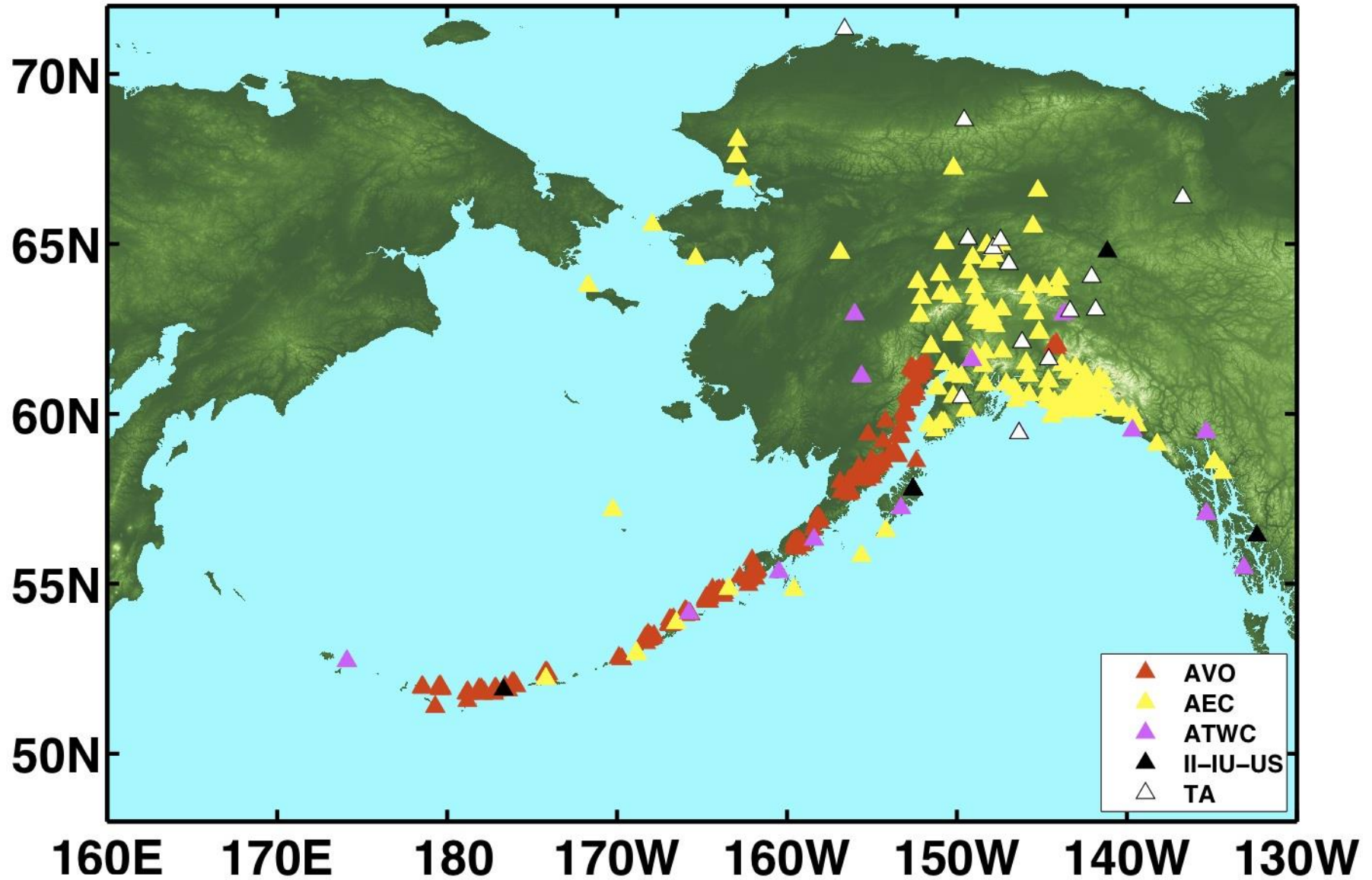


# Estimating plumes from seismic data: What we can and cannot do



# Seismic monitoring in Alaska

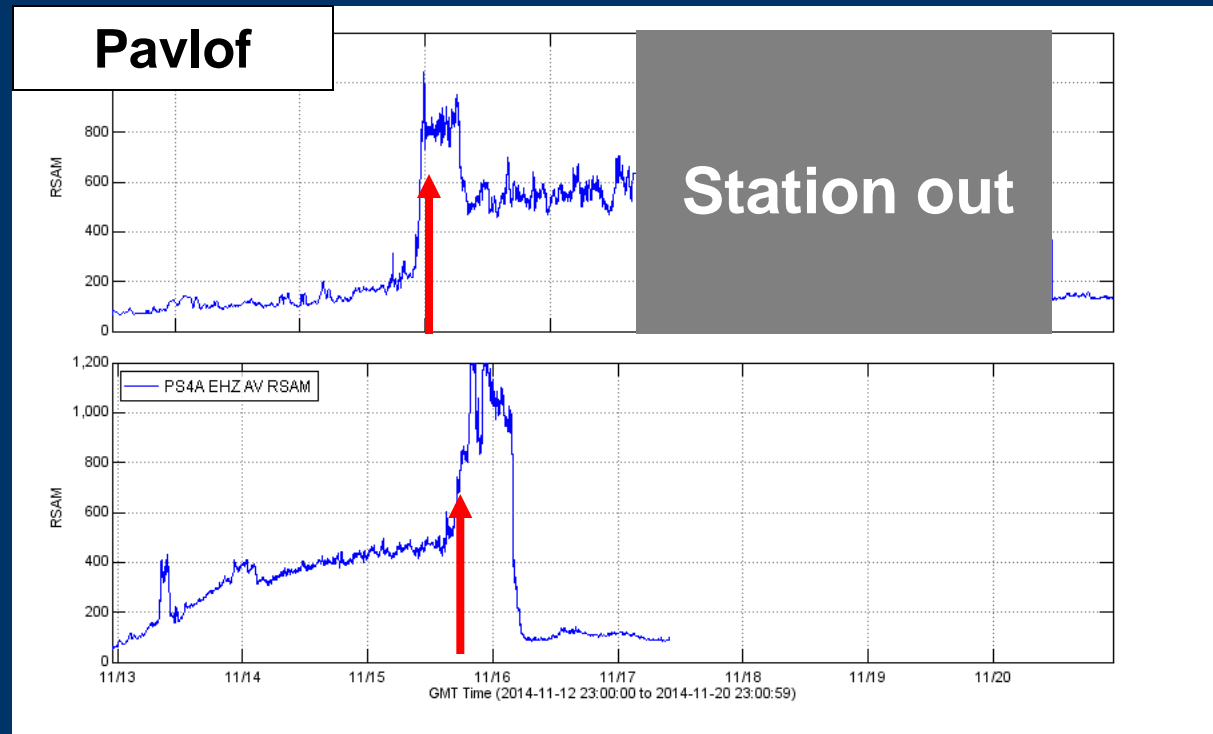


# Outline

- Review of plume seismology
- Force source seismic model
- Scaling arguments
- Counter-example: Okmok 2008

# Real-time seismic amplitude (RSAM)

May-June 2014



November 2014

Color code changes based in large part on increase in RSAM

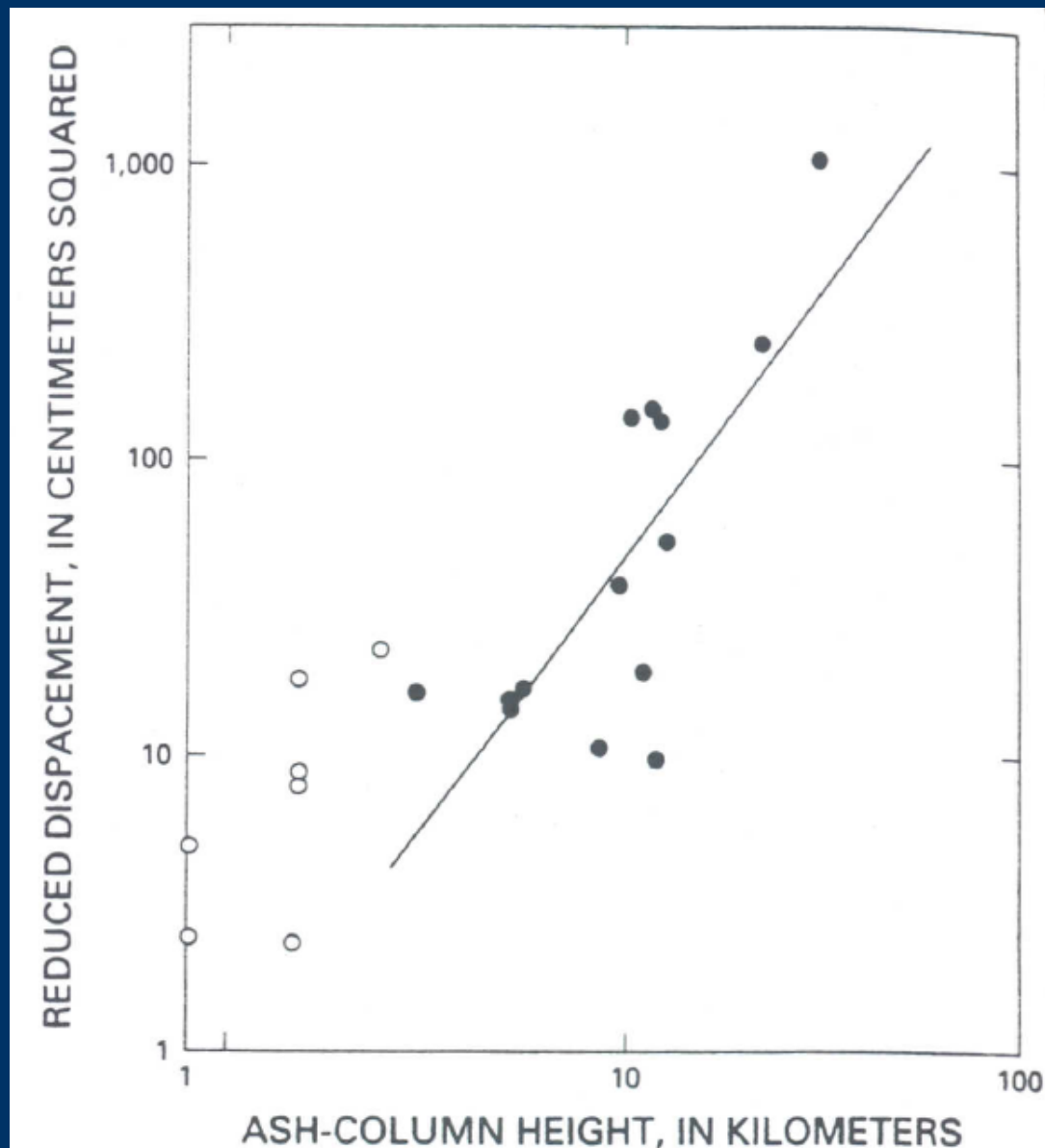
# Reduced displacement ( $D_R$ )

- Ground displacement multiplied by distance from source - physical dimensions of displacement squared
- In principle should be the same at all stations
- Analogous to scattering cross section in radiative transfer
- Alternatives are RSAM and radiated energy

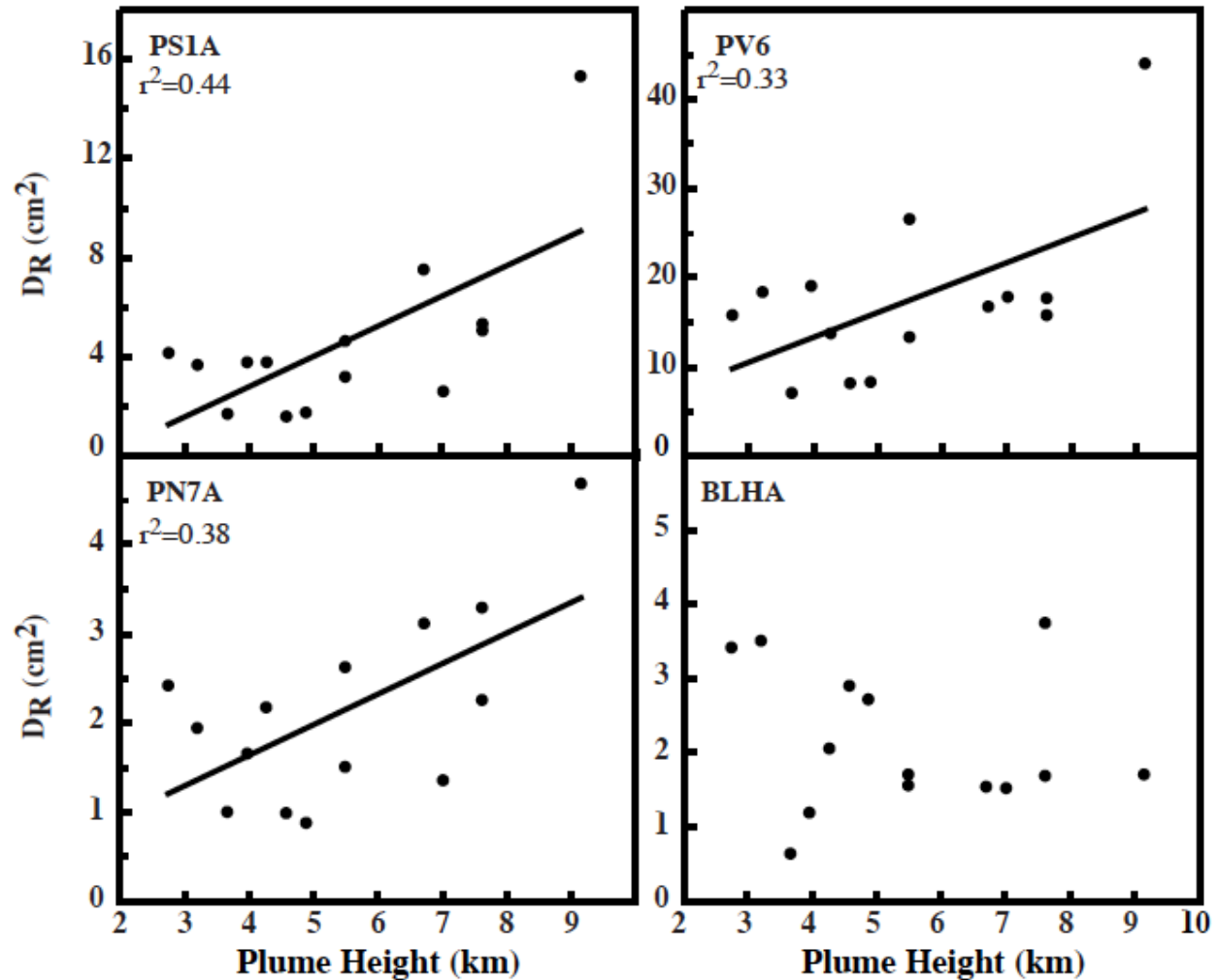
# Plume Height vs. $D_R$

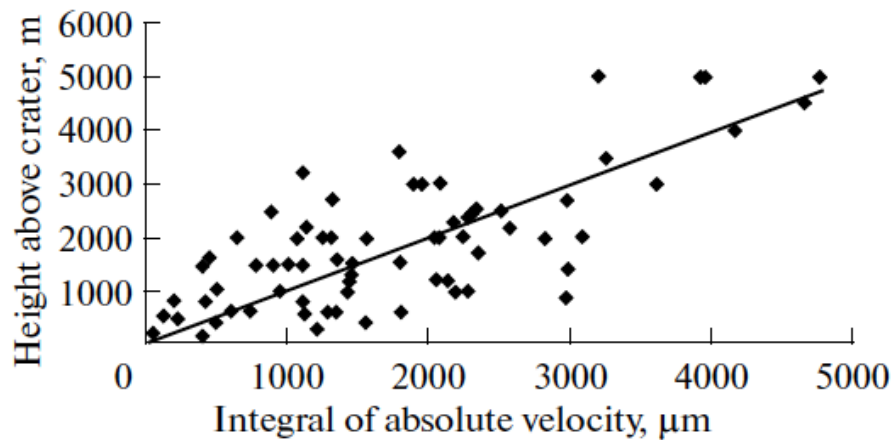
McNutt (1994)

