Volcanic plume modelling and assimilation with the global MACC system (with emphasis on SO<sub>2</sub>)

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Parameter Estimation Workshop 2013

### Introduction

- How can we use timely observations in combination with data assimilation for initial values to improve the MACC forecasts of volcanic eruptions ?
- Eyjafjallajökull eruption in 2010 set the agenda
  - The MACC data assimilation system needs to be improved to be able to assimilate plume observations (retrievals)
  - Estimates of injection profile and emission rate are essential for reasonable forecasts
- MACC makes forecast and analyses volcanic aerosol and volcanic SO<sub>2</sub> using the Integrated forecasting system (IFS) of ECMWF (4DVAR, NWP forecasting model with a semilagrangian advection scheme)



# First Attempts ... in April 2010

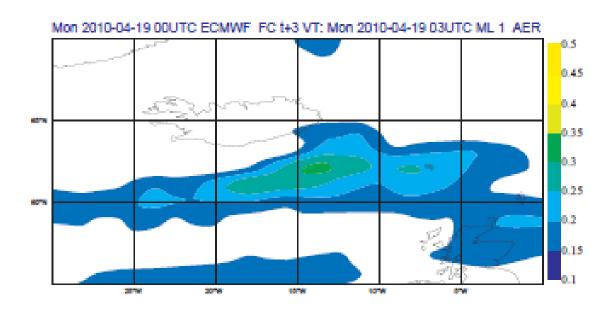




Figure 1: Sea salt plume off the coast of Iceland on April 19, 2010 at 030UTC.

- MODIS AOD north of 60N blacklisted
- No volcanic aerosol tracer
- No assimilation of volcanic SO<sub>2</sub> retrievals
- Forecast runs with arbitrary emissions



### Recent Developments: Forecast and Assimilation of volcanic Ash and SO<sub>2</sub> Plumes

- Assimilation of MODIS AOD to change proportionally modelled aerosol species
  - →Introduce volcanic aerosol model (new)
  - → Relax quality criteria to not filter out volcanic signal
- Assimilation of middle-trop to strat UV SO<sub>2</sub> retrievals
  - $\rightarrow$  Volcanic SO<sub>2</sub> model field and loss terms
  - Optimise DA for plume assimilation (specific background error statistics, variable transformation)
- Method to estimate injection height and emission flux from UV SO<sub>2</sub> retrievals

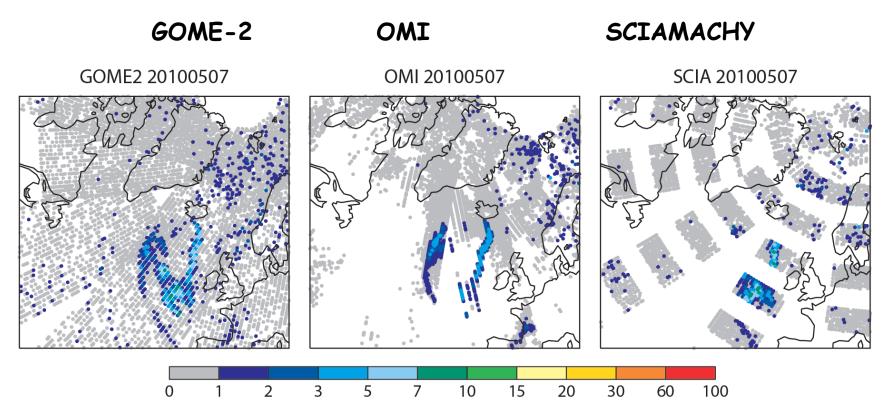


# Parameter Estimation and Data Assimilation for SO<sub>2</sub> Plume Forecasts

- What are can be inferred from satellite SO<sub>2</sub> retrievals to make (good) SO<sub>2</sub> plume forecast?
  - →Initial conditions (DA)
  - → Emissions flux (PE)
  - →Injection profile (PE)
  - $\rightarrow$  SO<sub>2</sub> life time (PE)
- Are the SO<sub>2</sub> retrievals providing the required information ?
- How important is meteorological forecast error and realism of model transport by the IFS ?
- How to represent uncertainty ?
- Test cases: 2011 Grímsvötn and 2010 Eyjafjallajökull erruption



