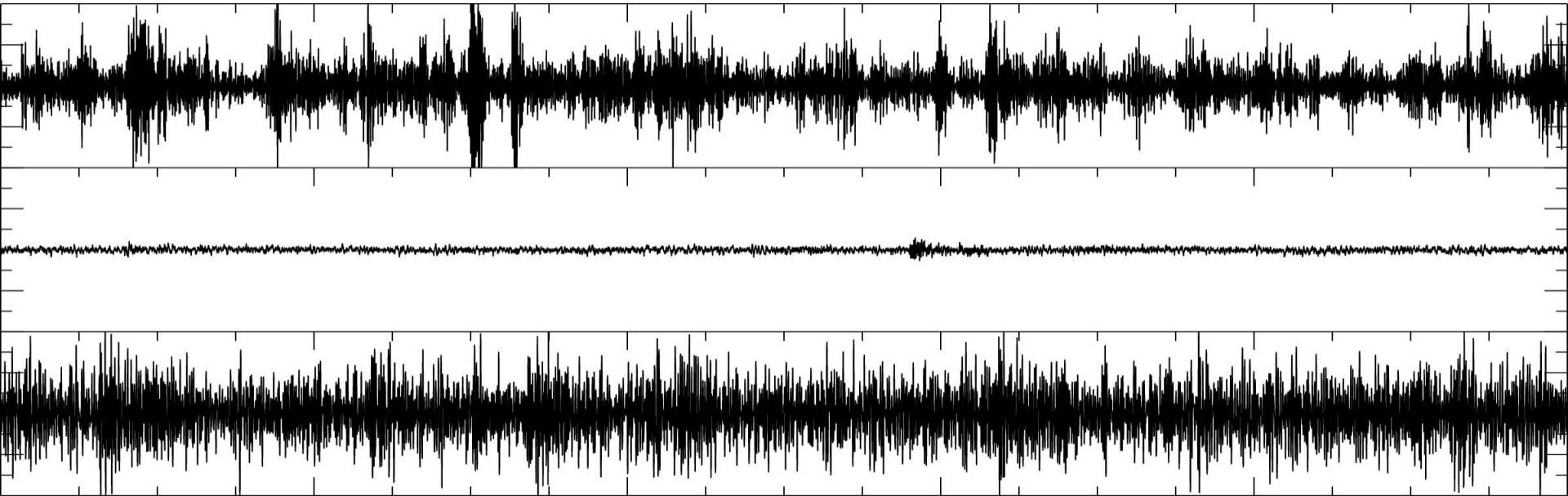
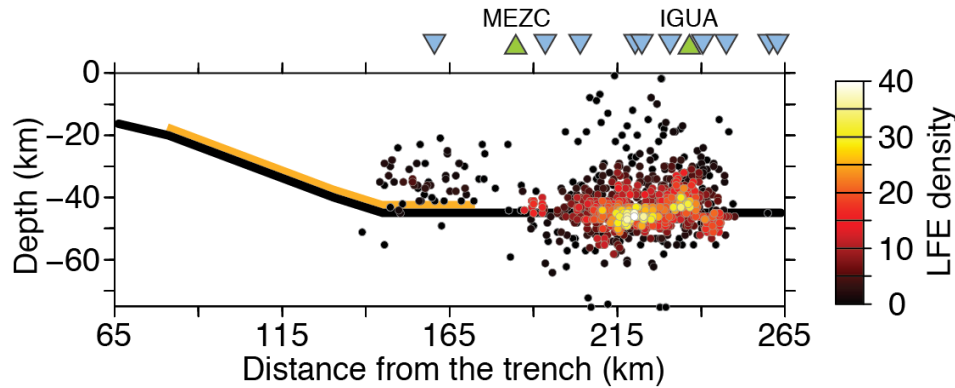


# Internal sources of “seismic noise” (volcanic and tectonic low-frequency tremors)

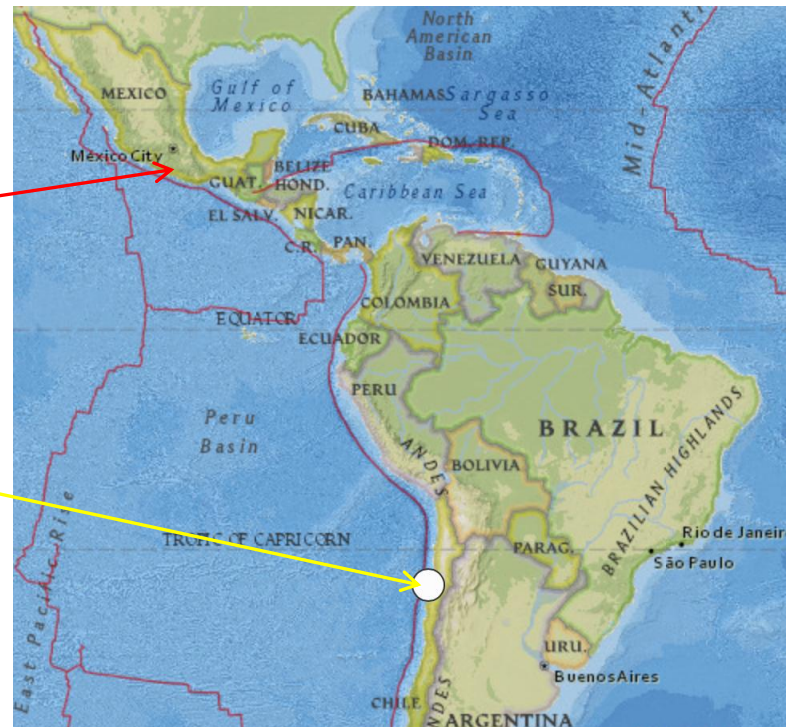
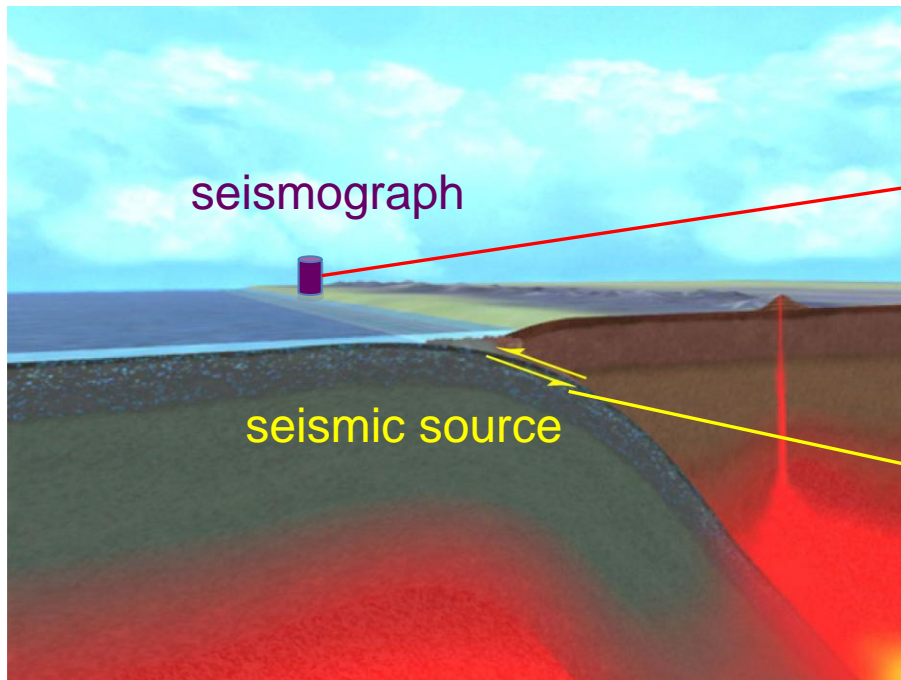
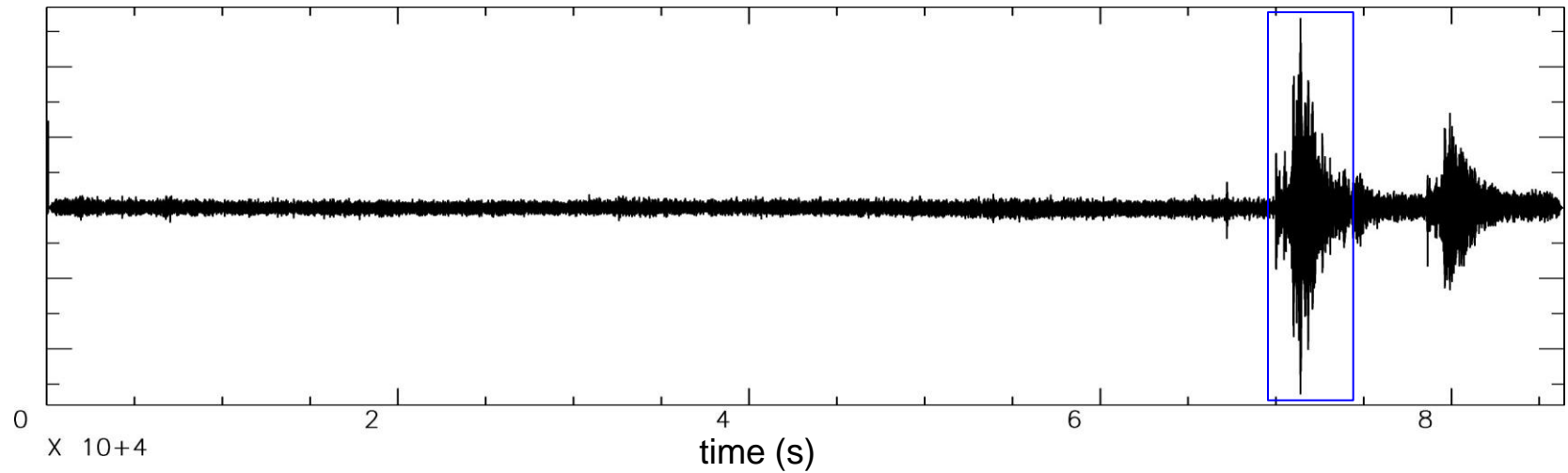
**Nikolai Shapiro**, Jean Soubestre, Dmitry Droznin, Svetlana Droznina, Leonard Seydoux, Julien de Rosny, William Frank



# Outline

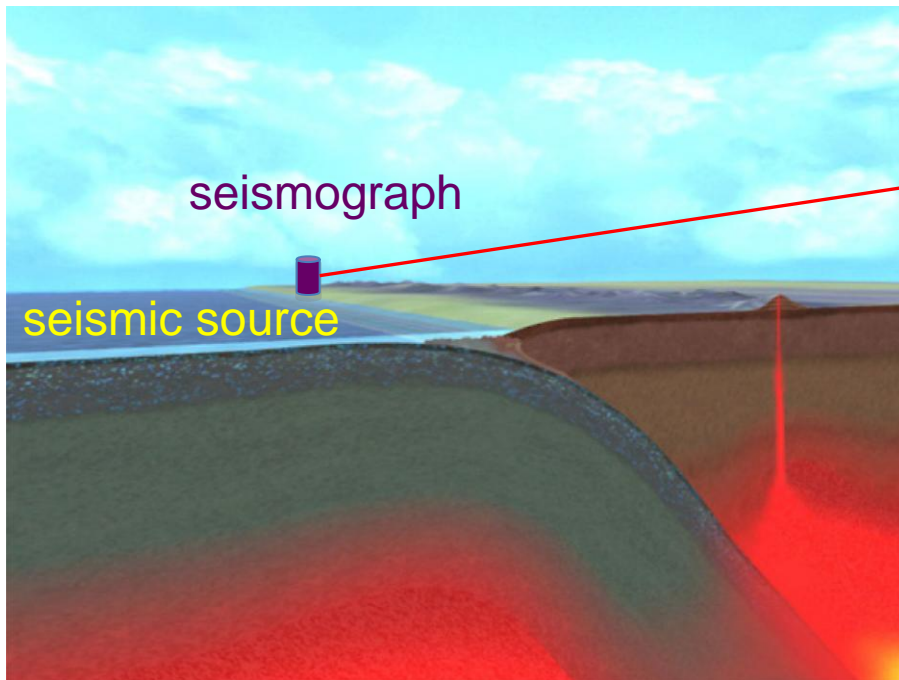
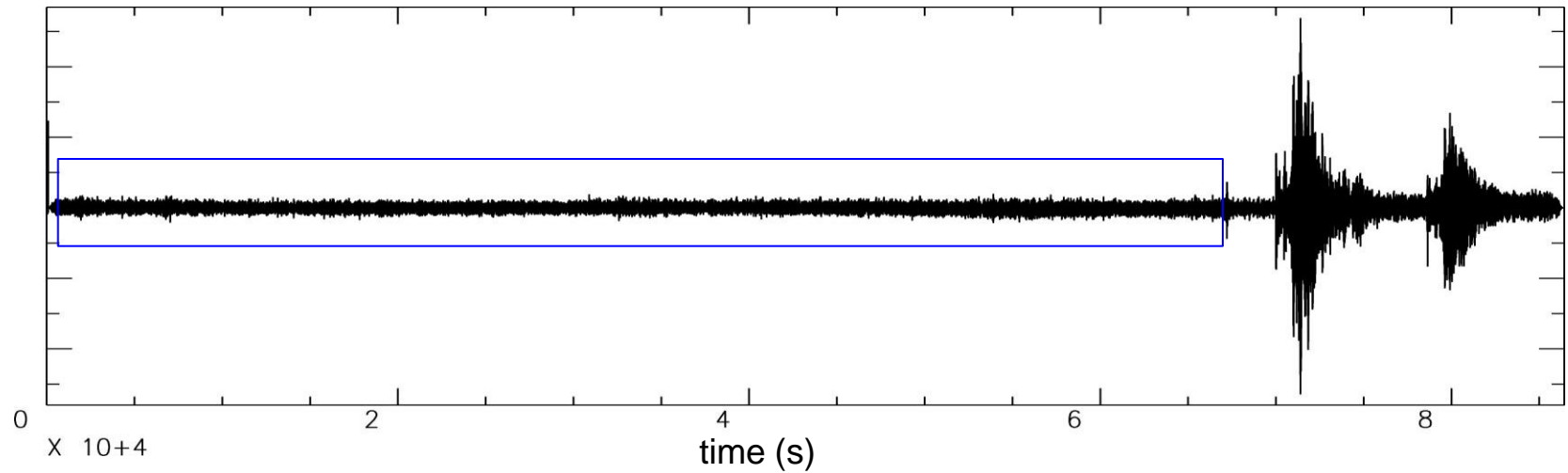
- Main types of observed Earth's seismic signals
- Volcanic tremors
- Tectonic tremors
- Challenges with the interpretation

# Example of seismic record: earthquake



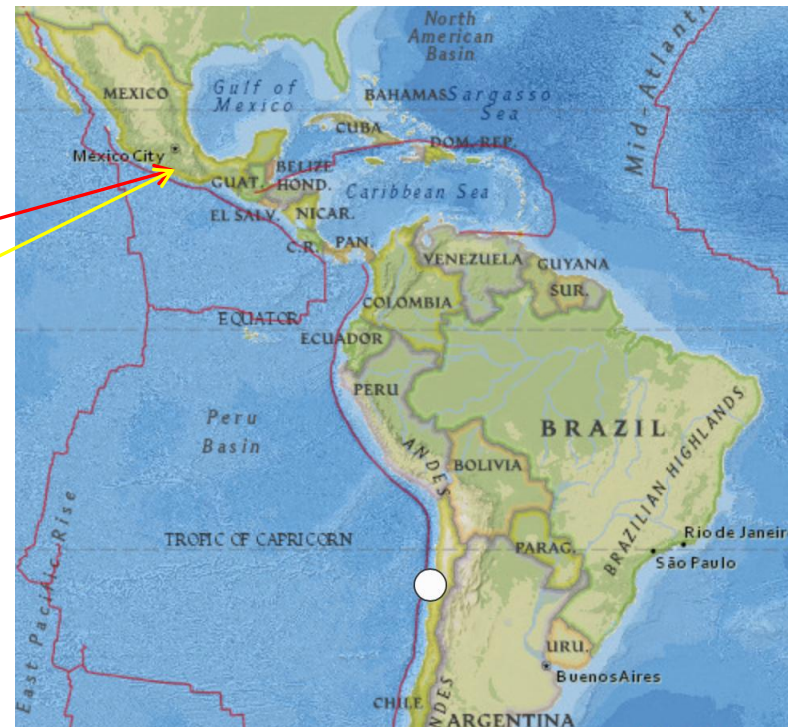
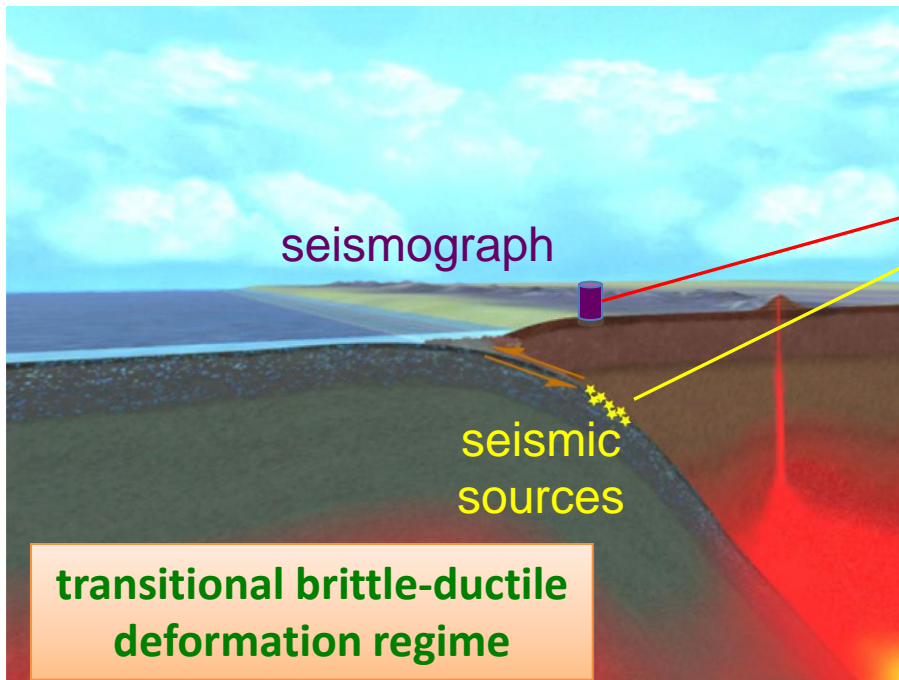
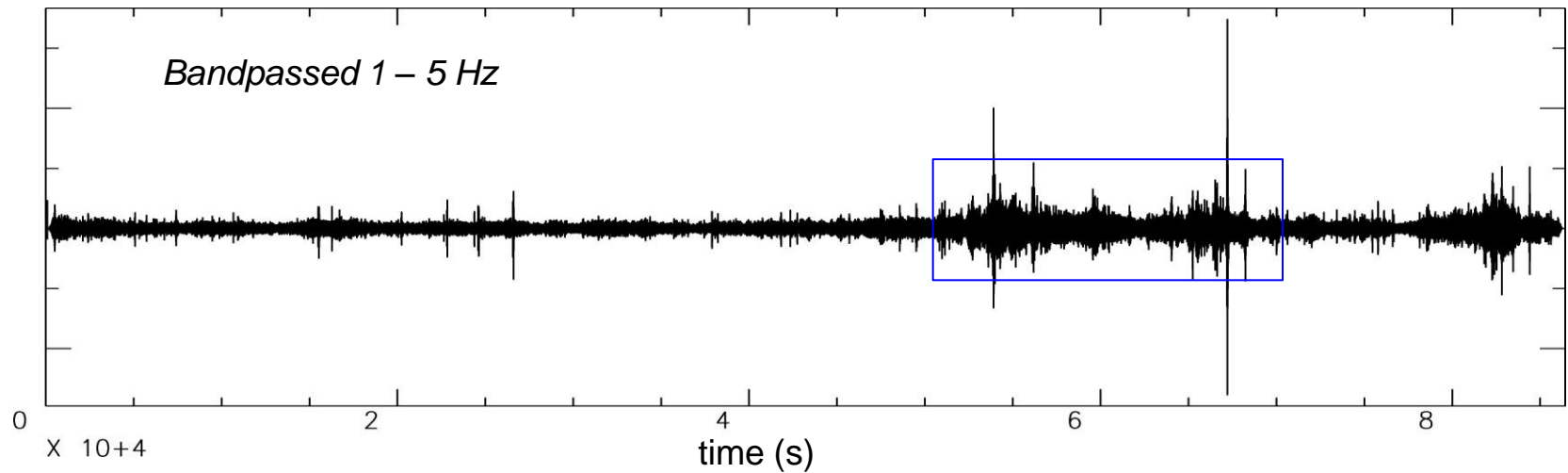


# Example of seismic record: ambient noise

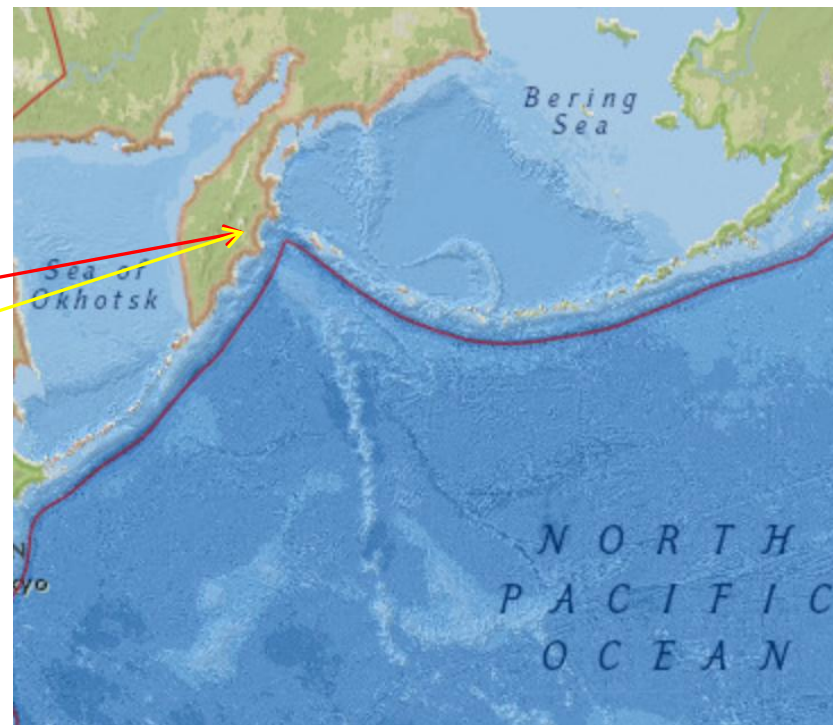
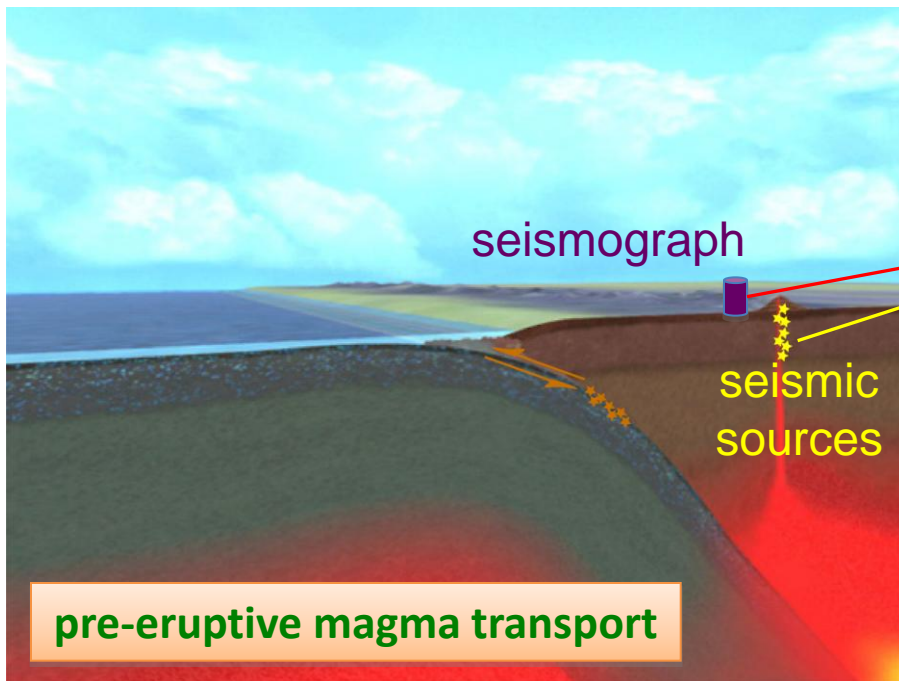
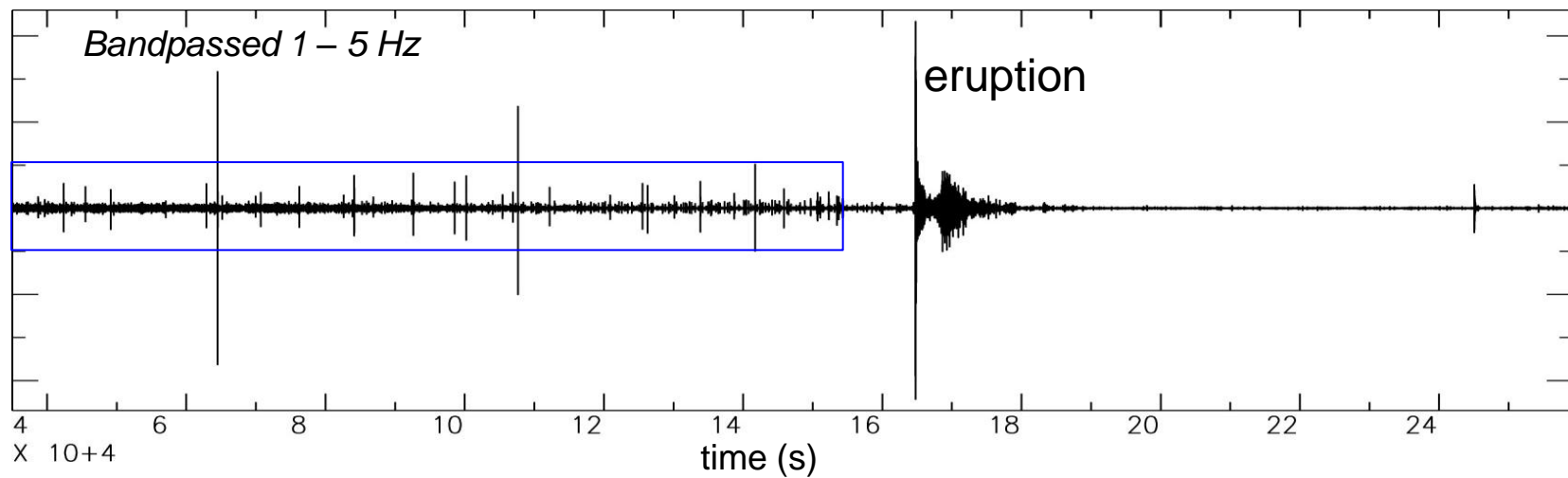




