



The vertical distribution of volcanic SO₂ plumes measured by IASI

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Anu Dudhia¹, MariLiza Koukoulis⁴, Dimitris Balis⁴

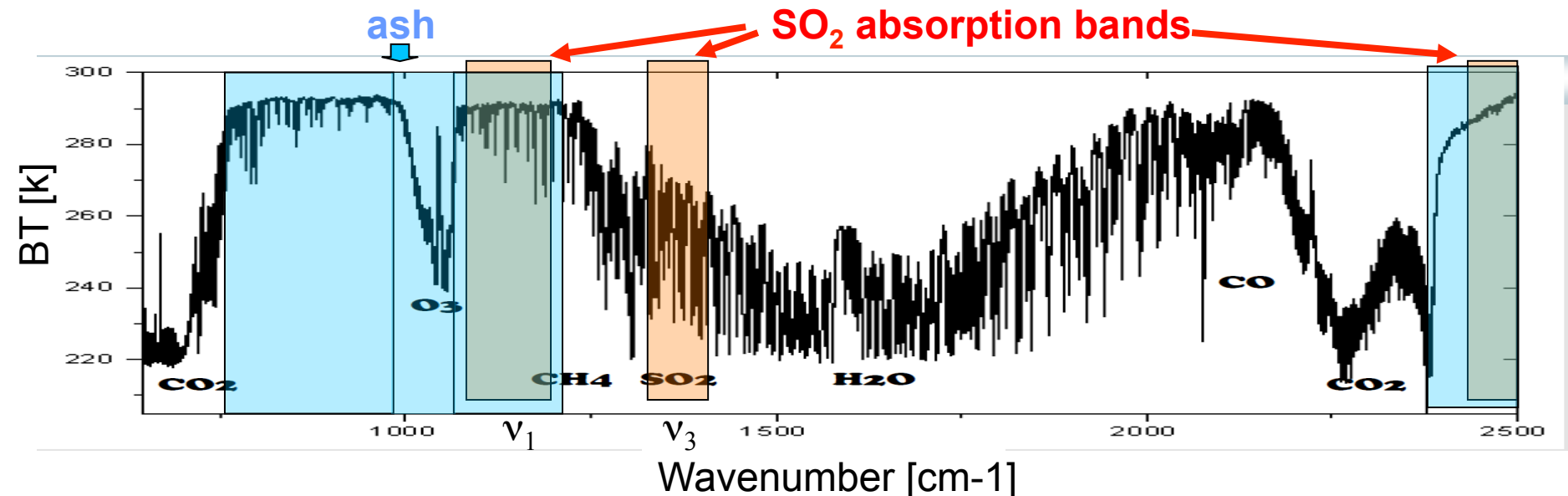
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- (2) COMET, Department of Earth Science, University of Oxford, UK.
- (3) Rutherford Appleton Laboratory, Didcot, United Kingdom.
- (4) Laboratory of Atmospheric Physics, Aristotle University of Thessaloniki, Greece

Infrared Atmospheric Sounding Interferometer - IASI

IASI is on board of METeorological OPERational satellite program (METOP-A and METOP-B), a European meteorological satellite that has been operational since 2007.

IASI is a Fourier transform spectrometer, that measures the **spectral range 645 to 2760 cm^{-1} ($3.62\text{--}15.5\mu\text{m}$)** with a spectral sampling of 0.25 cm^{-1} and an apodised spectral resolution of 0.5 cm^{-1} . Radiometric accuracy is 0.25-0.58K. The IASI field of view (FOV) consists **of four circles of 12 km diameter (at nadir) inside a square of 50 x 50 km**.

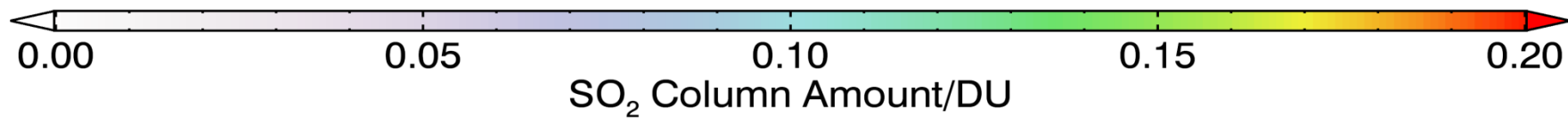
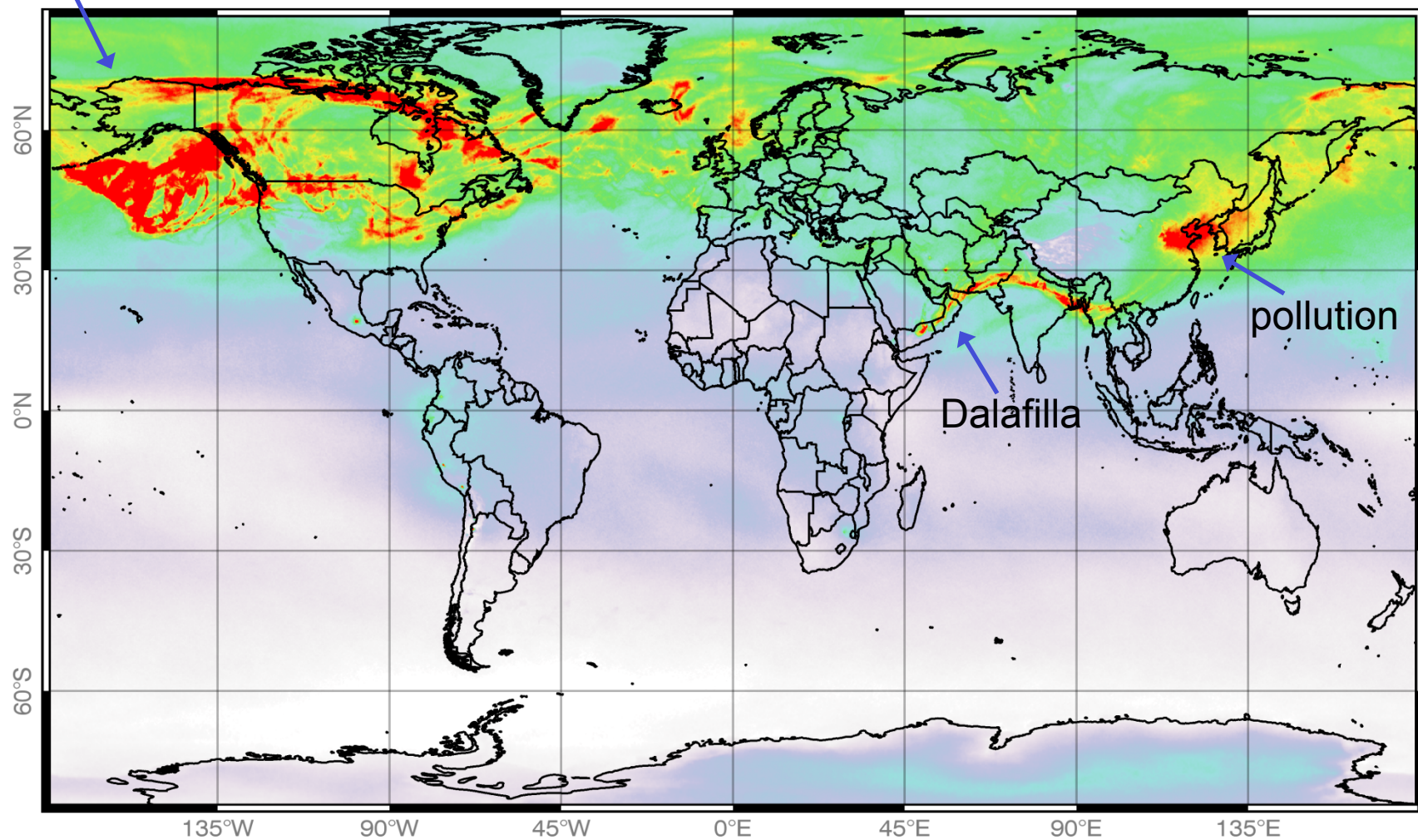
It has a 2000 km swath and nominally can achieved **global coverage in 12 hours** (although there are some gaps between orbits at tropical latitudes). Radiances are collocated with the Advanced Very High Resolution Radiometer (AVHRR) that provides complementary visible/near infrared channel, for cloud and aerosol retrievals.



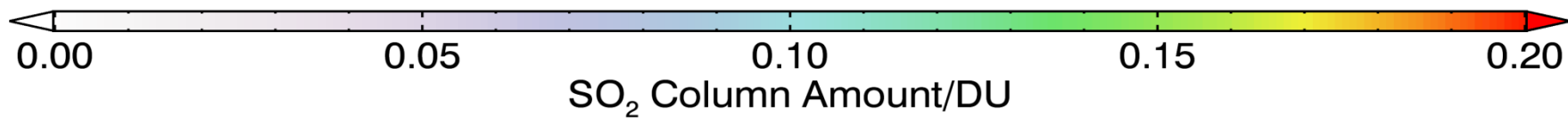
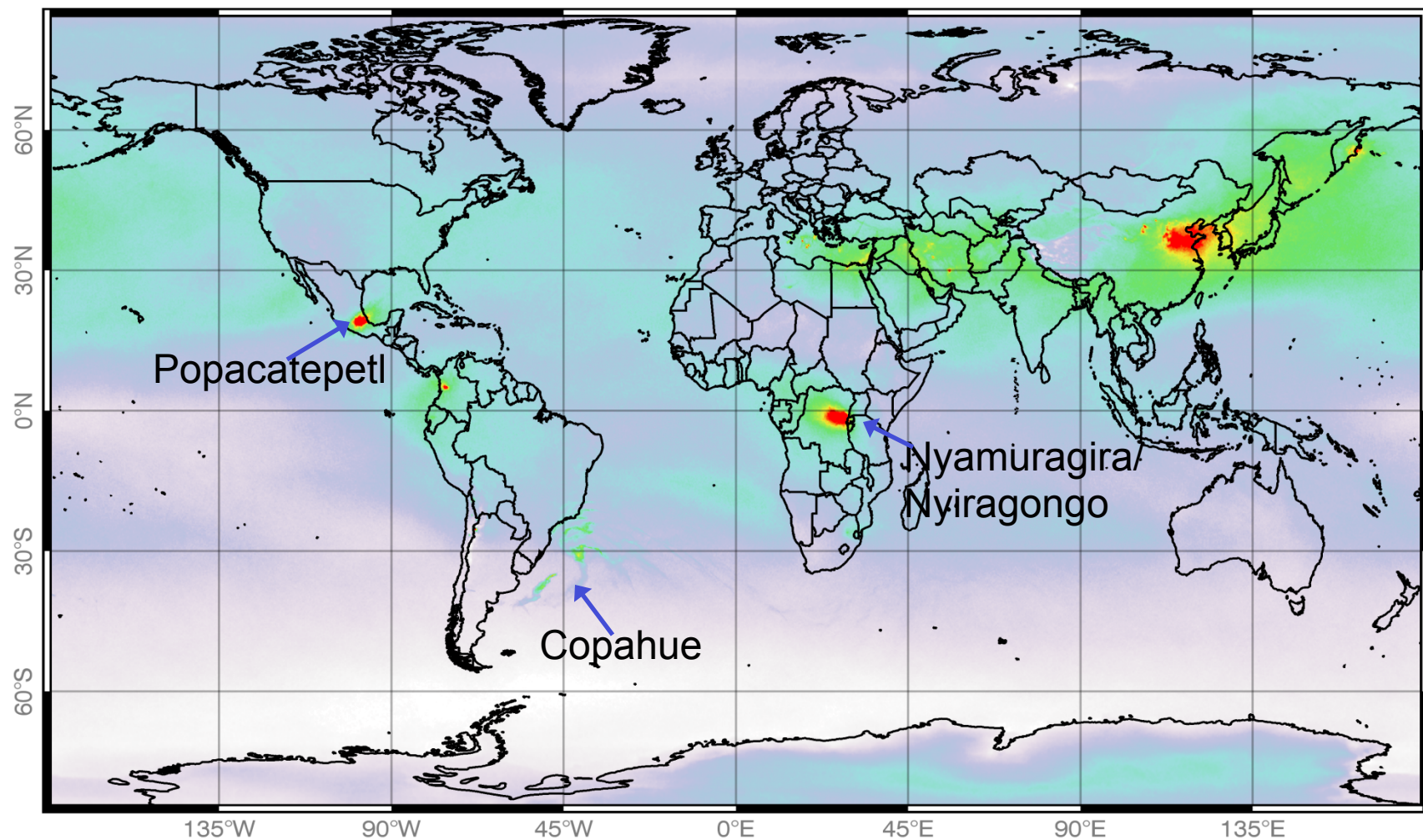
Kasatochi

2008 Global Average

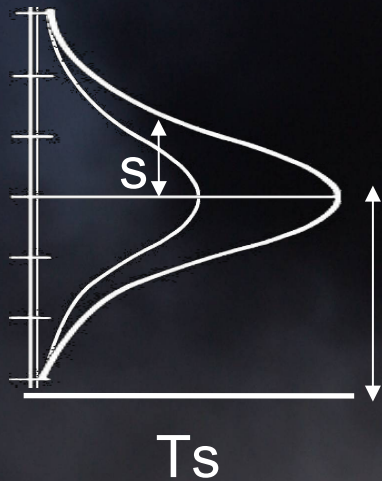
Detection, NOT quantitative!



2012 Global Average



SO₂ Retrieval scheme



State vector:

- Total column amount of SO₂
- Altitude H
- ~~Thickness s~~
- Surface temperature T_s

+ ECMWF profile (temperature, h₂O, p, z)

$F(x)$

Forward model: fast radiative transfer (RTTOV + SO₂ RAL coefficients)

IASI simulated spectra

y is the measurement vector, x the state vector
 $F(x)$ forward model, S_y error covariance matrix

$$J = (y - F(x))^T S_y^{-1} (y - F(x)) + (x - x_a)^T S_a^{-1} (x - x_a)$$

IASI measurements



OE retrieval



best estimate of state vector:
SO₂ amount, plume altitude, T_s

$$S_y(i,j) = \langle (y_{mi} - \overline{y_{mi}}) - (\overline{y_{mi}} - \overline{y_{si}}) \rangle \langle (y_{mj} - \overline{y_{mj}}) - (\overline{y_{mj}} - \overline{y_{sj}}) \rangle$$

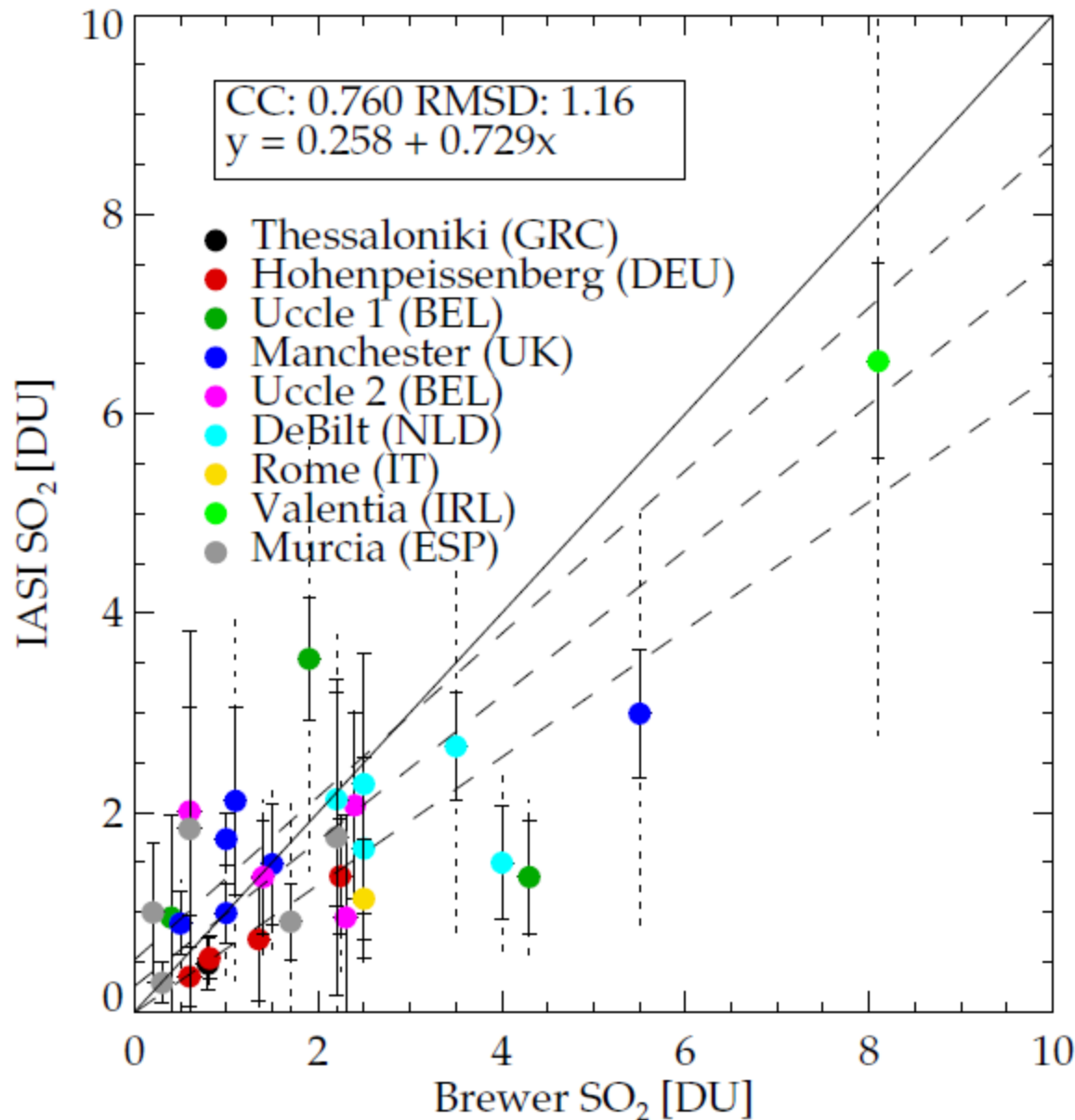
$$y_s = F(\text{SO}_2=0)$$

S_y Computed with
billions pixels

S_y is defined to represent the effects of atmospheric variability not represented in the forward model (FM), as well as instrument noise (cloud and trace-gases...).

The matrix is constructed from differences between FM calculations (for clear-sky) and actual IASI observations for wide range of conditions, when we are confident that negligible amounts of SO₂ are present.

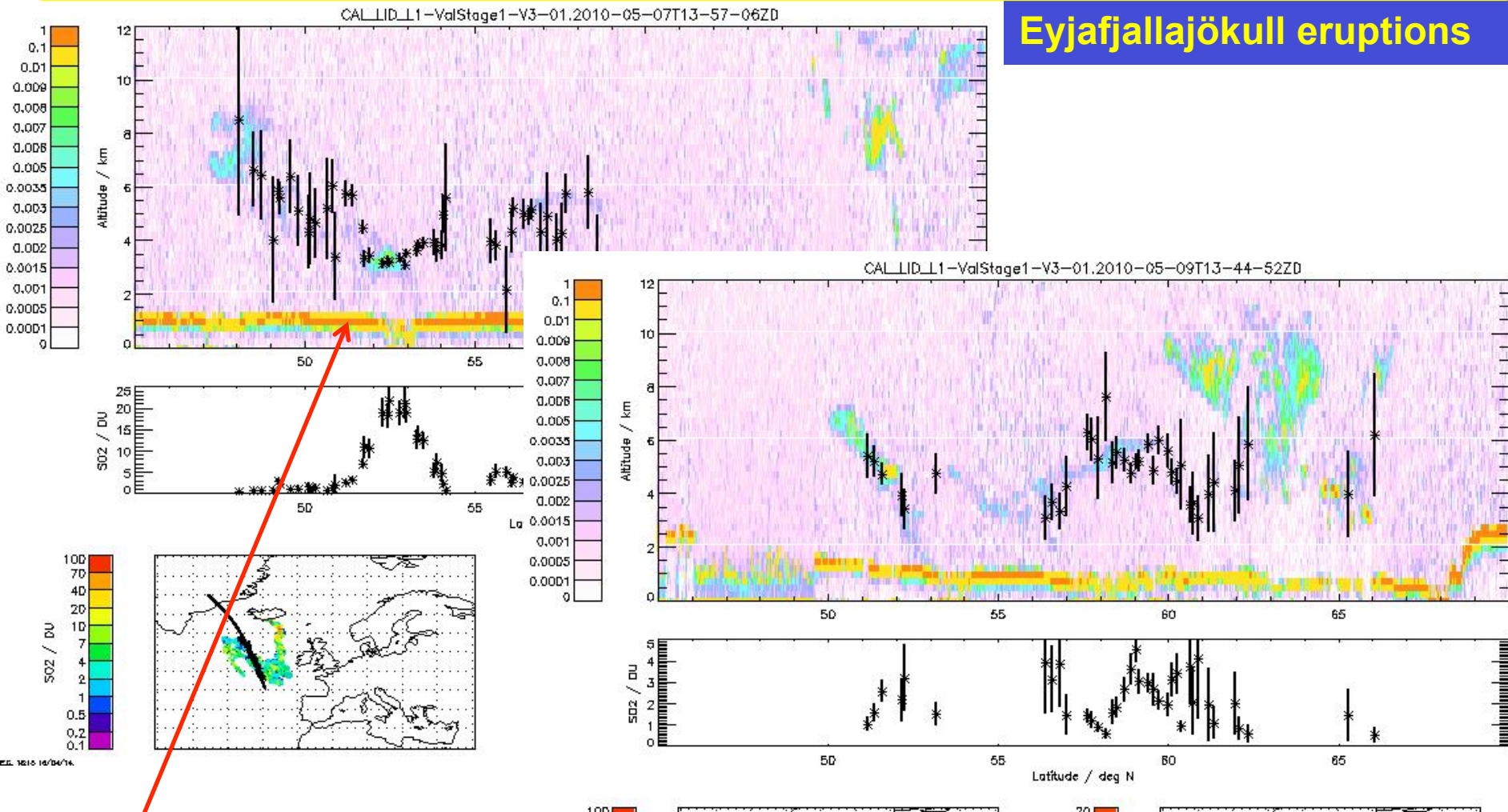
Comparison with Brewer ground data



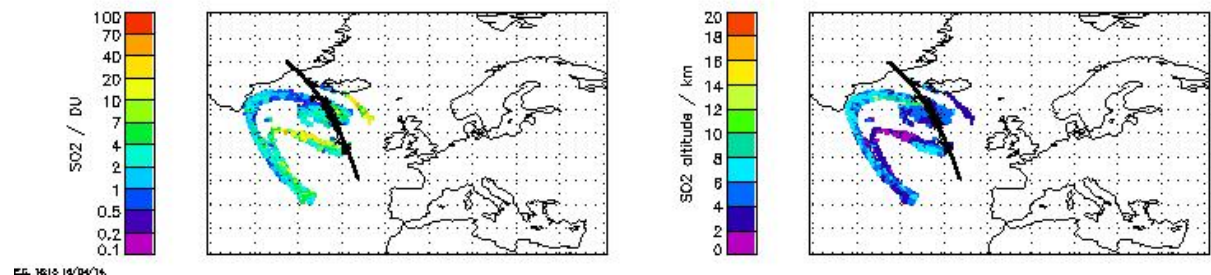
Scatter plot of IASI SO₂ measurements, averaged within a distance of 200 km from the ground station, versus the daily SO₂ column amount, measured from Brewer spectrometers. Different colours correspond to a different ground station. Black error-bars are the IASI average errors; dotted error-bars are the standard deviation of the IASI data within the selected distance. Black lines represent the ideal line $y=x$; dotted lines are the best fits with error in the best fit

