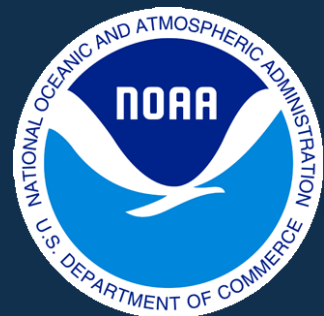




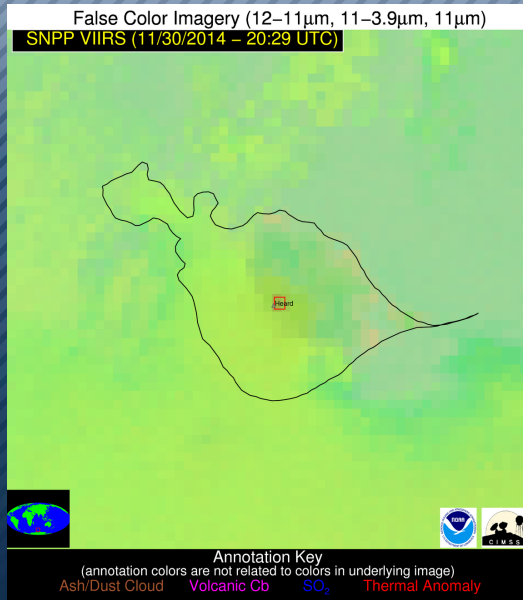
# AUTOMATED VOLCANIC CLOUD IDENTIFICATION, TRACKING, AND CHARACTERIZATION USING NEXT GENERATION METEOROLOGICAL SATELLITES



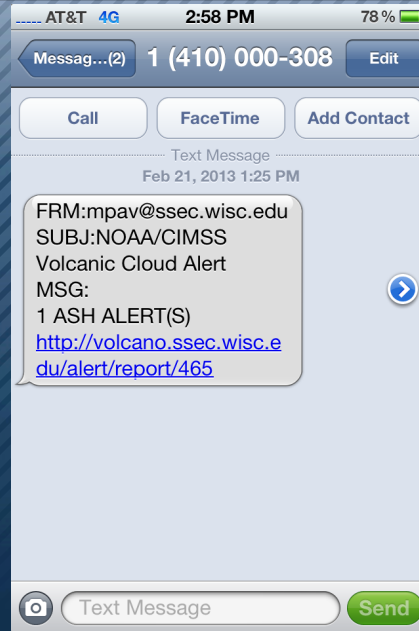
Michael Pavolonis  
NOAA/NESDIS/STAR  
**John Cintineo** and Justin Sieglaff  
UW-CIMSS

