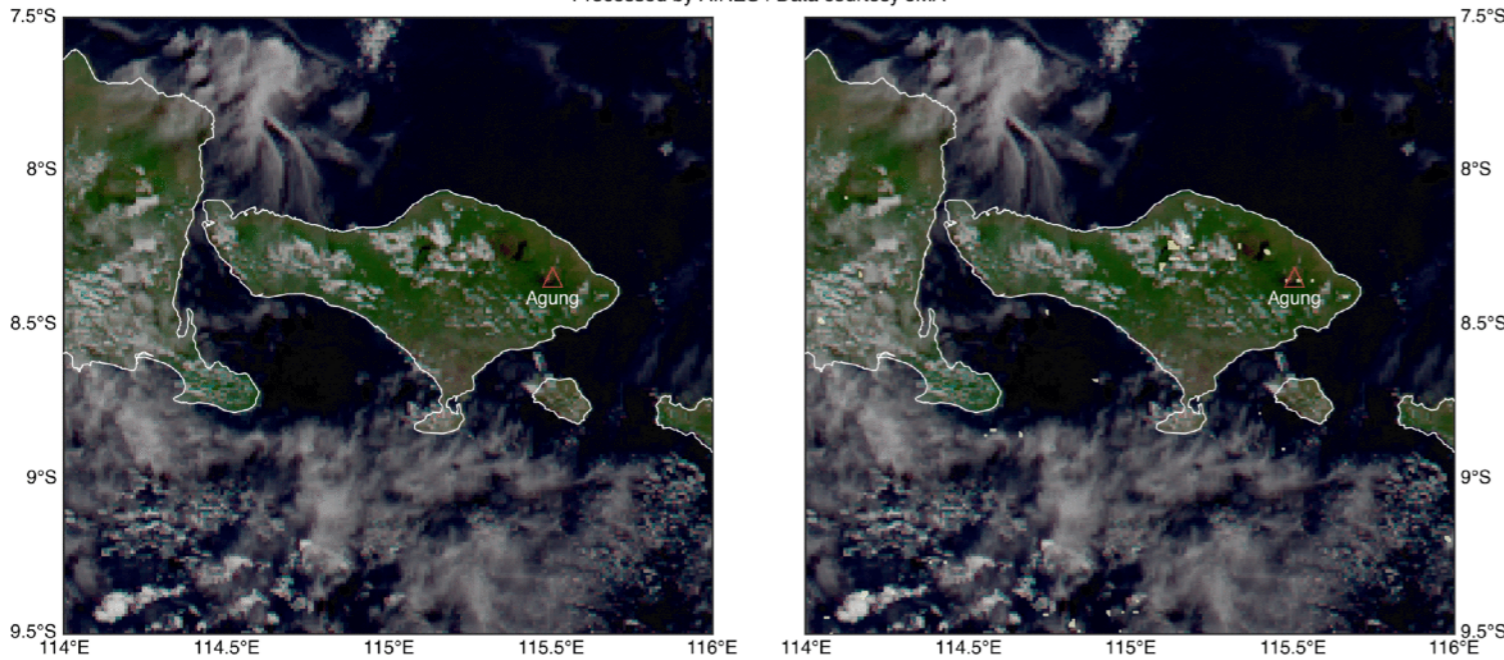


# Watching Volcanic Eruptions From Space:

*How we use Satellites to Warn Aviation of the Threat from Ash Clouds*

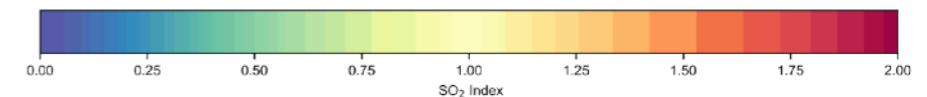
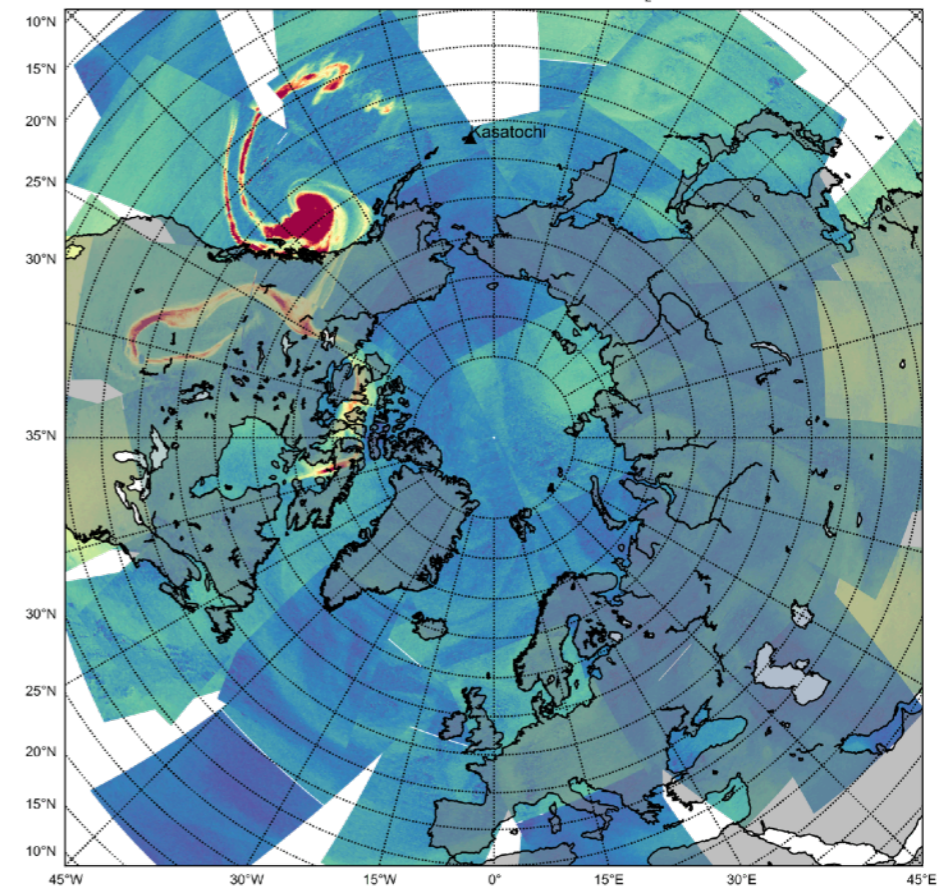
*Dr Fred Prata  
 Director AIRES Pty Ltd  
 Visiting Professor, Curtin University,  
 Western Australia*

Himawari-8 | 2018-06-13 03:00 UTC | Left: True colour | Right: True colour with IR ash detection  
 Processed by AIRES | Data courtesy JMA

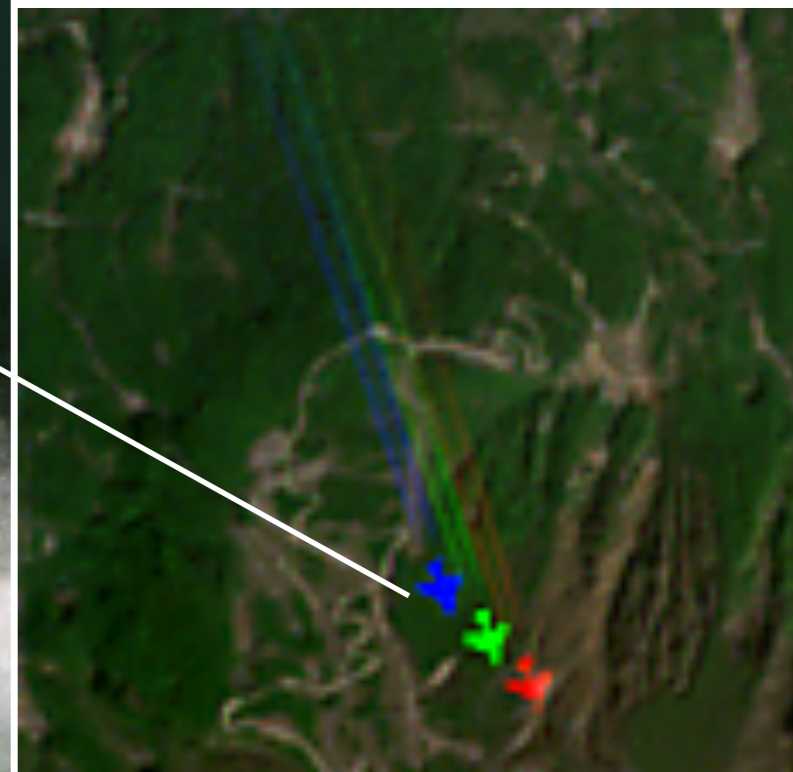


## QUICKLOOK

AIRS BTDR SO<sub>2</sub> Date: 2008.08.11



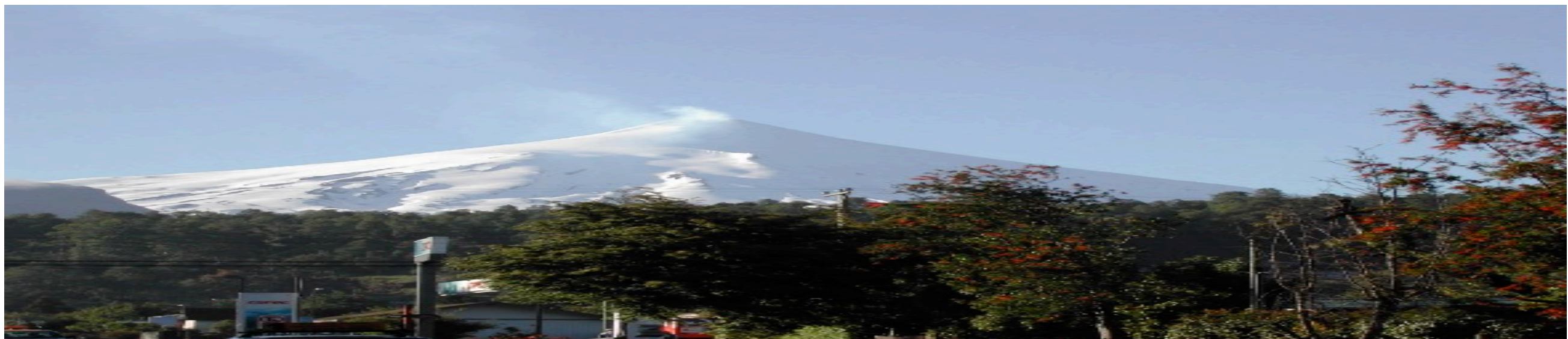
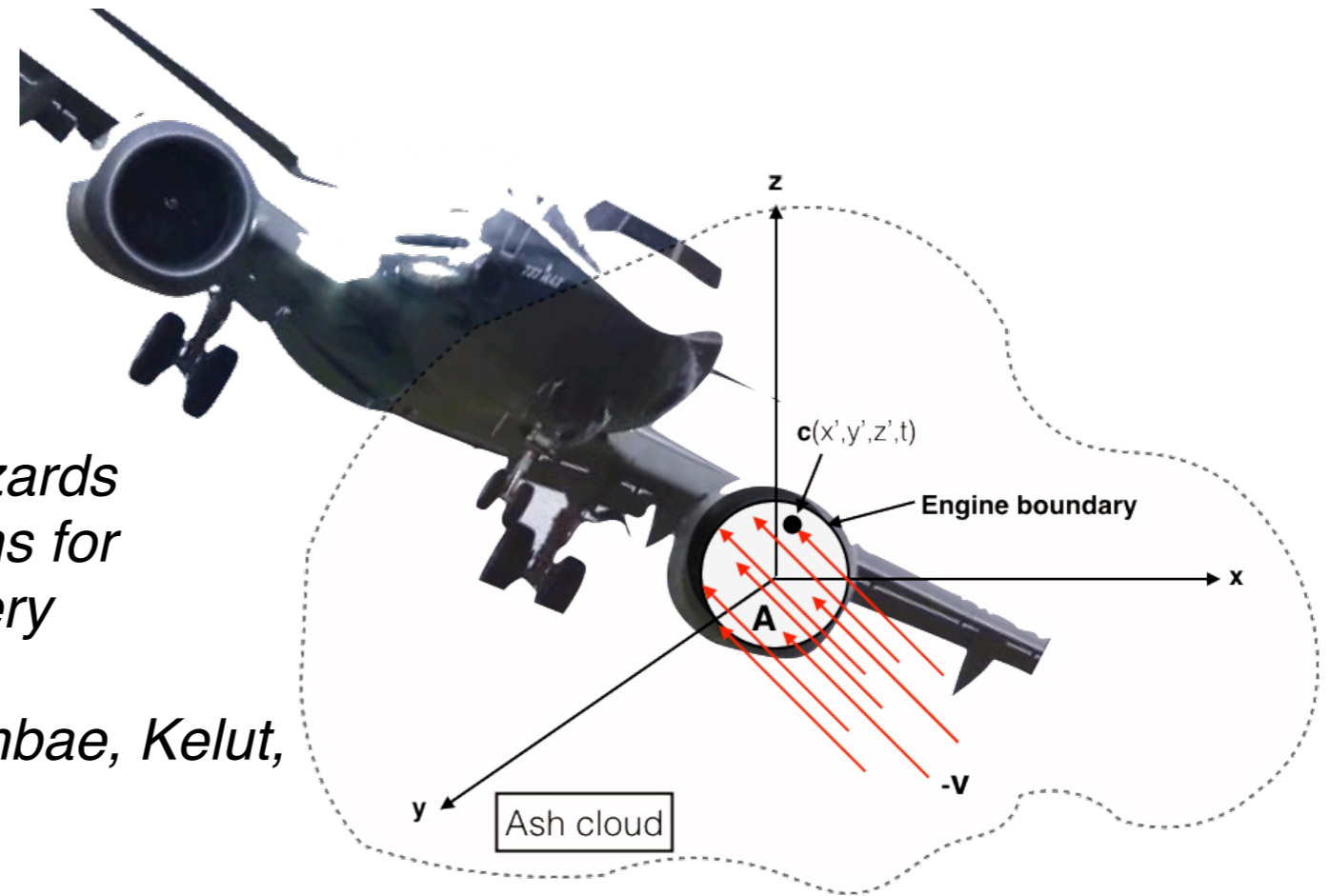
Data courtesy NASA/JPL | Processed by: Dr Fred Prata | email: fred@aires.space



**Sentinel-2 True-colour (RGB) image ~10 m resolution**

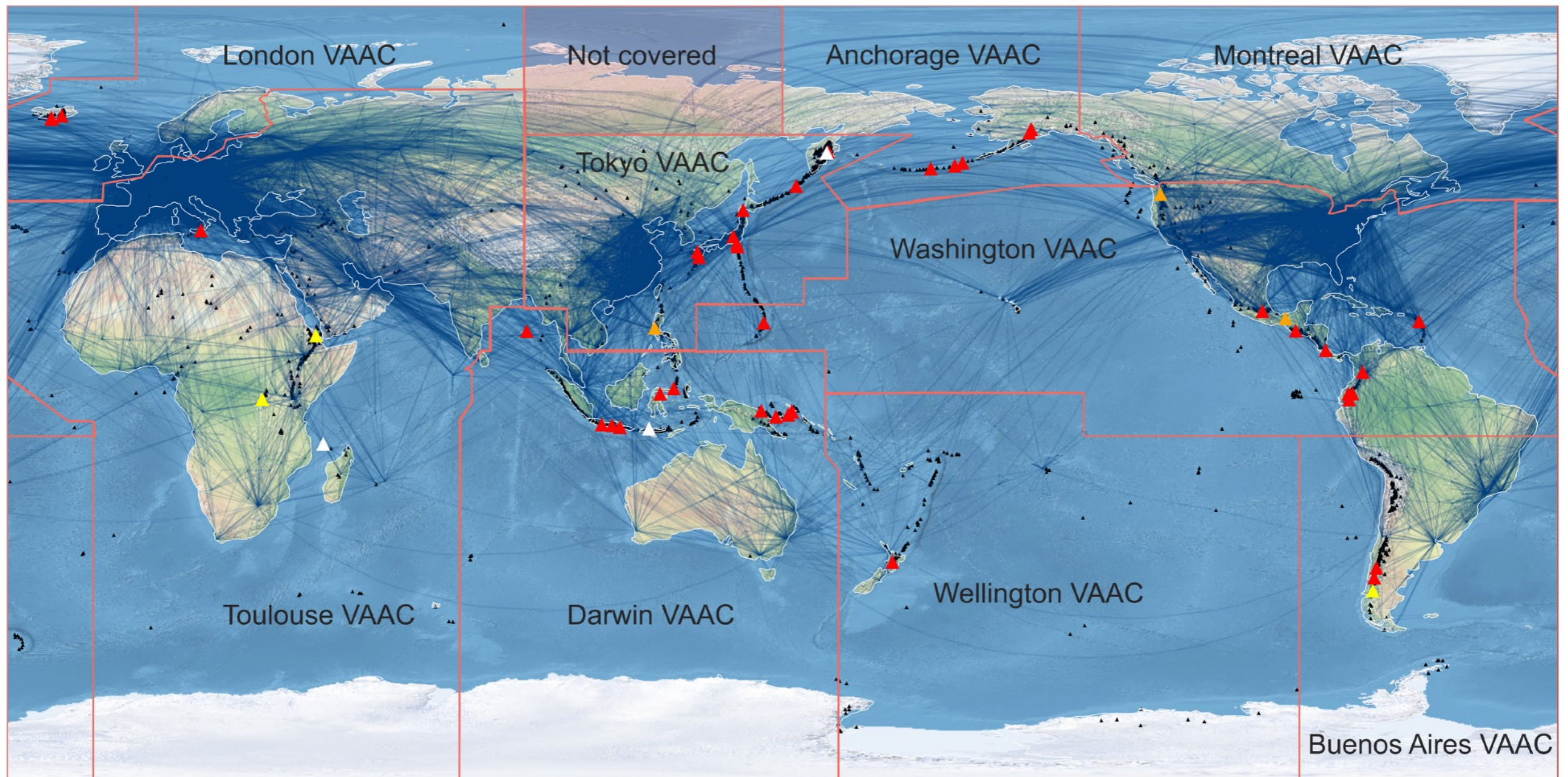
# Synopsis

- \* *Volcanoes: distribution, eruptions and hazards*
- \* *Satellites: polar and geostationary systems for watching volcanoes—how to use the imagery*
- \* *Infrared imagery: ash and gas detection*
- \* *Some examples: Eyjafjallajökull, Aoba/Ambae, Kelut, and others*
- \* *Cloud height and eruption rate*



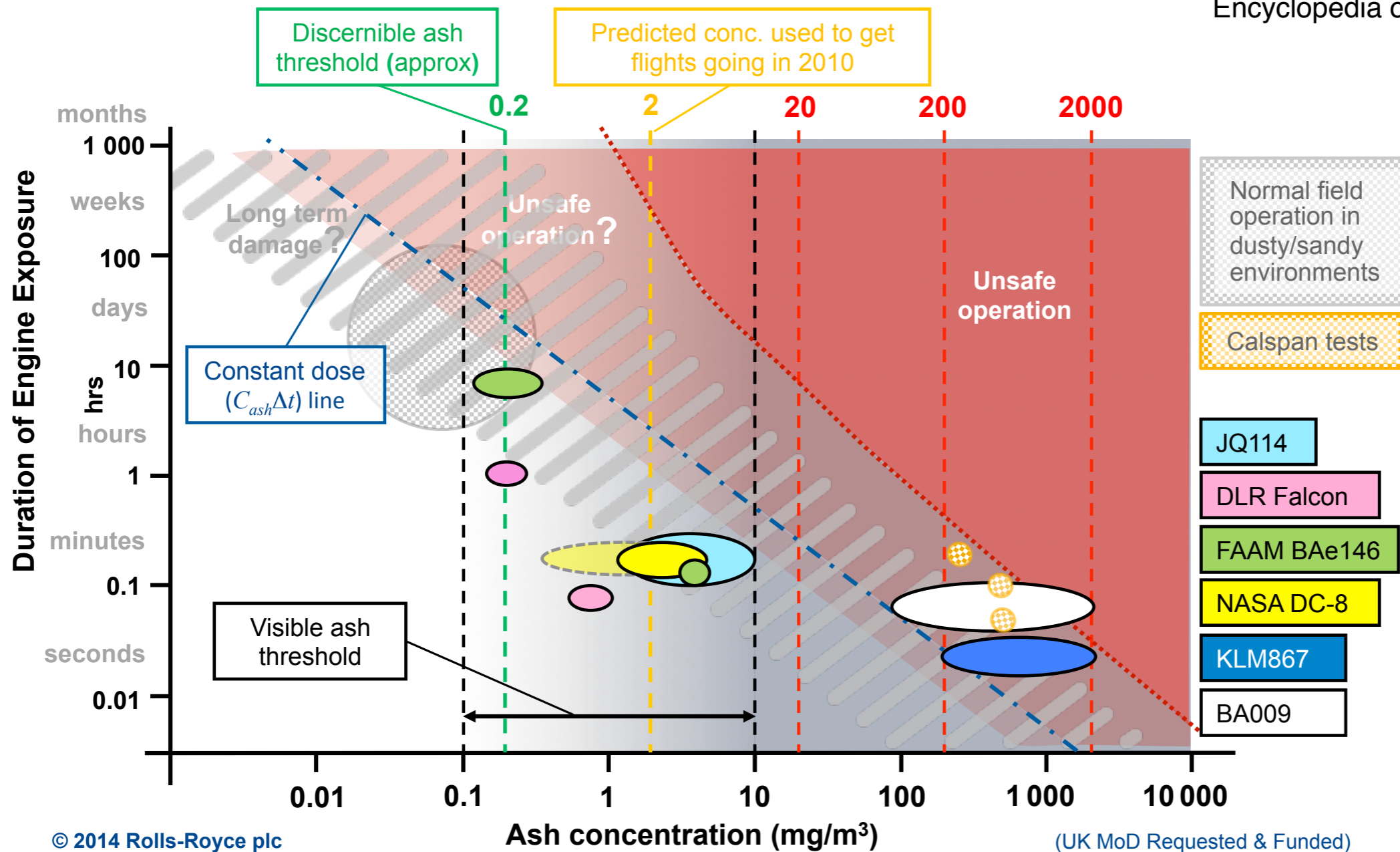
# \* *Volcanoes: distribution, eruptions and hazards*

- \* Distribution
- \* Historic Eruptions
- \* Recent Eruptions
- \* Hazards



# Rolls-Royce Duration of Exposure v Ash Concentration Chart

Clarkson et al., (2016)  
 Prata, A. J. and W. I. Rose (2016)  
 Encyclopedia of Volcanoes 2<sup>nd</sup> Edition



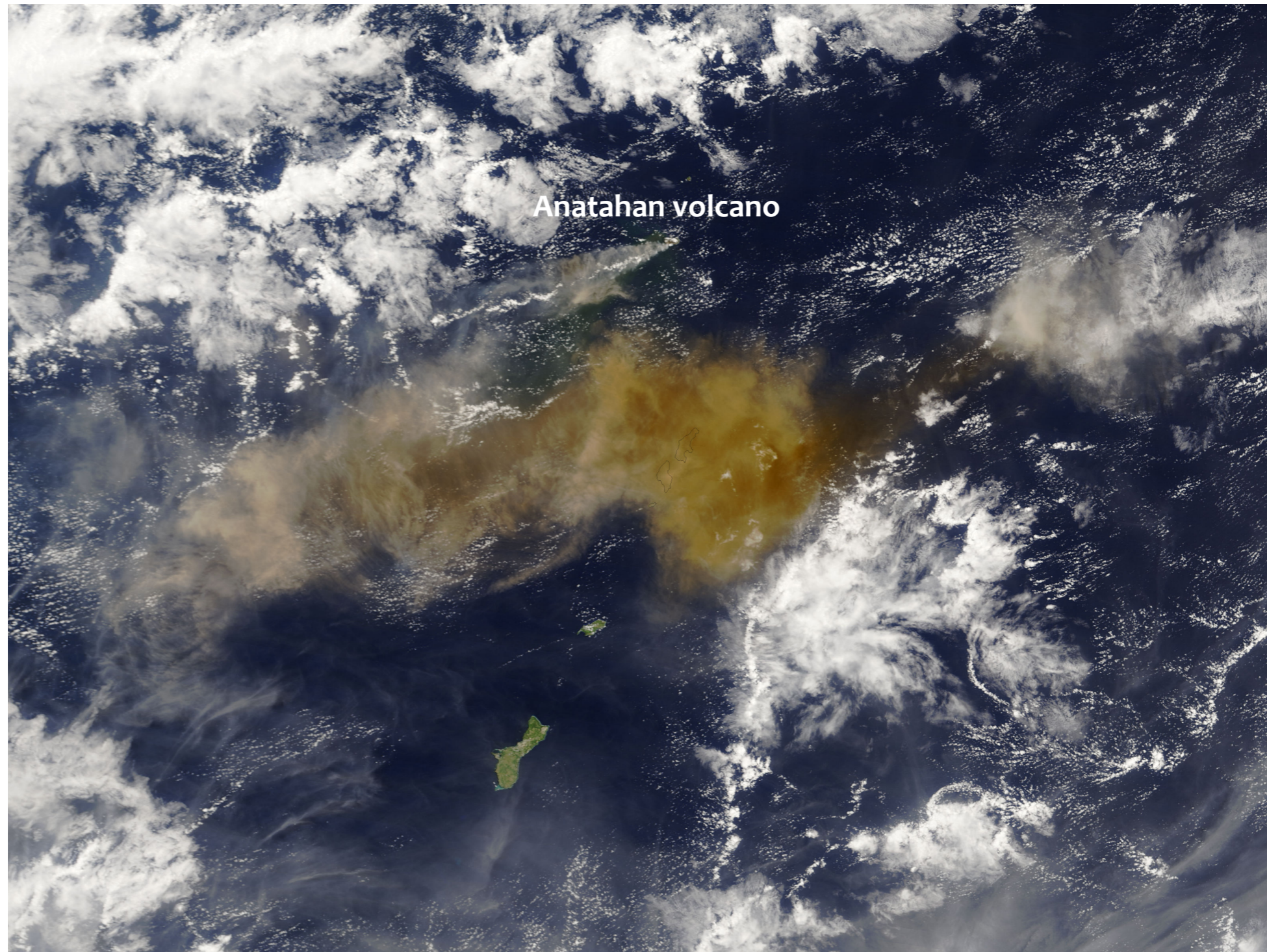
Move towards ash mass loadings rather than concentrations (maybe this will become “law”)  
Conclusion 7/16 — Definitions of visible ash and discernible ash for operational use. That:

***Visible ash be defined as:***

*“volcanic ash observed by the human eye  
and not be defined quantitatively by the  
observer”*

***Discernible ash be defined as:***

*“volcanic ash detected by defined impacts  
on/in aircraft or by agreed in-situ and/or  
remote-sensing techniques”*



Volcanic ash cloud appearance in MODIS True-colour imagery

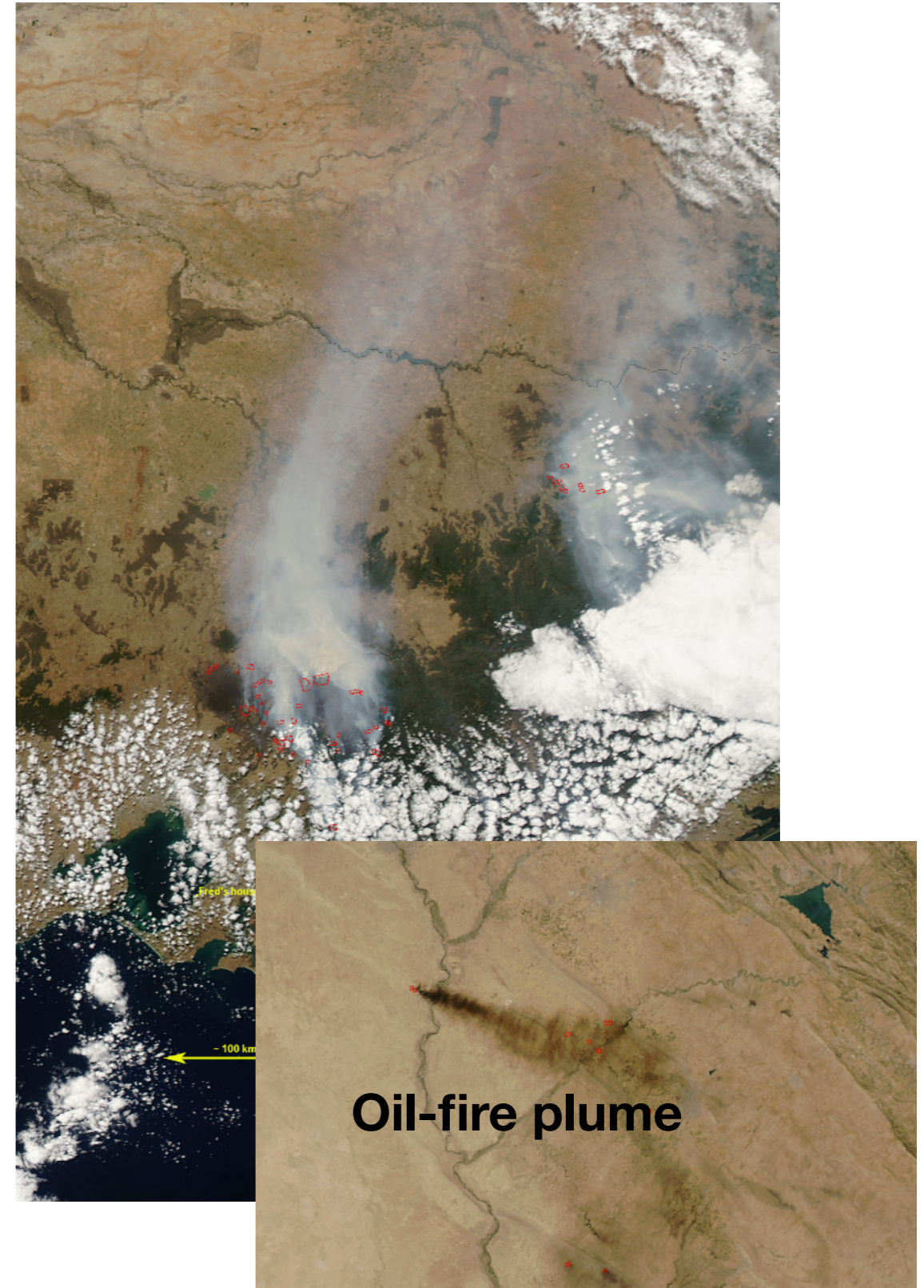
# Brightness Temperature Differences

How do you identify volcanic eruptions in satellite data?



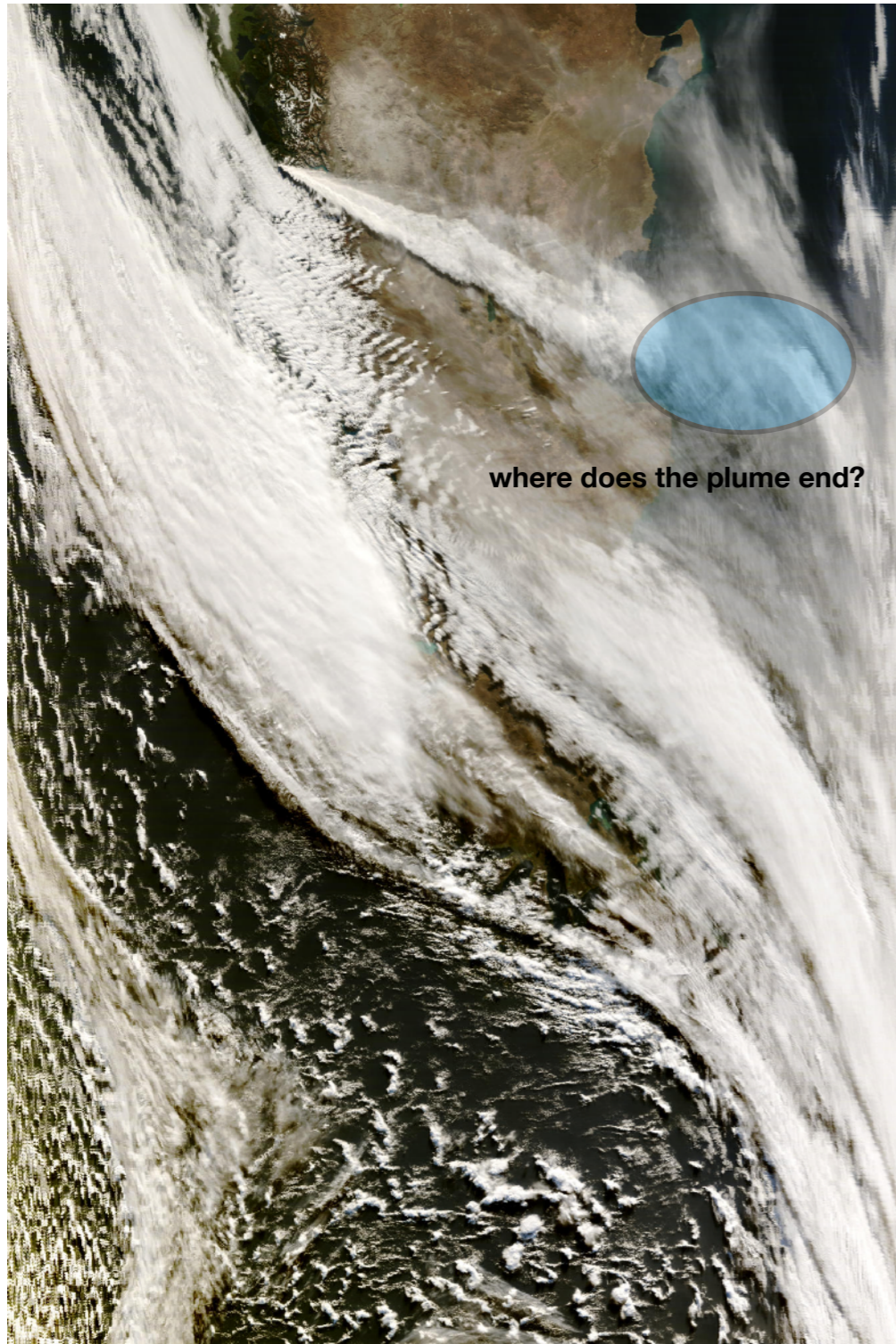
The appearance of a plume that is discolored and appearing to come from a point source is suggestive. These are fires.

