

Use of satellite data for Environmental Monitoring

Angela Benedetti

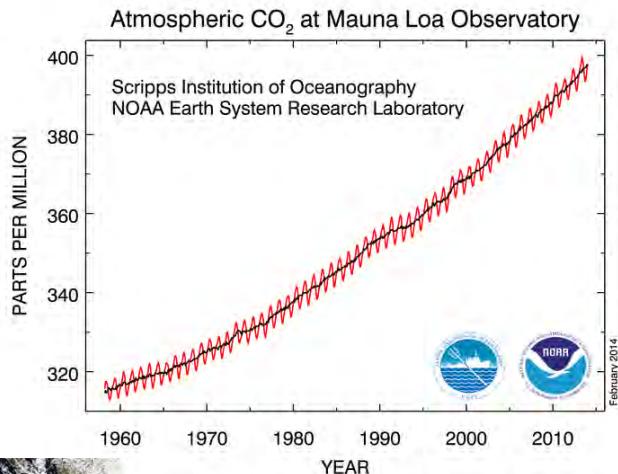
Based on a lecture by: **Antje Inness**

Contributions from: **Richard Engelen, Johannes
Flemming, Sebastien Massart**

Outline

- 1. Introduction**
- 2. Challenges for atmospheric composition DA**
- 3. Observations of atmospheric composition**
- 4. Atmospheric composition assimilation**
- 5. Concluding remarks**

Atmospheric composition



08:50 Larnaca	AA6621	Cancelled
08:50 Berlin	BA662	Cancelled
08:50 Glasgow	AA6594	Cancelled
08:50 Palma Mallorca	GF5222	Cancelled
08:55 Prague	LH6639	Go to Gate
08:55 Moscow	CX7121	Cancelled
08:55 Nice	BA872	Cancelled
08:55 Manchester	BD193	Go to Depart
08:55 Dublin	GF5280	Cancelled



Scientific Motivation

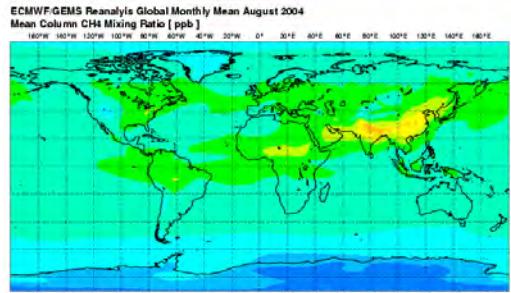
- Environmental and health concern (29,000 premature deaths due to pollution in UK per year)
- Important to provide air quality forecasts
- Expertise in data assimilation and atmospheric modelling
- Not fundamentally different from meteorological DA but several new challenges
- Interaction of atmospheric composition (AC) and NWP
 - Feedback on dynamics via radiation scheme
 - Precipitation and clouds
 - Satellite data observations influenced by aerosols (and trace gases)
 - Hydrocarbon (Methane) oxidation is water vapour source
 - Assimilation of AC data can have impact on wind field

Composition-IFS (C-IFS)

- Over the last decade IFS has been extended with modules for atmospheric composition (aerosols, reactive gases, greenhouse gases)
- GEMS -> MACC -> CAMS ([Copernicus Atmosphere Monitoring Service](#)) projects
- At first a “Coupled System”, now composition fully integrated into IFS
- Data assimilation of AC data to provide best possible IC for subsequent forecasts
- AC benefits from online integration and high temporal availability of meteorological fields
- C-IFS provides daily analyses and 5-day forecasts of atmospheric composition in NRT

CAMS Service Provision

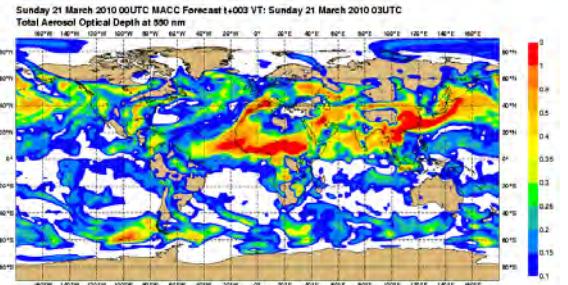
Retrospective



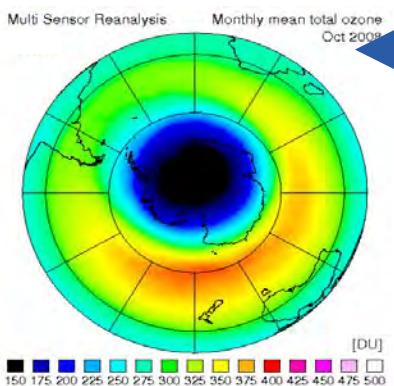
Reanalysis
2003 onwards

Aerosols

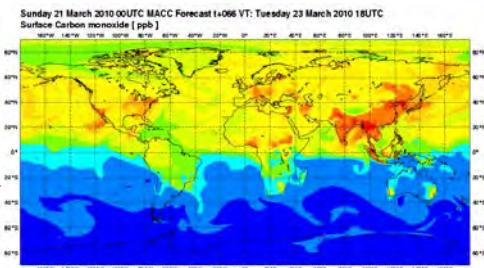
Daily (NRT)



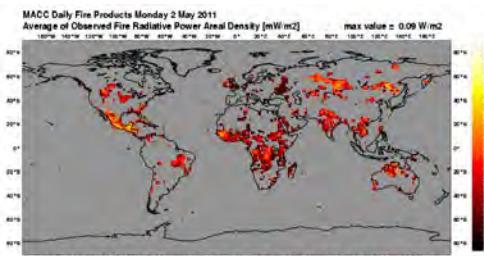
Ozone records



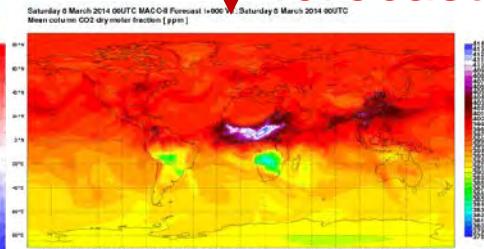
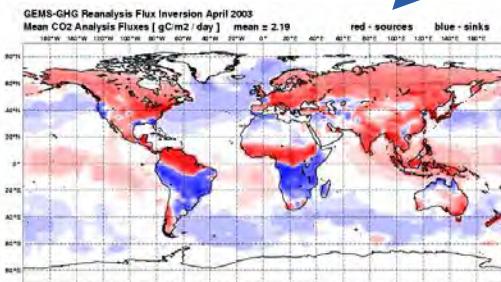
Global Pollution