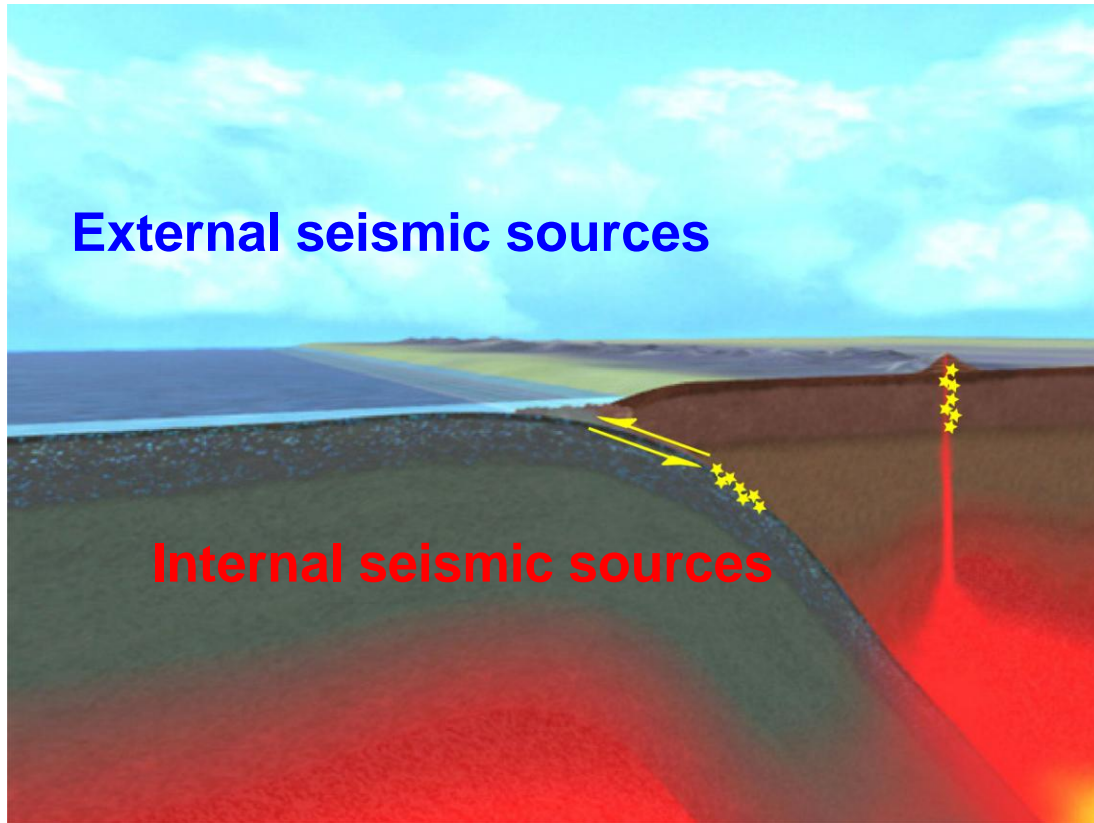
# Example of seismic record: tectonic tremor



# Example of seismic record: volcanic tremor



# Main classes of natural seismic sources



**External seismic sources**

**Internal seismic sources**

**Ambient seismic noise**  
broadband, recorded continuously

**Earthquakes**  
broadband, less than 1% of records

**Tectonic tremors**  
**Volcanic tremors**  
high-frequency ( $> 1$  Hz)  
up to 50% of records  
near faults and volcanoes

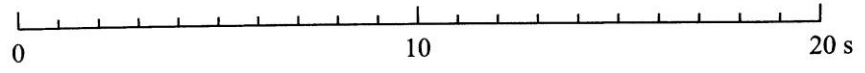
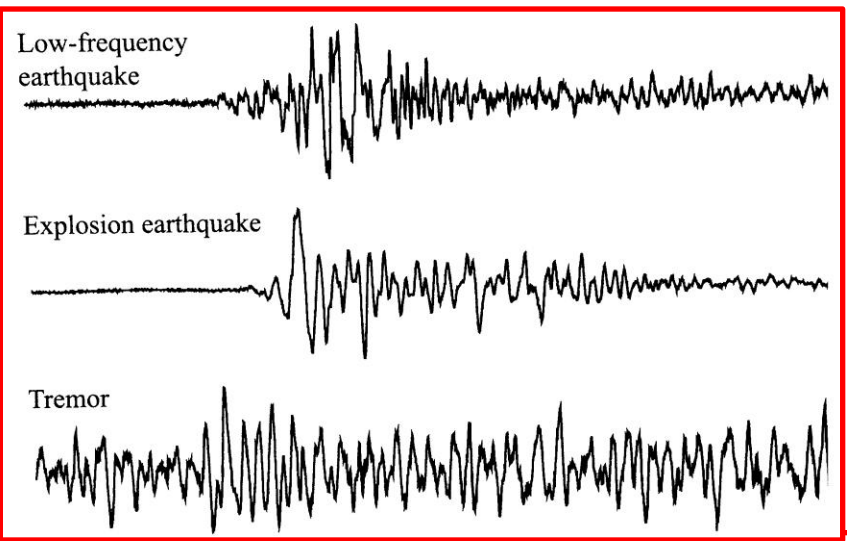
**Low-frequency tremors** – unique source of information about slow transient processes occurring within volcanic and fault systems



# Outline

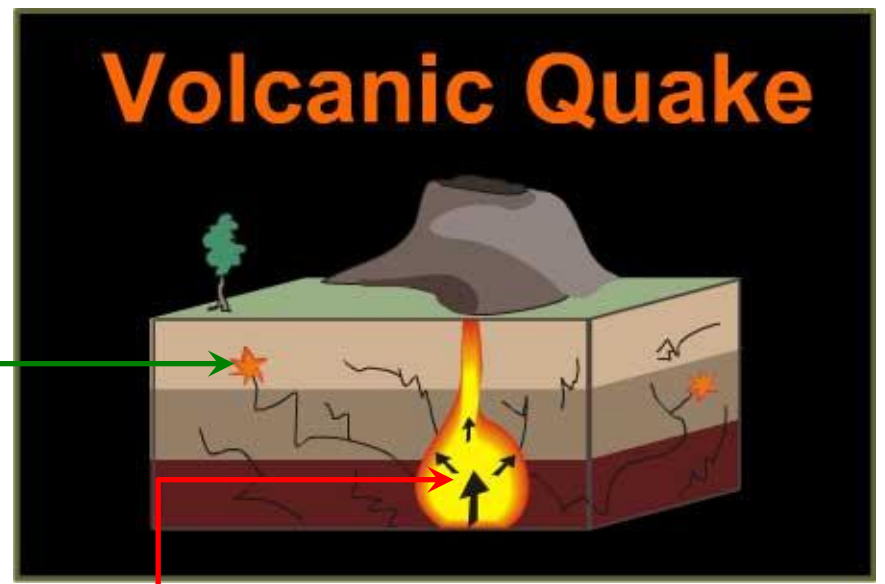
- Main types of observed Earth's seismic signals
  - Volcanic tremors
  - Tectonic tremors
- Challenges with the interpretation

# Two main classes of seismo-volcanic signals



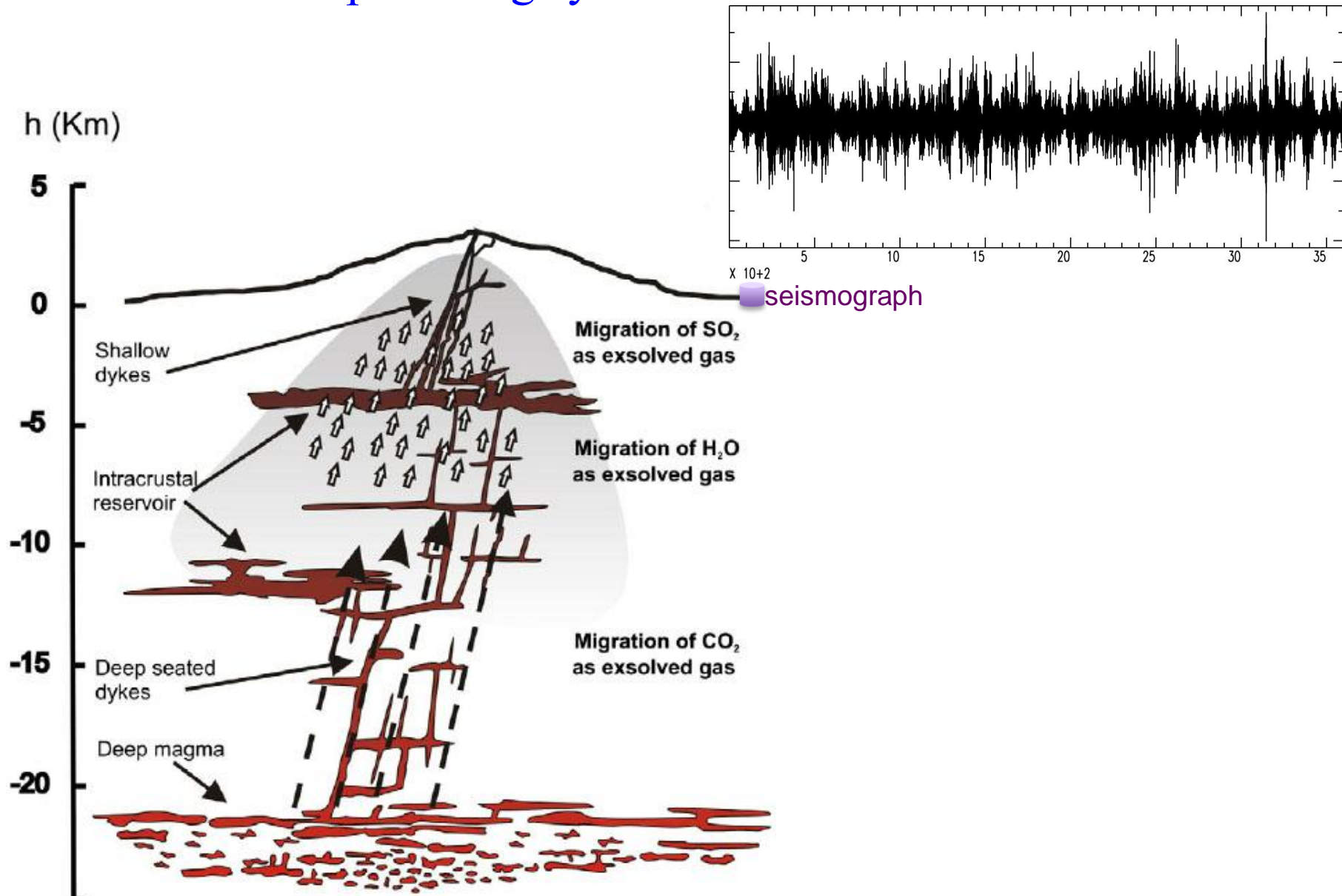
*Mt. Tokachi (Japan)*  
*From Nishimura and Iguchi, 2011*

Volcano-tectonic earthquakes:  
faulting within the solid part of volcanic edifices



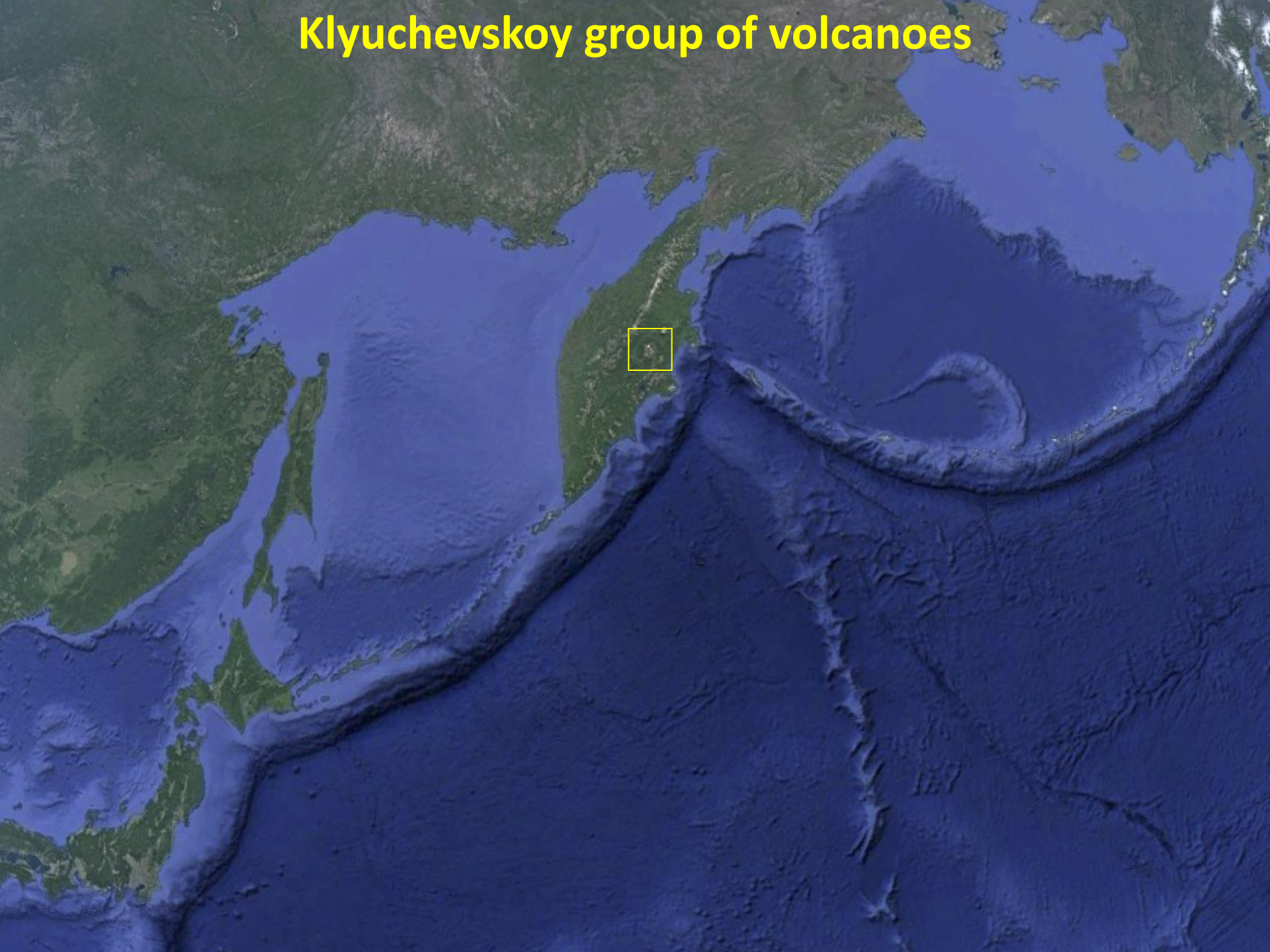
**Low-frequency (0.5-5 Hz) seismicity:  
processes within the plumbing system**

# Volcanic tremors reflect slow processes within plumbing systems of volcanoes





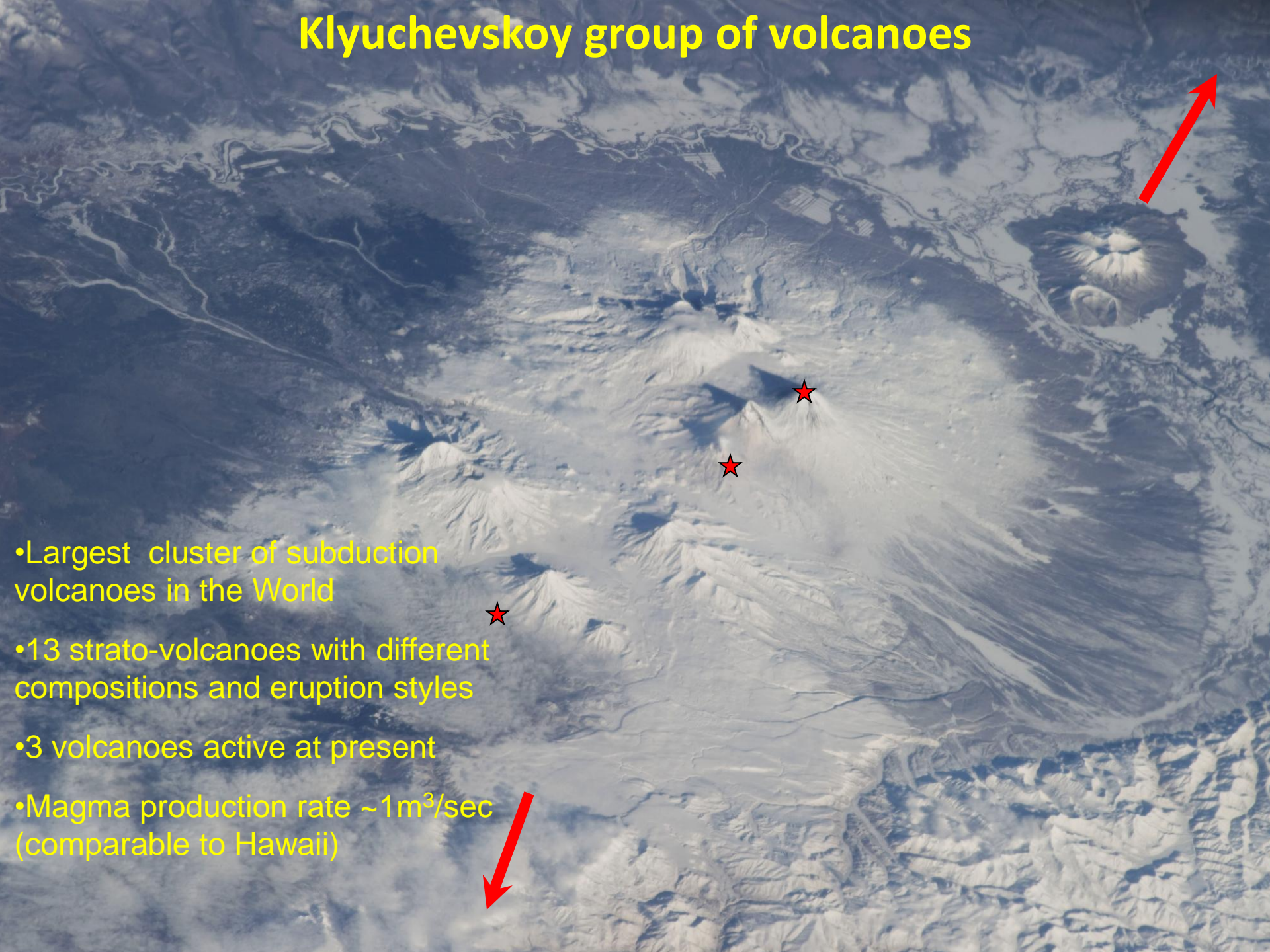
# Klyuchevskoy group of volcanoes





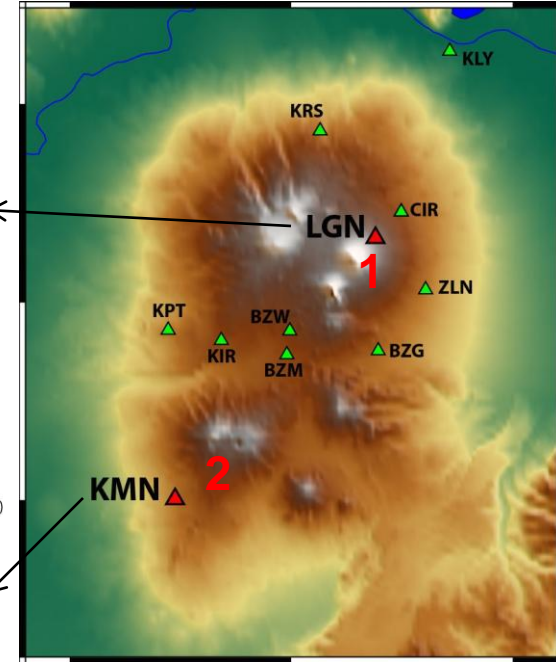
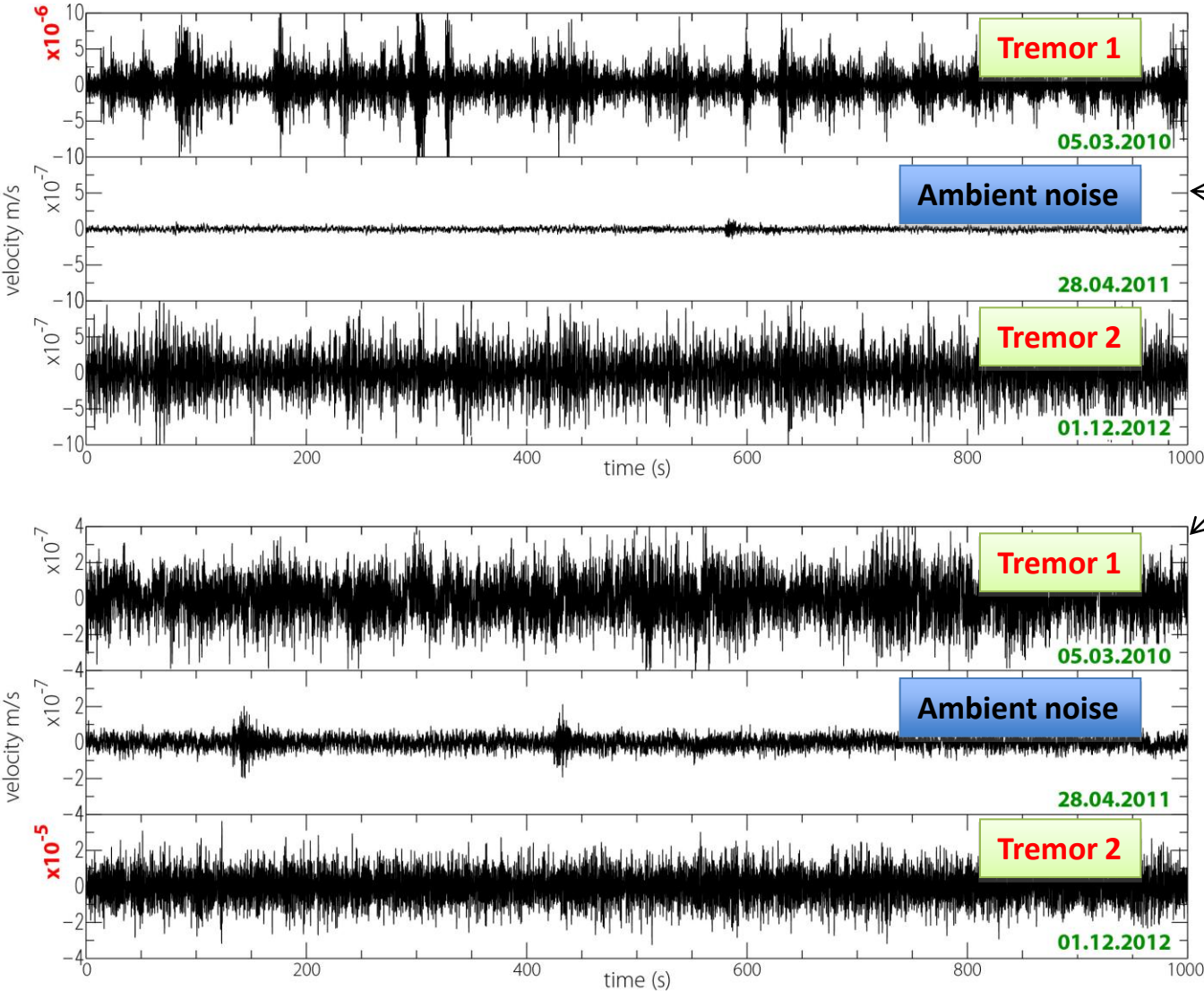
# Klyuchevskoy group of volcanoes

