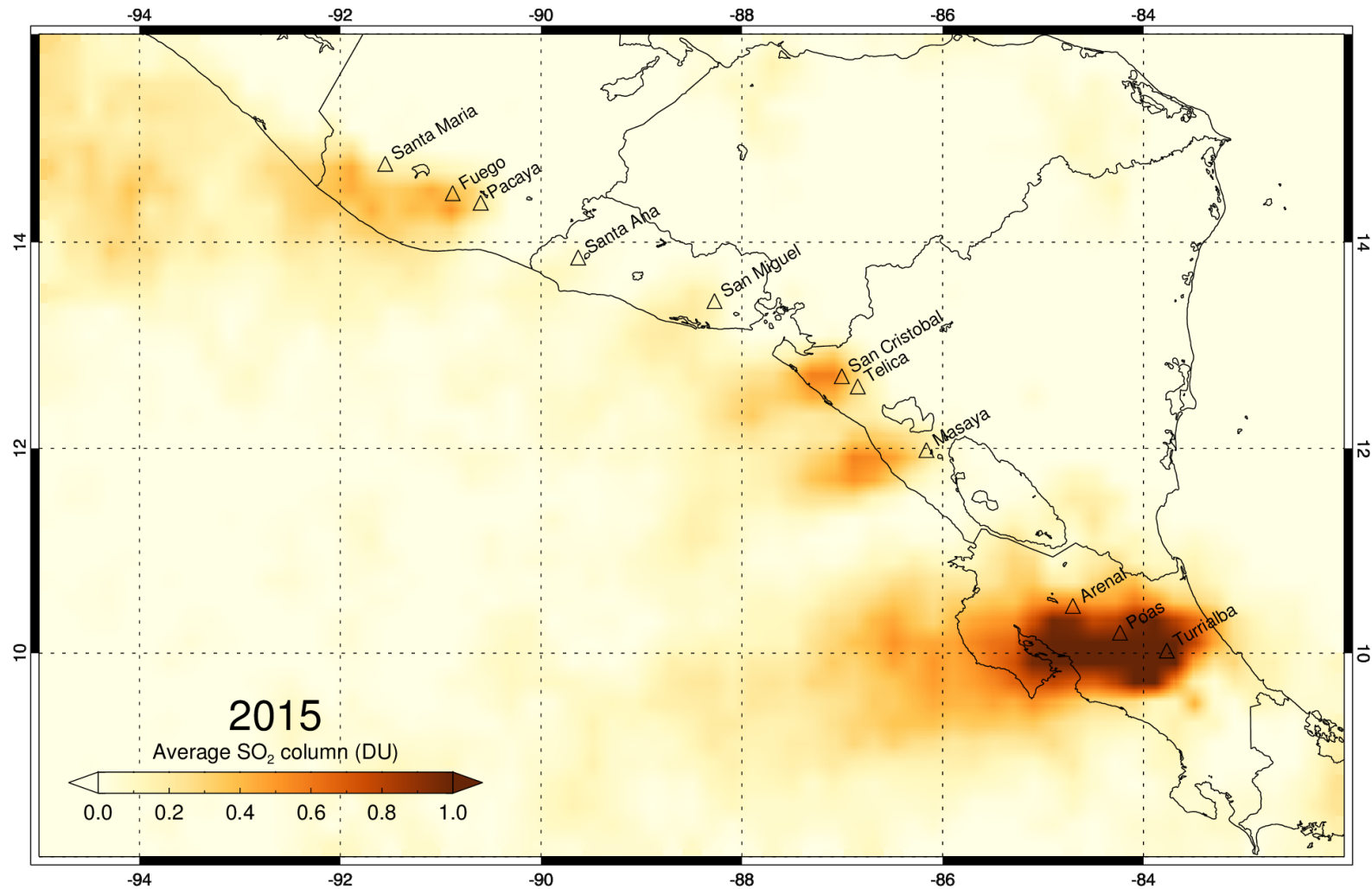


Satellite Remote Sensing of Volcanic Emissions



How big? How high? Climate impacts?



Pinatubo – June 12, 1991 (*Getty Images*)

Before the satellite era

Stratospheric particles sampled after the 1963 Agung eruption (*Mossop, 1964*)

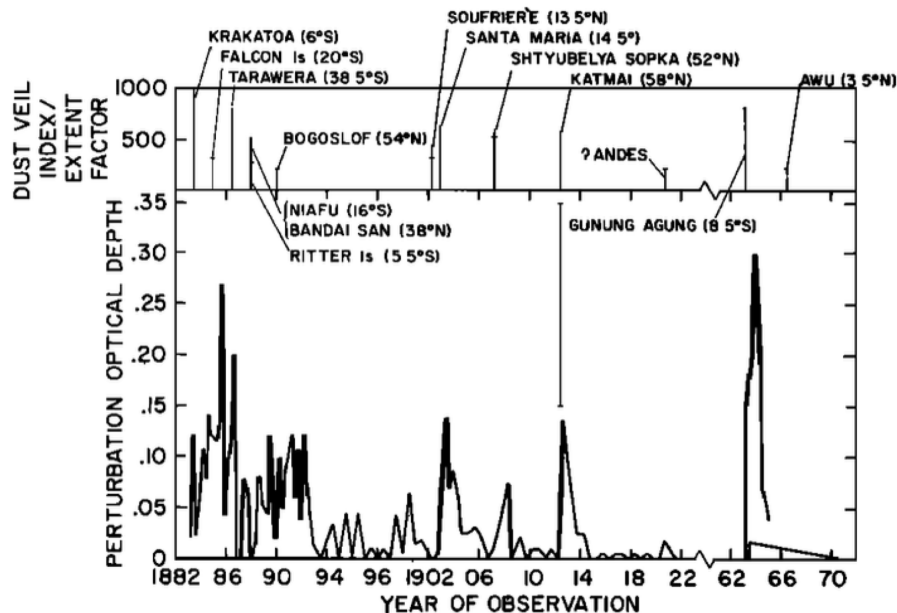


Fig. 10. Optical depth perturbation of the atmosphere as a function of time. Also shown are the times of volcanic explosions that had DVI values in excess of 170. The left side of the figure presents data for the time period from 1880 to 1925, while the right side presents corresponding information from 1962 to the present. There is a break in the time scale between these two sides. *Pollack et al., 1976*

- Optical perturbations, direct sampling, ice cores

Lamb, 1970 (DVI); Hammer, 1977; Hammer et al., 1980

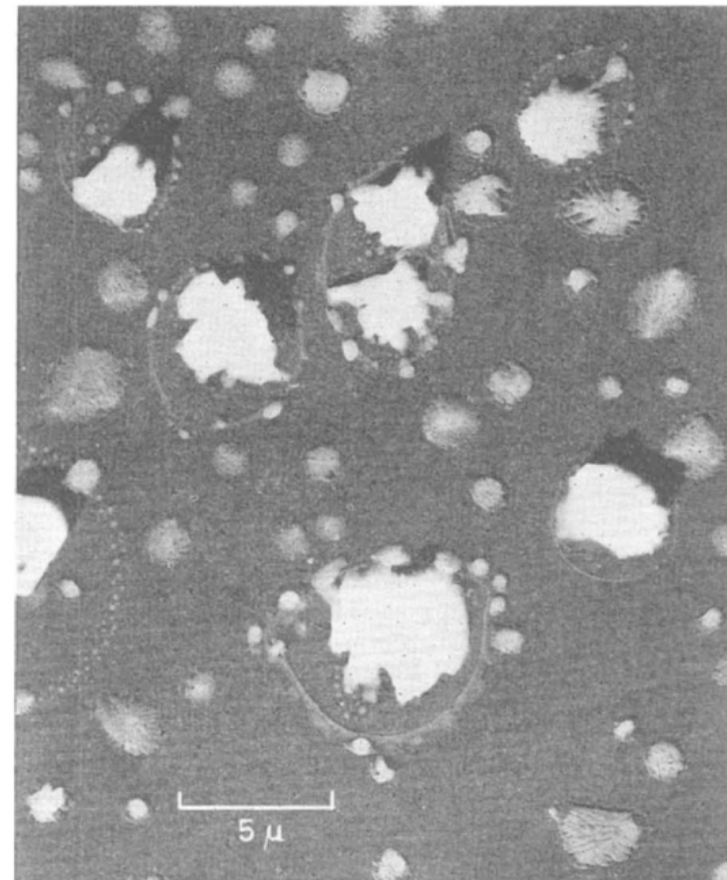
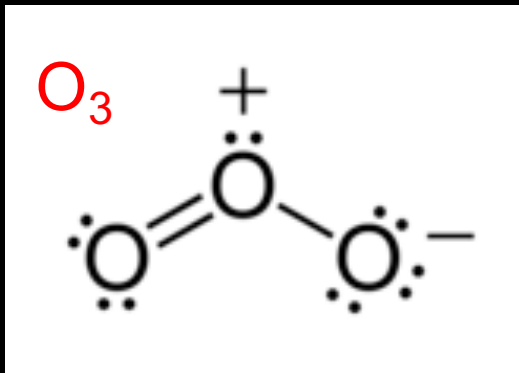
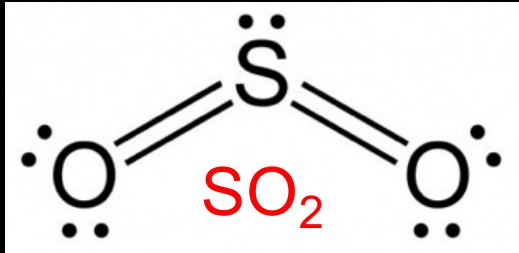


Fig. 1. Particles collected at 20 km between latitudes 44° and 40° S. on May 21, 1963, with metal shadowing. The large particles which cast an appreciable shadow are volcanic particles encased in soluble material, while the smaller flat 'rosettes' are typical of particles present at this level before the incursion of volcanic dust

'The material collected on the aircraft windshield is acid to litmus paper and painfully acid to the tongue.'

Detection of April
1982 El Chichon SO₂
cloud by the NASA
Total Ozone Mapping
Spectrometer (TOMS)



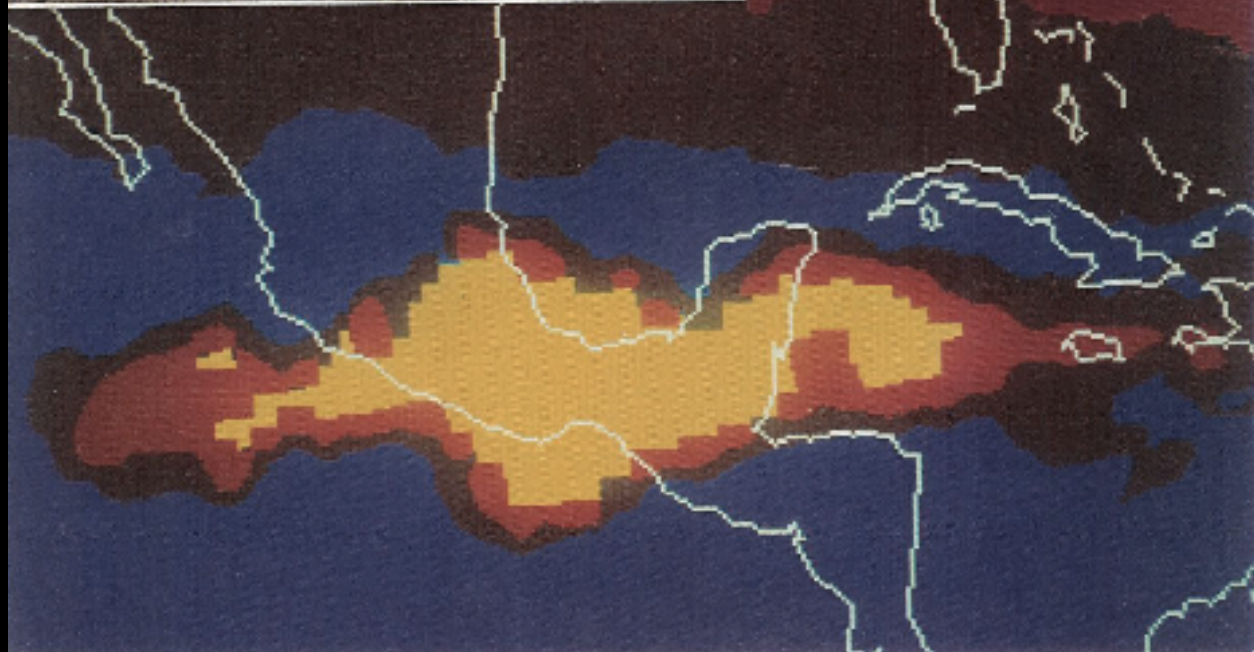
Krueger (1983)
Krueger et al. (2008)

24 JUNE 1983 · VOL. 220 · NO. 4604

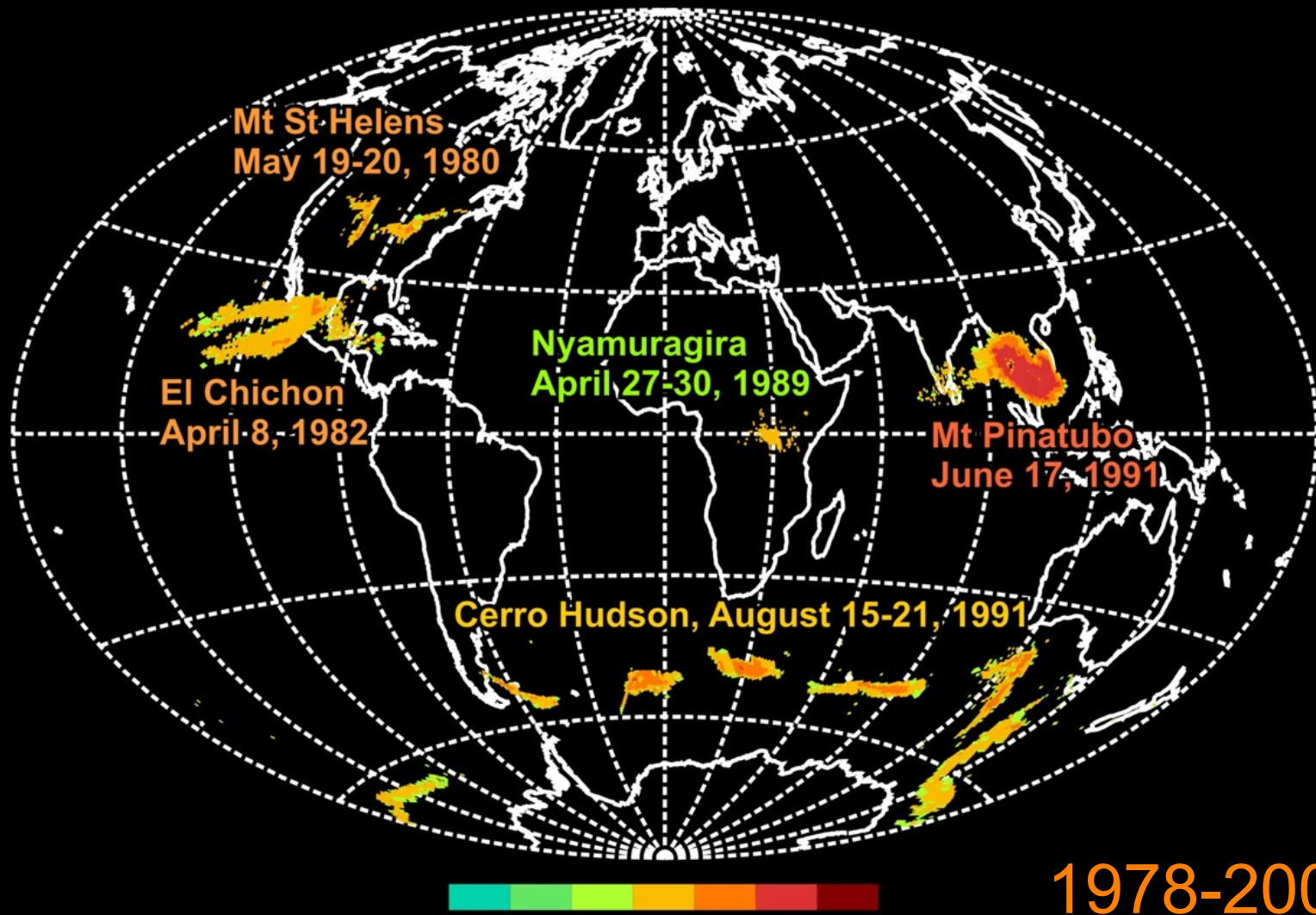
\$2.50

SCIENCE

AMERICAN ASSOCIATION FOR THE ADVANCEMENT OF SCIENCE



Volcanic SO₂ clouds measured by TOMS

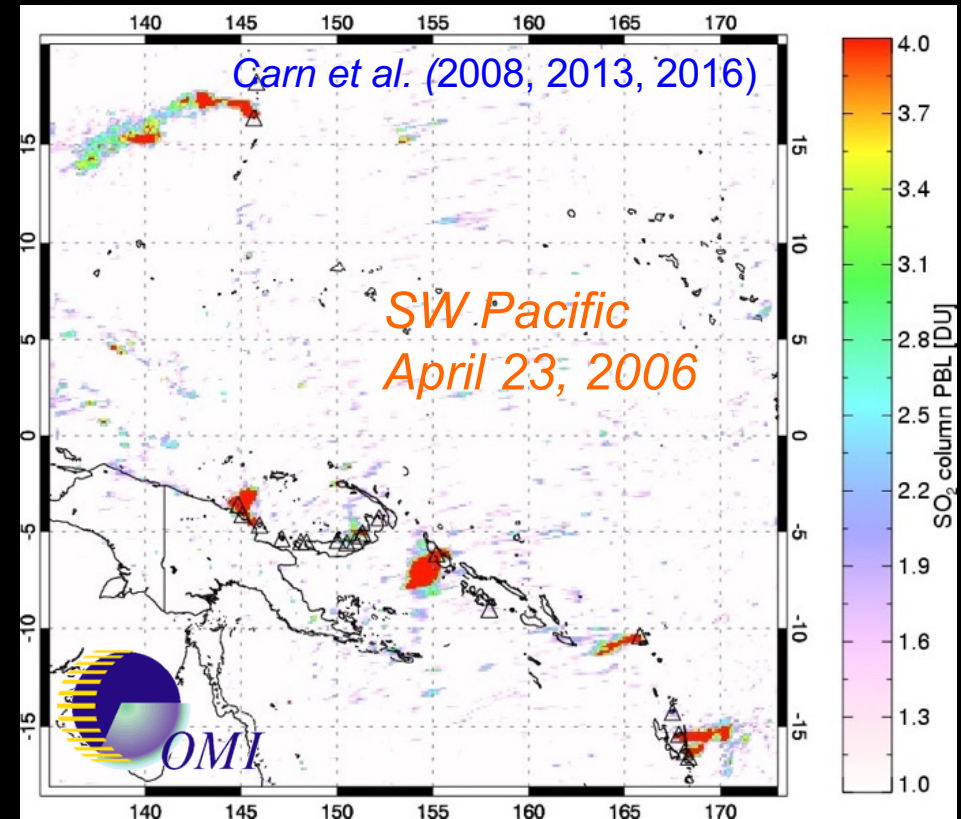
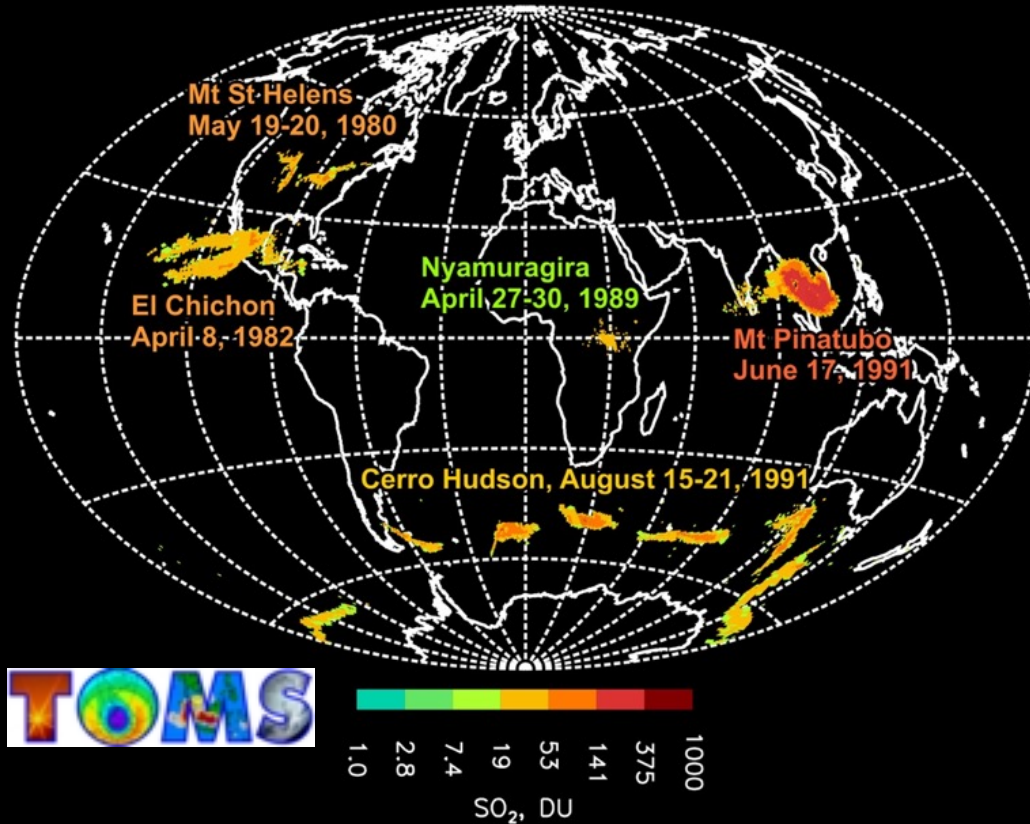


Total Ozone Mapping
Spectrometer



Krueger et al., 1995
Carn et al., 2003, 2016

UV satellite remote sensing of volcanic SO₂



1978-2005

Total Ozone Mapping
Spectrometer (TOMS)

1995-2003

Global Ozone Monitoring
Experiment (GOME)

2004-

Ozone Monitoring
Instrument (OMI)

2006-
GOME-2

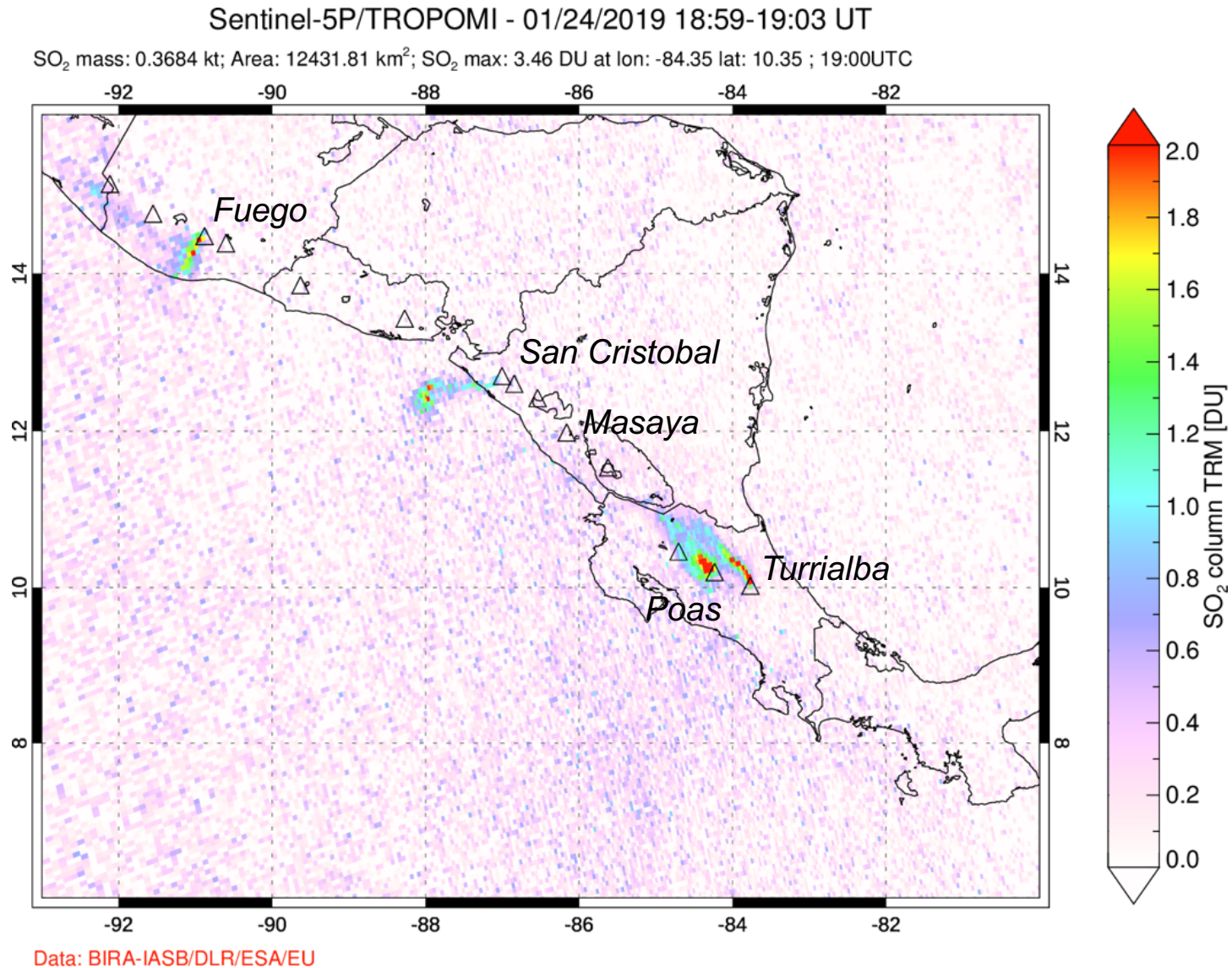


2012- & 2017-
Ozone Mapping and
Profiler Suite (OMPS)

2015-
DSCOVR/
EPIC

2018-
Sentinel 5P
TROPOMI

Present: monitoring daily passive degassing from space



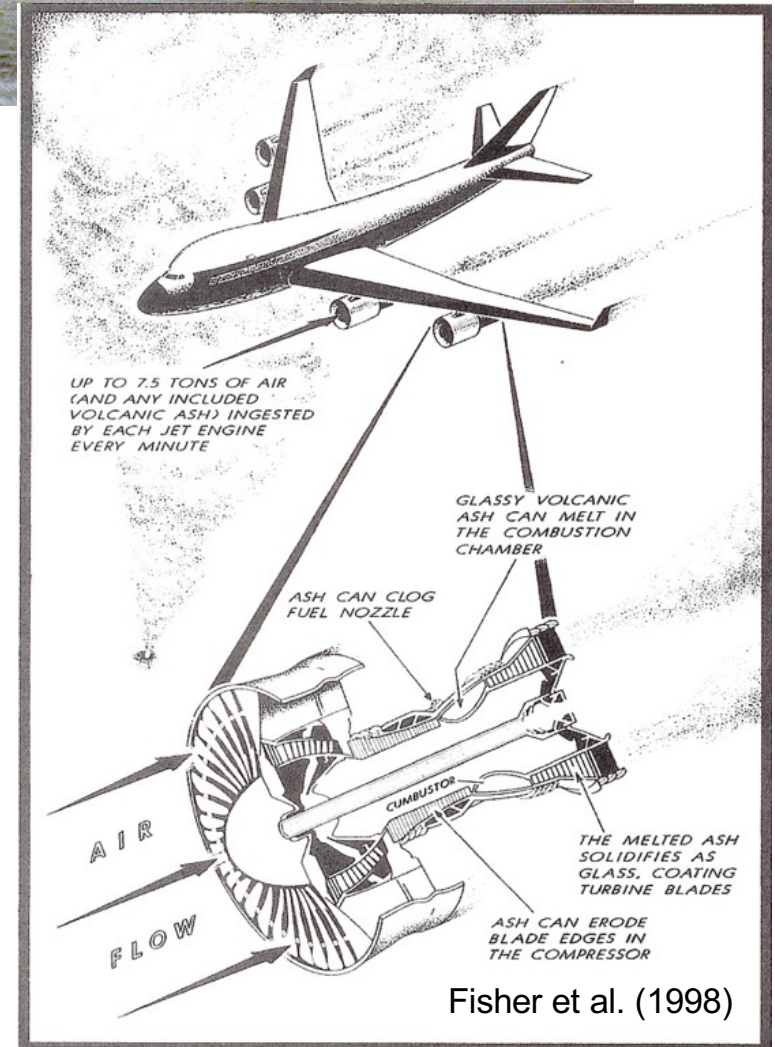
Before satellites, records of volcanic activity were largely collated from ground-based and proxy observations, and hence were incomplete. Remote sensing now provides a less 'biased' view of global (subaerial) volcanism.

Aviation hazards from volcanic eruption clouds

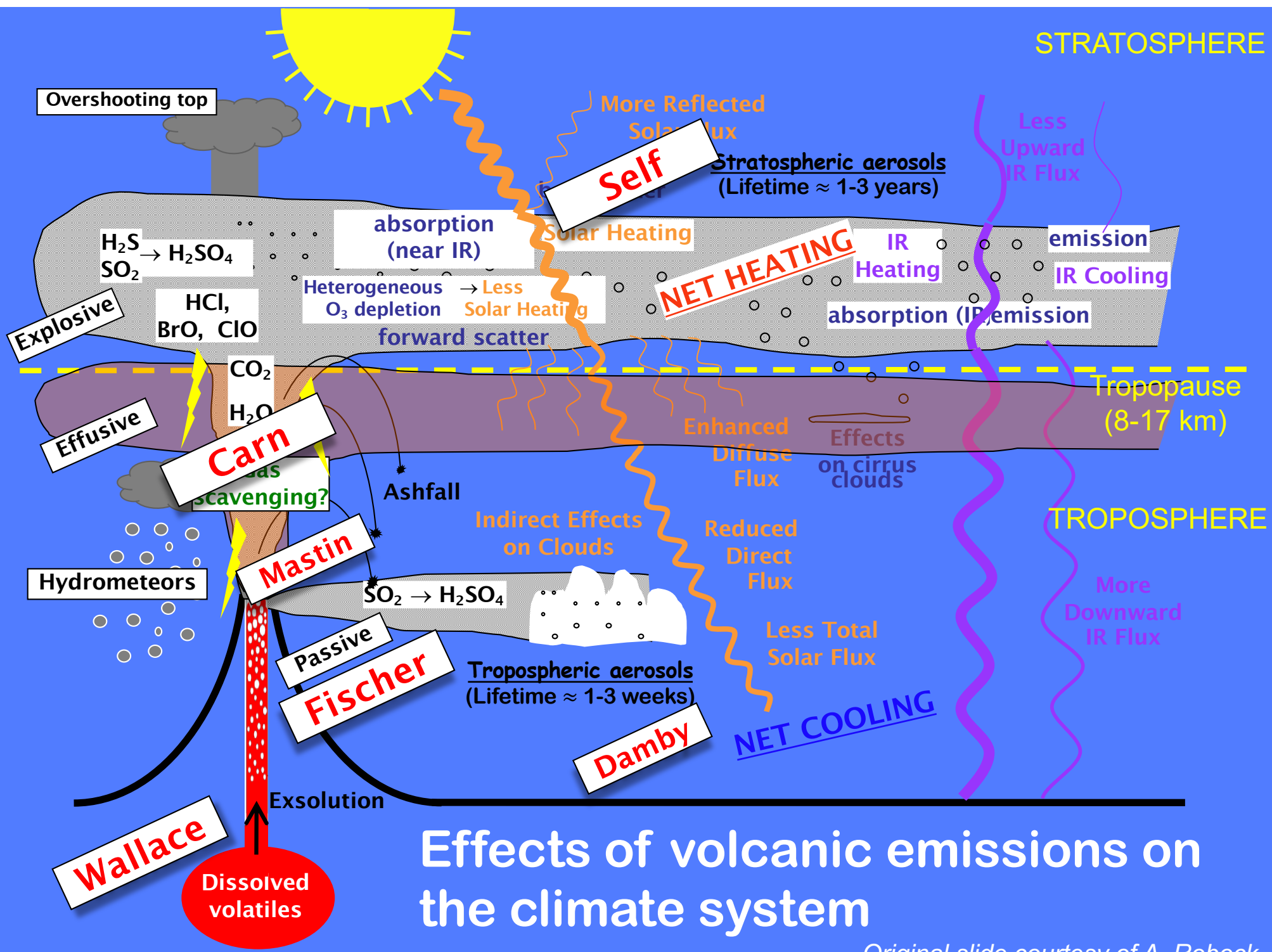
Eyjafjallajökull (Iceland) 2010



- Near-catastrophic aviation encounters with volcanic ash in 1982 (Galunggung, Indonesia) and 1989 (Redoubt, AK, USA)
- Hazards include jet engine failure or damage, windshield abrasion, disruption of avionics
- Mitigation:
 - Immediate detection of fresh volcanic clouds
 - Tracking/forecast of cloud position and altitude



Casadevall (1994a, 1994b); Prata and Tupper (2009)



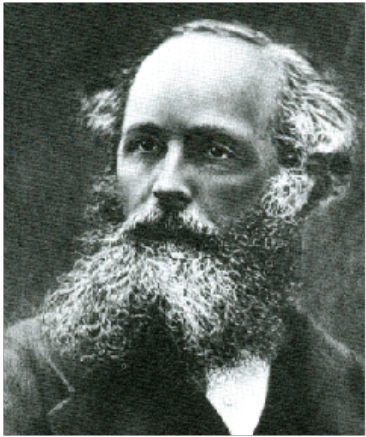
Original slide courtesy of A. Robock

Outline



- **Electromagnetic (EM) radiation**
 - What do remote sensing techniques detect?
- **Principles of satellite remote sensing**
 - Ultraviolet (UV) and Infrared (IR) measurements
 - Spatial and temporal resolution
- **Satellite remote sensing of volcanic eruptions**
 - What information can satellites provide during eruptions?
 - What gas species can be measured?
- **Synthesis of global eruptive SO₂ measurements**
 - Degassing and deformation
- **Passive volcanic degassing from space**
 - New global database of volcanic emissions

Maxwell's equations – what is light?



James Clerk Maxwell

E = electric field

B = magnetic field

$\nabla \bullet$ = Divergence

$\nabla \times$ = Curl

• ϵ_0 (electric permittivity of free space) = 8.854188×10^{-12} Farad m^{-1}

• μ_0 (magnetic permeability of free space) = 1.2566×10^{-6} T $m A^{-1}$

$$\nabla \bullet E = 0$$

Gauss's Law for Electricity

$$\nabla \bullet B = 0$$

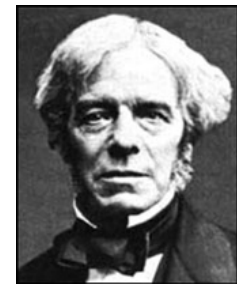
Gauss's Law for Magnetism

$$\nabla \times E = - \frac{\partial B}{\partial t}$$

Faraday's Law of Induction

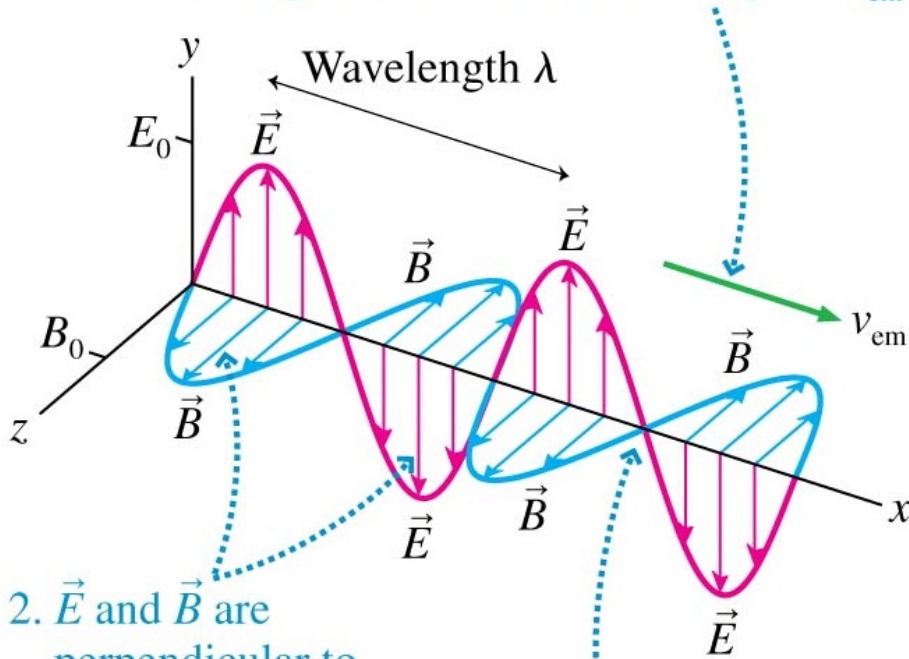
$$\nabla \times B = \epsilon_0 \mu_0 \frac{\partial E}{\partial t}$$

Ampere's Law



The speed of light

1. A sinusoidal wave with frequency f and wavelength λ travels with wave speed v_{em} .



2. \vec{E} and \vec{B} are perpendicular to each other and to the direction of travel. The fields have amplitudes E_0 and B_0 .