$$\log_{10}(D_R) = 1.80 \log_{10}(H) - 0.08$$



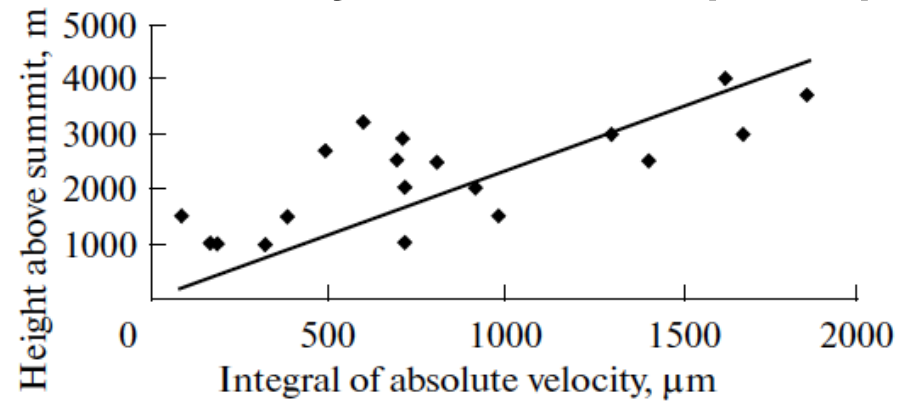
**Fig. 13** Comparison of reduced displacement ( $D_R$ ) and reported plume heights. Plume heights generally increase with reduced displacement; the effect is most apparent on stations PS1A and PN7A. Station PV6, on the other hand, had continually high levels of tremor associated with a debris or mud flow in a nearby gully; note the scale difference on the graph for PV6. Reduced displacement at station BLHA, located at 33 km, shows no relationship with plume height



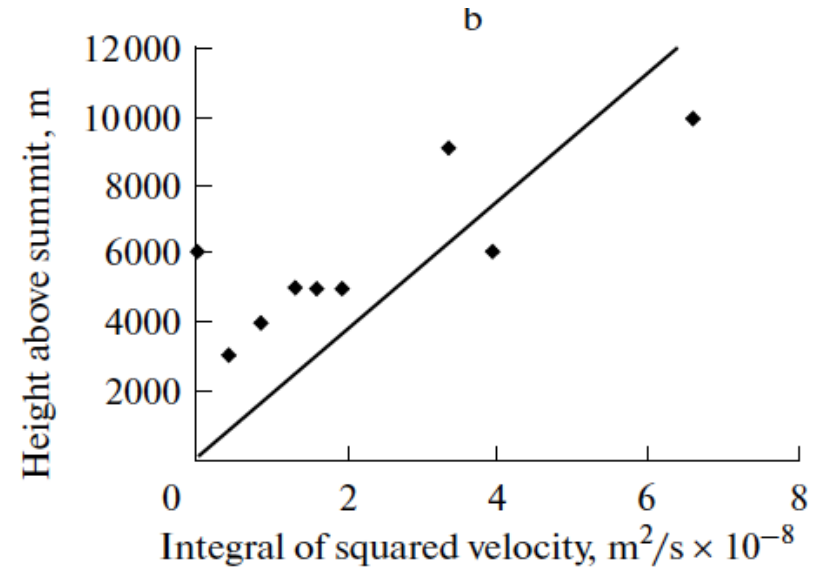
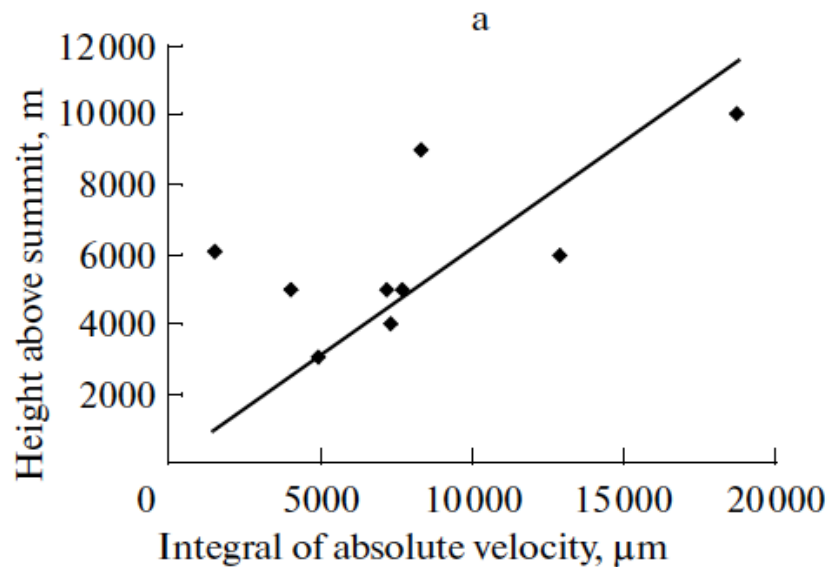


**Fig. 3.** The correlation between the height of ash plumes on Karymskii Volcano and the integral of absolute velocity as observed at the KRY station for 70 cases recorded by visual, photographic, and video observations in 2004–2007.

## Senyukov et al. (2013)



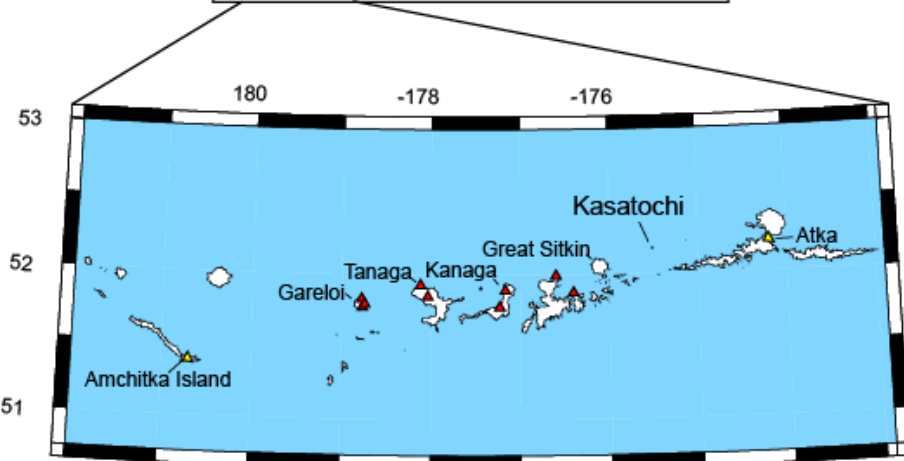
**Fig. 4.** The correlation between the height of ash emissions on Kizimen Volcano and the integral of absolute velocity as observed at the KZV station for 19 cases recorded by visual, photographic, and video observations in 2011.



**Fig. 5.** The correlation of the height of ash plumes on Bezmyannyi Volcano: (a) with the integral of absolute velocity, (b) with the integral of squared velocity. The analysis involved records of the LGN station for nine cases recorded by visual, photographic, and video observations.

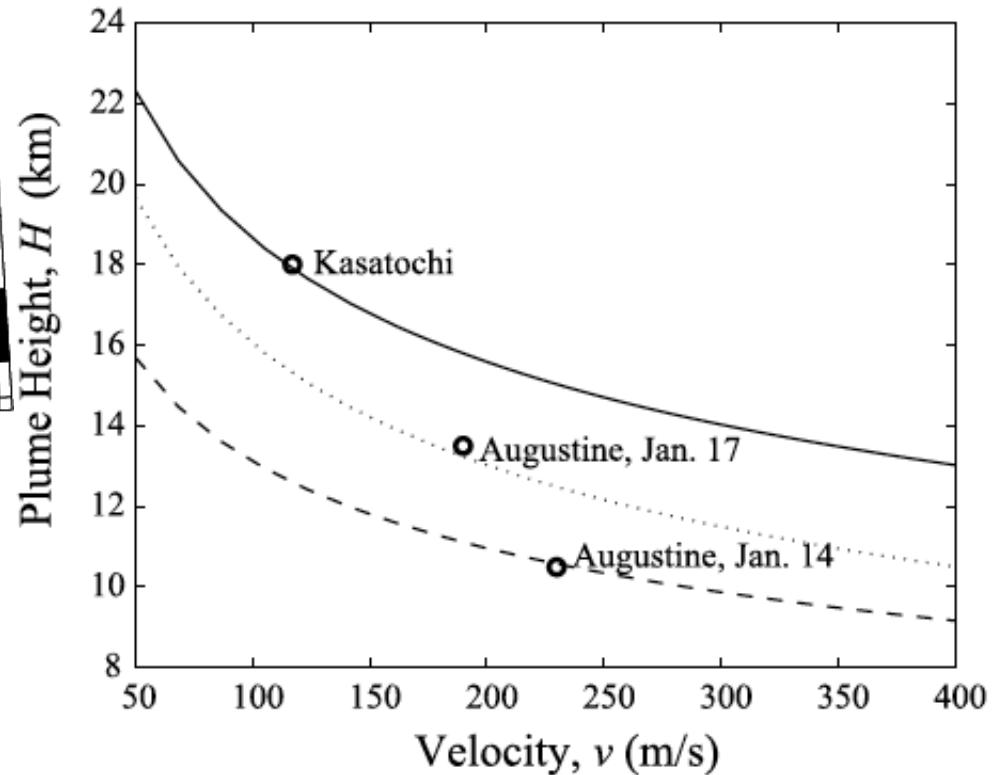


# Prejean and Brodsky (2011) *JGR*



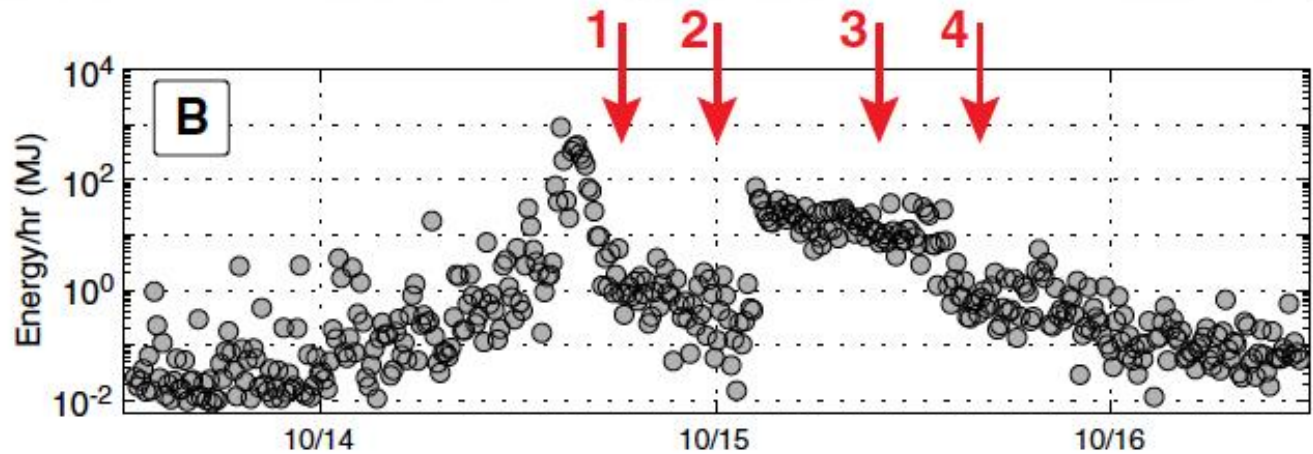
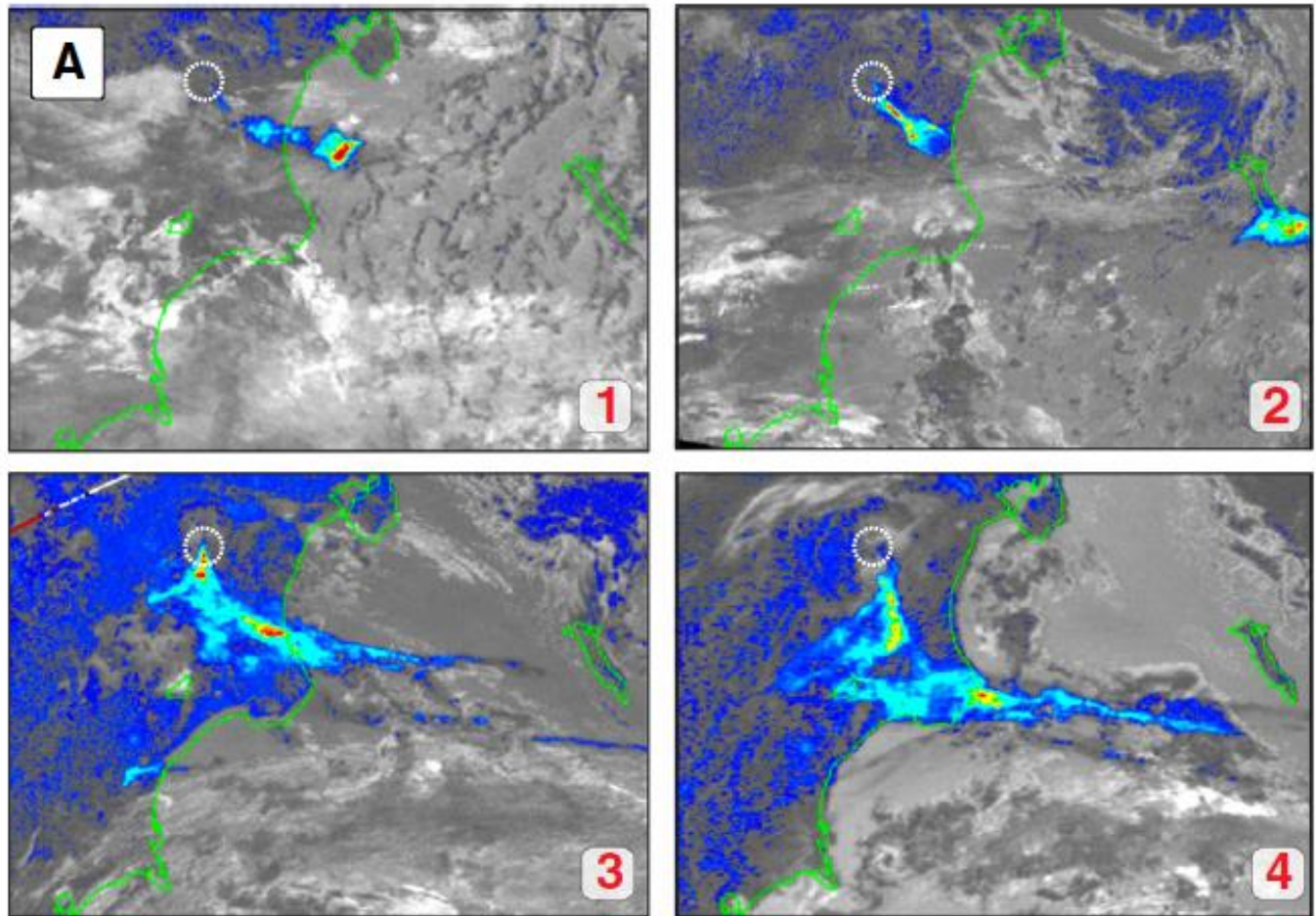
- Force source model
- Far-field Rayleigh waves
- Used Sparks *et al.* (1997) relation:

