



# Stratospheric volcanic ash emissions from the 13 February 2014 Kelut eruption

**Nina I Kristiansen**<sup>1</sup>, Fred Prata<sup>2</sup>, Andreas Stohl<sup>1</sup>, and Simon Carn<sup>3,4</sup>

1: Norwegian Institute for Air Research, Kjeller, Norway

2: Nicarnica Aviation, Kjeller, Norway,

3: Department of Geological and Mining Engineering and Sciences, Michigan Technological University, Houghton, Michigan, USA,

4: Department of Mineral Sciences, National Museum of Natural History, Smithsonian Institution, Washington, District of Columbia, USA



# Kelut (Kelud)

Eruption onset  
13 February 2014 22:50 LT (15:50 UTC)

Major eruption duration  
~ 6 hours

Emissions  
SO<sub>2</sub> and ash plumes to ~26 km



Volcano Discovery web site  
<http://pic.twitter.com/ypy7kx9615> / @milmi\_d

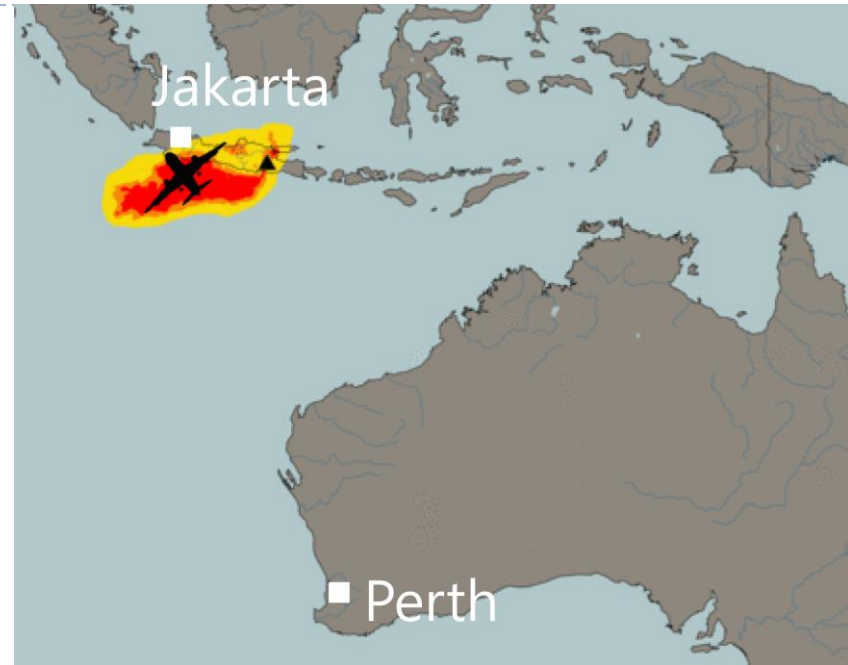


# Aircraft encounter

---

Commercial flight from Perth to Jakarta

- ▶ Took off from Perth **02:25** LT
- ▶ Encountered the ash cloud around **05:10** LT
- ▶ Landed safely in Jakarta **05:50** LT



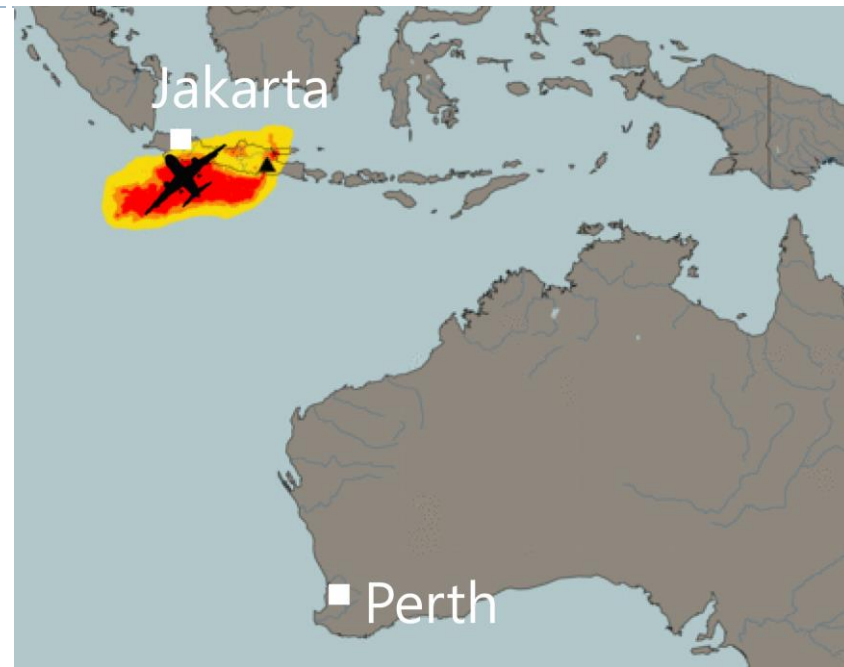
# Aircraft encounter

Commercial flight from Perth to Jakarta

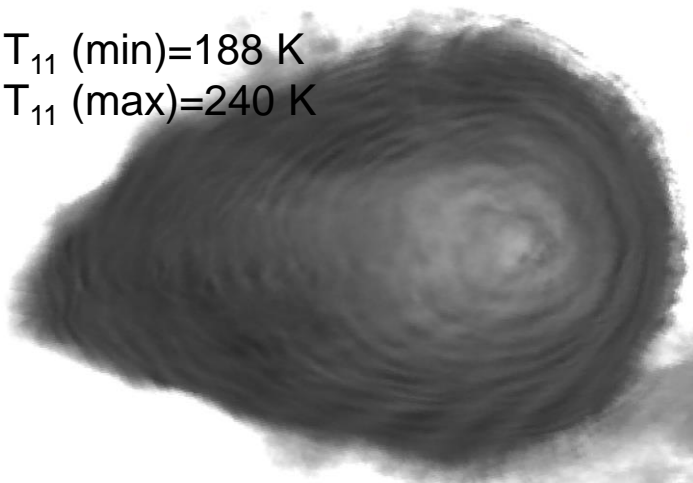
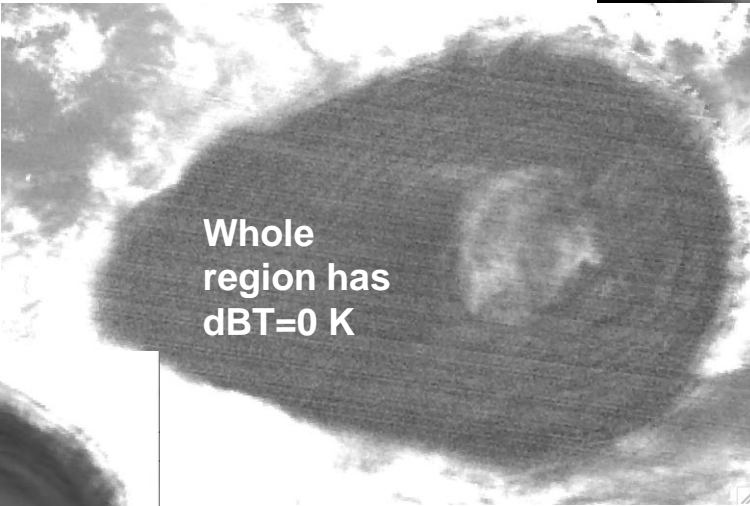
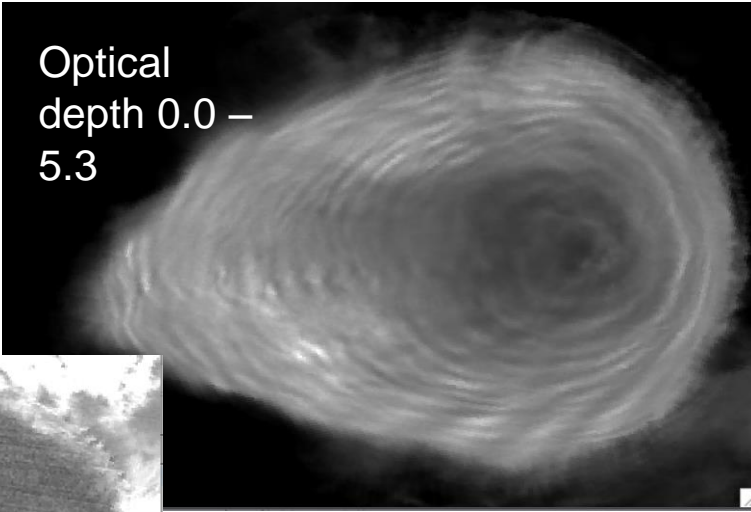
- ▶ Took off from Perth **02:25** LT
- ▶ Encountered the ash cloud around **05:10** LT
- ▶ Landed safely in Jakarta **05:50** LT

Satellite ash retrievals troublesome

Can inverse and dispersion modelling help in estimating the concentrations of ash that the aircraft encountered?