3. \vec{E} and \vec{B} are in phase. That is, they have matching crests, troughs, and zeros.

$$v = f\lambda$$

Solution to Maxwell's Equations:

$$\nabla^2 \vec{E} = \mu\epsilon \frac{\partial^2 \vec{E}}{\partial t^2}$$

Wave equation

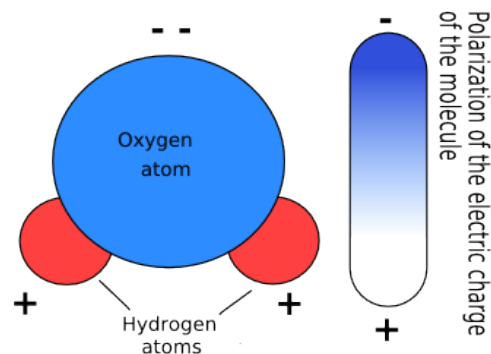
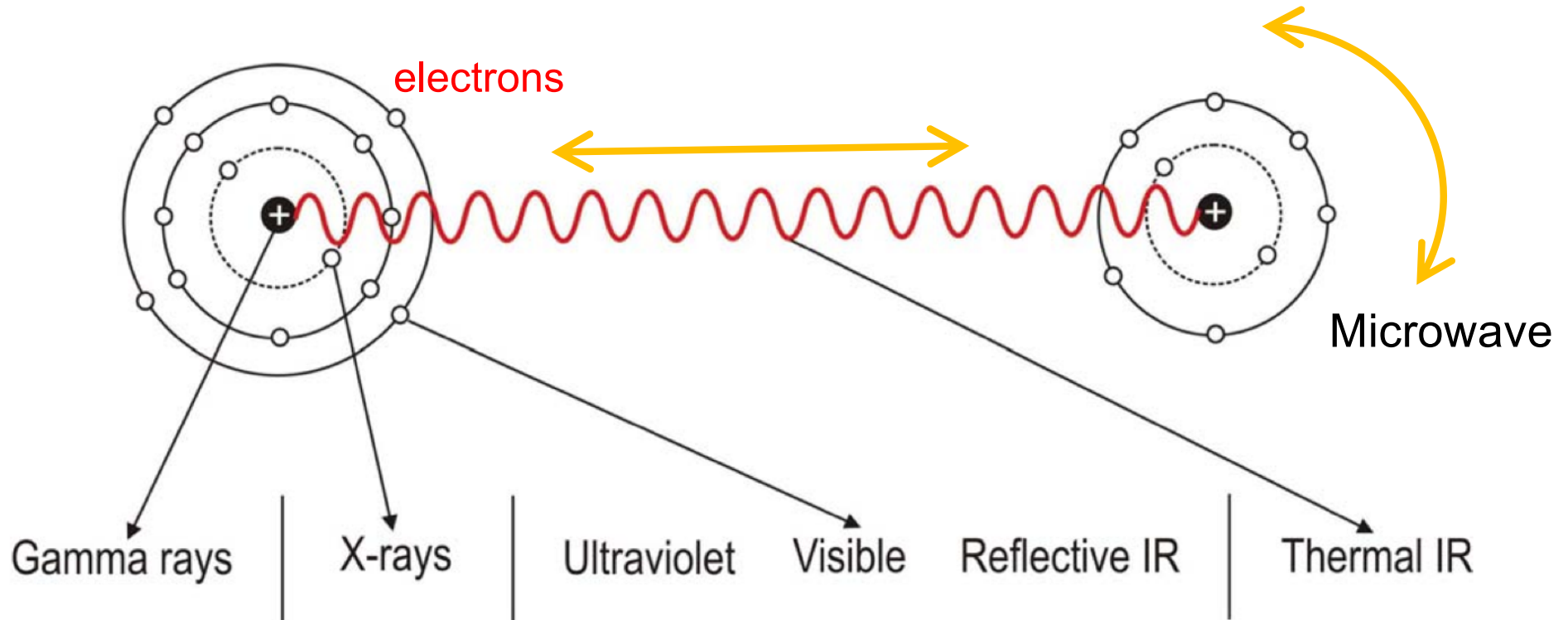
$$\nabla^2 u = \frac{1}{v^2} \frac{\partial^2 u}{\partial t^2}$$

So for EM waves, $v = \frac{1}{\sqrt{\mu\epsilon}}$

$$v = c = 2.998 \times 10^8 \text{ m s}^{-1}$$

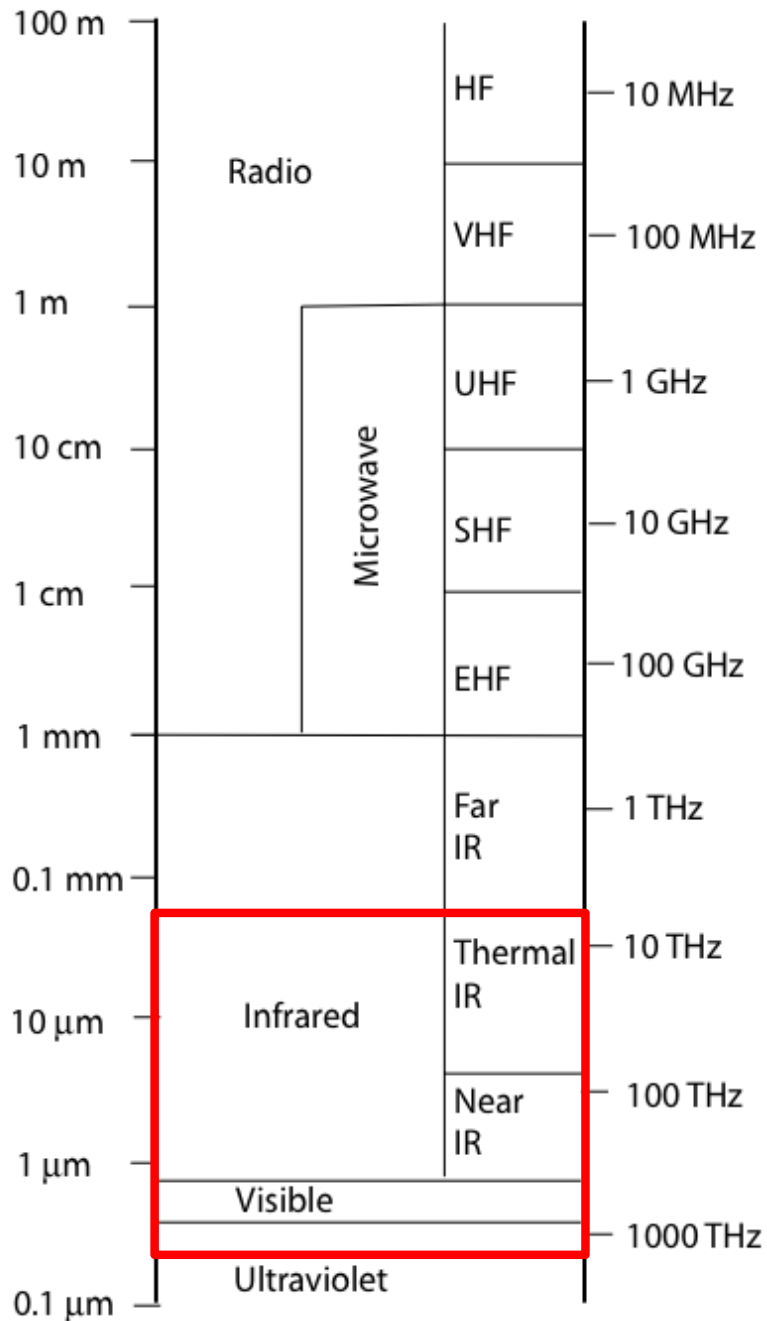
Electromagnetic wave generation

- There is no fundamental constraint on the frequency of electromagnetic (EM) radiation, provided an oscillator with the right natural frequency and/or an energy source with the minimum required energy is present



Water molecule (dipole)

The Electromagnetic Spectrum

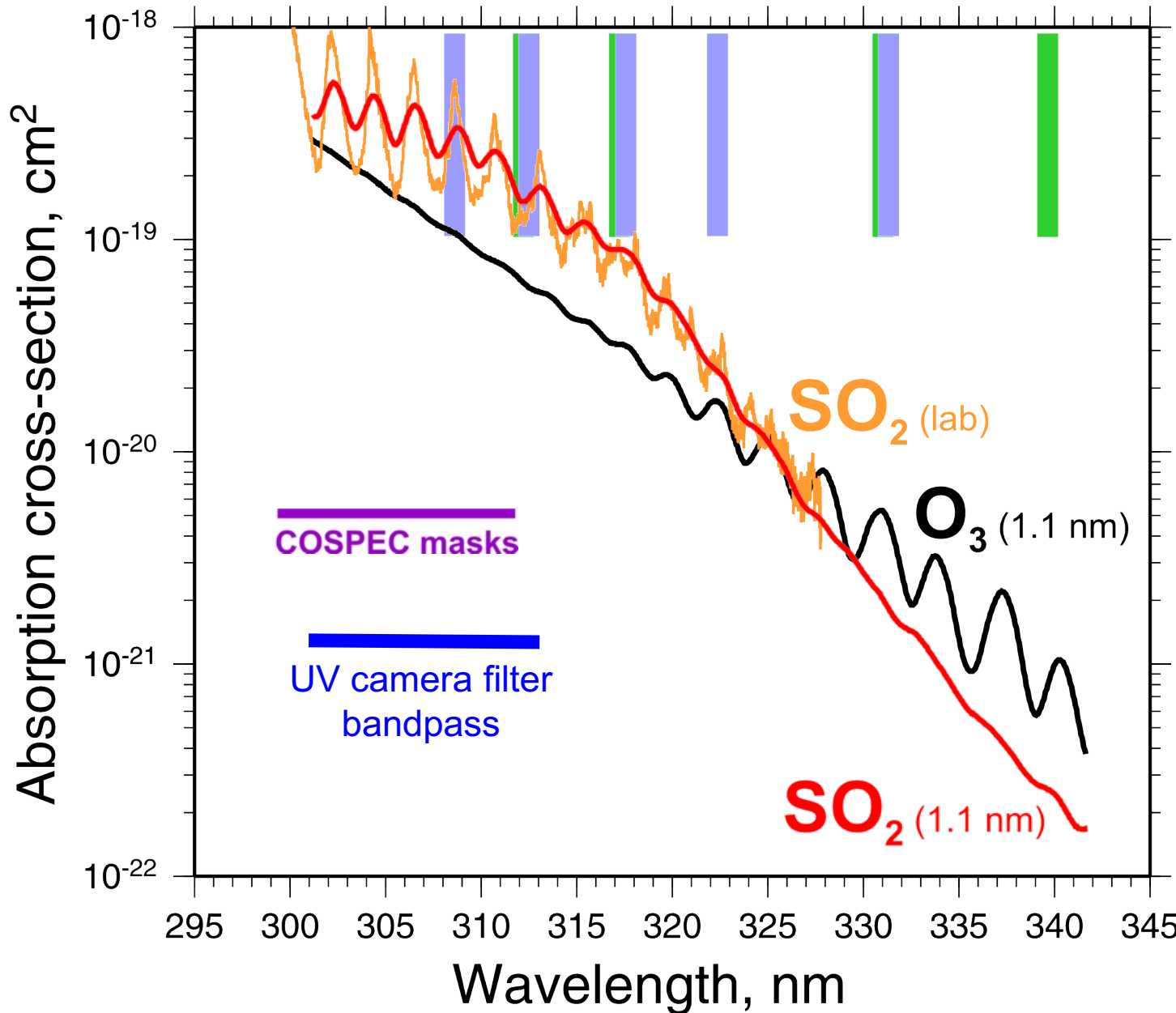


The EM spectrum is subdivided into a few discrete spectral bands.

EM radiation spans an enormous range of frequencies; the bands shown here are those most often used for remote sensing.

Boundaries between bands are arbitrary and have no physical significance, except for the *visible band*.

Absorption of UV radiation by atmospheric gases



Earth Probe TOMS
1996-

Nimbus-7 TOMS
1978-93

- UV radiation absorbed by electronic transitions in SO₂ and O₃

Multi-spectral
Discrete bands

Hyperspectral
Full spectrum

- Spectral resolution affects sensitivity

Absorption of IR radiation by atmospheric gases

Fundamental or normal modes

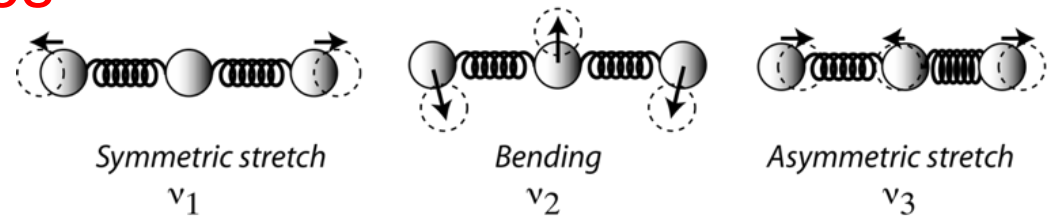
- ν_1 Symmetric stretch
- ν_2 Bend (Scissoring)
- ν_3 Asymmetric stretch

A normal mode is IR-active if the dipole moment changes during mode motion.

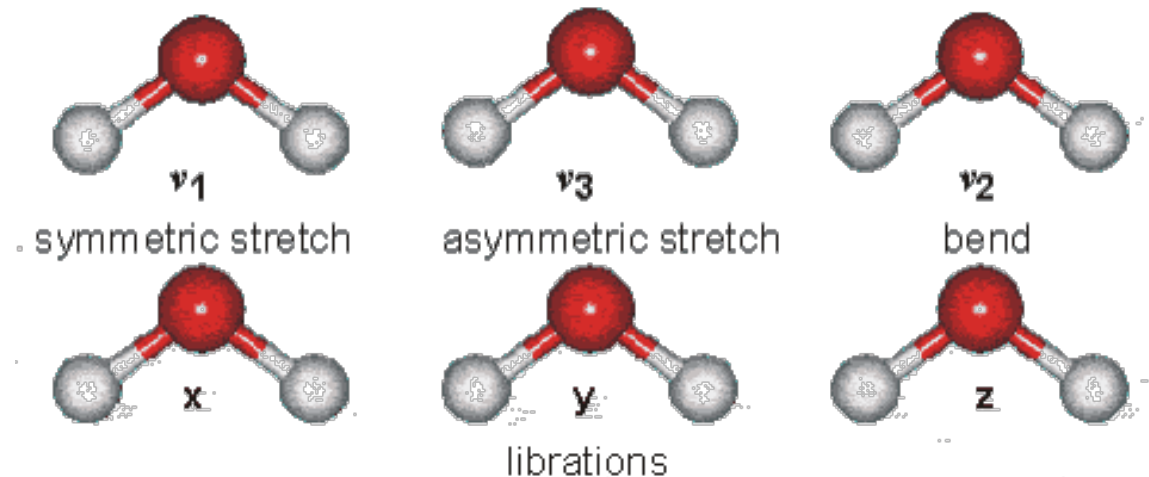
Overtones, combinations and differences of fundamental vibrations are also possible (e.g., $2\nu_1$, $\nu_1+\nu_3$ etc.)

SO₂
'Accessible bands'

Linear triatomic (CO₂, N₂O)



Non-linear triatomic (O₃, SO₂, H₂O)



ν_1 : 1151 cm⁻¹, 8.6 μm

ν_3 : 1361 cm⁻¹, 7.3 μm – high altitude SO₂

$\nu_1+\nu_3$: 2500 cm⁻¹, 4 μm

Volcano remote sensing – spectral bands

Daytime only

Daytime or nighttime

UV

Vis

Near-Infrared (NIR)

Thermal Infrared (TIR)

Volcanic gases:
SO₂, BrO, OCIO

Volcanic gases: SO₂, H₂S, CO₂, CO

SO₂

0.3-0.35 μm

CO₂

4 μm

7.3 8.6 μm

SO₂, HCl

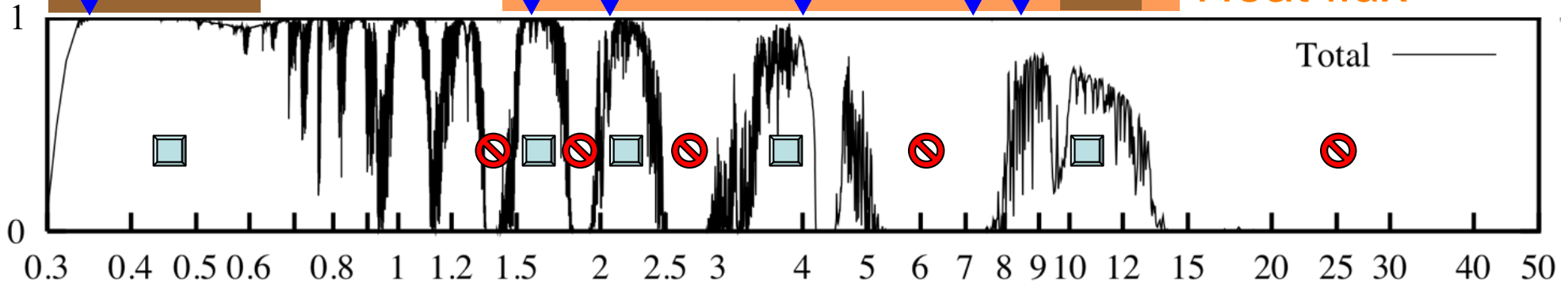
Microwave
~1 mm

Ash

Ash

Heat flux

Transmittance

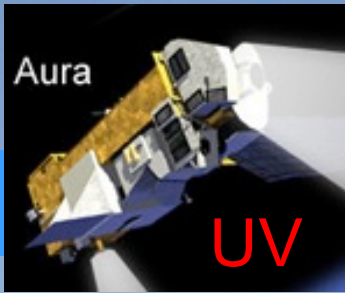


Solar

Wavelength [μm]

Terrestrial

UV and IR satellite remote sensing



$T = 6000 \text{ K}$

Ozone absorption

Scattering (air)

Cloud reflectance

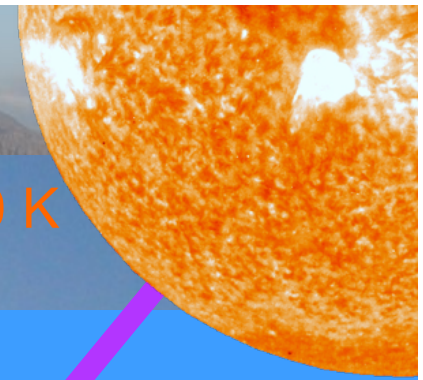
$T < 300 \text{ K}$

Thermal IR (TIR)

$T = \sim 300 \text{ K}$

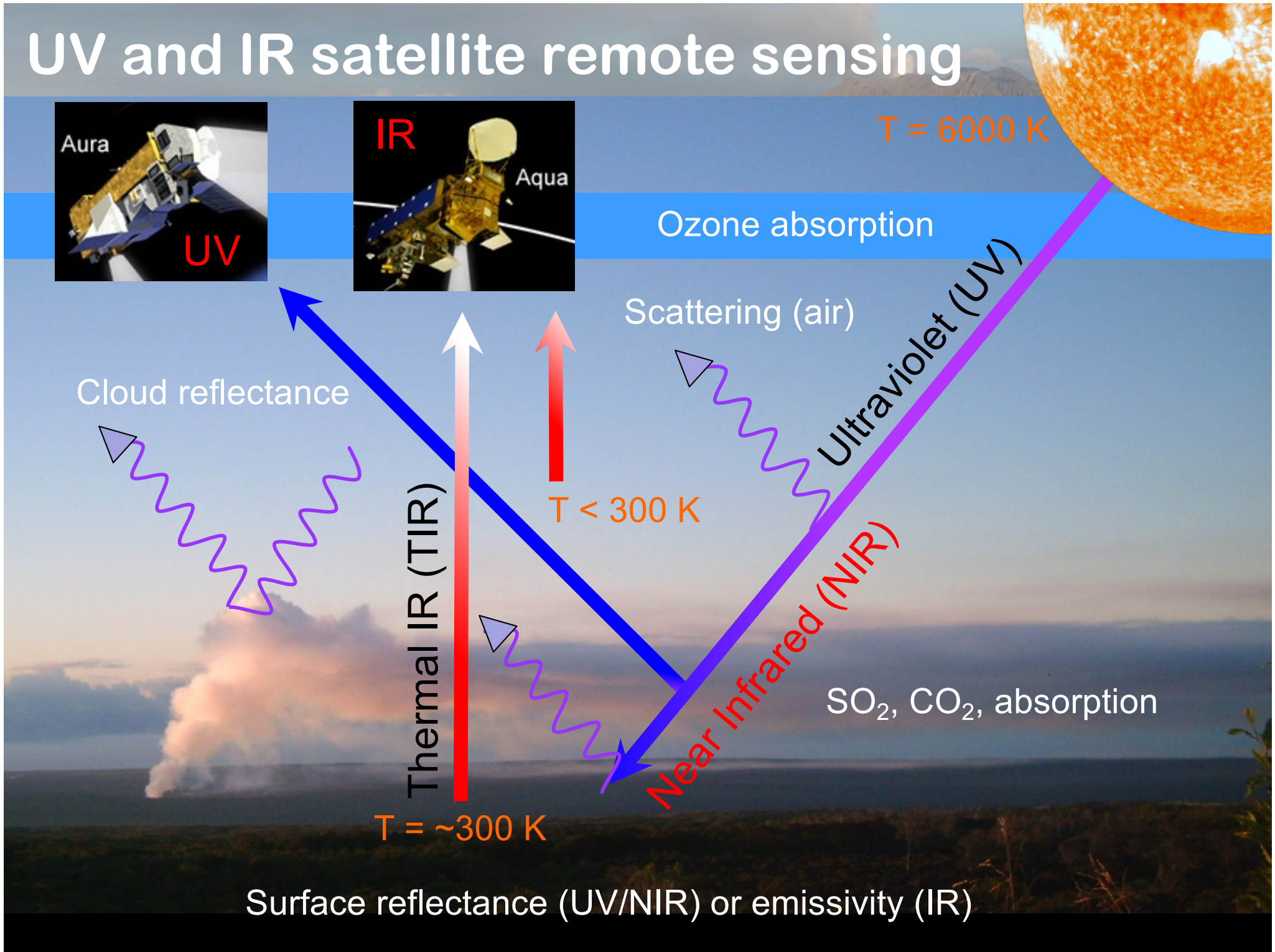
SO_2, CO_2 , absorption

Surface reflectance (UV/NIR) or emissivity (IR)



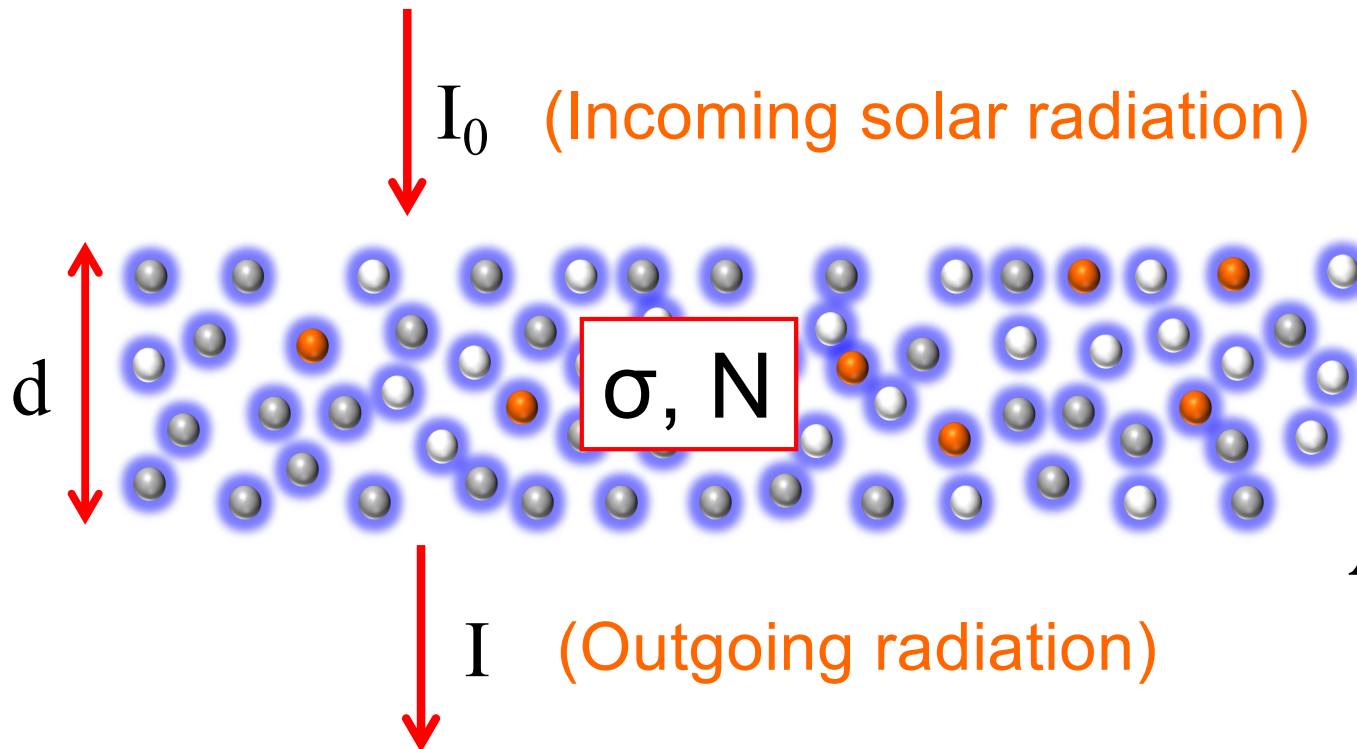
Ultraviolet (UV)

Near Infrared (NIR)



Beer-Bouguer-Lambert (Beer's) Law

For a gaseous absorber, absorbance (A) is equal to the product of an **absorption cross-section** (σ , cm²), the **number density of absorbers** (N, molecules cm⁻³) and the **path length** (d):



$$t = \frac{I}{I_0} = e^{-\sigma Nd}$$

Transmittance

$$A = -\ln \frac{I}{I_0} = \sigma Nd$$

Absorbance

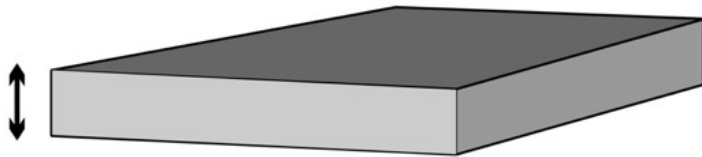
- Absorption is dependent on gas temperature/pressure, hence **volcanic SO₂ retrievals must use an a-priori plume vertical profile**
- Lower troposphere (~3 km; TRL), mid-troposphere (~8 km; TRM) and upper troposphere to lower stratosphere (~17 km; STL) typically used

Satellite measurements of trace gases

Atmospheric column



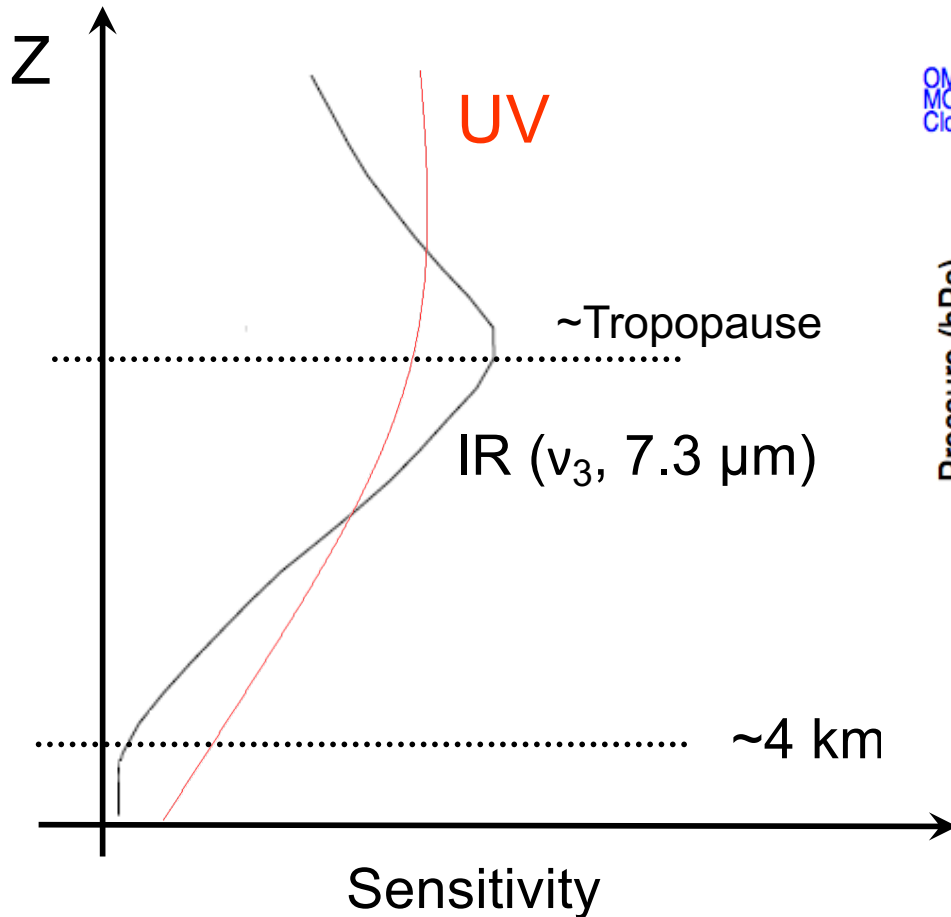
STP = 0°C, 1 atm pressure



1 Dobson Unit (DU) = 1 Milli Atm cm
1 DU = 0.01 mm thickness at STP
e.g. 800 DU = 8 mm thick layer
1 DU = 10 ppmm at STP

- **Satellites measure the 'column amount' or 'total column' of a gas**
 - US units: Dobson Unit (DU)
 - $1 \text{ DU} = 2.69 \times 10^{16} \text{ molecules cm}^{-2} = 0.0285 \text{ g m}^{-2} \text{ SO}_2$
 - Averaged over satellite footprint (km^2)
- **Typical SO_2 columns in volcanic clouds**
 - Fresh eruption cloud: 100s – 1000+ DU
 - Passive degassing: <20 DU
 - Measured column depends on spatial resolution of sensor
 - Can be converted to mass or concentration (if cloud thickness is known)
- **Sensitivity decreases towards surface**
 - Snow cover can enhance sensitivity (in the UV)

Relative sensitivity of UV and IR measurements



Courtesy of L. Clarisse, ULB

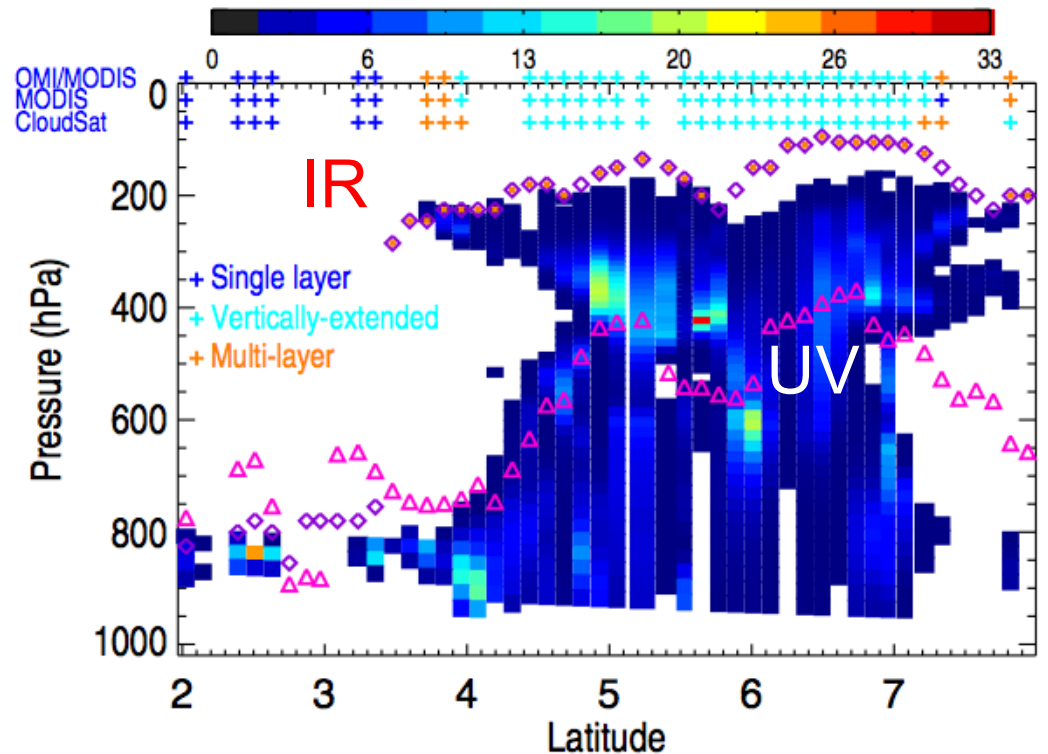


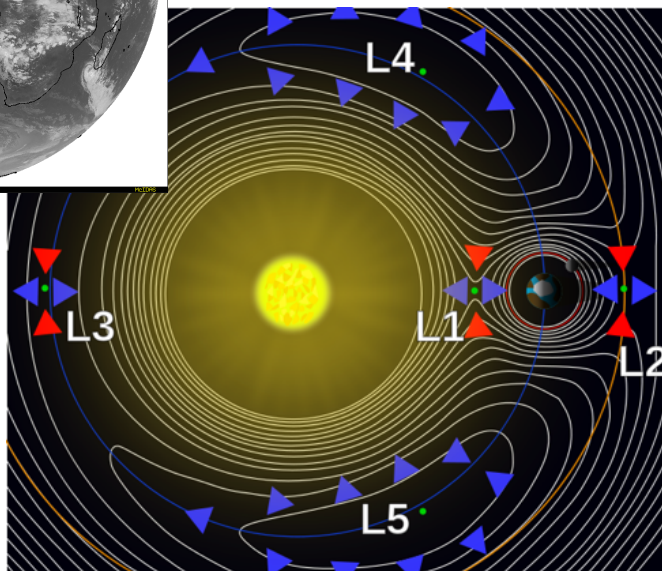
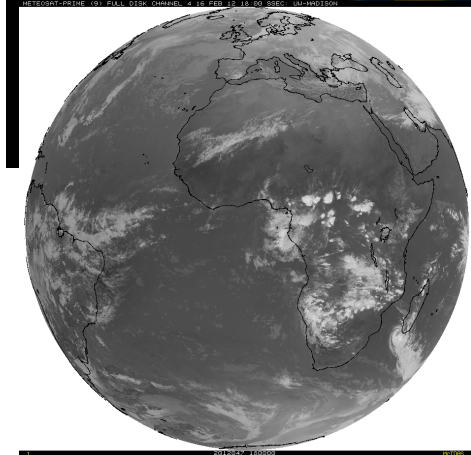
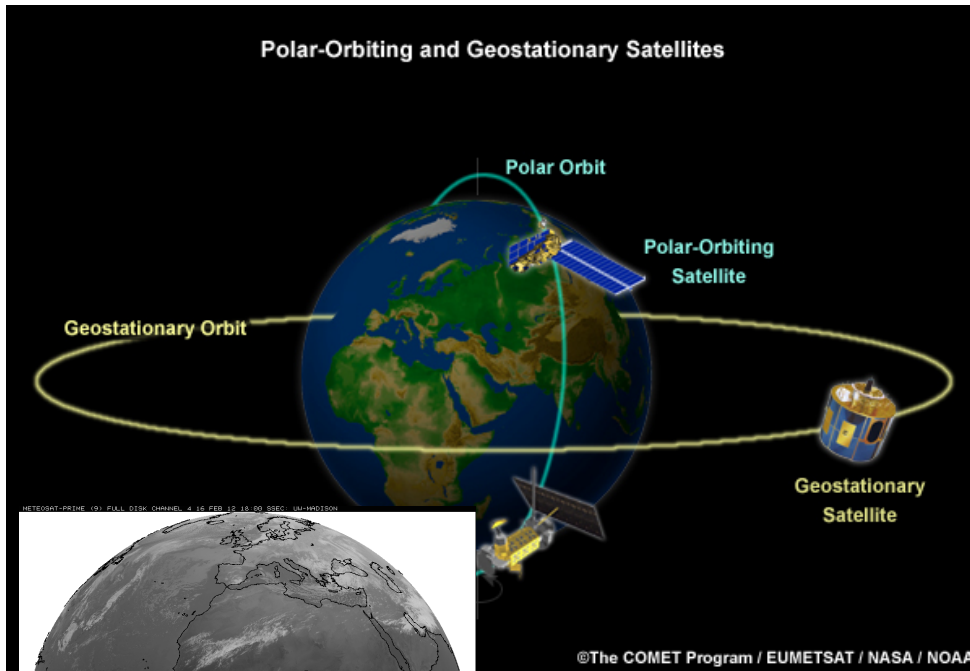
Fig. 7. CloudSat 2B-Tau cross section of cloud extinction (km^{-1}) along OMI orbit 12 402 (western track in tropical Pacific highlighted in Fig. 6); Averaged along-track over OMI pixel (~ 13 km); Pink triangles: OMI optical centroid cloud pressure; Purple diamonds: MODIS minimum cloud-top pressure within closest passive sensor footprint, orange-filled where MODIS maximum multi-layer flag > 2 .

Joiner et al. (2009)

• IR cloud top \neq UV cloud pressure

- SO_2 altitude can be directly retrieved in some cases (UV and IR)
- Satellite sensitivity increases with altitude in the troposphere
- UV measurements more sensitive to passive degassing (low altitude)

Satellite orbits and temporal resolution



- **Geostationary (GEO)**
 - ~36,000 km altitude
 - Continuous view of one hemisphere
 - High temporal resolution (~1-15 min)
 - Low spatial resolution (~3 km+)
 - Poor high-latitude coverage (>55°)
- **Polar-orbiting (LEO)**
 - ~700-800 km altitude
 - 14-15 orbits per day
 - Low temporal resolution (hours-days)
 - Higher spatial resolution (m, km)
 - Coverage of polar regions
- **L₁ Lagrange point**
 - ~1.5 million km from Earth
 - Continuous view of sunlit Earth disk

Aura (2004-)

OMI - SO₂, NO₂, BrO

TES - SO₂

MLS - strat. SO₂, HCl

CloudSat (2006-)

CPR (radar) –
precipitation,
hydrometeors

Aqua (2002-)

MODIS - SO₂, ash, sulfate

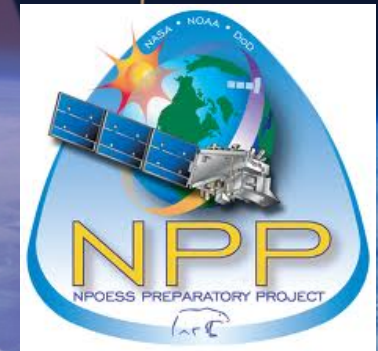
AIRS - UTLS SO₂, ash

Volcanic CO₂?

