

# Forecasting an impending eruption by extracting features of seismic waveforms

Yosuke Aoki

Earthquake Research Institute,  
The University of Tokyo

18 November 2025

Workshop on "Automatization and Standardization of  
Volcano Seismic Data Processing Workflows  
Nanyang Technological University, Singapore

# Monitoring low-frequency earthquake in Mt. Fuji, Japan

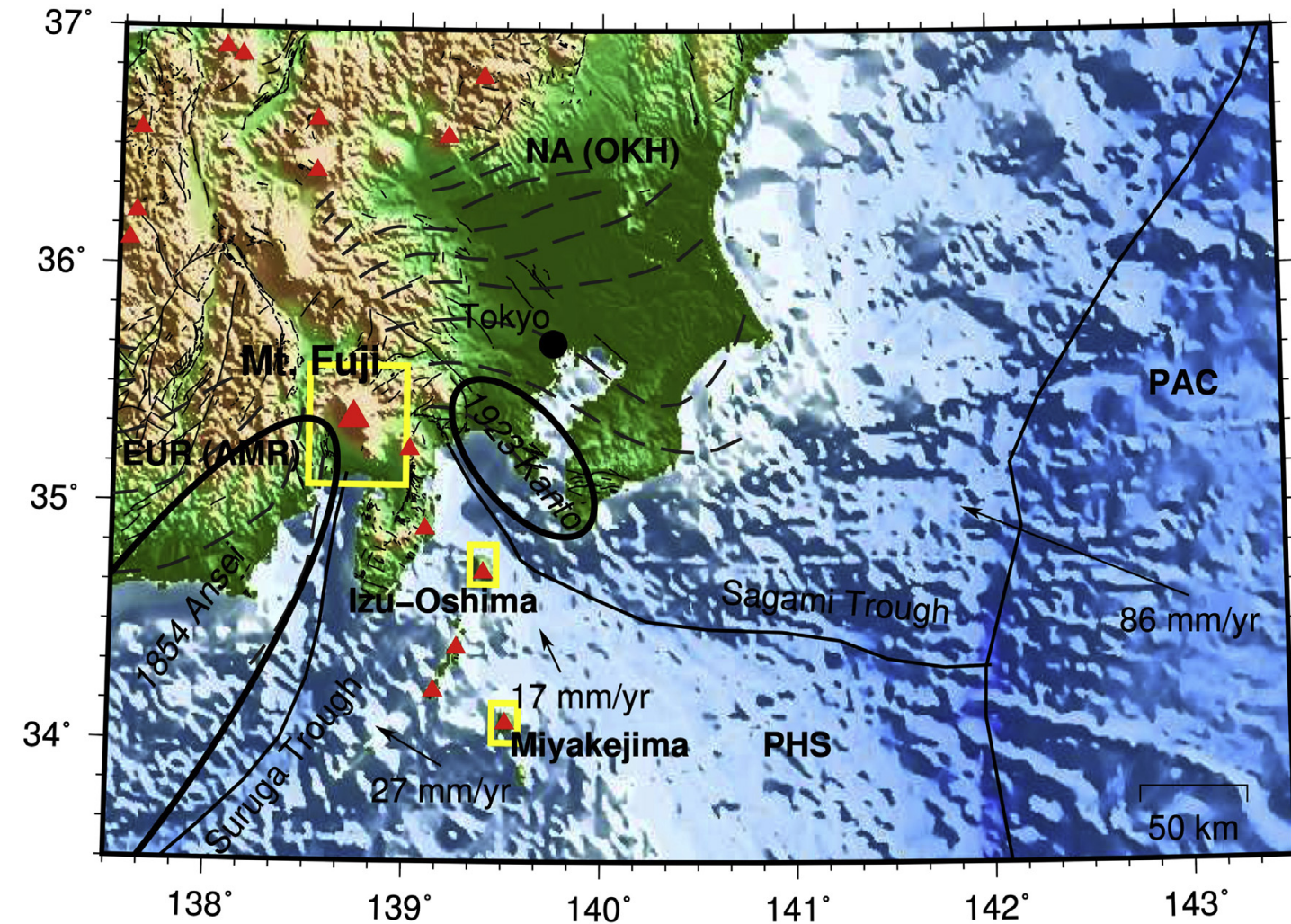
**Yosuke Aoki** (1; yaoki@eri.u-tokyo.ac.jp), Adèle Doucet (2),  
Kohtaro Araragi (3), Léonard Seydoux (2), Nobuaki Fuji (2),  
Jean-Philippe Métaxian (2), Takao Ohminato (1),  
Martha Savage (4), Kae Tsunematsu (5), Mitsuhiro Yoshimoto (6)

(1) ERI, UTokyo, (2) IPGP, (3) JAXA,  
(4) Victoria Univ. Wellington,  
(5) Yamagata Univ. (6) Mt. Fuji Res. Inst.

18 November 2025  
Workshop on "Automatization and Standardization of  
Volcano Seismic Data Processing Workflows  
Nanyang Technological University, Singapore



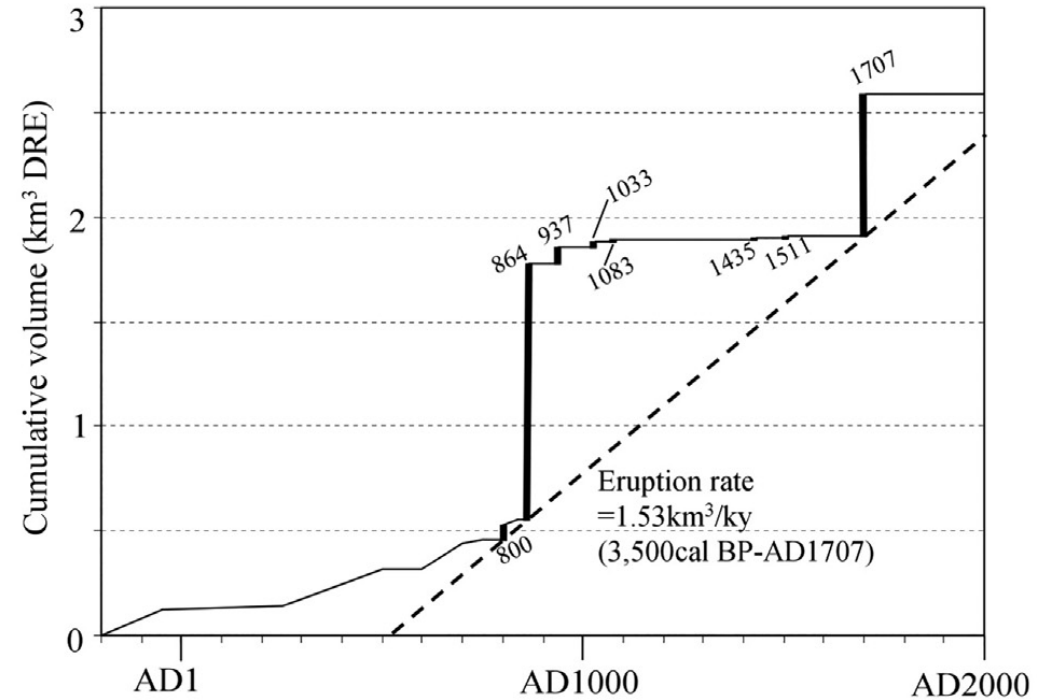
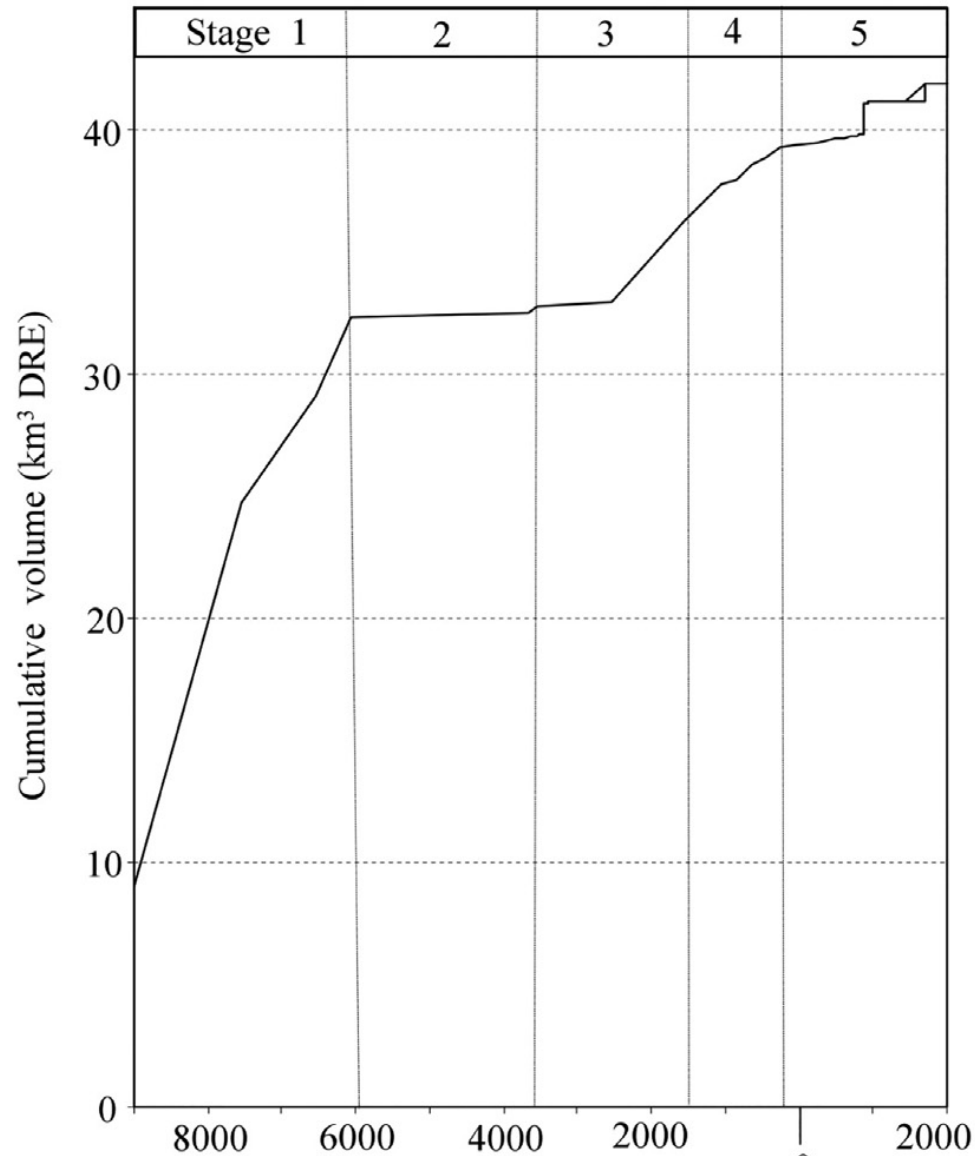
# Tectonic background



Aoki et al. (2019, Earth-Sci. Rev.)

- ✓ ~100 km from Tokyo.
- ✓ 25M people within 100 km.
- ✓ Located at the triple junction among the Philippine Sea, North American, and Eurasian plates.
- ✓ Collision and subduction of the Philippine Sea plate.
- ✓ NW-SE contraction, NE-SW extension.

