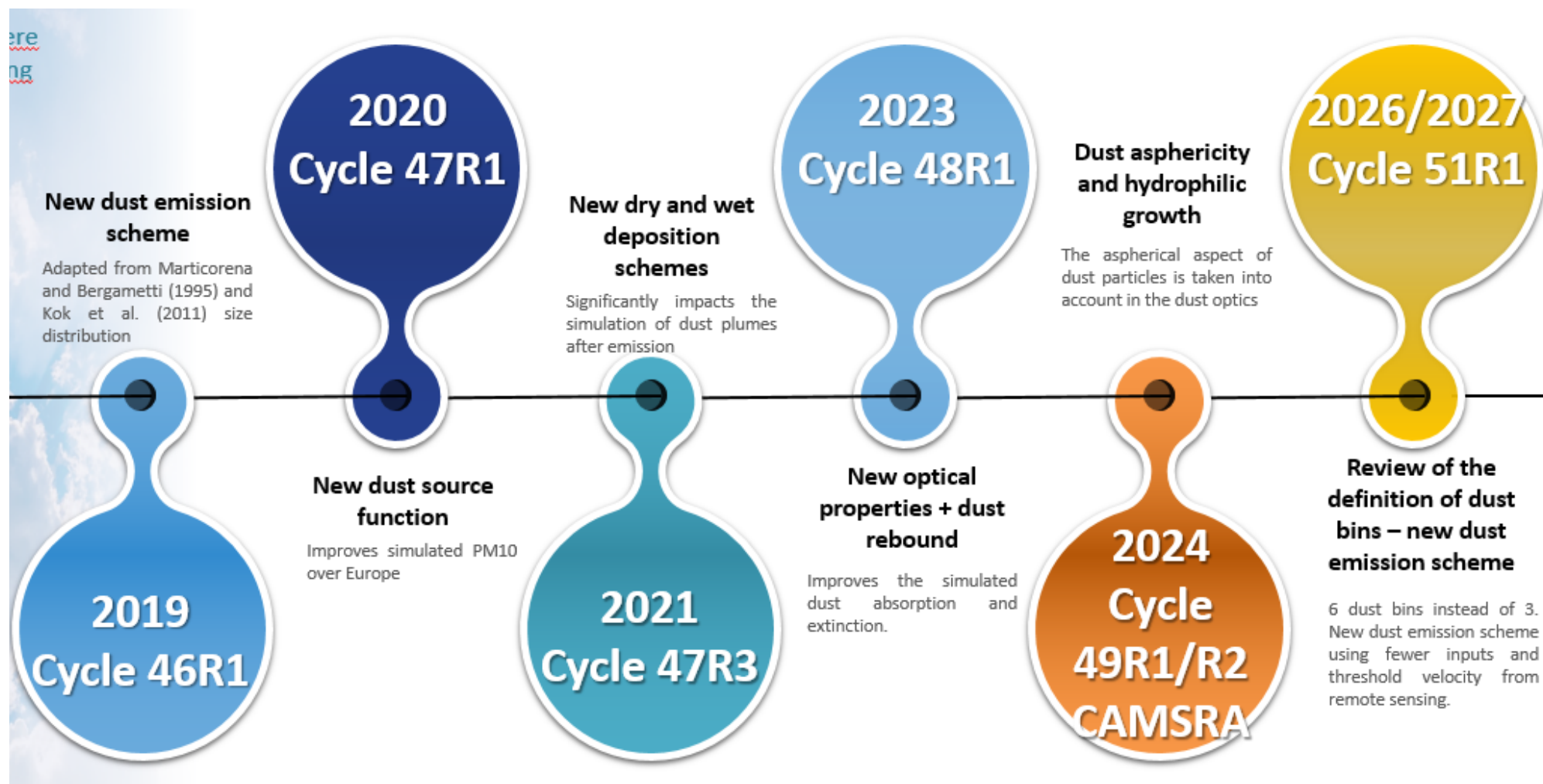


*Schematic from LISA representing the key processes for the production of desert aerosols.*

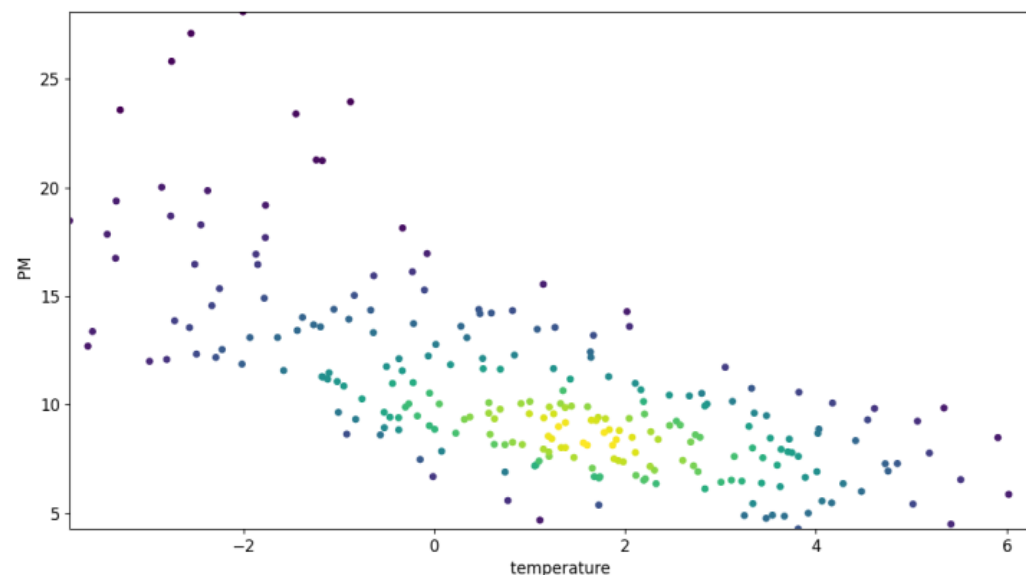




## Desert dust is subject to frequent updates in IFS-COMPO



- Residential emissions are provided by emissions inventories as monthly or yearly averages
- However, they are known to be highly dependent on temperature in wintertime
- This results in some correlation between temperature and PM<sub>2.5</sub> over some regions in wintertime
- Online modulation of residential emissions by temperature could yield some benefits



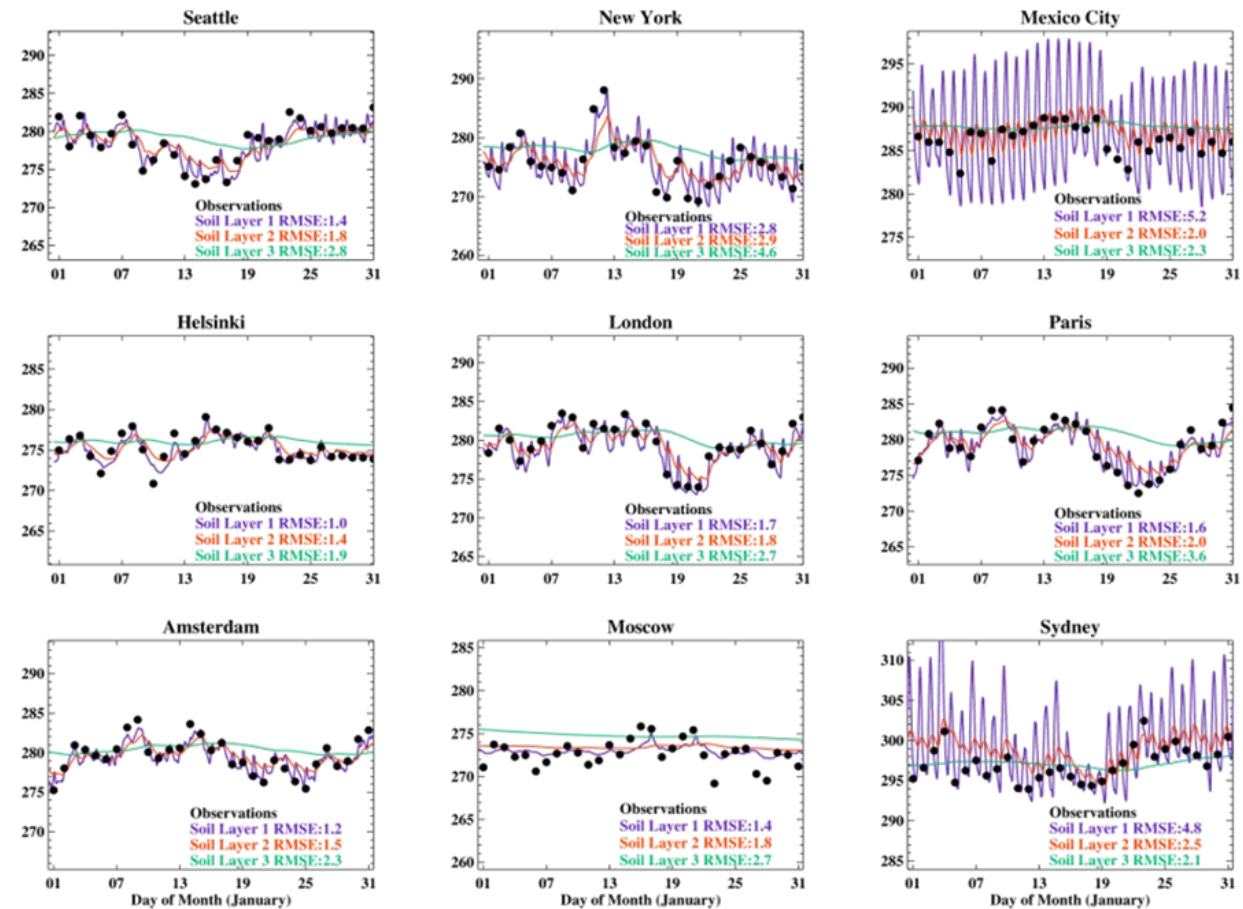
*January 2019, simulated daily lowest model level temperature vs observed PM<sub>2.5</sub> over background urban stations in Europe*



# Online emissions – residential emissions

copernicus.eumetsat.int

- Tests with a « Heat Degree Day approach » - HDD following Guevara et al (2020)
- A difficulty – daily mean 2m temperature is required, but not known in the model
- A solution – use soil temperature (2<sup>nd</sup> level) as a proxy for daily mean 2m temperature