Fires

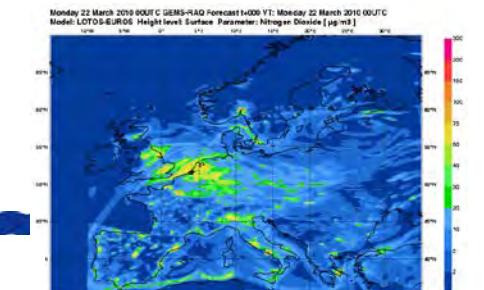


Flux Inversions

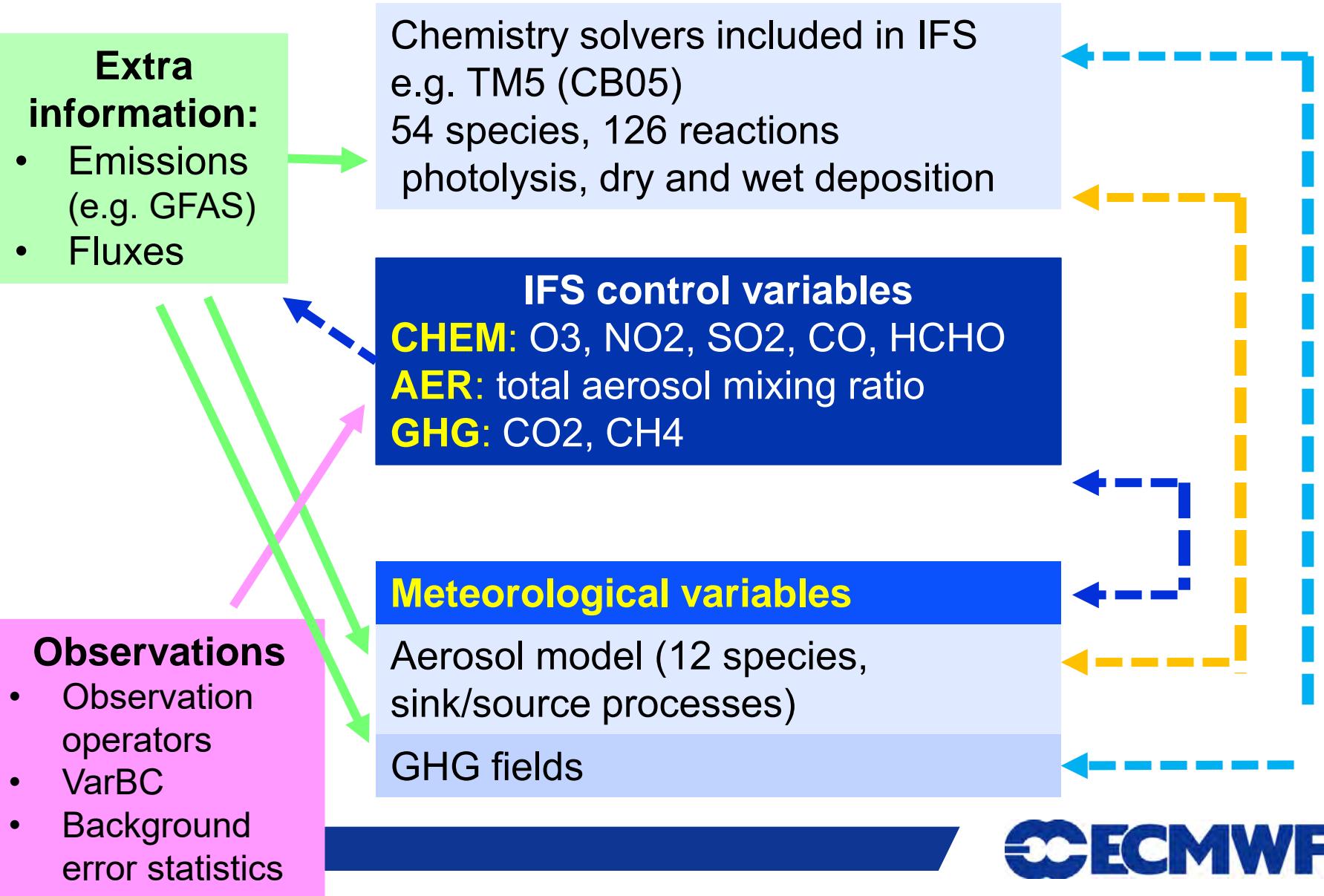


GHG forecast

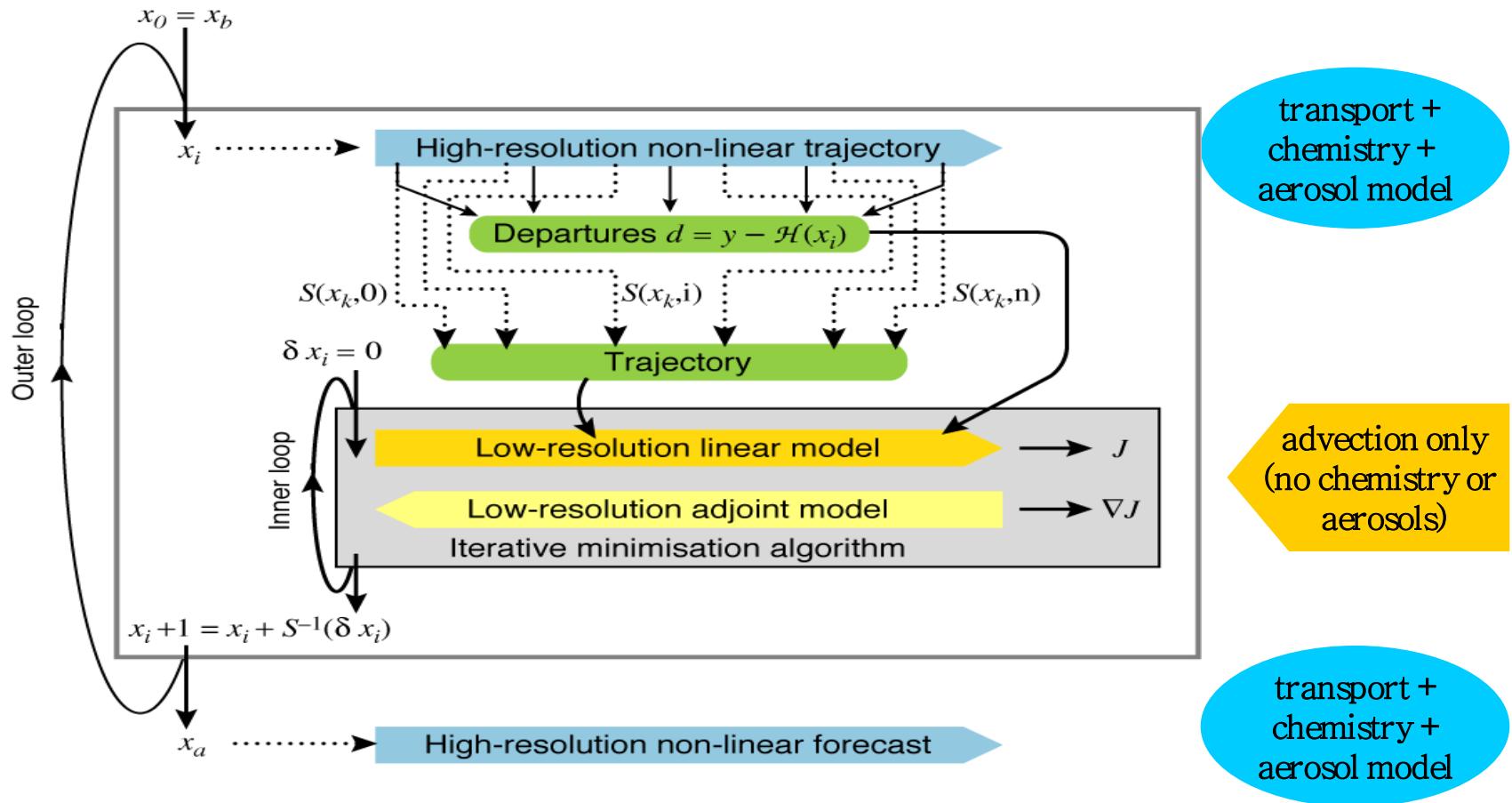
Air quality



CAMS data assimilation system



ECMWF CAMS 4D-VAR Data Assimilation Scheme: Assimilation of AC

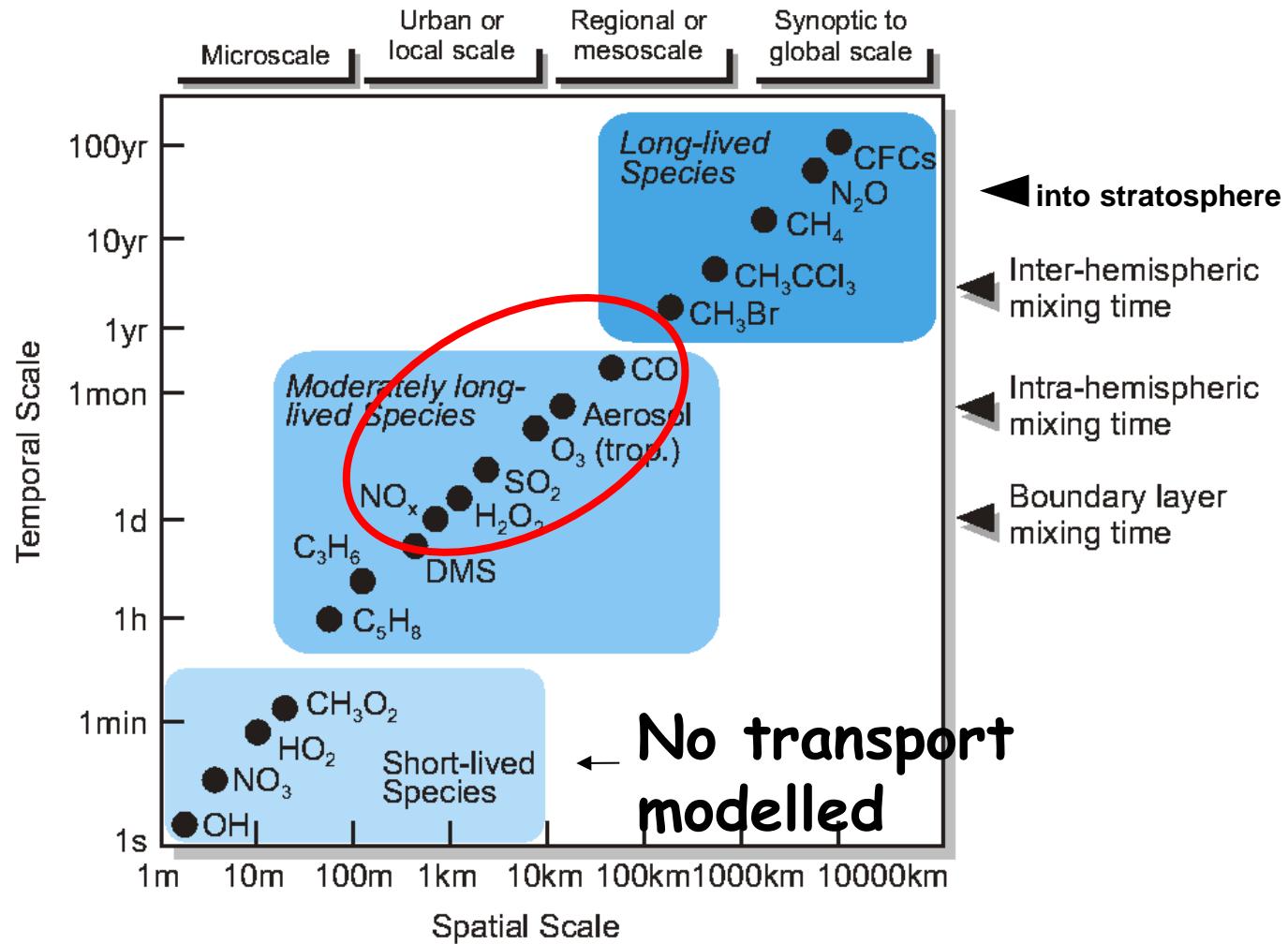


CHALLENGES IN ATMOSPHERIC COMPOSITION DATA ASSIMILATION

Challenges

- Quality of NWP depends predominantly on initial state
- AC modelling depends on initial state (lifetime) and surface fluxes
- Large part of chemical system not sensitive to initial conditions because of chemical equilibrium, but dependent on model parameters (e.g. emissions, deposition, reaction rates,...)
- Data assimilation is challenging for short lived species (e.g. NO₂)
- CTMs have larger biases than NWP models
- Most processes take place in boundary layer, which is not well observed from space
- Only a few species (out of 100+) can be observed
- Data availability
- More complex and expensive, e.g. atmospheric chemistry, aerosol physics
- Concentrations vary over several orders of magnitude

Chemical Lifetime vs. Spatial Scale



After Seinfeld and Pandis [1998]

Emission Estimates

- Emissions are one of the major uncertainties in modeling (difficult to measure directly)
- The compilation of emissions inventories is a labour-intensive task based on a wide variety of socio-economic and land use data
- Some emissions can be “modeled” based on wind (sea salt aerosol) or temperature (biogenic emissions)
- Some emissions can be observed indirectly from satellites instruments (Fire radiative power, burnt area, volcanic plumes)
- “Inverse” methods can be used to correct emission estimates using observations and models – in particular for long lived gases such as CO₂ (e.g. Chevallier et al. 2014) and Methane (Bergamaschi et al. 2009)
- Emissions can be included in the control vector and adjusted together with concentrations (e.g. Hanea et al. 2004; Elbern et al. 2007; Miyazaki et al. 2012)

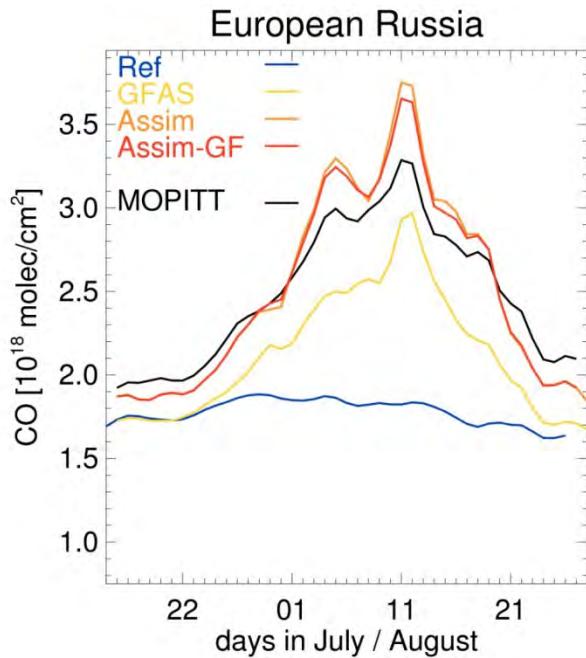
Emission Processes

- Combustion related (CO, NO_x, SO₂, VOC, CO₂)
 - fossil fuel combustion
 - Bio-fuel combustion
 - fires (anthropogenic and wild fires)
- Fluxes from biogeochemical processes (VOC, CH₄, CO₂, Pollen):
 - biogenic emissions (plants, soils oceans)
 - agricultural emissions (including fertilisation)
- Fluxes from wind blown dust and sea salt (from spray)
- Volcanic emissions (volcanic ash, SO₂, HBr ...)
- In MACC we use **GFAS fire emissions** (Kaiser et al. 2012) and **MACCity anthropogenic emissions** (Granier et al. 2011)
- Biomass burning accounts for ~ 30% of total CO and NO_x emissions, ~10% CH₄

Importance of emissions (Russian fires 2010)