Height comparison with CALIOP

Eyjafjallajökull eruptions

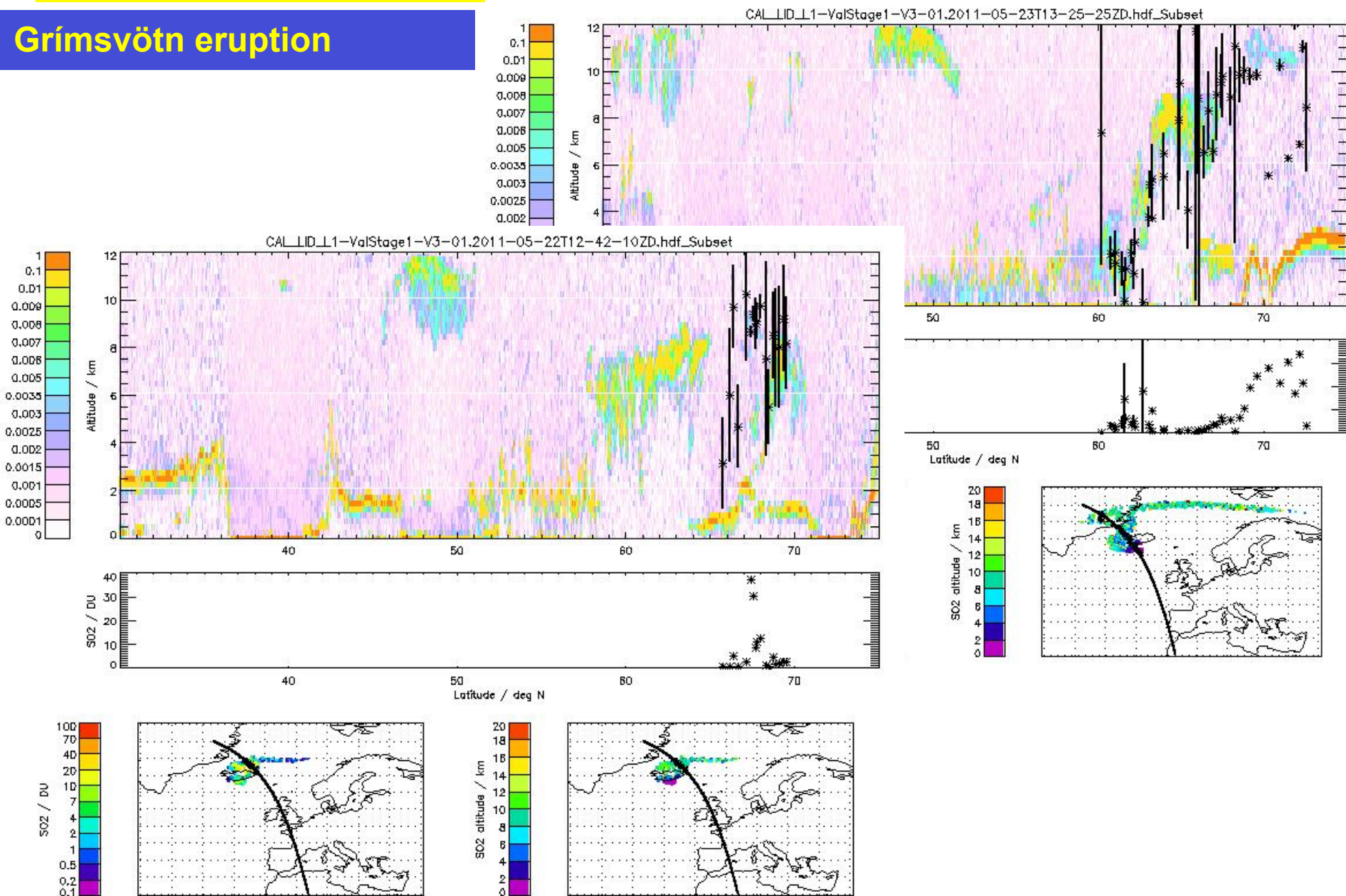


Note that underlying cloud doesn't affect the retrieval

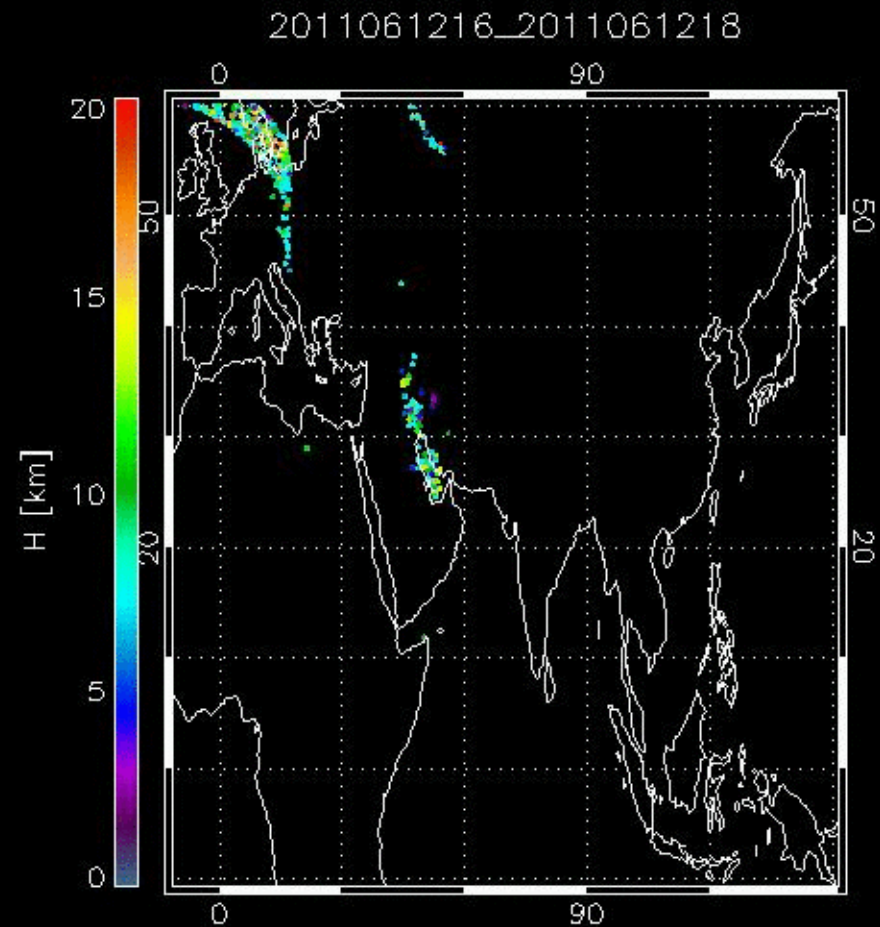
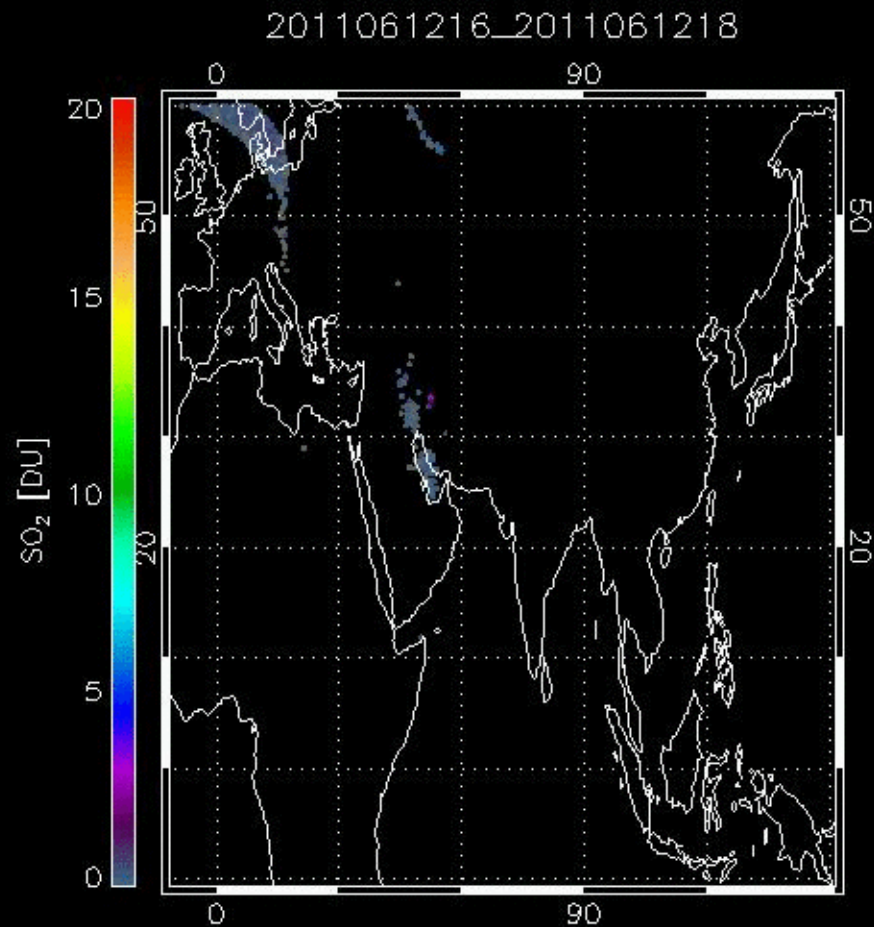


Height comparison with CALIOP

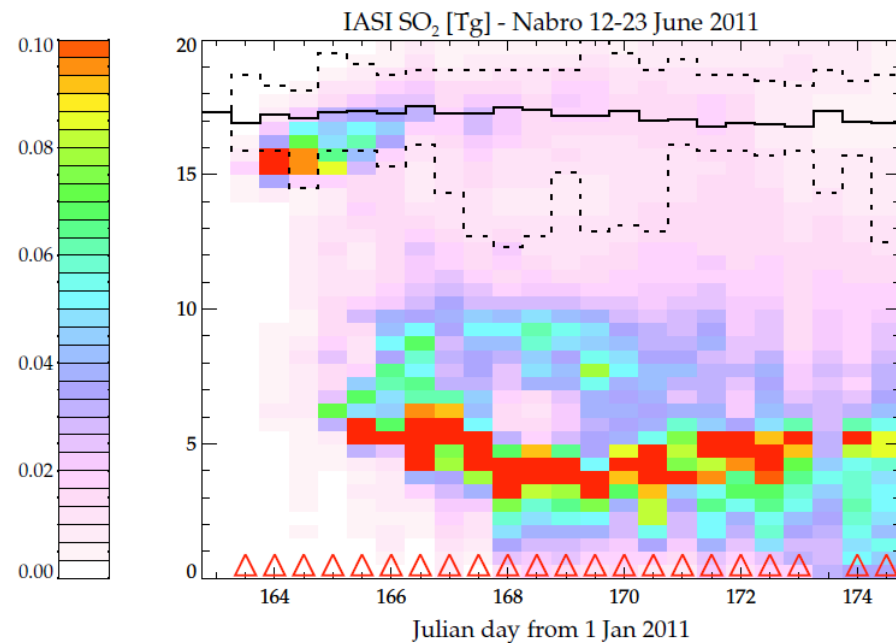
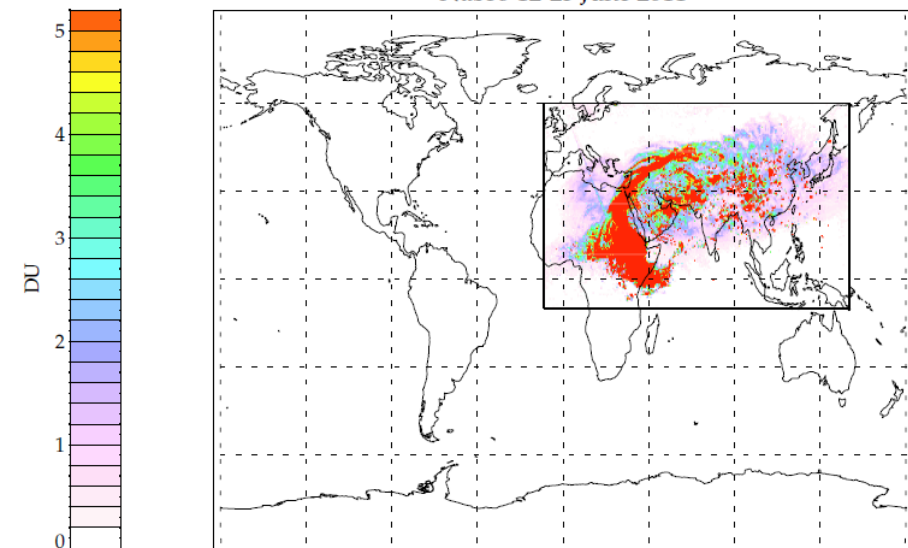
Grímsvötn eruption



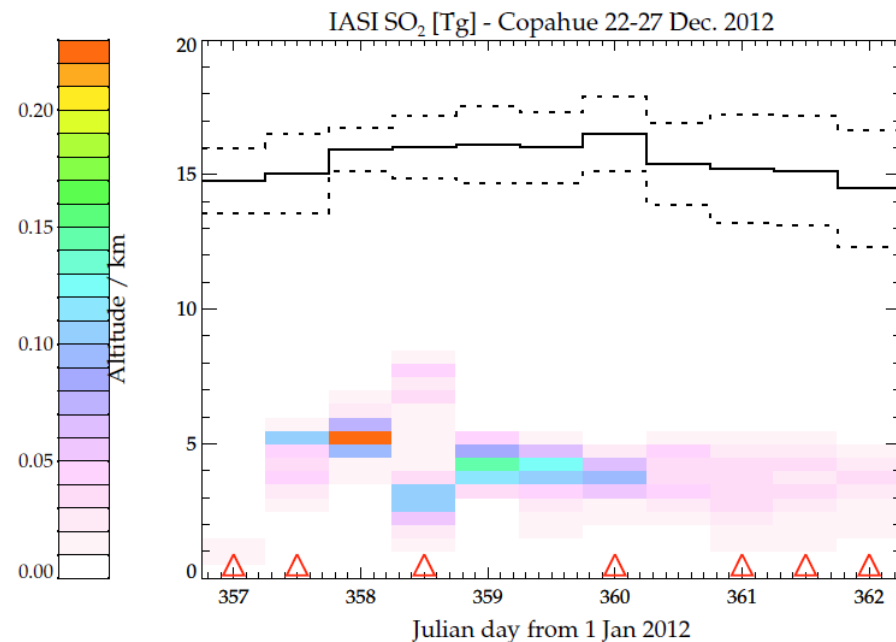
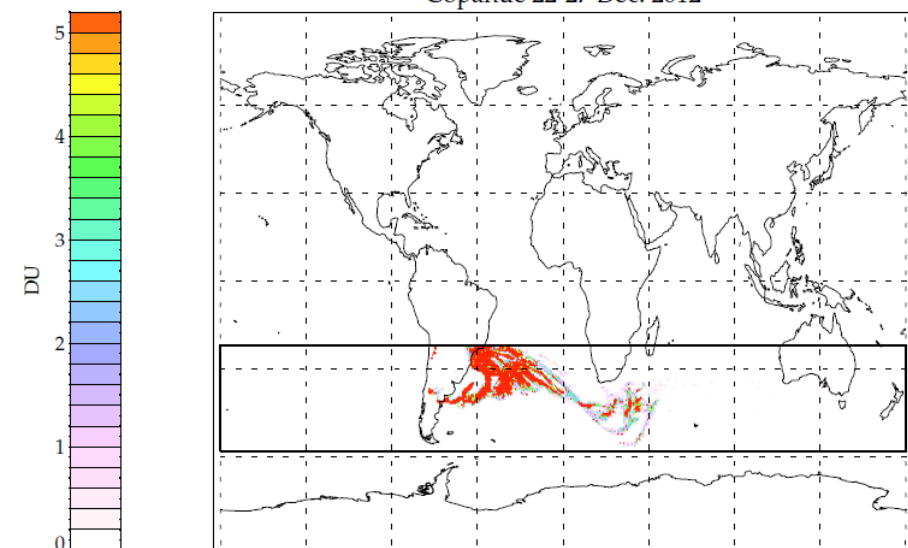
Nabro eruption 13-24 June 2011



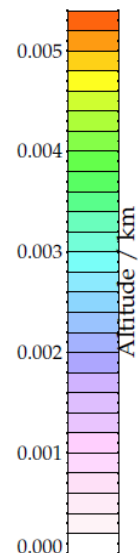
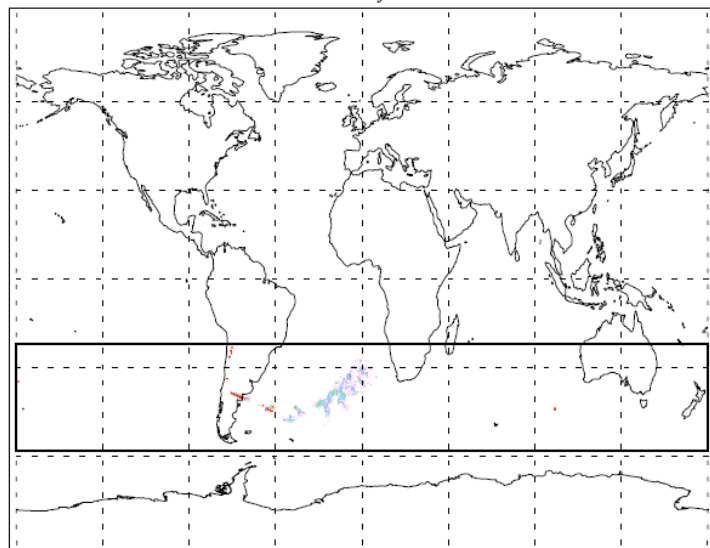
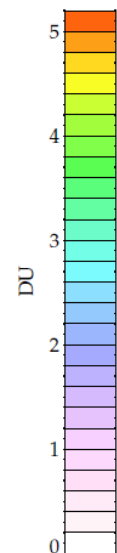
Nabro 12-23 June 2011



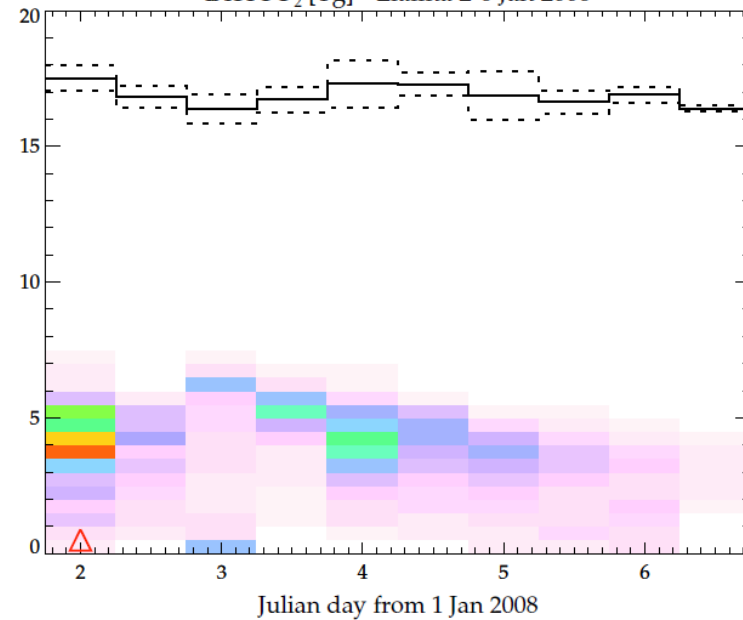
Copahue 22-27 Dec. 2012



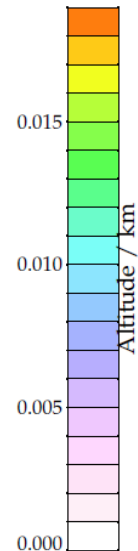
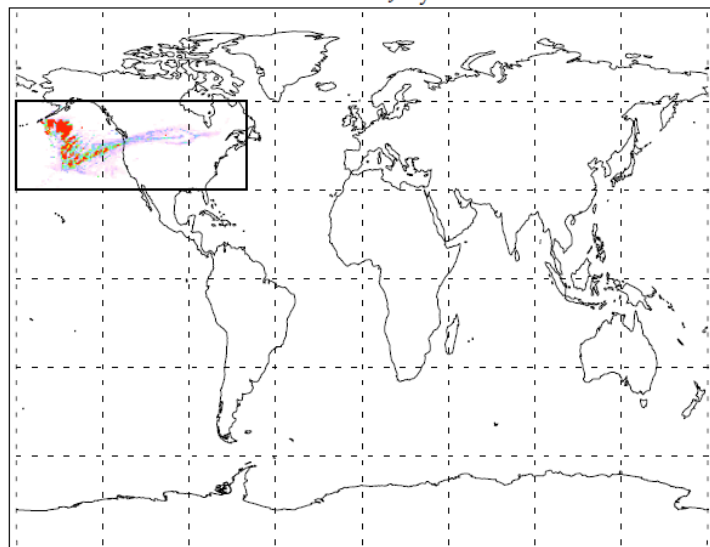
Llaima 2-6 Jan 2008