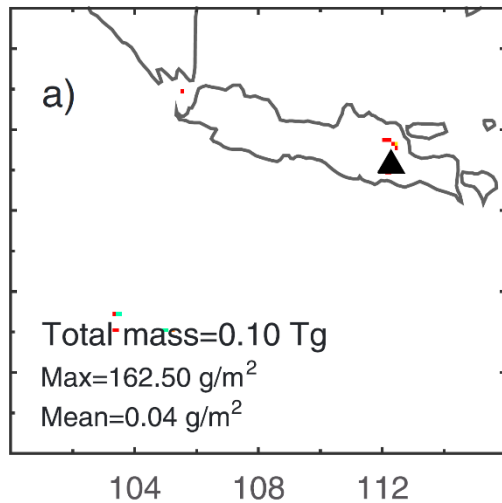


# Satellite observations of the umbrella cloud



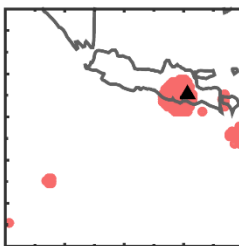
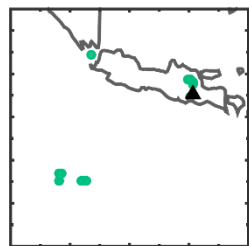
# Satellite ash retrievals from MTSAT

13 Feb 2014, 17:32 UTC



Valid retrieval

Failed retrieval



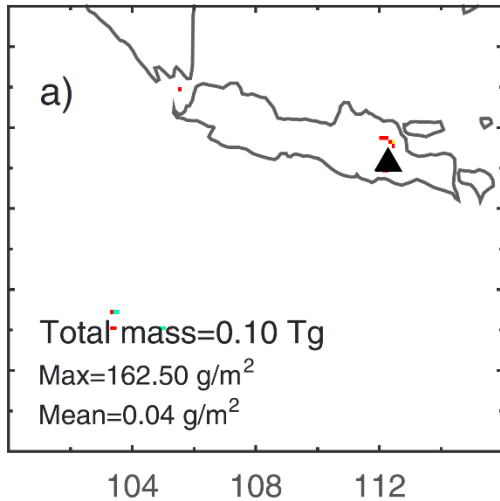
104 108 112

104 108 112

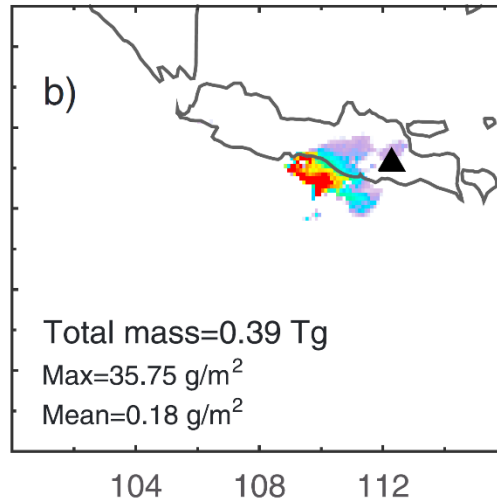


# Satellite ash retrievals from MTSAT

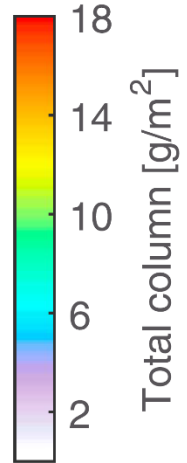
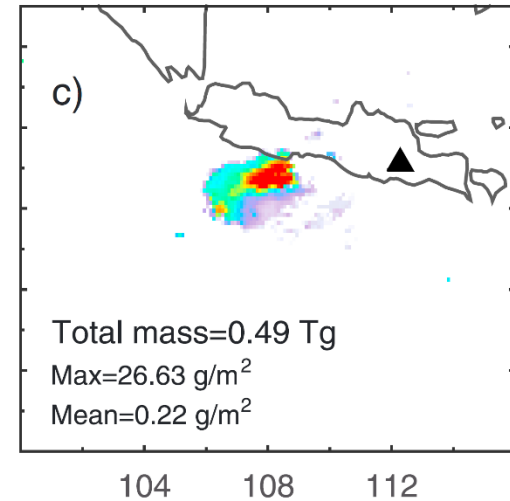
13 Feb 2014, 17:32 UTC