# Historical eruptions

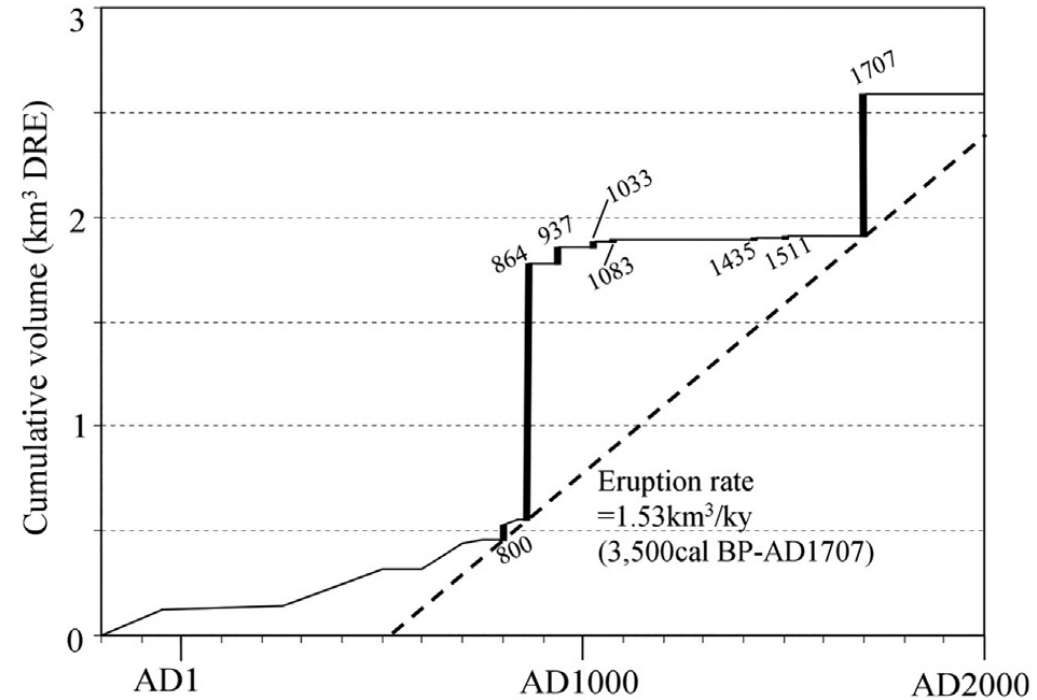
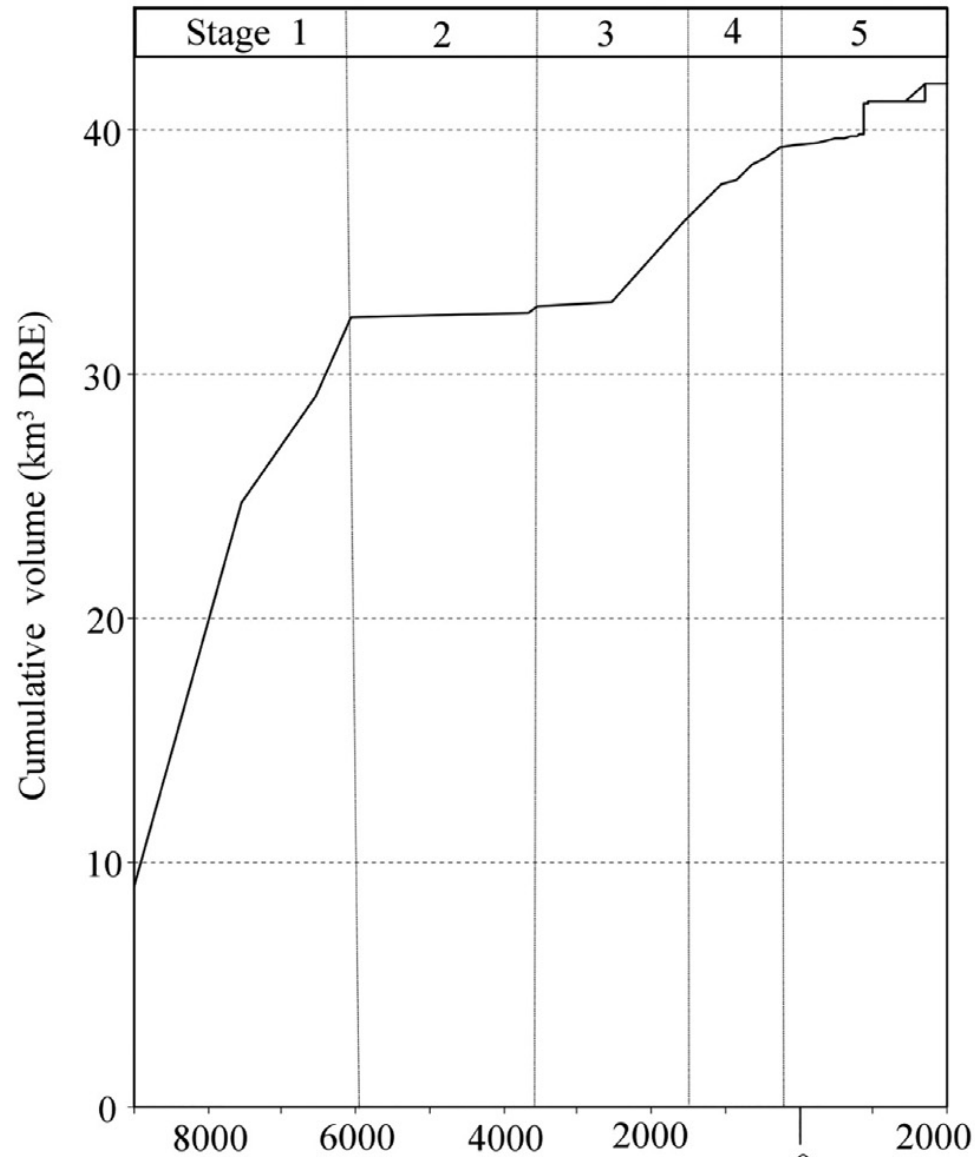


Miyaji (2007)

- ✓ High eruption rate =  $\sim 40 \text{ km}^3 / 10 \text{ ka}$
- ✓ Summit and flank eruptions. Summit eruptions only until 2.2 ka.
- ✓ Many of them are effusive, some of them are explosive.



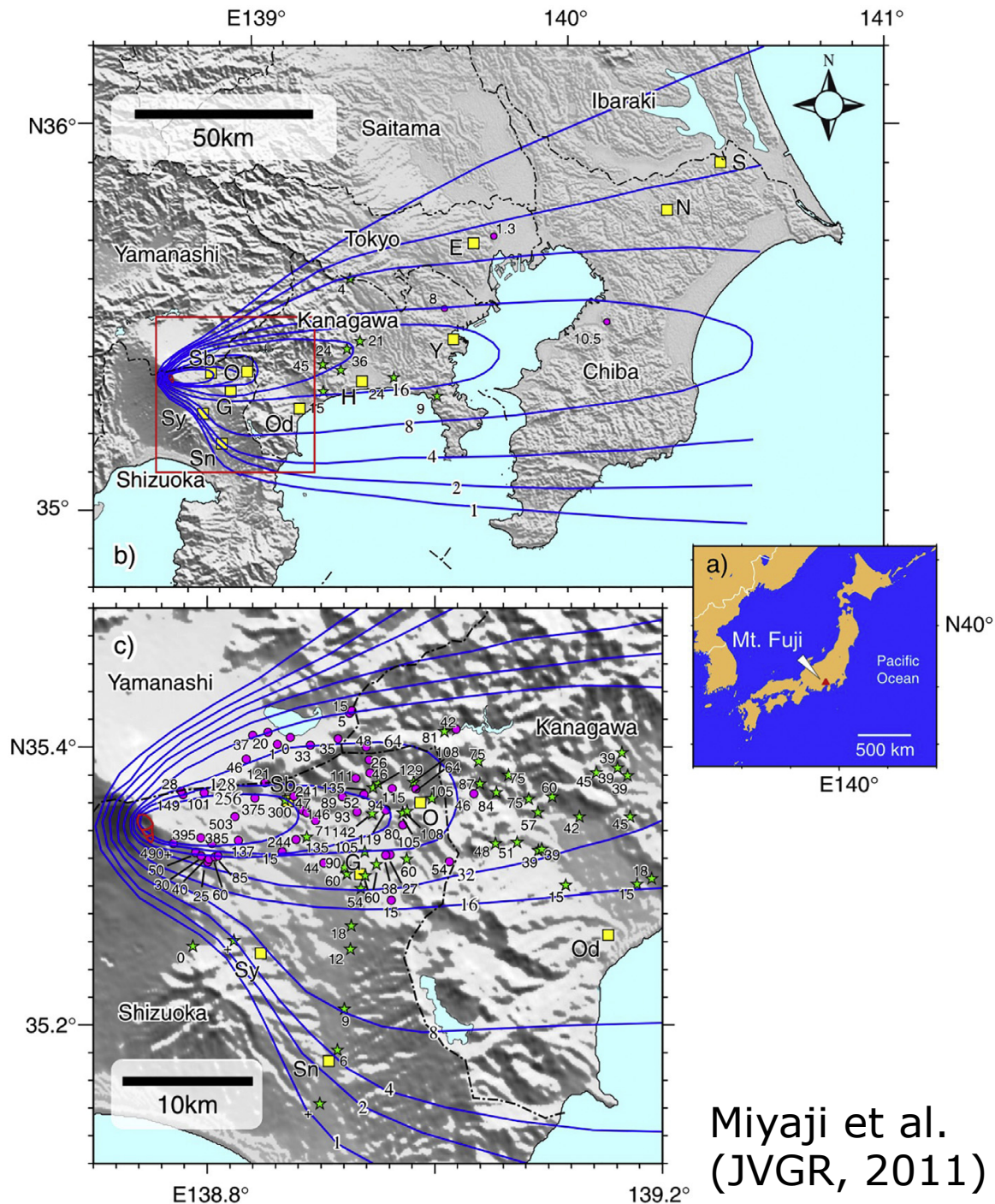
# Historical eruptions



Miyaji (2007)

Historic eruptions: 864 lava flow (VEI~6),  
1707 explosive eruption (latest: VEI~5)

# Ashfall by the 1707 eruption

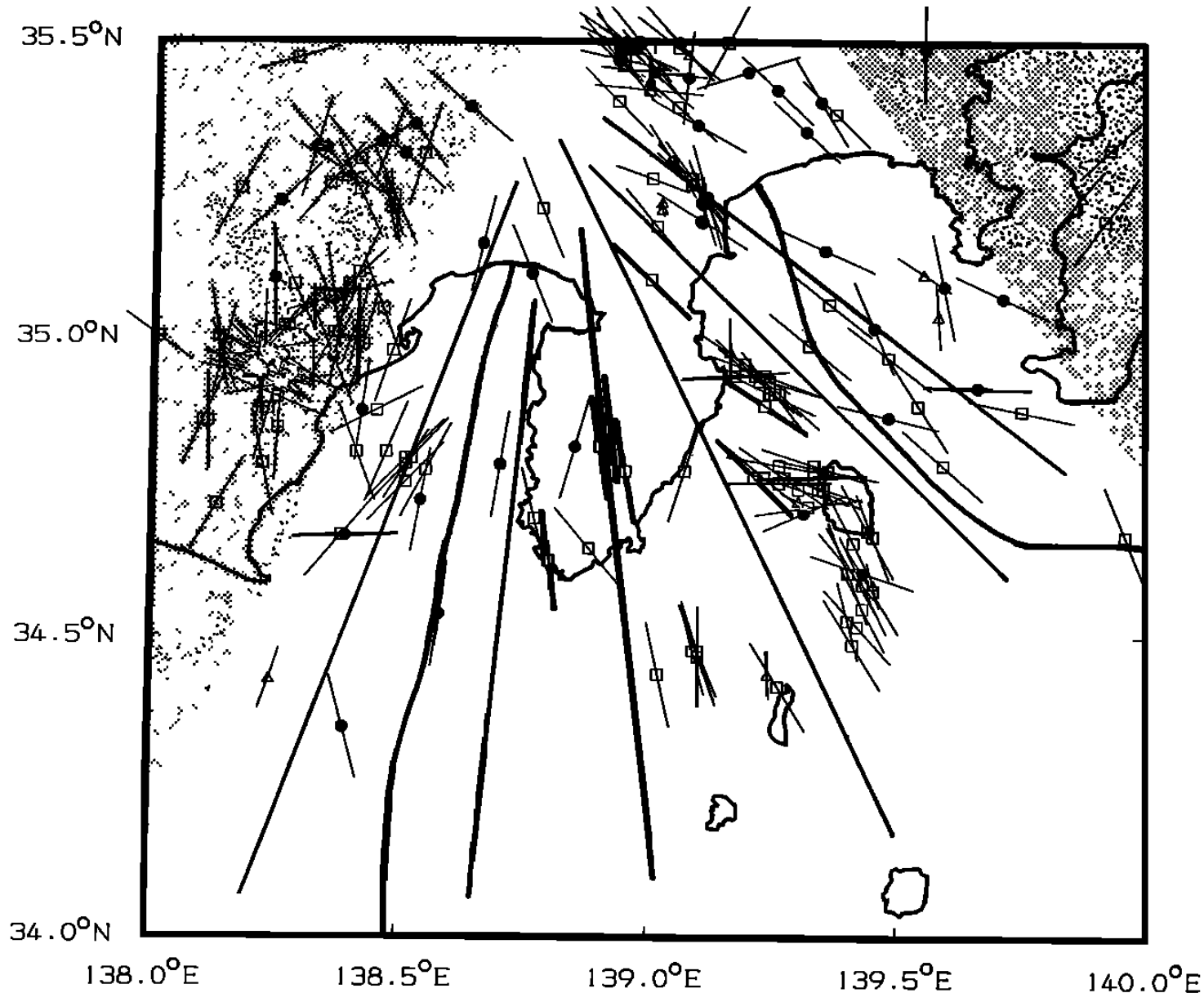


The 1707 eruption drove volcanic ash to Tokyo Metropolitan Region (~100 km), accumulating up to >100 mm of ash.