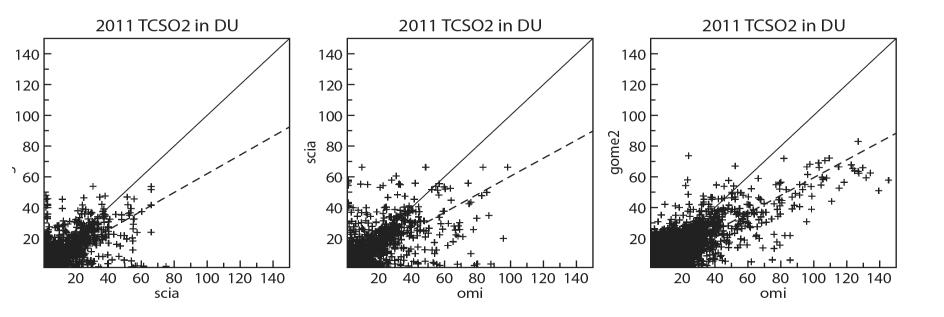
# Spatial and temporal Coverage – Total Column SO<sub>2</sub> retrieval



- Good coverage essential (GOME-2 is best)
- No night time retrievals for UV instruments
- No vertical information



### High TCSO2: OMI vs GOME-2 vs SCIA

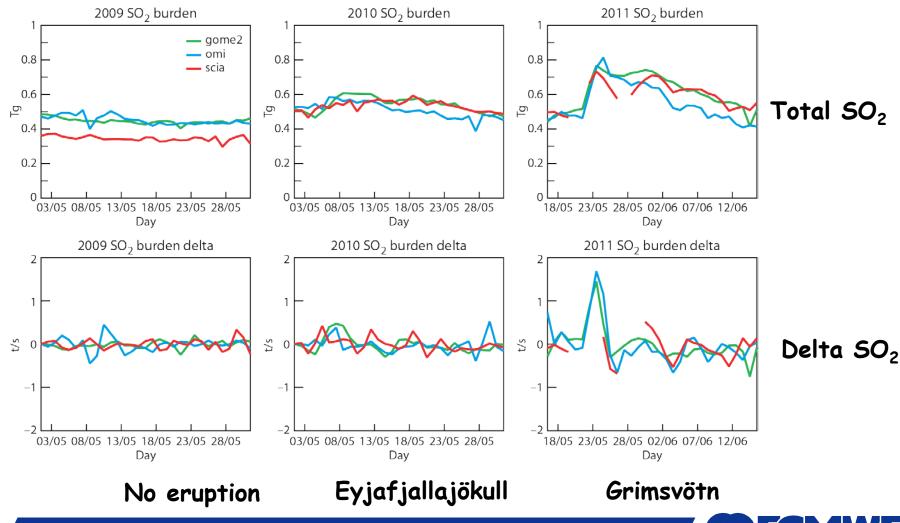


Gridded observations OMI tends to have highest maxima

Grimsvoetn 2011



# Variability of observed SO<sub>2</sub> Burden used to estimate Emissions

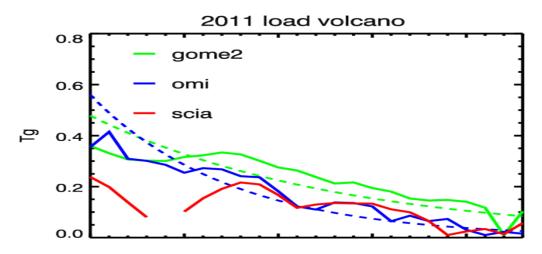


SO<sub>2</sub> Burden 4000 km around Iceland

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# SO<sub>2</sub> Lifetime Estimate from SO<sub>2</sub> Retrievals

 Use reduction of observed SO<sub>2</sub> burden to estimate lifetime after end of eruption



 $SO_2 \rightarrow SO_4$   $dSO_2/dt = - k SO_2$  $SO_2(t) = SO_2(0) \exp(- t/T)$ 

- "GOME-2 Lifetime" : 15 days
- "OMI-Lifetime" : 9 days
- No really exponential loss
- According to exponential loss obs have too low SO<sub>2</sub> in the concentrated plume at the start