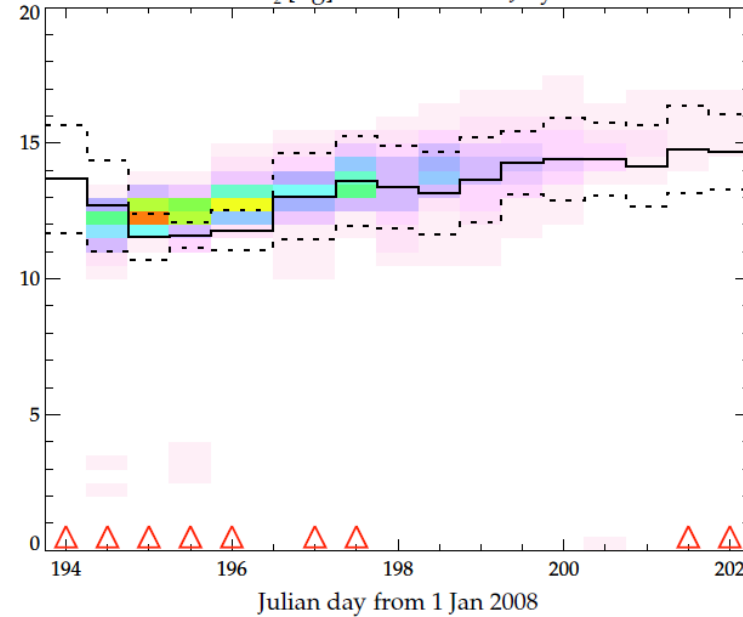
IASI SO₂ [Tg] - Llaima 2-6 Jan 2008



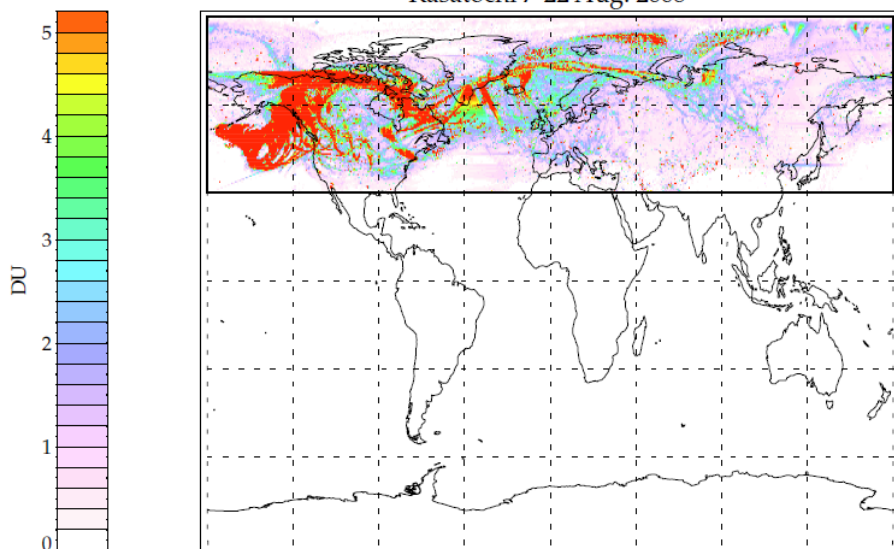
Okmok 12-20 July 2008



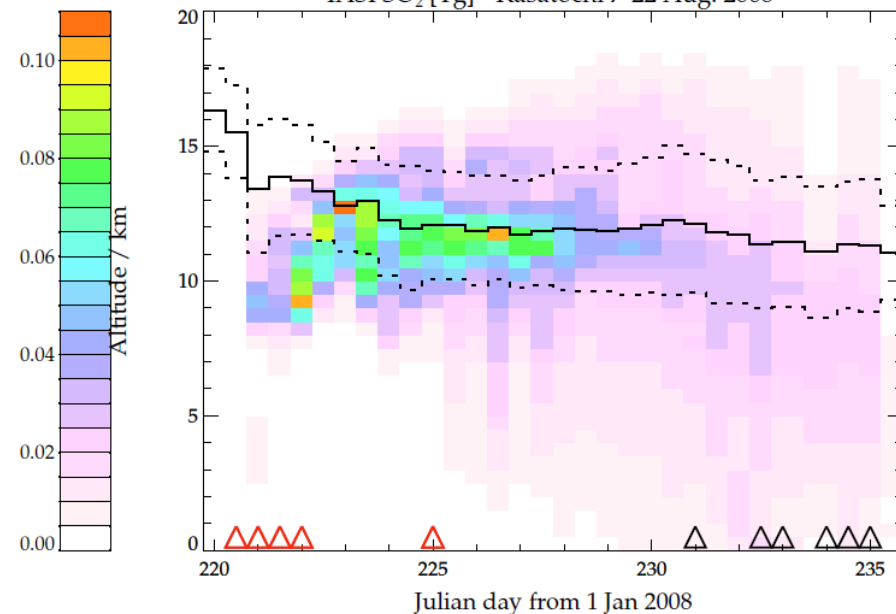
IASI SO₂ [Tg] - Okmok 12-20 July 2008



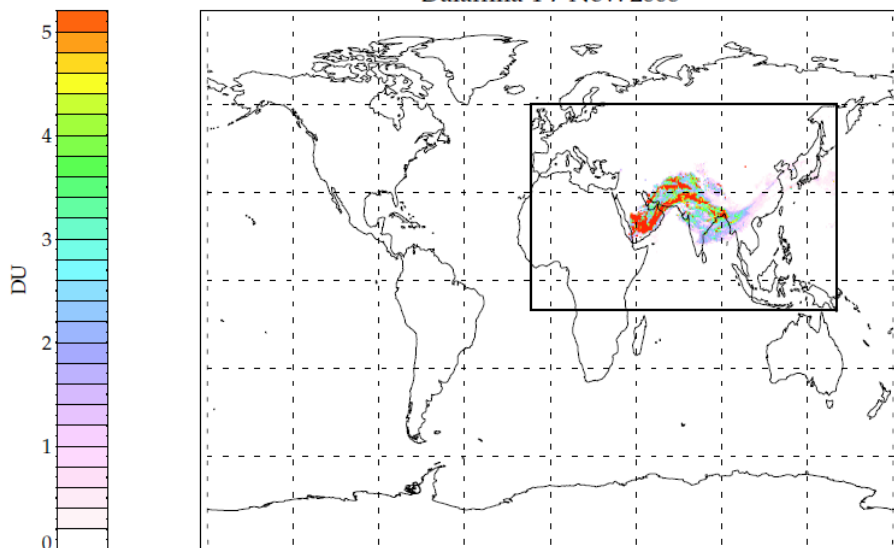
Kasatochi 7-22 Aug. 2008



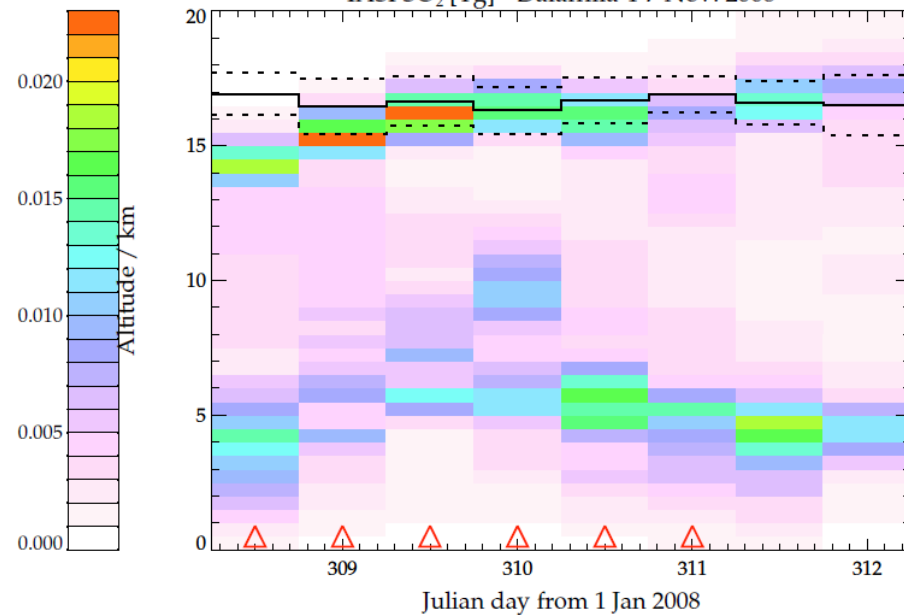
IASI SO₂ [Tg] - Kasatochi 7-22 Aug. 2008



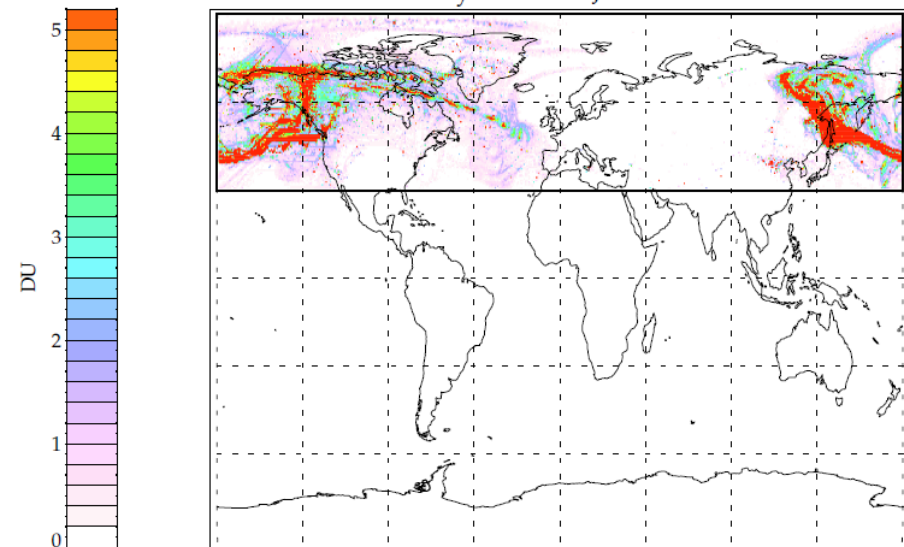
Dalaffilla 4-7 Nov. 2008



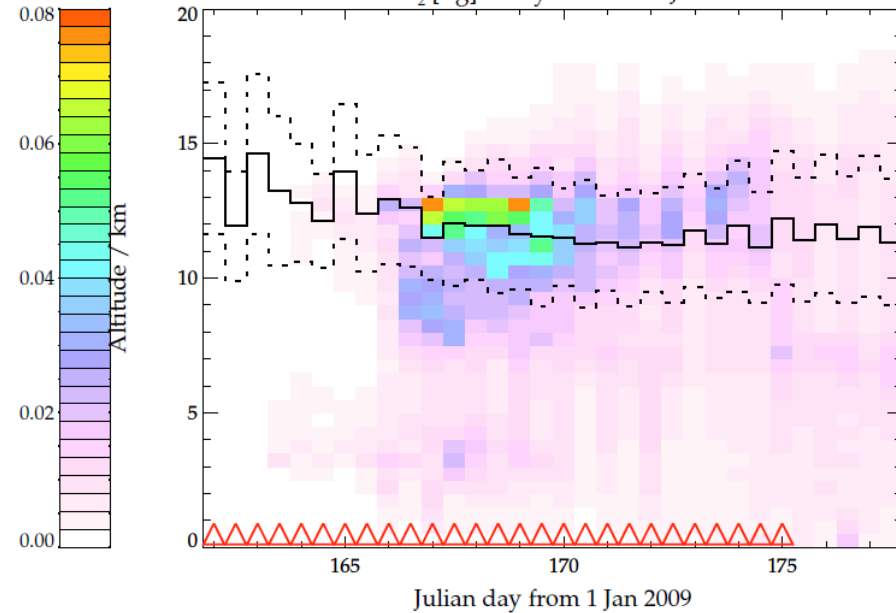
IASI SO₂ [Tg] - Dalaffilla 4-7 Nov. 2008



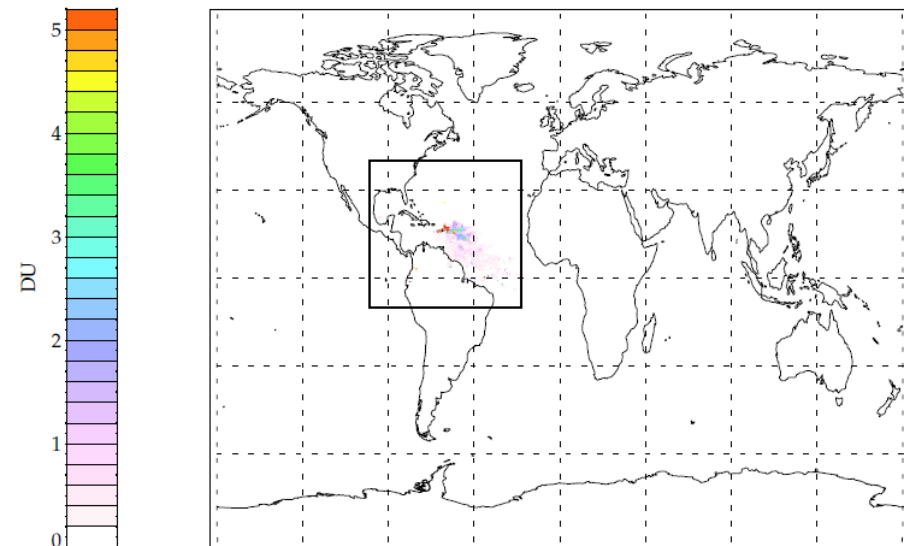
Sarychev 11-26 June 2009



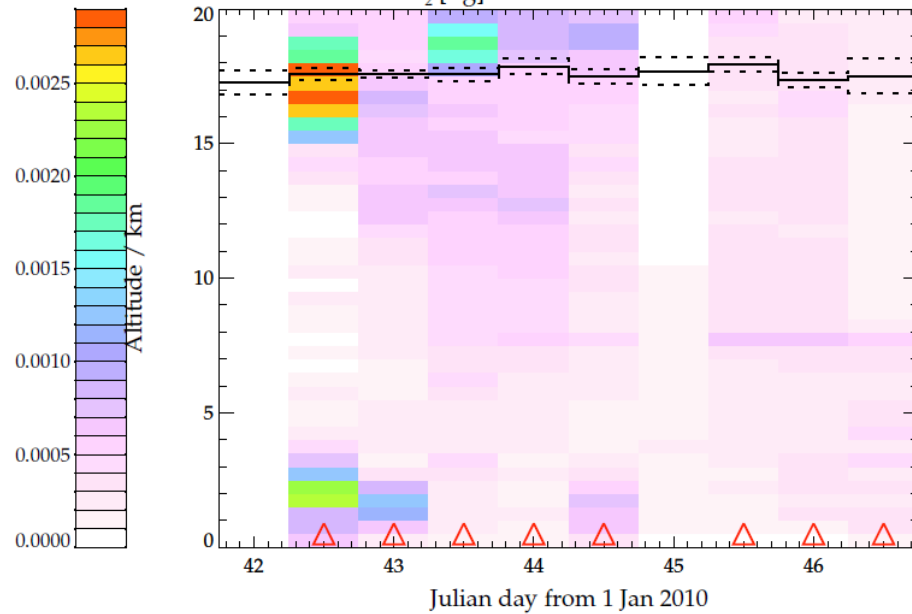
IASI SO₂ [Tg] - Sarychev 11-26 June 2009



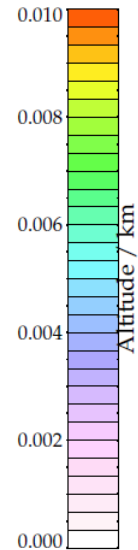
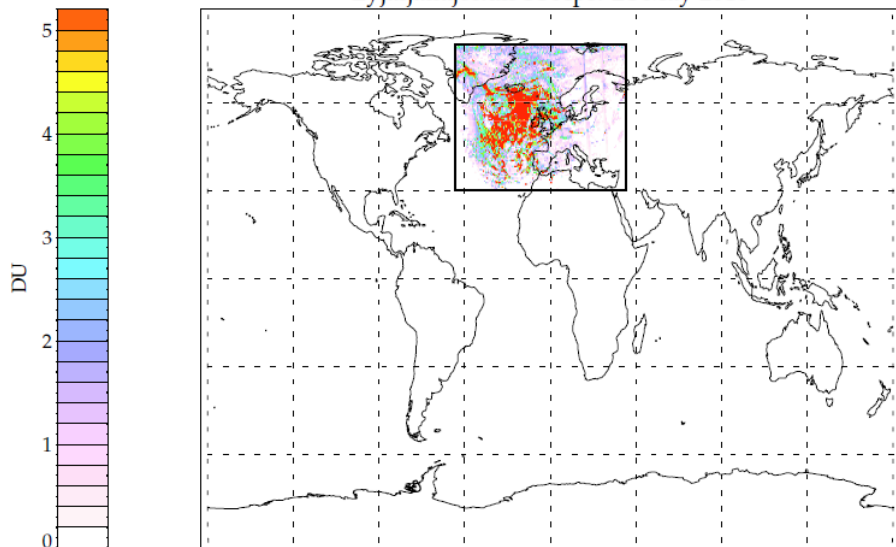
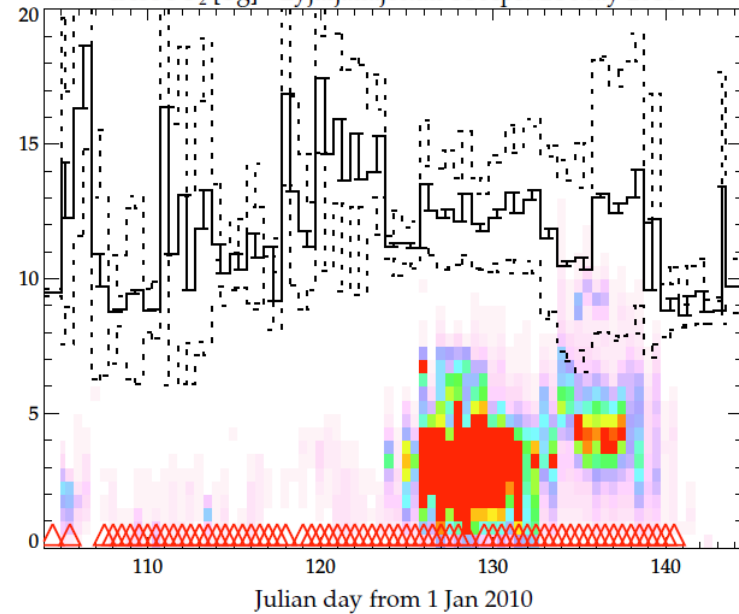
Montserrat 10-15 Feb 2010



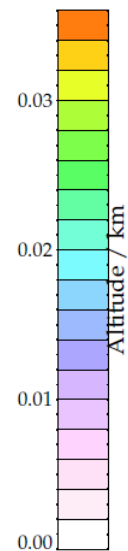
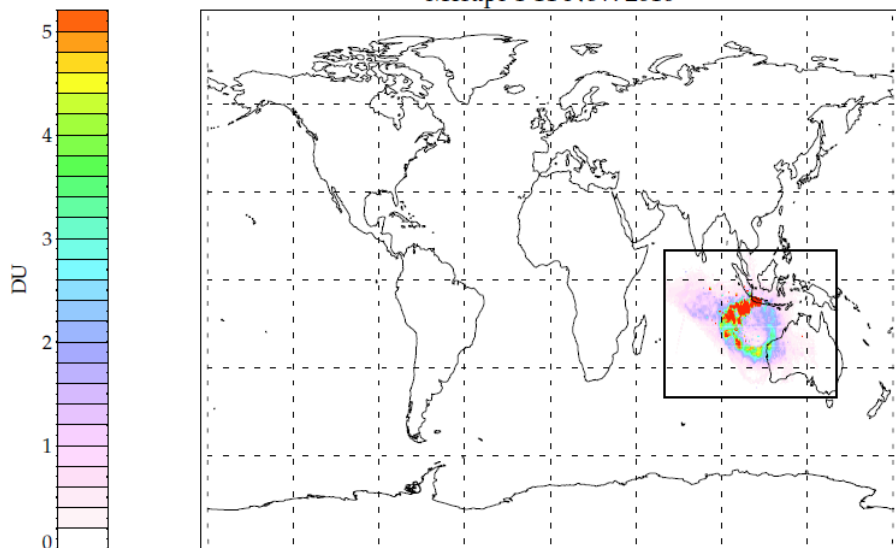
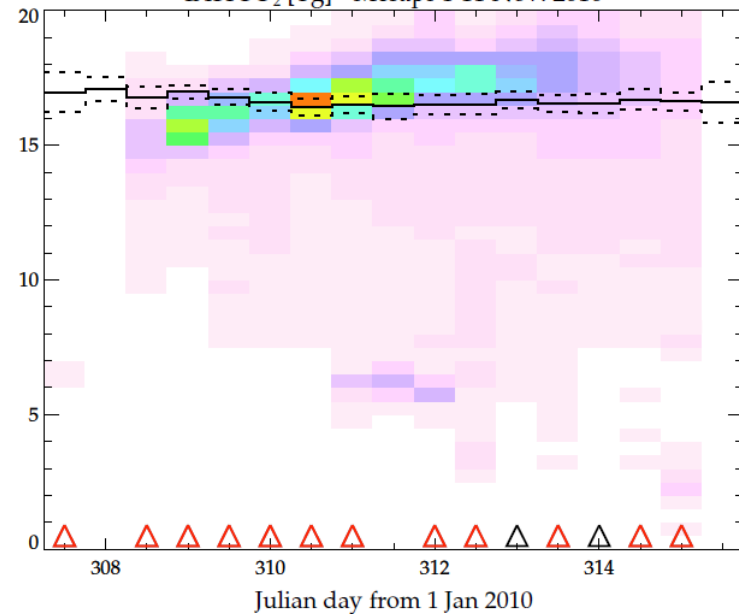
IASI SO₂ [Tg] - Montserrat 10-15 Feb 2010