# VOLcanic Cloud Analysis Toolkit (VOLCAT)

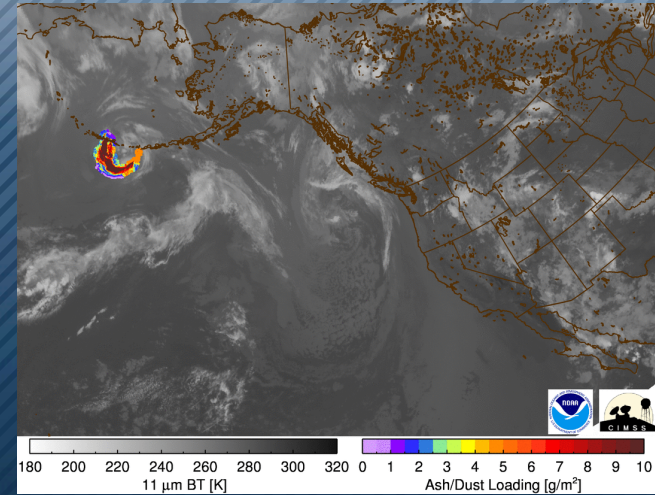
## 1). Unrest Alerts



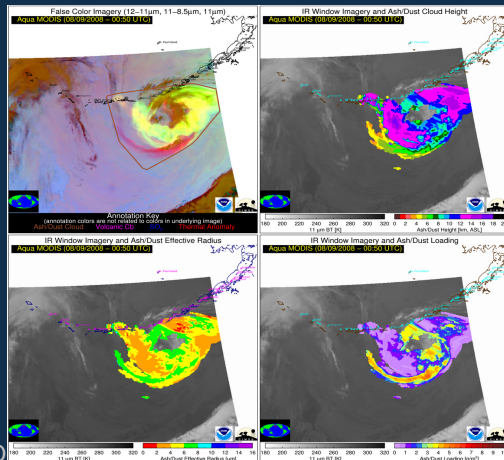
## 2). Eruption Alerts



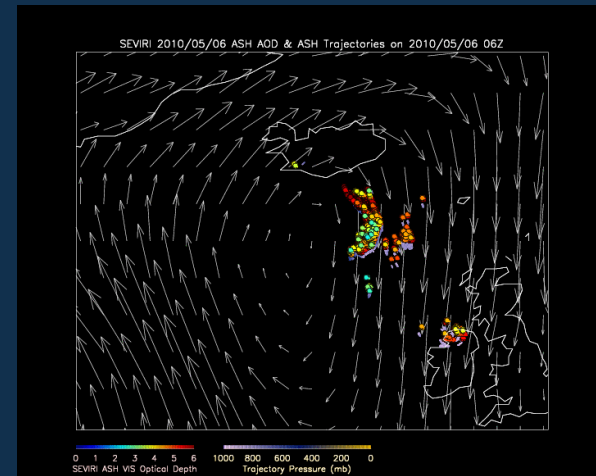
## 3). Volcanic Cloud Tracking



## 4). Volcanic Cloud Characterization



## 5). Dispersion Forecasting



# Information Used by VOLCAT Algorithms

**1. Spectral**

**2. Spatial**

**3. Temporal**

**4. Multi-sensor**

# Information Used by VOLCAT Algorithms

**1. Spectral**

2. Spatial

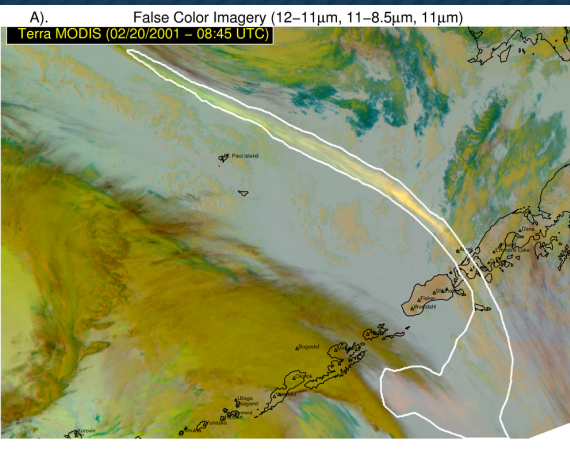
3. Temporal

4. Multi-sensor

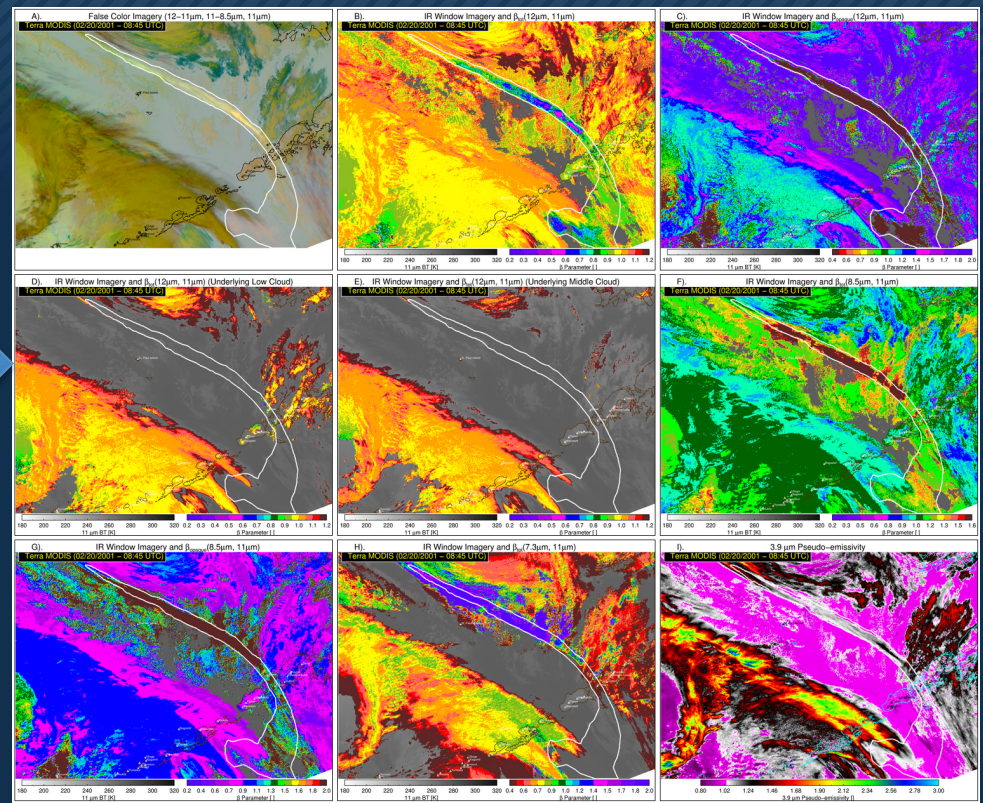
**Key Science Concept:** Maximize the sensitivity to volcanic ash by utilizing multi-spectral metrics that account for background conditions

**Impact of NextGen Satellites:** More volcanic cloud relevant spectral channels

Measured BT's, BTD's and reflectance



Robust metrics such as  $\beta$ -ratios



Pavolonis et al. 2015a

# Information Used by VOLCAT Algorithms

1. Spectral

**2. Spatial**

3. Temporal

4. Multi-sensor

A). False Color Imagery (12–11 $\mu$ m, 11–8.5 $\mu$ m, 11 $\mu$ m)

Terra MODIS (02/20/2001 – 08:45 UTC)

Weak Ash Signature

Strong Ash Signature

Weak Ash Signature

# Spatial Analysis: Cloud Objects

volcanic clouds, spectral metrics are used to estimate ash probability

Pavolonis et al. (2015a); Pavolonis et al. (2015b)

**Key Science Concept:** Humans rely heavily on spatial pattern recognition to identify volcanic clouds, so should automated algorithms

**Impact of NextGen Satellites:** Higher spatial resolution aids feature recognition

EUMETSAT Conference - October 4, 2017

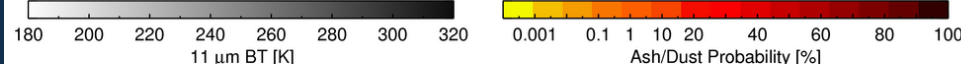
D IR Window Imagery and Ash Probability

Terra MODIS (02/20/2001 – 08:45 UTC)

Weak Ash Signature

Strong Ash Signature

Weak Ash Signature

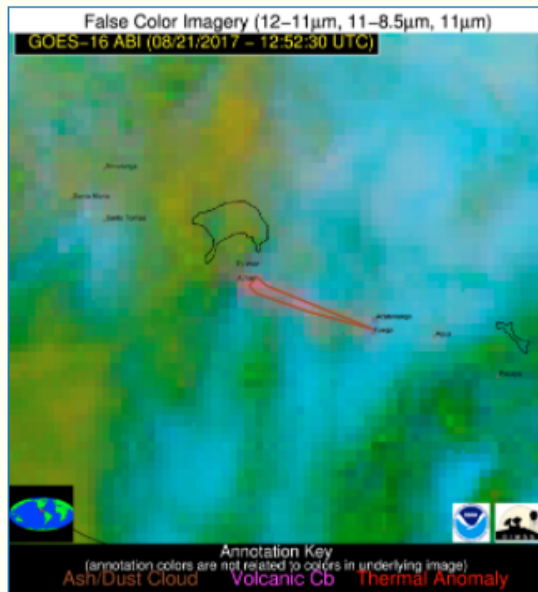


# Volcanic Cloud Alert Report

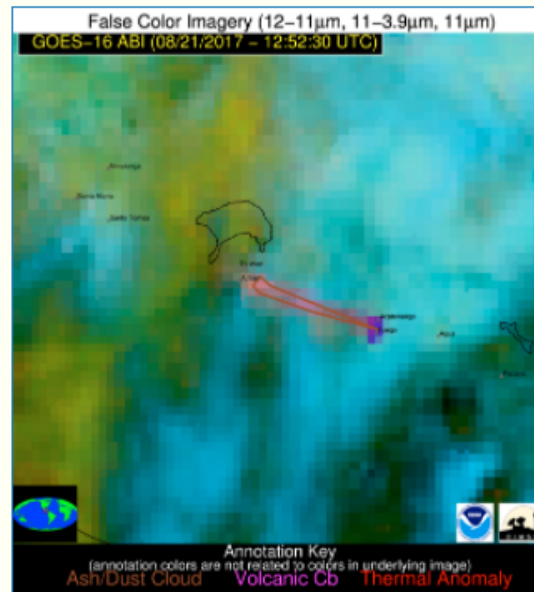
Date:	2017-08-21
Time:	12:52:30
Production Date and Time:	2017-08-21 12:58:15 UTC
Primary Instrument:	GOES-16 ABI