- Largest cluster of subduction volcanoes in the World
- 13 strato-volcanoes with different compositions and eruption styles
- 3 volcanoes active at present
- Magma production rate  $\sim 1\text{m}^3/\text{sec}$  (comparable to Hawaii)





# Volcanic tremors: examples of records



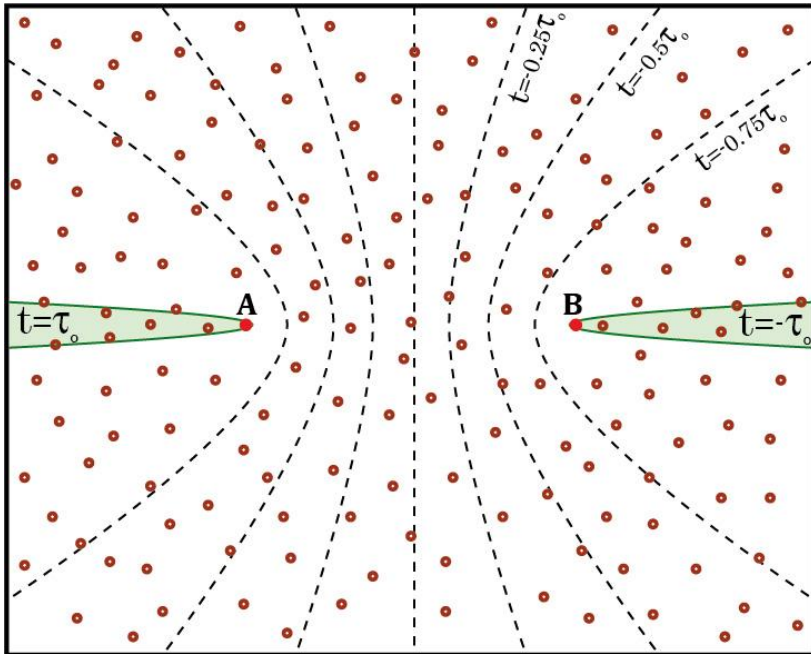
Volcanic tremors:

Complex,  
apparently random  
signals

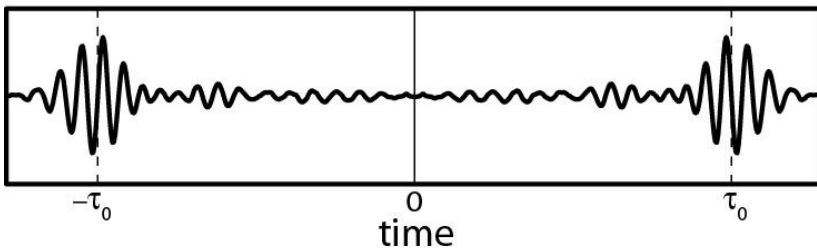


# Difference between tremors and ambient noise

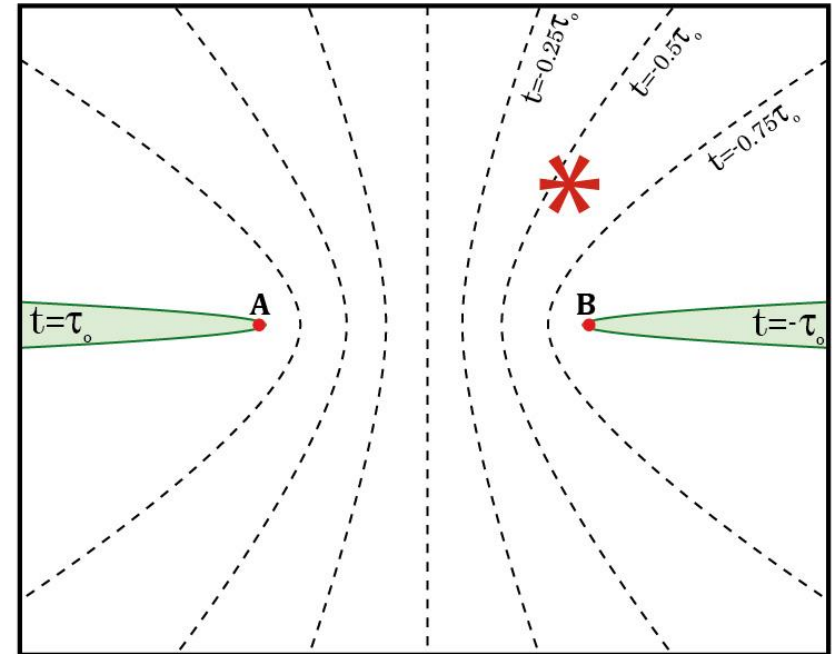
noise from well-distributed sources



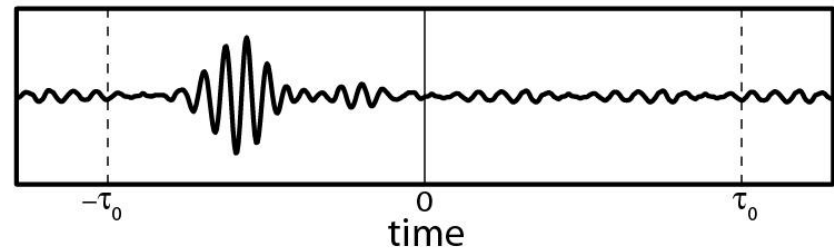
cross-correlation A-B



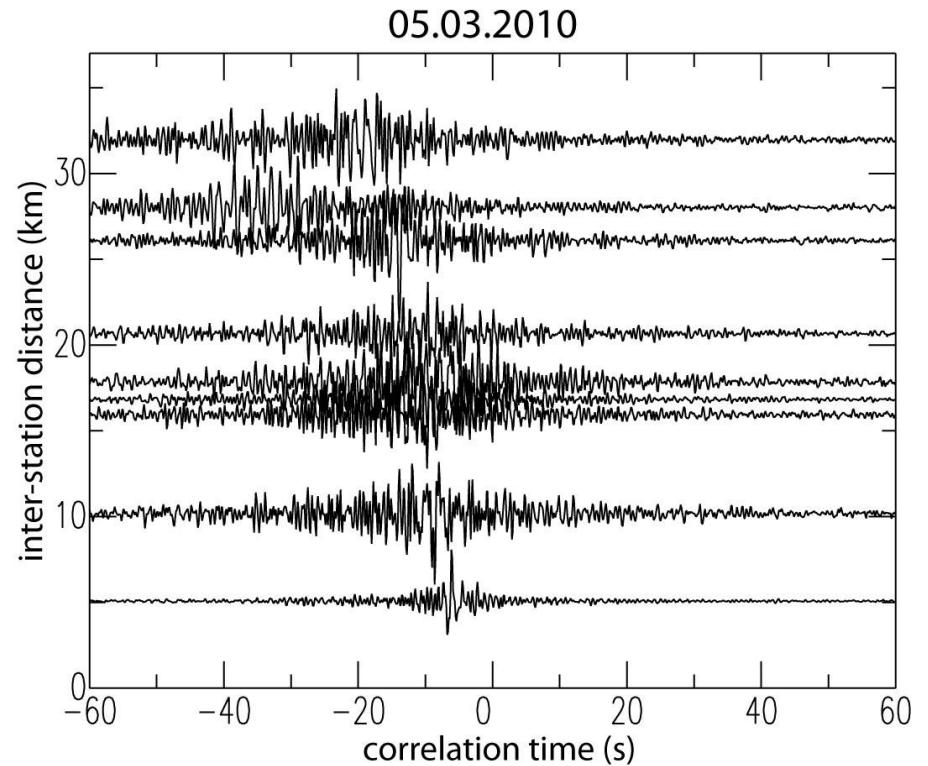
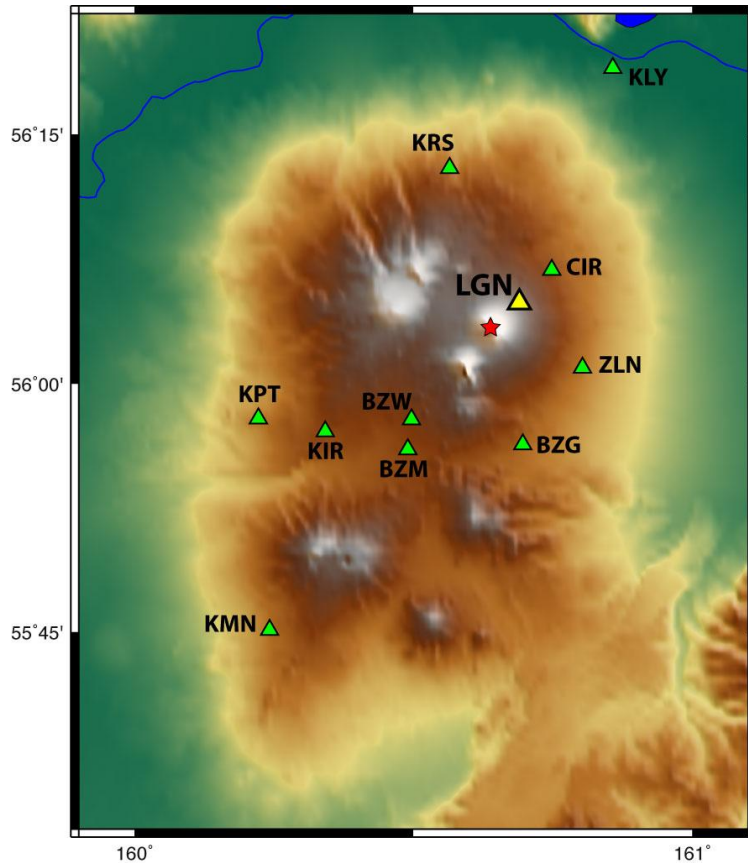
noise from a localized source



cross-correlation A-B



# Cross-correlations of volcanic tremors



**Arrivals appearing on cross-correlations are controlled by the travel times between the tremor source and the stations**

# Cross-correlations of volcanic tremors



01.12.2012

## Location of tremor sources:

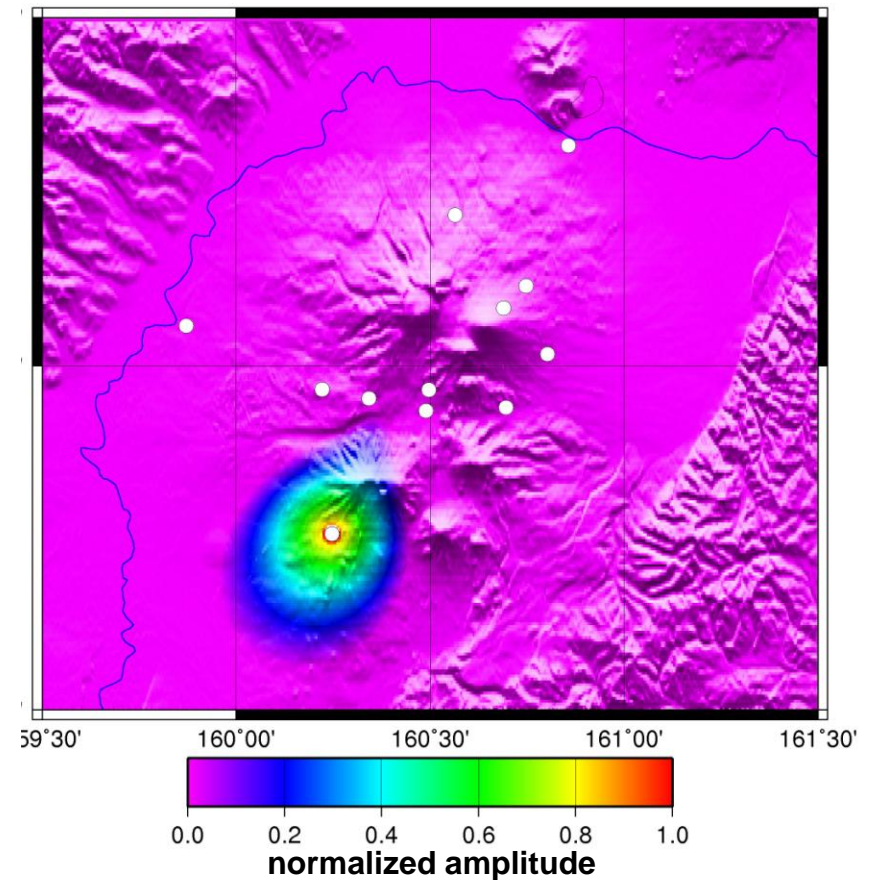
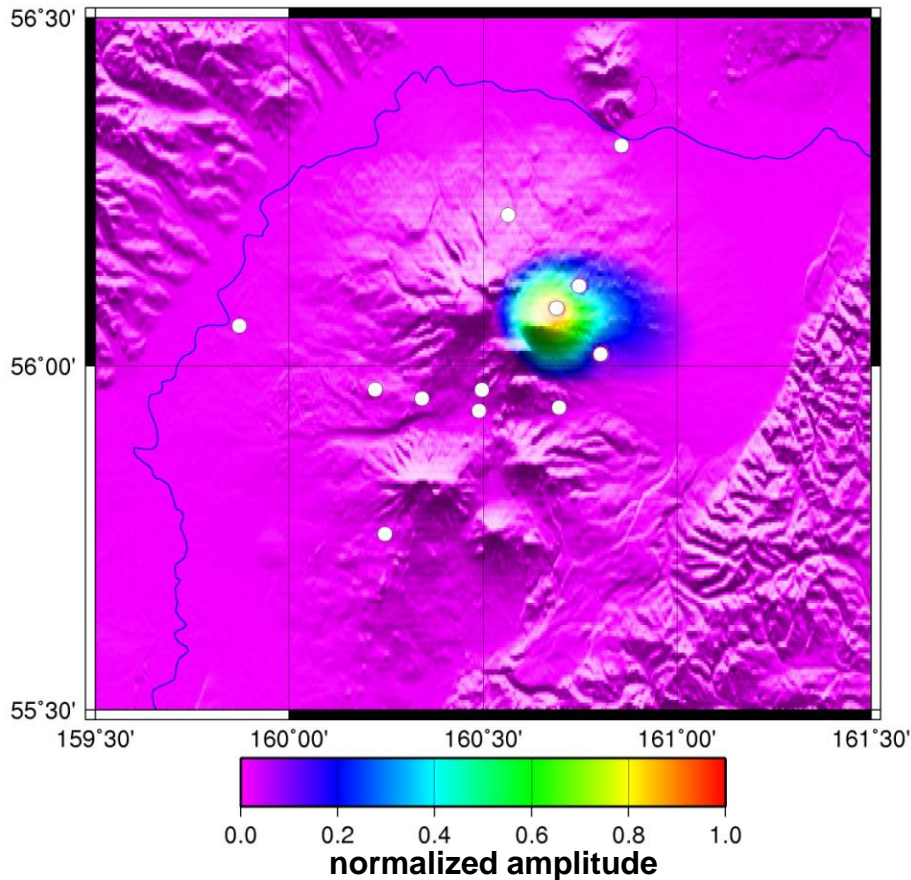
1. Computing envelopes of cross-correlations
2. Introducing time shifts based on tested source location
3. Computing network response function by adding shifted envelopes
4. Repeating steps 2 and 3 for all source positions
5. Finding the position maximizing the network response function

**Arrivals appearing on cross-correlations are controlled by the travel times between the tremor source and the stations**

# Cross-correlation network response function

**Klyuchevskoy erupting  
(March 5, 2010)**

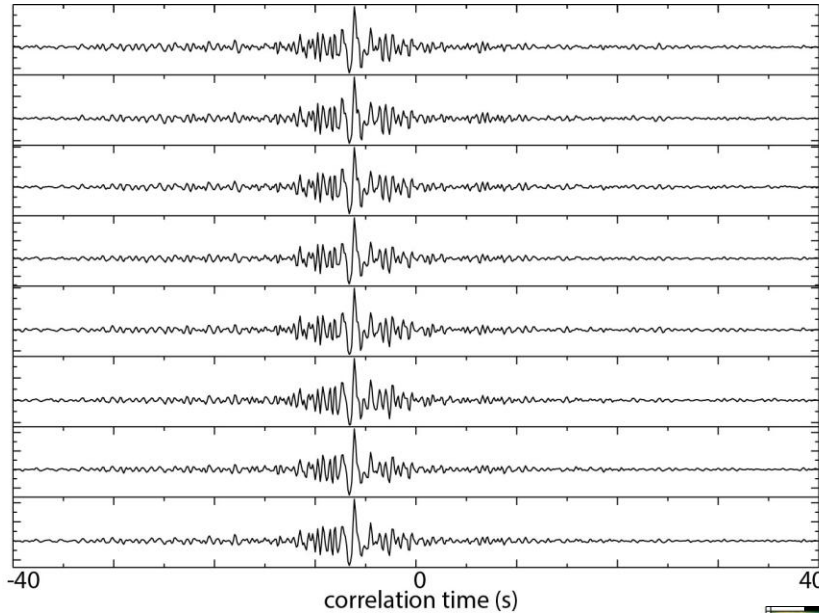
**Tolbachik erupting  
(December 1, 2012)**



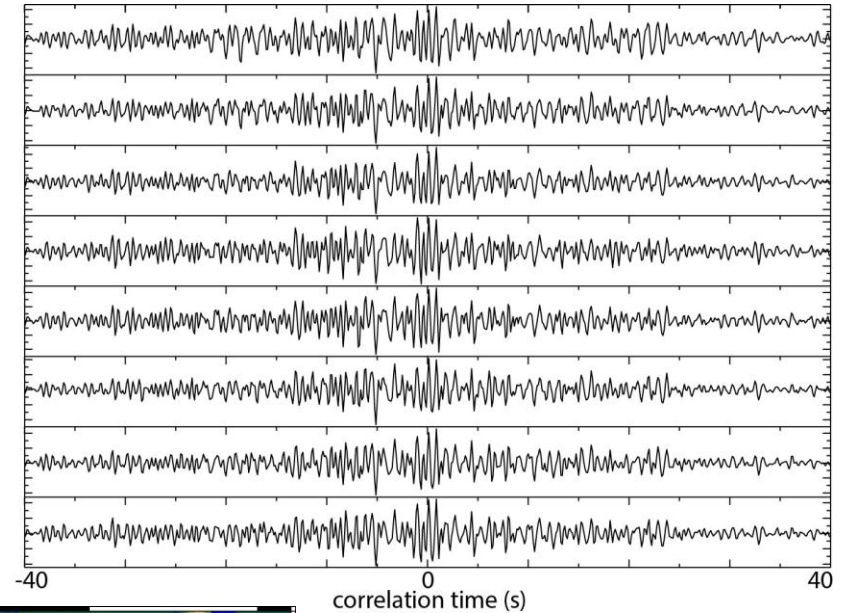


# Exploring the repetitivity of the seismic correlations: “tremor fingerprinting”

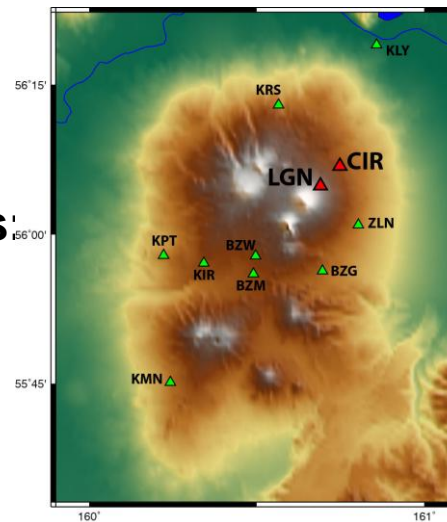
01.20.2010-08.20.2010 : Klyuchevskoy eruption



01.20.2013-08.20.2013 : Tolbachik eruption



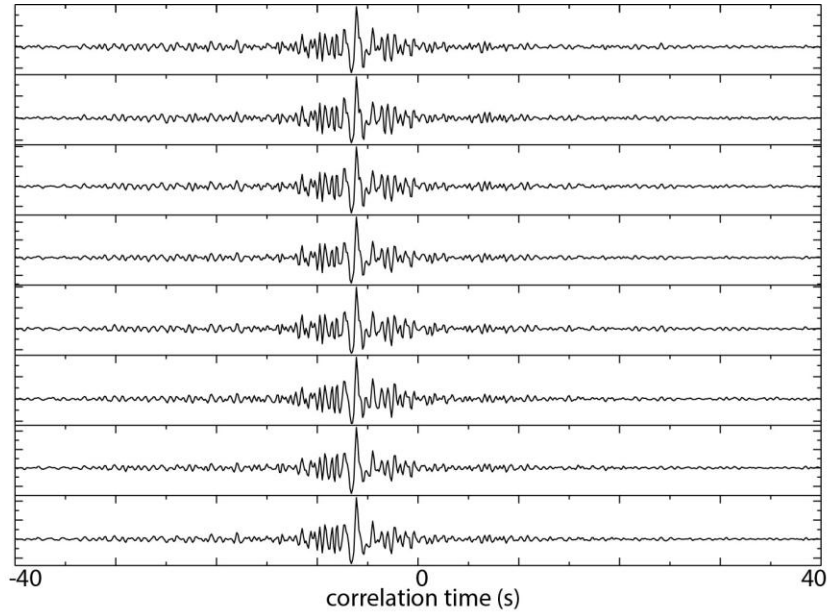
Daily cross-correlations  
between one pair of stations:  
**LGN - CIR**



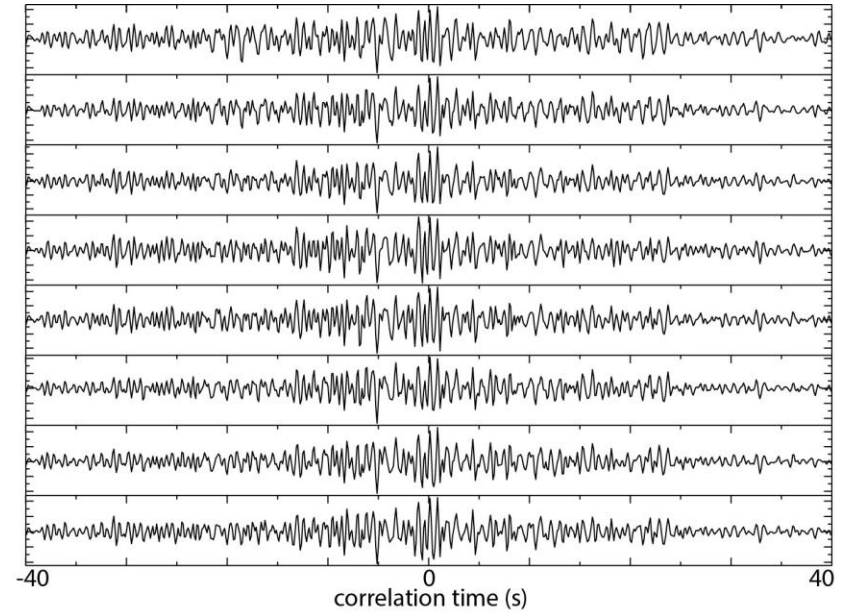
from Droznin et al, 2015

# Exploring the repetitivity of the seismic correlations: “tremor fingerprinting”

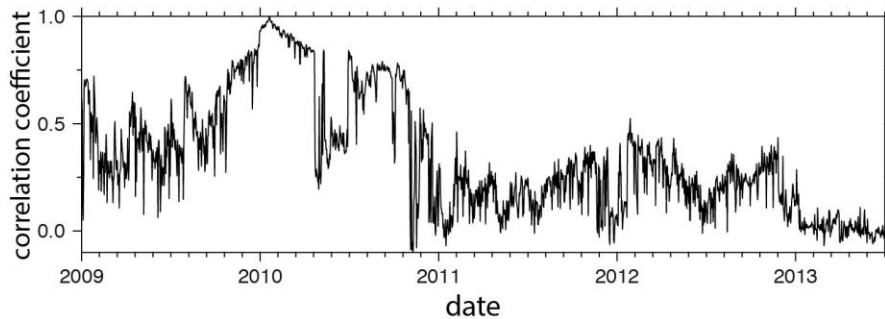
01.20.2010-01.27.2010 : Klyuchevskoy eruption



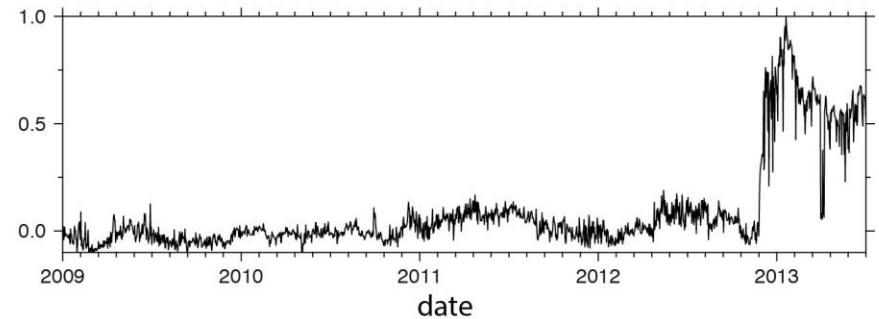
01.20.2013-01.27.2013 : Tolbachik eruption