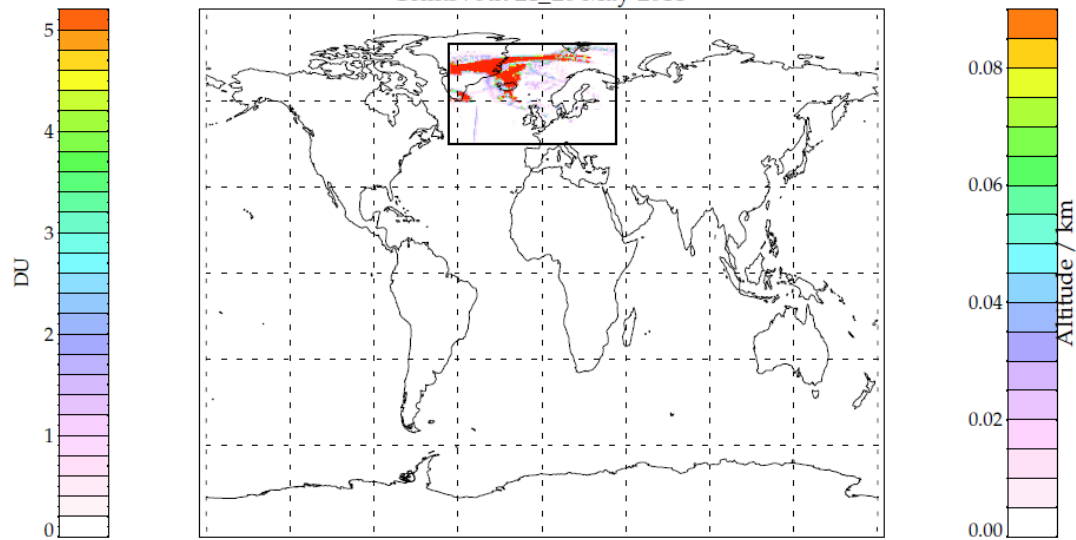
Eyjafjallajökull 14 Apr.-24 May 2010

IASI SO₂ [Tg] - Eyjafjallajökull 14 Apr.-24 May 2010

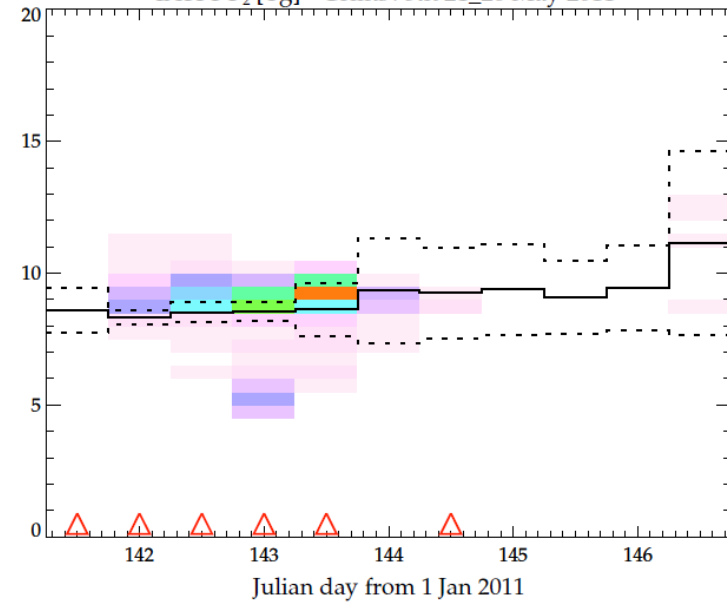
Merapi 4-11 Nov. 2010

IASI SO₂ [Tg] - Merapi 4-11 Nov. 2010

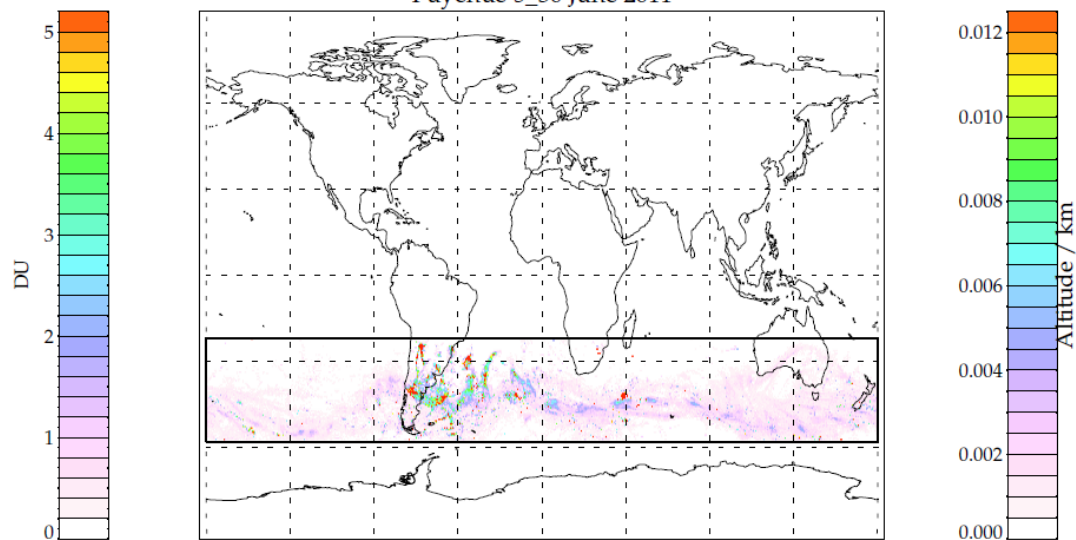
Grimsvothn 21_26 May 2011



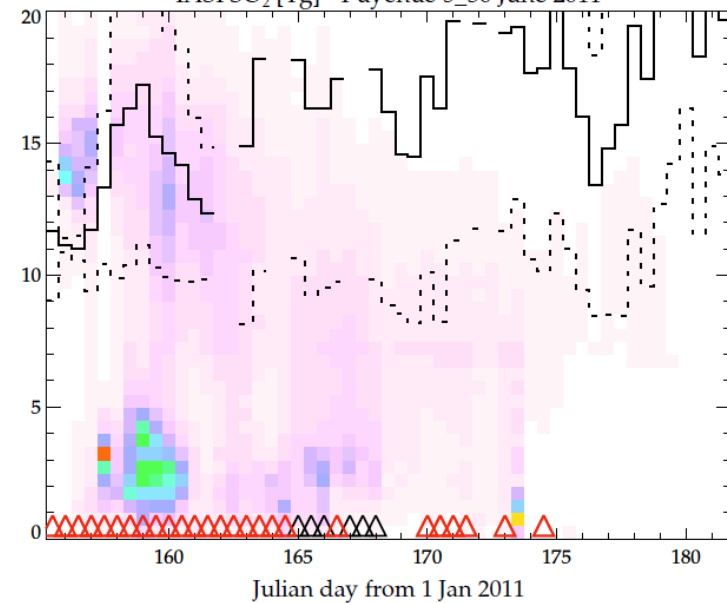
IASI SO₂ [Tg] - Grimsvothn 21_26 May 2011



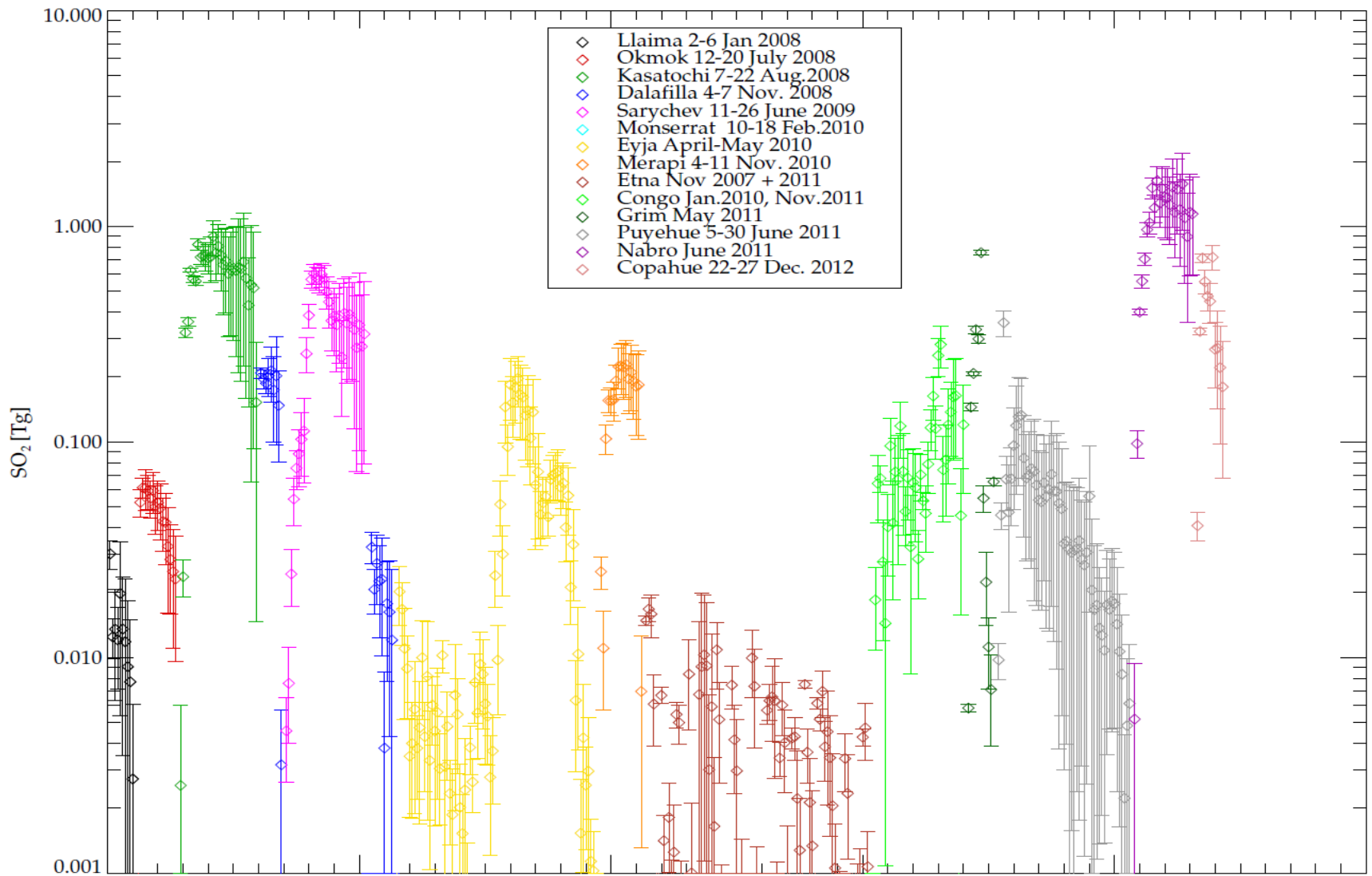
Puyehue 5_30 June 2011



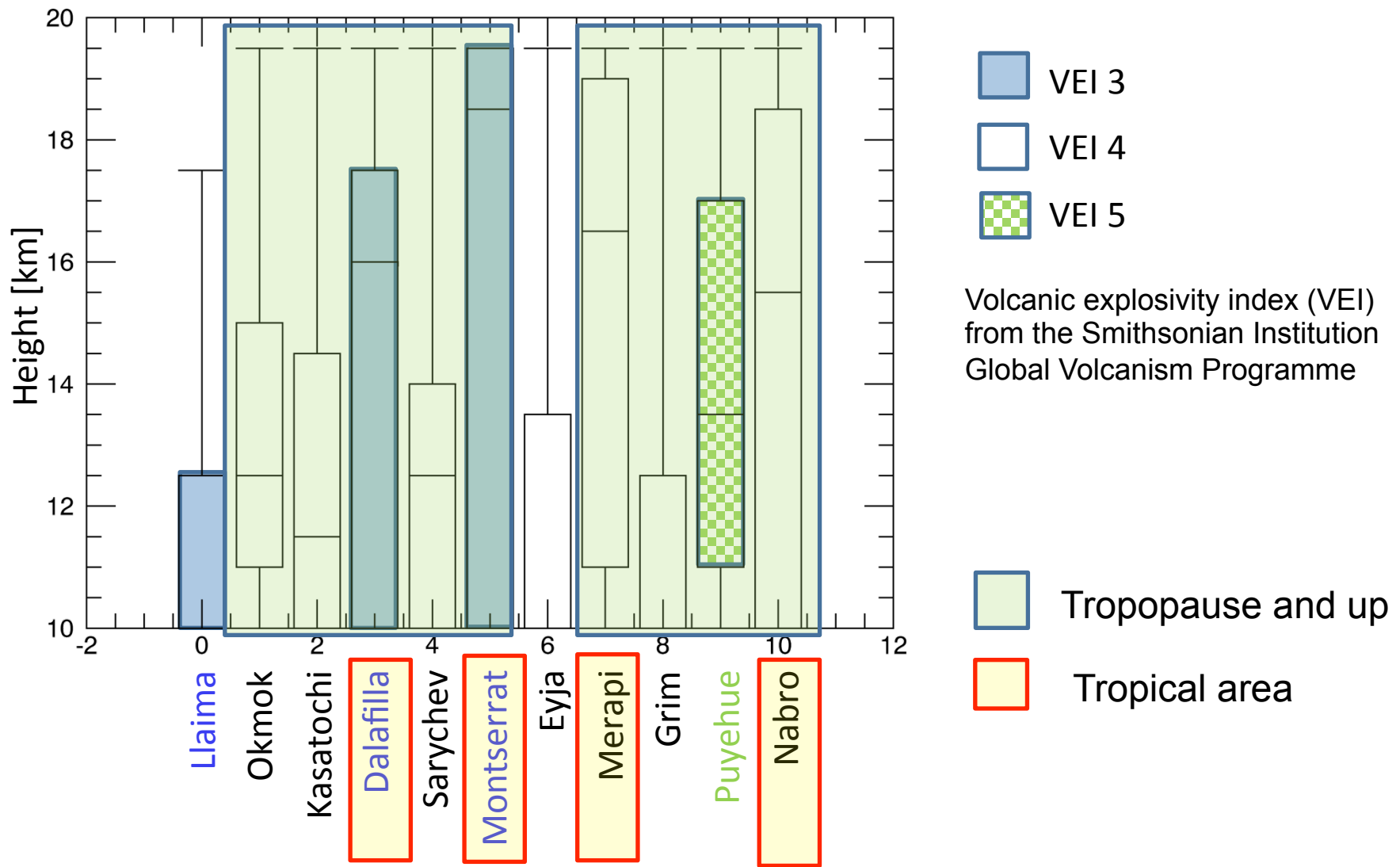
IASI SO₂ [Tg] - Puyehue 5_30 June 2011



SO₂ total mass



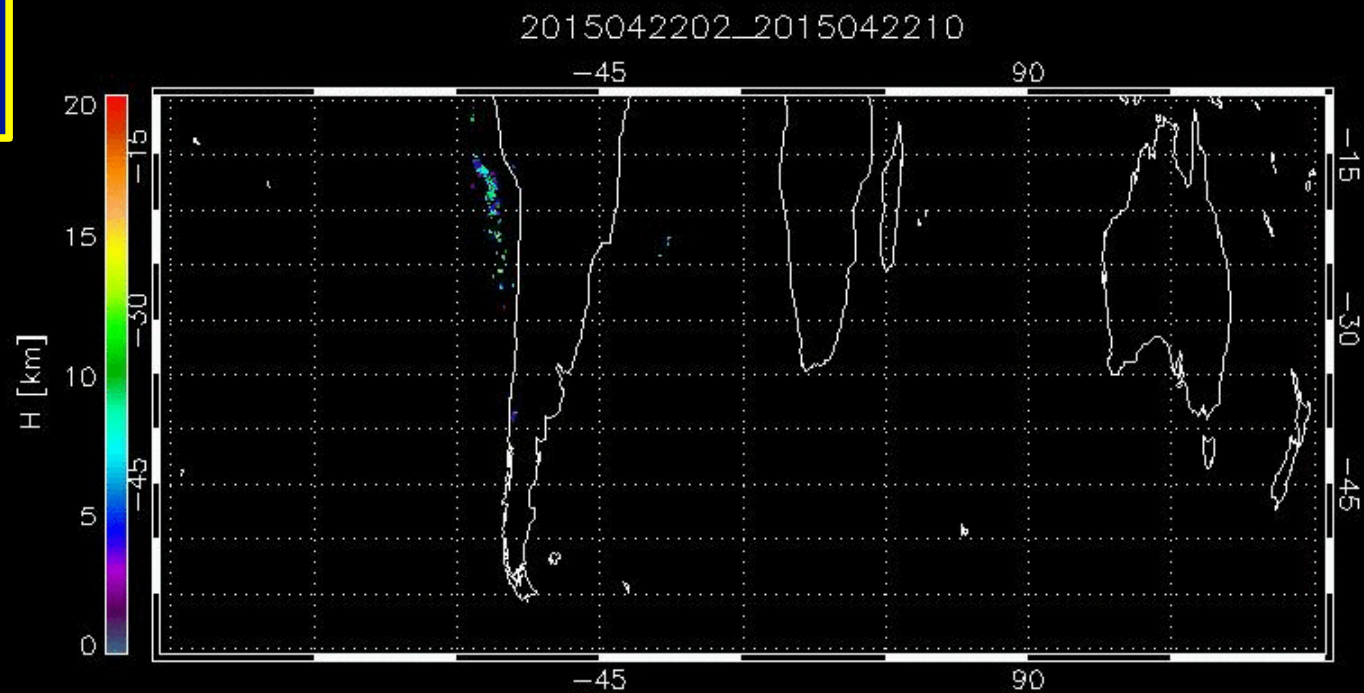
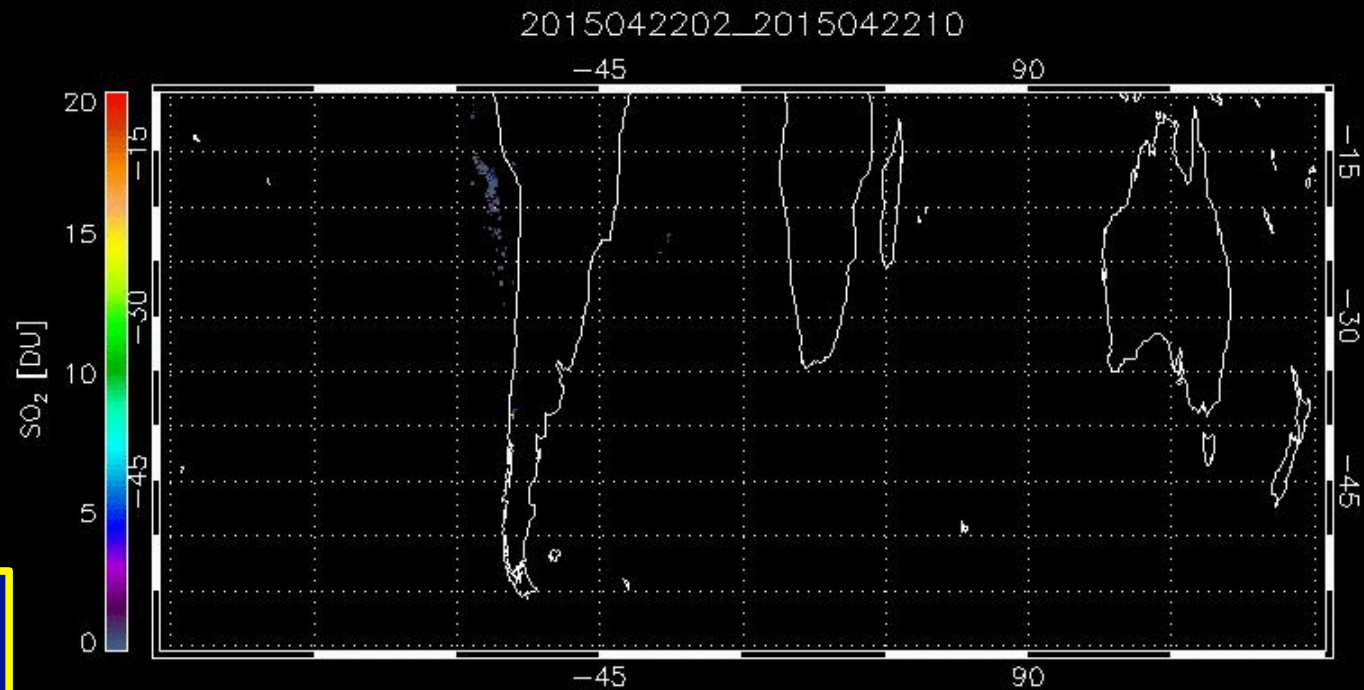
SO₂ retrieved from IASI data. The values are the measured amount on a particular day and vary with volcanic emission, gas removal and satellite sampling. Points are separated by ~12 hours.



VEI is a poor index of the potential height to which volcanic SO₂ is injected.

All of the eruptions in the tropics (except Nyamuragira, VEI 1,2), reached the tropopause.

Calbuco
22 April -
20 May 2015



Summary

SO₂ detection: (AMT Walker et al 2011, JRL Walker et al 2012)

Very fast => global survey tool

=> show emission from volcanic eruptions, anthropogenic source and degassing.

- IASI archive 2007-2014
- NRT processing

SO₂ iterative: (ACP Carboni et al 2012, ACP Carboni et al. 2016)

We use simultaneously channel between 1000-1200 cm⁻¹ and 1300-1410 cm⁻¹ (v1 and v3 SO₂ absorption band)

- retrieve both column amount and altitude for volcanic plume.
- IASI retrieved values are consistent with CALIPSO altitudes and Brewers column amount
- we can study the plume vertical distributions, and evolution in time.
- There is a tendency for volcanic SO₂ plumes to reach the tropopause. (All of the eruptions in the tropics (except Nyamuragira) reached the tropopause).