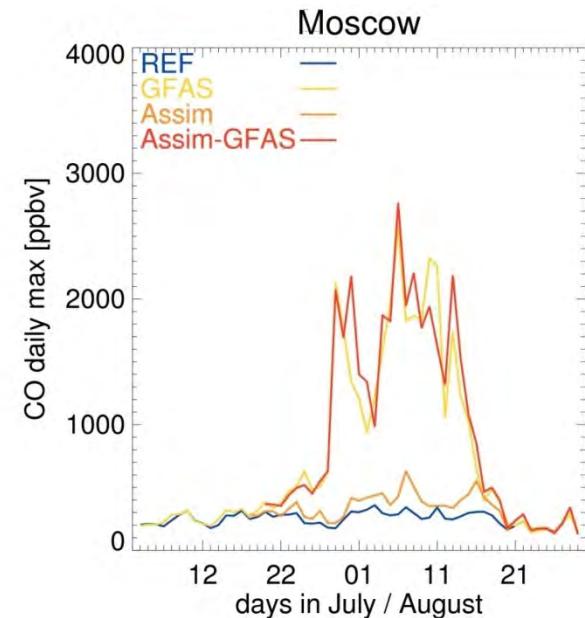
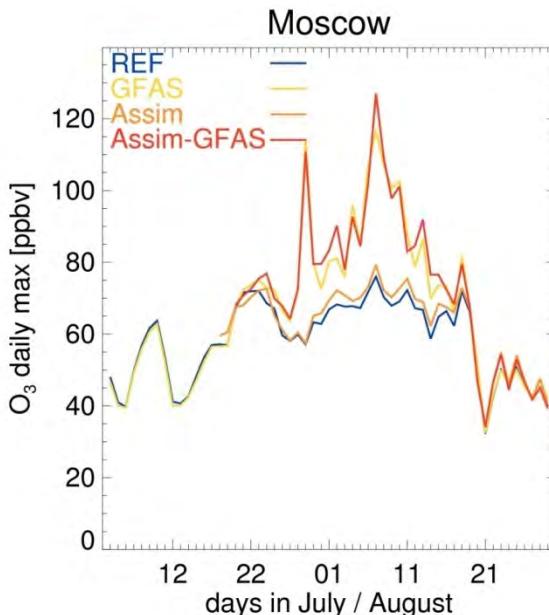
Huijnen et al. 2012 (ACP)

Total column CO



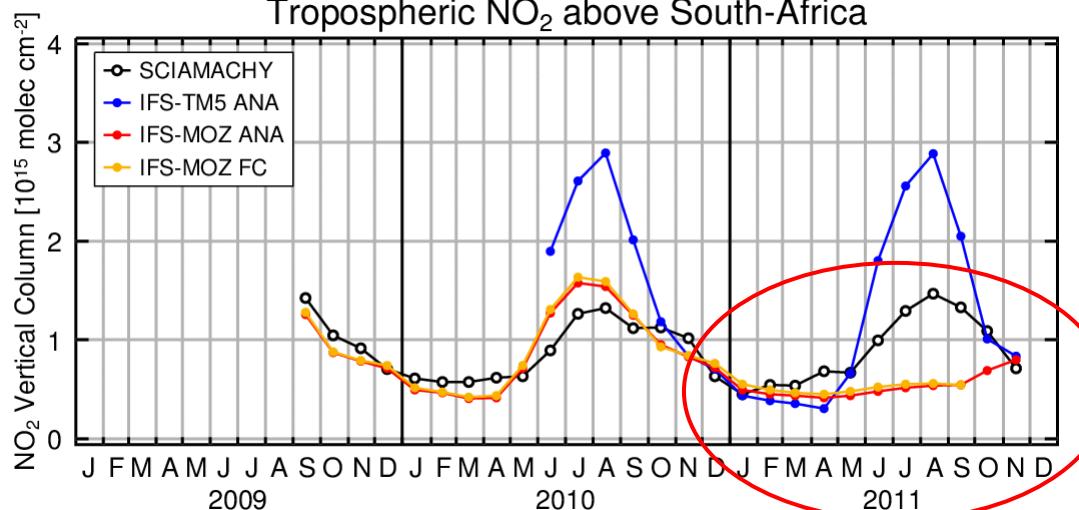
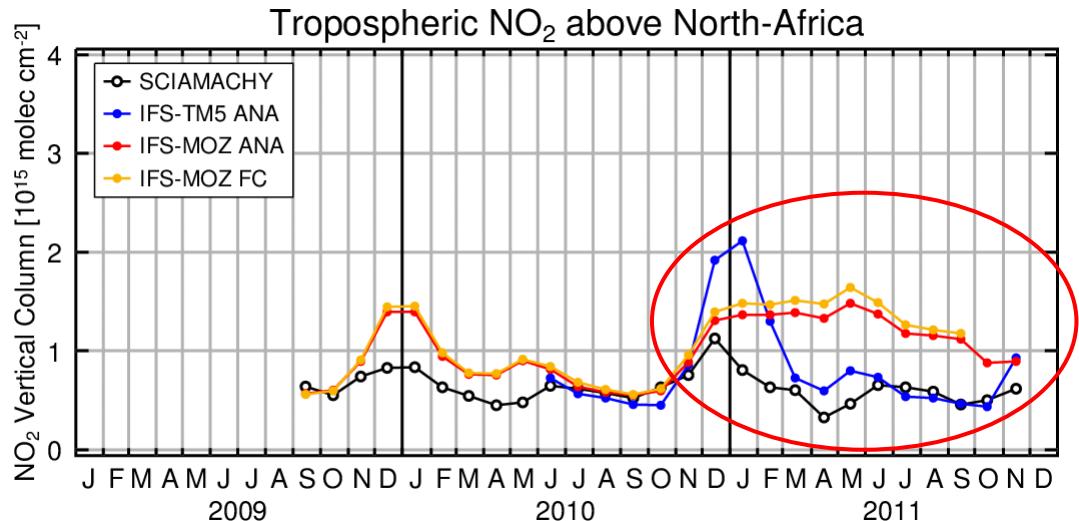
- Assimilation of IASI TCCO leads to improved fit to MOPIIT TCCO
- TCCO from **Assim** and **Assim-GFAS** are very similar

Daily maximum surface O₃ and CO



GFAS emissions are needed to get peak in surface concentrations in **GFAS** and **Assim-GFAS**

Importance of fire emissions on tropospheric NO₂

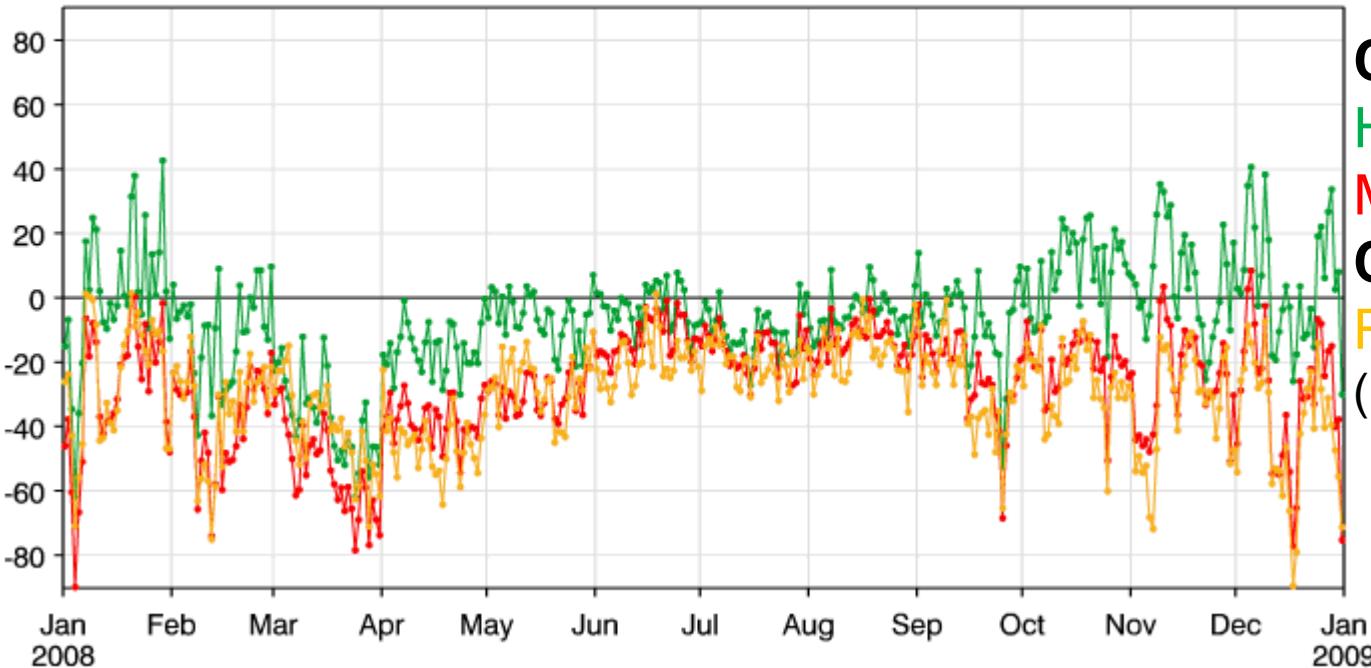


GFAS emissions for January used by mistake in IFS-MOZ during 2011

Impact of anthropogenic emissions: CO Bias - GAW Europa timeseries

CO (ppbv) FC-OBS bias. Model versus GAW.
Meaned over 14 sites in Europe. Jan - Dec 2008. FC start hrs=00Z. T+0 to 21.

— g0al — g0ao — rean



C-IFS runs:
HTAP emissions
MACCity emissions
Coupled system:
Reanalysis (MACCity)
(GFAS used in all runs)

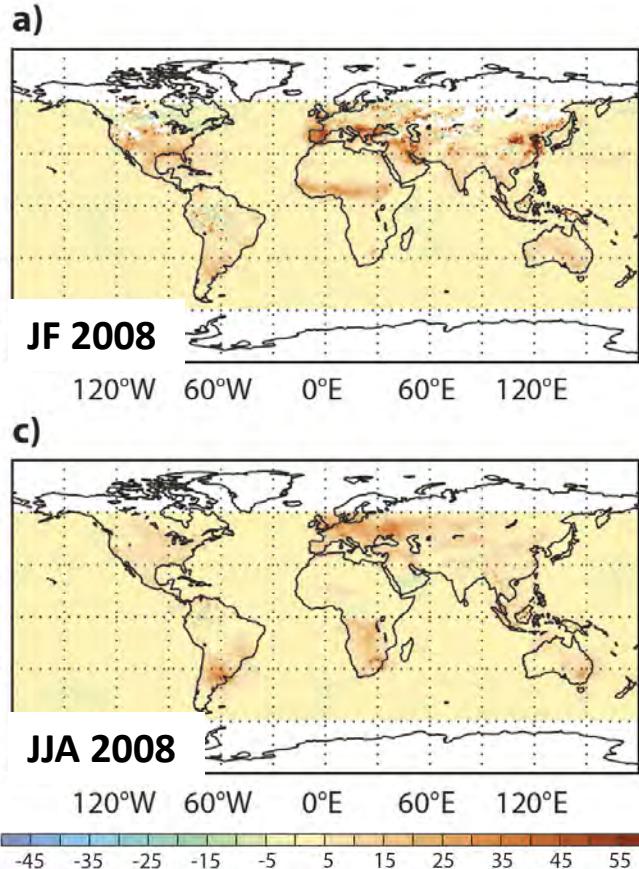
Choice of emissions data set has large impact on surface concentrations