Detection of activity: correlation coefficient with a reference CC waveform



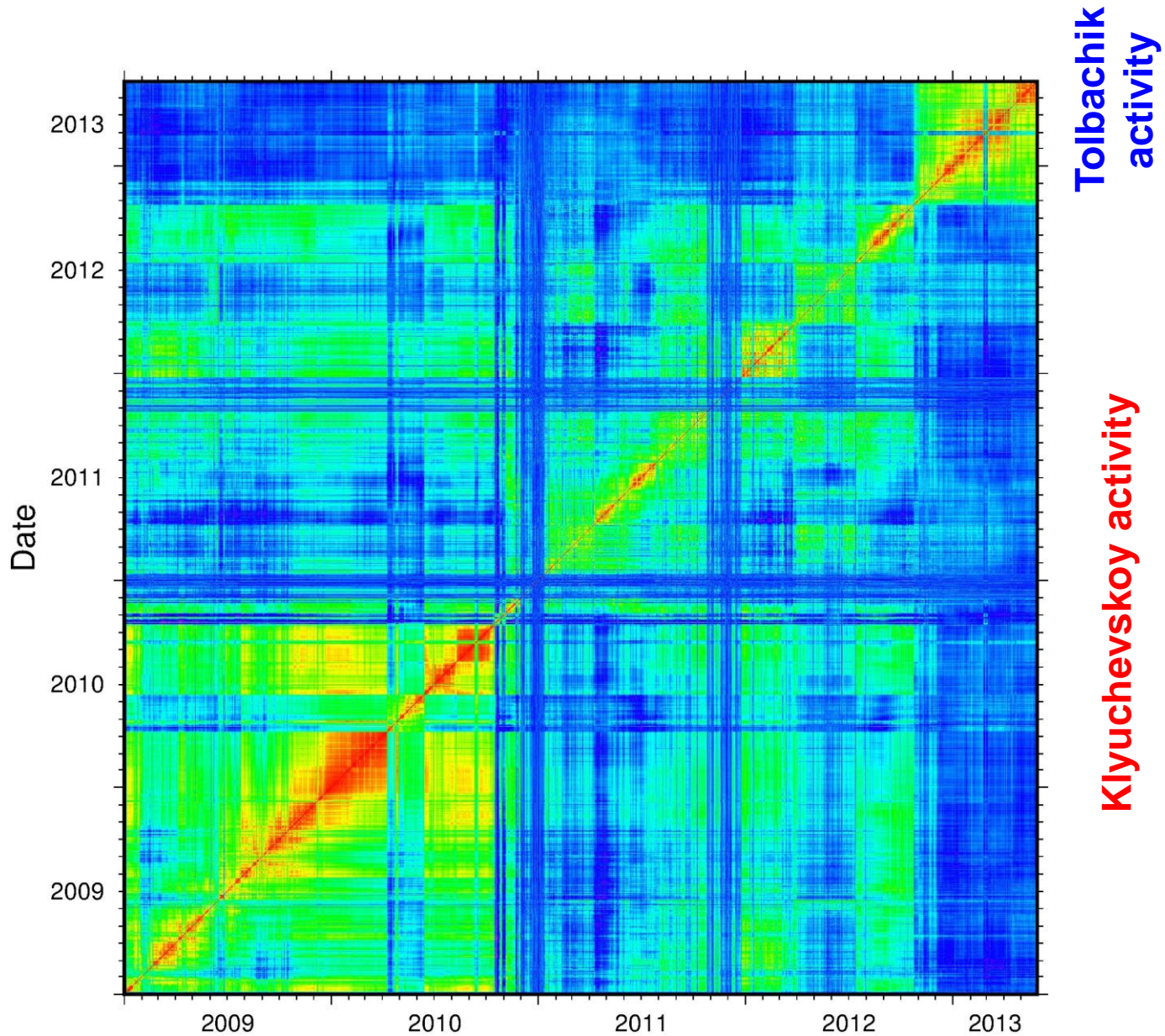
Klyuchevskoy activity



Tolbachik activity



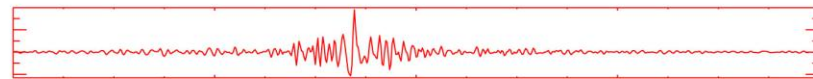
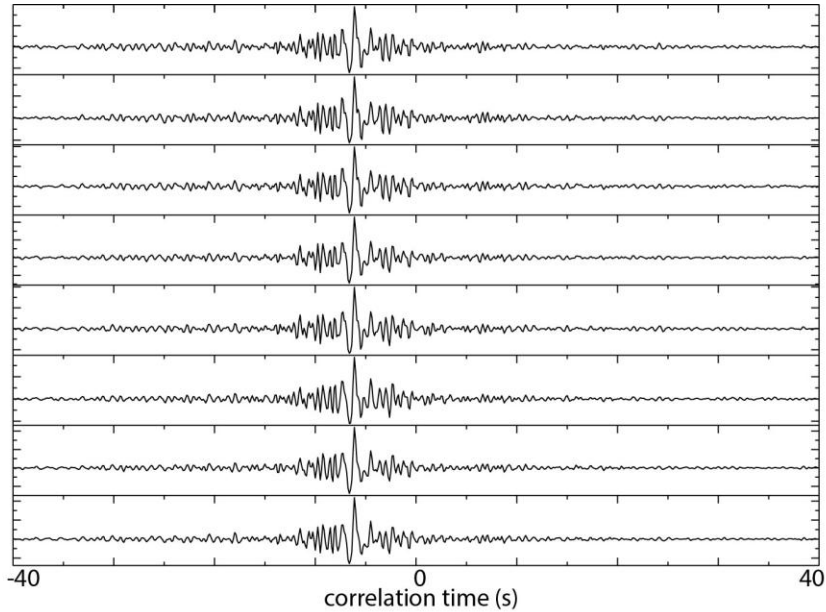
# Matrix of correlation coefficients



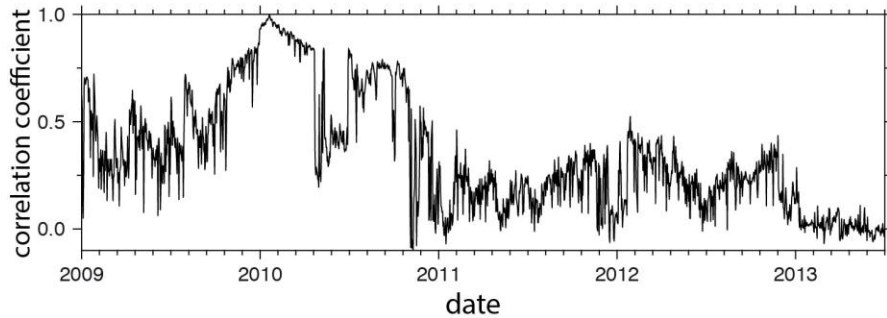
*from Droznin et al, 2015*

# Principle component analysis of the ensemble of daily cross-correlations

01.20.2010-08.20.2010 : Klyuchevskoy eruption

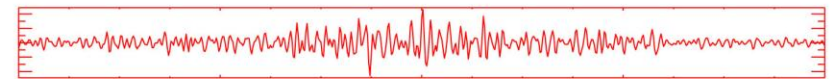
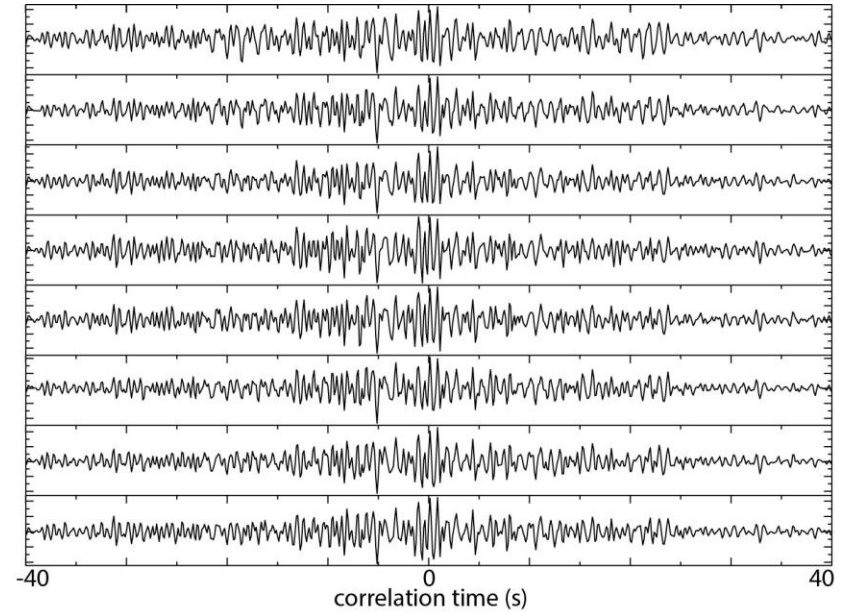


eigenvector 1

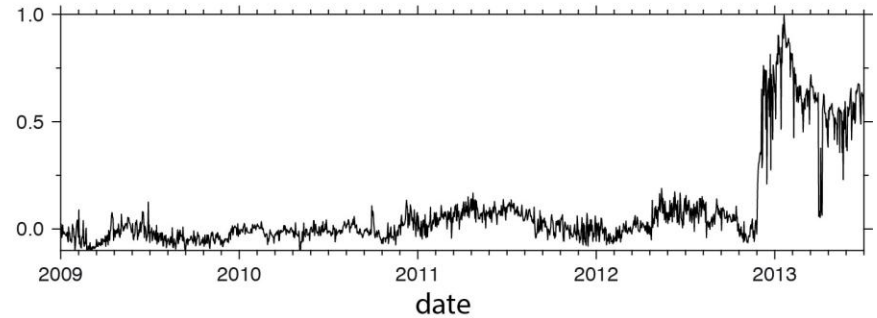


Klyuchevskoy activity

01.20.2013-08.20.2013 : Tolbachik eruption



eigenvector 2

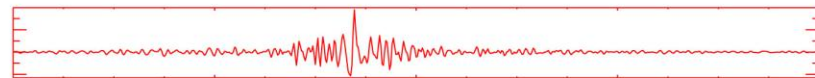
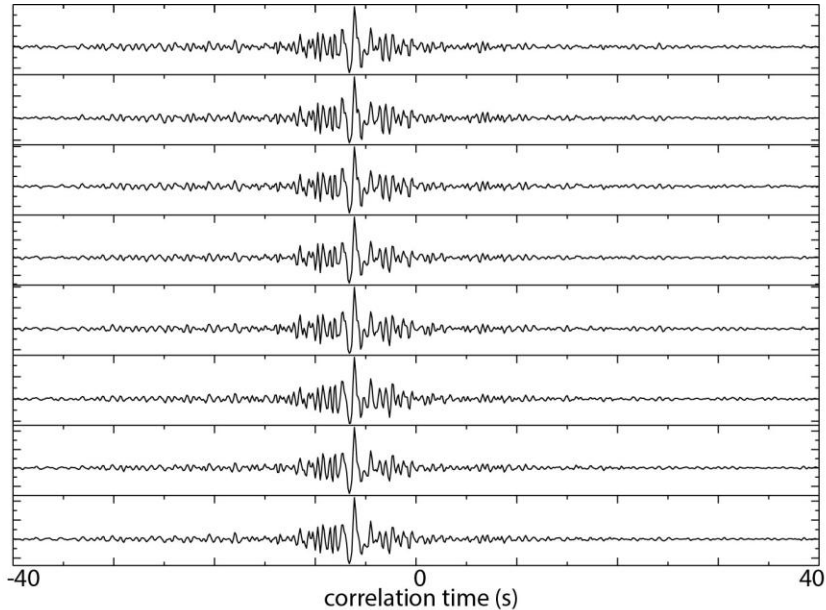


Tolbachik activity

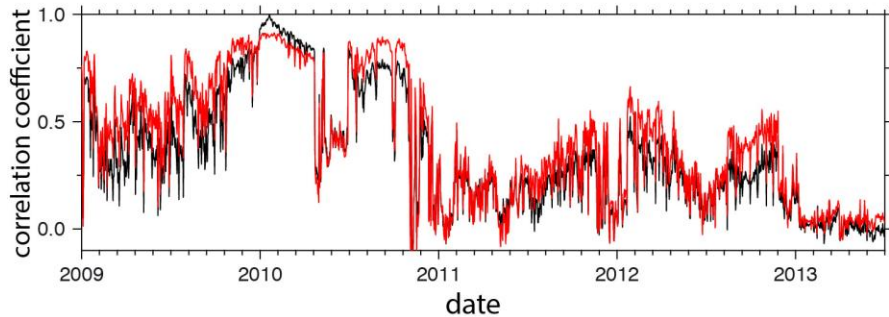


# “Tremor fingerprinting” from the results of the Principle component analysis

01.20.2010-08.20.2010 : Klyuchevskoy eruption

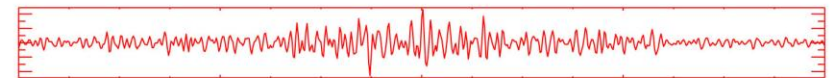
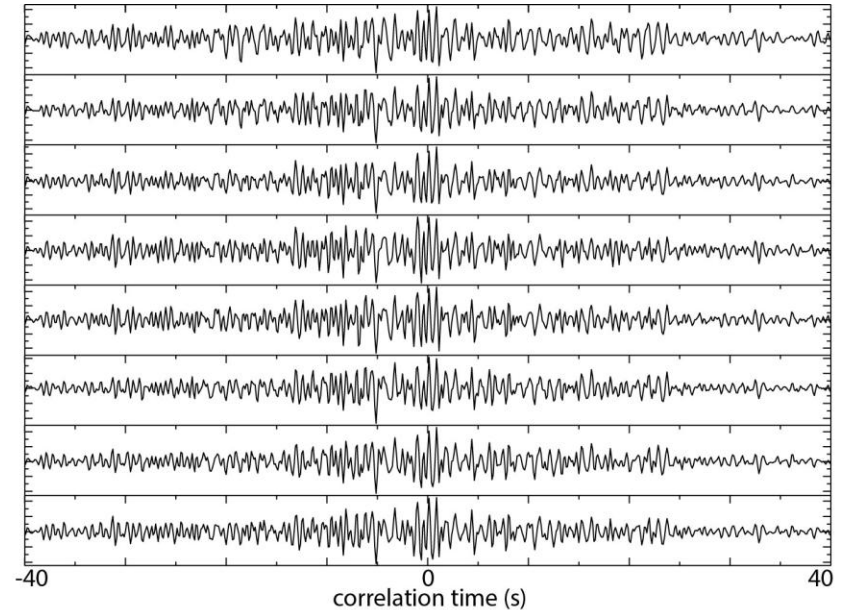


**eigenvector 1**

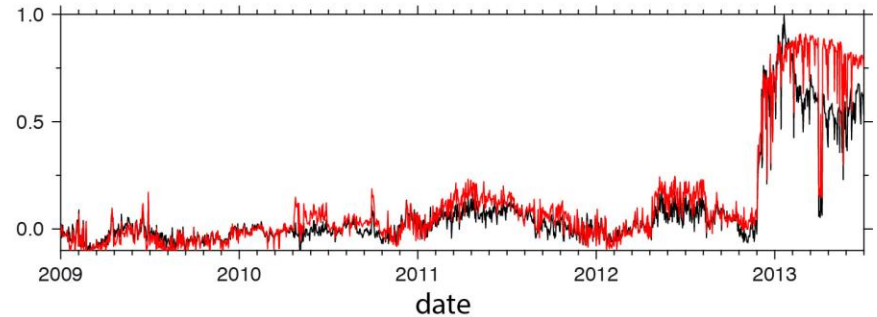


**Klyuchevskoy activity**

01.20.2013-08.20.2013 : Tolbachik eruption



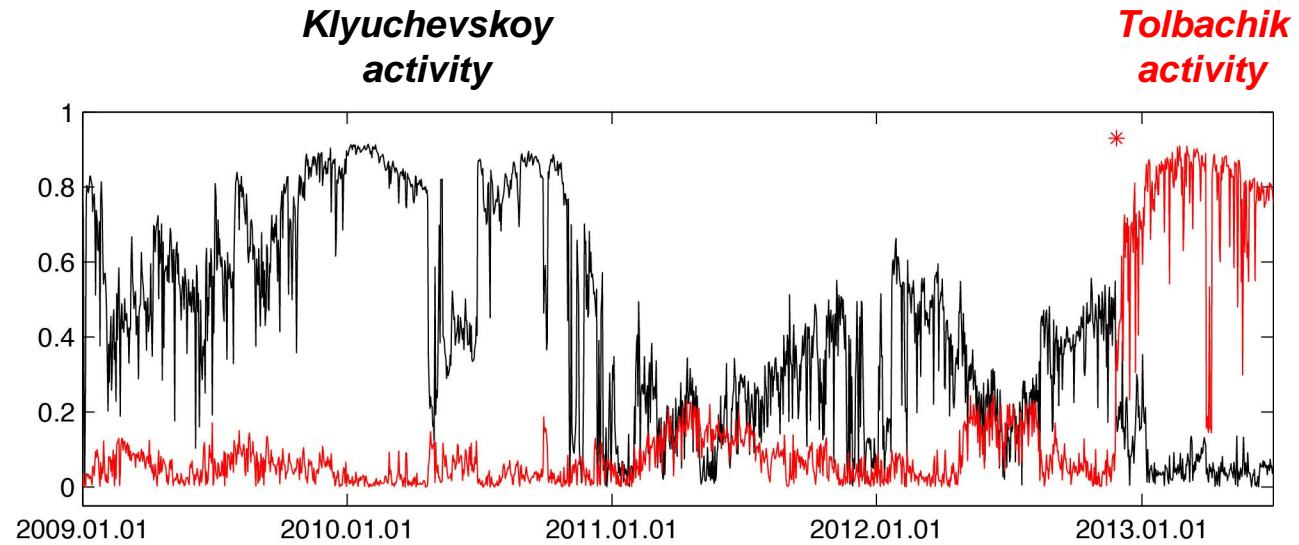
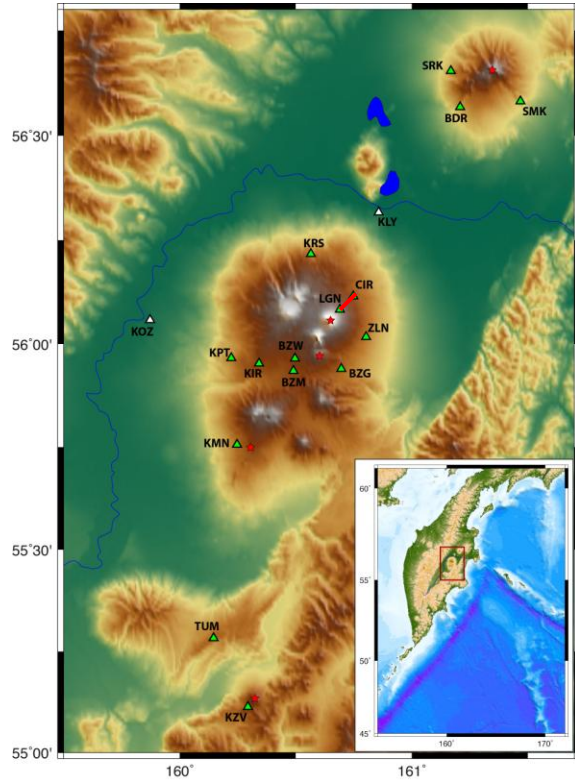
**eigenvector 2**



**Tolbachik activity**

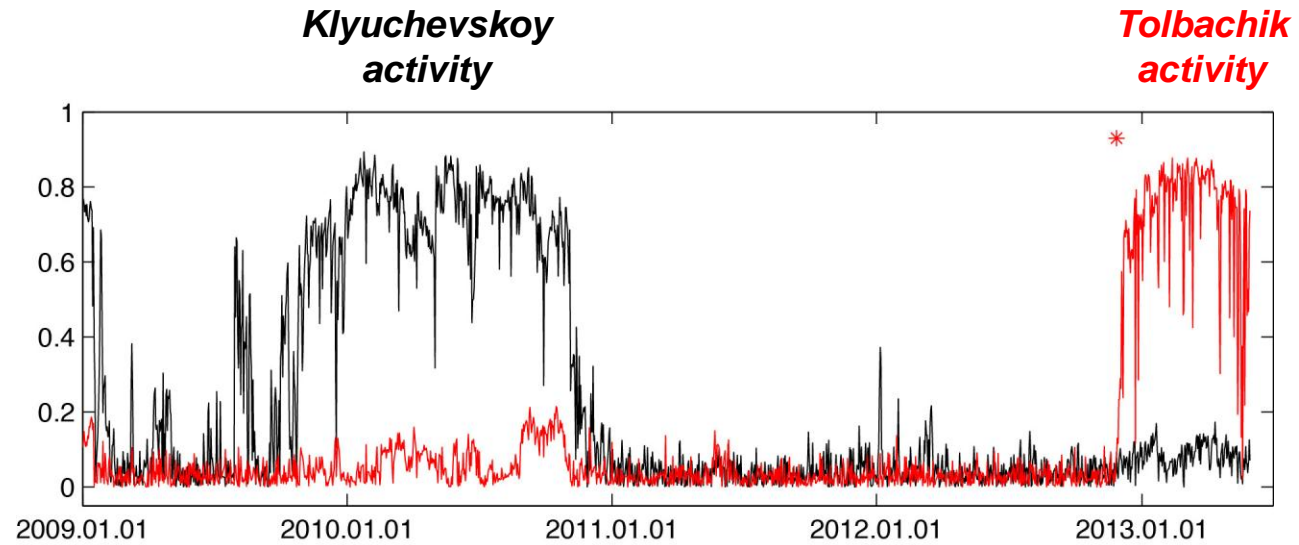
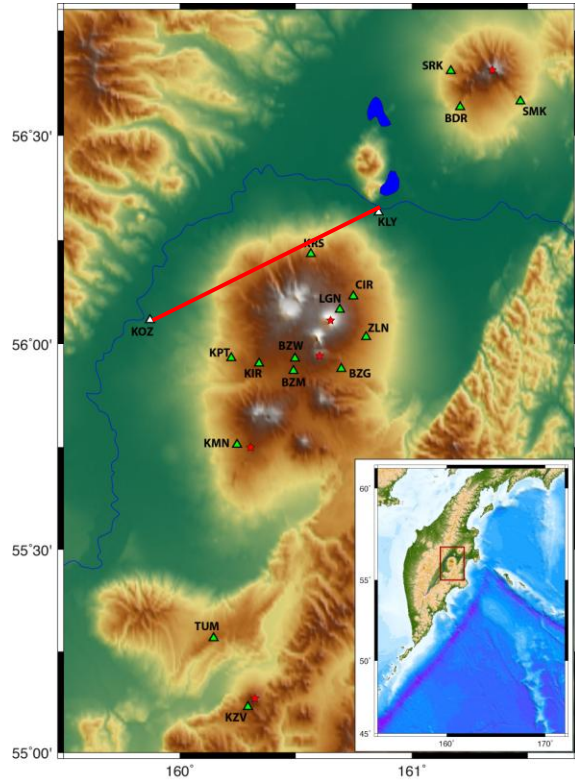
# Exploring the repetitivity of the seismic correlations:

## CIR - LGN



# Exploring the repetitivity of the seismic correlations:

## KLY - KOZ





# Ensemble of inter-station cross-correlations: Network Covariance Matrix

Cross-correlation between records  $u_i(t)$  and  $u_j(t)$  at receivers  $i$  and  $j$ :

$$CC_{ij}(t) = \int_{-\infty}^{\infty} u_i(t)u_j(t + \tau)d\tau = iFFT[U_i(\omega)U_j^*(\omega)]$$

t – time,  $\omega$  - frequency,  $U_i(\omega)$  and  $U_j(\omega)$  – Fourier transforms of  $u_i(t)$  and  $u_j(t)$

Covariance matrix:

$$CM_{ij}(\omega) = \langle U_i(\omega)U_j(\omega) \rangle$$

$\langle \rangle$  - time average

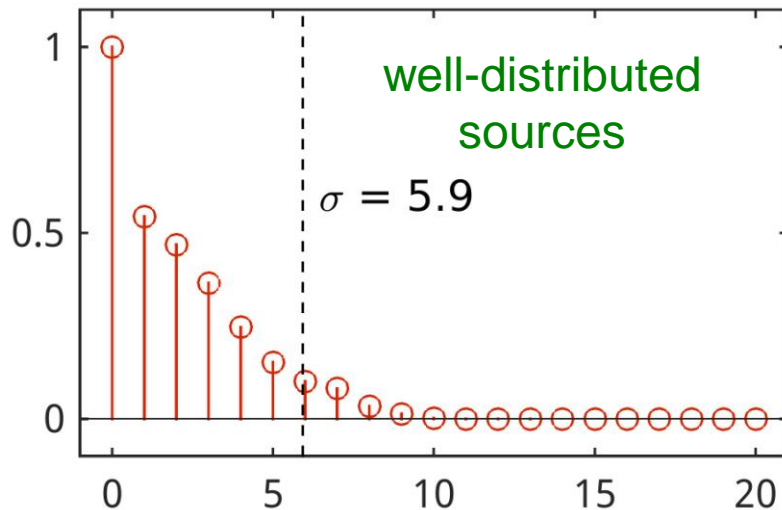
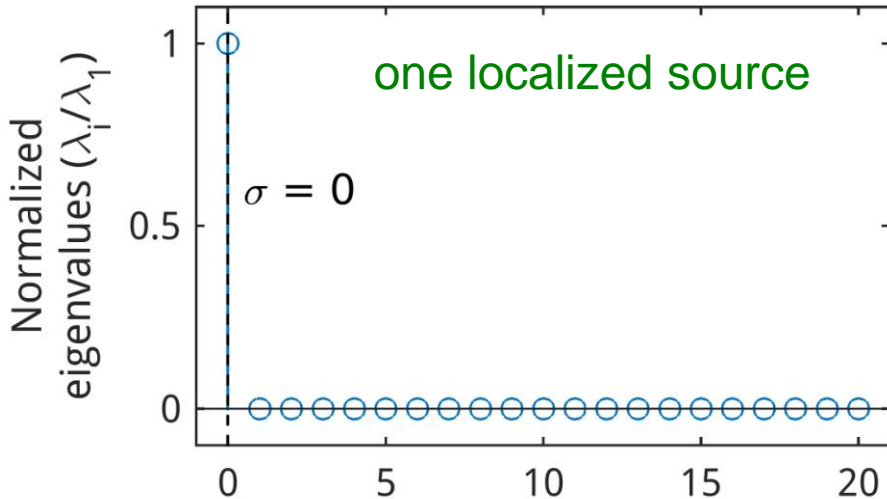
## Eigenvector-eigenvalue decomposition

$$\mathbf{C}(f) = \sum_{n=1}^N \lambda_n \mathbf{v}_n \mathbf{v}_n^\dagger$$

**Eigenvector** corresponding to the **maximum eigenvalue** describes the wavefield emitted by the **dominating seismic source**

