

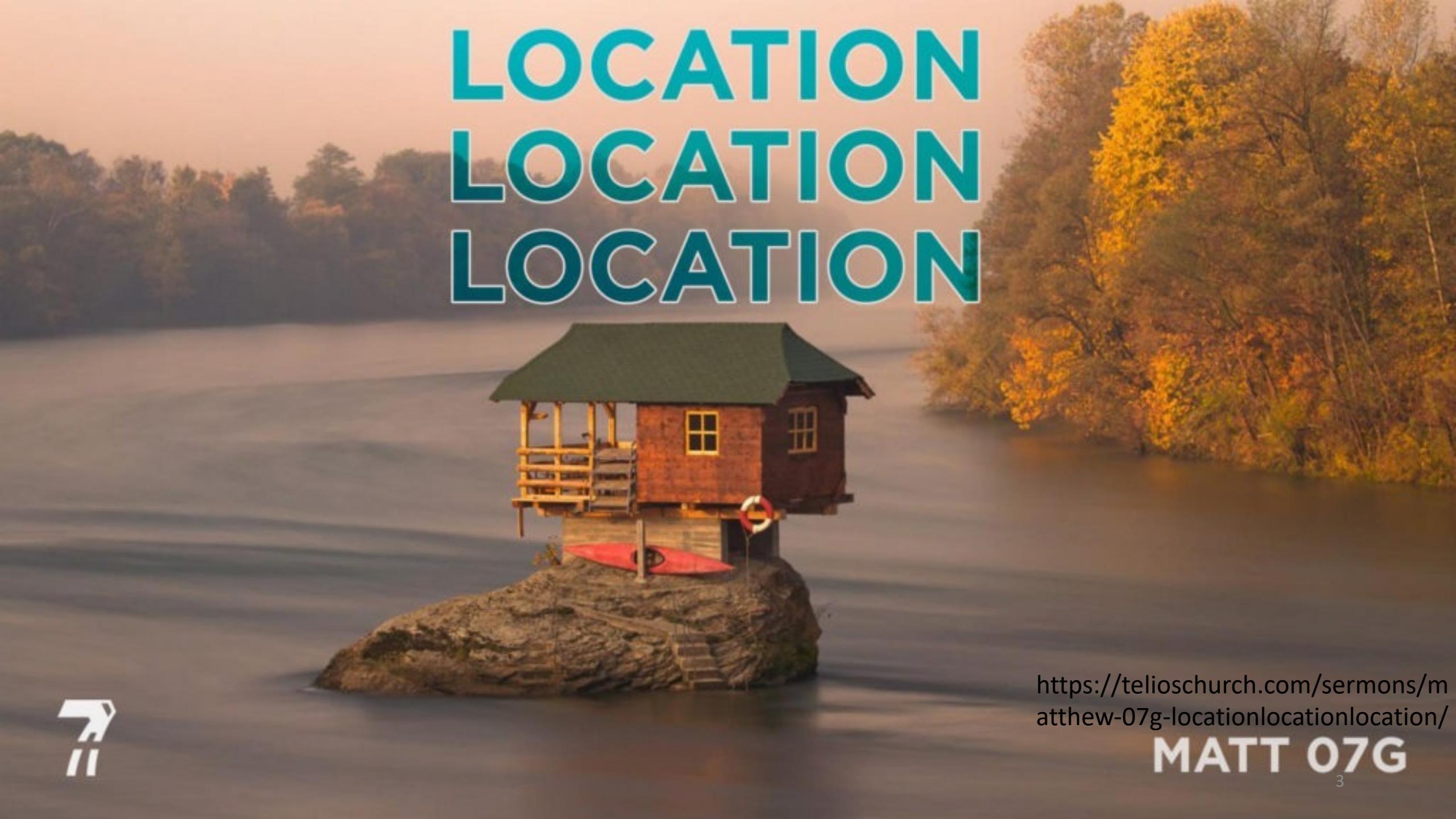
Accurate Earthquake Location Using Single-Station Waveforms: A Case Study

Miao Zhang
Dalhousie University

USTC, Hefei, China
Mar. 2021

Outline

- Background
- Review of single-station location methods
- Source characterization for two small earthquakes in Dartmouth, NS
- Summary



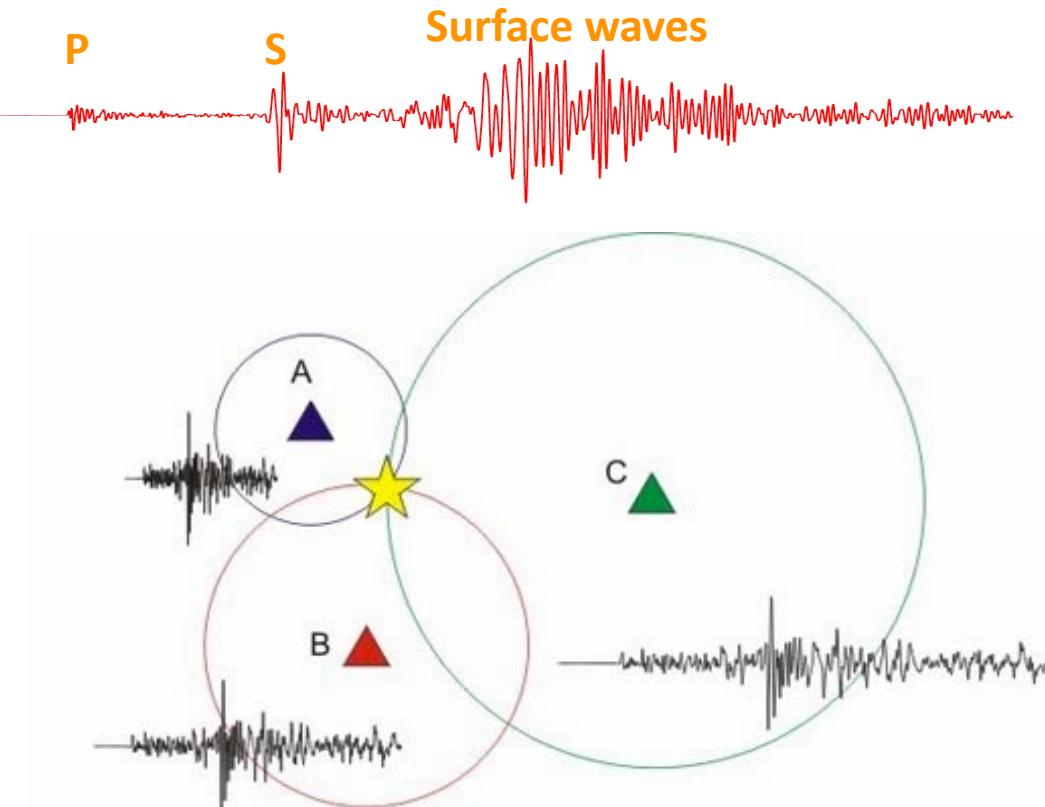
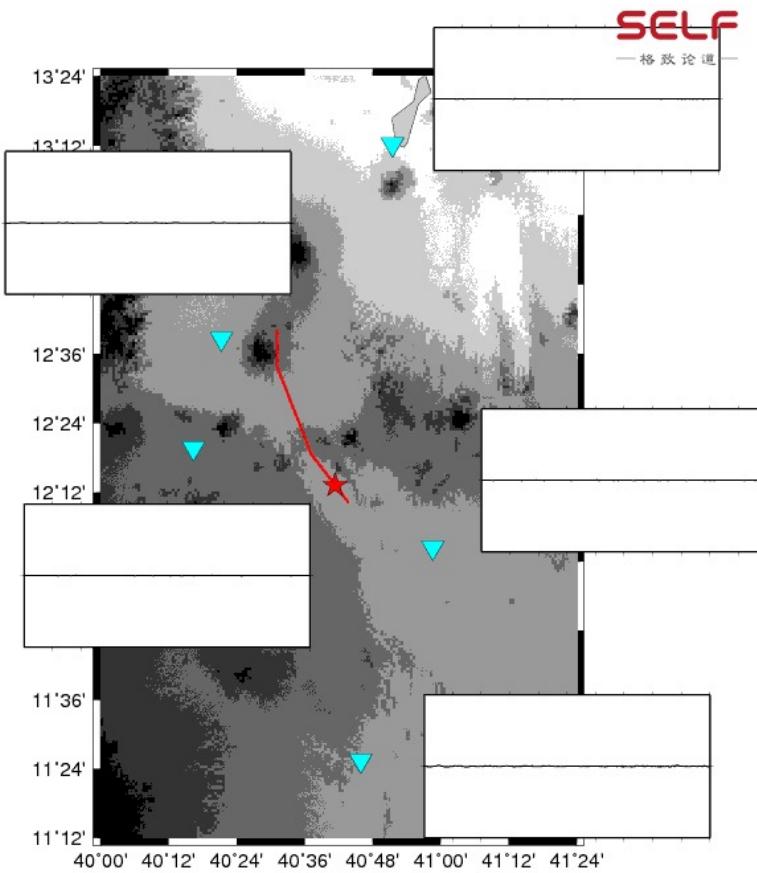
LOCATION LOCATION LOCATION



<https://telioschurch.com/sermons/mattew-07g-locationlocationlocation/>

MATT 07G

Earthquake Location



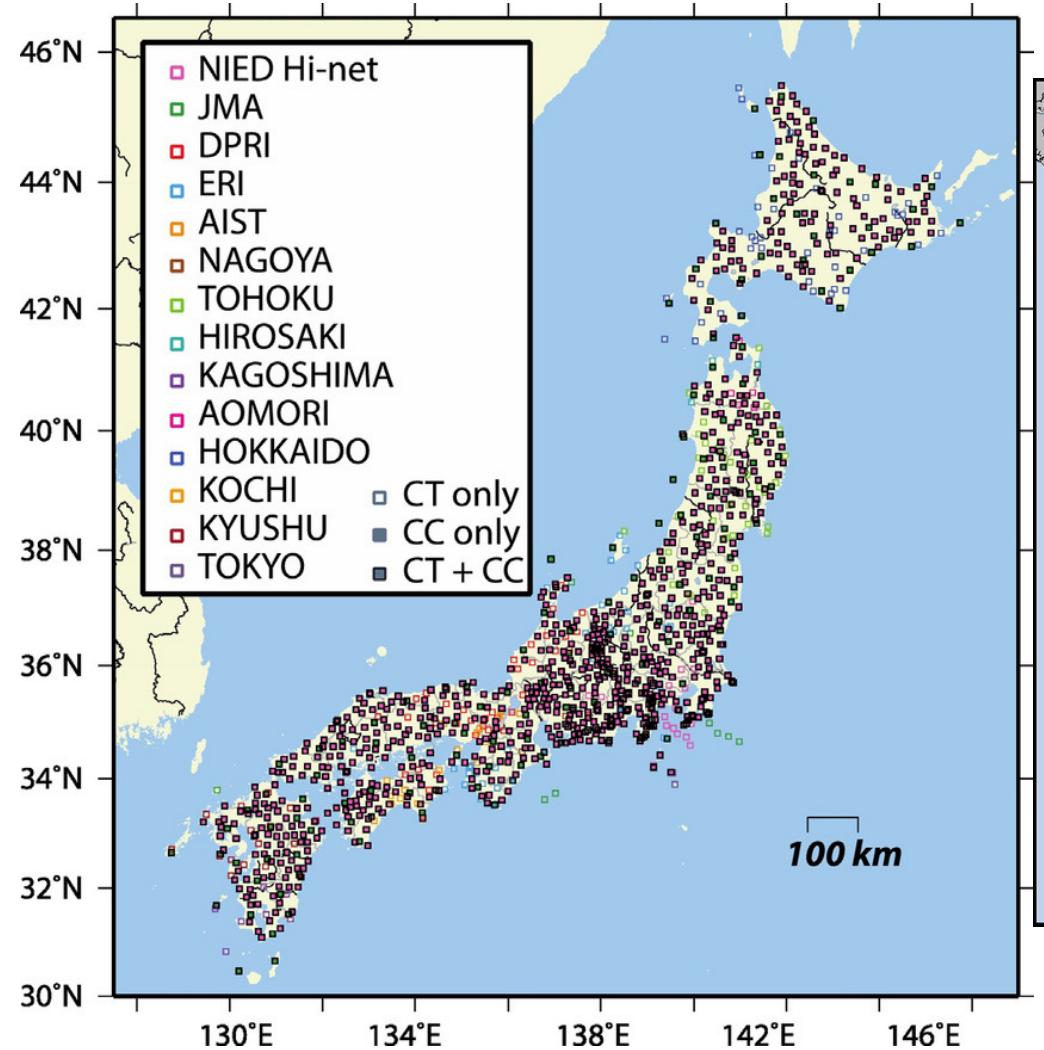
Pick-based methods

VS.

Waveform-based methods

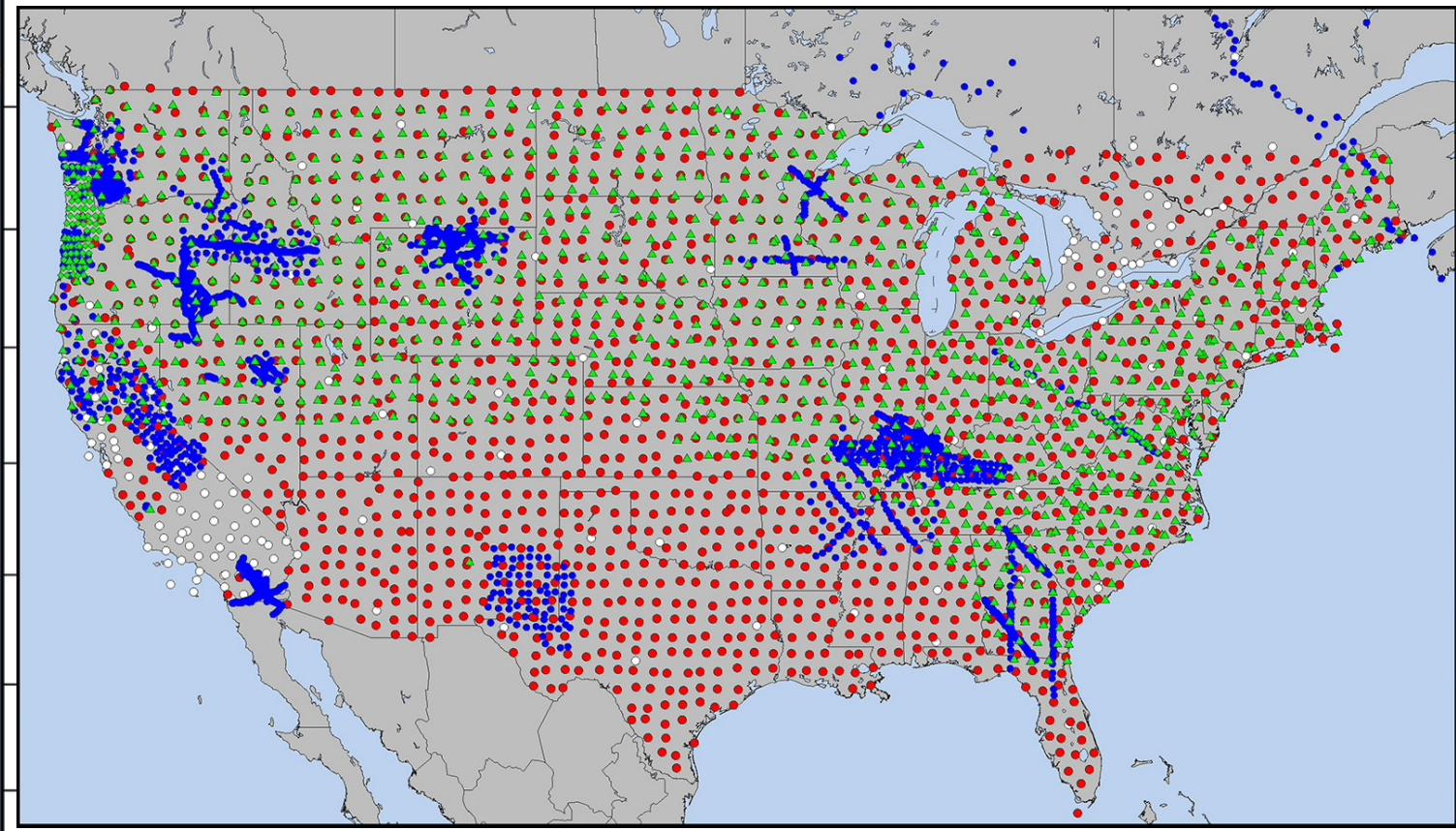
All in one single step (delay-and-sum) & waveform simulation/matching

Hi-net (Japan)



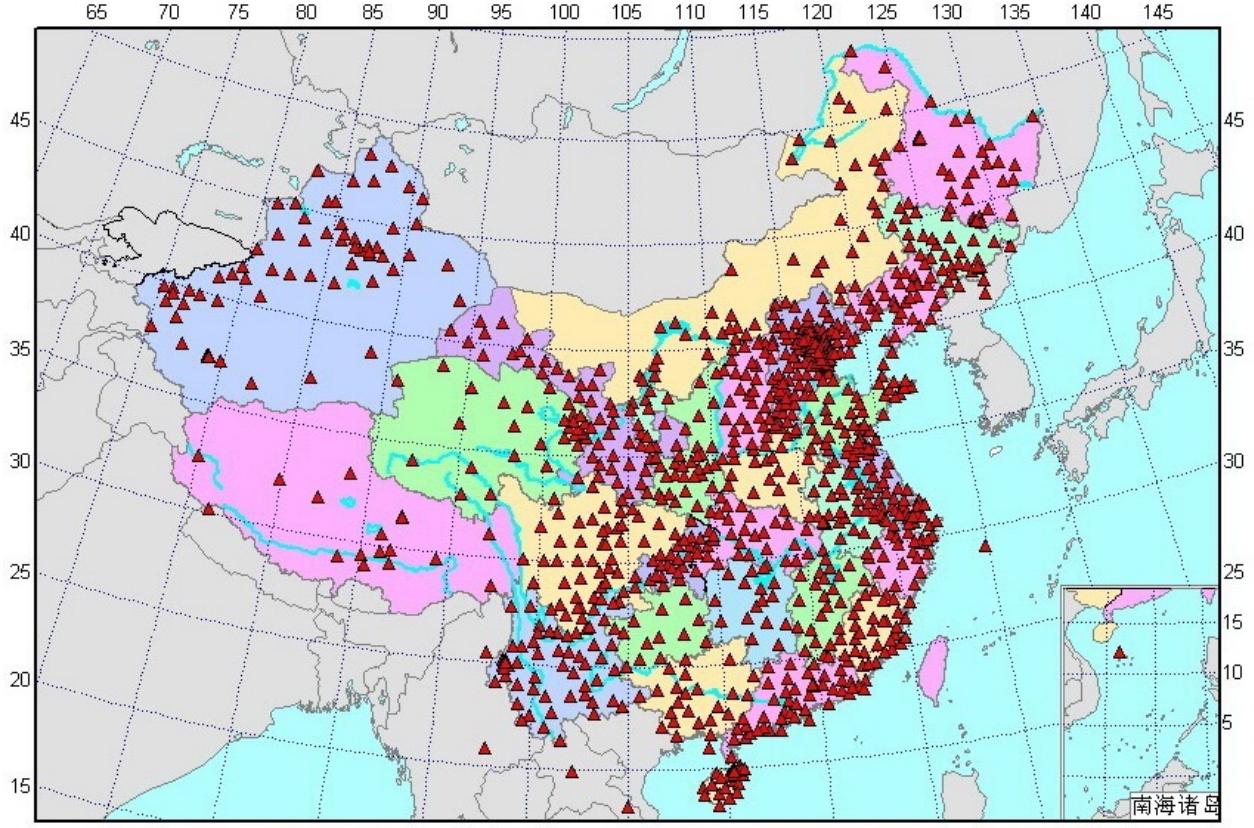
Station spacing: 20~ 30 km

US Array (USA)