Miyaji et al.  
(JVGR, 2011)



# Regional stress field

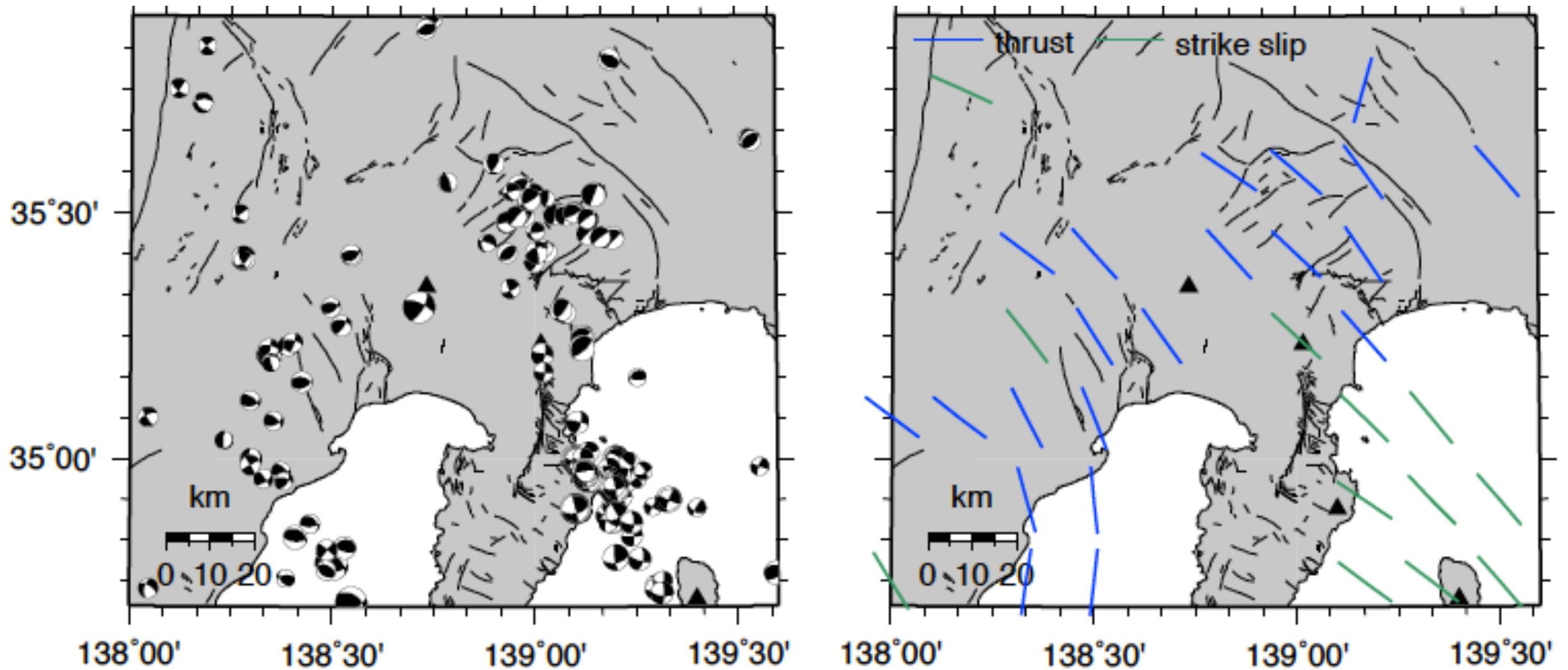


✓ Collision and subduction of the Philippine Sea plate.

✓ NW-SE contraction, NE-SW extension.

Ukawa et al. (1991)

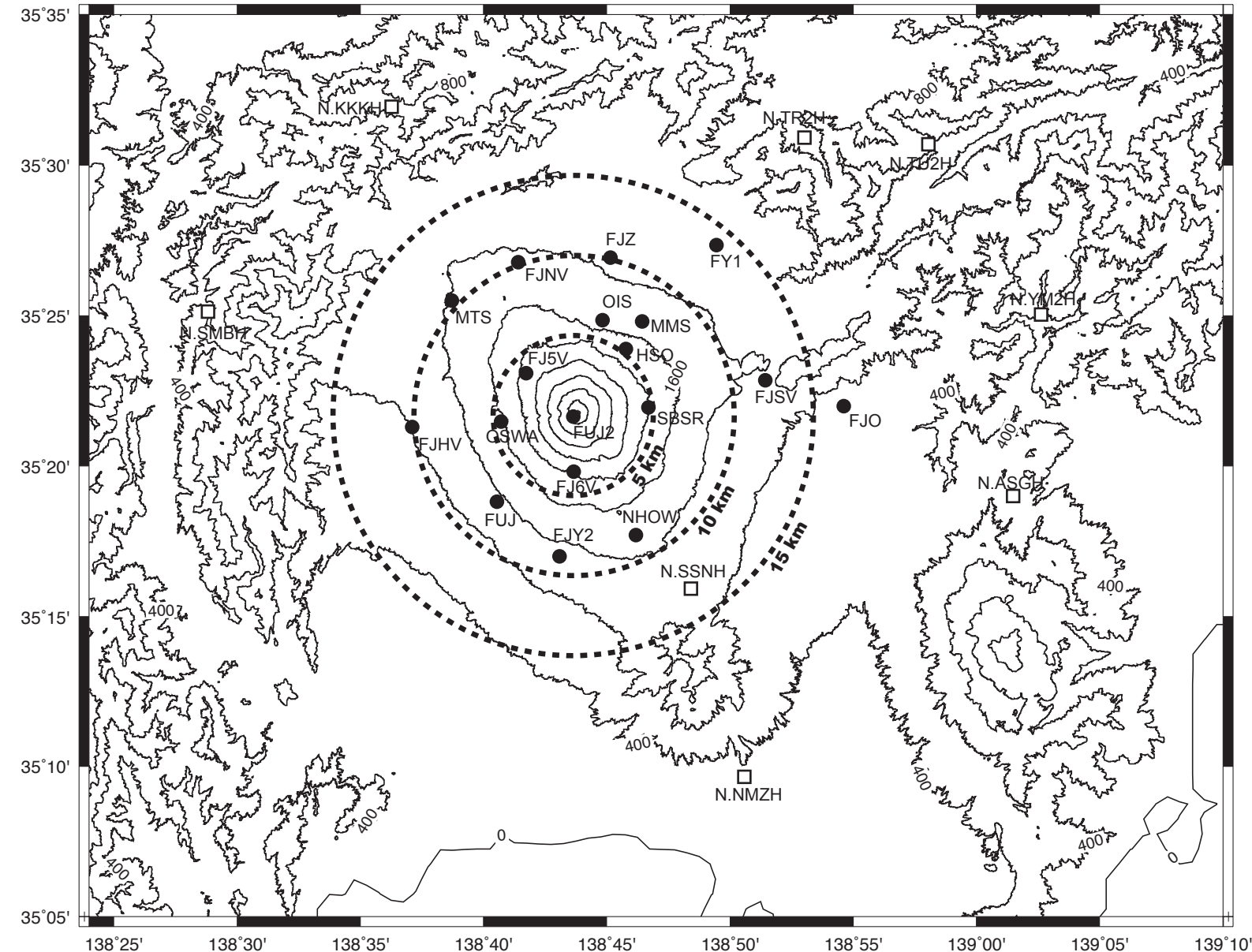
# Regional stress field



Araragi, Savage, Ohminato, and Aoki (2015, JGR Solid Earth)



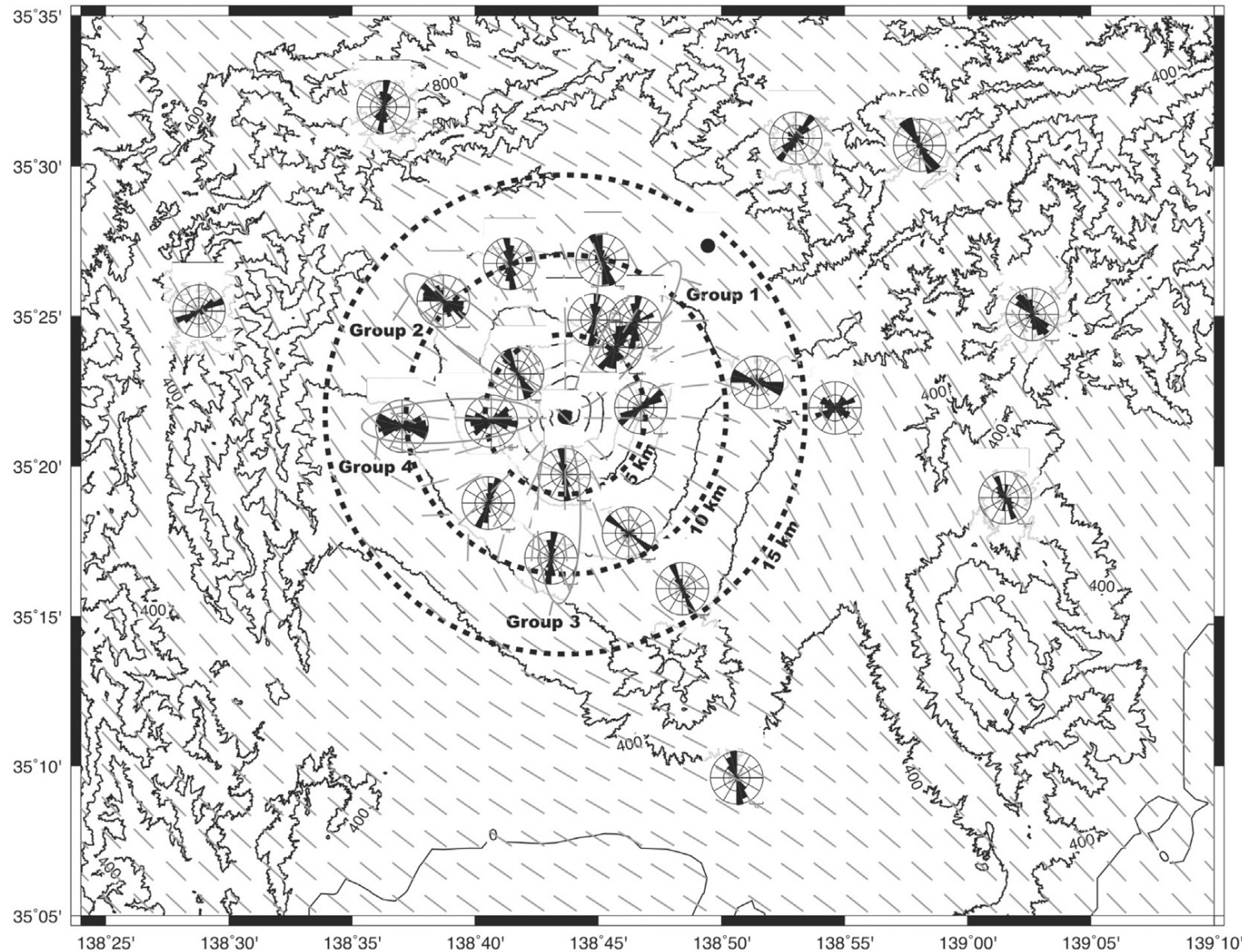
# Seismic sites



✓ Approximately 5, 10, and 15 stations within 5, 10, and 15 km from the summit.

✓ Some are broadband seismometers, some equip a 1 Hz seismometer.