Guevara et al 2020, Copernicus Atmosphere Monitoring Service  
TEMPOral profiles (CAM5-TEMPO): global and European emission  
temporal profile maps for atmospheric chemistry modelling

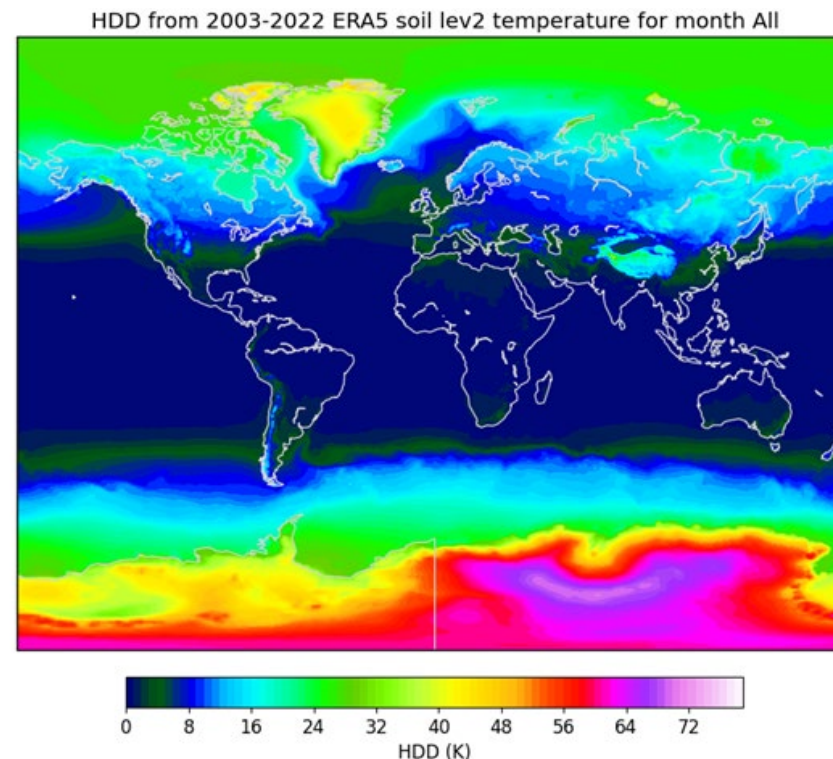
*from Mc Norton et al. (2023): A comparison of hourly IFS modelled soil temperature for different layers with the daily mean observed 2 m temperature for January, 2020.*

HDD depends on two parameters :  $T_b$  – threshold temperature of  $15.5^{\circ}\text{C}$ , and offset  $f=0.2$  based on the European household energy statistics reported by Eurostat

$$HDD_{clim} = \sum_{d=1/1/2003}^{d=31/12/2022} \max(T_b - T_{s2}(d), 1)$$

$$HDD_t = \max(T_b - T_{s2}(t), 1)$$

$$EMIS_{res,t} = EMIS_{res,y} * \frac{HDD_t + f * HDD_{clim}}{(1 + f)HDD_{clim}}$$

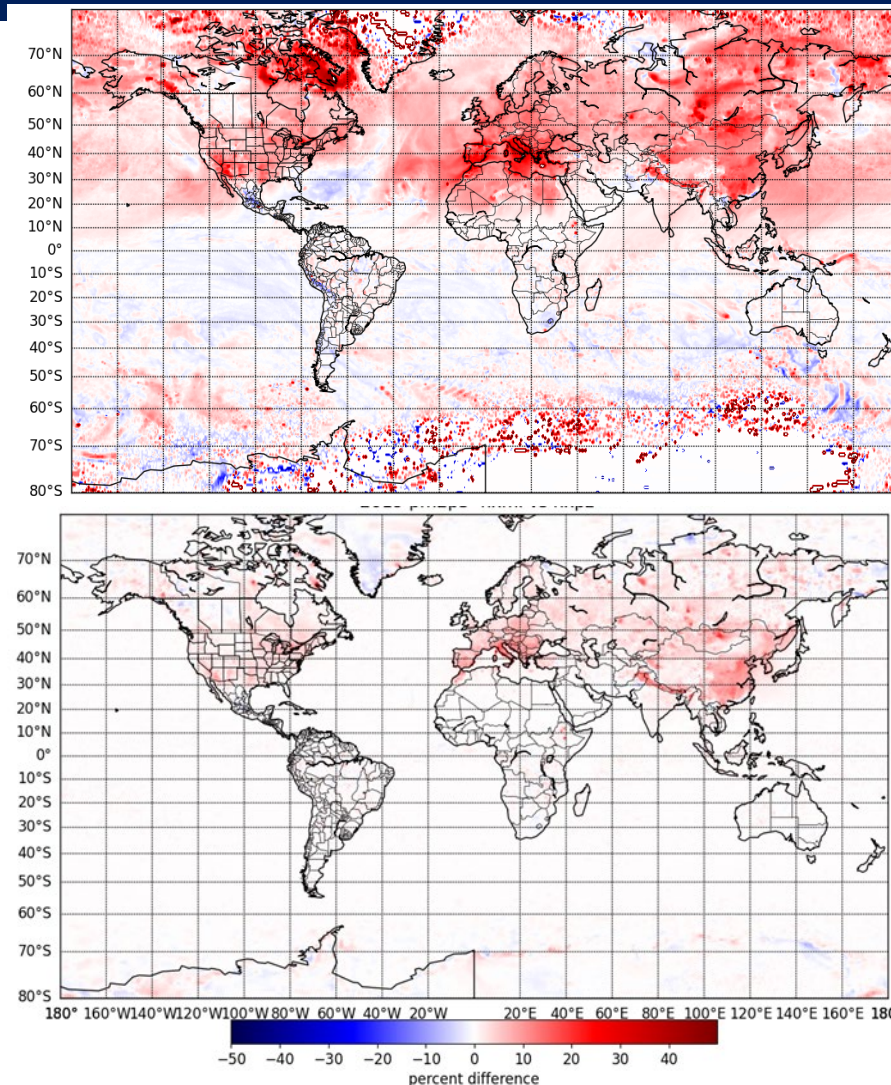


**2003-2022 Climatological HDD from ERA5 computed using soil level 2 temperature**





Significant impact on simulated organic matter at surface and PM2.5

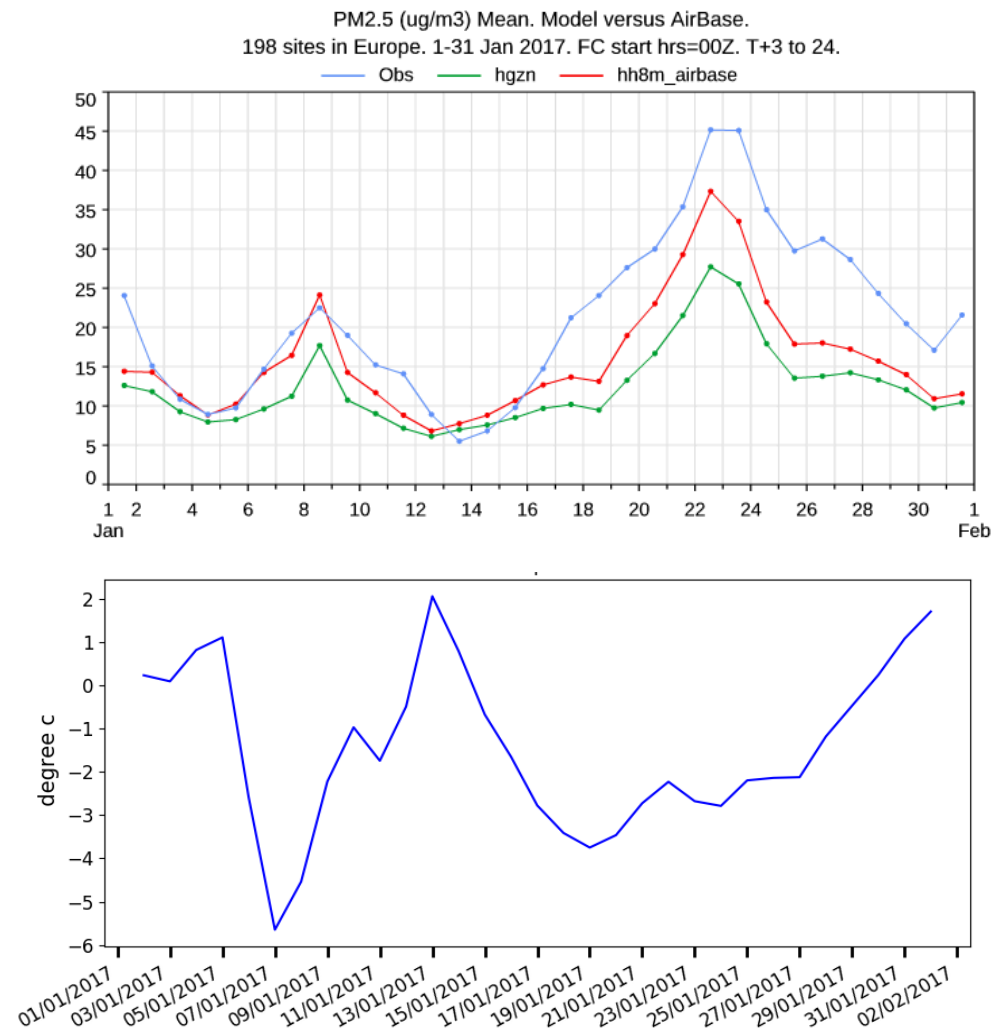


*January 2019, relative difference of a simulation using HDD versus a reference simulation in simulated surface organic matter (top) and PM2.5 (bottom)*