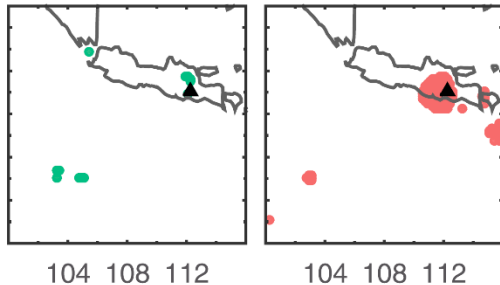
13 Feb 2014, 22:32 UTC



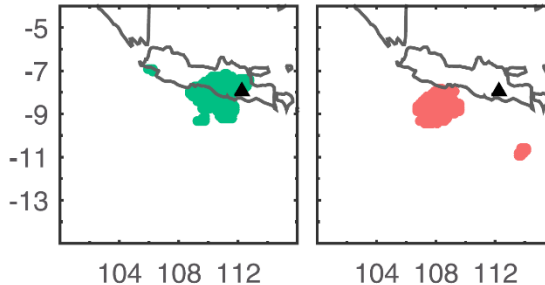
14 Feb 2014, 02:32 UTC



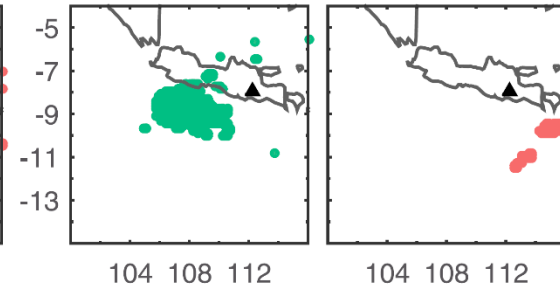
Valid retrieval Failed retrieval



Valid retrieval Failed retrieval

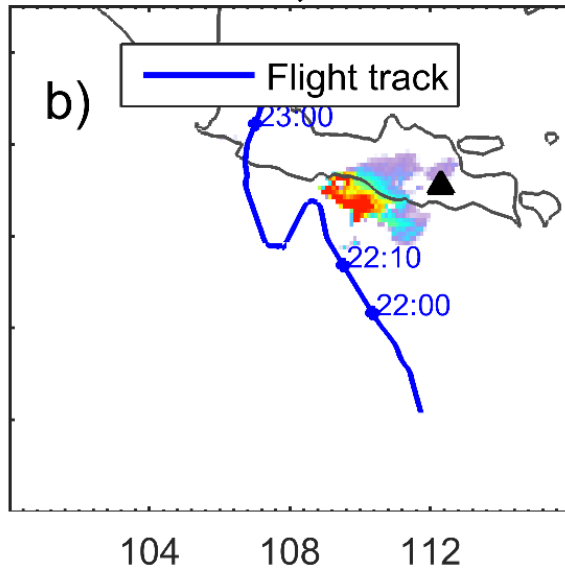


Valid retrieval Failed retrieval

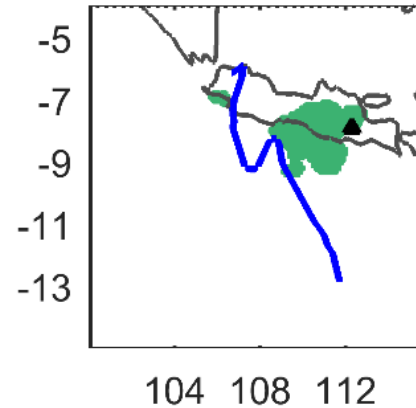


# Aircraft encounter “seen” from MTSAT

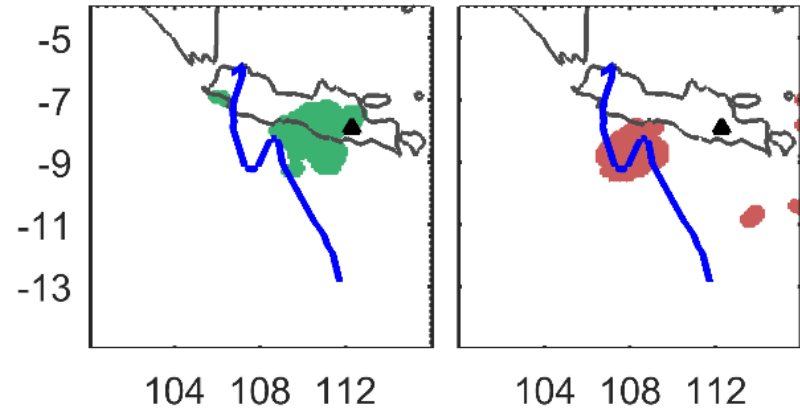
13 Feb 2014, 22:32 UTC



Valid retrieval



Failed retrieval





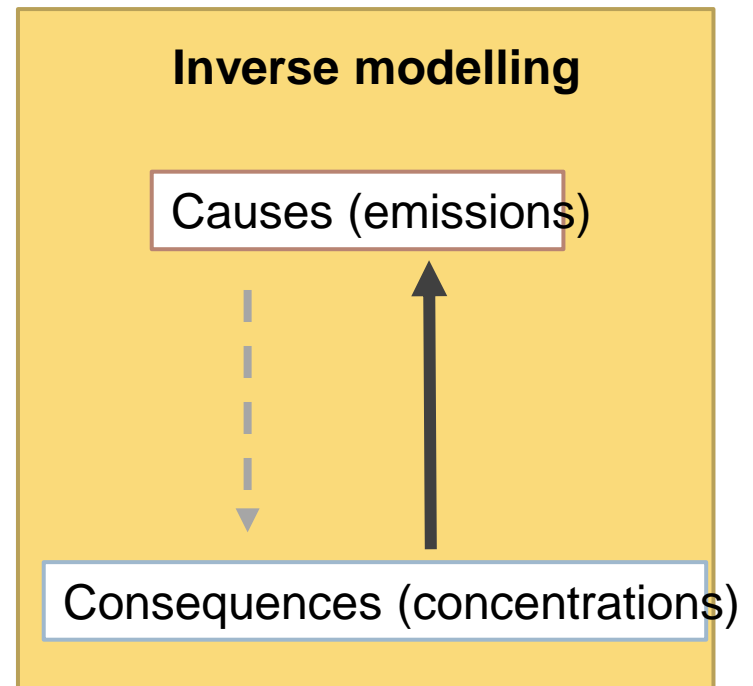
# Can modelling help?

---

**Dispersion modelling** is crucially dependent on the source term!

Estimate ash source term using **inverse modelling**; find the emissions that make the modelled ash clouds in best possible agreement with satellite observations!

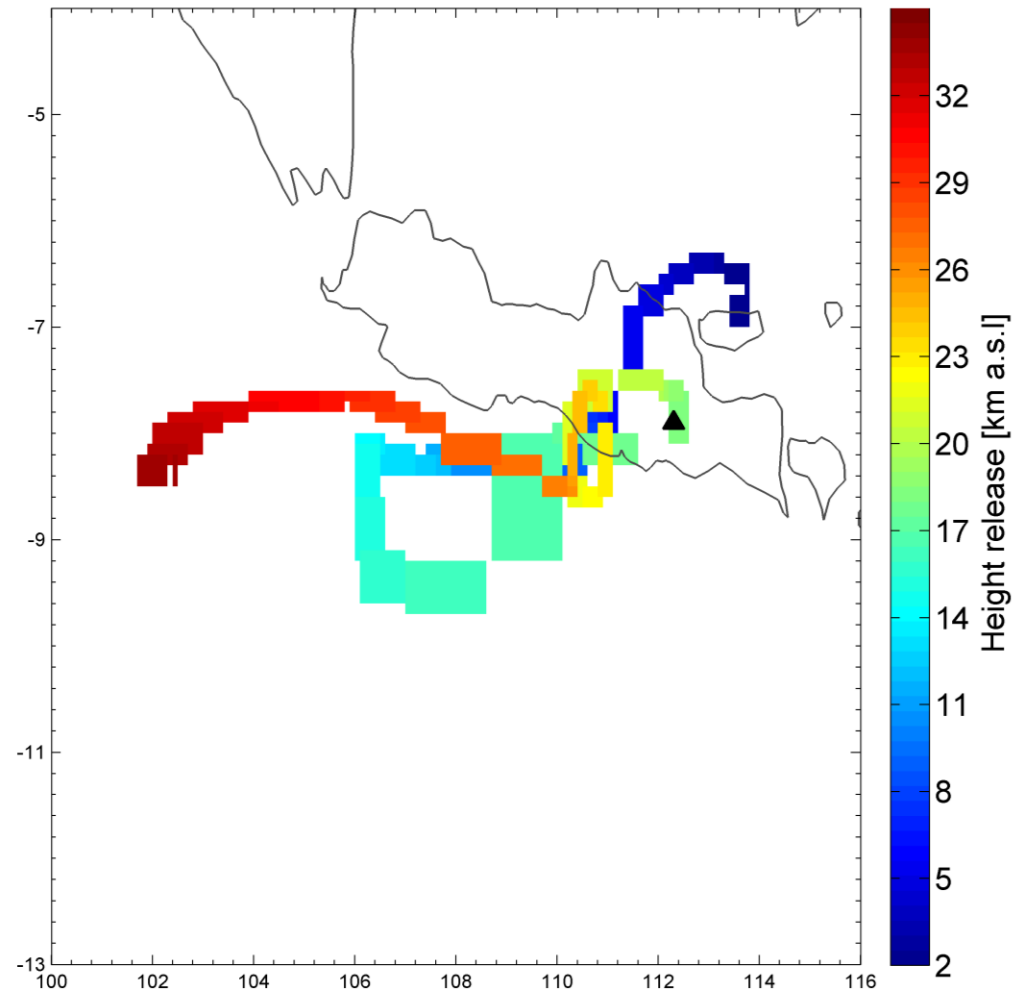
*If satellite retrievals cannot see the ash cloud – how can the source term be estimated and modelling reveal it?*



# Source term inversion:

Transport is dependent on altitude of emission

Sourcerelease: 13 Feb 2014 15:30  
Simulation output: 13 Feb 2014 22:30



FLEXPART dispersion model run on one-hourly ECMWF NWP data

Emissions of ash

- every 500 m [2-35 km a.s.l.]
- every 30 min

# Source term inversion:

Combining model, satellite and a priori

$$\mathbf{M} \mathbf{x} = \mathbf{y}^o$$



Unknown  
source

**M:** Model  
sensitivities ( $\text{g}/\text{m}^2$ )  
FLEXPART dispersion  
model run on one-  
hourly ECMWF NWP  
data