Credits: J. Flemming

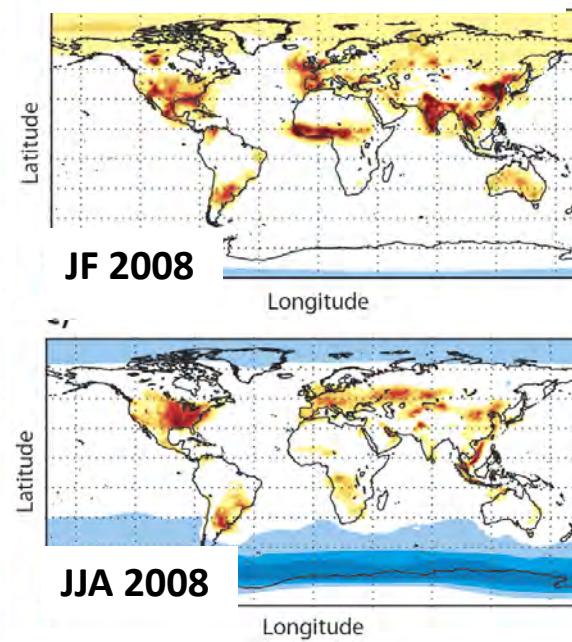


Short lived memory of NO₂ assimilation

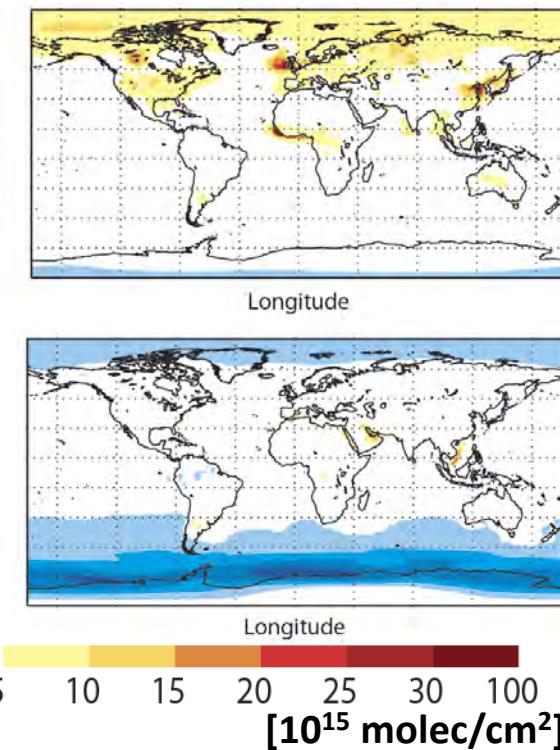
OMI NO₂ analysis increment [%]



Differences between
Analysis and CTRL



12h fc from ASSIM and CTRL

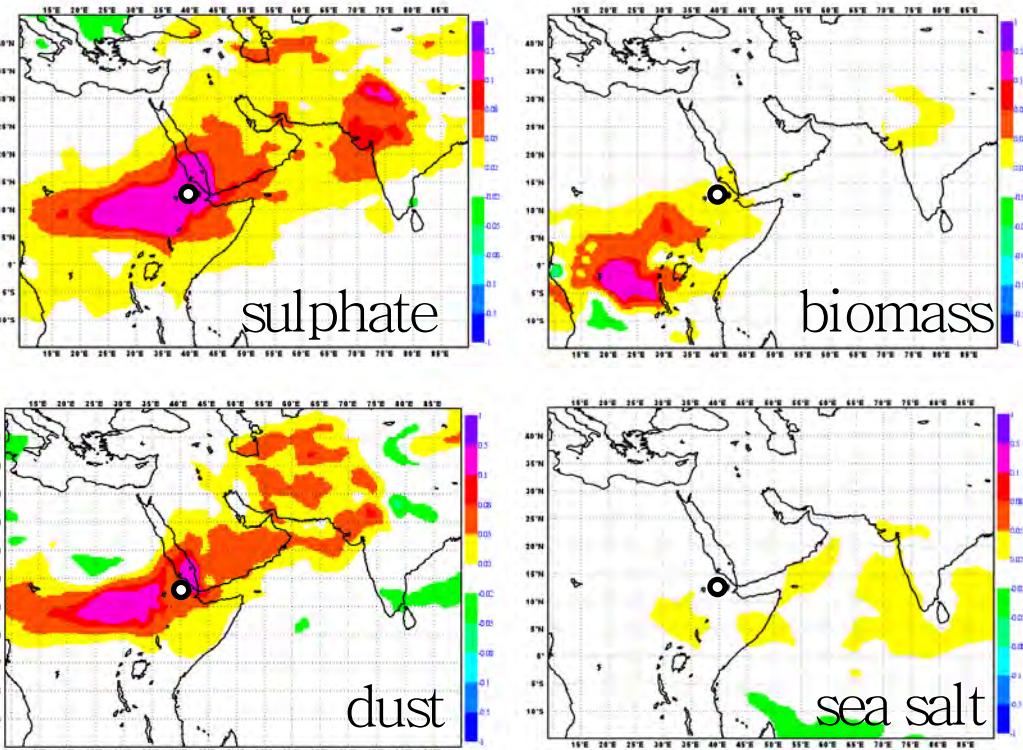
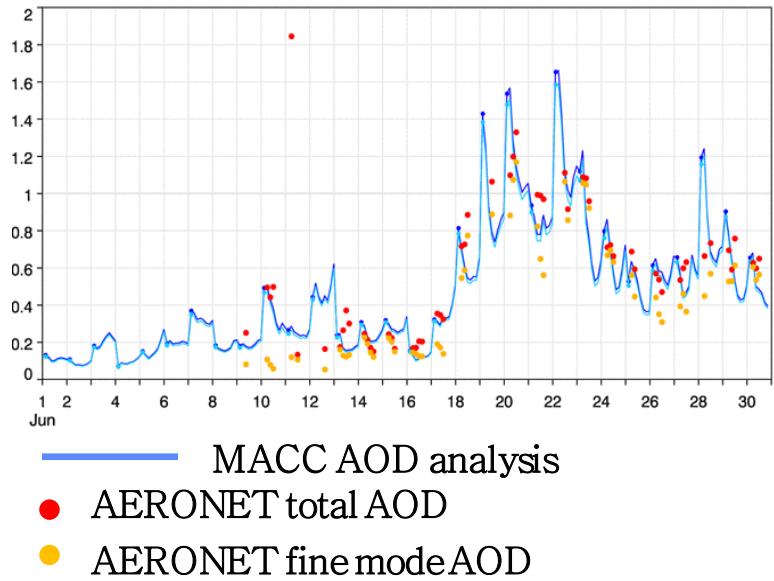


- Large positive increments from OMI NO₂ assim
- Large differences between analyses of ASSIM and CTRL
- Impact is lost during subsequent 12h forecast
- It might be more beneficial to adjust emissions (instead of IC)

Under-constrained system for aerosols

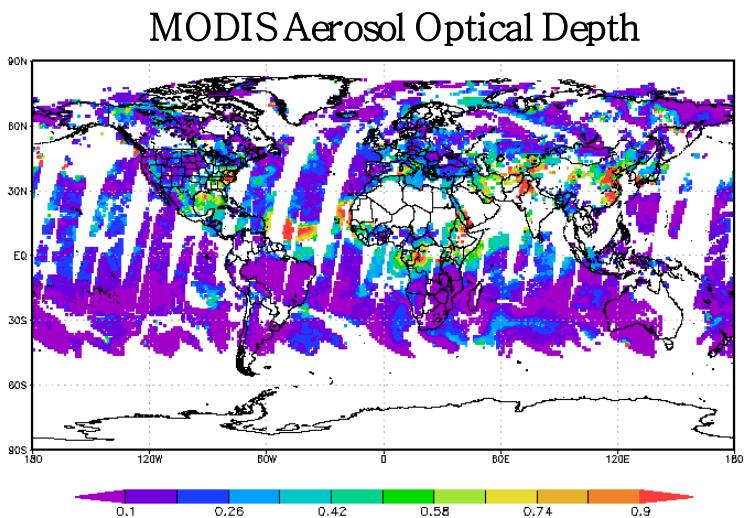
Eruption of the Nabro volcano in June 2011 put a lot of fine ash into the stratosphere. This was observed by AERONET stations and the MODIS instrument.

ICIPE-Mbita - AERONET

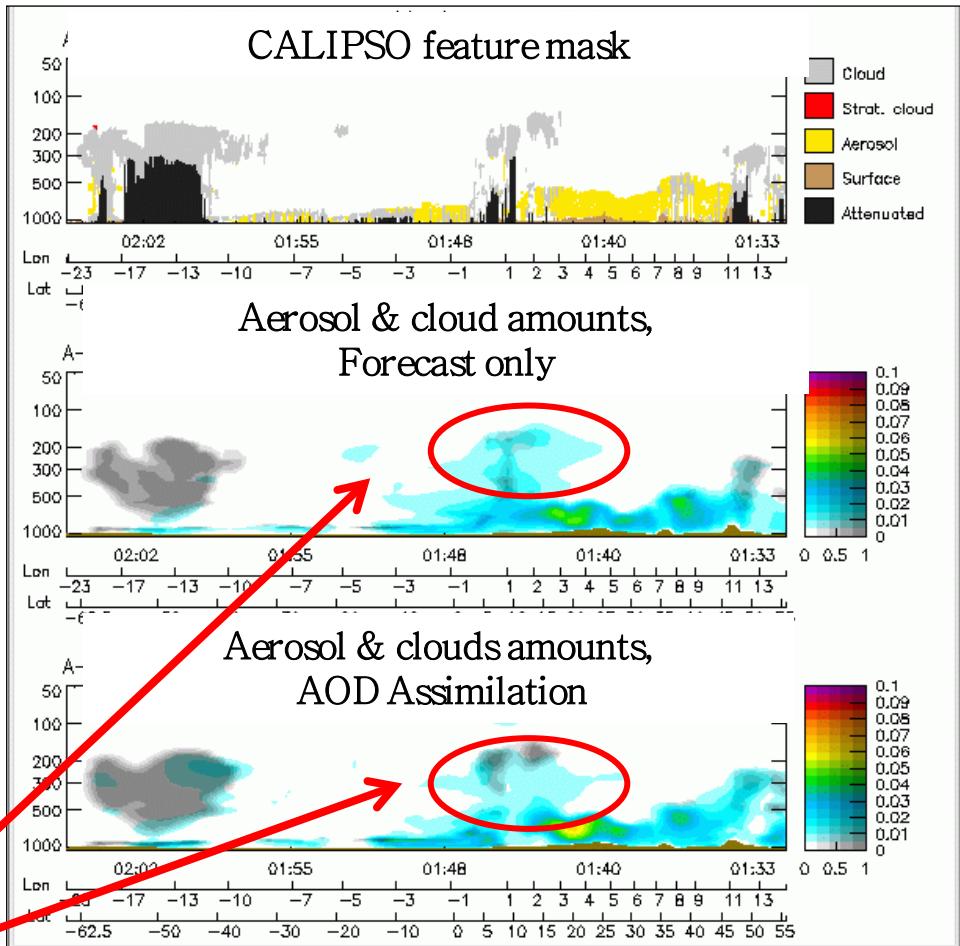


The MACC aerosol model did not contain stratospheric aerosol at this time, so the observed AOD was wrongly attributed to the available aerosol types.