Significant impact on simulated organic matter at surface and PM2.5

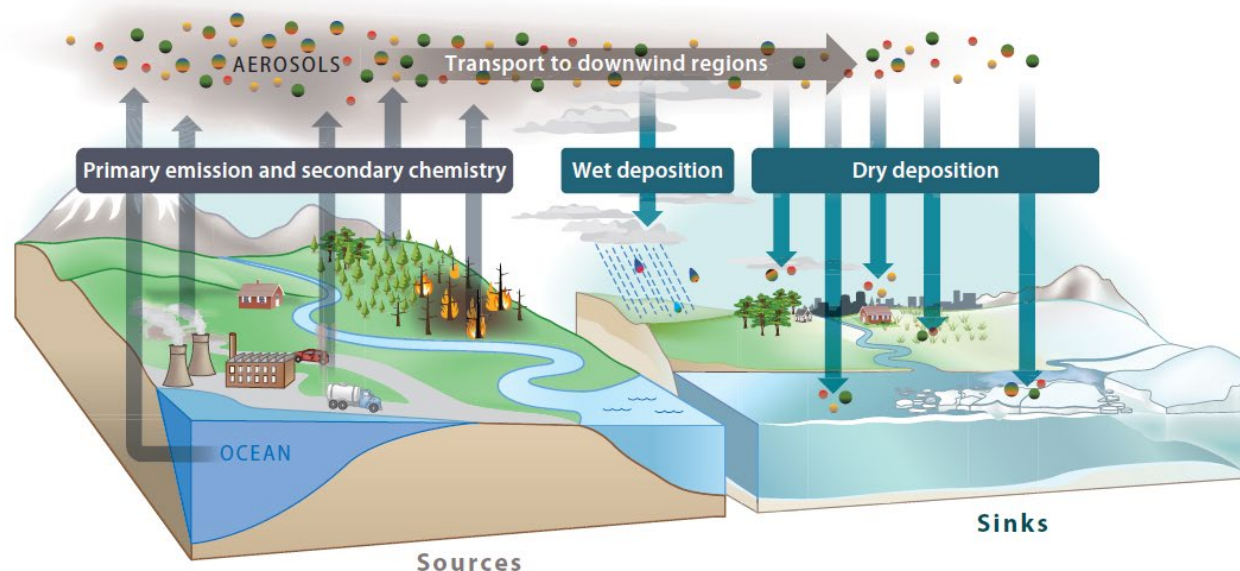


*January 2017, observed and simulated PM2.5 (top), and simulated mean daily 2m temperature over Europe (bottom).*

On average, deposition matches the emissions.

At first order, deposition of particles are modulated by:

- Wind speed, surface type, particle diameter and concentration for dry deposition
- Precipitation rate, particle diameter and concentration over the vertical (burden) for wet deposition
- (Particle diameter)<sup>2</sup>, air density and concentration over the vertical (burden) for sedimentation



*Schematic of emissions and deposition from Farmer et al (2021)*

## Dry deposition

$$F_{DD} = V_{DD} * C$$

## Sedimentation

$$F_S = V_S * C$$

## Wet deposition

$$F_{WD} = F_P * C_{res}$$

$C$  = Concentration

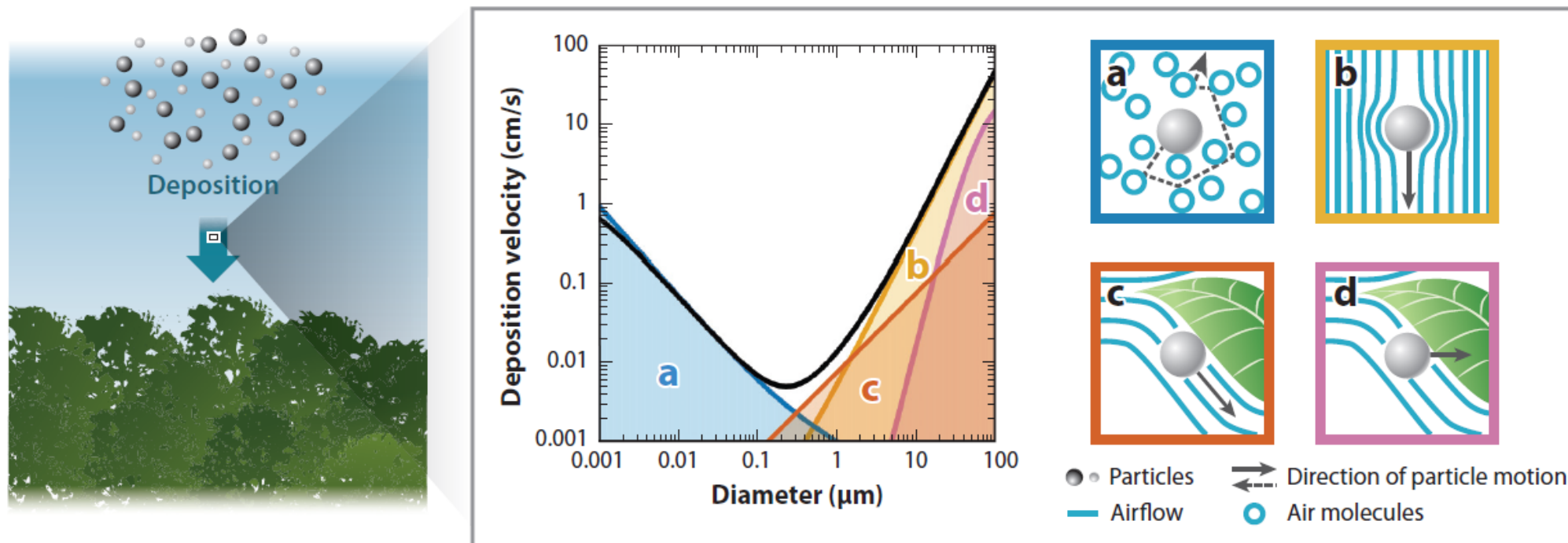
$V_{DD}$  = dry deposition velocity =  
F (Diffusion, surface and canopy )

$V_S$  = sedimentation velocity =  
F ((particle diameter)<sup>2</sup>, meteorology )

$C_{res}$  = scavenging rate =  
F (solubility, transfer to droplet)

$F_p$  precipitation flux

Dry deposition is the combination of several physical processes



**Figure 2**

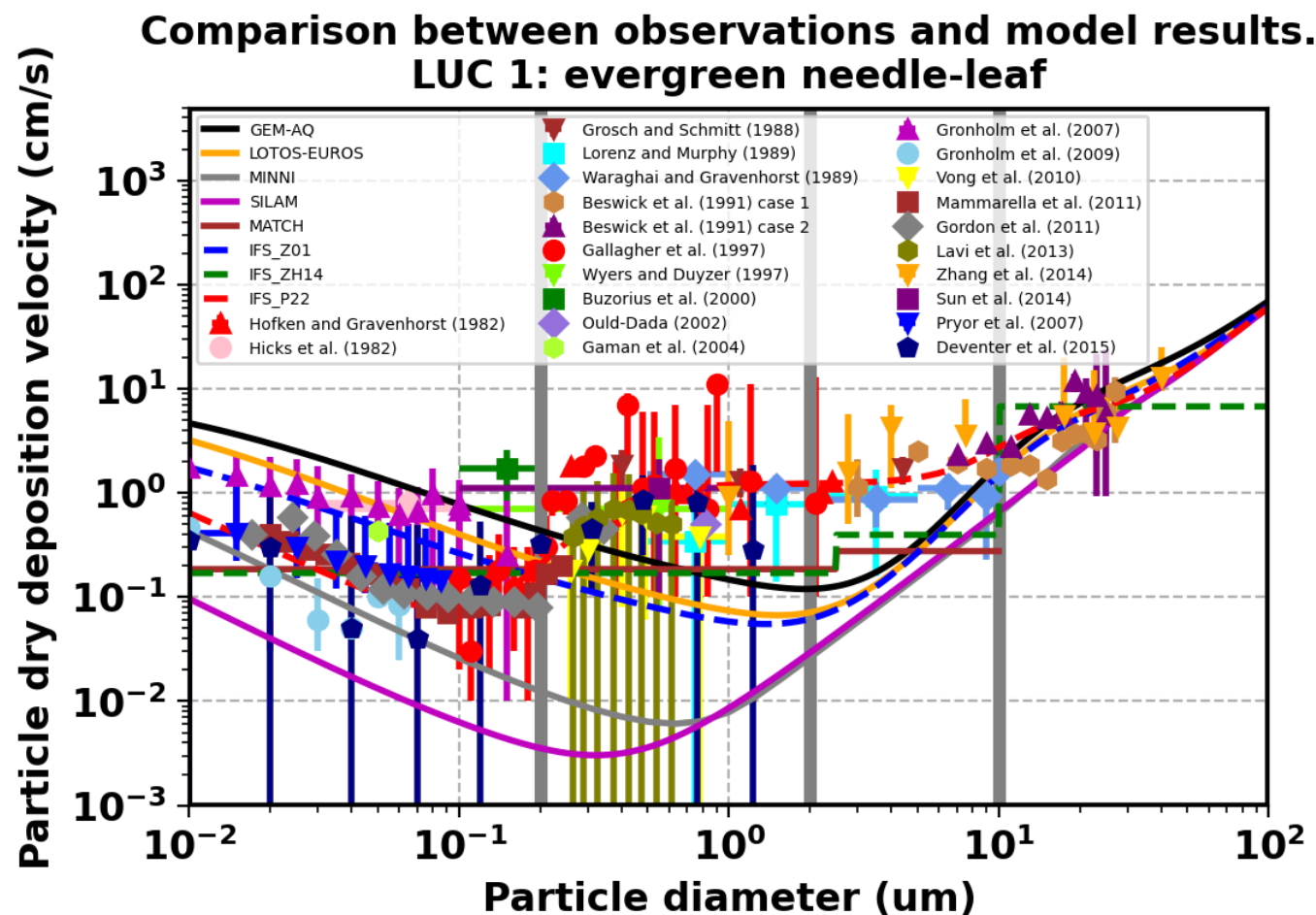
Dry deposition velocities of particles are a function of particle diameter and are driven by a combination of processes, including (a) Brownian diffusion (blue), (b) gravitational settling (yellow), (c) interception (orange), and (d) impaction (purple). The relative importance of these processes varies with particle size and surface type, with the graph providing an example of these processes and the total calculated deposition velocity (thick black line) for a conifer forest. The direction of airflow in panels a–d is indicated by solid blue lines; the direction of particle motion is indicated by gray arrows. In the case of Brownian diffusion, particle movement is random, as indicated by the dashed gray arrow. The size of particles relative to gases is not drawn to scale.