CALIPSO (2006-)

CALIOP (LiDAR) - cloud altitude, aerosol phase

The A-Train



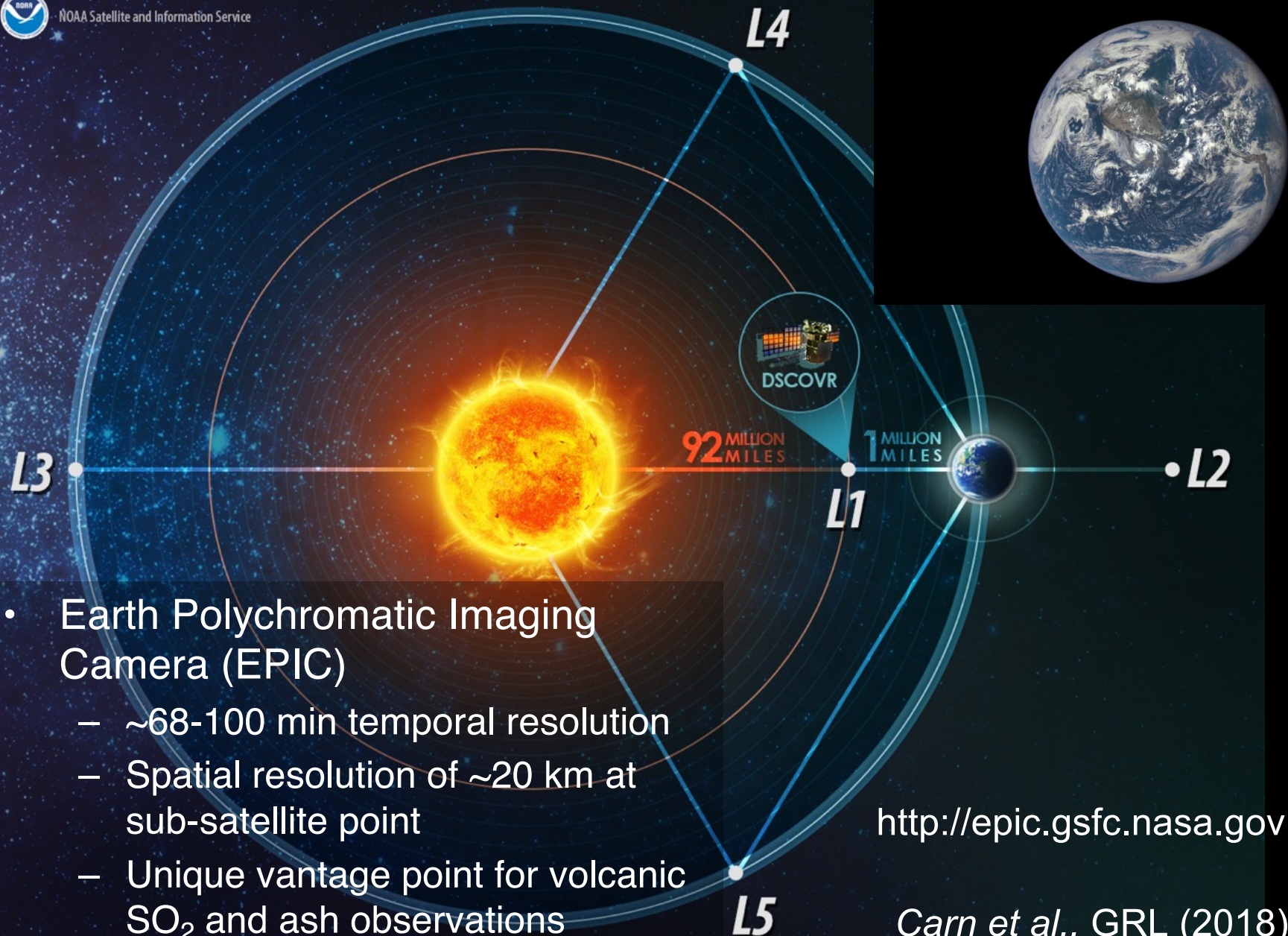
OMPS, VIIRS, CrIS -
SO₂, ash



Deep Space Climate Observatory (DSCOVR) at L₁



NOAA Satellite and Information Service

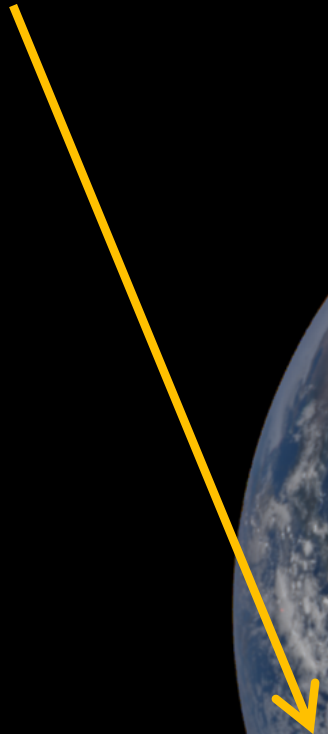


- Earth Polychromatic Imaging Camera (EPIC)
 - ~68-100 min temporal resolution
 - Spatial resolution of ~20 km at sub-satellite point
 - Unique vantage point for volcanic SO₂ and ash observations

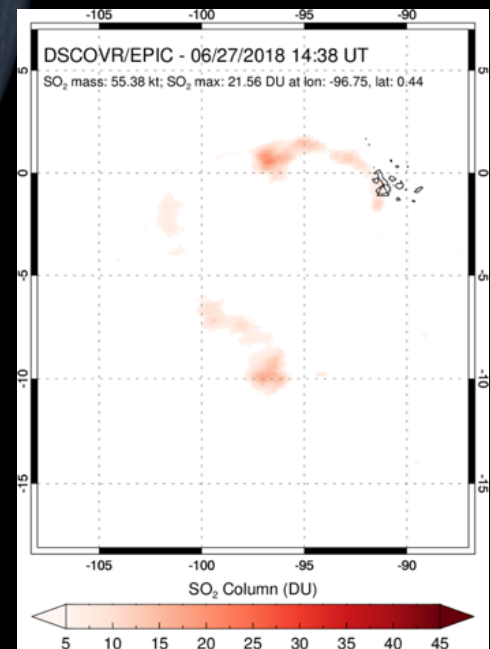
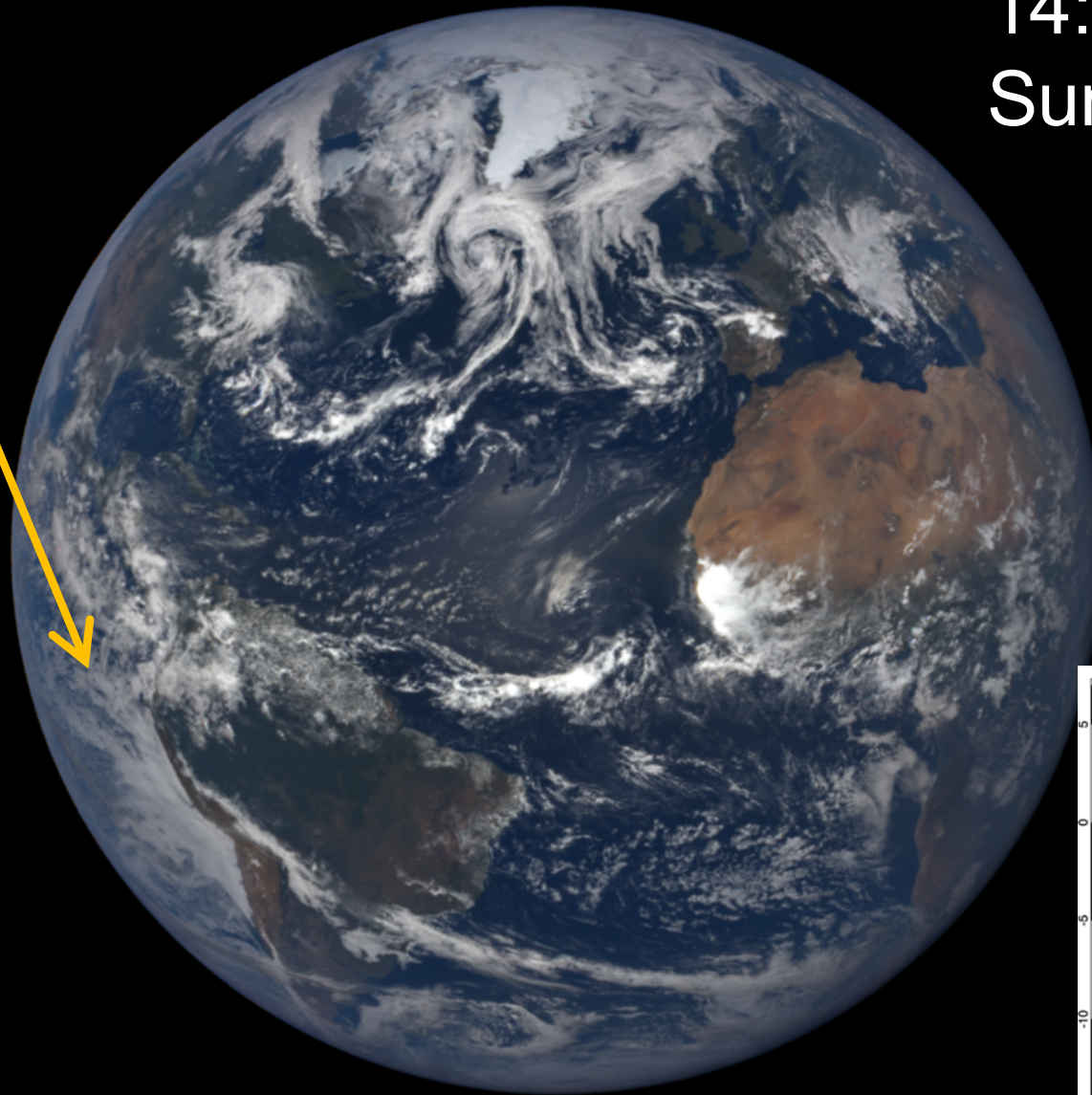
<http://epic.gsfc.nasa.gov>

Carn et al., GRL (2018)

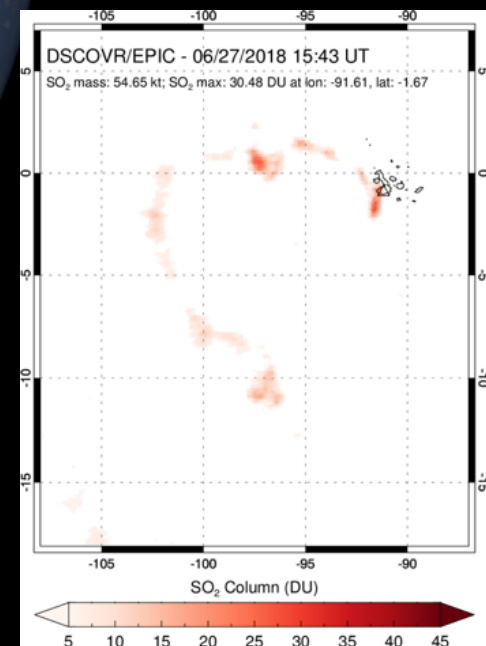
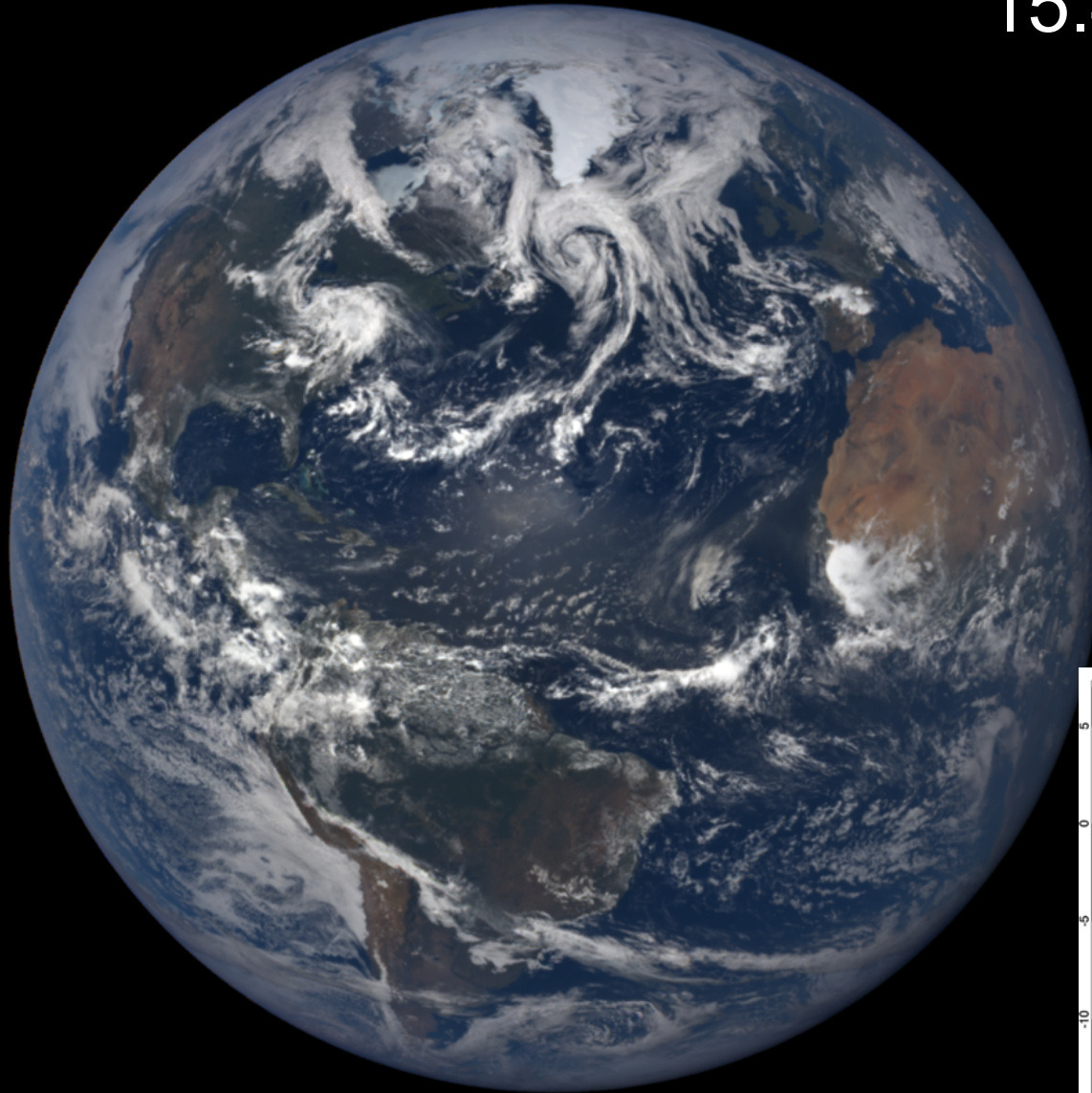
Sierra Negra



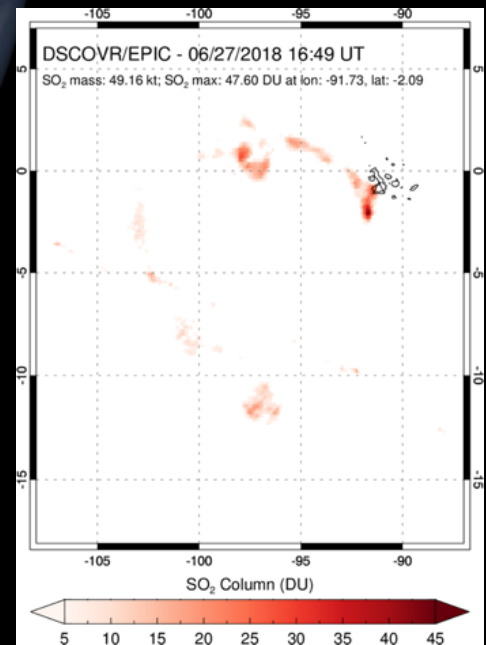
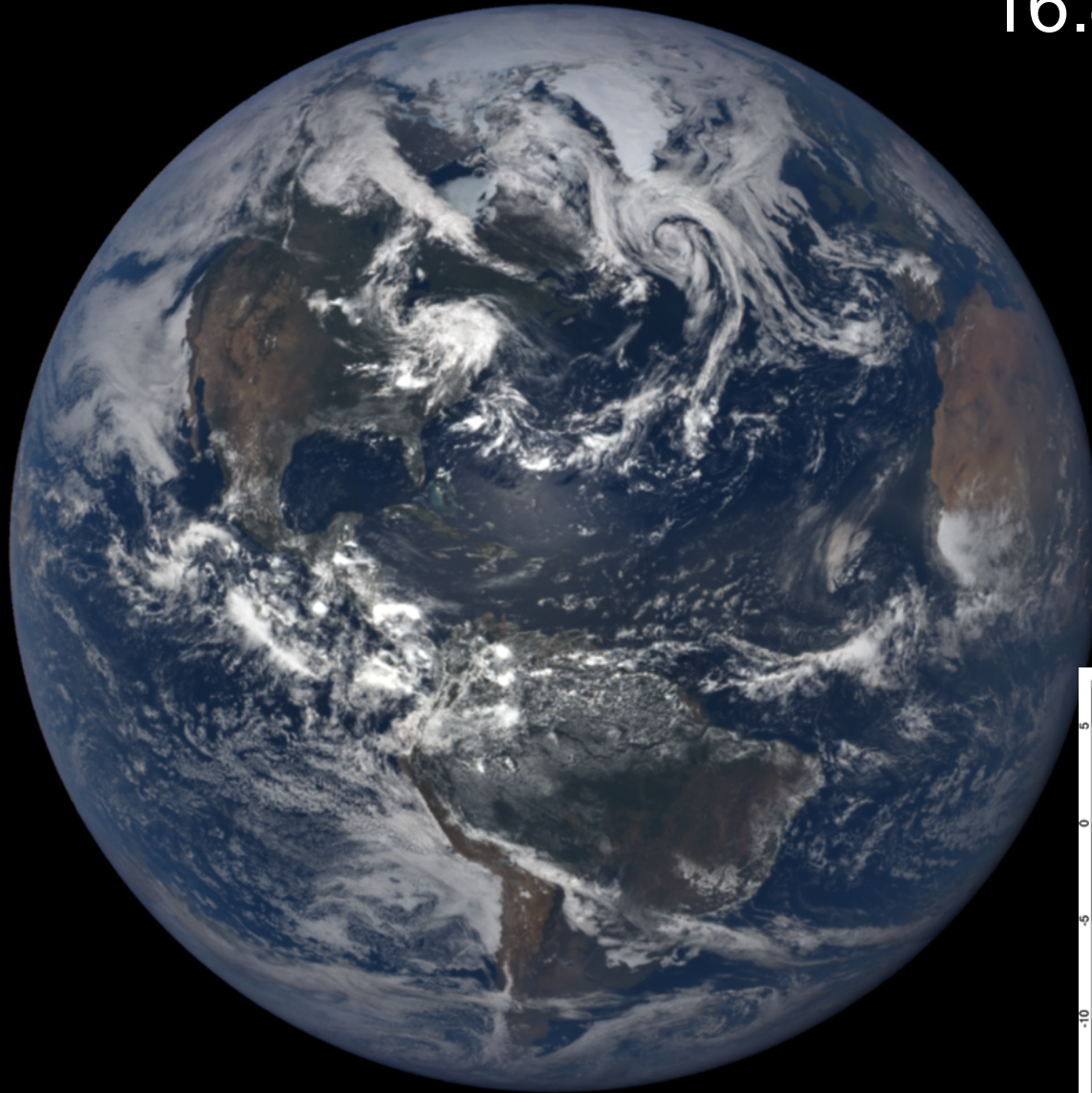
Jun 26, 2018
14:38 UT
Sunrise



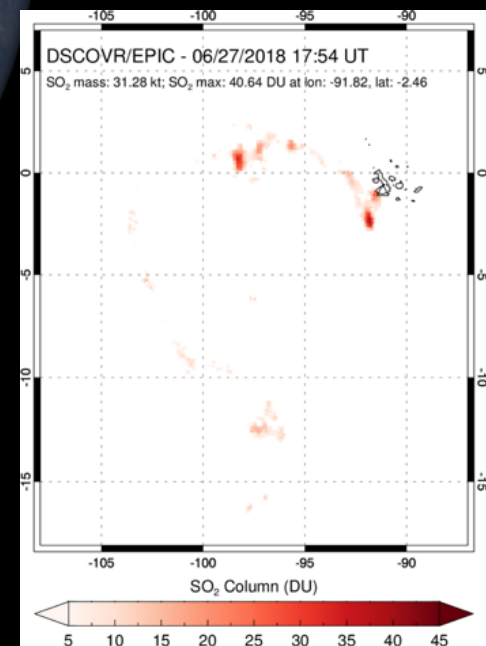
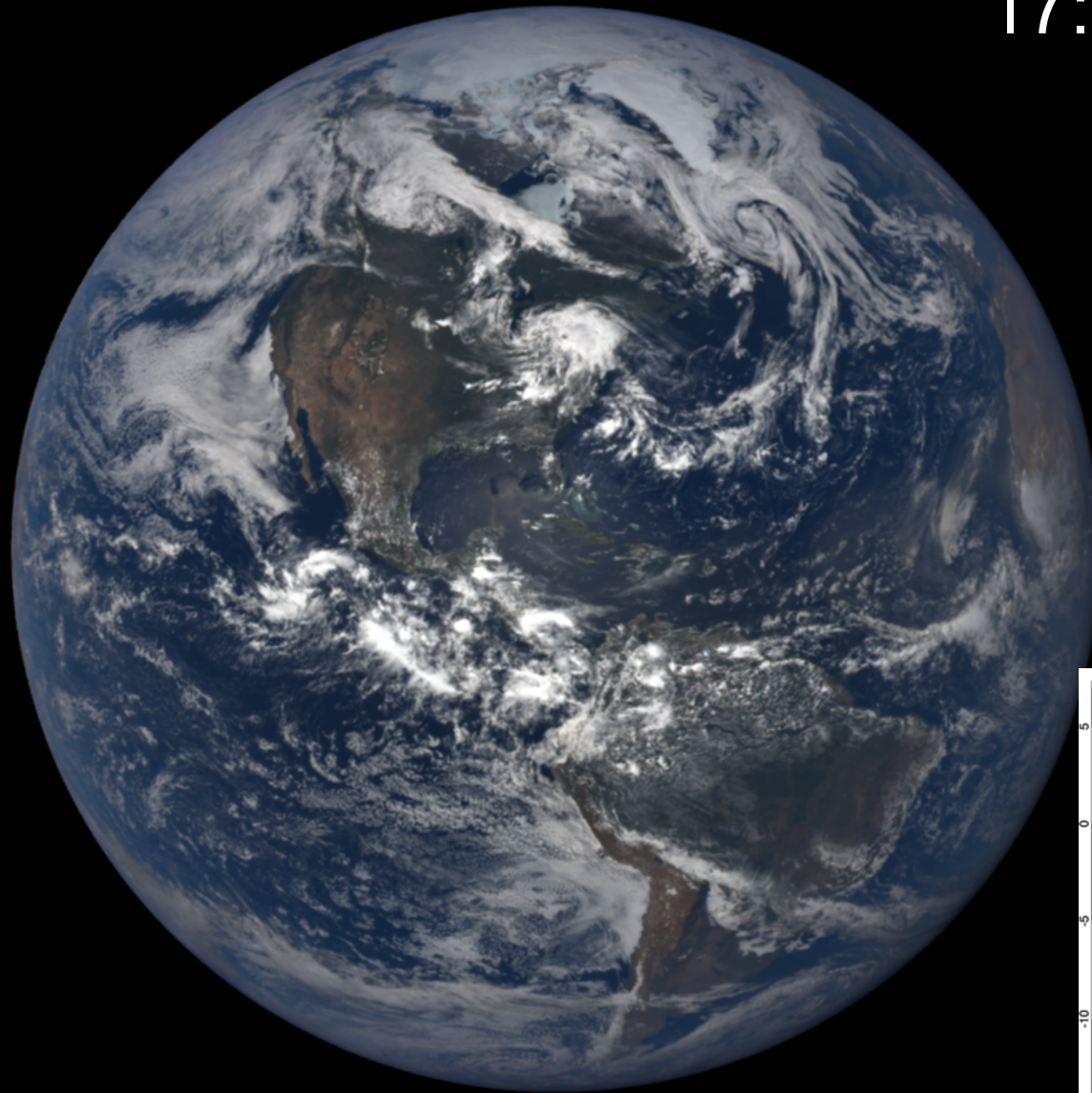
Jun 26, 2018
15:43 UT



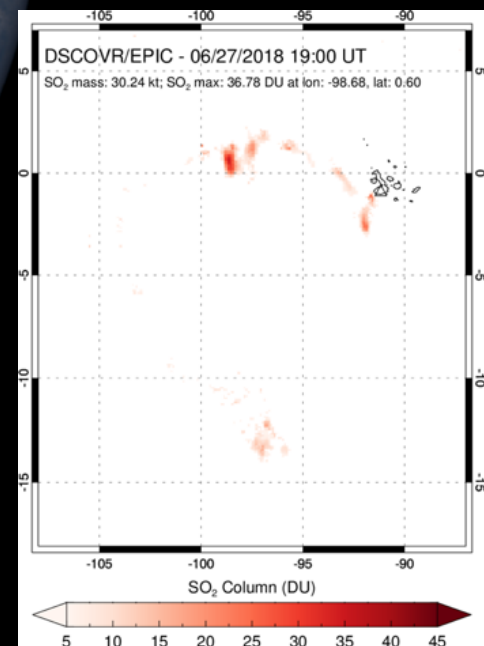
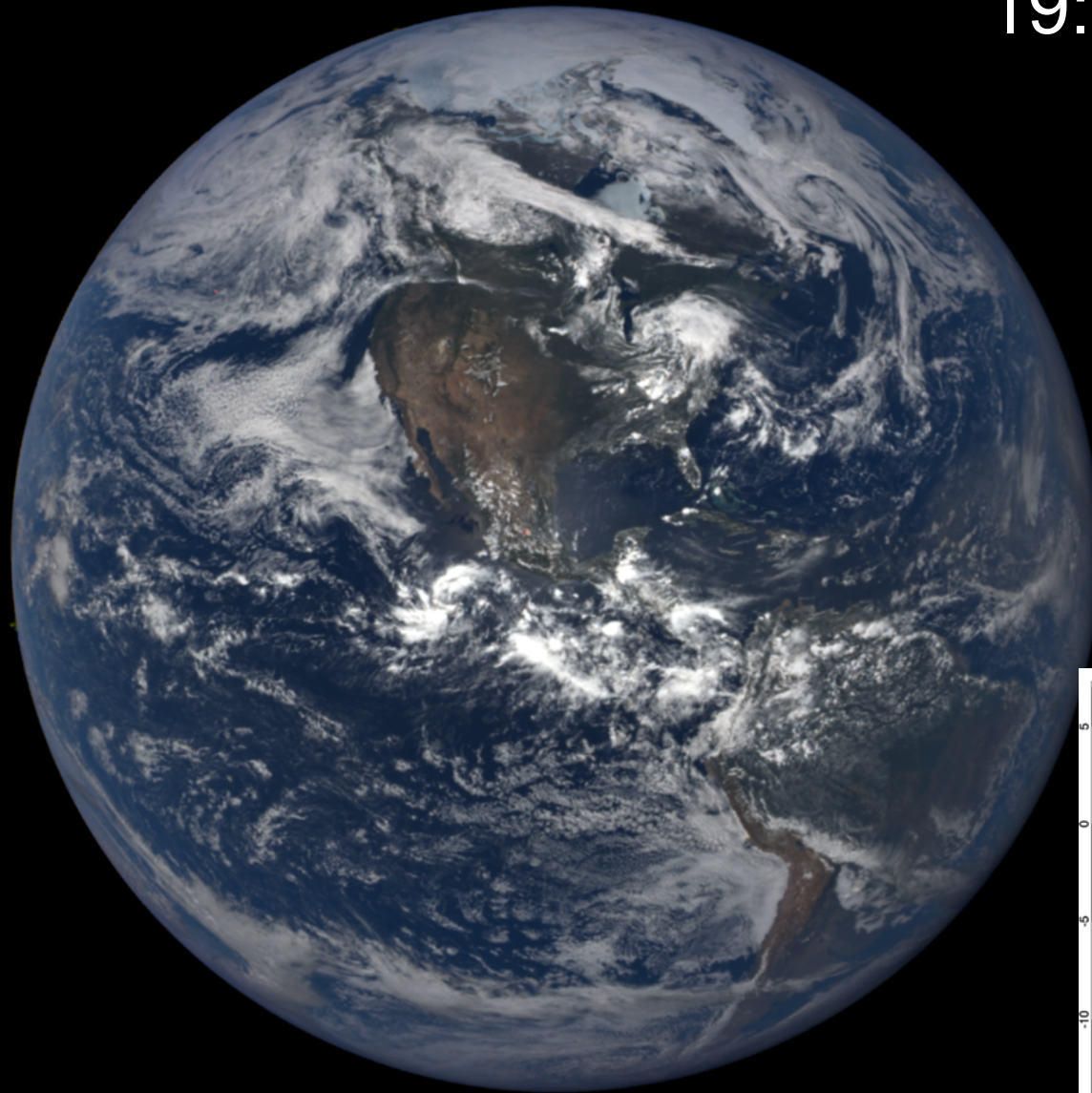
Jun 26, 2018
16:49 UT



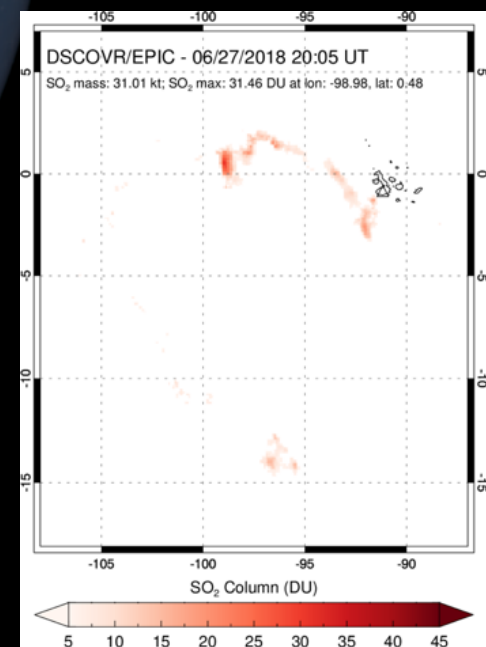
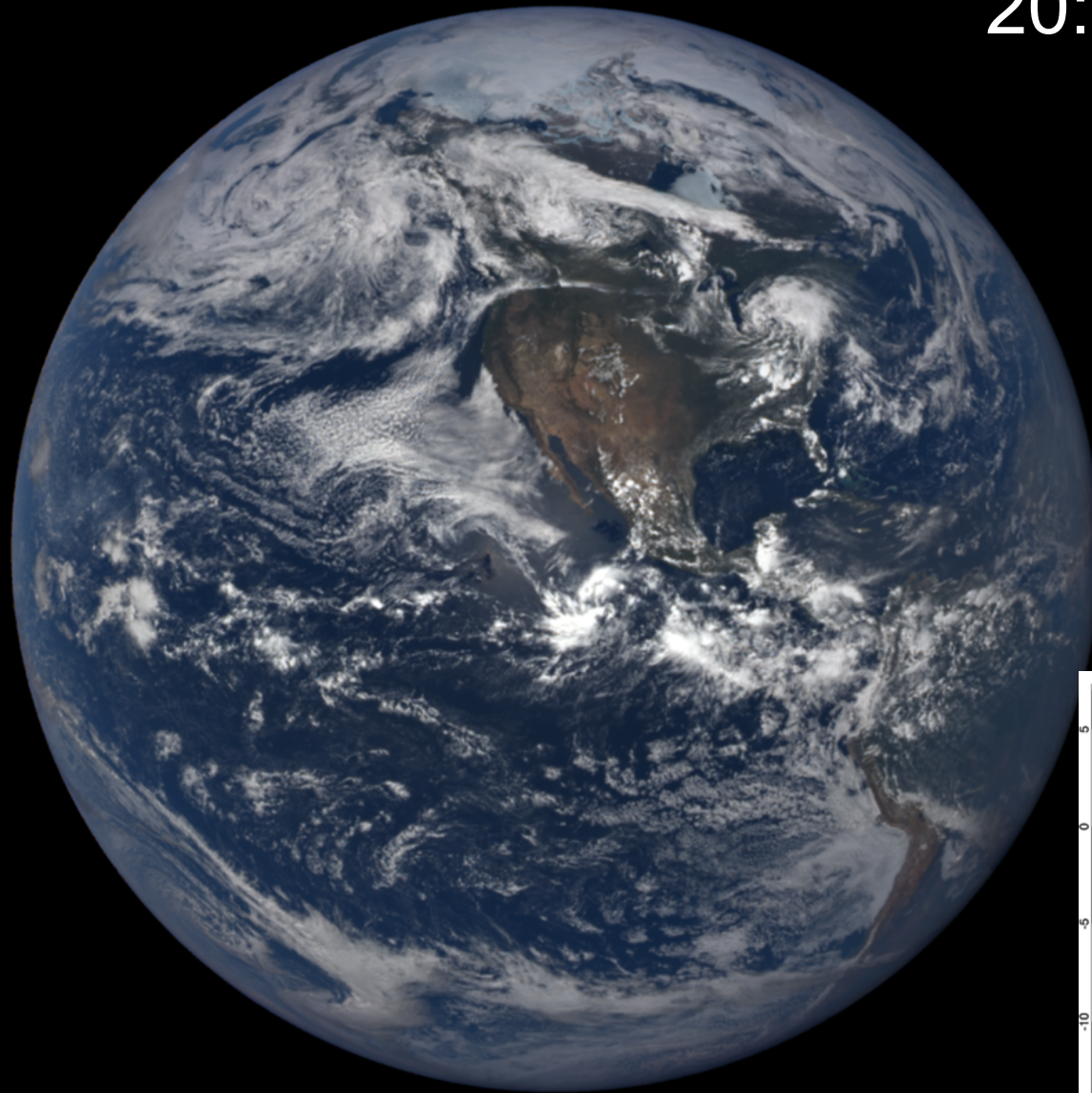
Jun 26, 2018
17:54 UT



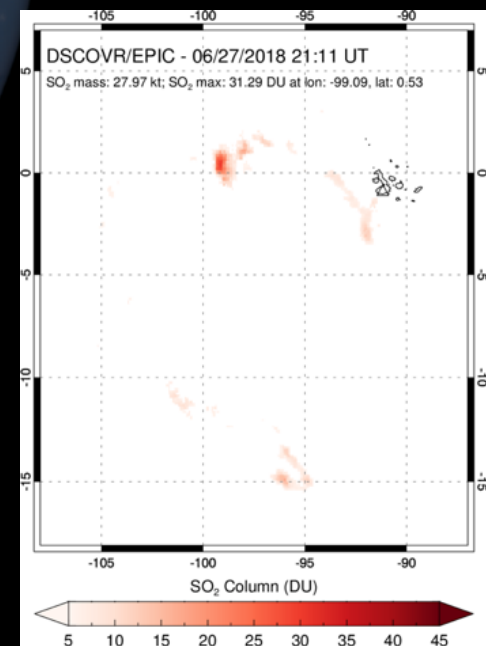
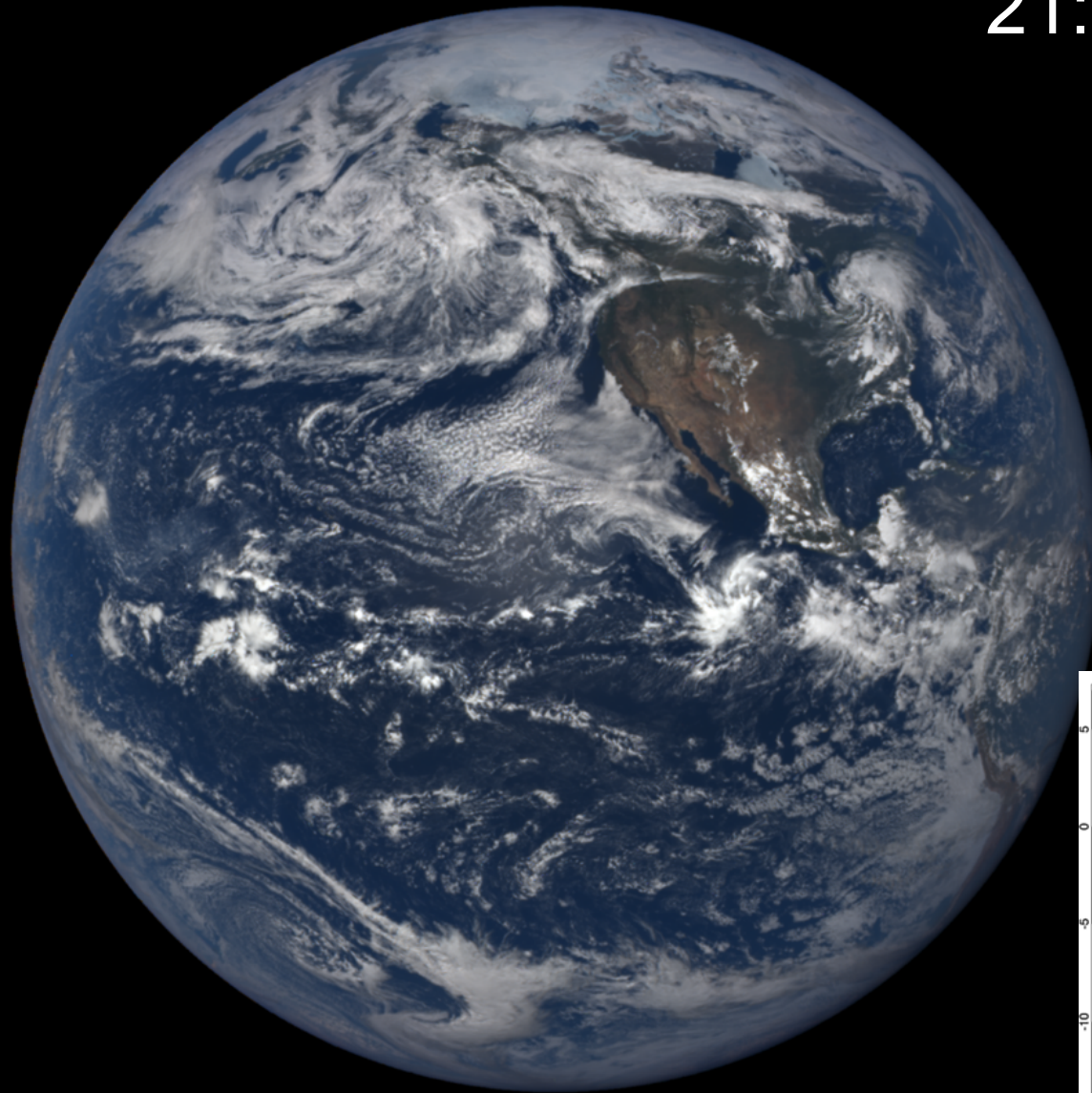
Jun 26, 2018
19:00 UT



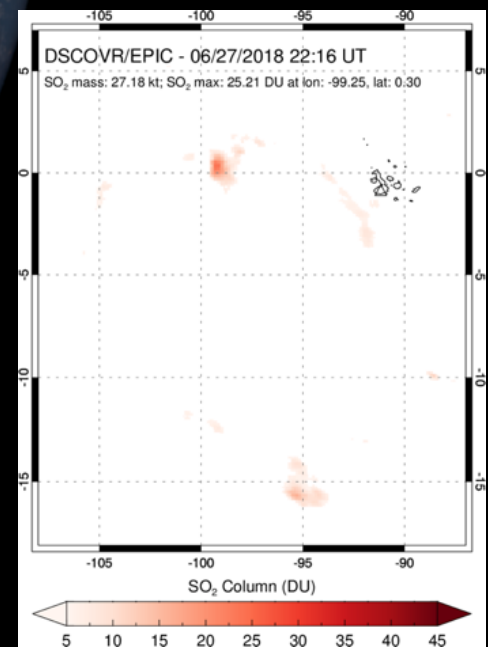
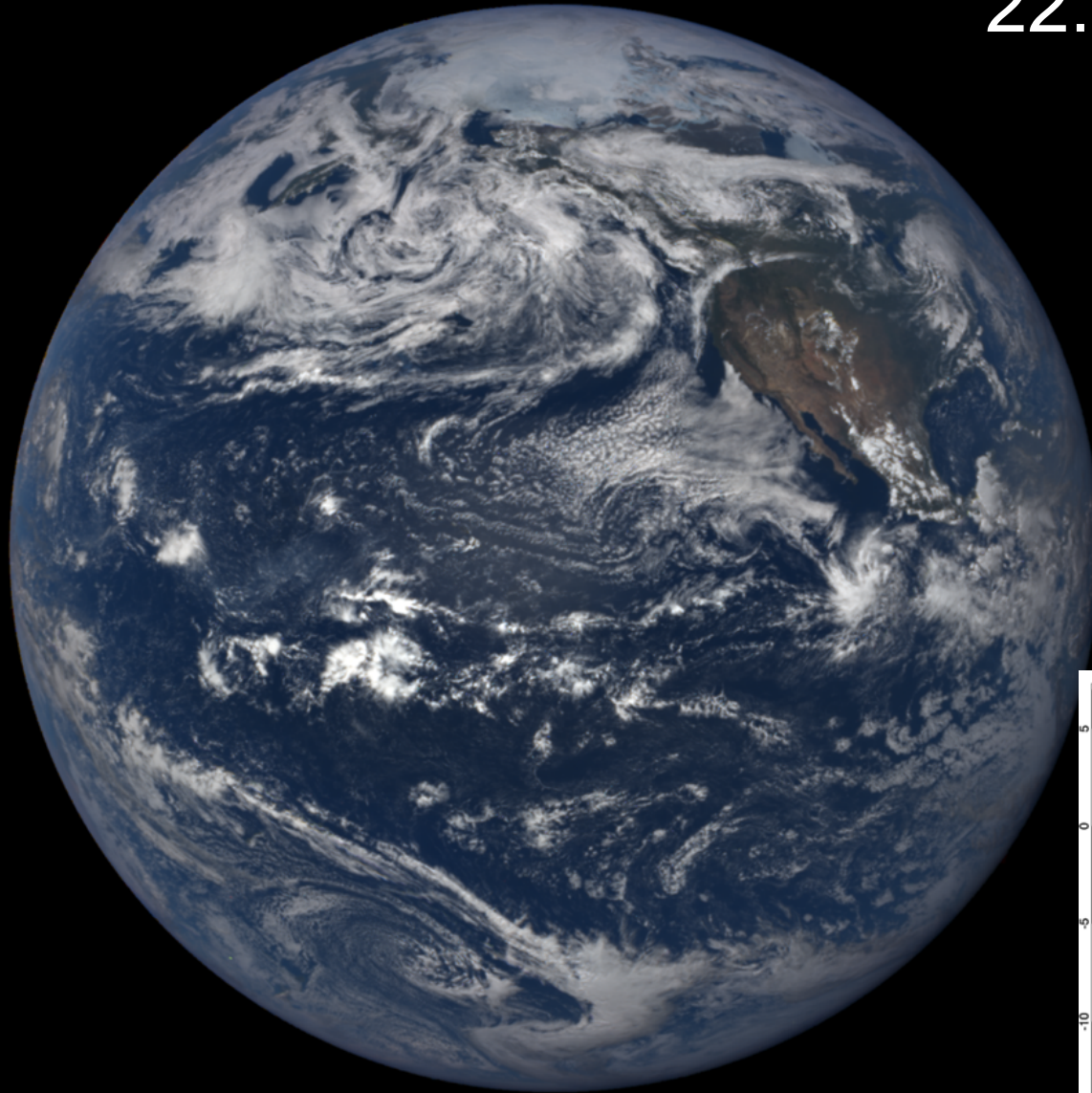
Jun 26, 2018
20:05 UT