Need for profiling data



- AOD is a column-integrated quantity
- Assimilation of AOD does not modify the vertical profile
- Profile data are needed (lidar)

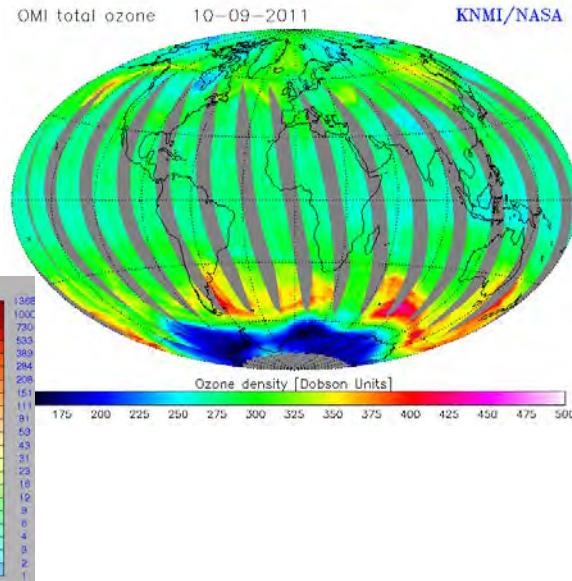


Graphics by Luke Jones

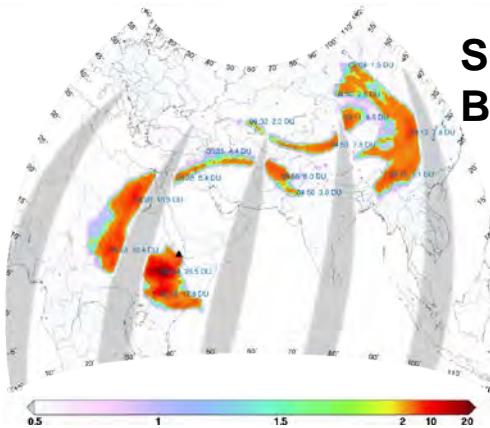
OBSERVATIONS OF ATMOSPHERIC COMPOSITION

Satellite observations

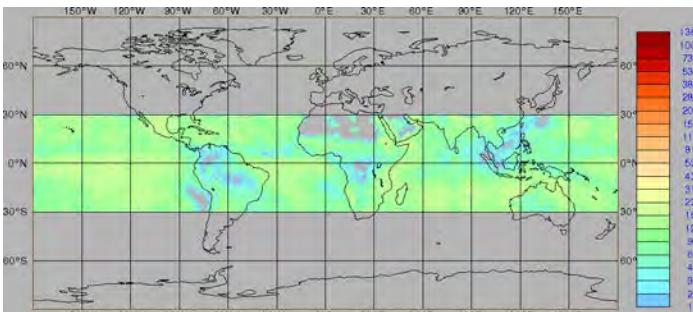
O₃, OMI, KNMI/NASA



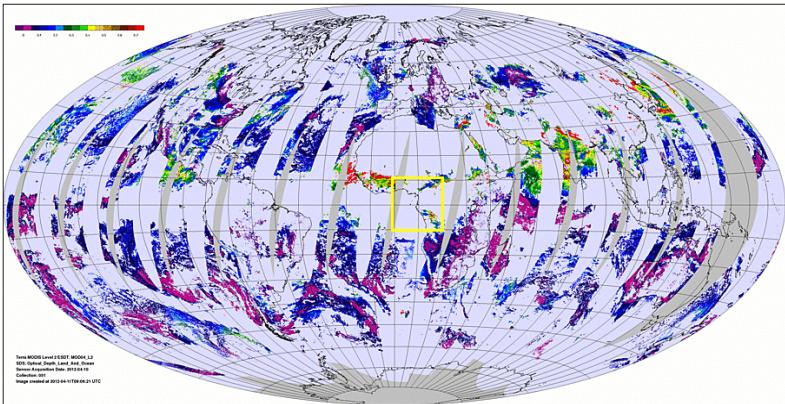
SO₂, GOME-2, SACS,
BIRA/DLR/EUMETSAT



CH₄, IASI, LMD



Aerosol Optical Depth, MODIS, NASA



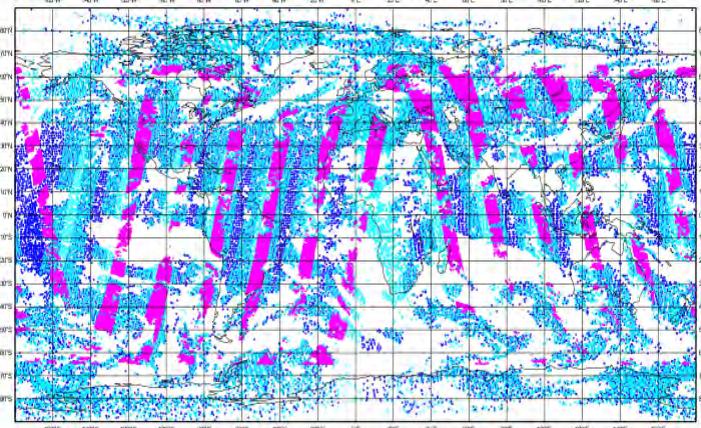
NO₂, OMI, KNMI/NASA



Atmospheric composition observations traditionally come from UV/VIS measurements. This limits the coverage to day-time only. Infrared/microwave are now adding more and more to this spectrum of observations (MOPITT, AIRS, IASI, MLS, MIPAS ...)

Reactive gases data availability in MACC NRT system: 20140901, 12z

CO

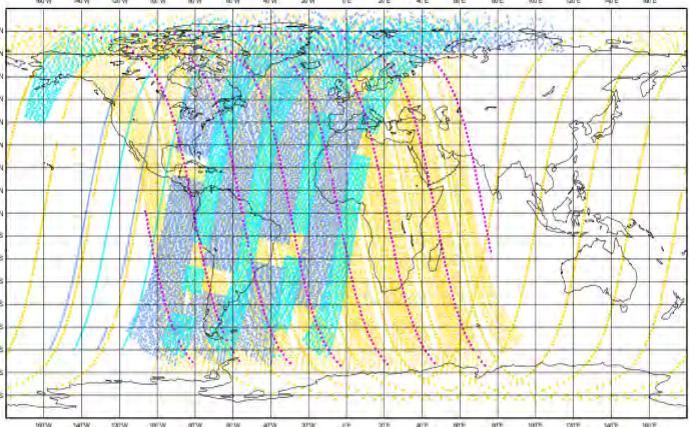


IASI
Metop-A

IASI
Metop-B

MOPITT
TERRA

O3



GOME-2
Metop-A

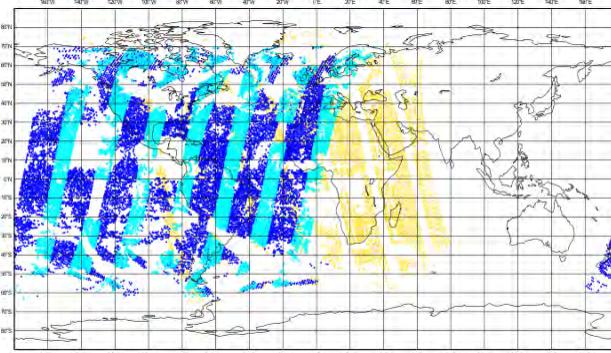
GOME-2
Metop-B

OMI, MLS
AURA

SBUV/2
NOAA-19

assimilated
monitored

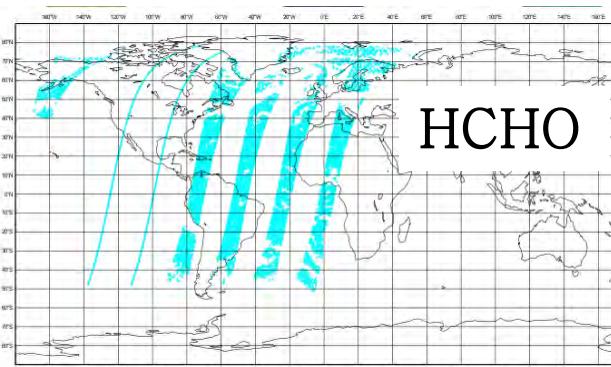
Tropospheric NO₂



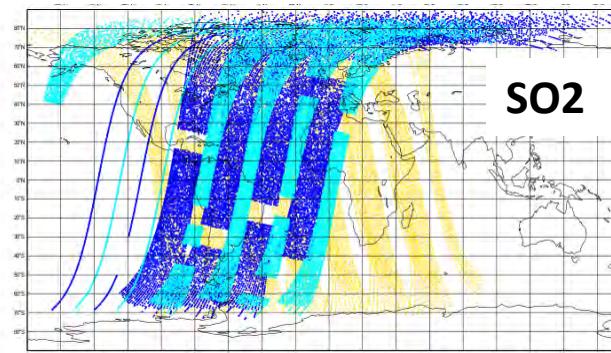
OMI
AURA

GOME-2
Metop-A

GOME-2
Metop-B



GOME-2
Metop-A



OMI
AURA

GOME-2
Metop-A

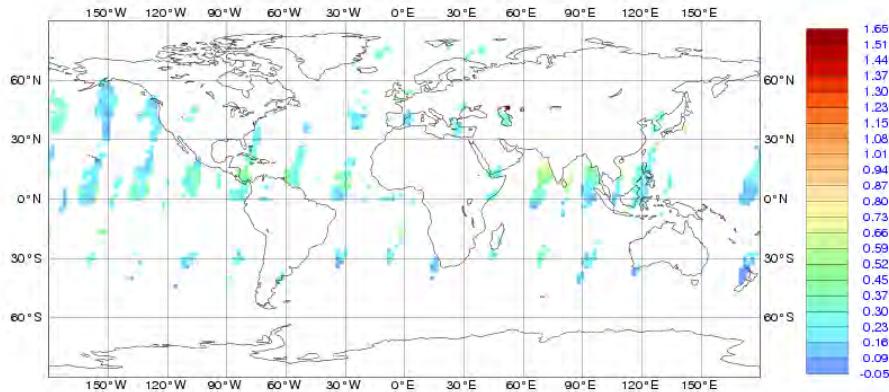
GOME-2
Metop-B

Aerosol data availability in NRT system (daily)