$$H \sim q^{1/4}$$



**Figure 8.** Calculated plume heights,  $H$ , for a possible range in  $v$  given measured displacement,  $u$ , for explosions at Kasatochi Volcano on 8 August 2008 (solid line), Augustine Volcano on 14 January 2006 (dashed line), and Augustine Volcano on 17 January 2006 (dotted line). Observed plume heights,  $H$ , and inferred preferred velocities,  $v$ , are indicated by circles.

# West (2013) JVGR



# Assumptions in plume seismology

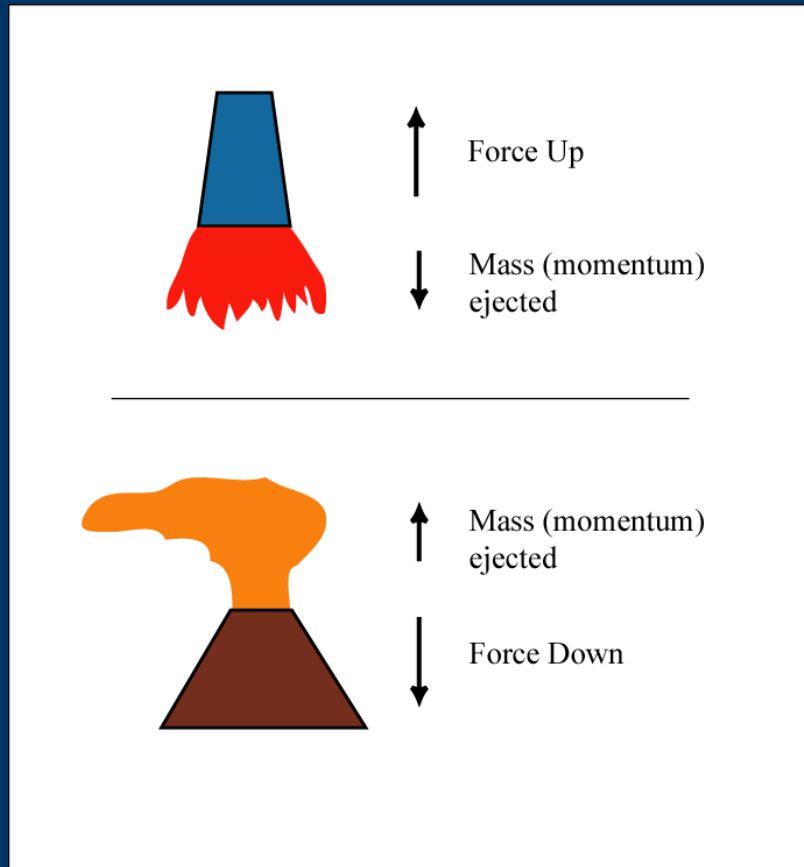
- **Seismic signals from the plume dominate**
  - Seismicity not at depth in the Earth
  - Not ground-coupled airwaves
- **Wave type known: P, S, or Rayleigh wave**
- **Distortion from path effects unimportant**
- **Amplitude proportional to plume height**
- **Applies for plumes higher than 5 km**

# Force source model

Prejean and Brodsky  
(2011) *JGR*:

A volcanic plume source acts as an inverted rocket engine, imparting force on the Earth:

$$F = q\rho V$$



$\rho$

Plume density

$q$

Volume eruption rate

$V$

Exit velocity

# Scaling: Radiated seismic power

$$W \sim \frac{\rho A V^6}{V_p^3} \left( \frac{\rho}{\rho_s} \right)$$

Prejean and Brodsky  
(2011) source model leads  
to above scaling relation  
for seismic power  $W$

$\rho$	Plume density
$A$	Area of vent
$V$	Exit velocity
$V_p$	P-wave velocity
$\rho_s$	Earth density

# Scaling: Acoustic analogy

Empirical constant or  
fudge factor

$$W \sim \frac{\rho AV^6}{V_p^3} \left( \frac{\rho}{\rho_s} \right)$$

$$P_D = K_D \frac{\rho_0 A_D V^6}{a_0^3}$$

Woulff and McGetchin (1976)

Dipole sound radiation model

# Scaling: Vent area and plume height

$$W \sim \frac{\rho AV^6}{V_p^3} \left( \frac{\rho}{\rho_s} \right)$$

Square root scaling  
with vent area

$$D_R \sim \sqrt{W} \sim \sqrt{A}$$

Rewriting in terms of  
volume eruption rate

$$W \sim \frac{\rho q V^5}{V_p^3} \left( \frac{\rho}{\rho_s} \right)$$

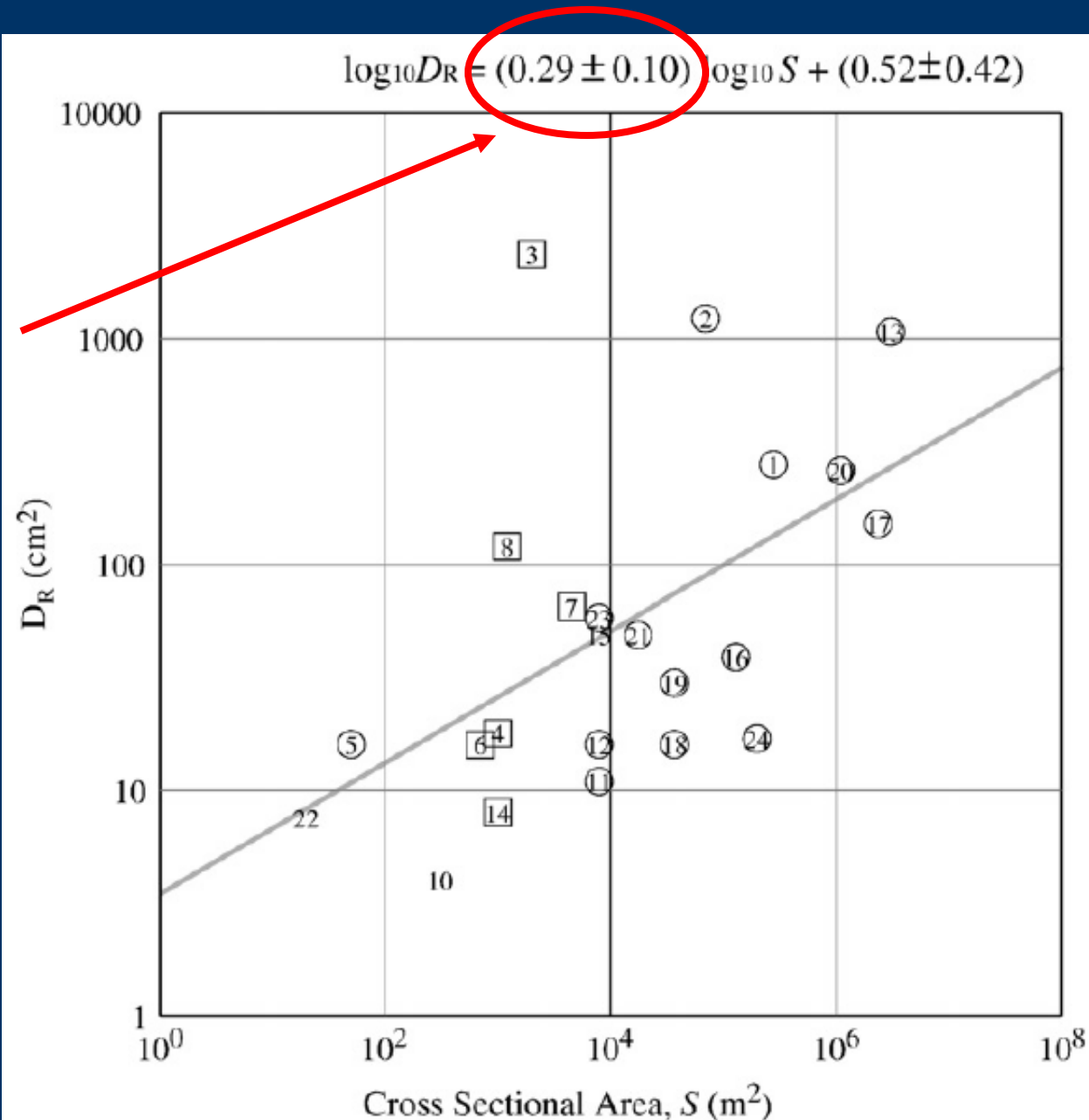
Together with Sparks *et al.*  
(1997) relation gives quadratic  
scaling w/plume height

$$D_R \sim \sqrt{W} \sim H^2$$

# McNutt and Nishimura (2008)

**Close to scaling prediction of 0.5**

**“We infer that the maximum reduced displacement is approximately proportional to the square root of the area of vents ...”**