# Seismic anisotropy

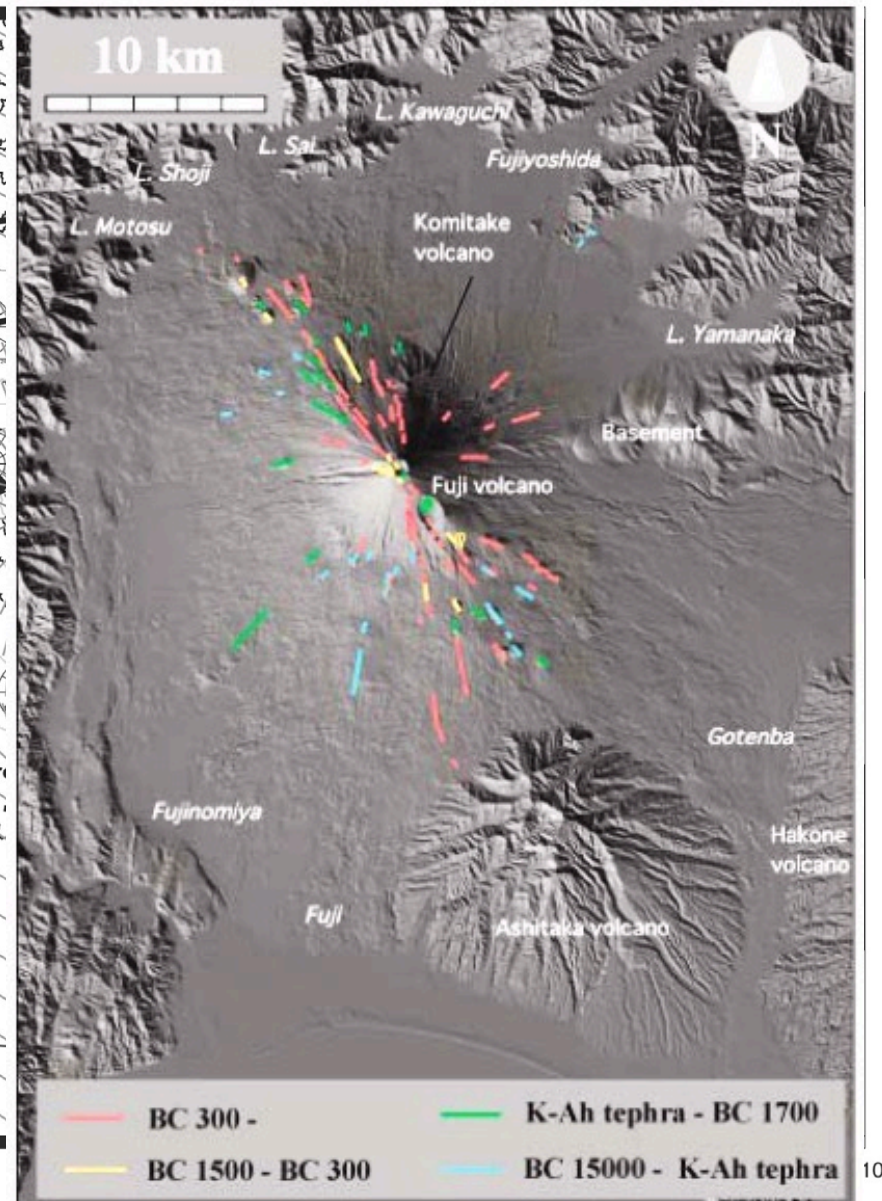
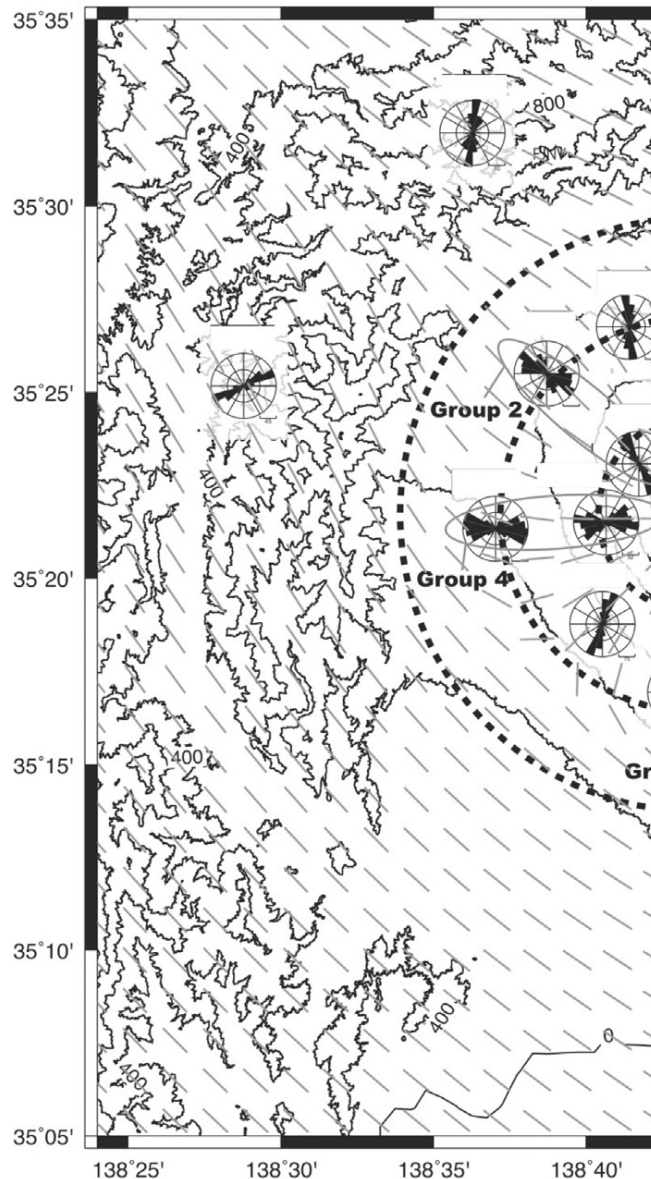


✓ The local stress field generates seismic anisotropy in this case.

**Stress field =  
Tectonic stress field +  
Flank loading**



# Seismic anisotropy



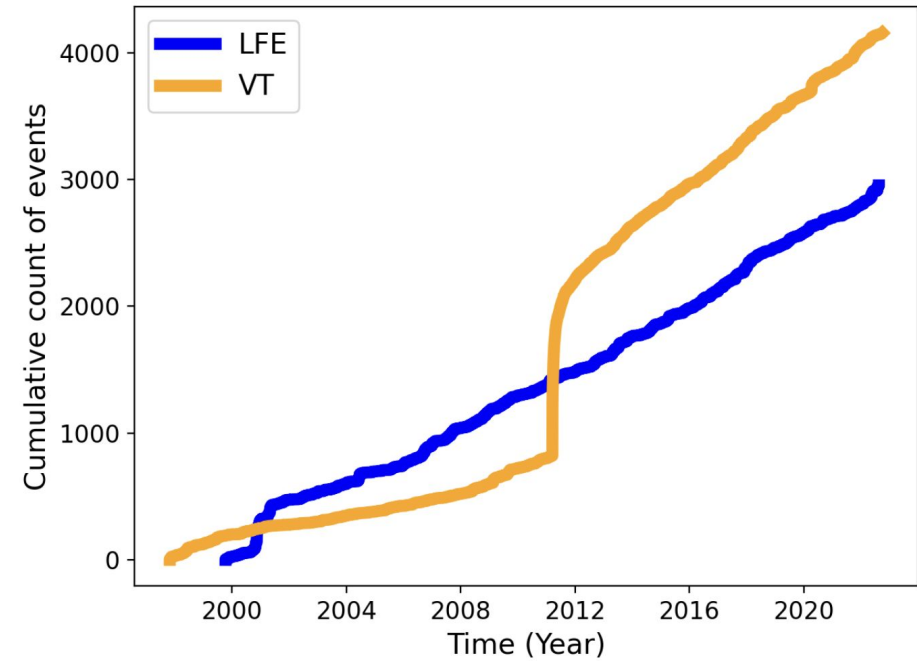
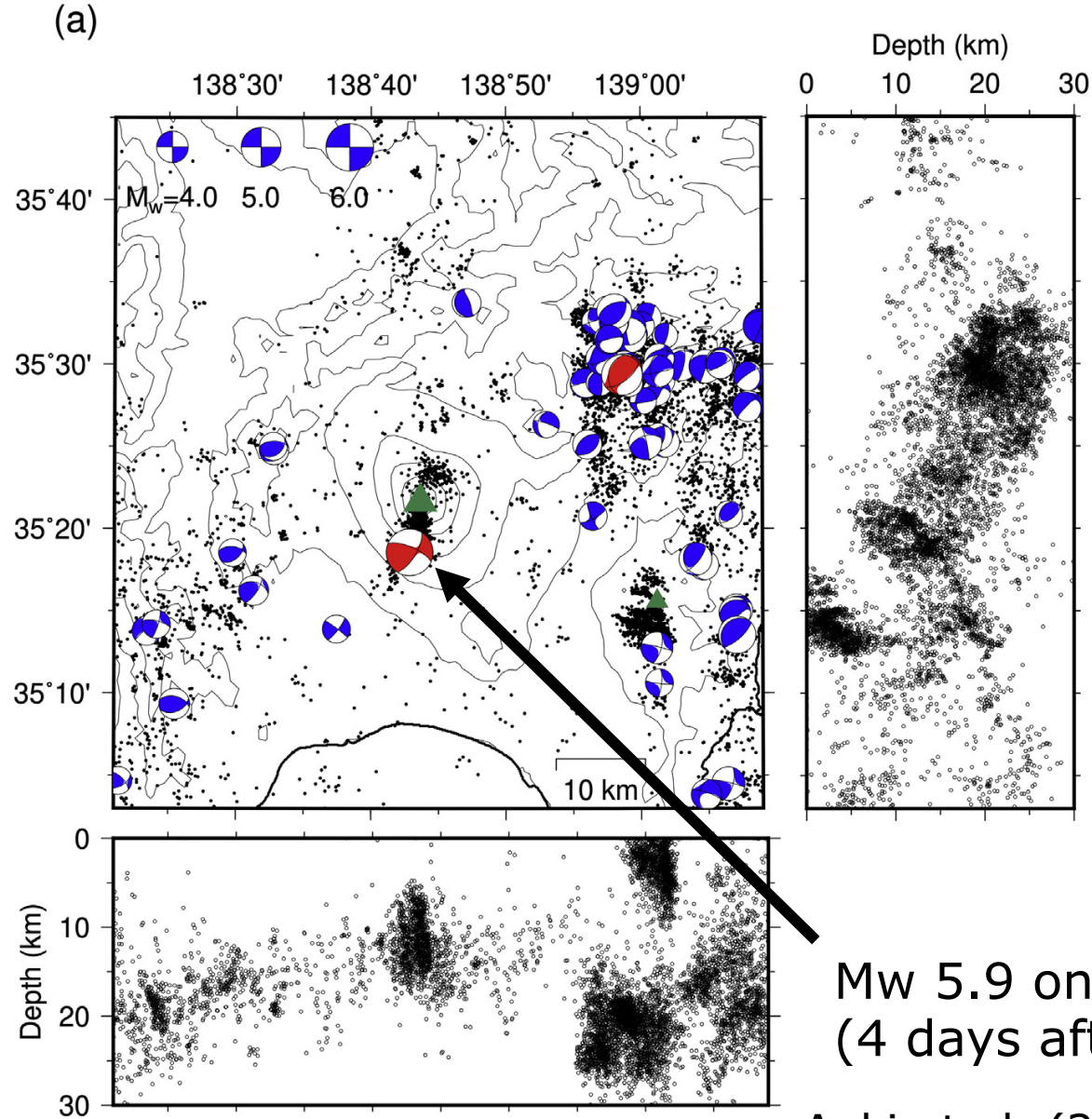
✓ The local stress field generates seismic anisotropy in this case.

**Stress field =  
Tectonic stress field +  
Flank loading**

✓ Consistent with vent location.

Araragi et al. (2015)

# Seismic activity



The 2011 Tohoku-oki earthquake might have triggered a  $M_w$  5.9 earthquake, but otherwise the seismic activity is (more or less) stationary over time.