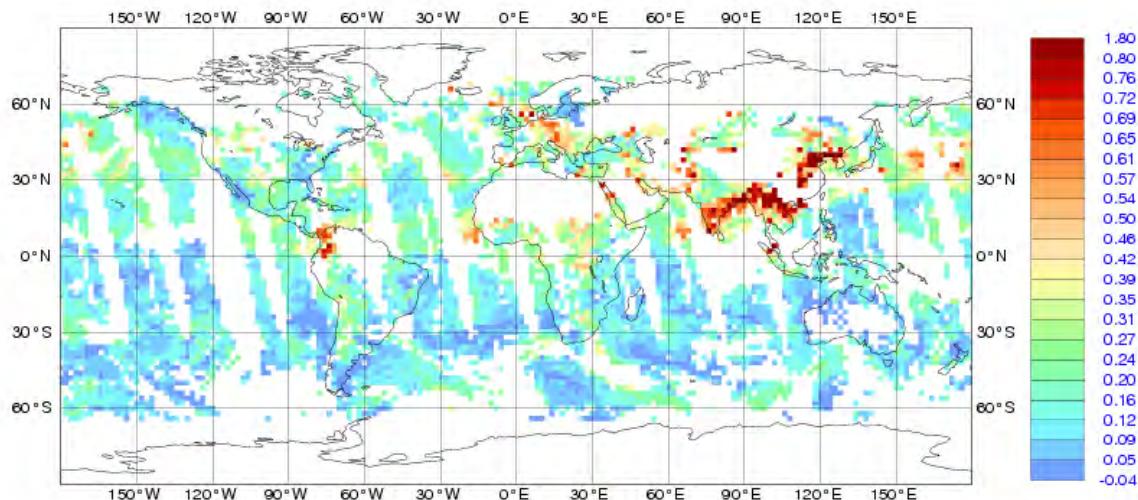
Aerosol
Optical
Depth

MODIS
AQUA

MODIS
TERRA



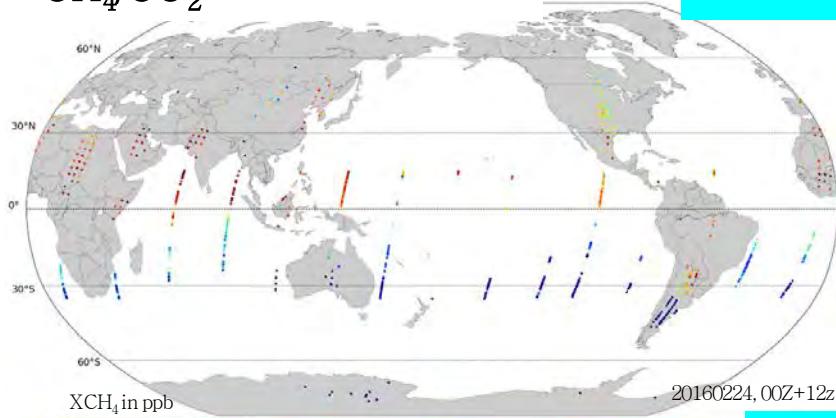
PMAP
Metop-A
PMAP
Metop-B



assimilated
monitored

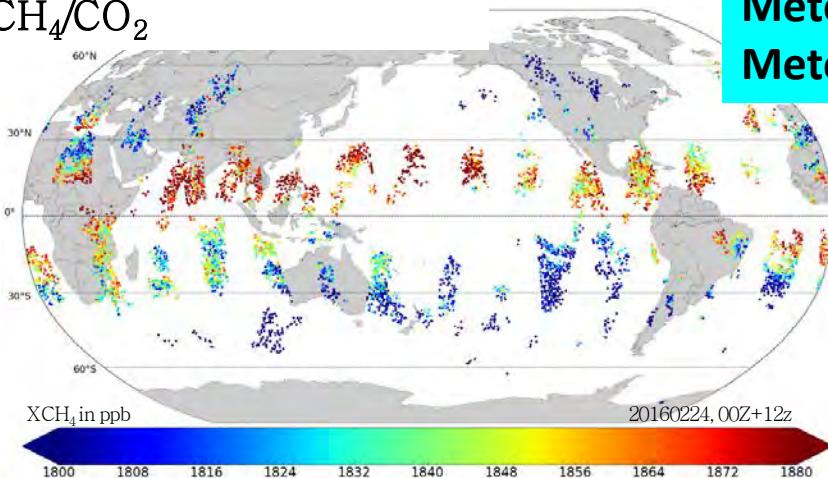
Greenhouse gases data availability in MACC NRT system: 20160224, 0z & 12z

Lower troposphere
CH₄/CO₂

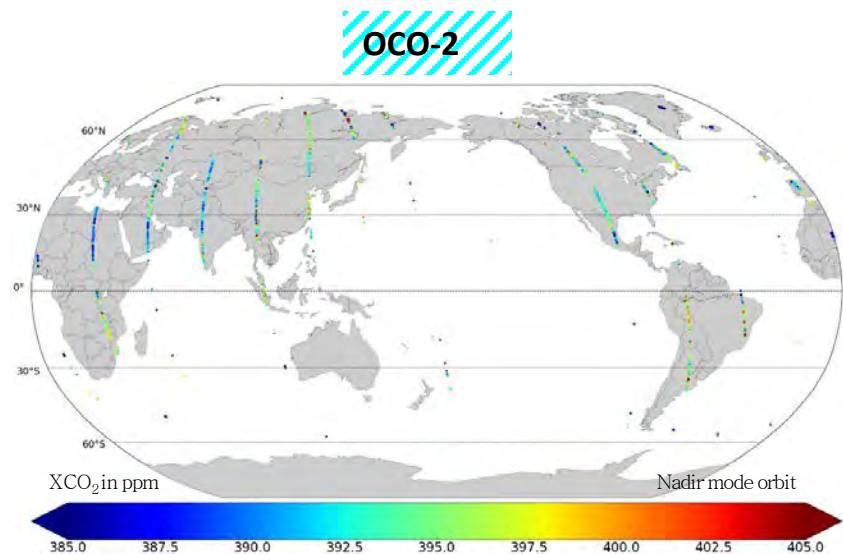


TANSO-FTS
GOSAT

Middle troposphere
CH₄/CO₂



IASI
Metop-A
Metop-B



Issues with Observations

● AC Satellite retrievals

- Little or no vertical information from satellite observations. Total or partial columns retrieved from radiation measurements. Weak or no signal from boundary layer.
- Fixed overpass times and daylight conditions only (UV-VIS) -> no daily maximum/cycle
- Global coverage in a few days (LEO); often limited to cloud free conditions; fixed overpass time.
- Retrieval errors can be large; small scales not resolved
- We use retrievals for AC: Averaging kernels important

● AC in-situ observations

- Sparse (in particular profiles)
- Limited or unknown spatial representativeness

ATMOSPHERIC COMPOSITION DATA ASSIMILATION

Importance of height resolved observations

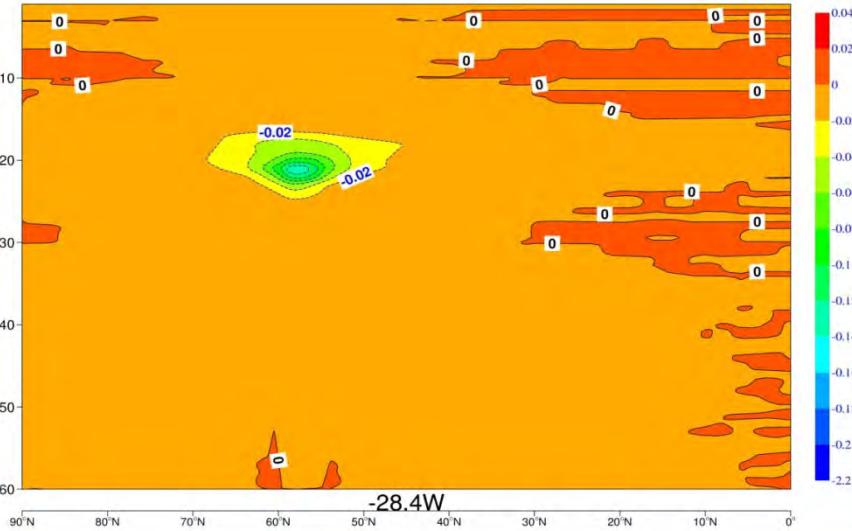
Impact of a single observation in 3D-Var (for model variable at a gridpoint)

$$x_a - x_b = \frac{y - x_b}{\sigma_o^2 + \sigma_b^2} B$$

- x_a : analysis value
- x_b : background value
- y : observation
- σ_o^2 : observation variance
- σ_b^2 : background covariance
- B : column of background error covariance matrix
- Analysis increment is proportional to a column of B -matrix
- B -matrix determines how increment is spread out from a single observation to neighbouring gridpoints/ levels

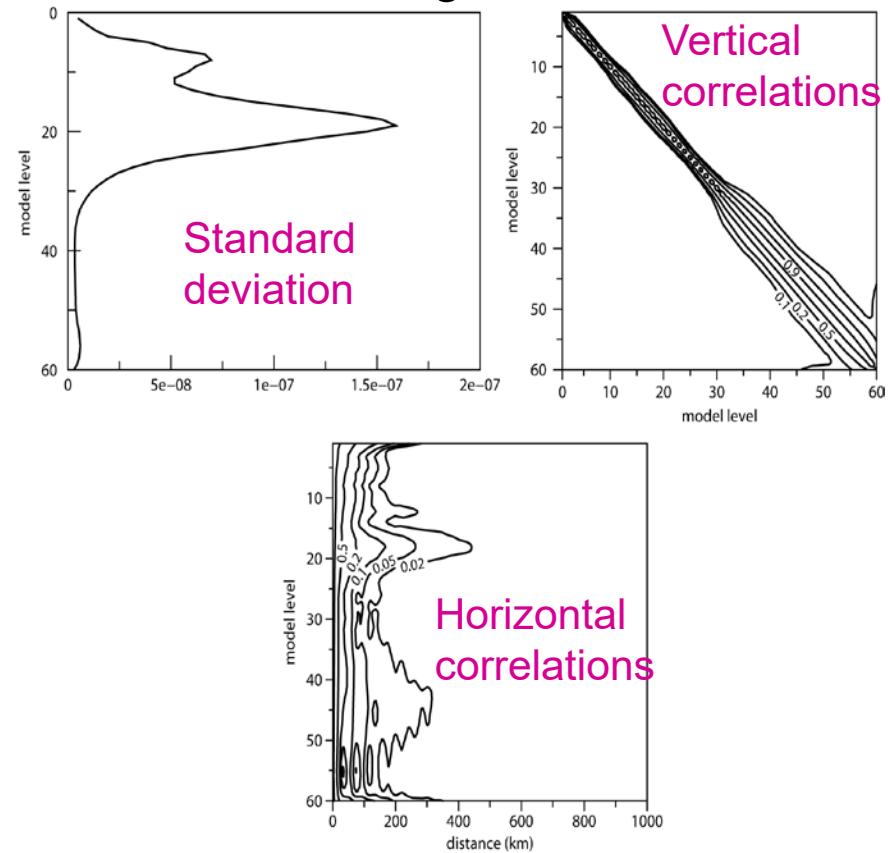
Increment from a single TCO3 observation