Emissions of ash  
- every 500 m [2-35 km  
a.s.l]  
- every 30 min

**$\mathbf{y}^o$ :** Satellite  
observations ( $\text{g}/\text{m}^2$ )  
One-hourly MTSAT ash  
mass loading retrievals  
Flags: valid/failed  
retrieval

# Source term inversion:

Combining model, satellite and a priori

$$\mathbf{M}(\mathbf{x} - \mathbf{x}^a) \approx \mathbf{y}^o - \mathbf{M}\mathbf{x}^a$$

Unknown  
source

$\mathbf{y}^o$ : Satellite  
observations ( $\text{g}/\text{m}^2$ )  
One-hourly MTSAT ash  
mass loading retrievals  
Flags: valid/failed  
retrieval

$\mathbf{x}^a$ : *a priori*

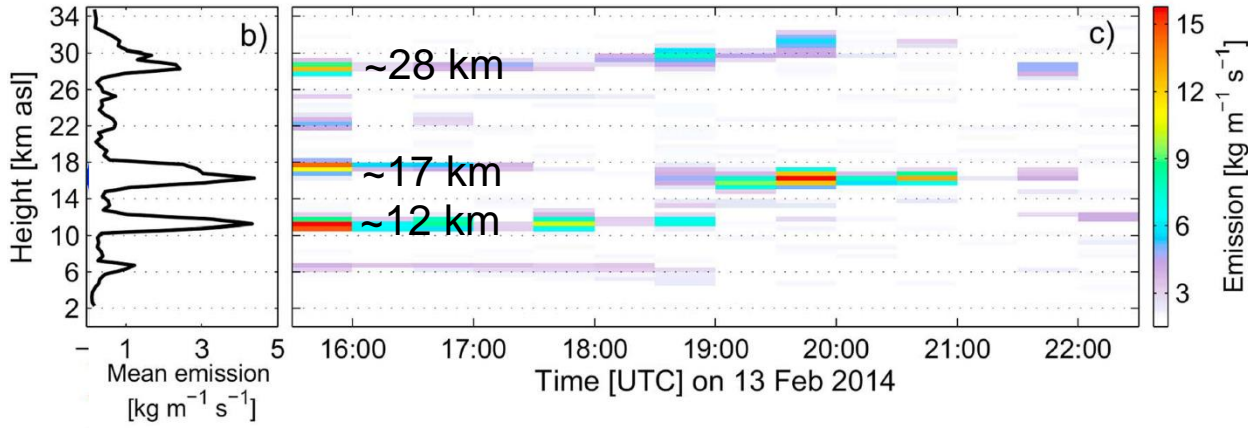
1.5 Tg fine ash (from  
“poor-mans  
inversion”)

Distributed uniformly  
in time and height.

Very large  
uncertainty

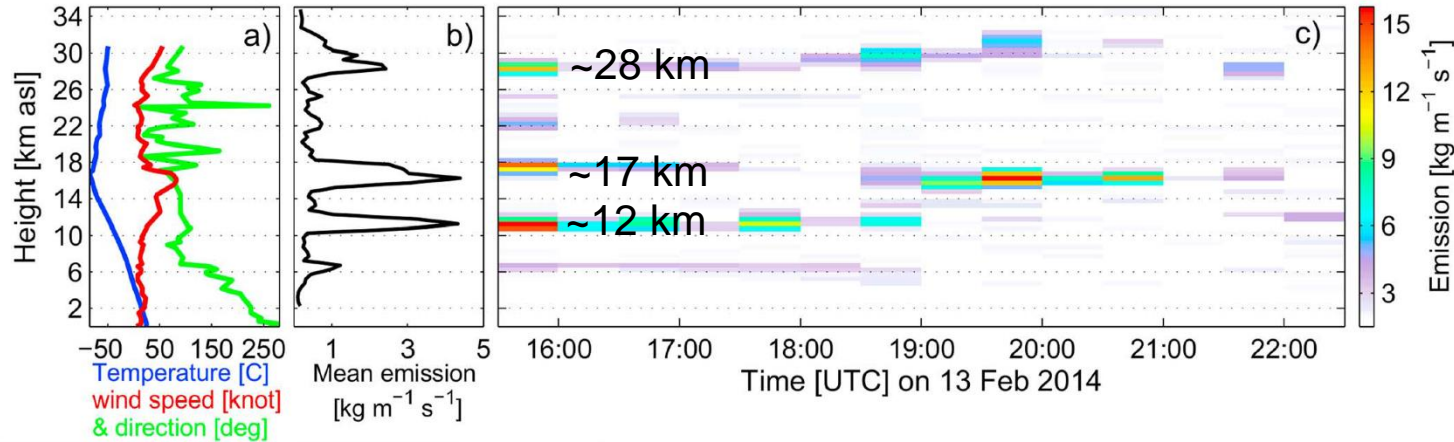
**M**: Model  
sensitivities ( $\text{g}/\text{m}^2$ )  
FLEXPART dispersion  
model run on one-  
hourly ECMWF NWP  
data  
Emissions of ash  
- every 500 m [2-35 km  
a.s.l]  
- every 30 min