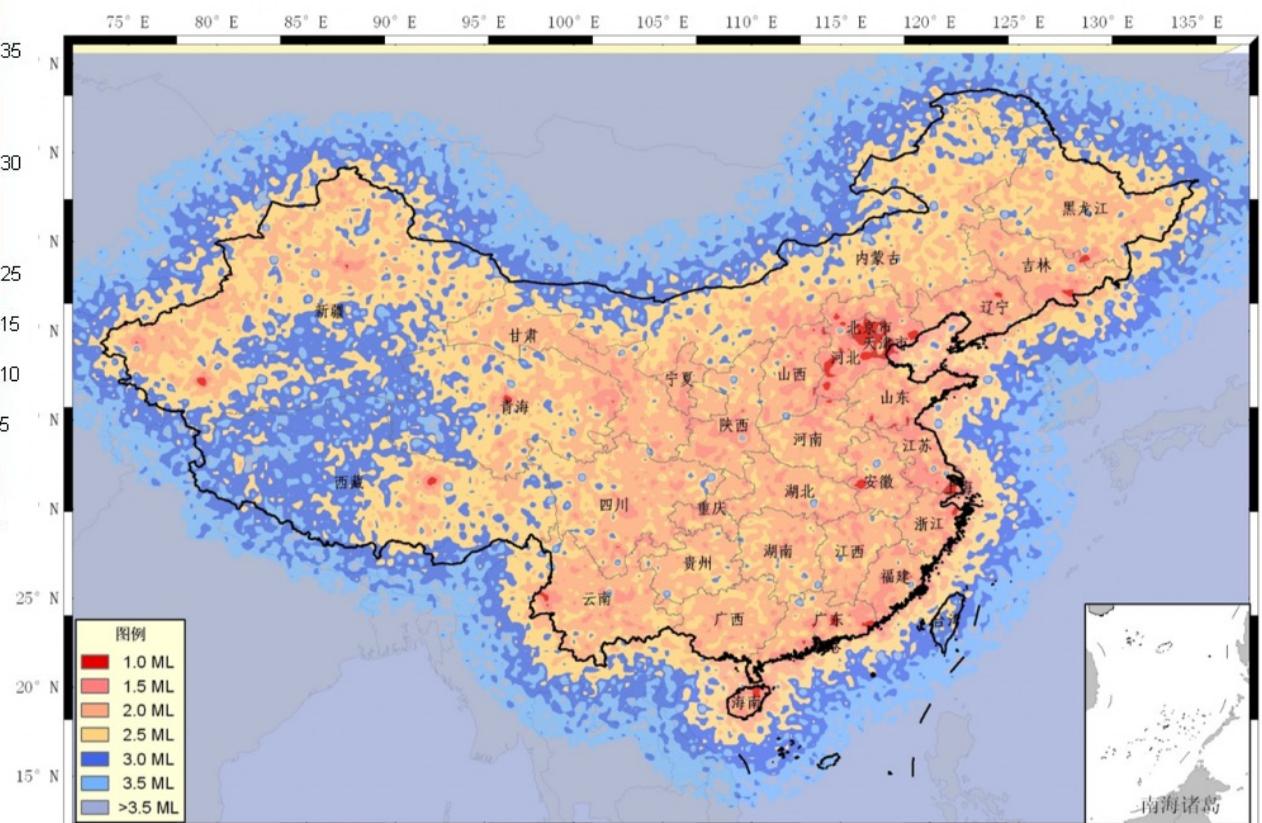
Station spacing: 70 km

Seismic Station Distribution in China



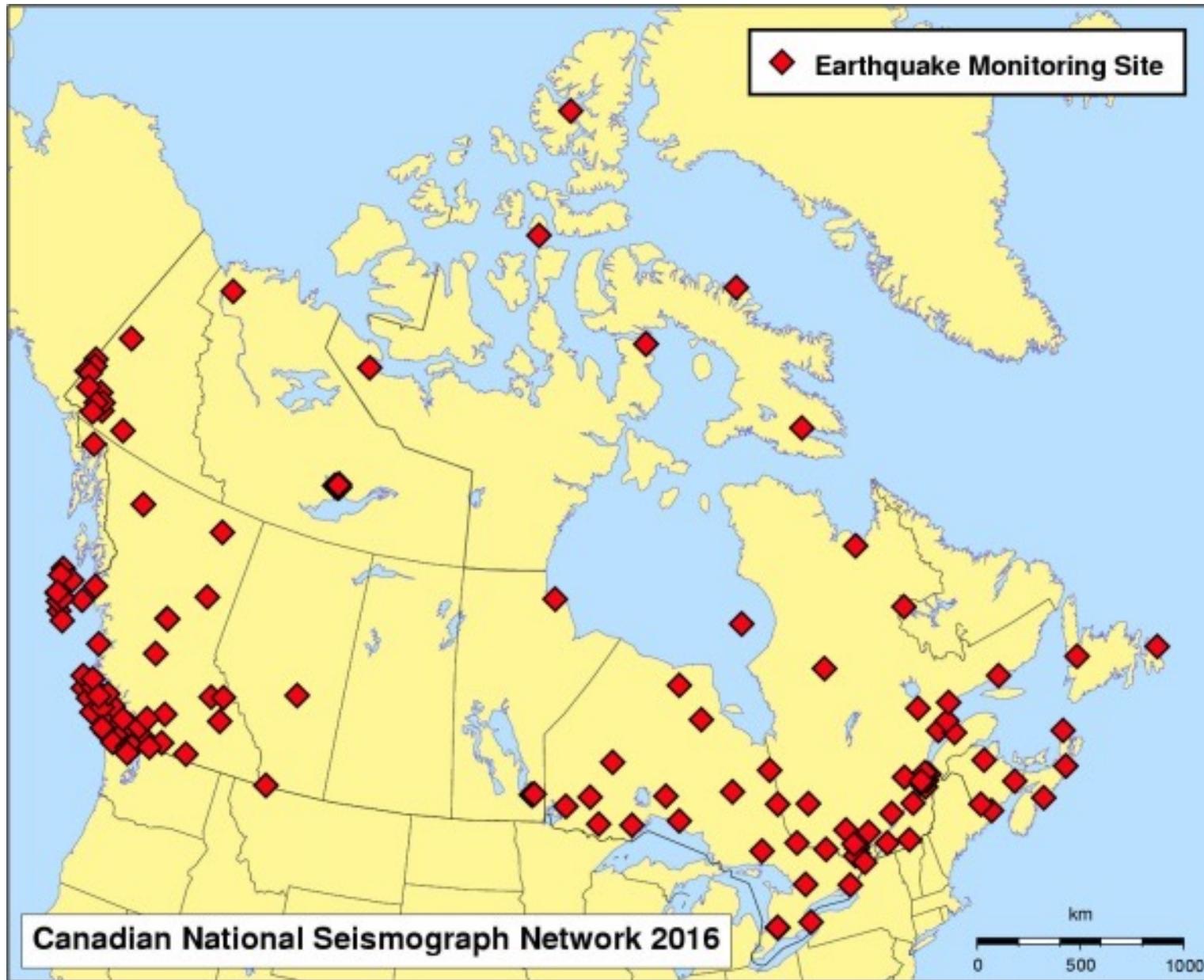
<https://data.earthquake.cn/>

Earthquake Monitoring Ability

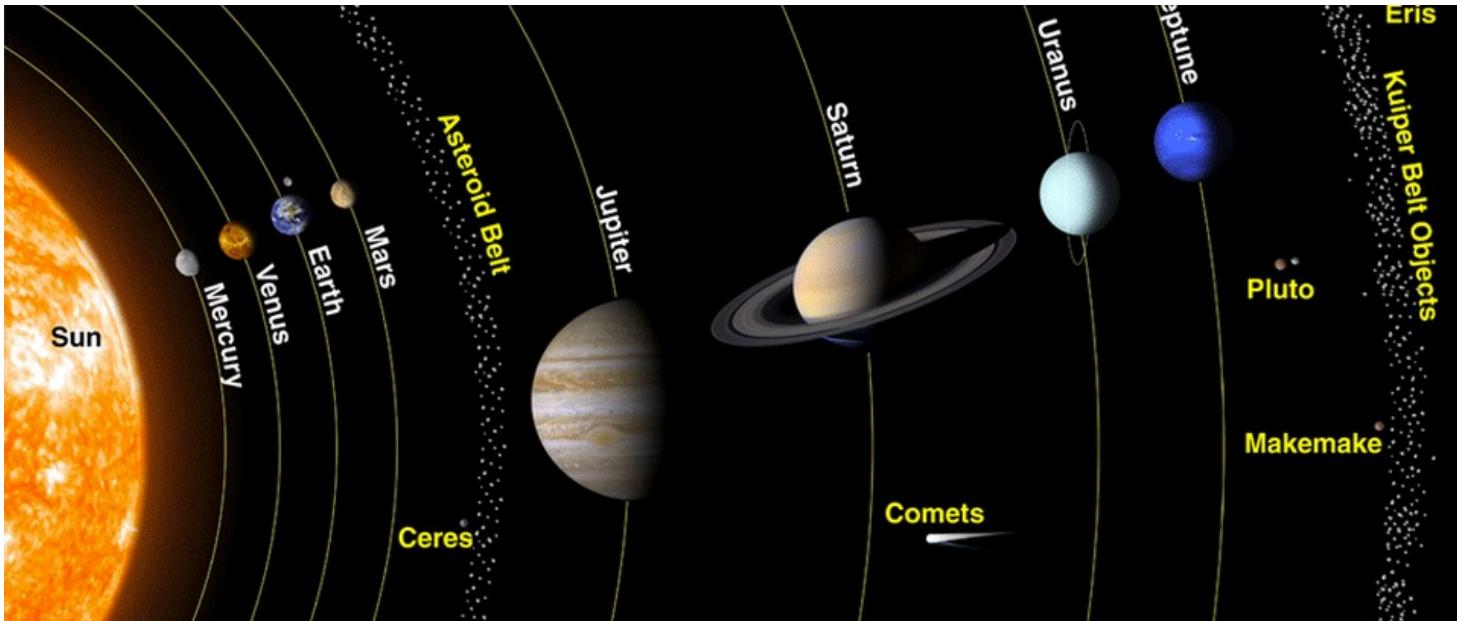


<http://chinageorefmodel.org/>

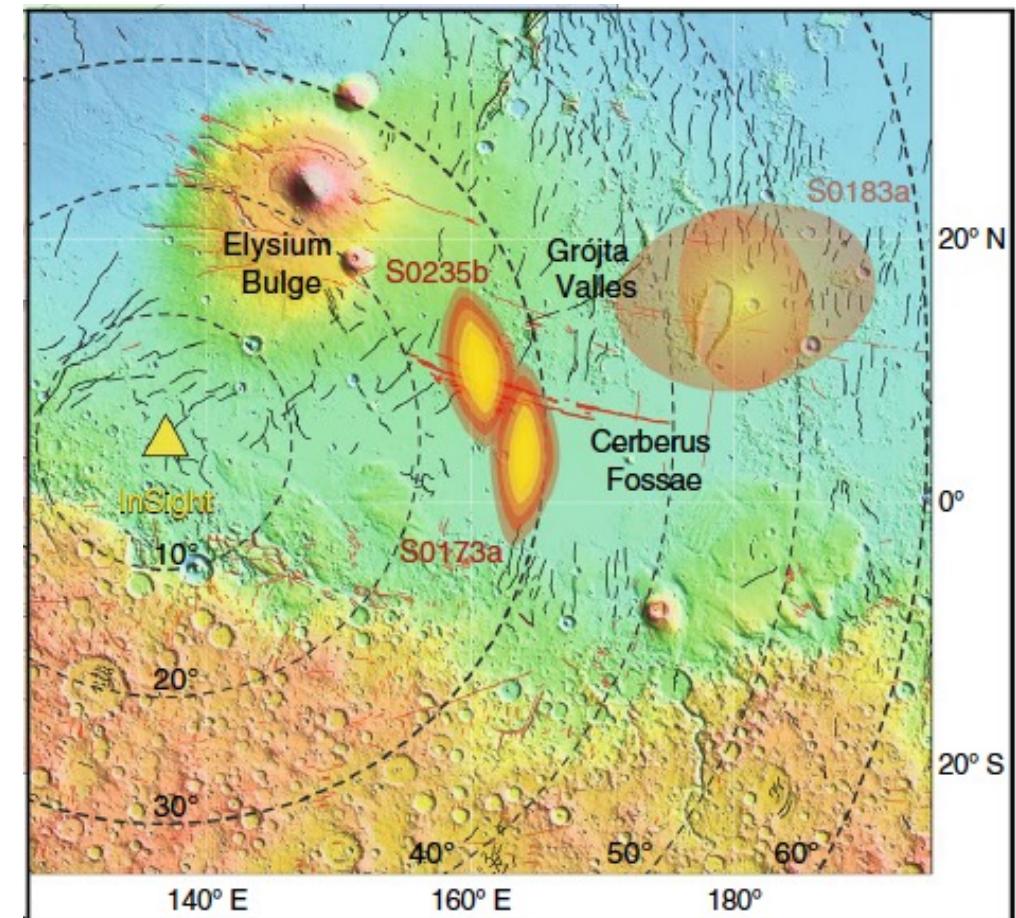
Canadian National Seismograph Network



Quake location on other planets



Seismicity of Mars



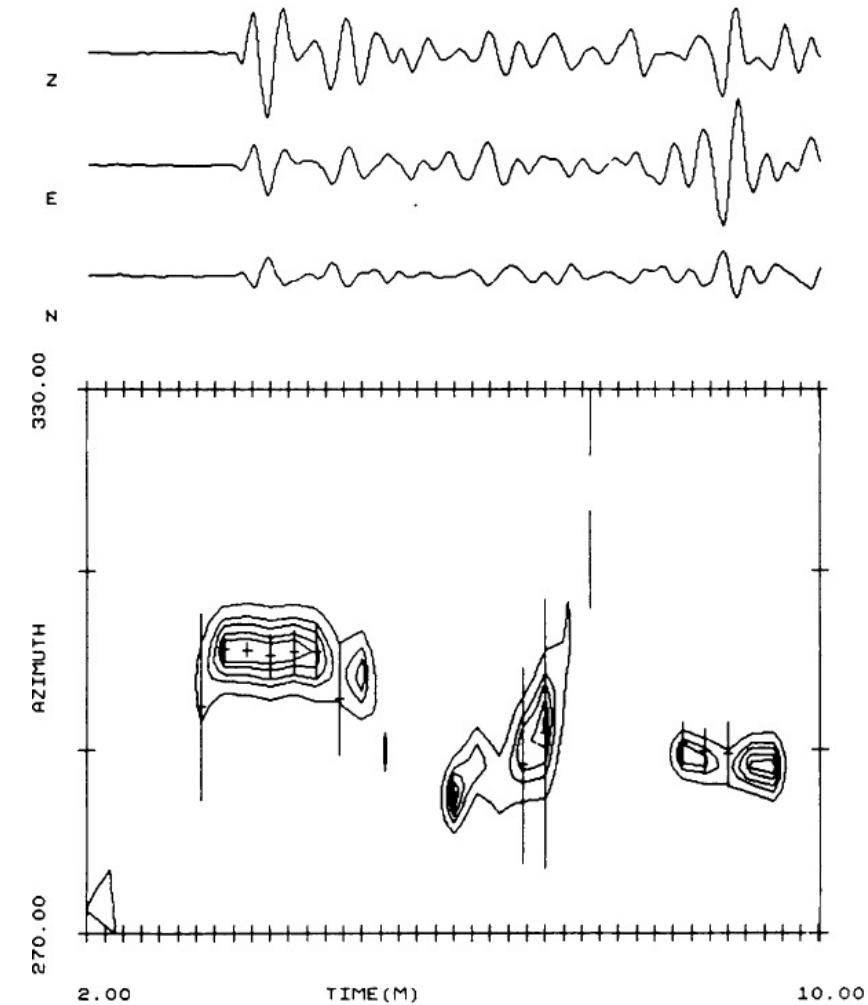
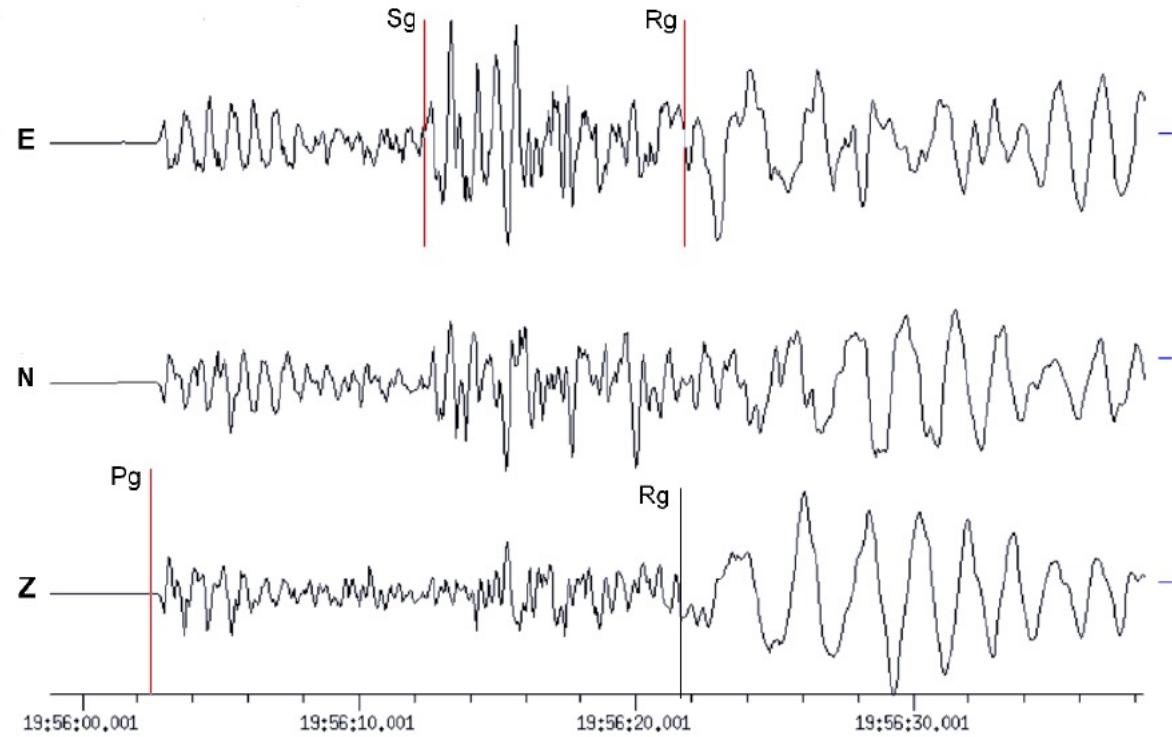
Giardini et al., Nat. Geosci., 2020

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Single-station location:

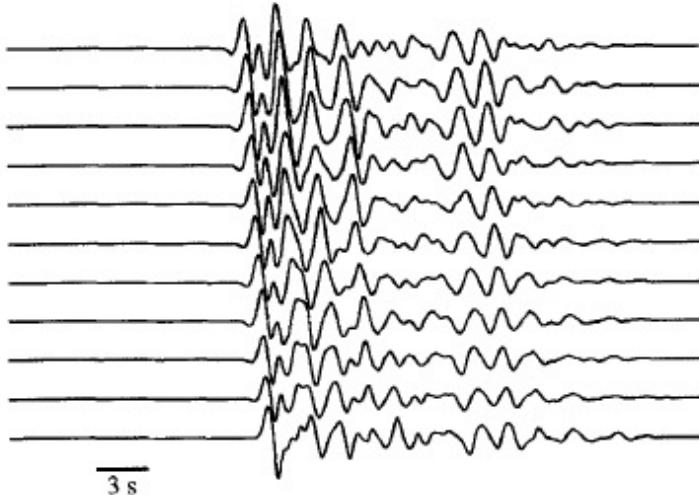
1. epicentral distance (T_p -s) + back azimuth (polarity)



Single-station location: 2. using waveform similarity

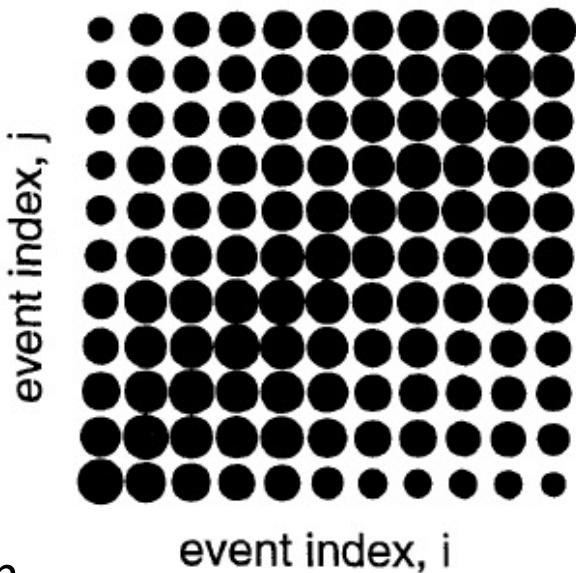
$$C_{ij}^{\text{pre}} = \exp(-r_{ij}/s); r_{ij} = |x^{(i)} - x^{(j)}|$$

$$E = \sum_i \sum_j |C_{ij}^{\text{obs}} - C_{ij}^{\text{pre}}|.$$



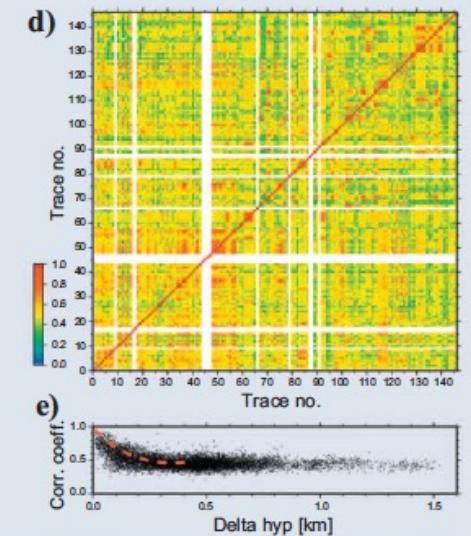
Only recover relative distribution

Menke et al., BSSA, 1999



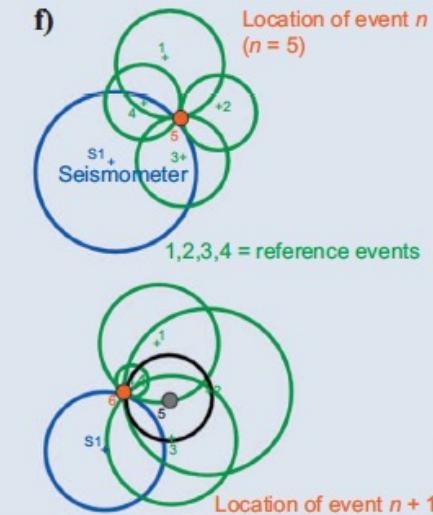
Step 2
Crosscorrelation of reference events

- Calculate correlation coefficients for all pairs of reference events (d)
- Estimate the parameters of function $cc = e^{-f(\Delta t)}$ (e.g., $cc = e^{-\Delta t/s}$ (e))
- Optionally, test location on reference events and find optimal location parameters



Step 3
Location of additional events using the value of cc

- For all events , calculate cc with all located events
- Sort event list (start with event pair that has highest cc value)
- For each event do
 - Update cc matrix
 - Locate event (f)
 - If accepted, add event to set of located events
- Done (repeat for next event)



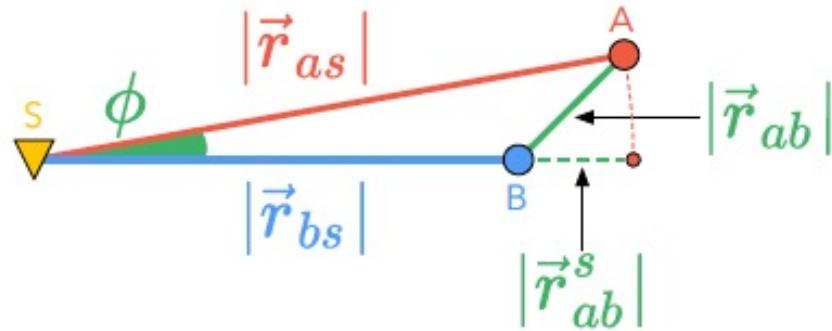
Absolute location: CC + Ts-p

Kummerow, Geophysics, 2010

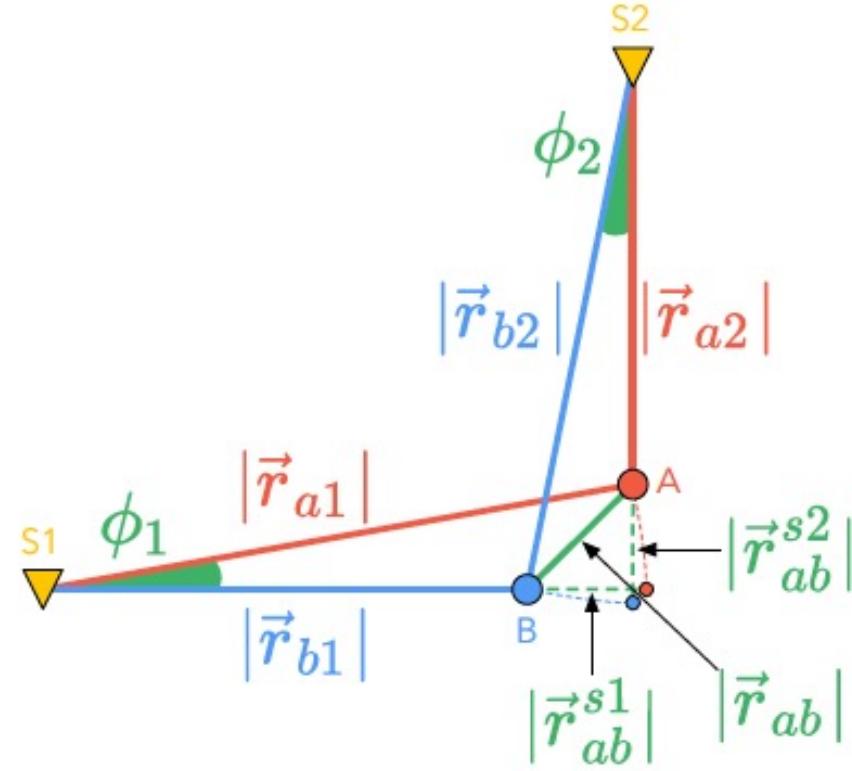
Single-station location: 3. distance-geometry-based method

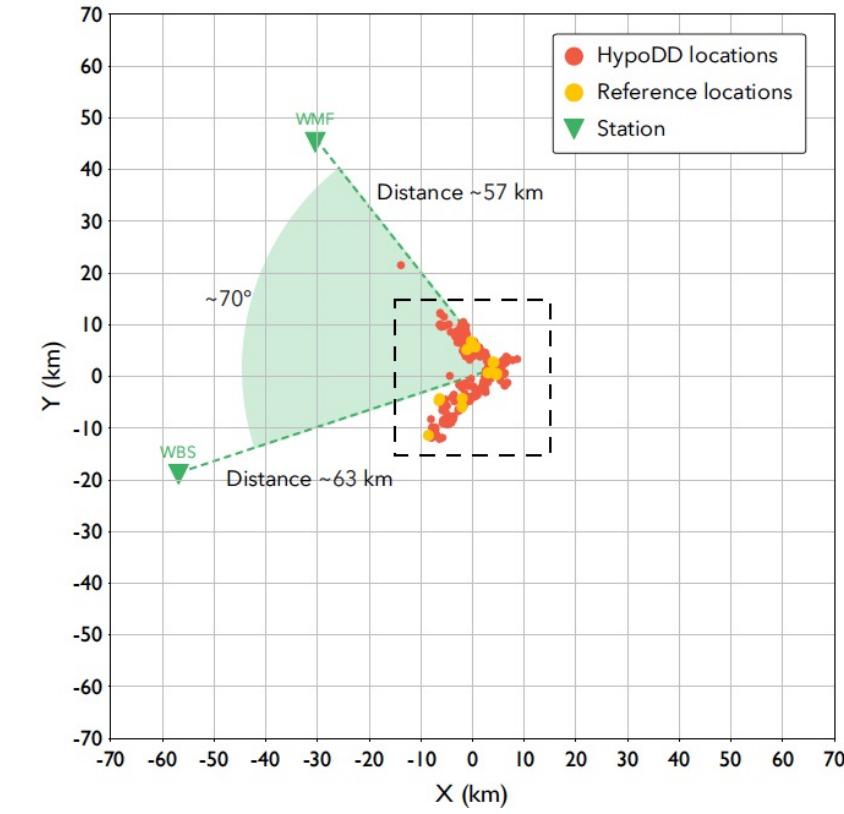
$$||\mathbf{r}_{ab}||^2 = ||\mathbf{r}_{as}||^2 + ||\mathbf{r}_{bs}||^2 - 2 ||\mathbf{r}_{as}|| ||\mathbf{r}_{bs}|| \cos \phi.$$

(a)

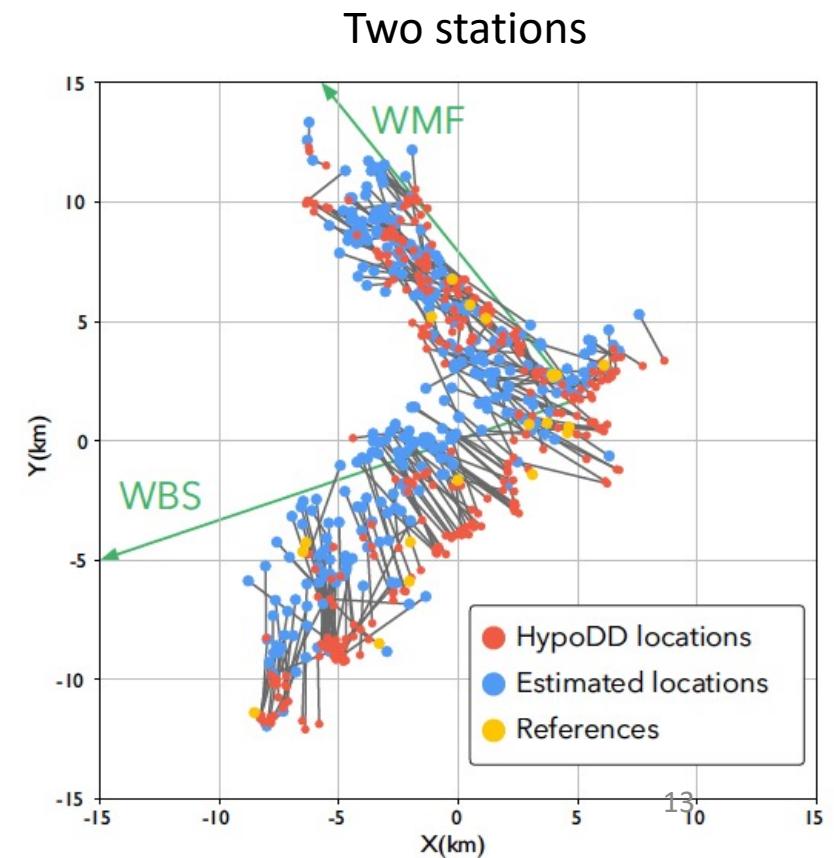
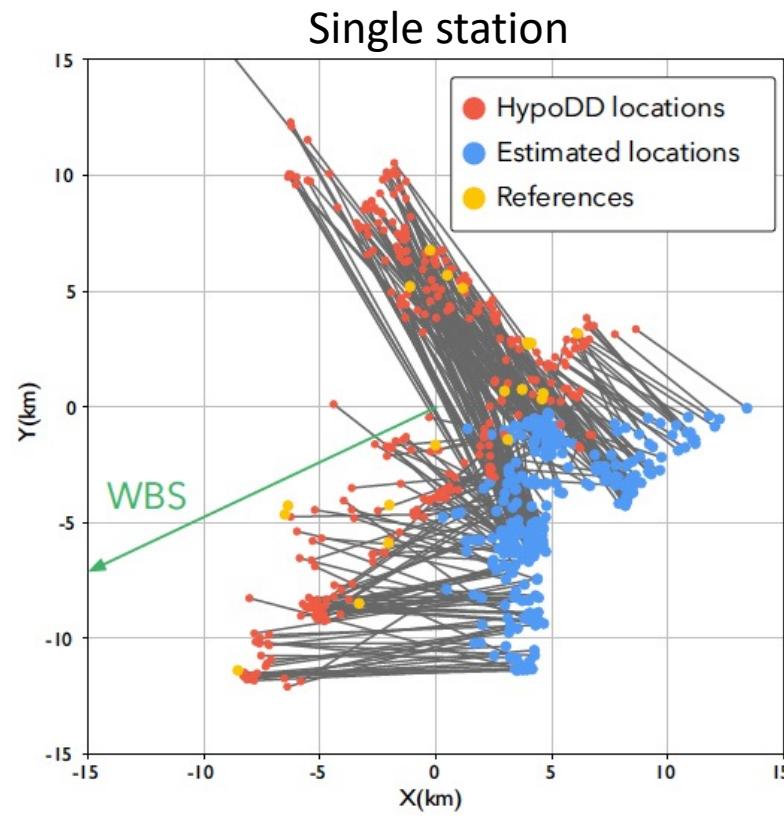


(b)



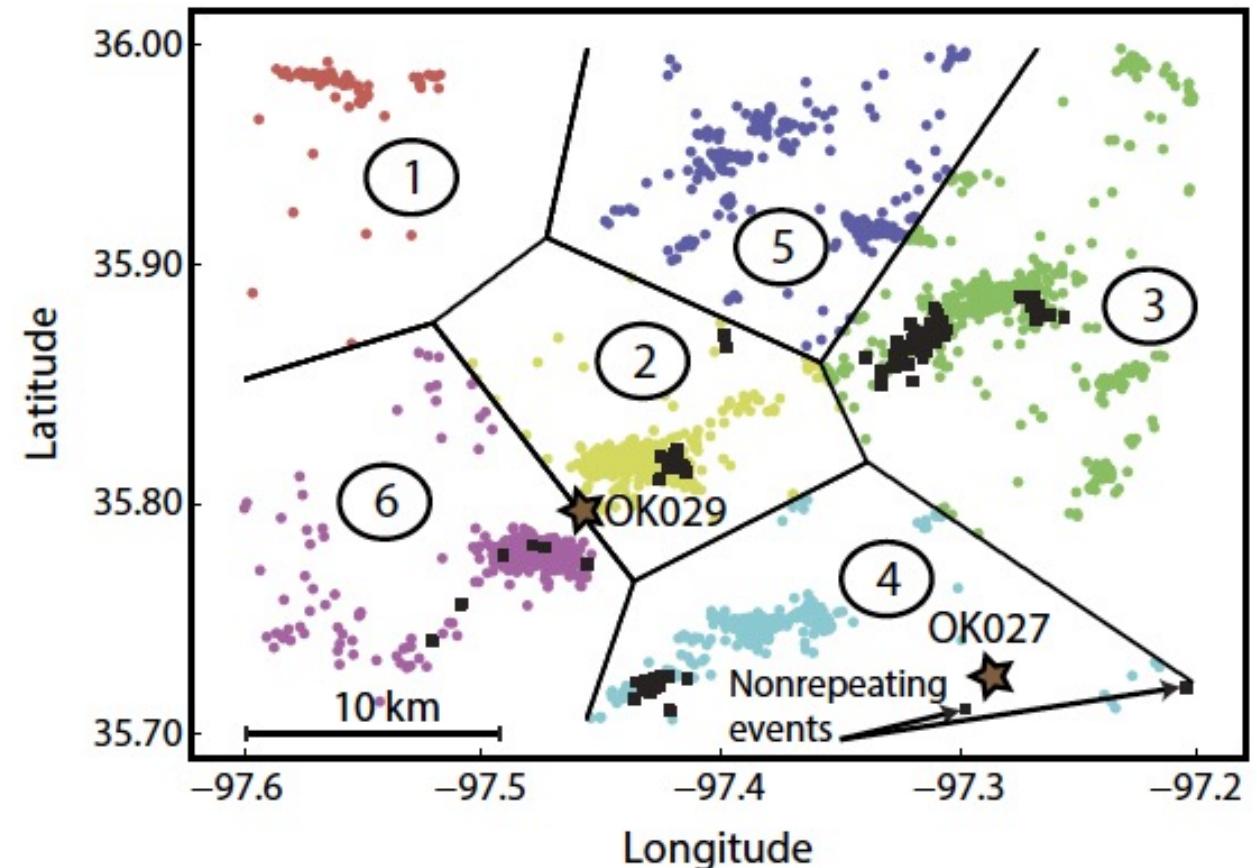
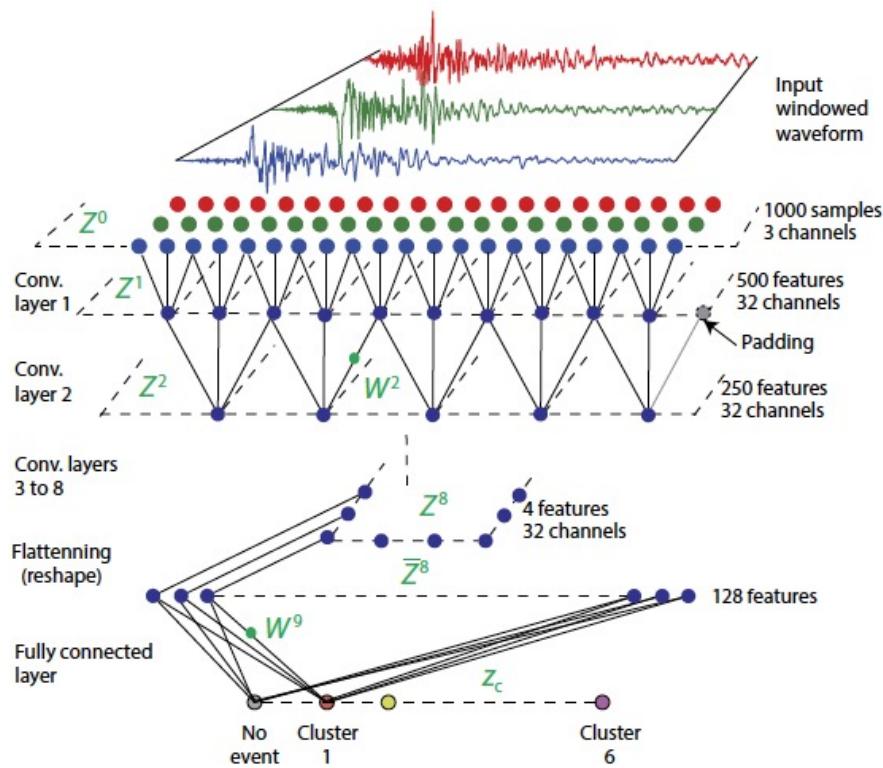