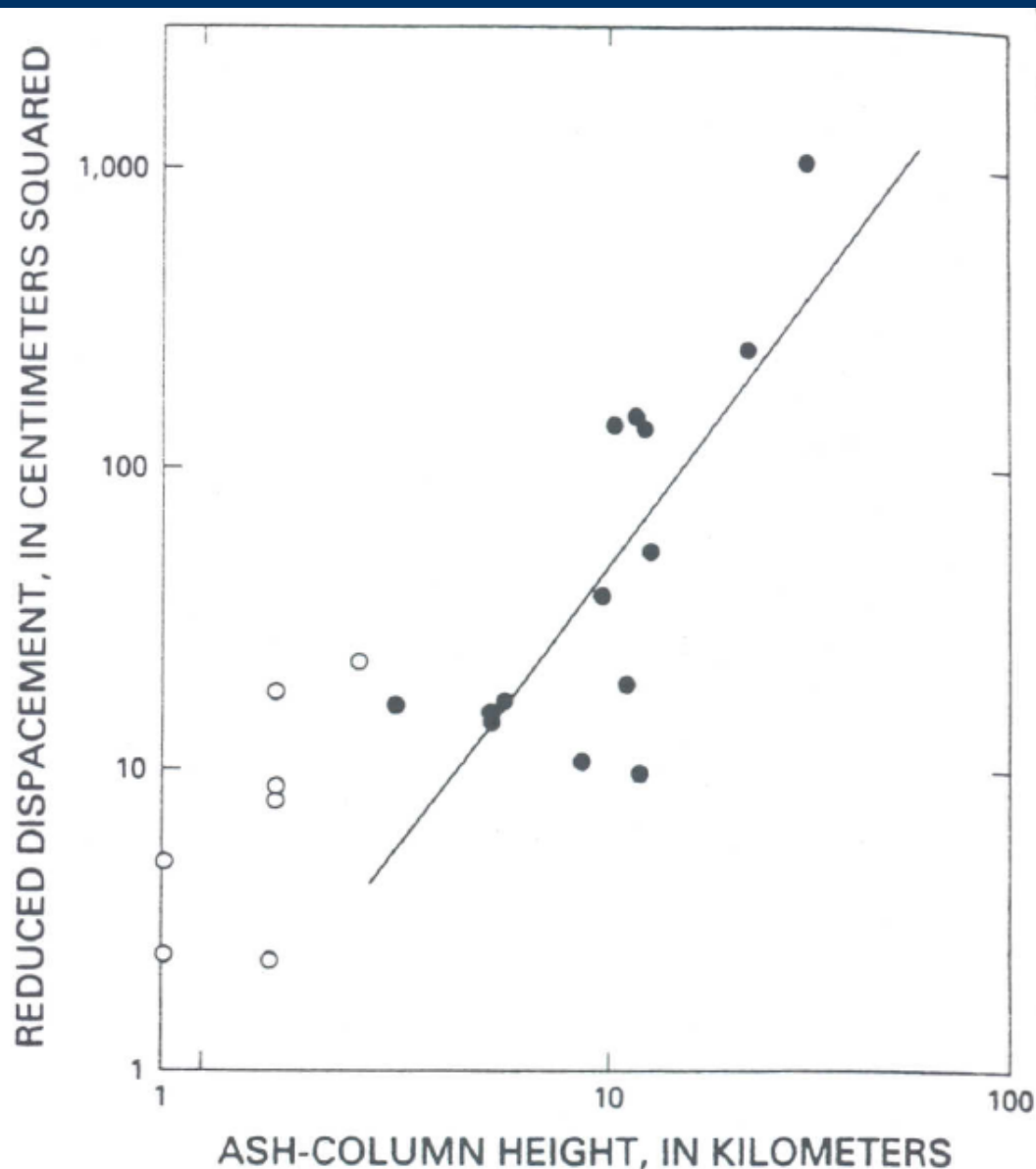




# McNutt (1994) revisited

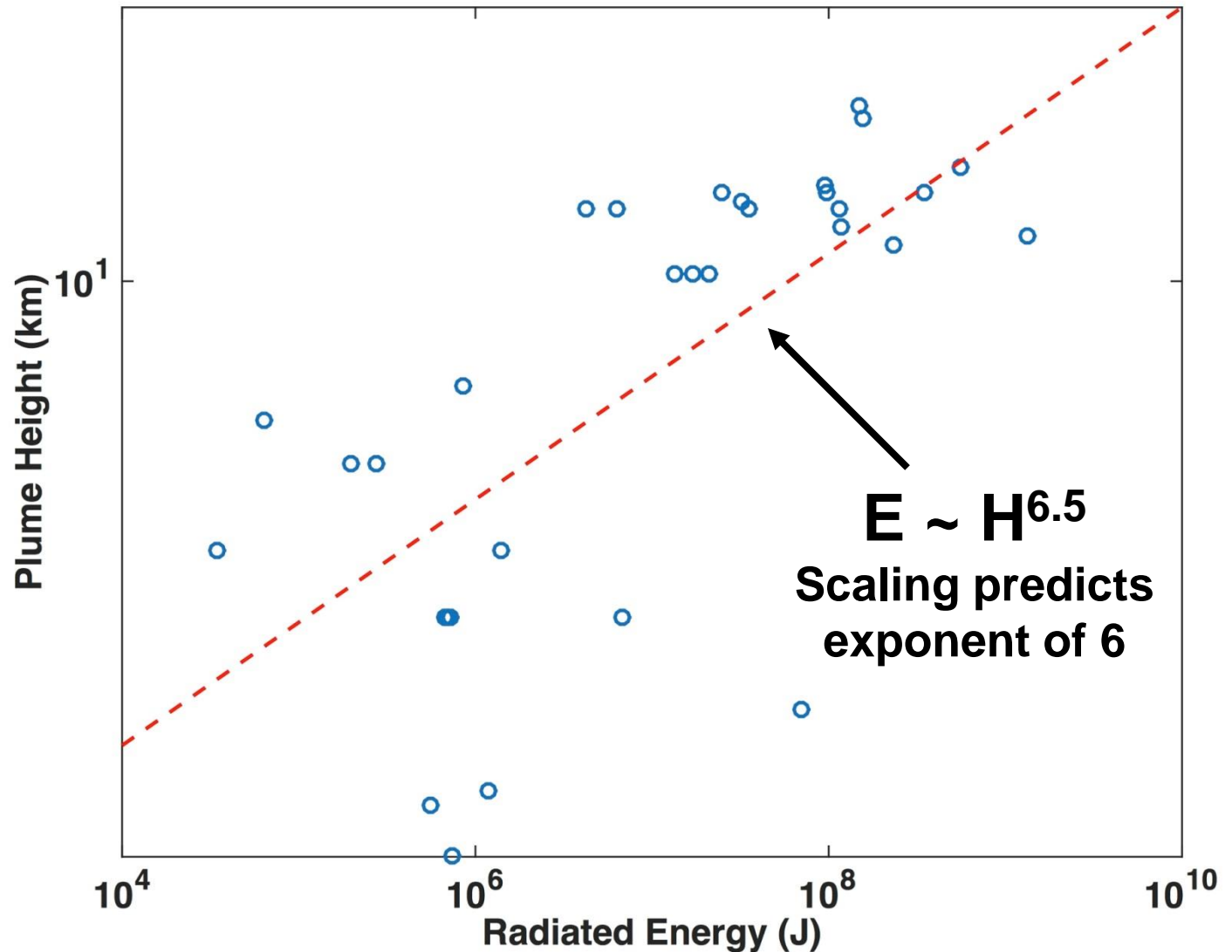
$$\log_{10}(D_R) = 1.80 \log_{10}(H) - 0.08$$

Close to scaling prediction of 2

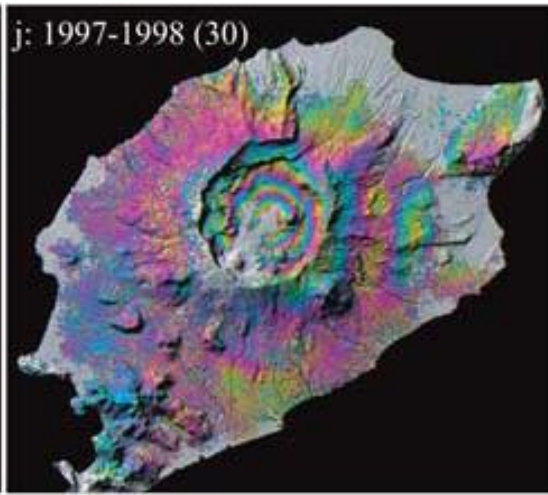
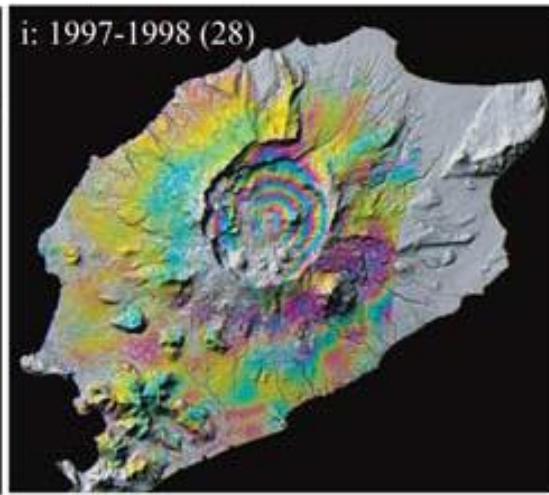
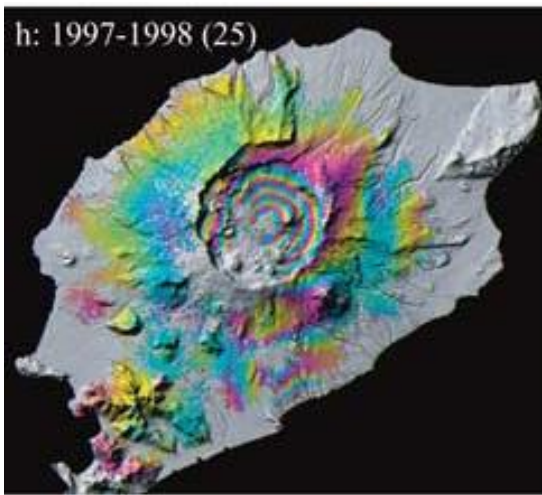


# Redoubt 2009 explosive events

Radiated energy and plume height data from McNutt *et al.* (2013)



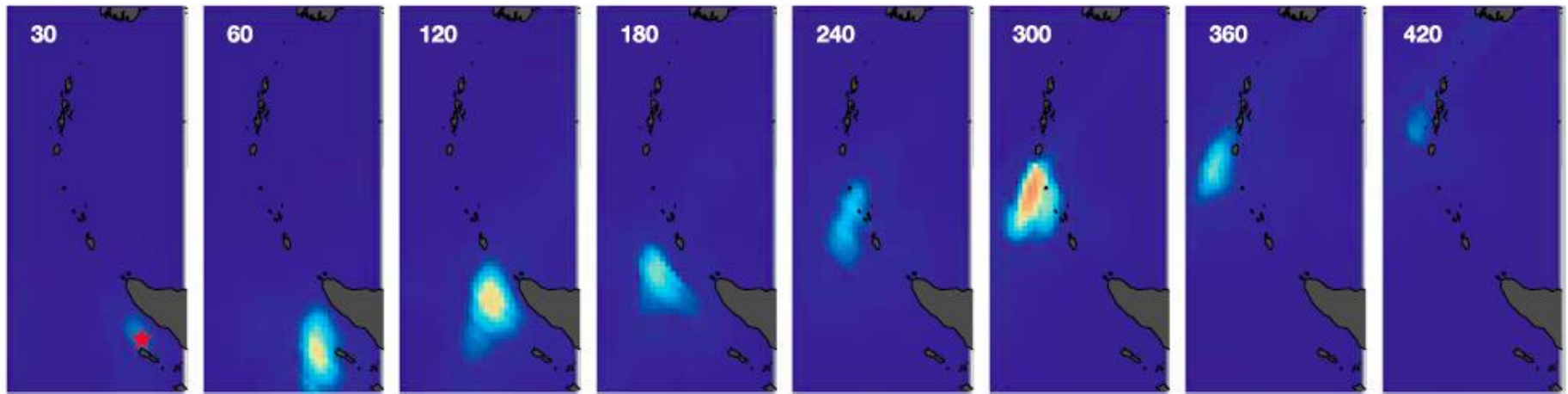
# Okmok Volcano: A counter- example



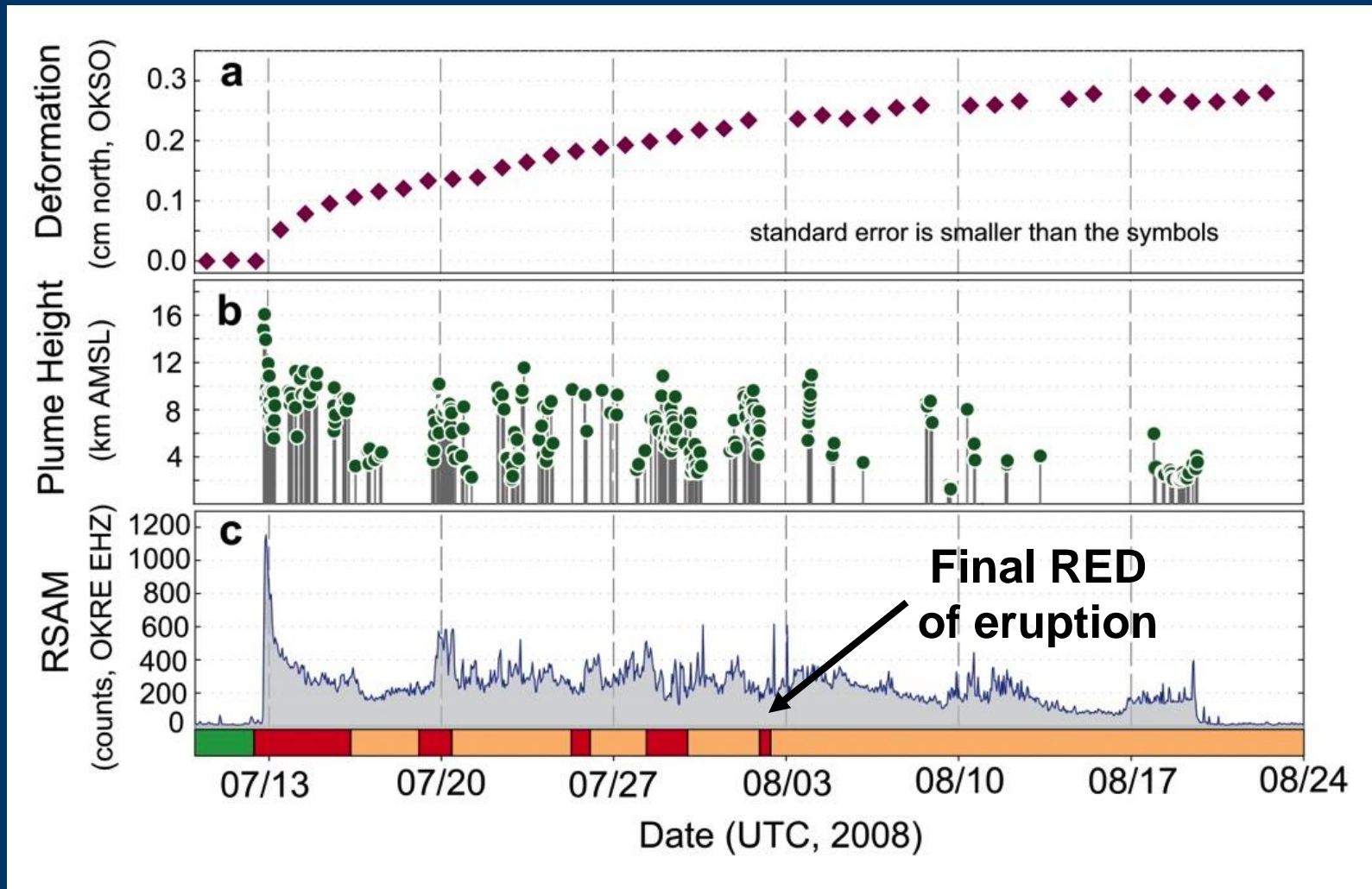
# Backprojection Method

- Illuminating the source by summing over stations

$$s_j(t) = \sum_k \left( p_k / A_k \right) u_k \left( t - t_{jk} + \Delta t_k \right)$$