# Satellite-constrained *fine ash* source term



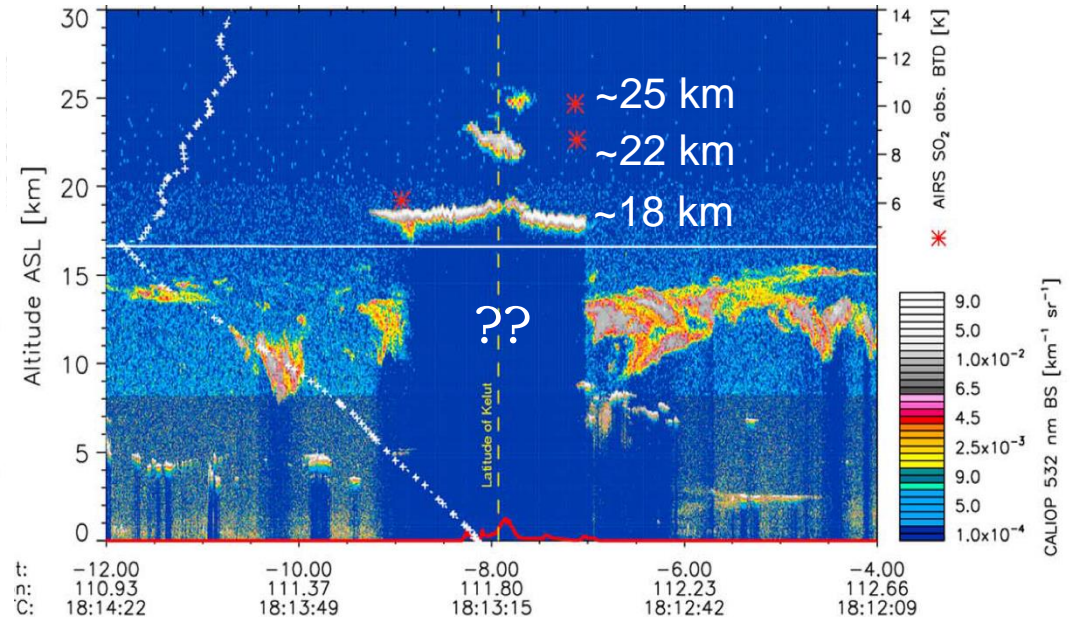
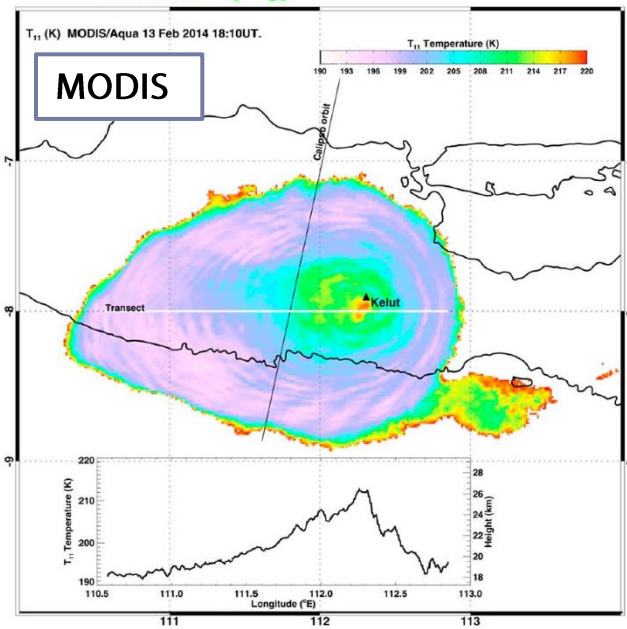
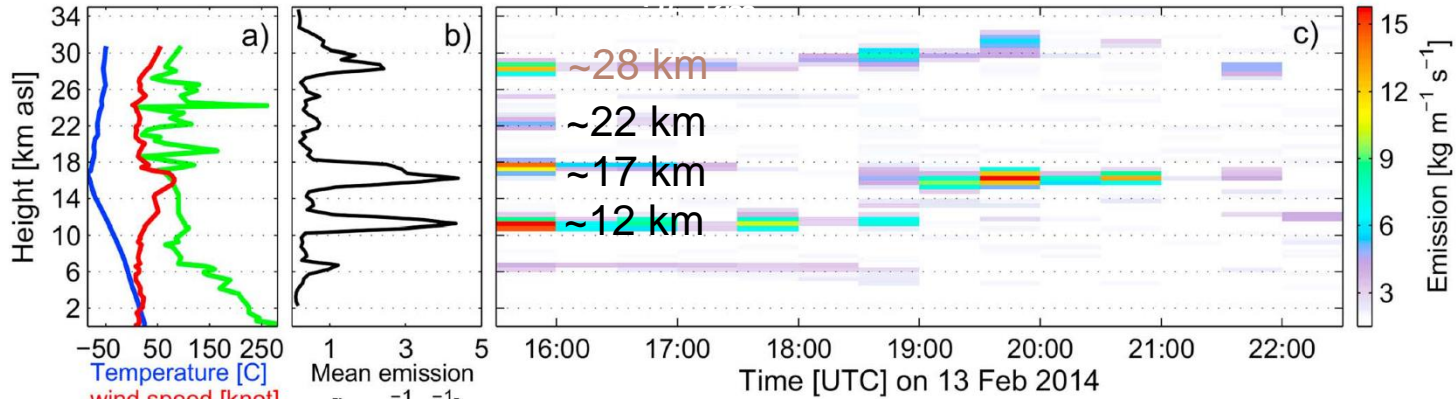
Kristiansen, N. I., A. J. Prata, A. Stohl and S. A. Carn (2015) Stratospheric volcanic ash emissions from the 13 February 2014 Kelut eruption Geophys. Res. Lett., 42, doi:10.1002/2014GL062307.

# Satellite-constrained *fine ash* source term



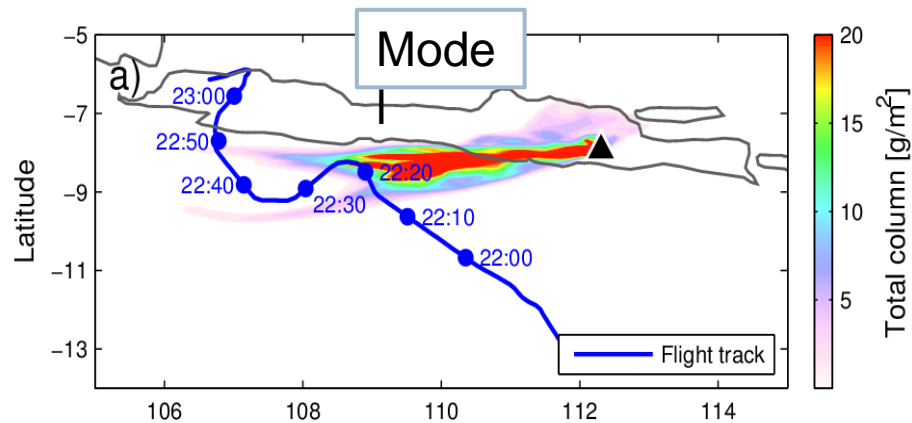
Kristiansen, N. I., A. J. Prata, A. Stohl and S. A. Carn (2015) Stratospheric volcanic ash emissions from the 13 February 2014 Kelut eruption Geophys. Res. Lett., 42, doi:10.1002/2014GL062307.

# Comparison to CALIOP



Kristiansen, N. I., A. J. Prata, A. Stohl and S. A. Carn (2015) Stratospheric volcanic ash emissions from the 13 February 2014 Kelut eruption Geophys. Res. Lett., 42, doi:10.1002/2014GL062307.

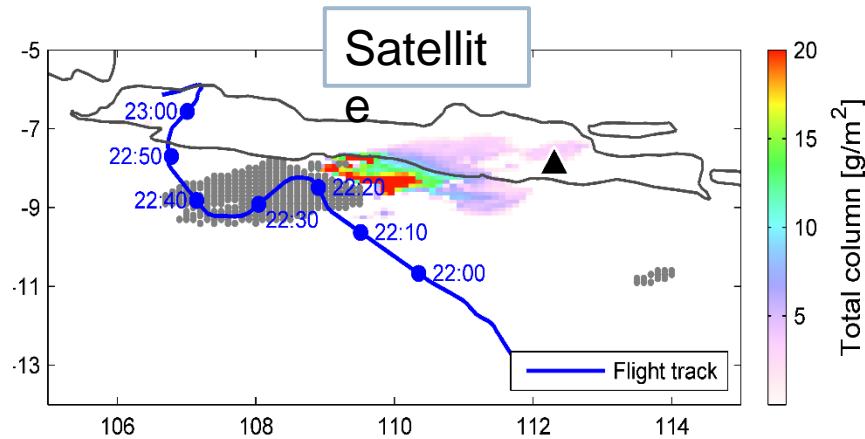
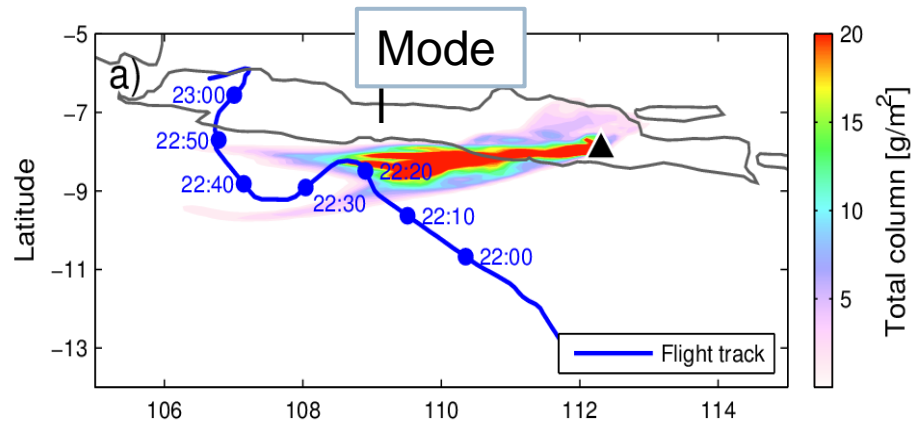
# Modelling the aircraft encounter



Fine ash source term →  
Extend the particle size distribution  
and the related mass eruption rate to  
include smaller/larger particles than  
what is inverted for (i.e. observed by