320 aftershocks of the 2019 Mw 6.4 Ridgecrest earthquake (20 first-hour aftershocks as references)

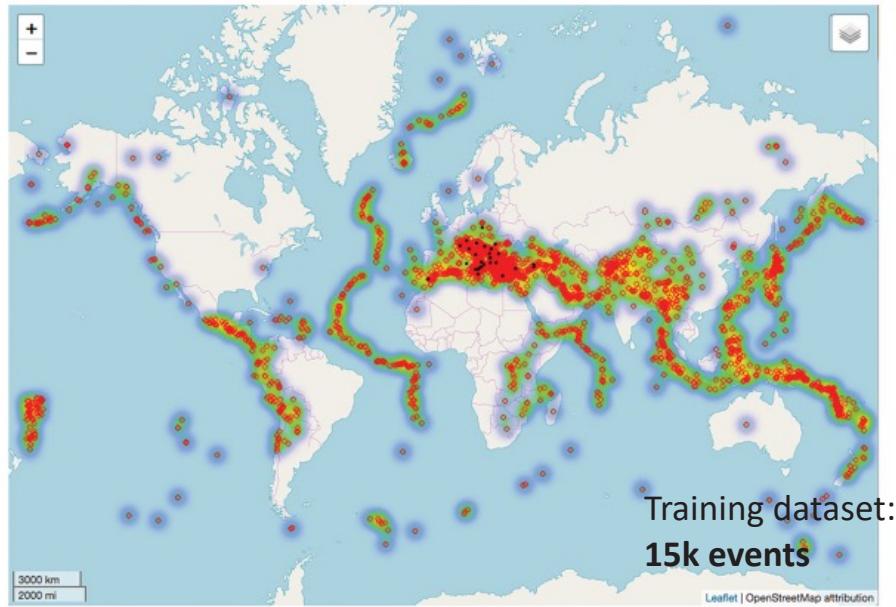


Single-station location: 3. machine-learning method

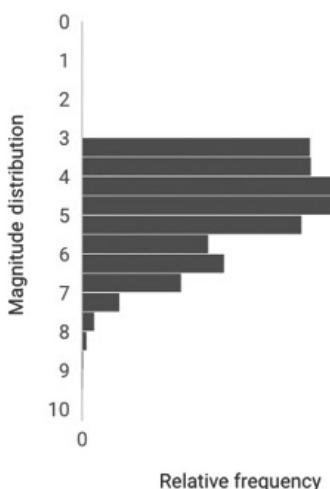
Detection + Classification



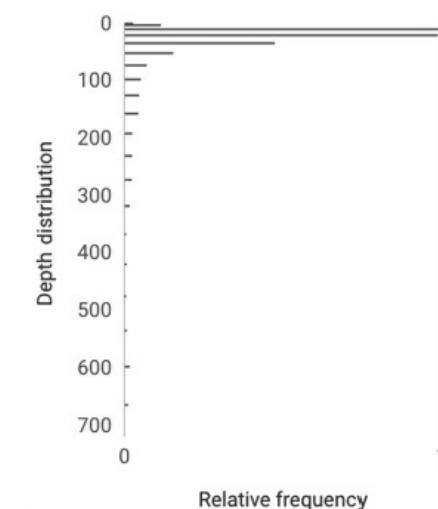
(a)



(b) Magnitude distribution

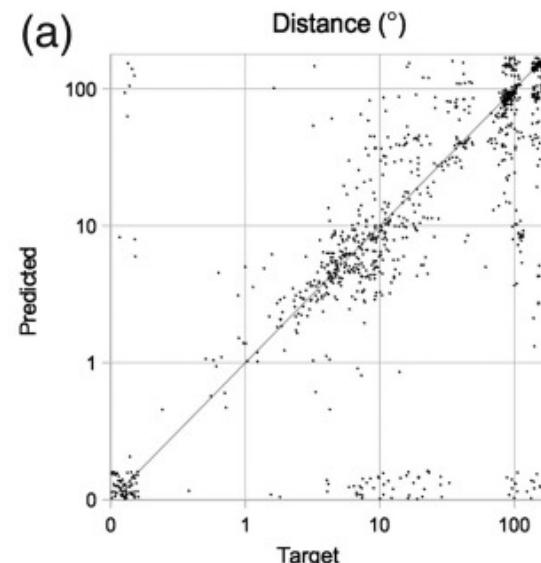


(c) Depth distribution

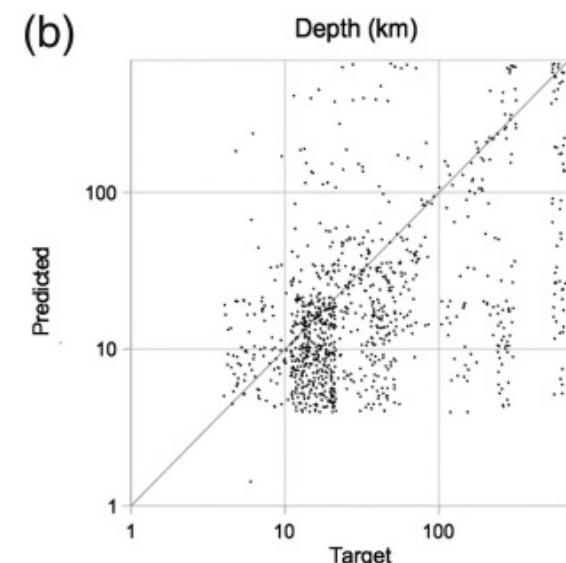


Detection + Classification (multiple parameters)

(a)

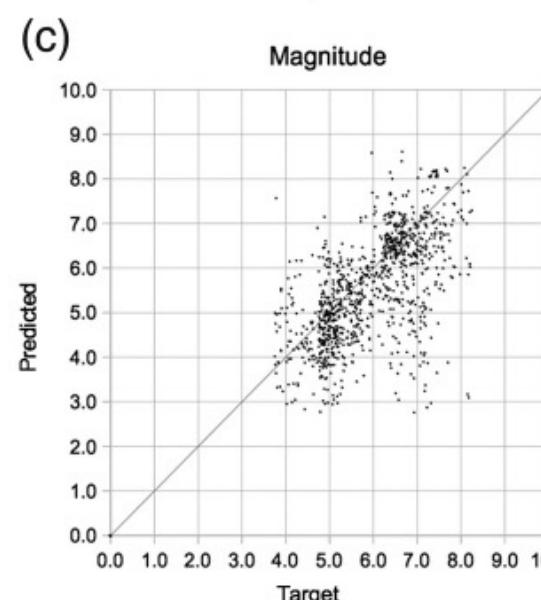
Distance ($^{\circ}$)

(b)



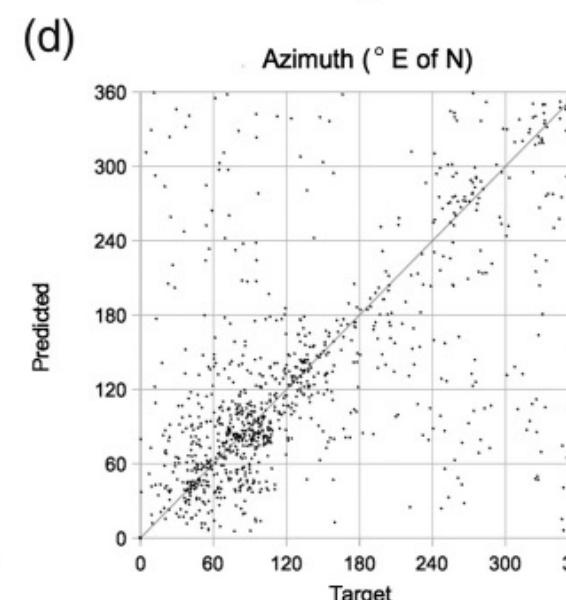
Depth (km)

(c)

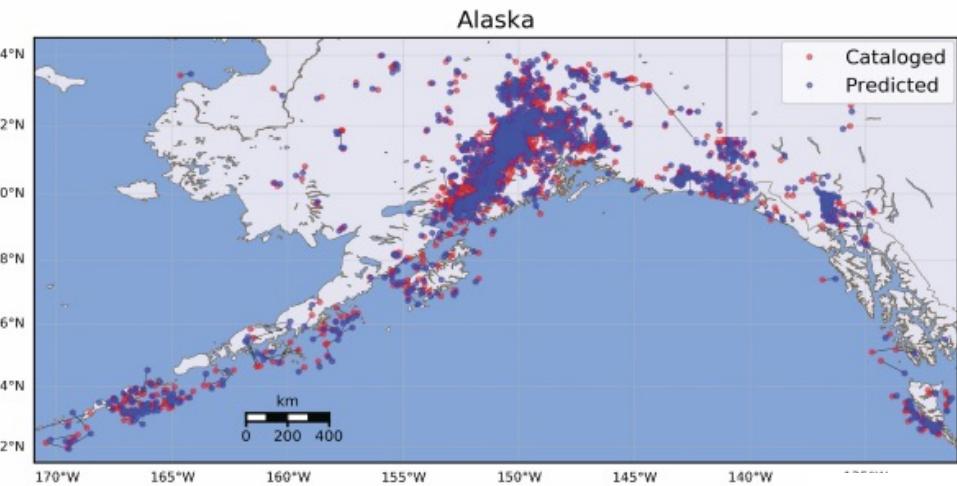


Magnitude

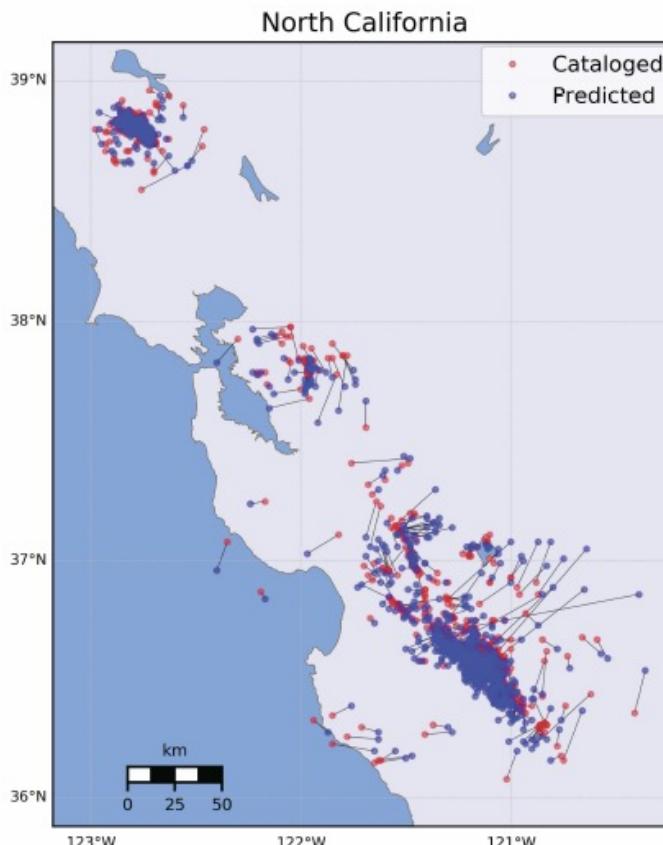
(d)

Azimuth ($^{\circ}$ E of N)

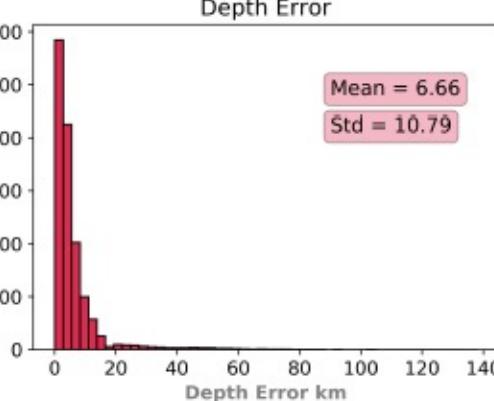
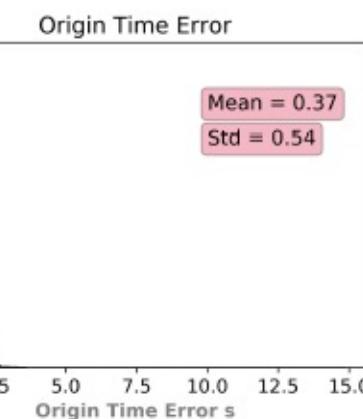
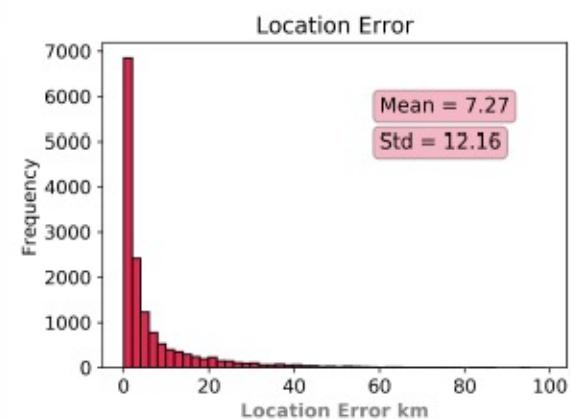
a)



b)



Epicentral distance + back-azimuth + P travel time



Training dataset
Stanford EArthquake Data Set
(STEAD)

450k events

Uncertainties:
Epicenter: 7.3 km
Origin time: 0.4 sec
Depth: 6.7 km

Accurate Depth Determination

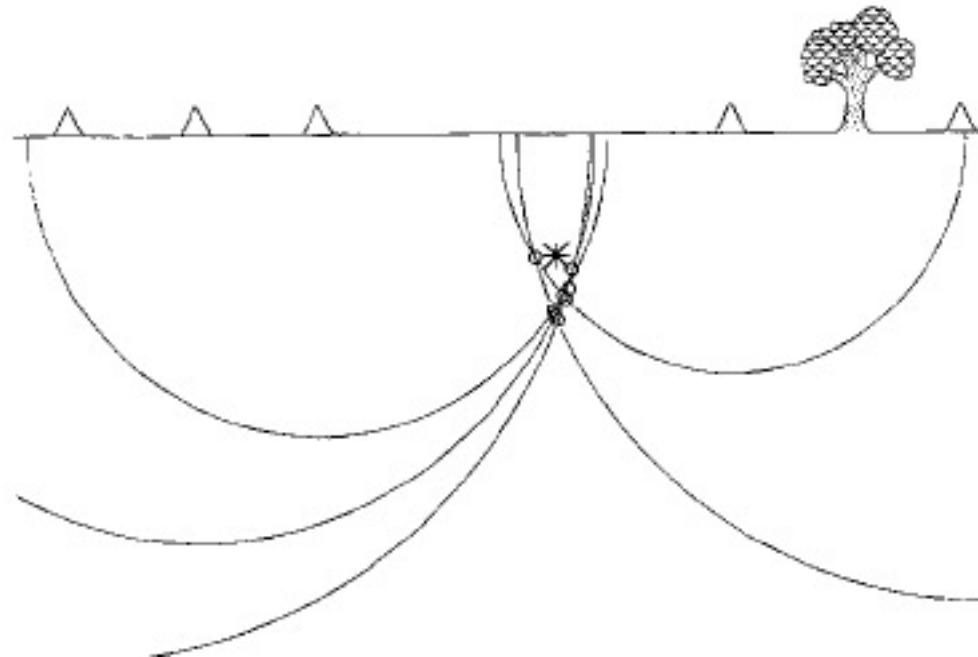
Bulletin of the Seismological Society of America, Vol. 80, No. 6, pp. 1605–1628, 1990

THE EFFECT OF S-WAVE ARRIVAL TIMES ON THE ACCURACY OF HYPOCENTER ESTIMATION

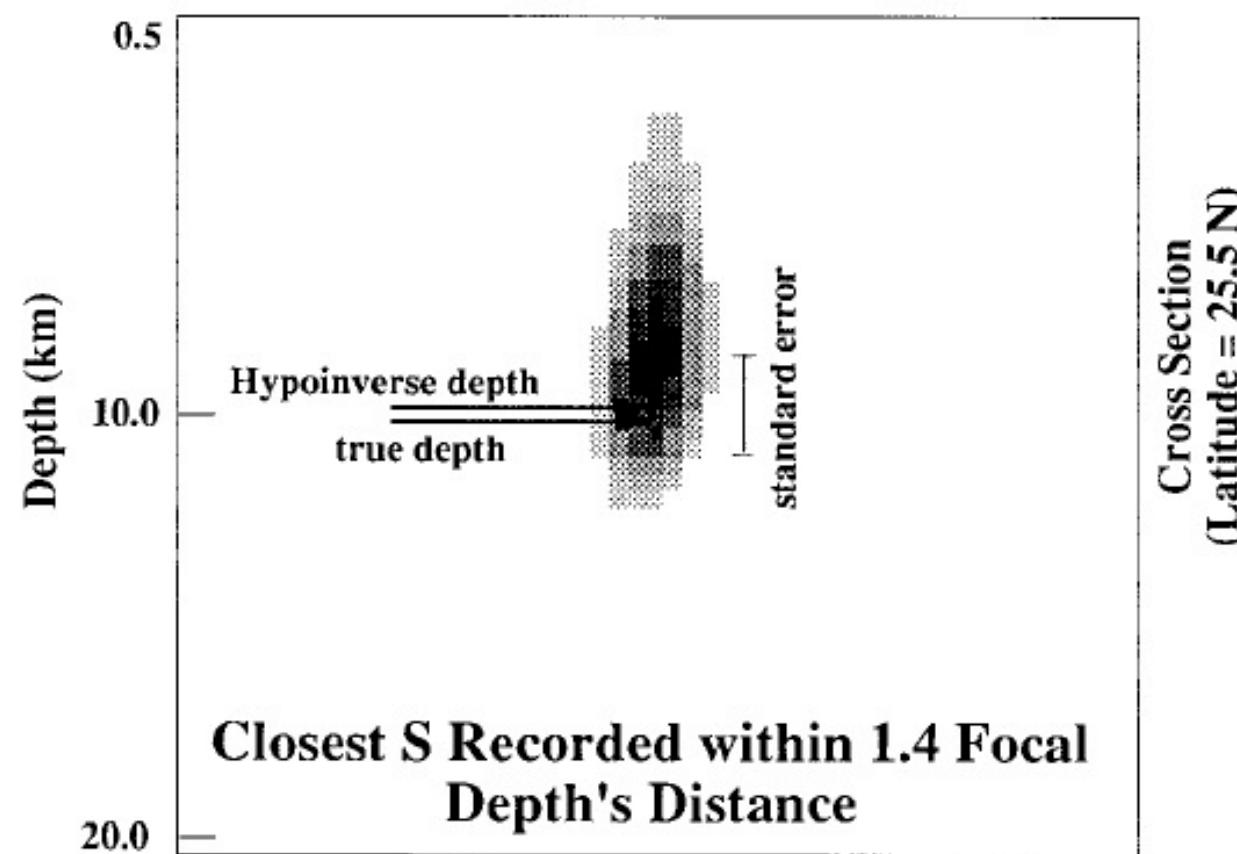
BY JOAN S. GOMBERG, KAYE M. SHEDLOCK, AND STEVEN W. ROECKER

ABSTRACT

Well-constrained hypocenters (latitude, longitude, depth, and origin time) are required for nearly all studies that use earthquake data. We have examined the theoretical basis behind some of the widely accepted “rules of thumb” for obtaining accurate hypocenter estimates that pertain to the use of S phases and illustrate, in a variety of ways, why and when these “rules” are applicable. Results

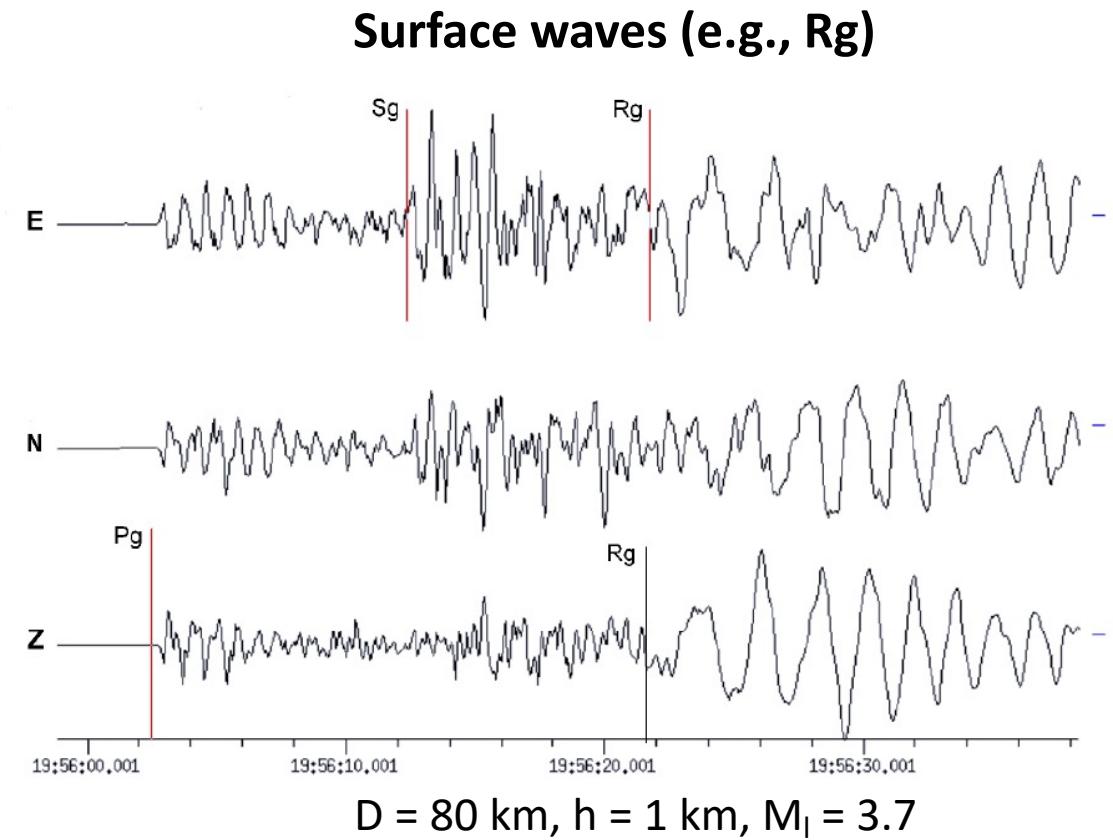
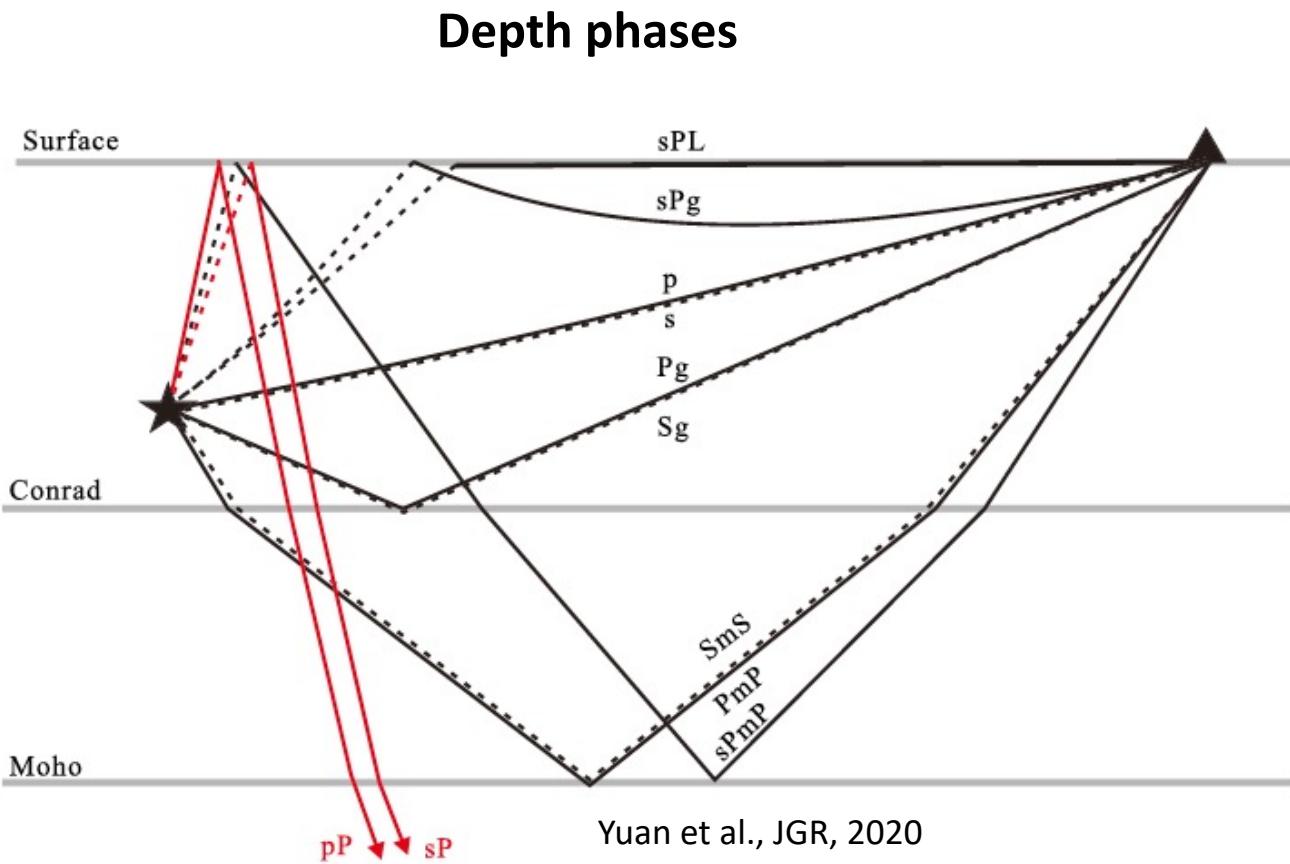


Gomberg et al., BSSA, 1990



At least one S phase is confidently picked at stations within distances of < ~1.4 times the depth