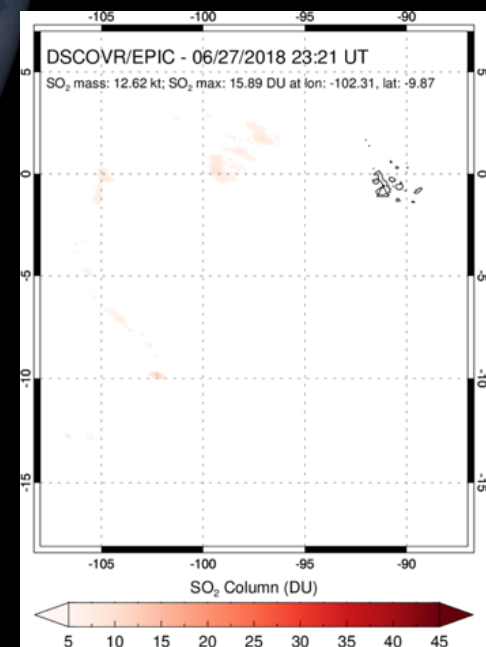
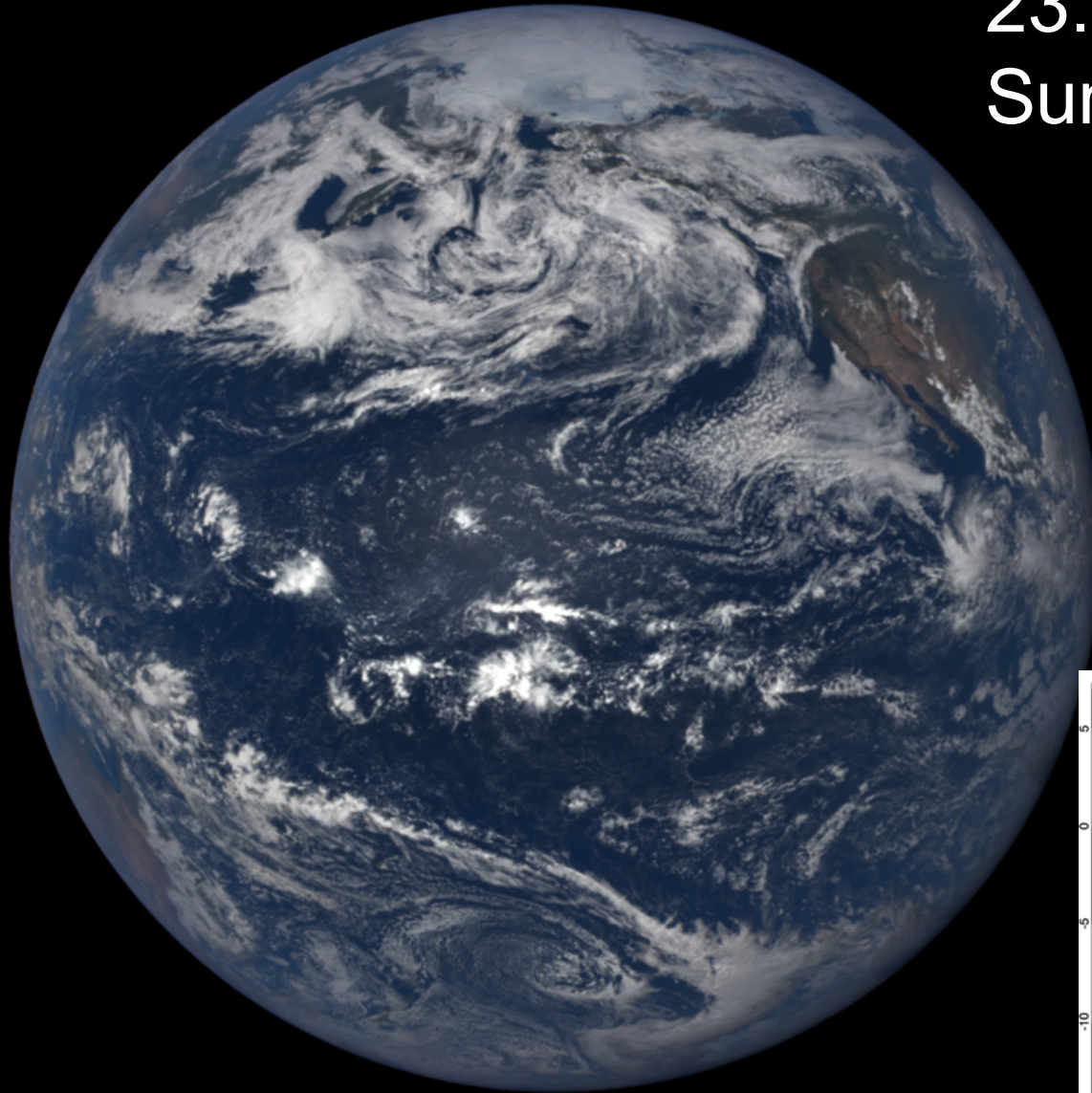
Jun 26, 2018
21:11 UT



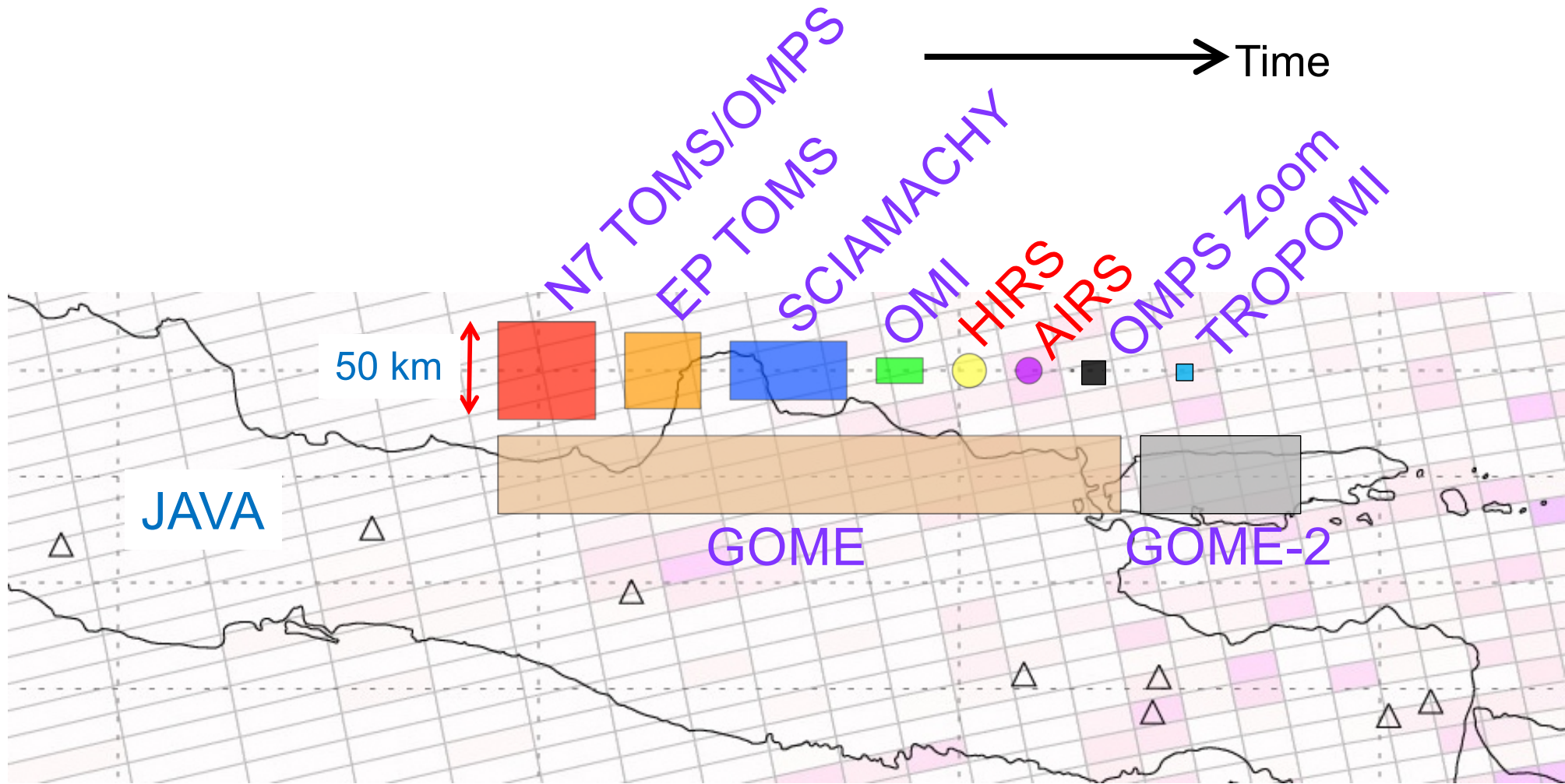
Jun 26, 2018
22:16 UT



Jun 26, 2018
23:21 UT
Sunset



Satellite instrument spatial resolution



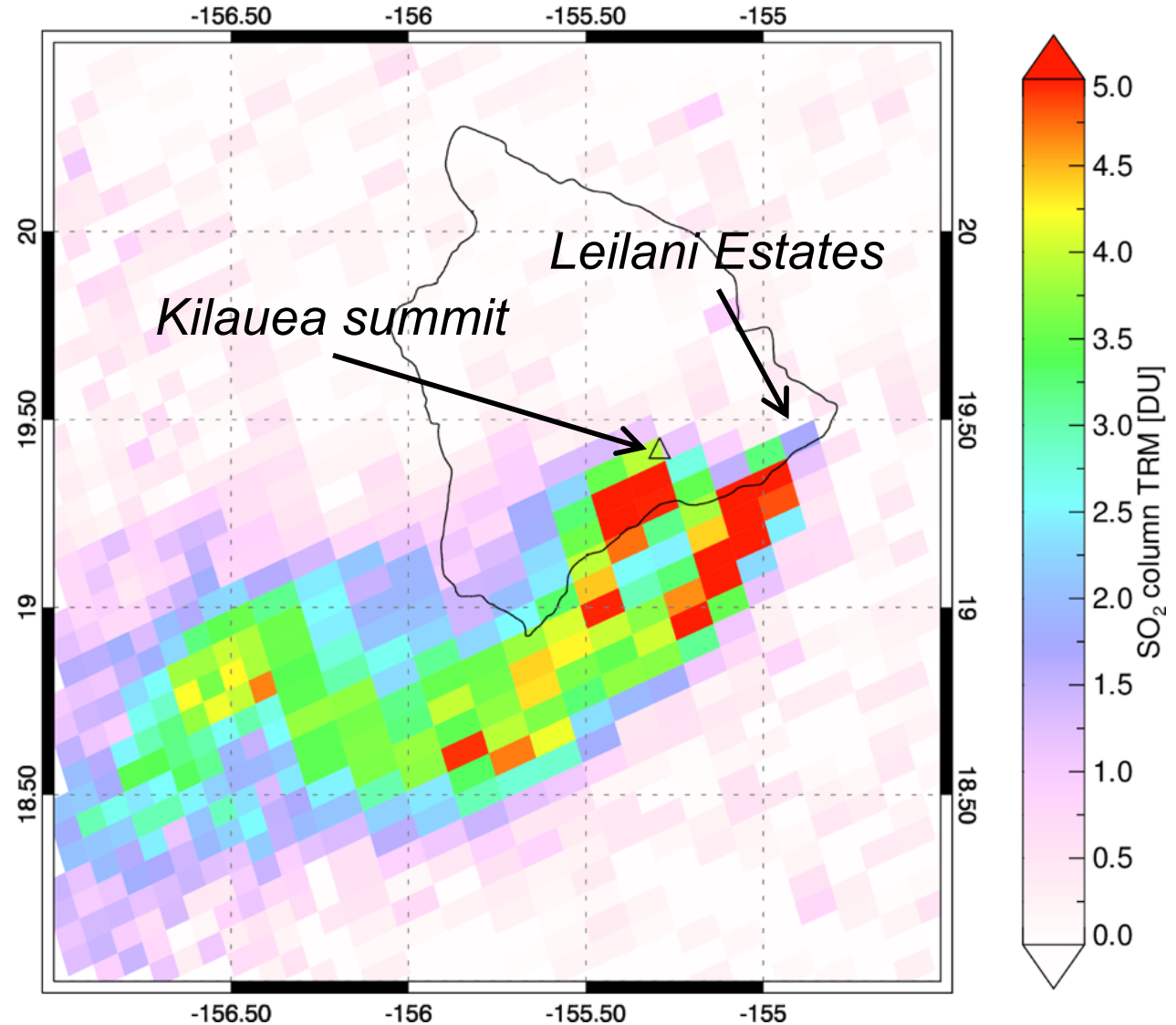
- Detection requires that a volcanic plume cover a large fraction of the sensor pixel or instantaneous field of view (IFOV)
- For most instruments, IFOV size also varies across the swath
- For large volcanic clouds ($>$ IFOV), footprint size is less important
- Pixel size is ultimately constrained by the available photon flux

Sentinel-5P TROPOMI SO₂ measurements

Sentinel-5P/TROPOMI - 05/06/2018 22:58-22:59 UT - Orbit 2916

SO₂ mass: 1.75 kt; Area: 38383 km²; SO₂ max: 12.15 DU at lon: -155.40 lat: 19.23 ; 22:58UTC

- ESA Sentinel-5P TROPOMI instrument (launched Oct 2017)
- Improved volcanic plume resolution (in the UV) with 7 x 3.5 km pixel size
- Some IR sensors (e.g., ASTER) have higher spatial resolution but lower SO₂ sensitivity and temporal resolution



Volcanic gases detected from space

UV/IR Sensor ^a	Volatile species											Timespan
	H ₂ O	CO ₂	CO	SO ₂	H ₂ S	NO ₂	HCl	BrO	OCIO	IO	CH ₃ Cl	
TOMS*				■								1978-2005
SBUV* (P)				■								1978-present
HIRS*				■								1978-present
GOME	■			■		■		■	■			1995-2003
MODIS*	■			■								1999-present
ASTER				■								1999-present
MOPITT			■									1999-present
SCIAMACHY (L)	■	■	■	■		■		■	■	■		2002-2012
MIPAS (L)				■								2002-2012
AIRS	■	■	■	■								2002-present
ACE (L)			■	■			■				■	2003-present
SEVIRI				■								2004-present
OMI				■		■		■	■	■		2004-present
MLS* (L)	■		■	■			■	■	■		■	1991-2001; 2004-present
TES (P)				■								2004-present
GOME-2*	■			■		■		■	■	■		2006-present
IASI*	■	■	■	■	■							2006-present
OMPS*				■		■		■	■	■		2011-present
VIIRS				■								2011-present
CrIS				■								2011-present
AHI				■								2015-present
GOSAT (P)		■		■								2009-present
OCO-2		■										2014-present

* = Multiple sat.
P = Profiler
L = Limb
■ = Confirmed
■ = Possible?

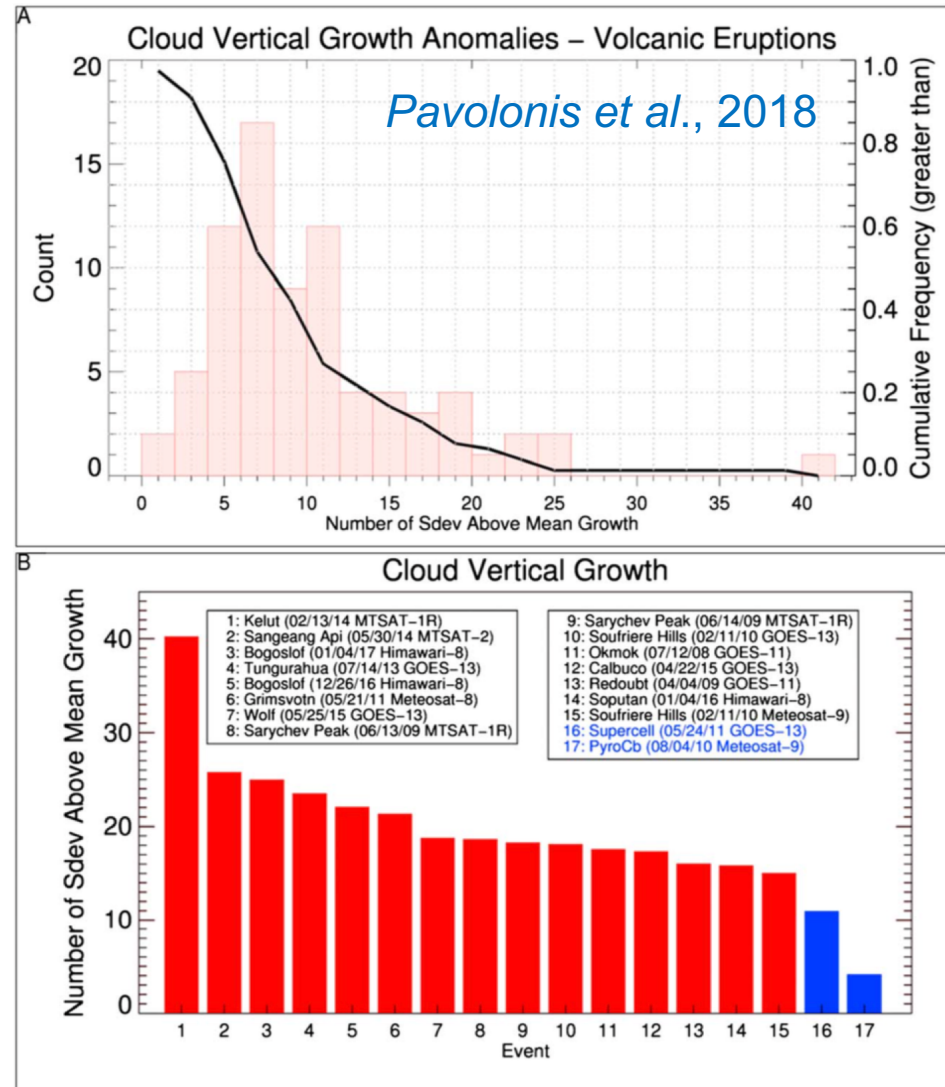
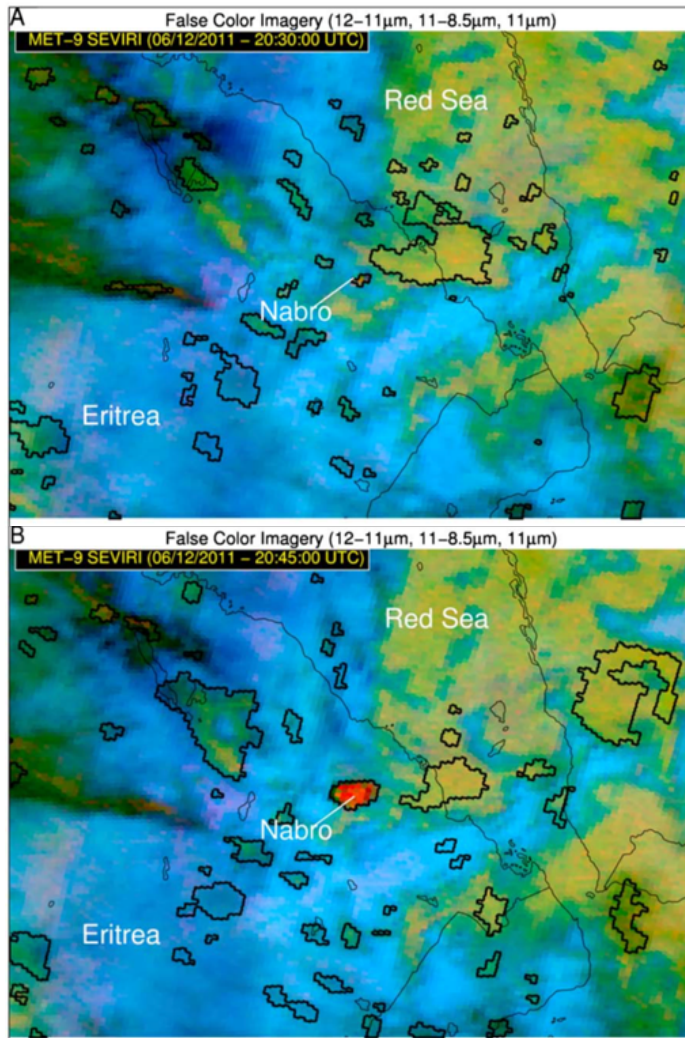
- Compositional bias towards SO₂
- >20 daily polar-orbiting SO₂ sensor overpasses

What can satellites measure during volcanic eruptions?



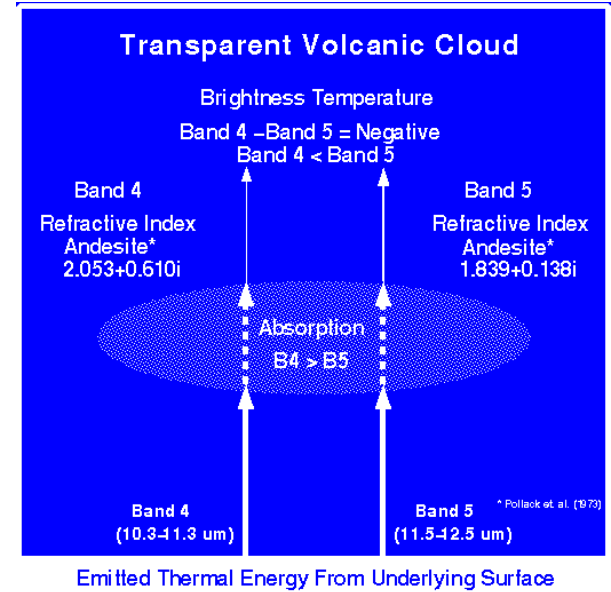
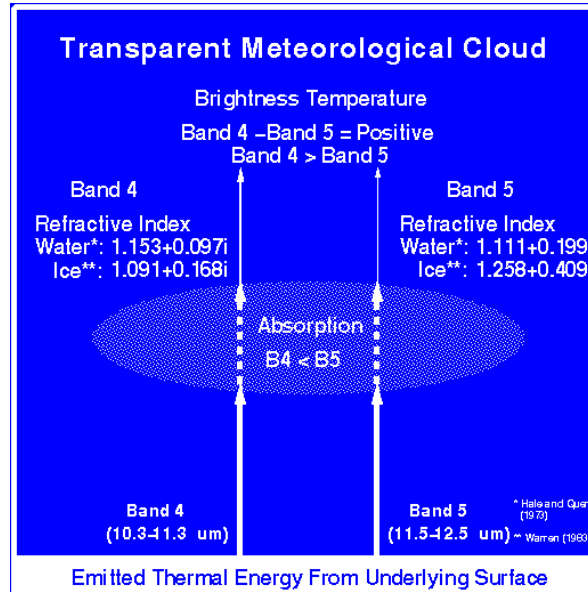
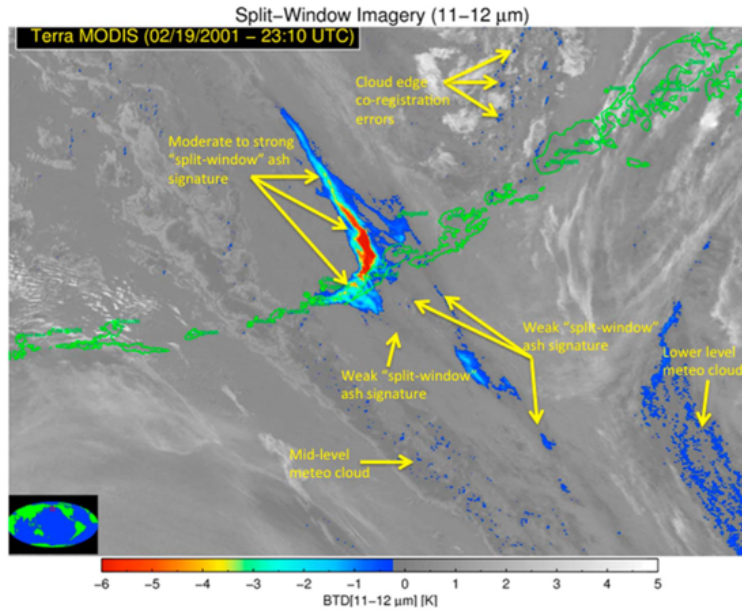
Calbuco Chile, April 2015 (C. Gutierrez/AP)

Vertical growth anomalies in volcanic plumes



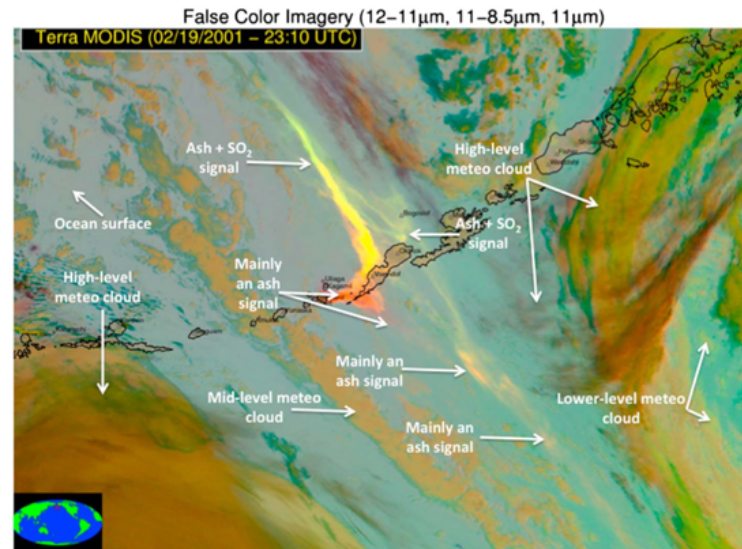
- Anomalous vertical growth rates of volcanic clouds (wrt meteorological clouds) used to detect explosive eruptions in geostationary satellite data and issue alerts
- Used operationally by some Volcanic Ash Advisory Centers (VAACs)

Volcanic ash cloud detection and alerts



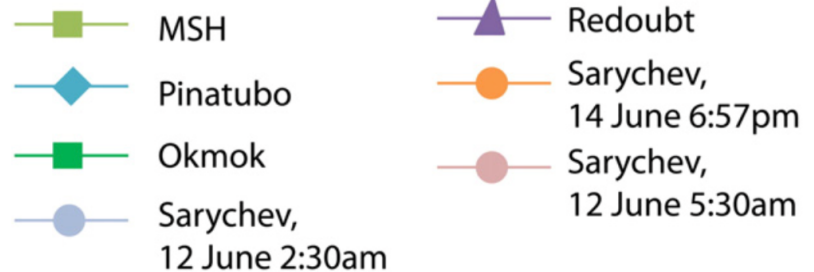
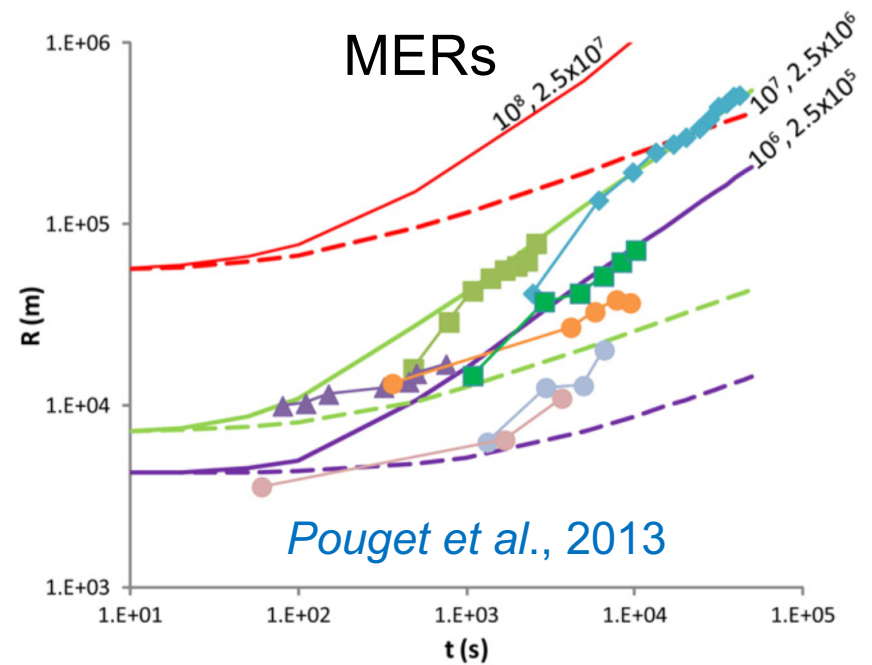
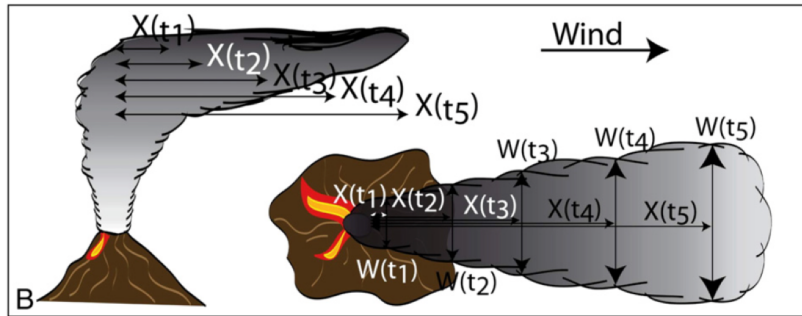
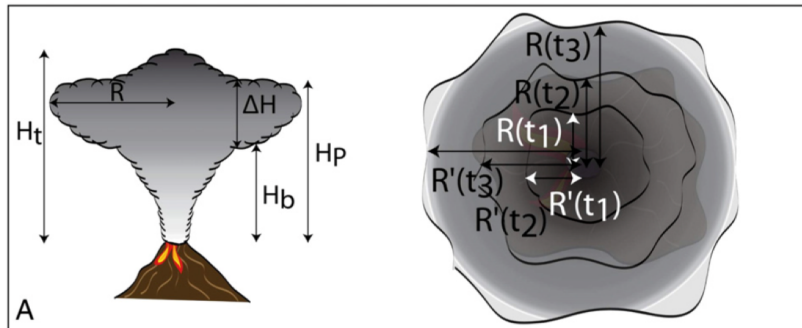
'Reverse absorption'

- Automated volcanic ash cloud and thermal anomaly detection conducted in 'near real-time'
- Algorithms attempt to mimic human expert analysis of satellite imagery (similar to AI)
- Improve as more satellite data for actual volcanic events is collected (algorithm training)
- Towards an 'unbiased' record of volcanic activity?
- VOLCAT: <https://volcano.ssec.wisc.edu>

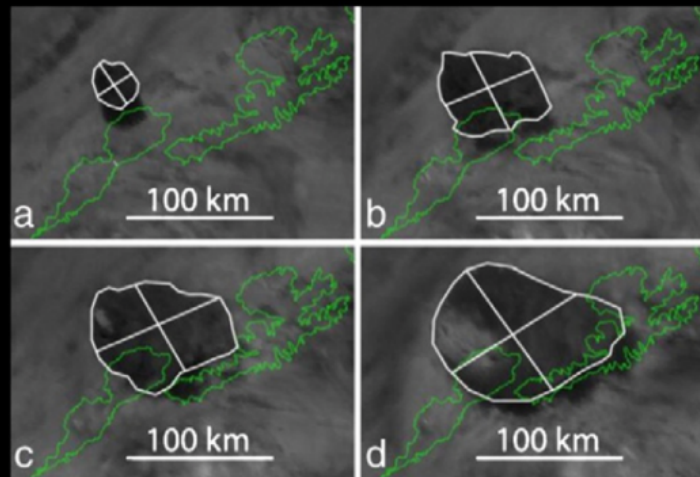


Prata, 1989; Pavolonis et al., 2015

Mass eruption rates from umbrella cloud expansion



B 2008 Okmok eruption (AK, USA)

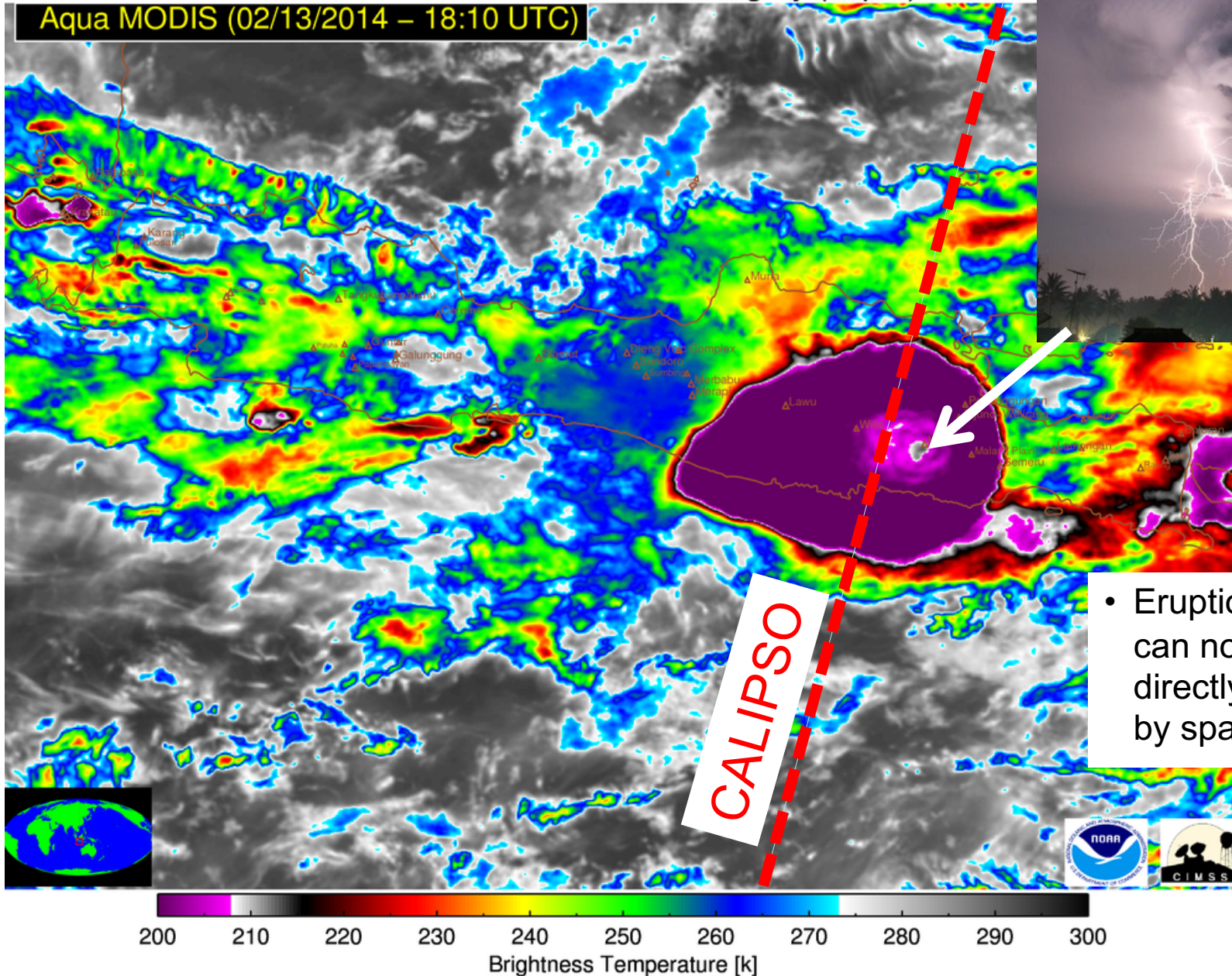


- Growth of umbrella clouds and downwind plumes from satellite imagery used to estimate mass eruption rates (MER)
- Faster, remote estimates of MER and its temporal variation

A-Train data for February 2014 Kelut eruption

Color Enhanced Infrared Imagery (11 μ m)

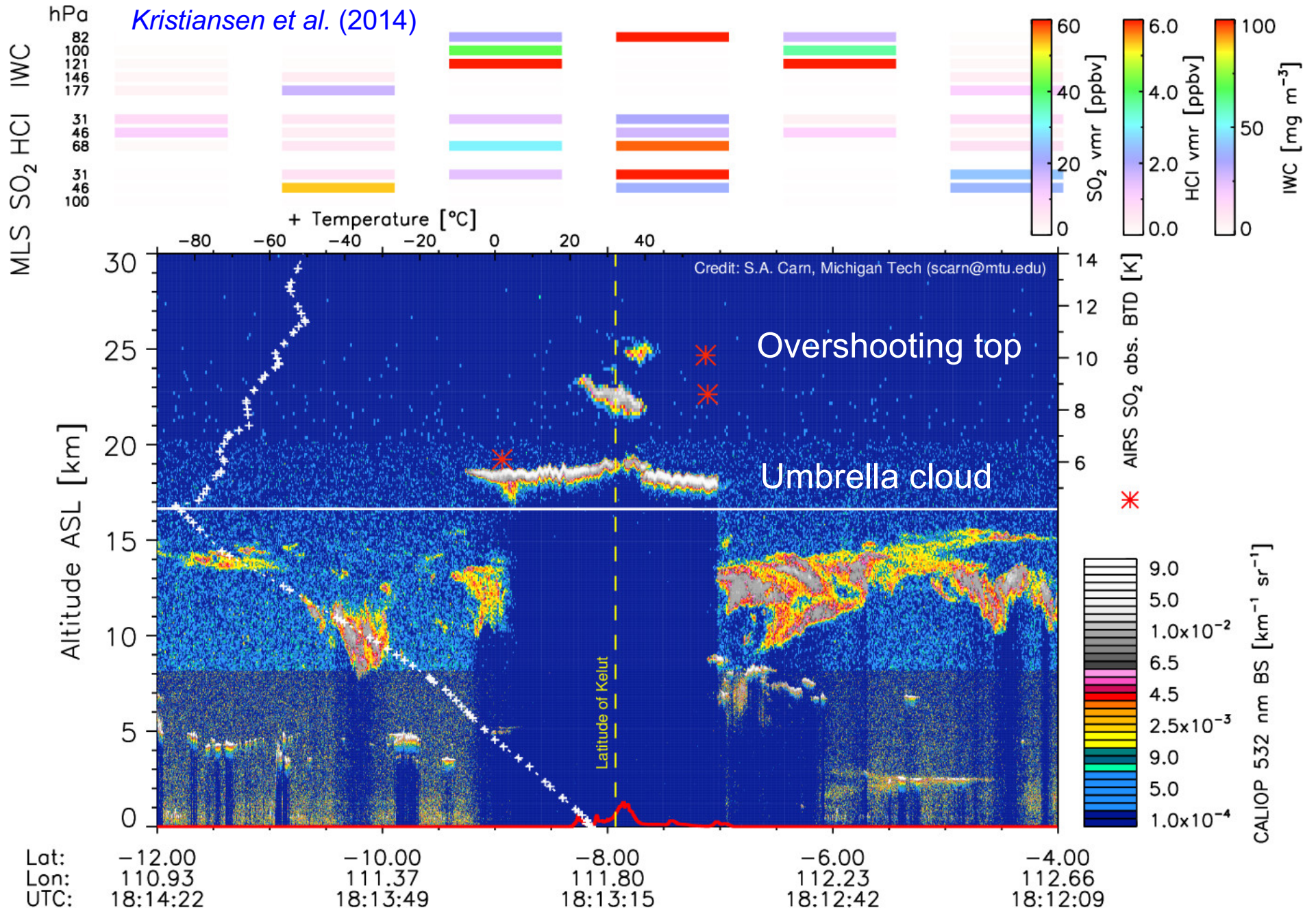
Aqua MODIS (02/13/2014 – 18:10 UTC)