More papers using this IASI SO₂:

Schmidt et al. 2015 - Bardabunga

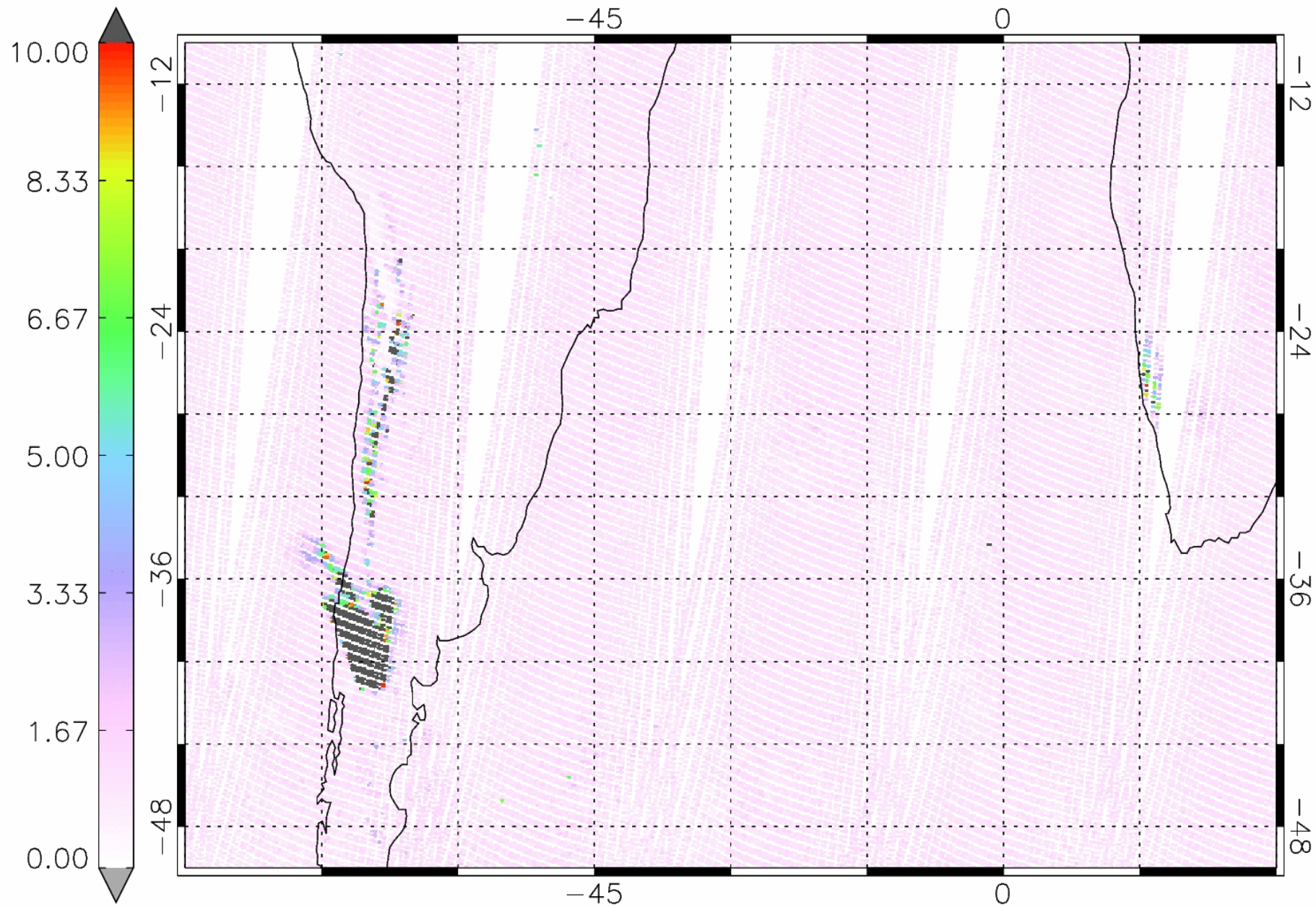
Fromm et al 2014 – Nabro

Koukouli et al 2015, Spinetti et al 2015, Sears et al. 2013

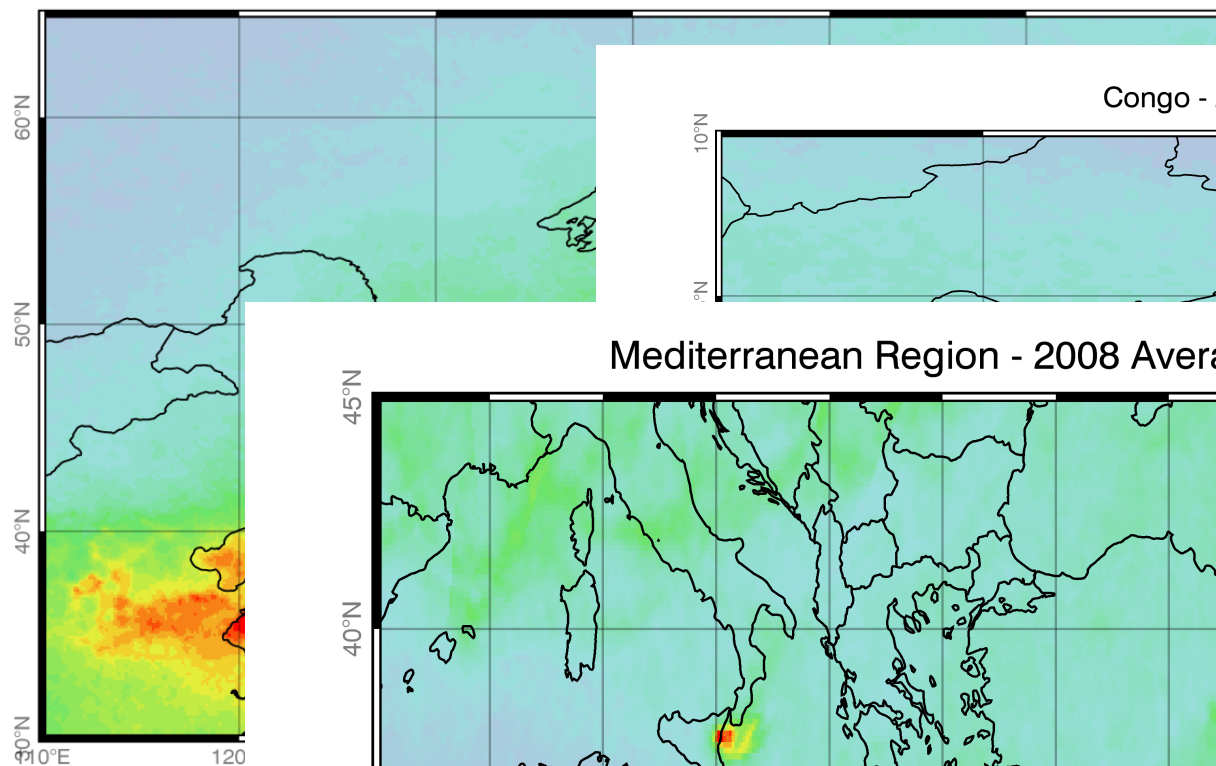
Dataset is available (elisa@atm.ox.ac.uk)

Thank you!

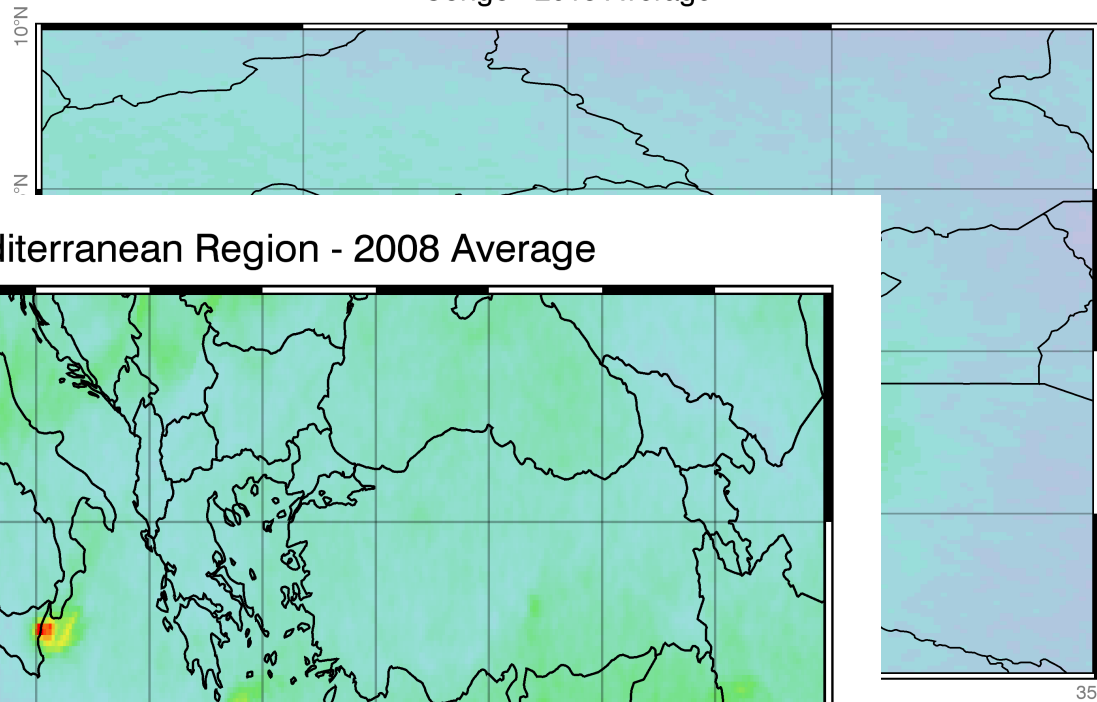
20150423 (day), ret_tau-x0



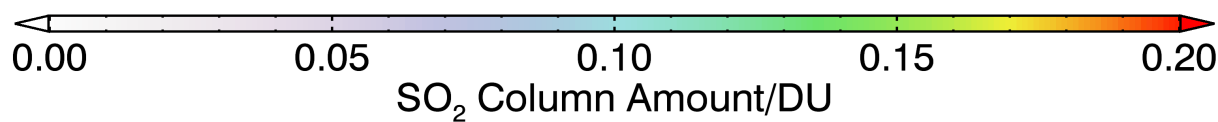
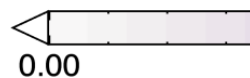
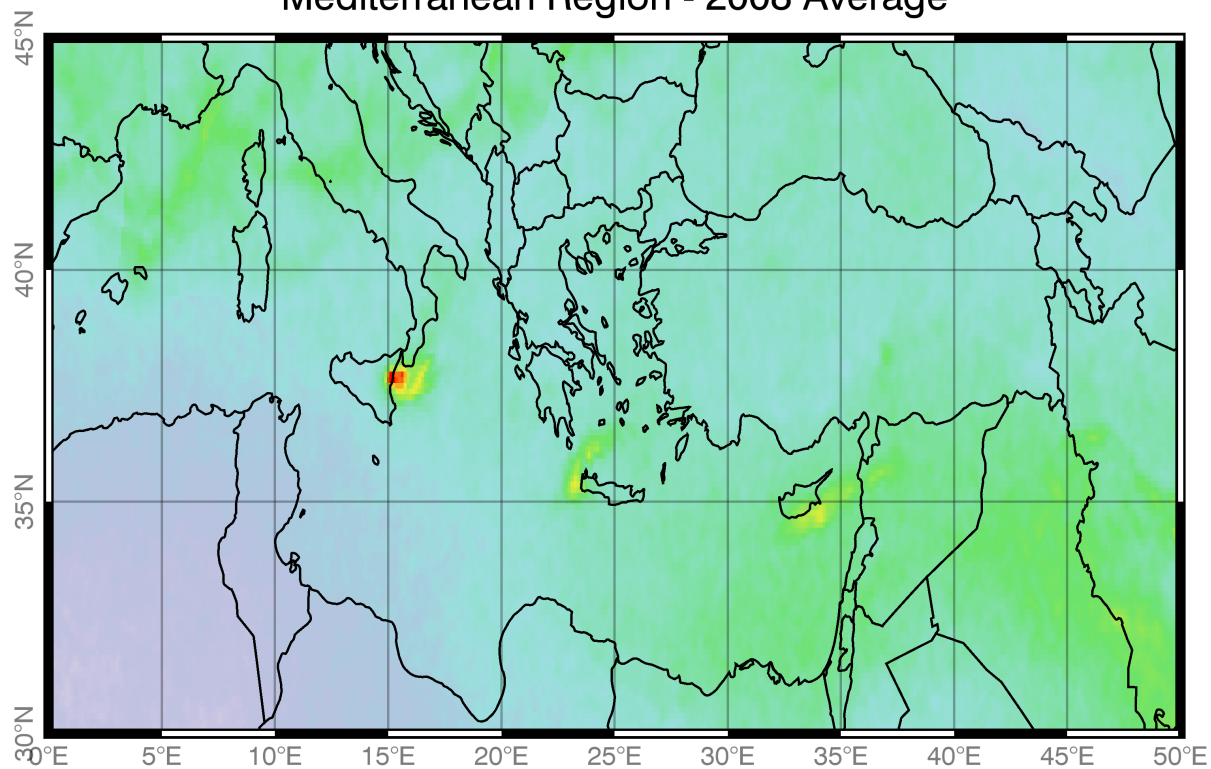
China and Kamchatka -2007 Average



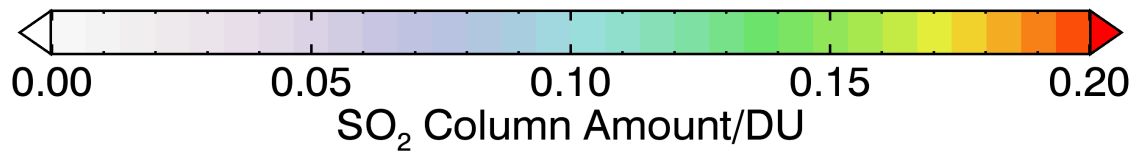
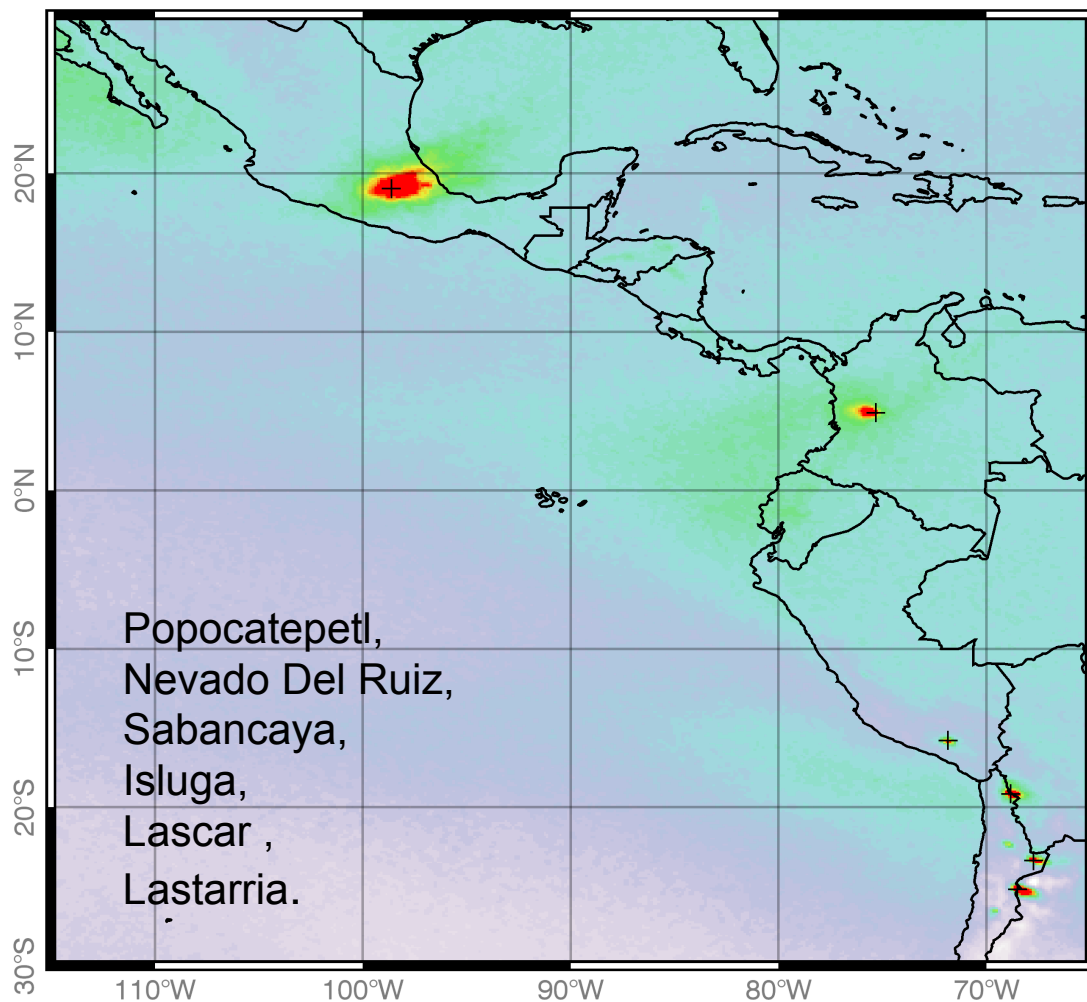
Congo - 2013 Average



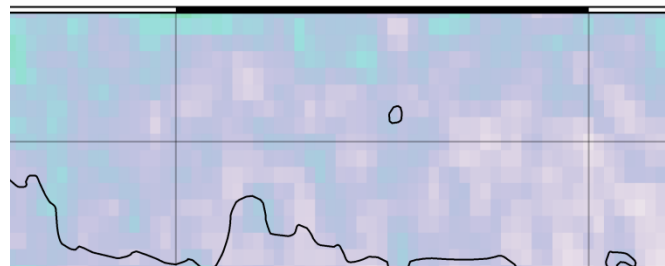
Mediterranean Region - 2008 Average



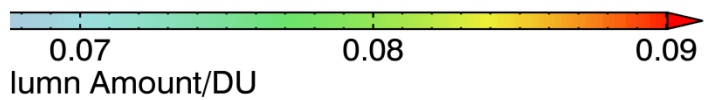
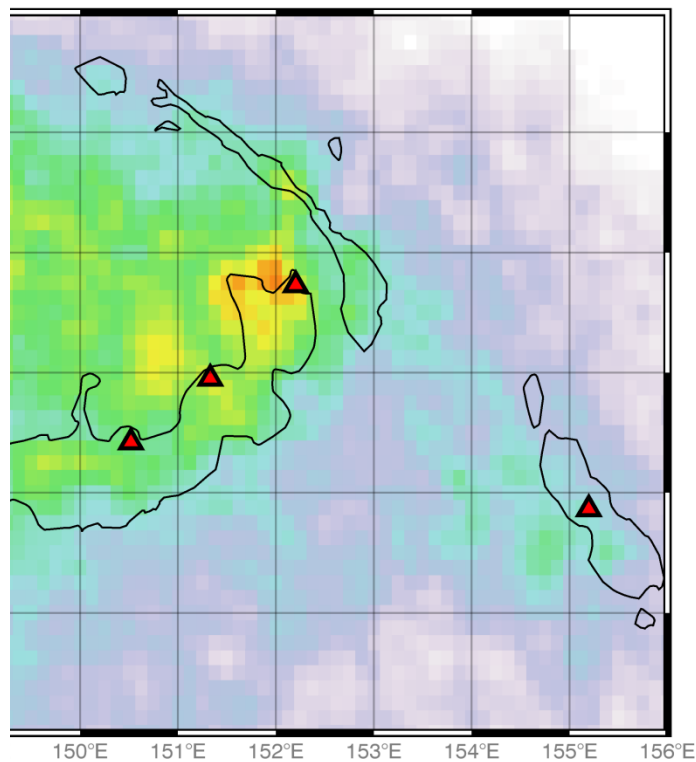
Central and South America - 2013 Average