[More details ▼](#)

## Possible Volcanic Ash Cloud



[False Color Image \(12-11, 11-8.5, 11\) \[zoomed-in\]](#)



[False Color Image \(12-11, 11-3.9, 11\) \[zoomed-in\]](#)

### Basic Information

Volcanic Region(s)	Mexico and Central America
Country/Countries	Guatemala
Volcanic Subregion(s)	Guatemala
VAAC Region(s) of Nearby Volcanoes	Washington
Identification Method	Plume
Mean Object Date/Time	2017-08-21 12:52:30UTC
Radiative Center (Lat, Lon):	14.470°, -90.880°
Nearby Volcanoes (meeting alert criteria):	<a href="#">Fuego (0.00 km)</a>
	<a href="#">Acatenango (3.10 km)</a>
	<a href="#">Agua (14.80 km)</a>
	<a href="#">Pacaya (31.80 km)</a>
	<a href="#">Atitlan (35.20 km)</a>
Maximum Height [AMSL]	10.00 km ; 32808 ft
90th Percentile Height [AMSL]	9.60 km ; 31496 ft
Mean Tropopause Height [AMSL]	16.50 km ; 54134 ft

[Show More ▲](#)

[View all event imagery ►](#)

## Auto-detected eruption of Fuego (Guatemala) with GOES-16

Cloud object based volcanic ash detection allows for reliable generation of eruption alerts, which is critical in an era with very large satellite data volumes



# The VOLcanic Cloud Analysis Toolkit (VOLCAT)

Automated early detection of volcanic eruptions



FVXX21 KNES 071809  
VA ADVISORY  
DTG: 20170707/1809Z

VAAC: WASHINGTON

VOLCANO: POPOCATEPETL 341090  
PSN: N1901 W09837

AREA: MEXICO

SUMMIT ELEV: 17802 FT (5426 M)

ADVISORY NR: 2017/056

INFO SOURCE: NOAA CIMSS ALERT/CENAPRED

## Volcanic Cloud Alert Report

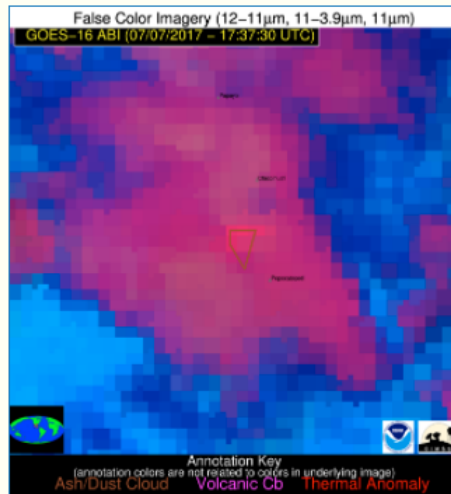
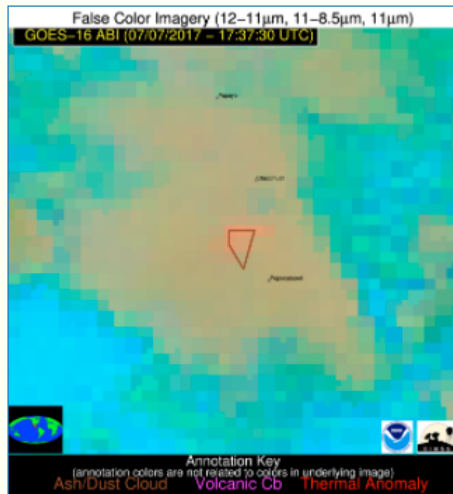
ERUPTION DETAILS: NEW VA EM AT 07/1719Z

RMK: WE HAVE RECEIVED INFORMATION SUGGESTING A POSSIBLE VA EMISSION. WE WILL GATHER FURTHER INFORMATION AND ISSUE A FULL ADVISORY AS SOON AS POSSIBLE.

NXT ADVISORY: AS SOON AS POSSIBLE

Date:	2017-07-07
Time:	17:37:30
Production Date and Time:	2017-07-07 17:44:35 UTC
Primary Instrument:	GOES-16 ABI
<a href="#">More details ▼</a>	

### Possible Volcanic Ash Cloud



### Basic Information

Volcanic Region(s)	Mexico and Central America
Country/Countries	Mexico
Volcanic Subregion(s)	Mexico
VAAC Region(s) of Nearby Volcanoes	Washington
Identification Method	Puff
Mean Object Date/Time	2017-07-07 17:37:30UTC
Radiative Center (Lat, Lon):	19.100°, -98.680°
Nearby Volcanoes (meeting alert criteria):	<a href="#">Popocatepetl (2.80 km)</a>
Maximum Height [AMSL]	9.20 km ; 30184 ft
90th Percentile Height [AMSL]	9.10 km ; 29856 ft
Mean Tropopause Height [AMSL]	16.50 km ; 54134 ft

[Show More ▲](#)

[View all event imagery >](#)