Context is important





# Examples

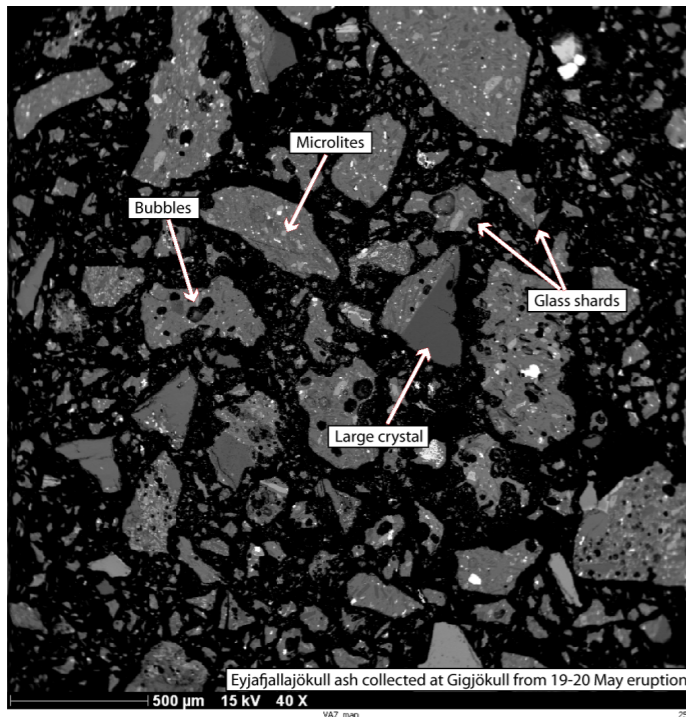


**This image shows a volcanic plume from Chaiten, southern Chile.**

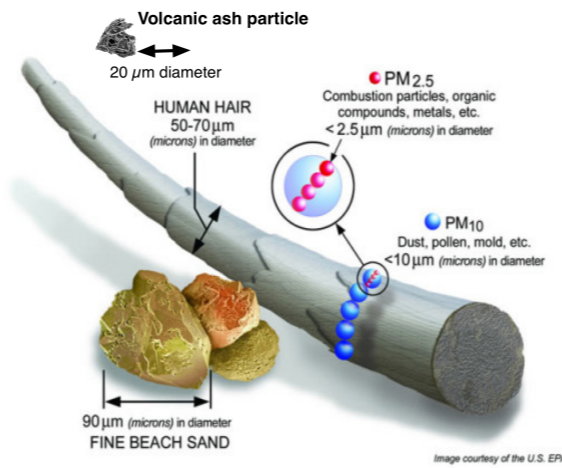
**The plume appears “white” – similar to surrounding meteorological cloud but from this “true-colour” MODIS image it is difficult to judge how much of the plume is volcanic**

# Properties of Volcanic Ash

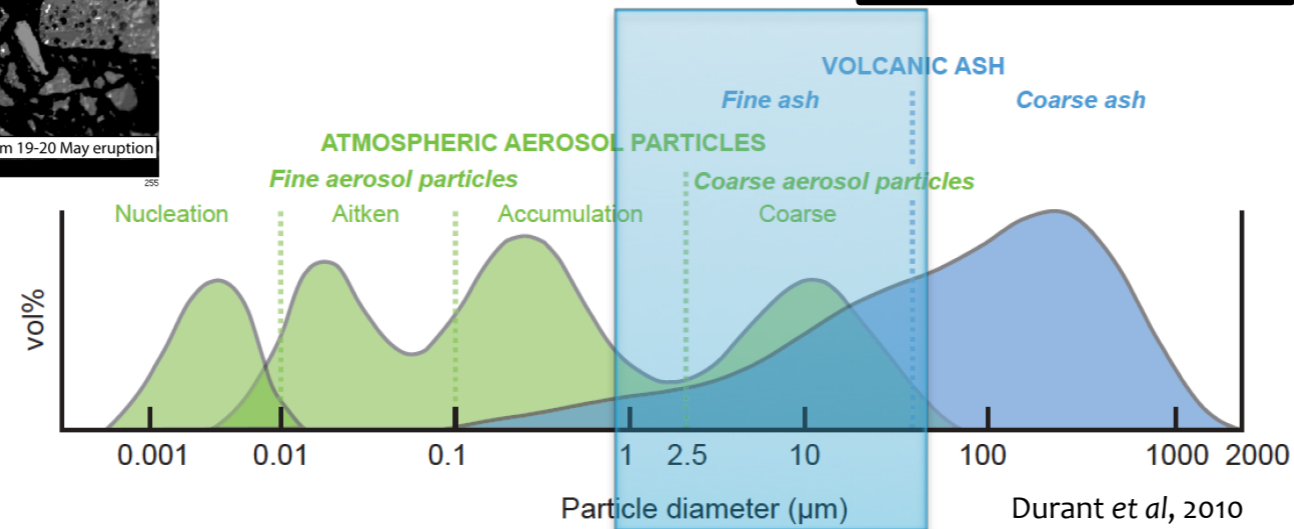
## Mt Redoubt ash



Courtesy: G. Prata, U of Oxford



Mineral	%Mass
SiO <sub>2</sub>	69.9
Al <sub>2</sub> O <sub>3</sub>	10.4
CaO	8.4
FeO	5.0
Na <sub>2</sub> O	4.3
MgO	0.5
K <sub>2</sub> O	0.3

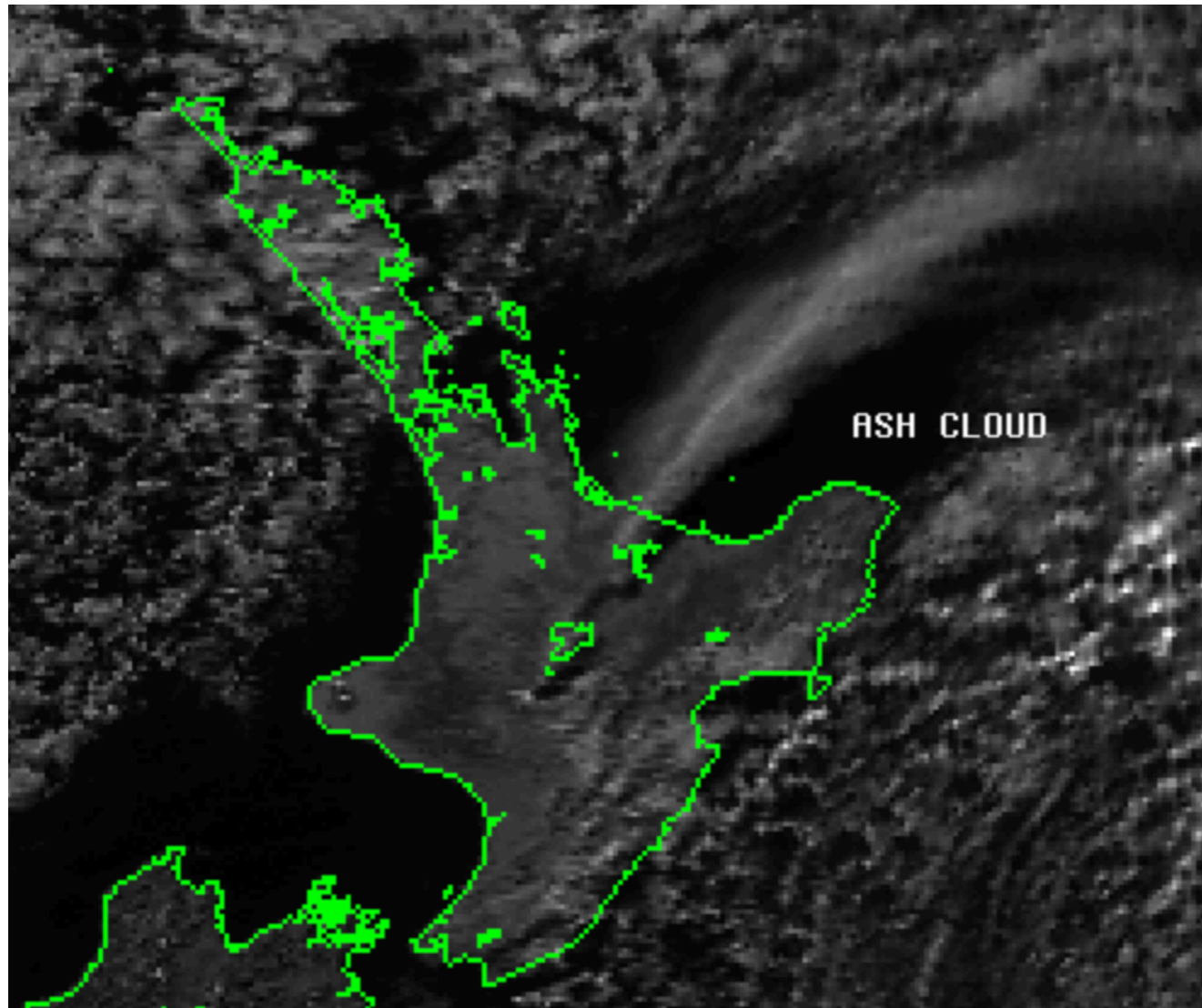


Durant et al, 2010

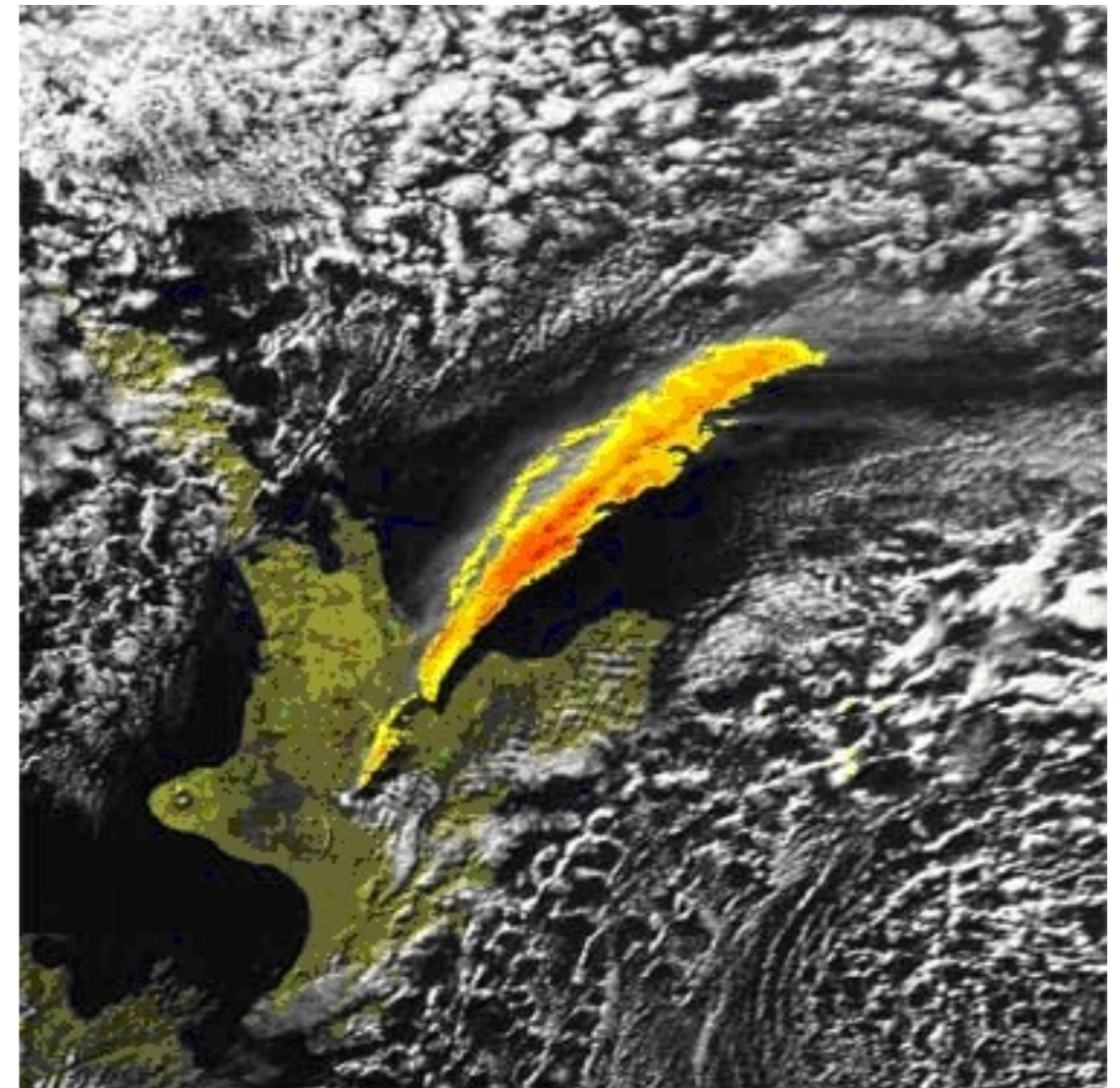
# Examples

## Using spectral IR data helps

AVHRR visible channel



True-colour with BTM overlay



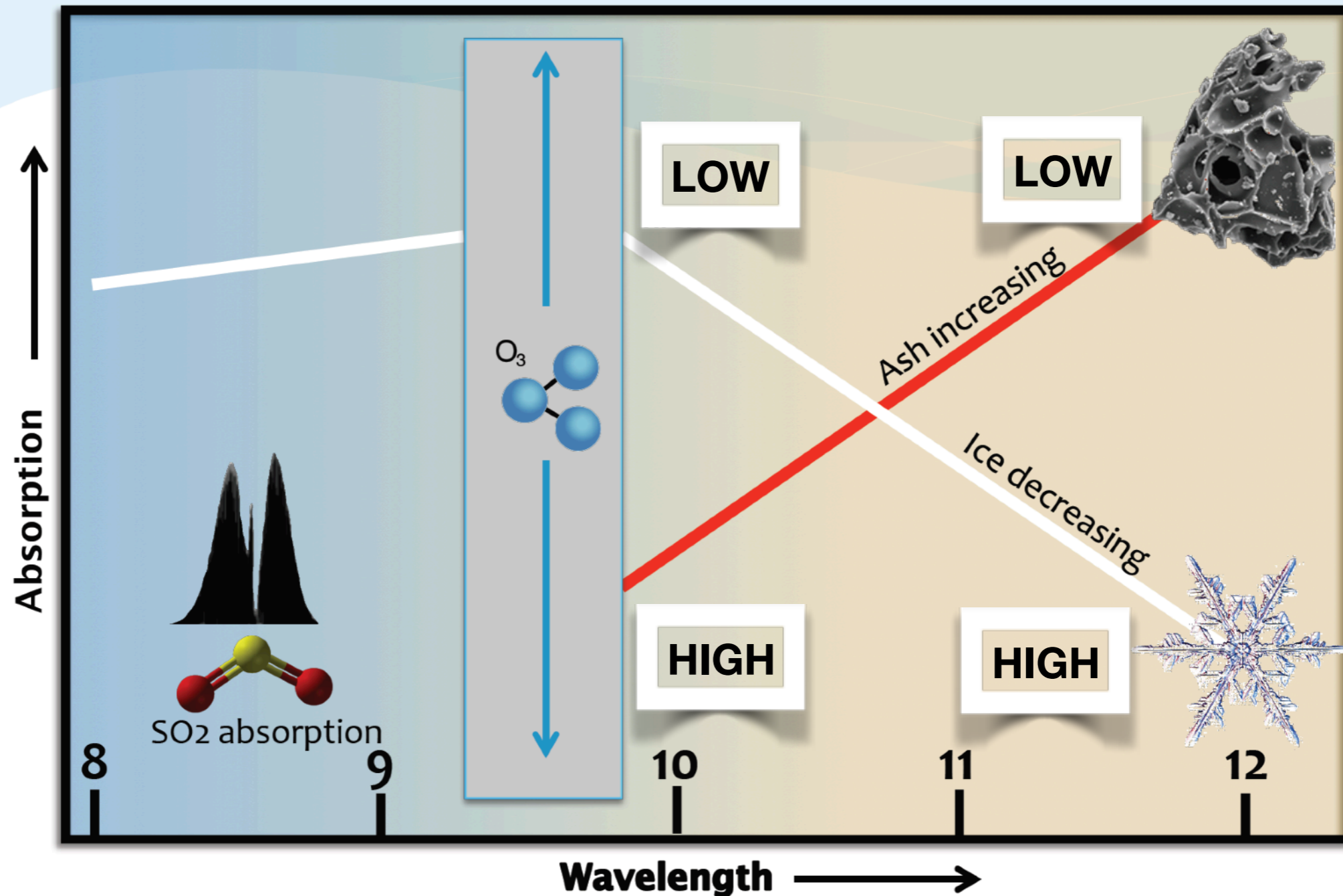
**Mt Ruapehu eruption, 17 June 1996**

Context helps but if this eruption occurred at night then visible cues are not available

# Examples

## Brightness temperature difference - the 'reverse' absorption effect

Ash absorption is the "reverse" of ice and water absorption

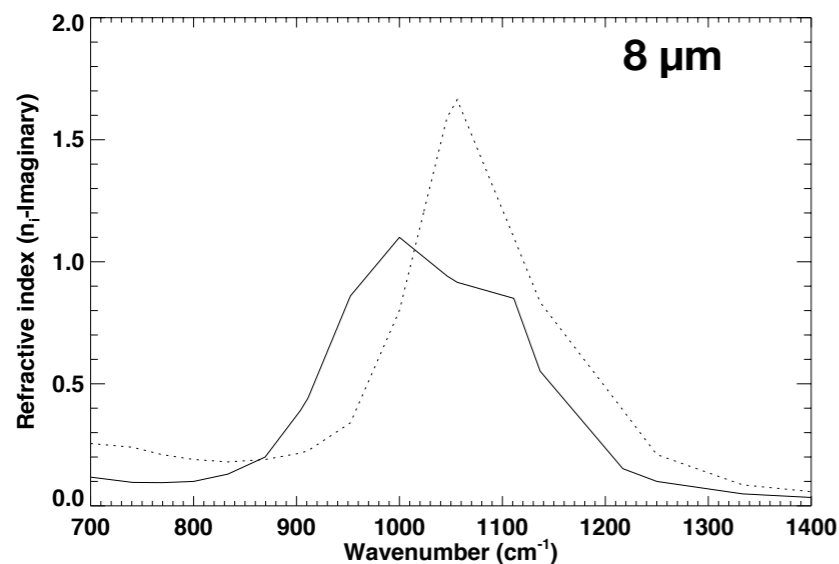
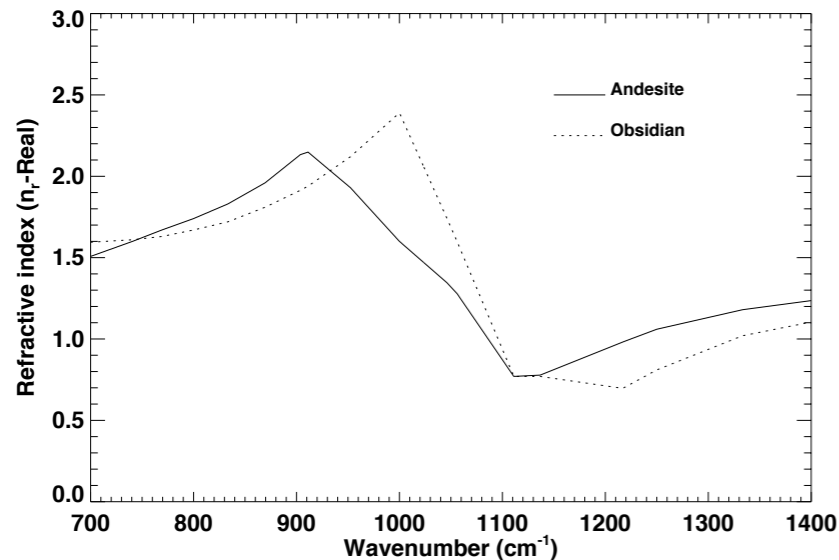


Smoke from forest fires or oil fires or industrial plumes **DO NOT** show the reverse absorption effect

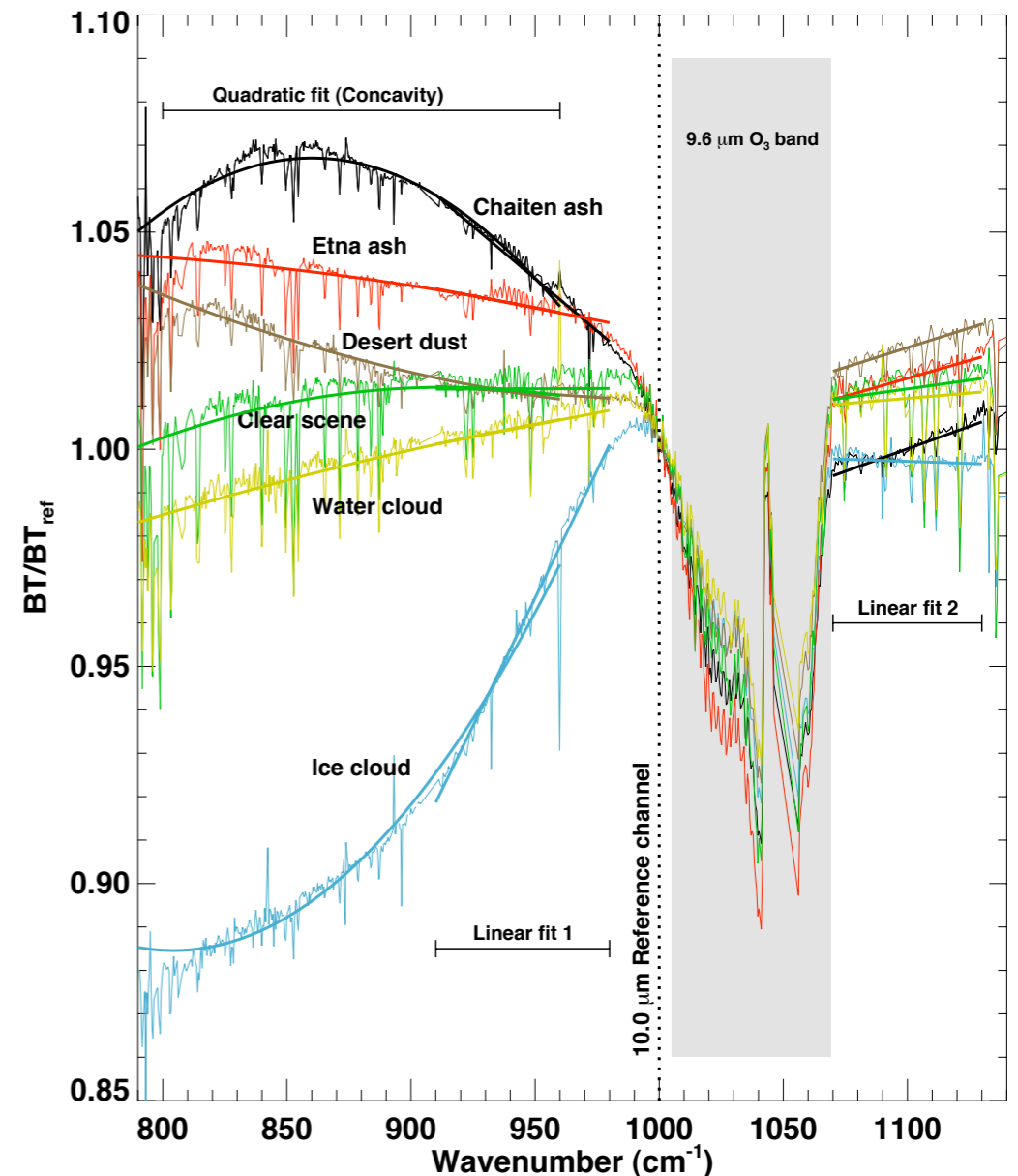
# Examples

## What causes the effect?

The  $\text{SiO}_2$  molecule exhibits internal crystal lattice vibrations that preferentially absorb radiation at certain infrared wavelengths. These are the restrahlen and Christiansen frequencies. The effects and locations of the vibrational frequencies are best seen in refractive index measurements.

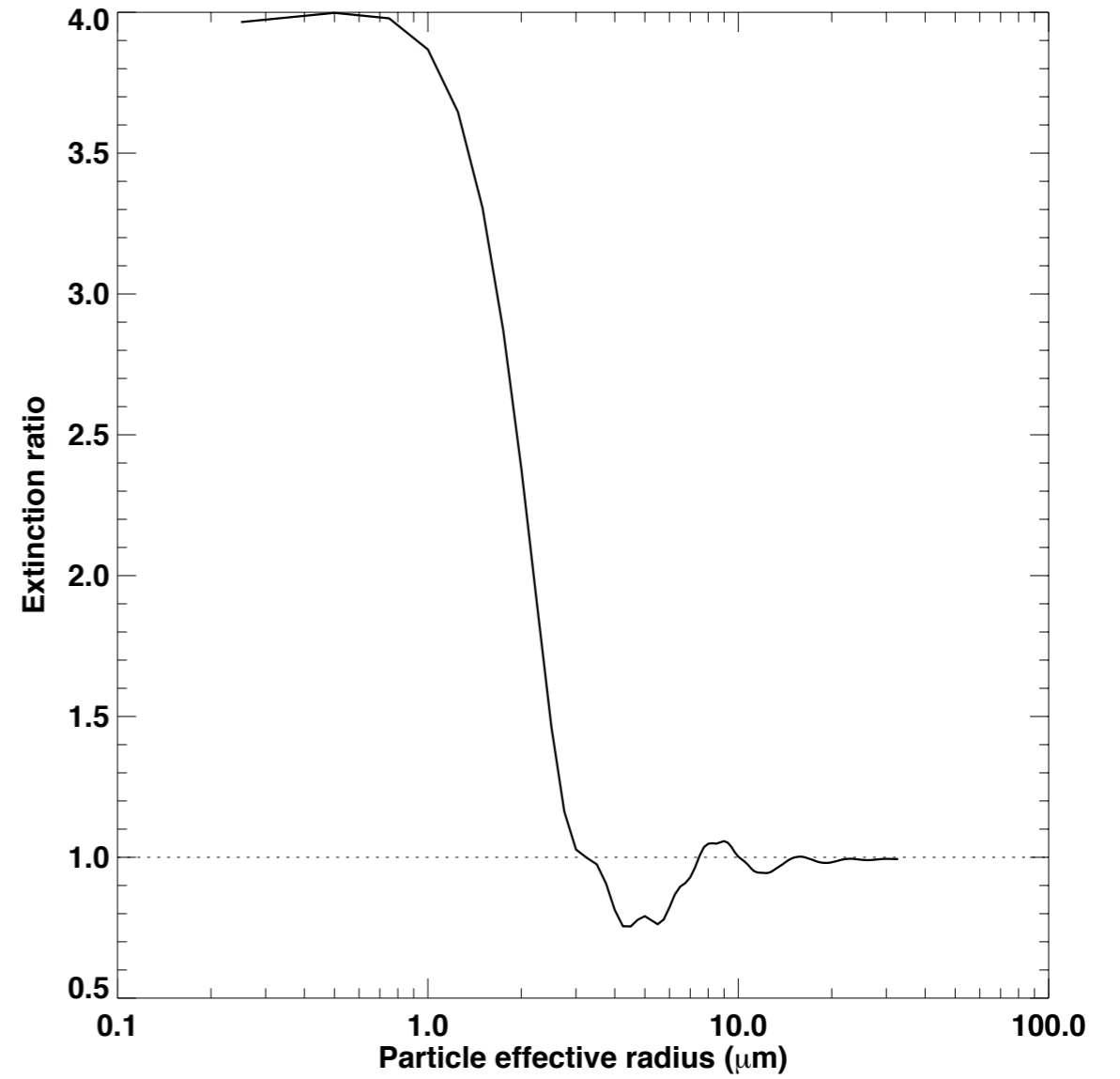
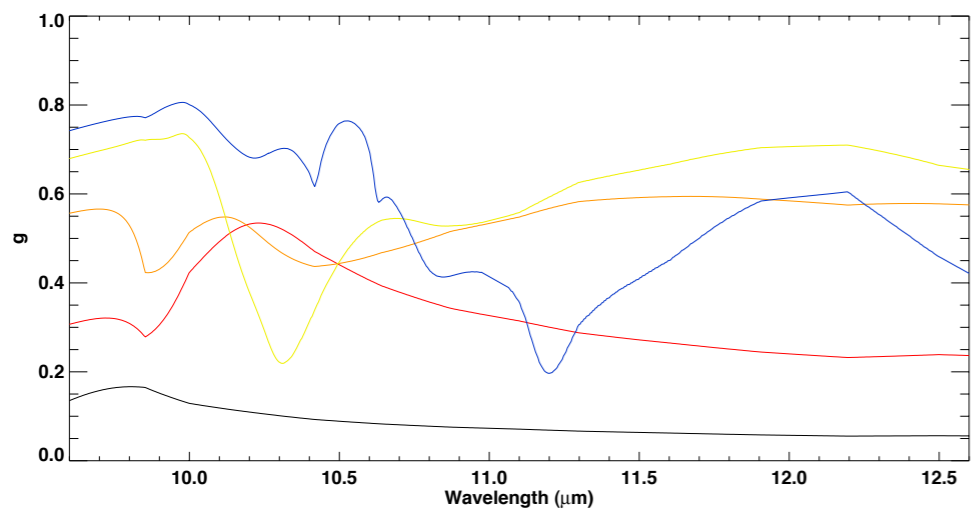
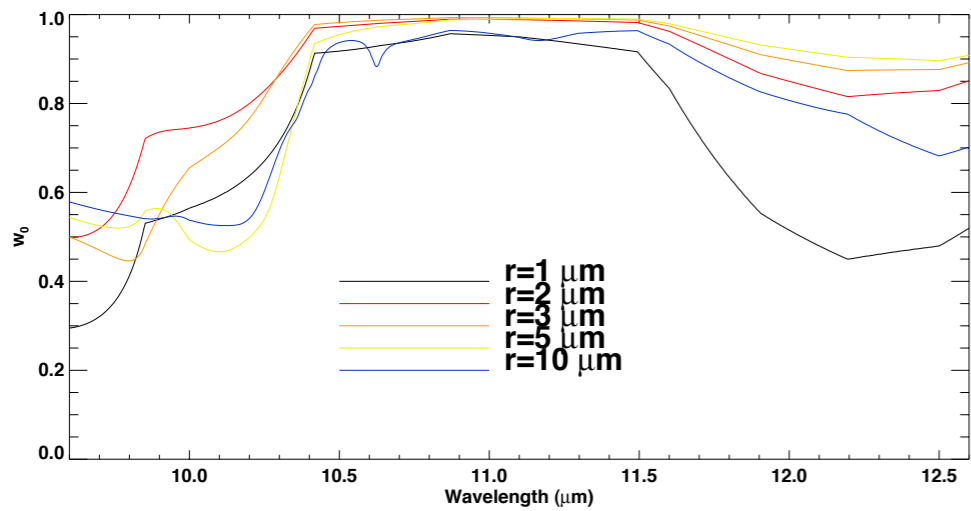
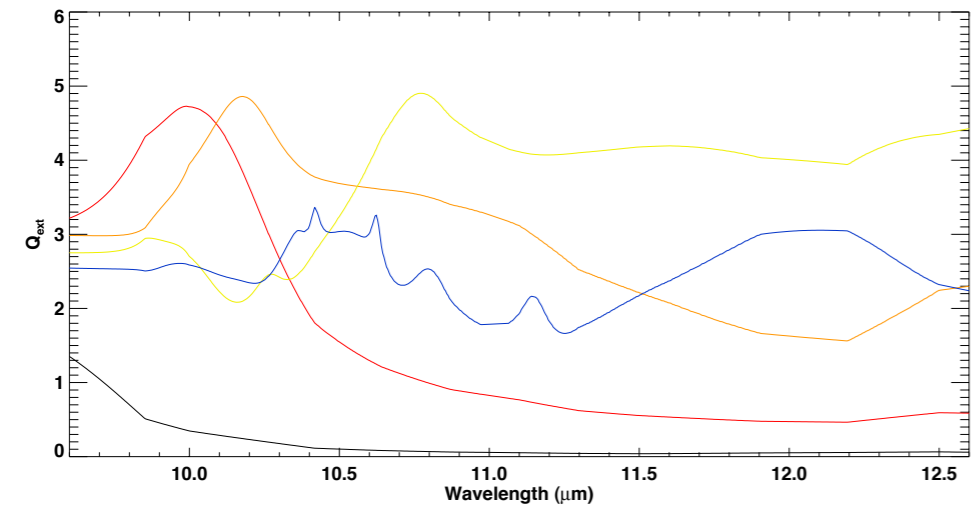


Peak in imaginary part of the refractive index implies greater absorption there



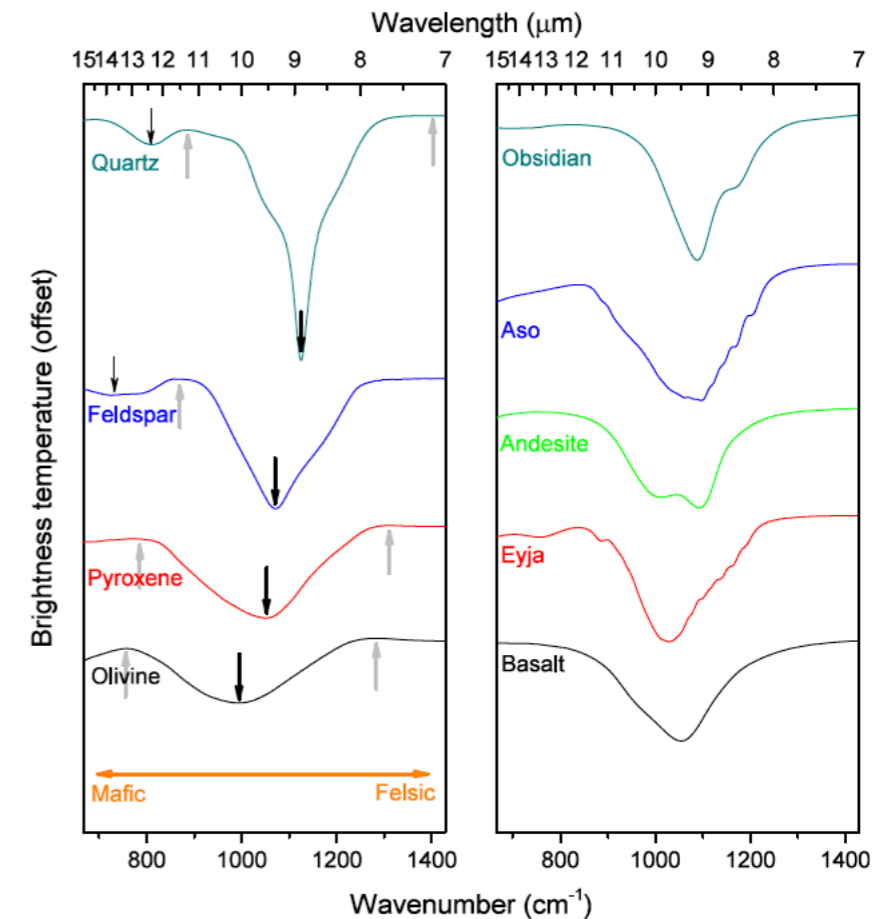
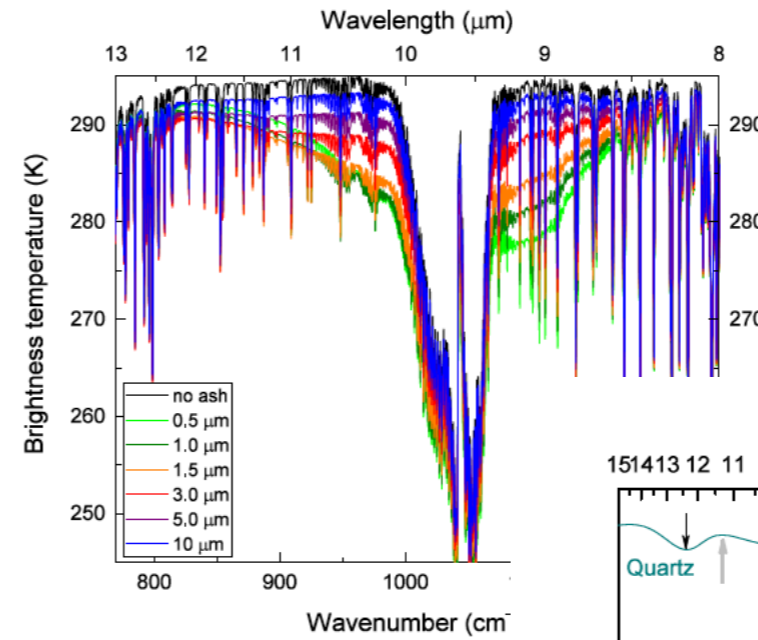
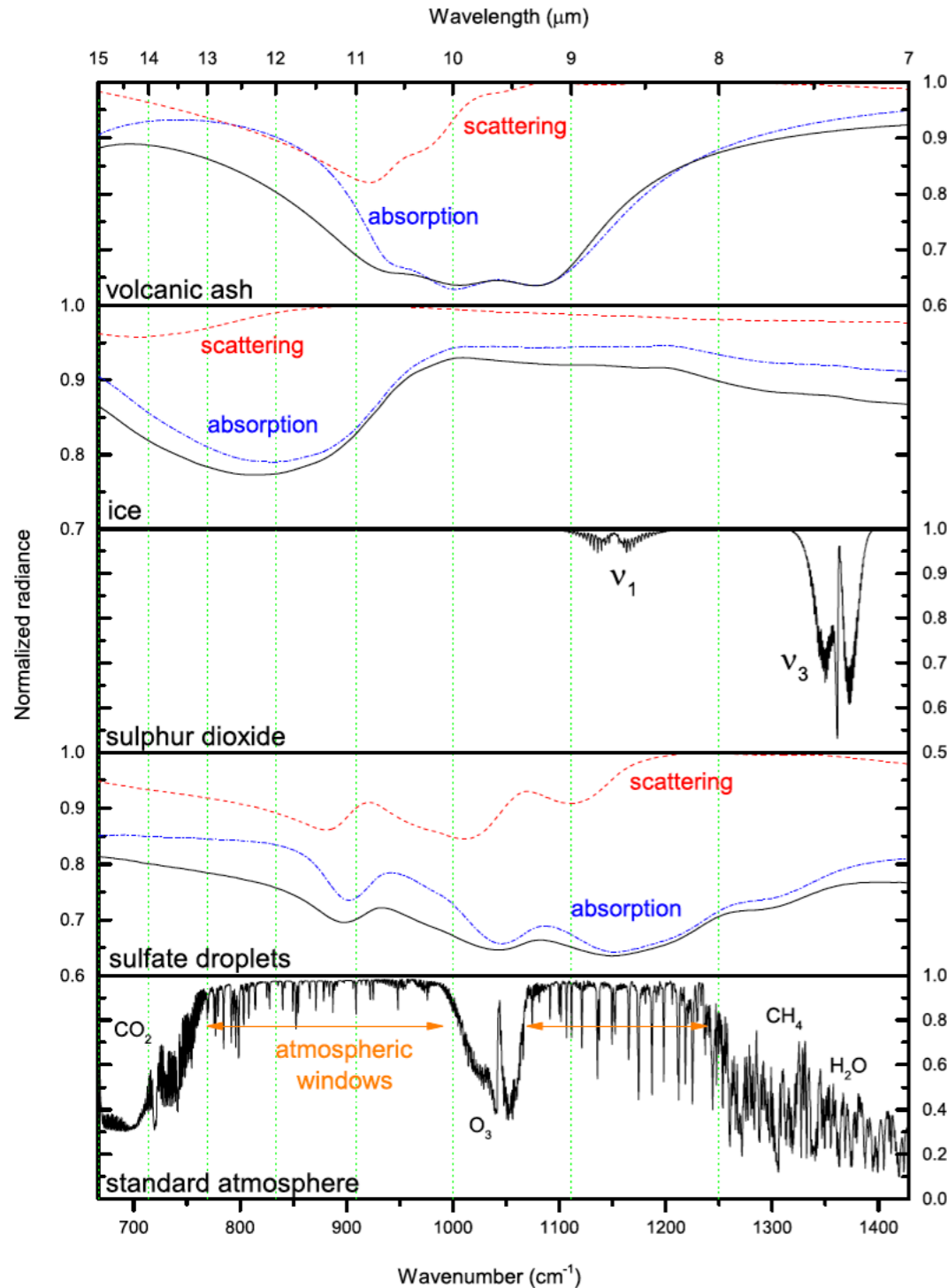
# Examples

There is a strong particle size and compositional effect

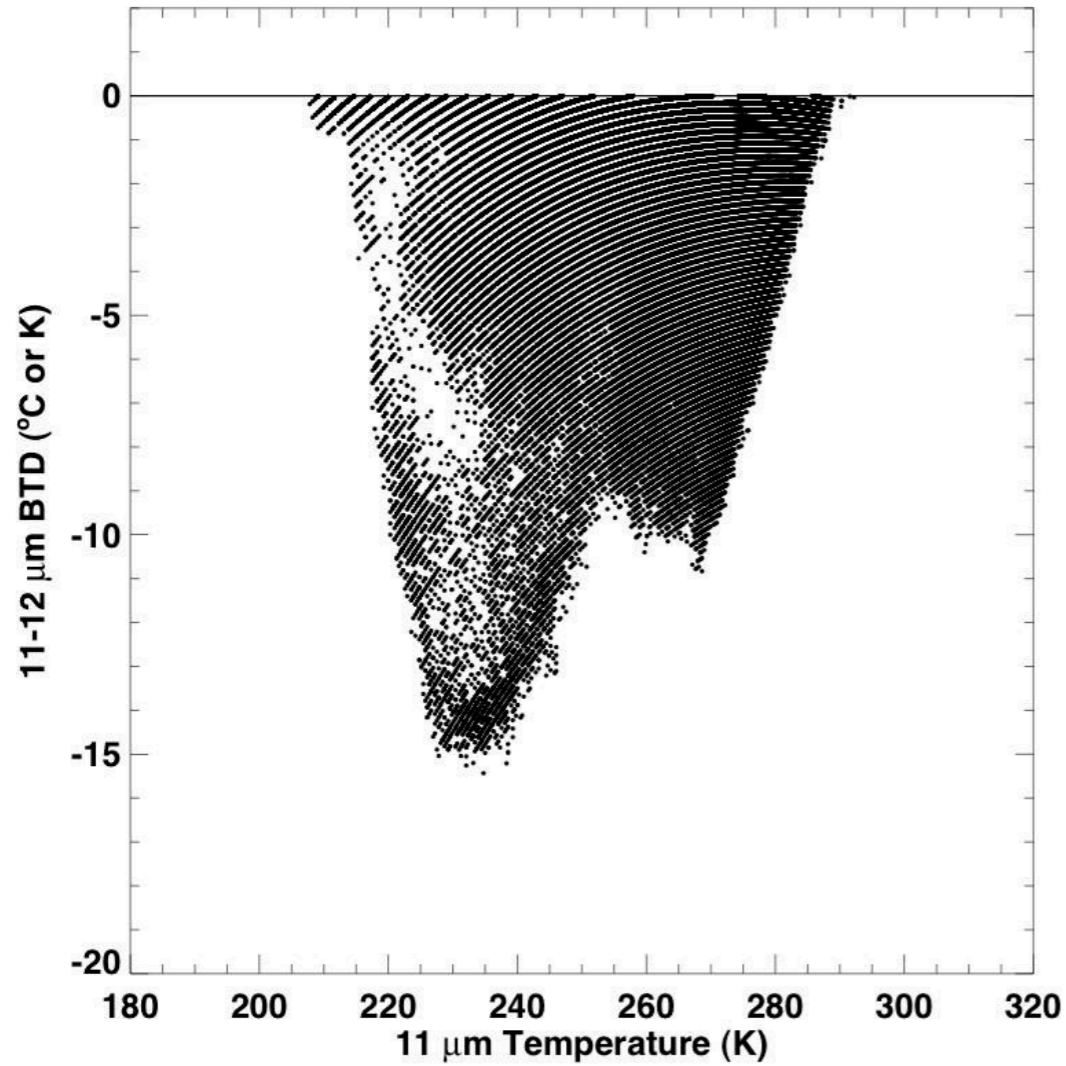


# Hyperspectral Infrared

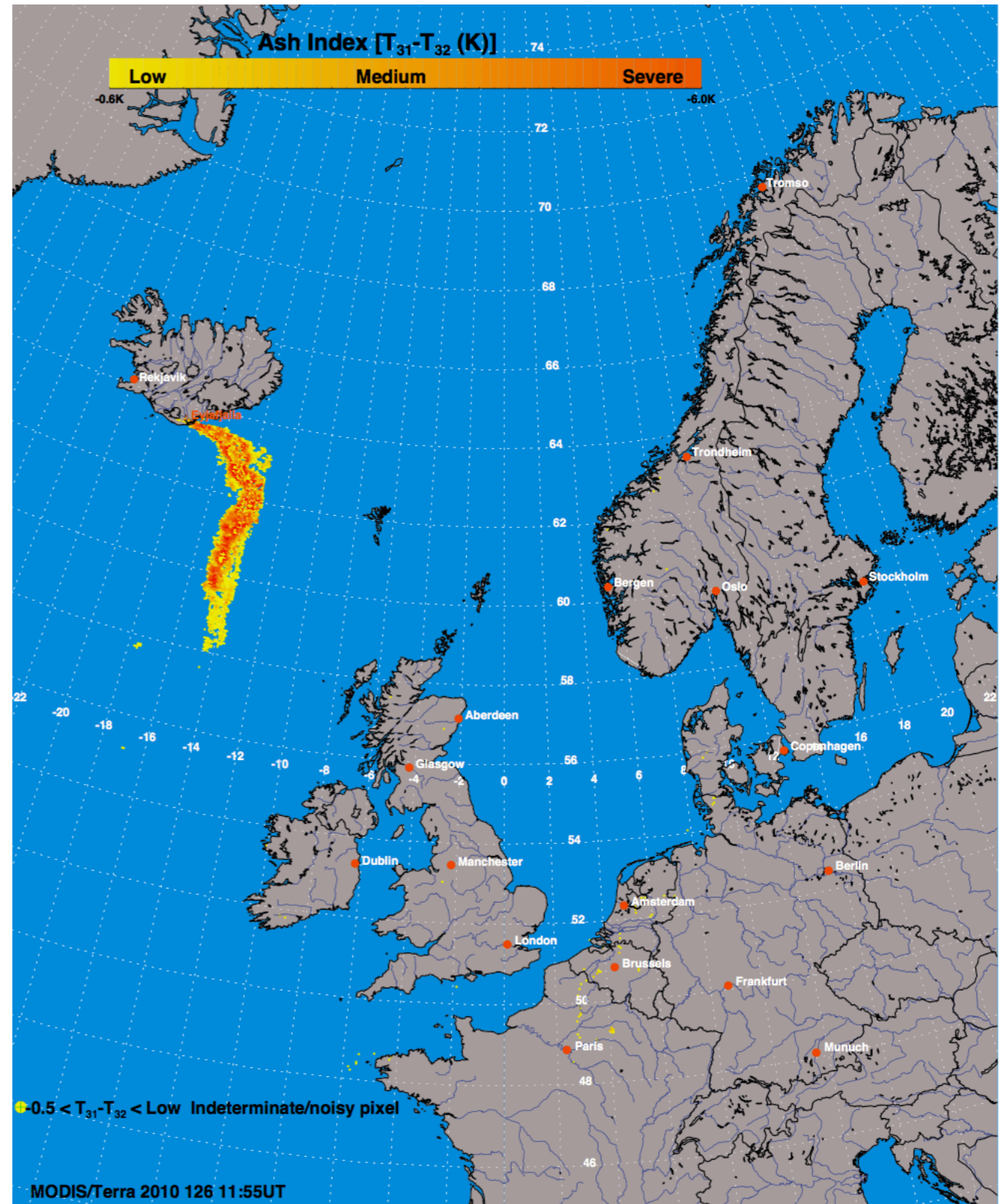
**AIRS and IASI provide 100s of channels in the IR and suggest the possibility of deriving new quantitative aspects of volcanic emissions**