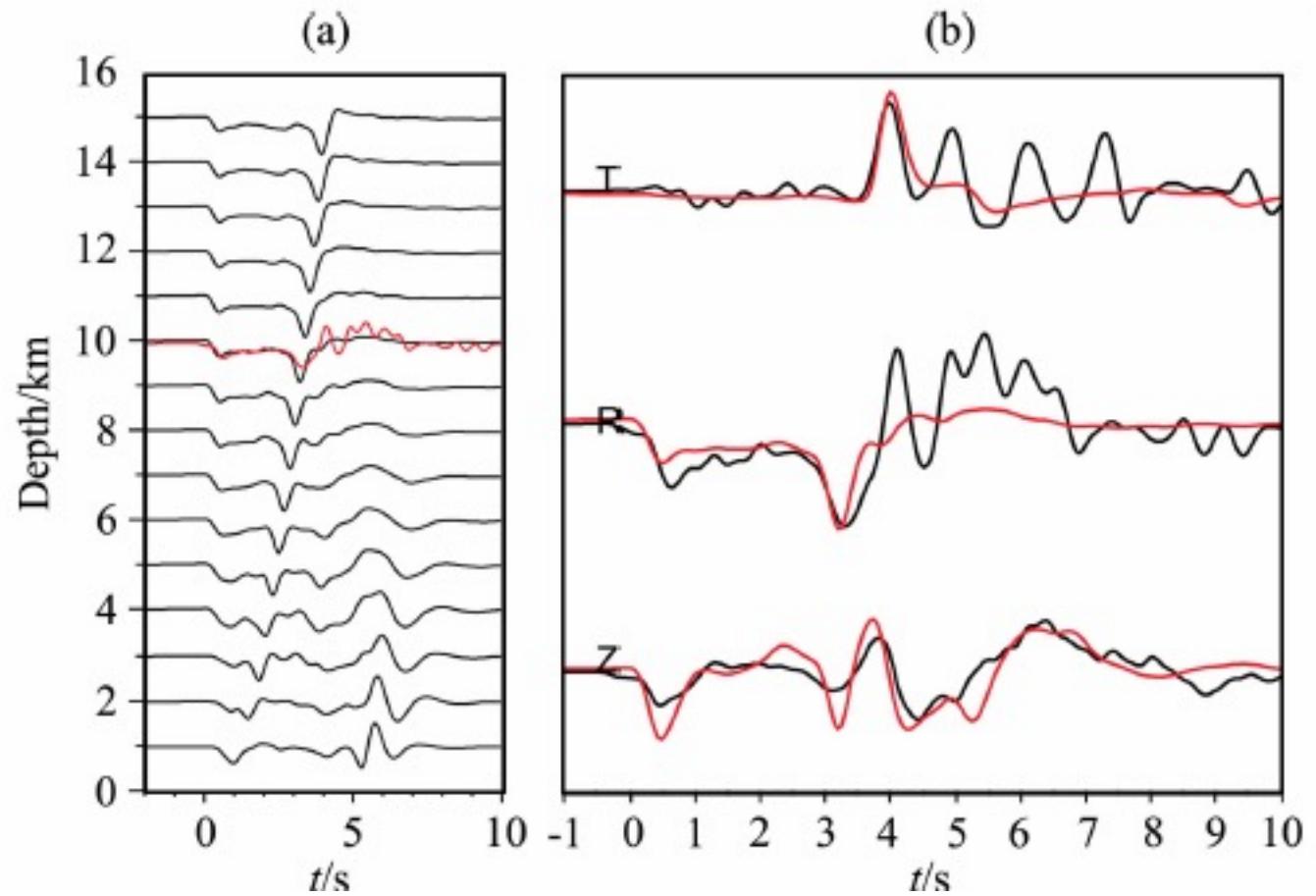
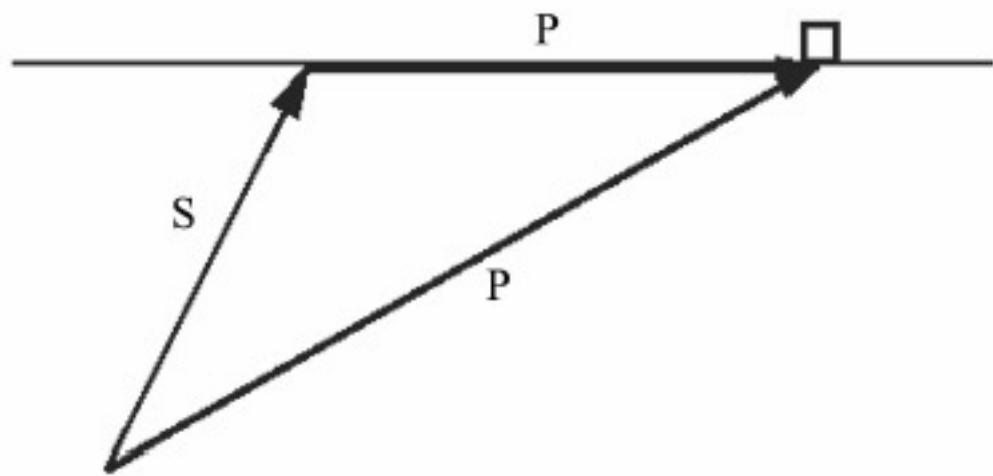
How to determine depth accurately?



Local and regional region: sPL, sPg, sPn, SmS, sSmS, PmP, sPmP, etc.
Global region: pP, sP, pwP, swP, W phase, etc

- Very sensitive to source depth
- Distance: > ~5 times source depth;
- Strong Rg wave when depth < 5~8 km.¹⁸

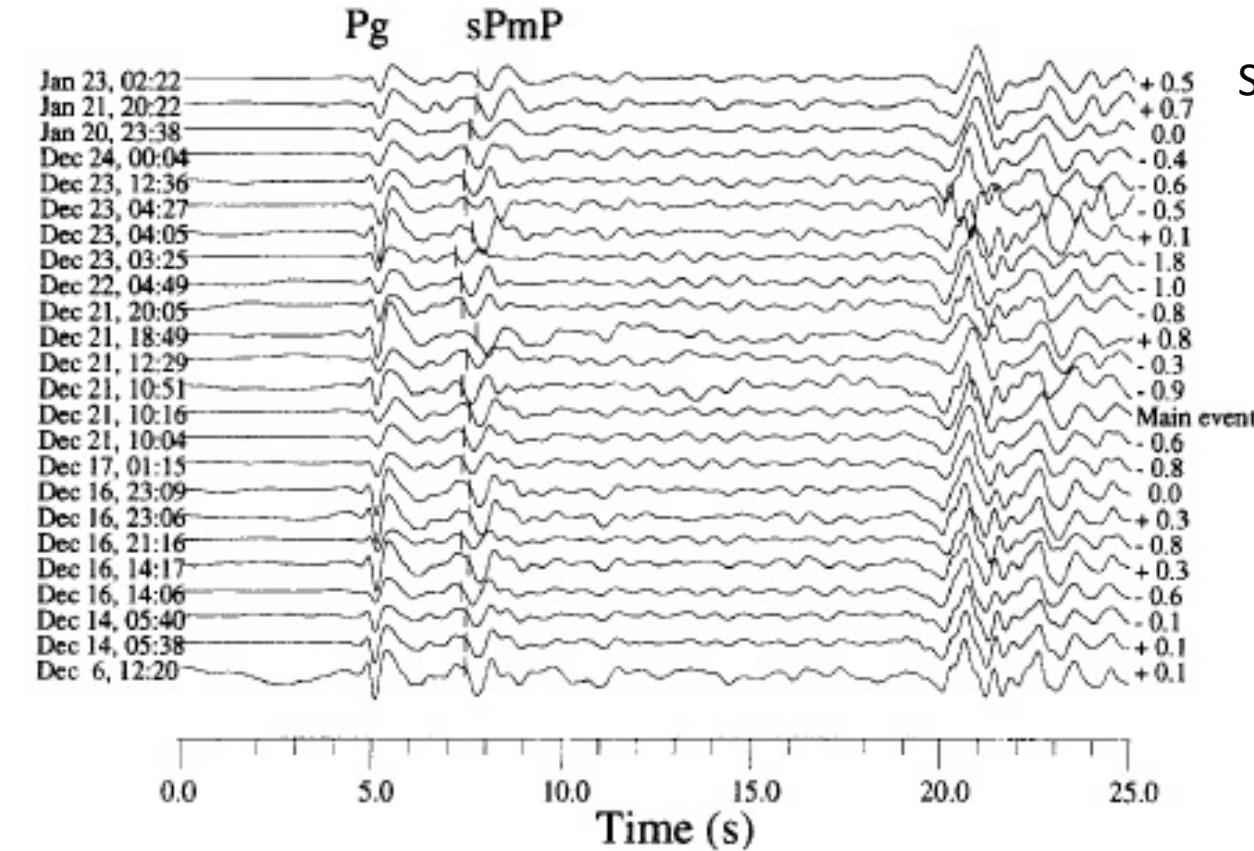
Depth Phase: sPL



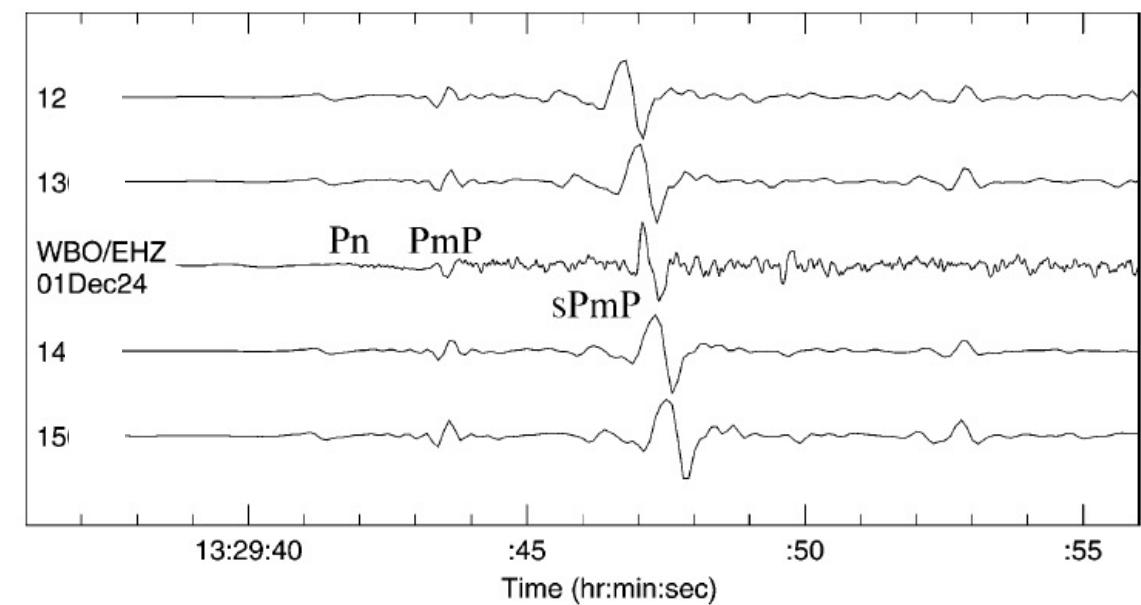
sPL phase

Distance range: 30 ~ 50 km

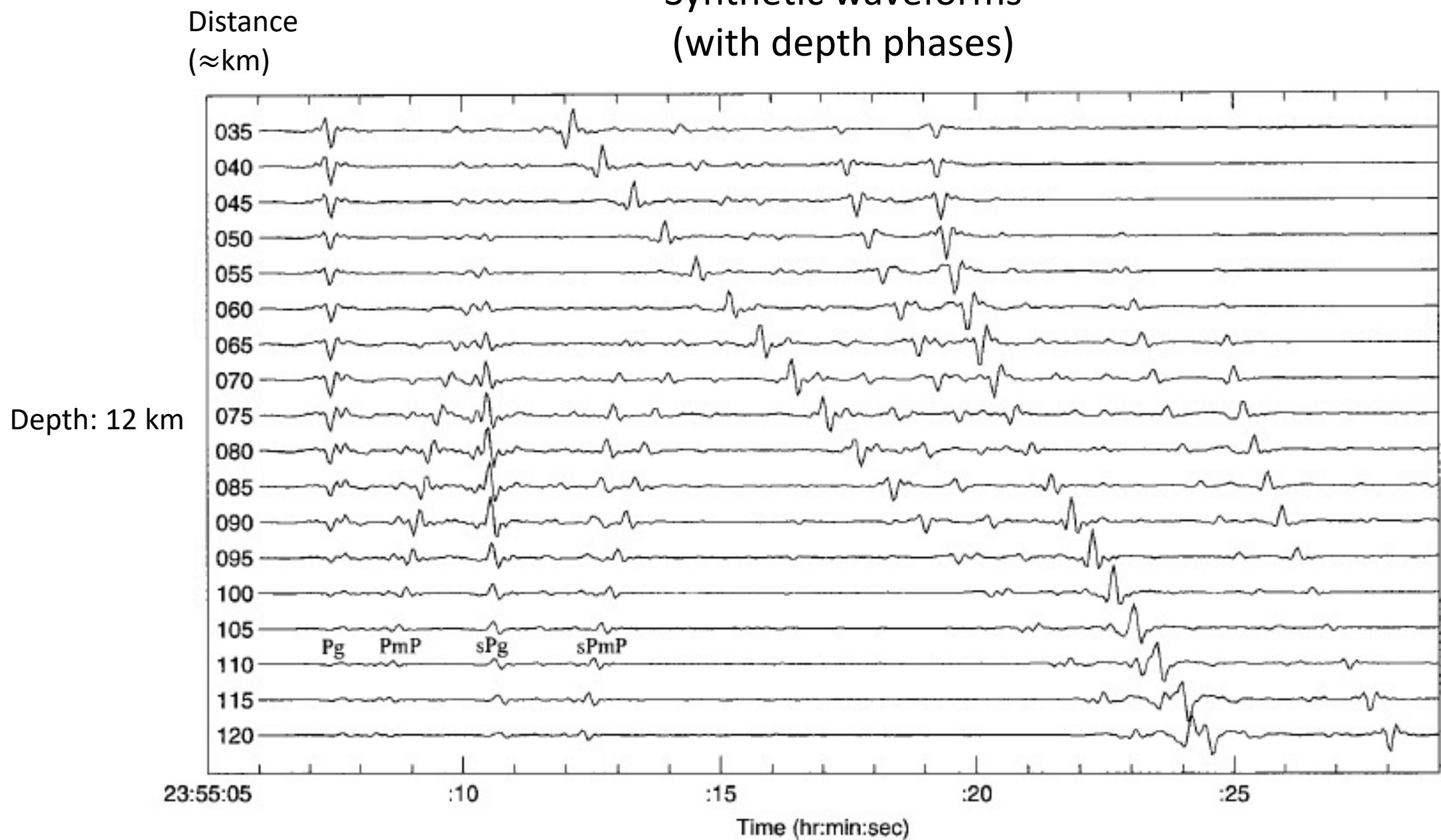
Depth Phase: sPmP



Syn. Depth (km)



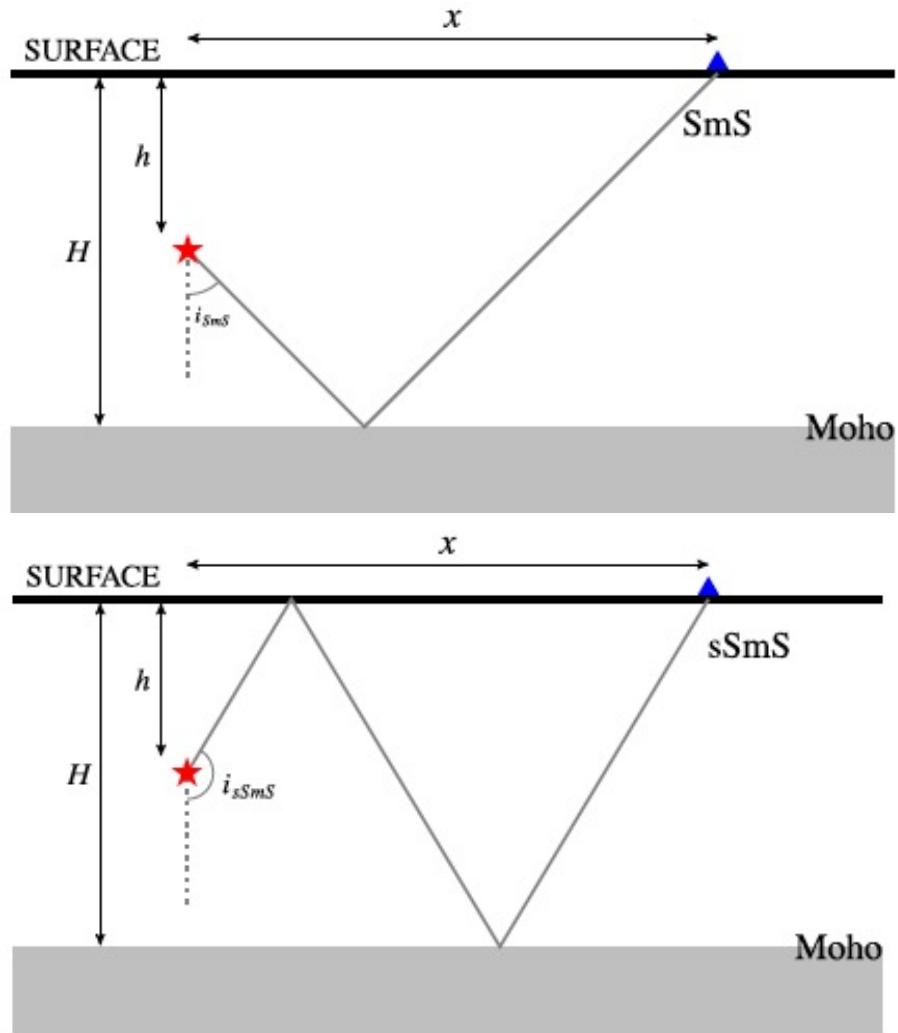
Synthetic waveforms (with depth phases)



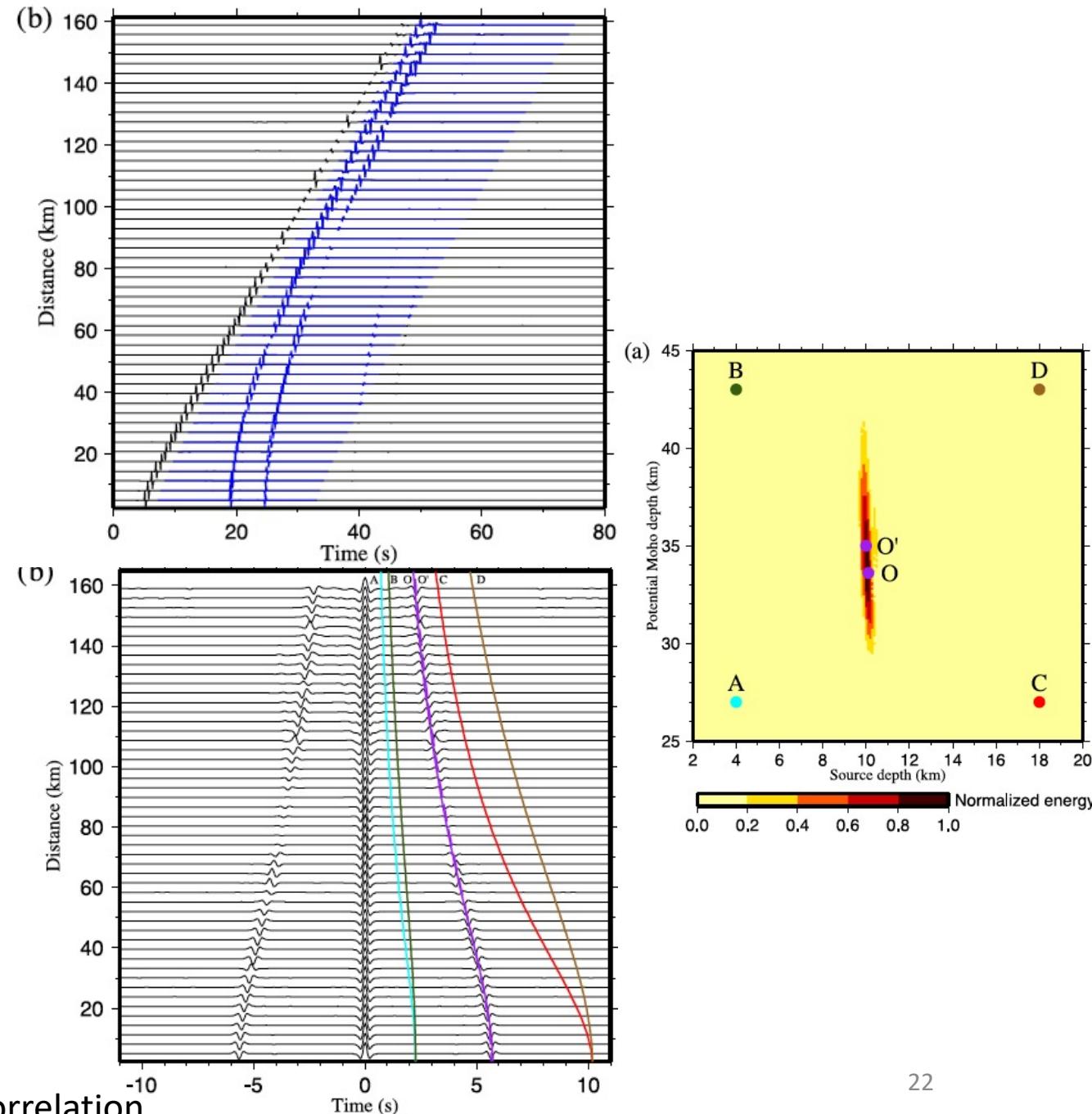
Different depth phases have different recording distances.

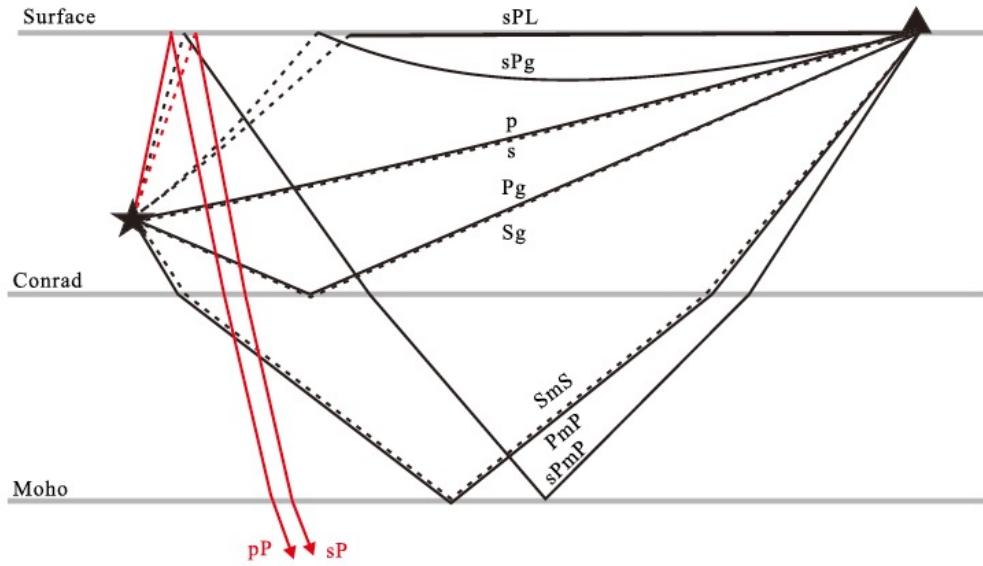
Ma and Atkinson, BSSA, 2006

Depth information extraction: Autocorrelation + Stacking

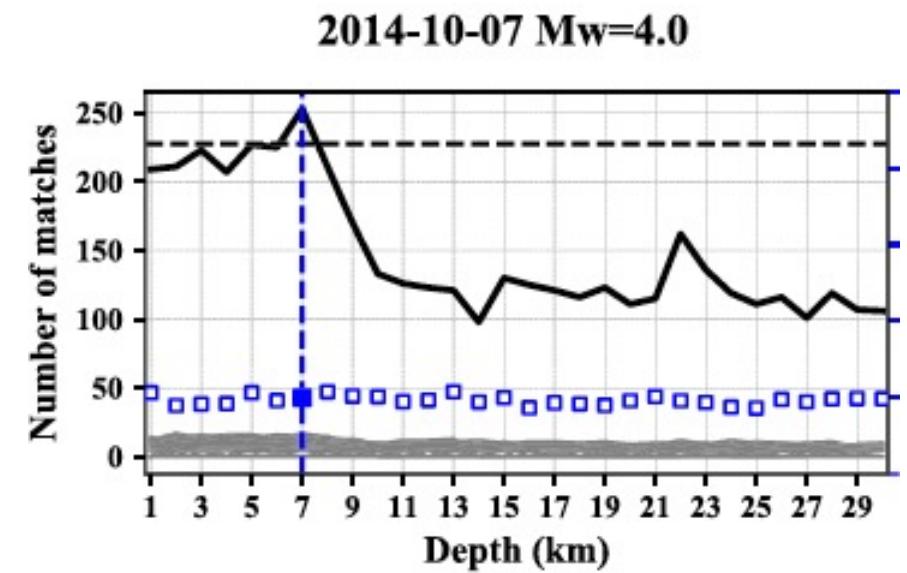
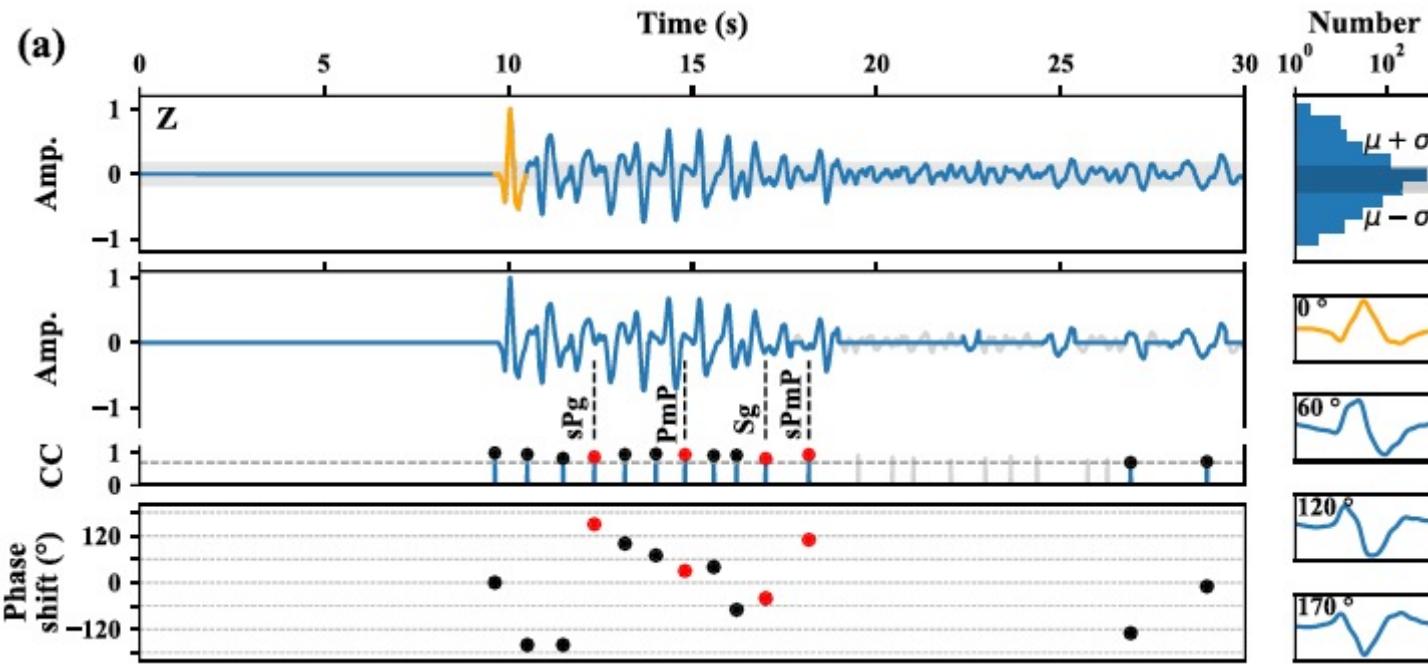