# Information Used by VOLCAT Algorithms

1. Spectral

2. Spatial

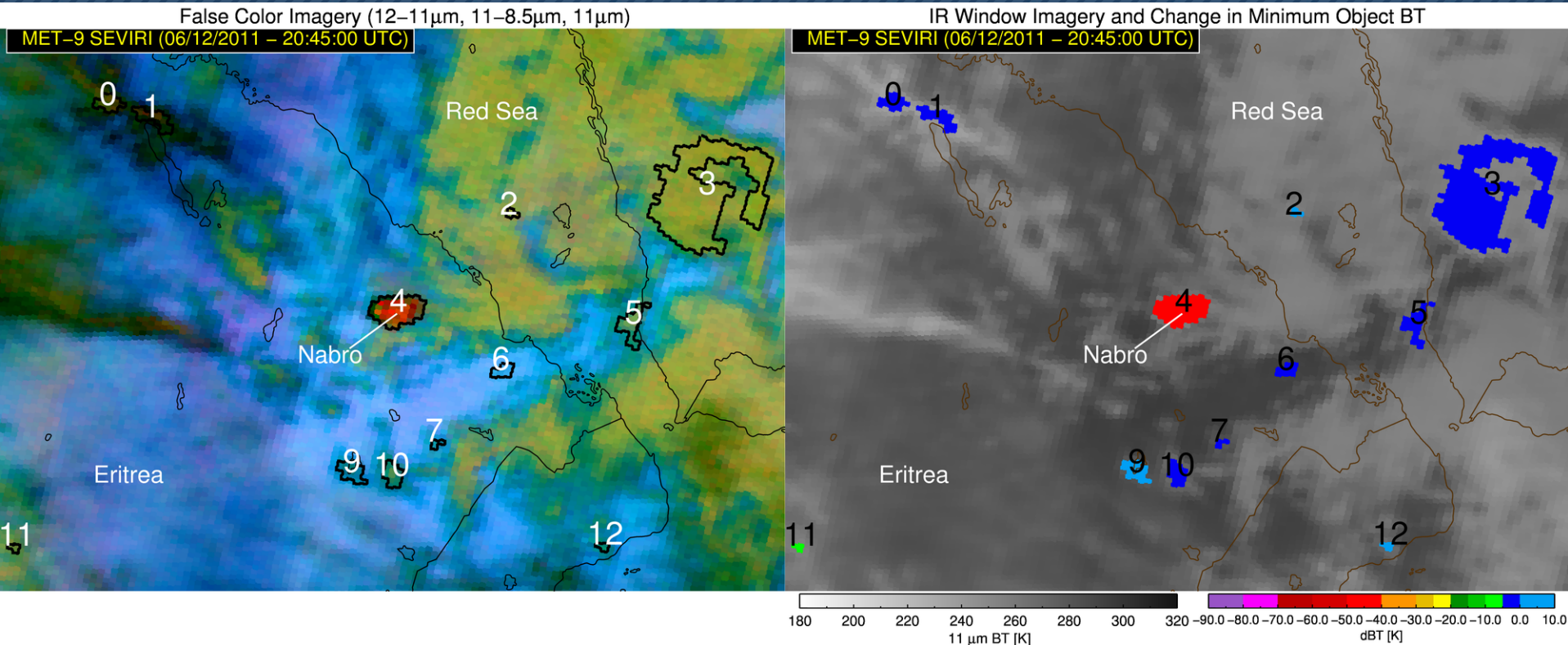
**3. Temporal**

4. Multi-sensor

# Temporal – Cloud Vertical Growth

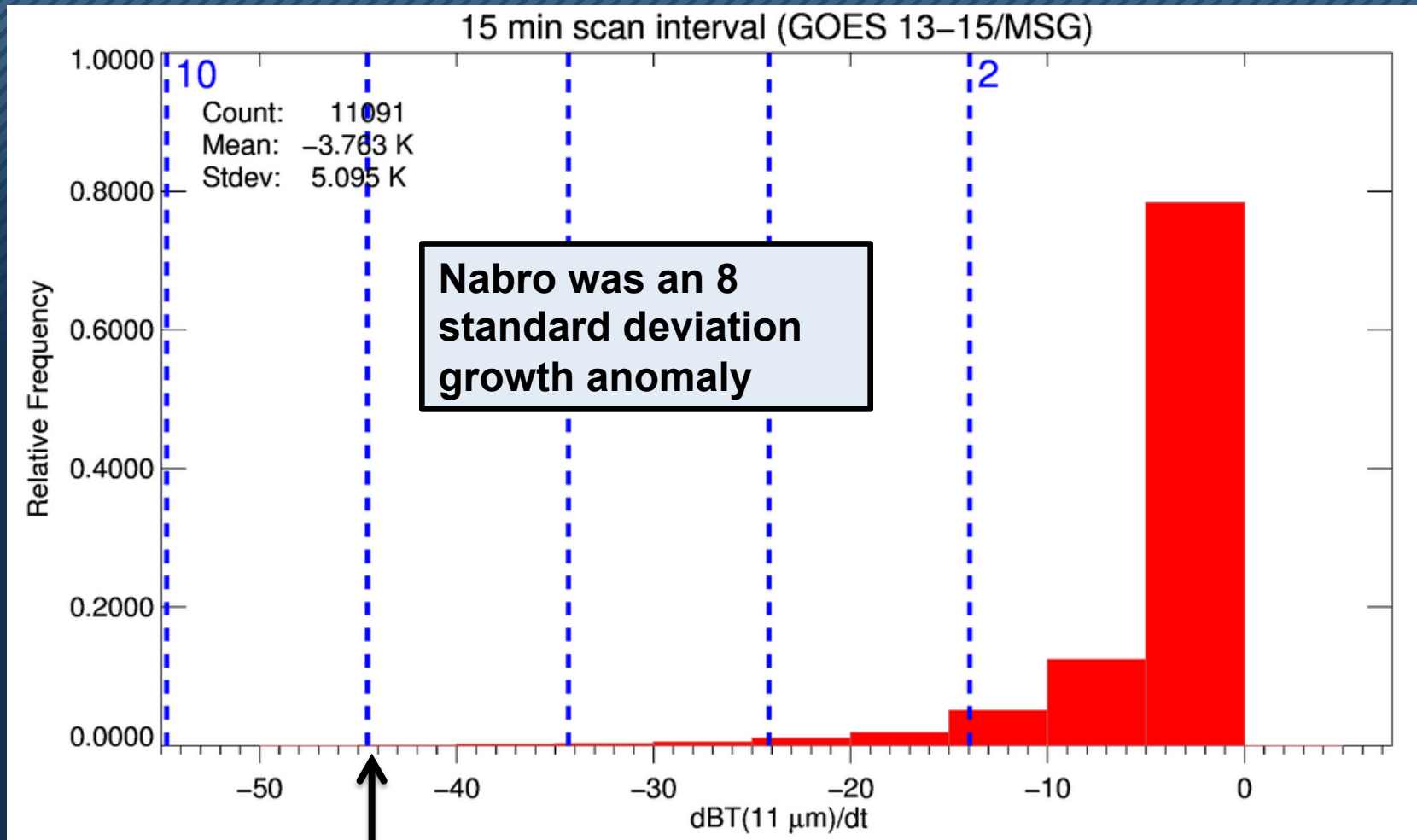
**Key Science Concept:** Volcanic clouds generally emerge from volcanic vents in a sudden manner

**Impact of NextGen Satellites:** More frequent images allows for better characterization of developing clouds



**Pavlonis et al. (2017, in prep)**

# How anomalous is vertical growth of Nabro cloud given the pixel area, time interval between the images, and background cloudiness?