$M_w$  5.9 on 15 March 2011  
(4 days after the 2011 Tohoku-oki earthquake)

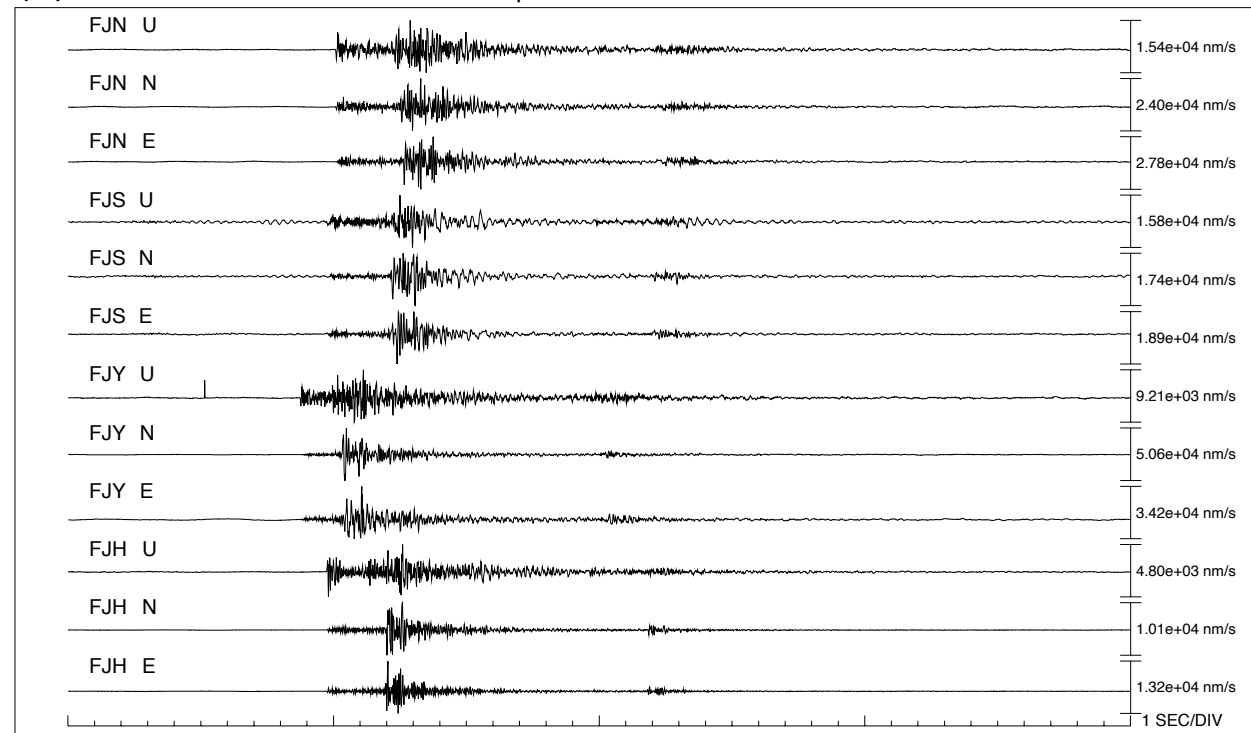
Aoki et al. (2019)



# Waveforms of $M \sim 2$ volcano-tectonic and low-frequency earthquakes

Volcano-tectonic earthquake

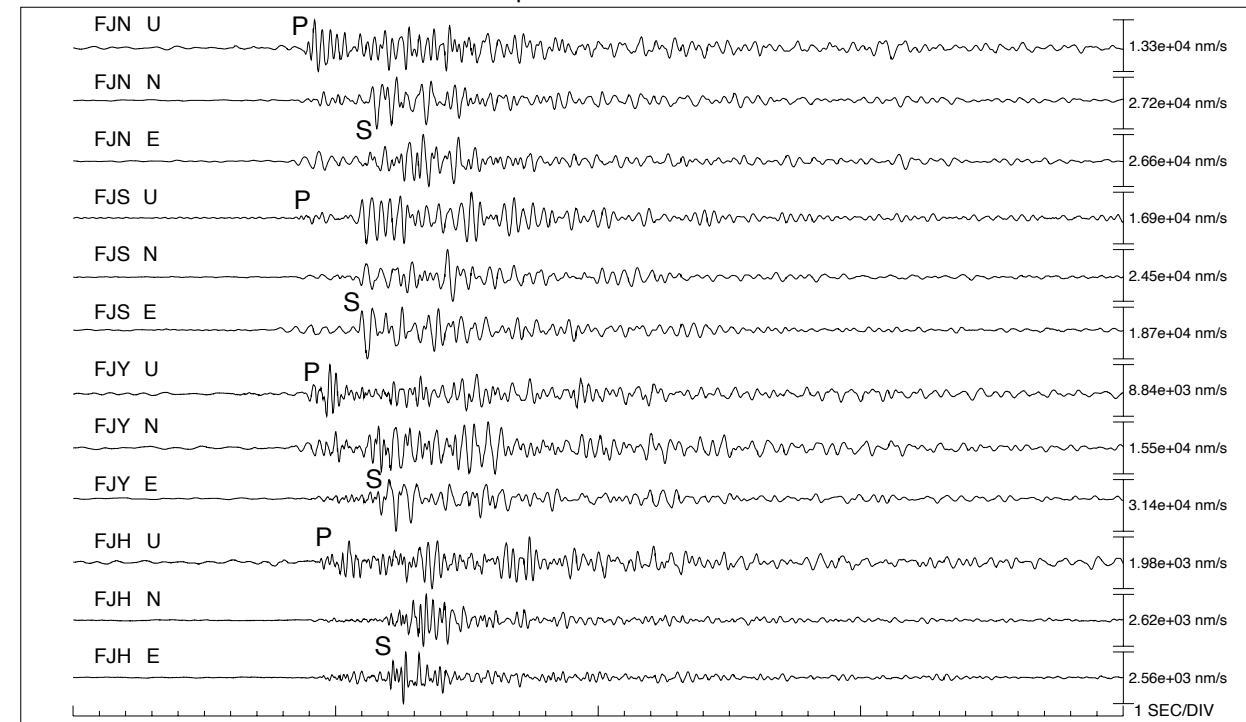
(b) 01/02/17/ 08h03m10.000s  $M=1.8$  Depth=10 km



10 seconds

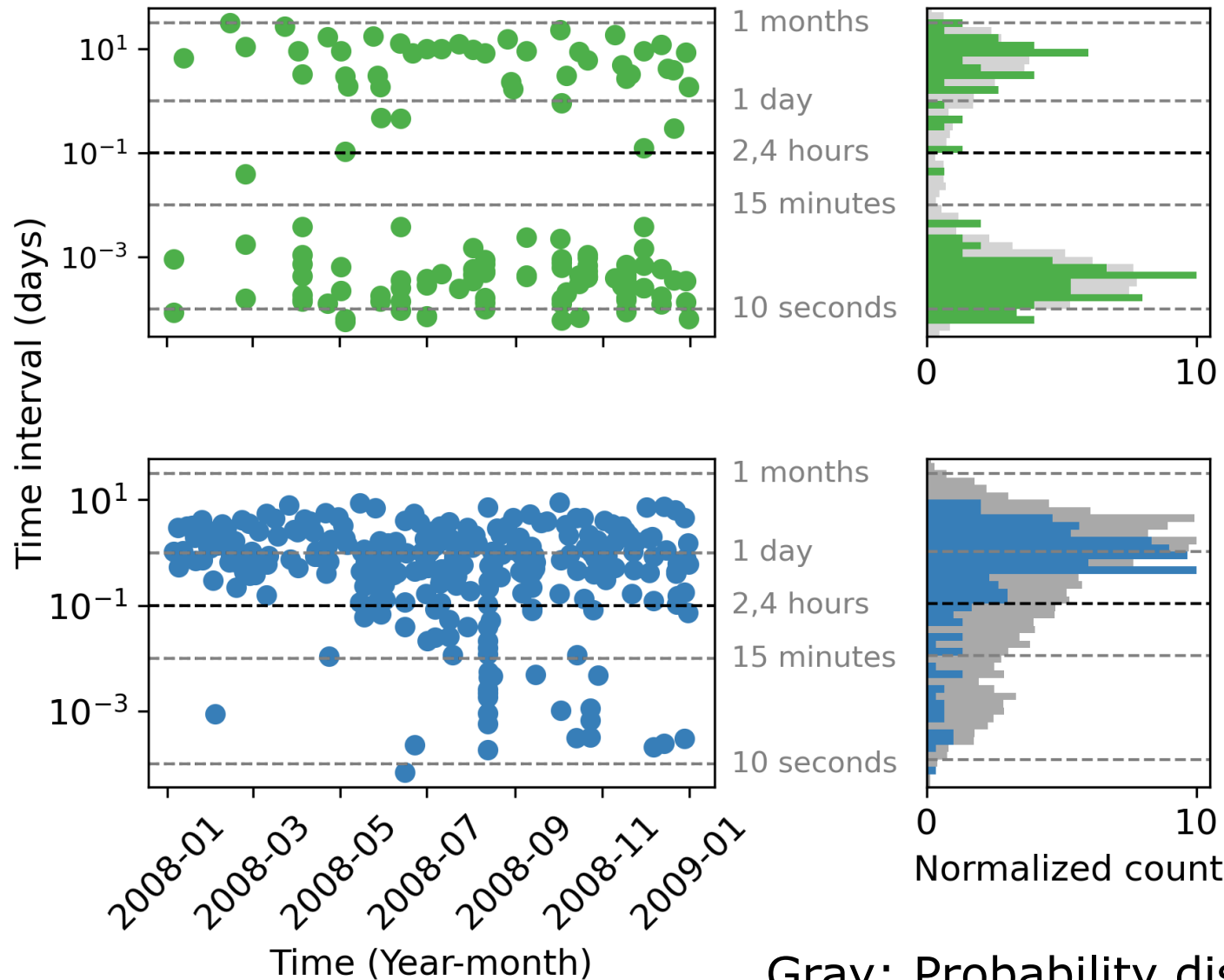
Low-frequency earthquake

(a) 01/04/30/ 21h42m00.000s  $M=2.3$  Depth=14 km



Nakamichi et al. (2004, Earth Planet. Space)

# Inter-event statistics



Inter-event time of

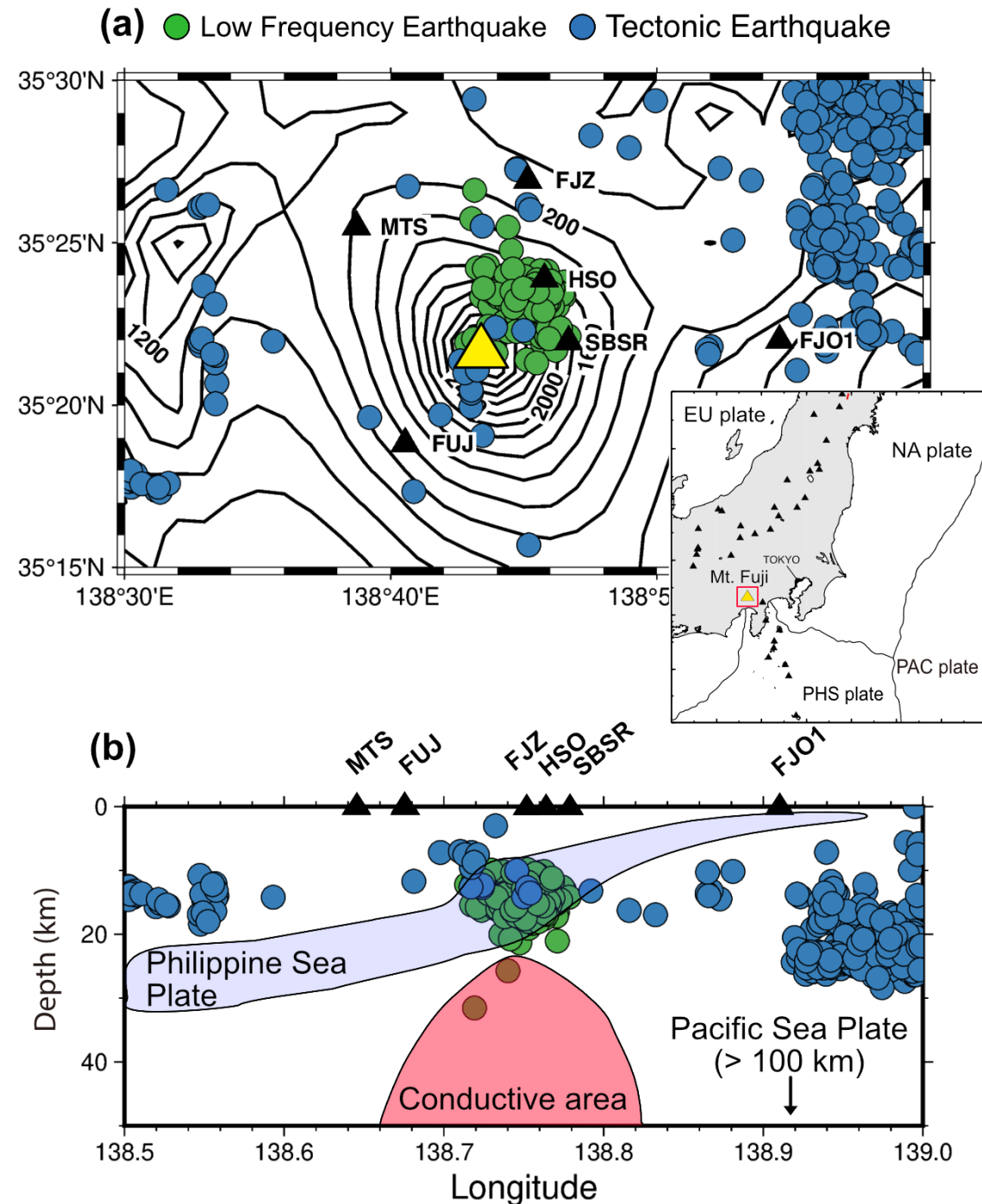
**Tectonic earthquakes:**  
Exponential or power-law  
distribution