# Examples

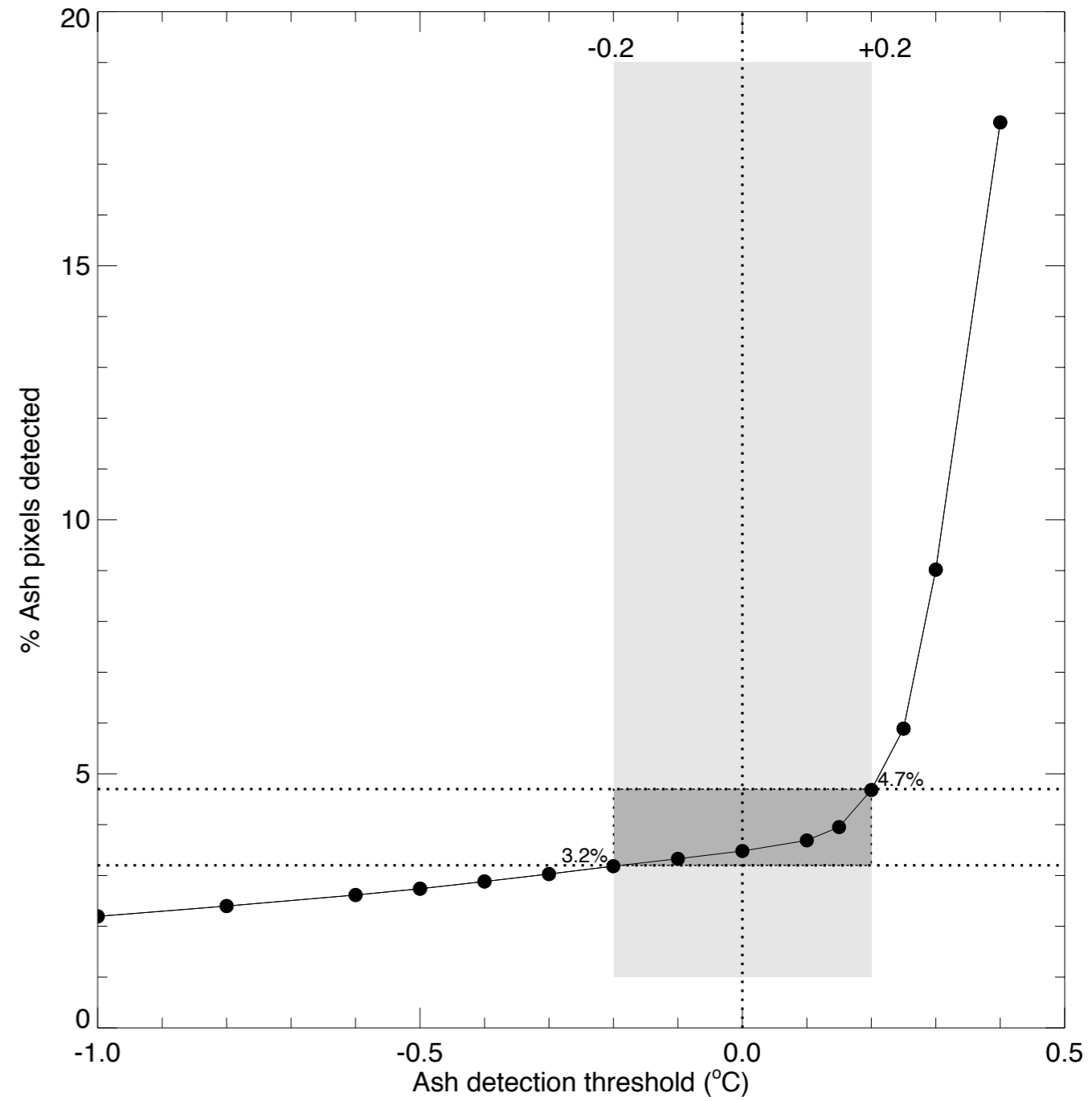
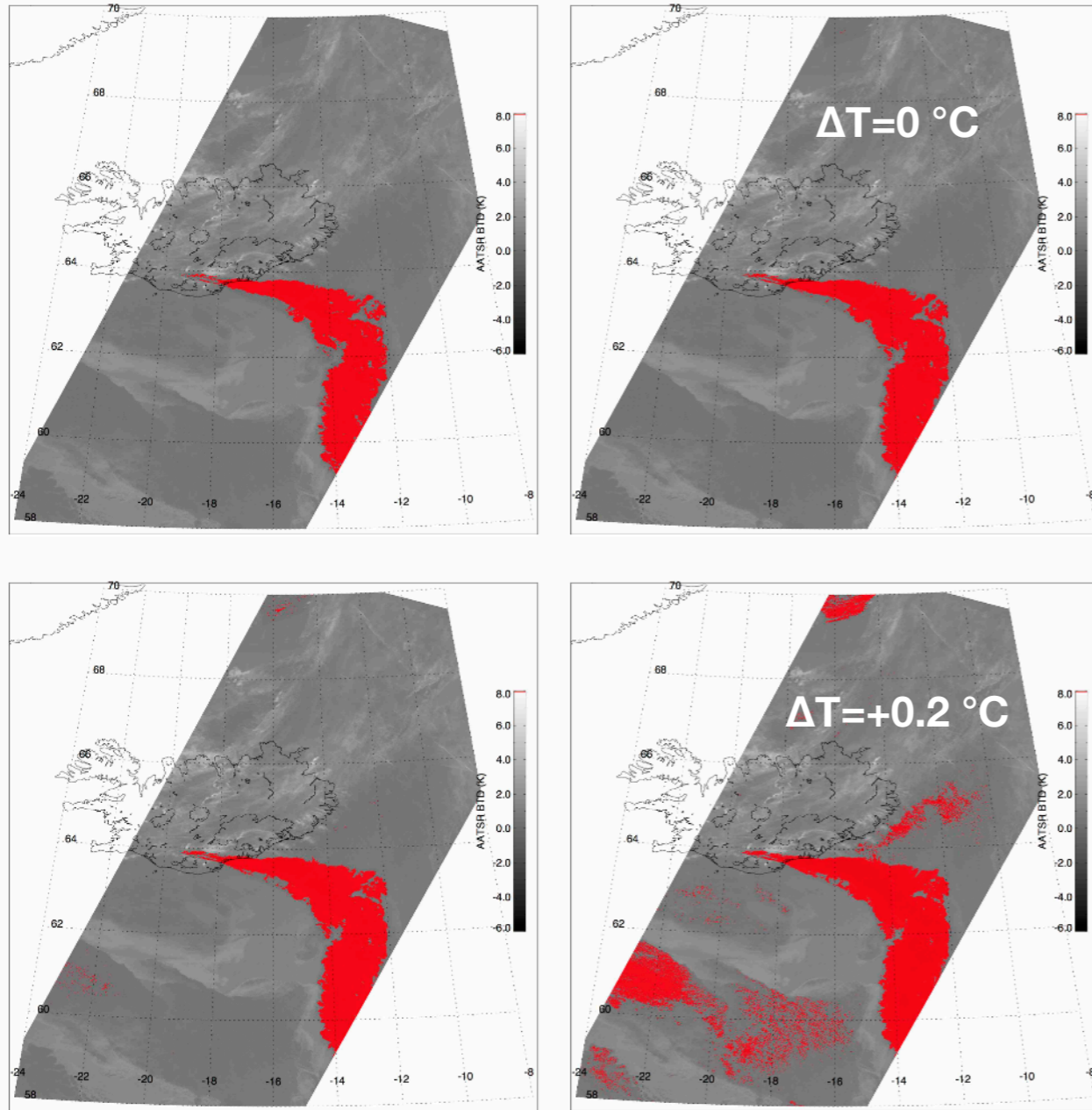


**Method:**  
 Plot  $T_{11}$  vs BTD ( $T_{11}-T_{12}$ )  
 Identify ash as all pixels with  $BTD < \Delta T$





# Examples (Setting the threshold)

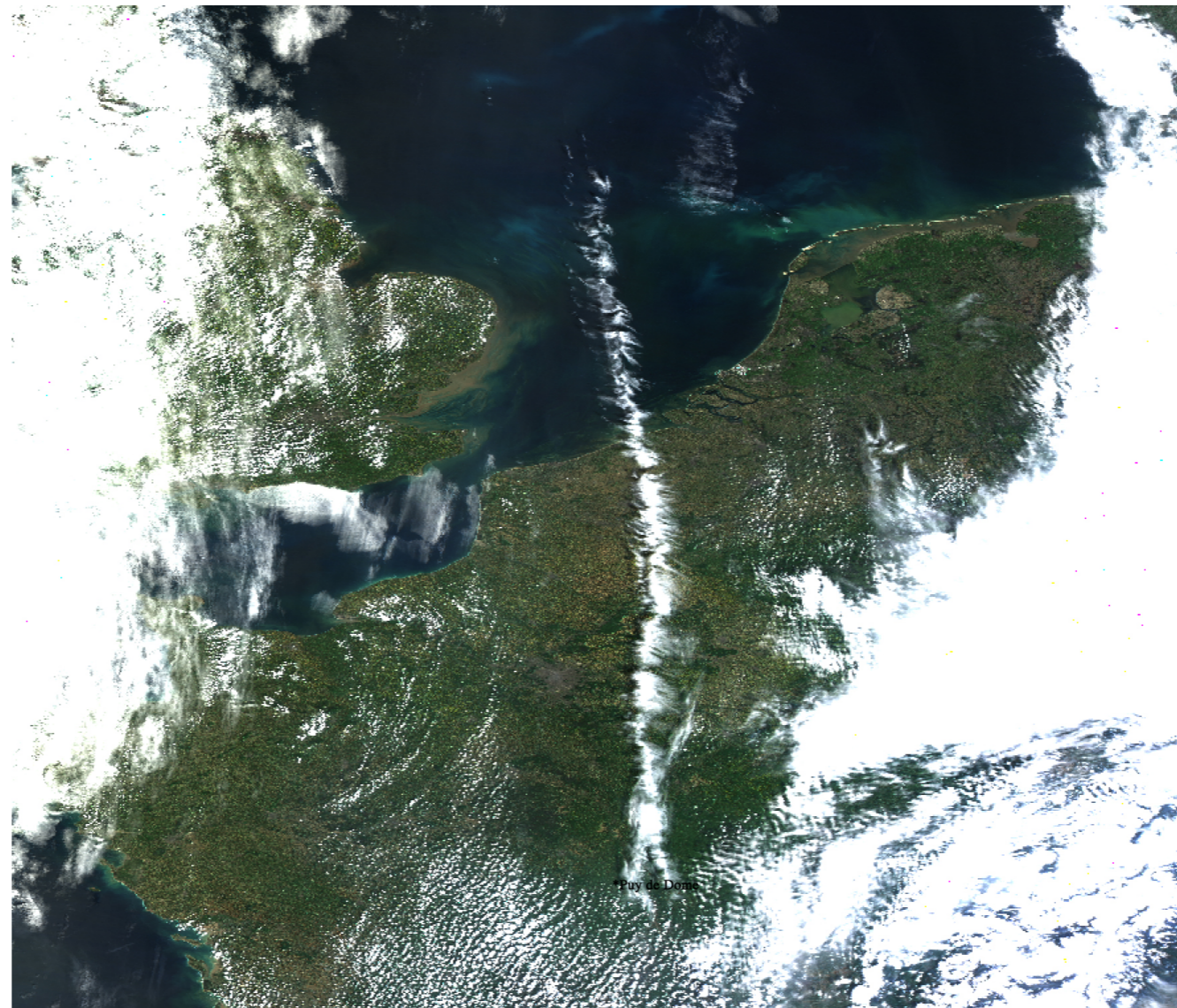


## MODIS True-colour image – Eyjafjallajökull

**Eyja**

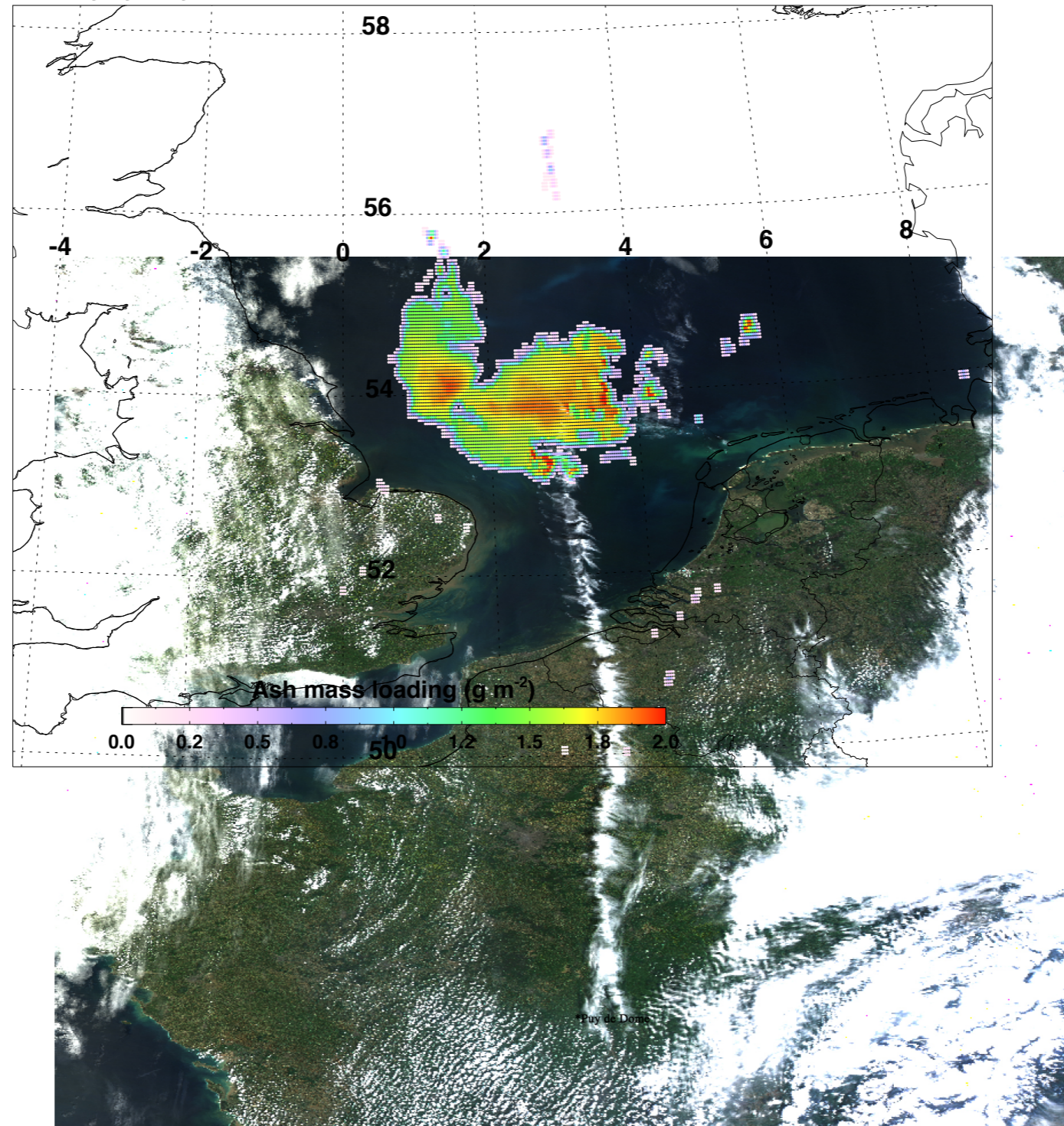
17 May 2010  
13:25 UT

Mass loadings



Eyjafjallajokull 17 May 2010 13:25UT MODIS/Aqua Mass= 0.008Tg

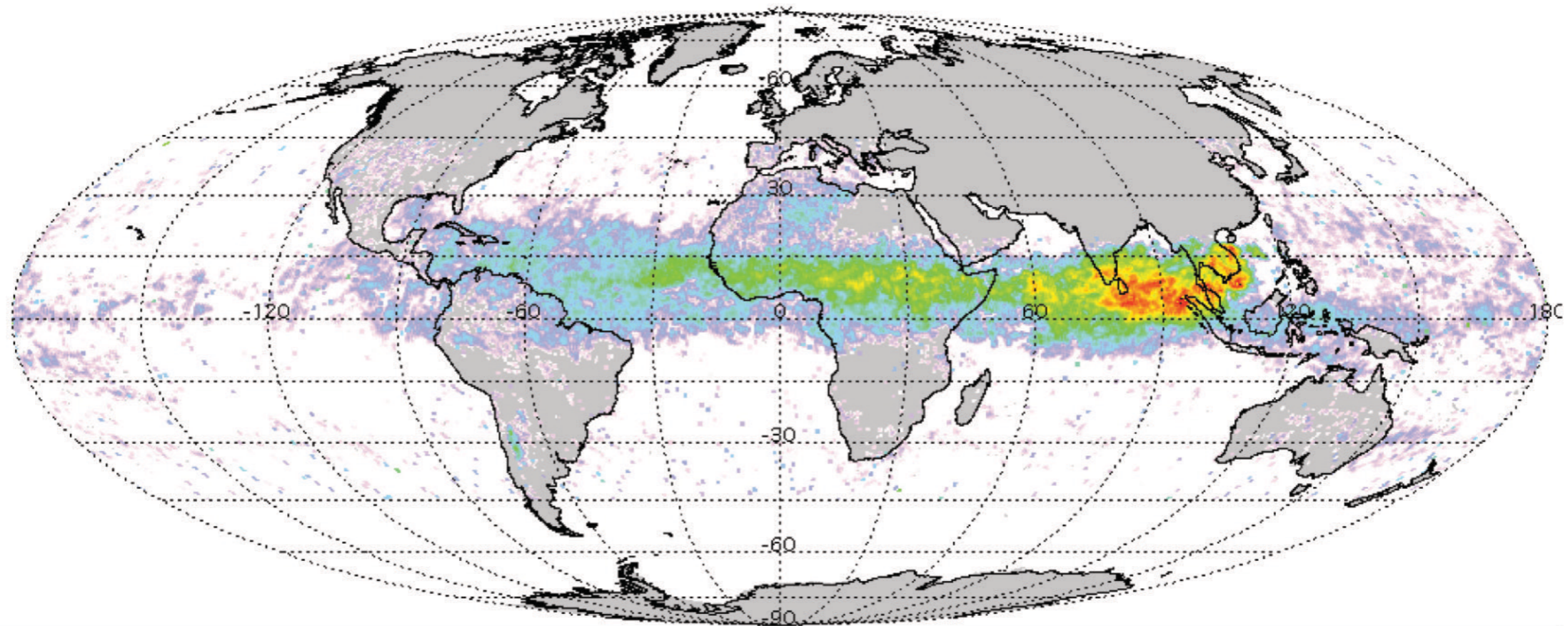
**Eyja**  
17 May 2010  
13:25 UT  
Mass loadings



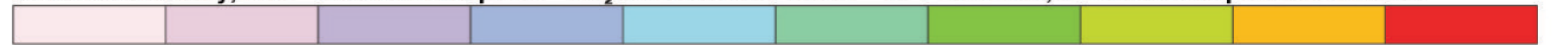
# Large Eruptions

## Pinatubo eruption June 1991

**No MODIS**  
**No AIRS**  
**No IASI**  
**No OMI**



15 June to 15 July, 1991 Pinatubo Eruption. SO<sub>2</sub> Derived from TOVS. Dr Fred Prata, CSIRO Atmospheric Research



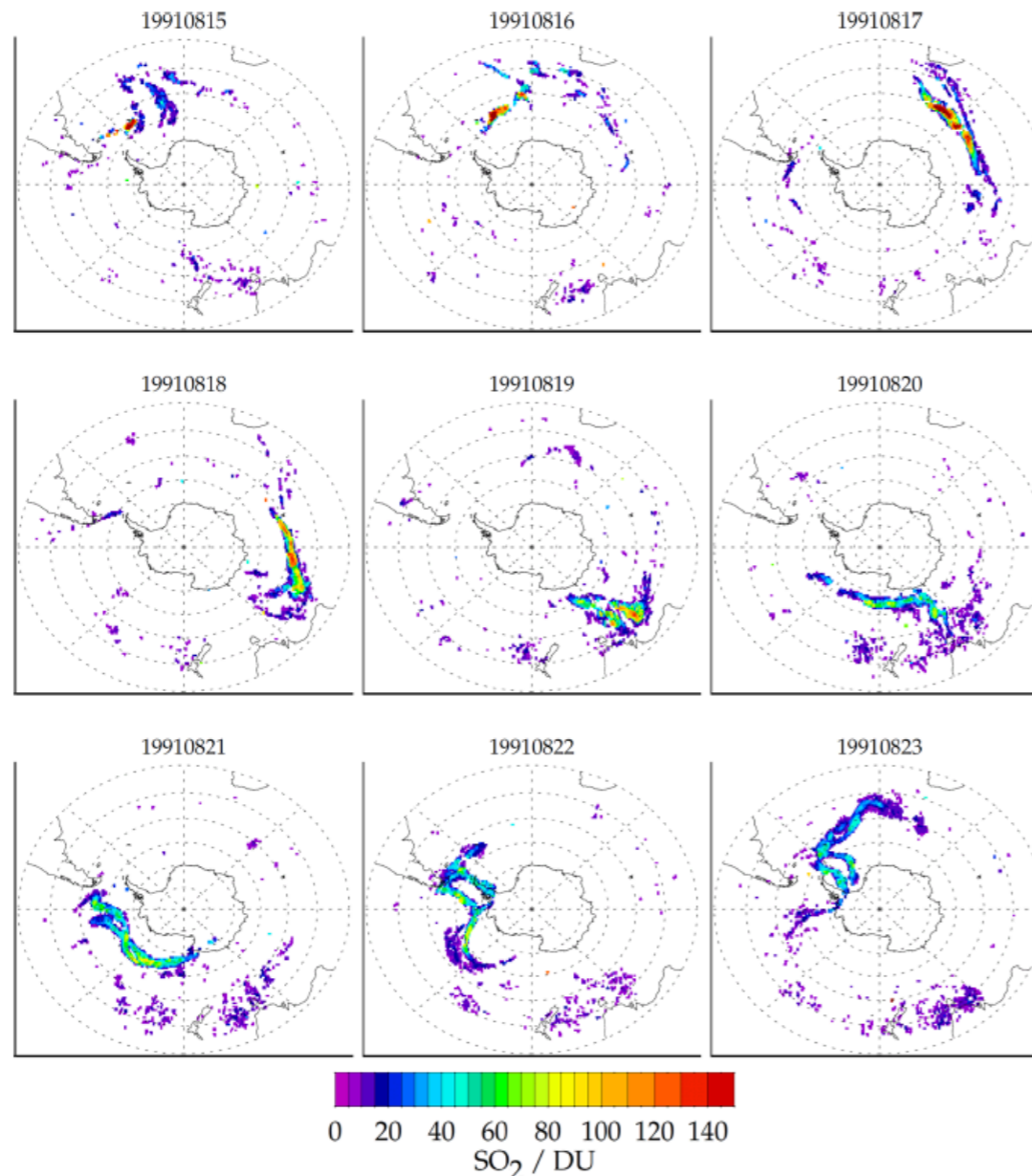
0 100 200 300 400 500 600 700 800 900 1000

SO<sub>2</sub> absorber amount (m atm-cm)

# Large eruptions

G. M. Miles et al.: Retrieval of volcanic SO<sub>2</sub> from HIRS/2 using optimal estimation

Table 3. Total erupted SO<sub>2</sub> rounded estimates for Cerro Hudson.



Eruptive phase	TOMS SO <sub>2</sub> <sup>1</sup>	TOMS SO <sub>2</sub> <sup>2</sup>	HIRS/2 Prata fit <sup>3</sup>	HIRS/2 OE <sup>4</sup>
8–9 August	700 kT	–	300 kT	500 ± 150 kT
12 August	600 kT	–	400 kT	300 ± 90 kT
15 August	2700 kT	2000 kT	1200 kT	1500 ± 400 kT

<sup>1</sup> Constantine et al. (2000), with errors estimated to be circa 30%. <sup>2</sup> This work, based on updated TOMS algorithm, for total mass as observed on 16 August (as region was poorly observed on the 15th) with consideration of pixel overlap within orbit. <sup>3</sup> After Prata et al. (2003), but data reproduced and sampled as OE HIRS/2 product is herein. <sup>4</sup> This work, with retrieved error.

<https://www.atmos-meas-tech.net/10/2687/2017/>

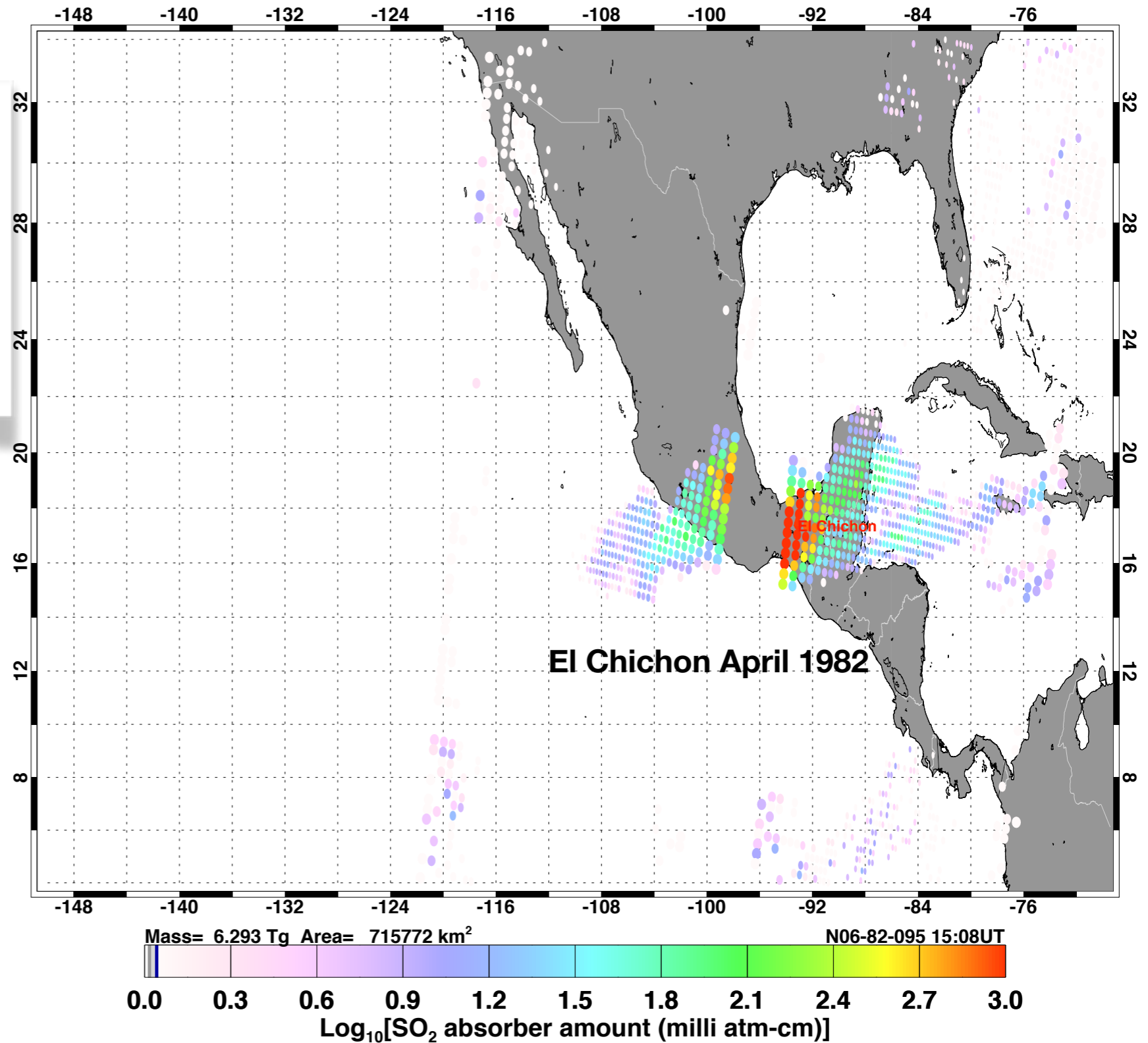
**Hudson, Chile. August 1991**  
**Probably 3rd\* largest SO<sub>2</sub>**  
**emission in the satellite era**

\*Pinatubo ~18Tg  
 El Chichon ~6Tg  
 Hudson ~4Tg  
 Nabro ~4Tg  
 Kasatochi ~2Tg

Figure 8. Progression of main erupted plume from 15 August 1991, using all orbits (day and night) from HIRS/2 NOAA 11. The eruption began with smaller amounts emitted from 8 August, which are apparent on the 15th and disassociated from the main plume. The plume's transport between observations is evident, particularly from 21 August, where it is captured multiple times by multiple swaths. Data have been screened at the 3σ level (8.1 DU) for clarity of the main plume.

# Large Eruptions

For large eruptions weather satellite data from 1979 onwards can be used to determine SO<sub>2</sub> mass loadings based on a channel at 7.3 μm. This has implications for analysing the effects of volcanic emissions on climate.

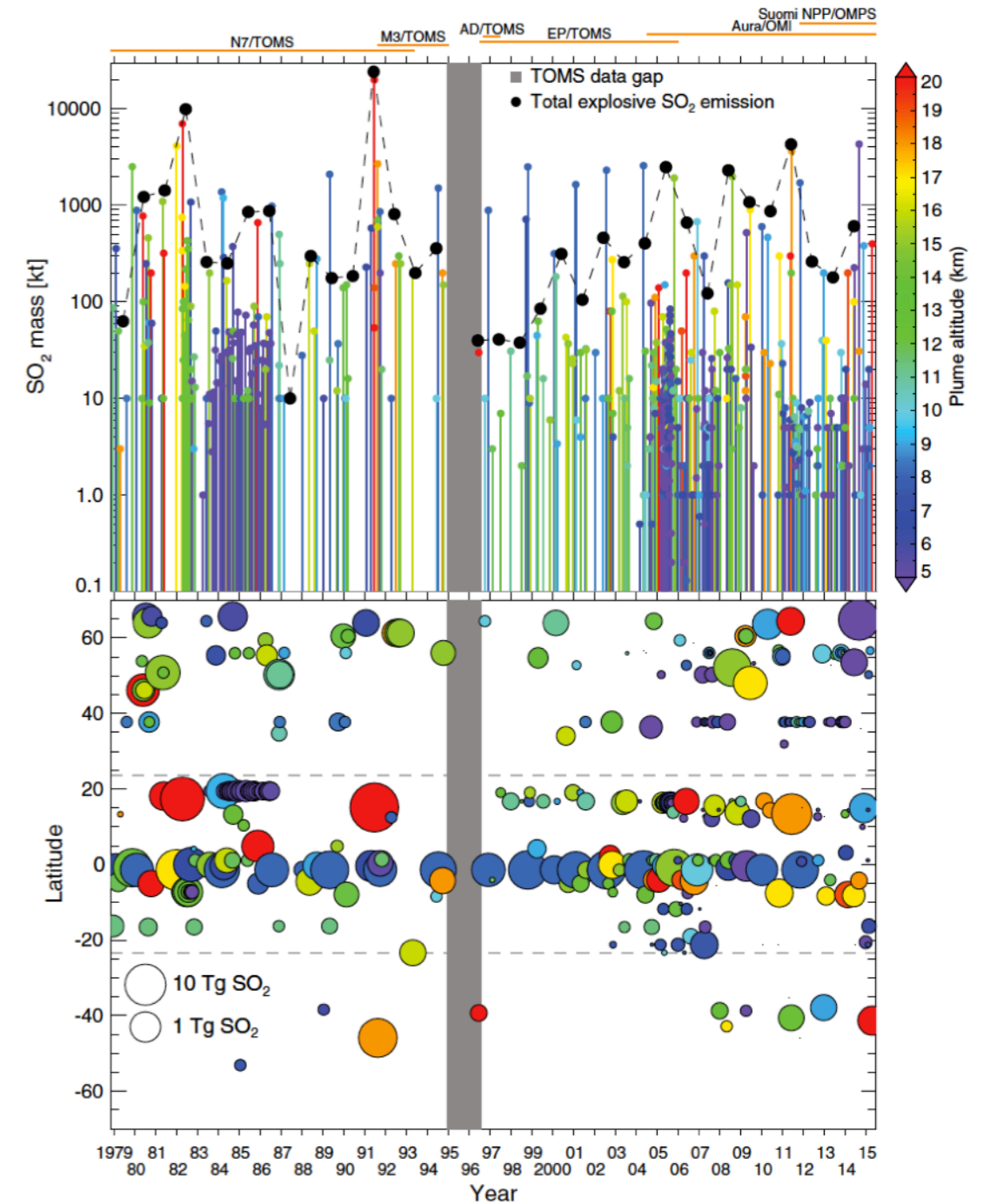


# Large eruptions

Table 1  
Volcanic gases measured or potentially detectable from space.

Sensor <sup>a</sup>	Volatile species										Timespan	Reference(s) <sup>b</sup>
	H <sub>2</sub> O	CO <sub>2</sub>	CO	SO <sub>2</sub>	H <sub>2</sub> S	HCl	BrO	OCIO	CH <sub>3</sub> Cl			
TOMS*				Red							1978–2005	1, 2
SBUV* (P)				Red							1978–present	3, 4
HIRS*				Red							1978–present	5
GOME	Light gray			Red					Light gray		1995–2003	6, 7, 8, 9
MODIS*	Light gray			Red							1999–present	10, 11
ASTER				Red							1999–present	12, 13, 14
MOPITT			Light gray	Red							1999–present	15
SCIAMACHY (L)	Light gray	Light gray		Red				Light gray	Light gray		2002–2012	8, 16, 17, 18
MIPAS (L)				Red							2002–2012	19
AIRS		Light gray		Red							2002–present	20, 21
ACE (L)				Red					Light gray		2003–present	22
SEVIRI				Red							2004–present	23
OMI				Red				Light gray	Light gray		2004–present	18, 24, 25, 26
MLS* (L)	Light gray			Red		Light gray		Light gray	Light gray		1991–2001; 2004–present	27, 28, 29, 30
TES (P)				Red							2004–present	31
GOME-2*	Light gray			Red				Light gray	Light gray		2006–present	18, 32, 33, 34
IASI*	Light gray			Red							2006–present	15, 35, 35
OMPS*				Red					Light gray		2011–present	37
VIIRS				Red							2011–present	38
CrIS				Light gray							2011–present	39
AHI				Light gray							2015–present	40
GOSAT (P)		Light gray		Light gray							2009–present	41
OCO-2		Light gray		Light gray							2014–present	42

Red = detected in a volcanic cloud; Light gray = potentially detectable but not yet proven in a volcanic context and/or not viable for routine volcanic measurements (e.g., due to background interference).