# Network Covariance Matrix: distribution of eigenvalues depends on distribution of sources

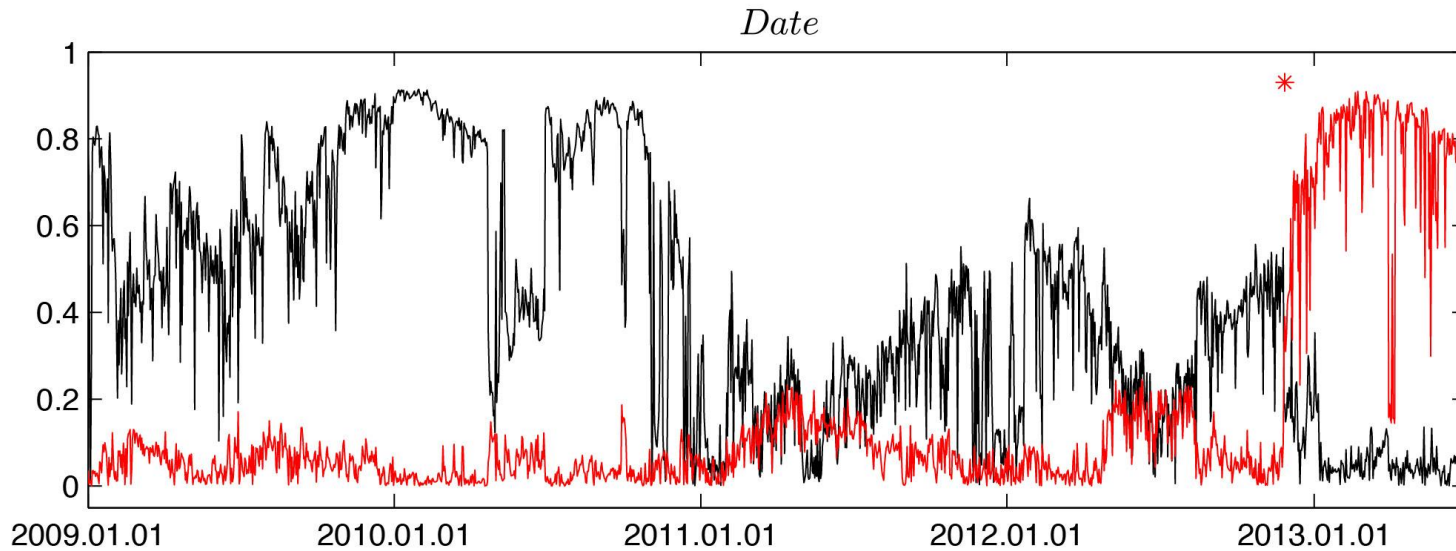
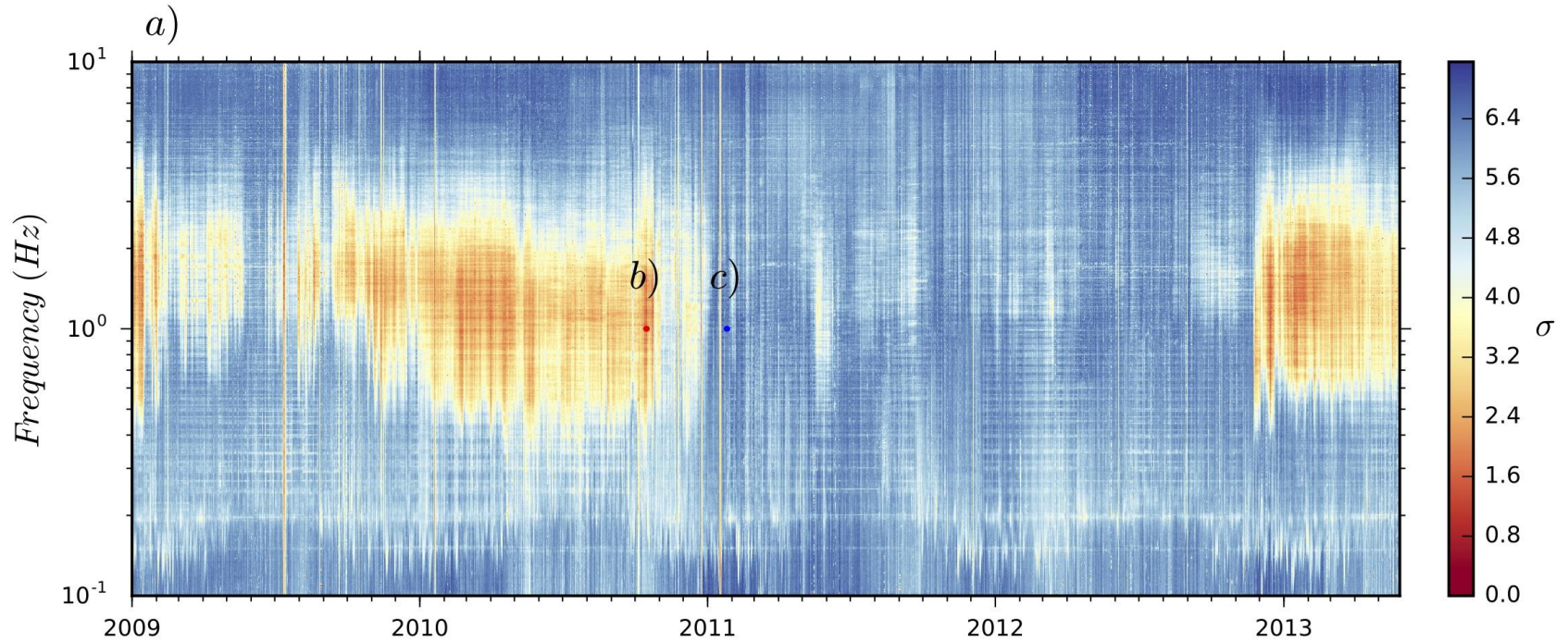
## Synthetic tests



$$\sigma(f) = \frac{\sum_{i=1}^N (i-1) \lambda_i(f)}{\sum_{i=1}^N \lambda_i(f)}$$

Covariance Matrix spectral width

# Network Covariance Matrix for the Klyuchevskoy group of volcanoes: eigenvalues

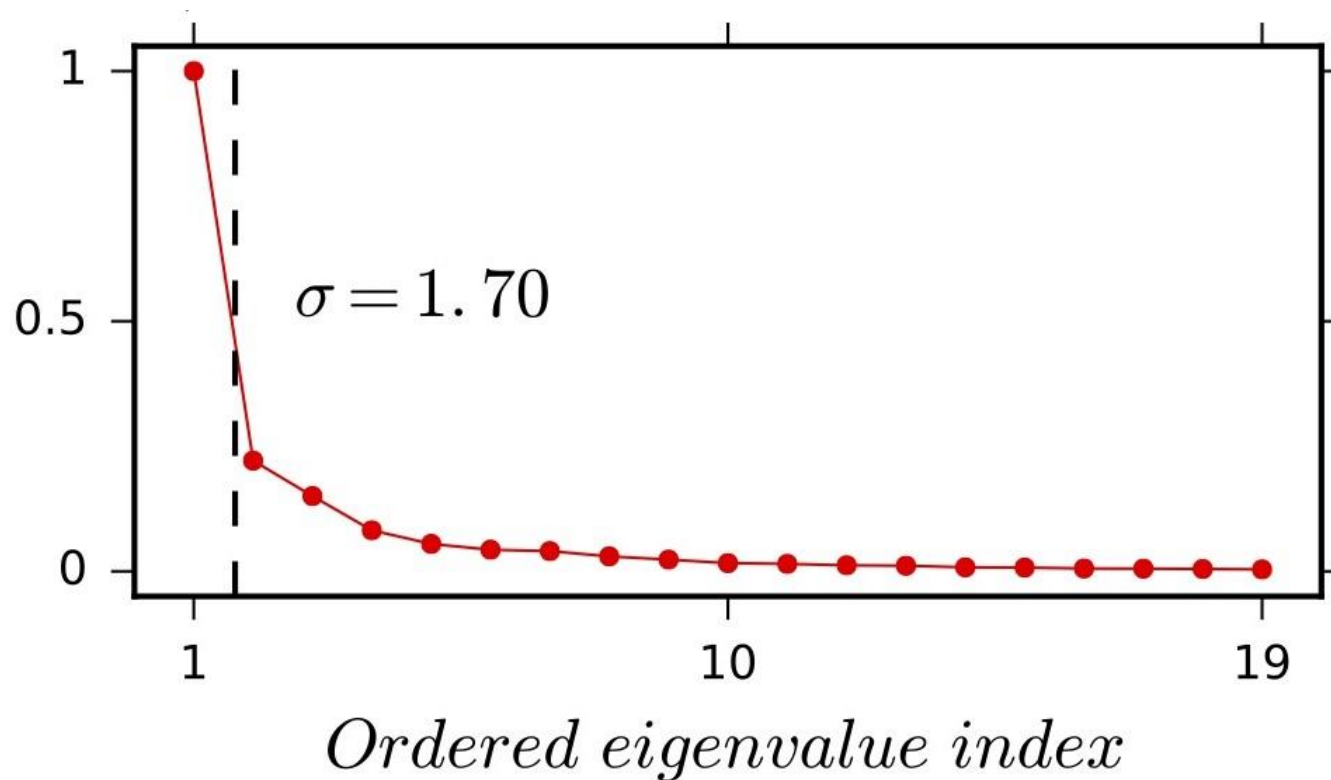


from Soubestre et al, 2017

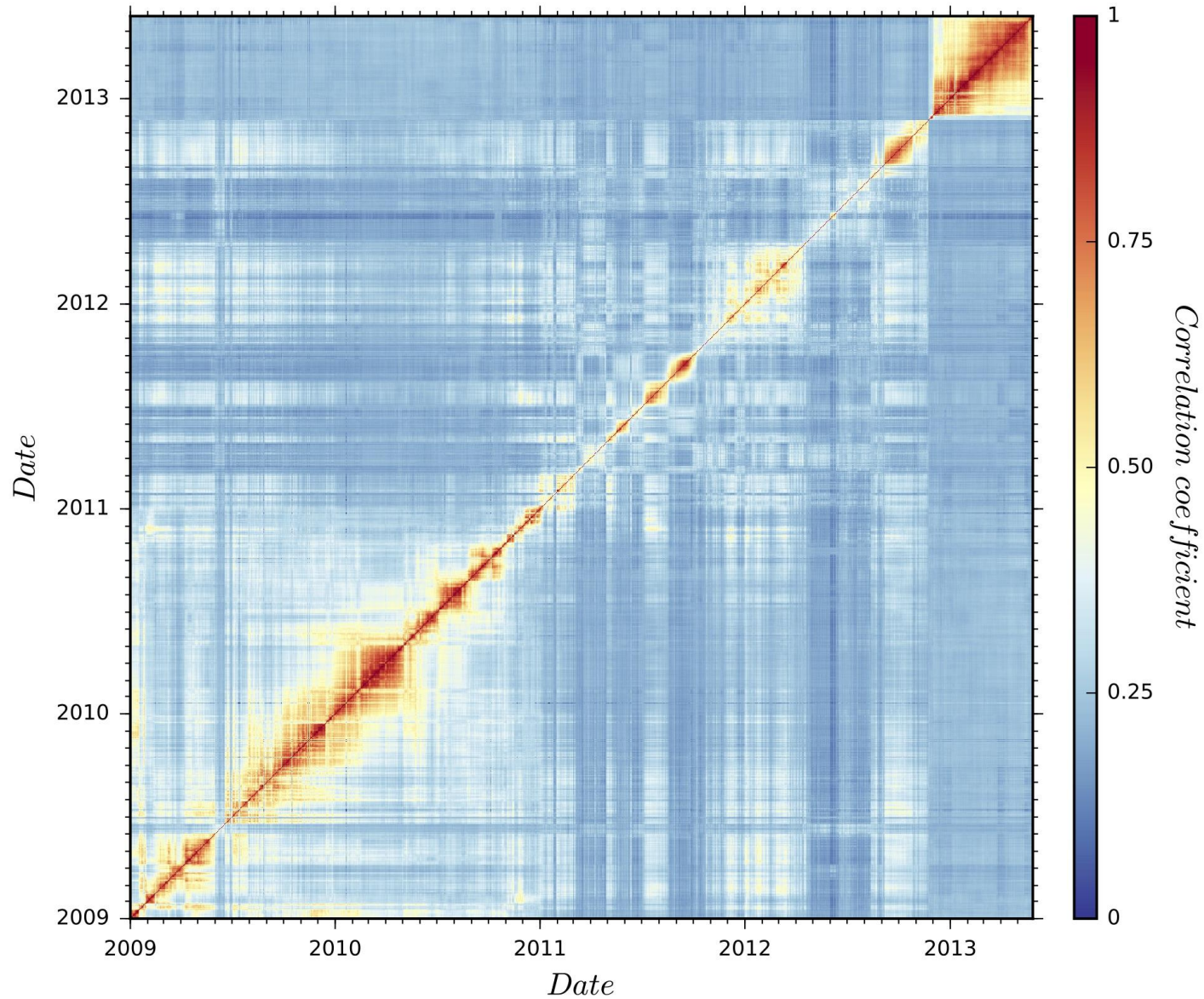


## Network Covariance Matrix: **dominant eigenvector** wavefield corresponding to **dominant source**

$$C_{i,j}(f) = |S(f)|^2 P_s(r_i, f) P_s^*(r_j, f)$$



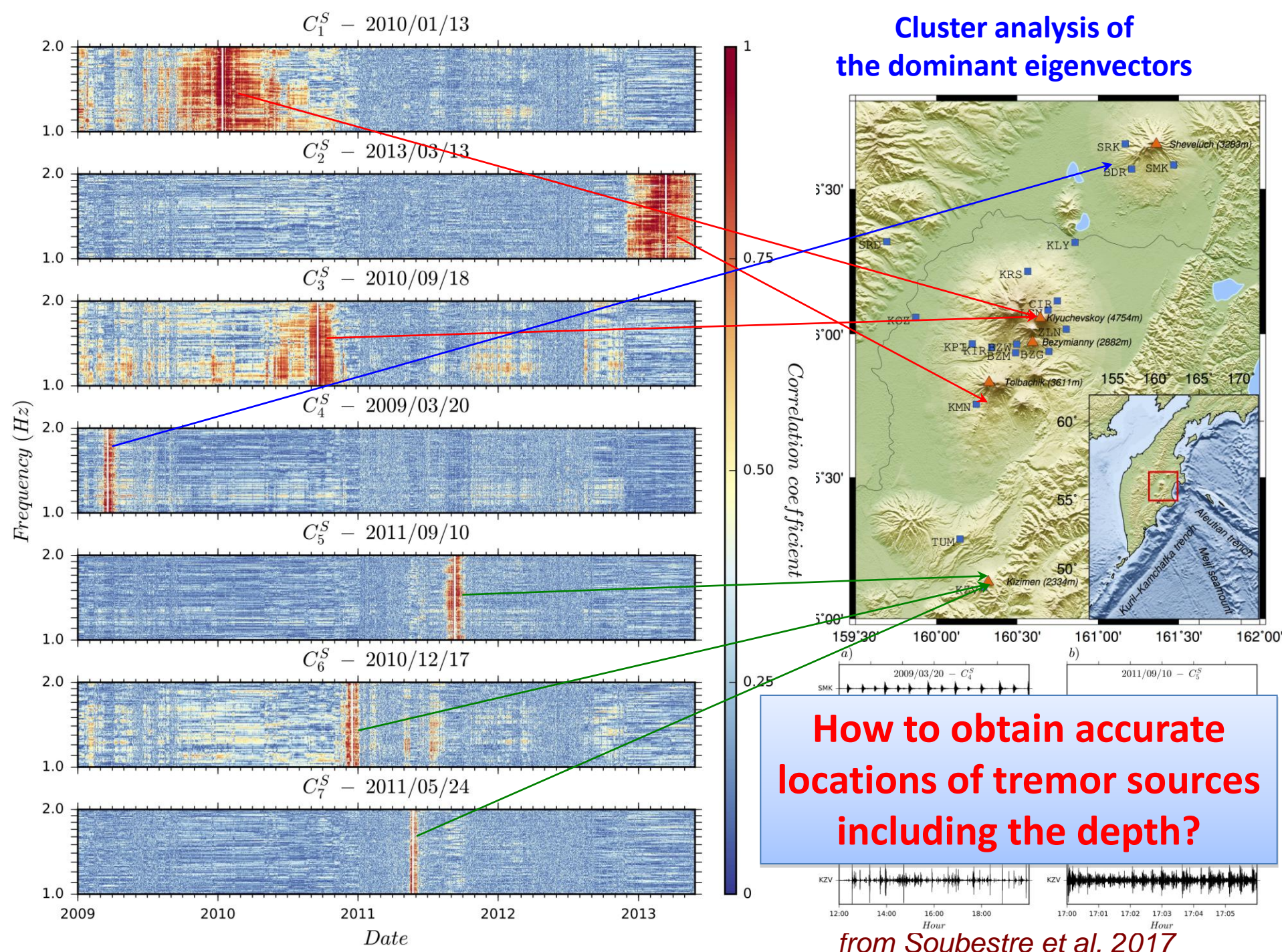
# Network Covariance Matrix for the Klyuchevskoy group of volcanoes: correlation coefficients between dominant eigenvectors



*from Soubestre et al, 2017*



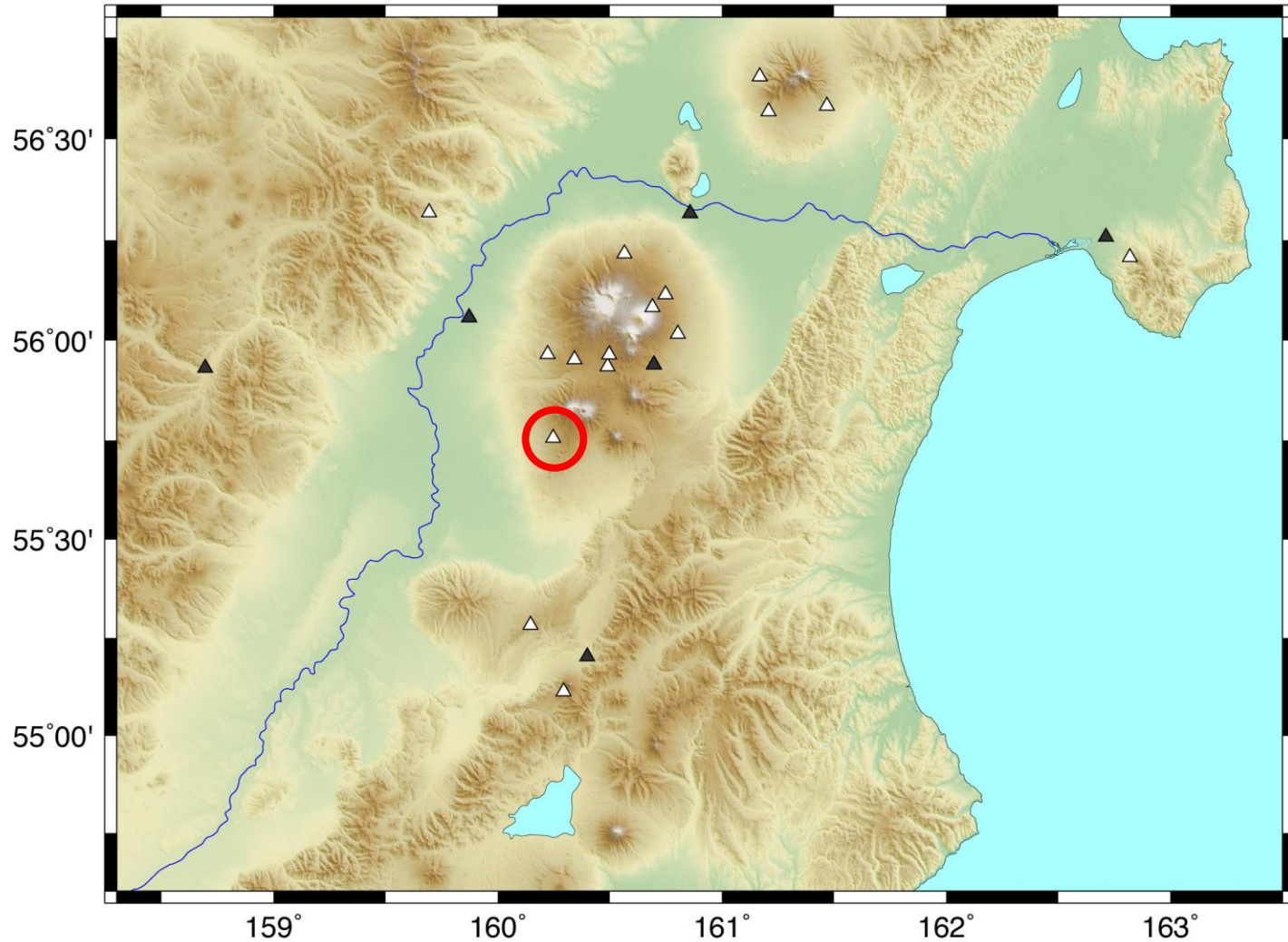
# Cluster analysis of the dominant eigenvectors



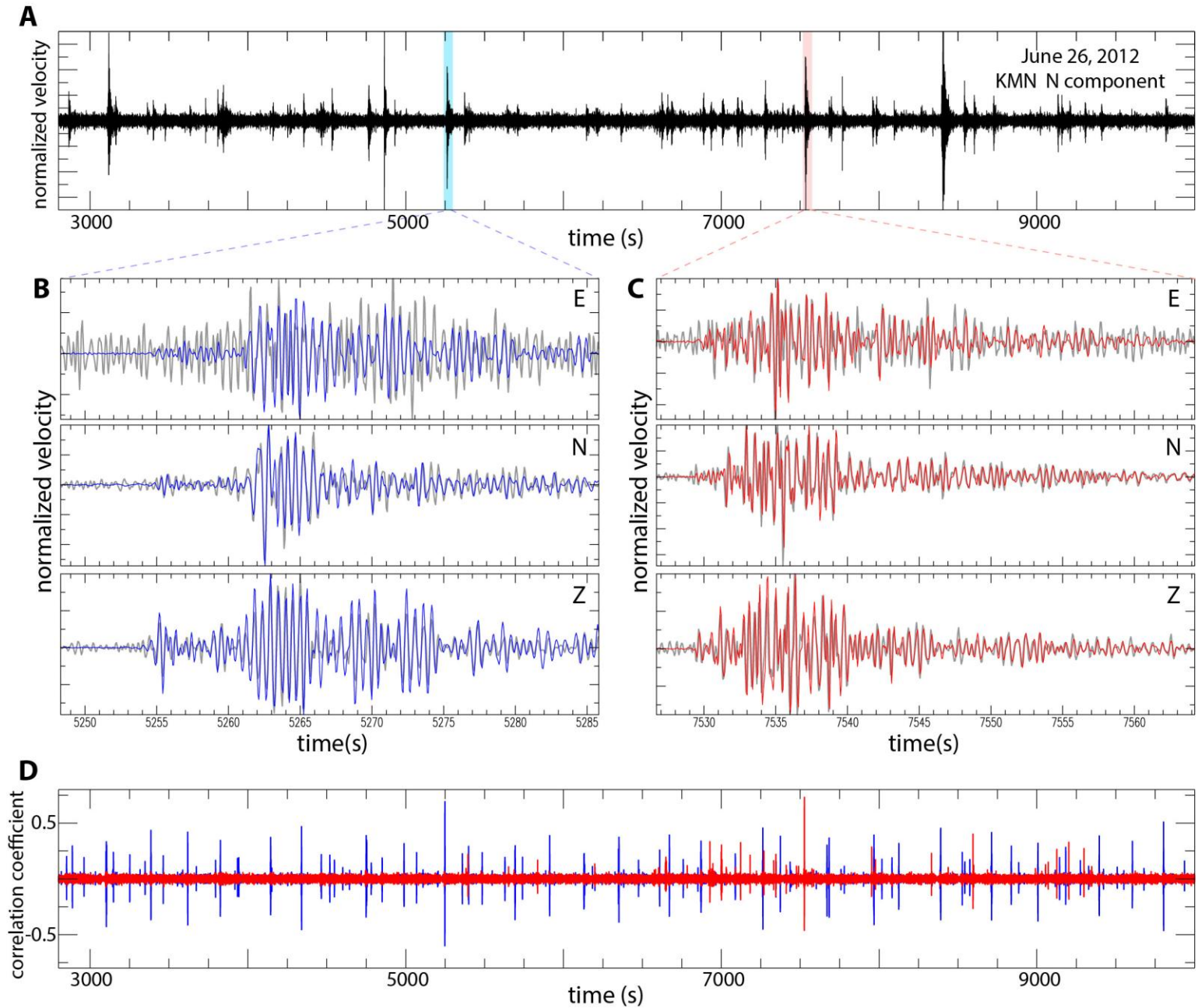


# Low-frequency (long-period LP) earthquakes within tremors

studied period: 01.01.2011 – 31.12.2012



# Example of LP earthquakes sequence



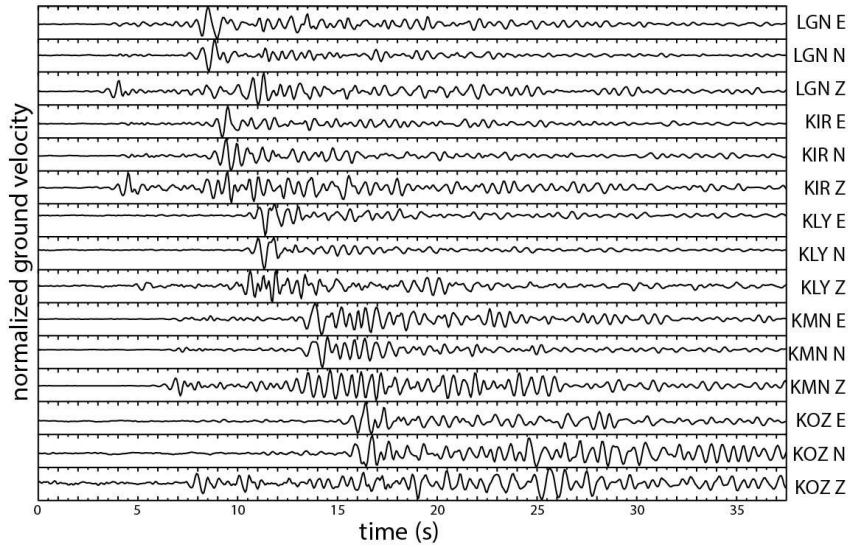
## Systematic matched-filter detection of LP events