- Eruption column heights can now be measured directly (in some cases) by space-borne LiDAR

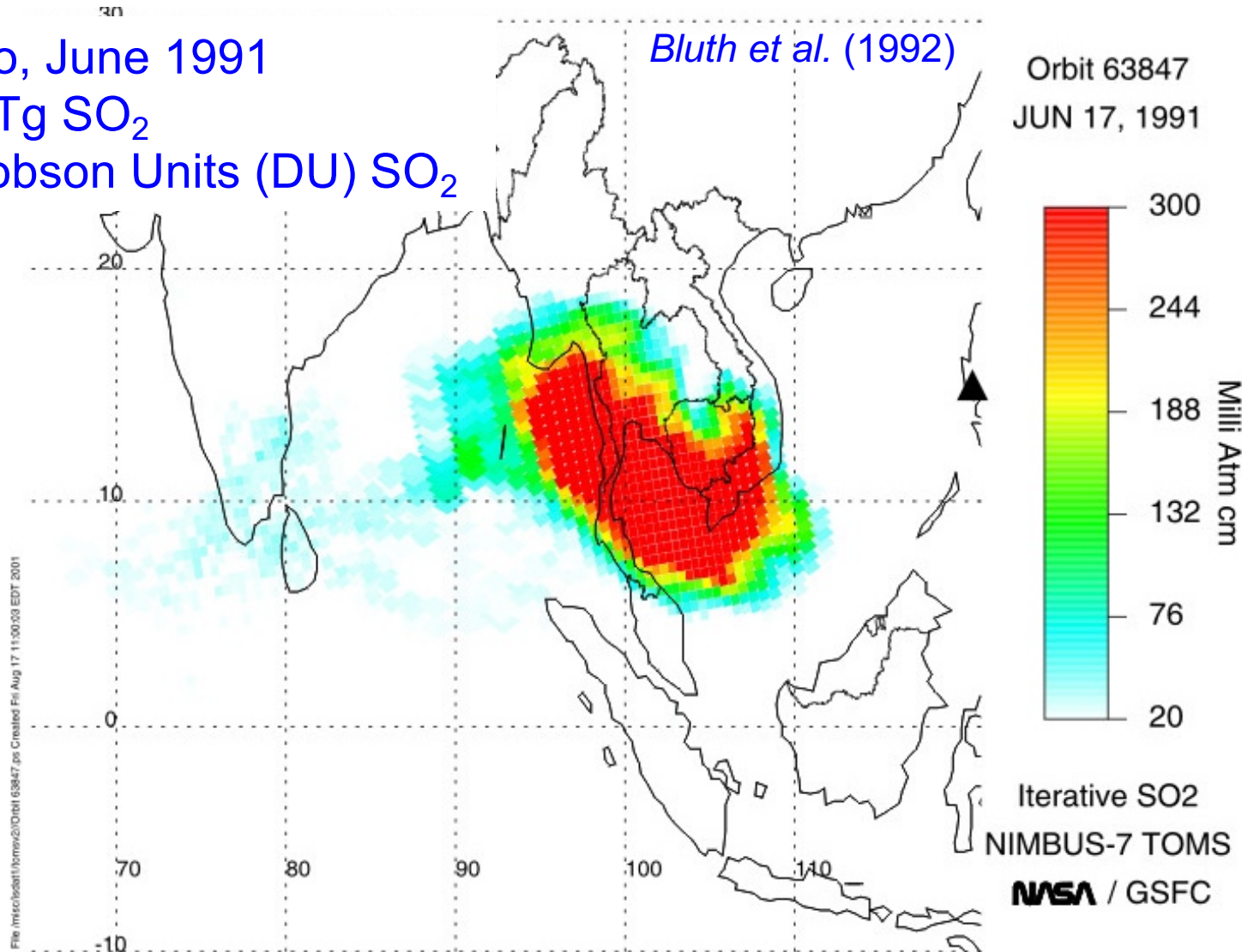
MODIS image
courtesy of
NOAA/CIMSS

A-Train data for February 2014 Kelut eruption



Eruptive SO₂ emissions

Pinatubo, June 1991
~13-17 Tg SO₂
~500 Dobson Units (DU) SO₂

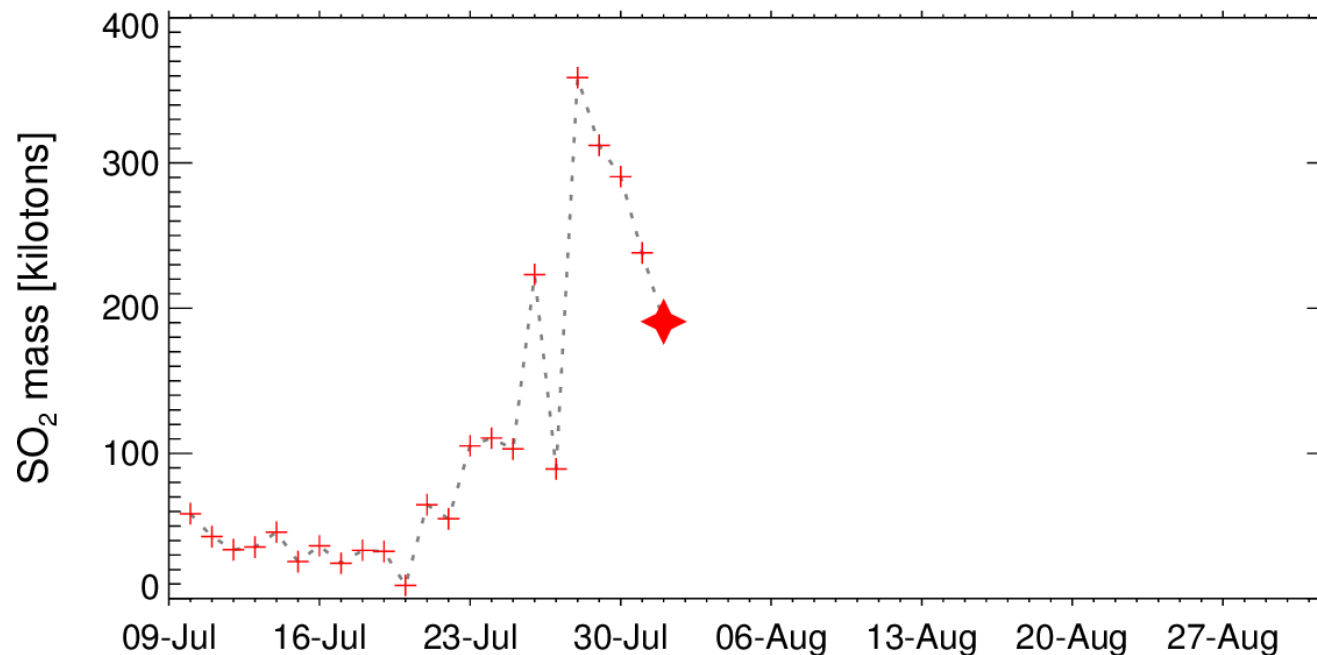
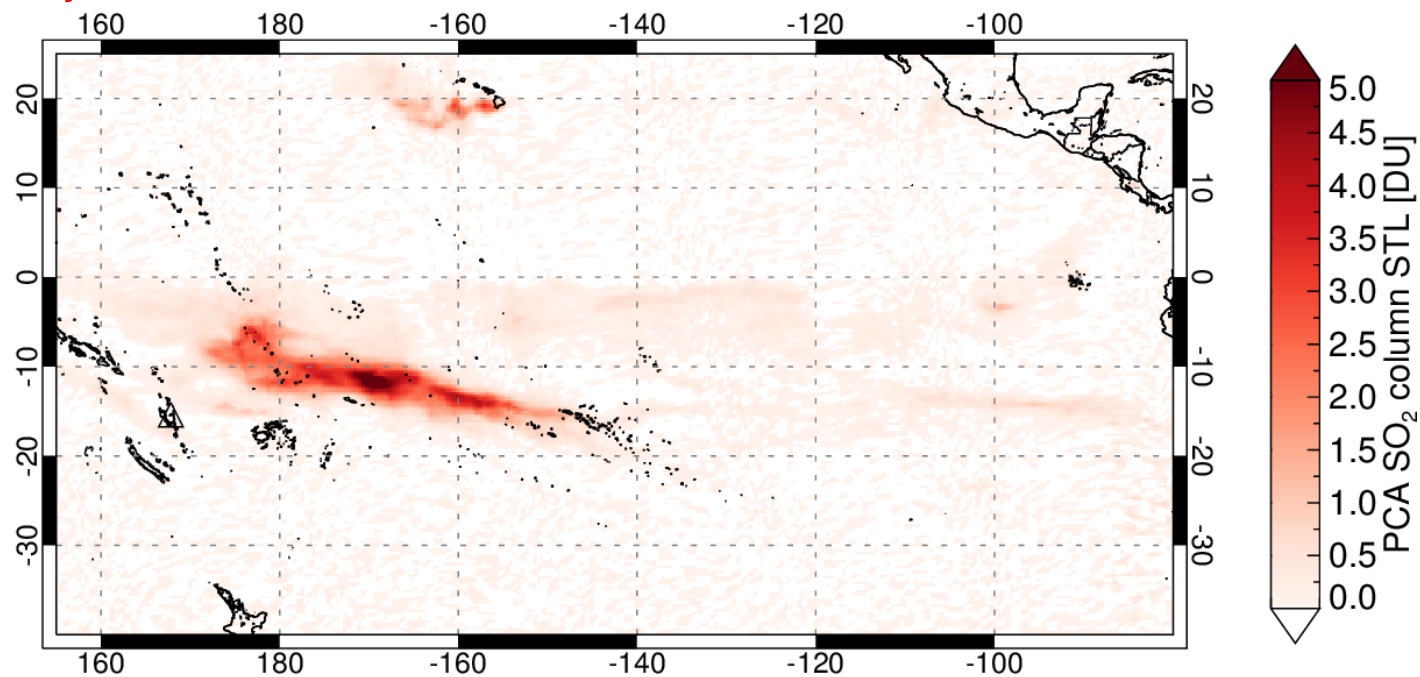


- Satellites measure 'snapshot' SO₂ mass rather than flux
- Pinatubo SO₂ mass retrievals still being refined (*Fisher et al.*, 2019)
- Image archive: NASA global SO₂ monitoring website (<http://so2.gsfc.nasa.gov>)

Ambae (Vanuatu) eruption July 26, 2018

Suomi NPP –
Ozone Mapping
and Profiler Suite
(OMPS)

Suomi NPP/OMPS - 08/01/2018

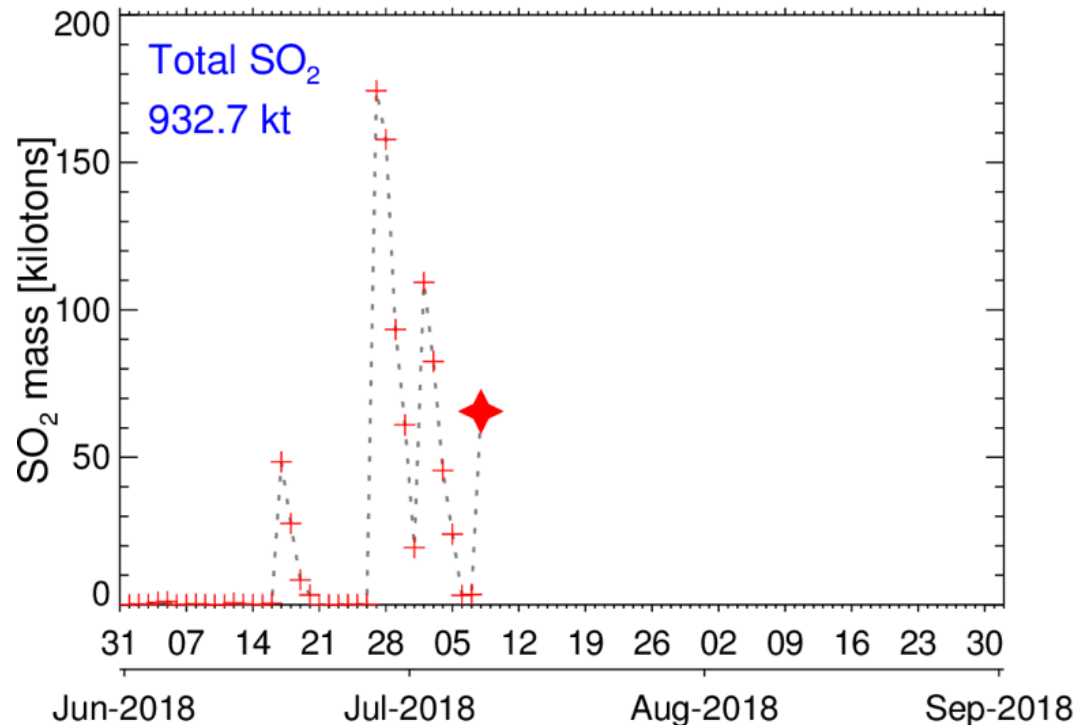
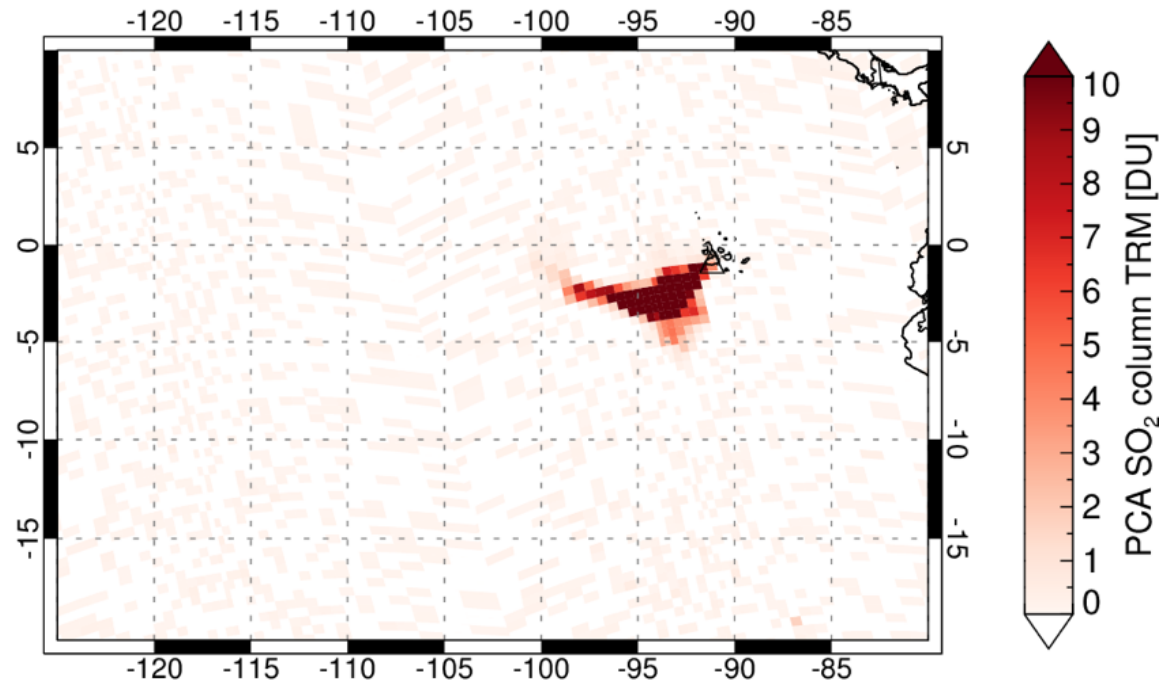


Galápagos eruption: June - August 2018

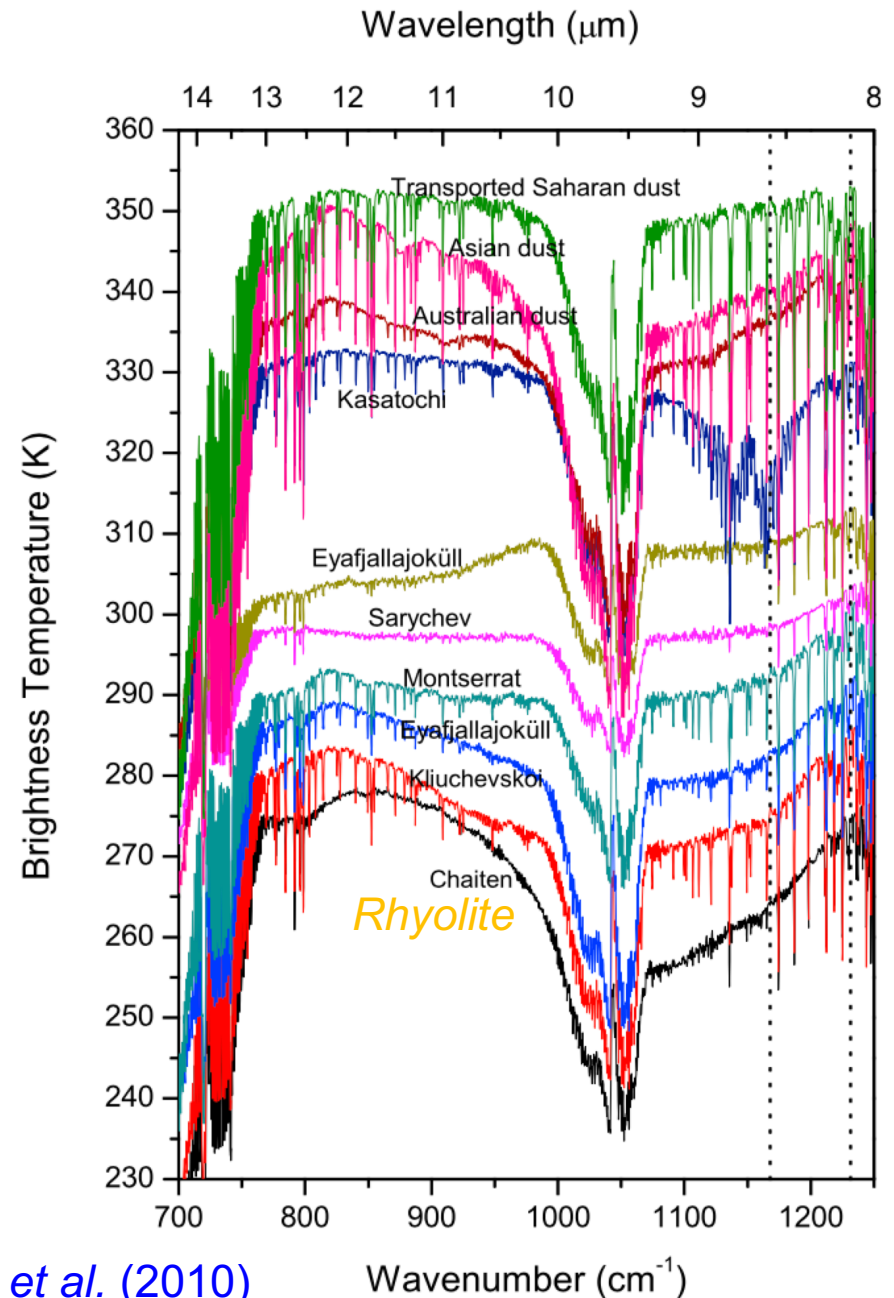
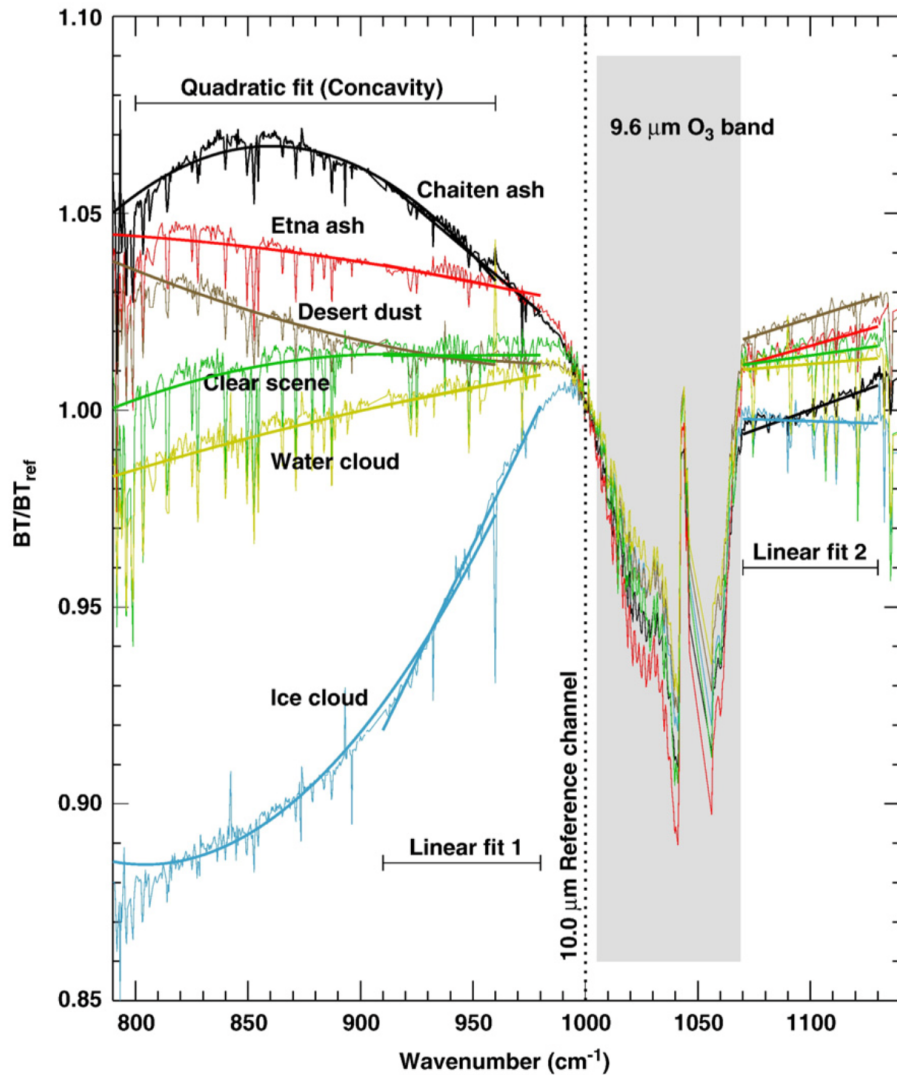
Suomi NPP – Ozone Mapping and Profiler Suite (OMPS)

- Typical 'waxing-waning' emission trend – proxy for effusion rate
- Fernandina (16 June)
 - ~2 day eruption
 - ~3 km plume altitude
 - ~100 kt SO₂
- Sierra Negra (26 June)
 - Unrest since July 2017 (seismicity, uplift)
 - SO₂ detected from 26 June – 19 August
 - Several pulses of higher SO₂ emissions

Suomi NPP/OMPS - 07/08/2018



Ash composition detected from space

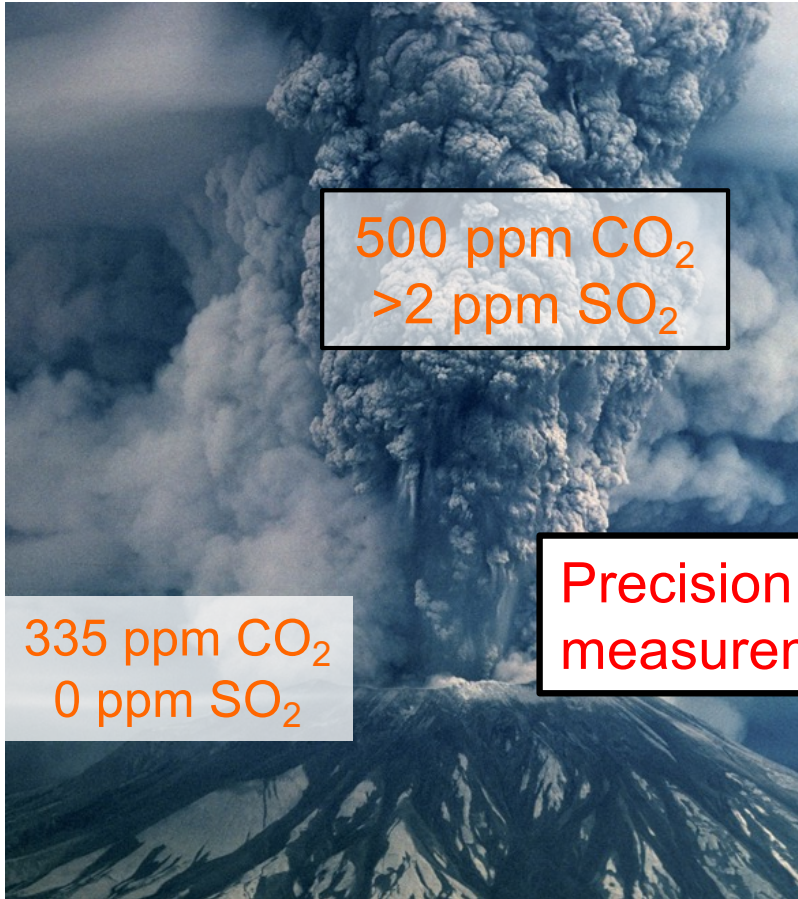


- IR spectral shape is sensitive to volcanic ash composition and differentiates ash from dust and water/ice clouds

Gangale et al. (2009); Clarisse et al. (2010)

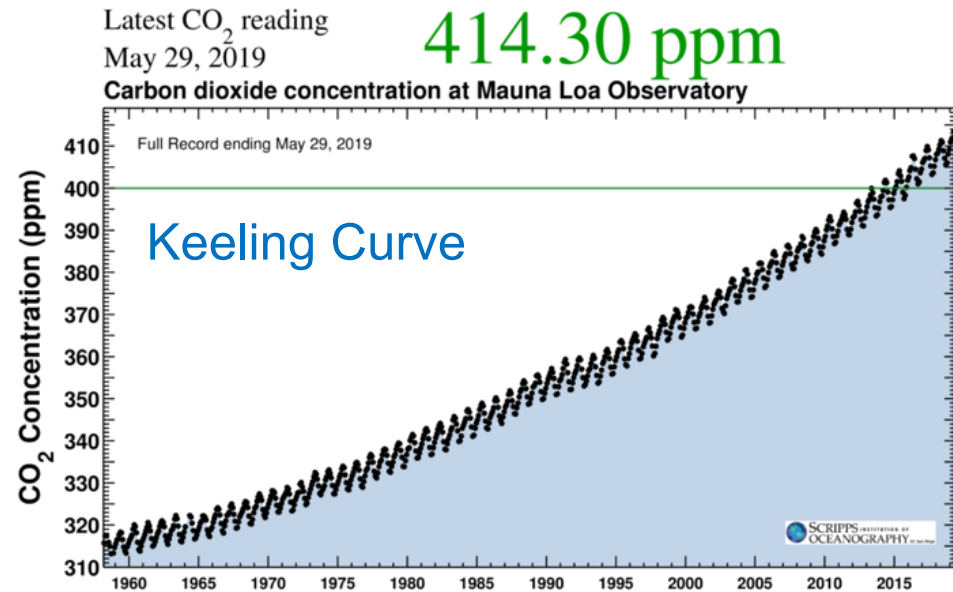
Can we detect volcanic CO₂ from space?

Explosive eruption

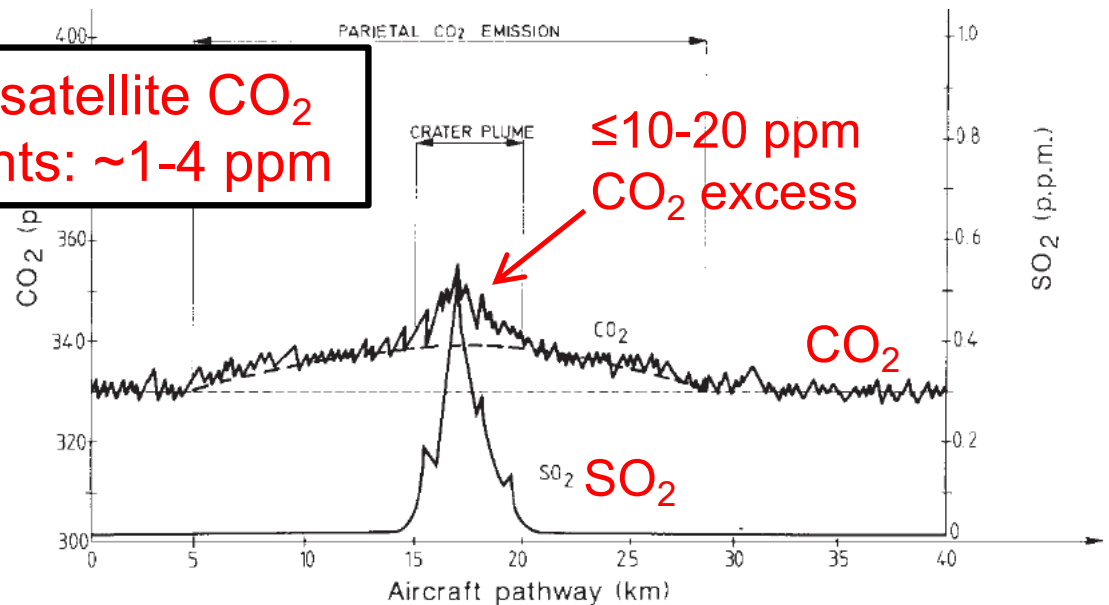


May 1980 Mt St Helens eruption
(Hobbs et al., 1982)

CO₂/SO₂ = 55 → ~55 Tg CO₂



Precision of satellite CO₂ measurements: ~1-4 ppm



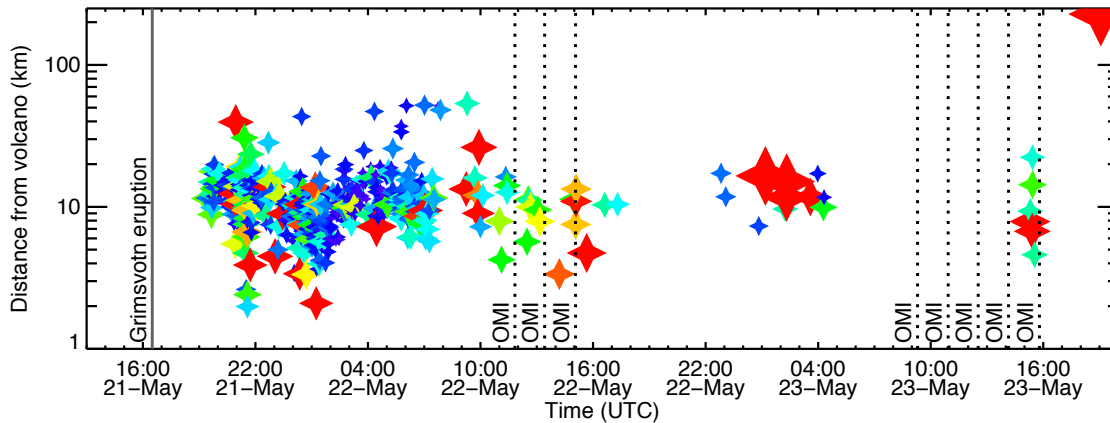
Etna, Italy: 13 Tg yr⁻¹ CO₂ (Allard et al., 1991)

Volcanic lightning NO_x and ash-gas separation

- NO_x = NO + NO₂
- N₂ + O₂ → 2NO
- 2NO + O₂ → 2NO₂



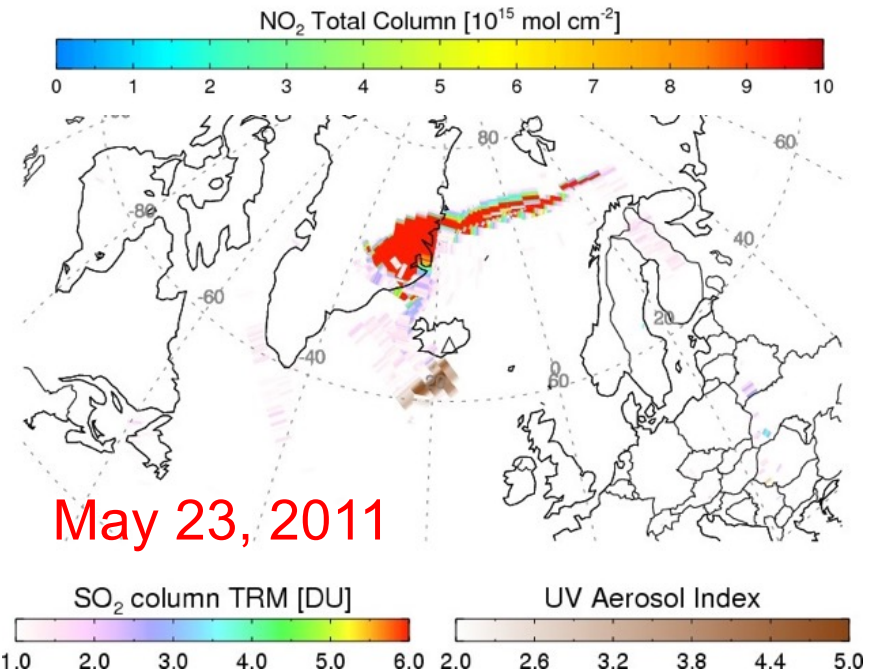
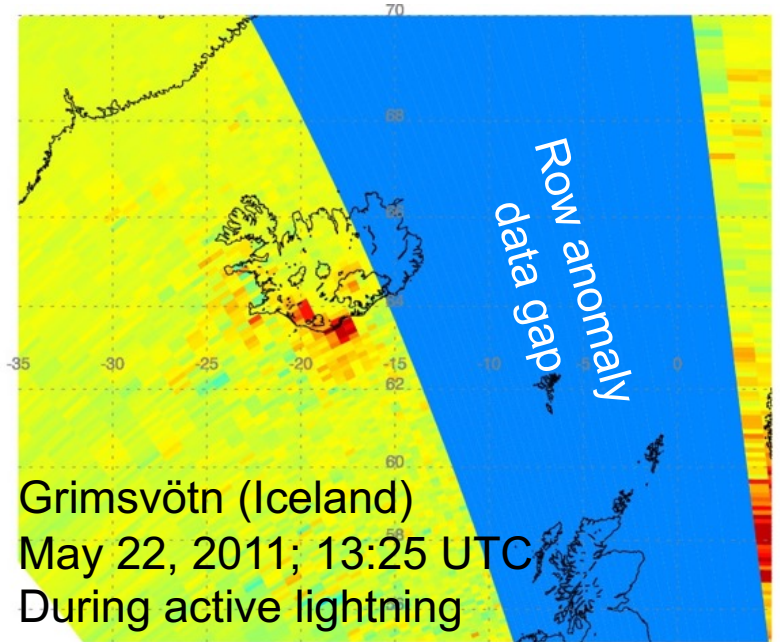
Lightning NO_x
(LNO_x)



WWLLN lightning strikes during May 2011 eruption of Grimsvötn (Iceland)

- Volcanic lightning NO_x could provide a new way to detect hazardous volcanic clouds
- Several processes could create lightning, including fallout of ash-hydrometeor aggregates ('dirty thunderstorm' mechanism)

Sigmarsson et al. (2013); Carn et al. (2016)



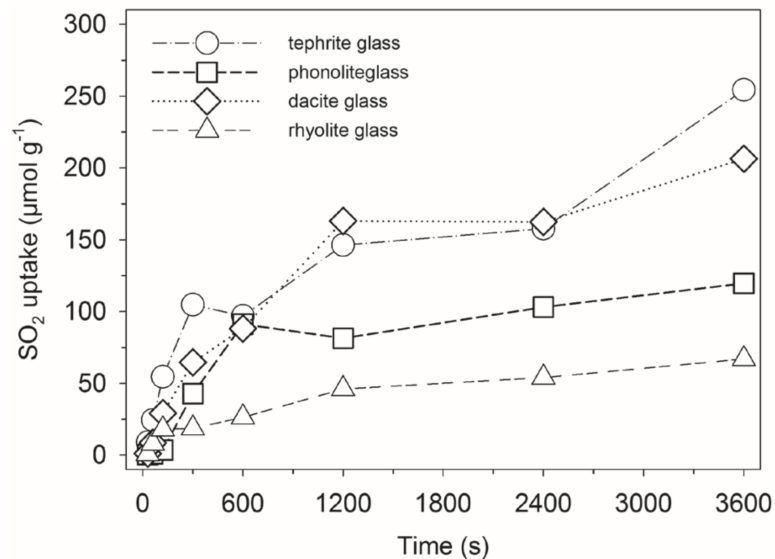
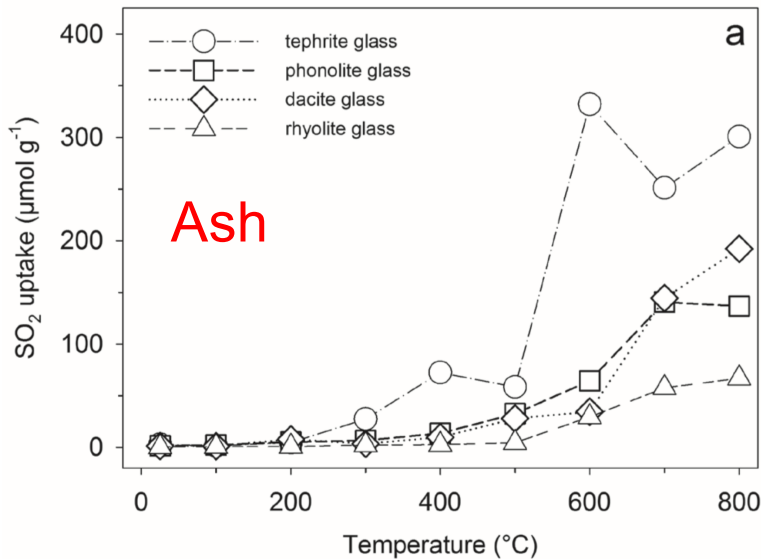
Grimsvötn (Iceland) eruption plume (May 2011)

Photos by Jón Ólafur

- What is the fate of volcanic gases in eruption columns?
- Gas scavenging on ash and hydrometeors [e.g., Textor et al., 2003]