Journal of Volcanology and Geothermal Research  
Volume 311, 1 February 2016, Pages 99–134



Review

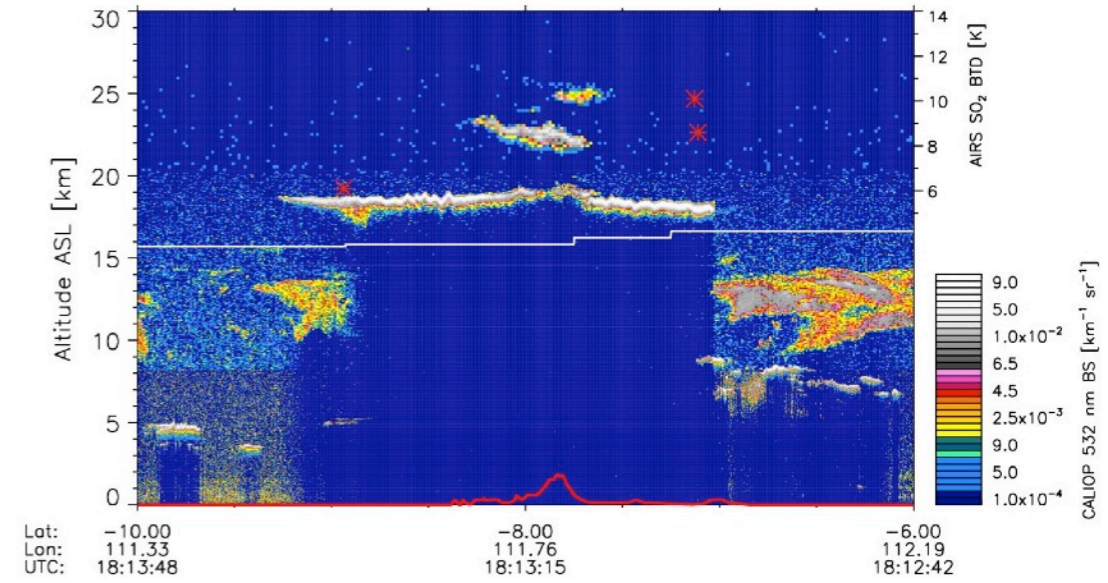
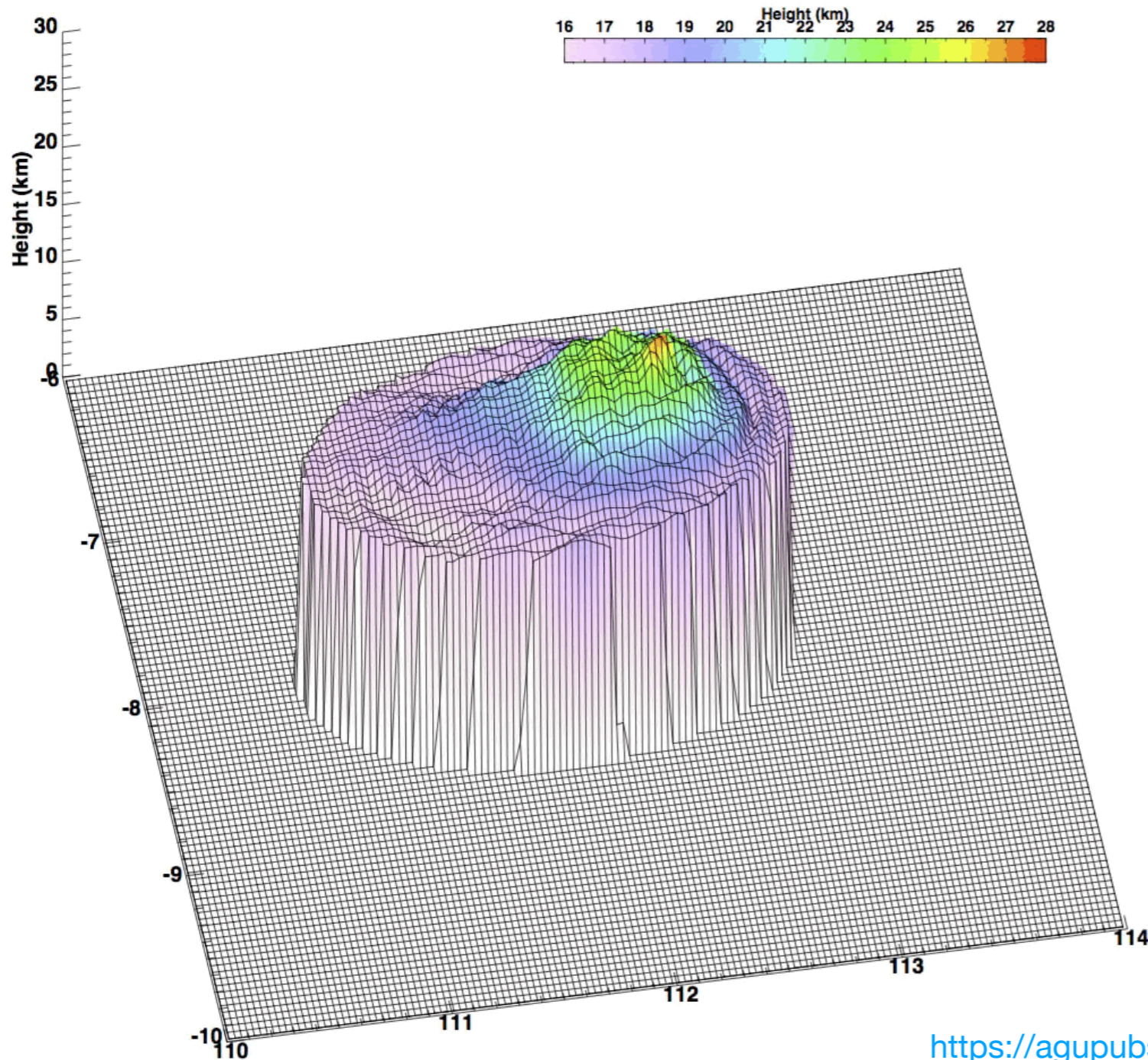
Multi-decadal satellite measurements of global volcanic degassing

S.A. Carn <sup>a, b, c, d</sup>, L. Clarisse <sup>e</sup>, A.J. Prata <sup>d</sup>

<https://www.sciencedirect.com/science/article/pii/S0377027316000032>

# Large eruptions - Kelut

Kelut plume topography. 13 Feb 2014 18:10 UT. MODIS/Aqua



<https://agupubs.onlinelibrary.wiley.com/doi/abs/10.1002/2014GL062307>

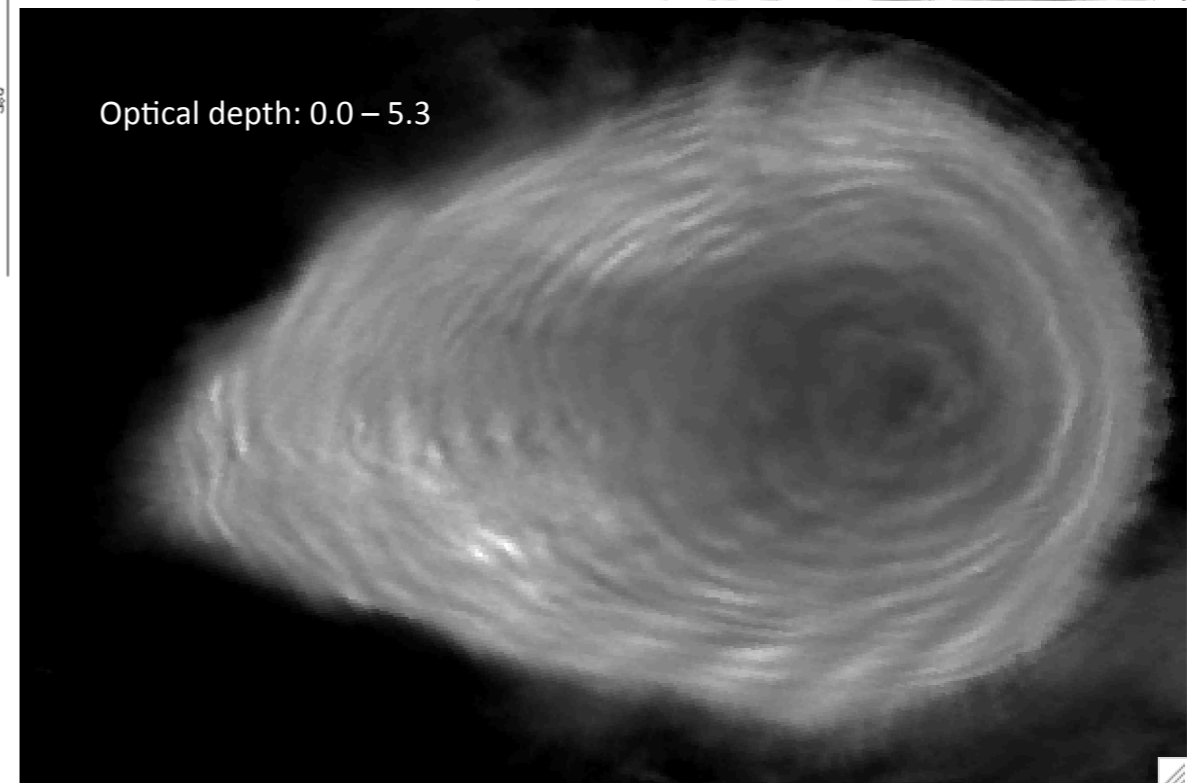
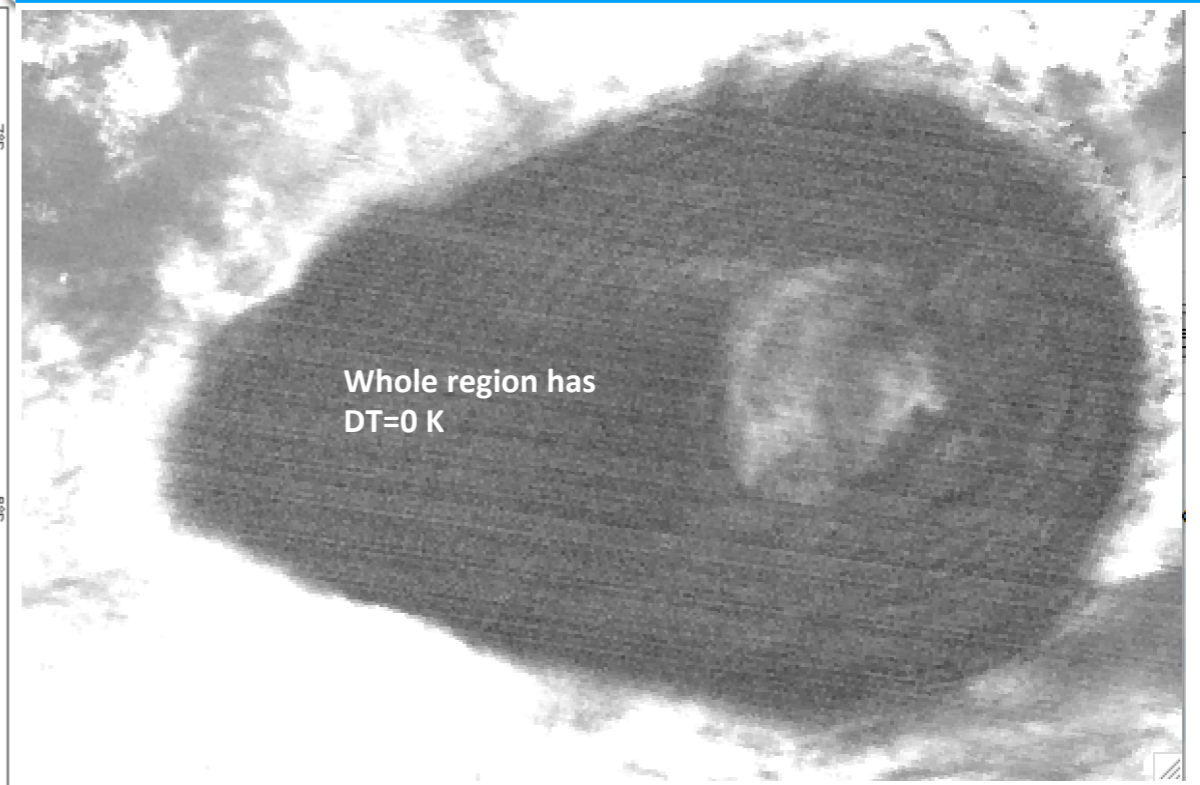
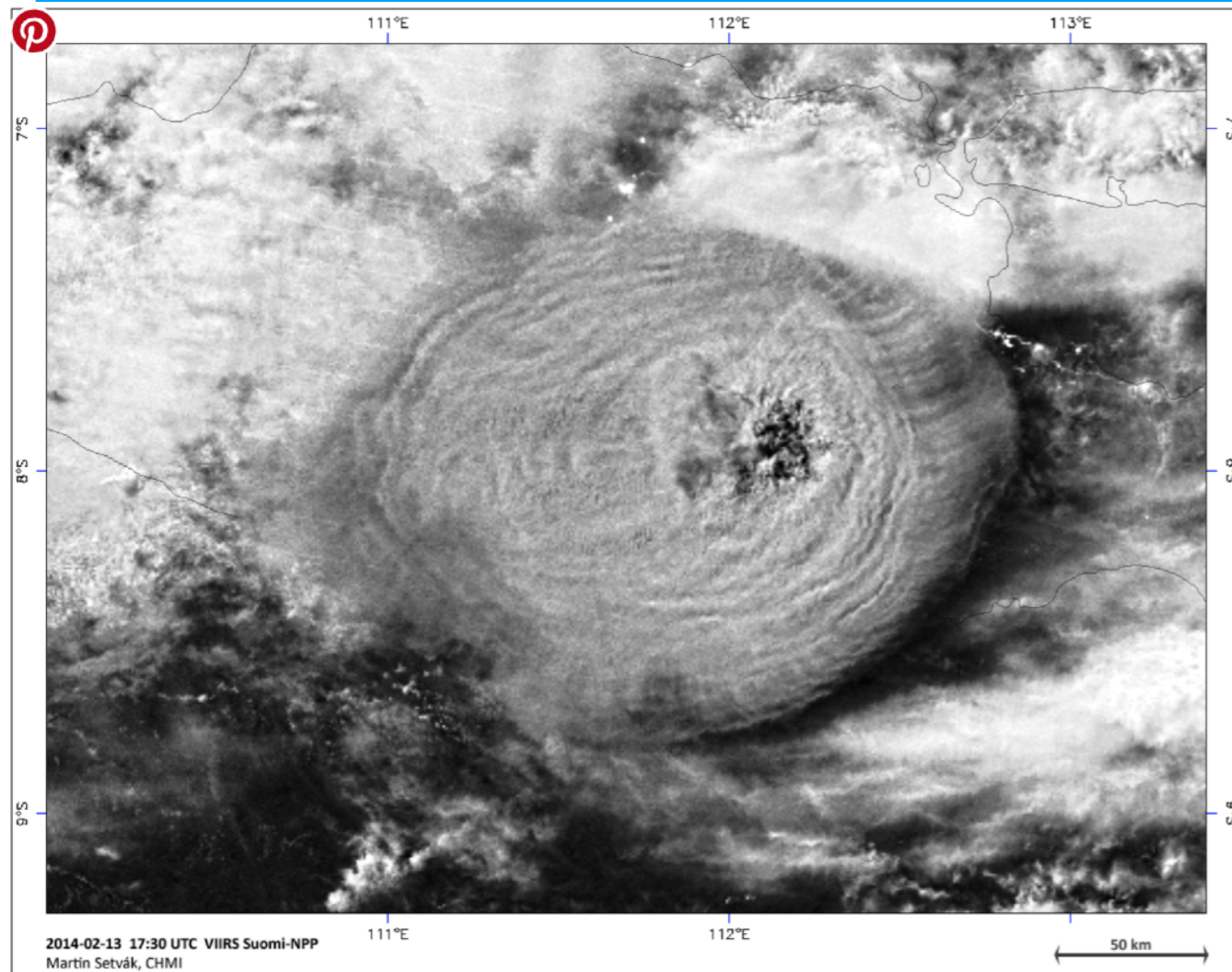


# Kelut Eruption 13 Feb 2014

Spreading umbrella >40,000 ft

Ash layers <30,000 ft



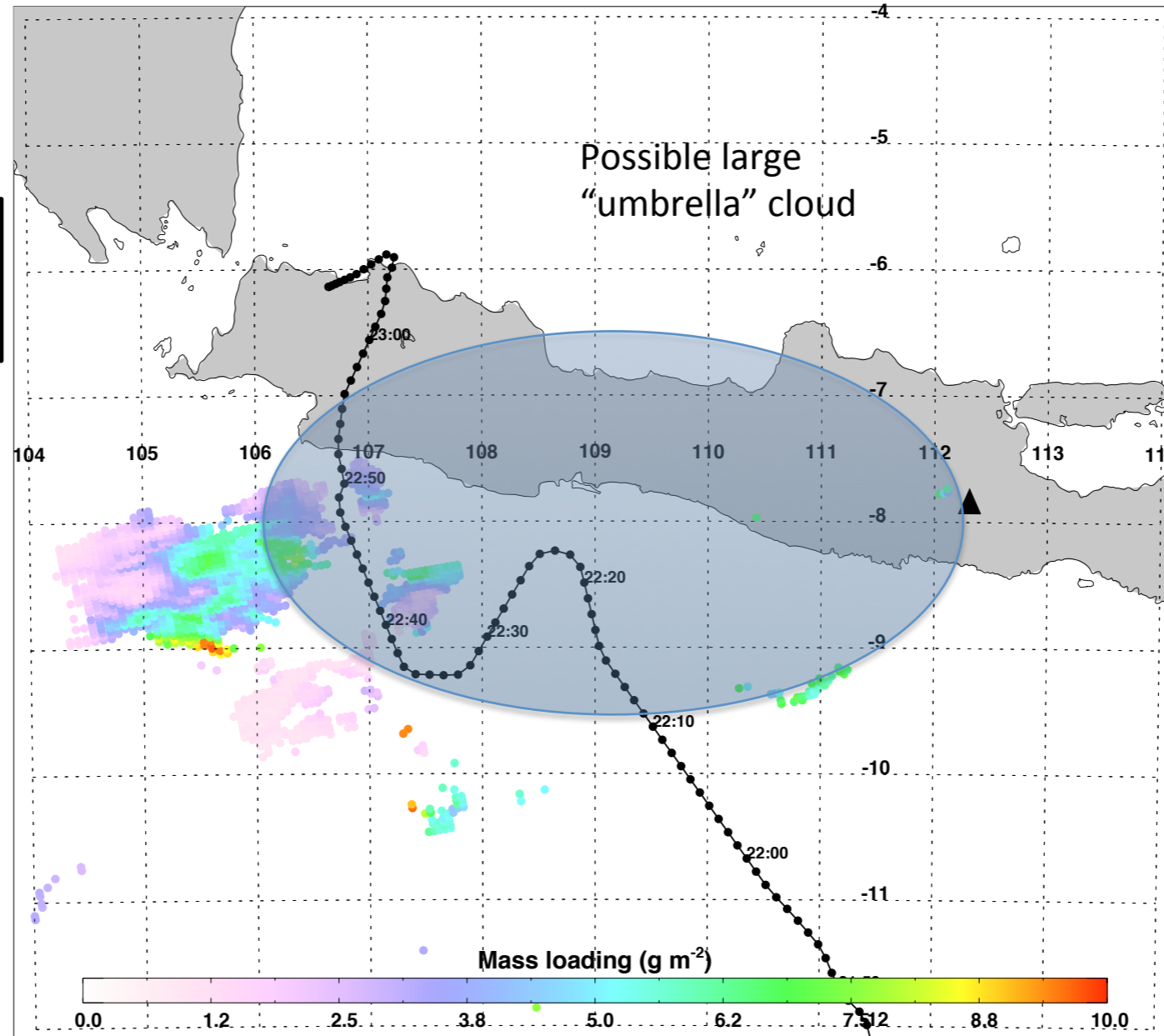


Mt Kelut eruption, Java. 13 February 2014

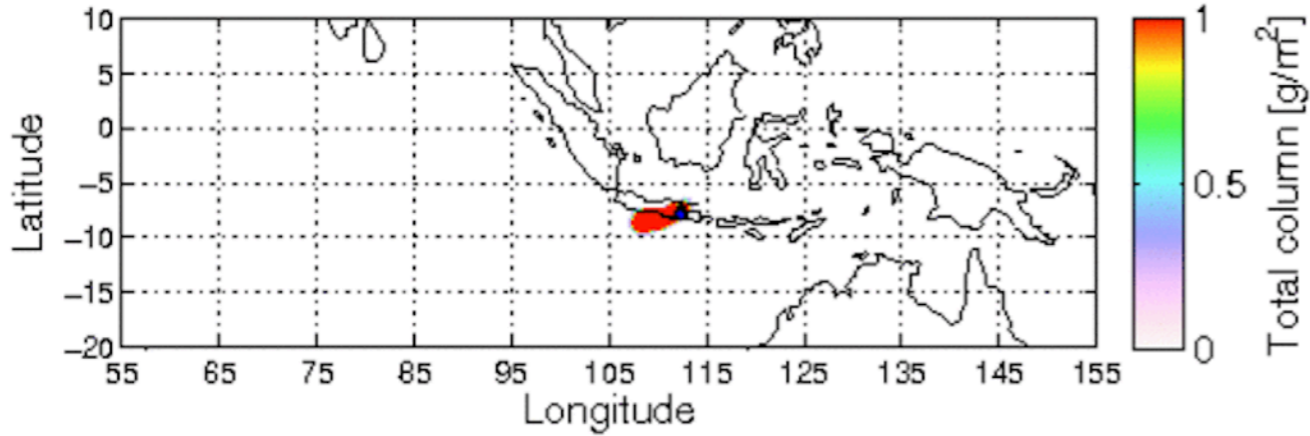
[https://www.eumetsat.int/website/home/Images/ImageLibrary/DAT\\_2169181.html](https://www.eumetsat.int/website/home/Images/ImageLibrary/DAT_2169181.html)

AVHRR N18 07:15UTC 14 February 2014.

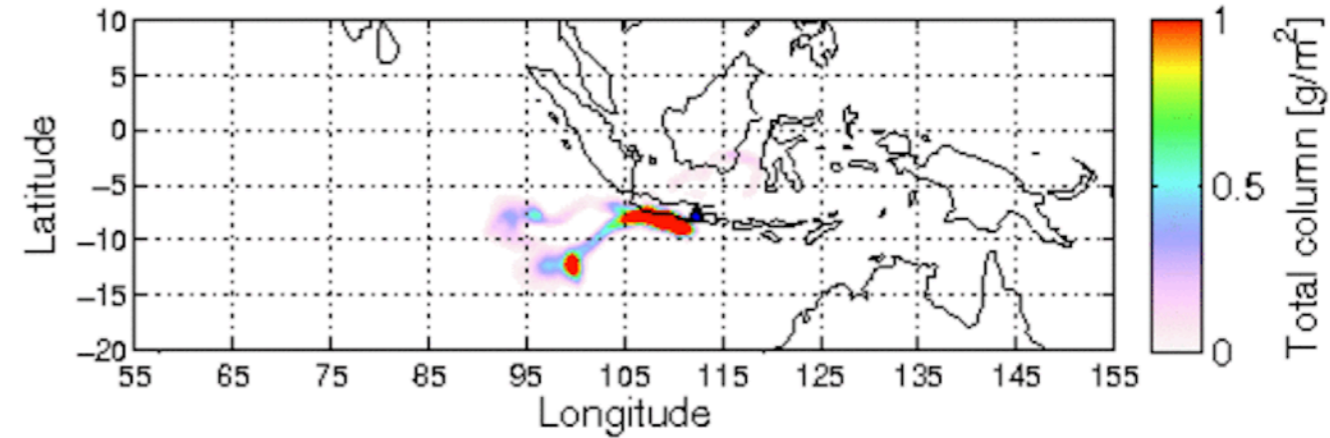
Ash mass loadings remain high  $> 4 \text{ g m}^{-2}$  12 hours later



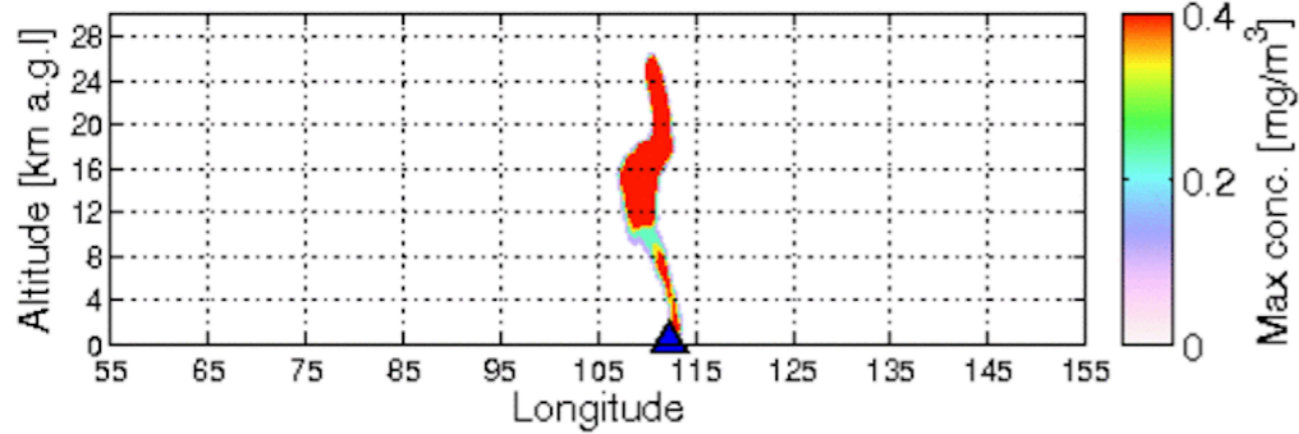
FLEXPART-GFS ASH FORECAST  
Date: 13 Feb 2014 22:30 UTC



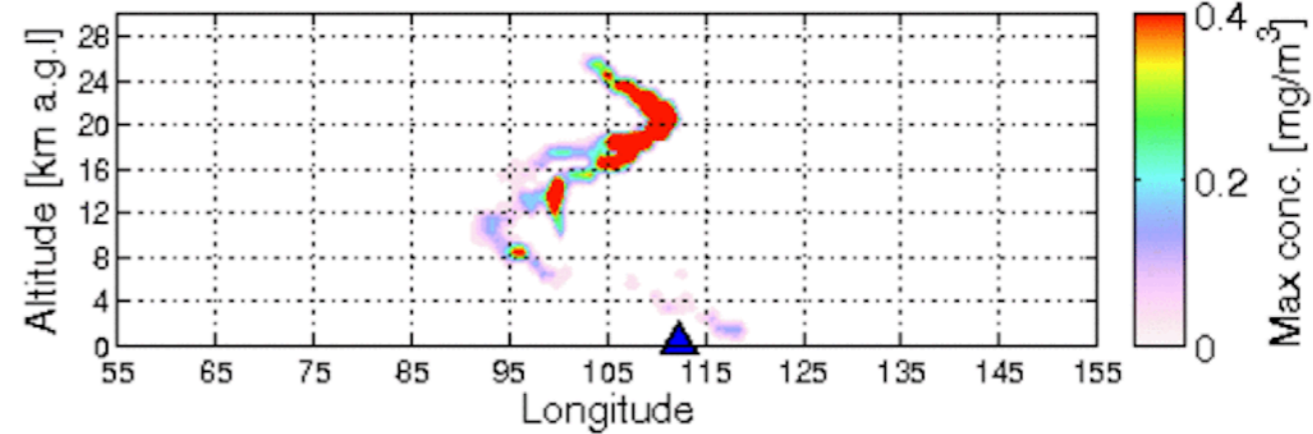
FLEXPART-GFS ASH FORECAST  
Date: 15 Feb 2014 02:30 UTC



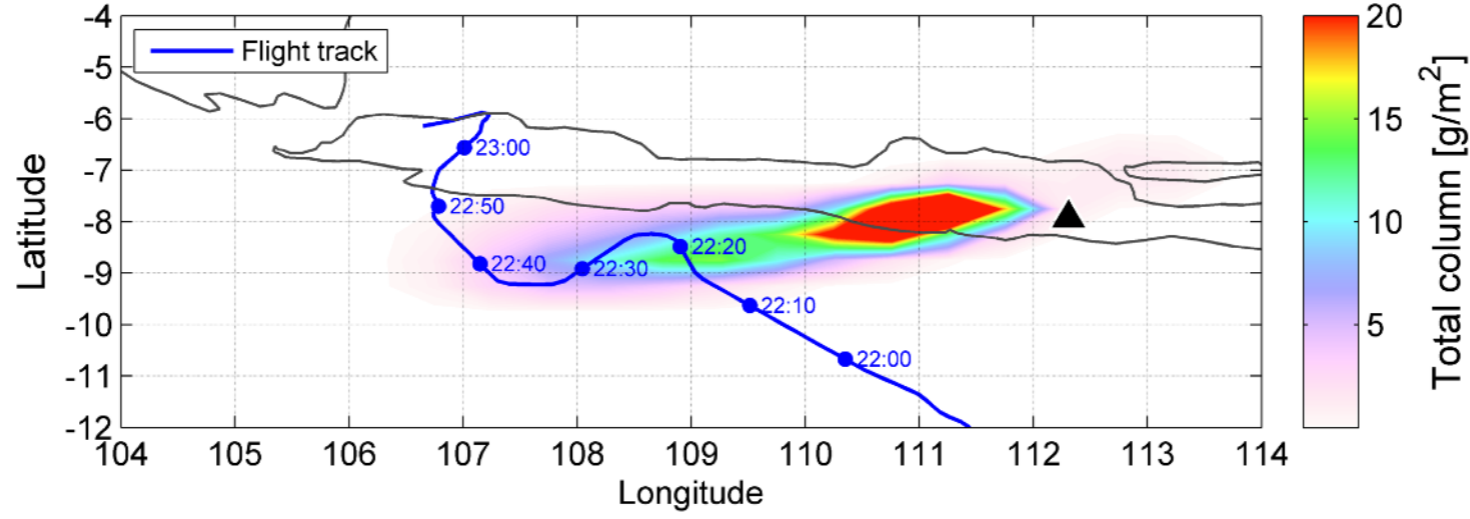
Cross section (over all latitudes)



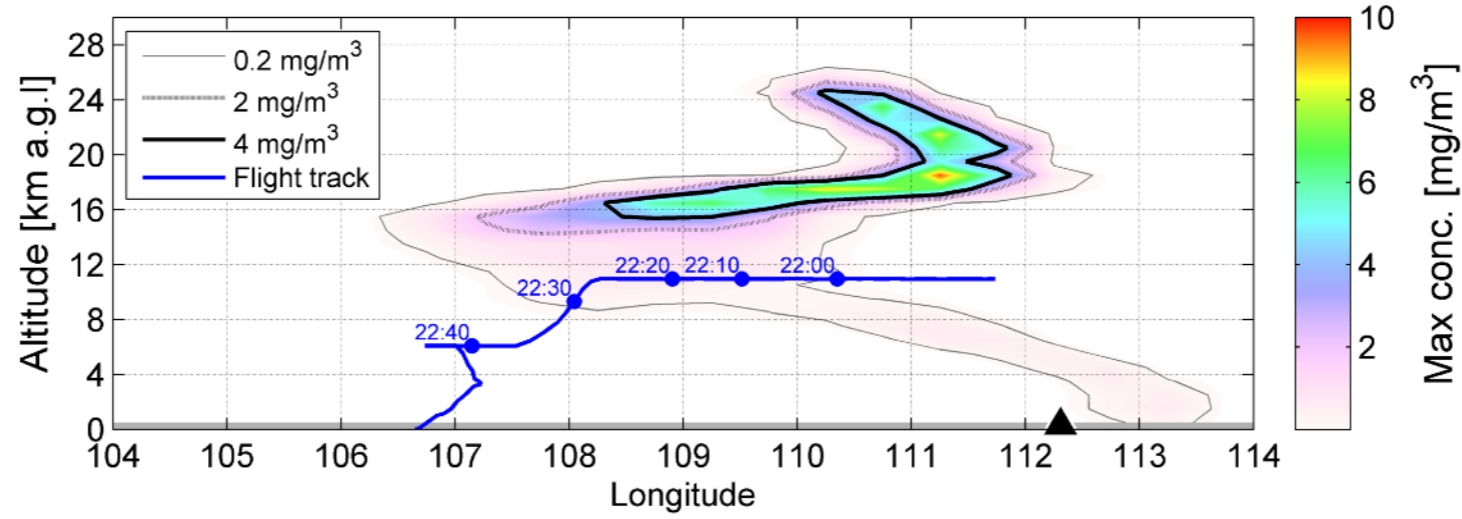
Cross section (over all latitudes)



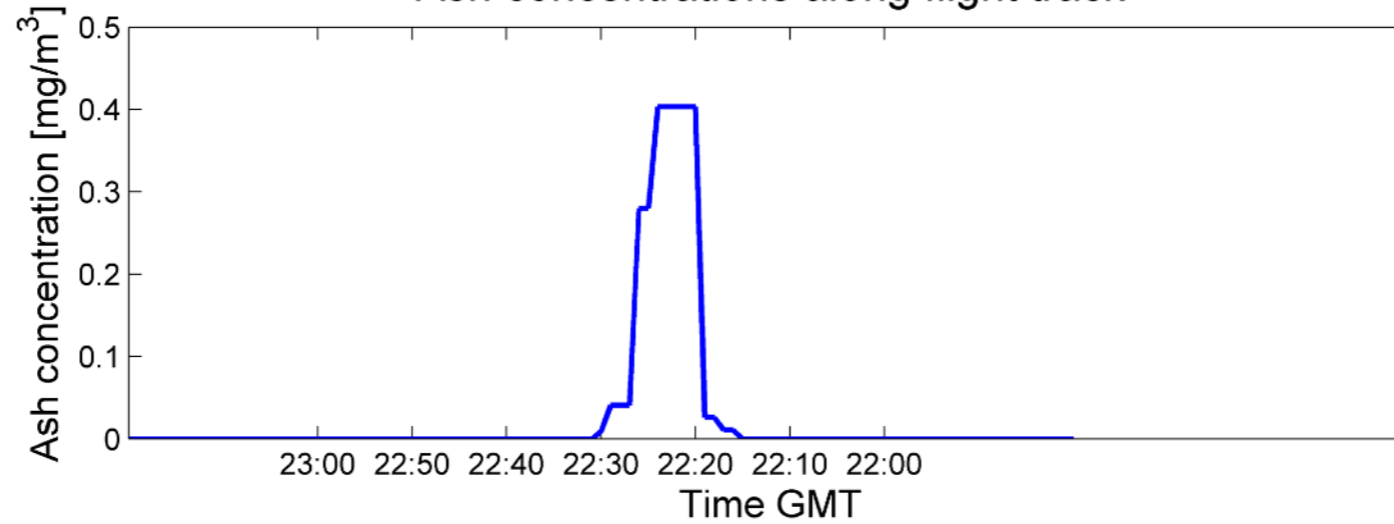
### FLEXPART-GFS MODEL SIMULATION 13 Feb 2014 22:30 - 23:30 UTC



### Maximum ash concentrations over all latitudes



### Ash concentrations along flight track



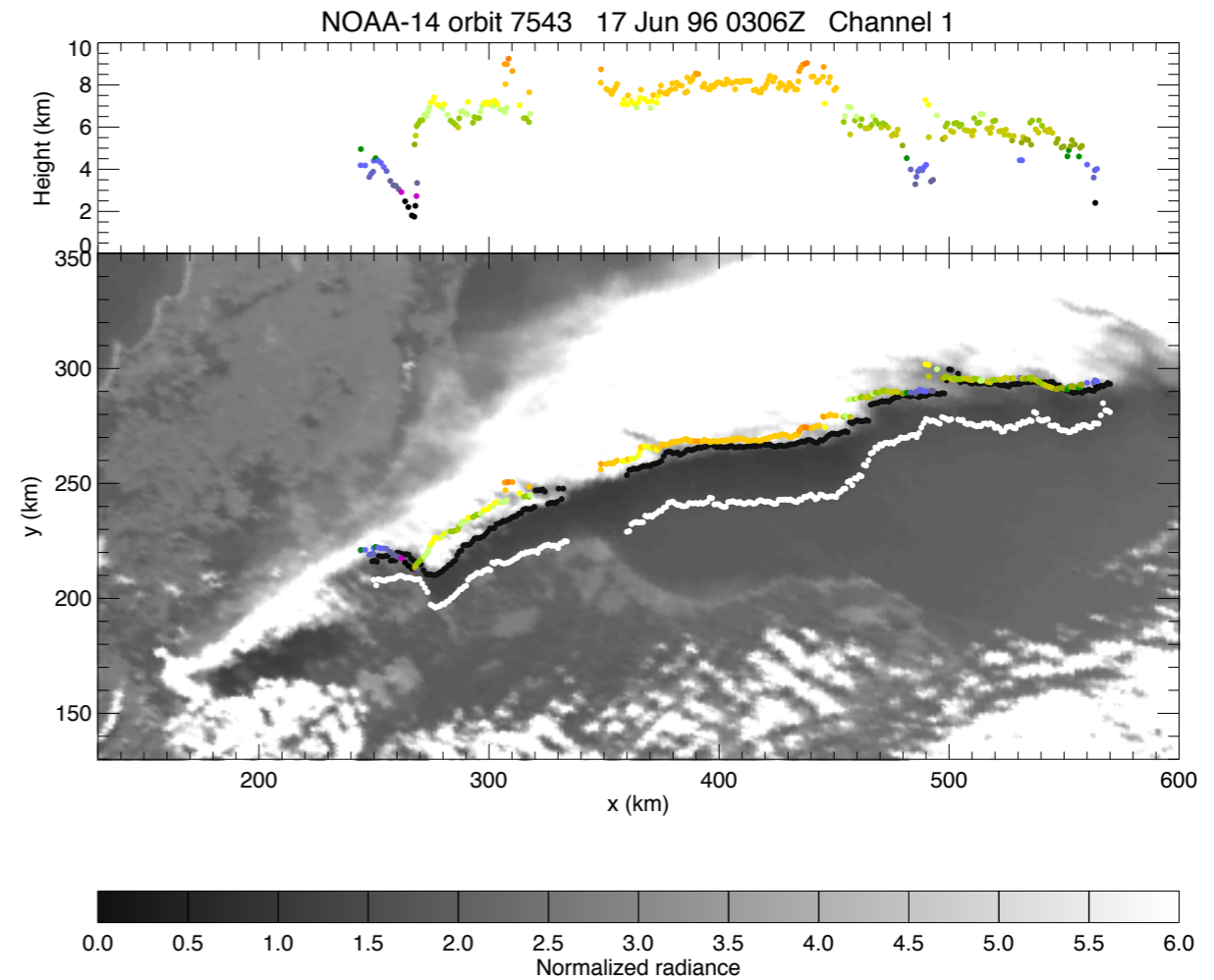
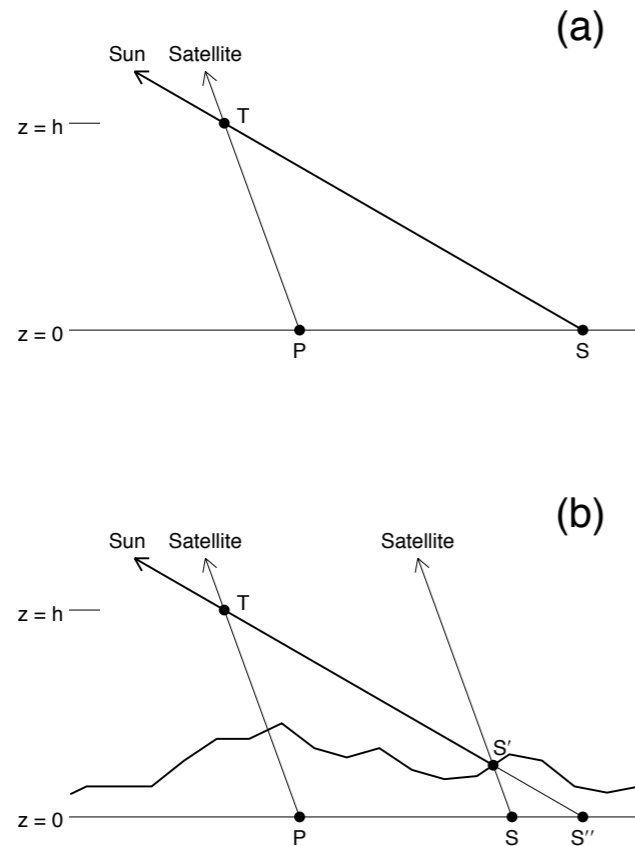
# How to use satellite imagery: Estimation of cloud height

## Some current methods

<b>Radiative Transfer</b>	<b>Cloud-top Temperature + Radiosonde profile</b>	<b>Cloud slicing</b>	<b>Optimal Estimation</b>
<b>Geometrical</b>	<b>Cloud shadow</b>	<b>Stereoscopy</b>	
<b>Direct Measurement</b>	<b>Lidar</b>	<b>Radiosonde</b>	<b>Radar</b>
<b>Model</b>	<b>Plume position and dispersion</b>	<b>Inverse modelling</b>	

# Cloud shadow

e.g. Prata and Grant (2001)



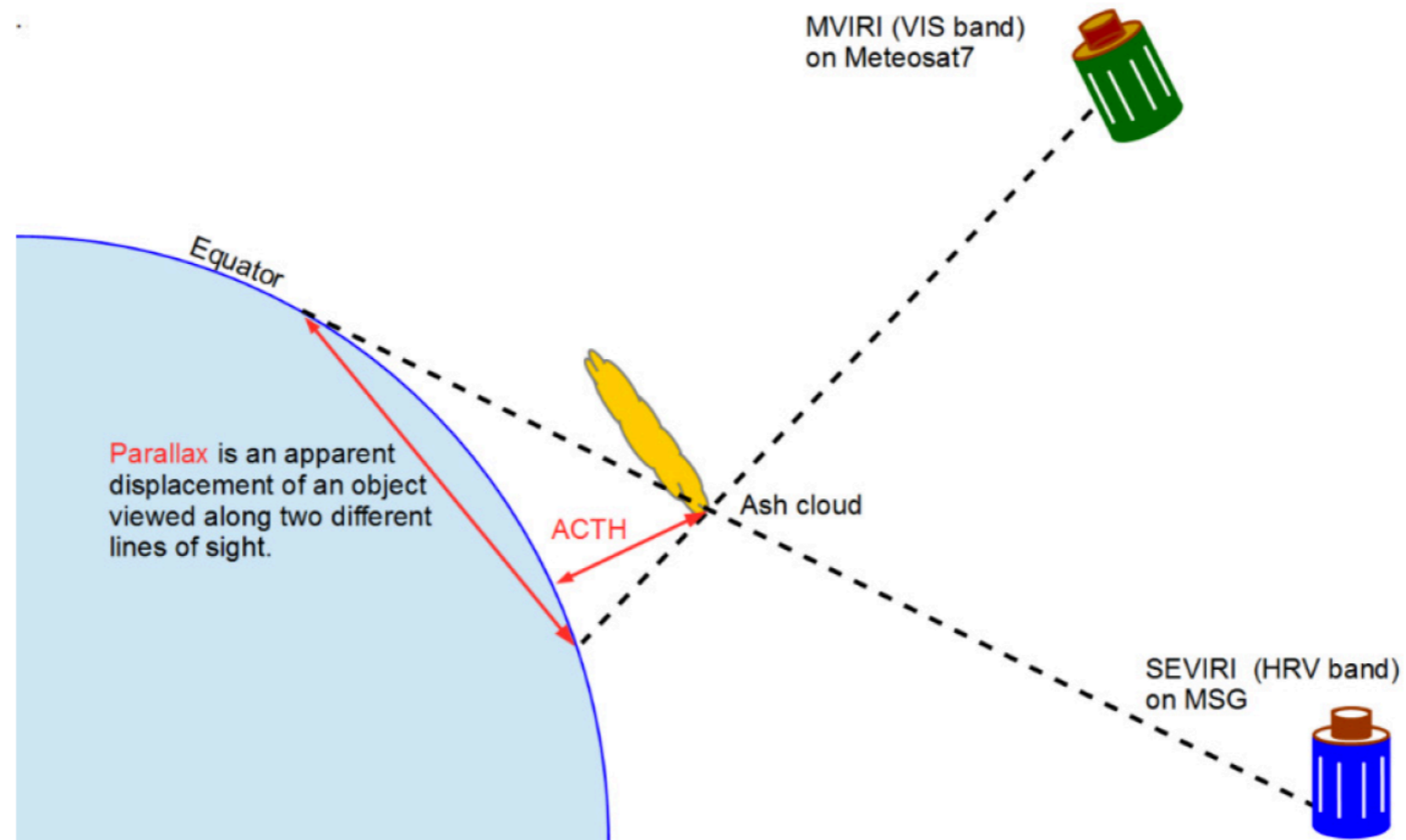
Plotted by gra439: Tue Aug 3 16:44:54 1999

Plotted by gra439: Fri Jun 18 09:37:23 1999

Reference: Prata, A. J. and I. F. Grant (2001) Retrieval of microphysical and morphological properties of volcanic ash plumes from satellite data: Application to Mt. Ruapehu, New Zealand., *Quarterly journal of the Royal Meteorological Society*, 127 (576B), 2153-2179.