Body wave autocorrelation

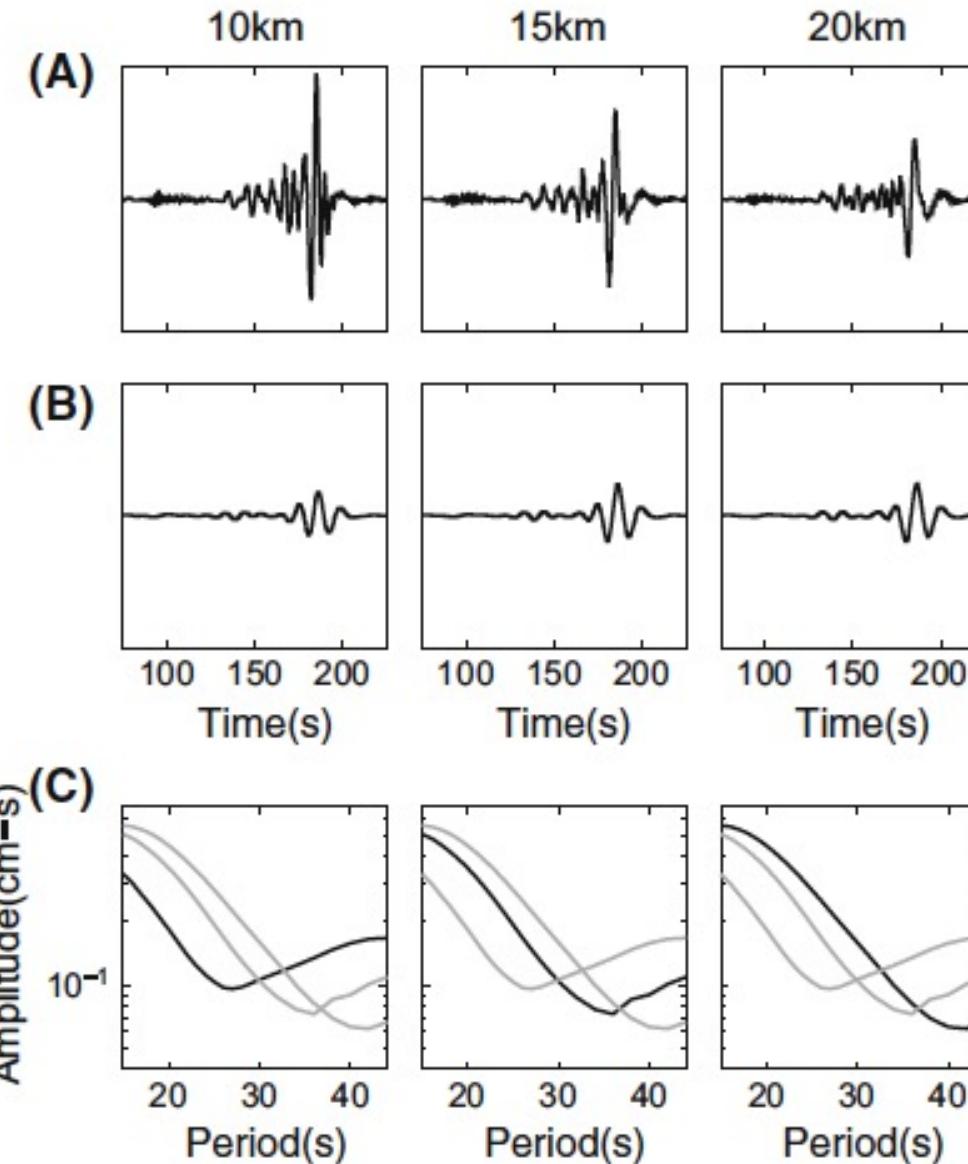
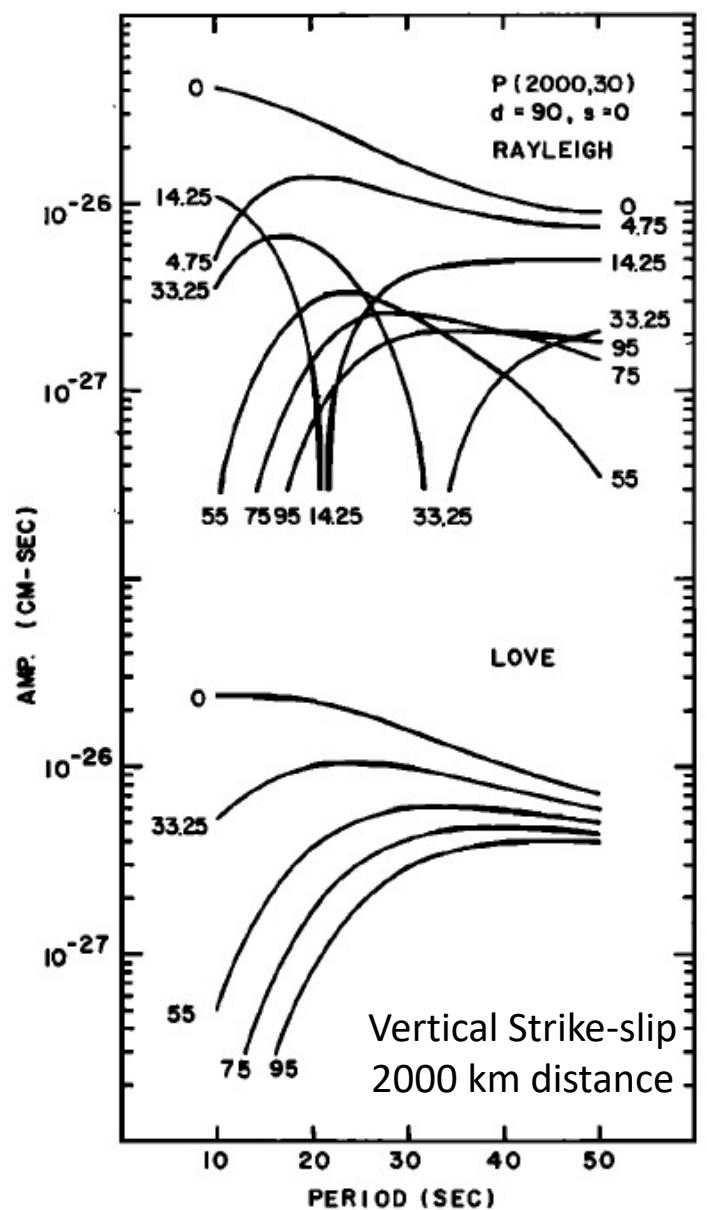




Depth-Scanning: Scan all potential depth phases

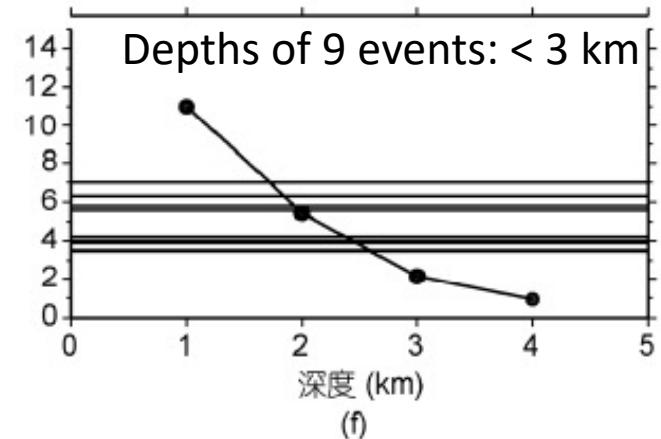
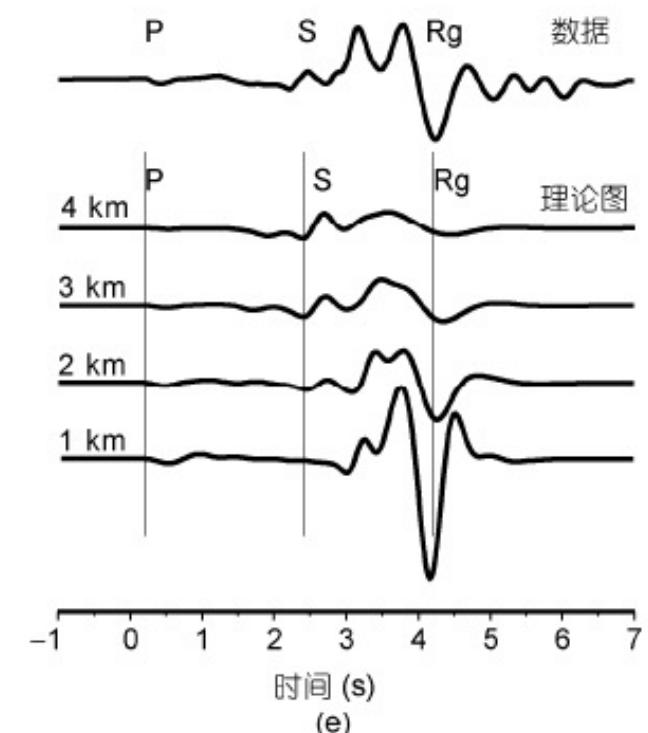
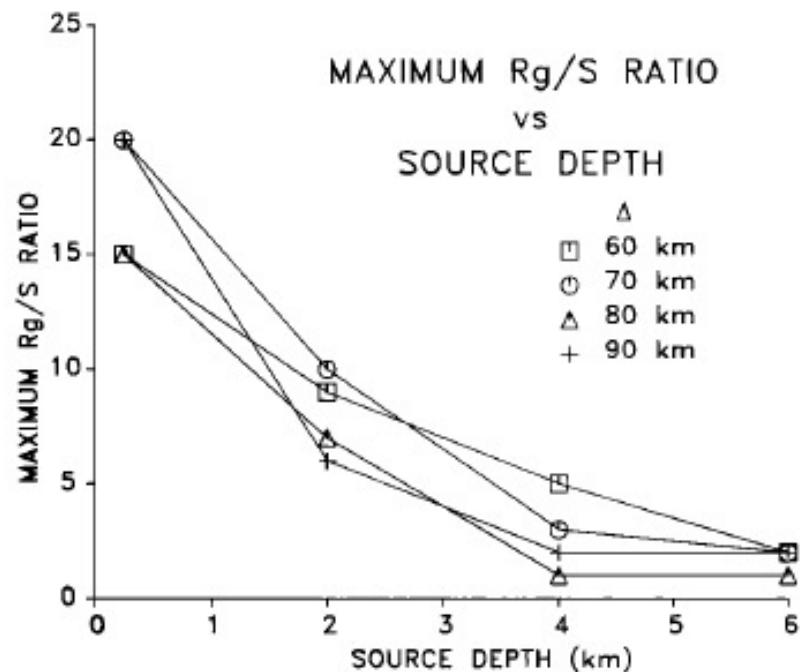
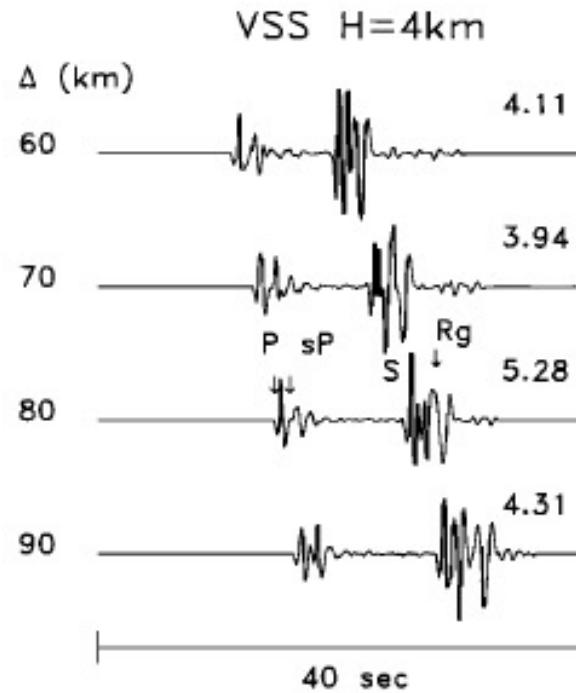


Surface waves: Rayleigh wave amplitude spectral



Fundamental mode Rayleigh wave: 10–50 sec

Surface wave/body wave amplitude ratio (e.g., Rg/S)



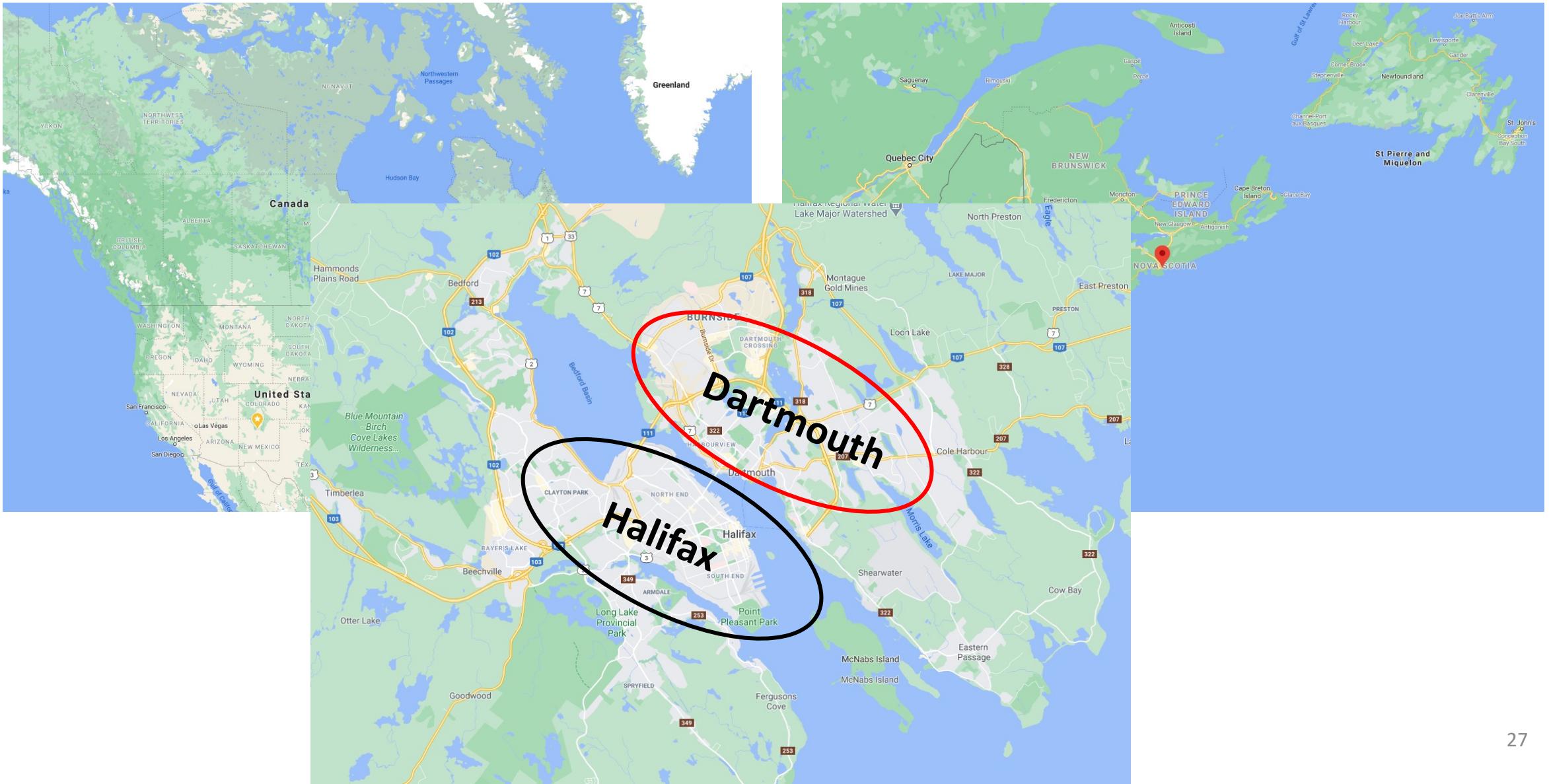
Unknows:

e.g., velocity, focal mechanism, etc.

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- Source characterization for two small earthquakes in Dartmouth, NS
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Where is Dartmouth, Nova Scotia, Canada?



First earthquake: Mar. 1, 2020 at 8:40 pm (local time)

Magnitude: M_N 2.4 (Earthquakes Canada, M_L 1.5 - USGS)
Depth: 2 km (Earthquakes Canada)

Did you feel it?



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(Final catalog M_N 2.4)

Magnitude 2.6 earthquake jolts parts of Dartmouth

Some Dartmouth residents were jolted by a minor earthquake on Sunday night.

Halifax Regional Police said numerous reports came in around 8:40 p.m. from people who felt their homes shaking and heard an "extremely loud noise" that lasted several seconds.

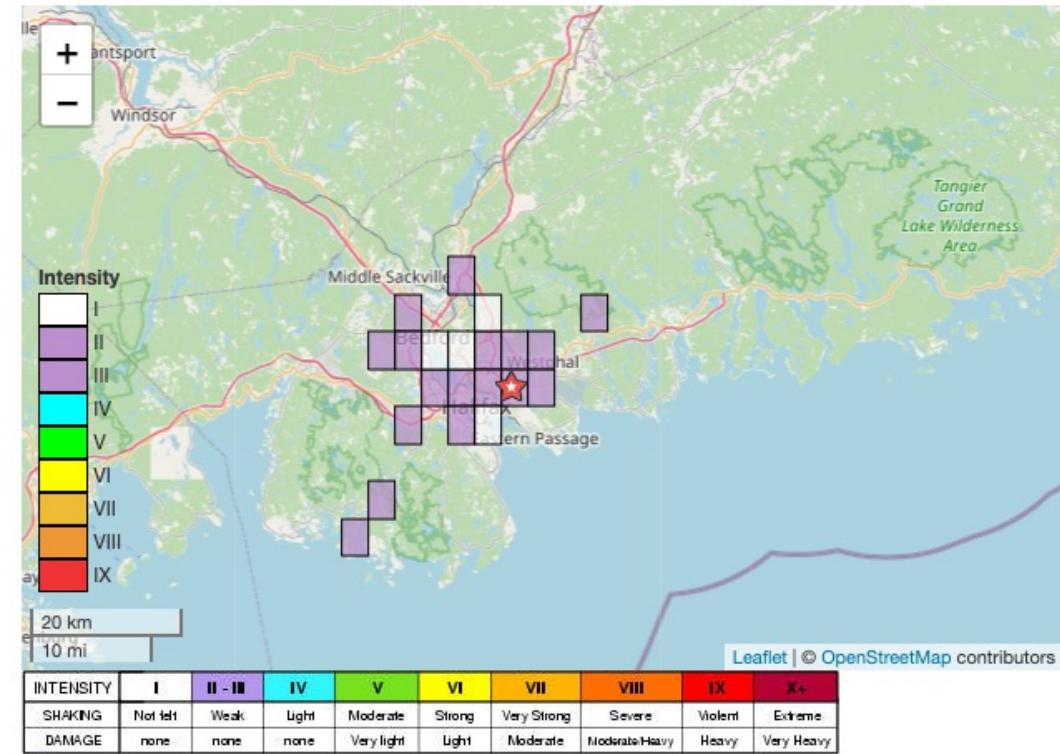
The reports came from the area north east of Lake Mic Mac, including Waverley Rd., Montebello Dr. and Caledonia Rd.

According to Nick Ackerley, a seismologist with Earthquakes Canada, the earthquake was a small magnitude 2.6.

"That is very small, well below the threshold of something that might cause damage," explained Ackerley.

<https://www.halifaxtoday.ca/local-news/magnitude-2-6-earthquake-jolts-parts-of-dartmouth-2131000>

Intensity	Reports
I	26
II	508
III	50
IV	10
V	0
VI	1
VII	1
VIII	0
IX	0
Total	596



★ epicentre

<https://earthquakescanada.nrcan.gc.ca/recent/2020/20200302.0038/dyfi-en.php>

- No reported damages and injuries
- But widely felt by residents with loud noise

Second earthquake: Mar. 3, 2020 at 00:42 am (local time)



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Aftershock shakes parts of Dartmouth, says Earthquakes Canada

Earthquakes Canada says an aftershock struck the Westphal and Montebello areas of Dartmouth early Tuesday morning.

Seismologist Nick Ackerley says the aftershock was a magnitude 2.6, the same magnitude as the earthquake on Sunday night that impacted the neighbourhoods.

"The typical aftershock sequence is that the largest aftershock is about a unit of magnitude smaller than the foreshock, so already we're deviating from that a little bit," explained Ackerley.

In a release issued early Tuesday morning, Halifax Regional Police said numerous reports came in around 12:42 a.m. on Tuesday from people in East Dartmouth who felt their homes shaking and heard what sounded like an explosion.

There were no injuries or damage reported.

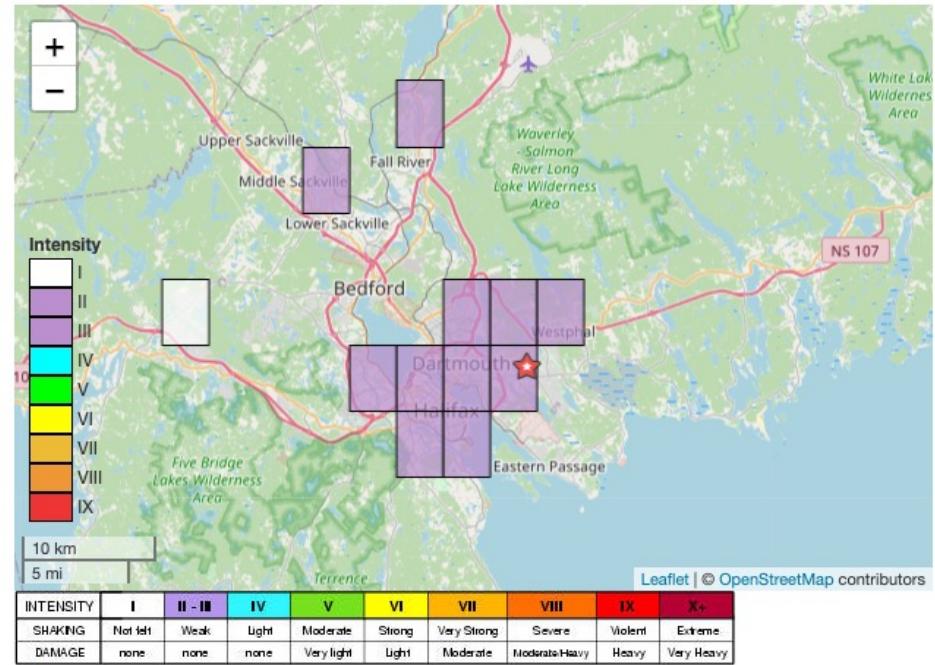
Ackerley says those loud noises people in the area heard, both on Tuesday morning and Sunday night during the first earthquake, are a result of how shallow these events were.

<https://www.halifaxtoday.ca/local-news/aftershock-shakes-parts-of-dartmouth-says-earthquakes-canada-2133739>

Magnitude: M_N 2.6 (Earthquakes Canada, M_L 2.1 - USGS)
Depth: 2 km (Earthquakes Canada)

Did you feel it?

Intensity	Reports
I	8
II	206
III	82
IV	10
V	1
VI	0
VII	0
VIII	0
IX	0
Total	307

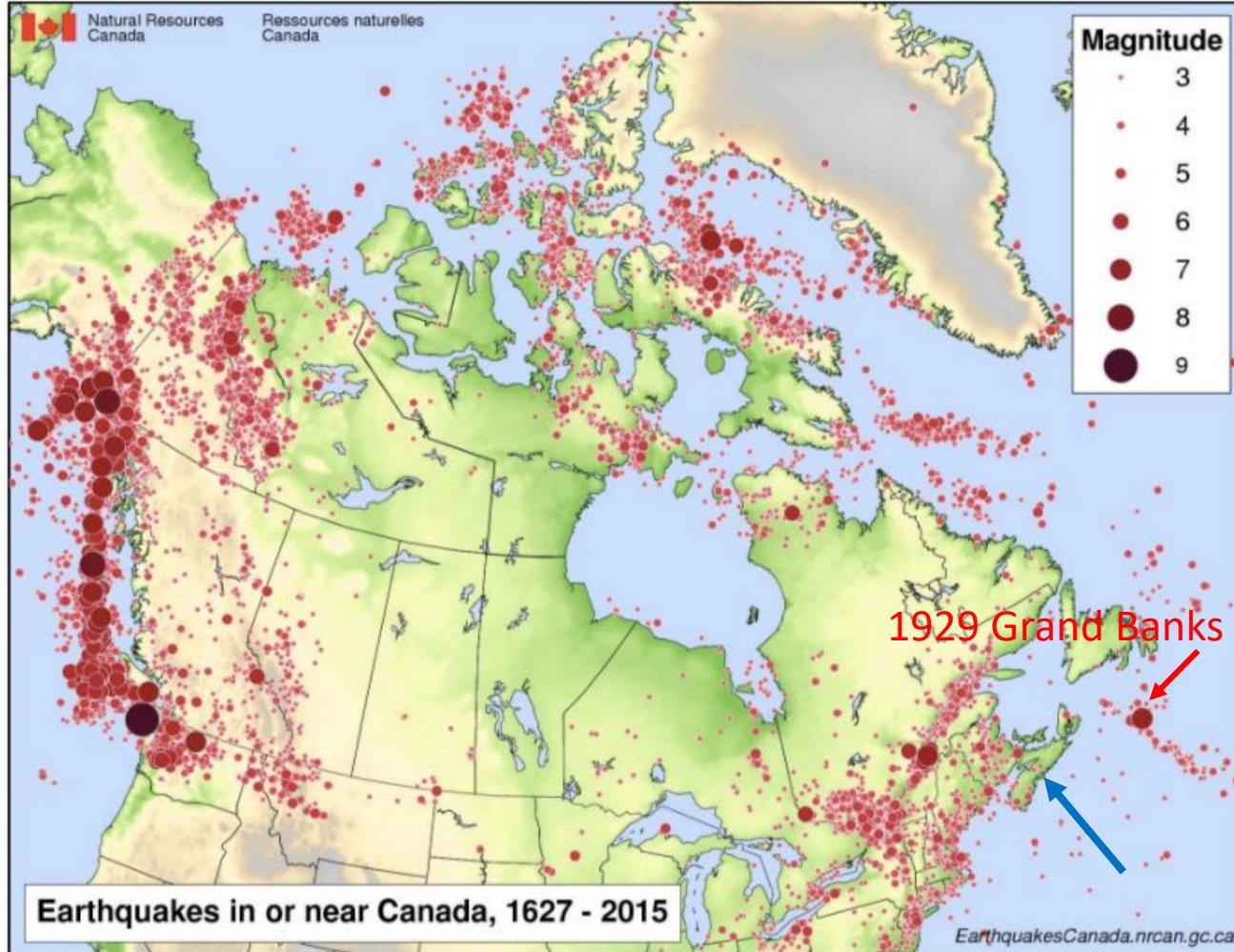


★ epicentre

<https://earthquakescanada.nrcan.gc.ca/recent/2020/20200303.0442/dyfi-en.php>

- No reported damages and injuries
- But widely felt by residents with loud noise

Seismicity in or near Canada



<https://earthquakescanada.nrcan.gc.ca/historic-historique/caneqmap-en.php>

CTV live interview



Questions

- What are their exact locations? (epicenters vs. shaking report)
- How shallow are the two earthquakes? (extreme loud sound, like explosion)
- How about the aftershocks and historical events?
- What are the potential mechanisms for the two earthquakes?