**Low-frequency earthquakes:**  
Bimodal

**Low-frequency earthquakes  
occur in bursts.**

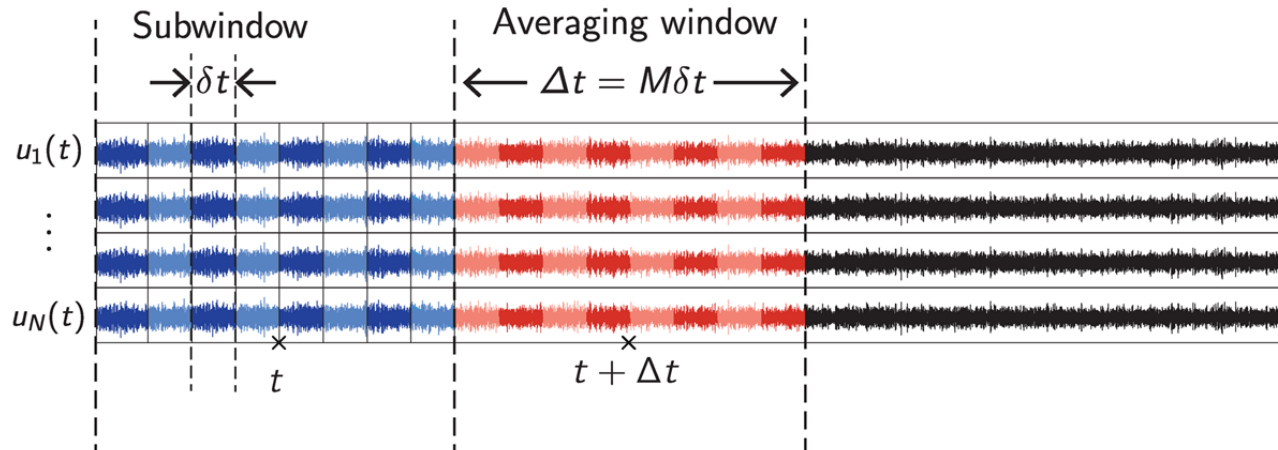
Gray: Probability distribution 1997—2022

# Seismic activity





# Calculating coherency



Energy normalization on averaging windows  
(spectral whitening + temporal normalization)

Sub-windowing and computation of  $M$  cross-spectra matrices over subwindows  
 $\mathbf{u}_m(f)\mathbf{u}_m^\dagger(f)$  ,  $m = 1 \dots M$

Average over  $M$  subwindows : array covariance matrix

$$\mathbf{C}(f) = \frac{1}{M} \sum_{m=1}^M \mathbf{u}_m(f)\mathbf{u}_m^\dagger(f)$$

Subwindow = 100 s

Averaging window = 500 s  
(Number of averaging windows=5)

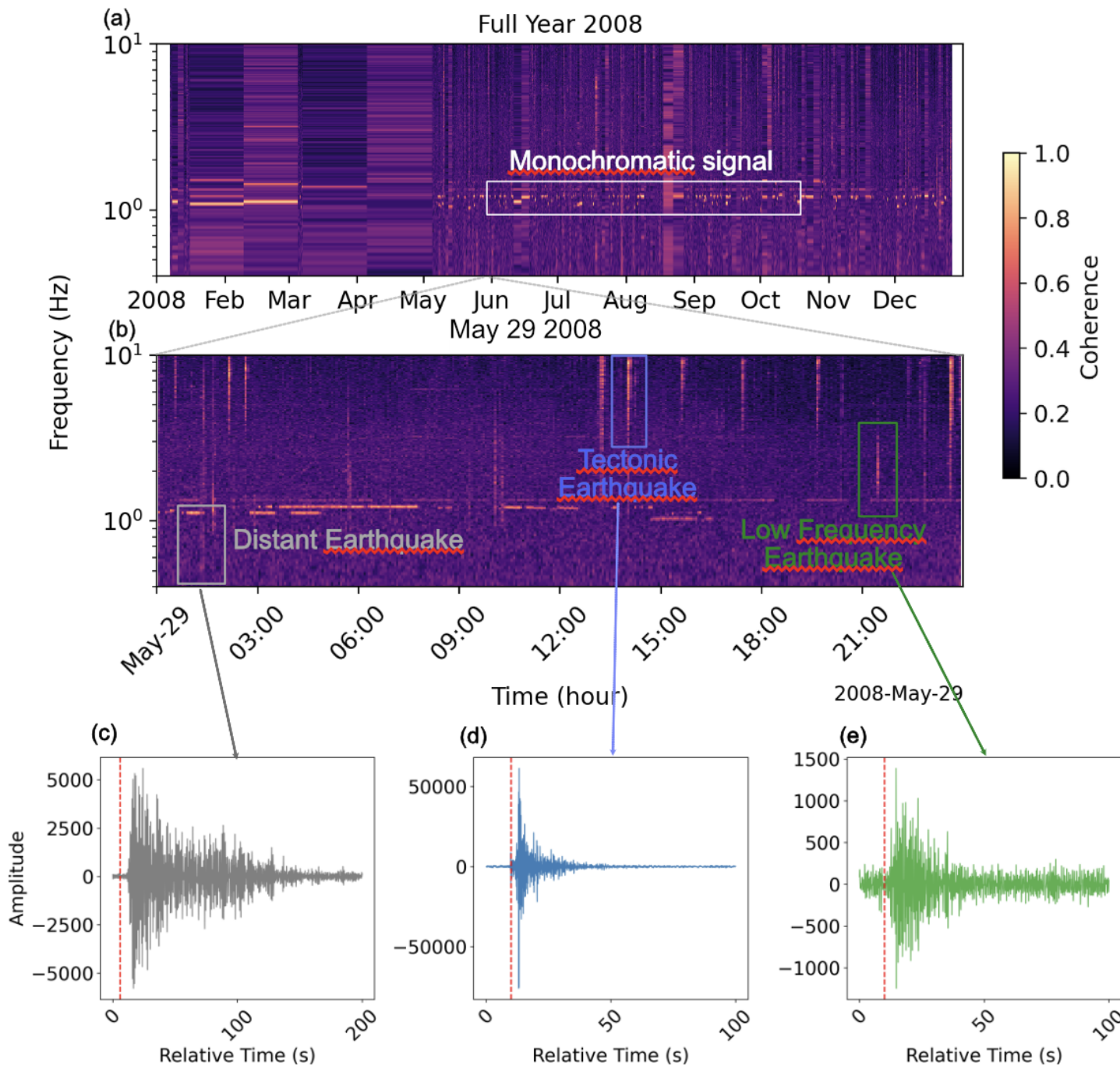
# Calculating coherence

Not a spectrogram!

Tectonic earthquakes exhibit high coherence in high frequency ( $>3$  Hz).

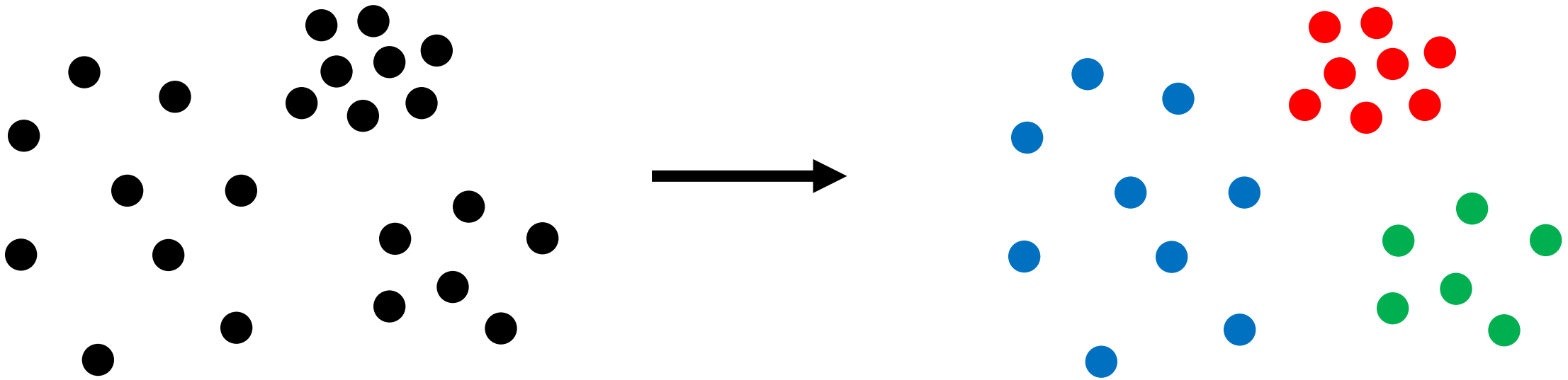
Low-frequency earthquakes exhibit high coherence in low frequency (1–3 Hz).

Monochromatic signals at  $\sim 1$  Hz (unknown origin).



# Mapping 1-year coherency into a 2D atlas

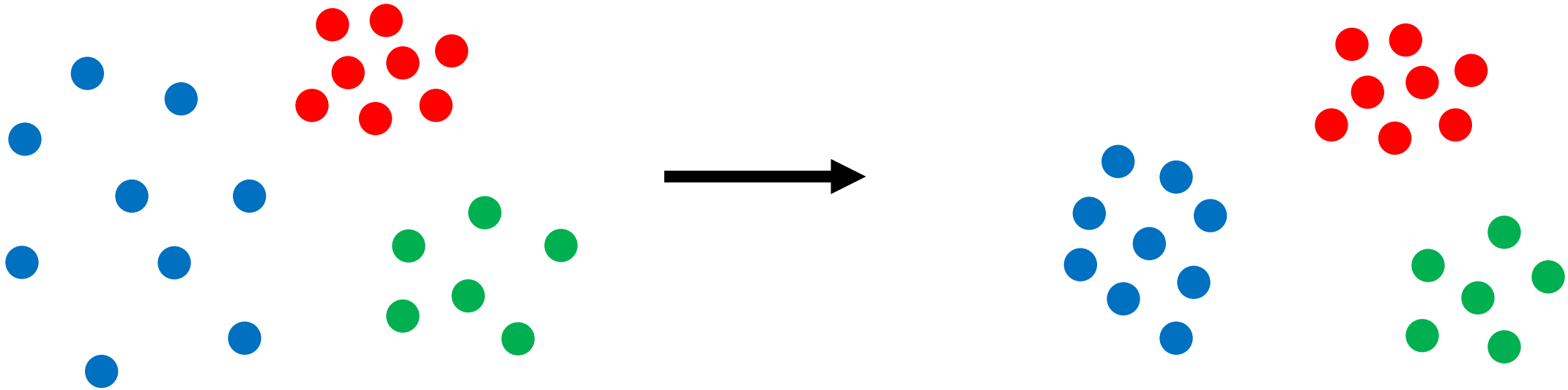
**Uniform Manifold Approximation and Projection (UMAP)** maps high-dimensional data into two (in this case) or three dimensions by preserving the global and **local structures of the data** (McInnes et al., 2020, arXiv; Steinmann et al., 2024, JGR Solid Earth).





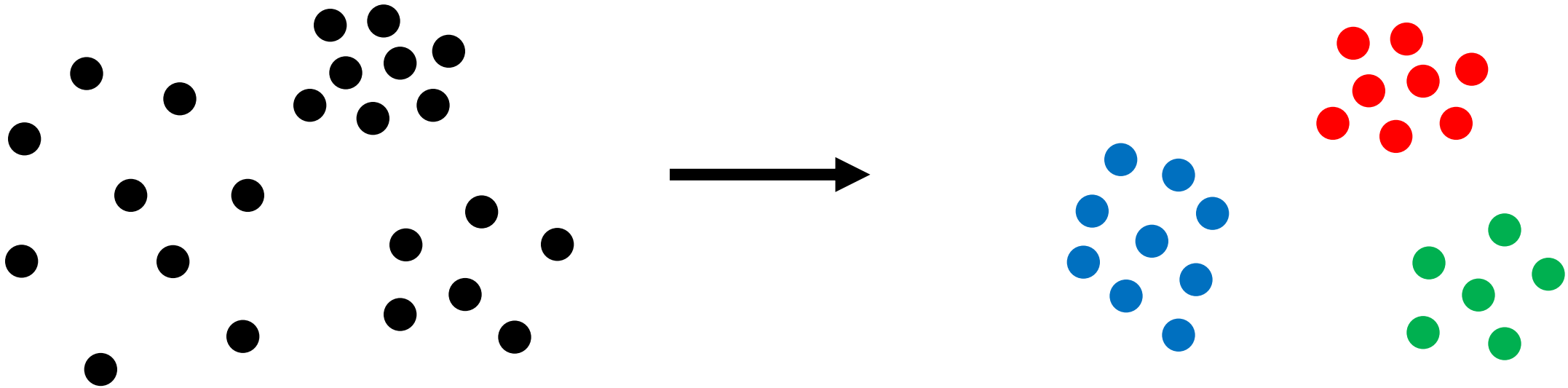
# Mapping 1-year coherency into a 2D atlas

**Uniform Manifold Approximation and Projection (UMAP)** maps high-dimensional data into two (in this case) or three dimensions by preserving the global and **local structures of the data** (McInnes et al., 2020, arXiv; Steinmann et al., 2024, JGR Solid Earth).