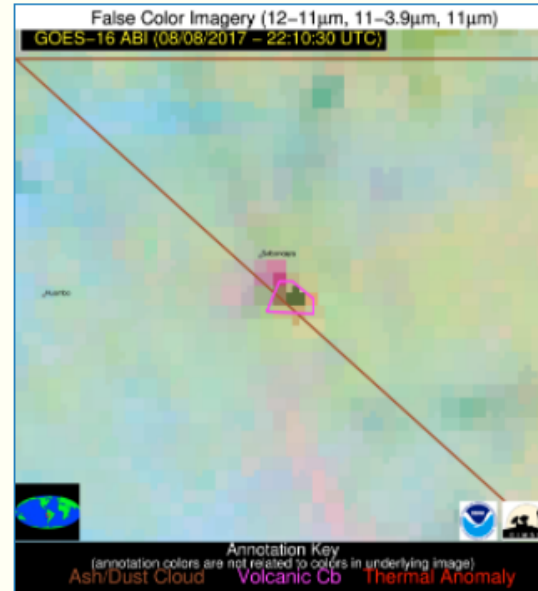
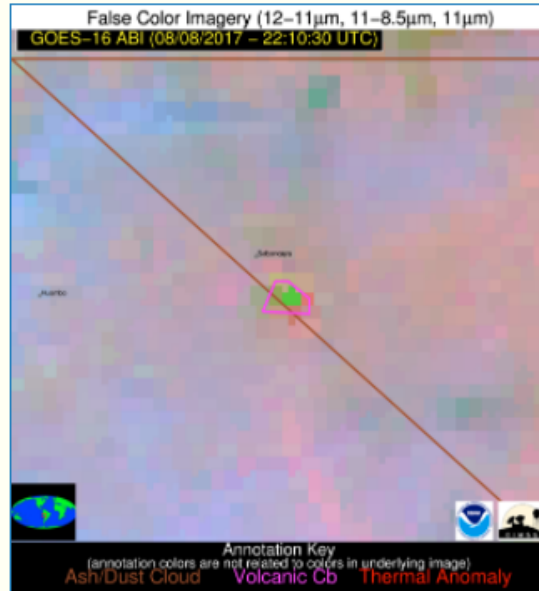


# Volcanic Cloud Alert Report

Date: 2017-08-08  
Time: 22:10:30  
Production Date and Time: 2017-08-08 22:20:16 UTC  
Primary Instrument: GOES-16 ABI

[More details ▼](#)

## Possible Volcanic Cb



### Basic Information

Volcanic Region(s)	South America
Country/Countries	Peru
Volcanic Subregion(s)	Peru
VAAC Region(s) of Nearby Volcanoes	Buenos Aires
Identification Method	Basic Growth
Mean Object Date/Time	2017-08-08 22:10:30UTC
Radiative Center (Lat, Lon):	-15.810°, -71.830°
Nearby Volcanoes (meeting alert criteria):	<a href="#">Sabancaya (1.10 km)</a>
Trend in IR Brightness Temperature	-15.50 °C
Vertical Growth Rate Time Interval	5 minutes
Vertical Growth Rate Anomaly	6.10 number of stddev above mean
Maximum Height [AMSL]	6.00 km ; 19685 ft
90th Percentile Height [AMSL]	5.70 km ; 18701 ft
Mean Tropopause Height [AMSL]	16.50 km ; 54134 ft

[Show More ▲](#)

[View all event Imagery ▶](#)

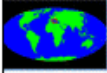
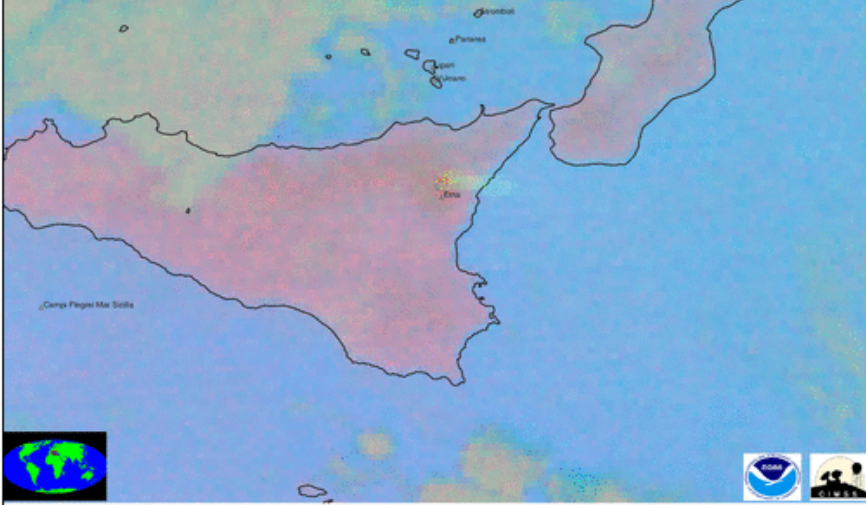
**Cloud growth based auto-detection of Sabancaya (Peru) eruption with 5 minute GOES-16 data**

**The more frequent the images, the better the detection capabilities (accuracy and timeliness)**

False Color Imagery (12–11 $\mu$ m, 11–8.5 $\mu$ m, 11 $\mu$ m)

MET-10 SEVIRI (12/03/2015 – 02:00:00 UTC)

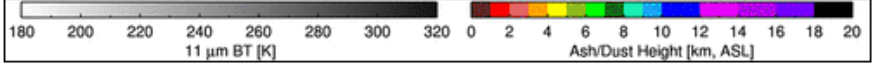
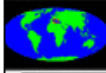
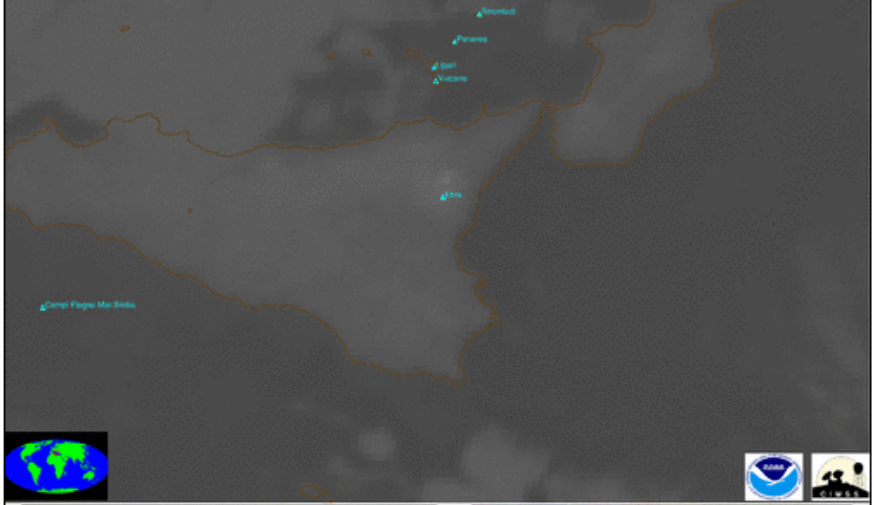
~7 sdev anomaly