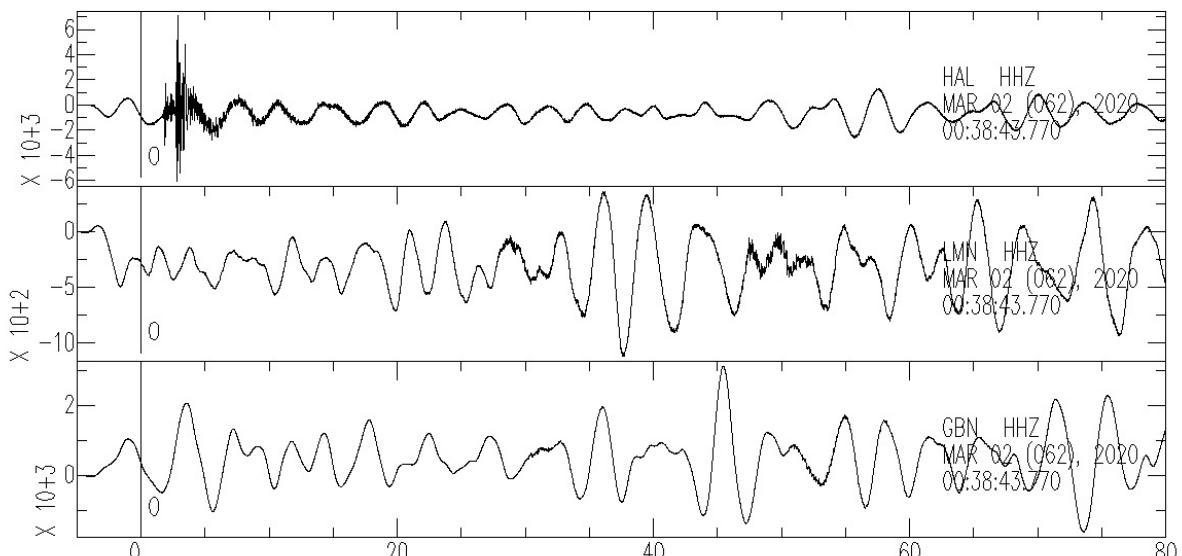
Three seismic stations (<200 km)
recorded the two earthquakes



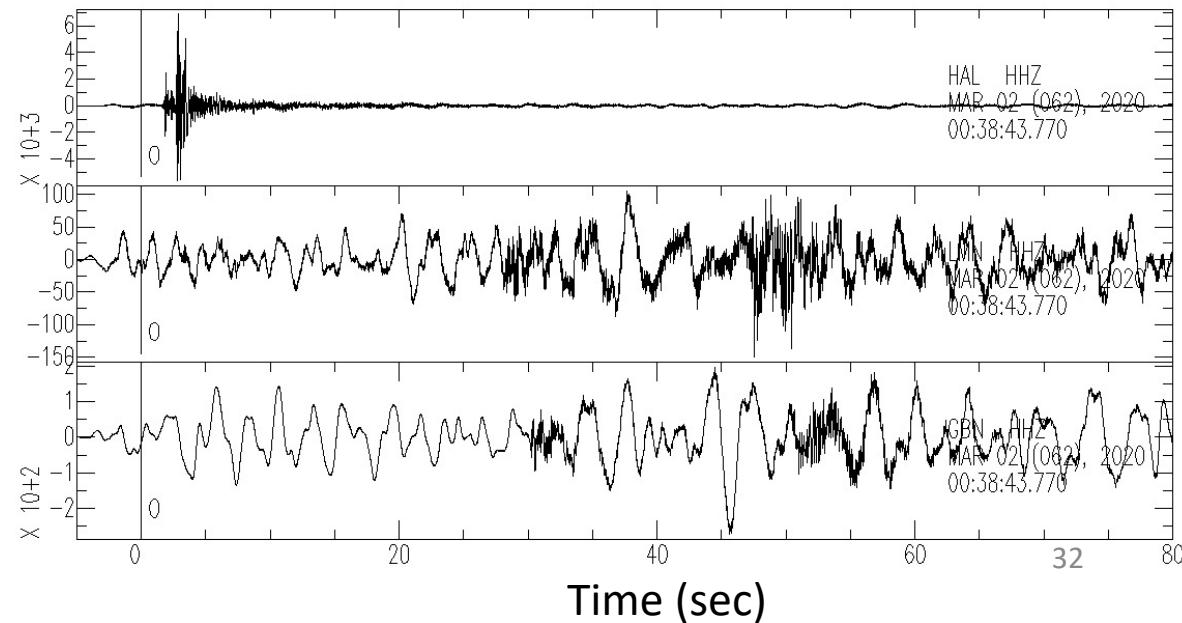
Challenges for pick-based absolute location:

1. Only three stations are available, and low SNR at the two further stations
2. Unknown local velocity model

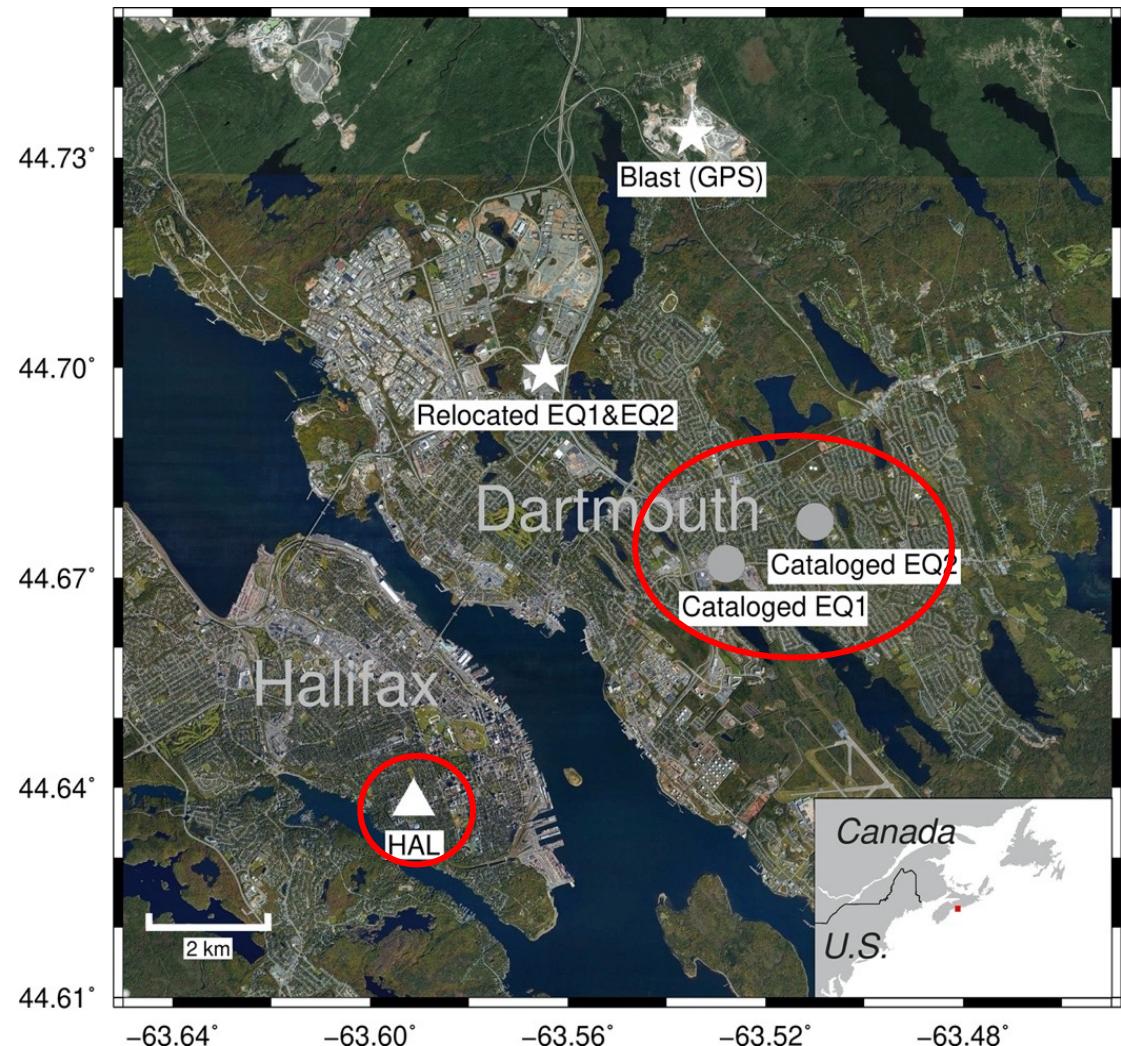
Raw data (broadband)



1Hz High pass filtering (hp c 1)

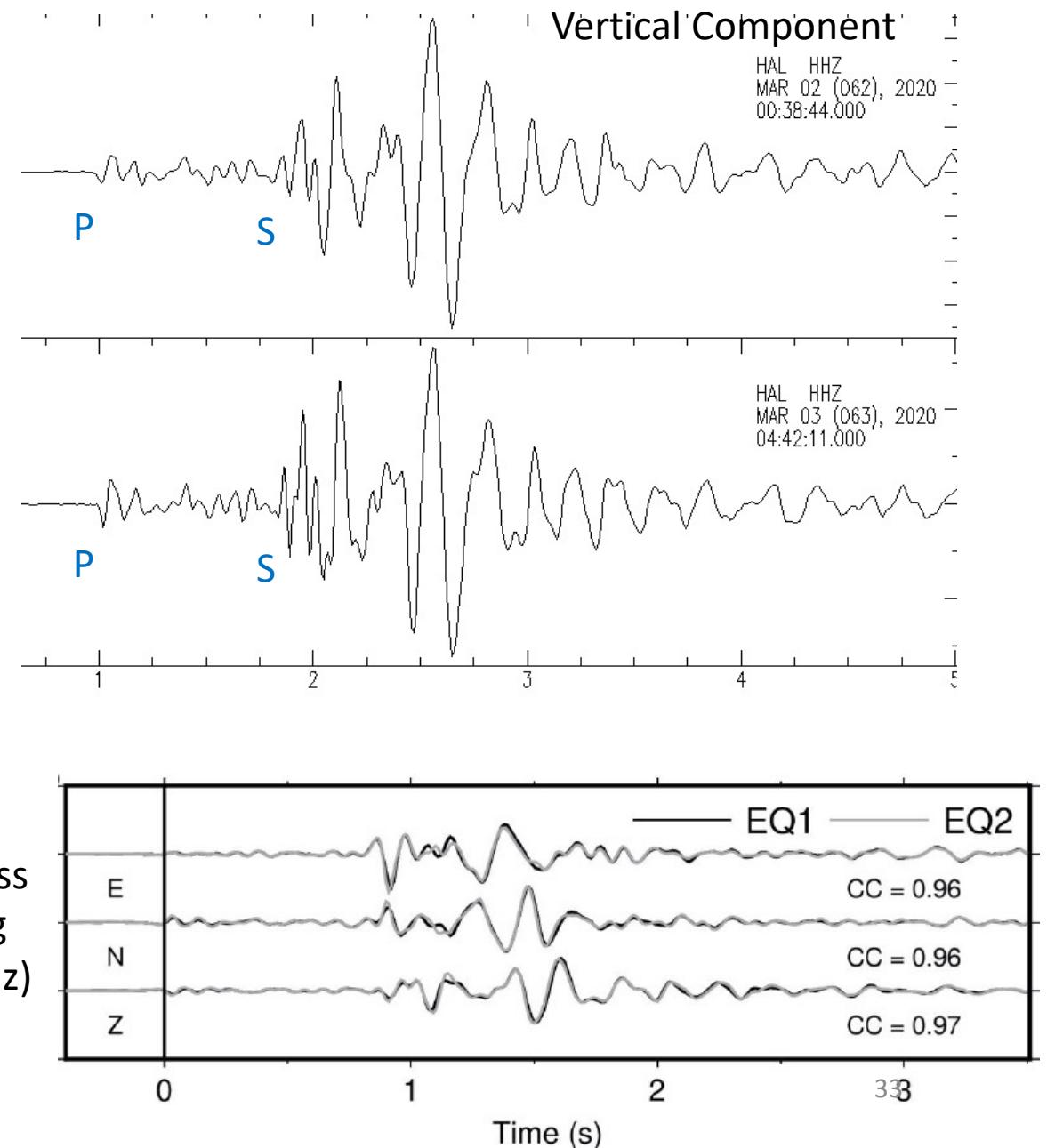


Waveforms at station HAL

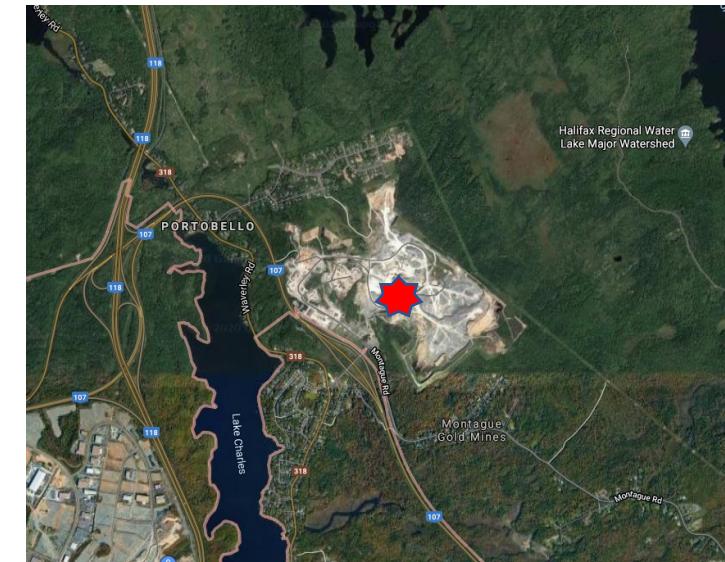
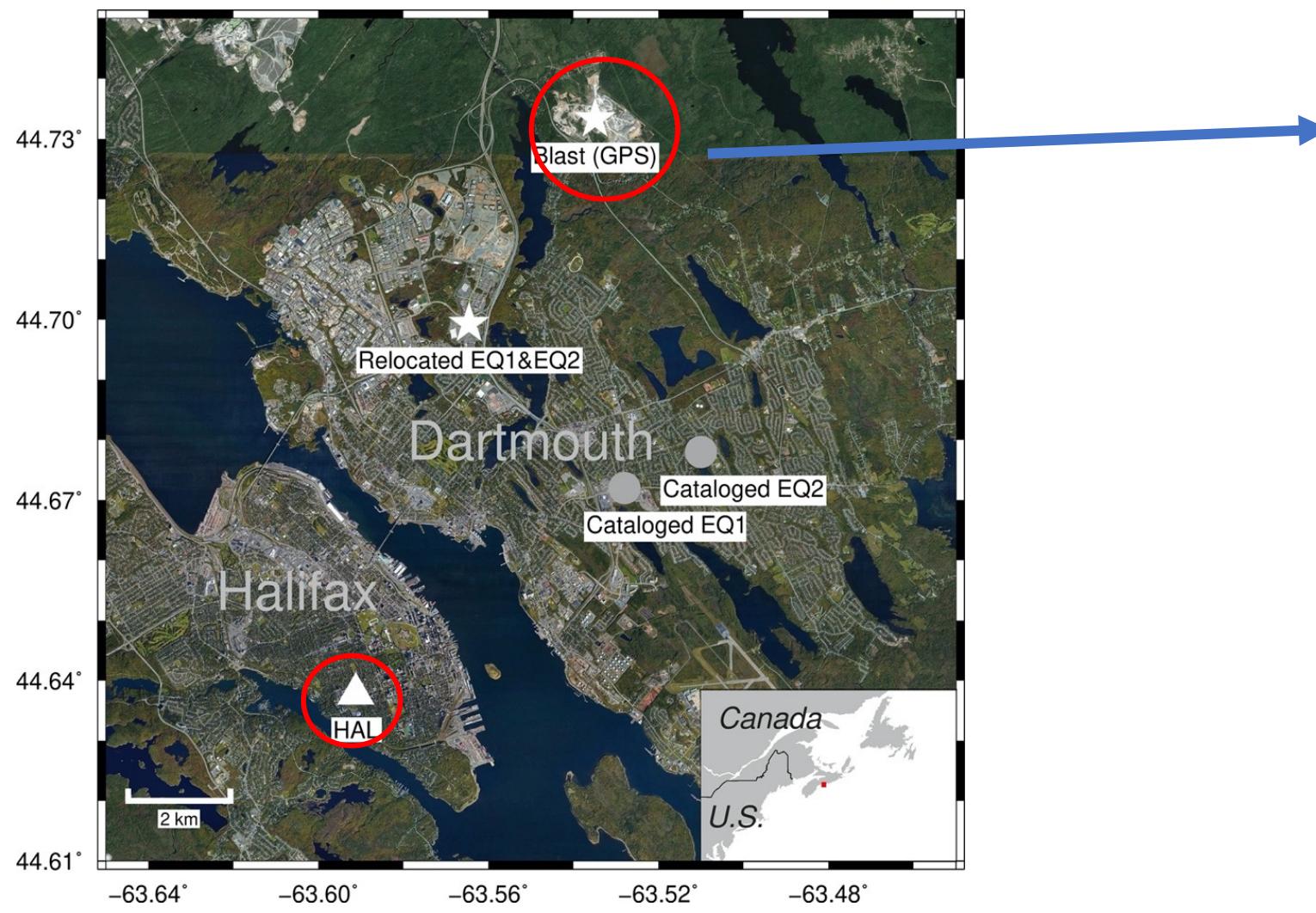


High cross-correlation:
approximately co-located earthquakes

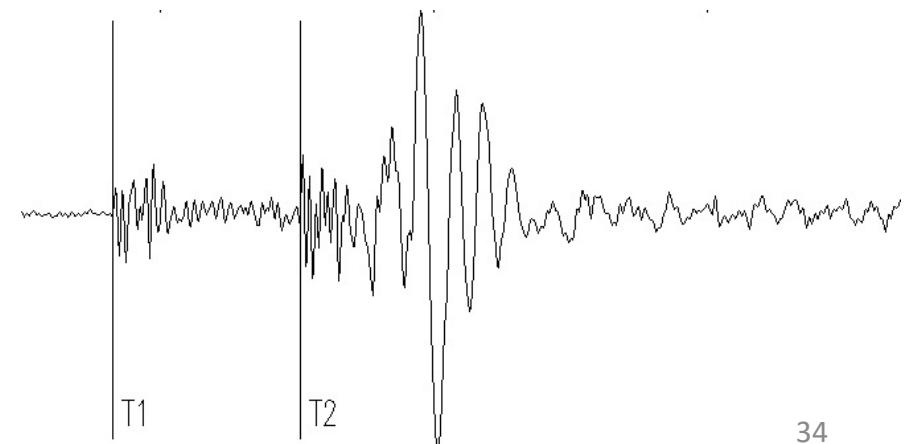
Band-pass
filtering
(3 – 12 Hz)



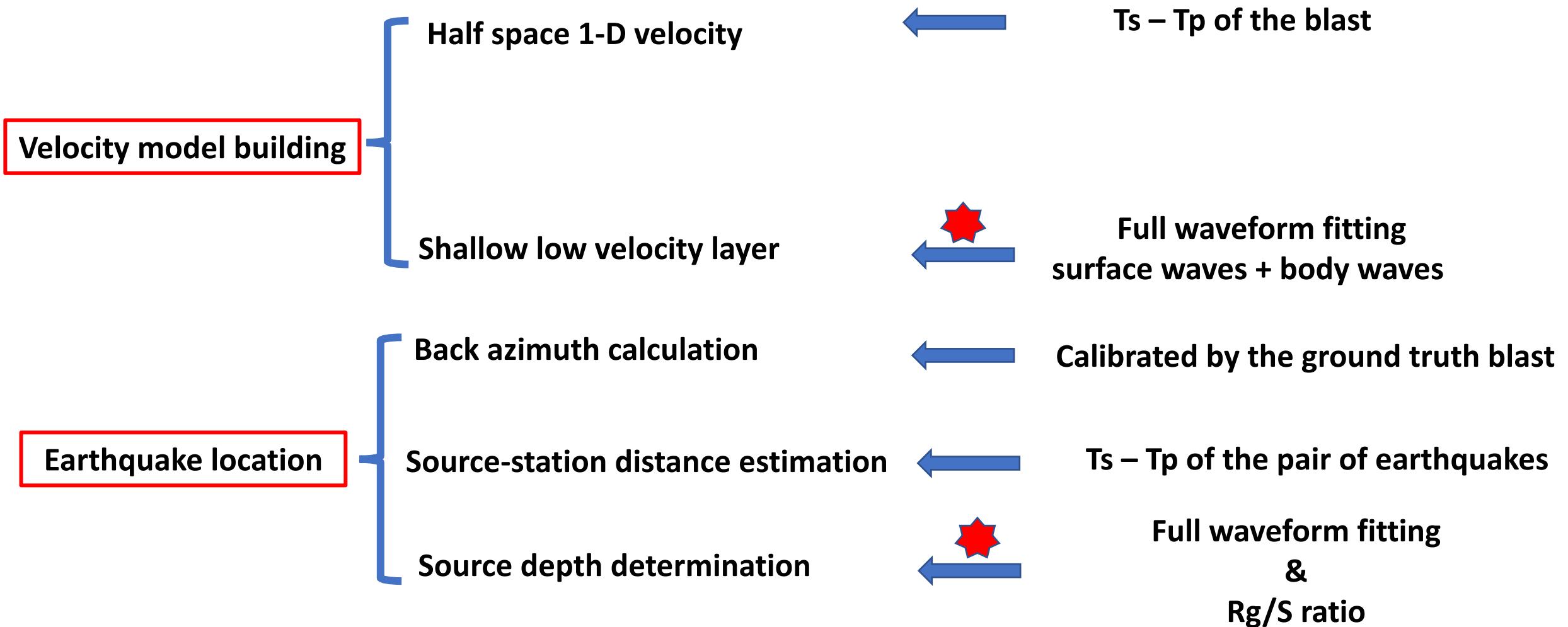
Quarry blast nearby



Quarry blast with GPS location
on March 3, 2020 (M_N 2.0)

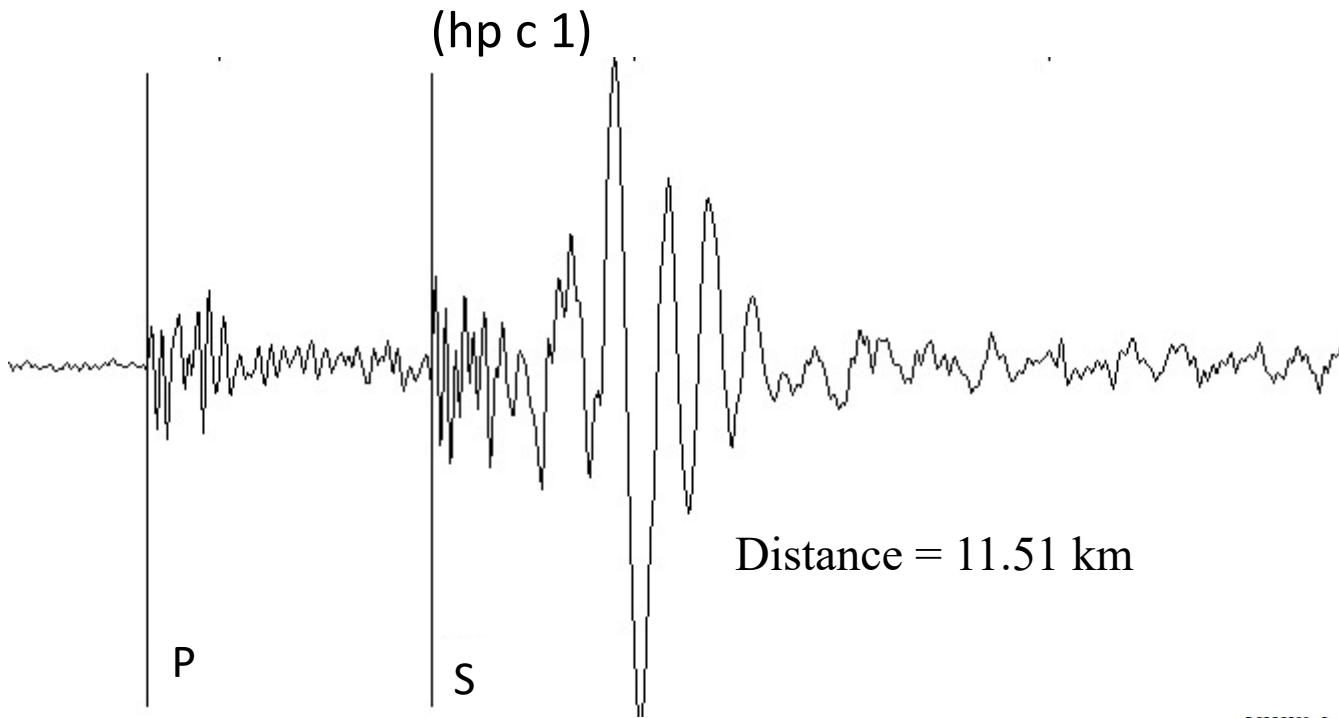


Workflow



Half-space velocity estimation

Vertical component of the Blast



$$T_{S-P} = 1.37 \text{ sec}$$

$$V_p = 6.15 \text{ km/s}$$

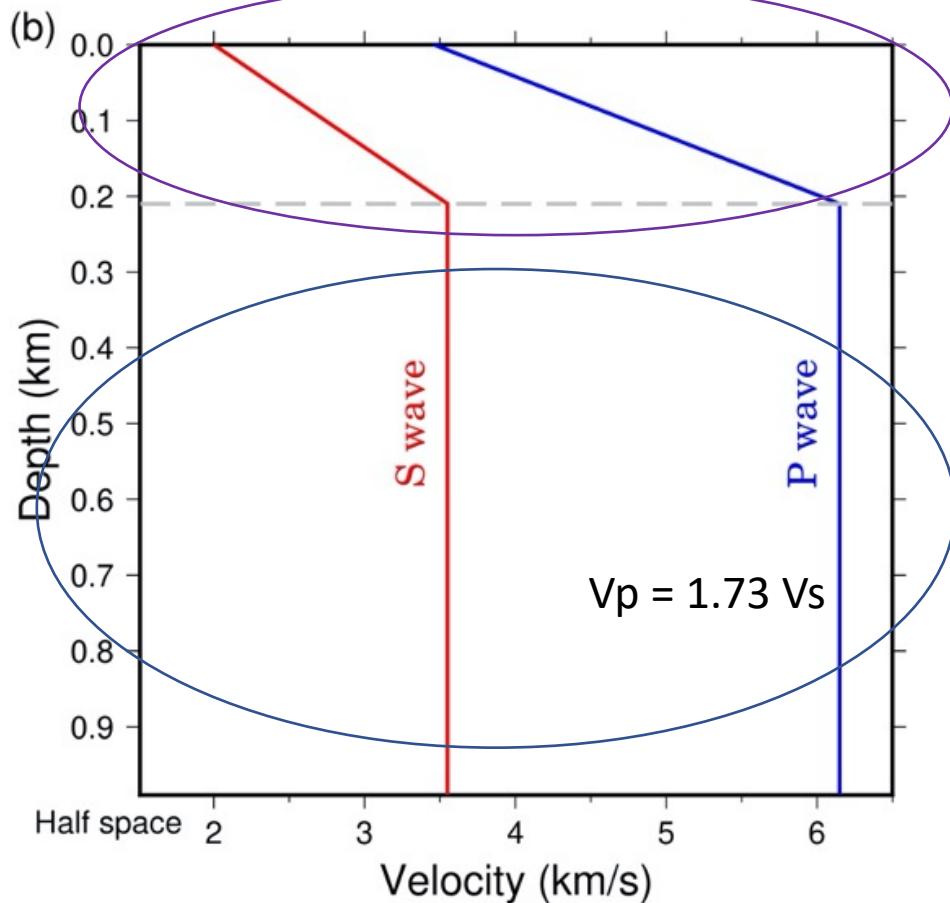
$$V_s = 3.55 \text{ km/s}$$

$$\text{With } V_p/V_s = 1.73$$

Table 1. Crustal model for eastern Canada (modified from Mereu *et al.* 1986).