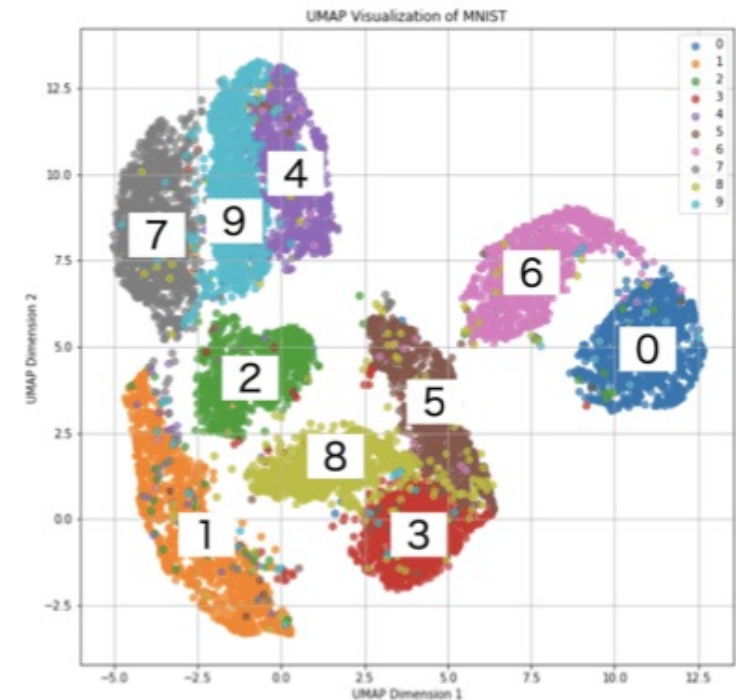
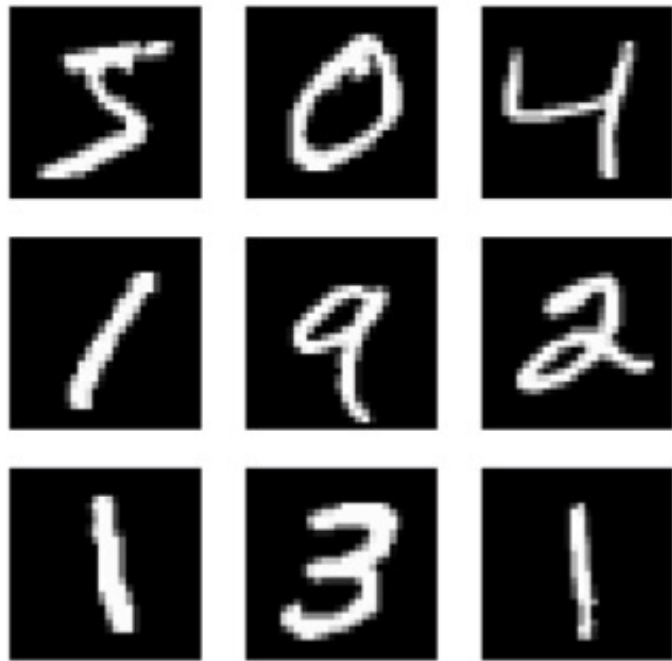
# Mapping 1-year coherency into a 2D atlas

**Uniform Manifold Approximation and Projection (UMAP)** maps high-dimensional data into two (in this case) or three dimensions by preserving the global and **local structures of the data** (McInnes et al., 2020, arXiv; Steinmann et al., 2024, JGR Solid Earth).



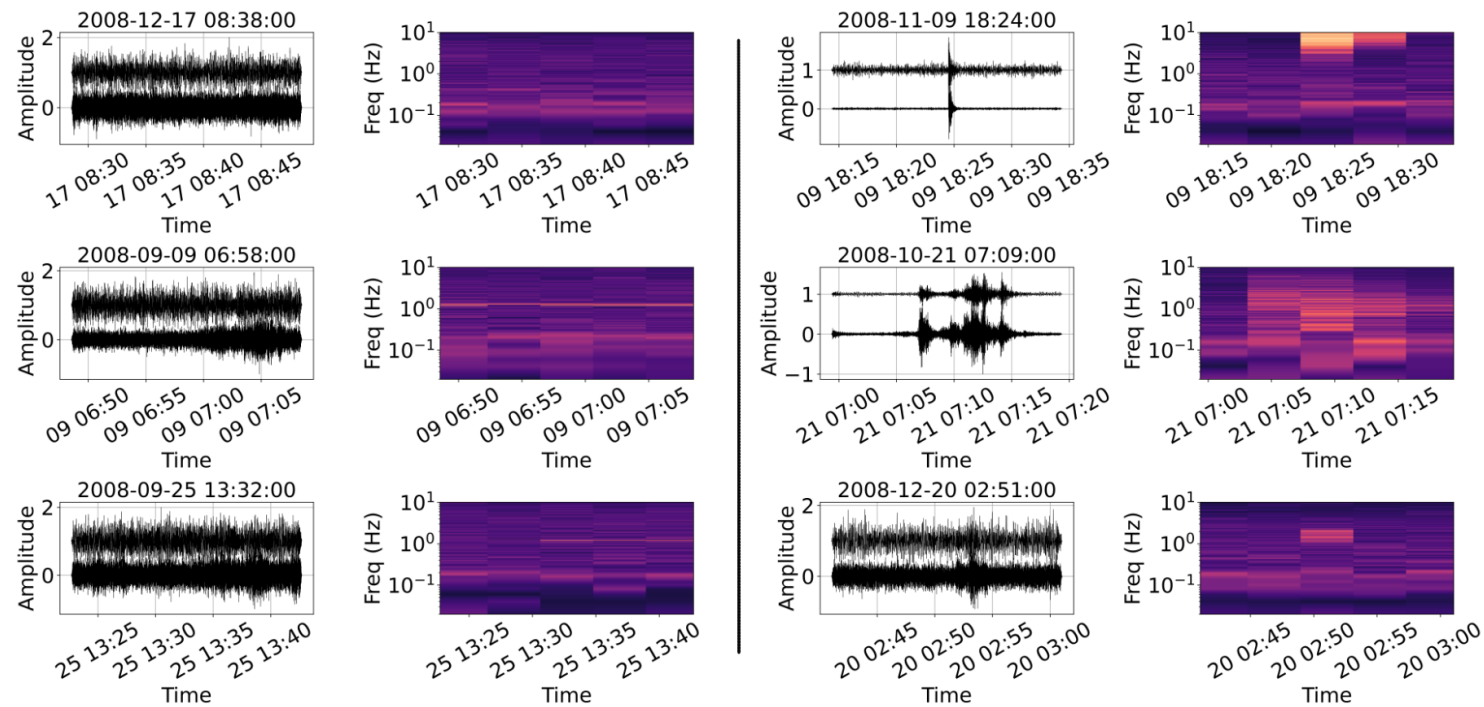
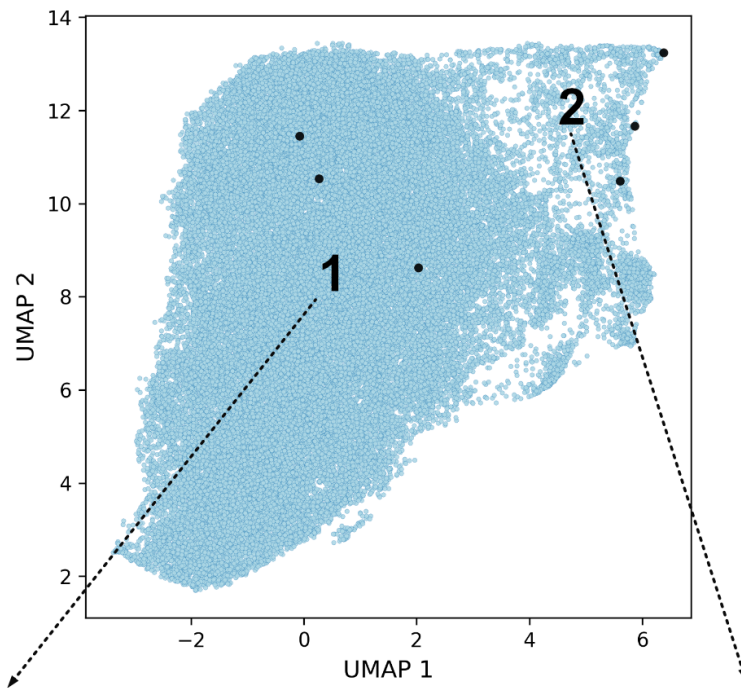
# Mapping 1-year coherency into a 2D atlas

**Uniform Manifold Approximation and Projection (UMAP)** maps high-dimensional data into two (in this case) or three dimensions by preserving the global and **local structures of the data** (McInnes et al., 2020, arXiv; Steinmann et al., 2024, JGR Solid Earth).