IR Window Imagery and Ash/Dust Cloud Height

MET-10 SEVIRI (12/03/2015 – 02:00:00 UTC)

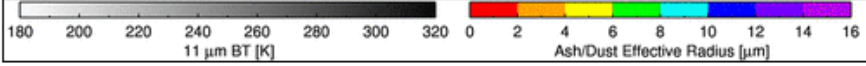
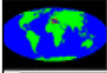
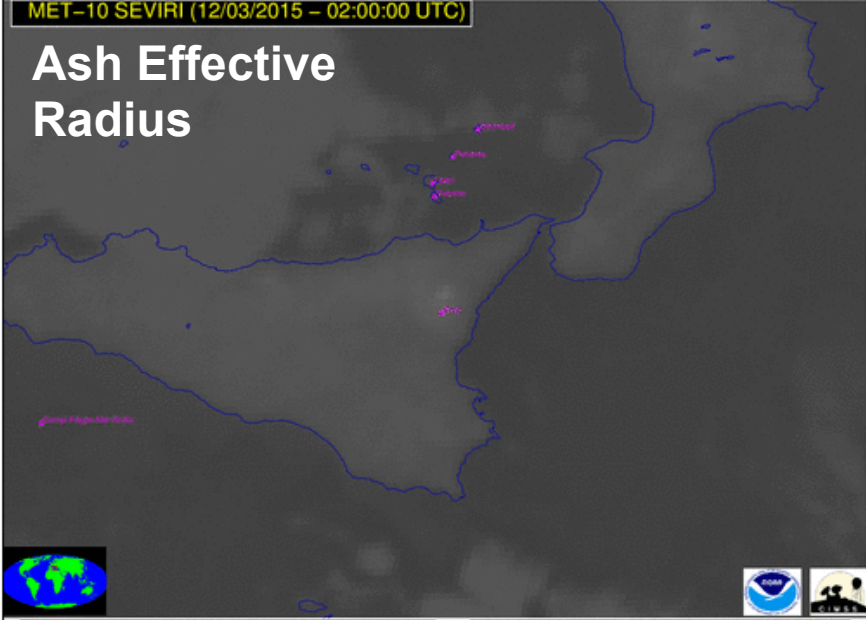
Ash Height



IR Window Imagery and Ash/Dust Effective Radius

MET-10 SEVIRI (12/03/2015 – 02:00:00 UTC)

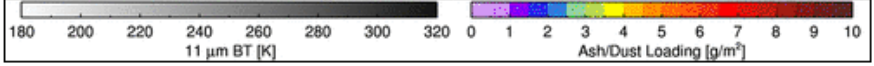
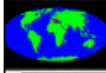
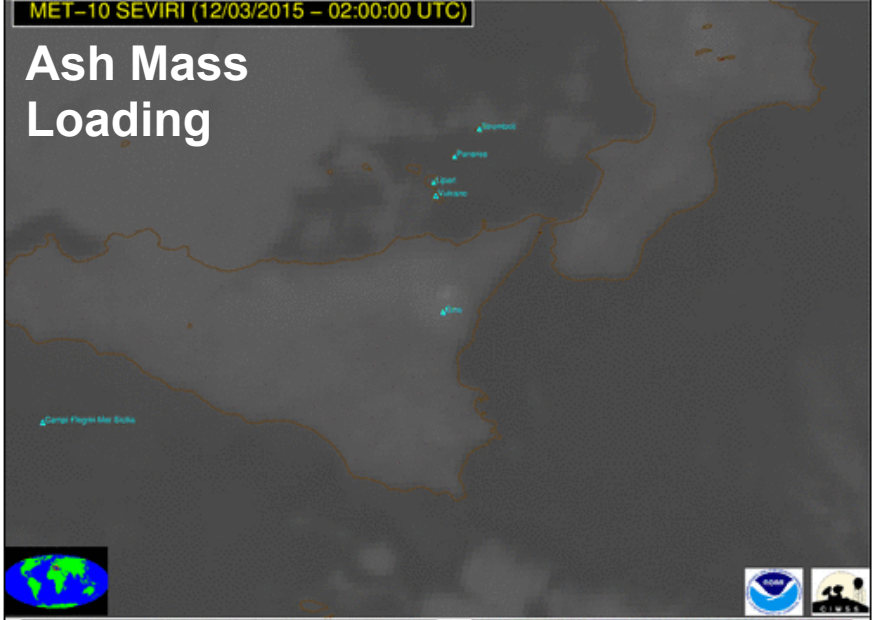
Ash Effective Radius



IR Window Imagery and Ash/Dust Loading

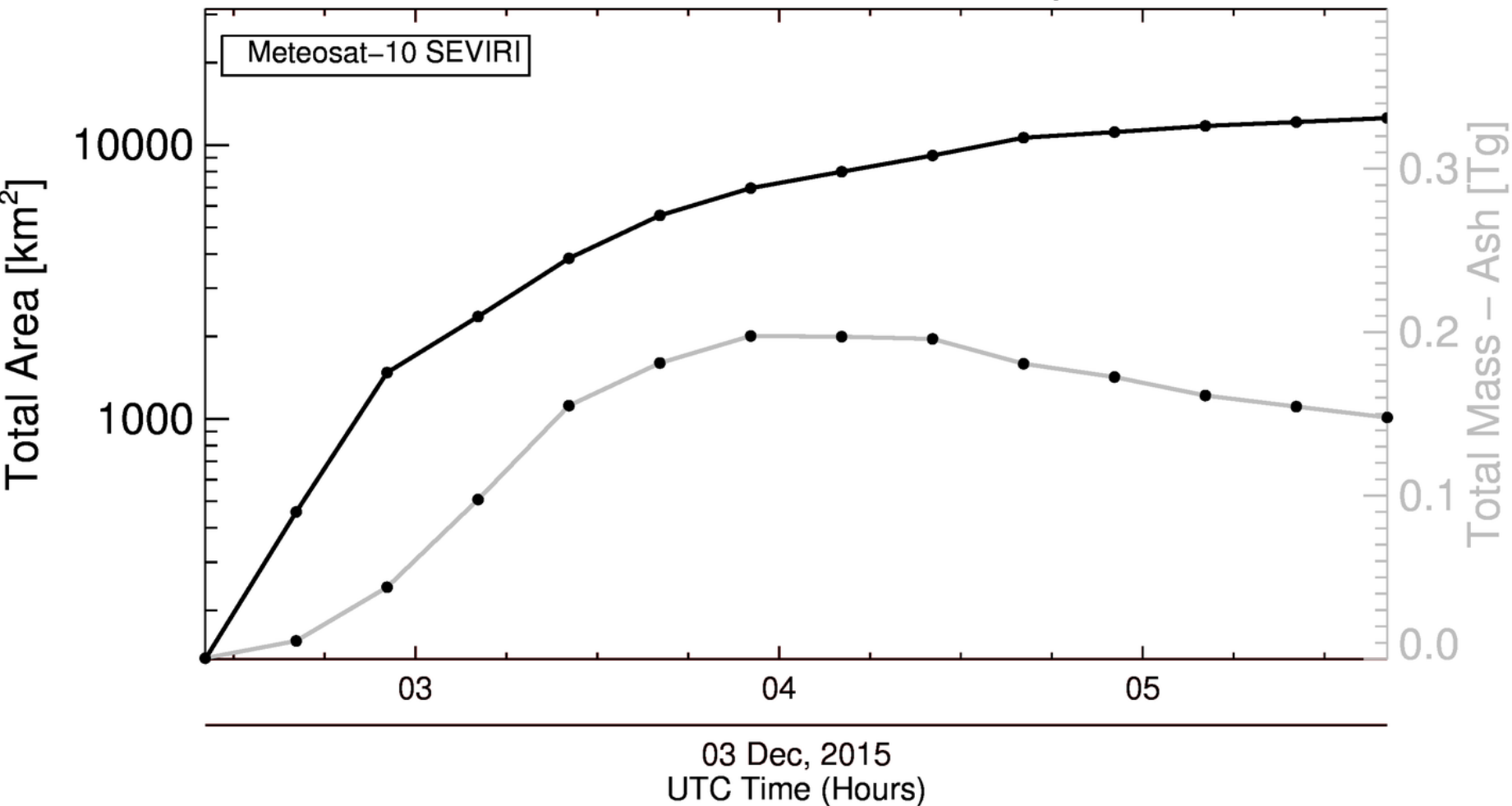
MET-10 SEVIRI (12/03/2015 – 02:00:00 UTC)