*Farmer et al (2021)*



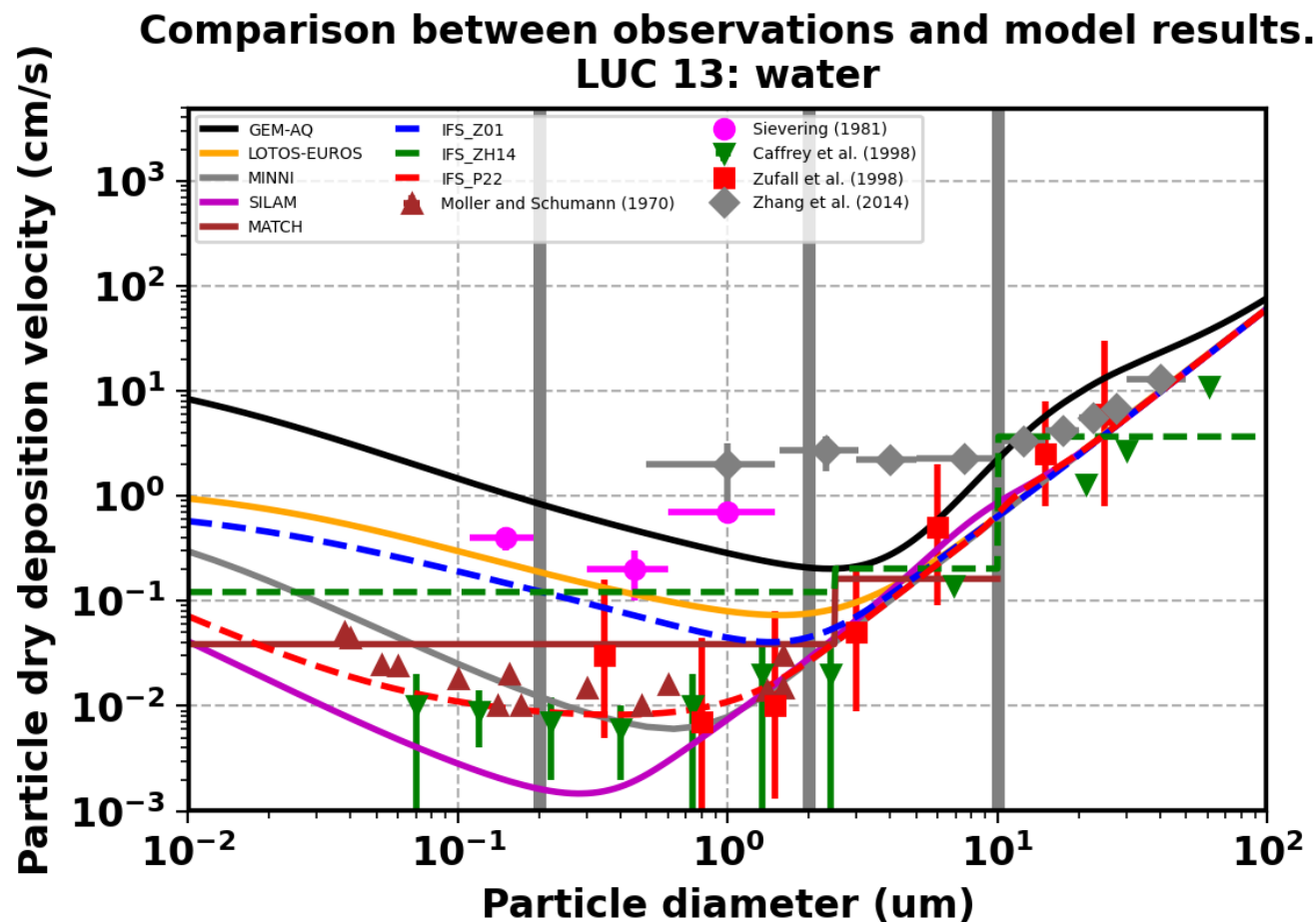
Large variability in how dry deposition is represented between models

Intercomparison of dry deposition carried out in the CAMAERA HE project





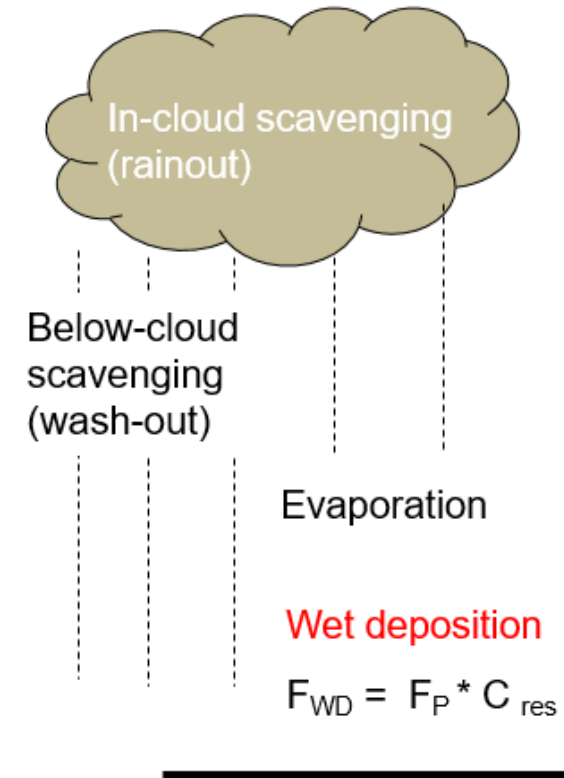
Large variability in how dry deposition is represented between models  
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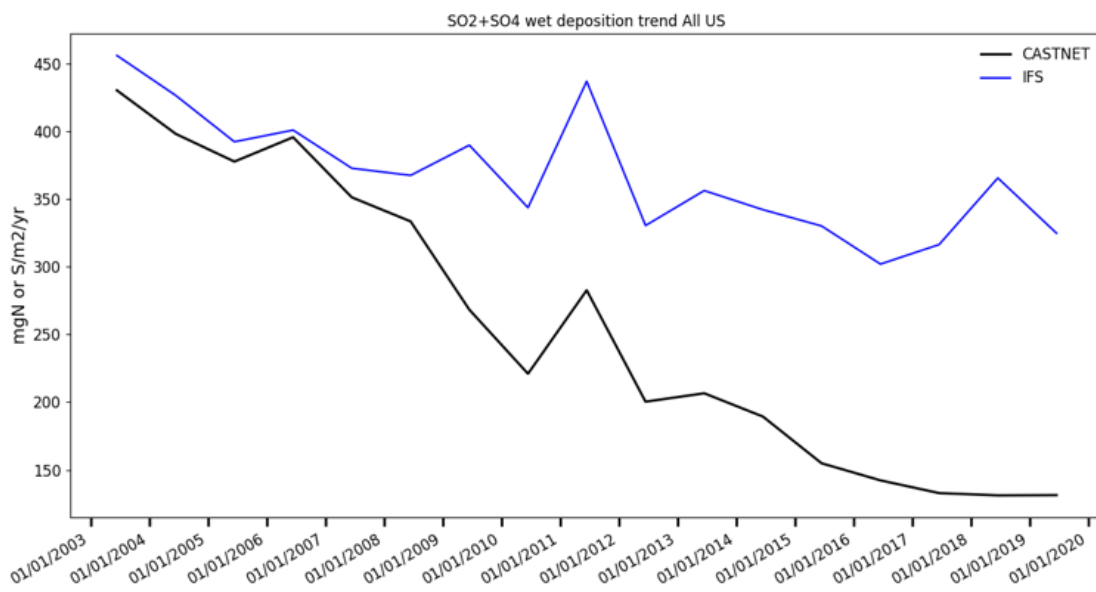
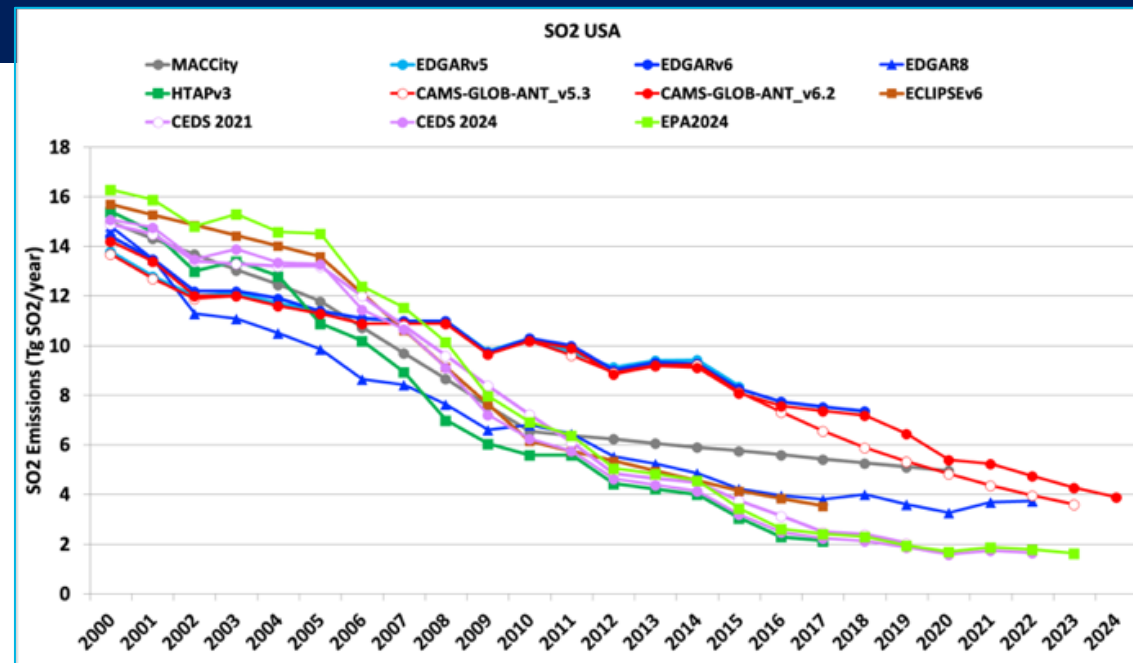
- Wet deposition is also the combination of several physical processes
- Wet deposition trends of nitrogen and sulphur are monitored and the subject of many papers
- Wet deposition can be used to assess emissions also, as done in long IFS-COMPO simulations to prepare for next reanalysis