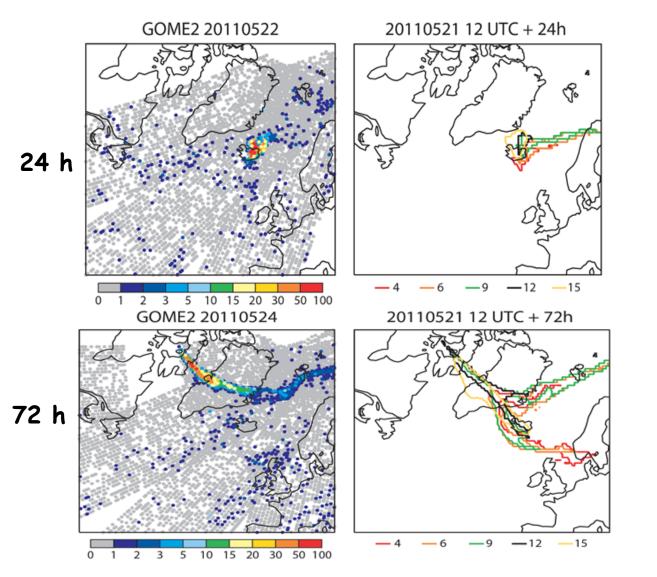


#### **Emission and Injection Height Estimate using Ensembles of Tracers**

- Simulate test tracers with fixed emission rate (1t/s) injected at different levels up to 24 h before observation
- Find best overlap of test plume with plume observations (1DU)
  - Identify plume height by plume locations (wind shear)
- "scale" fixed emissions to fit observations in "best" test plume
  - minimise area to calculate burdens (only area covered by test plumes)
- Refine temporal resolution of estimate with test forecast 18/12/6 h before observation time, if possible



#### **Test Tracer Grimsvötn**

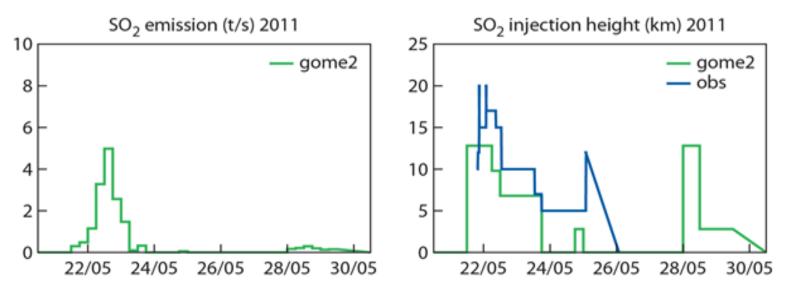


#### Eruption start 19 UTC 21.5.11



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### **Emissions Flux and Injection height - Grimsvötn**



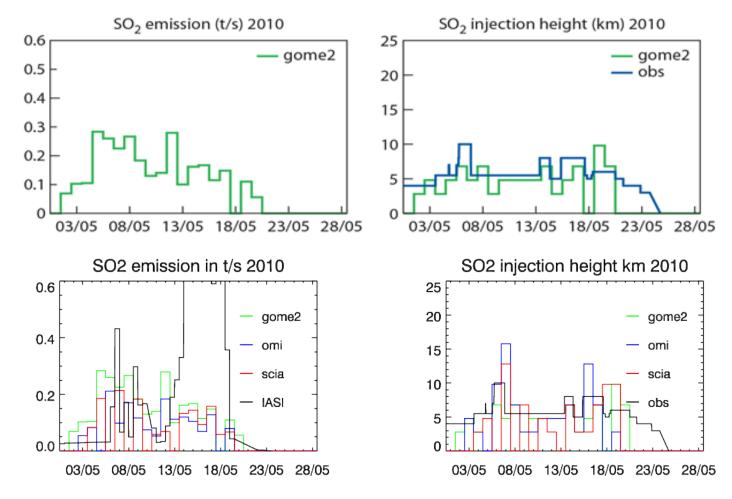
Reasonable agreement with plume top height observations from radar

Estimate after 28.5 is artefact caused by plume returning to Iceland



Using GOME-2

# Emissions Flux and Injection height - Eyjafjallajökull



OMI and SCIA estimates more "jumpy" than GOME-2 Larger differences with IASI based estimate by Heard et al. 2012