Gas scavenging in volcanic plumes



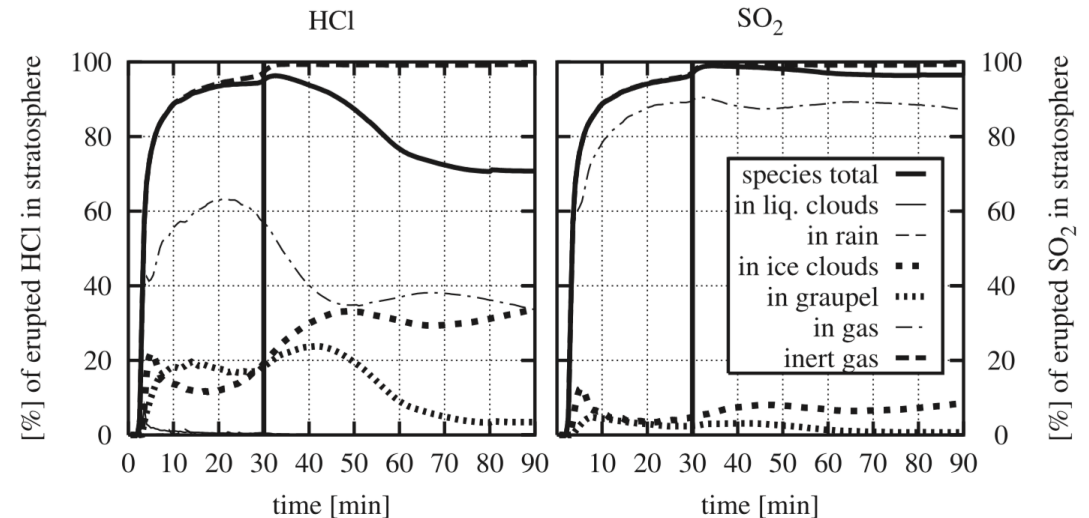
acids/water condensation
<190 °C

gas adsorption (chemisorption)
190-800 °C

aerosol salt formation/deposition
600-1200 °C

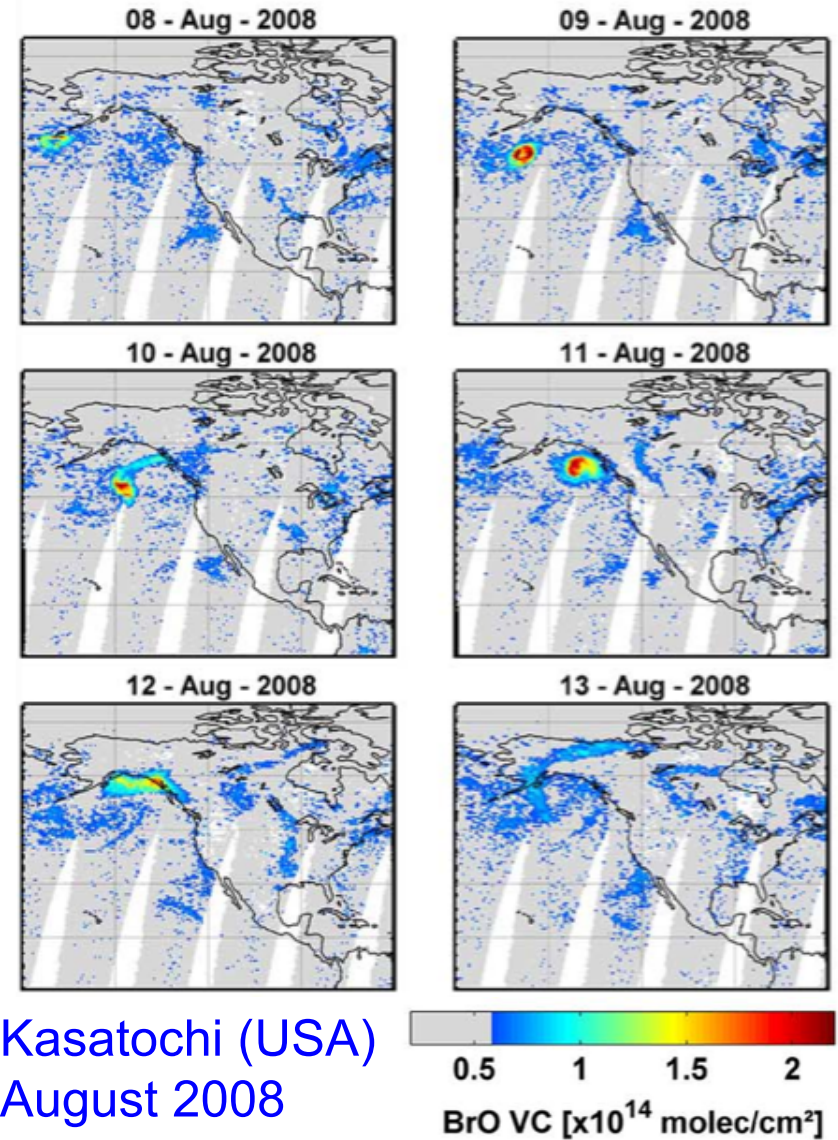
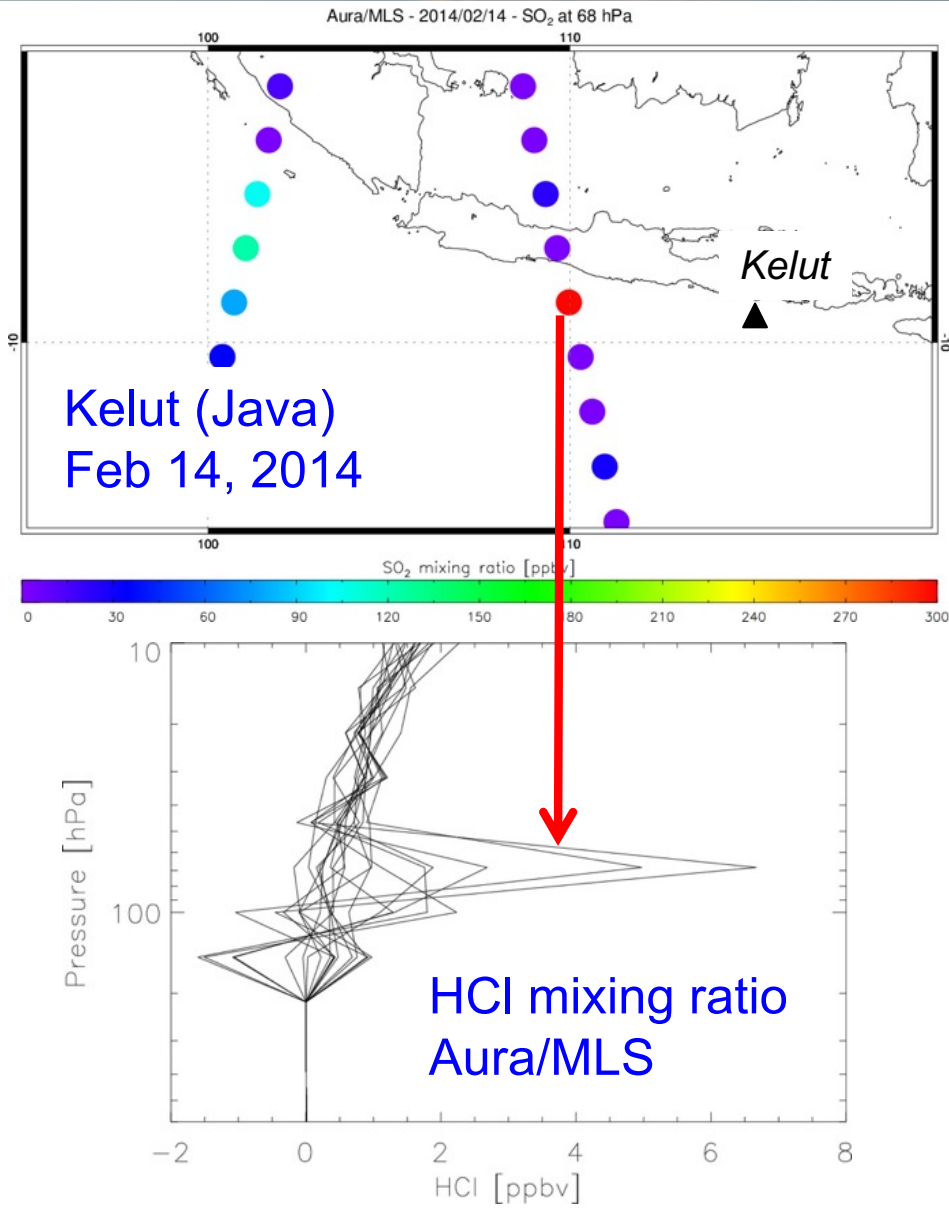
Textor et al. (2003)
Ayris et al. (2013)
Delmelle et al. (2018)

Hydrometeors



- >80% S gases and >25% HCl predicted to reach stratosphere in explosive eruptions
- Ash interactions dependent on volcanic gas-ash exposure time at high T (i.e., fragmentation depth), ash composition (Ca)

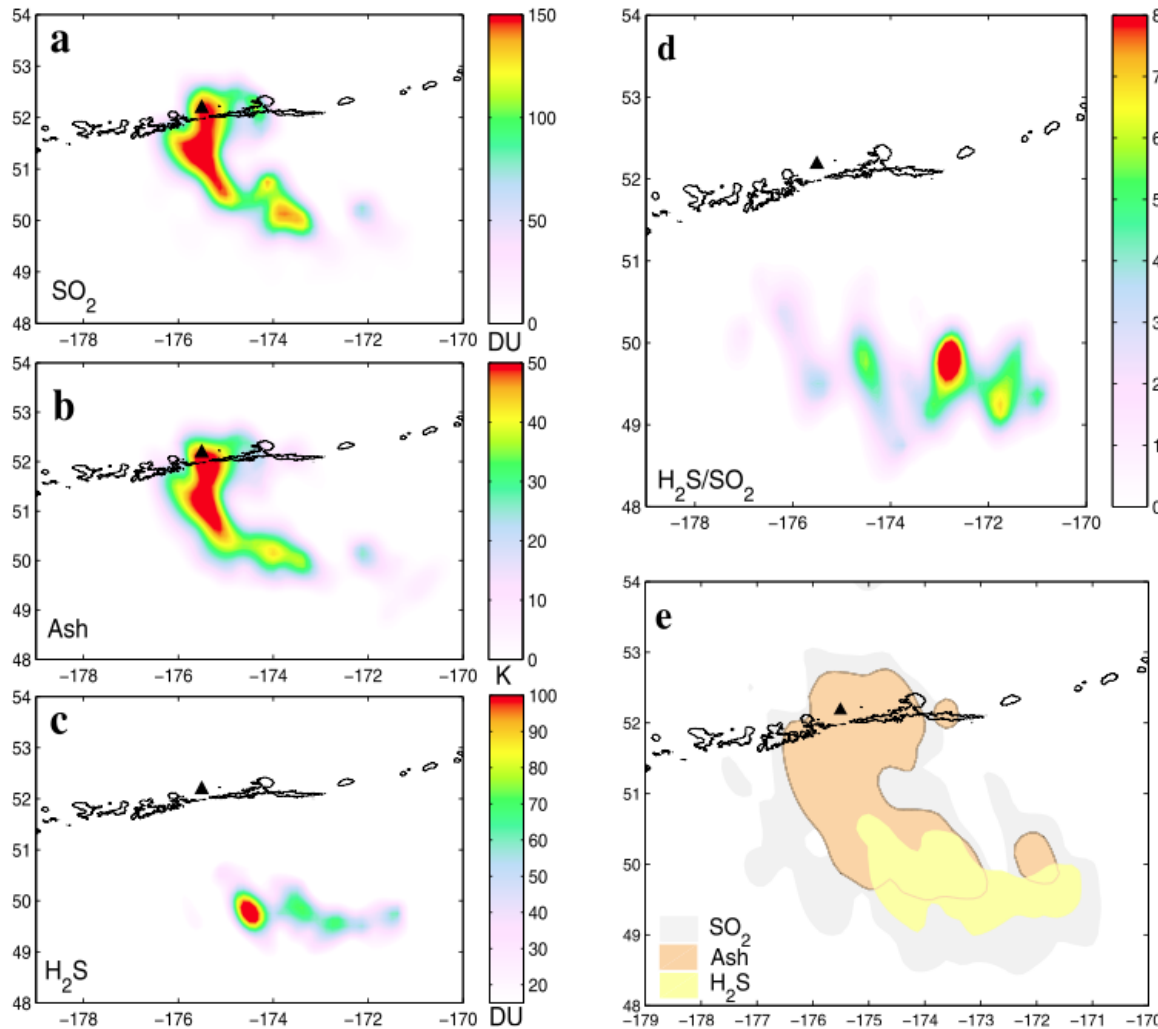
Satellite measurements of volcanic halogens



Theys et al. (2009, 2014); Carn et al. (2016)

- Satellites have measured HCl, BrO, and OCIO in explosive volcanic eruption clouds
- Volcanic halogens can promote ozone depletion

Satellite measurement of volcanic H₂S emissions



2008 Kasatochi eruption
Clarisse *et al.* (2011)

Pressure →



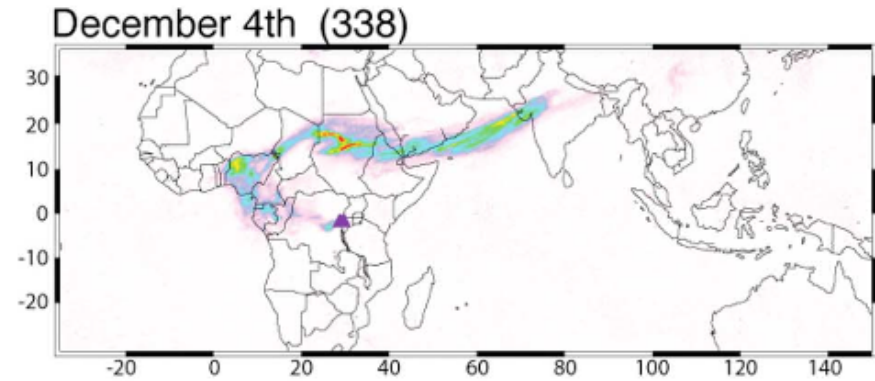
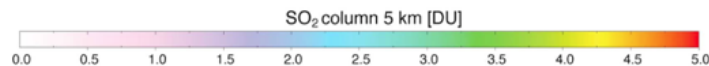
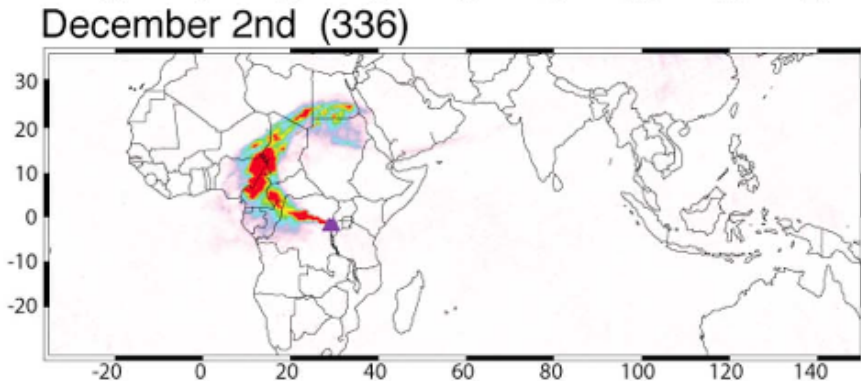
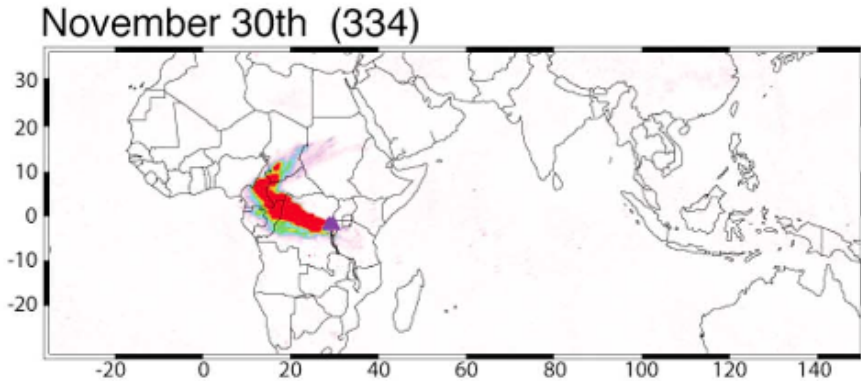
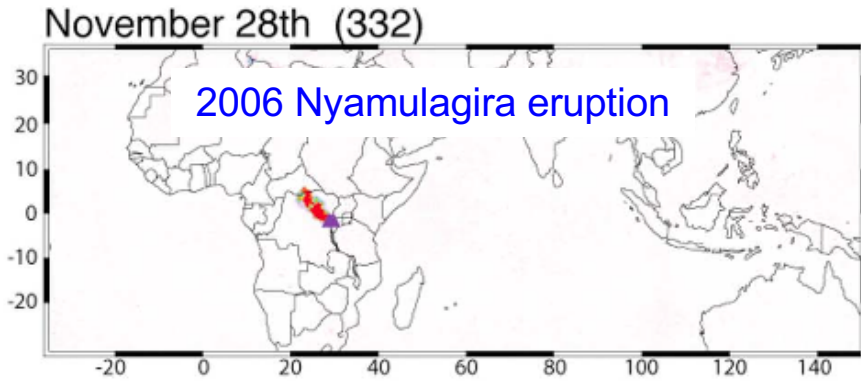
← Temperature / fO₂

$$\begin{aligned} \log (\text{SO}_2/\text{H}_2\text{S}) = \\ \log K_T - 3 \log (\text{H}_2/\text{H}_2\text{O}) \\ - \log P \cdot X_{\text{H}_2\text{O}} \end{aligned}$$

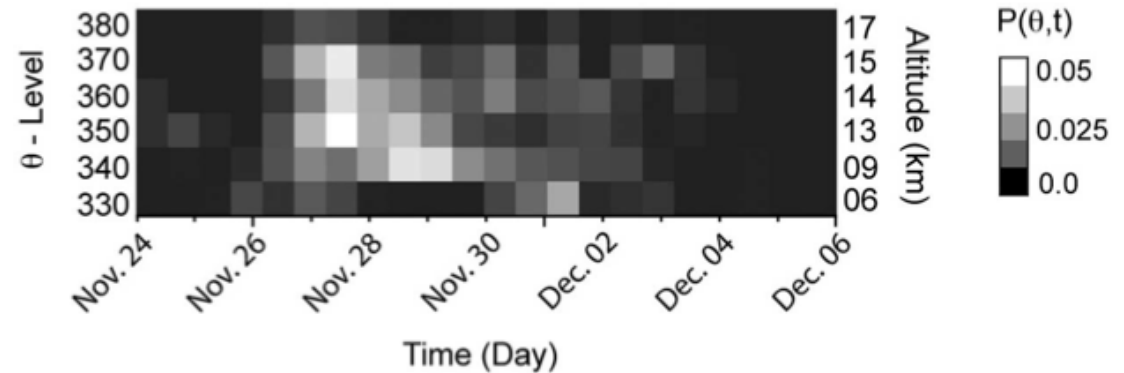
Symonds et al., 1994

- May be a significant component of the total sulfur budget at some volcanoes (*Aiuppa et al., 2005*)
- IR absorption bands are very weak, hence can only be detected from space in large eruptions (IASI; *Clarisse et al., 2011*)

Inverse trajectory modeling of SO₂ data



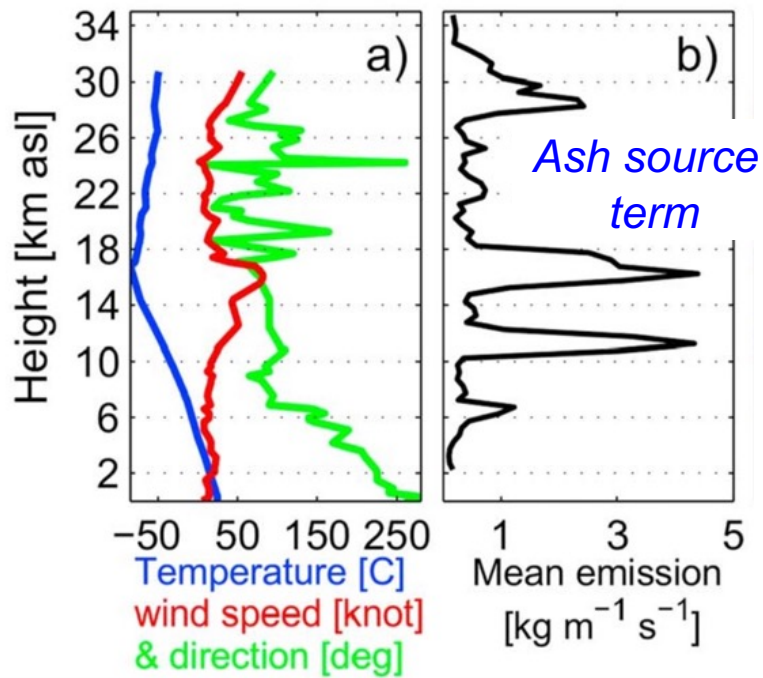
December 6th (340) *Hughes et al. (2012)*



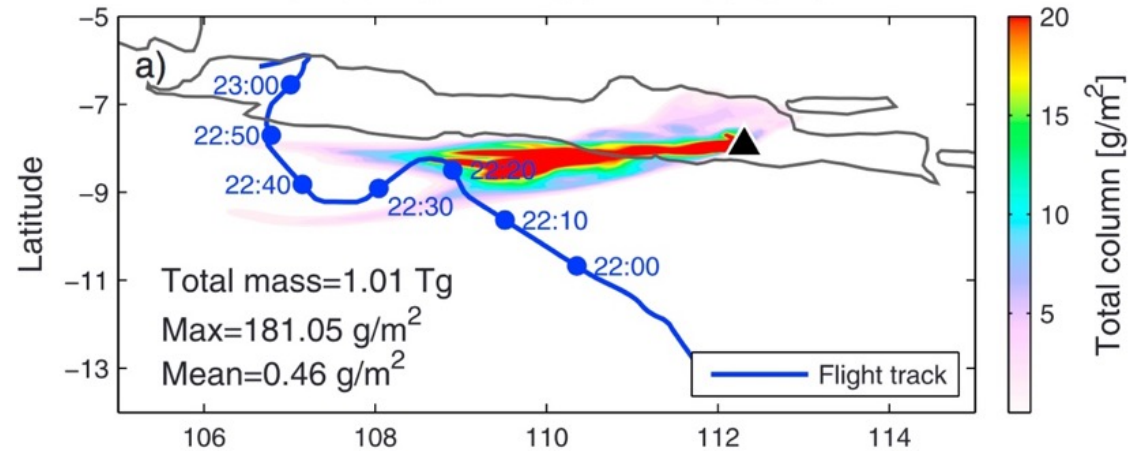
- Satellite measurements from polar-orbiting sensors have low (~daily) temporal resolution
- Initiate backward trajectories from observed locations of SO₂ cloud – select those that approach volcano
- Generate PDF of SO₂ emission altitude and time (here for an effusive eruption)

Eckhardt et al. (2008); Kristiansen et al. (2010, 2014); Boichu et al. (2013, 2014)

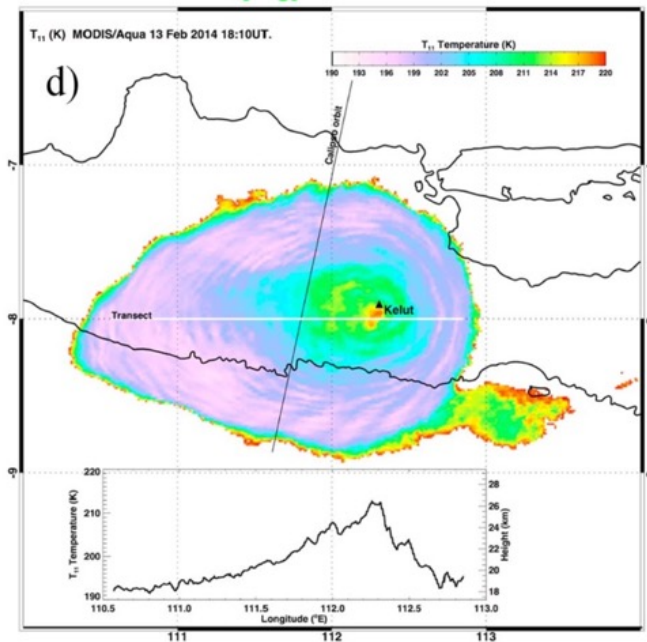
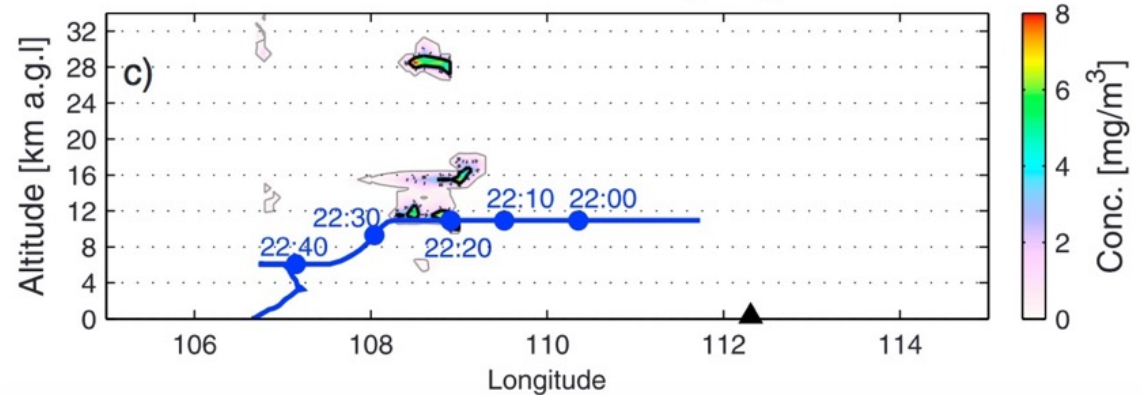
Inverse modeling of volcanic 'source term'



FLEXPART-ECMWF MODEL SIMULATION 13 Feb 2014 22:00 – 22:30 UTC

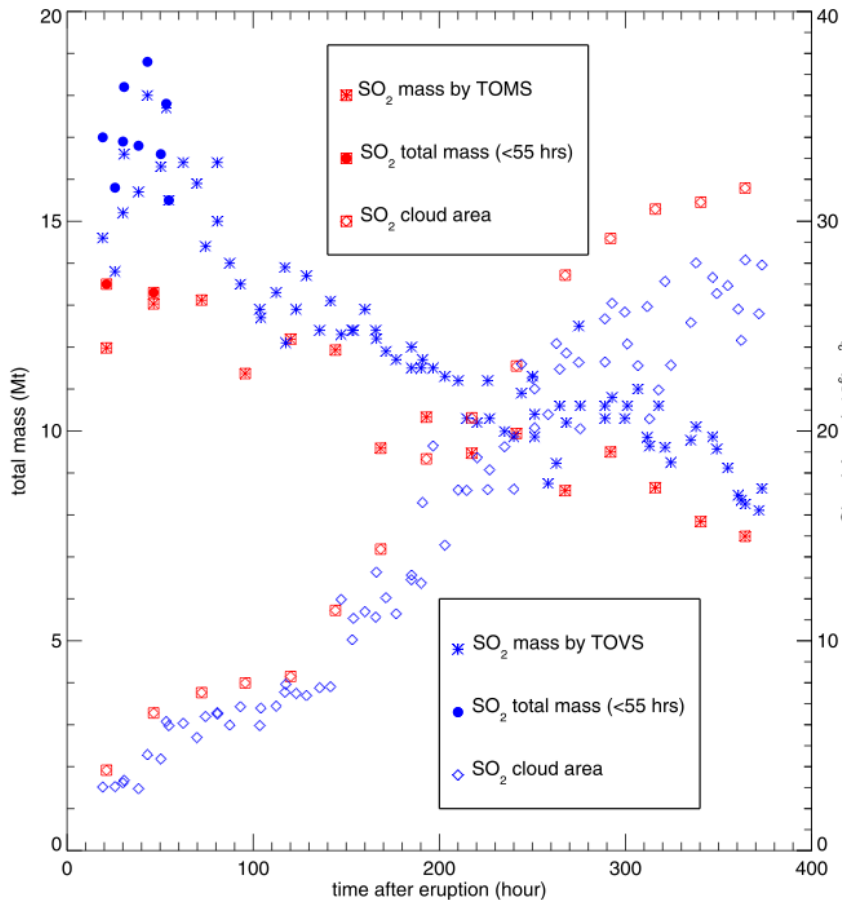


Vertical cross section along flight track

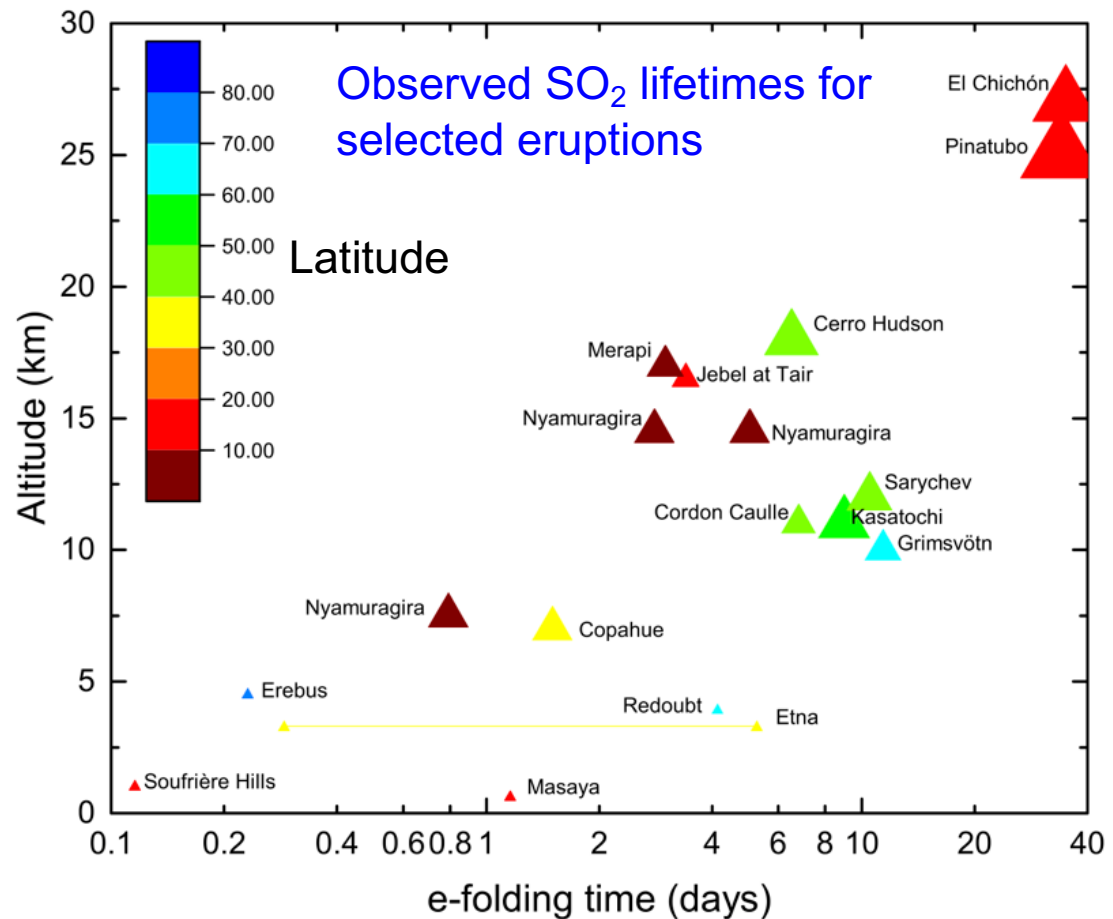


- Geostationary satellite data used to estimate volcanic ash source term, and simulate location of aircraft encounter that was not directly observed

Evolution of SO₂ mass after volcanic eruptions



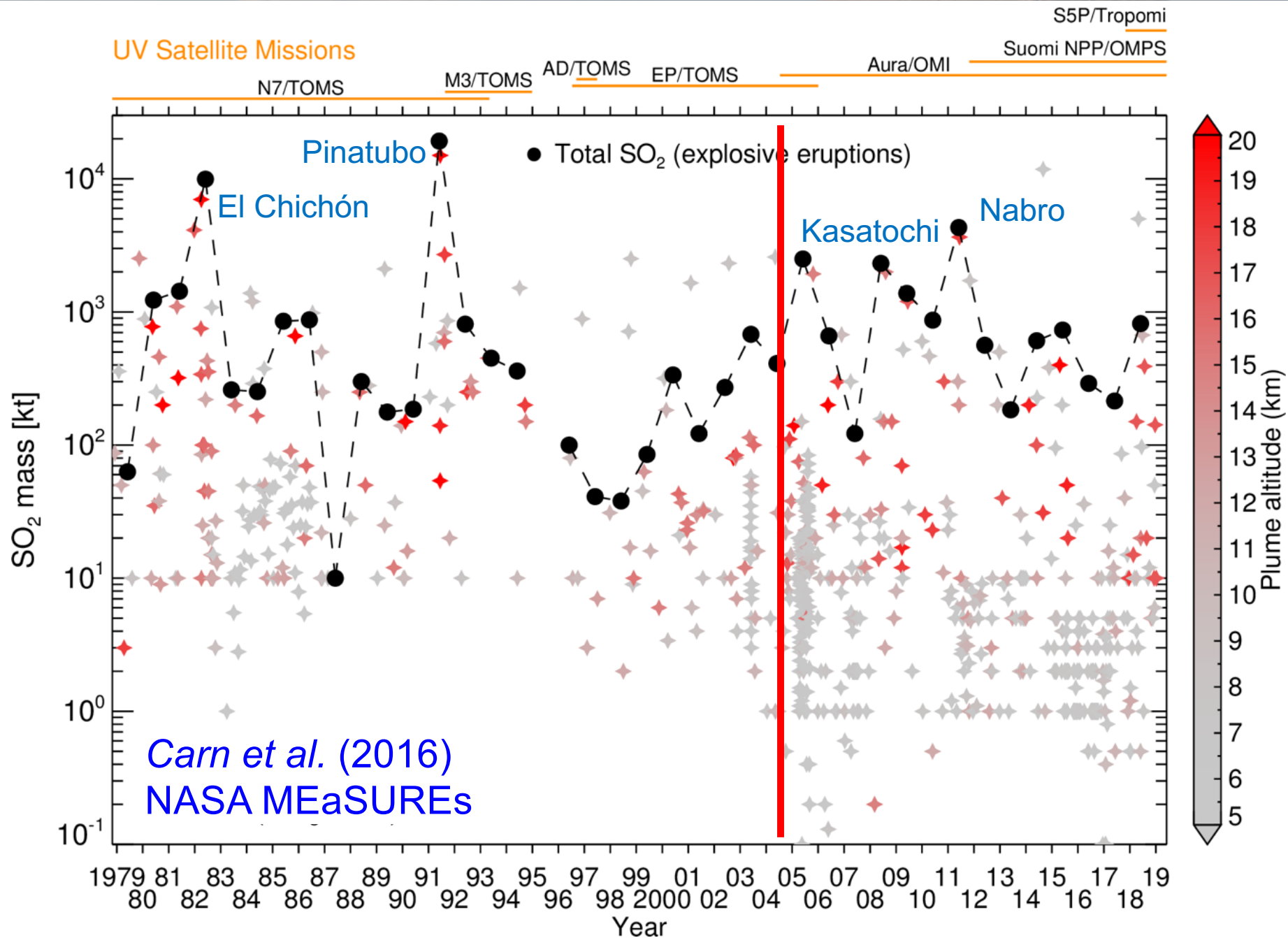
1991 Pinatubo SO₂ mass evolution from TOMS and TOVS (*Guo et al., 2004*)



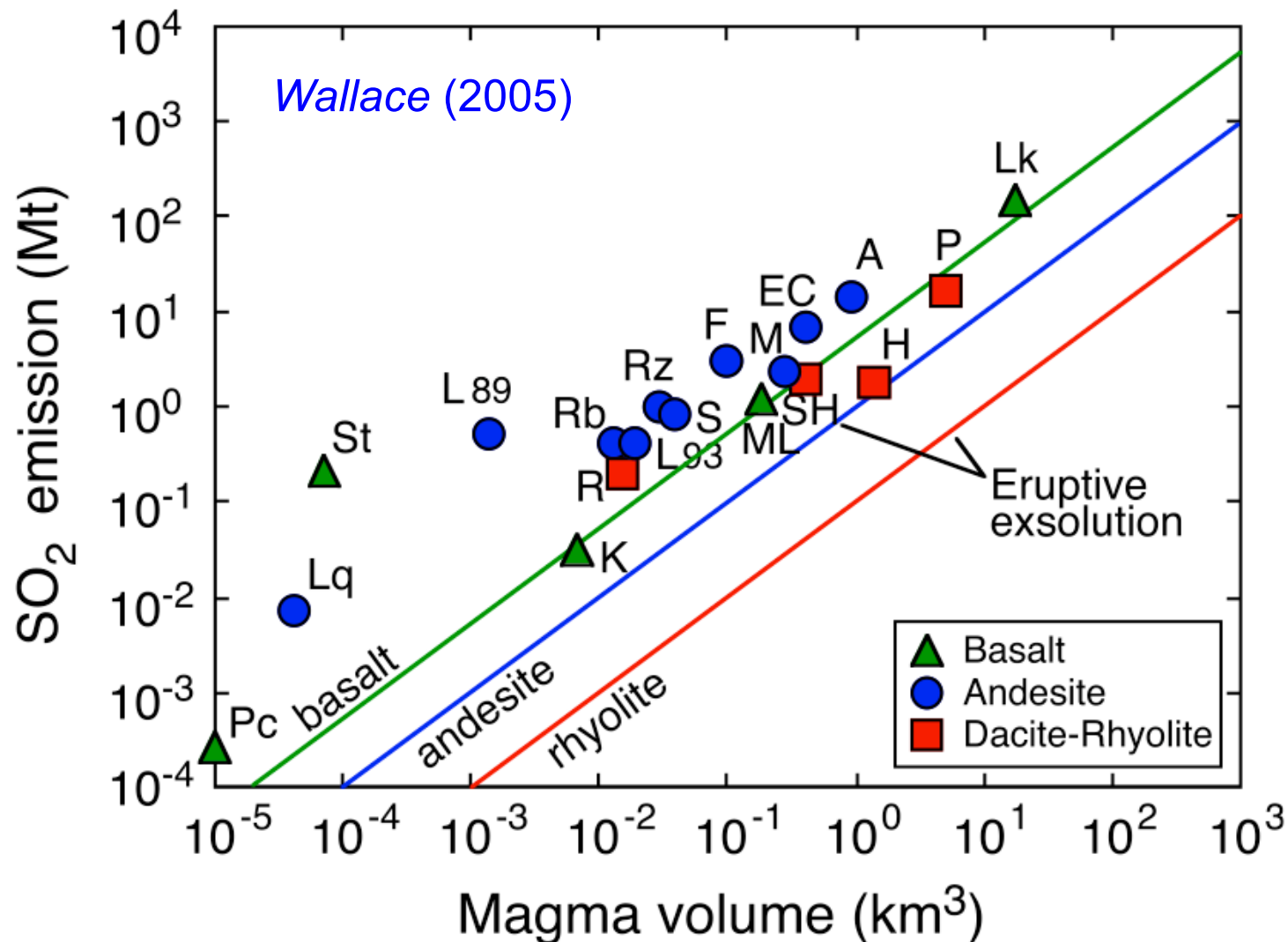
Carn et al. (2016)

- A '2nd day' SO₂ mass peak is sometimes observed; possible reasons include:
 - Oxidation of co-erupted H₂S to SO₂ (*Bluth et al., 1995*)
 - Optically thick fresh plume partially masks detection of SO₂ (*Bluth et al., 1995*)
 - Release of gas-phase SO₂ from SO₂ - ice - ash mixtures (*Textor et al., 2003*)
- e-folding time of volcanic SO₂ used to test chemical schemes in climate models

Eruptive volcanic SO₂ emissions (1978-2018)