# Geometry: Parallax from two satellites

e.g. Merucci, L., Klemen Zakšek, K., Carboni, E. and S. Corradini (2016)





# Other methods

---

## **Inversion:**

Stohl, A., Prata, A.J., Eckhardt, S., Clarisse, L., Durant, A., Henne, S., Kristiansen, N.I., Minikin, A., Schumann, U., Seibert, P. et al. **(2011)**. Determination of time- and height-resolved volcanic ash emissions and their use for quantitative ash dispersion modeling: The 2010 Eyjafjallajökull eruption. *Atmos. Chem. Phys.*, 11, 4333–4351.

## **Optimal Estimation:**

Francis, P.N., Cooke, M.C. and Saunders, R.W., **(2012)**. Retrieval of physical properties of volcanic ash using Meteosat: A case study from the 2010 Eyjafjallajökull eruption. *Journal of Geophysical Research: Atmospheres*, 117(D20).

## **Cloud-slicing:**

Holz, R.E., Ackerman, S., Antonelli, P., Nagle, F., Knuteson, R.O., McGill, M., Hlavka, D.L. and Hart, W.D., **(2006)**. An improvement to the high-spectral-resolution CO<sub>2</sub>-slicing cloud-top altitude retrieval. *Journal of Atmospheric and Oceanic Technology*, 23(5), pp.653-670.

## **MISR Stereo:**

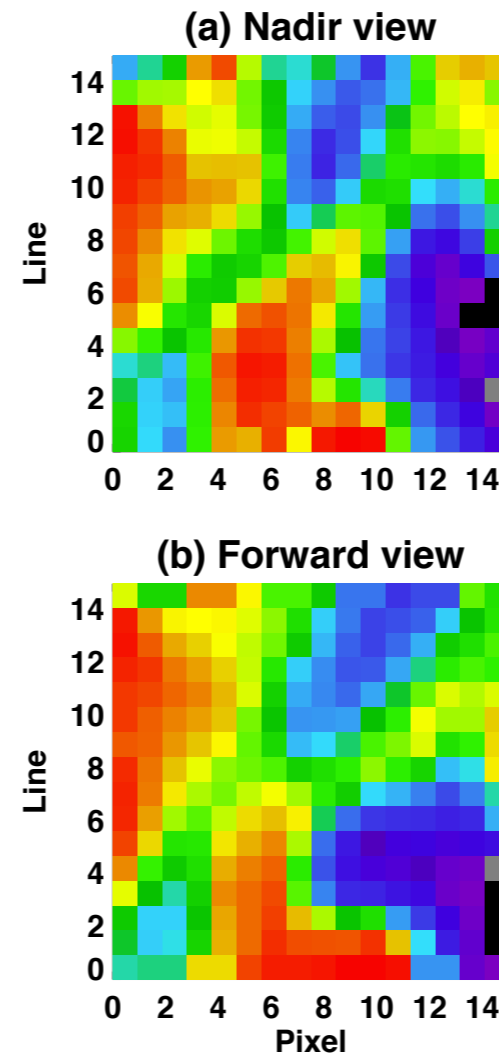
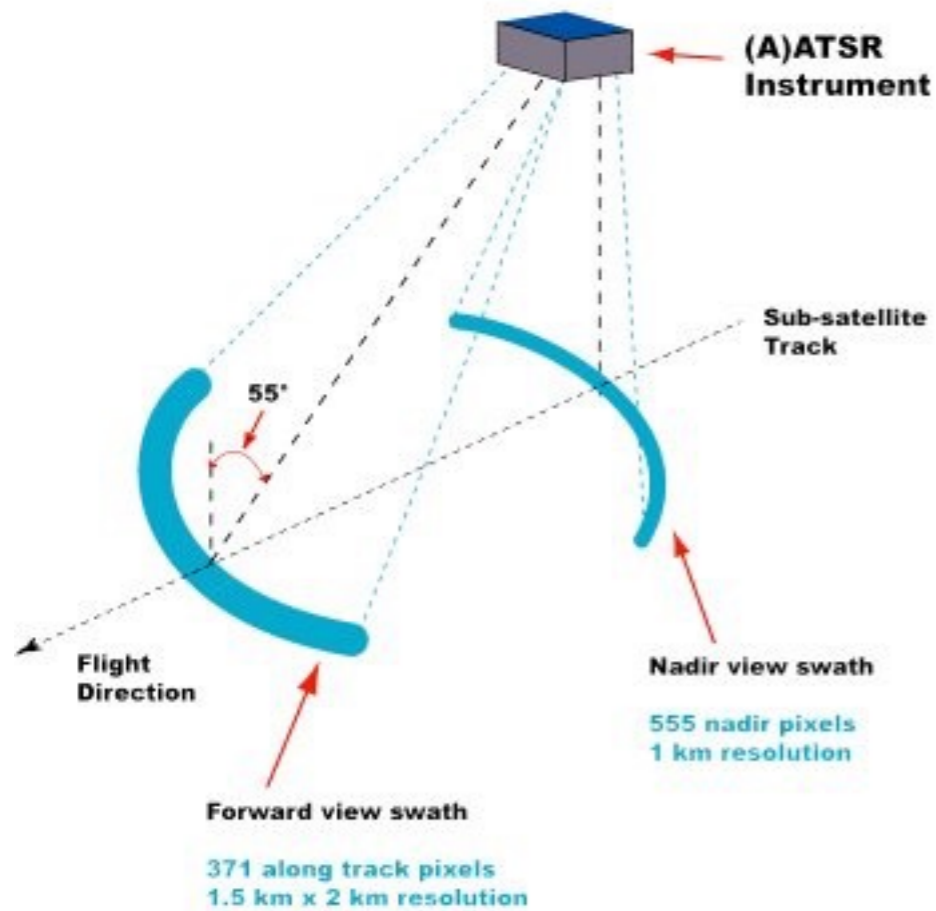
Flower, V.J. and Kahn, R.A., **(2017)**. Assessing the altitude and dispersion of volcanic plumes using MISR multi-angle imaging from space: Sixteen years of volcanic activity in the Kamchatka Peninsula, Russia. *Journal of Volcanology and Geothermal Research*, 337, pp.1-15.

## **Cloud-top/radiosonde:**

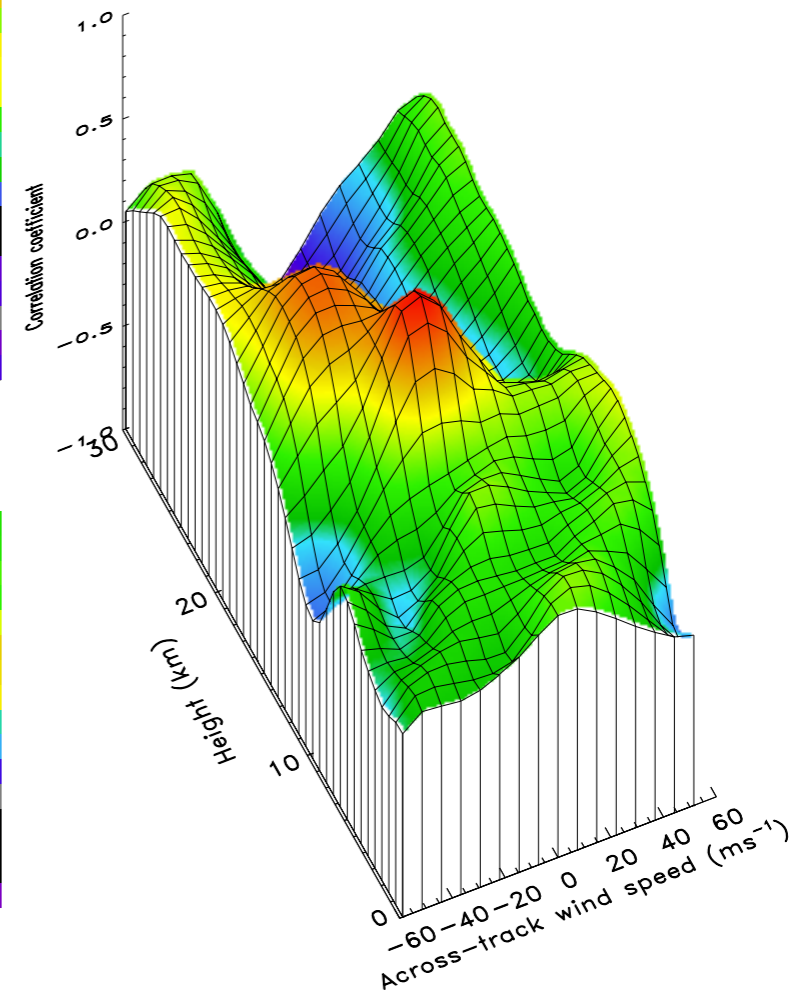
Woods, A.W. and Self, S., **(1992)**. Thermal disequilibrium at the top of volcanic clouds and its effect on estimates of the column height. *Nature*, 355(6361), p.628.

# Stereoscopy from ATSR/ATSR-2/AATSR/SLSTR

e.g. Prata and Turner (1997)

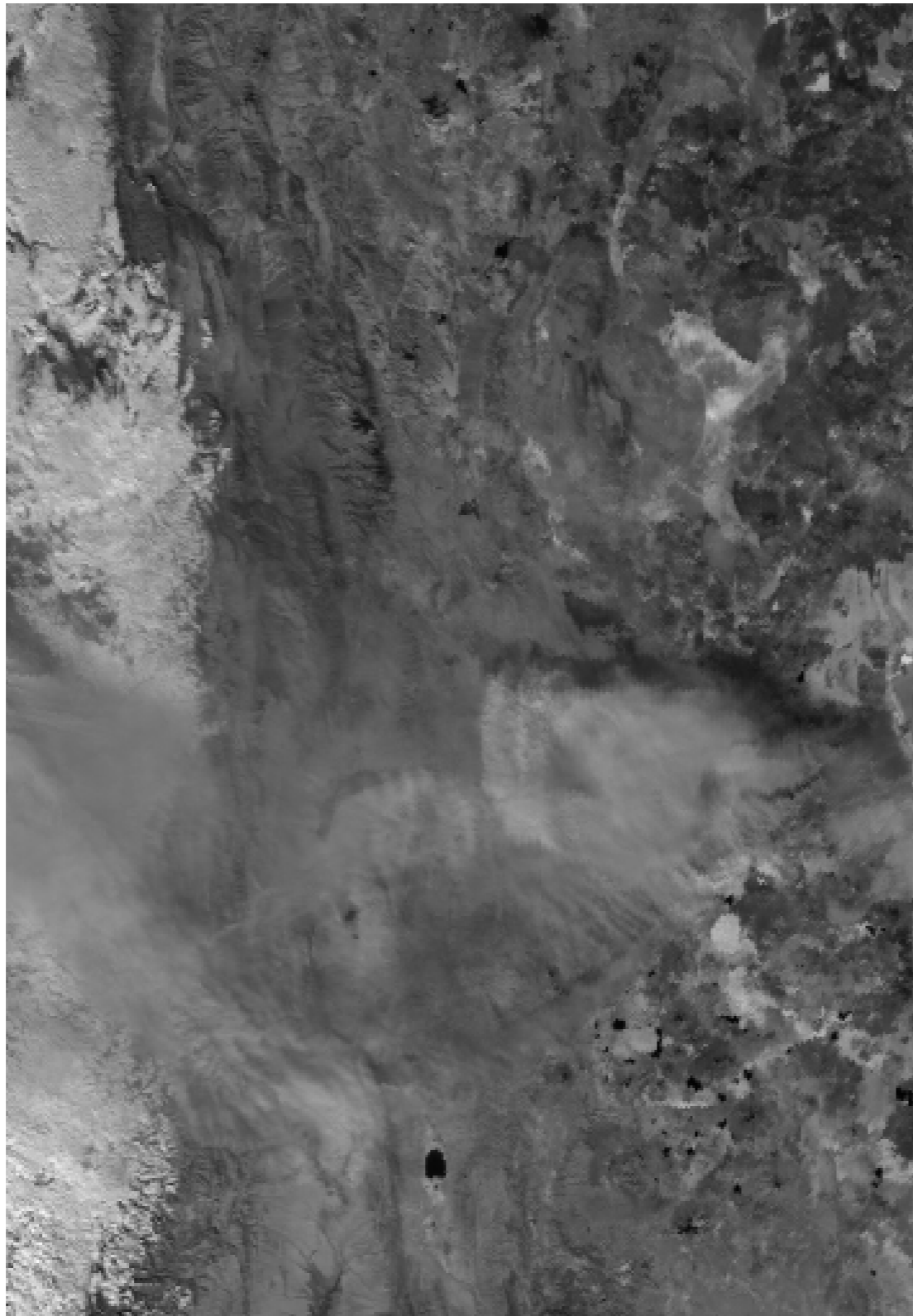


(c) 2-D correlation function  
 $h=12.7 \text{ km}$   $v=-7.4 \text{ ms}^{-1}$

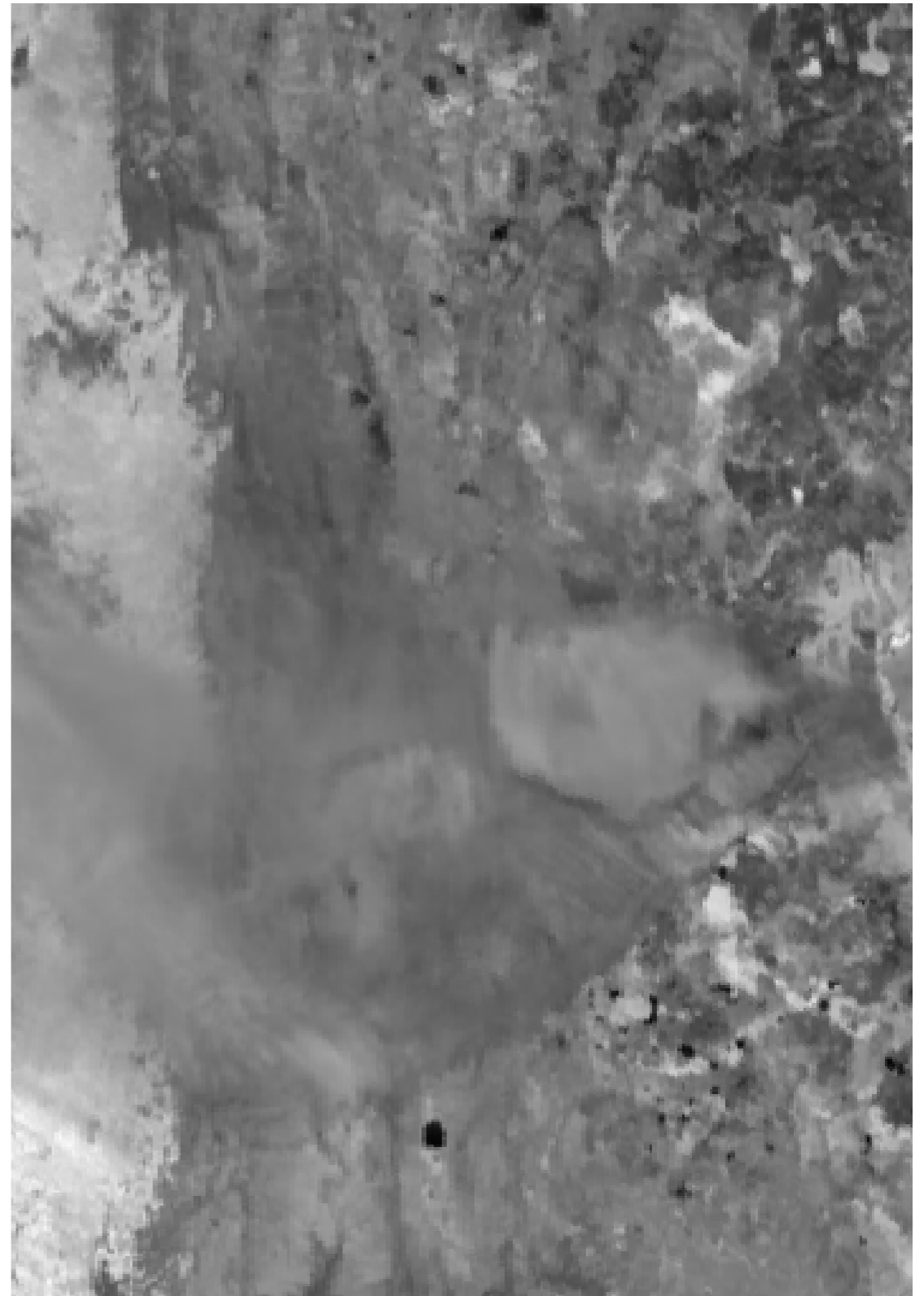


# Lascar eruption

ATSR-2 Stereo Pairs



**Nadir view**



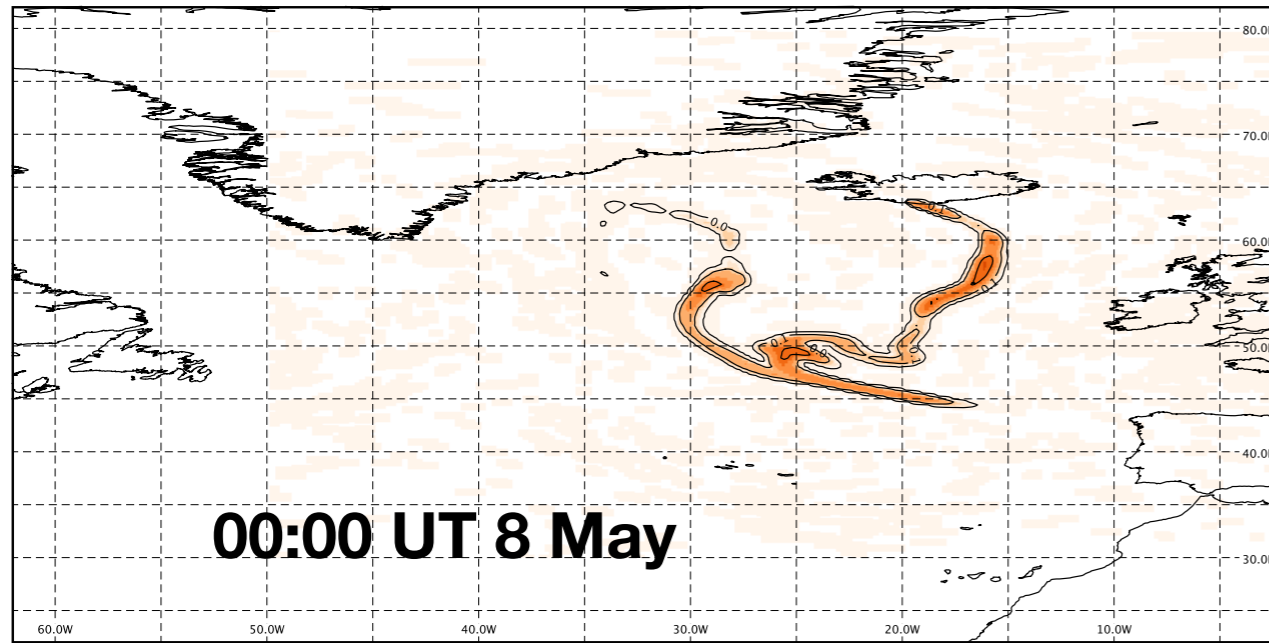
**Forward view**

# Example: Eyjafjallajökull

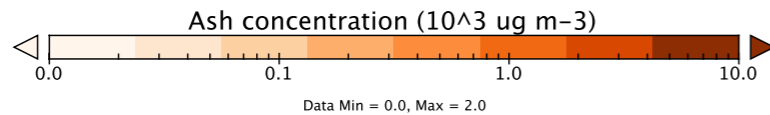
## 8-May 2010 Highly dispersed ash cloud over ocean (>36 hrs old)

### FLEXPART (model)

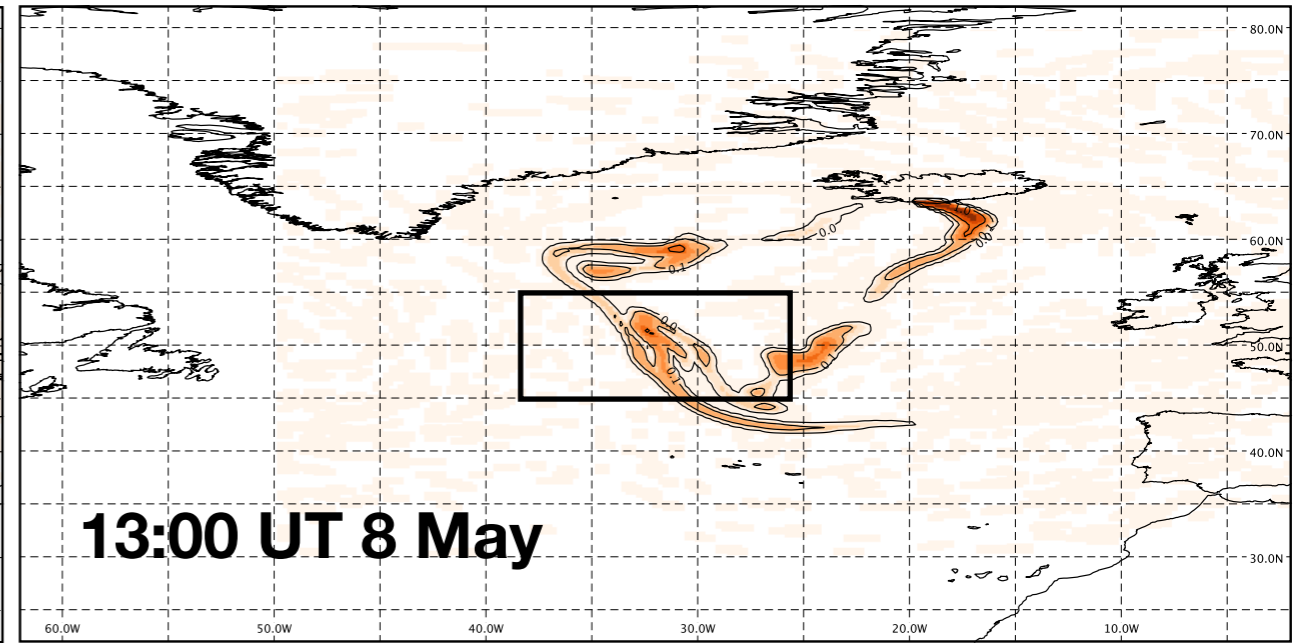
FLEXPART Ash concentration at 6375 m  
8-May-2010 00:00 UT



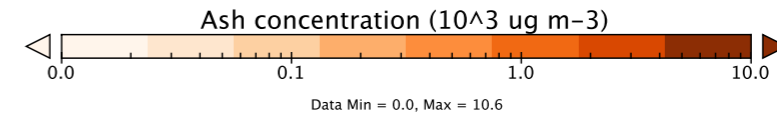
00:00 UT 8 May



FLEXPART Ash concentration at 6375 m  
8-May-2010 13:00 UT

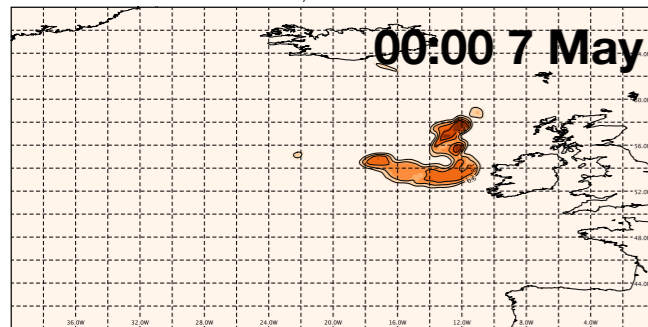


13:00 UT 8 May

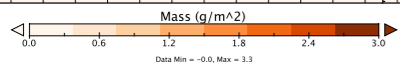


### SEVIRI (actual measurements)

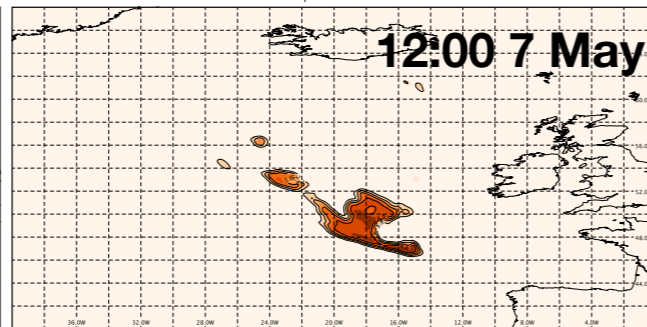
SEVIRI Mass Loading  
7-May-2010 00:00 UT



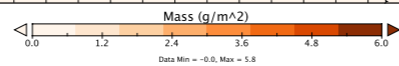
00:00 7 May



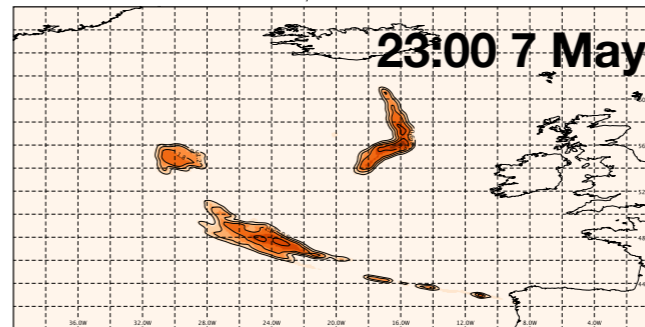
SEVIRI Mass Loading  
7-May-2010 12:00 UT



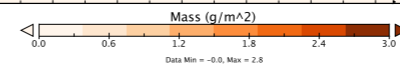
12:00 7 May



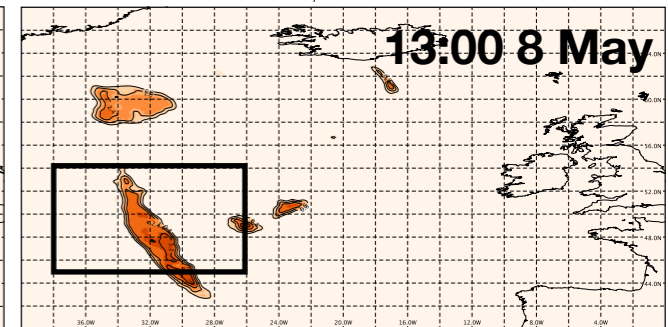
SEVIRI Mass Loading  
7-May-2010 23:00 UT



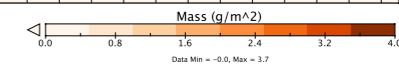
23:00 7 May



SEVIRI Mass Loading  
8-May-2010 13:00 UT

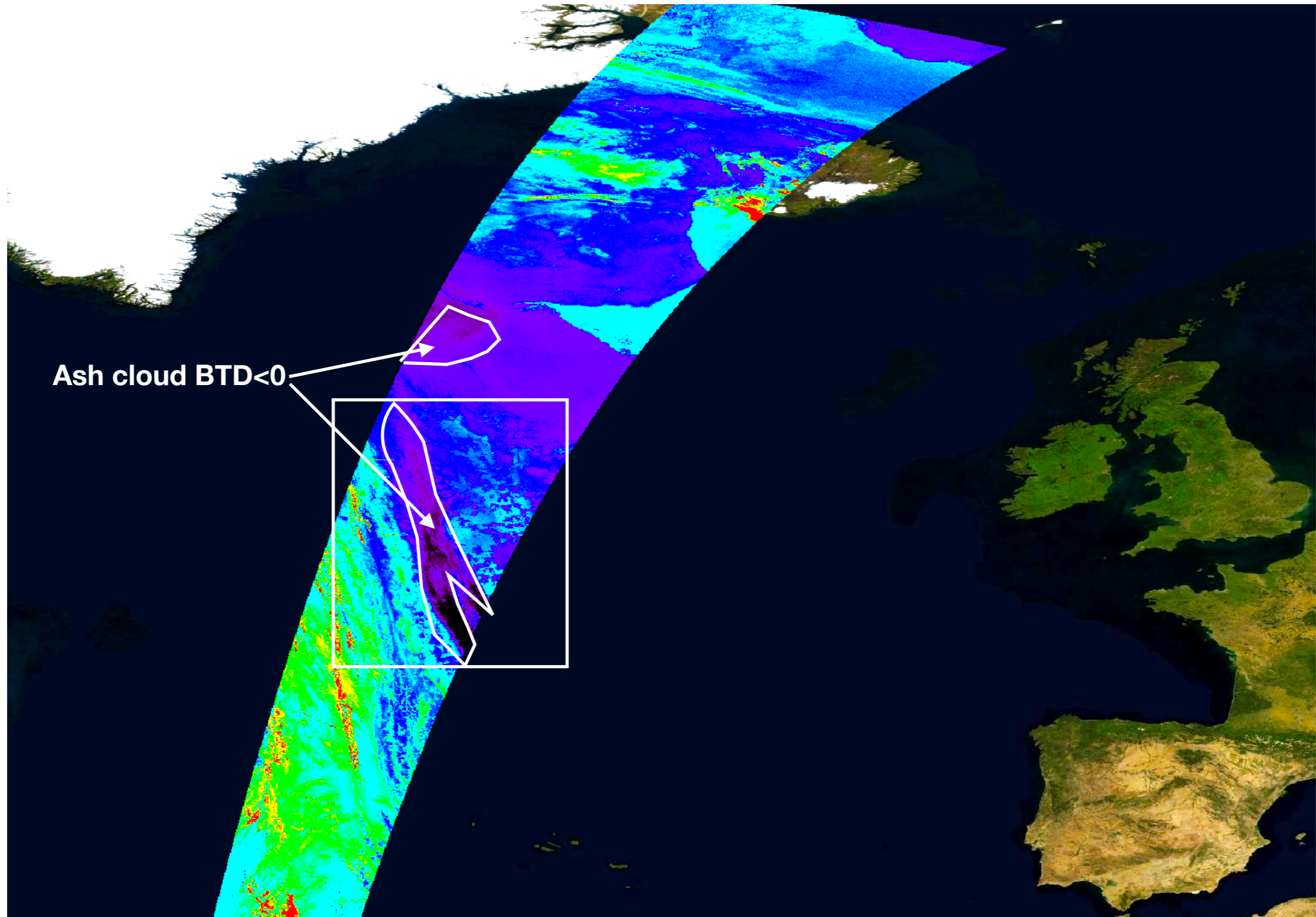


13:00 8 May

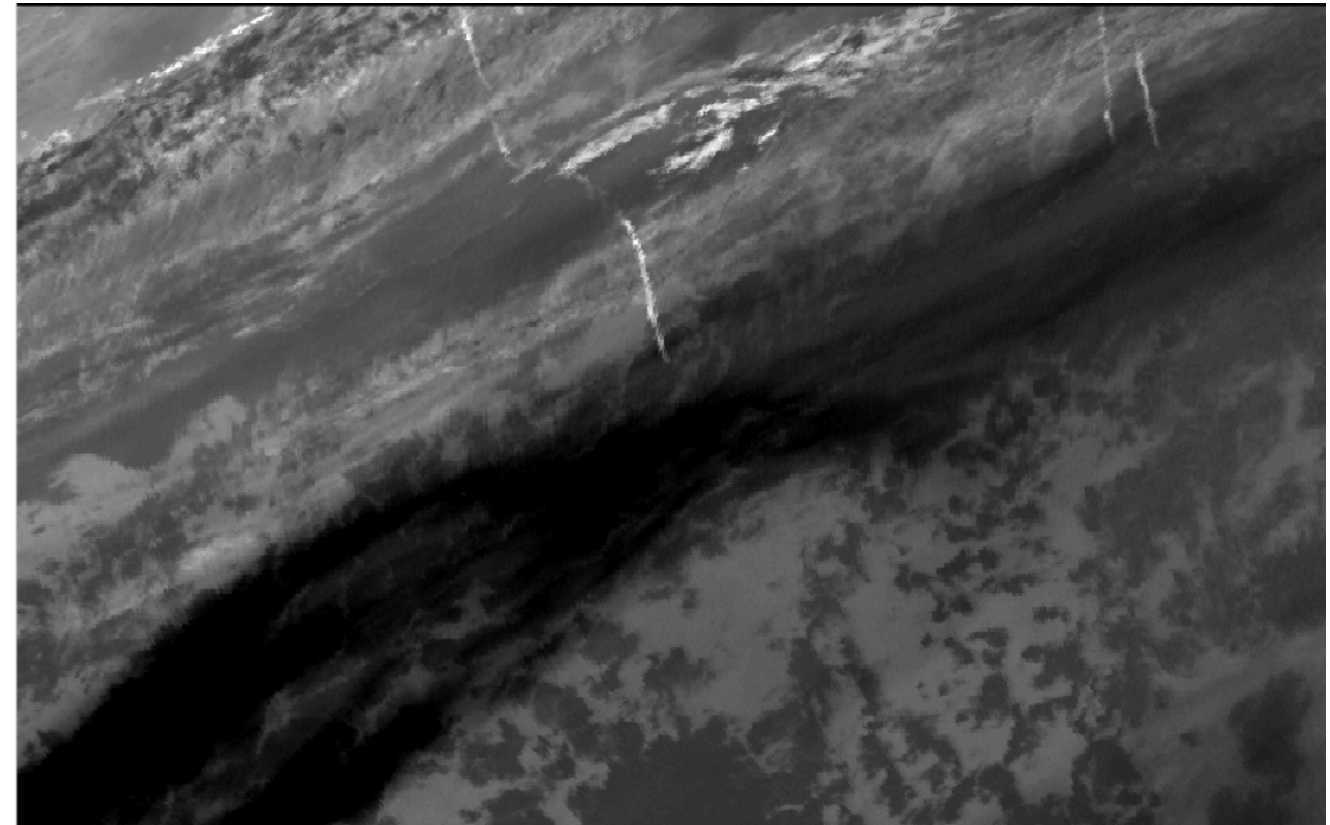
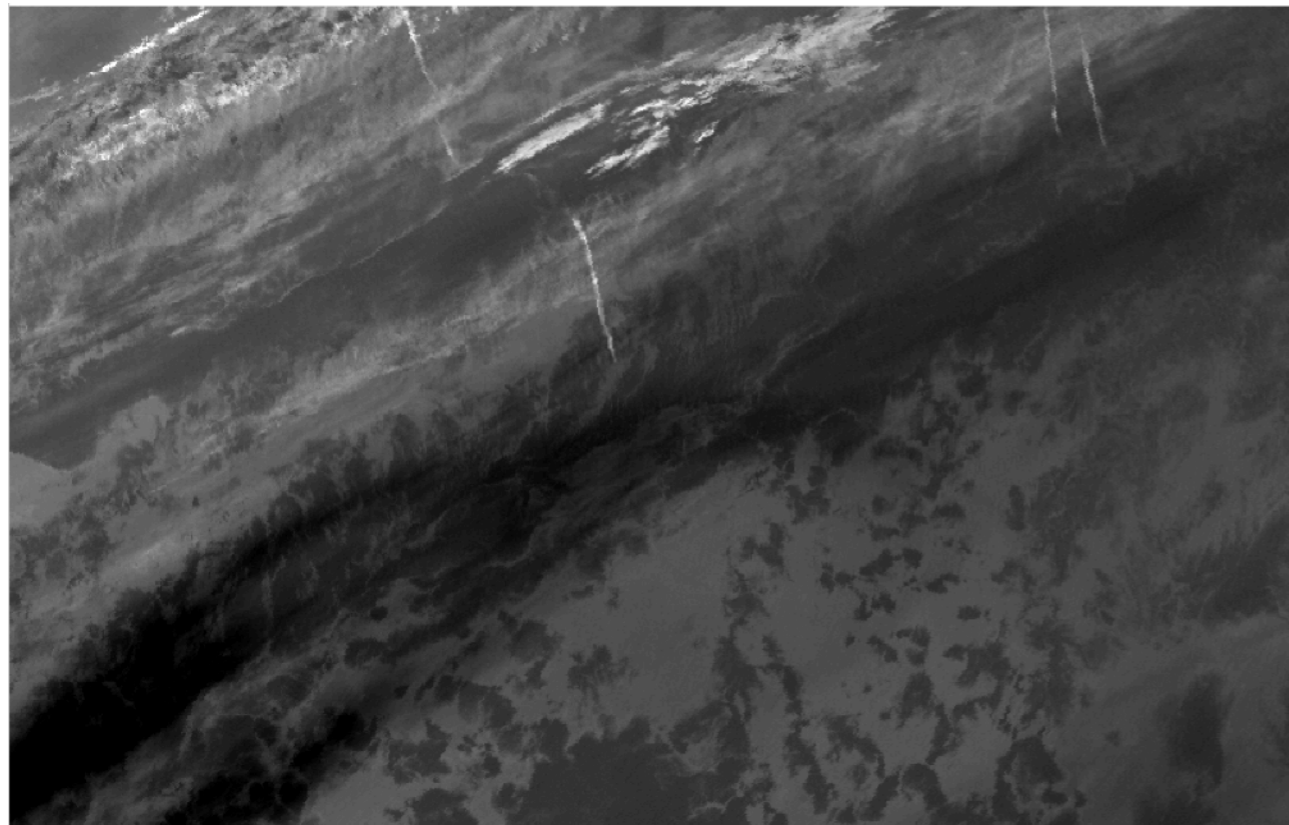