Ash Mass Loading



Pavolonis et al. 2013

# December 3, 2015 Etna Eruption



**The time evolution of certain volcanic cloud properties (e.g. area) can be used to derive eruption source parameters required to constrain dispersion models**

# Information Used by VOLCAT Algorithms

1. Spectral

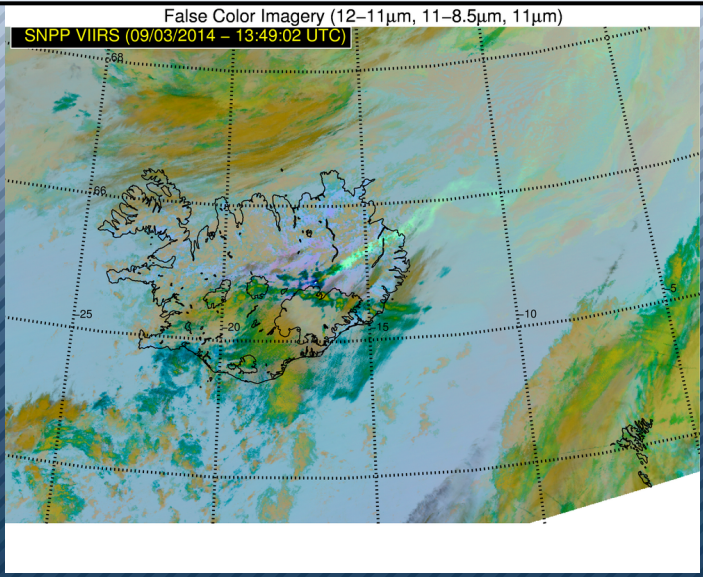
2. Spatial

3. Temporal

**4. Multi-sensor**



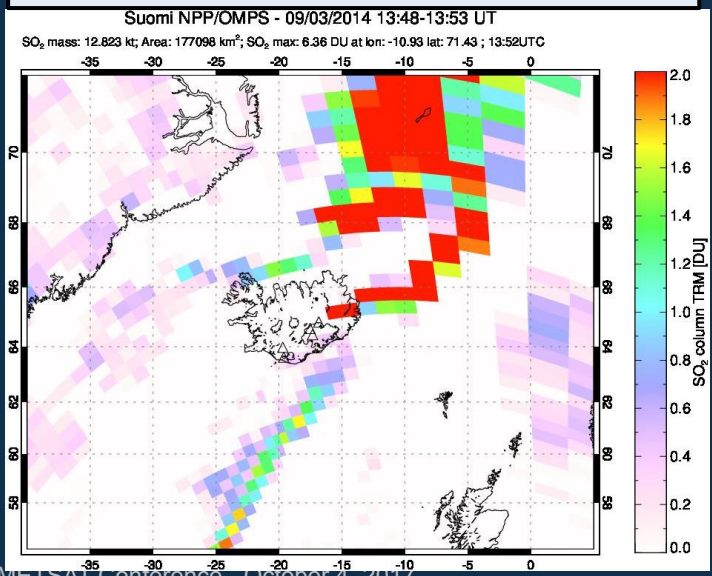
# Infrared (high spectral + high spatial)



+

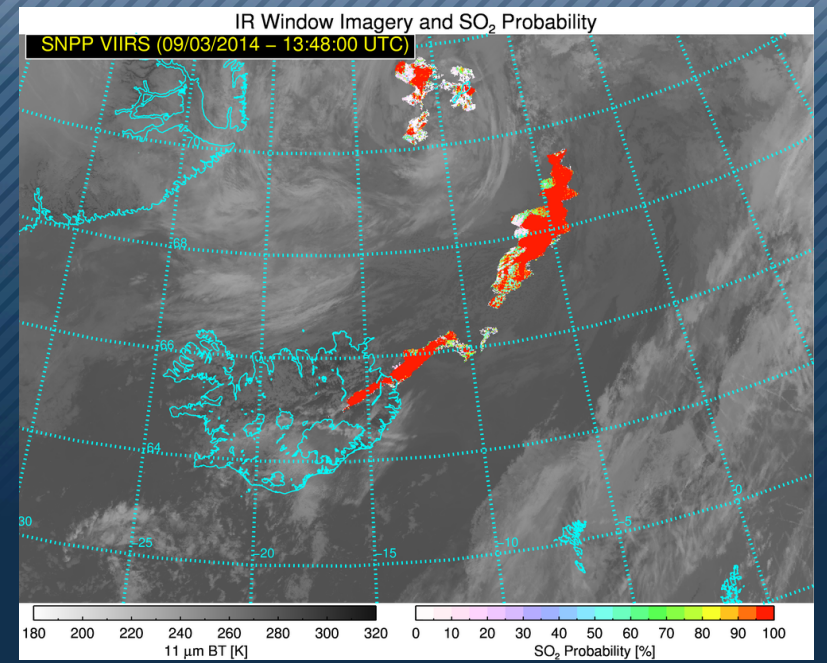
=

# UV



# Application to SO<sub>2</sub>

## Improved SO<sub>2</sub> Products SO<sub>2</sub> Probability, Loading, and Height



**Key Science Concept:** No single sensor is perfectly optimized to detect and characterize all types of volcanic clouds

**Impact of NextGen Satellites:** Hyperspectral UV and IR greatly aid in volcanic cloud (including SO<sub>2</sub>) detection and characterization