1. Analysis of **continuous** records at individual stations
2. Detecting impulsive events as **templates** for **matched-filter** search
3. Detecting all **multiplets** of these templates
4. Stacking waveforms at all stations based on detection times of one-station templates
5. Use **stacked** waveforms to locate template sources

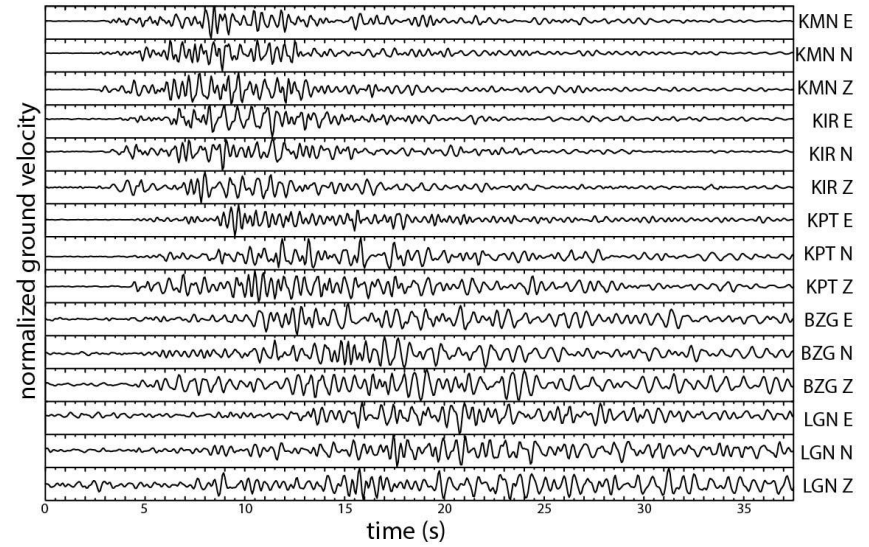


# Example of LP template stacks

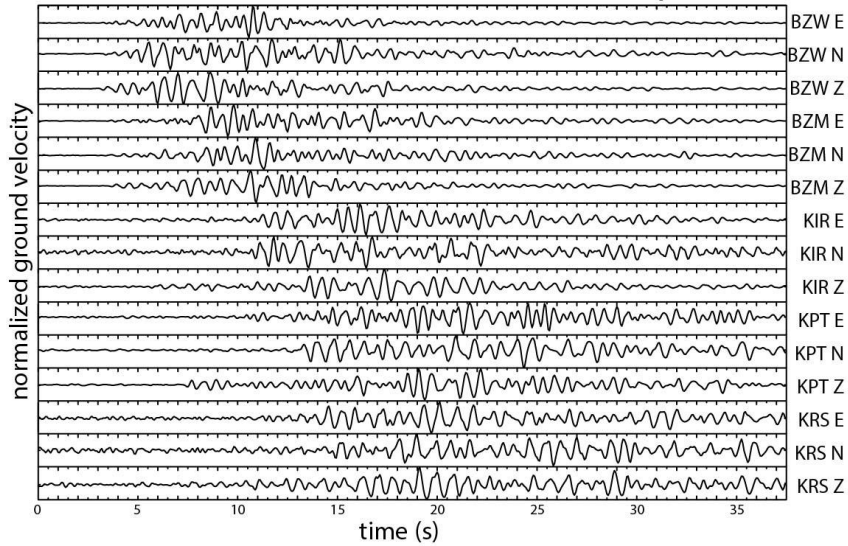
## template 1



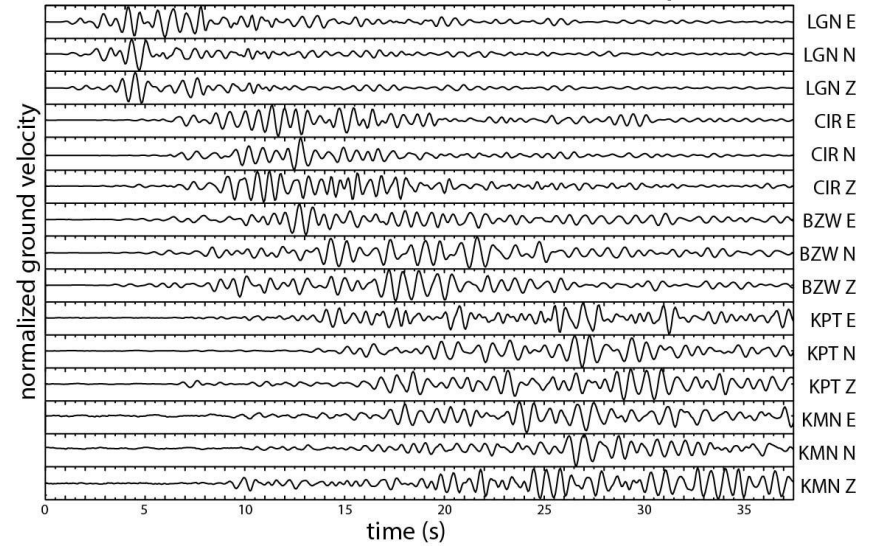
## template 6



## template 10

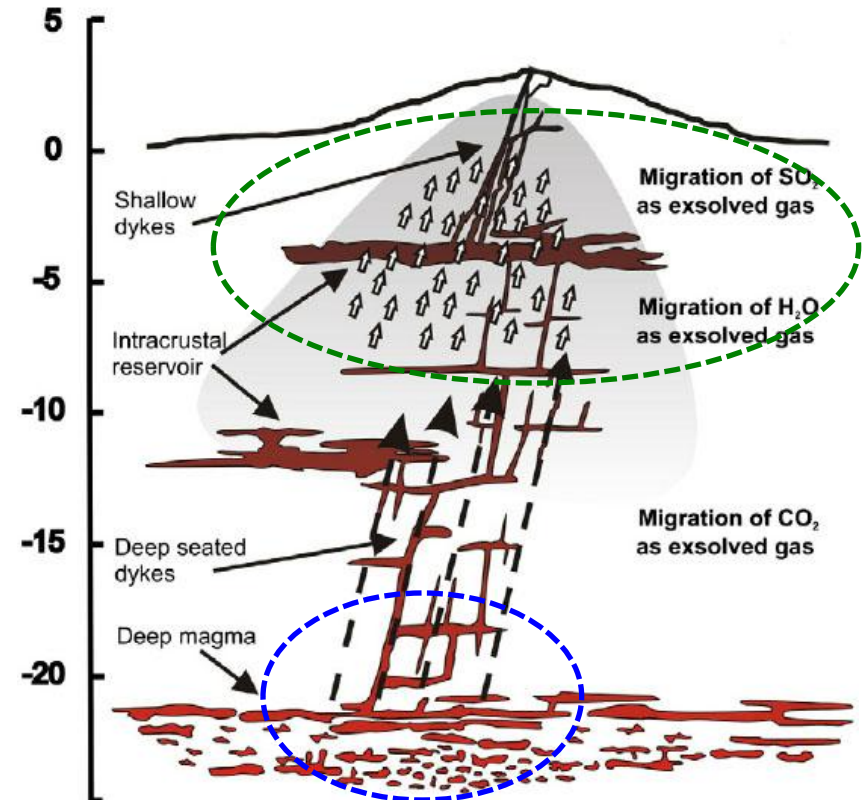
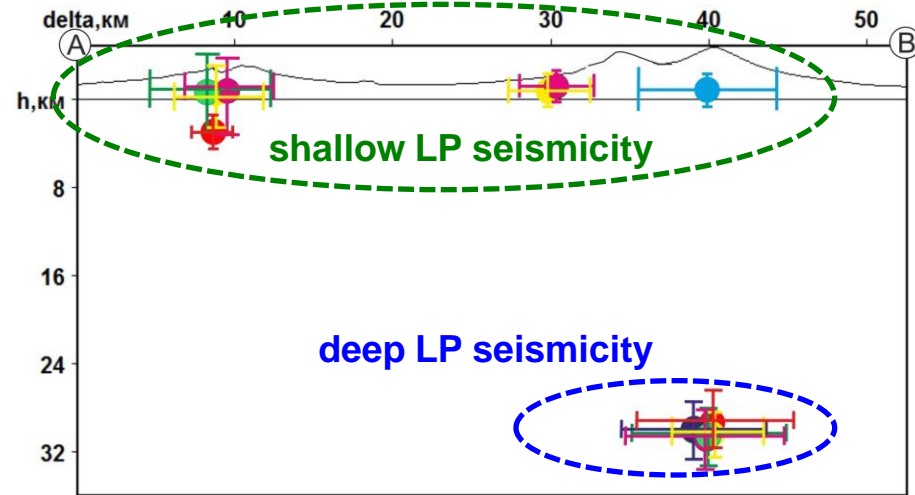
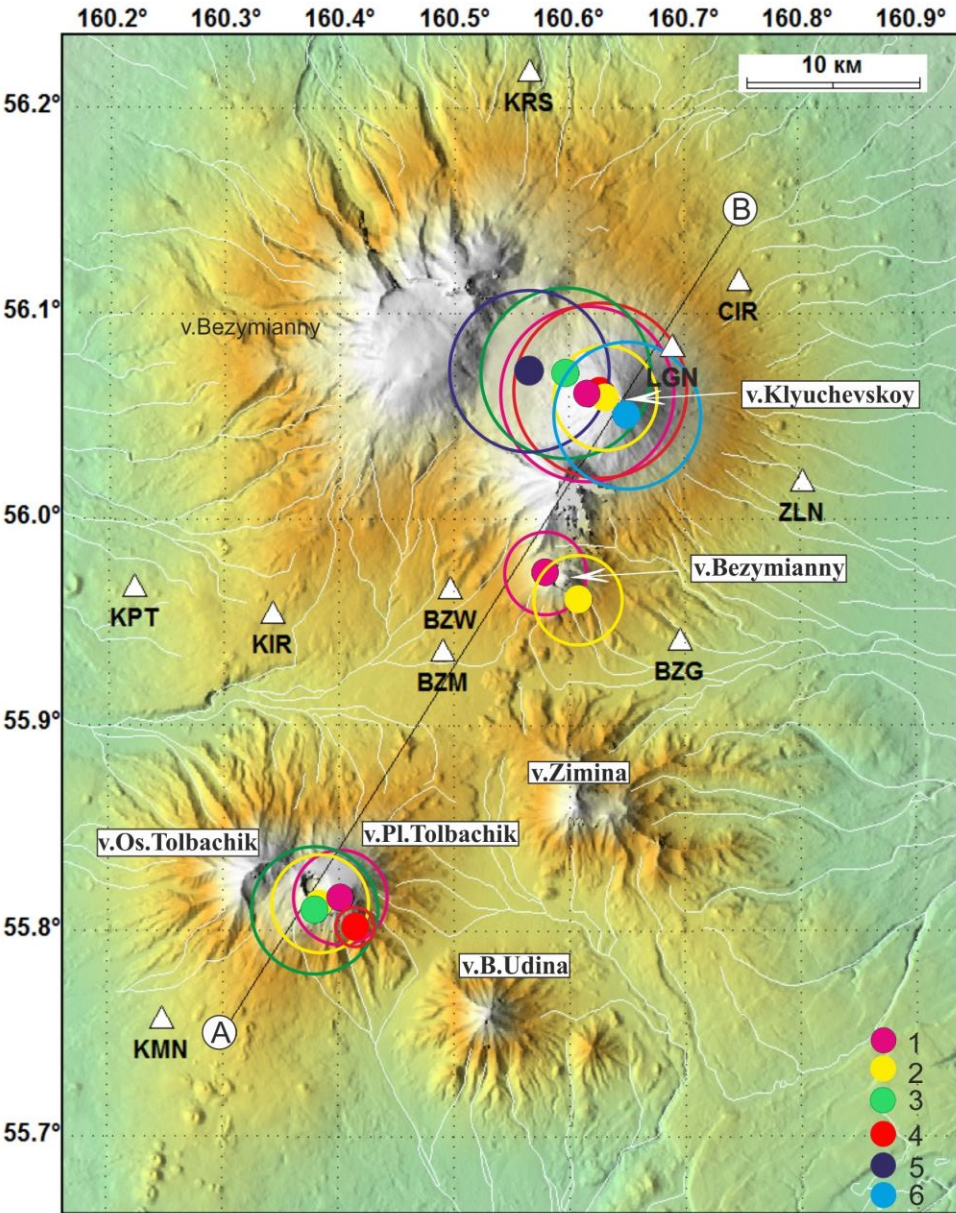


## template 12





# Epicenters of "stacked" templates



# Volcanic LP tremors and earthquakes

1. Dominating frequencies 0.5-5 Hz

2. Sequences of highly repetitive events

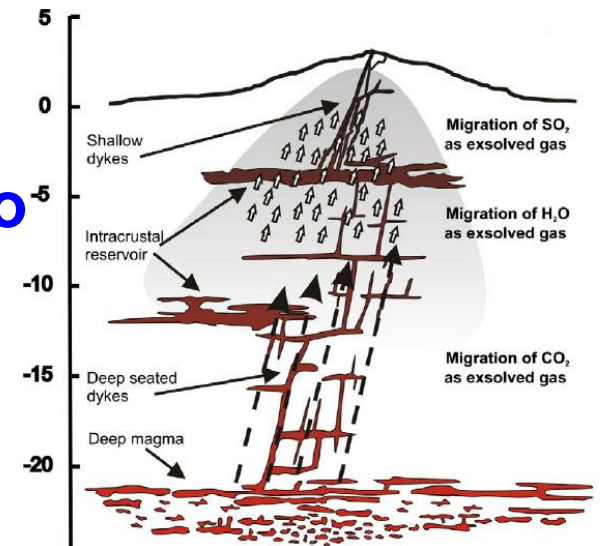
## Long-period volcano seismicity: its source and use in eruption forecasting

**Bernard A. Chouet**

At an active volcano, long-period seismicity (with typical periods in the range 0.2–2 s) reflects pressure fluctuations resulting from unsteady mass transport in the sub-surface plumbing system, and hence provides a glimpse of the internal dynamics of the volcanic edifice.

Widely accepted interpretation:

Seismo-volcanic LP activity is related to unsteady transport of the fluids (magmatic and/or hydrothermal) within the conduit system





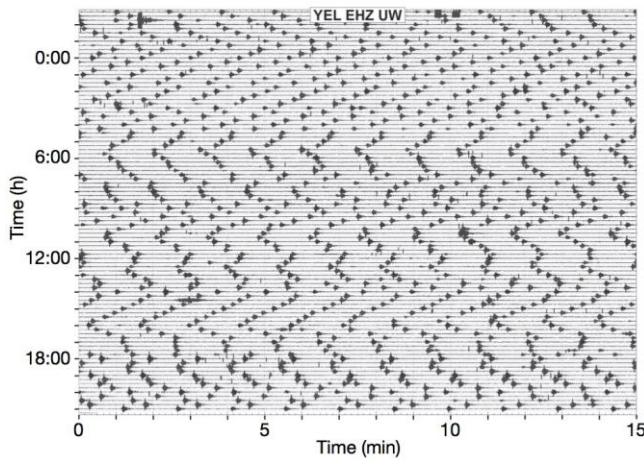
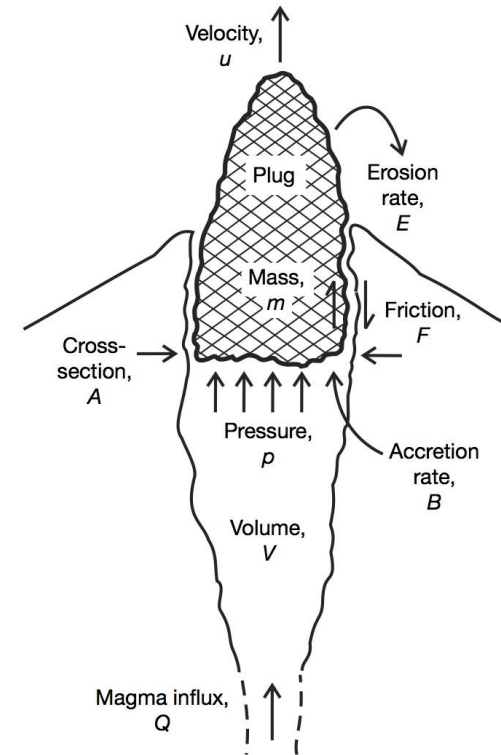
# Volcanic LP earthquakes: alternative interpretations

## Stick-slip motion along the margins of the magma plug

### Dynamics of seismogenic volcanic extrusion at Mount St Helens in 2004–05

Richard M. Iverson<sup>1</sup>, Daniel Dzurisin<sup>1</sup>, Cynthia A. Gardner<sup>1</sup>, Terrence M. Gerlach<sup>1</sup>, Richard G. LaHusen<sup>1</sup>, Michael Lisowski<sup>1</sup>, Jon J. Major<sup>1</sup>, Stephen D. Malone<sup>2</sup>, James A. Messerich<sup>3</sup>, Seth C. Moran<sup>1</sup>, John S. Pallister<sup>1</sup>, Anthony I. Qamar<sup>2,†</sup>, Steven P. Schilling<sup>1</sup> & James W. Vallance<sup>1</sup>

The 2004–05 eruption of Mount St Helens exhibited sustained, near-equilibrium behaviour characterized by relatively steady extrusion of a solid dacite plug and nearly periodic shallow earthquakes. Here we present a diverse data set to support our hypothesis that **these earthquakes resulted from stick-slip motion along the margins of the plug** as it was forced incrementally upwards by ascending, solidifying, gas-poor magma. We formalize this hypothesis with a dynamical model that reveals a strong analogy between behaviour of the magma–plug system and that of a variably damped oscillator. Modelled stick-slip oscillations have properties that help constrain the balance of forces governing the earthquakes and eruption, and they imply that magma pressure never deviated much from the steady equilibrium pressure. We infer that the volcano was probably poised in a near-eruptive equilibrium state long before the onset of the 2004–05 eruption.



# Long-period seismicity in the shallow volcanic edifice formed from slow-rupture earthquakes

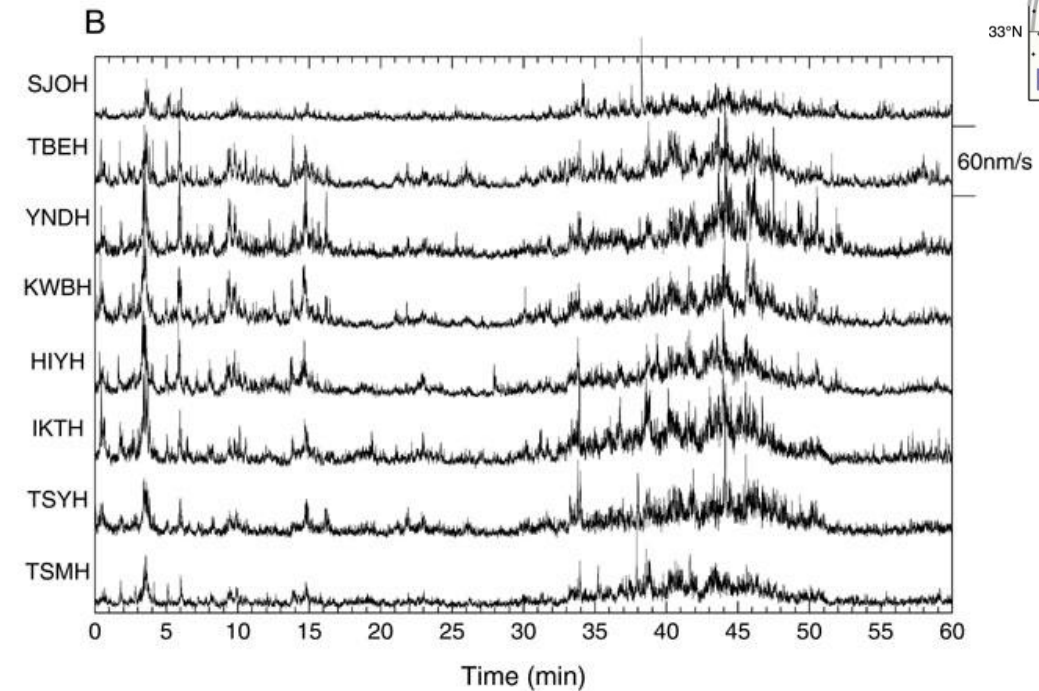
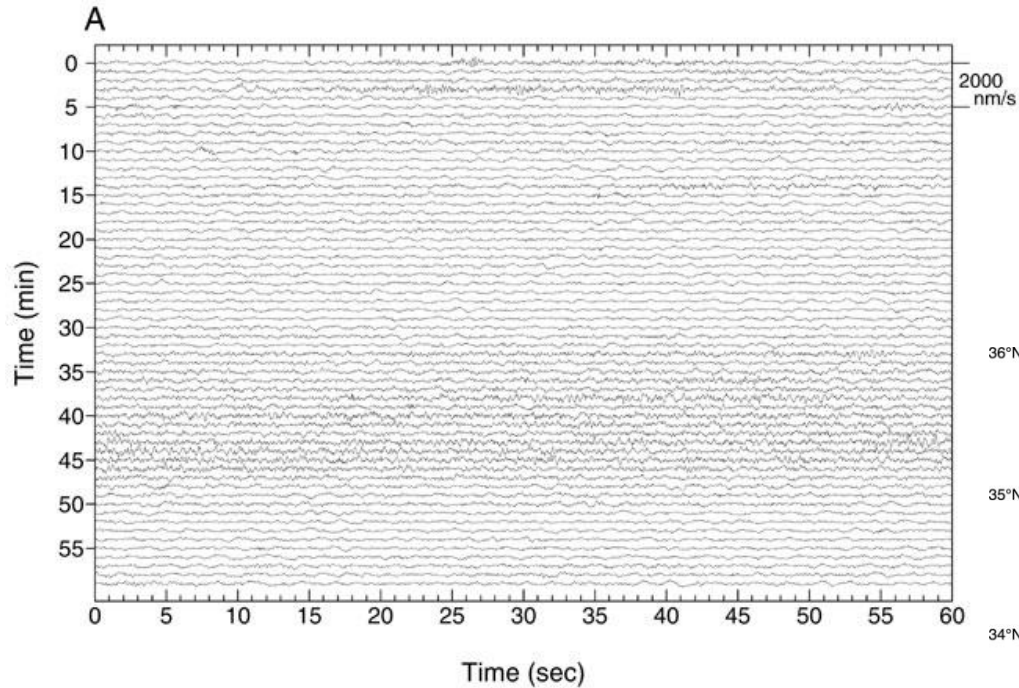
Christopher J. Bean<sup>1\*</sup>, Louis De Barros<sup>1†</sup>, Ivan Lokmer<sup>1</sup>, Jean-Philippe Métaxian<sup>2</sup>, Gareth O' Brien<sup>3</sup> and Shane Murphy<sup>4</sup>

Forecasting of volcanic eruptions is still inadequate, despite technological advances in volcano monitoring. Improved forecasting requires a deeper understanding of when unrest will lead to an actual eruption. Shallow, long-period seismic events often precede volcanic eruptions and are used in forecasting. They are thought to be generated by resonance in fluid-filled cracks or conduits, indicating the presence of near-surface magmatic fluids. Here we analyse very-high-resolution seismic data from three active volcanoes—Mount Etna in Italy, Turrialba Volcano in Costa Rica and Ubinas Volcano in Peru—measured between 2004 and 2009. We find that seismic resonance is dependent on the wave propagation path and that the sources for the long-period seismic waves are composed of short pulses. We use a numerical model to show that slow-rupture failure in unconsolidated volcanic materials can reproduce all key aspects of these observations. Therefore, contrary to current interpretations, we suggest that short-duration long-period events are not direct indicators of fluid presence and migration, but rather are markers of deformation in the upper volcanic edifice. We suggest that long-period volcano seismicity forms part of the spectrum between slow-slip earthquakes and fast dynamic rupture, as has been observed in non-volcanic environments.