# Wet deposition

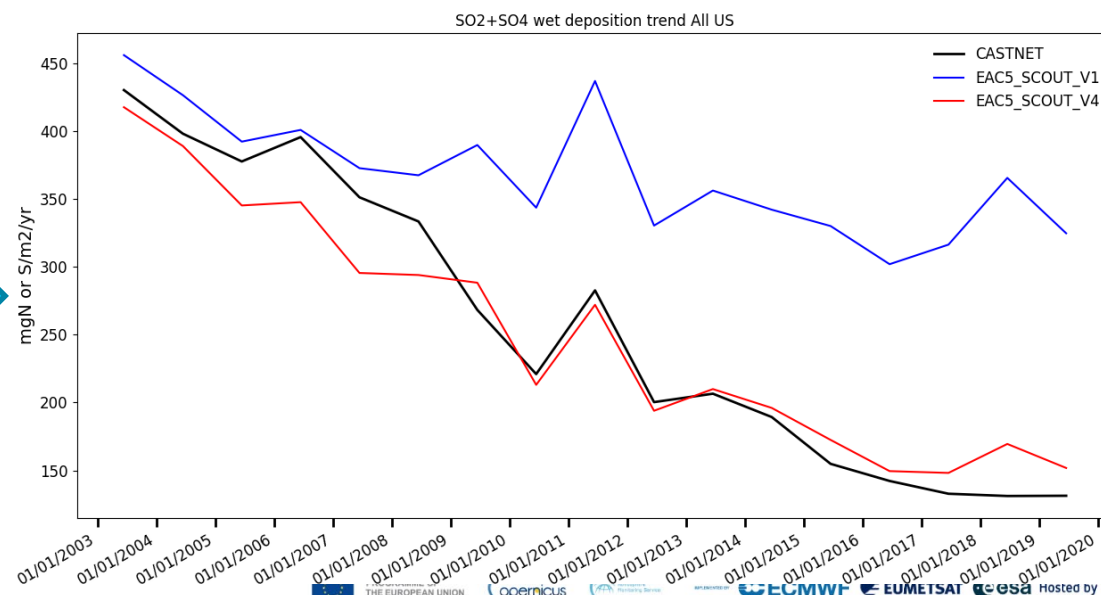
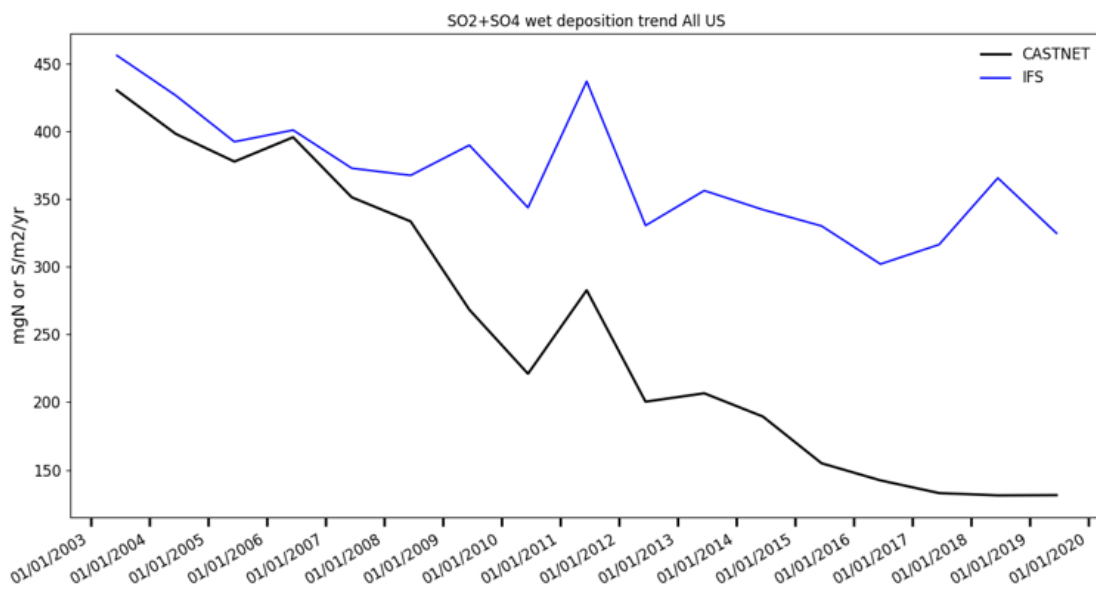
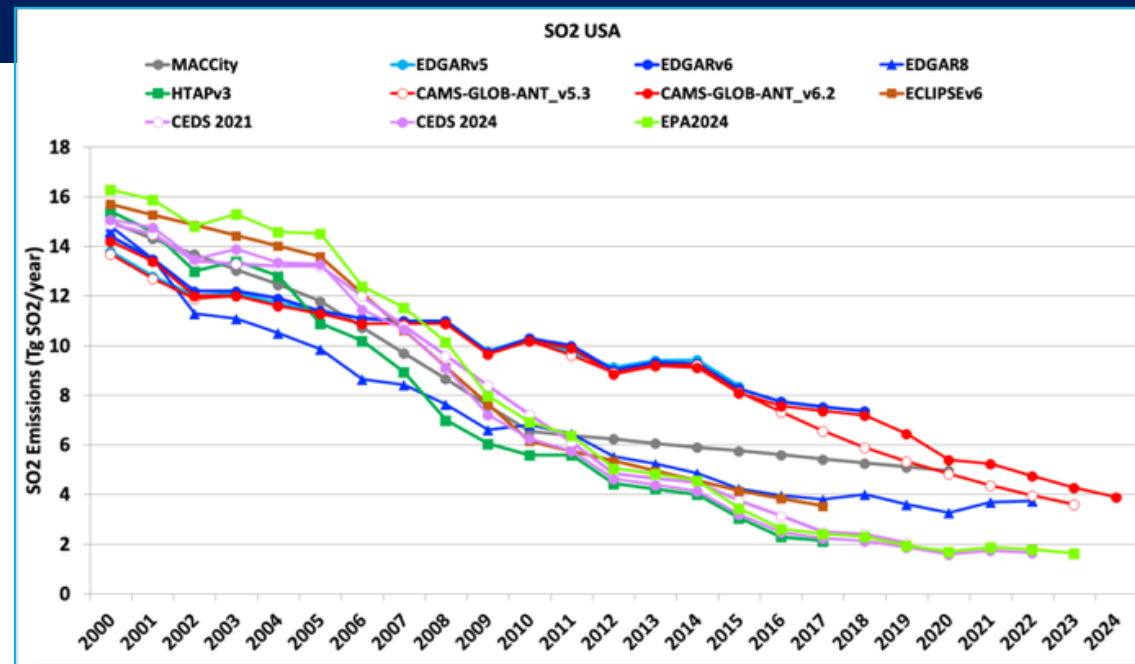
- Wet deposition can be used to assess emissions also, as done in long IFS-COMPO simulations to prepare for next reanalysis
- Simulation first done with CAMS\_GLOB\_ANT emissions
- Then, use of scaling factors over US and China; over US, use of EPA2024 emissions as a reference





# Wet deposition

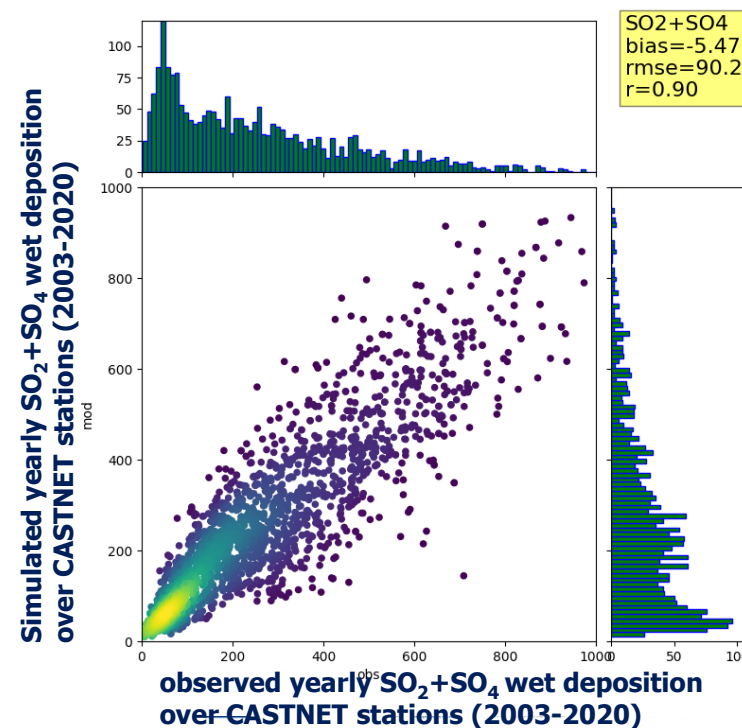
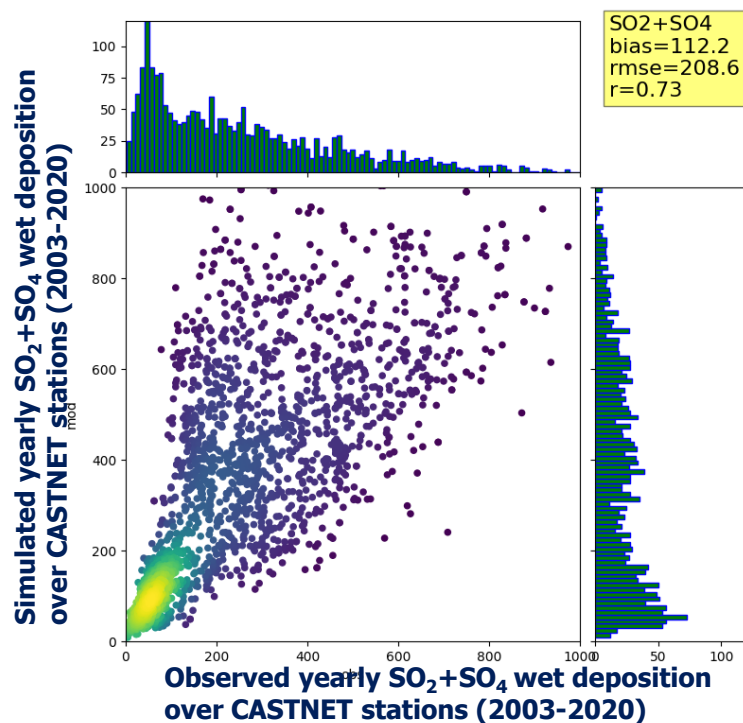
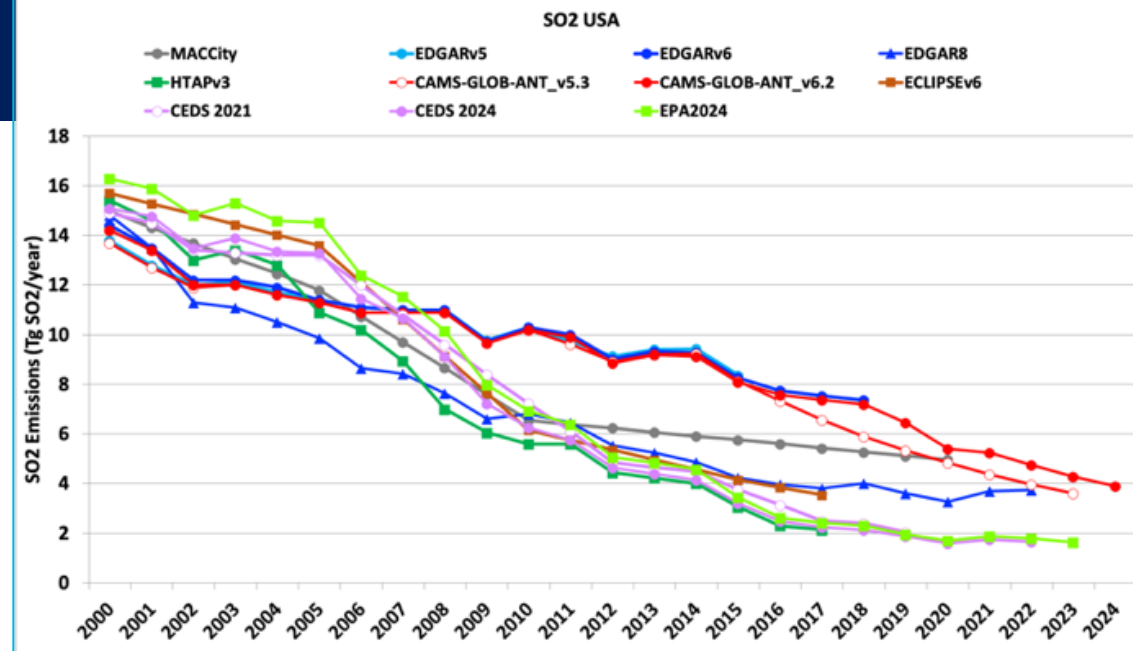
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# Wet deposition