Java Average 2008



Guinea Average 2008

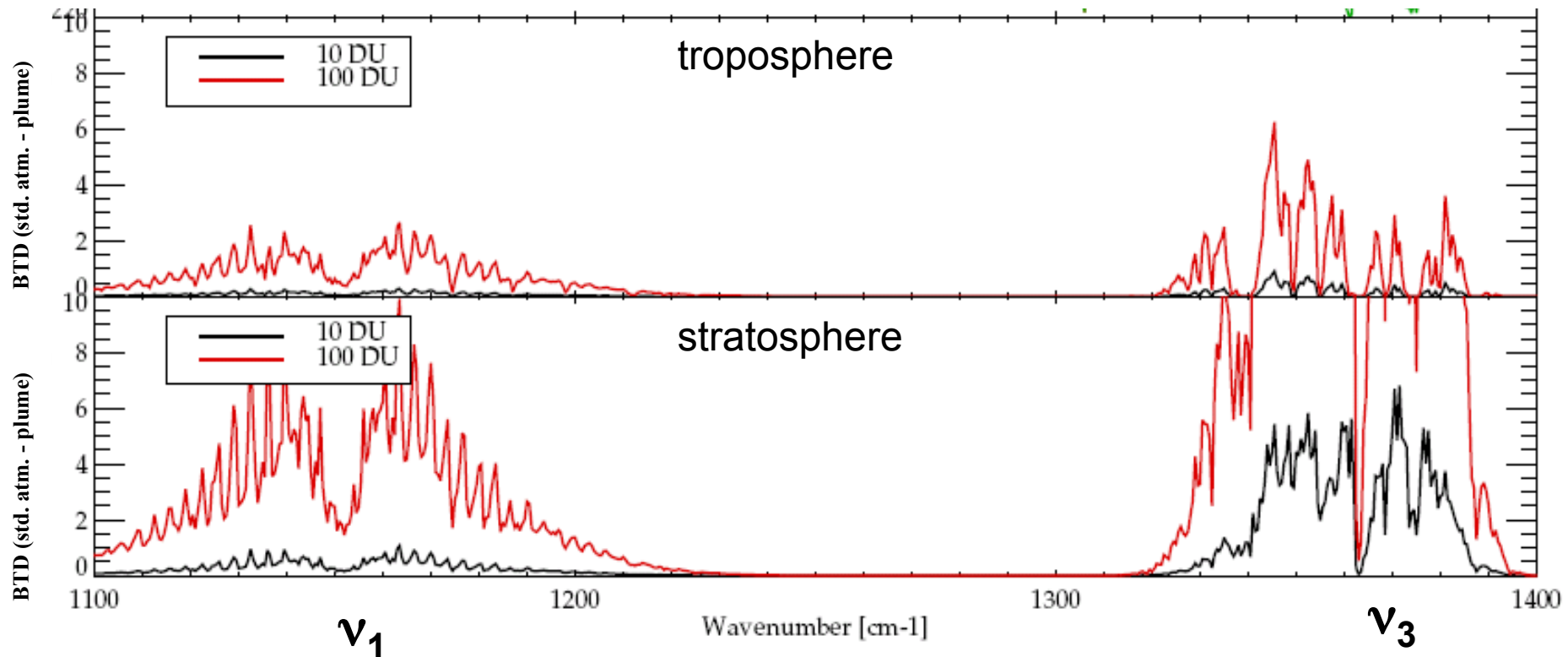




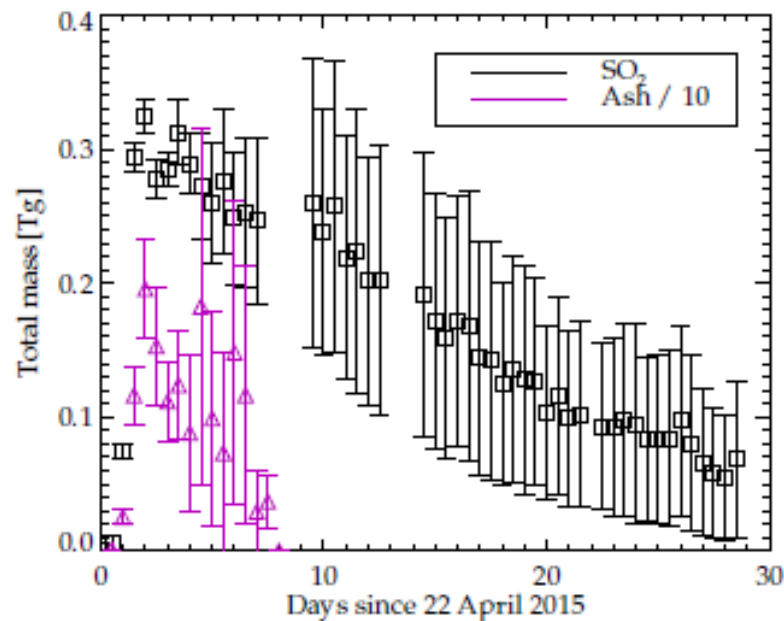
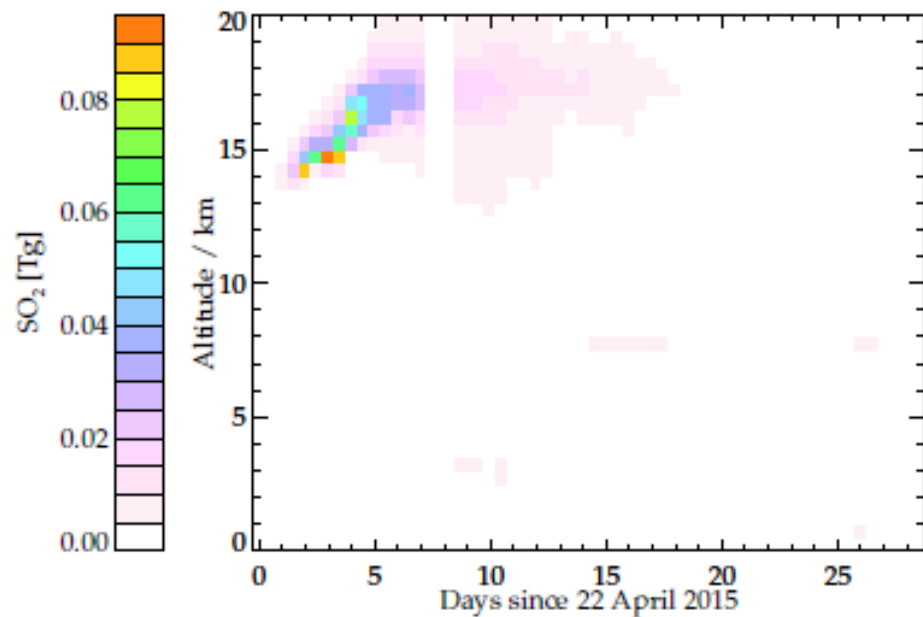
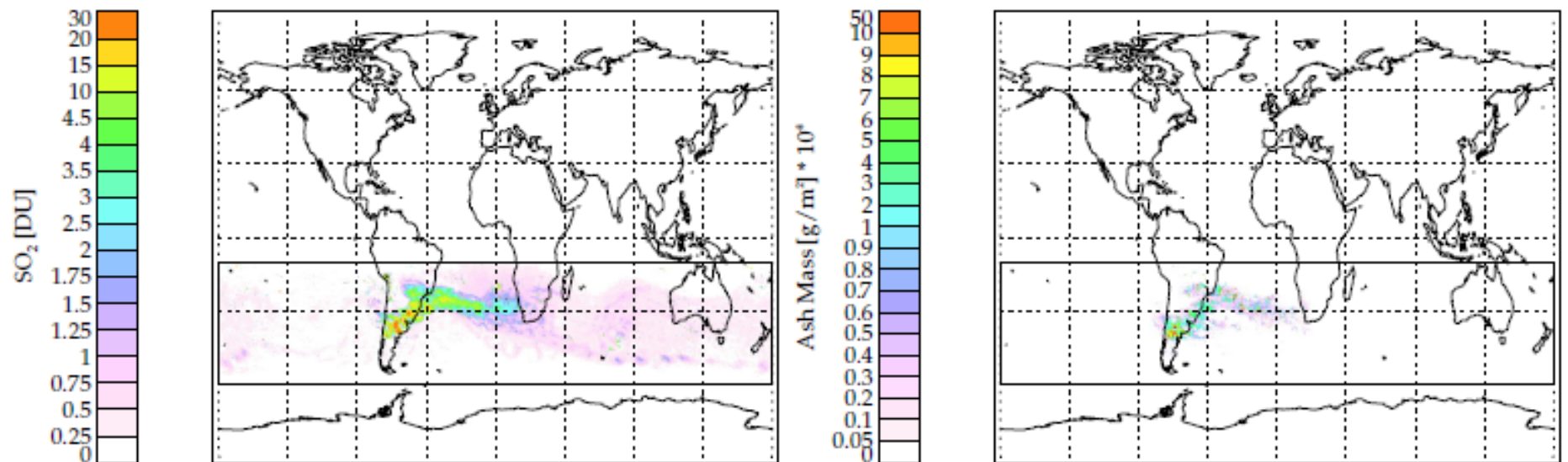
SO₂ thermal infrared spectra

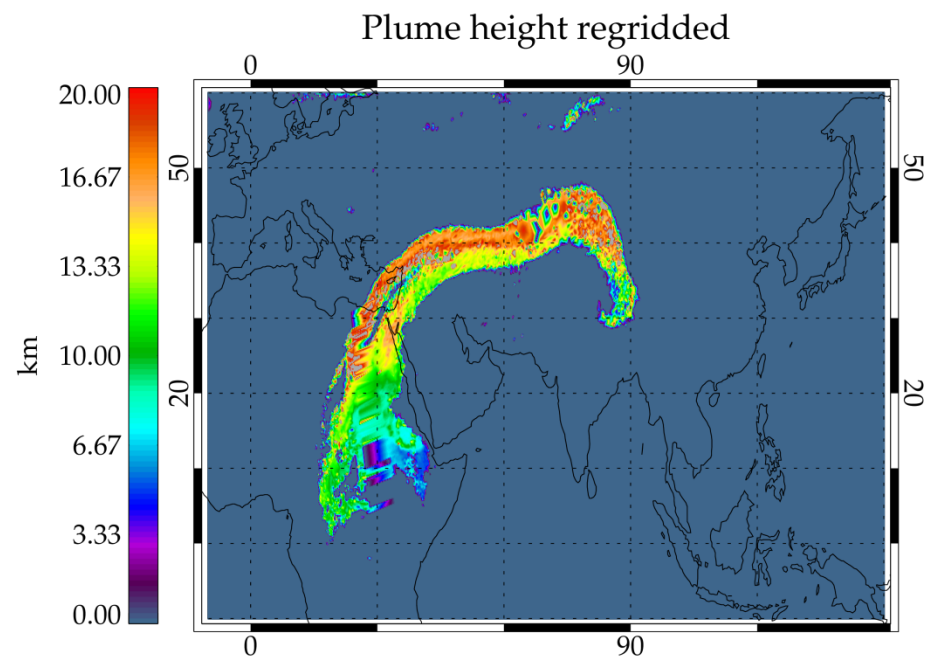
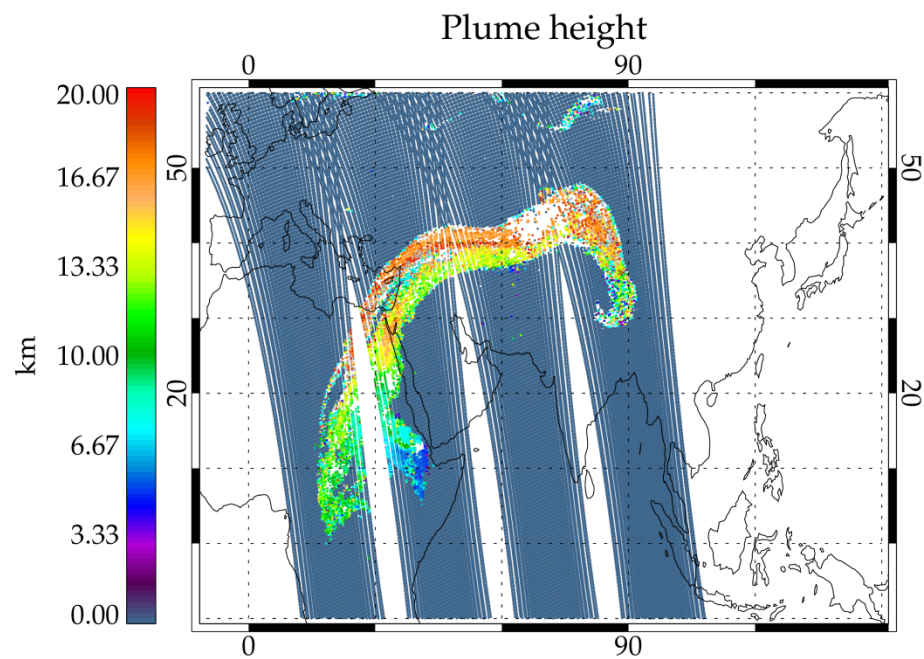
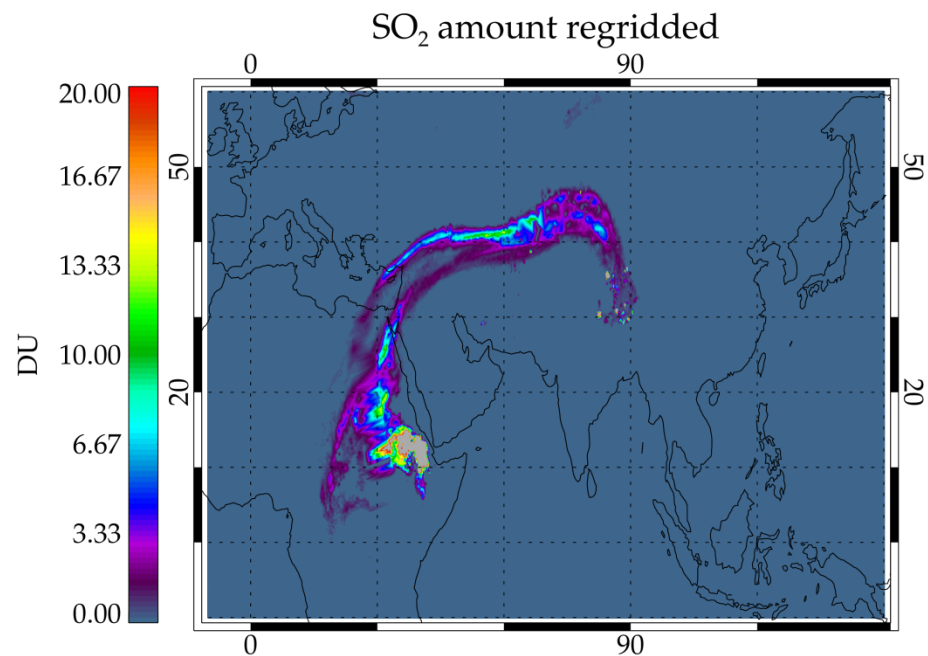
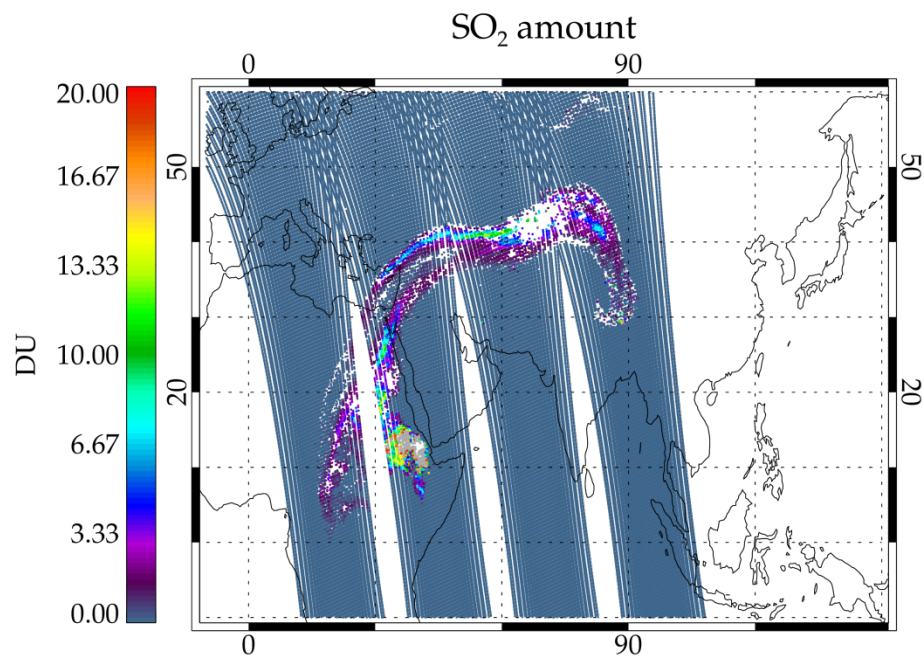
Brightness temperature differences (BTD) between the clear atmosphere and the atmosphere with enhanced tropospheric/stratospheric (top/bottom) SO₂ containing a total column amount of 10DU (black line) or 100DU (red line) of SO₂;

SO₂ absorption around 7.3 (ν_3) and 8.7 (ν_1) μm .



**IASI is sensitive to both the amount of SO₂ and the altitude of the plume
=> getting the altitude correct is important in order to get the correct *amount* of SO₂, since the signal depends strongly on altitude.**





Error analysis

linear error on the 'true' state obtained as:

$$S_x = (K^T S_y^{-1} K + S_a^{-1})^{-1}$$

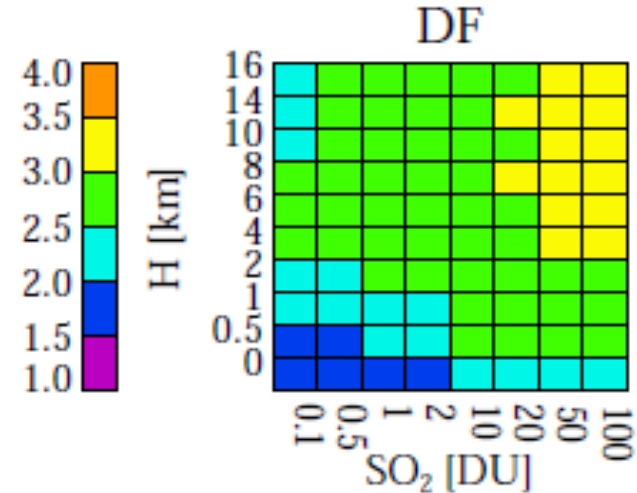
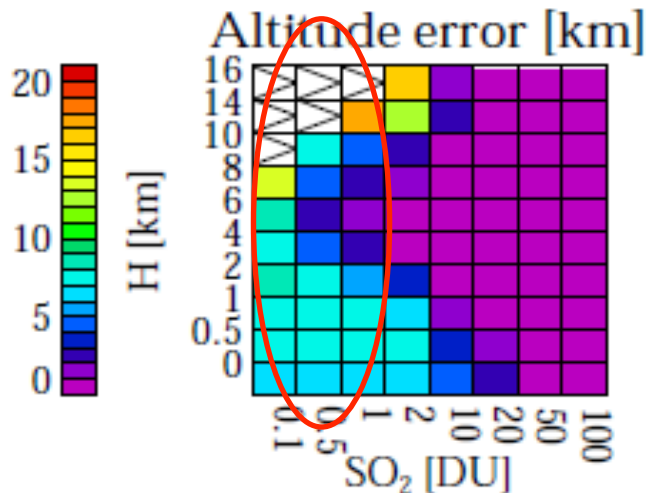
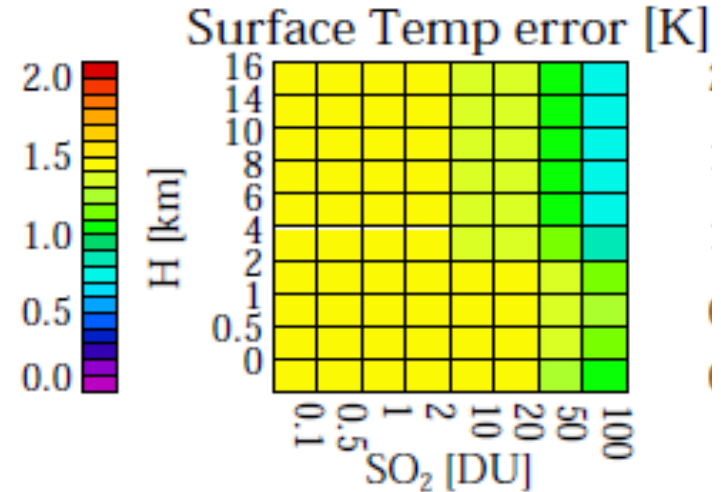
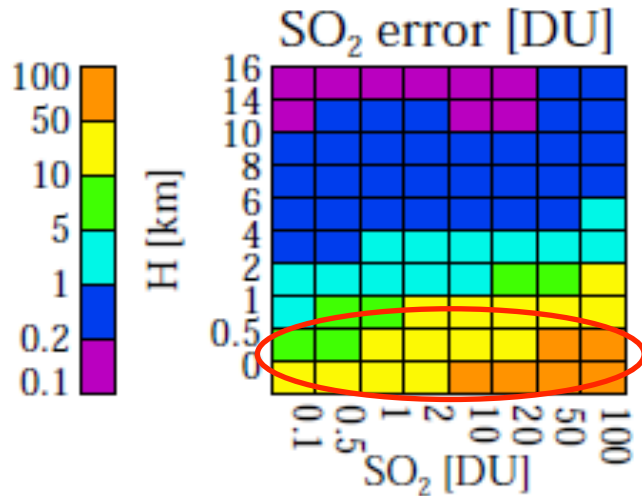
$$A = S_x S_x^{-1} - S_a^{-1}$$

A priori values

SO₂, H, s, Ts

Xa=[0.5, 400, 100, 290]

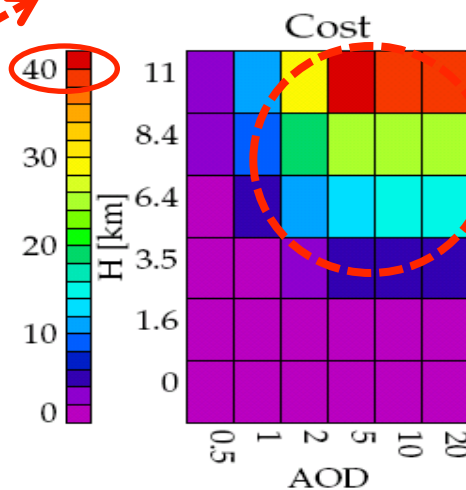
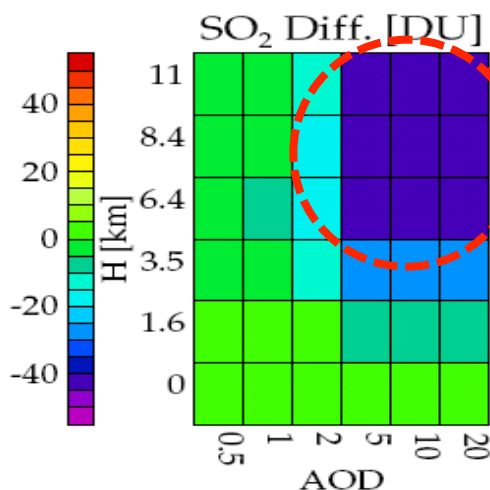
DXa=[100, 1000, 1, 20]



Sensitivity of retrieval to presence of ash and cloud

Type: ash, Re=2um

SO₂ underestimate for thick ash



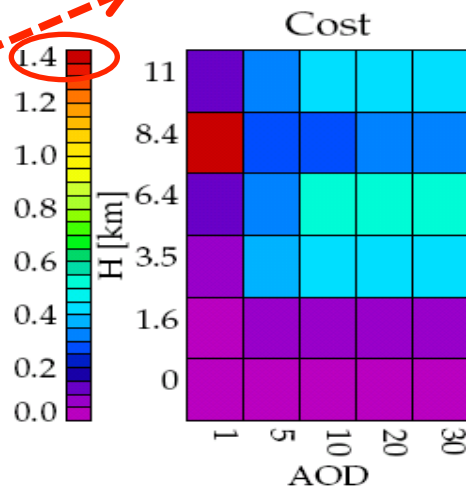
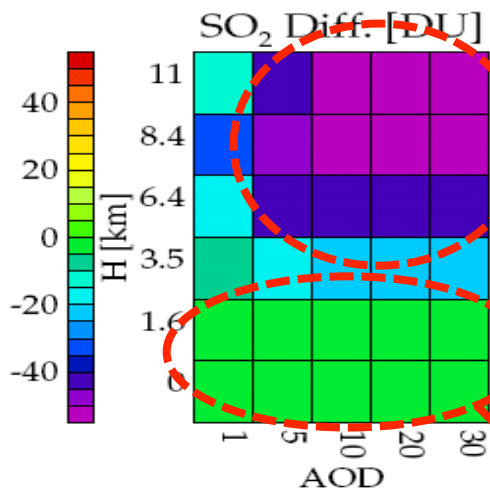
Retrieval using simulations with ash and water cloud at different optical depth and altitude

high cost !!

	DU	hPa	T [K]
Tru	50	400	
Ap	0.5	400	290
Ap err	100	1000	20

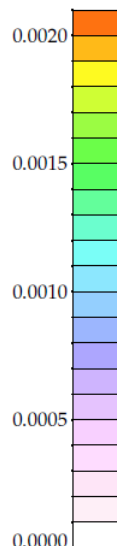
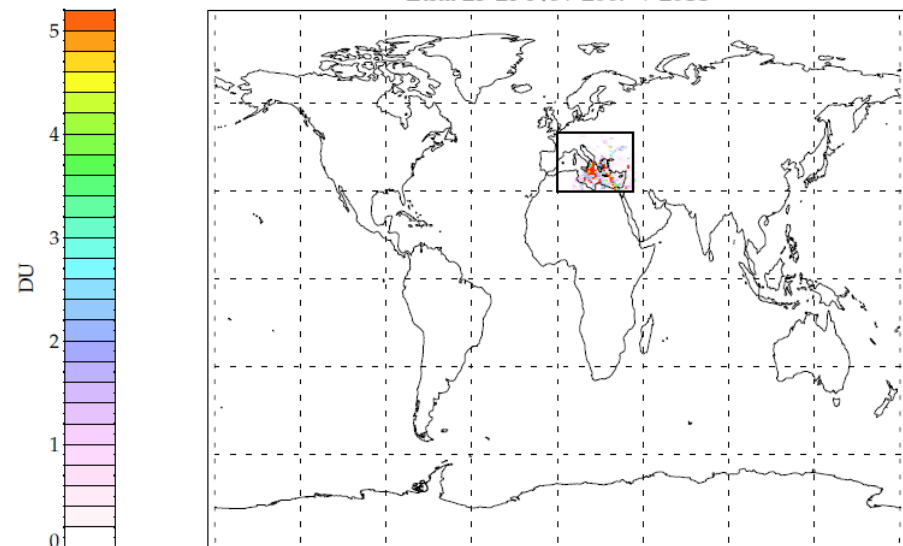
Type: water cloud, Re=20um

SO₂ signal 'covered' from cloud within or above the plume

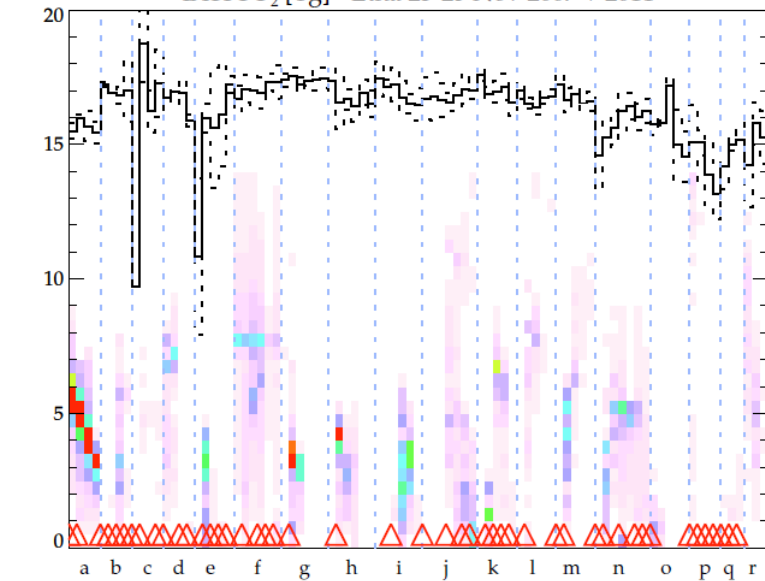


OK for cloud below the plume!!!