# 2008 eruption of Okmok

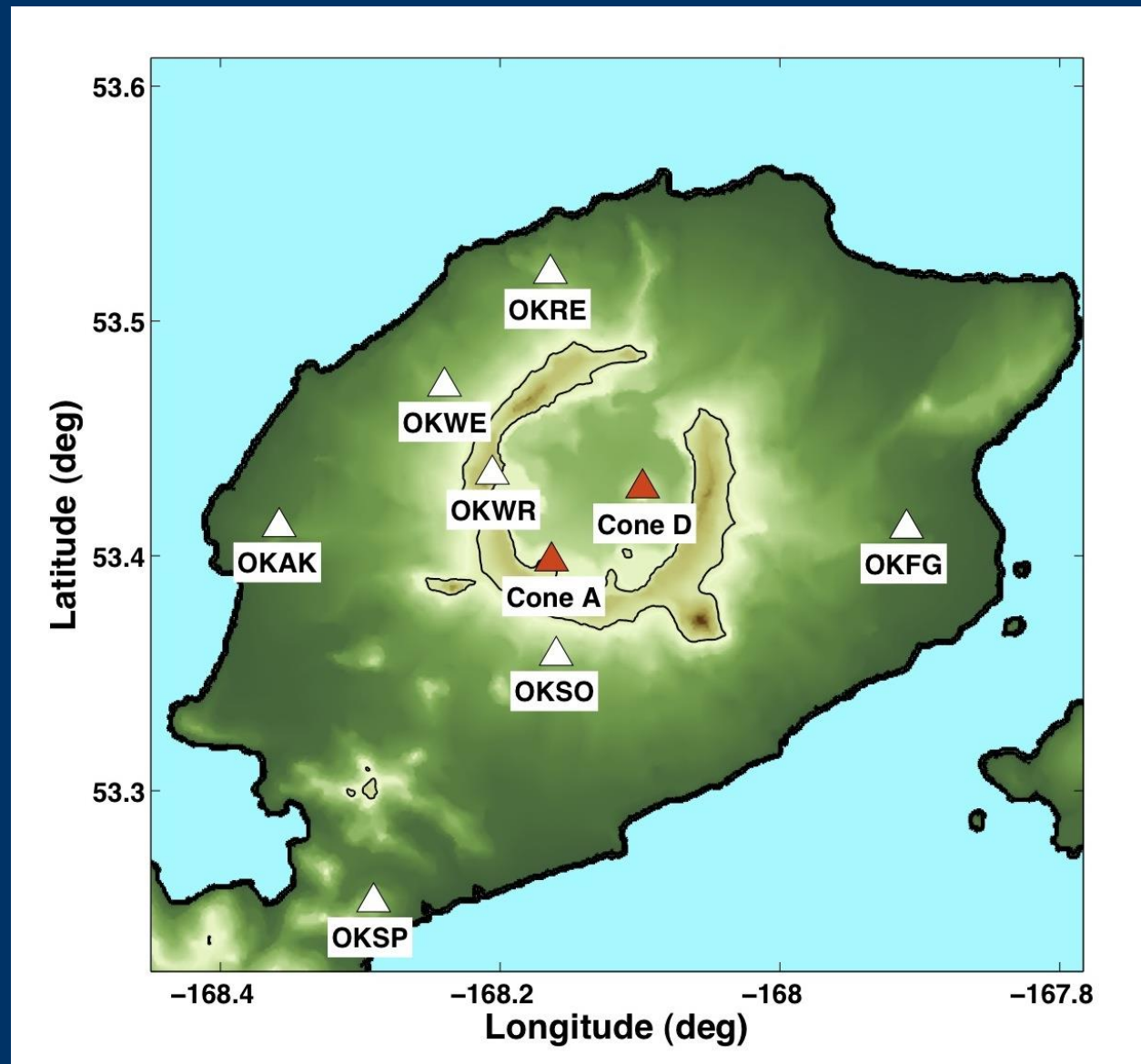


# Okmok seismic stations

2 broadbands:  
OKSO, OKFG

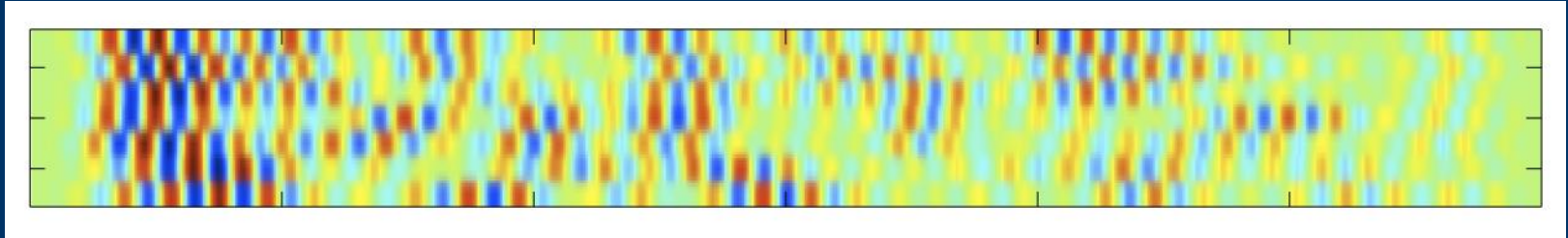
5 short-periods:  
OKAK, OKSP,  
OKWE, OKWR,  
OKRE

Several other  
stations damaged  
by eruption

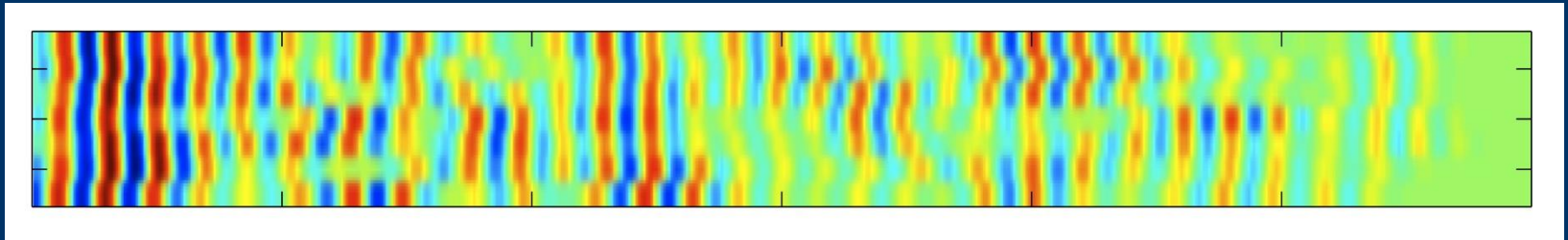


# Backprojection methodology

- Spectral whitening, time shift, and compute stack power for candidate source locations
- At Okmok, virtually no path effects in the 0.2-0.3 Hz band (Haney, 2010)
- Time shifting based on a homogeneous surface wave velocity model of 2.7 km/s (Masterlark *et al.*, 2010)

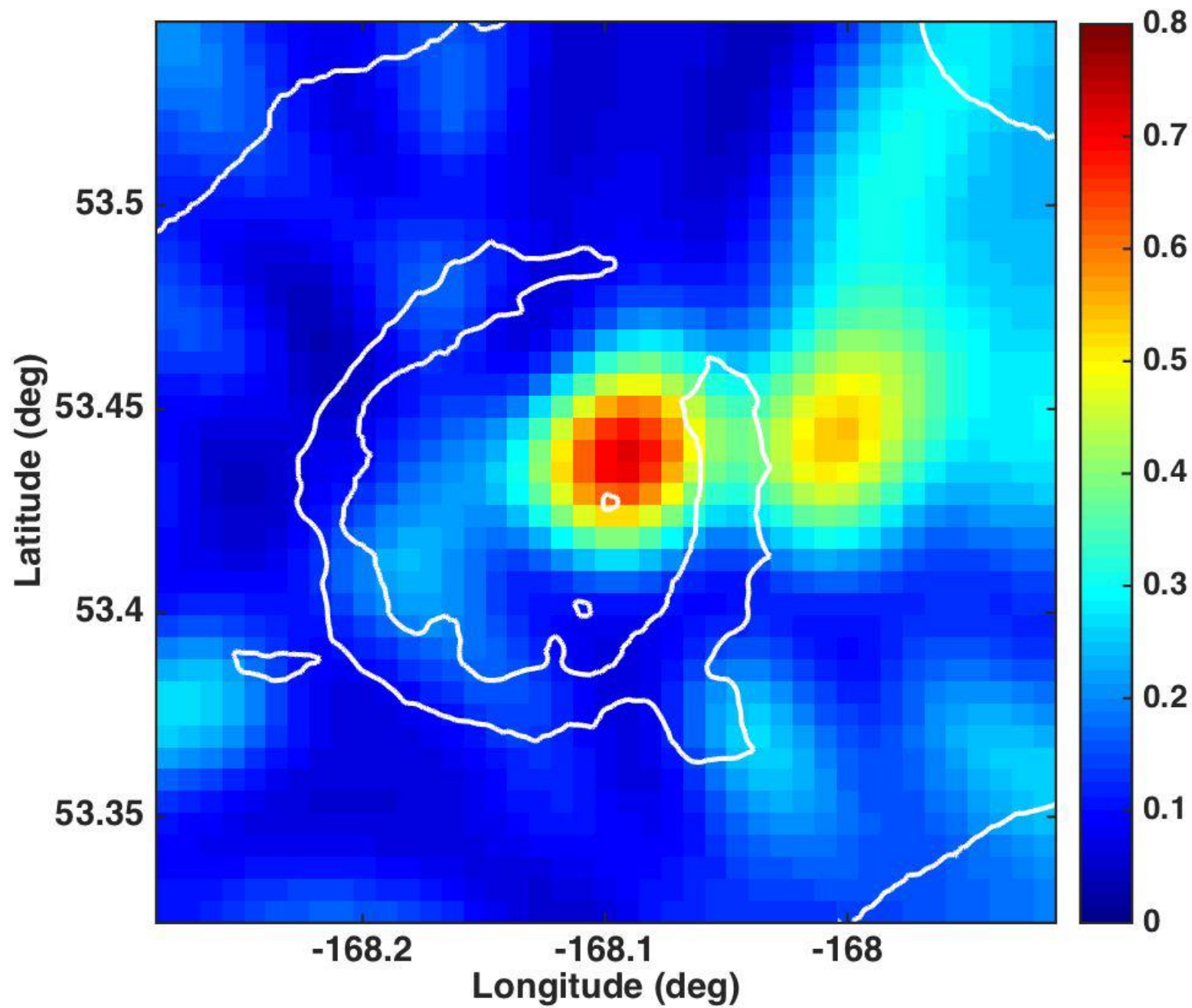


**Raw seismograms**



**Seismograms shifted at tremor location**

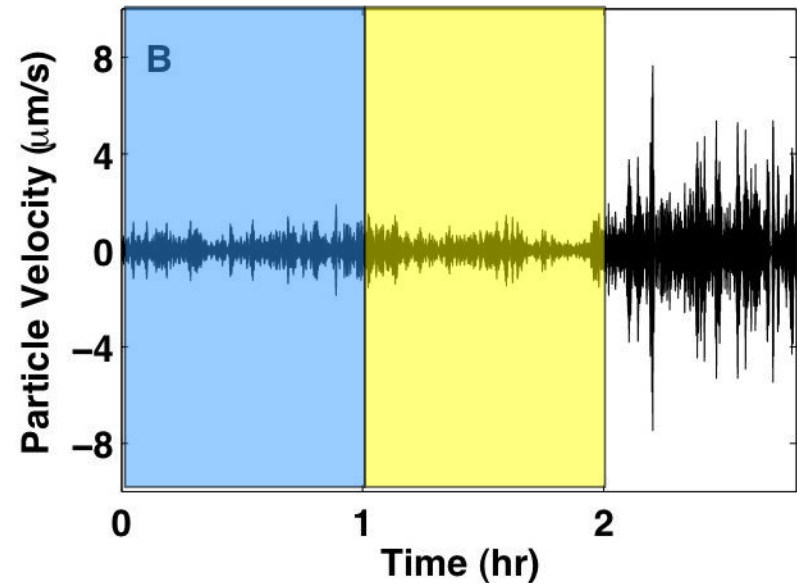
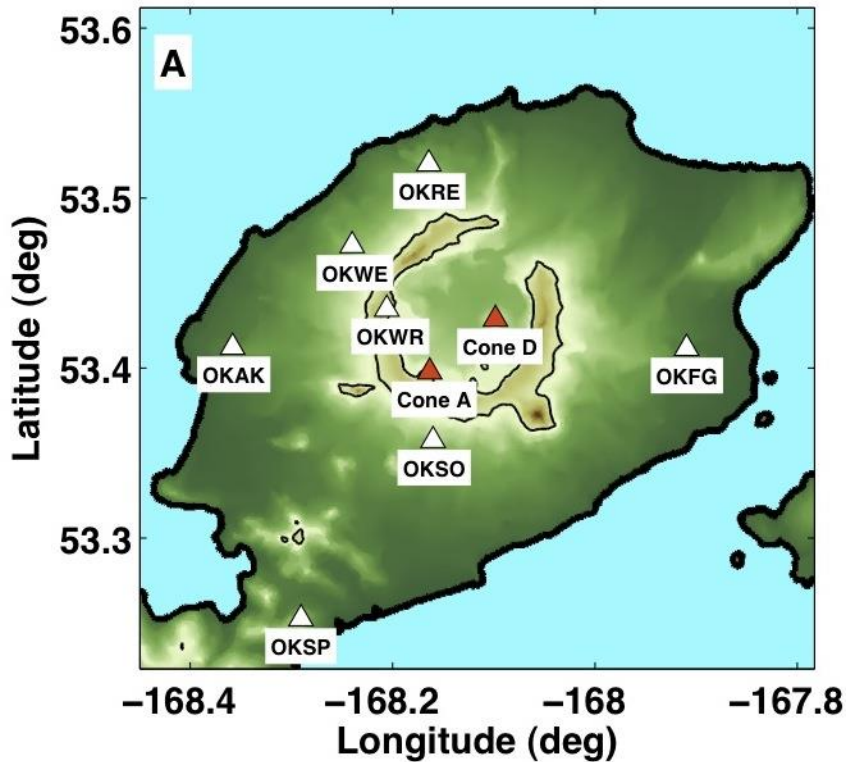




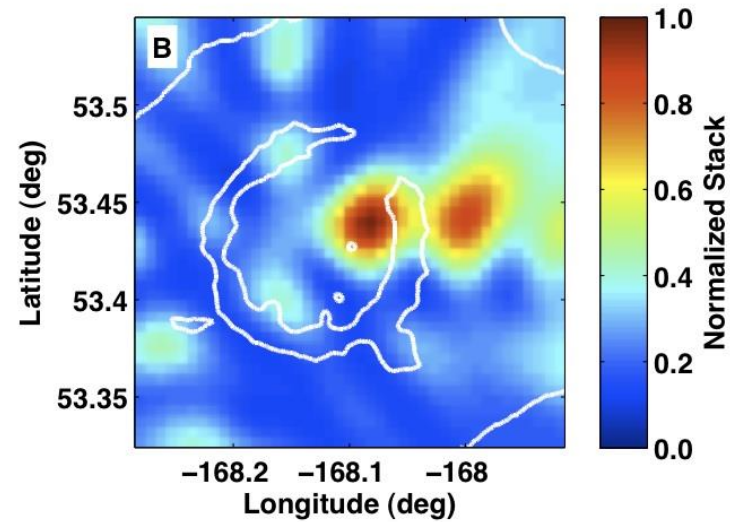
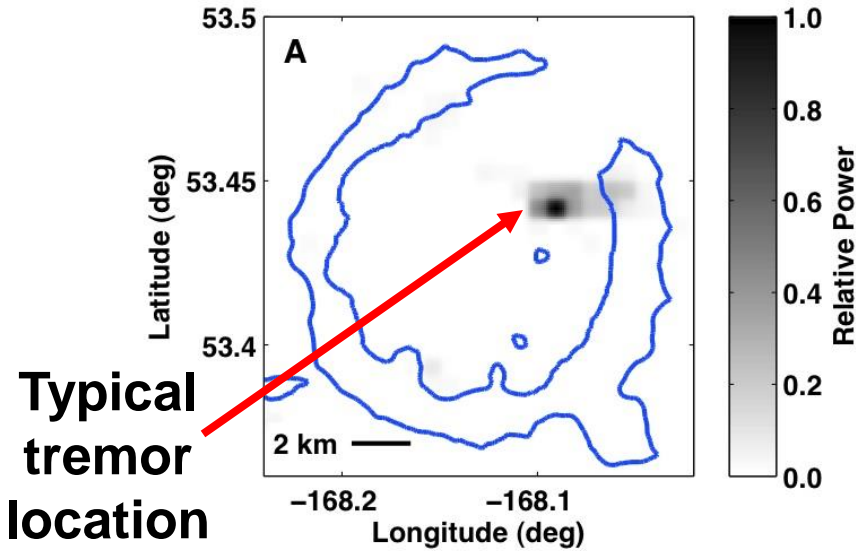
# Array Deconvolution

- Problem: Impulse response of modest 7 station network lacks sharp resolution
- Solution: Remove impulse response by deconvolution
- Two possible methods:
  - Richardson-Lucy, Nishida *et al.* (2008) *GRL*
  - Non-Negative Least Squares