# Outline

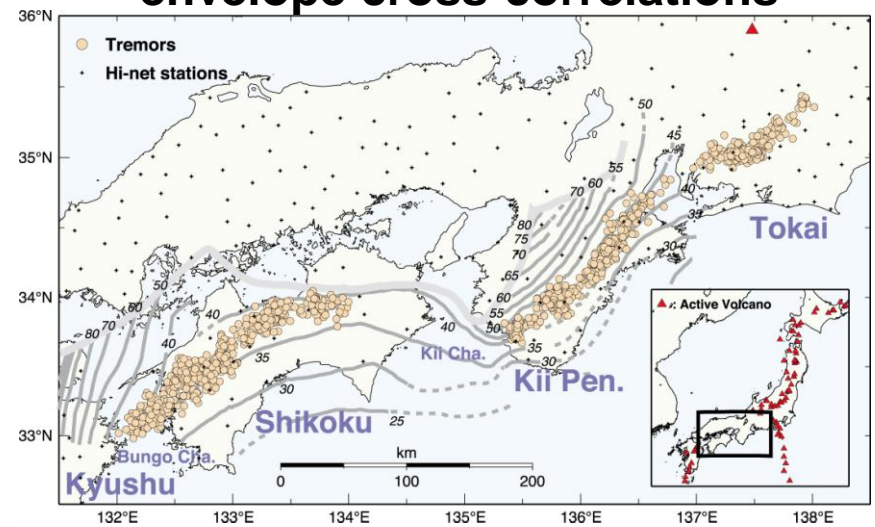
- Main types of observed Earth's seismic signals
- Volcanic tremors
- **Tectonic tremors**
- Challenges with the interpretation





## Tectonic Tremors

Source locations based on envelope cross-correlations

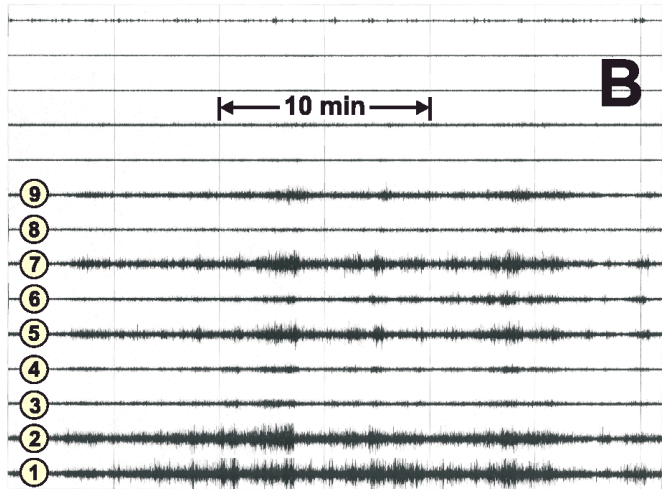
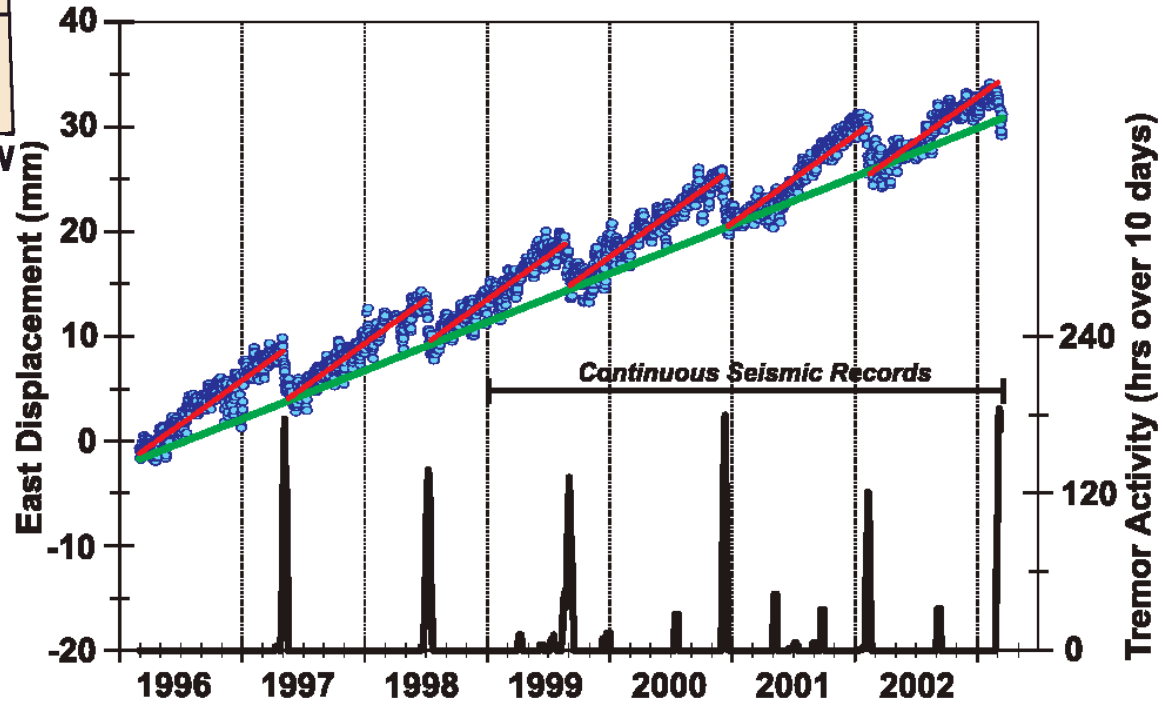
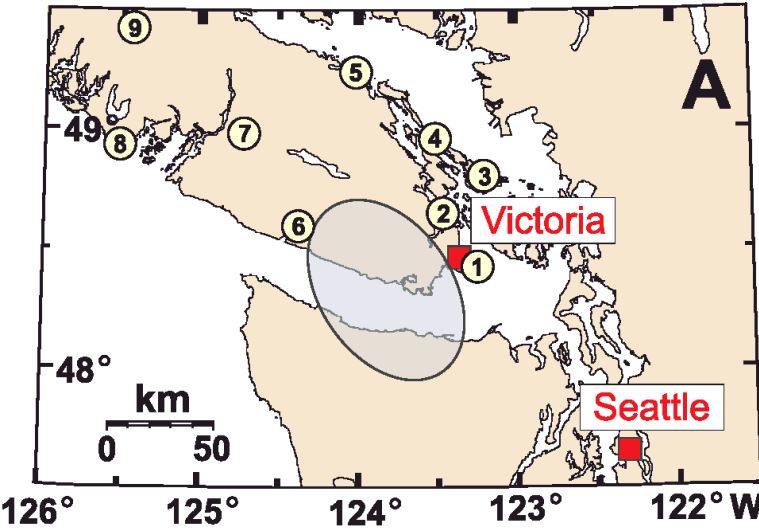


Obara, 2002

Seismic manifestation of slow processes in fault zones during inter-seismic periods

# Tectonic Tremors

Rogers and Dragert, 2003

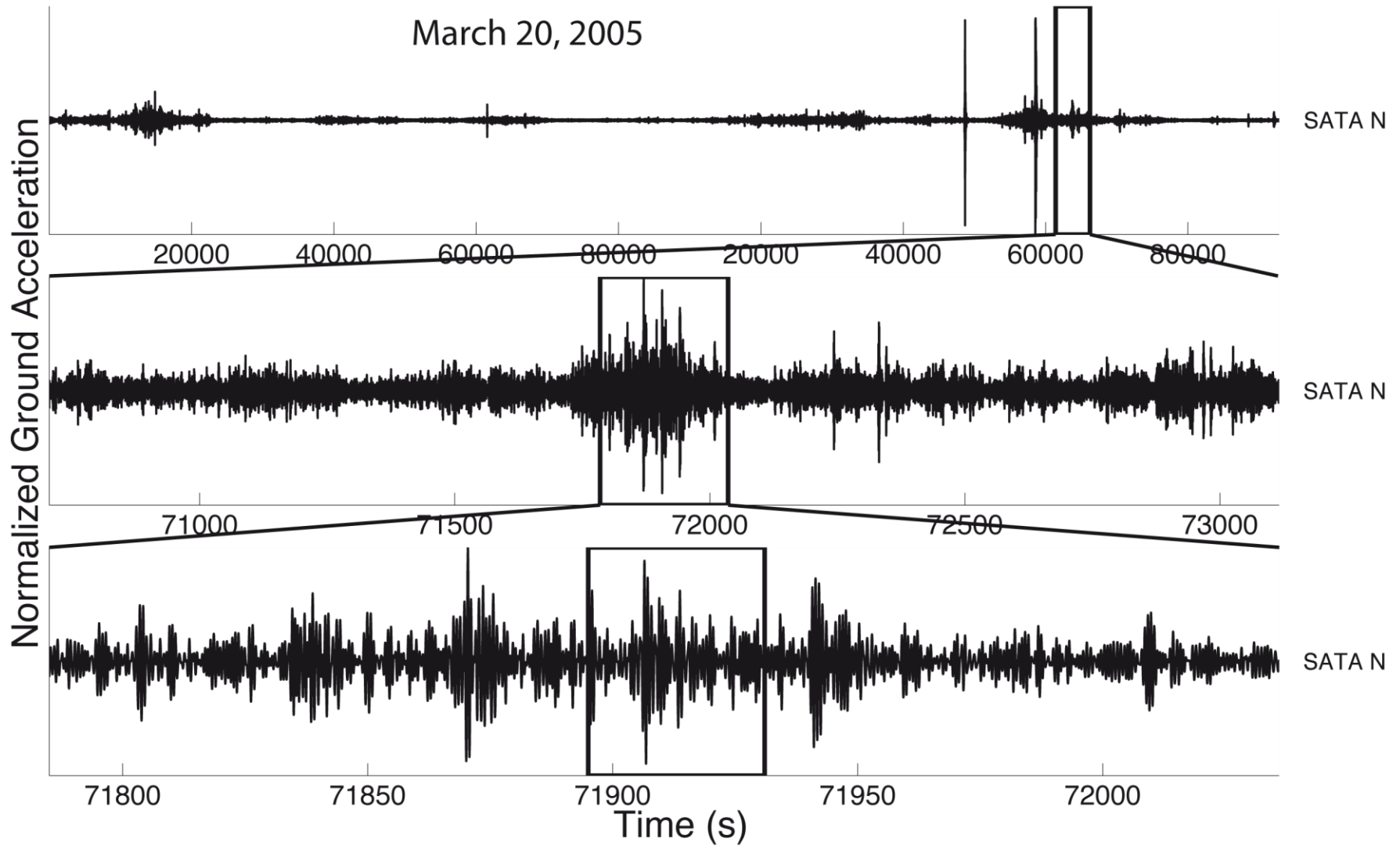


**Tremors are strongly correlated with Slow Slip**

# Low-Frequency Earthquakes (LFE) within tremors

Frank et al.,

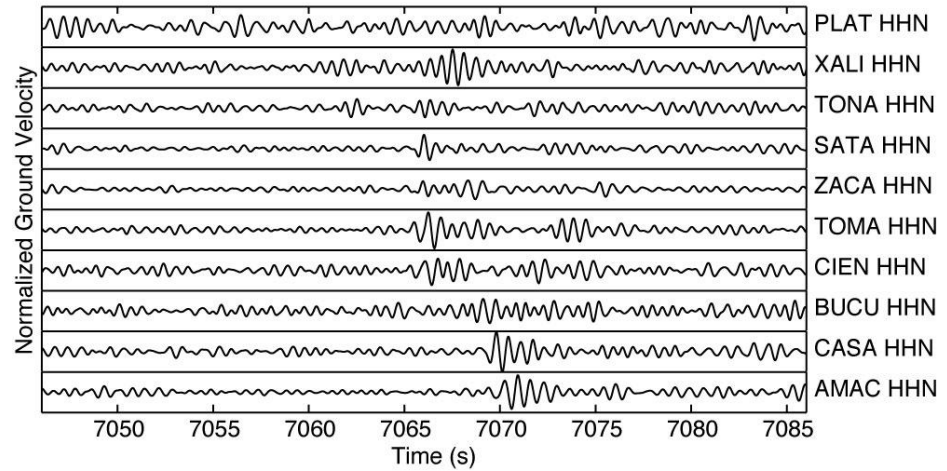
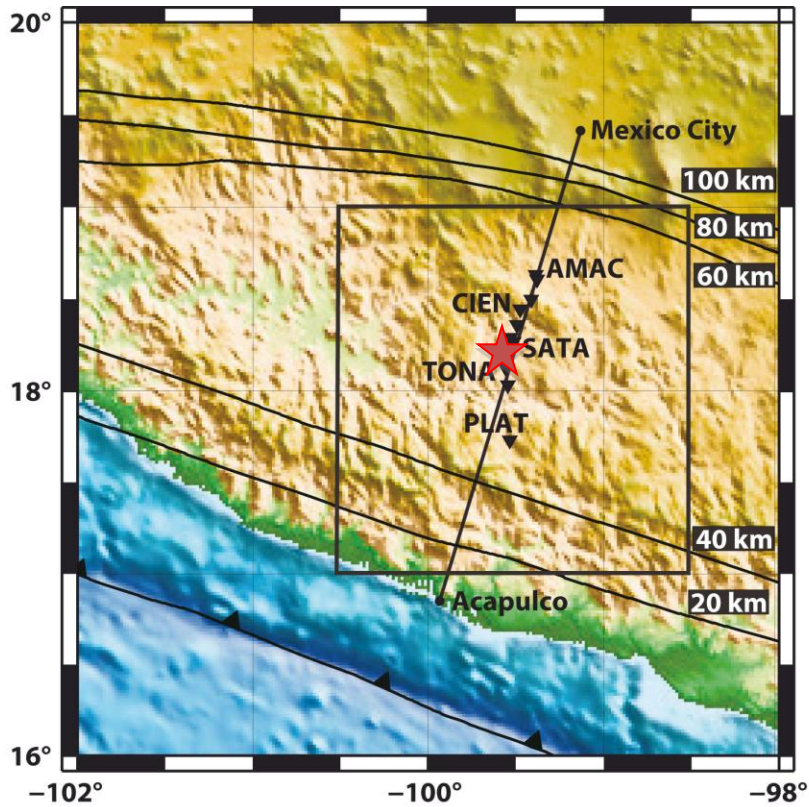
March 20, 2005





# Studying the Low-Frequency Earthquakes (LFE) in Mexico

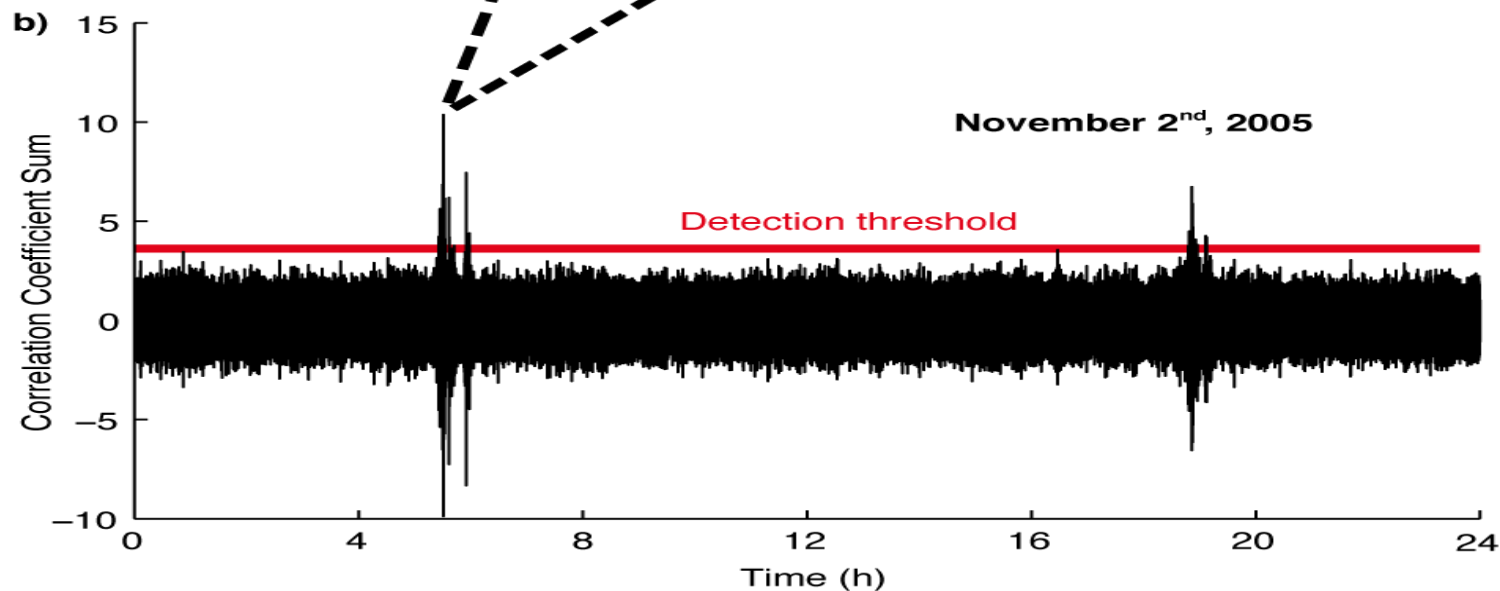
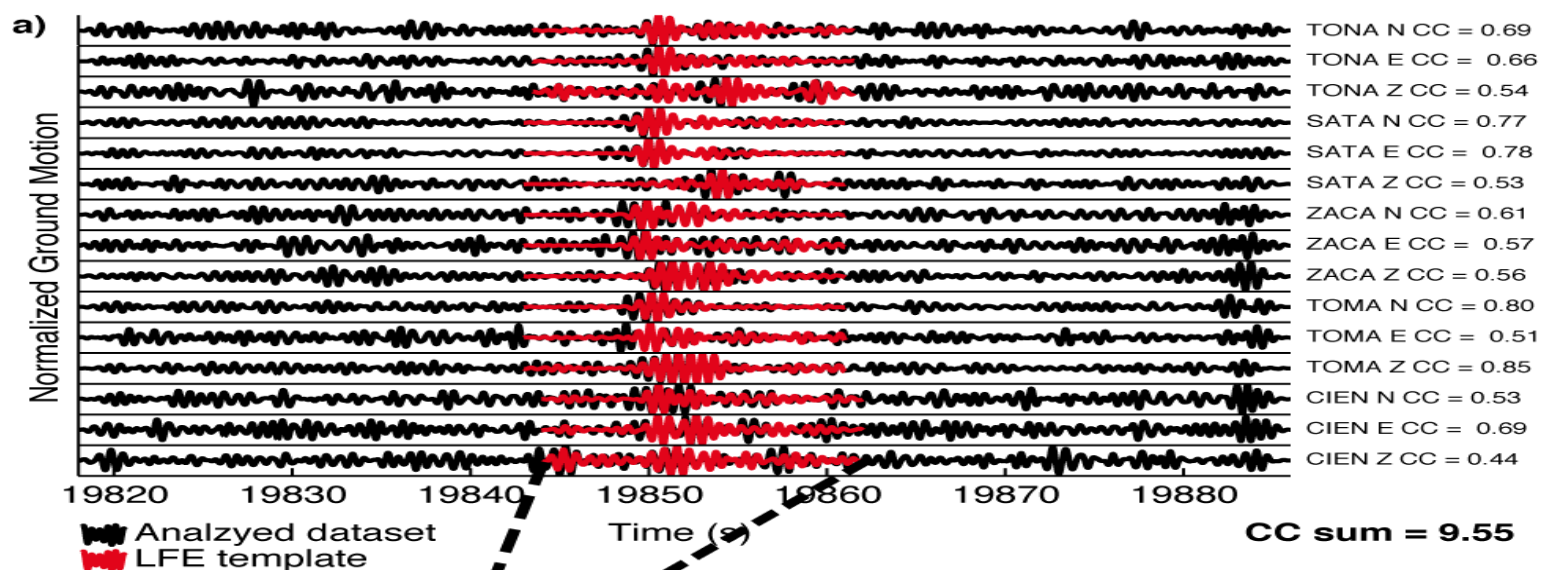
Frank et al.



# Studying the Low-Frequency Earthquakes (LFE) in Mexico

Frank et al.

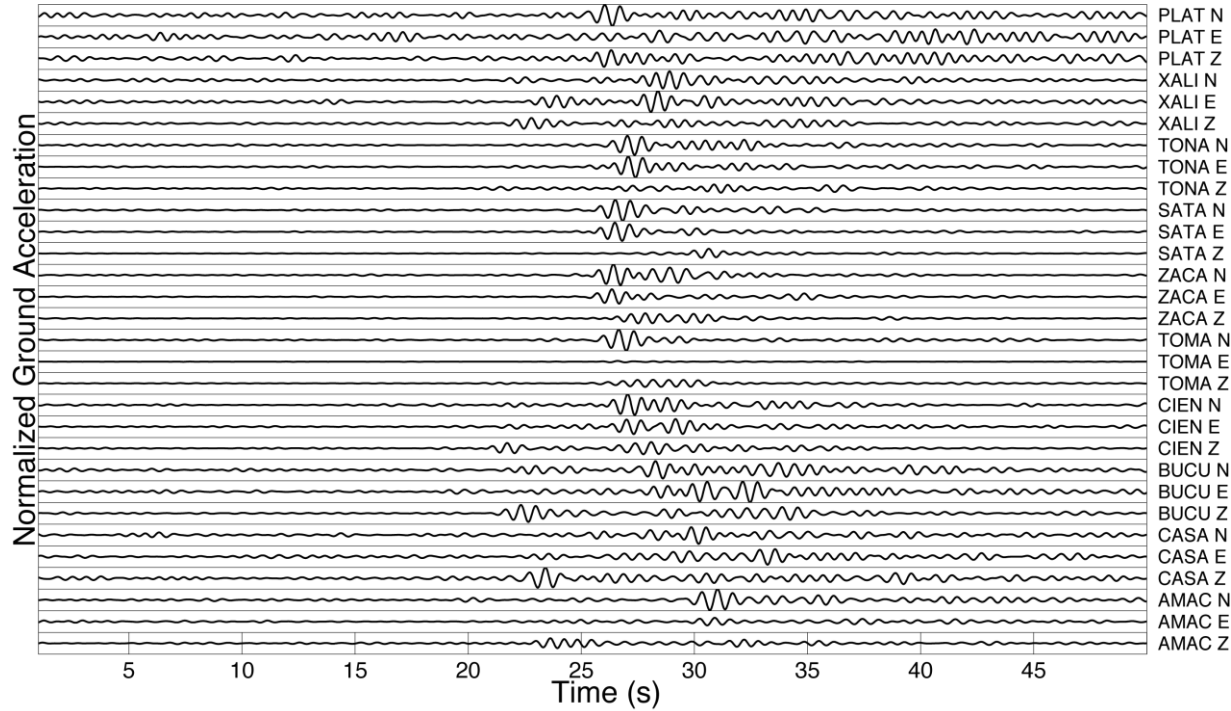
## Detecting template multiplets: Multi-station multi-component correlation



# Studying the Low-Frequency Earthquakes (LFE) in Mexico

Frank et al.