# Conclusions

- VOLCAT utilizes spectral, spatial, and temporal information to detect and characterize volcanic clouds captured by LEO and GEO satellites
- Much improved volcanic cloud detection and characterization is possible with next generation satellites
- Automated extraction of information is critical in this still evolving era of very large satellite data volumes
- VOLCAT products are generated at the University of Wisconsin and are not currently part of the planned operational GOES-R product suite

# References

Pavolonis, M. J., W. F. Feltz, A. K. Heidinger, and G. M. Gallina, 2006: A daytime complement to the reverse absorption technique for improved automated detection of volcanic ash. *J.Atmos.Ocean.Technol.*, **23**, 1422–1444.

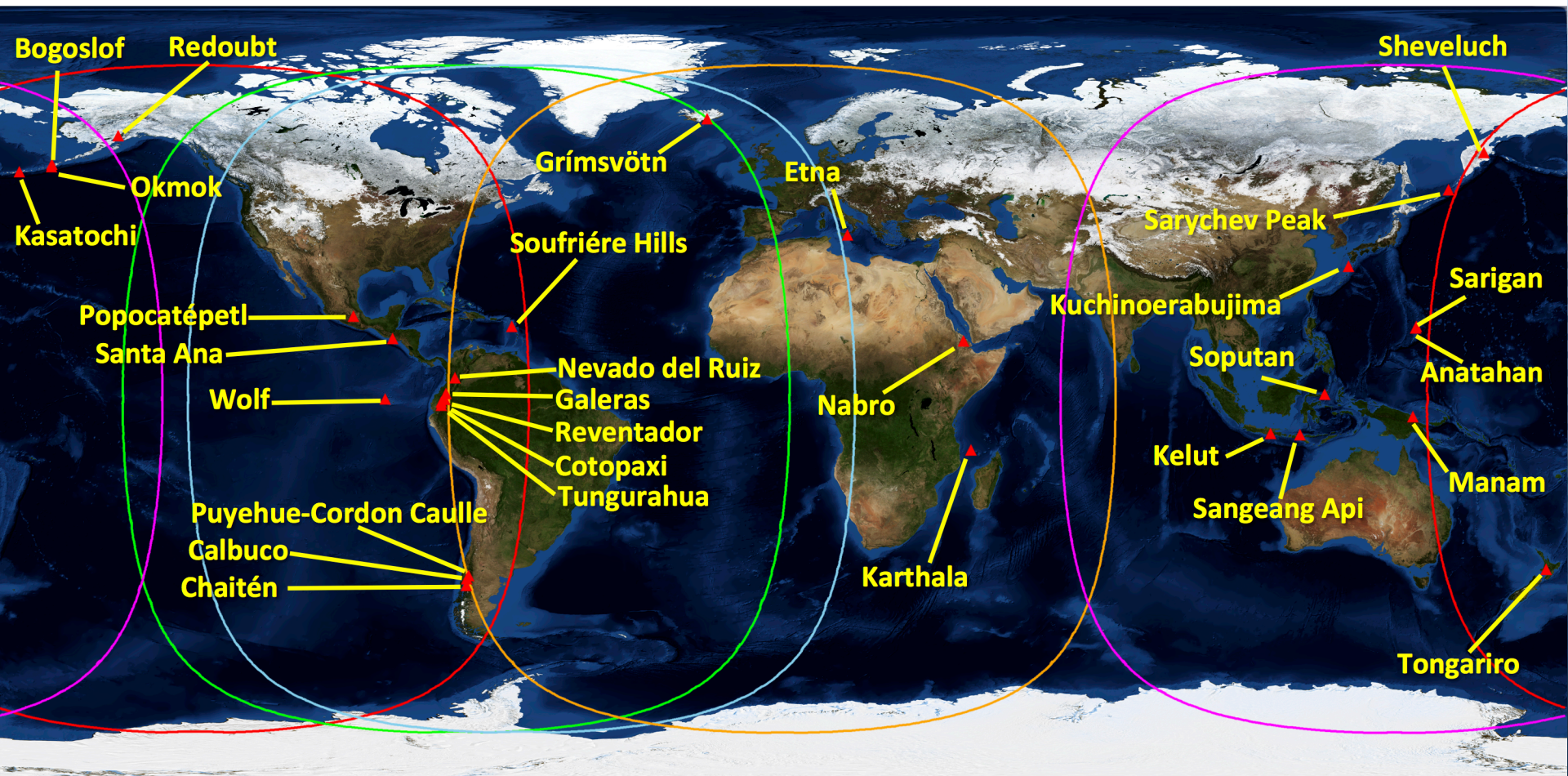
Pavolonis, M. J., 2010: Advances in Extracting Cloud Composition Information from Spaceborne Infrared Radiances–A Robust Alternative to Brightness Temperatures. Part I: Theory. *Journal of Applied Meteorology and Climatology*, **49**, 1992–2012, doi: 10.1175/2010JAMC2433.1 ER.

Pavolonis, M., A. Heidinger, and J. Sieglaff, 2013: Automated retrievals of volcanic ash and dust cloud properties from upwelling infrared measurements, *J. Geophysical Research*, **118(3)**, 1436–1458.

Pavolonis, M., J. Sieglaff, and J. Cintineo (2015a), Spectrally Enhanced Cloud Objects (SECO): A Generalized Framework for Automated Detection of Volcanic Ash and Dust Clouds using Passive Satellite Measurements, Part I: Multispectral Analysis, *Journal Geophysical Research*, **120**, 7813–7841.

Pavolonis, M., J. Sieglaff, and J. Cintineo (2015b) Spectrally Enhanced Cloud Objects (SECO): A Generalized Framework for Automated Detection of Volcanic Ash and Dust Clouds using Passive Satellite Measurements, Part II: Cloud Object Analysis and Global Application, *Journal Geophysical Research*, **120**, 7842–7870.

# **EXTRA SLIDES**



**Geostationary Satellite Coverage**

GOES-West

GOES-East

GOES-Central

MSG

MTSAT/Himawari

Number of cloud objects processed per day: ~3 million

Number of growing cloud objects processed per day: 1 million

Average number of false alerts per day: 3-4