# AATSR

$$\text{BTD} = T_{11}(\text{nadir}) - T_{12}(\text{nadir})$$



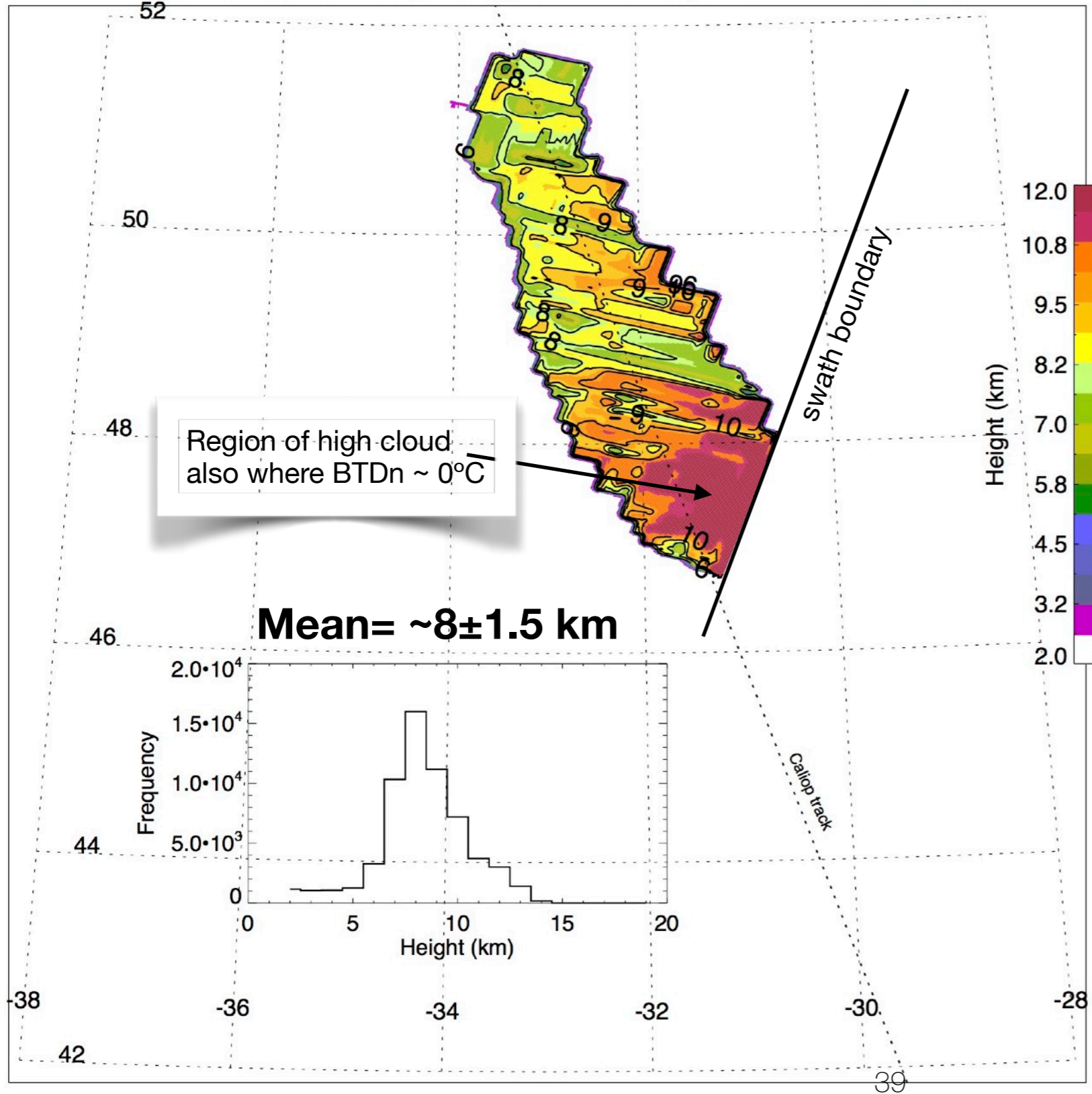
Stare at the image until a third **stereo** image appears between the pair  
(you may need to go “cross-eyed”)



There is a thin veil of high cloud running across the top-left corner of the image  
The aircraft contrails are below this  
The ash cloud (dark) is below both

# Height retrieval

AATSR cloud-top heights 8-May-2010 12:55UT

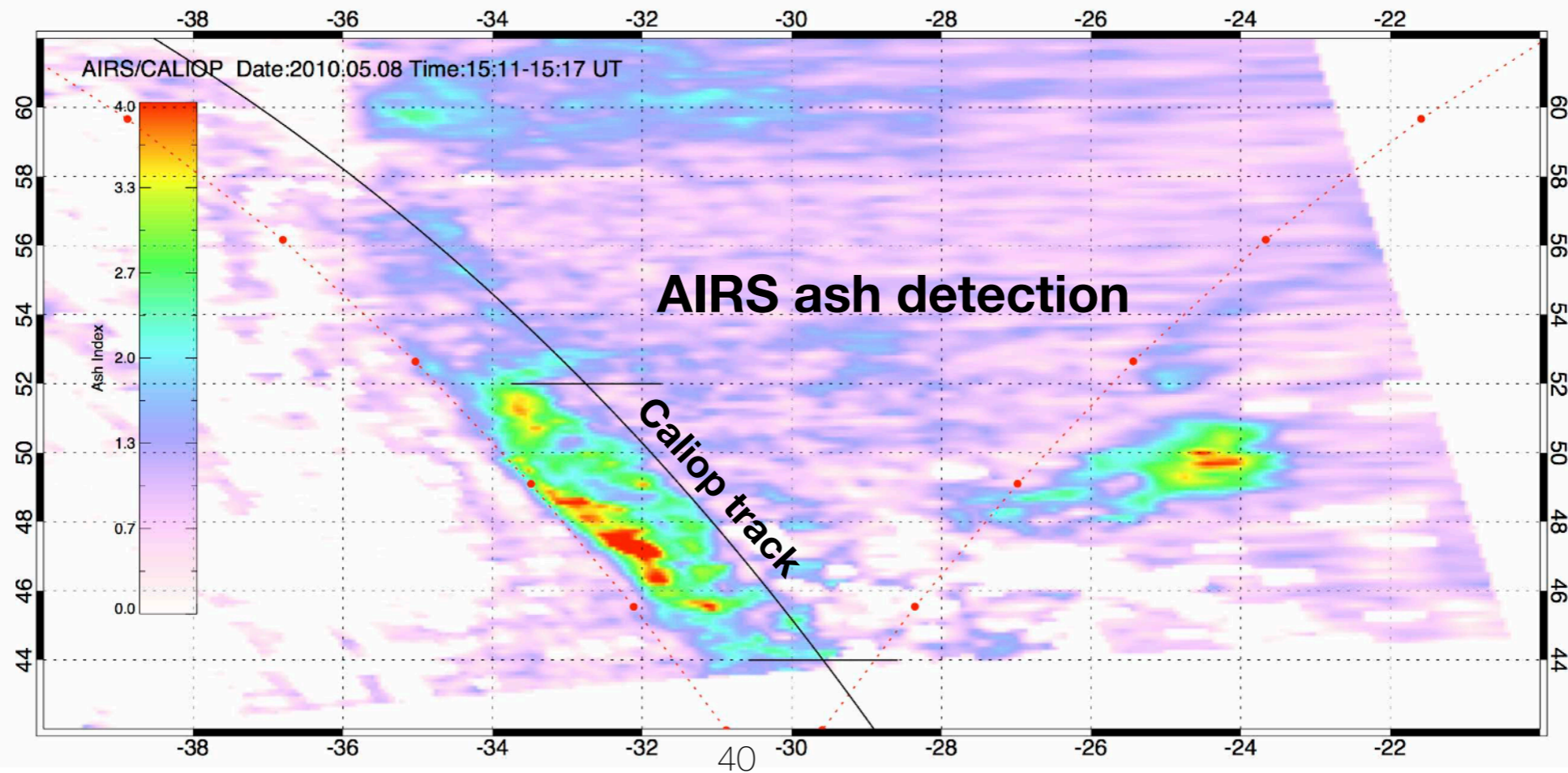
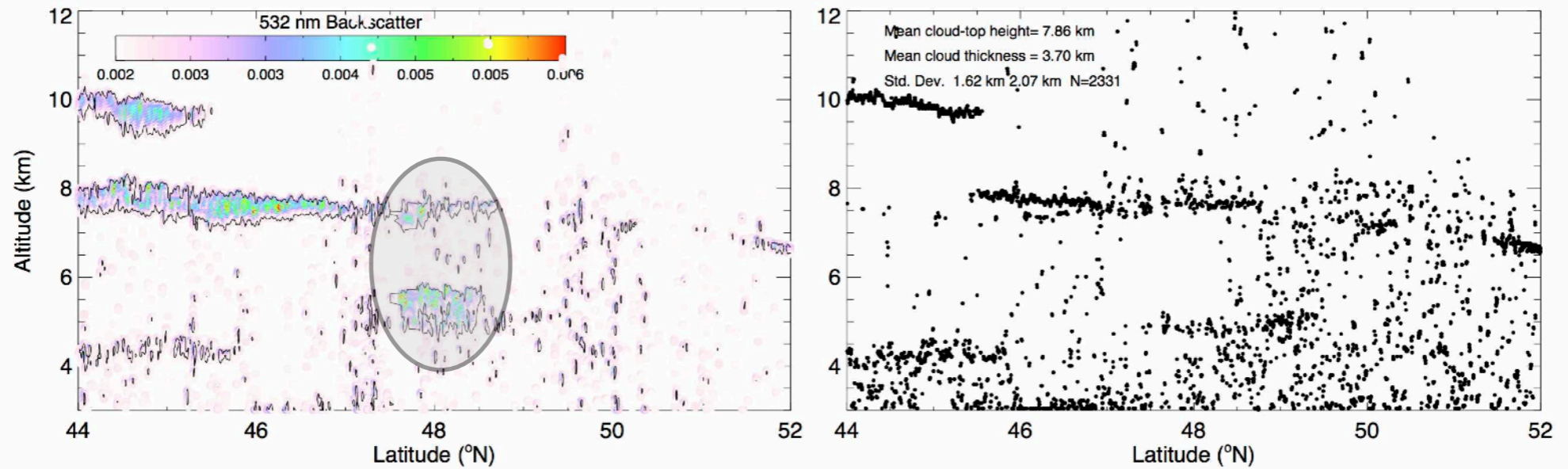


## Method

Use  $1.6 \mu\text{m}$  reflectance nadir and forward views. Only process pixels where  $BTD_n < 0$ . The  $r^2$  correlation between parts of the image is calculated in  $8 \times 8$  pixel chunks. Some smoothing is applied for graphical representation.

# Validation-Caliop/AIRS

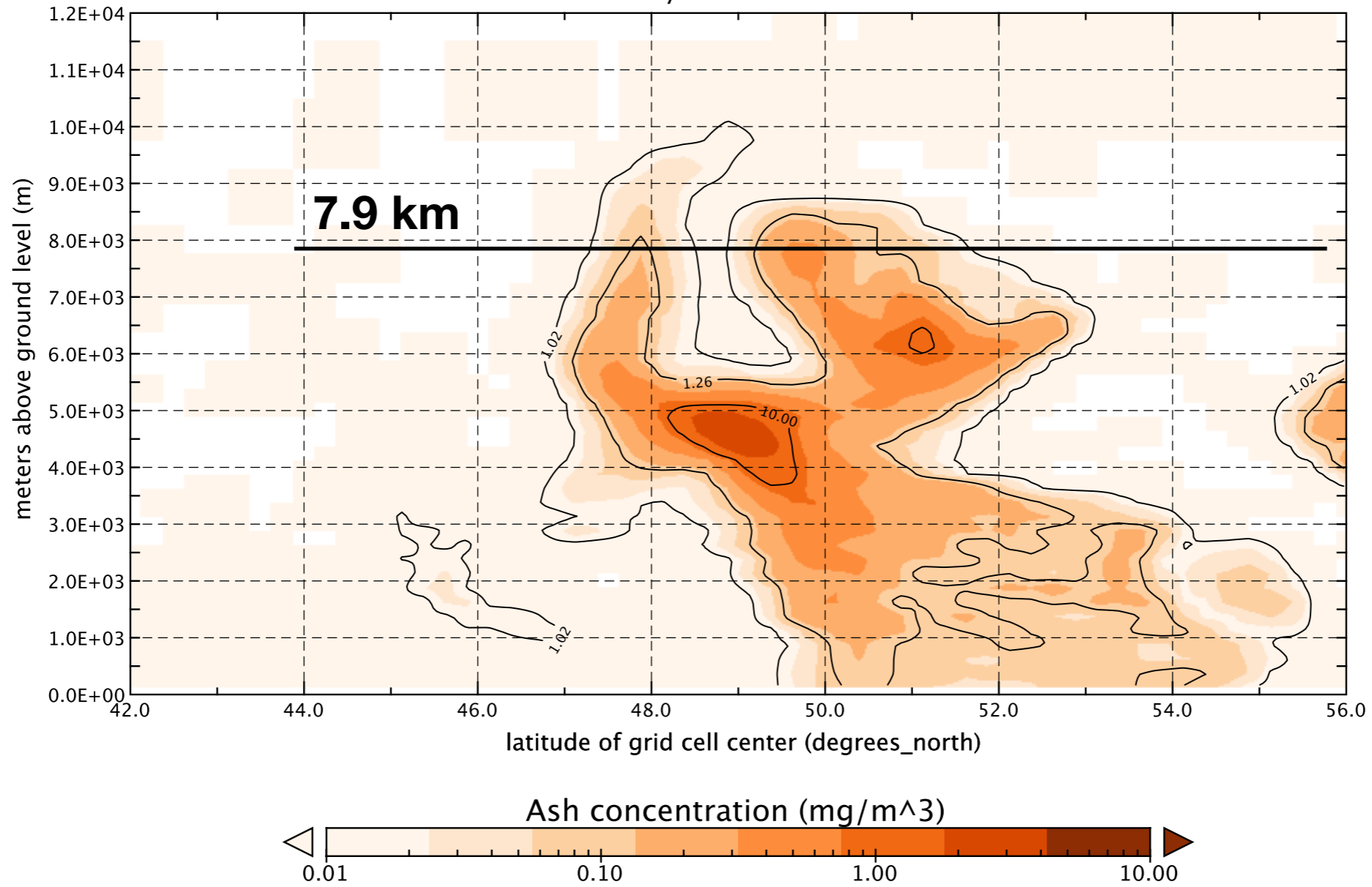
Mean=7.86±1.8 km





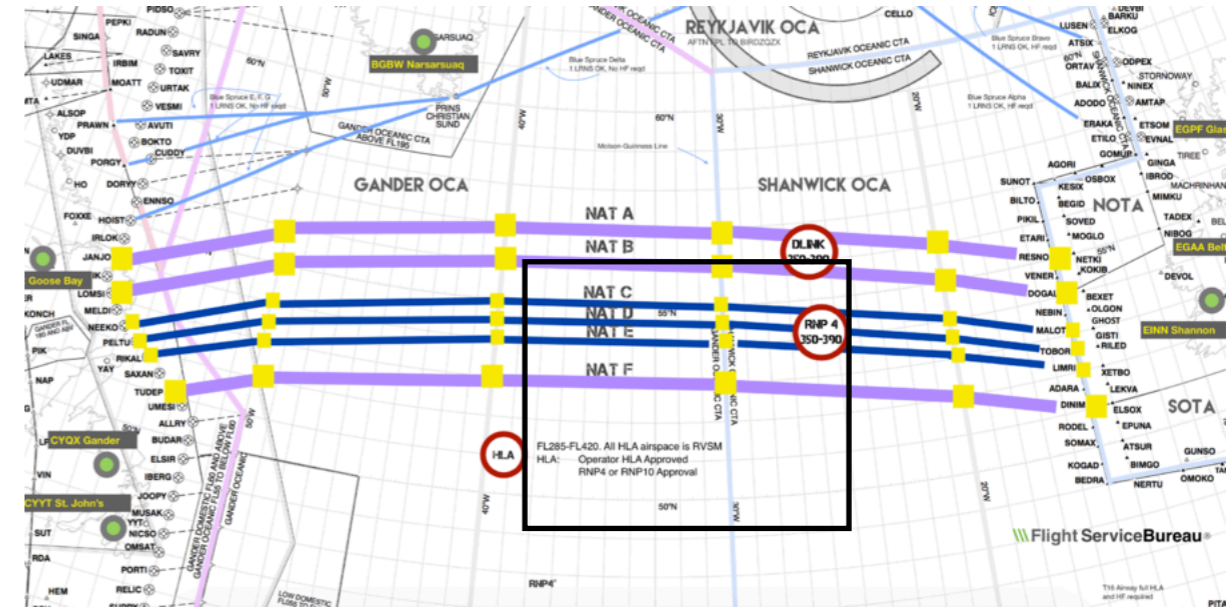
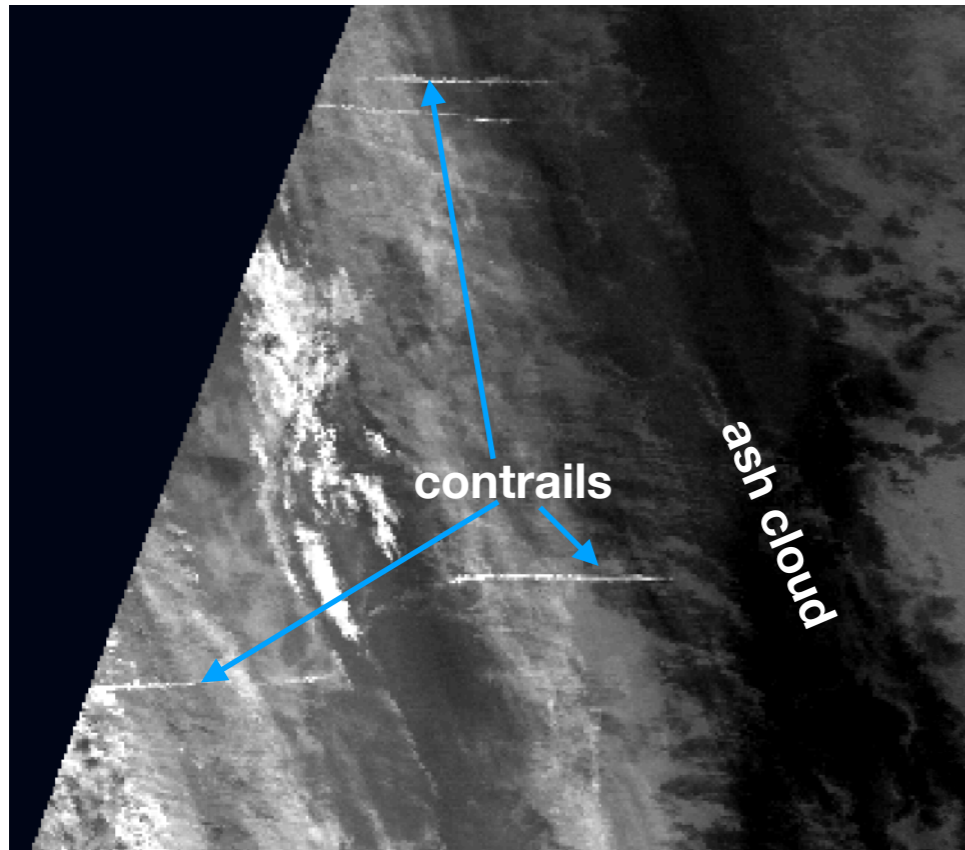
# FLEXPART

FLEXPART Ash concentration (Longitude 32°W)  
8-May-2010 13:00 UT



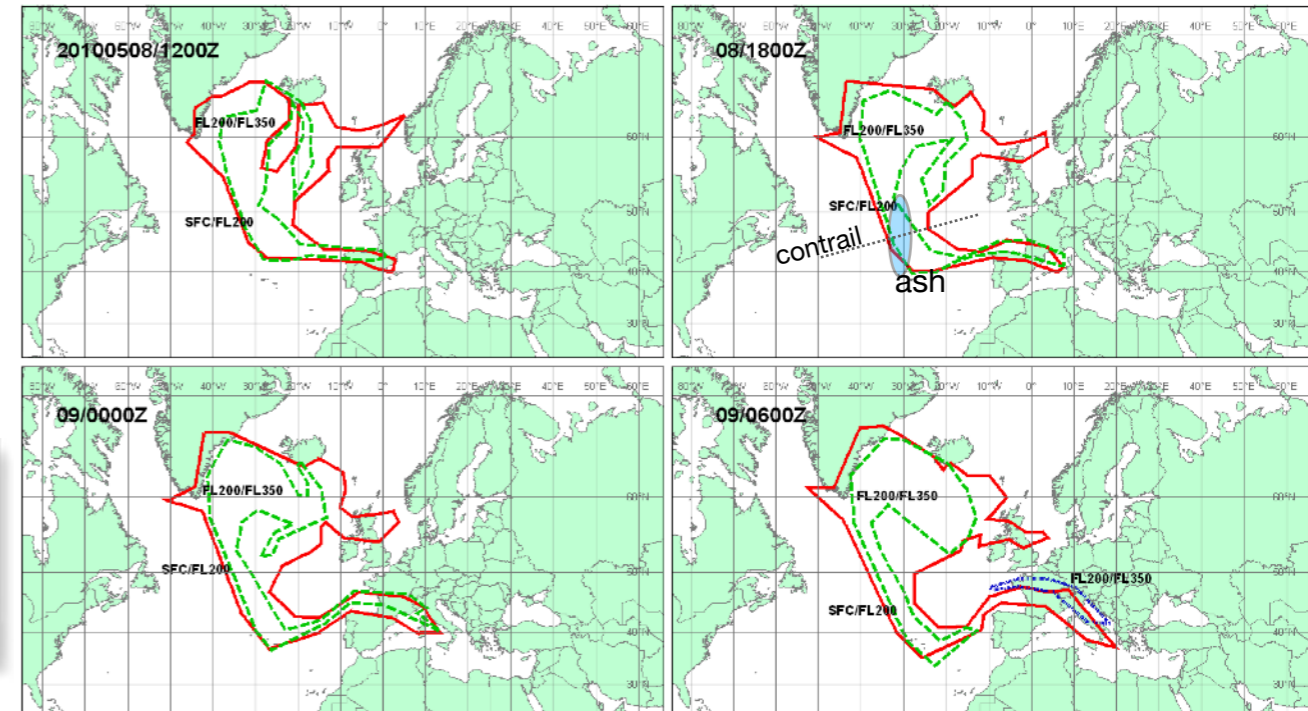
# Insights

Contrails show that aircraft were crossing the Atlantic while ash was in the vicinity



**NATS 29,000–41,000 ft (~8.8–12.5 km)**

London VAAC advisory suggests ash up to FL350 (35,000 ft ~10.7 km)



VA ADVISORY  
DTG: 20100508/1200Z  
VAAC: LONDON  
VOLCANO: EYJAFJALLAJOKULL 1702-02  
PSN: N6338 W01937  
AREA: ICELAND

SUMMIT ELEV: 1666M  
ADVISORY NR: 2010/092  
INFO SOURCE: ICELAND MET OFFICE  
AVIATION COLOUR CODE: RED  
ERUPTION DETAILS: PLUME ERUPTION  
CONTINUES, HEIGHTS UP TO FL230.

RMK: ADVISORY NO. NOW UPDATED AND CORRECTED  
NXT ADVISORY: 20100508/1800Z

# Eruption Rate from Satellite Measurements

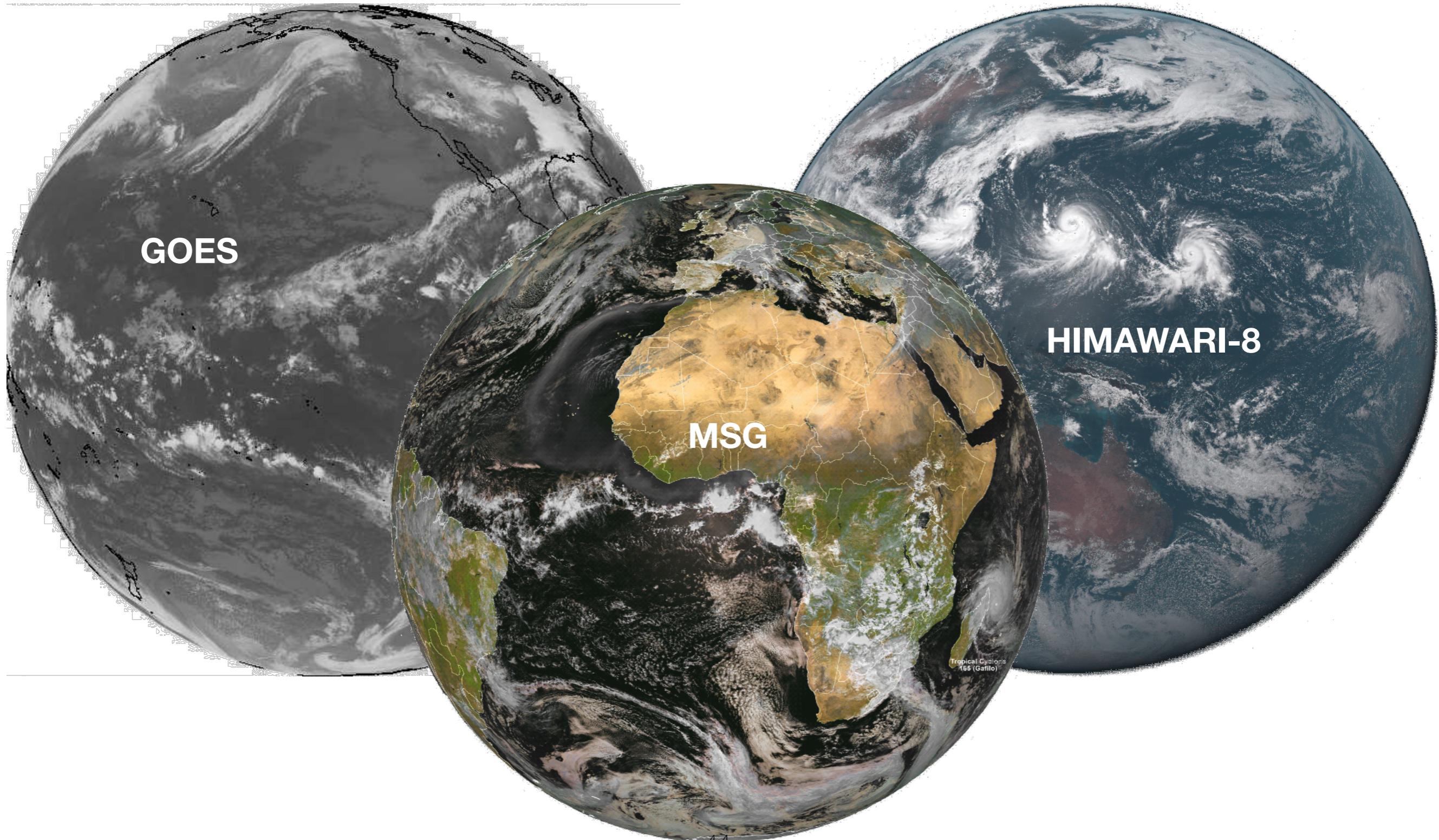
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## Prior art (using satellite data)

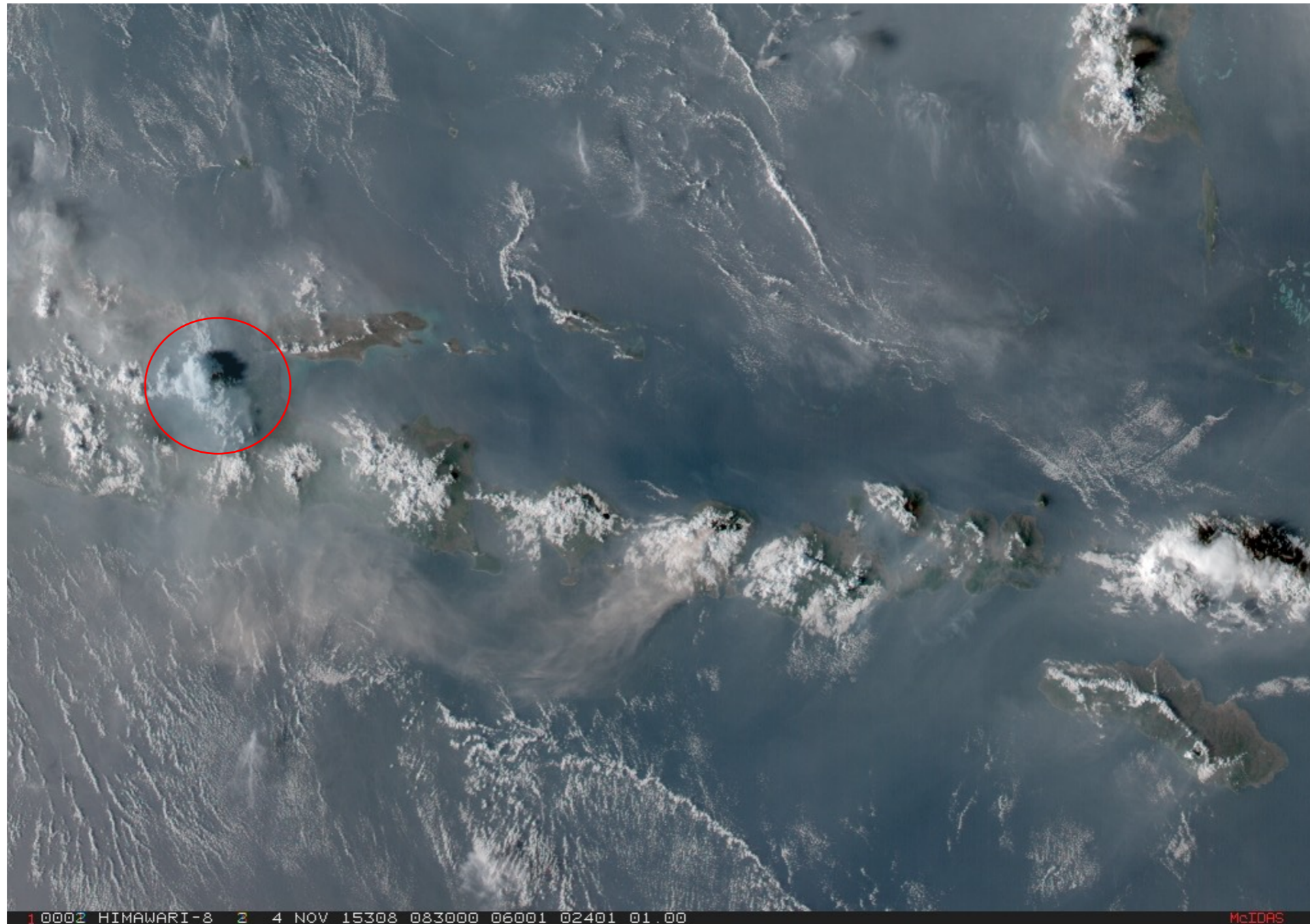
- Cloud shape recognition – pioneering work of Sawada (motivation to identify volcanic clouds in single channel imagery) – 1980's
- Solène Pouget (and co-workers) – 2010 onwards
- Convective clouds – much work in atmospheric sciences based on rapid growth and precipitation onset

# Geostationary Satellites

**Geo-satellites ideal because of high data repetition**

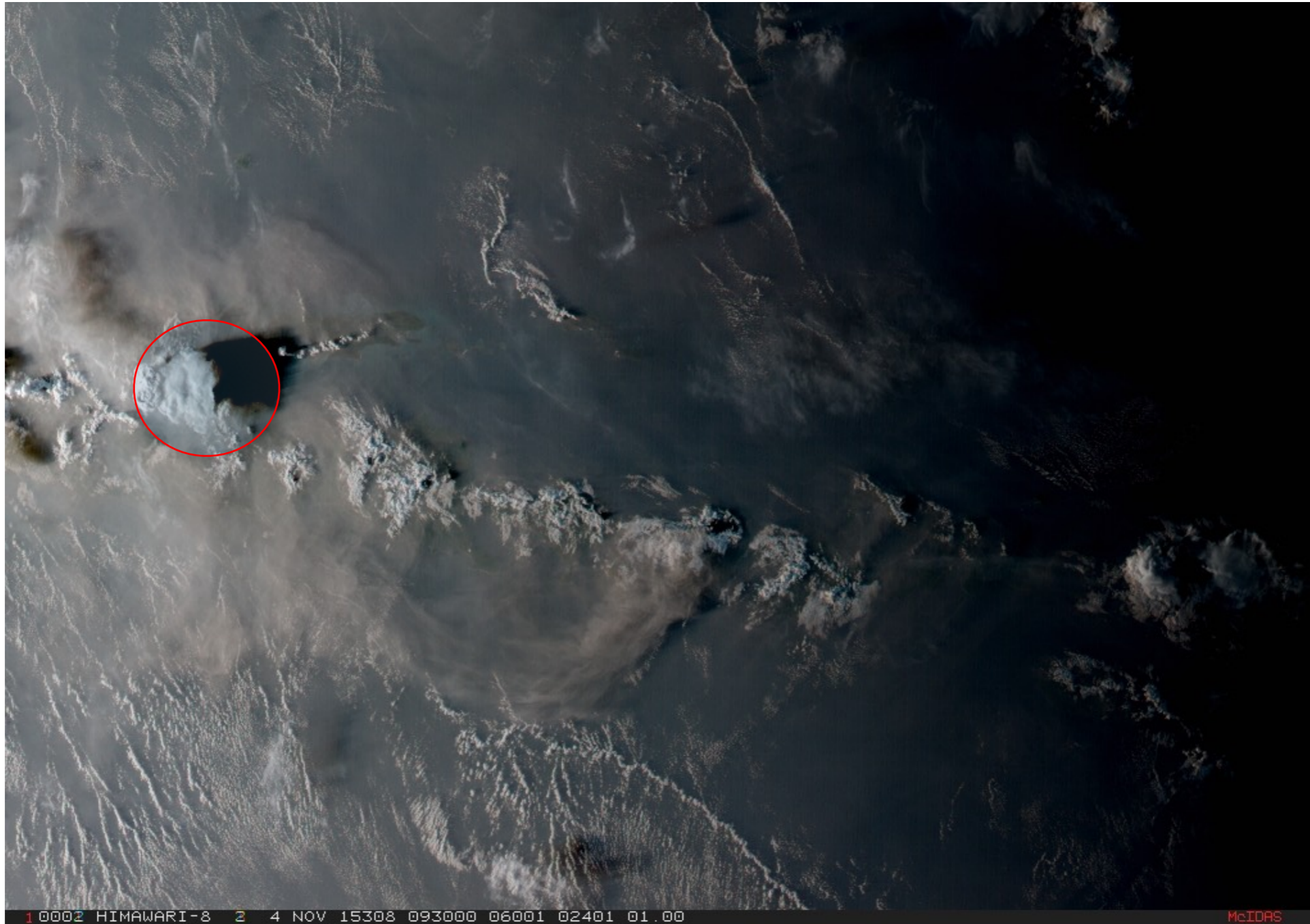


# Eruption Rate from Satellite Measurements

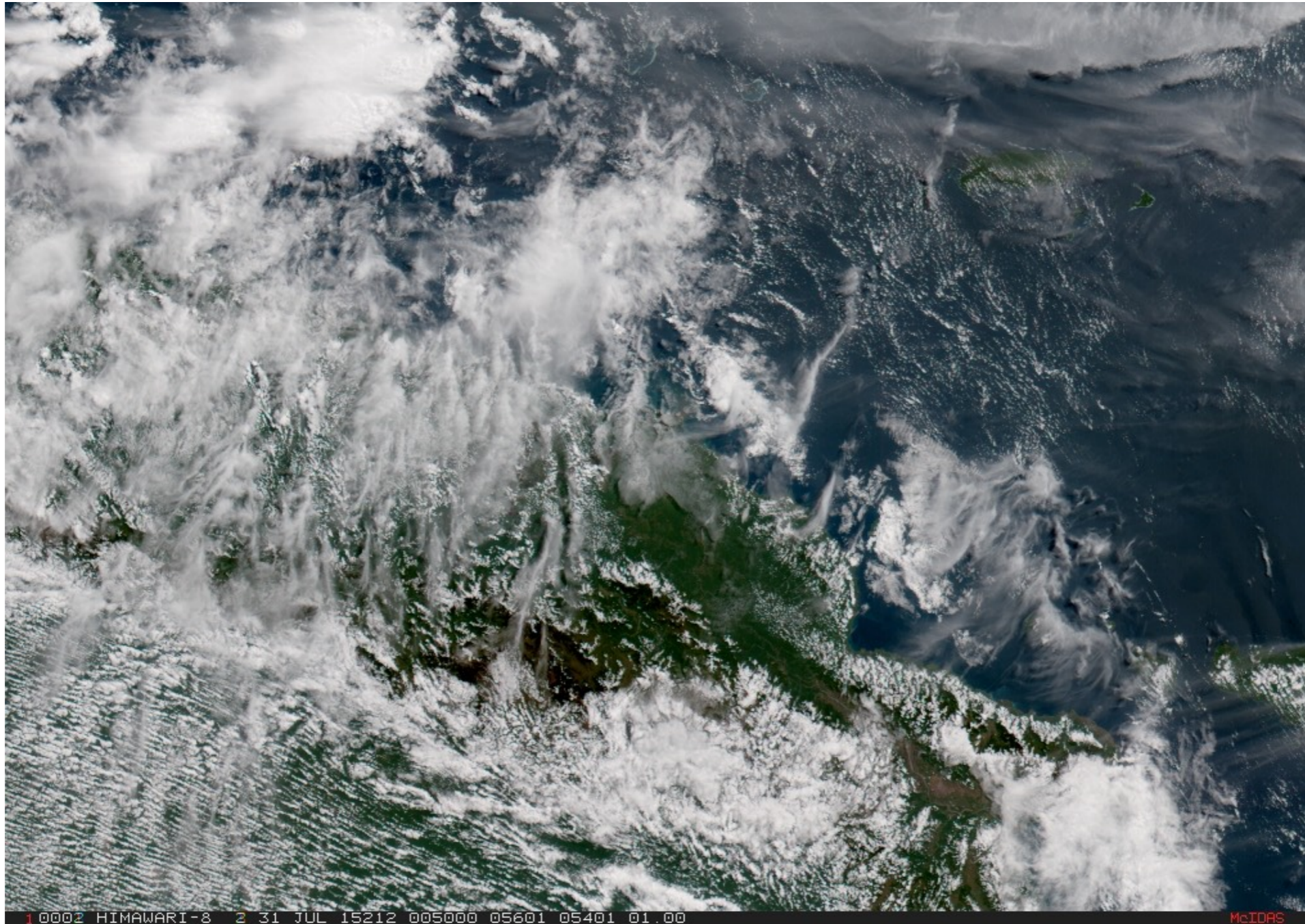


**Example of rapid vertical (convective) development of meteorological cloud**

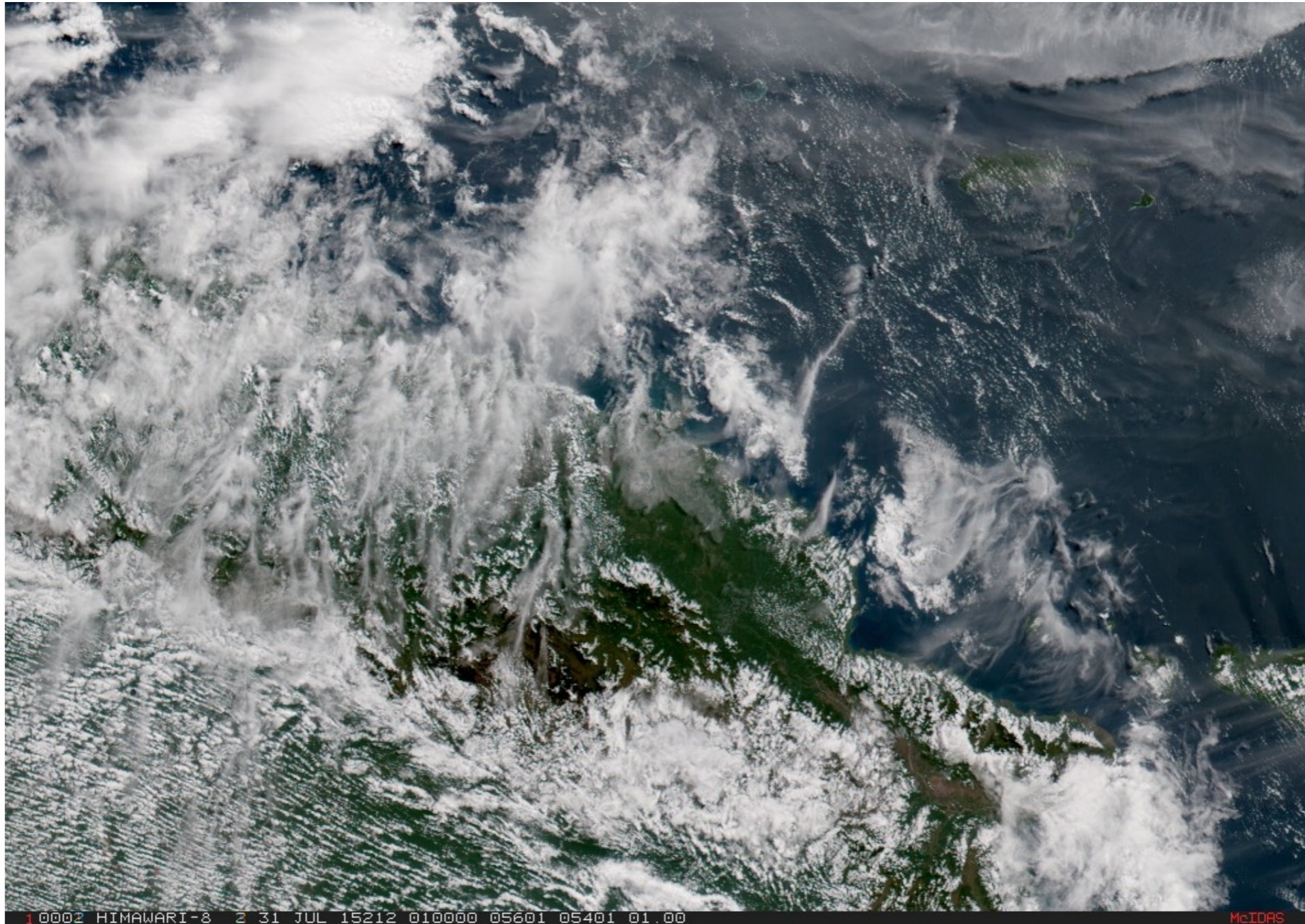
# Eruption Rate from Satellite Measurements