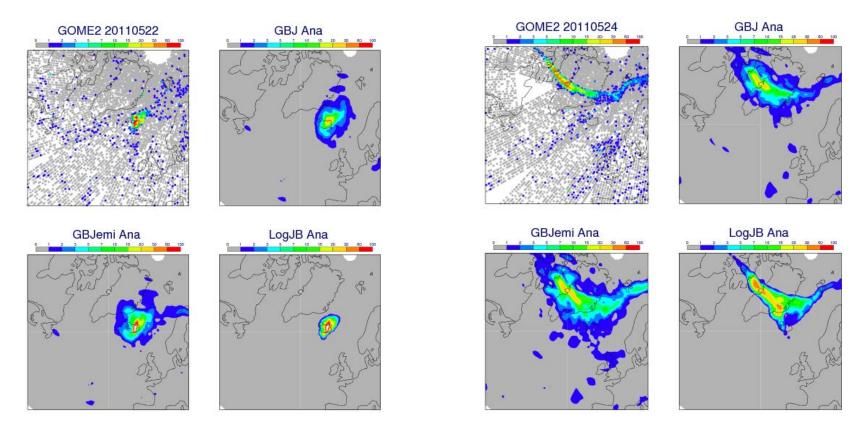
# Data Assimilation of volcanic SO<sub>2</sub> (GOME-2)

- Emissions flux in assimilating model yes no
  - DA was good in producing plumes but not correcting wrong plumes
- With log-Jb and Normal Jb
  - Log-Jb required existing plume to be amplified
- "External" plume height information needed to locate plume vertically
- Final setup for SO<sub>2</sub> plume assimilation
  - →Normal JB
  - → minimum > 0.1 DU, no thinning
  - increased back ground error variance at height of plume obtained form plume height estimate
  - 100 km horizontal length scale

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# **SO<sub>2</sub> Analysis Examples**



Log-Analysis not "over dispersive" but too high and dependent on a plume in background Analysis exaggerate plume extent

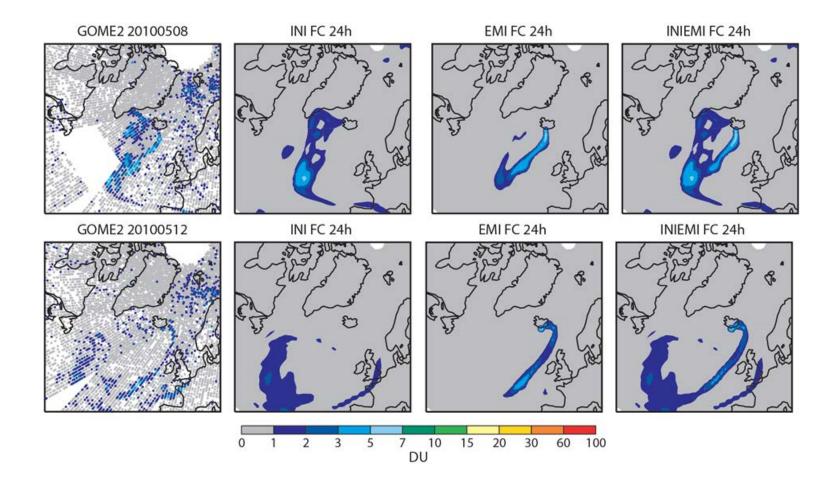


# Initial Conditions vs. / and Emission Parameters

- SO<sub>2</sub> forecasts for 2011 Grímsvötn and 2010 Eyjafjallajökull
- Forecasts configurations:
  - → EMI : Forecast with SO<sub>2</sub> source parameter (also for duration of forecast)
  - →INI: Forecast with SO<sub>2</sub> analysis (GOME-2) as initial conditions only and no SO<sub>2</sub> source term (INI)
  - →INIEMI Forecast with SO<sub>2</sub> analysis as initial conditions and estimated SO<sub>2</sub> source terms
- Daily 12 UTC Forecast over 120 h, T511L60, Mass fixer applied
- Evaluated with GOME-2 How good can we forecast tomorrow TCSO2 plume using todays TCSO2 retrievals?
- (NOTE EMI is not a NRT scenario because we don't know future emissions !)

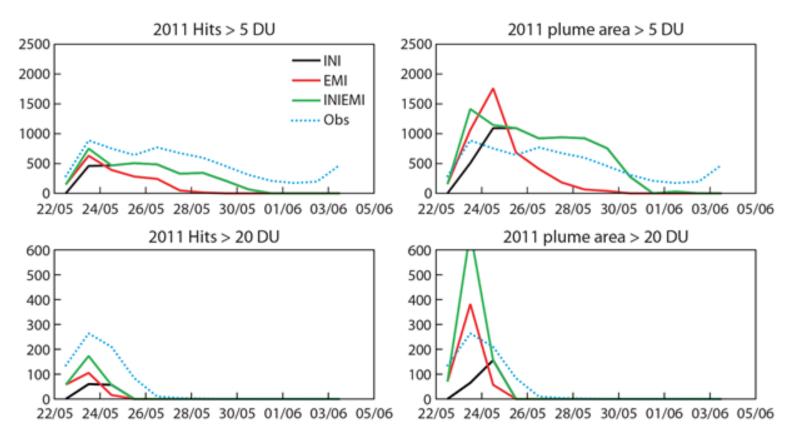


## **Eye-ball Plume Forecast Evaluation 2010**





# 24 FC SO<sub>2</sub> Plume Forecast Evaluation – 2011



Evaluation w.r.t to gridded observations (0.5x 0.25)