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- AI/ML more and more used in AC modeling, in particular to replace Mie code:
  - NeuralMie (Geiss et al 2025)
  - Mie AI (Kumar et al 2024)
- Two ongoing activities to implement ML in IFS-COMPO
- Replace selected processes by ML (HE project CAMAERA). Focus on:
  - Whitecap fraction and sea-salt aerosol emissions
  - Desert dust emissions (just started)
- Replace the whole model + DA by ML (ECMWF – Paula Harder)
  - A first prototype of AIFS-COMPO

**More ML application in talk by O Hasekamp**



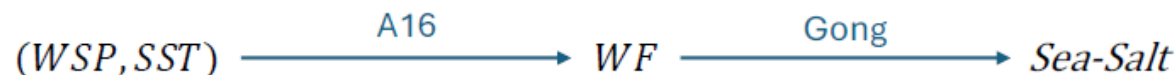
- Replace selected processes by ML (HE project CAMAERA). Focus on:
  - Whitecap fraction and sea-salt aerosol emissions

Current status of sea-salt aerosol emissions in cycle 49R1 IFS-COMPO:

- The whitecap fraction (WF) is estimated by the **Albert** et al. (2016) parameterization:

$$WF = a(SST)[WSP + b(SST)]^2$$

- Sea-salt aerosol emissions are derived using the **Gong** (2003) assumed size distribution



**Our objective :** Estimation of whitecap fraction and sea-salt emissions in IFS-COMPO with deep neural networks (DNN) by :

1. Training offline a DNN model to estimate whitecap fraction
2. Integrating this DNN model into IFS-COMPO

- Replace selected processes by ML (HE project CAMAERA). Focus on:
  - Whitecap fraction and sea-salt aerosol emissions

## Dataset description

**Ground truth** : Whitecap fraction (WF) at 10.7 and 37 GHz derived from remote sensing (Anguelova et al 2019)

**Time range** : 2 years of data with an hourly resolution

**Predictors** : 8 predictors collected

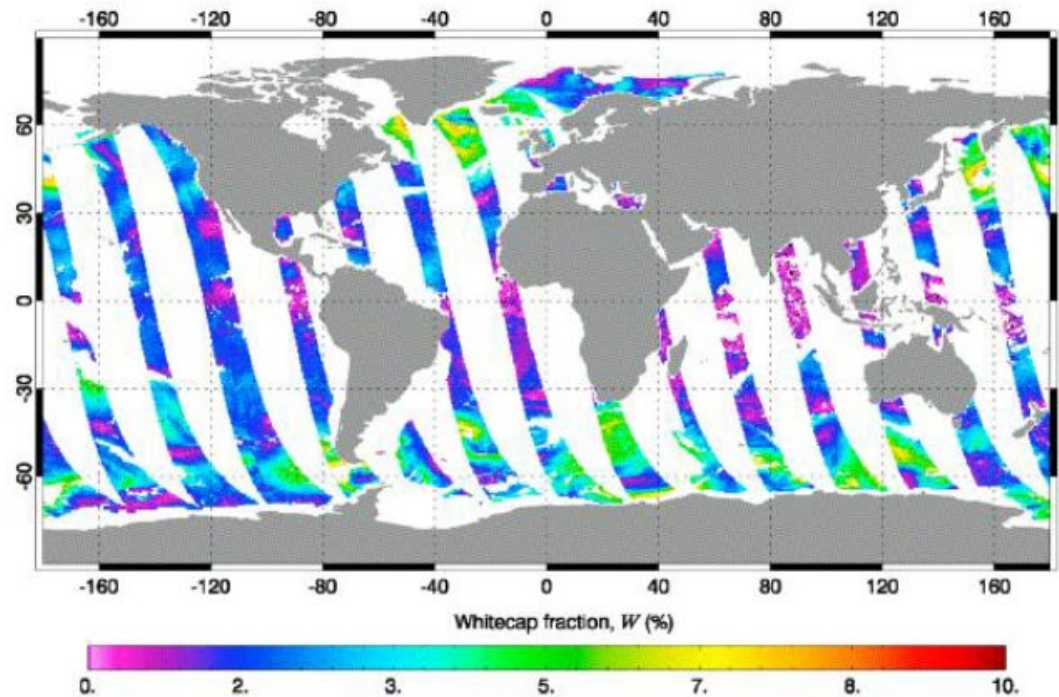
From ERA5 :

- Wind Speed
- Wind Direction
- Sea Surface Temperature
- Mean Wave Period
- Significant Wave Height

From HINDCAST :

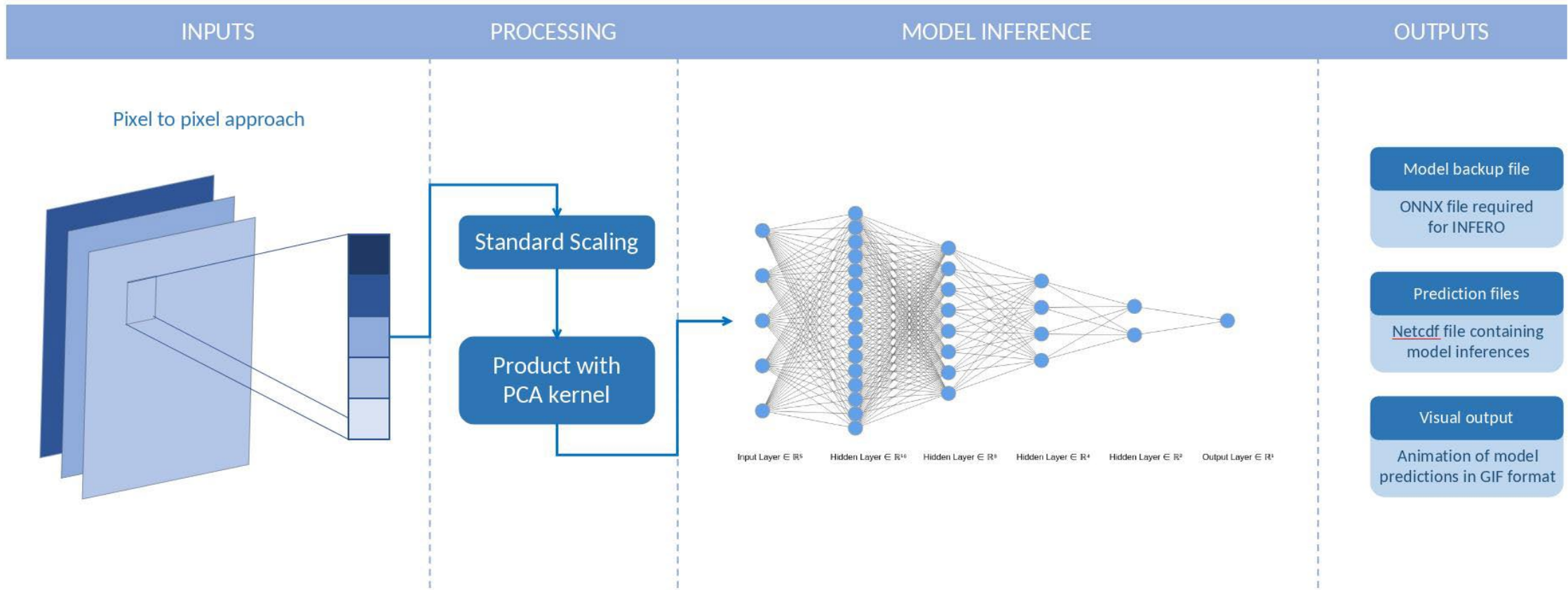
- Total Wave Height
- Significant Wave Height
- Dissipation of turbulent energy from breaking waves

**Dimension** : around 200 million pixels



*Example of daily map of whitecap fraction from Windsat acquisition [Anguelova et al.]*