# Eruption Rate from Satellite Measurements

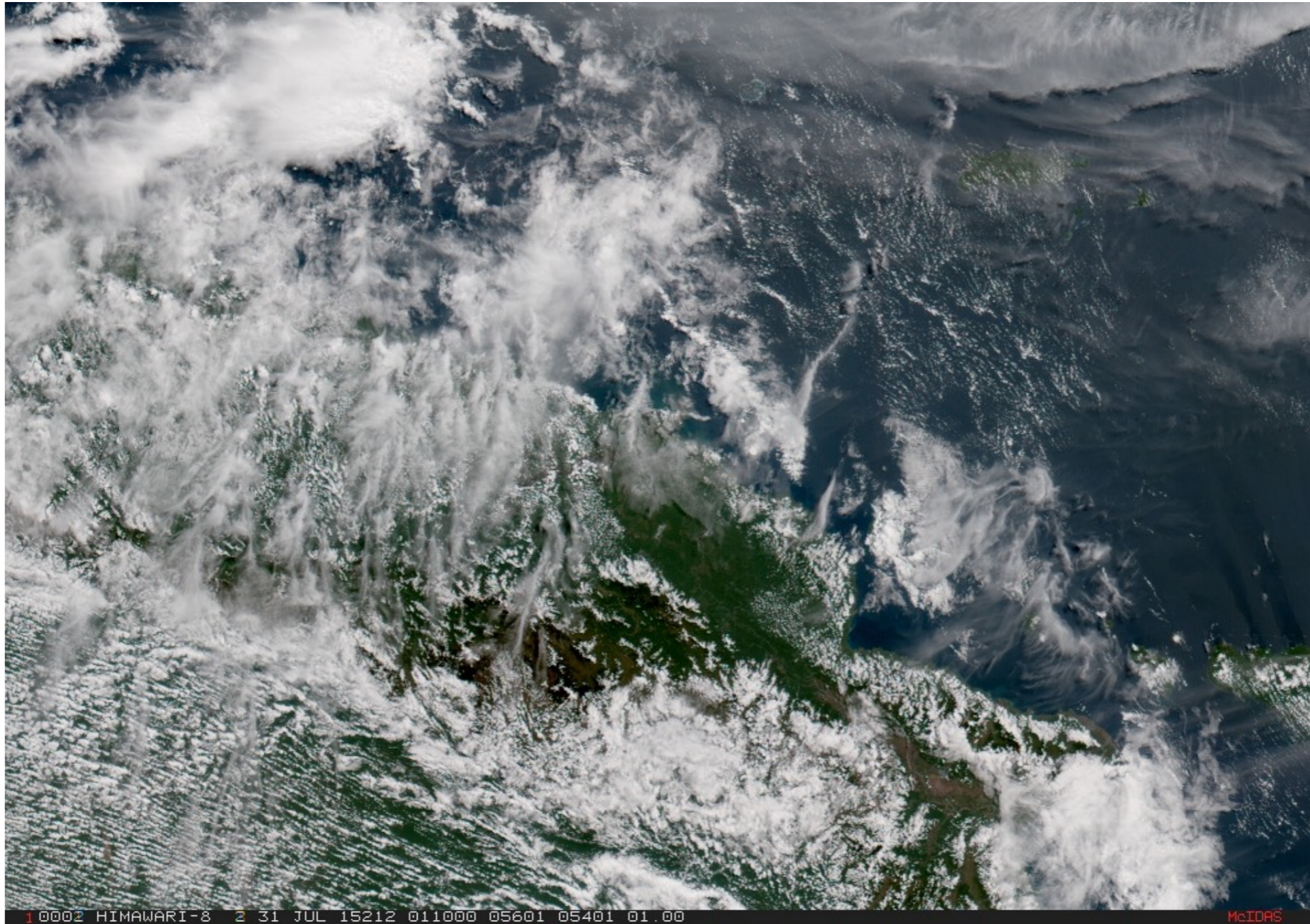


# Eruption Rate from Satellite Measurements

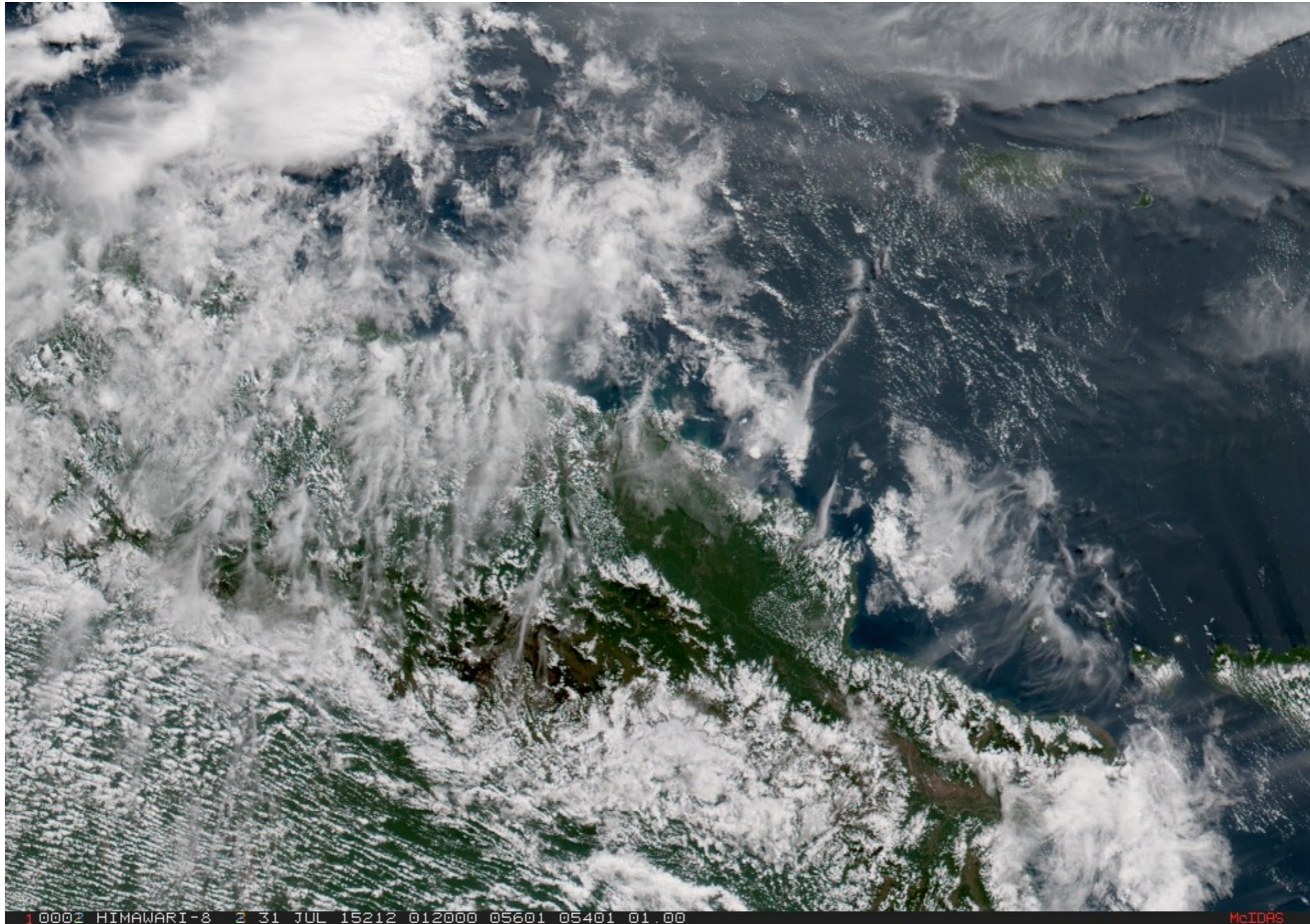




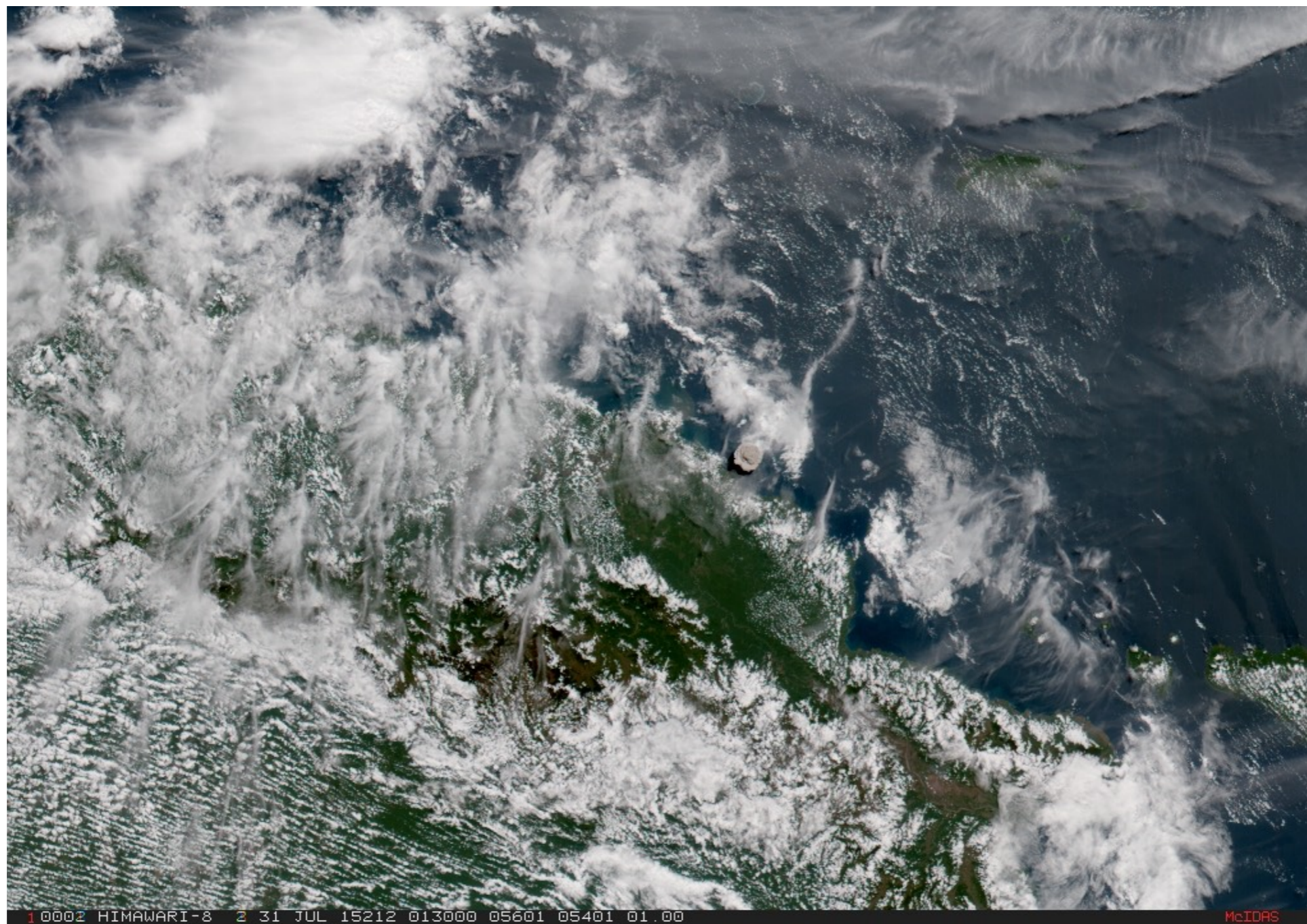
# Eruption Rate from Satellite Measurements



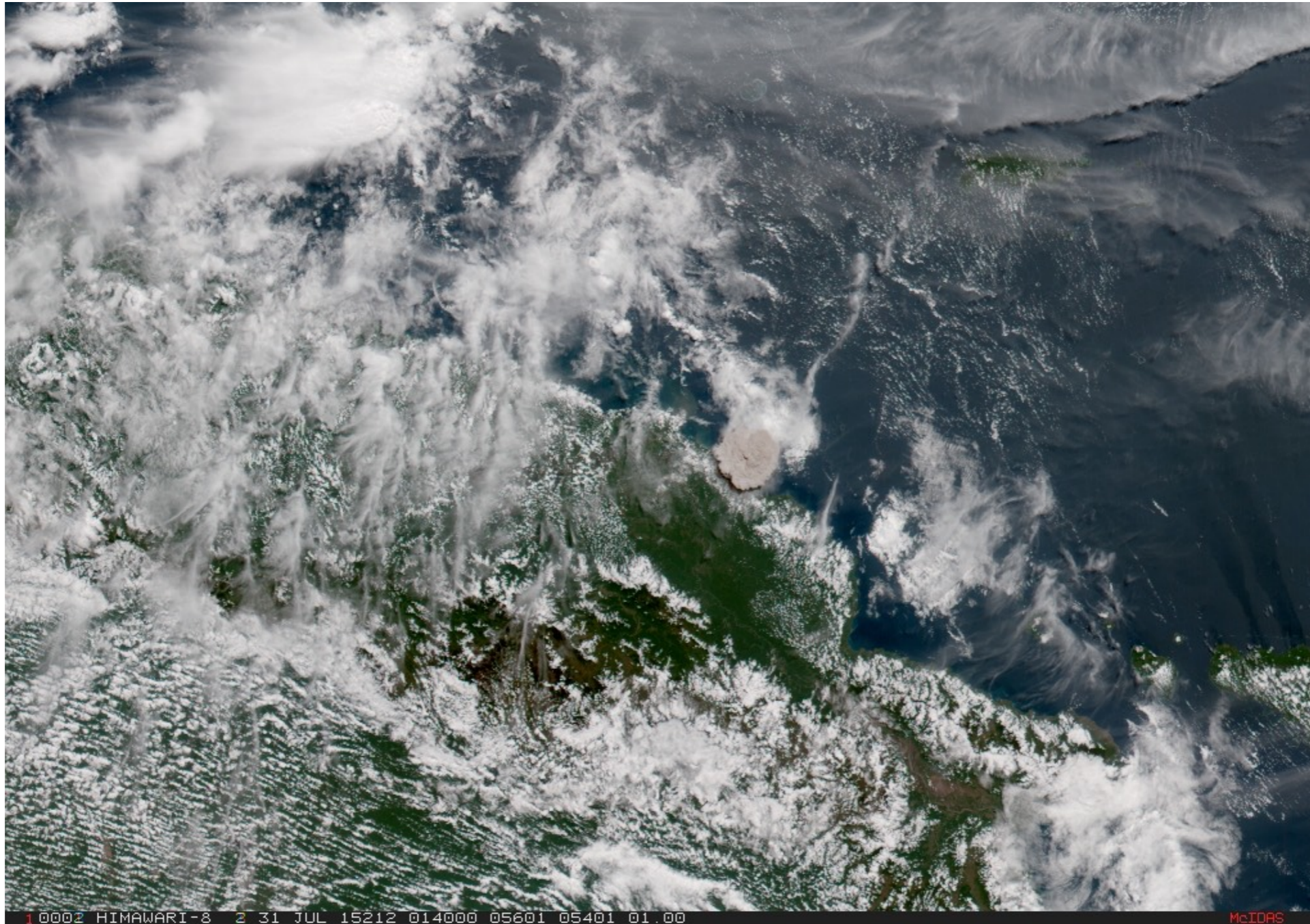
# Eruption Rate from Satellite Measurements



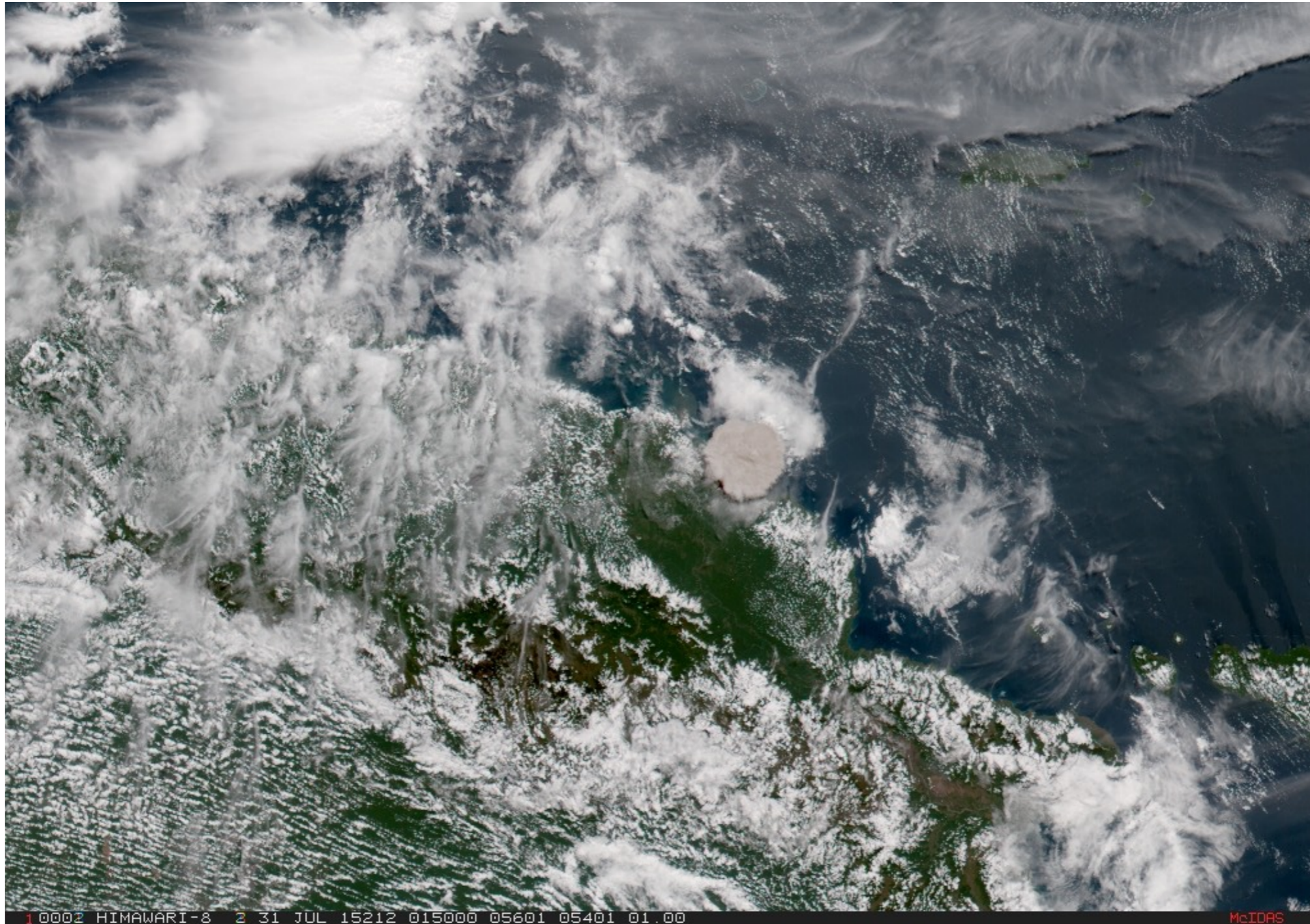
# Eruption Rate from Satellite Measurements



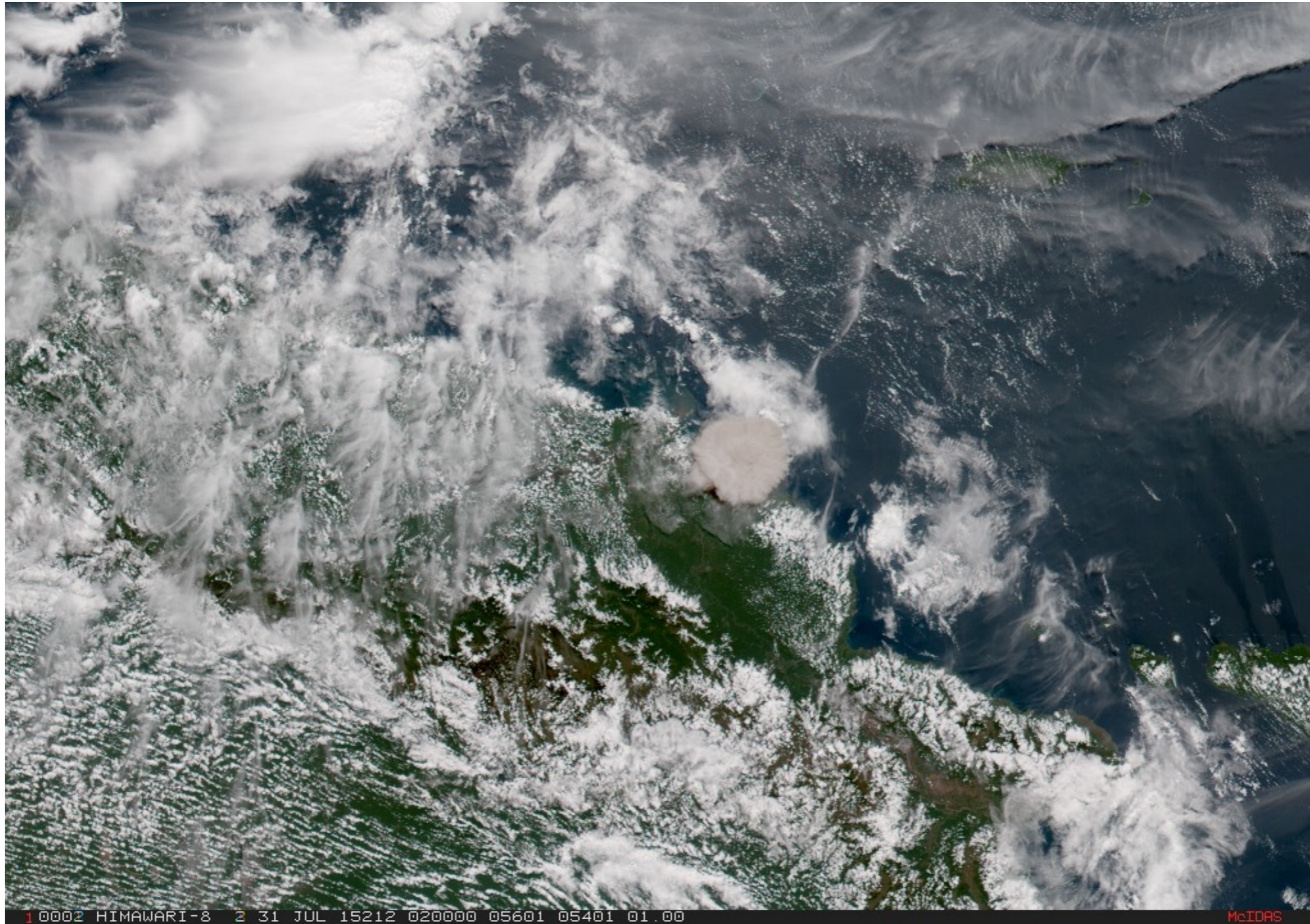
# Eruption Rate from Satellite Measurements



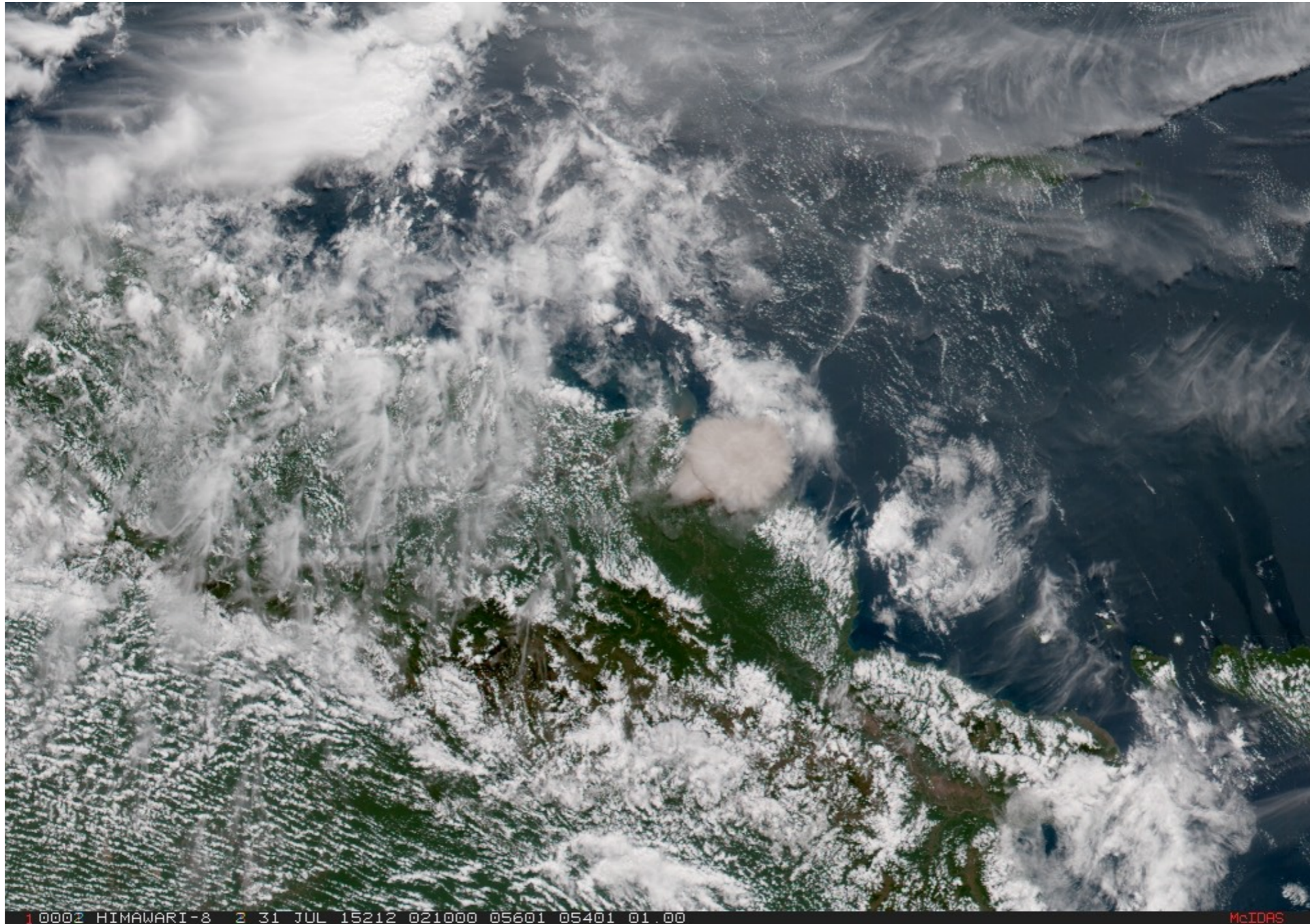
# Eruption Rate from Satellite Measurements



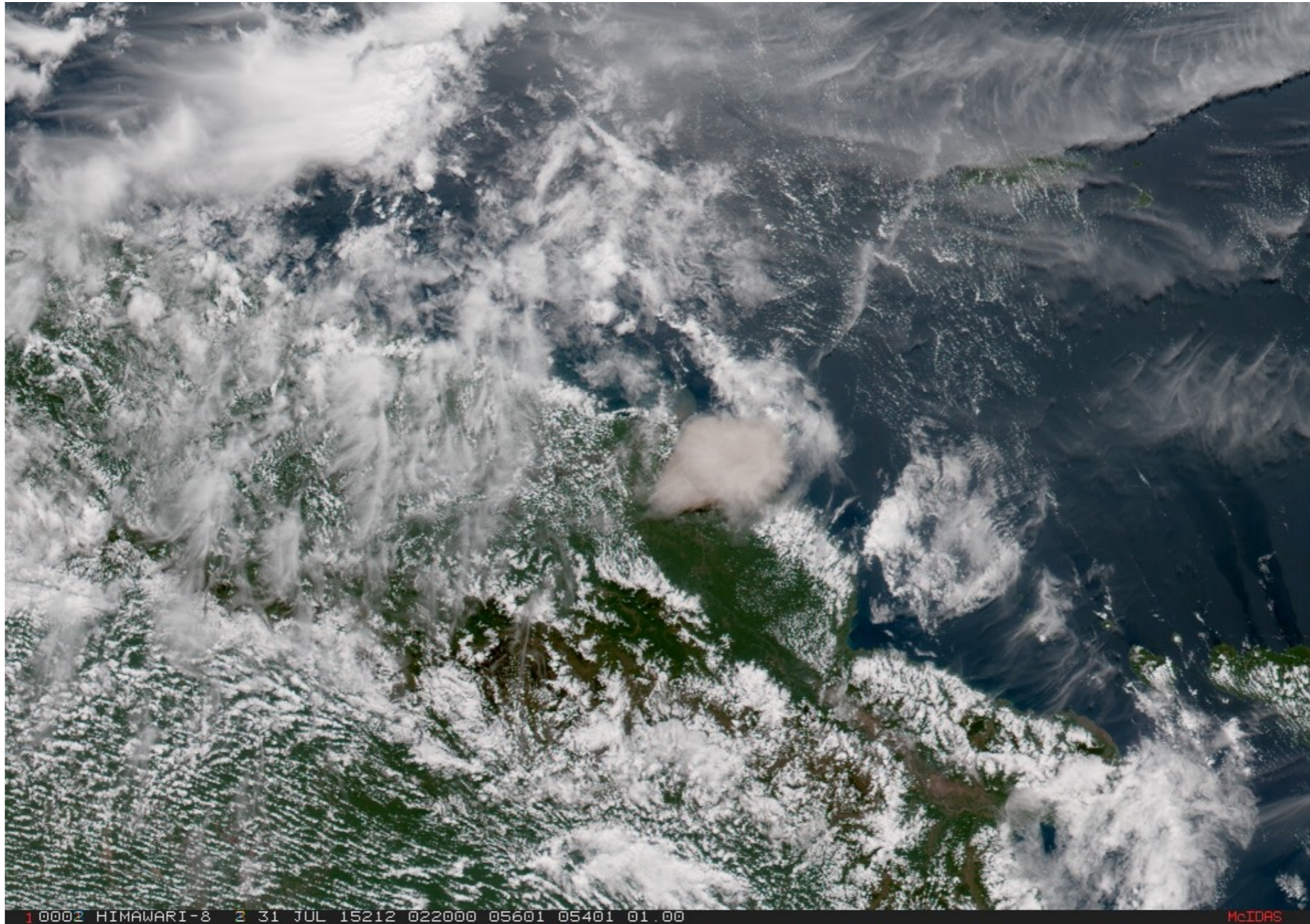
# Eruption Rate from Satellite Measurements