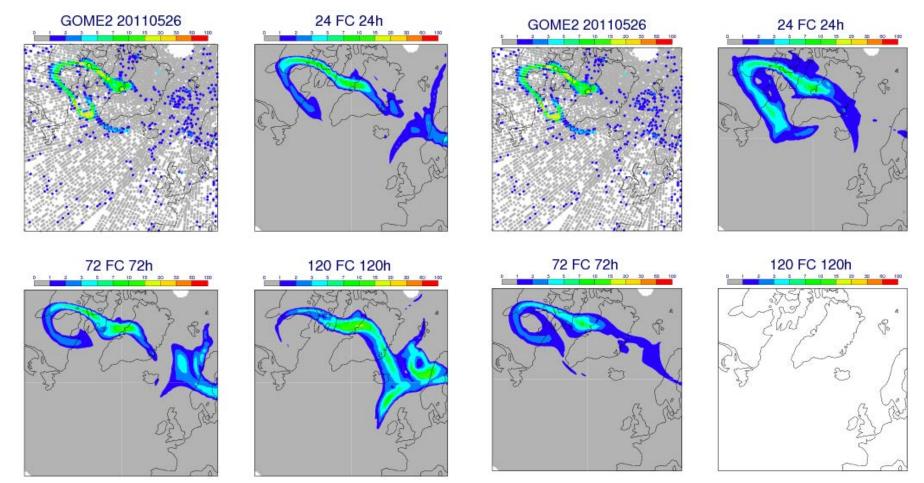
- Threshold based exceedance hits/miss/false alarm
- Plume size (w.r.t to threshold) independent of overlap



### Forecast Lead Time 24, 72 & 120 hours

EMI



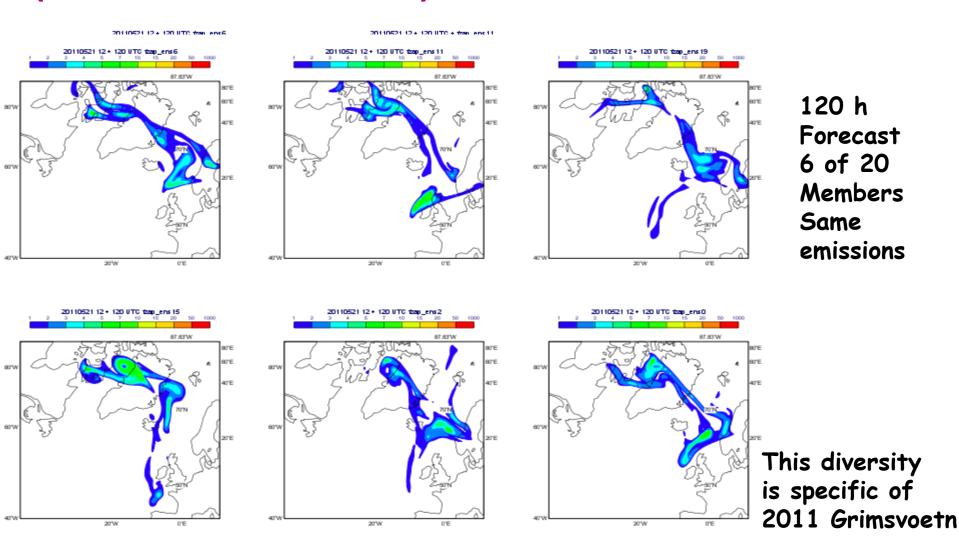


#### Quality of meteo forecast was very important for plume forecast



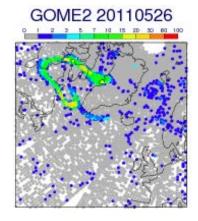
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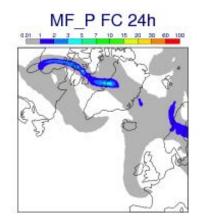
#### Meteorological Ensemble Forecast (T639L91 20 Members)





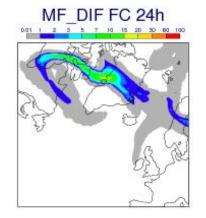
### **Model Numerics and Transport**

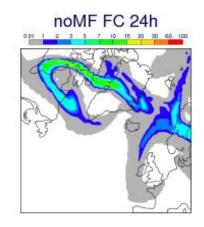




Different mass fixers

Model transport has difficulties to maintain the high observed values after the end of eruption.