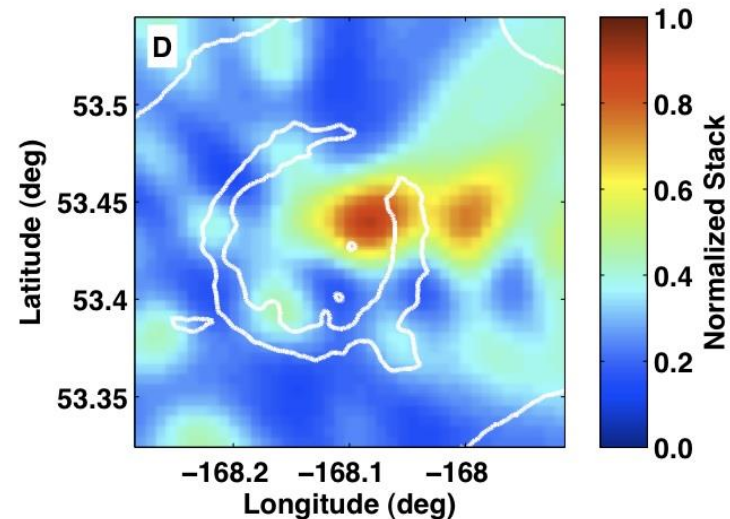
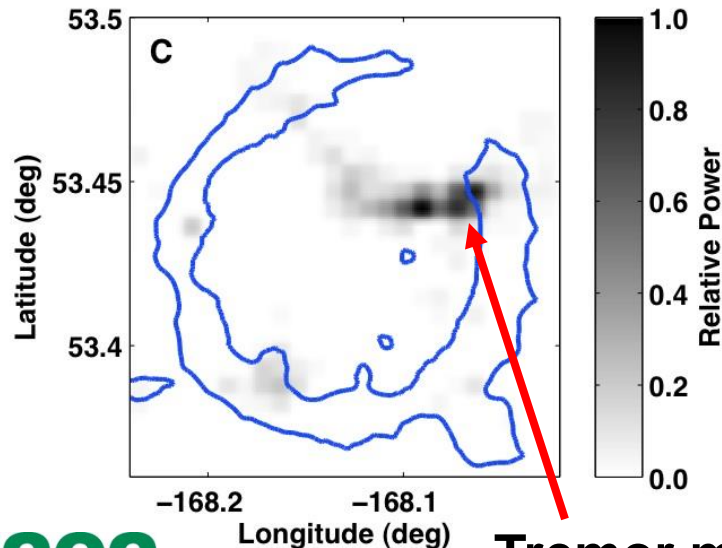
# August 2, 2008 tremor episode

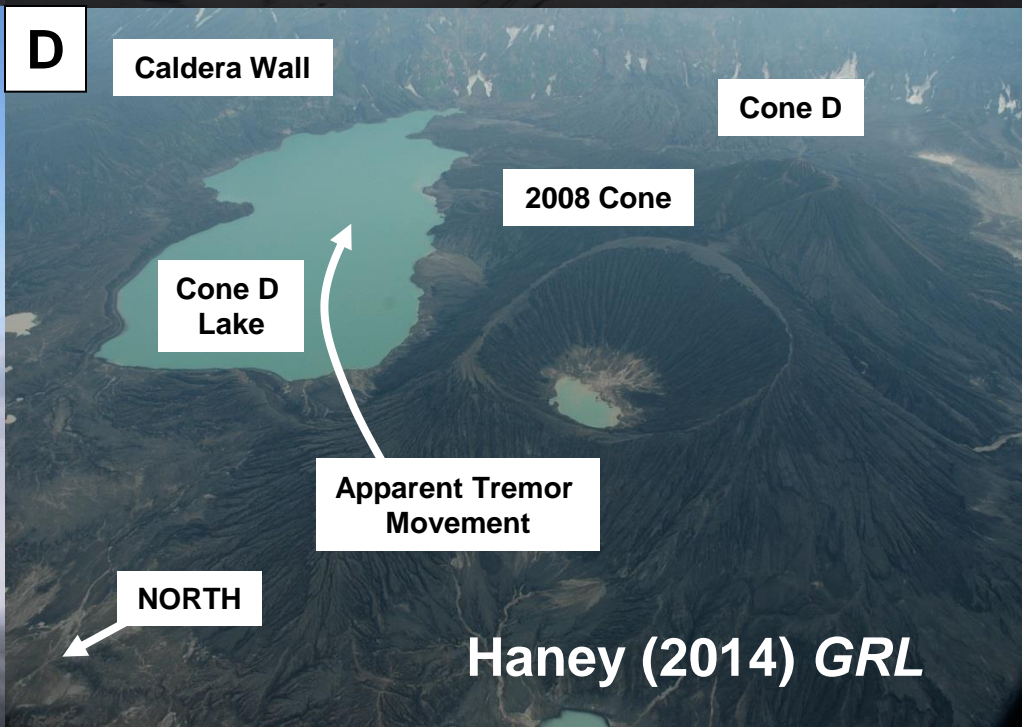


# 1-2 hours prior to tremor escalation at Okmok Volcano, 2008



## 0-1 hours prior to tremor escalation





# Conclusions

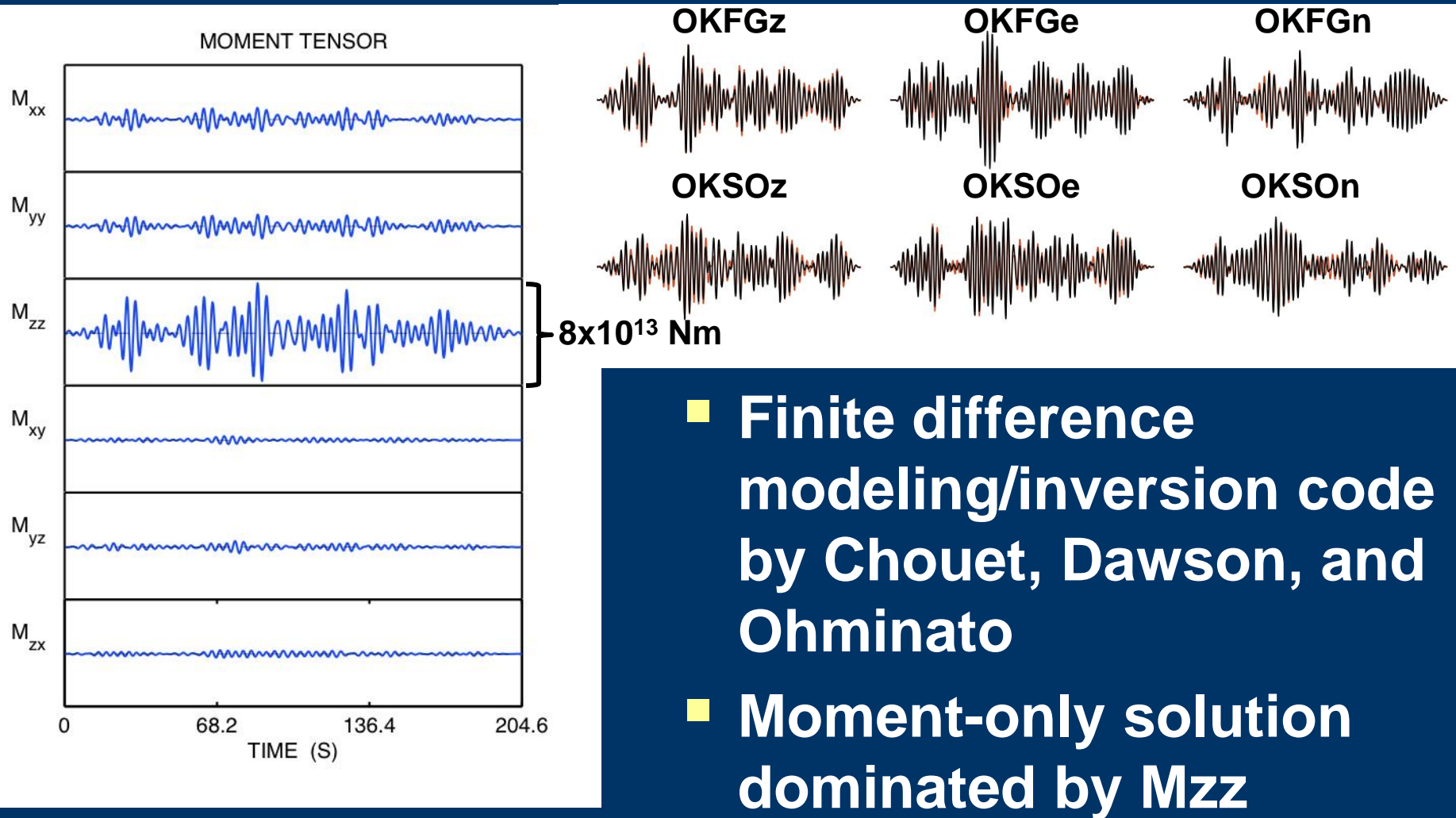
- **What we cannot do:**
  - Reliably predict the fudge factor  $K_d$  at a volcano
  - Strictly speaking, untangle the combination of parameters controlling radiated energy
- **What we can do:**
  - Roughly predict plume heights from seismic based on previous eruption observations
  - Use time-varying seismic amplitude as a proxy for changes in exit velocity