• Stacking all detections

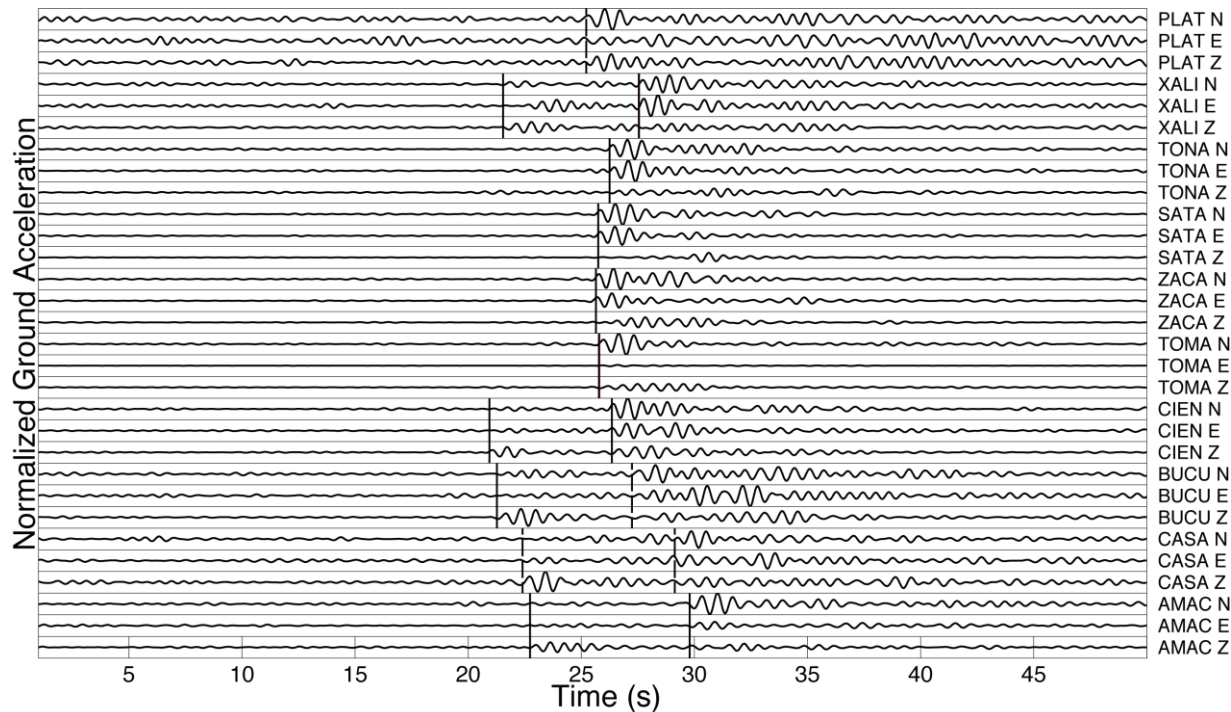




# Studying the Low-Frequency Earthquakes (LFE) in Mexico

Frank et al.

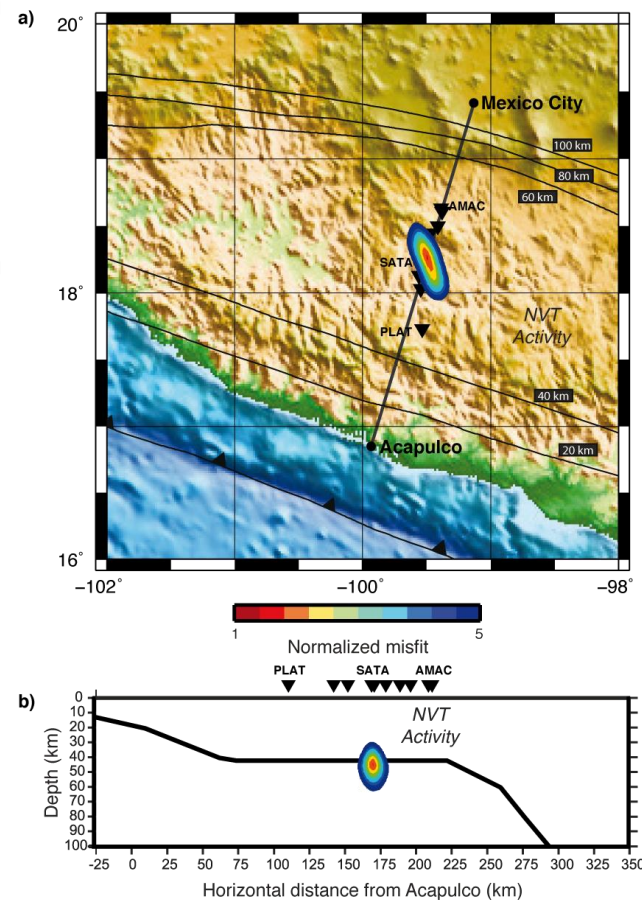
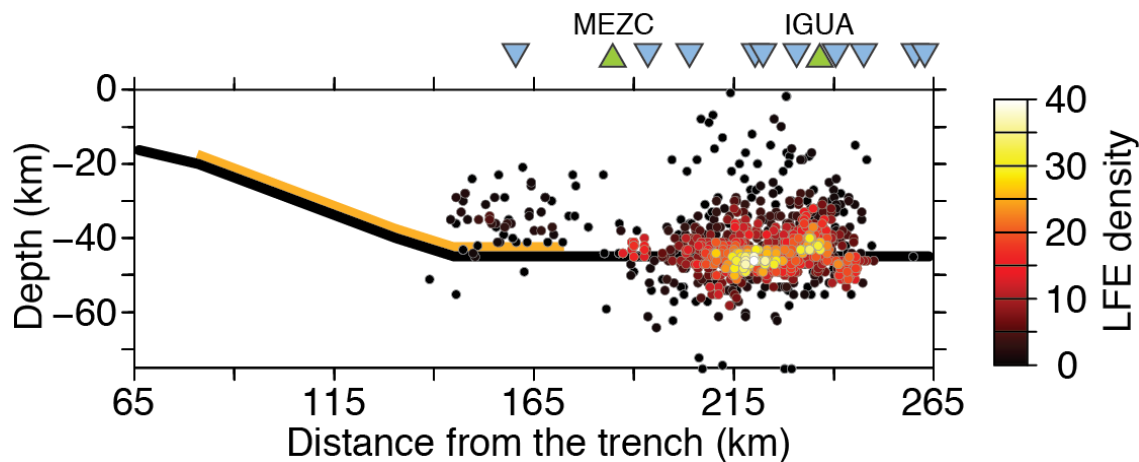
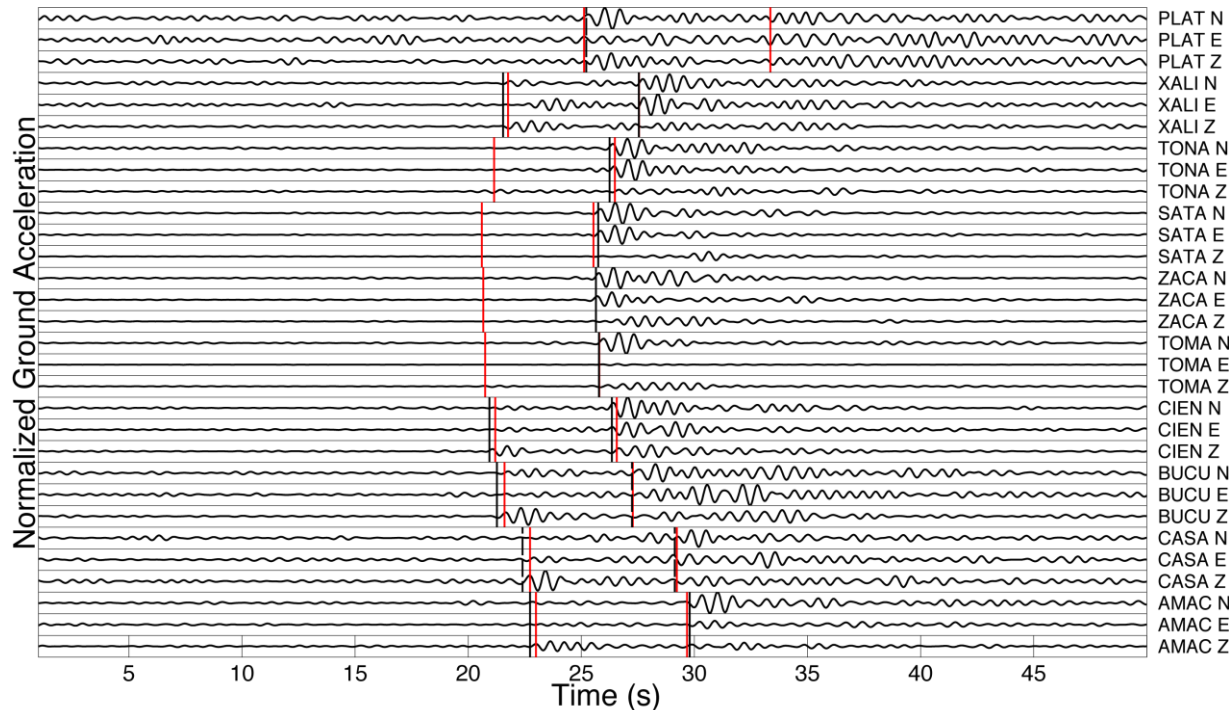
- Stacking all detections
- Picking travel times



# Studying the Low-Frequency Earthquakes (LFE) in Mexico

Frank et al.

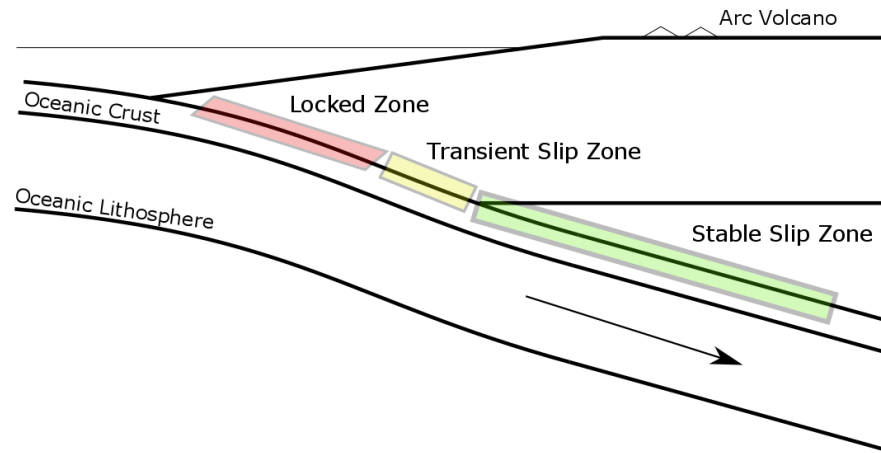
- Stacking all detections
- Picking travel times
- Locating the source



# Tectonic LF tremors and earthquakes

1. Dominating frequencies 0.5-5 Hz

2. Sequences of highly repetitive events



Widely accepted interpretation:

Seismic radiation produced by small seismogenic asperities in deep “**slow slipping**” parts of the faults



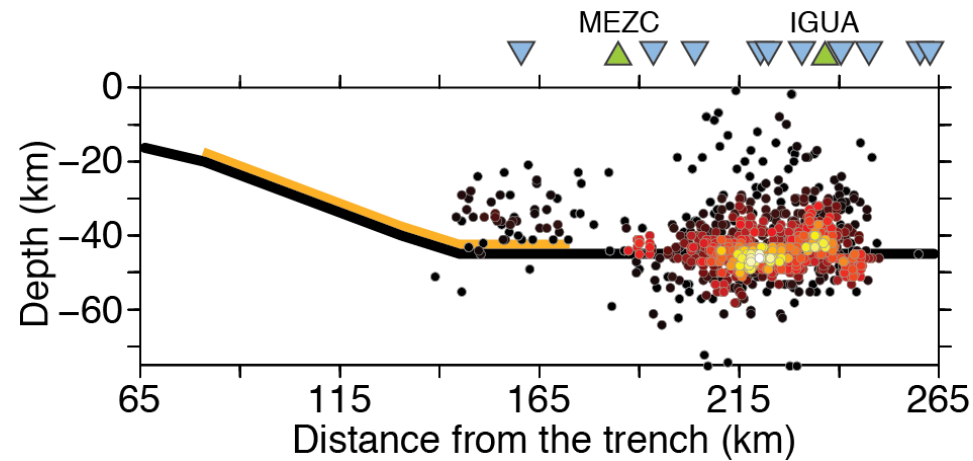
# Outline

- Main types of observed Earth's seismic signals
- Volcanic tremors
- Tectonic tremors
- Challenges with the interpretation

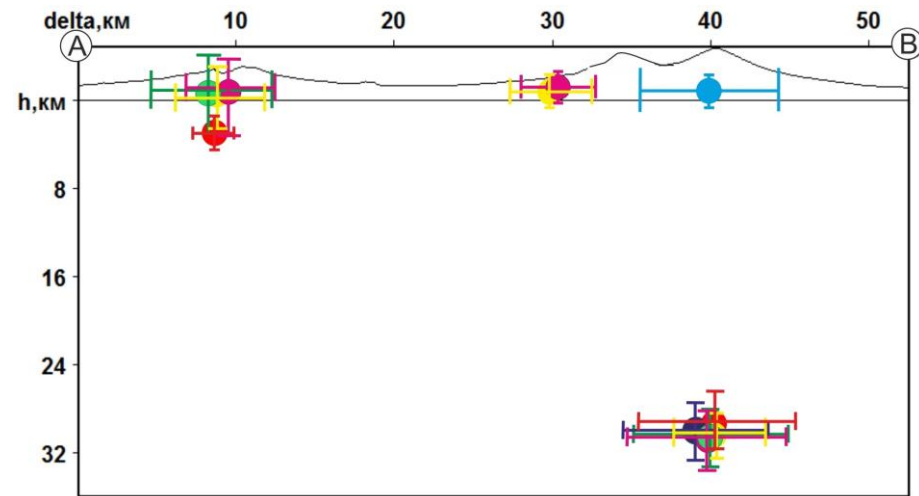
# Source regions and possible mechanisms of tectonic and volcanic tremors

- **Difference** -> depth and confining pressure (except VDLP)

Tectonic tremors



Volcanic tremors



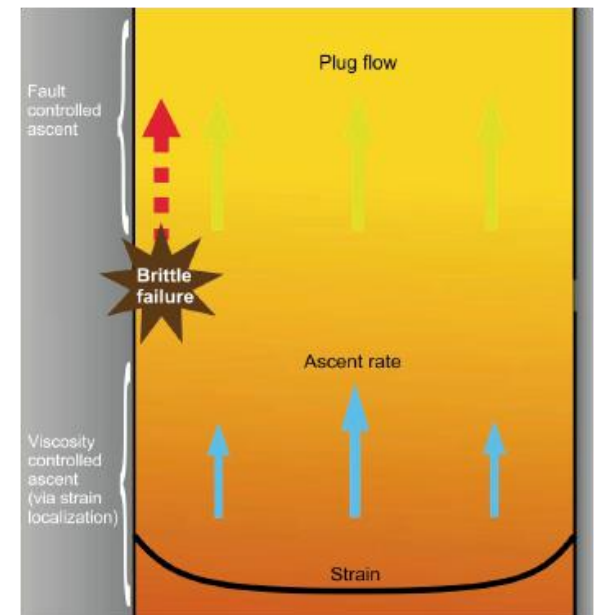
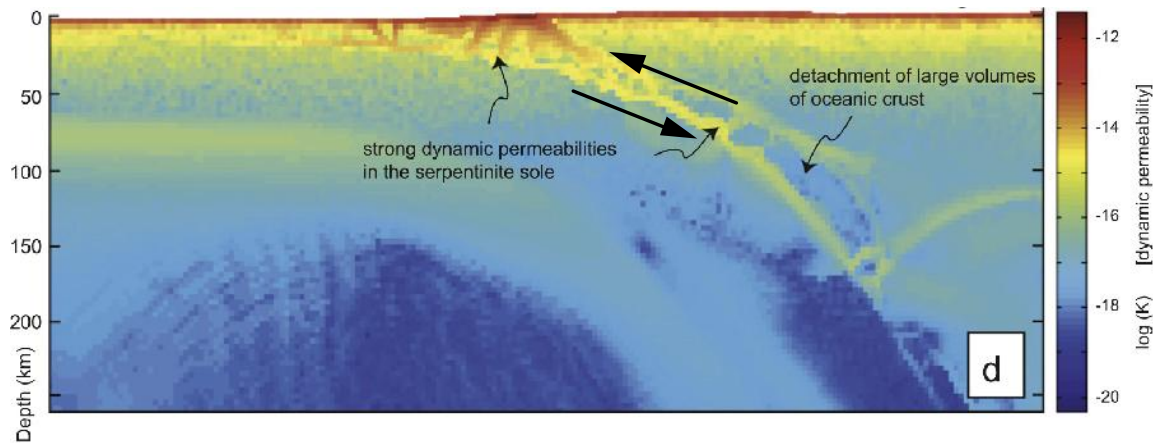
# Source regions and possible mechanisms of tectonic and volcanic tremors

- **Difference** -> depth and confining pressure (except VDLP)
- **Similarity** -> combination of shearing with fluid transport

Multiplet behavior -> nondestructive source mechanisms

Volcanic conduit  
(Hornby et al., 2015)

Subduction zone (Angiboust et al., 2015)

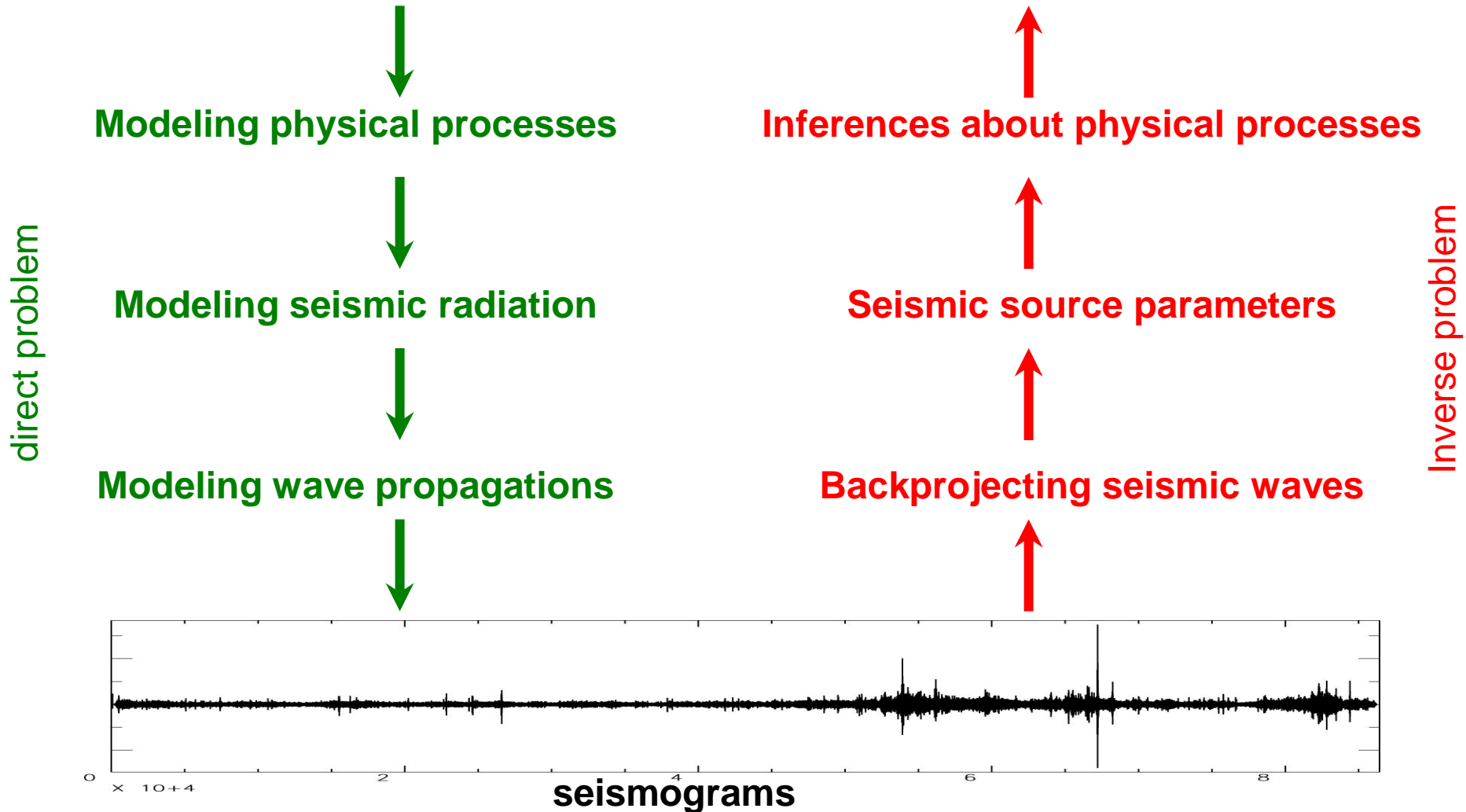


Low frequency tremors can be used to understand slow processes within faults and volcanoes



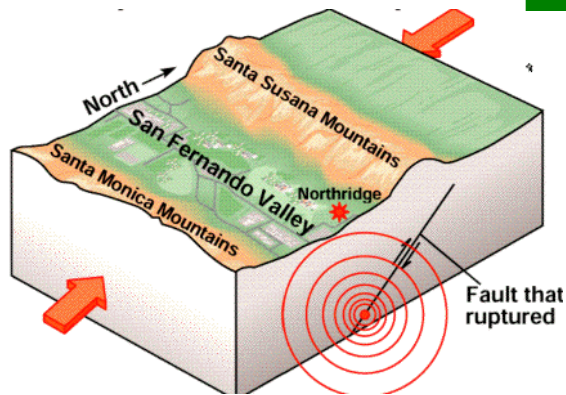
# Understanding Earth's processes with seismological observations

## STUDIED PHENOMENA



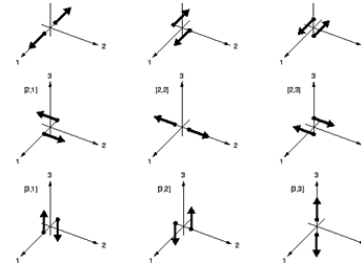
# Studying tectonic processes with earthquakes

Earthquakes on seismogenic faults



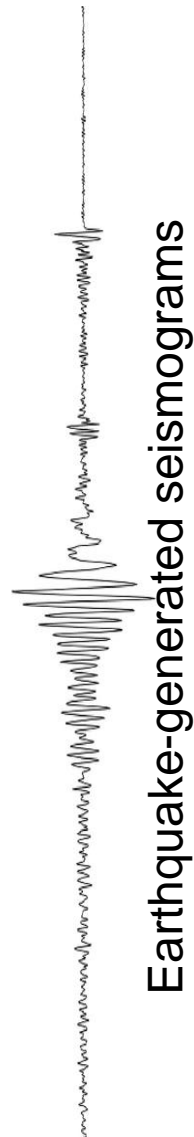
Rupture physics

Seismic moment tensor



$$M_{kj} = \begin{bmatrix} M_{xx} & M_{xy} & M_{xz} \\ M_{yx} & M_{yy} & M_{yz} \\ M_{zx} & M_{zy} & M_{zz} \end{bmatrix}$$

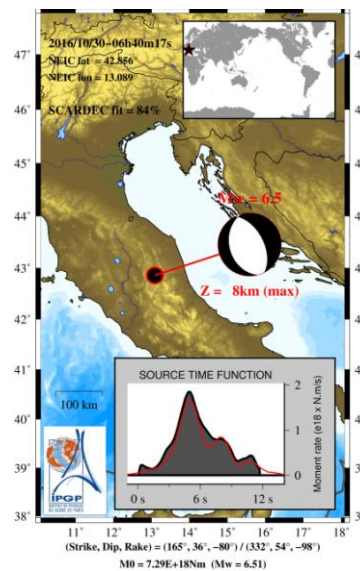
Wave propagation



Earthquake source parameters:  
location, seismic moment,  
focal mechanism, source time function

- fault properties
- mechanical stresses
- scaling laws
- seismic hazard
- plate tectonics

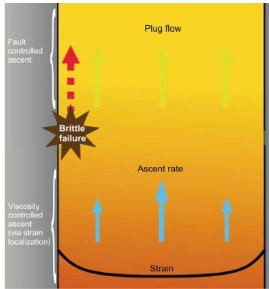
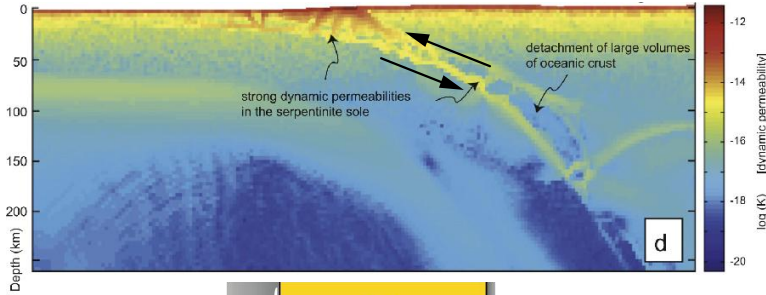
INFERENCE



INVERSION

# Studying slow processes with tremors

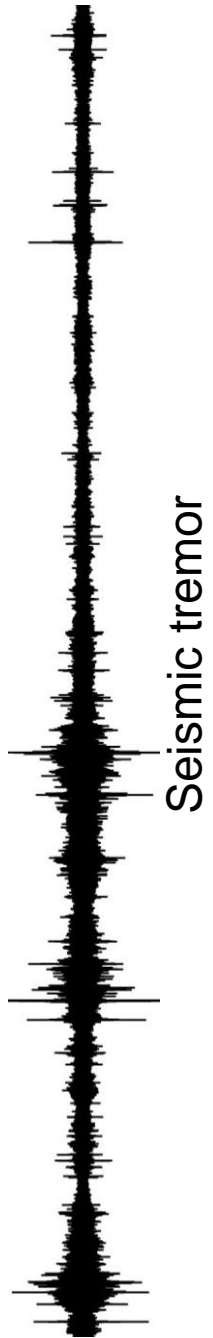
## Slow processes within Volcanoes and faults



## Description of wave sources

???

Wave propagation



## Seismic source parameters

INFERENCE

???

INVERSION

- slow slip
- fluids in the faults
- magma migration
- magma degassing
- hydrothermal systems



Thank you