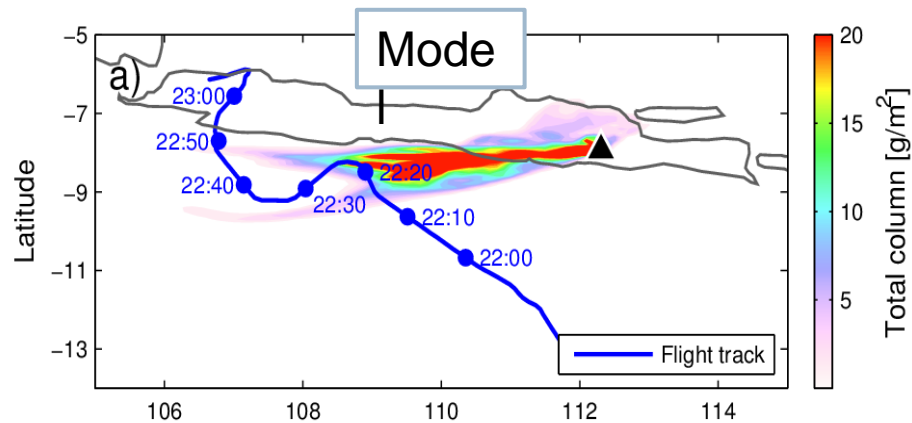


# Modelling the aircraft encounter

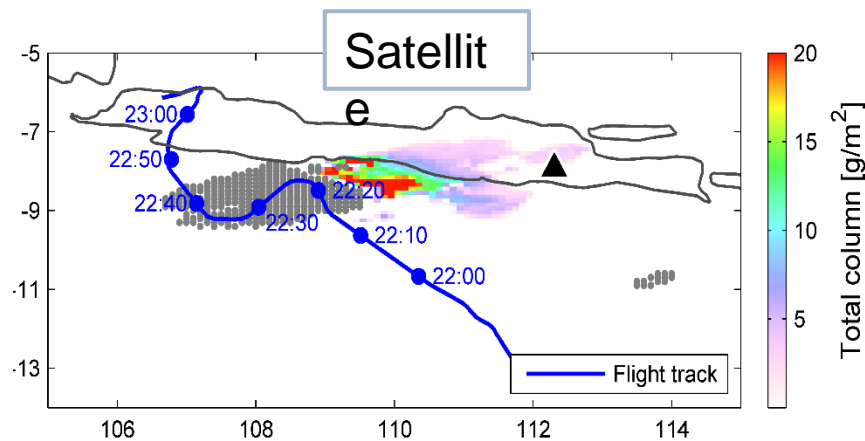
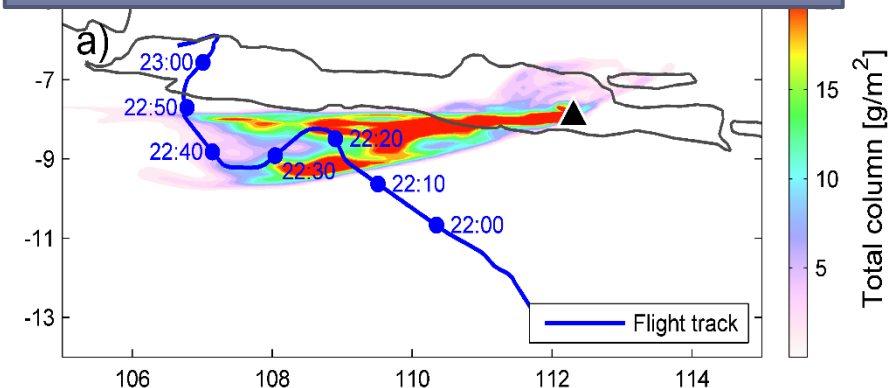


The inversion locates some ash in the western part only because this ash was observed elsewhere at a later time.

# Modelling the aircraft encounter



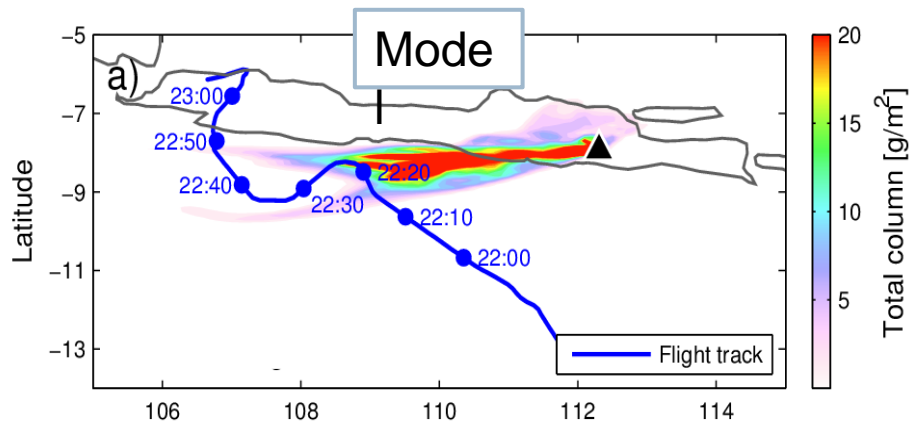
Sensitivity test:  
Assume ash in area of “failed retrieval”



## Other sensitivity tests for the inversion:

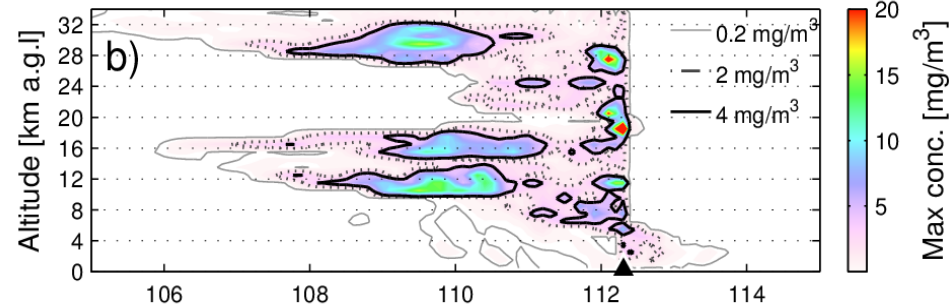
- Different amounts of satellite data
- Start and end time of assumed emission time period
- Assumed uncertainties
- Assumed ash particle size distribution