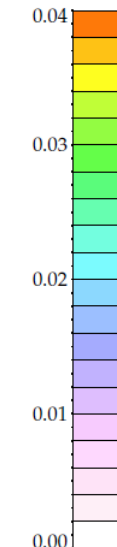
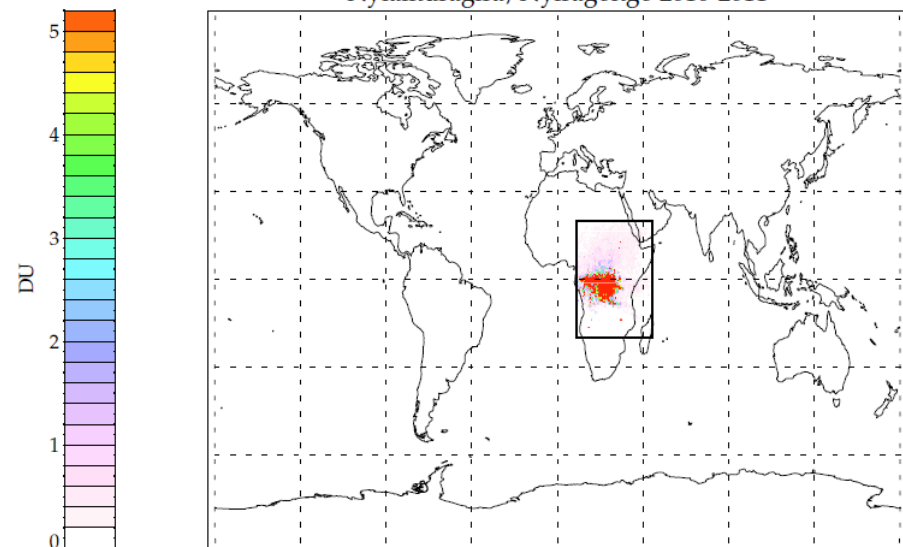
Etna 23-25 Nov 2007 + 2011



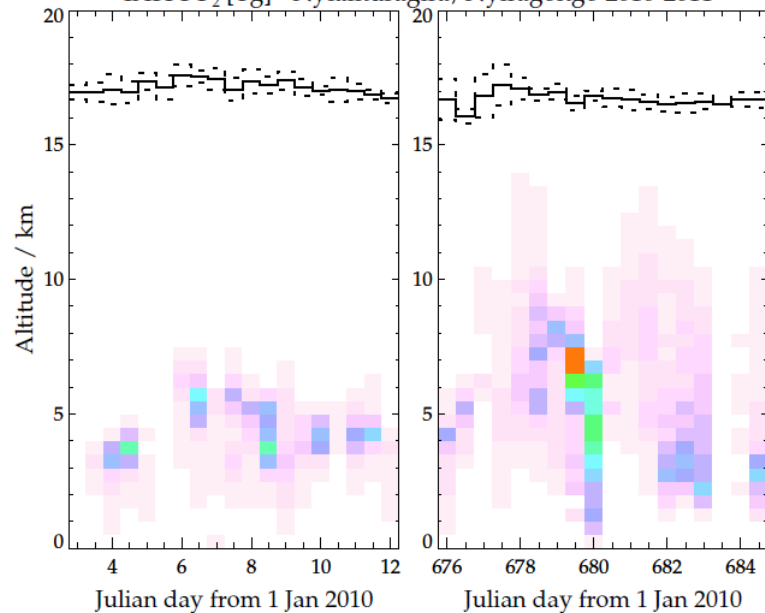
IASI SO₂ [Tg] - Etna 23-25 Nov 2007 + 2011



Nyamuragira/Nyiragongo 2010-2011



IASI SO₂ [Tg] - Nyamuragira/Nyiragongo 2010-2011



Minimum error estimate

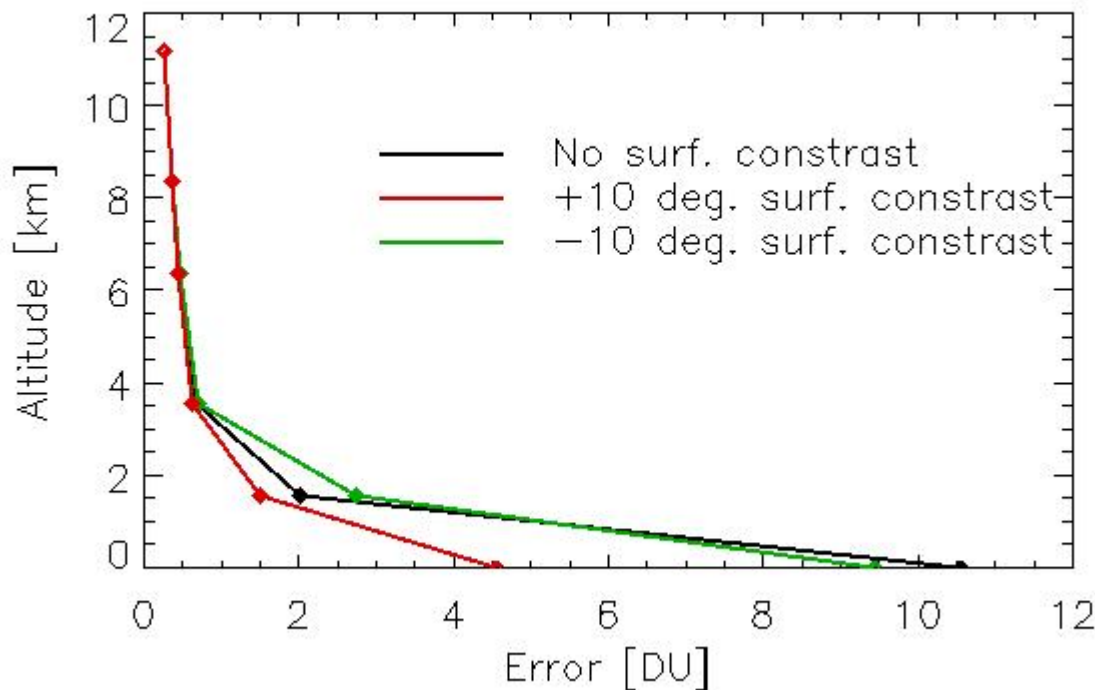
surface contrast = skin temperature - temperature of the first atm. layer

std. atm. profiles

assumption: we know the altitude of the plume.

$$1 \text{ DU} = 0.0285 \text{ g/m}^2$$

considering 60 overpass a month
=> error reduced of $1/\sqrt{60}$



SO₂ monthly errors

[km]	[g/m ²]
11	9 10 ⁻⁴
8.3	13 10 ⁻⁴
6.4	17 10 ⁻⁴
3.5	24 10 ⁻⁴
1.5	73 10 ⁻⁴
0	388 10 ⁻⁴

SO₂ linear (v3)

It is mainly a 'measurements' of the SO₂ signal

- All IASI archive 2007-2014 analysed
- NRT data processing

Assume:

SO₂ vertical profile,
atmospheric profiles,
Jacobian

Retrieve:

SO₂ column amount [DU]

Used for: (i) plume detection, (ii) identify where there is a signal

(1)

SO₂ iterative (all v1 and v3)

comprehensive error budget for every pixel

Require auxiliary data (ECMWF profiles),
radiative transfer (RTTOV) called iteratively

Used for:

Volcanic plume,

study SO₂ mass and vertical distribution

Retrieve:

SO₂ column amount [DU]
SO₂ plume altitude [mb, km]

(2)

(3) Low signal case: degassing, pollution

Results are average in time
(monthly means)

(3)

Assume:

SO₂ altitude

Retrieve:

SO₂ column amount [DU]

(1) SO₂ linear retrieval (detection) theory

[Rodger 2000]

The optimal estimate of x taking into account total measurement error may be computed as:

$$\hat{x} = x_0 + \underbrace{(K^T S_y^{\text{tot}-1} K)^{-1} K^T S_y^{\text{tot}-1}}_G (y - \bar{y})$$
$$G = (K^T S_y^{\text{tot}-1} K)^{-1} K^T S_y^{\text{tot}-1}$$

Create a generalized error covariance S_y^{tot} that contains not only the instrument noise, but noises due to interfering gases and broadband scatterers (using IASI spectra only).

S_y^{tot} is computed considering an appropriate ensemble of N measured spectra to construct an estimate of total measurement error variance-covariance S_y^{obs}

$$S_y^{\text{tot}} \approx S_y^{\text{obs}} = \frac{1}{N} \sum_{i=1}^N (y_i - \bar{y})(y_i - \bar{y})^T$$

$$\bar{y} = \frac{1}{N} \sum_{i=1}^N y_i$$

[Walker, Dudhia, Carboni, Atmos. Meas. Tech., 2011]

Error analysis

linear error on the 'true' state obtained as:

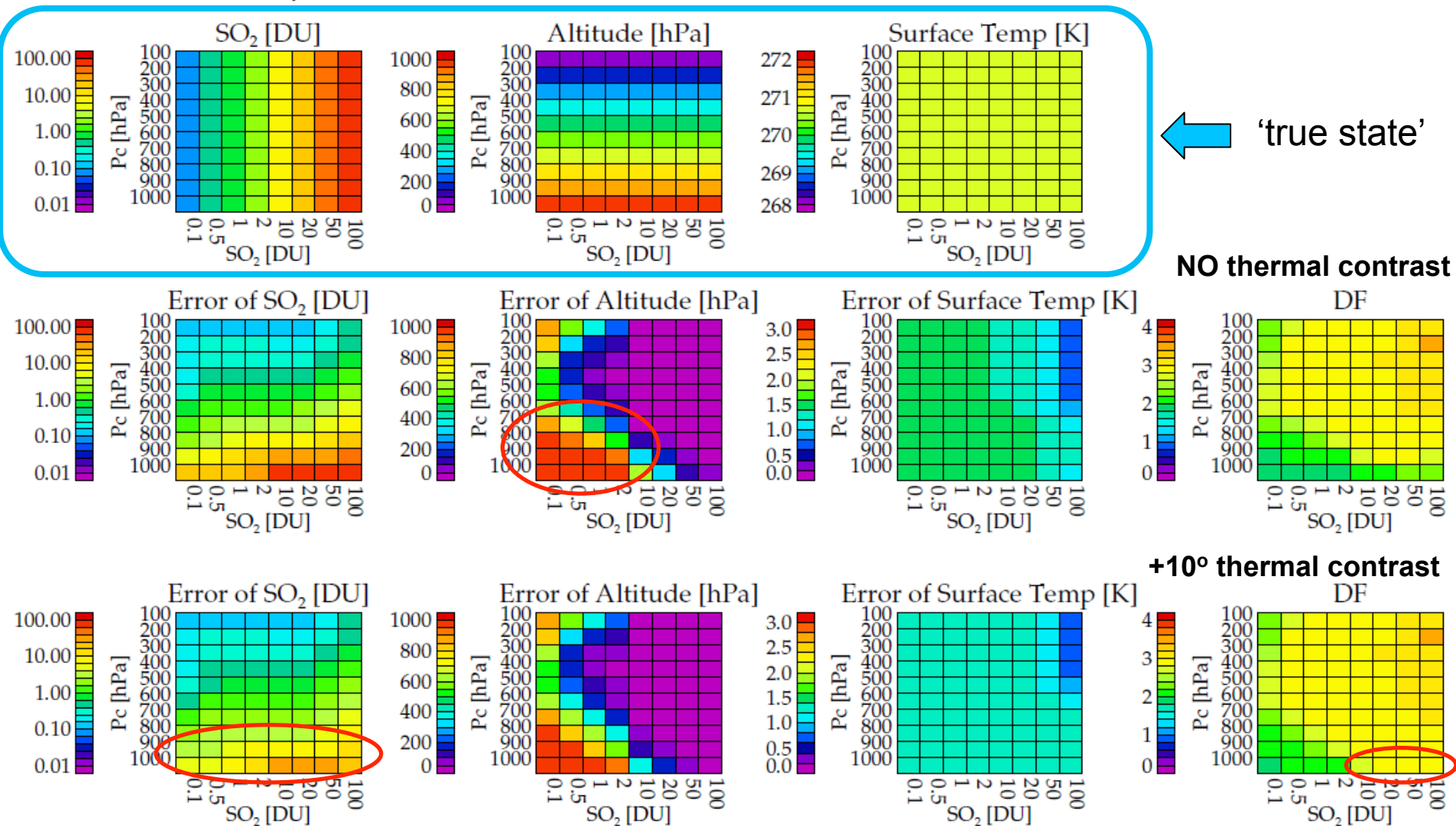
$$S_x = (K^T S_y^{-1} K + S_a^{-1})^{-1}$$

$$A = S_x S_x^{-1} - S_a^{-1}$$

SO₂, H, s, Ts

Xa=[0.5, 400, 100, 290]

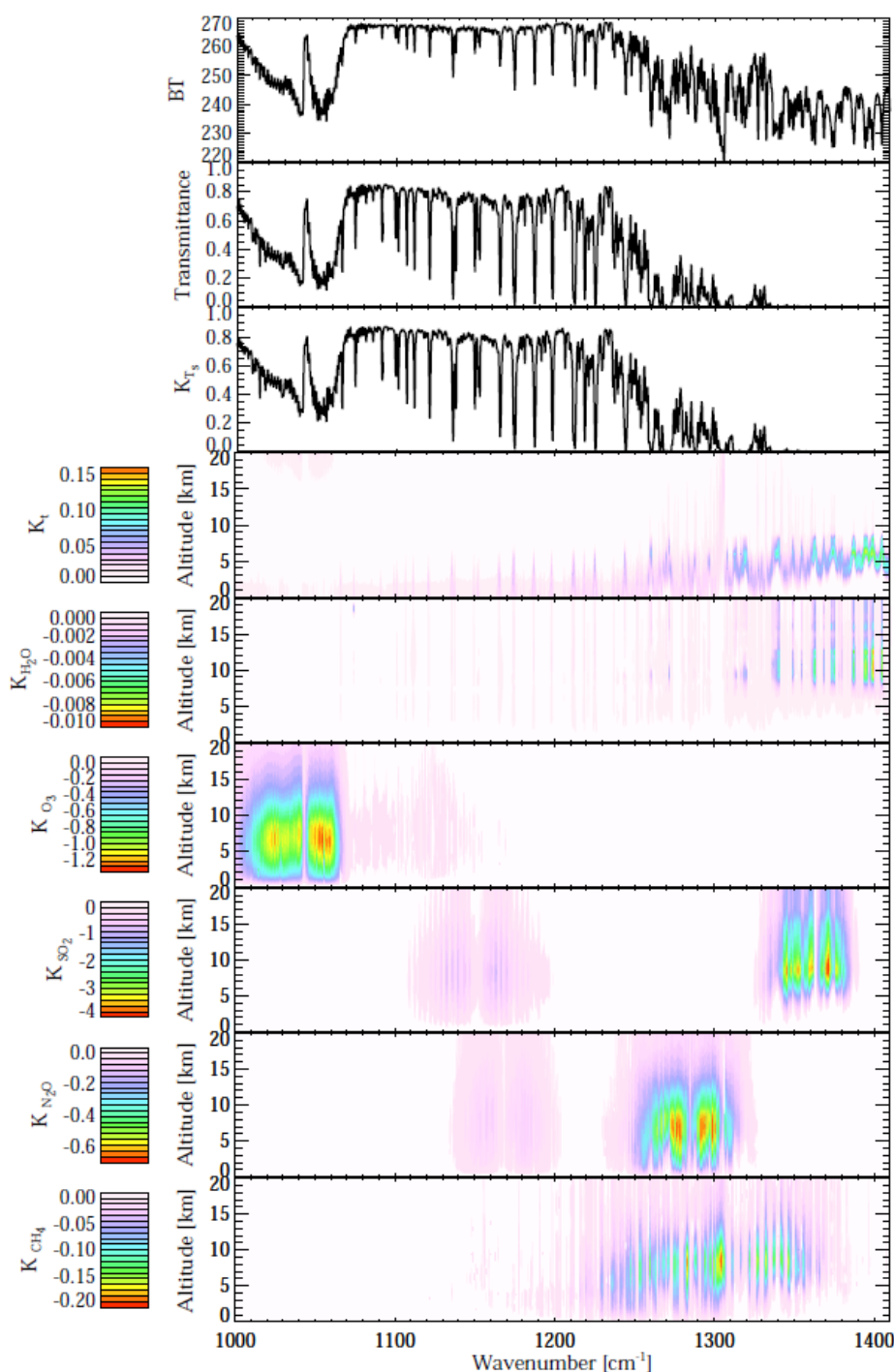
DXa=[100, 1000, 1, 20]



Radiative transfer model

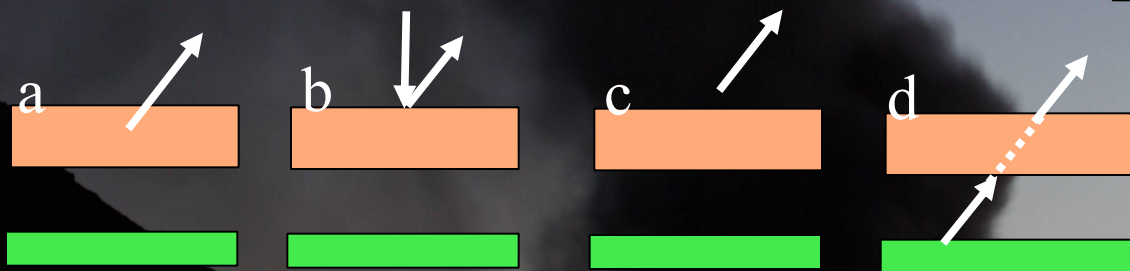
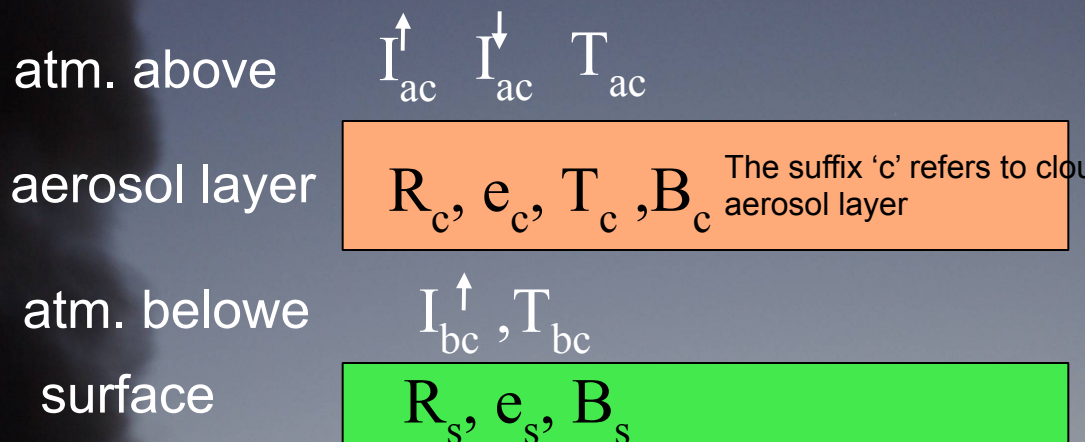
Radiative transfer model based on RTTOV (plus SO₂ coefficients computed by RAL using the line by line model RFM).

When used in proper retrieval RTTOV is driven by ECMWF profile interpolated at IASI pixel location and time



IASI FORWARD MODEL

The RTTOV output for a clean atmosphere (containing gas but not cloud or aerosol/ash) is combined with an ash layer using the same scheme as for the Oxford-RAL Retrieval of Aerosol and Cloud (ORAC) algorithm.

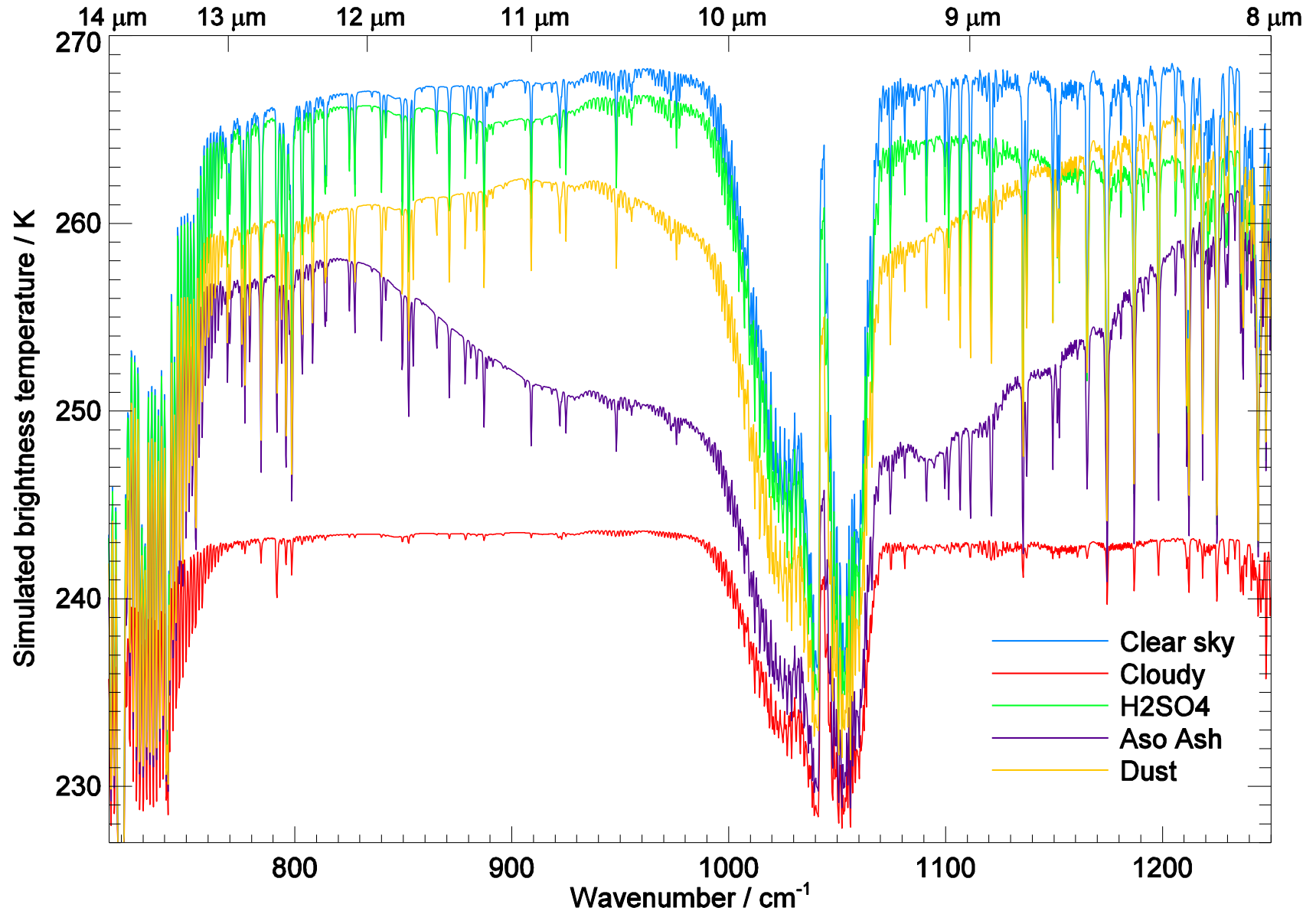


$$I_{\bullet}^{\uparrow} = B_c e_c T_{ac} + I_{ac}^{\downarrow} R_c T_{ac} + I_{ac}^{\uparrow} + B_s e_s T_{bc} T_c T_{ac} + I_{bc}^{\uparrow(atm)} T_c T_{ac}$$

LUTs for aerosol layer parameters (aerosol optical properties + DISORT)

Other atmospheric parameters (radiances above/below aerosol layer going up/down) are computed with RTTOV using ECMWF atmospheric profiles.