# Waveform inversion of tremor

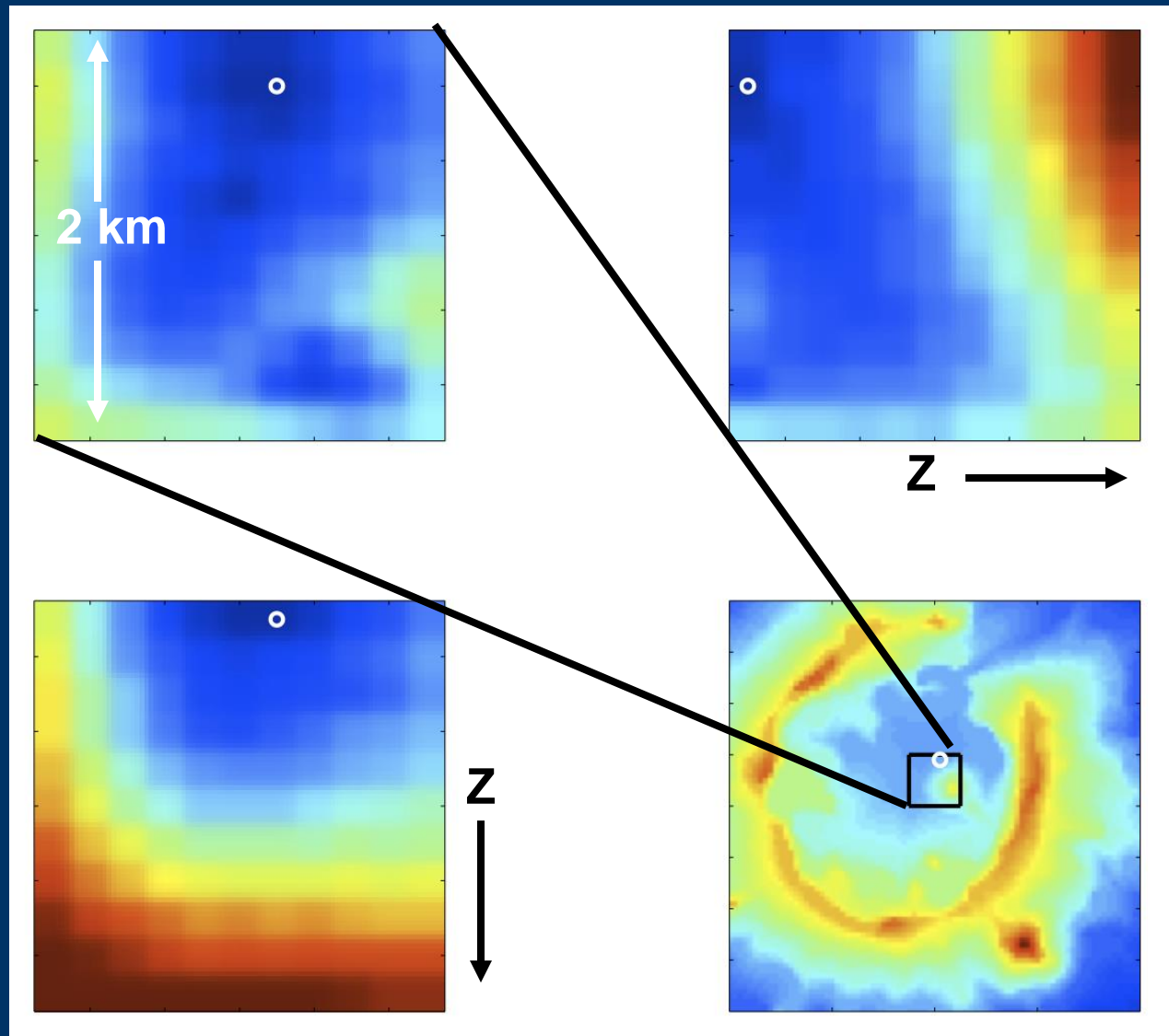


$$E1 = 100 \times \text{Var}(\text{Misfit}) / \text{Var}(\text{Data}) = 17\%$$

# Location from waveform inversion

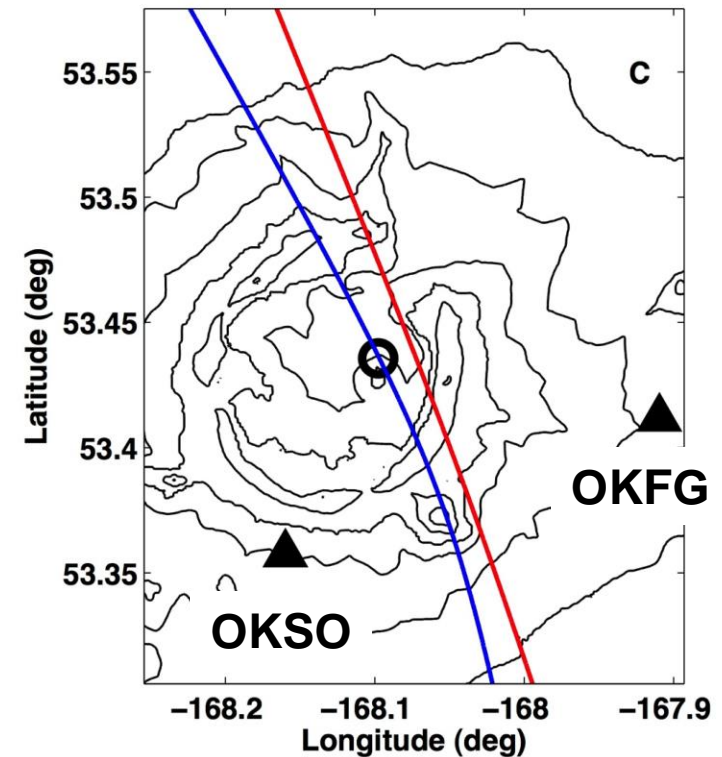
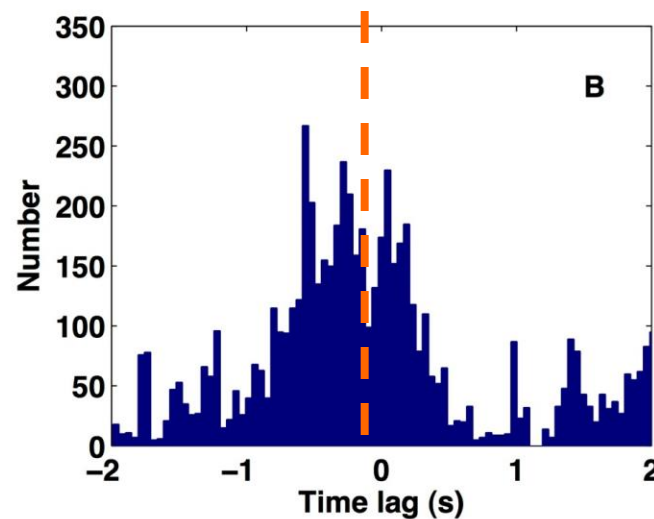
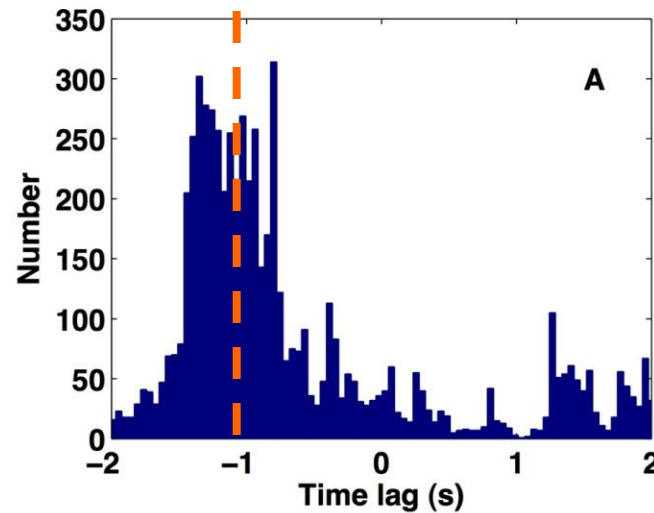
Error volume  
slices: blue =  
less error

Tremor at  
shallow  
depth, < 1 km



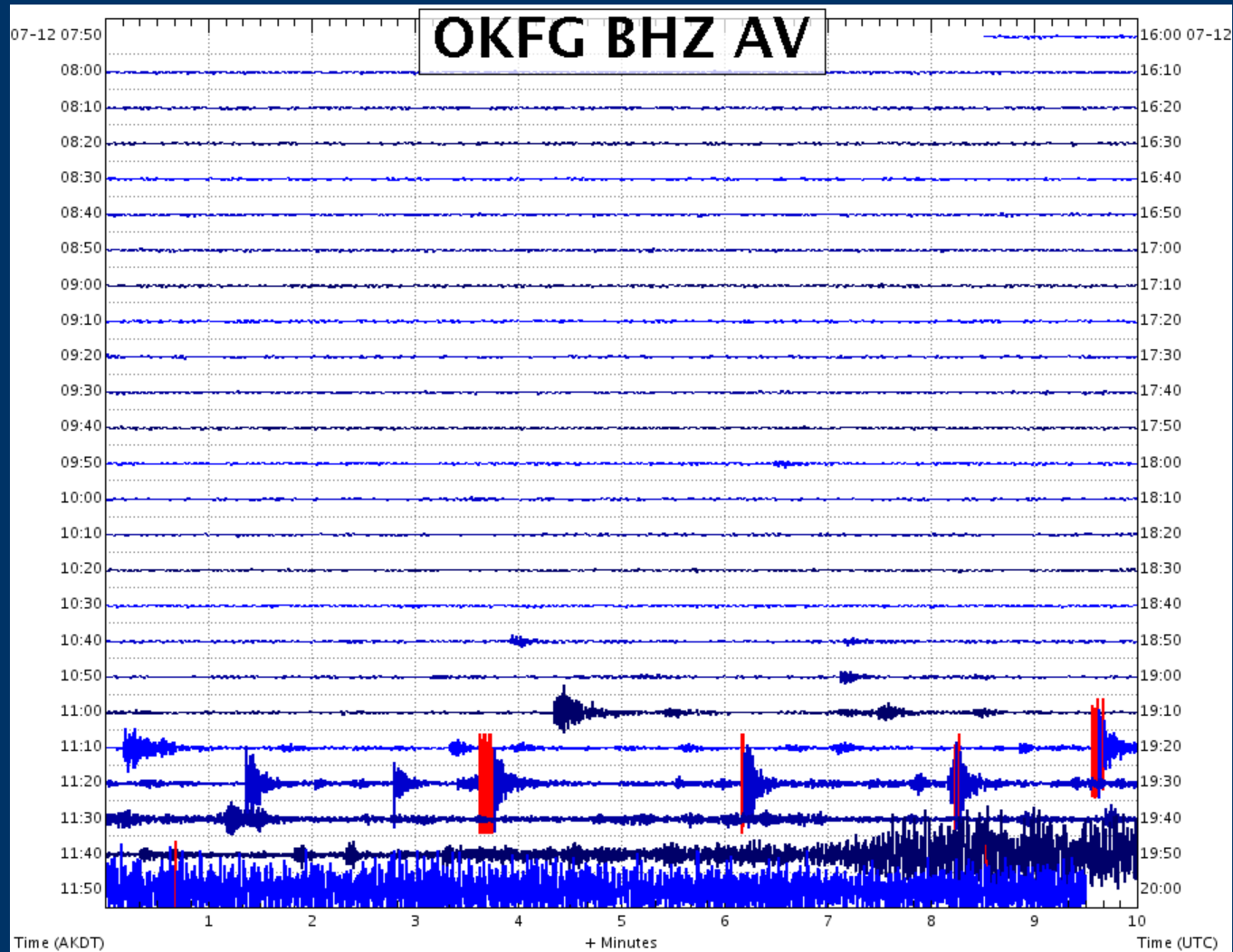
# Interstation times during escalation

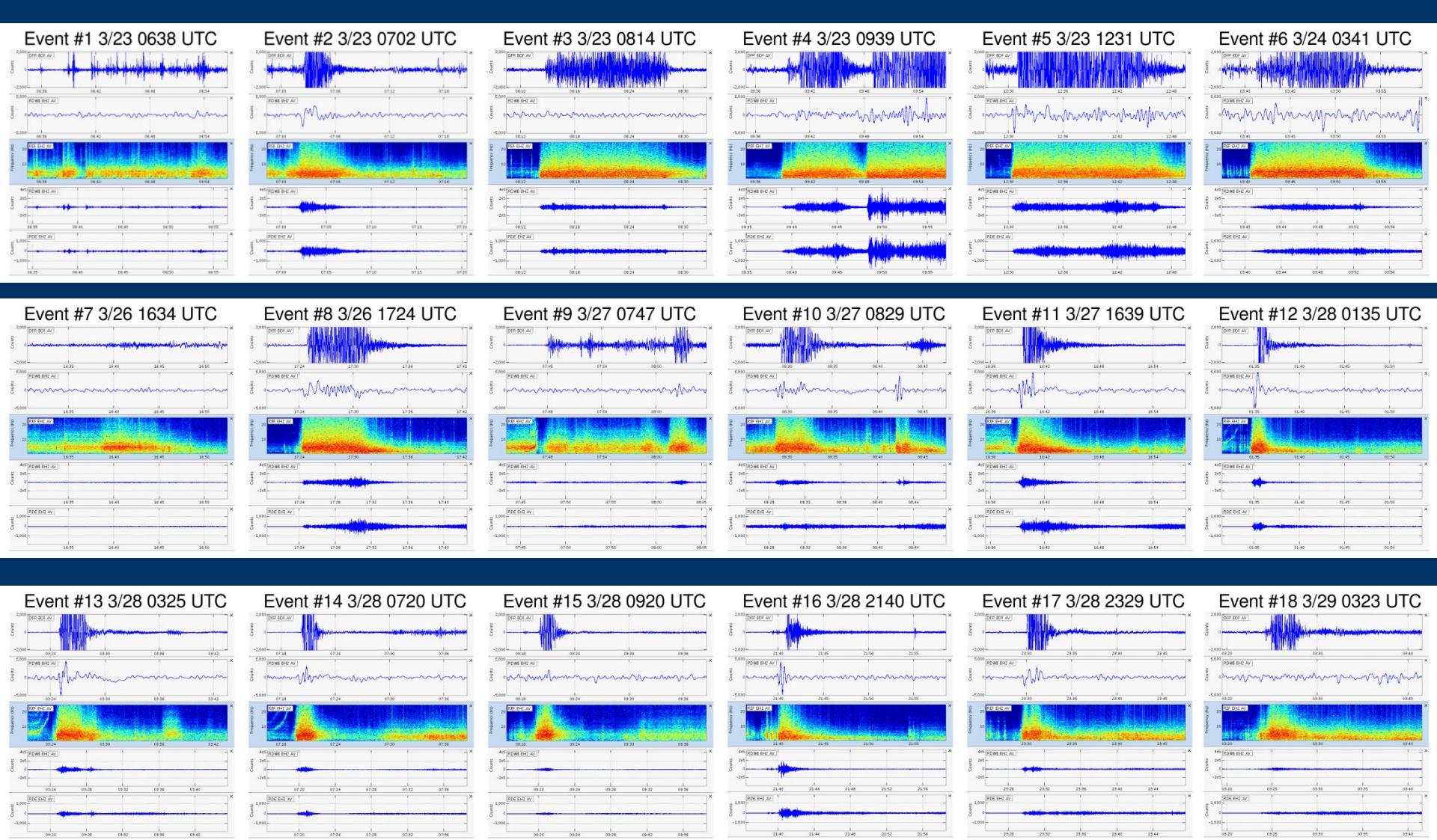
1-2 hours  
prior to  
escalation



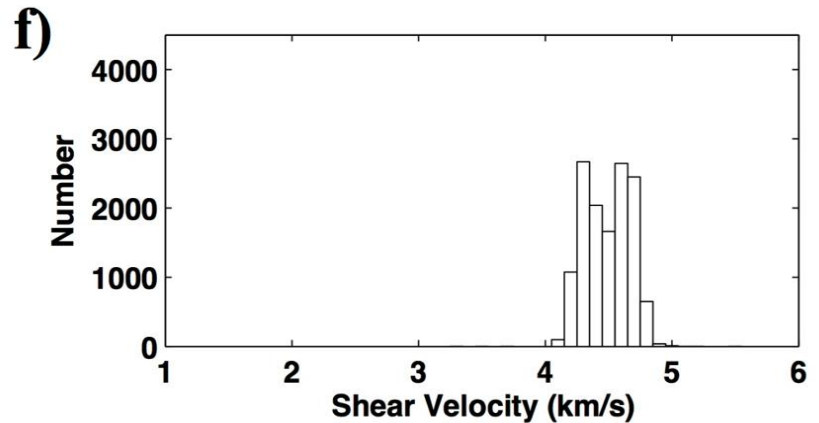
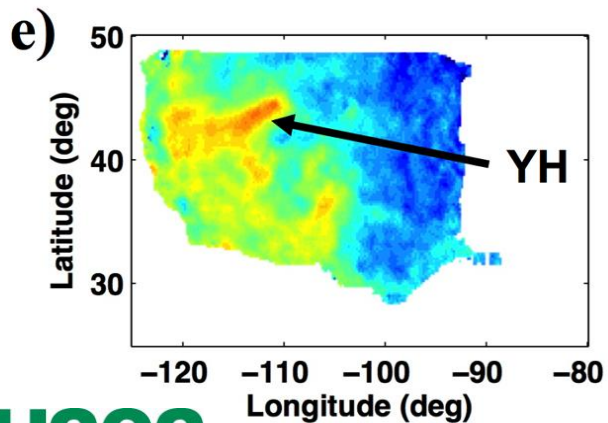
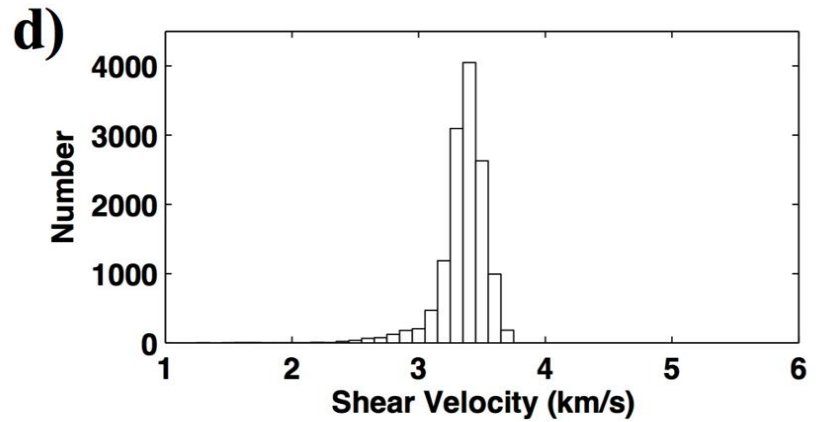
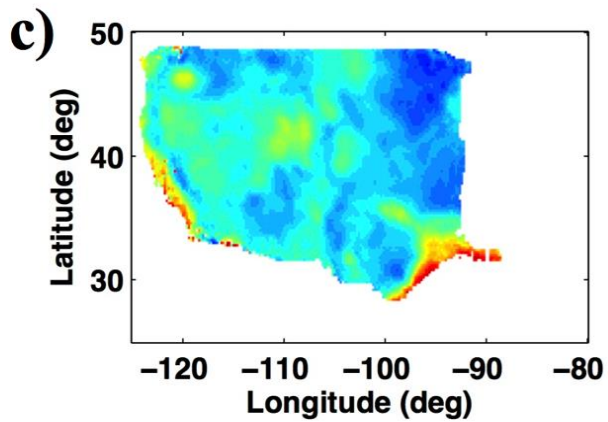
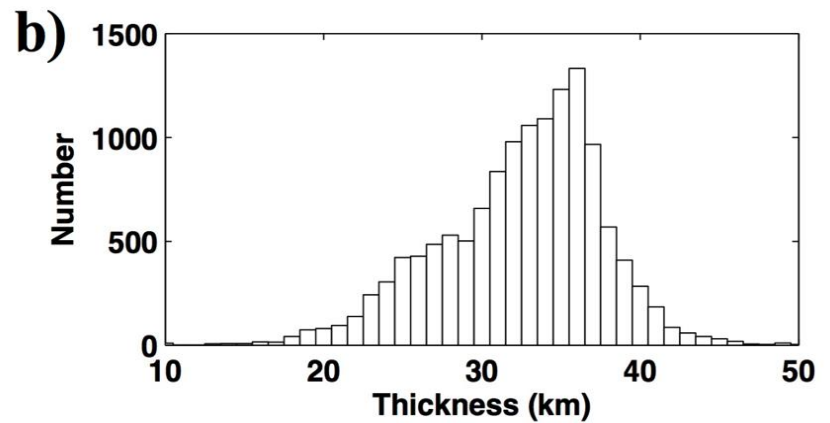
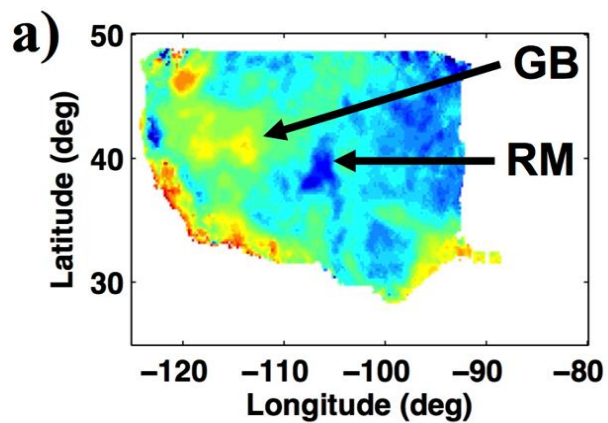
During tremor  
escalation