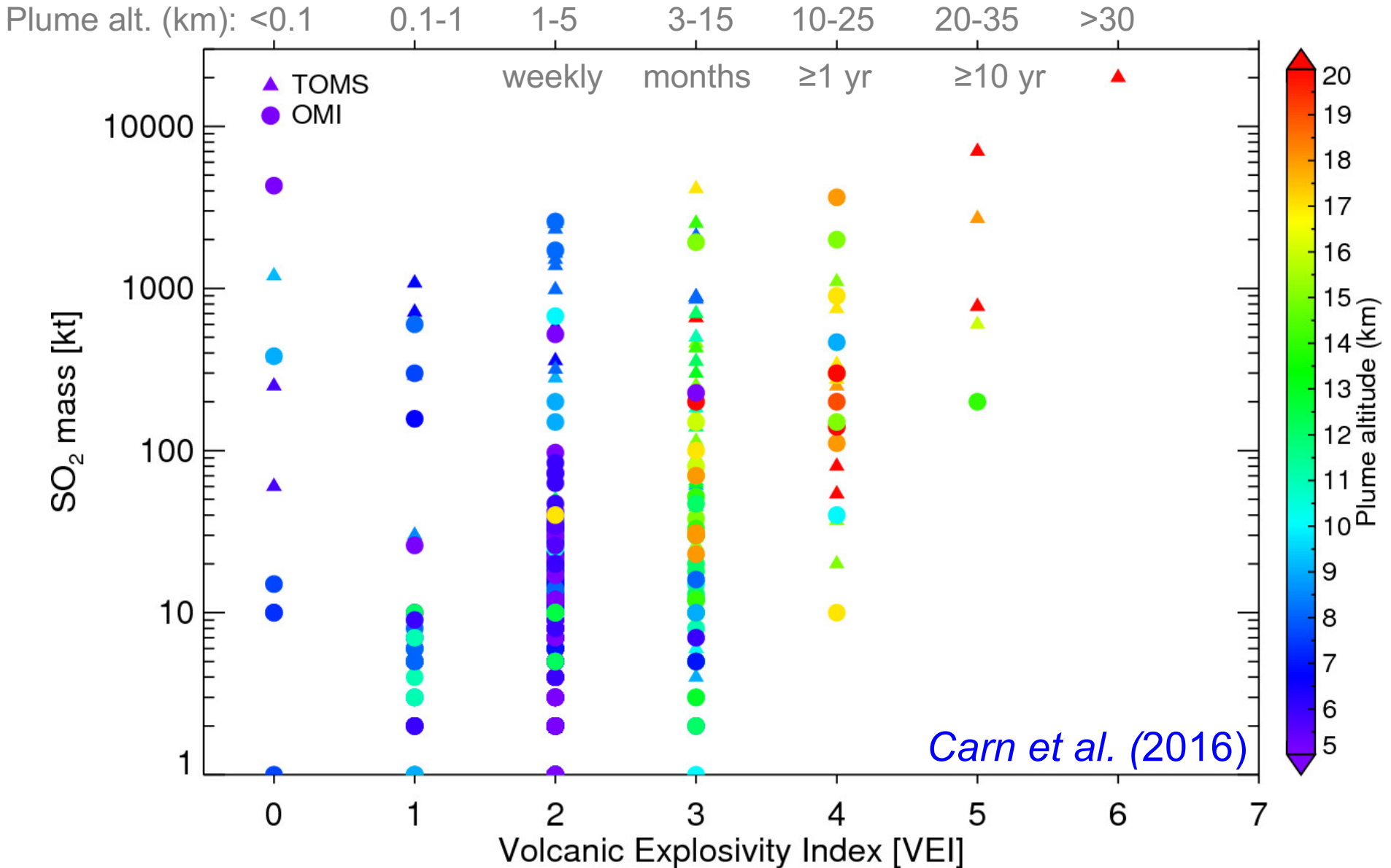


Excess sulfur in volcanic eruptions



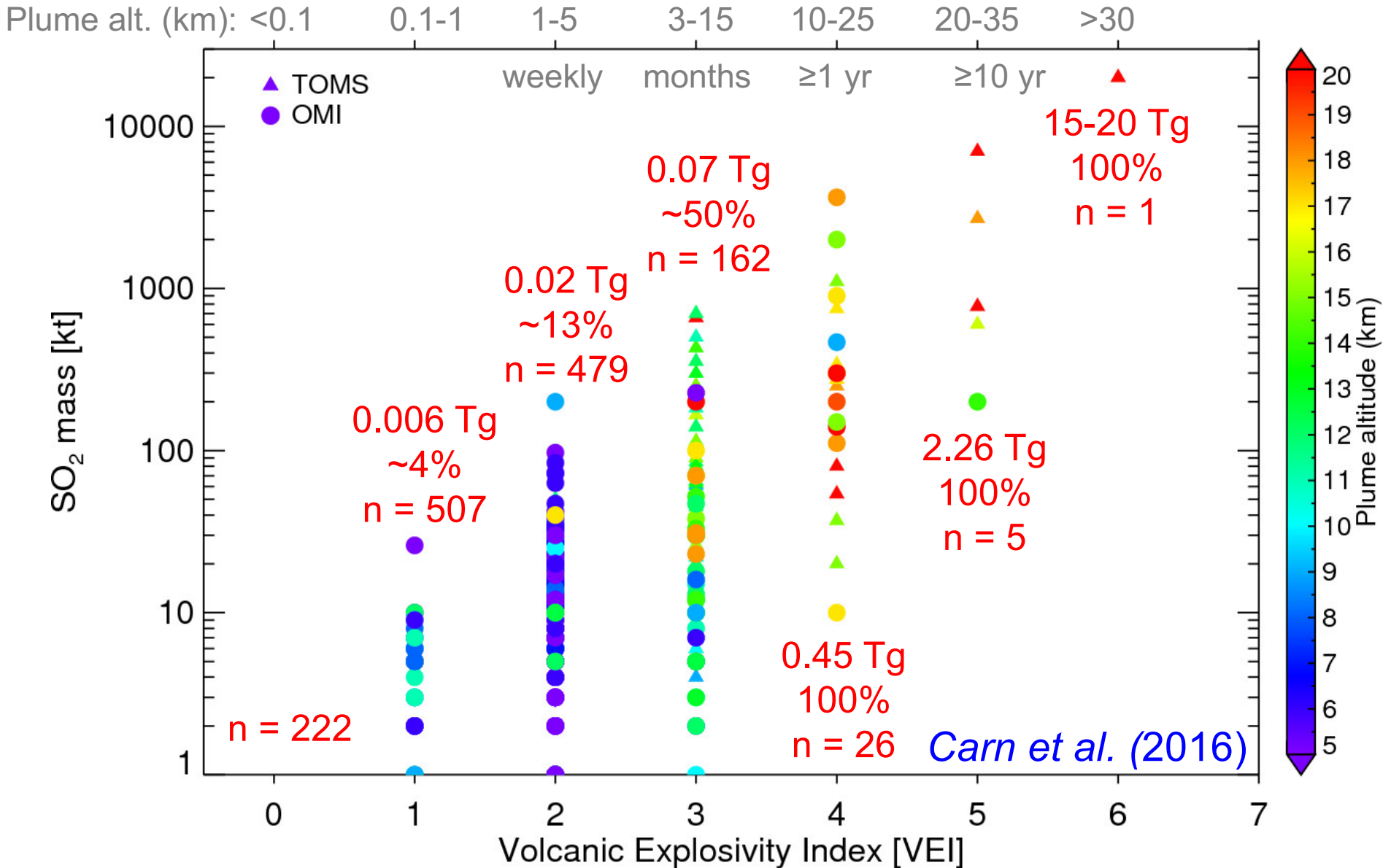
- Satellite data revealed disconnect with the 'petrological method'
- Now widely attributed to existence of pre-eruptive vapor phase in magmas
- Distribution of this vapor phase impacts eruption sulfur yield

SO₂ emissions vs. Volcanic Explosivity Index (VEI)



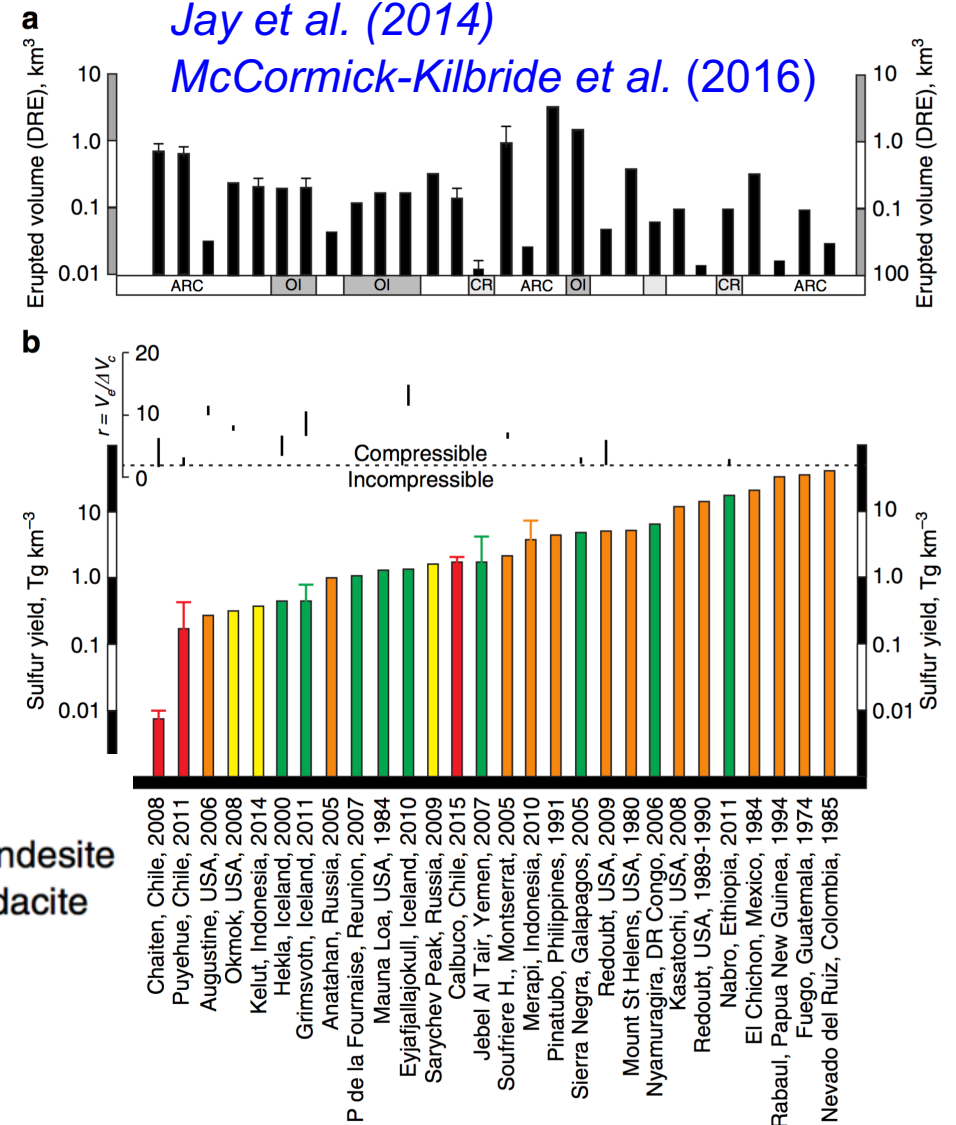
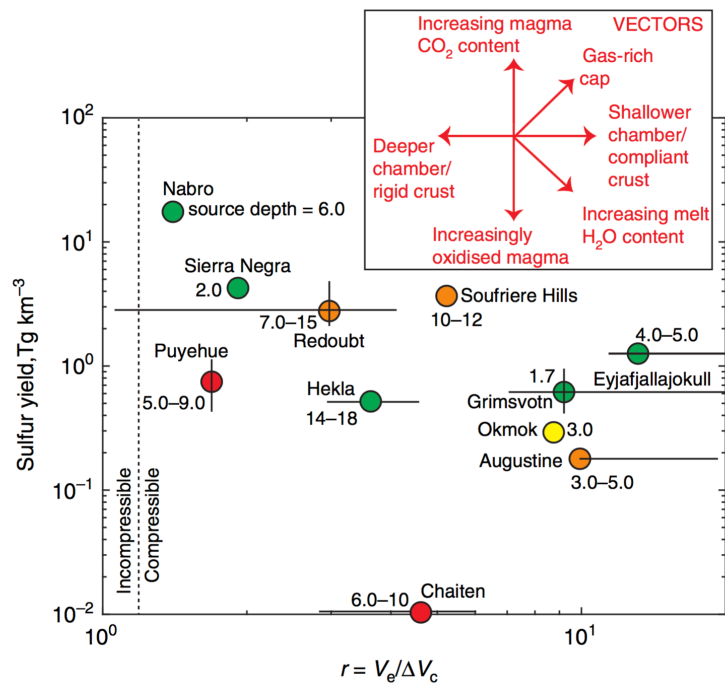
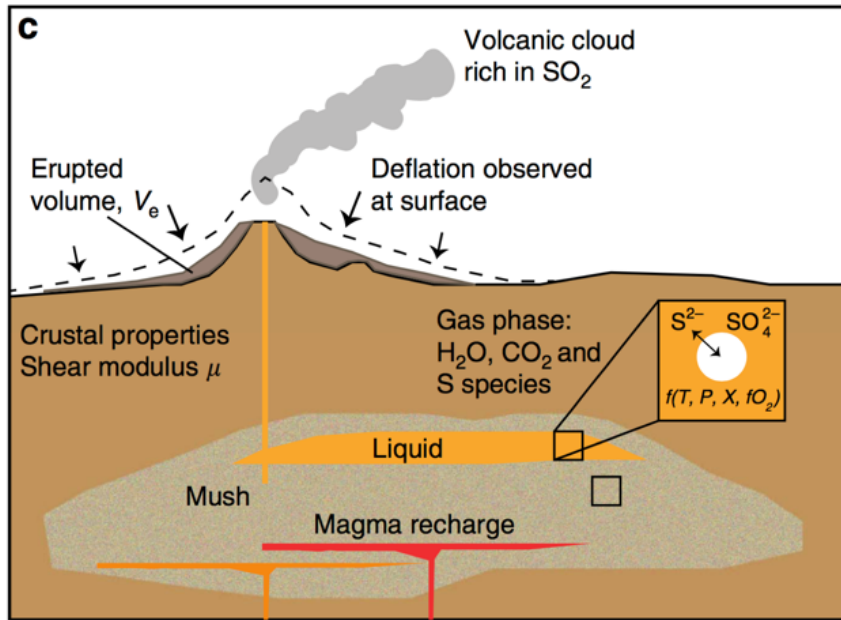
- Eruption VEIs from Smithsonian Global Volcanism Program database (VOTW 4.0)
- SO₂ data from TOMS, OMI, OMPS, AIRS, HIRS satellite measurements

SO₂ emissions vs. VEI (explosive eruptions)



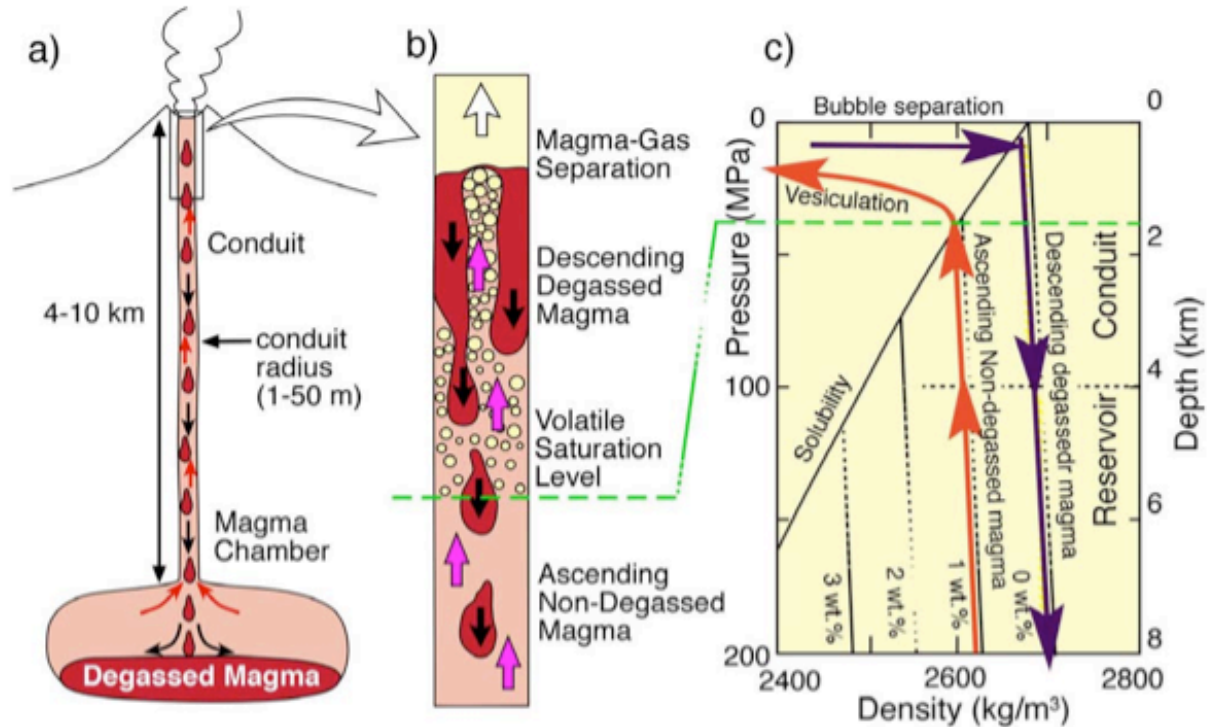
- Broad correlation between explosive SO₂ emissions and VEI, but large scatter
- May reflect release of variable amounts of pre-eruptive vapor during eruptions

Impact of magma compressibility on deformation



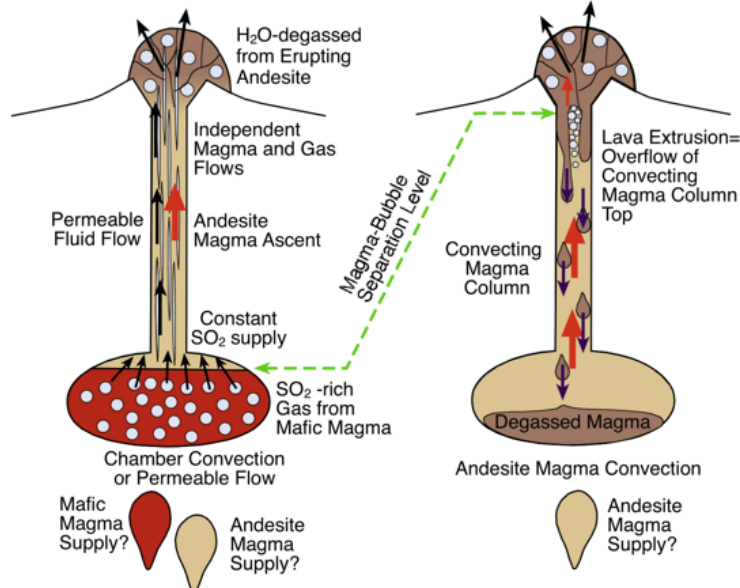
- $r = \text{erupted volume} / \text{obs. deformation}$
- Not only SO₂ contributing to compressibility
- Precursors to major SO₂-producing eruptions?

Passive volcanic degassing



a) Permeability Controlled Volcanic Gas Emission

b) Magma Convection Driven Volcanic Gas Emission



- On average, ~80-90% of volcanic SO₂ emissions emitted by passive (non-eruptive) degassing
- Significant environmental and health impacts
- Conduit convection or permeable conduit models usually invoked to explain high gas fluxes
- Only consistently detectable from space relatively recently (post-2004; Ozone Monitoring Instrument)

Kazahaya et al (1994); Shinohara (2008)

Global volcanic SO₂ emissions inventories

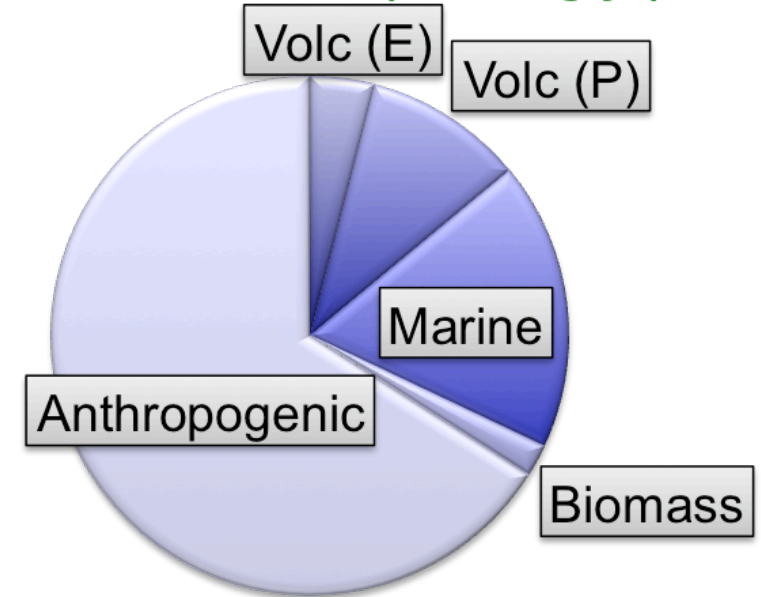
A time-averaged inventory of subaerial volcanic sulfur emissions

R.J. Andres and A.D. Kasgnoc

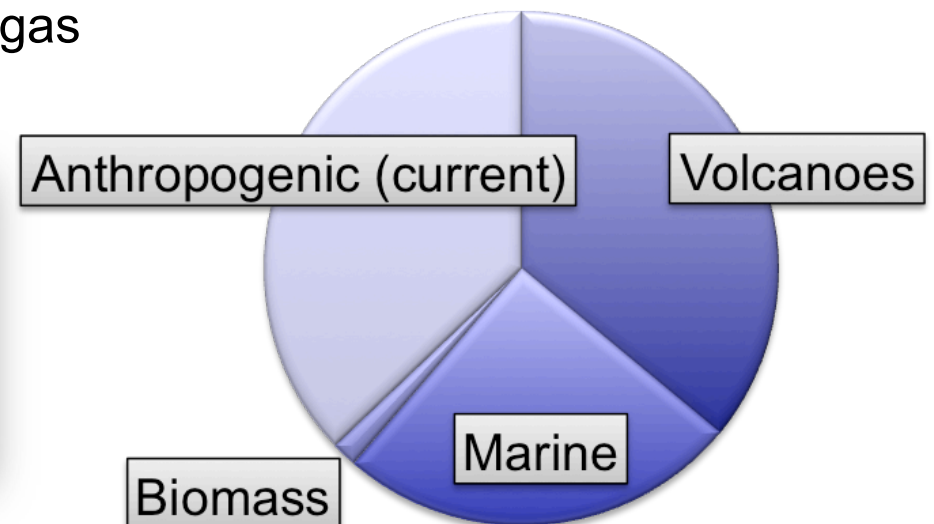
Institute of Northern Engineering, University of Alaska Fairbanks

- Volcanic degassing 'source term' in atmospheric chemistry and climate models
- Climate impact of tropospheric volcanic emissions (sulfate aerosol)
- Estimation of global fluxes of other volcanic gases (e.g., CO₂) and trace metals (e.g., Hg)
- Identifying potential field sites for volcanic gas studies

Sulfur emissions (~100 Tg/yr)



Sulfate burden



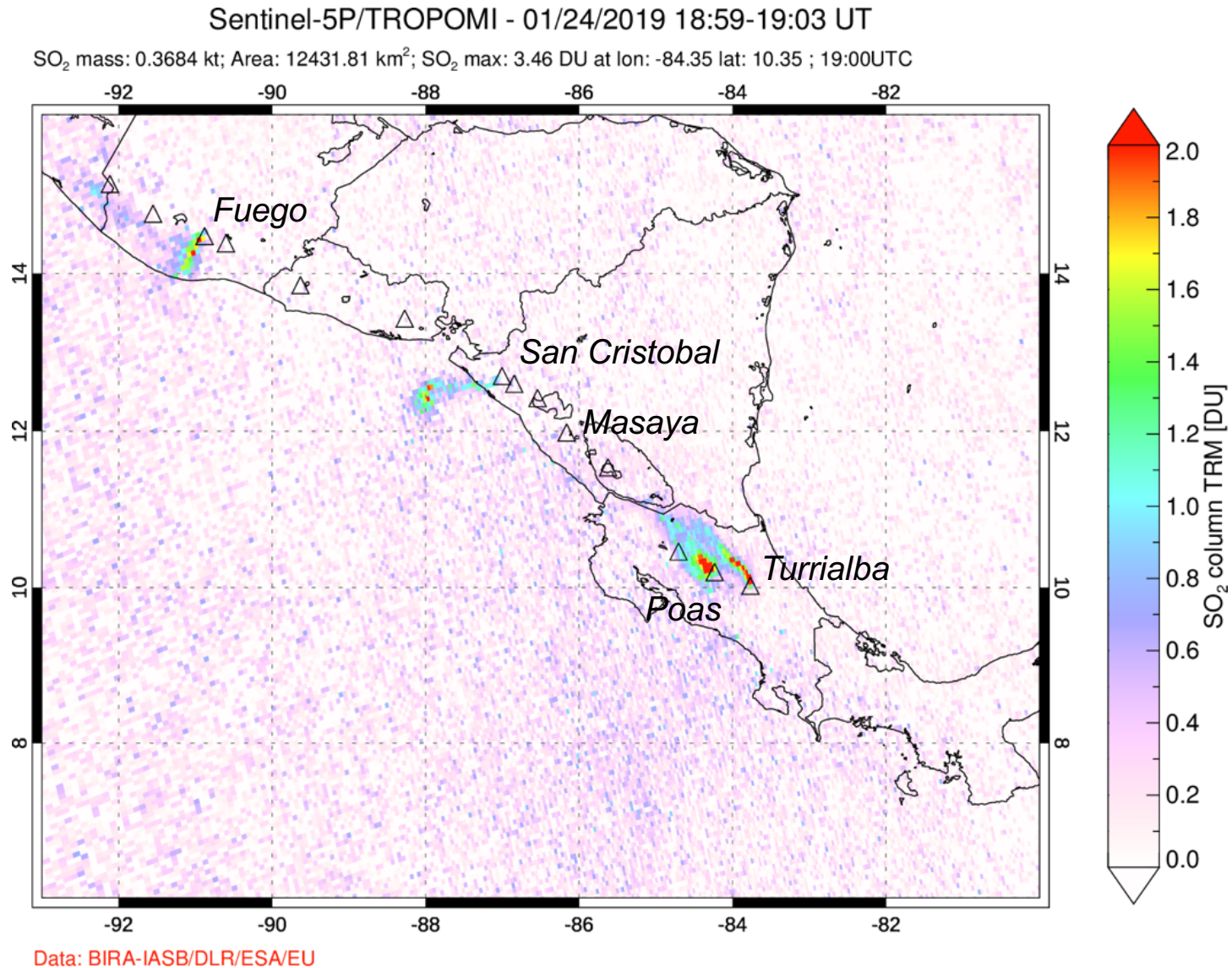
SCIENTIFIC REPORTS

OPEN

A decade of global volcanic SO₂ emissions measured from space

S. A. Carn¹, V. E. Fioletov², C. A. McLinden², C. Li^{3,4} & N. A. Krotkov⁴

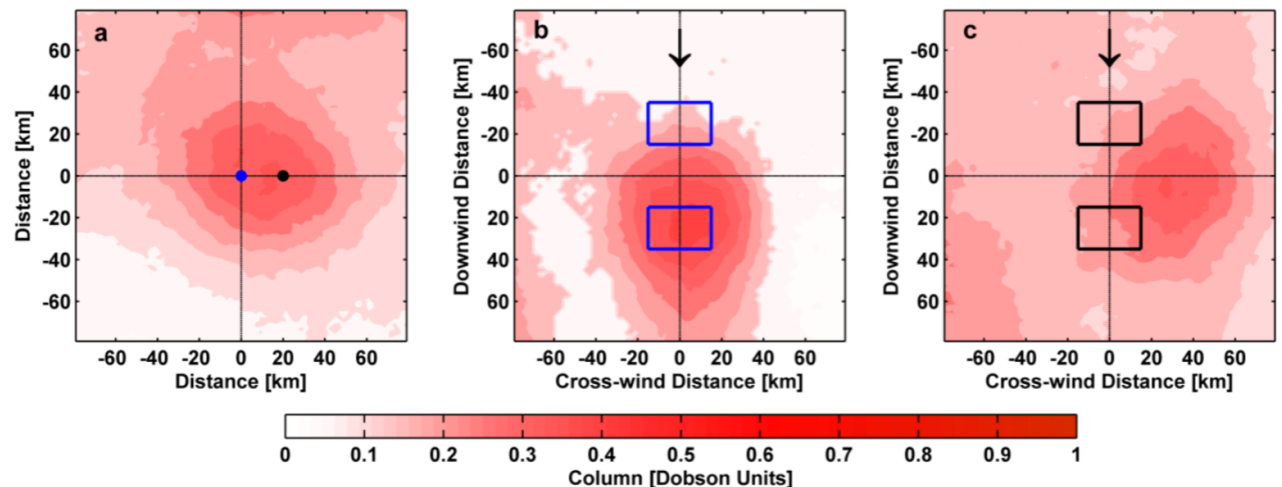
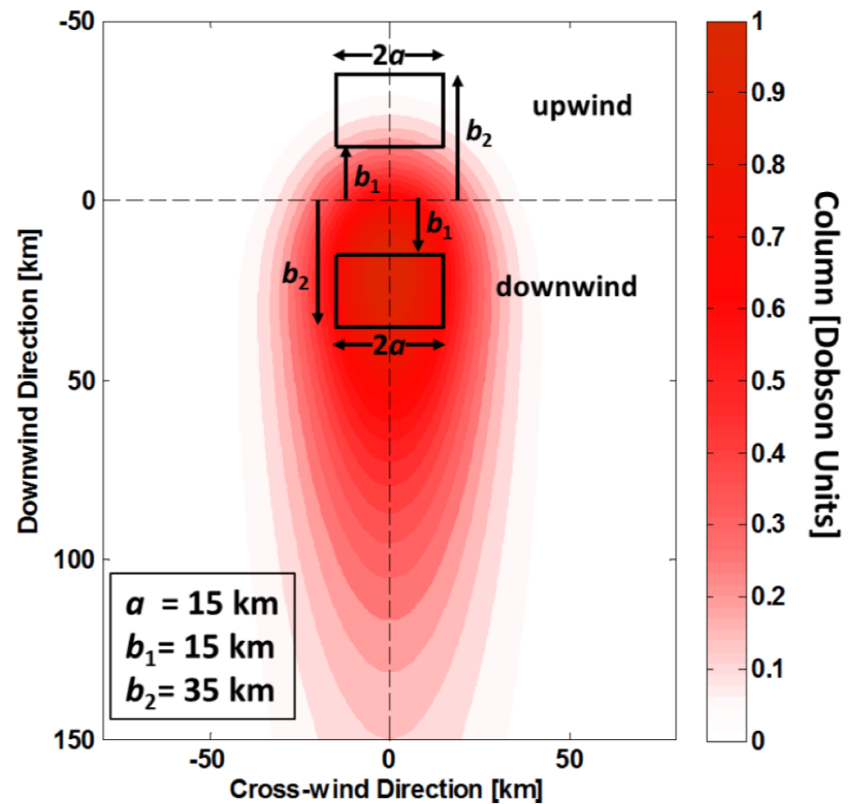
Passive volcanic degassing from space



- Plumes from strong SO₂ emitters (100s-1000s tons/day) visible on a daily basis in satellite data
- Detection of weaker degassing sources requires time-averaging – but simple data ‘stacking’ less effective if wind direction is variable

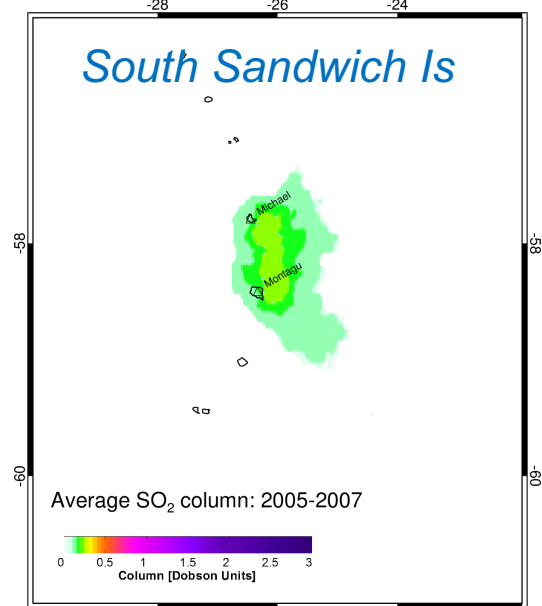
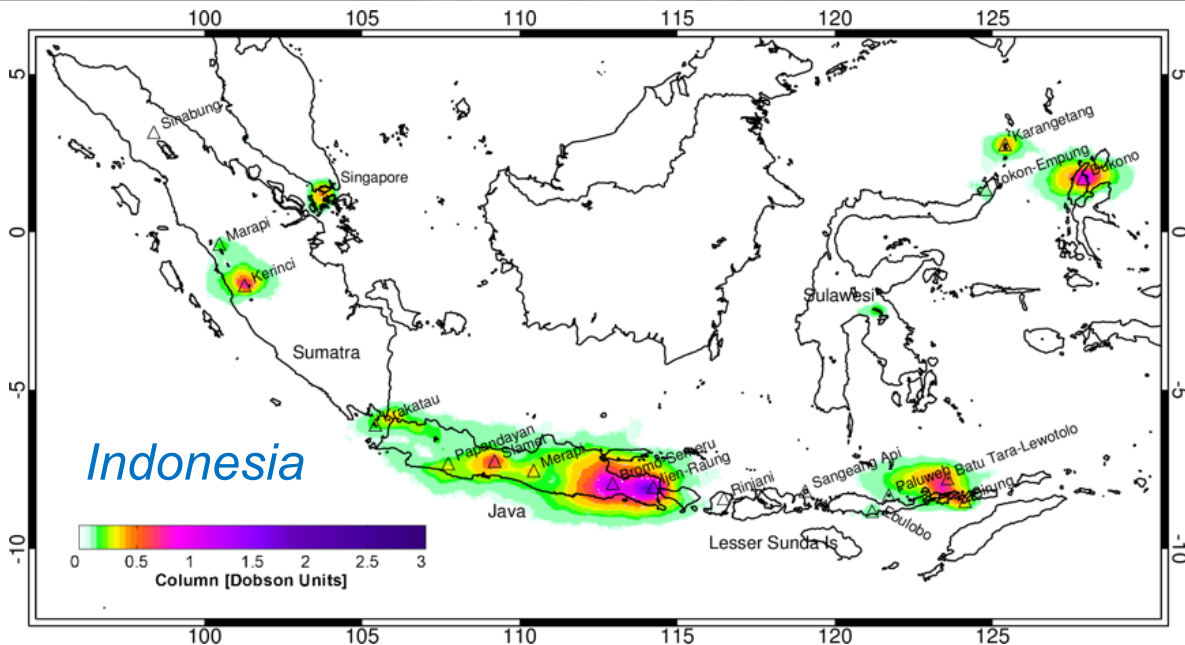
SO₂ source ID and emission estimation

- 3-year averages (e.g., 2005-2007) of global NASA Ozone Monitoring Instrument (OMI) SO₂ data
- Spatial smoothing and wind rotation techniques (upwind – downwind difference) used to identify SO₂ sources (volcanic and anthropogenic)
- Exponentially-modified Gaussian fit to average SO₂ plume to estimate annual mean SO₂ flux for each source
- Detection limit of ~16-30 tons/day SO₂



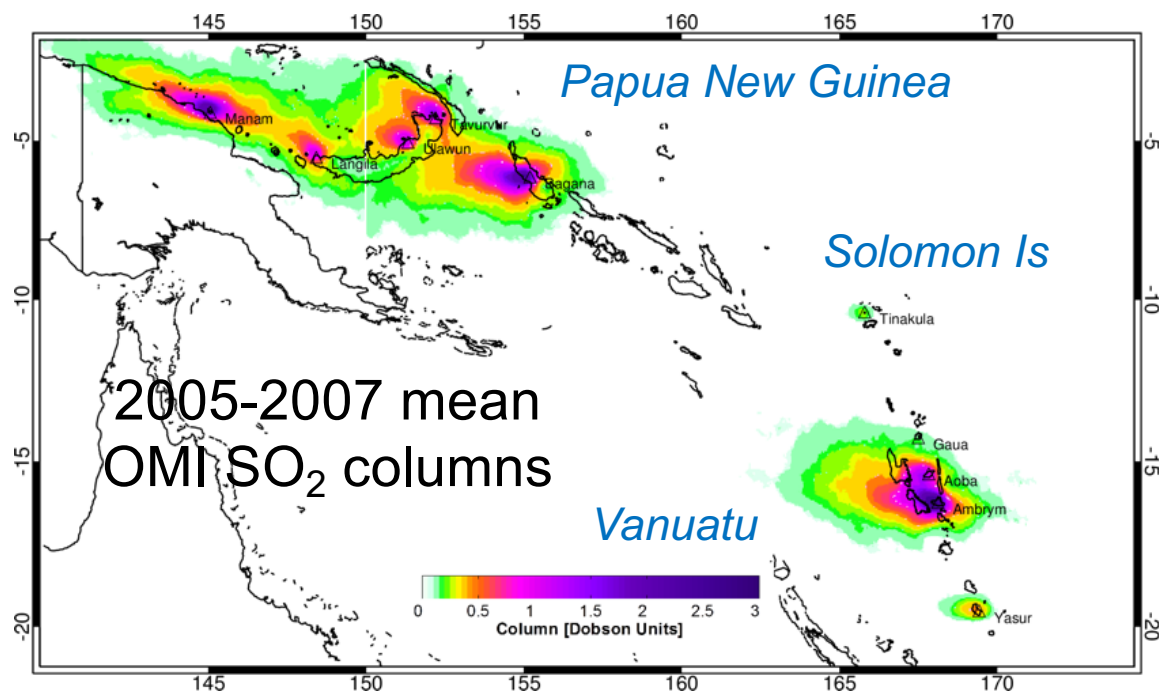
Fioletov et al. (2011, 2015, 2016)
McLinden et al. (2016)

New global volcanic SO₂ emission inventory

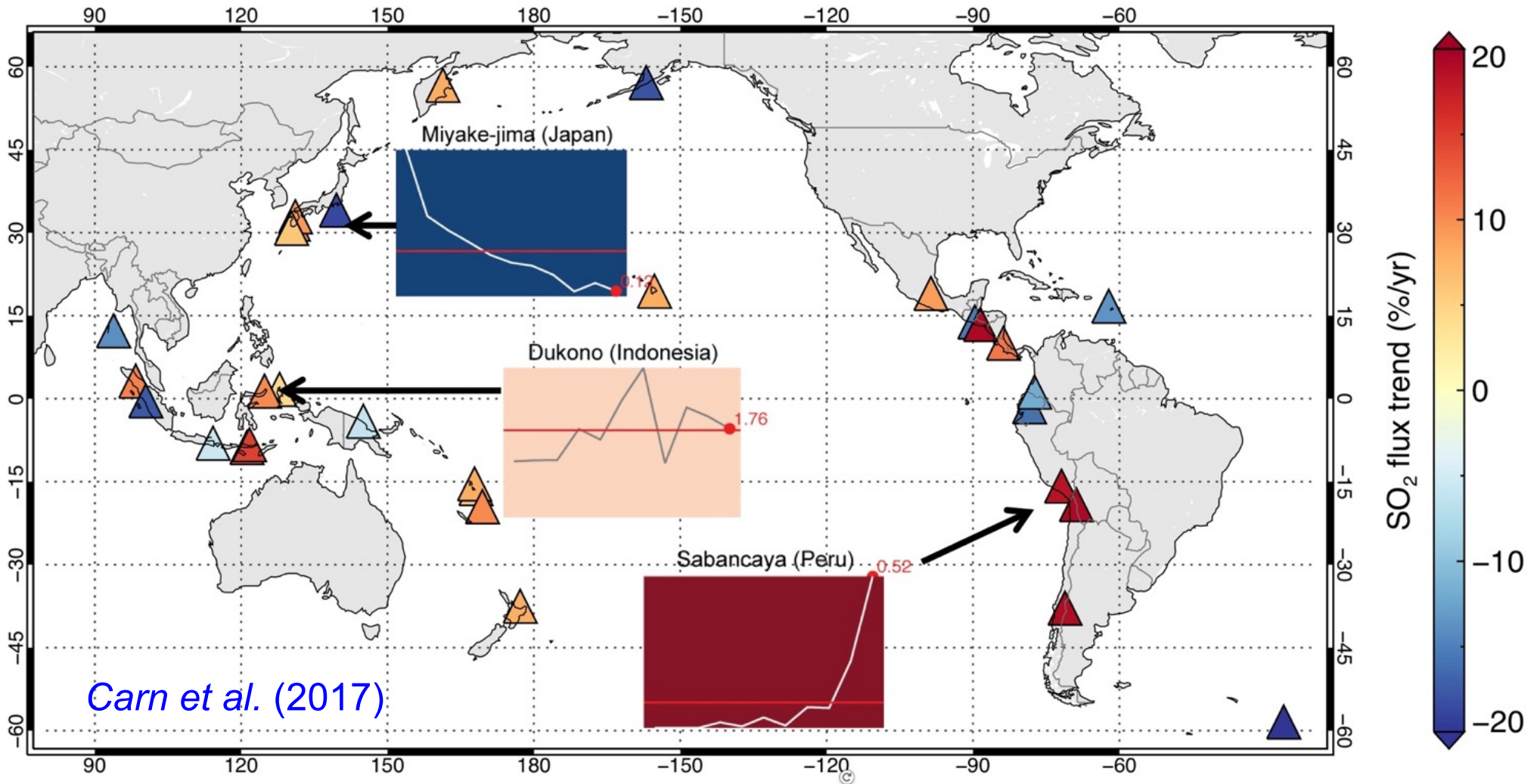


- Globally, 90-100 volcanic SO₂ sources quantified (10-20% 'new')
- Total SO₂ flux of 23±2 Tg/yr (~63 kt/day); ~80-90% of total SO₂ flux from passive + eruptive degassing
- Lowest flux: ~32 t/d; could be extended to weaker sources with new Sentinel-5P/TROPOMI data