Increment created by a single O₃ obs



Ozone observation of 247 DU, 66 DU lower than background

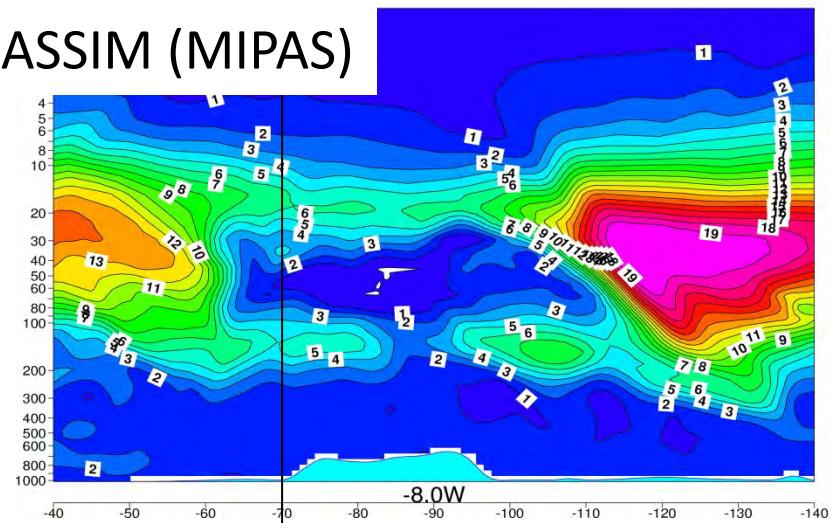
Ozone background errors



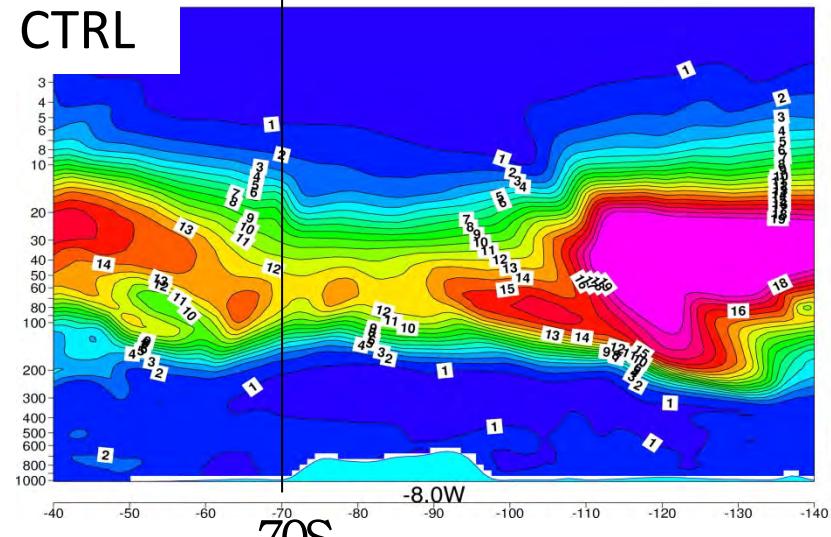
- Maximum impact around L20 (~35 hPa)
- Profile data are important to obtain a good vertical analysis profiles

Ozone hole in GEMS reanalysis: Cross section along 8E over South Pole, 4 Oct 2003

ASSIM (MIPAS)



CTRL



70S

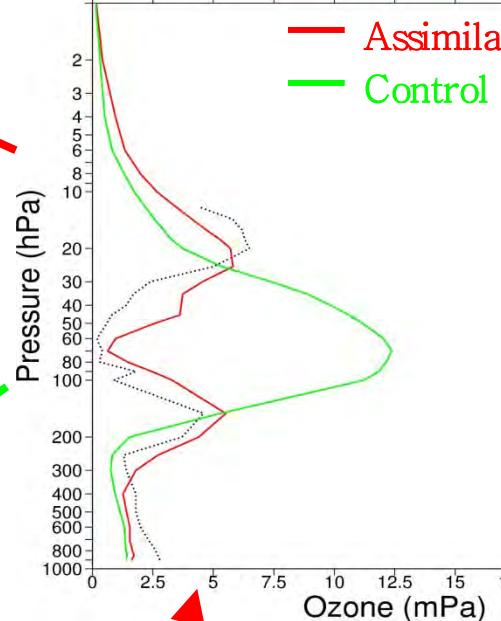


Assimilation **with
profile data**

Oct 2004

Average of all 10 profiles of F026 G03 (mPc)
over South_Pole in Oct 2004

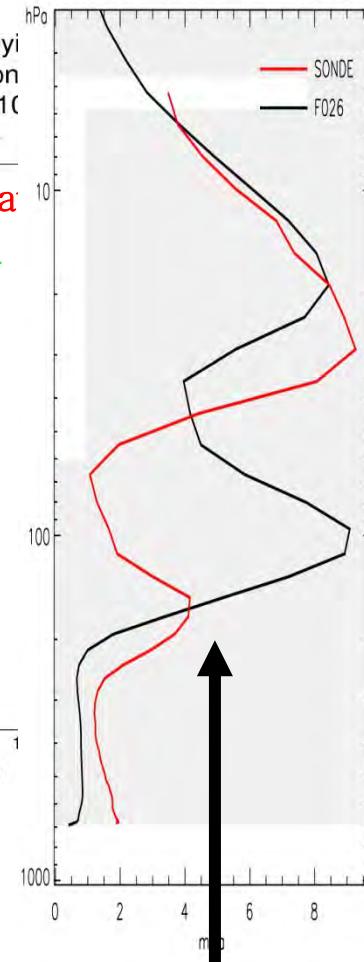
Ozone profiles from sonde, eyi
Neumayer (Lat = -70.7, Lon
Date = 2003100410



Pressure (hPa)

Ozone (mPa)

sonde eyih
Assimila
Control

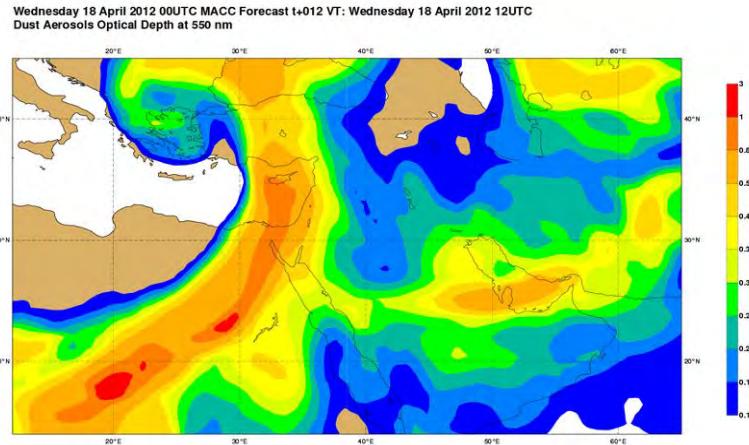


Assimilation **with
total column data**

4D-Var assimilation system for aerosols

Aerosol assimilation is difficult because:

- There are numerous unknowns (depending on the aerosol model) and very little observations to constrain them
- The concentrations vary hugely with for instance strong plumes of desert dust in areas with very little background aerosol, which makes it difficult to estimate the background error covariance matrix



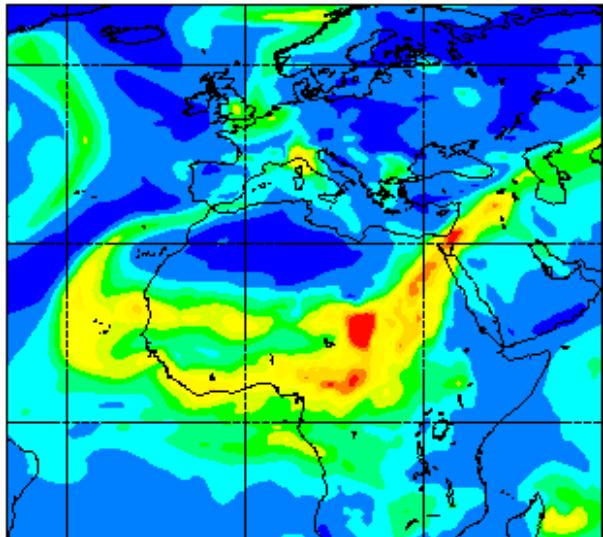
The aerosol prediction system: Analysis

- Assimilated observations are the 550nm MODIS Aerosol Optical Depths (AODs) over land and ocean.
- Control variable is formulated in terms of the total aerosol mixing ratio.
- Analysis increments are repartitioned into the species according to their fractional contribution to the total aerosol mixing ratio.
- Background error statistics were computed using forecasts errors as in the NMC method (48h-24h forecast differences).
- Observation errors are prescribed fixed values.
- Variational bias corrections are applied to total AOD

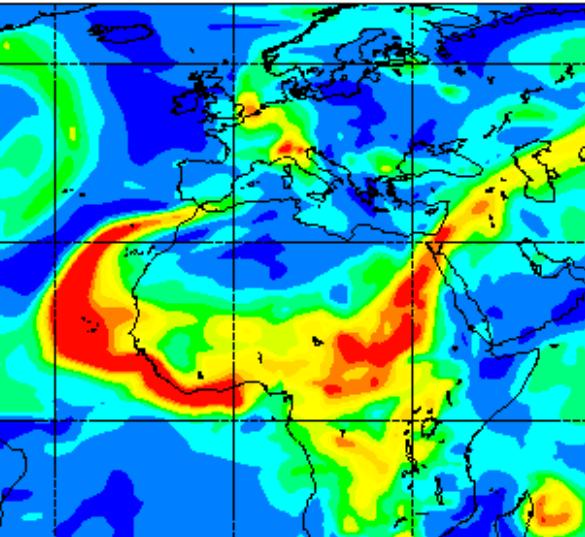
Benedetti et al. 2009, *JGR*, 114, doi:10.1029/2008JD011115