#### **Current Status of Response to Volcanic Eruptions with MACC system**

| Automated, no intervention   | NRT intervention (working hours)  | 1-2 day delay intervention   |
|--|---|--|
| <ul> <li>Assimilation of OMI<br/>SO<sub>2</sub> retrievals<br/>prescribed heights</li> <li>Assimilation of<br/>MODIS AOD in<br/>existing aerosols</li> </ul> | <ul> <li>Emit SO<sub>2</sub> and ash in<br/>model at volcano<br/>location using ad-hoc<br/>emission estimate</li> <li>Relax QC and reduce<br/>thinning for assimilated<br/>MODIS observations</li> <li>Active assimilation of<br/>TRM SO<sub>2</sub> retrieval<br/>(GOME-2, OMI)</li> </ul> | <ul> <li>Estimate SO<sub>2</sub><br/>emission rate and<br/>injection height<br/>based on UV-VIS<br/>satellite retrievals</li> <li>Rerun MACC<br/>system for<br/>eruption period<br/>with improved<br/>settings and<br/>emission estimates</li> </ul> |

MACC has no mandate to volcano forecast but the MACC products might be useful for VAAC etc.



### Summary

- MACC Data assimilation system picks up automatically volcanic ash and SO<sub>2</sub> plumes if they are observed
- The DA assimilation requires emission rate and injection height estimates (ash) or only injection height (SO<sub>2</sub>) estimate
- A method to estimate injection height and emission rate from SO<sub>2</sub> retrievals using an ensemble of test plumes has been developed
- Combing emission estimate and initial value data assimilation provided best results for SO<sub>2</sub> plume forecasts.
- Uncertainty of meteorological forecast and SO<sub>2</sub> lifetime is less important than emission parameters but still influential
- Ensembles of forecasts might be useful to express uncertainty of emission estimates, in particular after forecast start time



#### **References:**

SO<sub>2</sub>:

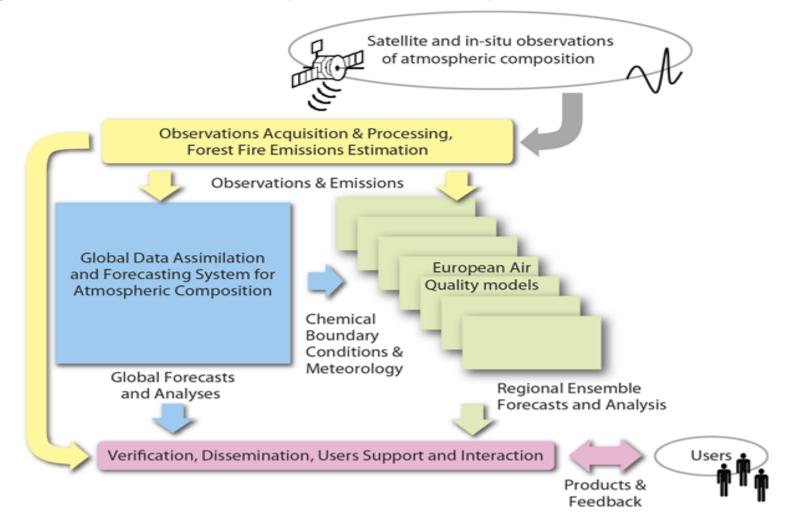
Flemming, J., and A. Inness (2013), Volcanic sulfur dioxide plume forecasts based on UV satellite retrievals for the 2011 Grímsvötn and the 2010 Eyjafjallajökull eruption, J. Geophys. Res. Atmos., 118, doi:10.1002/jgrd.50753.

AOD:

Benedetti, A., J. W. Kaiser, J-J. Morcrette, R. Eresmaa and S. Lu (2011), Simulations of volcanic plumes with the ECMWF/MACC aerosol system, December 2011, ECMWF Technical Memorandum, 653,



# MACC system – A global-to-regional forecasting system for atmospheric composition





# Grimsvötn (21-24.5.2011 eruption) – well sustained plume for over two weeks