IASI simulated spectra

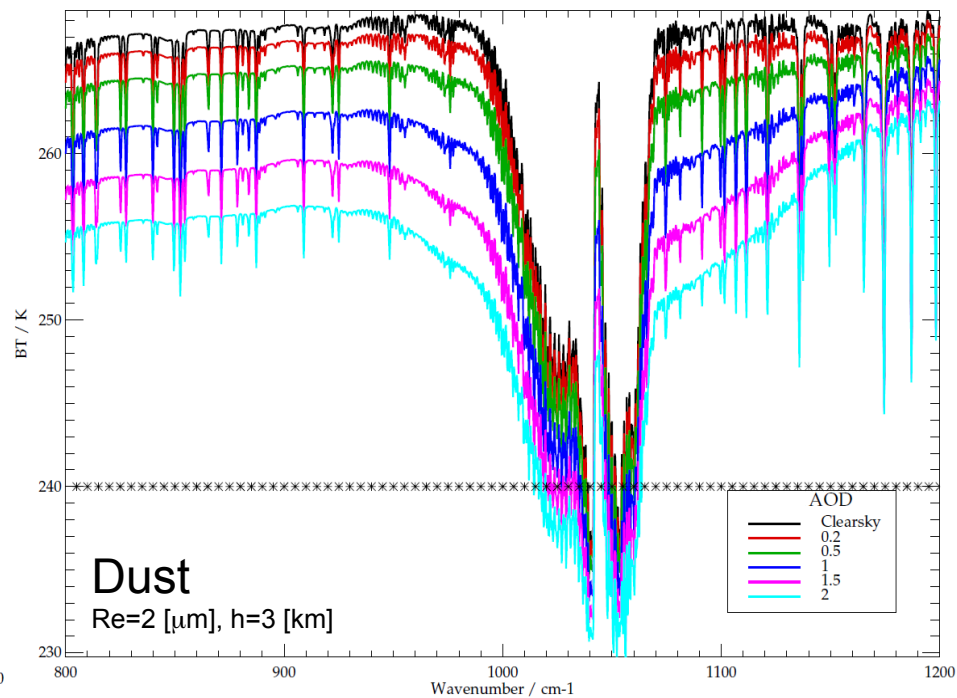
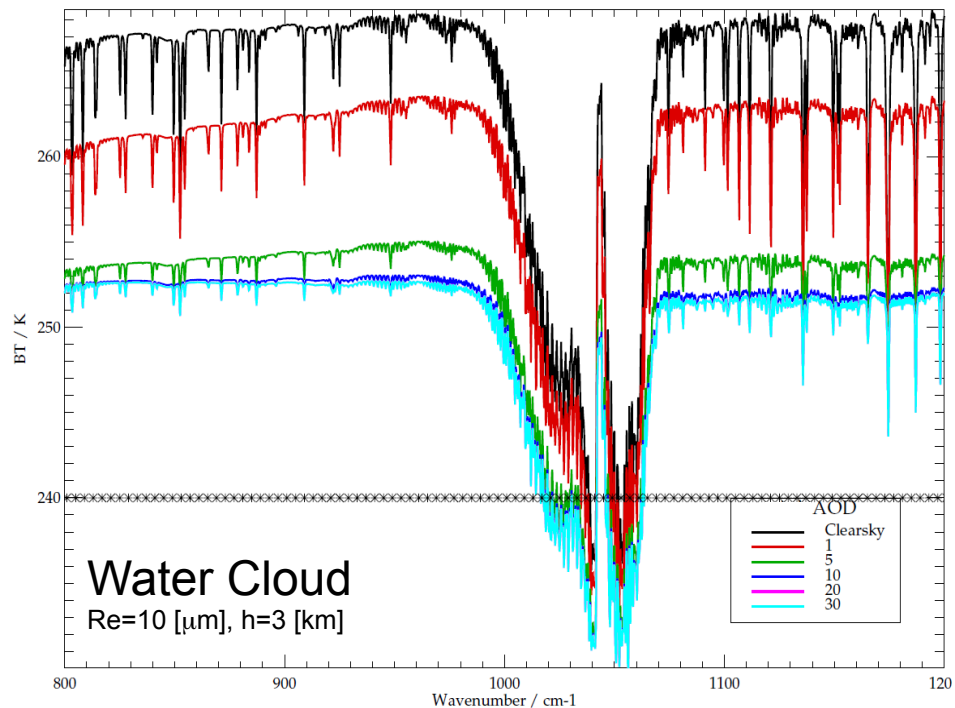
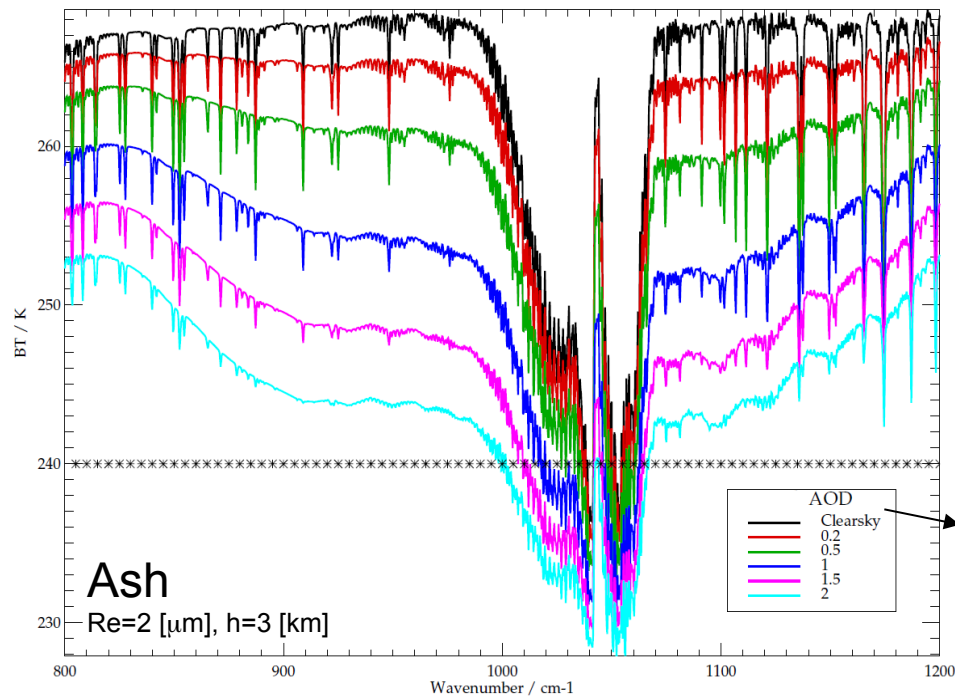


Ash and cloud effects?

To test if the retrieval is sensitive to ash/cloud etc...

IASI forward model can include aerosol and cloud.

Obtained with refractive index measured by Daniel Peters (see poster VA-5).

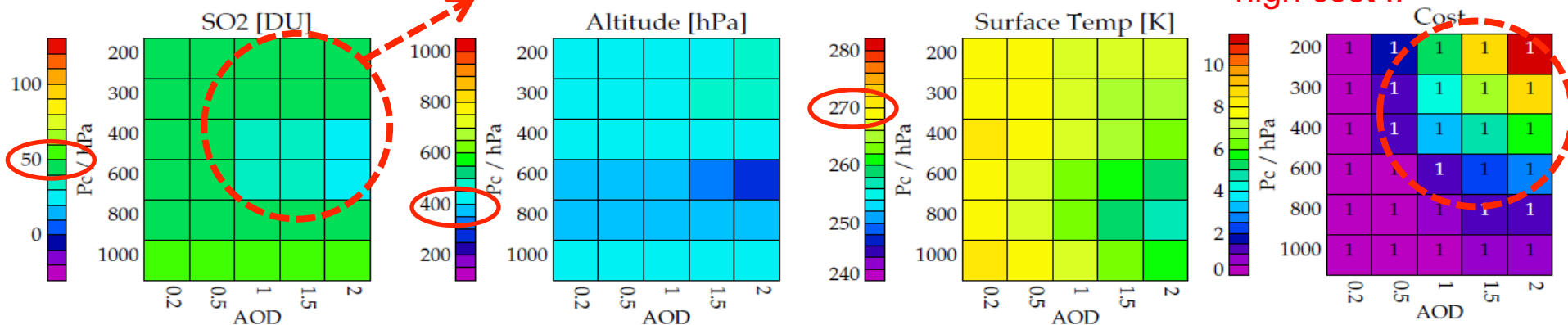


Sensitivity of retrieval to presence of ash and cloud

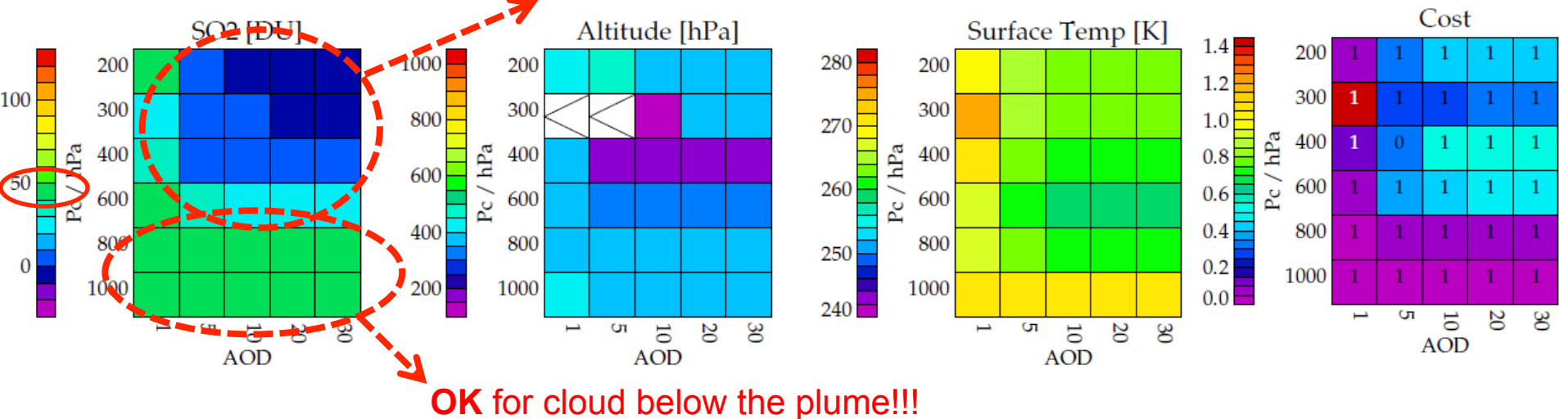
Retrieval using simulations with ash and water cloud at different optical depth and altitude

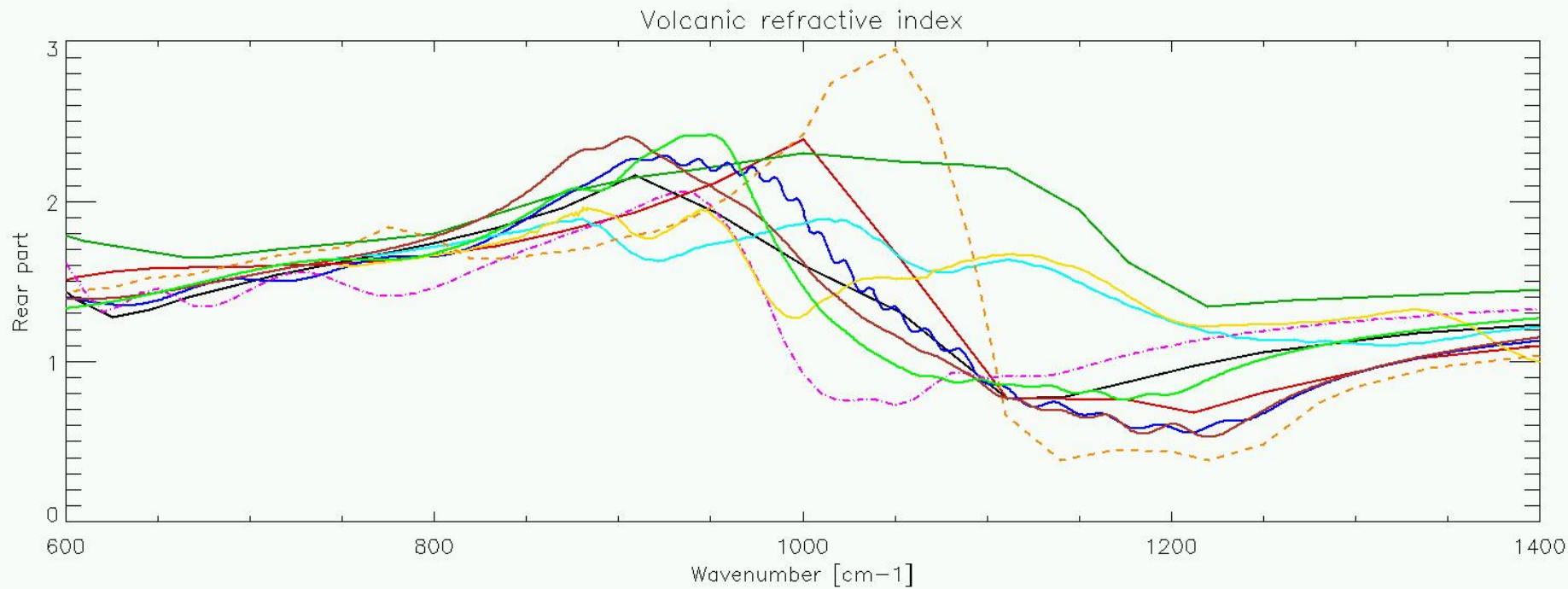
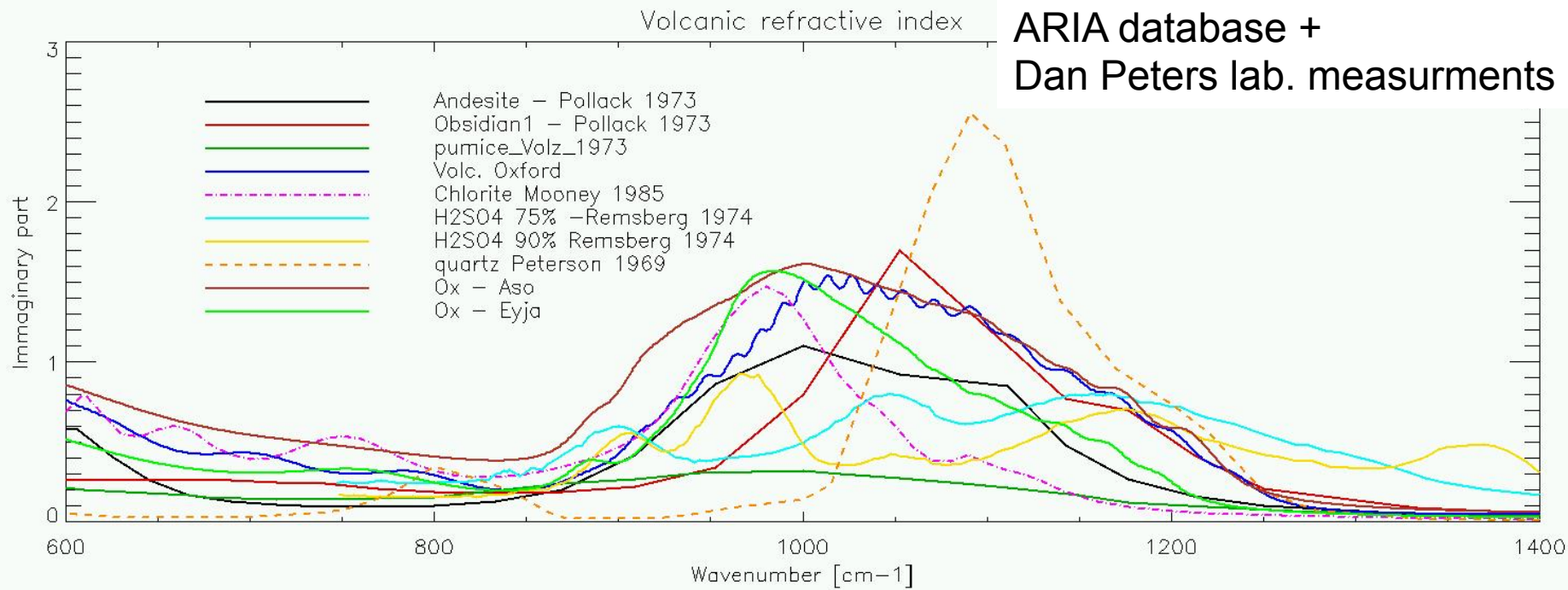
	DU	hPa	T [K]
Tru	50	400	
Ap	0.5	400	290
Ap err	100	1000	20

Type: ash, Re / microns = 2 SO₂ underestimate for thick ash

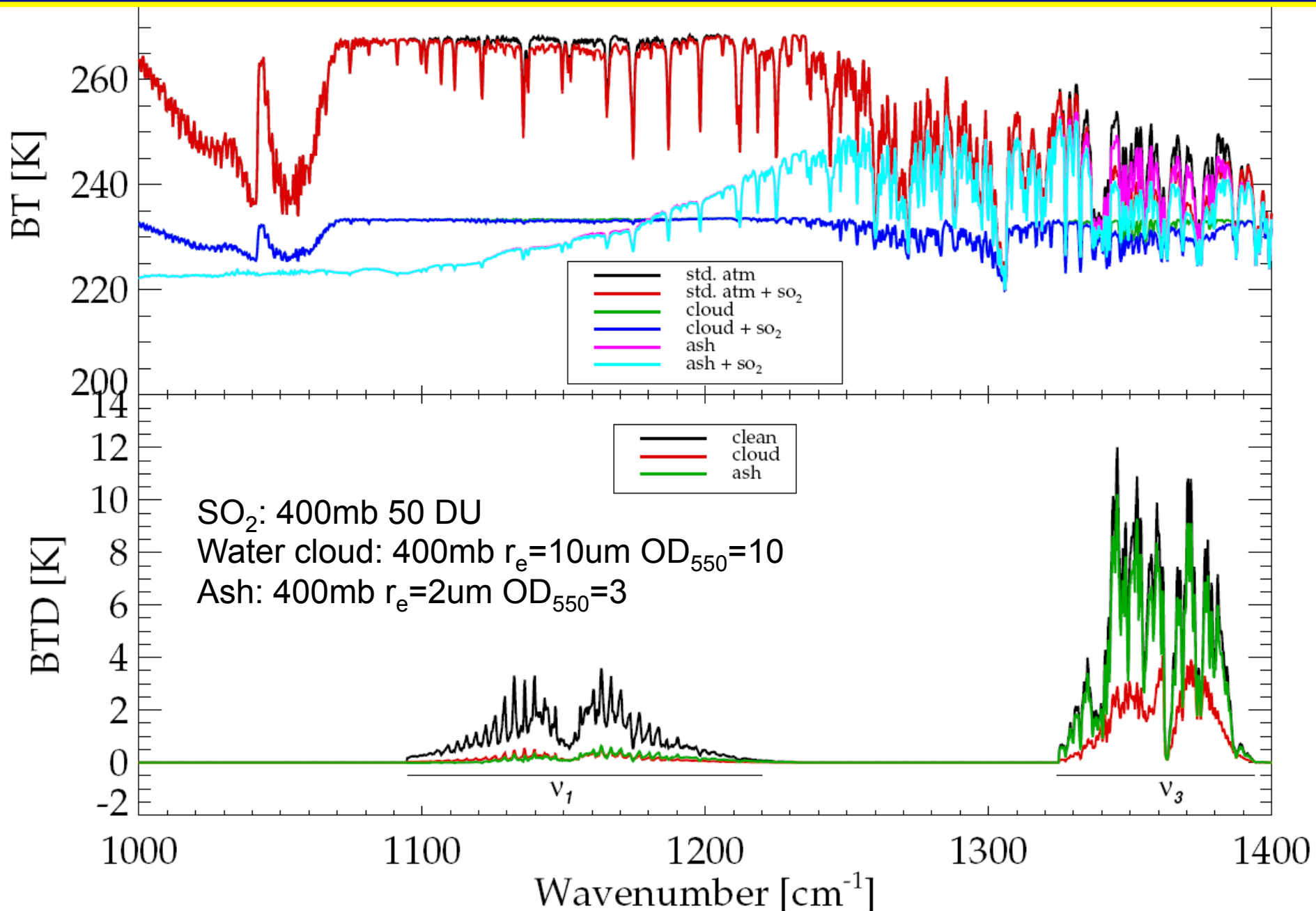


Type: wat, Re / microns = 15 SO₂ signal 'covered' from cloud within or above the plume





Ash and cloud effects?



Nabro - starts 12 June 2011

- a) The MLS (microwave limb sounder) retrieval of SO₂,
- b) The corresponding MLS temperature profile retrieval,
- c) The IASI SO₂ mass as function of altitude and time (one column every half day). Each column of this plot is obtained summing all the SO₂ amounts (regridded), with retrieved altitude between the indicated vertical levels. In this way we can follow the evolution of the SO₂ plume in the vertical.

As measured from MLS (14th June) and IASI (13th June) the initial Nabro SO₂ plume was injected at around 100m, and this altitude correspond to the minimum of the temperature profile as measured by MLS.

MLS data from: http://mls.jpl.nasa.gov/products/so2_product.php