Impact of assimilation for a Saharan dust outbreak

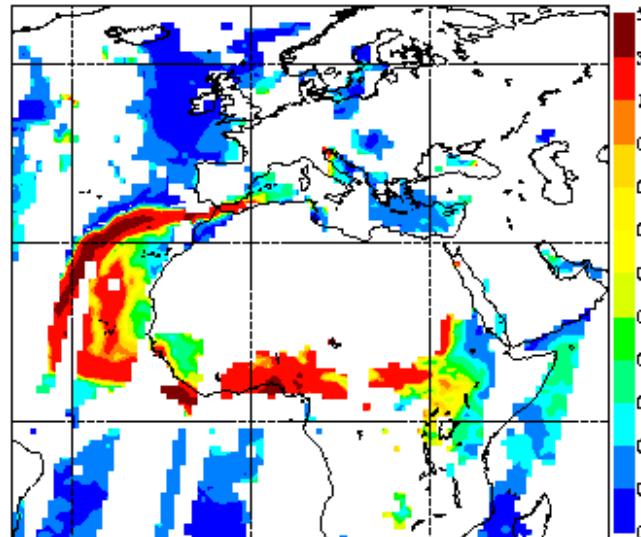
Model simulation



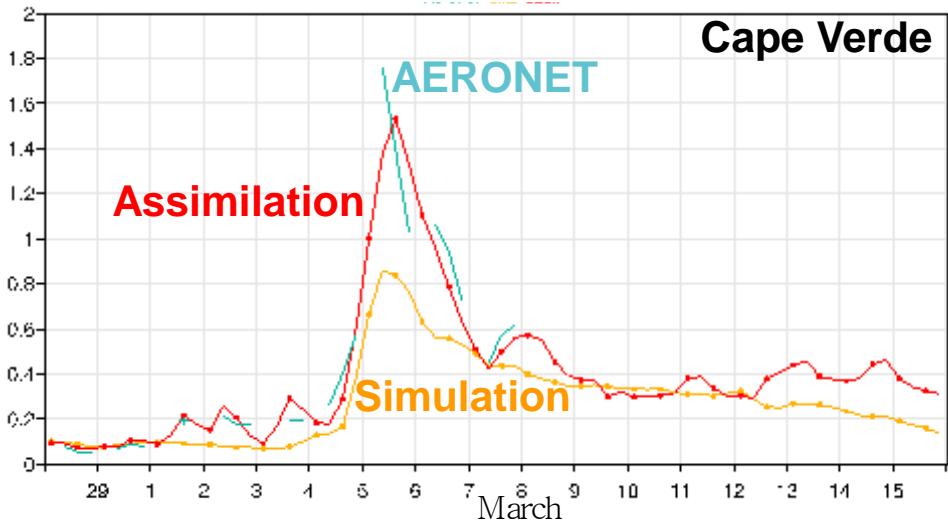
Assimilation



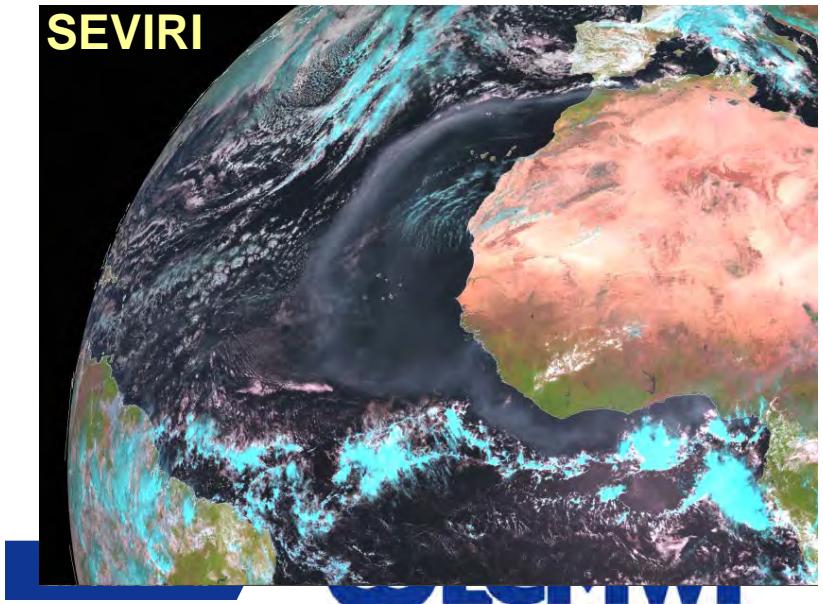
MODIS



Aerosol optical depth at 550nm (upper)
and 670/675nm (lower)

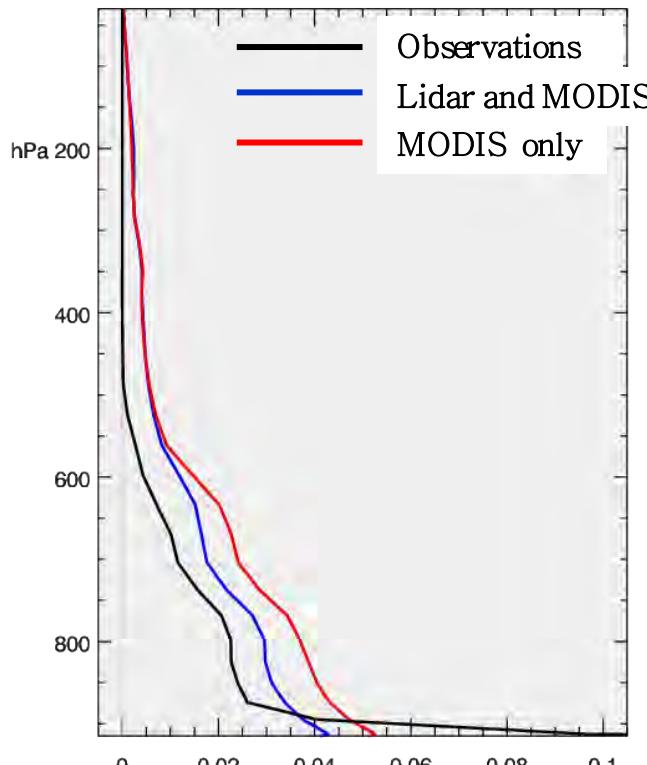


SEVIRI

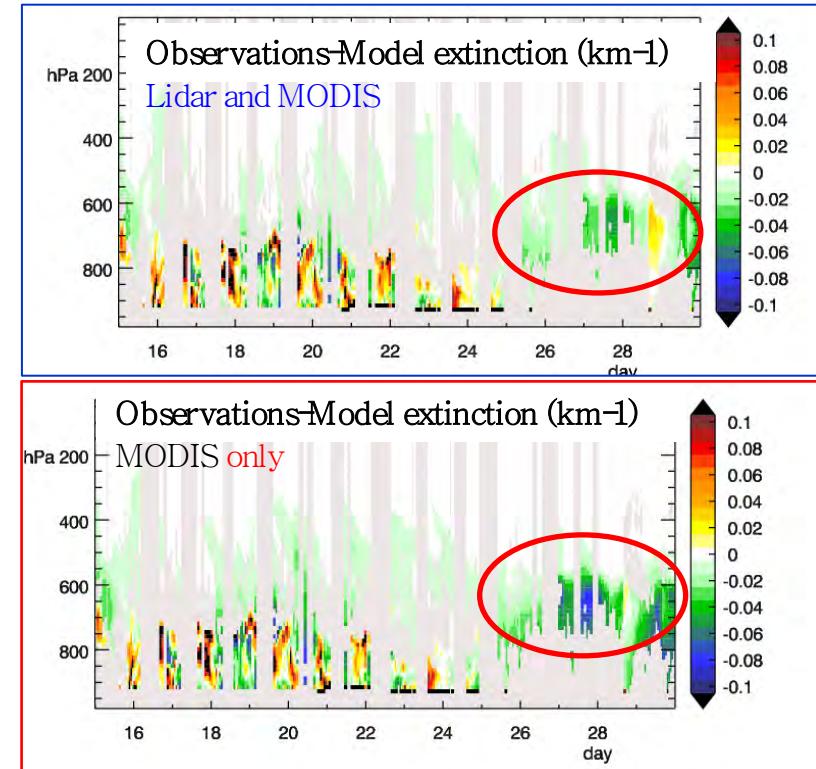


Towards lidar assimilation: Impact of CALIPSO on vertical profiles

- NRT CALIPSO level 1.5 product available since mid-2011
- Mean Attenuated aerosol backscatter at 532 nm (cloud cleared)
- Aimed at operational NWP centres (ECMWF, US Naval Research Lab, JMA,...)
- Developed through close collaboration with NASA LaRC CALIPSOTeam
- Lidar observation operator in place
- CALIPSO data have positive impact on the aerosol extinction profile (in initial tests) but biases still remains



Monthly averaged extinction (km⁻¹)
at 532nm at Sede Boker (453 profiles)



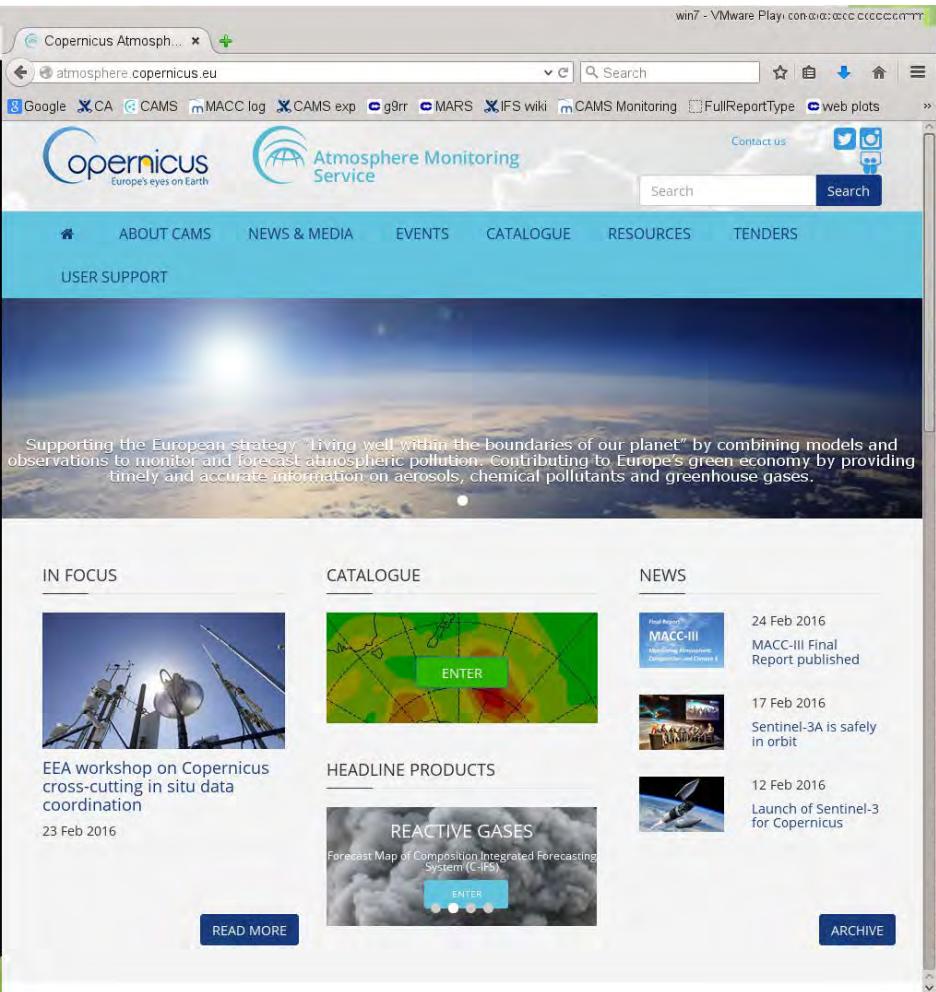
(*) Lidar data are courtesy of Arnon Karniel. Special thanks to Simone Lolli, Judd Welton and the MPLNET team.

6. Concluding remarks

- The ECMWF's Integrated Forecast System has been extended to include fields of atmospheric composition: Reactive gases, greenhouse gases, aerosols => **Composition-IFS (C-IFS)**
- Modelling of AC needs to include many species with concentrations varying over several orders of magnitude
- AC forecasts benefit from realistic initial conditions (**data assimilation**) but likewise from improved emissions
- Extra challenges for DA of atmospheric composition compared to NWP - but also potential benefits through chemical coupling and impact on NWP
- CAMS system produces useful AC forecast and analyses, freely available from atmosphere.copernicus.eu

More information about the environmental monitoring activities at ECMWF and how to access the data can be found on:

atmosphere.copernicus.eu



The screenshot shows the homepage of the Copernicus Atmosphere Monitoring Service. The header features the Copernicus logo and the text "Atmosphere Monitoring Service". Below the header is a navigation menu with links to "ABOUT CAMS", "NEWS & MEDIA", "EVENTS", "CATALOGUE", "RESOURCES", and "TENDERS". A "USER SUPPORT" section is also present. The main content area has a large background image of a sunset over clouds. A text overlay reads: "Supporting the European strategy "Living well within the boundaries of our planet" by combining models and observations to monitor and forecast atmospheric pollution. Contributing to Europe's green economy by providing timely and accurate information on aerosols, chemical pollutants and greenhouse gases." The page is divided into three columns: "IN FOCUS" (with an image of satellite equipment and a link to an EEA workshop), "CATALOGUE" (with an image of a map and a "ENTER" button), and "NEWS" (listing recent articles: "MACC-III Final Report published" on 24 Feb 2016, "Sentinel-3A is safely in orbit" on 17 Feb 2016, and "Launch of Sentinel-3 for Copernicus" on 12 Feb 2016). A "HEADLINE PRODUCTS" section is also visible.



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