- Replace selected processes by ML (HE project CAMAERA). Focus on:
  - Whitecap fraction and sea-salt aerosol emissions



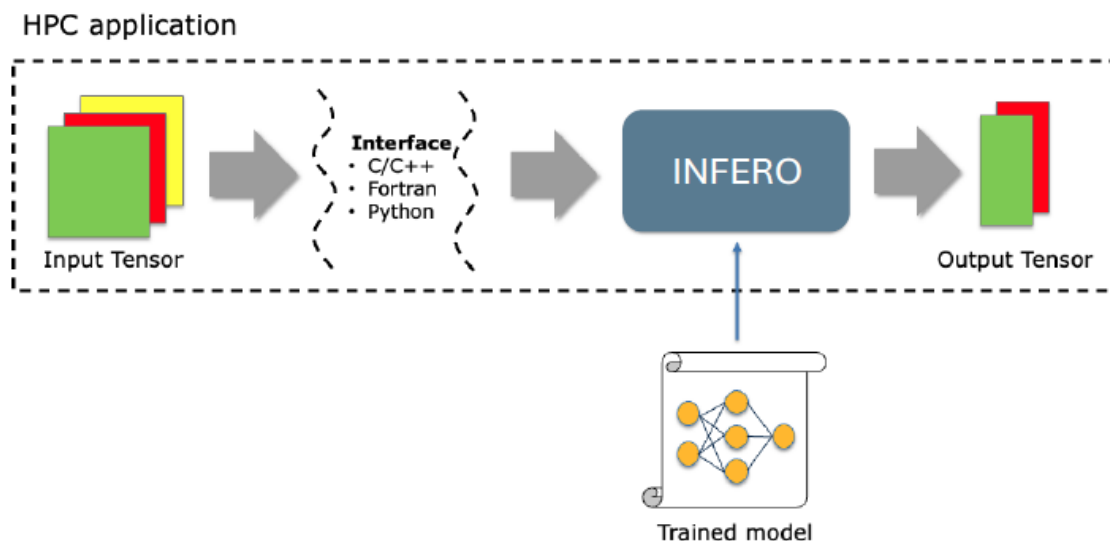
- Replace selected processes by ML (HE project CAMAERA). Focus on:
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Incorporation of an **exported version (ONNX format)** of the DNN to compute whitecap fraction and sea-salt aerosol emissions online in IFS-COMPO.

The **INFERO** library has been integrated into IFS-COMPO to interface with Deep Learning models

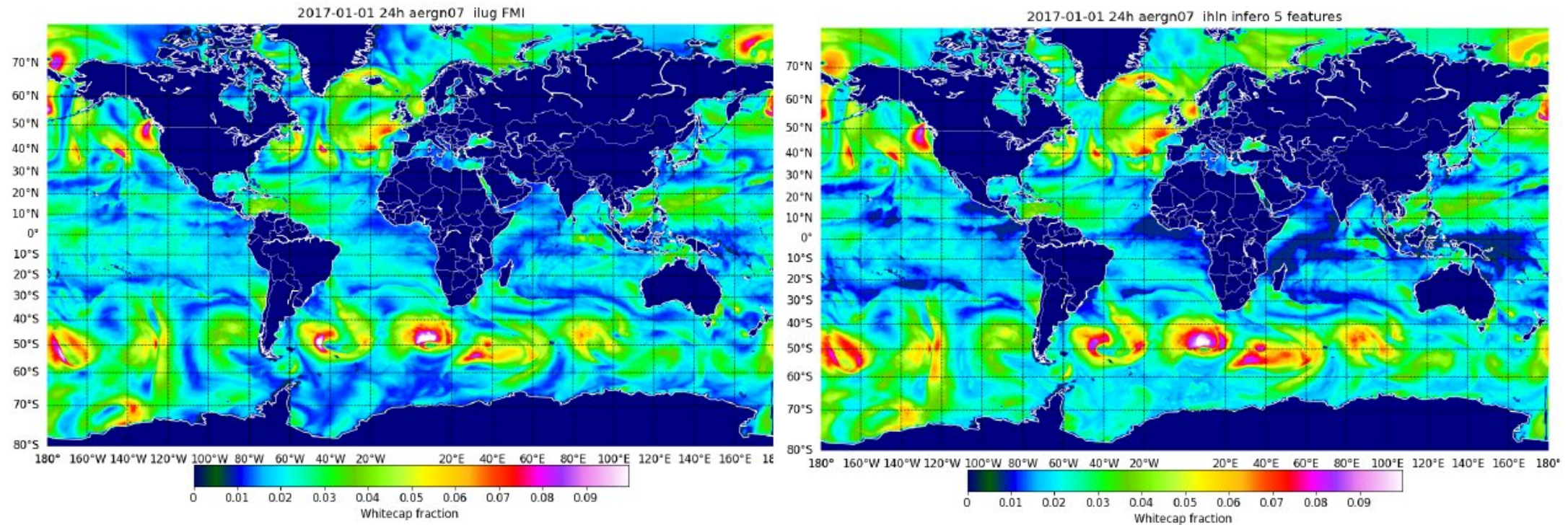
*Interest* : runs a learning model in ONNX format from a Fortran script

*Representation of the incorporation of our model into IFS*





- Replace selected processes by ML (HE project CAMAERA). Focus on:
  - Whitecap fraction and sea-salt aerosol emissions



*Simulated whitecap fraction by IFS-COMPO on 1/1/2017 0UTC, using the newly developed FMI scheme (left), and with deep learning model (using 5 predictors) enabled through the INFERO library (right).*





# Outlook : AI/ML for atmospheric composition

AIFS - ECMWF'S DATA-DRIVEN FORECASTING SYSTEM

A PREPRINT

Simon Lang\* Mihai Alexe\* Matthew Chantry Jesper Dramsch Florian Pinault Baudouin Raoult

Mariana C. A. Clare Christian Lessig Michael Maier-Gerber Linus Magnusson

Zied Ben Bouallègue Ana Prieto Nemesio Peter D. Dueben Andrew Brown Florian Pappenberger

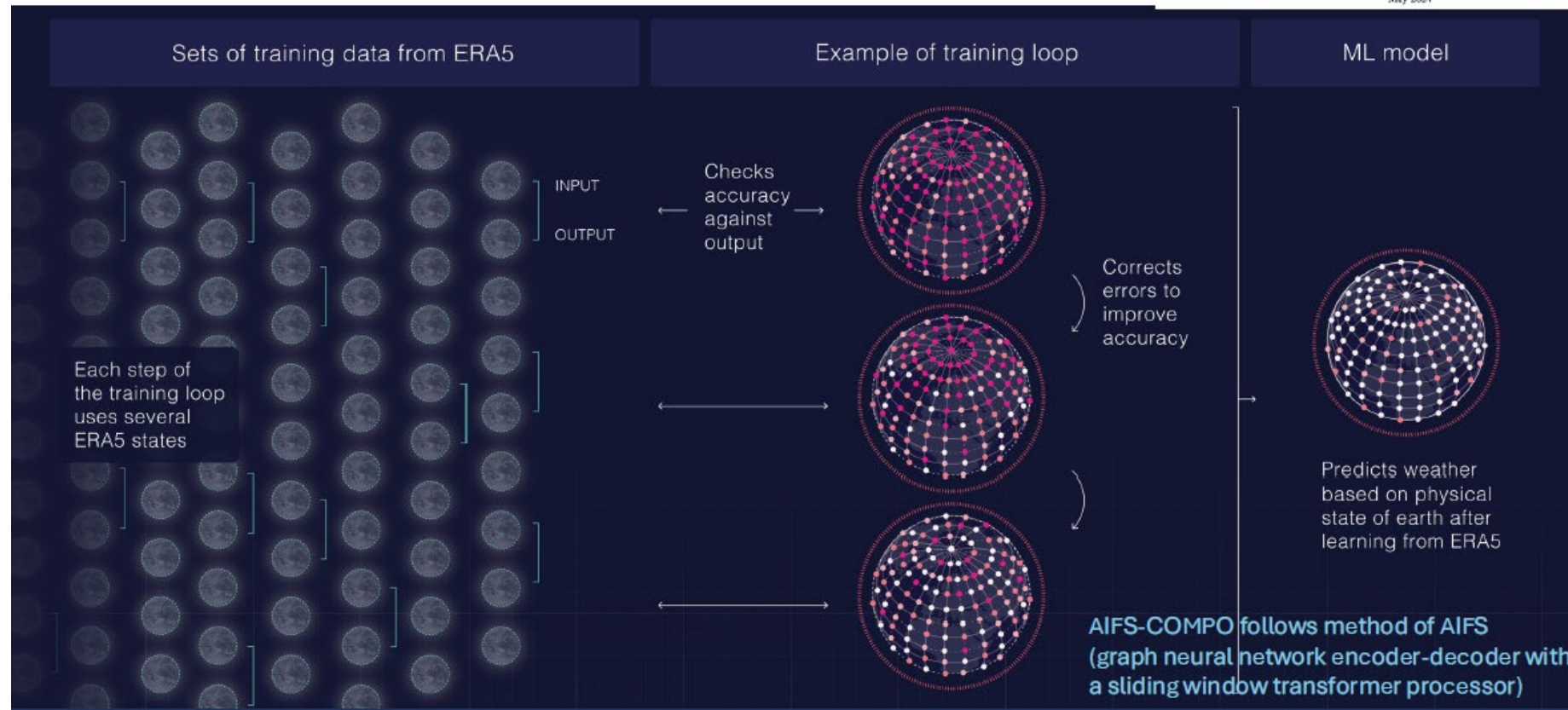
Florence Rabier

May 2024

Replace the whole model + DA by ML (ECMWF – Paula Harder)