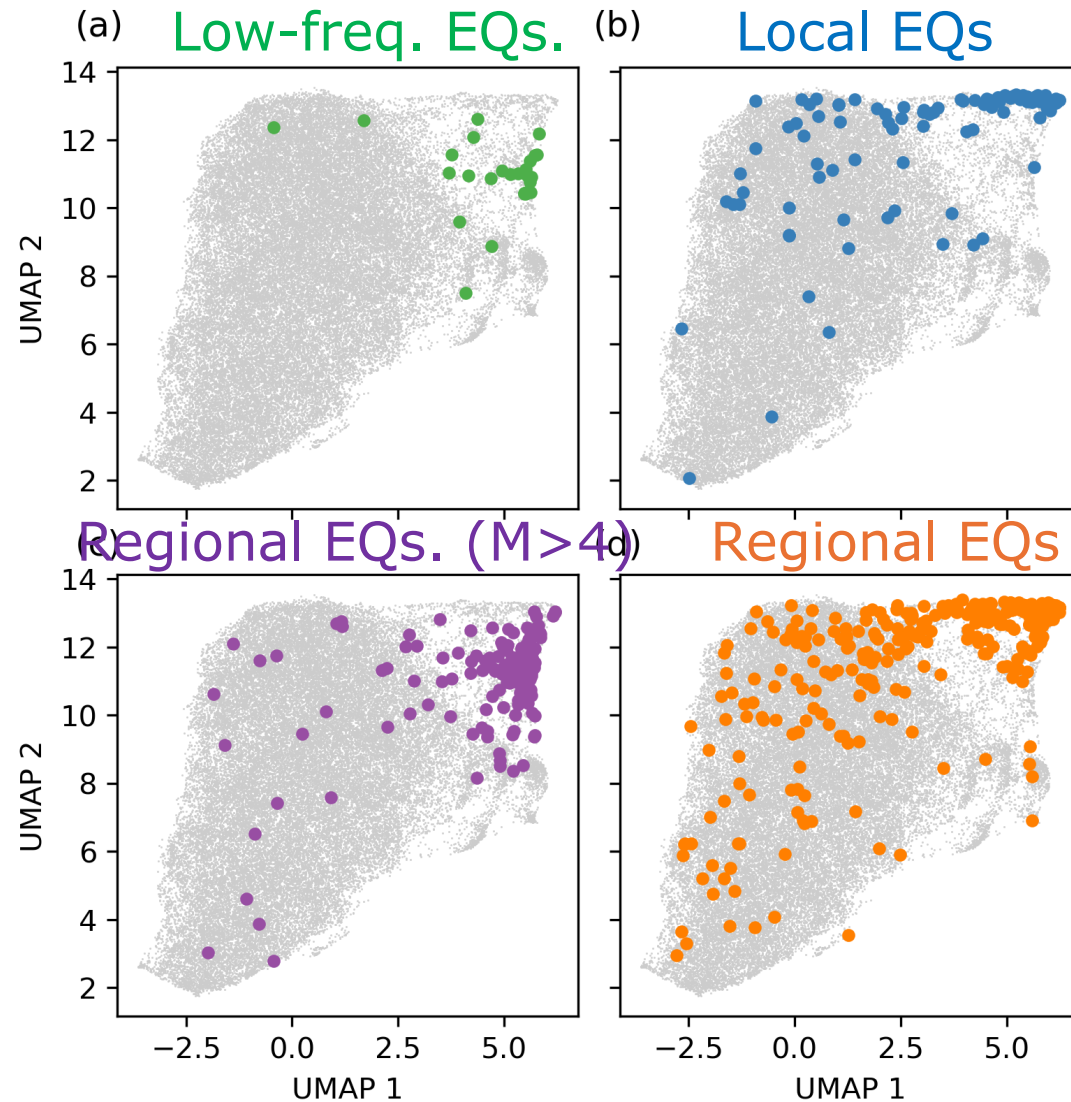




# Mapping coherency into a 2D atlas



# Mapping coherency into a 2D atlas

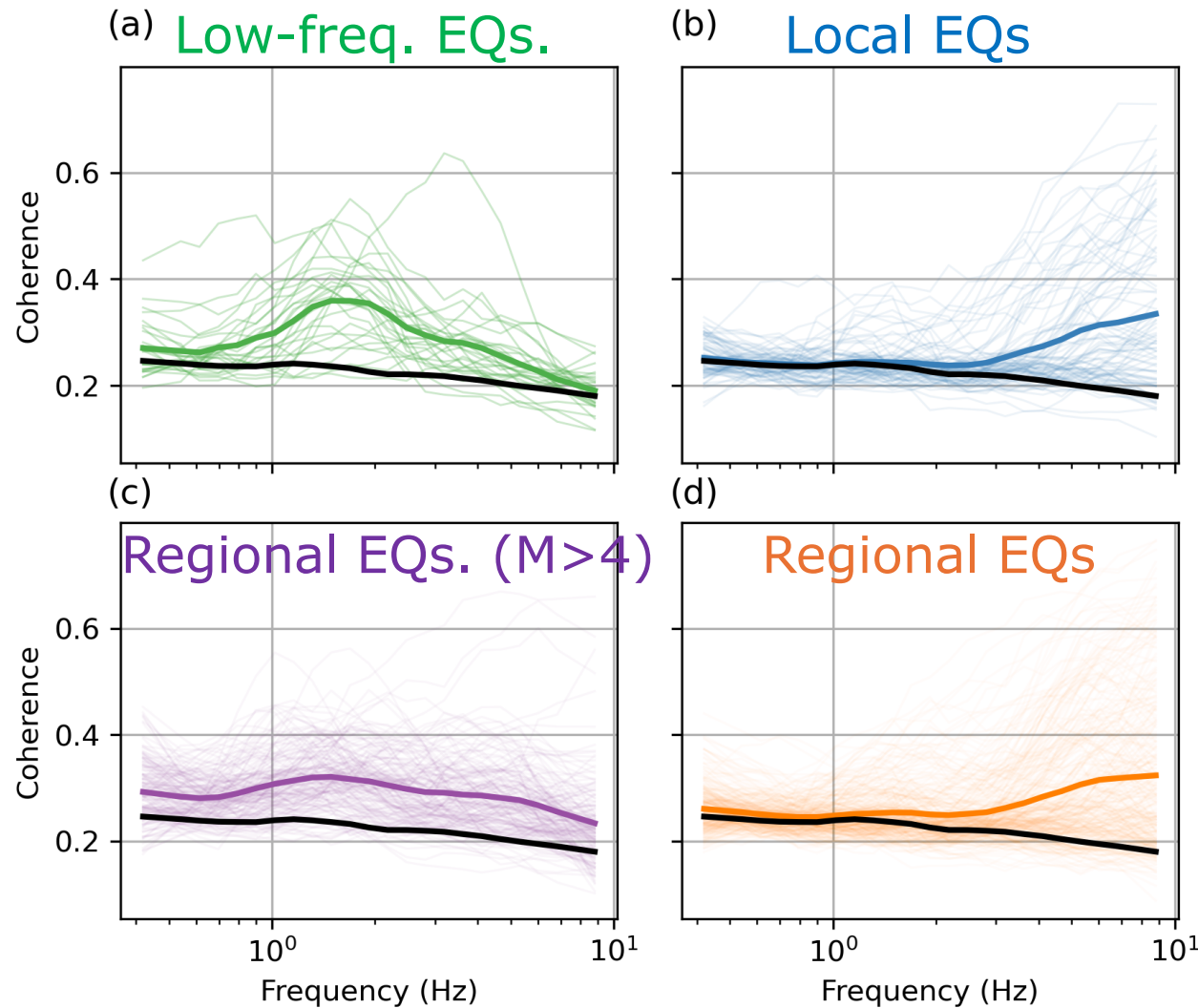


✓ Low-frequency earthquakes and local tectonic earthquakes are well discriminated.

✓ Low-frequency earthquakes and large regional earthquakes are not separated effectively.

- Low Frequency Earthquake
- Local Earthquake
- Regional Earthquake (<1000km, magnitude>4)
- Regional Earthquake (<100km)

# Coherency as a function of frequency

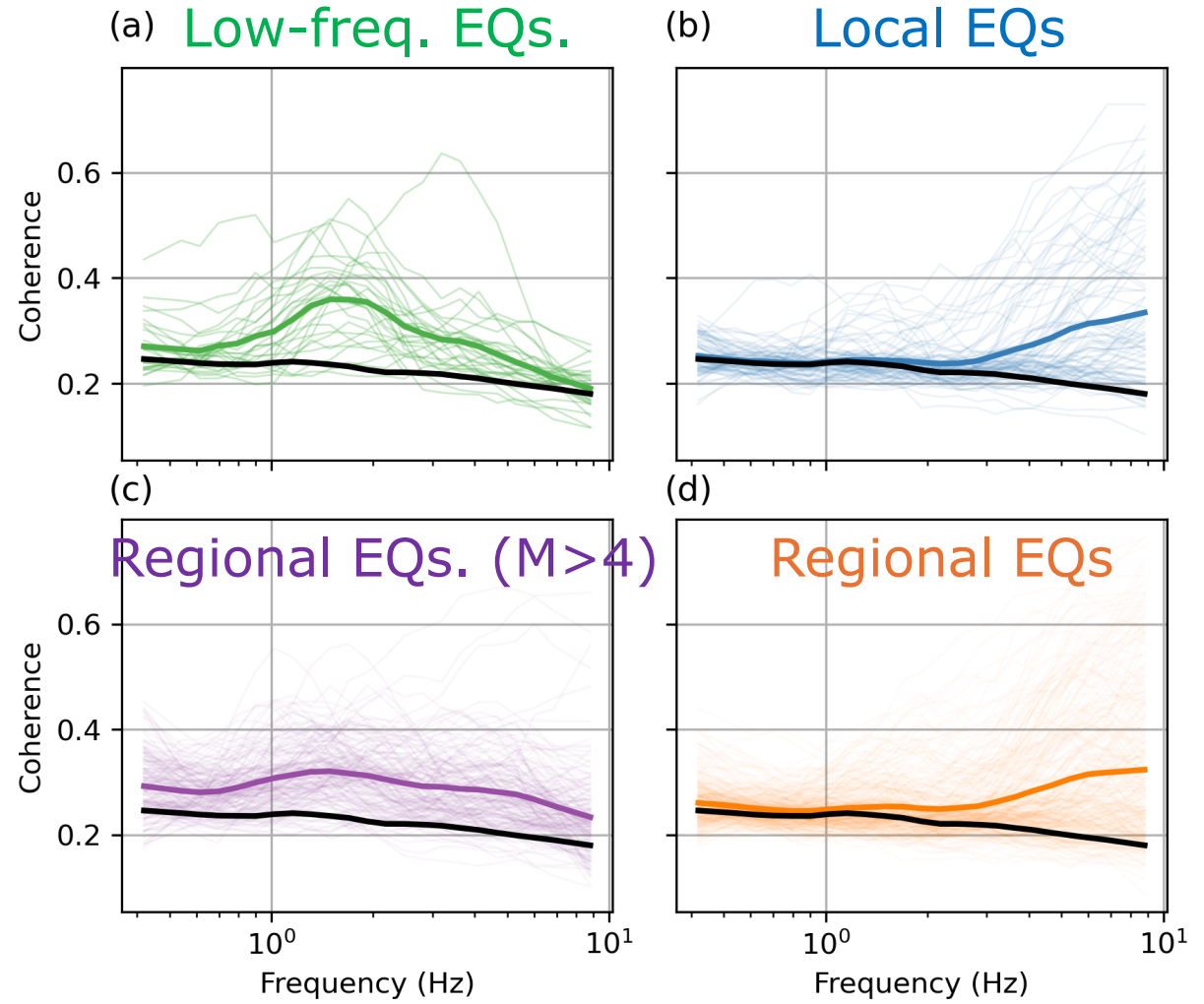
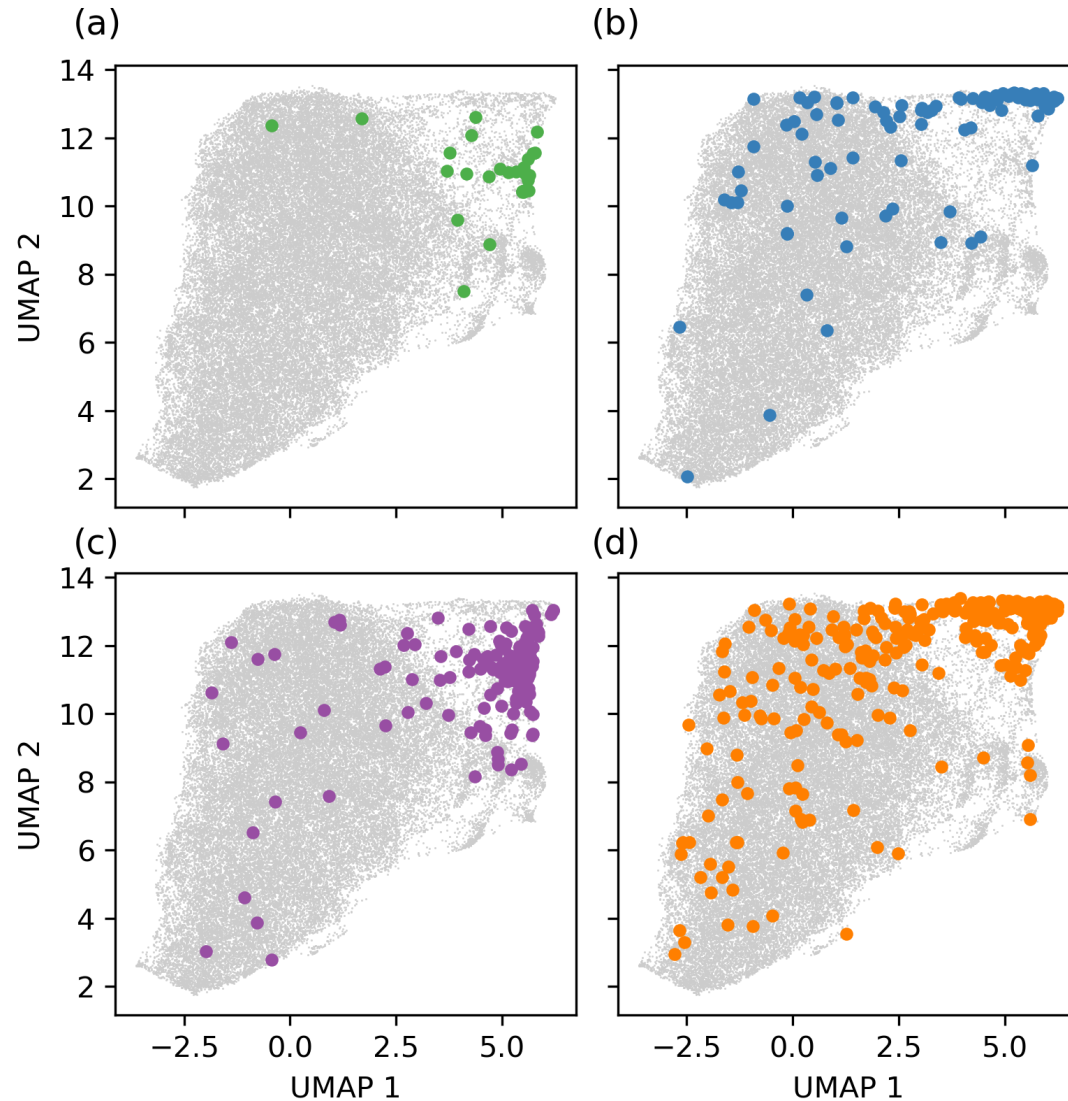


The difficulty of discriminating between Low-frequency earthquakes and large regional earthquakes comes from their similar coherence as a function of frequency.





# Coherency as a function of frequency



- Low Frequency Earthquake
- Local Earthquake
- Regional Earthquake (<1000km, magnitude>4)
- Regional Earthquake (<100km)



# Summary

- ✓ Mt. Fuji has been dormant for 300+ years, but is active with many low-frequency earthquakes at depths around 15 km.
- ✓ We employed UMAP to classify low-frequency earthquakes, but currently it is hard to discriminate between low-frequency earthquakes and regional large earthquakes.

## **Future:**

- ✓ Including seismic sites far from Mt. Fuji to discriminate between regional and low-frequency earthquakes.
- ✓ Temporal evolution over time
- ✓ Detecting uncataloged low-frequency earthquakes.