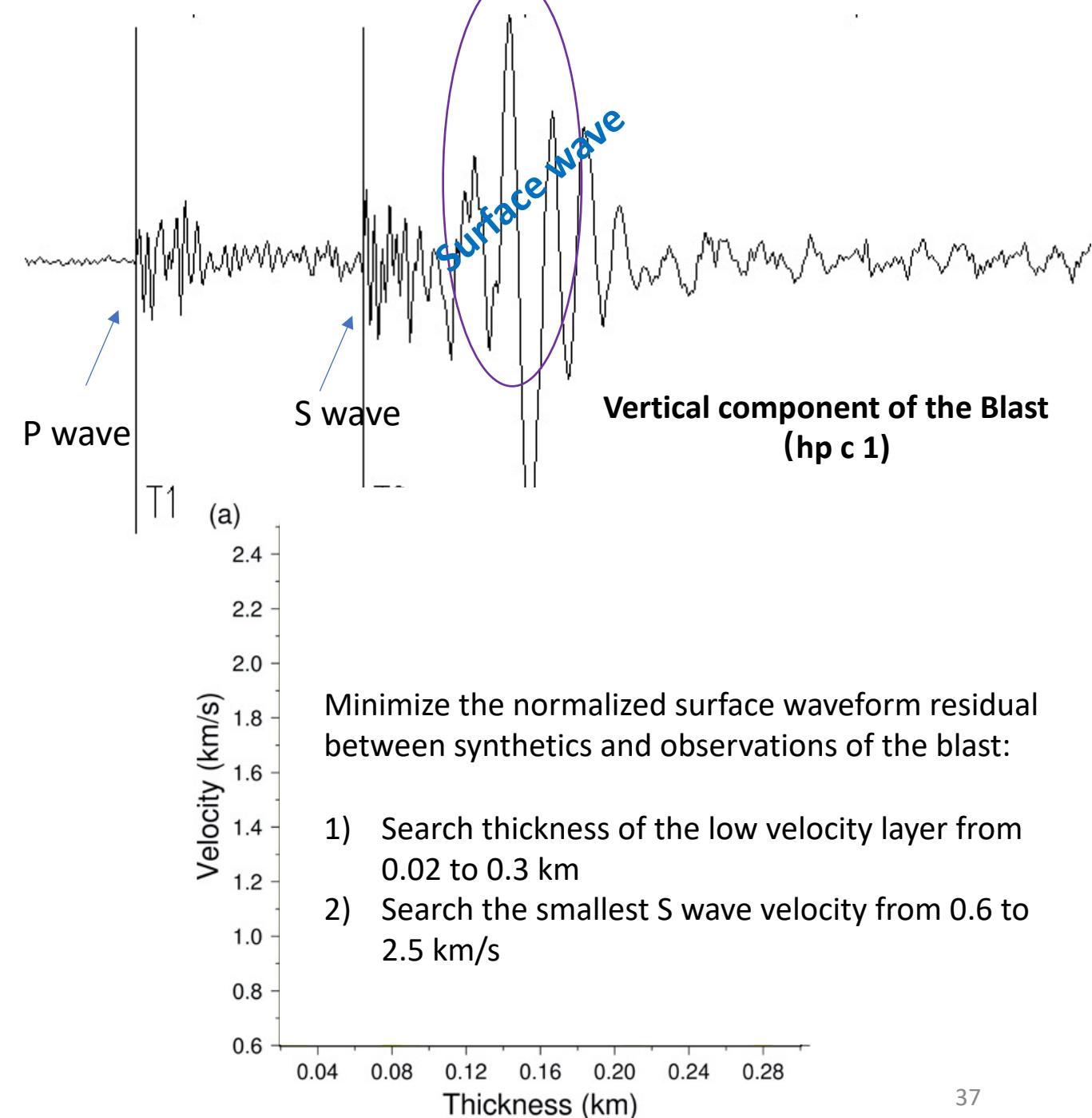
No	Thickness (km)	V_p (km s ⁻¹)	V_s (km s ⁻¹)	Density (g cm ⁻³)	Q_p	Q_s
1	8	6.25	3.61	2.53	1350	600
2	9	6.50	3.75	2.63	1350	600
3	7	6.60	3.81	2.67	1350	600
4	6	6.70	3.87	2.71	1350	600
5	6	7.10	4.10	2.87	1350	600
6	Moho	8.00	4.62	3.23	1350	600

Velocity model building

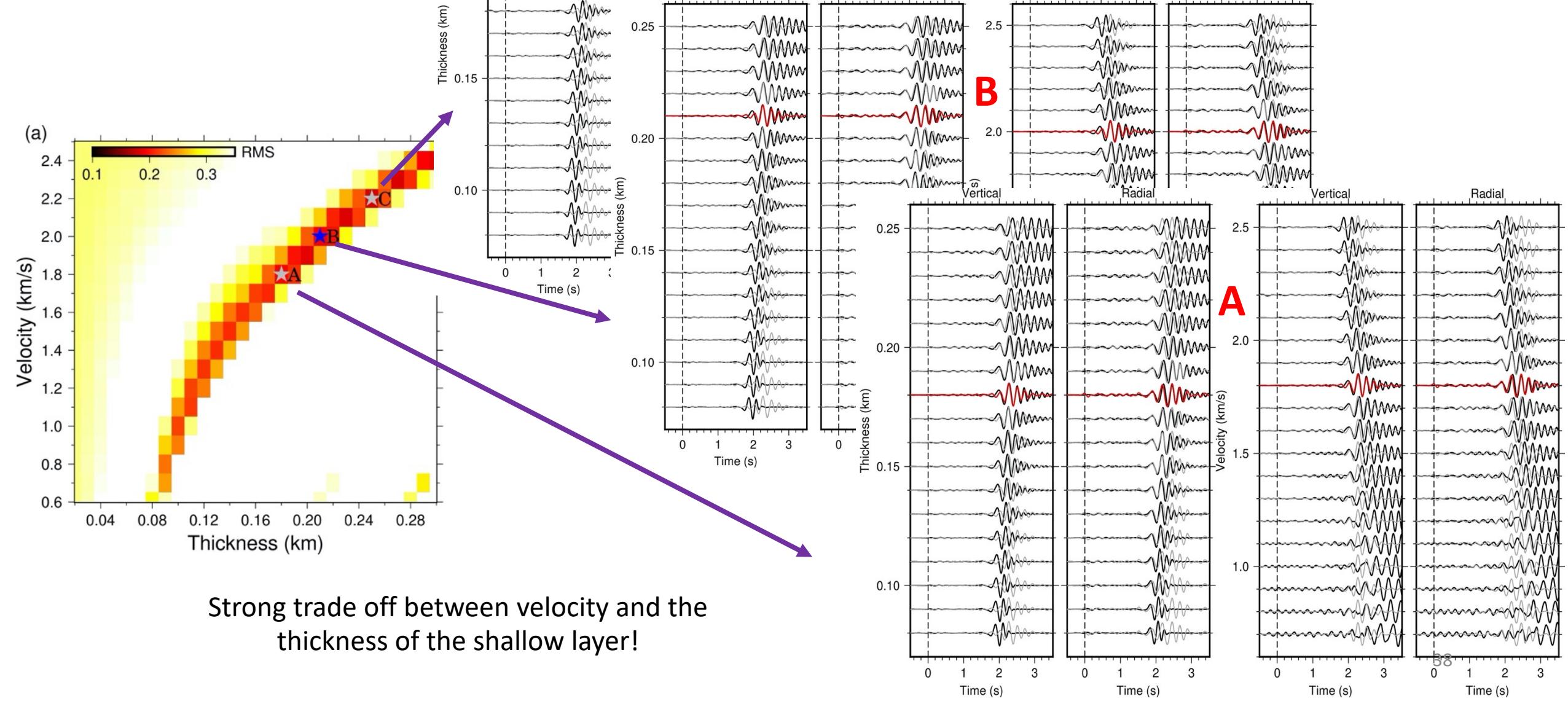


Low velocity layer:

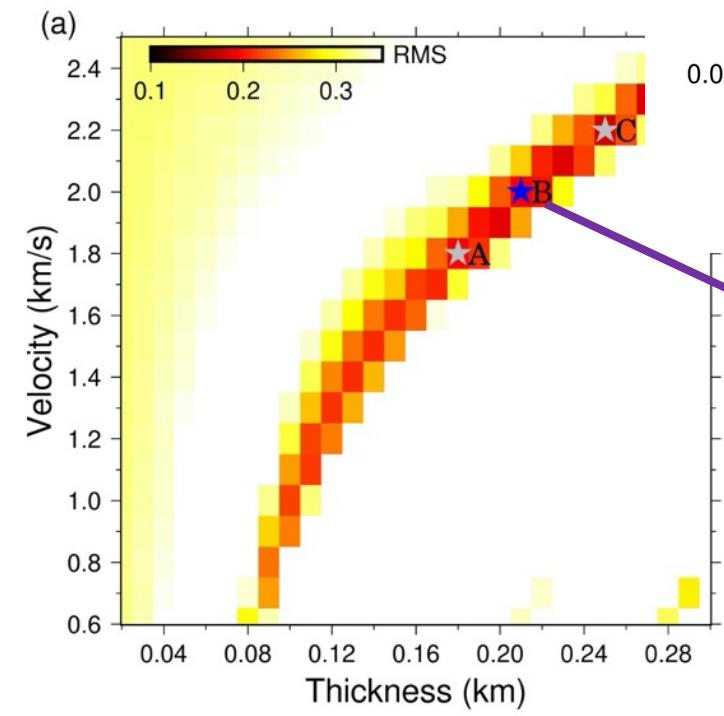
1. Assuming velocity linearly increases with depth
2. P is converted by $v_p/v_s = 1.73$
3. $Q_p=100$; $Q_s=50$.



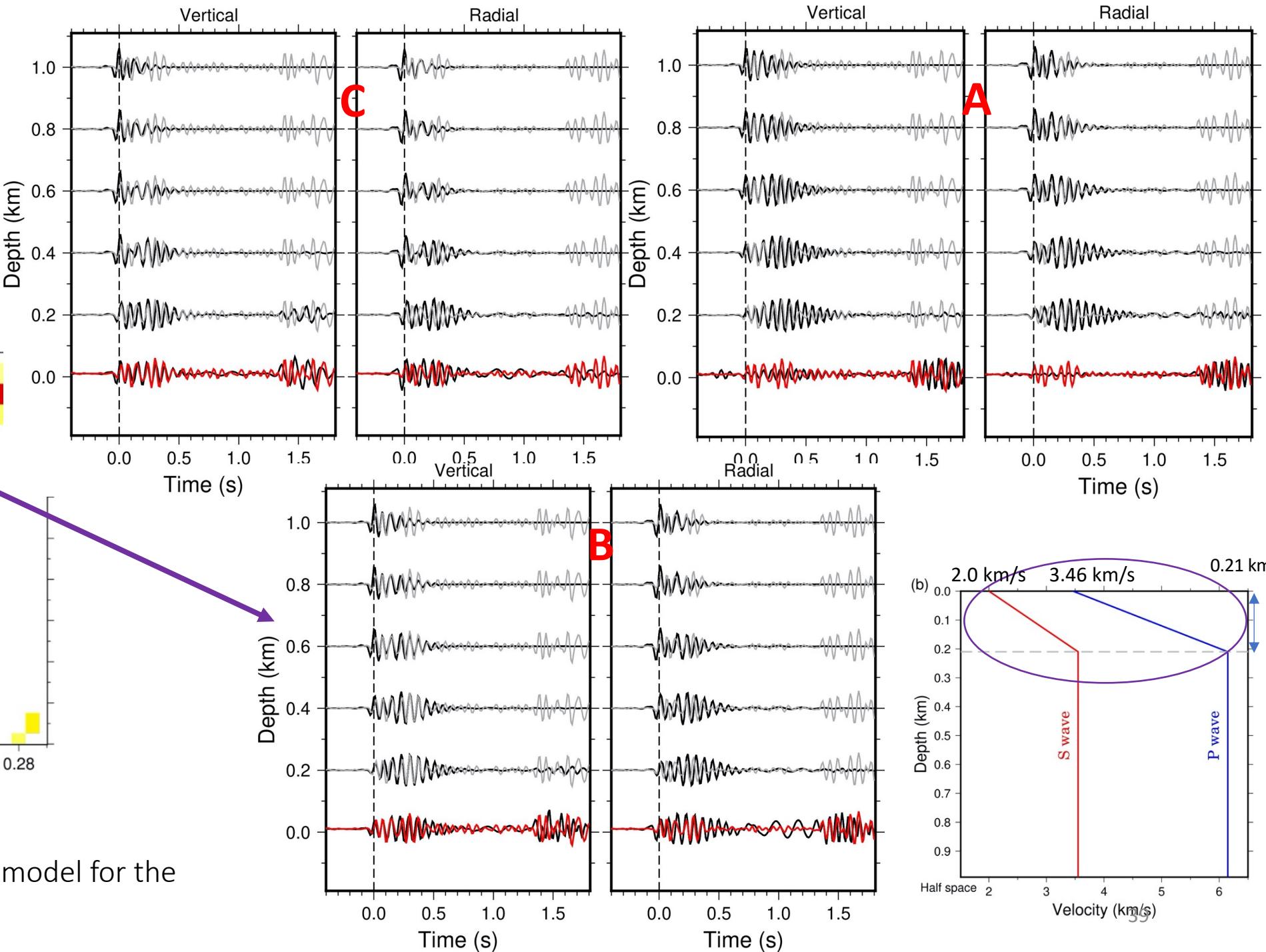
Surface wave fitting (2 -6 Hz)



Body wave fitting (7 - 20 Hz)



Confirm the optimal velocity model for the shallow layer

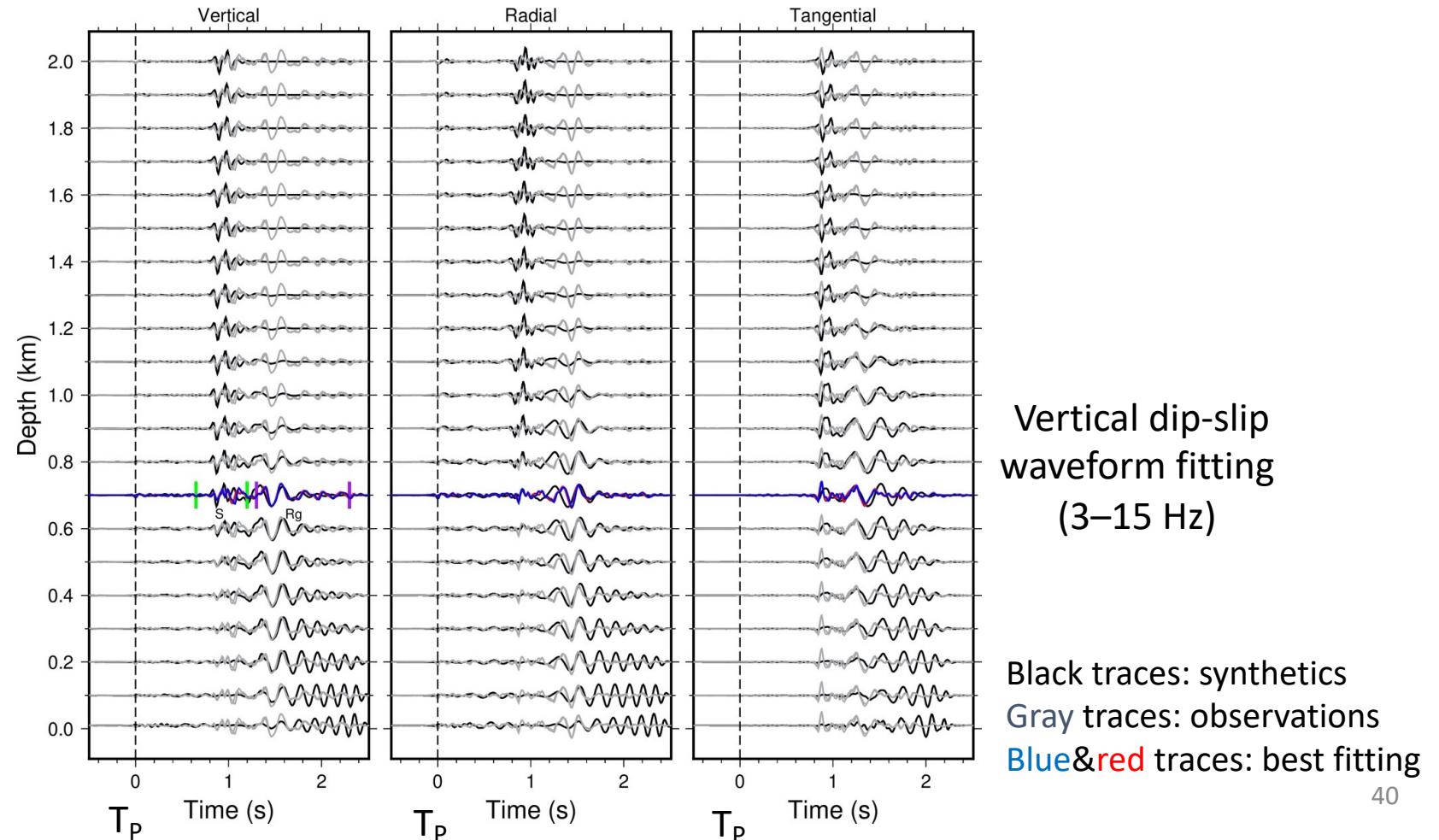


Source depth determination: I. Waveform fitting

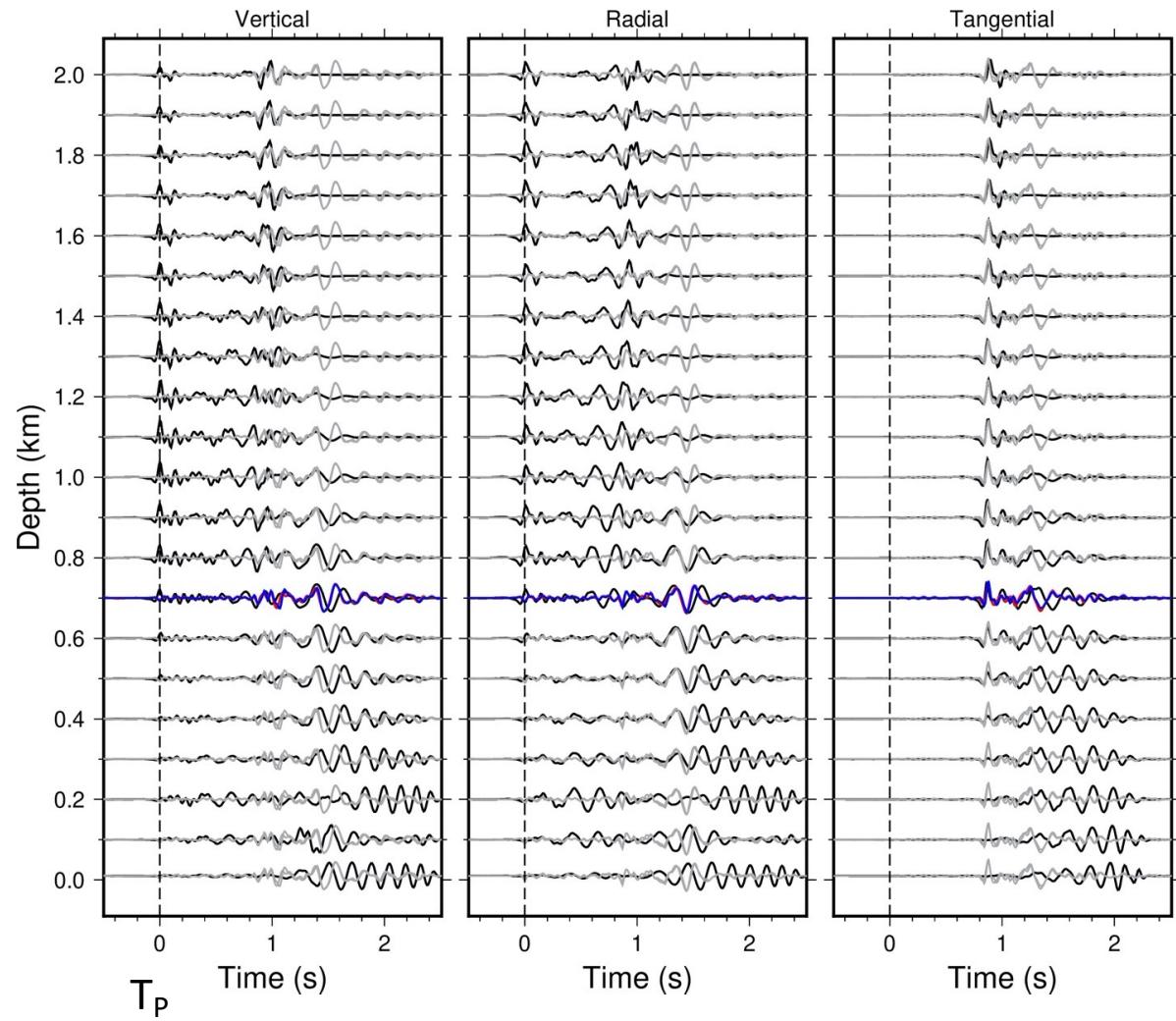
1. Back azimuth (calibrated by the ground truth blast): $17.15^\circ \pm 2.5^\circ$.
2. Source-station distance (roughly estimated from $t_s - t_p$ 0.85 sec with a source depth of 0 km): ~ 7.1 km
3. Focal mechanism (try three fundamental double couple mechanisms, i.e., vertical strike-slip, 45° dip-slip and vertical dip-slip, with an assumption of 0° strike).

The three focal mechanisms suggest a common source depth of 0.7 km.

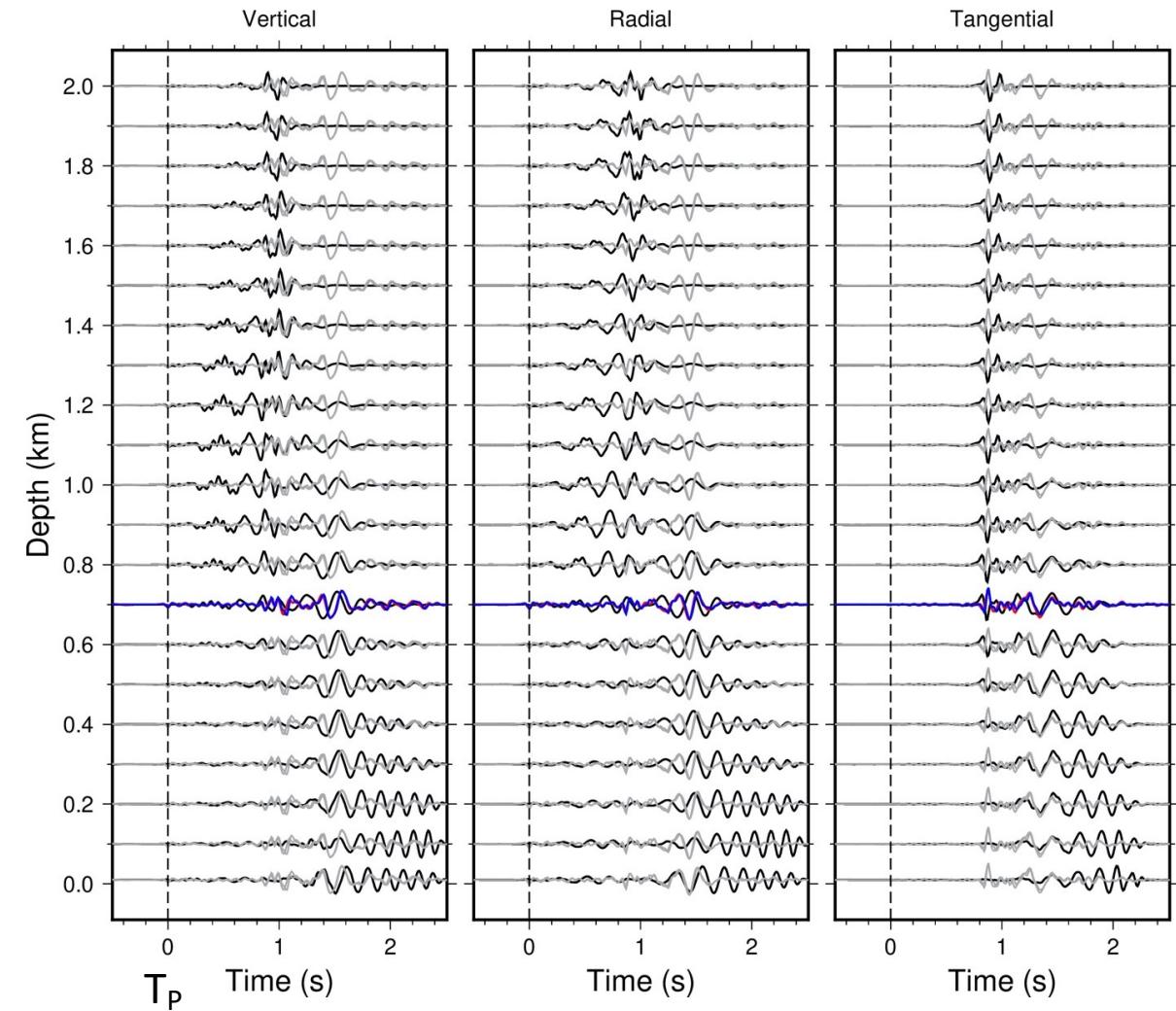
Vertical dip-slip fits best.