# Eruption Rate from Satellite Measurements

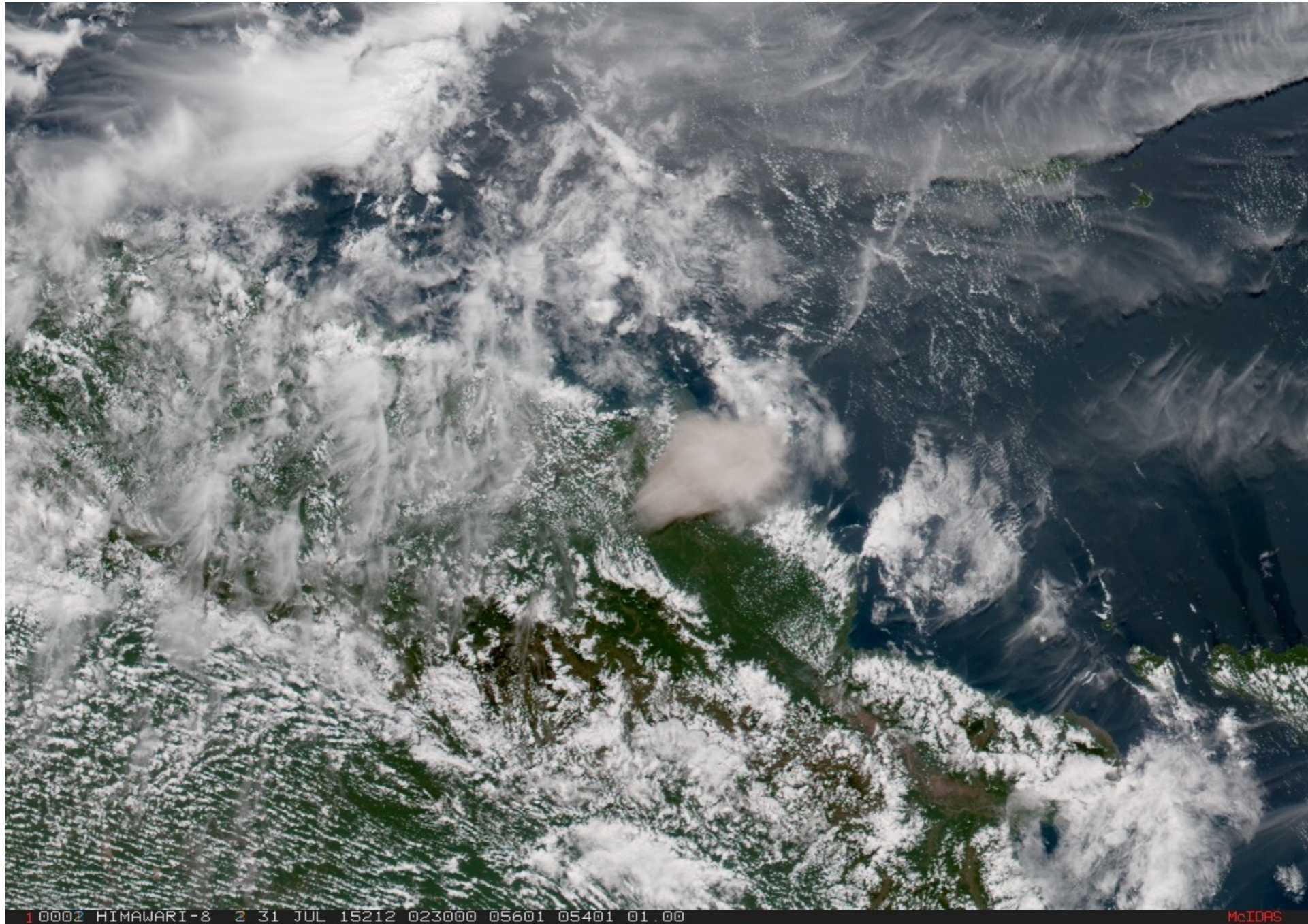


# Eruption Rate from Satellite Measurements

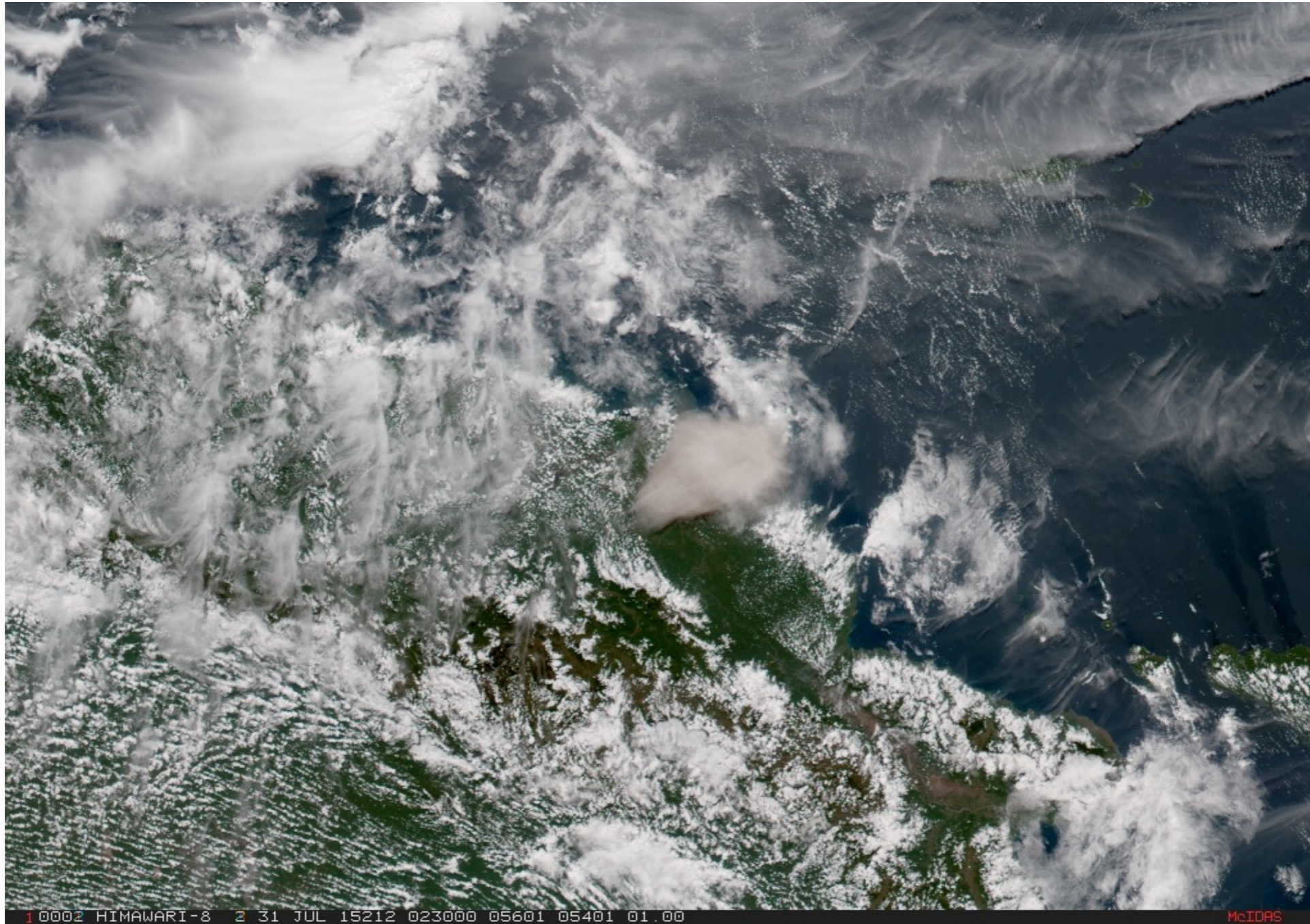




# Eruption Rate from Satellite Measurements

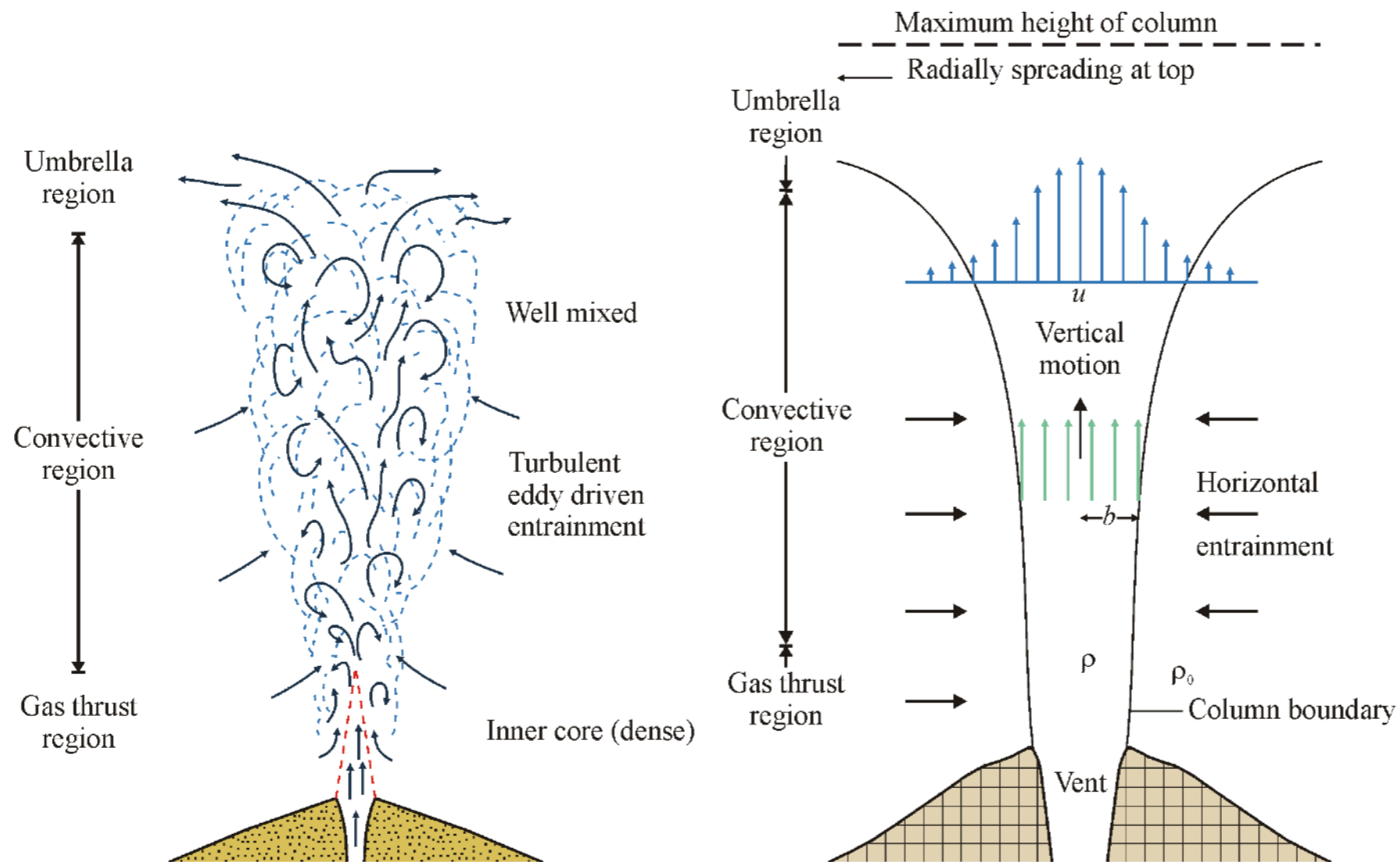


# Eruption Rate from Satellite Measurements



# Eruption Rate from Satellite Measurements

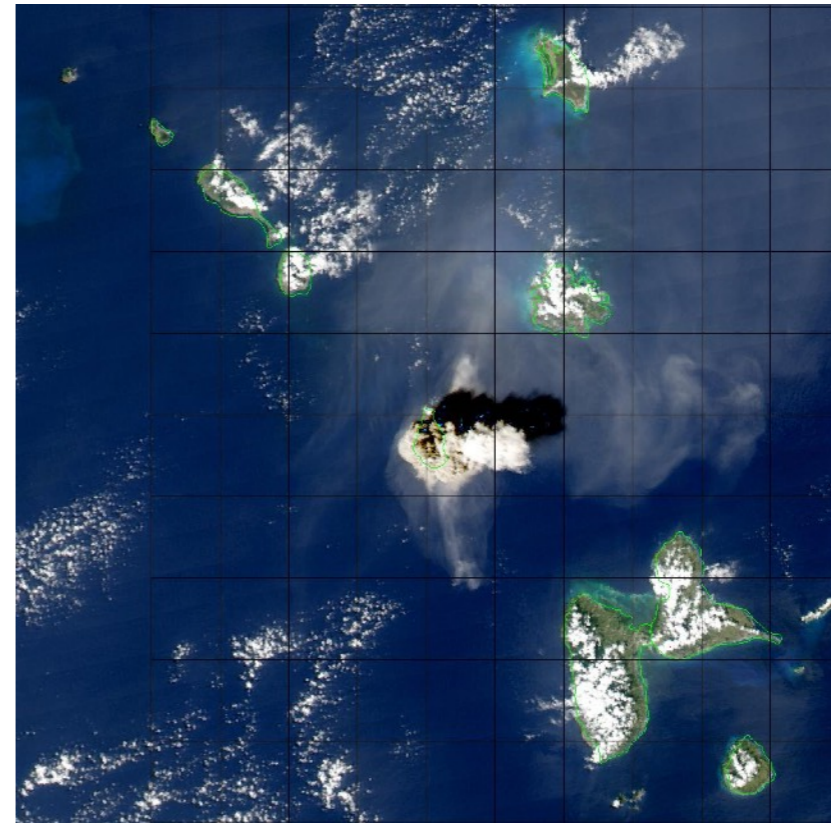
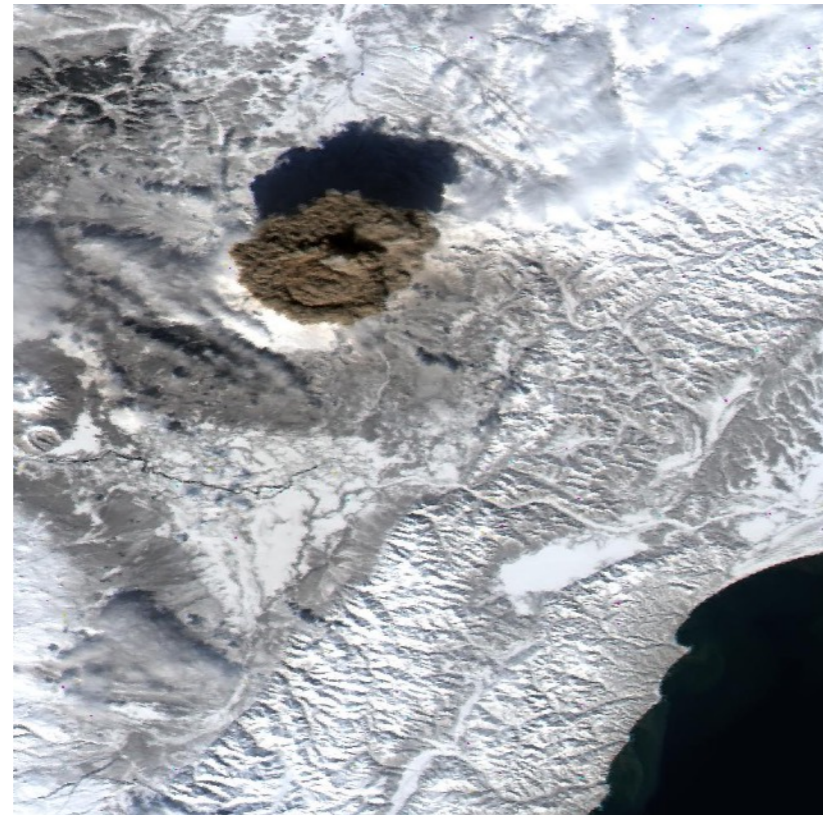
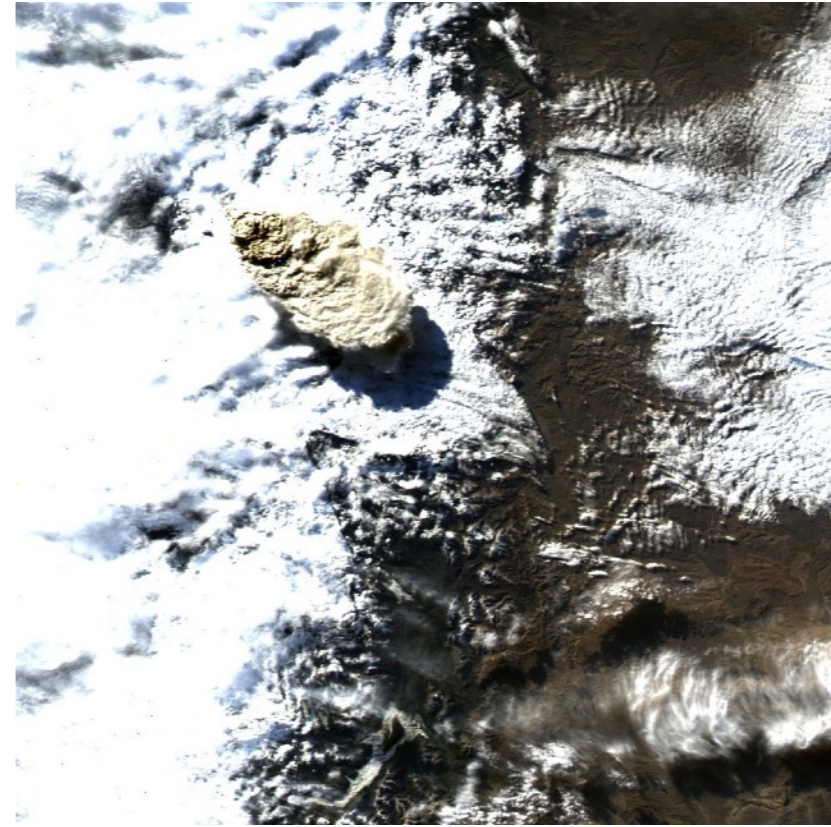
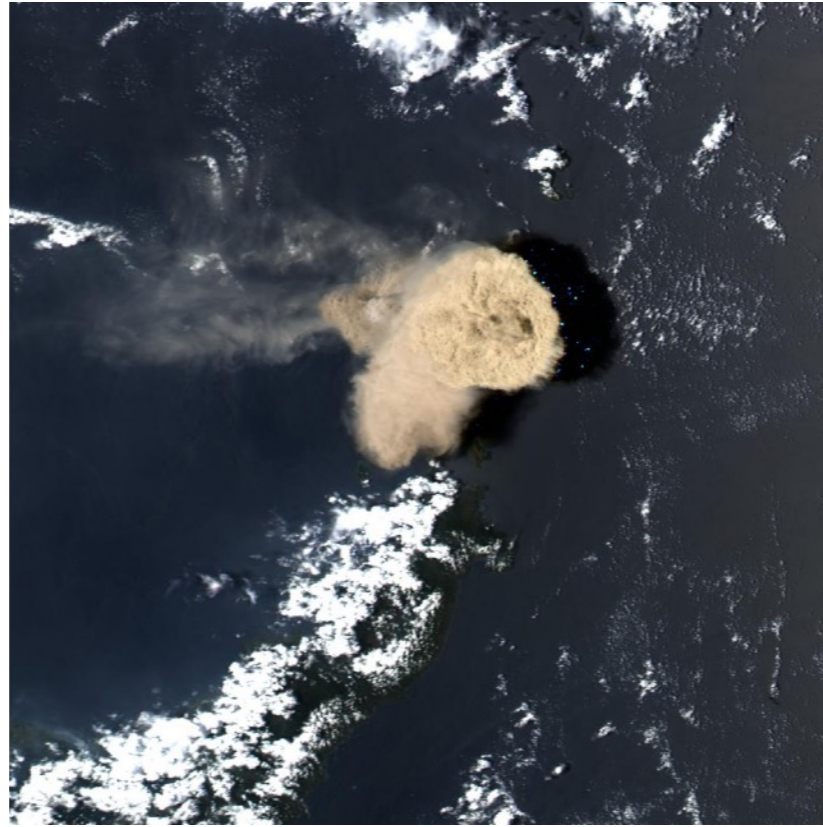
Can the rapid spread of the umbrella cloud be used to estimate the eruption rate of the vertical column?



After Augusto Neri

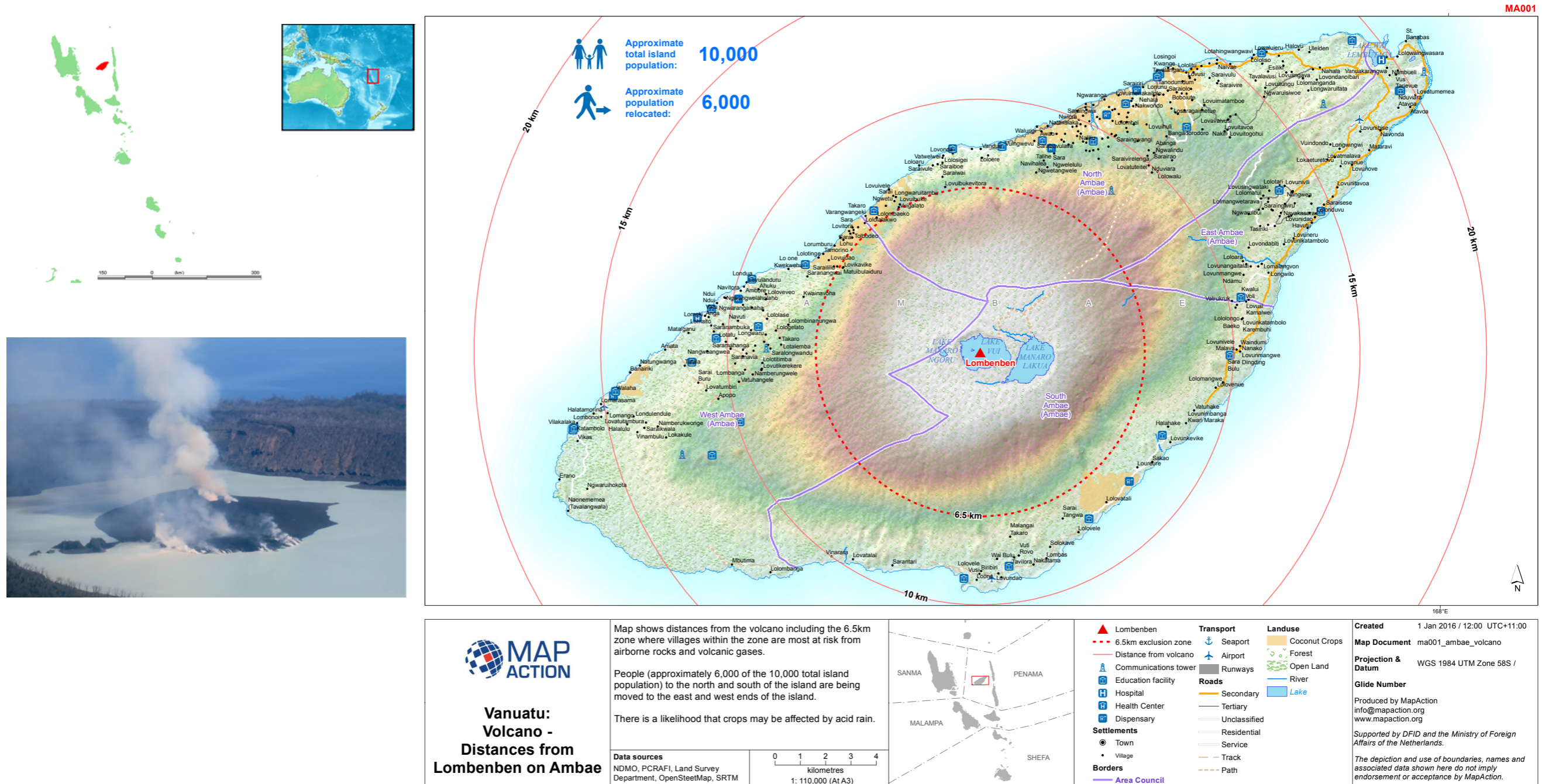
# Eruption Rate from Satellite Measurements

Satellites detect many eruption columns from early onset

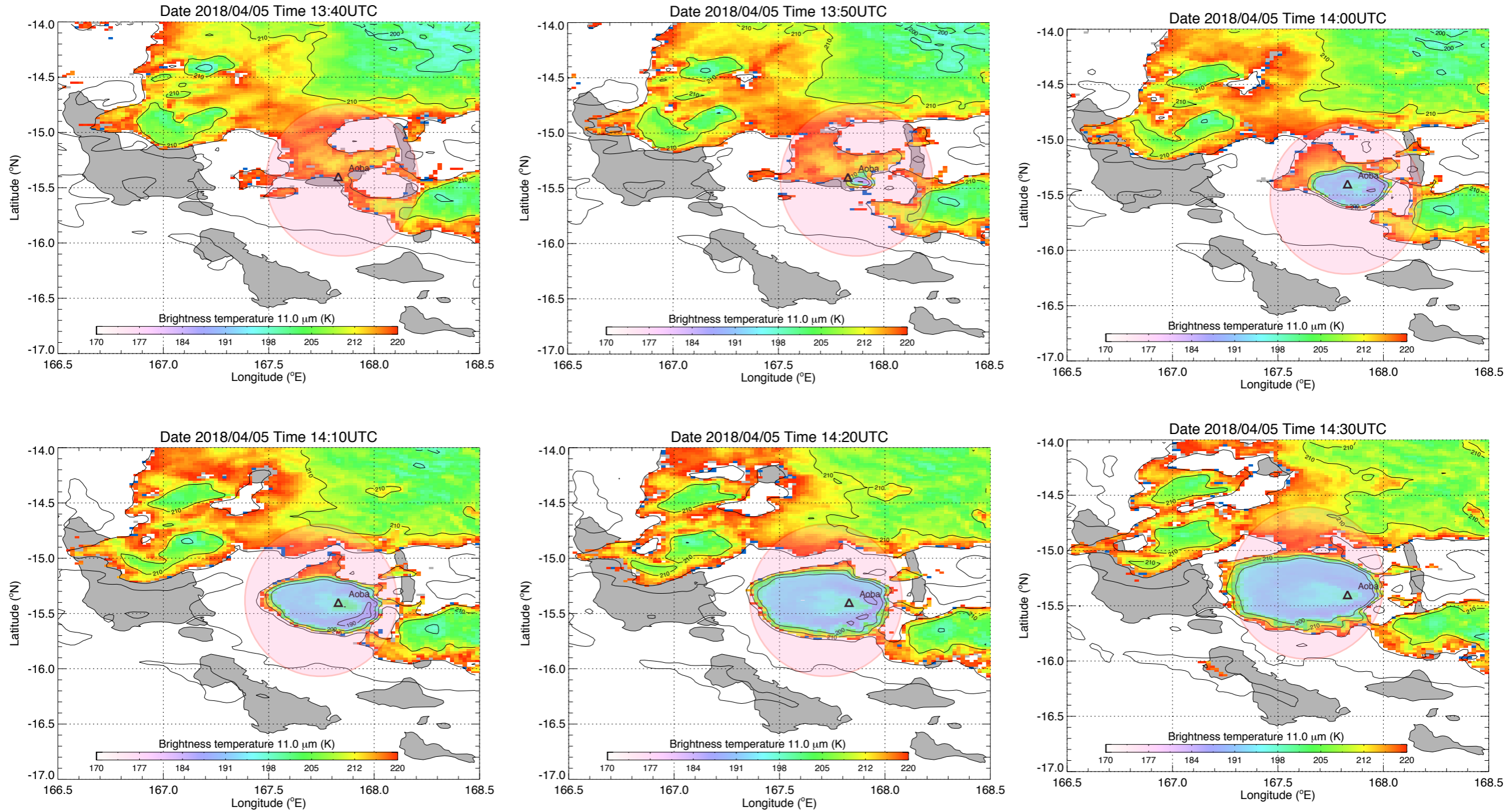


# Eruption Rate from Satellite Measurements

## Example: Aoba/Ambae eruption – April 2018

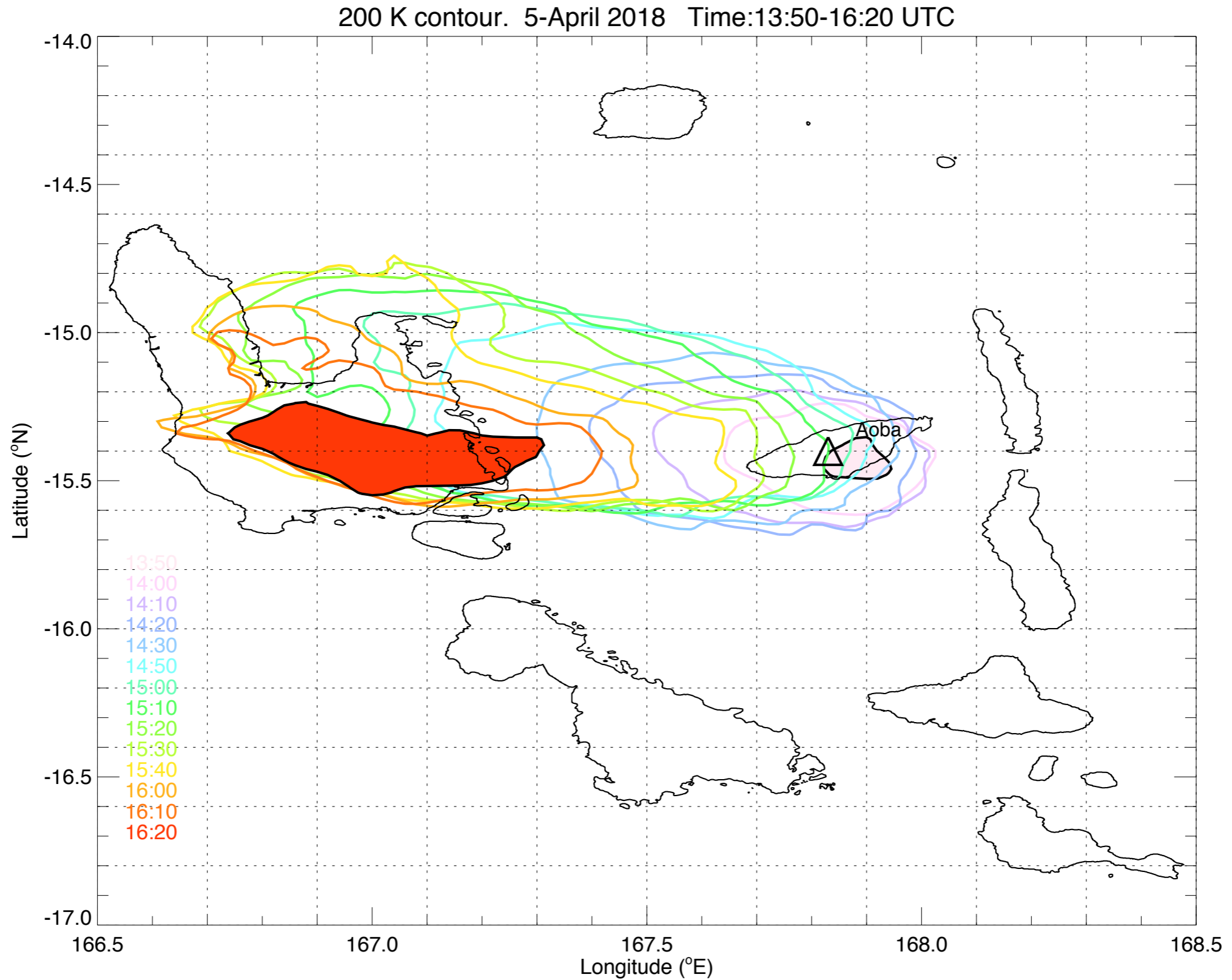


# Eruption Rate from Satellite Measurements



**Evolution of the 11 μm brightness temperature at 10 min intervals**

# Eruption Rate from Satellite Measurements



# Eruption Rate from Satellite Measurements

The volcanic cloud is easily observed in Himawari-8 and other satellite data. Himawari-8 samples the region at 2 x 2 km<sup>2</sup> spatial resolution in the infrared every 10 minutes. Assuming that the eruption column rises at some vertical ascent rate, unaffected by cross-winds, reaches a neutral buoyancy level and then spreads horizontally, an estimate of the rate of radial spreading can be used to estimate the eruption rate at the top of the cloud, essentially as a consequence of conservation of mass. A common formulation for the increase of the radius of the umbrella cloud is (Sparks et al., 1997; Pouget et al., 2013):

$$r_t = \left( \frac{3\nu N Q_t}{2\pi} \right)^{1/3} t^{2/3}$$

r is the radius

t is time

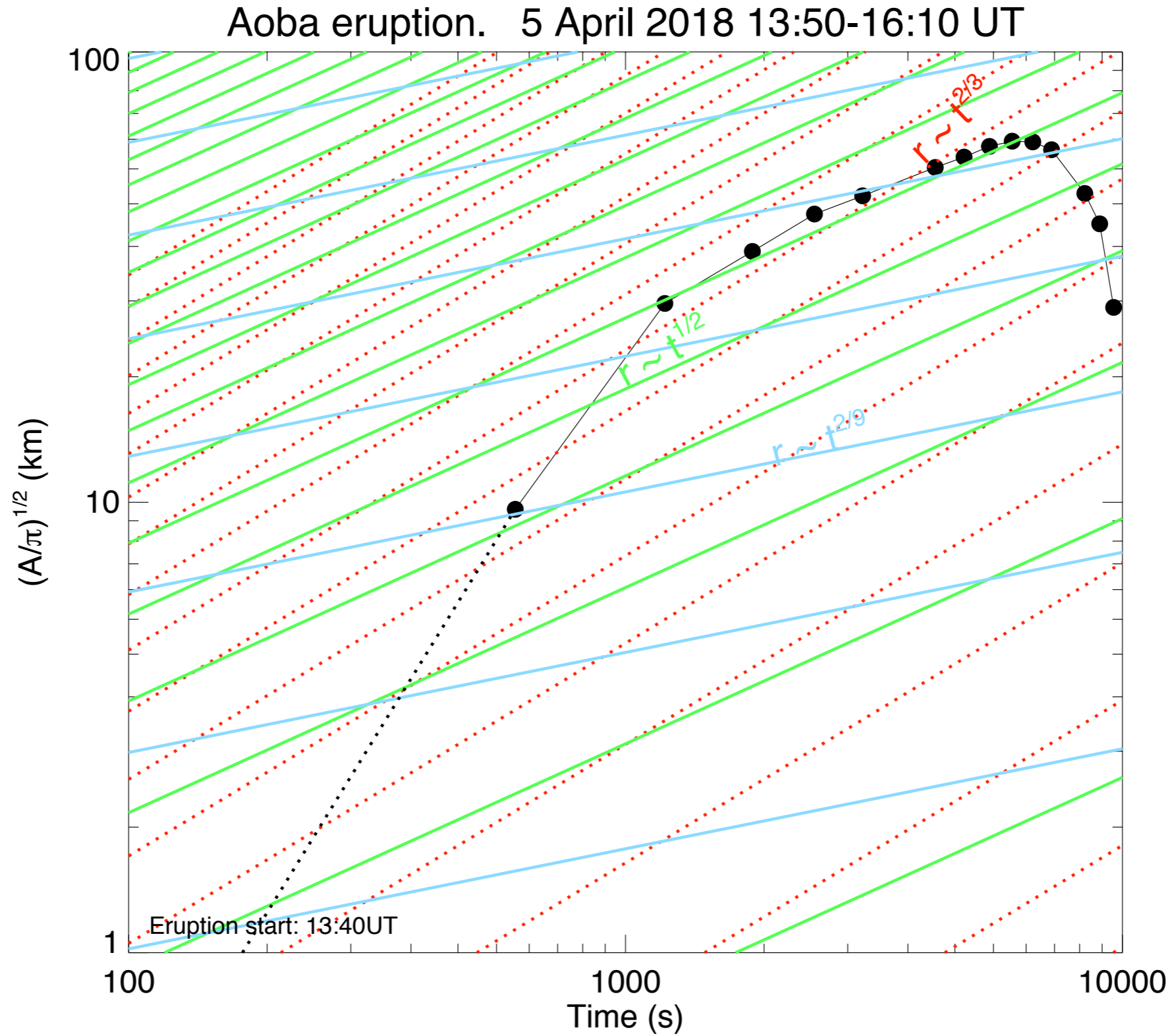
Q is the volumetric eruption rate

N is the Brunt-Vaisala frequency

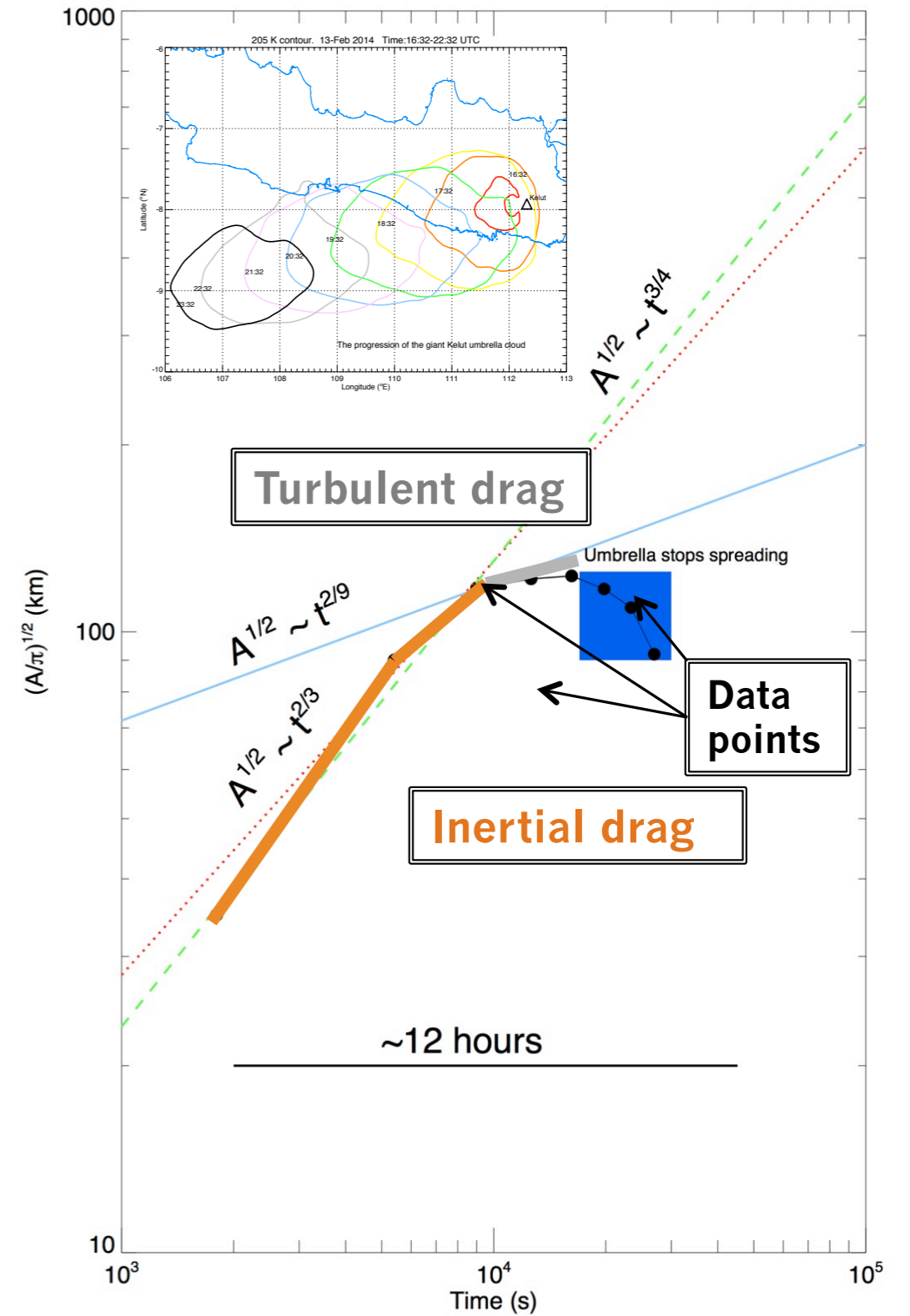
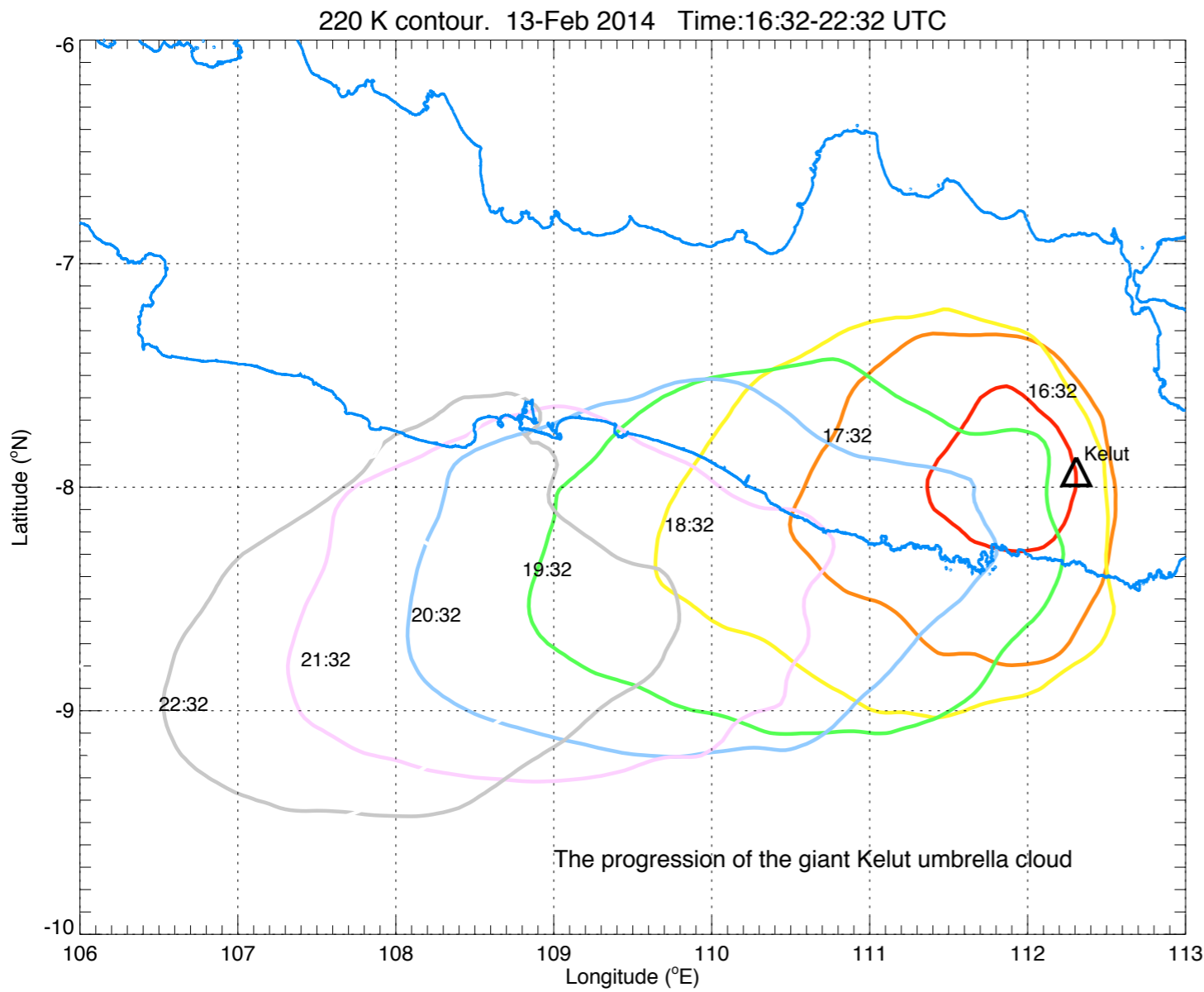
$\nu$  is a dimensionless constant



# Eruption Rate from Satellite Measurements



# Eruption Rate from Satellite Measurements



# Eruption Rate from Satellite Measurements