# Modelling the aircraft encounter

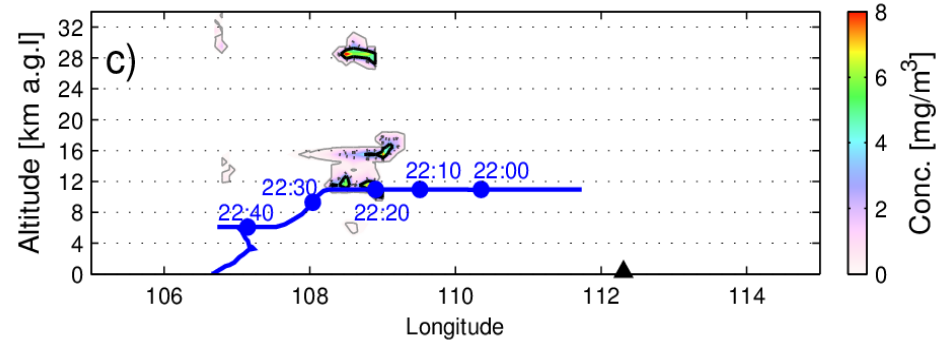


Modelling suggests that **the aircraft flew below the main ash cloud**

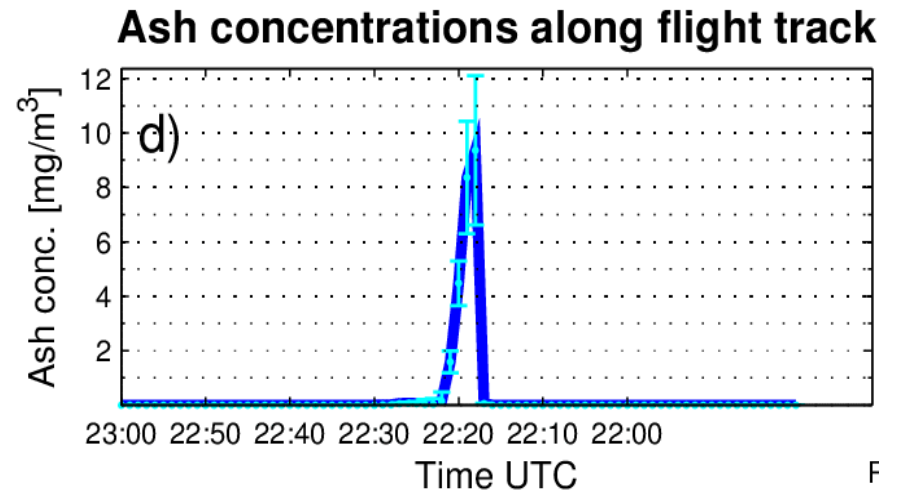
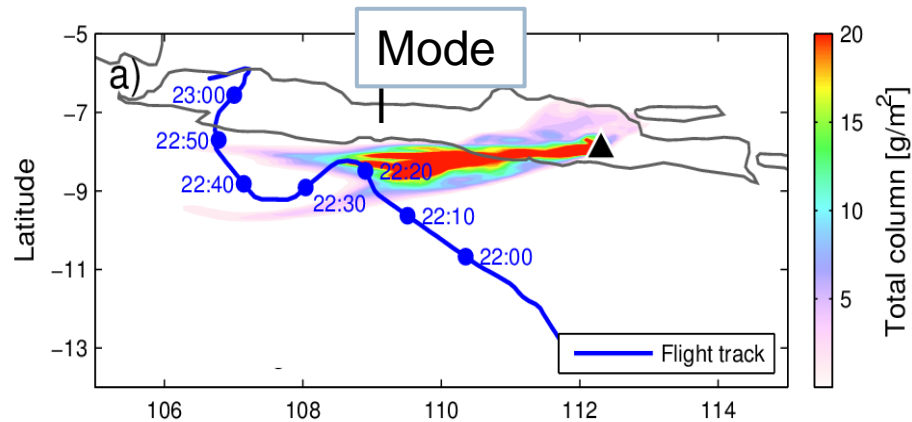
Vertical distribution (all latitudes)



Vertical cross section along flight track



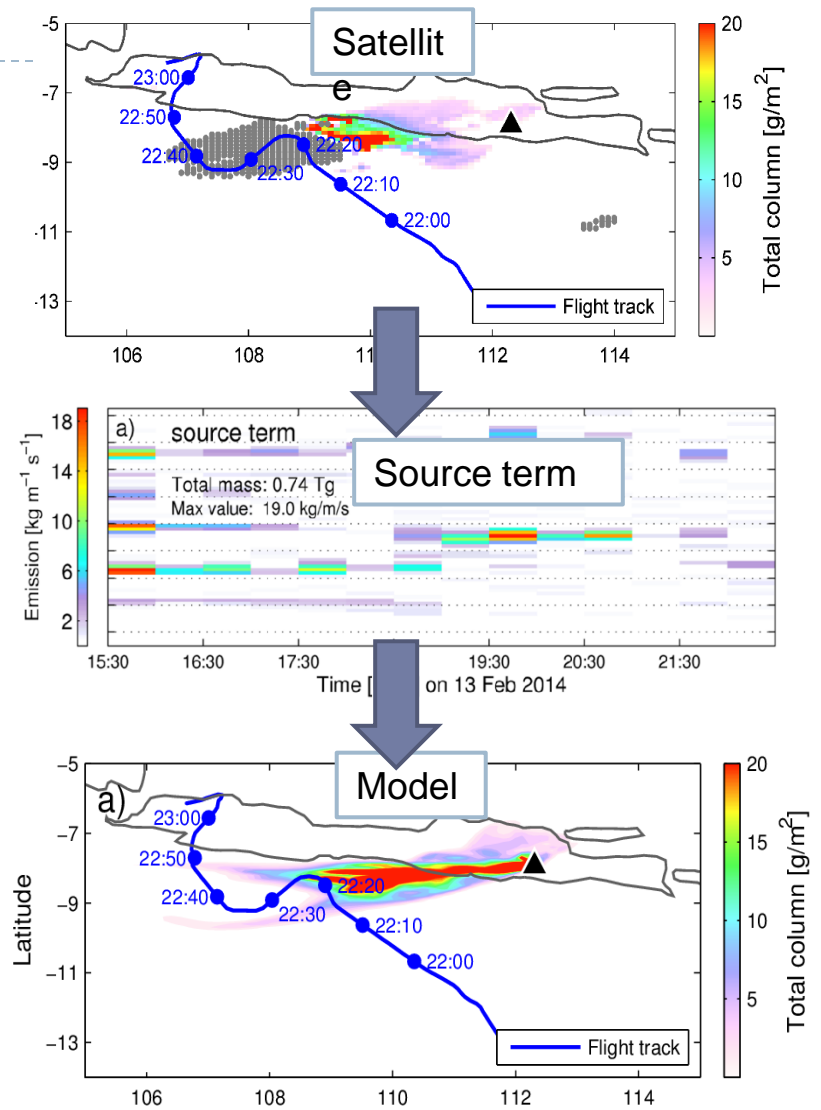
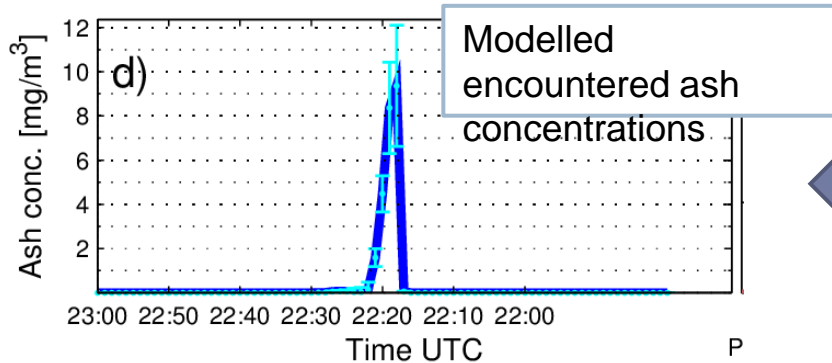
# Modelling the aircraft encounter



Modelling suggests the aircraft flew in areas with **ash concentrations up to 9-12 mg/m<sup>3</sup> over a period of 10-12 min**

## Key point

The method of combining satellite retrievals and transport modeling gives information that *cannot be obtained using either data source alone!*





Thank you



Questions



Contact: [nik@nilu.no](mailto:nik@nilu.no)