Carn et al. (2017)

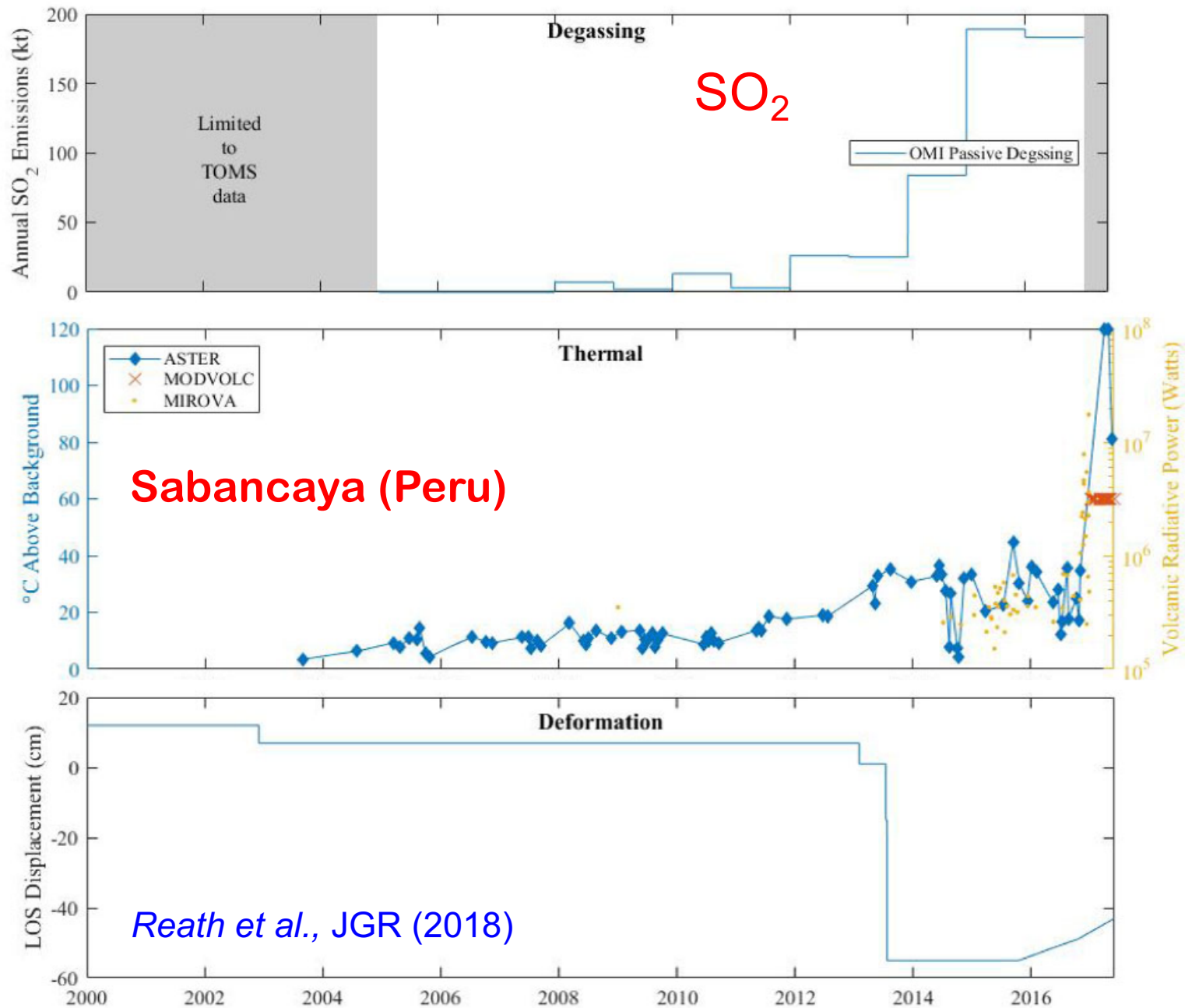


Trends in tropospheric volcanic SO₂ emissions

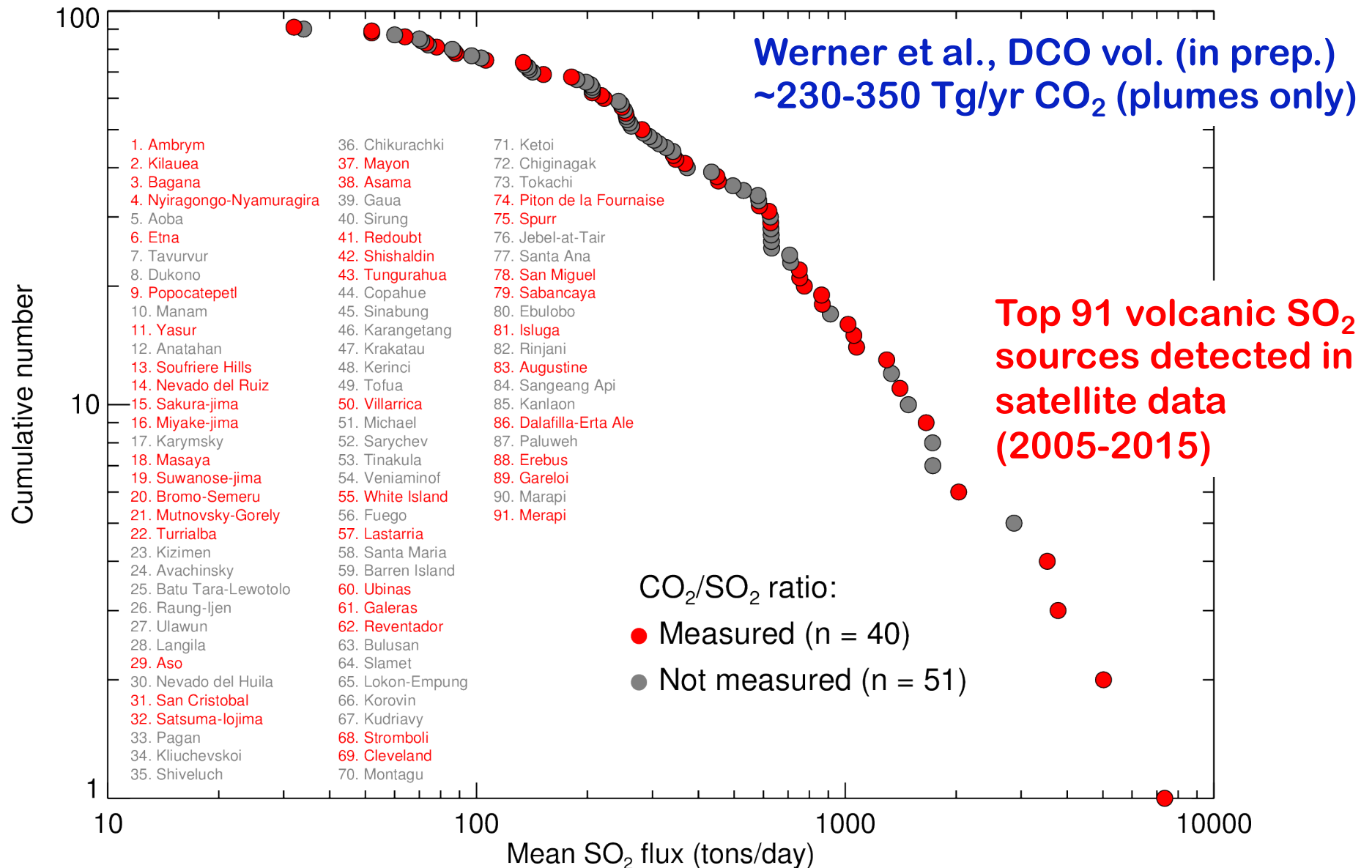


- ~30% of volcanic SO₂ sources show significant +/- decadal trends in emissions
- ~80% of sources also erupted during the decade (eruption VEIs below 4)
- New insight into volcanic life cycles?

Multi-parameter perspective on volcanic unrest

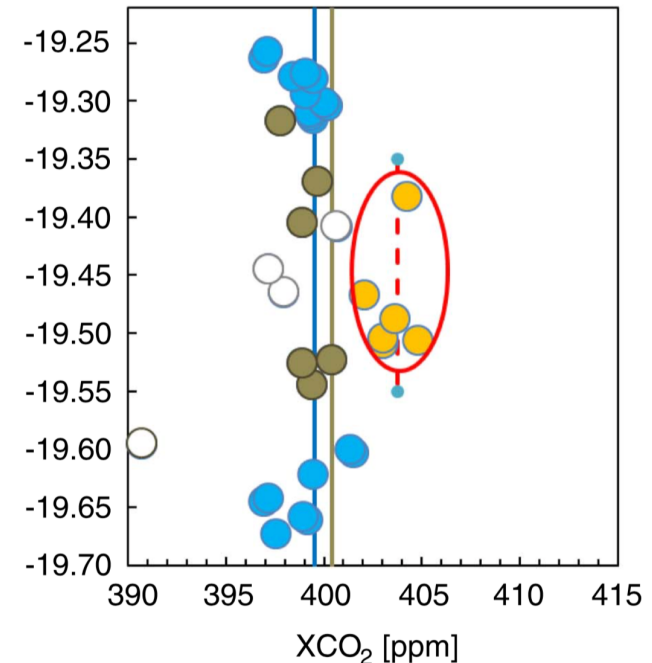
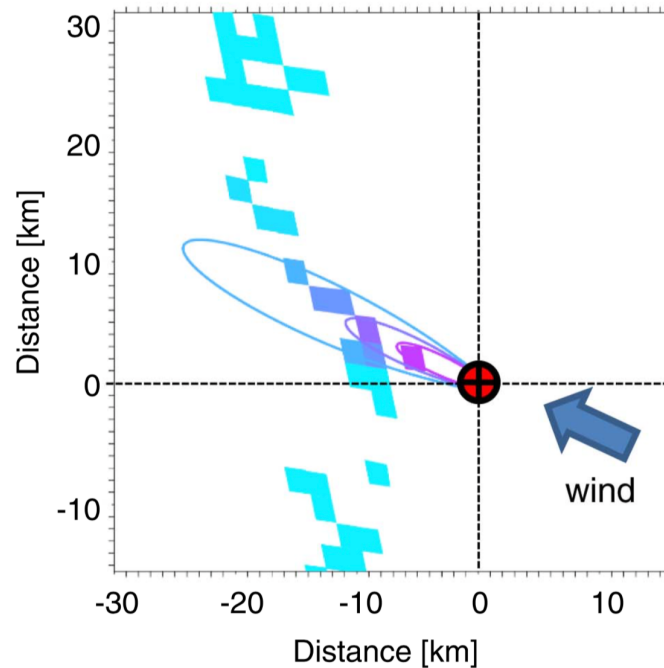
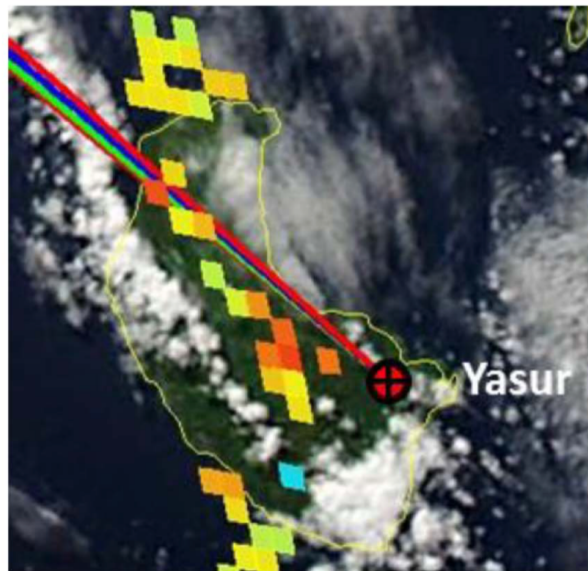


Improved estimates of volcanic CO₂ emissions

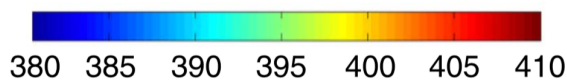


- CO₂/SO₂ ratios measured at many of the strongest SO₂ sources
- ~50% of SO₂ sources still lack CO₂ data (see *Aiuppa et al.*, ESR, 2017)

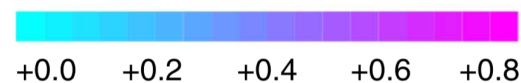
Detection of passive volcanic CO₂ emissions



Mean dry air column concentration XCO₂ [ppm]



Excess CO₂ relative to background [%]

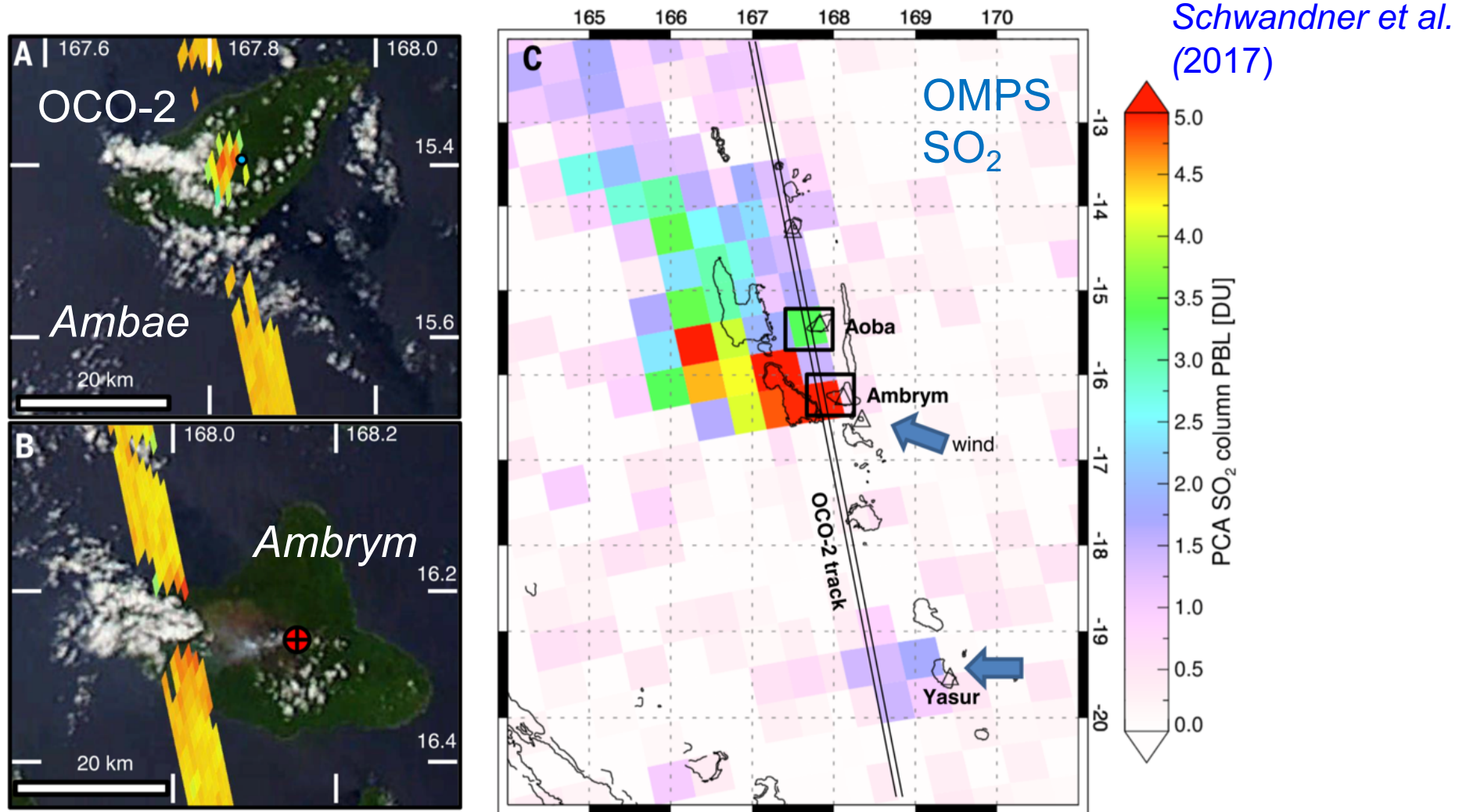


● Land ● Ocean ● Plume

Schwandner et al. (2017)

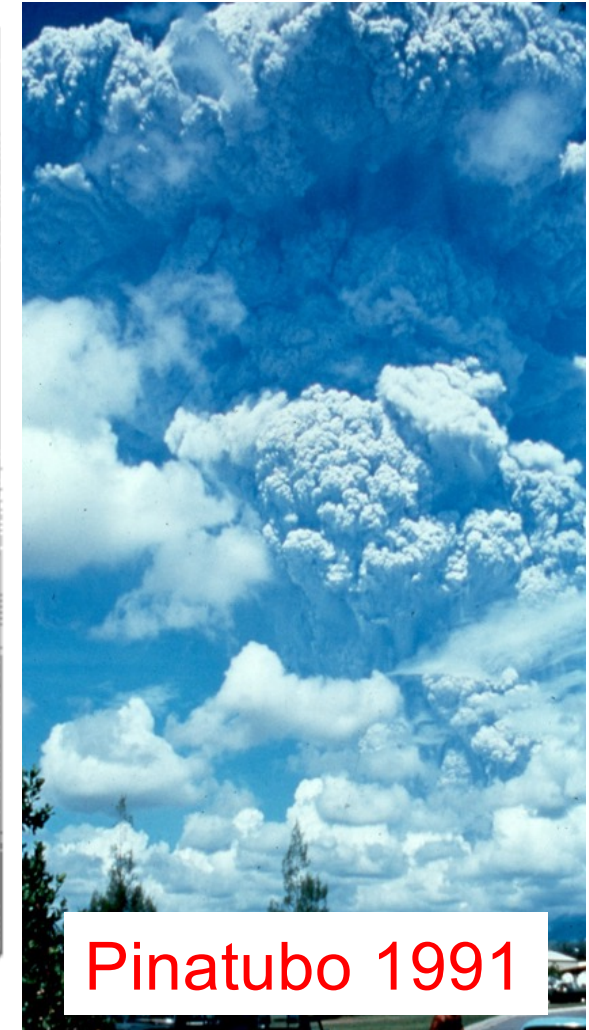
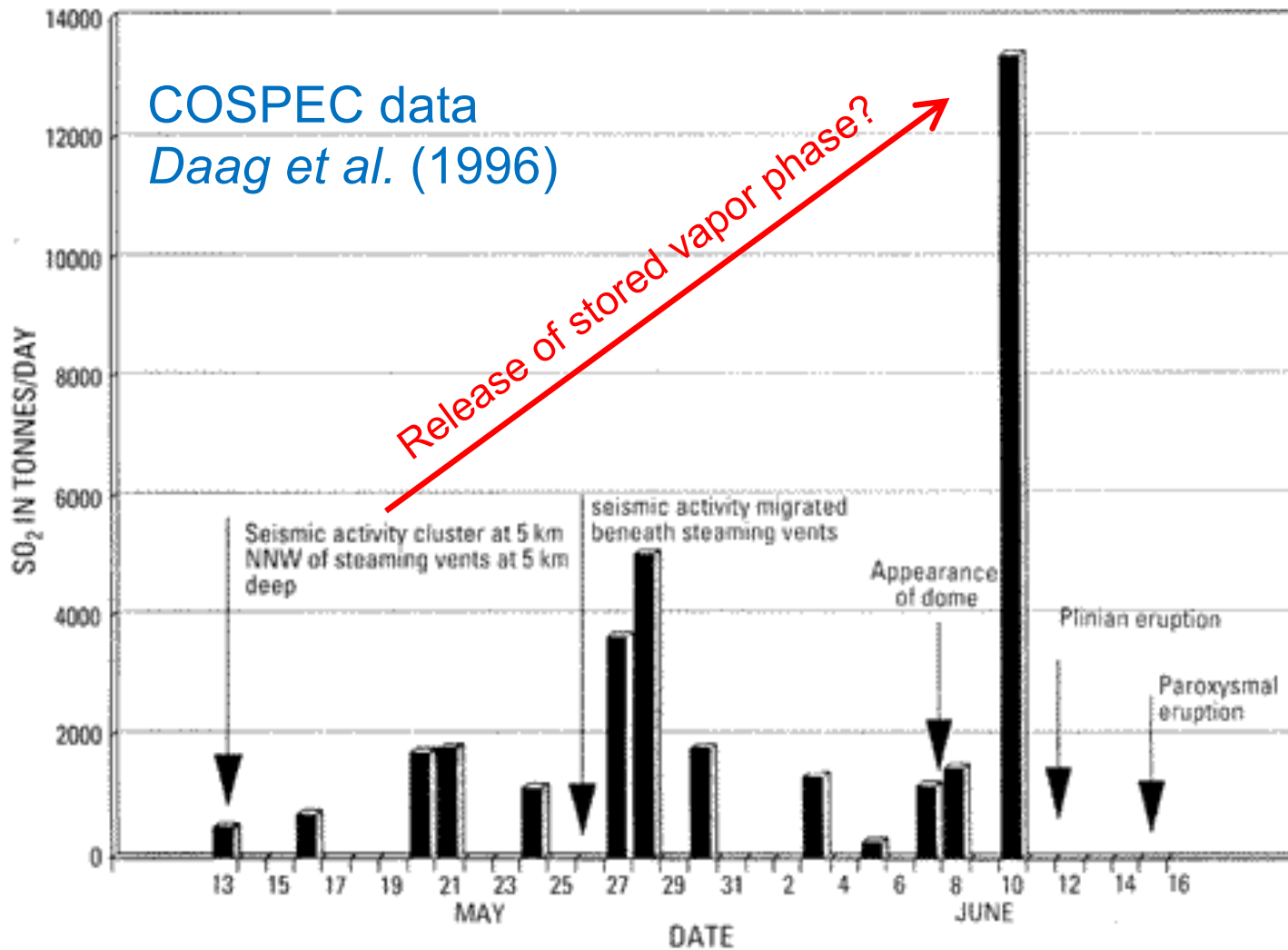
- Due to its lower solubility in magmas, CO₂ is likely a more reliable volcanic eruption 'precursor' than SO₂, but much more difficult to detect from space
- CO₂ sensing satellites include the NASA Orbiting Carbon Observatory-2 (OCO-2) and the Japanese Greenhouse Gases Observing Satellite (GOSAT)
- Spatial coverage is poor and measurement precision is a few ppm CO₂
- One (known) successful detection of volcanic CO₂ emissions at Yasur (Vanuatu)

Detection of passive volcanic CO₂ emissions



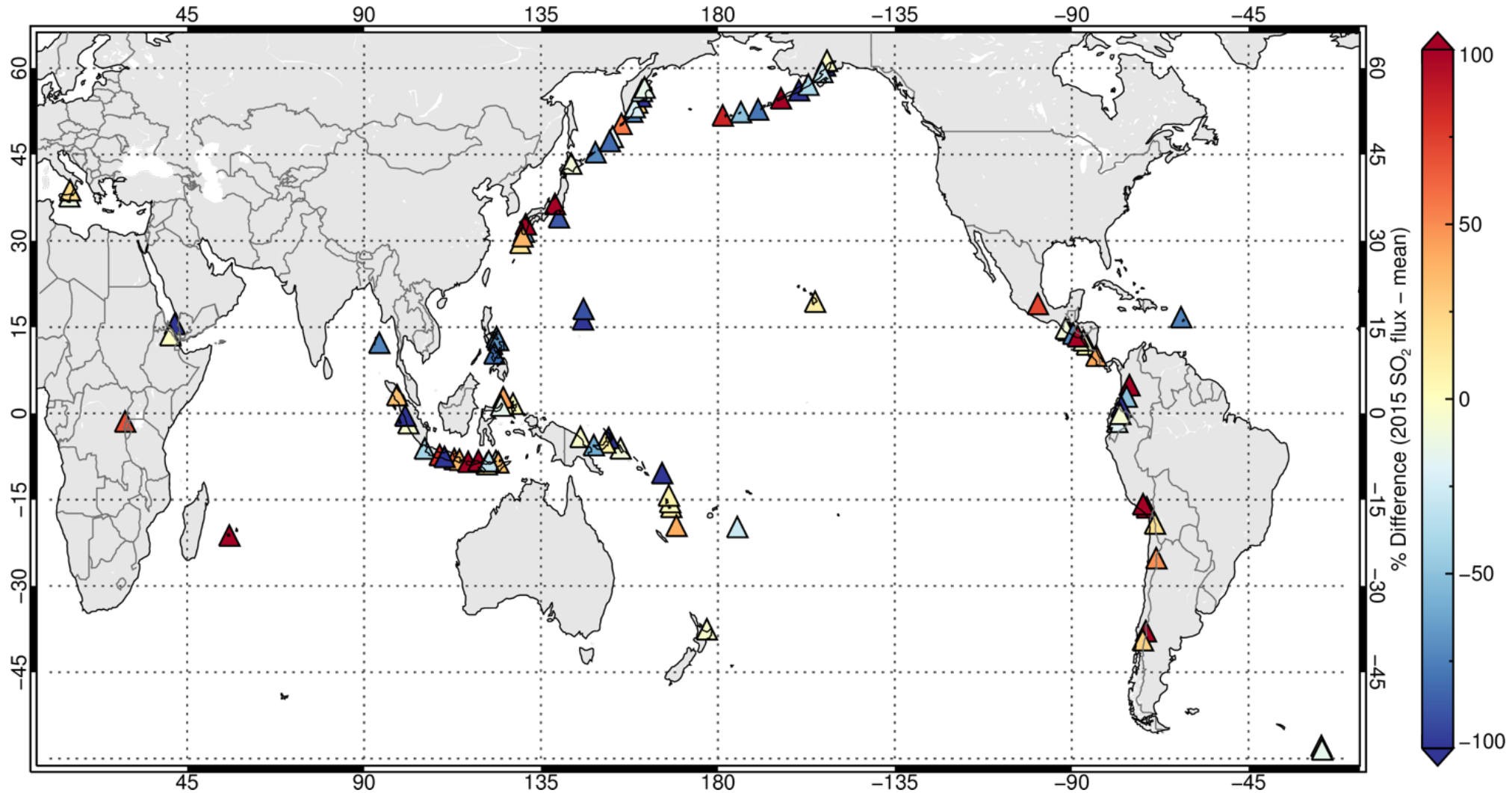
- Orbiting Carbon Observatory-3 (OCO-3) was deployed on the International Space Station in May 2019. Can be pointed at targets ('stare mode') such as volcanoes.
- Proxy methods for CO₂ (e.g., based on vegetation impacts) may be a useful alternative to direct measurement

Do 'pre-eruptive' volcanic SO₂ emissions actually happen?



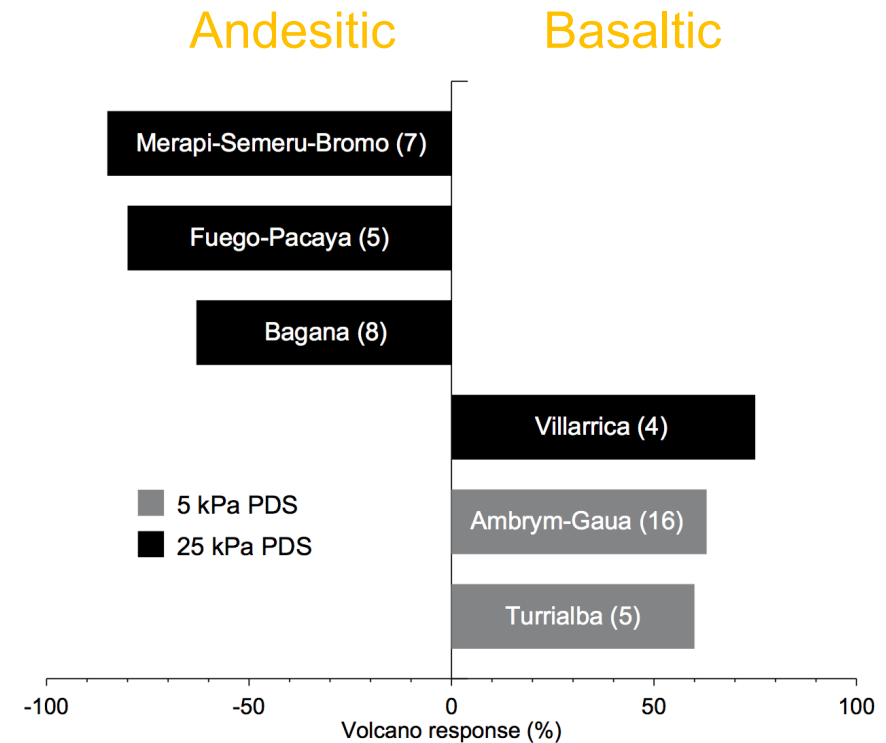
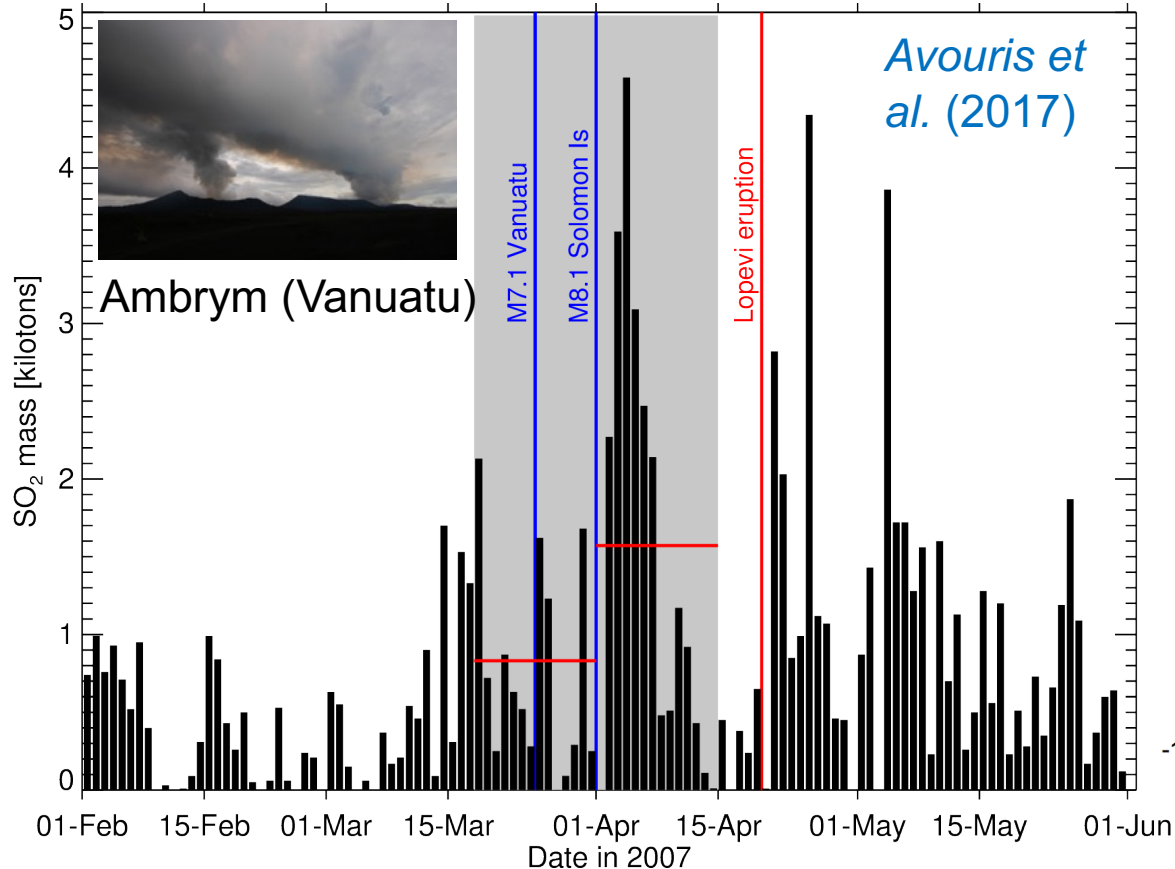
- Gas data generally subordinate to seismicity and deformation as a volcanic unrest indicator, due to perceived lack of data (note also that CO₂ more useful than SO₂)
- Deformation is the indicator of pre-eruptive unrest that on average provides the longest lead-time prior to an eruption (*Philipson et al., 2013; Furtney et al., 2018*)

How does volcanic degassing respond to external triggers?



Distribution of volcanoes with satellite-detected passive SO₂ emissions

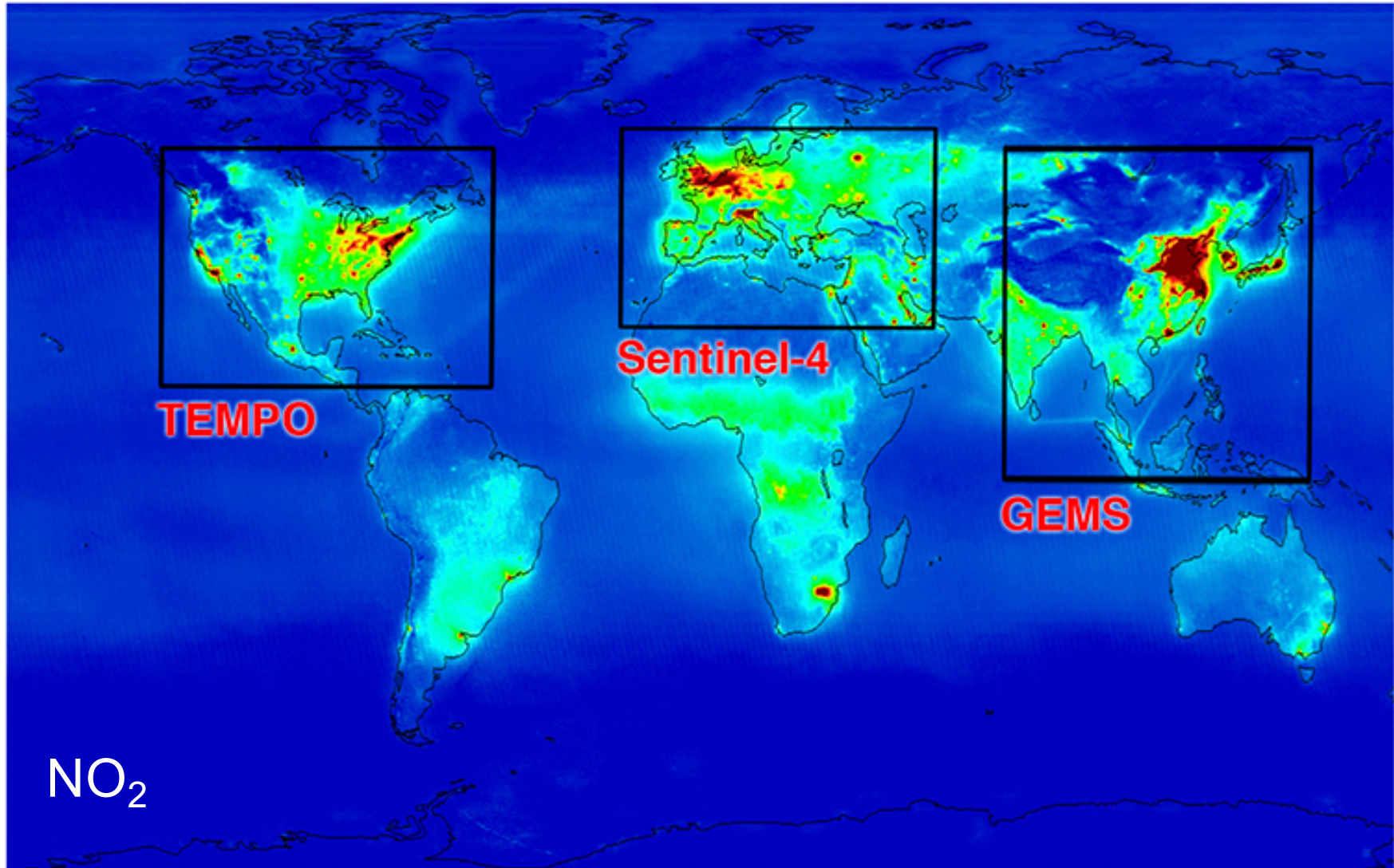
Earthquake triggering of volcanic degassing



- Long-term interest in the interactions between earthquakes and volcanoes
- Global, consistent SO₂ measurements by satellites allow monitoring of volcanic response to earthquakes more often and on larger scales
- *Avouris et al. (2017)* modeled peak dynamic stress (PDS) generated by shallow $M_w \geq 7$ earthquakes at 12 degassing volcanoes; basaltic and andesitic volcanoes showed positive (\uparrow SO₂) and negative (\downarrow SO₂) response to PDS, respectively
- Stimulated new analog modeling studies of magma sloshing, resonance etc.

Brodsky and Manga (2006); Namiki et al. (2016); Namiki et al. (2018)

The (near) future



- Geostationary UV measurements (driven by air quality)
 - Some volcanic regions covered
- Cubesat constellations (e.g., Planet Labs)

Some research questions

- **Given the measurement bias towards SO₂, what is the total volatile inventory (H₂O, CO₂, SO₂, ...) of active volcanism?**
- **What proportion of sulfur gases are scavenged in eruption columns and what processes control this? Climate vs. environmental impact.**
- **What would be the precursors to the next major, SO₂-rich eruption? NASA has a major interest in preparing observational assets.**
- **What is the mass flux of volcanic ash from active volcanism?**
- **How many volcanoes are passively degassing vs. erupting?**
- **How can we combine satellite measurements of degassing, deformation and heat flux to better understand volcanic unrest, volcanic cycles, and eruption precursors (2017-19 USGS Powell Center project)?**
- **What are the implications for models of magma migration in trans-crustal magmatic systems for observable trends in degassing?**
- **To what extent do earthquakes cause variations in degassing?**

Satellite SO₂ sensor constellation



Adapted from Brenot et al. (2014)

+ DSCOVR/EPIC, TOVS/HIRS, MSG/SEVIRI, GOES/ABI, Himawari-8/AHI