# Precursory seismicity at Okmok





# First 18 preliminary events of the 2009 Redoubt eruption



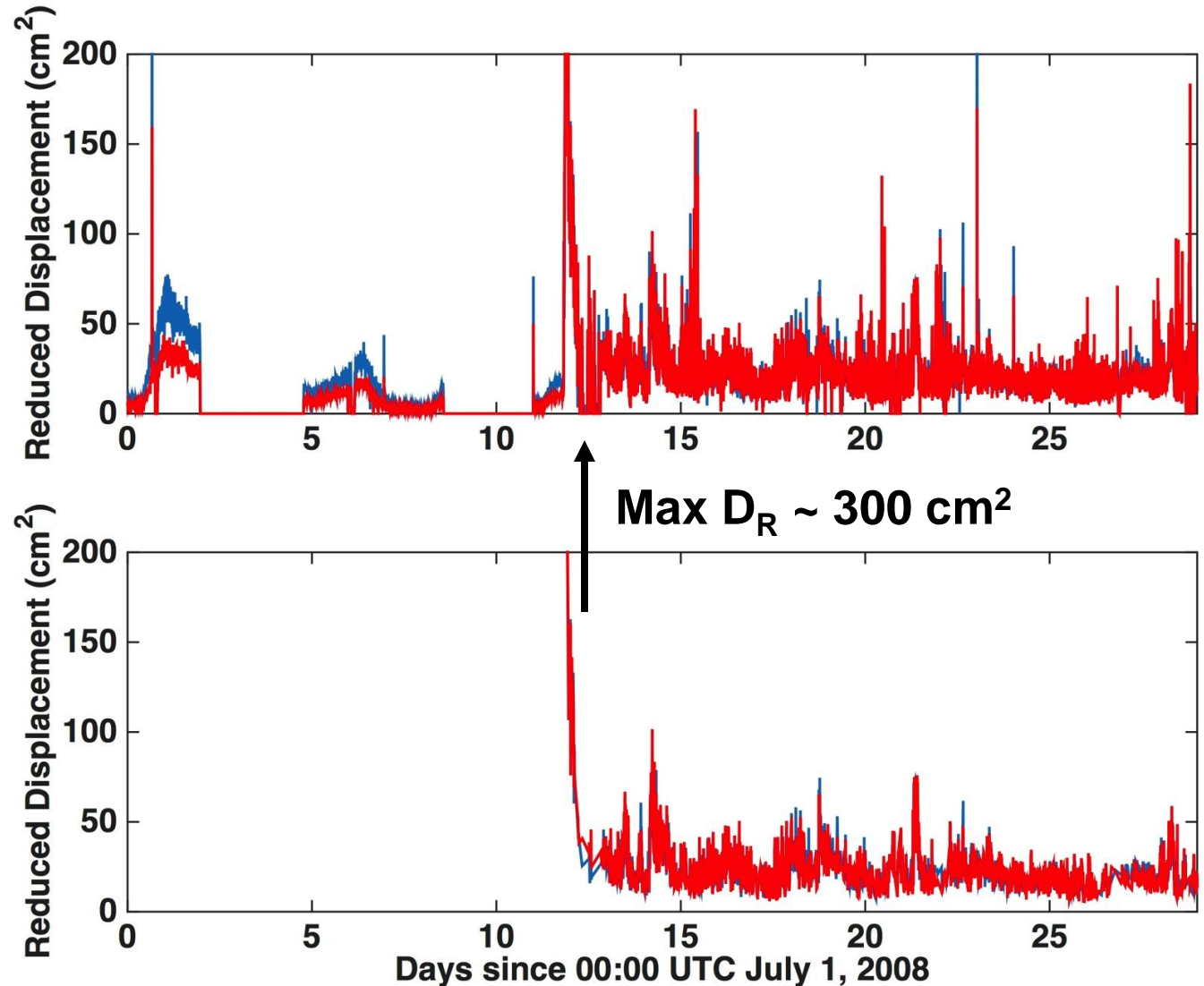
# Reduced Displacement 0.2-0.3 Hz

Izu Ooshima ~  
1230-2380 cm<sup>2</sup>

Pinatubo ~  
1070 cm<sup>2</sup>

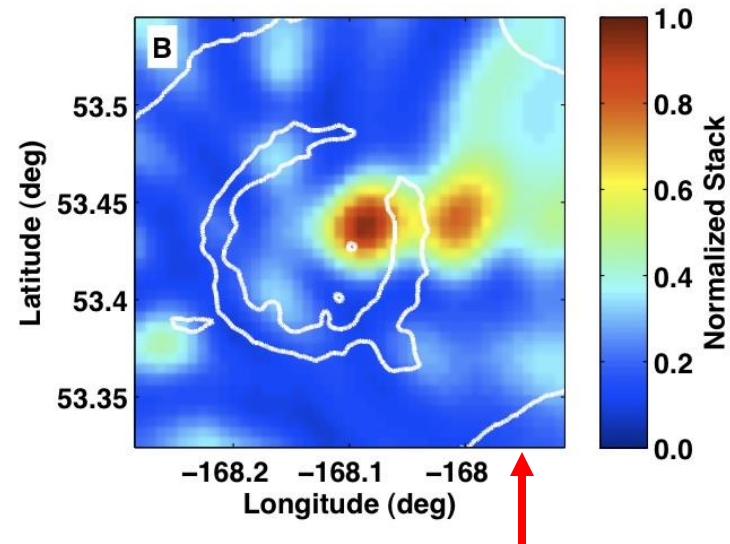
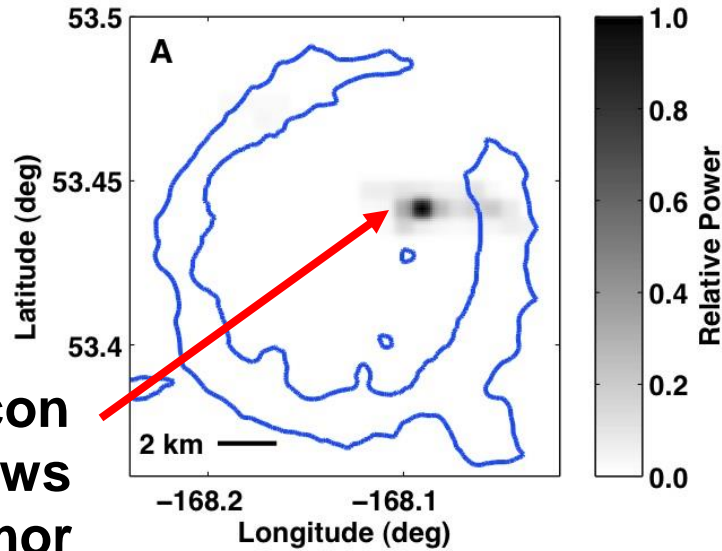
MSH ~  
260 cm<sup>2</sup>

McNutt and Nishimura  
(2008)

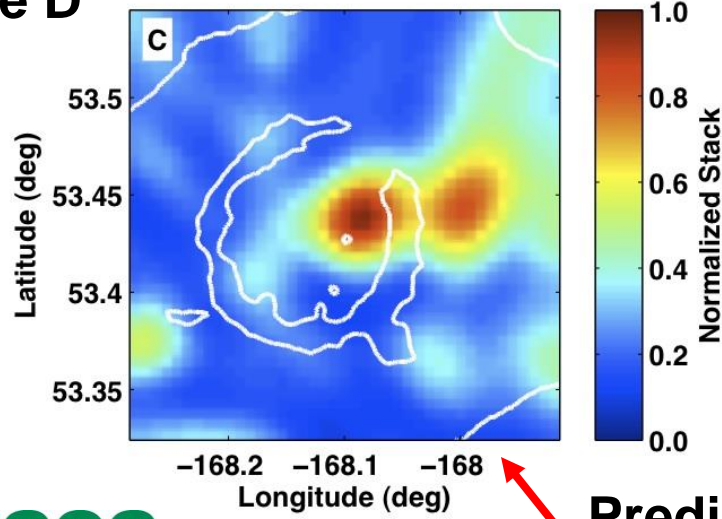


# 1 hour of typical tremor at Okmok: July 23, 2008

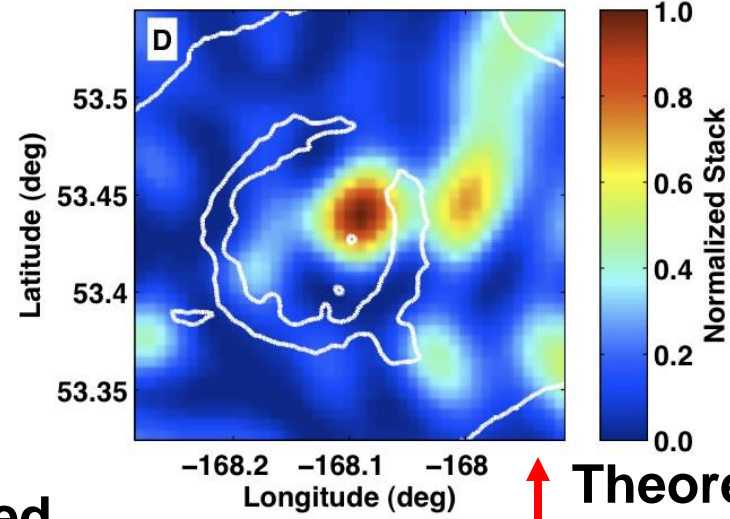
Decon shows tremor north of Cone D



Backprojection



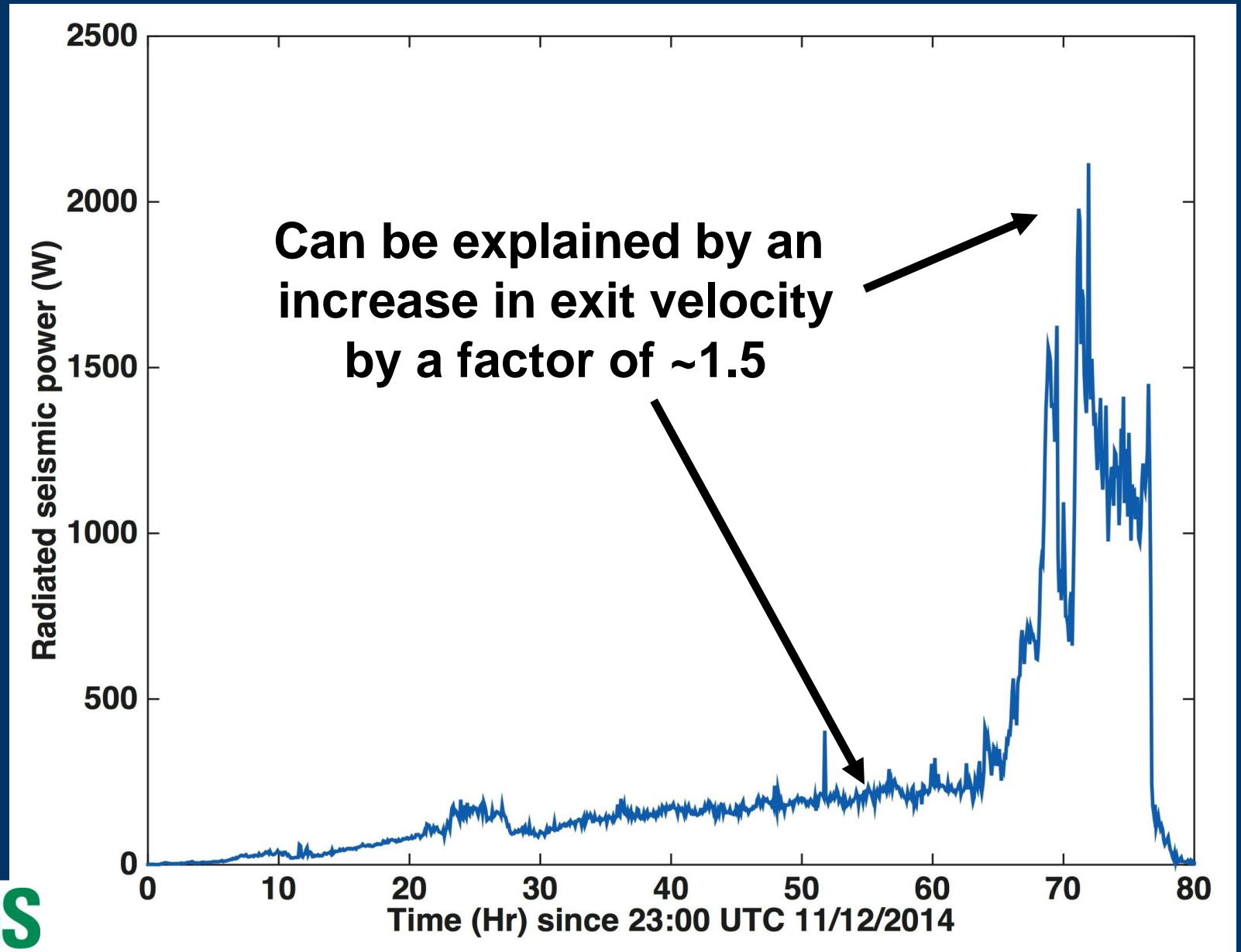
Predicted backprojection



Theoretical backprojection for single source



# November 2014 Pavlof Eruption



# Conclusions

- Advances in location methods and use of infrasound can provide information on whether tremor observed during eruptions originates from vent
- Scaling gives a rough picture, but more modern approaches exist for characterizing jets (Matoza *et al.*, 2013) and methods based on first principles are needed