- A first prototype of AIFS-COMPO

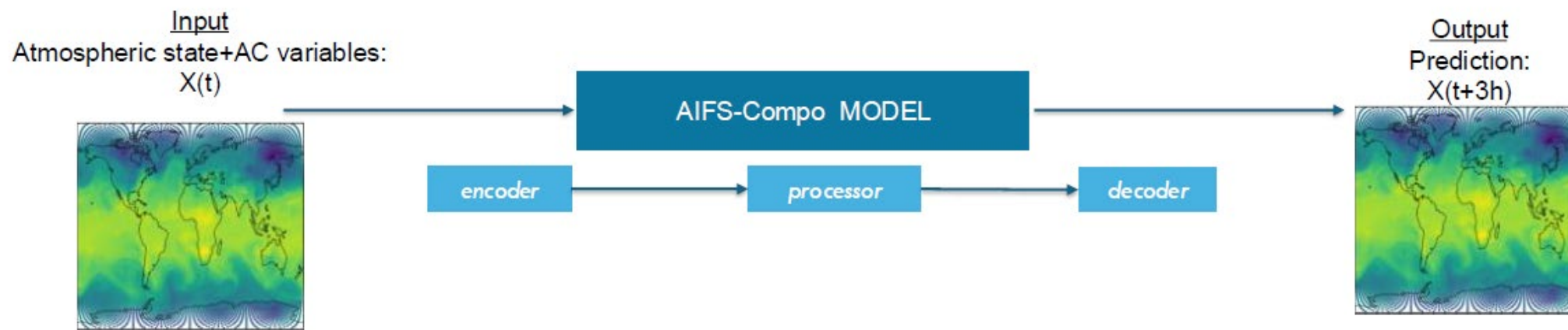
AIFS-COMPO follows method of AIFS



Replace the whole model + DA by ML (ECMWF – Paula Harder)

- A first prototype of AIFS-COMPO

From AIFS to AIFS-COMPO



## Variables:

- Atmospheric composition variables
  - AOD, PMs, Reactive gases
  - Mixing ratio at pressure levels
- Upper-air variables at 13 pressure levels (t,v,u,w,z)
- Surface variables (temperature, winds, pressure, radiation)
- Static geographical features, location and time information as input forcing

## Training Scheme:

1. Train on EAC4
2. Fine-tune on operational analysis/forecast and lead times up to 36h

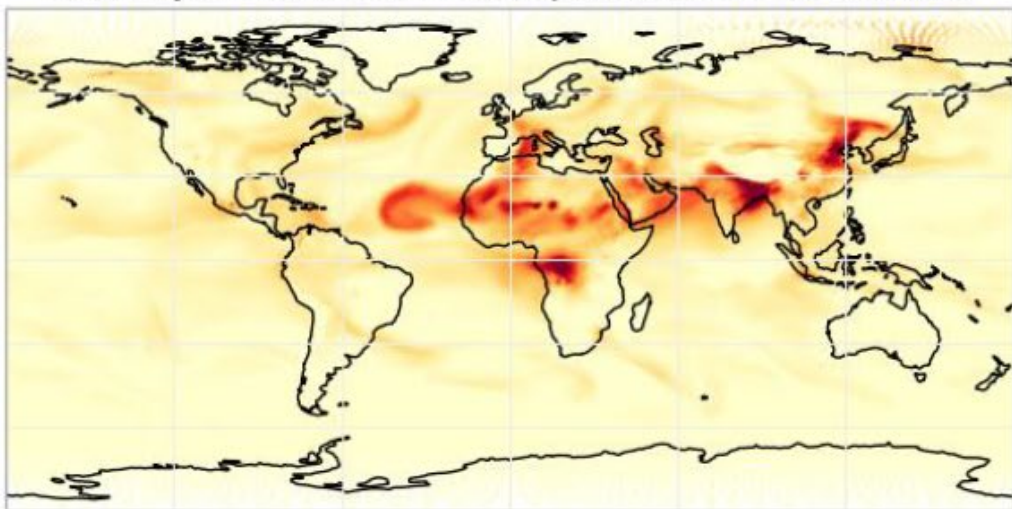
Replace the whole model + DA by ML (ECMWF – Paula Harder)

- A first prototype of AIFS-COMPO

Results: AOD

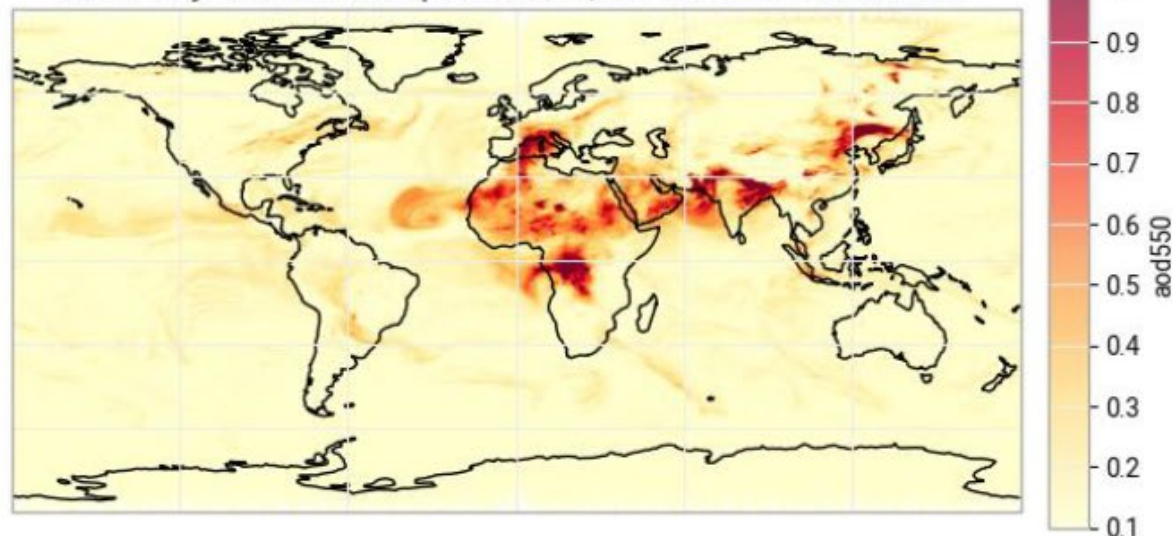
## AIFS-Compo

AOD day 3 forecast AIFS-Compo, 20-06-2024T00:00:00



## IFS-Compo

AOD day 3 forecast operational, 20-06-2024T00:00:00



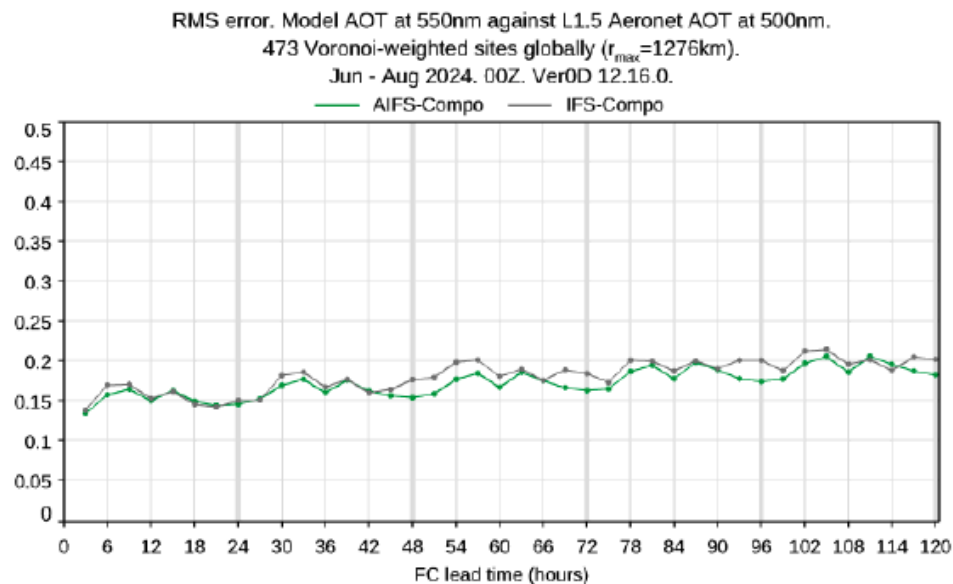


Replace the whole model + DA by ML (ECMWF – Paula Harder)

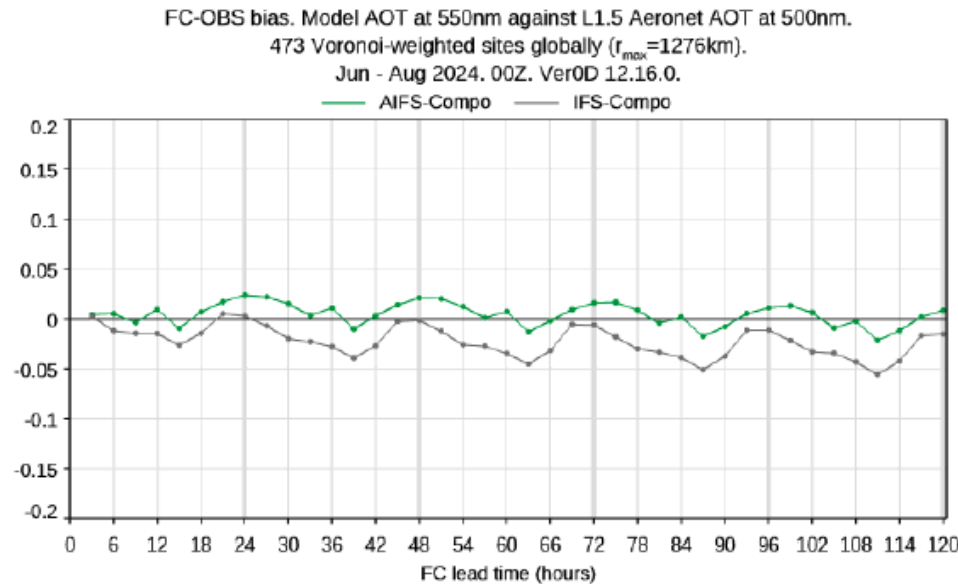
- A first prototype of AIFS-COMPO

Results: AOD

## RMSE against observations



## Bias against observations



- Improve emissions
  - Better knowledge of emission processes (EF, activity data, on-line calculation)
  - Use concentration observations to constrain emissions in models
- Increase model complexity
  - Better modelling of chemistry, aerosols, deposition and transport
  - Grid-box resolution
  - More coupling of processes (NWP-AC)
- Build Machine learning based models:
  - Replace components ACM with ML – for example chemistry schemes
  - Emulate ACM results directly – e.g. much faster forecasting
- Combine observations with modelling – data assimilation (**talk by Mel Ades**)
- Use new information from remote sensing for evaluation, in particular Earthcare and S4/S5 data (**talks by R. Lindsrat and A. Hoffmann**)





**Thank you!**  
Questions are welcome.