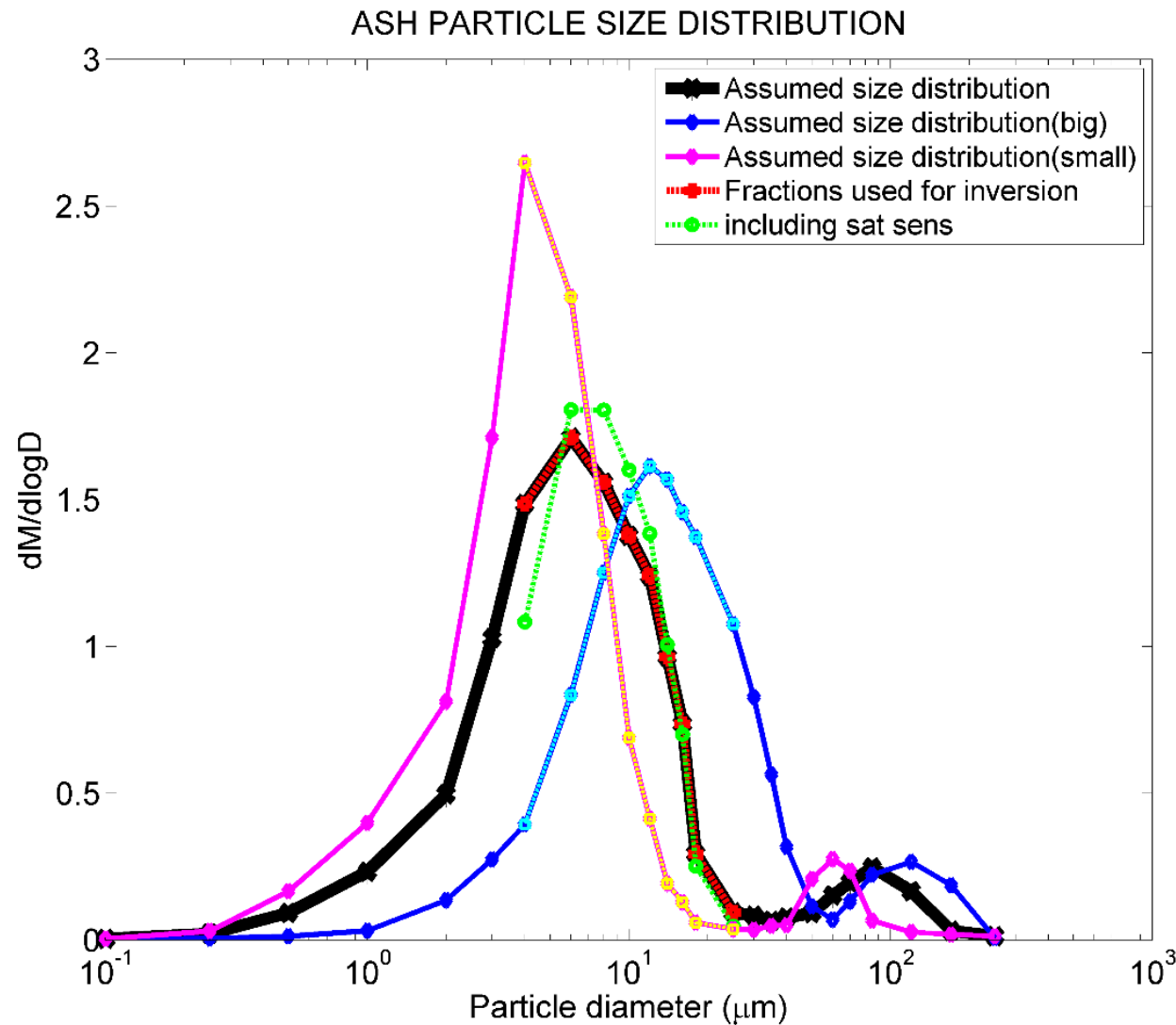


Additional slides



x/x

# Sensitivity to assumed particle size distribution





# Sensitivity to assumed particle size distribution

## DEFAULT PSD

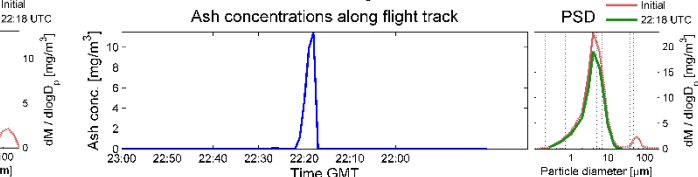
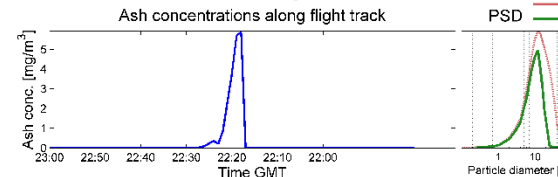
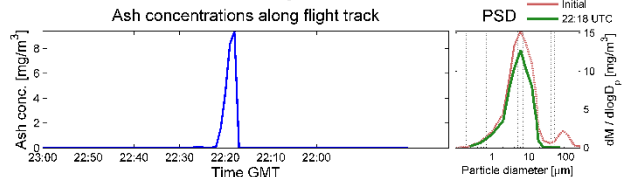
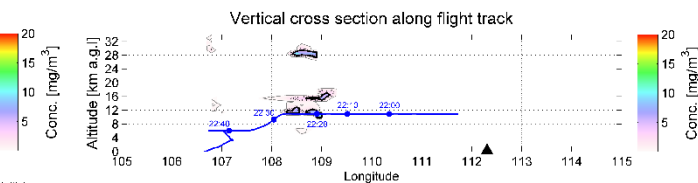
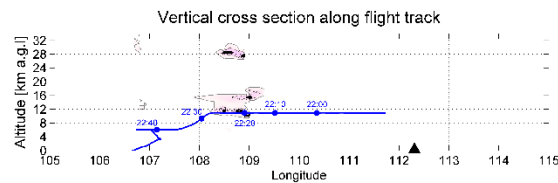
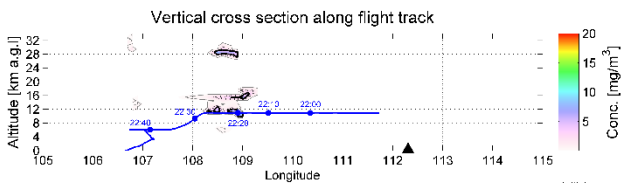
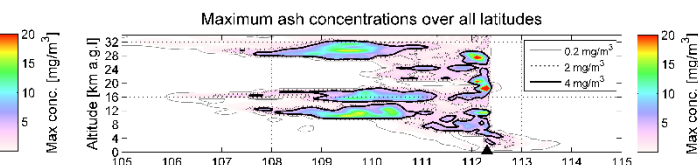
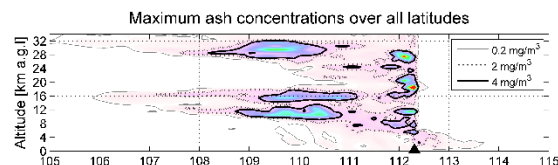
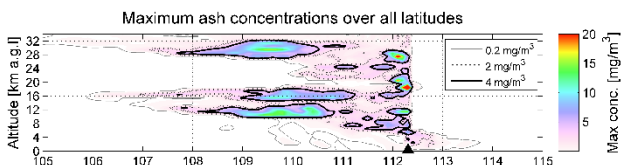
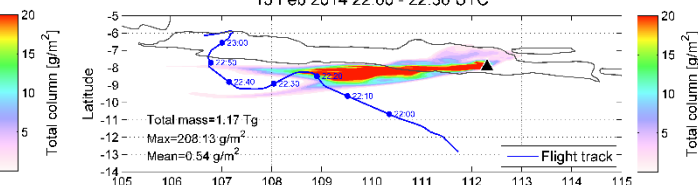
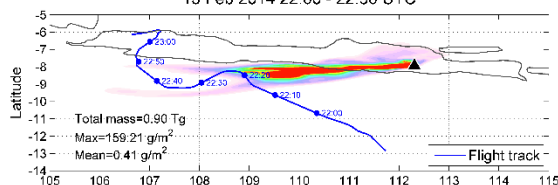
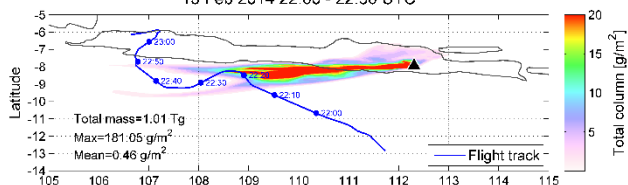
## BIG PSD

## SMALL PSD

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

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

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



# Some limitations of inverse modelling

---

- ▶ Relies on the “quality” of the satellite data or other constraining data
  - ▶ Characterizing the uncertainties related to the three inputs are challenging
  - ▶ Assumes normally distributed uncorrelated errors
  - ▶ Some subjective adjustments might be needed
  
  - ▶ Implicitly assumes that the uncertainty of the volcanic cloud modeling is dominated by the uncertainty of the source term
  - ▶ As the volcanic cloud gets transported further from the source, this assumption could be violated due to errors in meteorology and/or model parametrizations
  - ▶ Combining data assimilation and source term inversions could be helpful
-