Strike-slip
waveform fitting
(3–15 Hz)



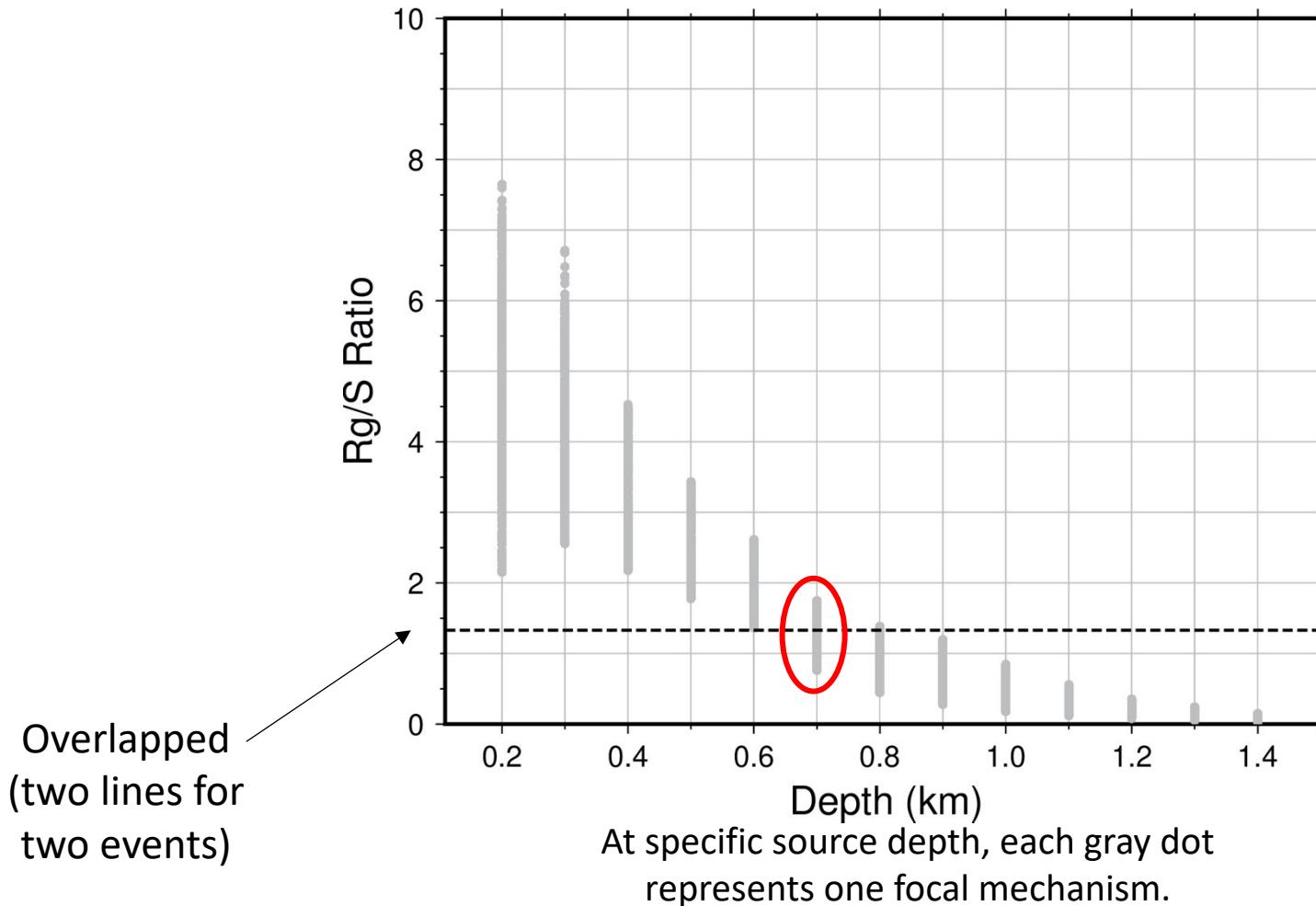
45° dip-slip
waveform fitting
(3–15 Hz)



Black traces: synthetics; Gray traces: observations; Blue&red traces: best fitting

Source depth determination: II. Rg/S amplitude ratio

1. Grid-search source depth, ranking from 0 to 1.5 km
2. Grid-search focal mechanism (strike: 0–360; dip:0–90; rake:-180–180)
3. Compute corresponding Rg/S amplitude ratios at vertical synthetic waveform (3 -15 Hz)
4. Compare with Rg/S amplitude ratios of the two earthquakes

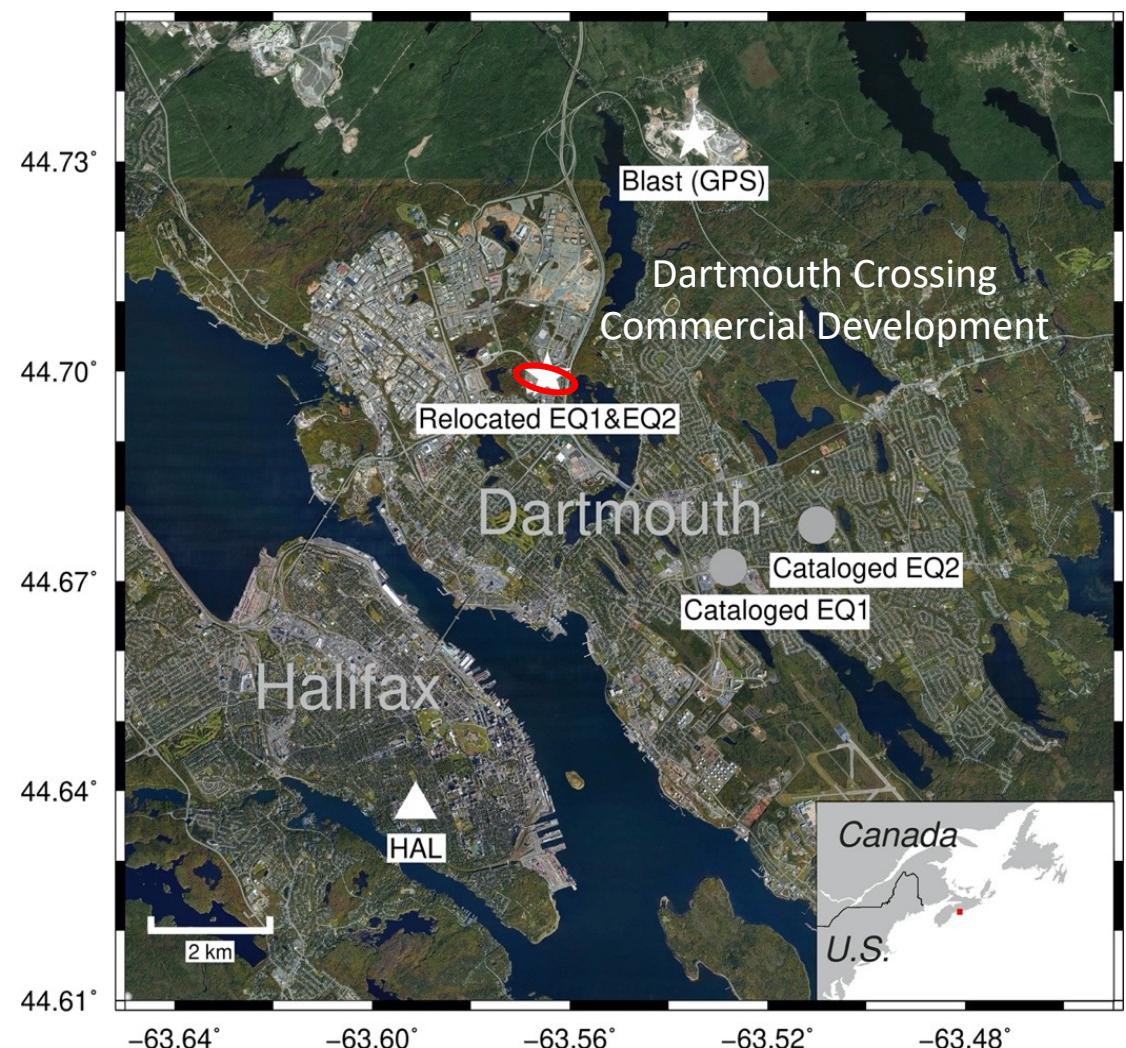
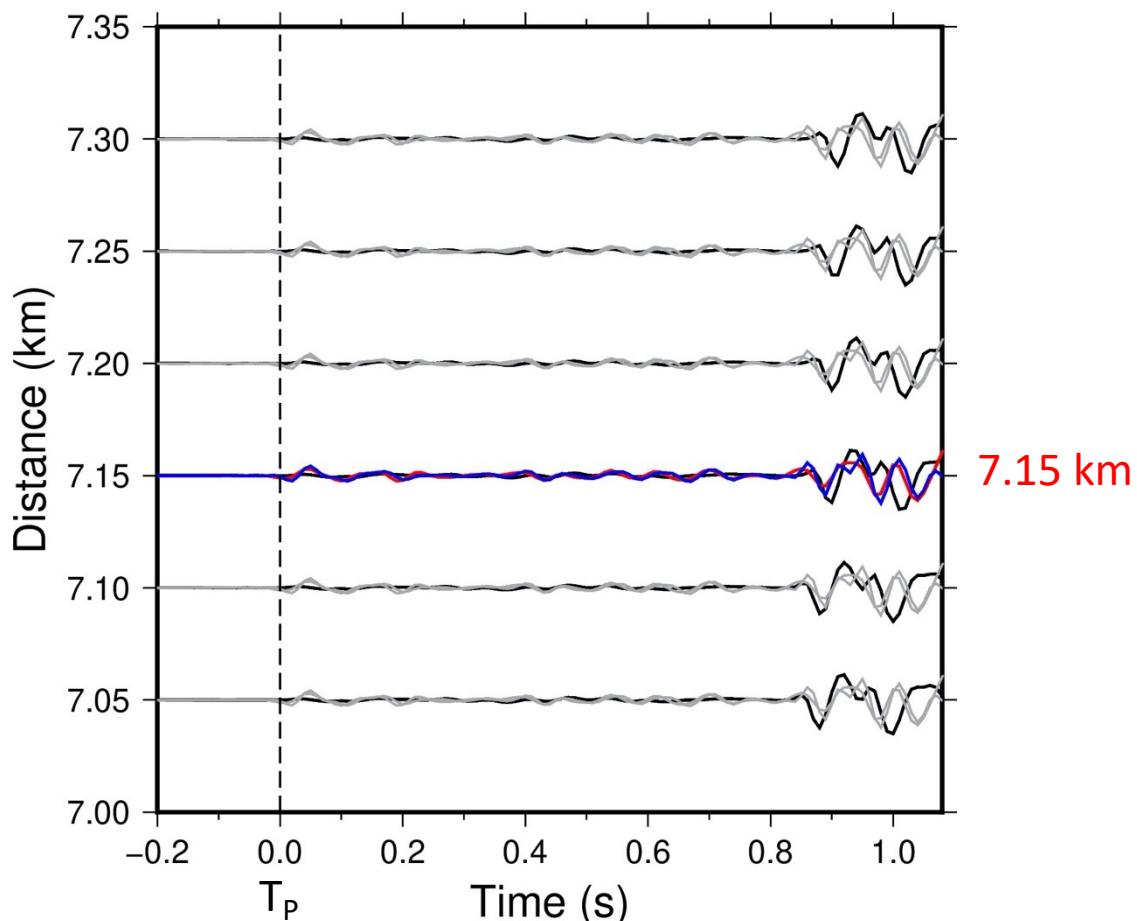


The optimal source depth is determined at 0.7 km (< 0.1 km uncertainty)

Consistent with the waveform fitting very well (i.e., 0.7 km).

Given accurate source depth 0.7 km, re-estimate the source-station distance by fitting the P and S body waves

The distance is corrected to be at 7.15 km.



Uncertainty: 300 m perpendicular to the source-station direction (baz) and 50 m along the source-station direction (grid size)
43

“Did You Feel It” maps for the Mar. 2 (left) and Mar. 3 earthquakes (right).

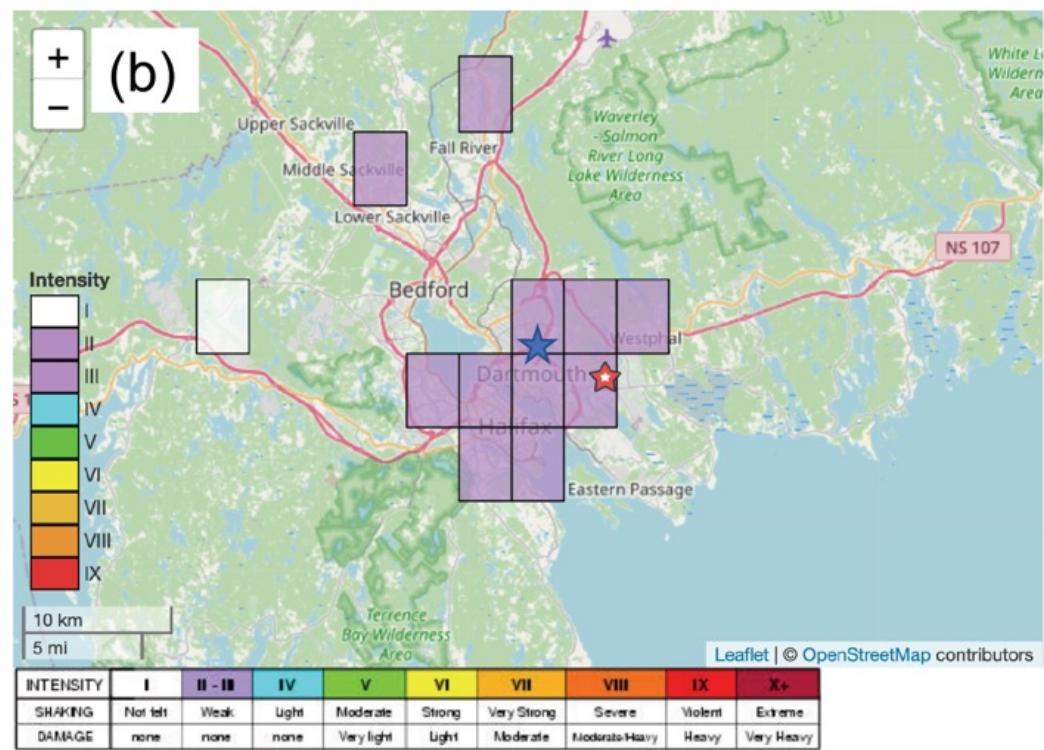
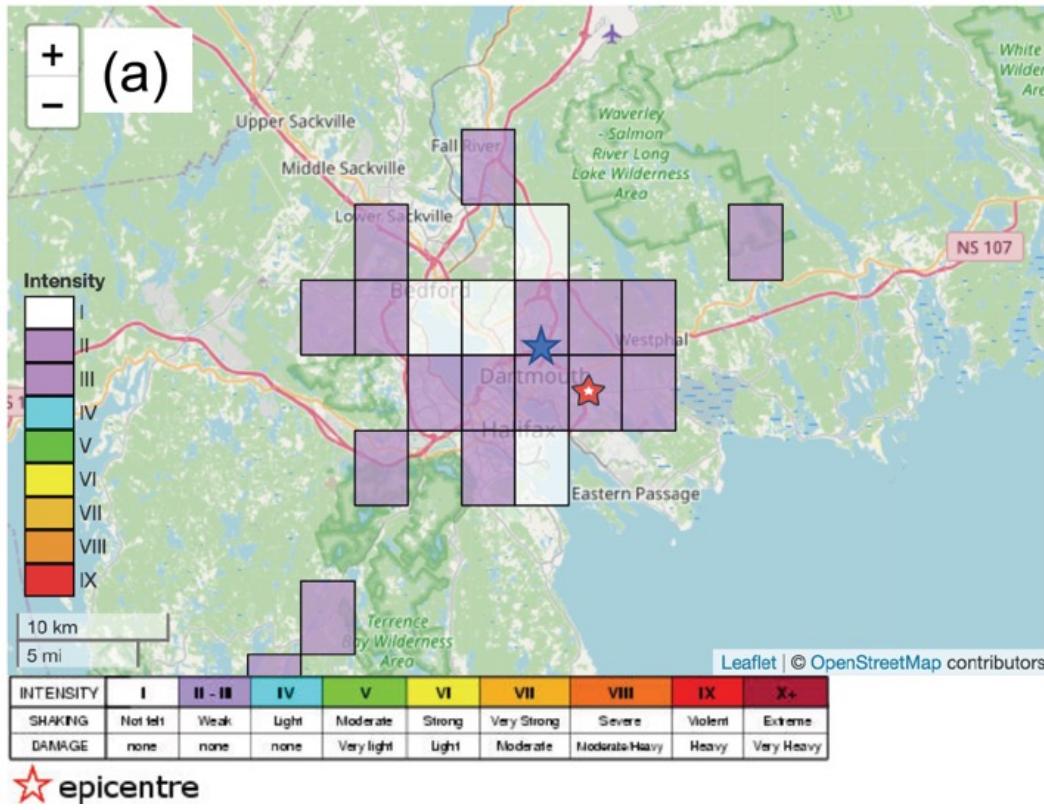


Table 1. Source parameters of the two earthquakes and the blast

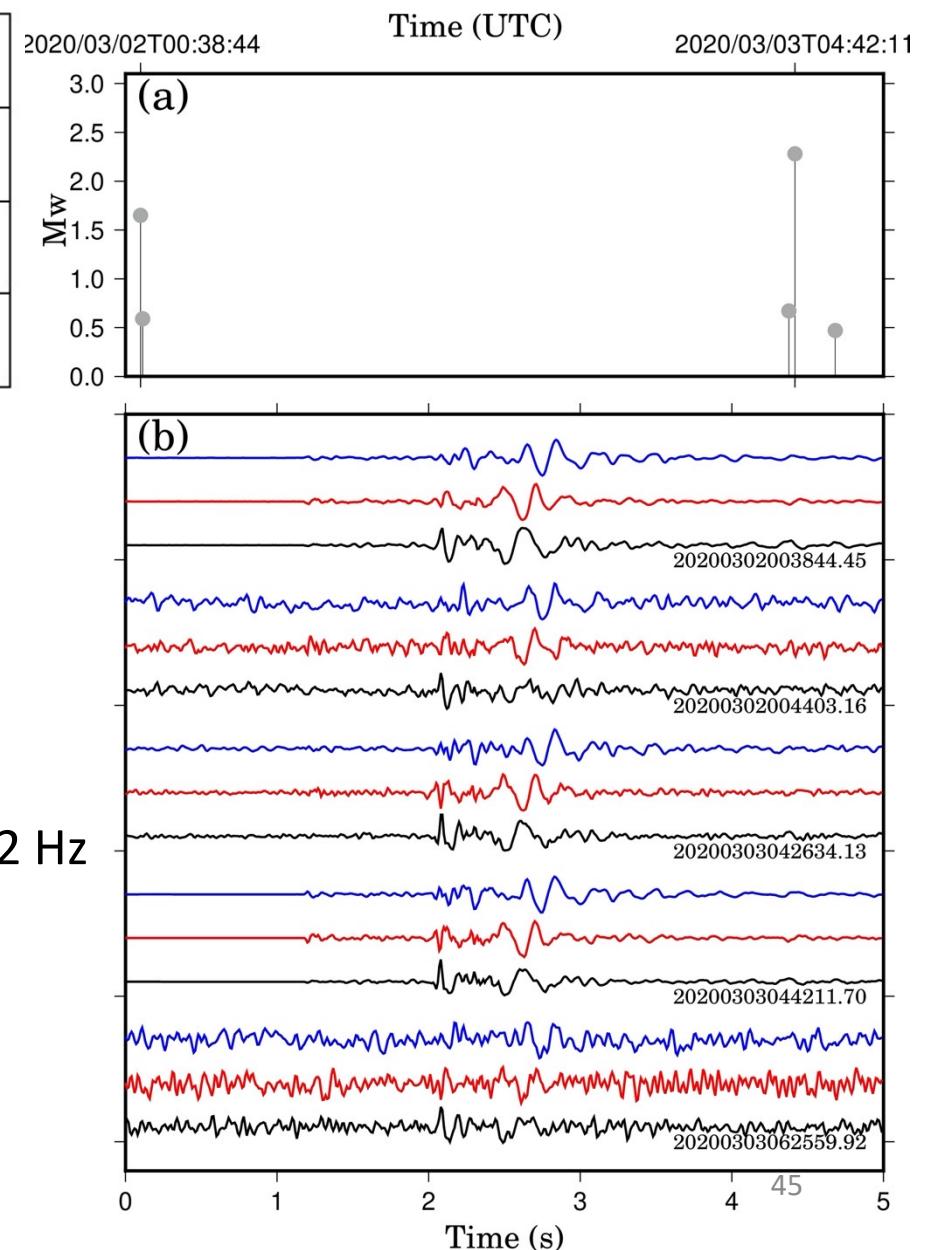
	Origin time	Latitude ($^{\circ}$)	Longitude ($^{\circ}$)	Depth (km)	Mw
EQ1	20200302T00:38:44.45	44.6993	-63.5646	0.7	1.7
EQ2	20200303T04:42:11.70	44.6993	-63.5646	0.7	2.3
Blast	20200303T18:22:50.72	44.7333 [#]	-63.5349 [#]	0	1.9

[#]As reported by the quarry operators

1. No historical earthquakes in the past decade (template matching)
2. Only detected three aftershocks until July 2020 (template matching)
3. No clear surface ruptures (on-site survey)
4. No mapped faults in the region (local geology)

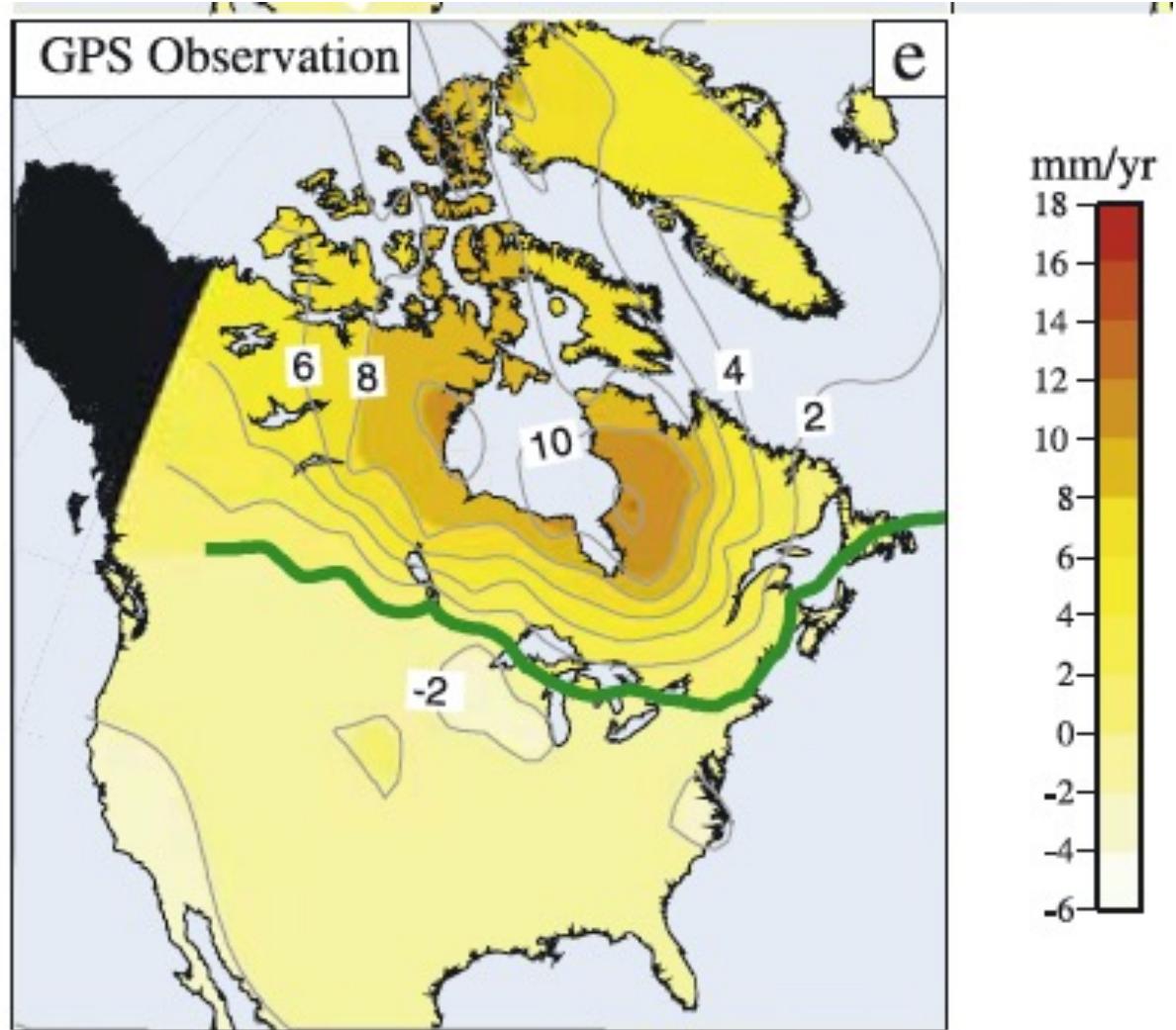
- Few aftershocks
- Very shallow source depths

Single-station template matching



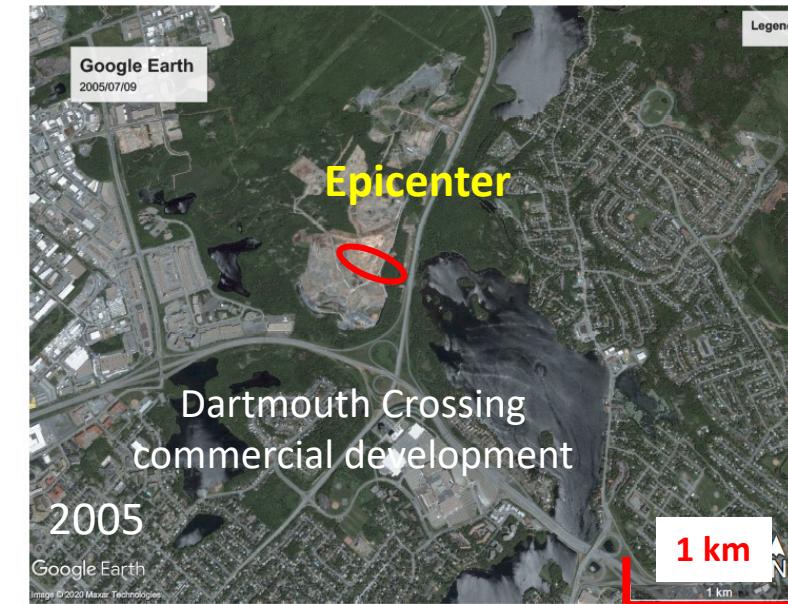
Potential mechanisms

1. Crustal stress perturbations associated with regional glacial isostatic adjustment?



Sella et al., GRL, 2007

2. Triggering by mass unloading?



4 MT of rock was moved during the 2006 construction

2006 Construction



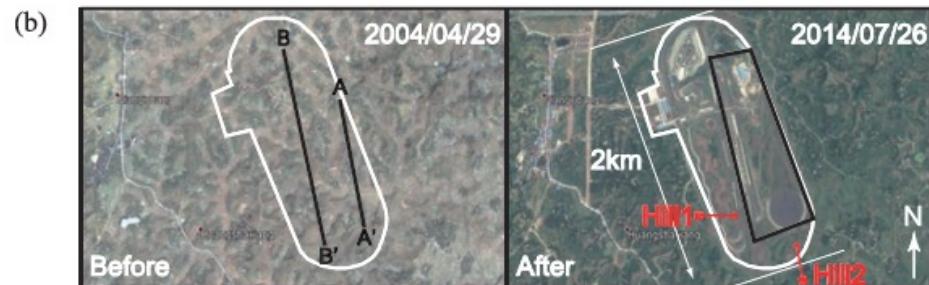
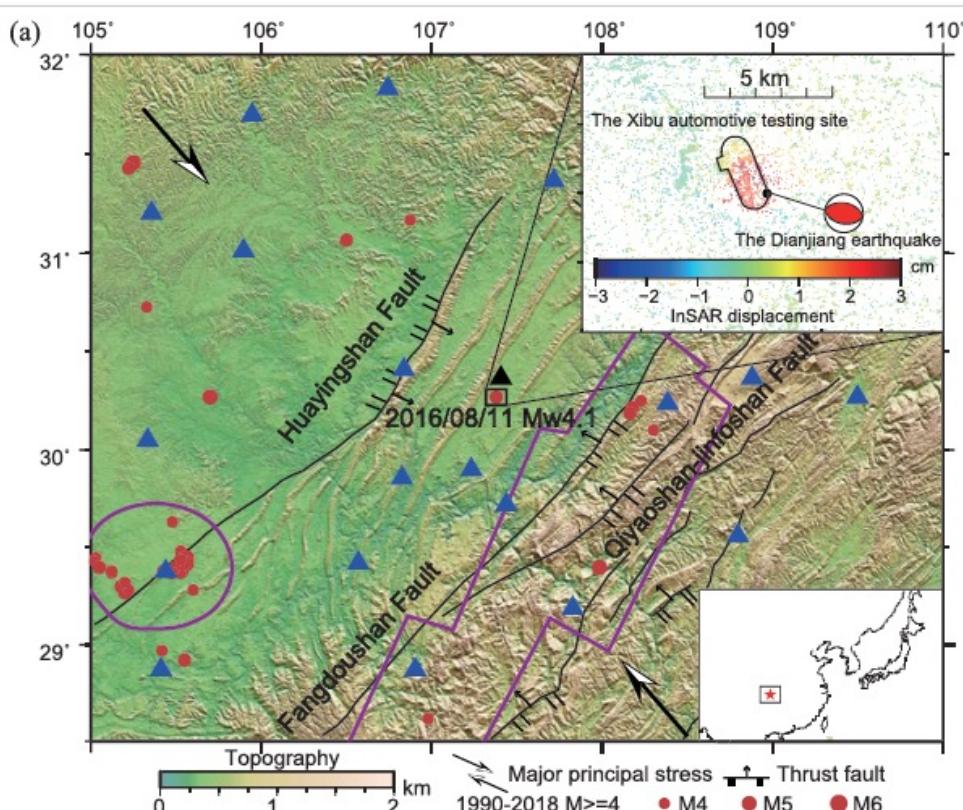
4M tons of rock
Average thickness $\approx 2m$

Triggered by unloading?

2020 Dartmouth Crossing Commercial Development



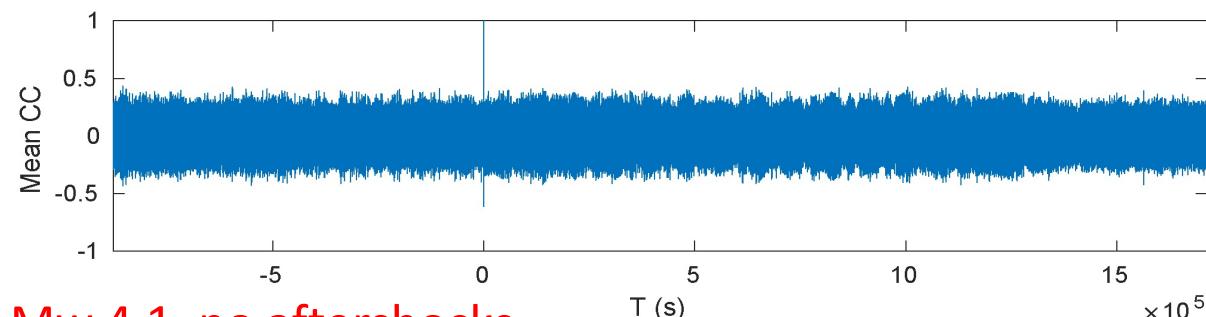
Another similar unloading triggered event



Qian et al., GRL, 2019

An Extremely Shallow $M_w 4.1$ Thrust Earthquake in the Eastern Sichuan Basin (China) Likely Triggered by Unloading During Infrastructure Construction

Yunyi Qian^{1,2}, Xiaofei Chen¹, Heng Luo³, Shengji Wei^{4,5}, Teng Wang⁶, Zhenguo Zhang¹, and Xinyu Luo²



- $M_w 4.1$, no aftershocks
- Source depth: 1 km
- 10 m hill leveled
- Delayed triggering by unloading (2-year)

In our case:

- $M_w 1.7 \& 2.3$, three aftershocks
- Source depth: 0.7 km
- 2 m rock removed
- Delayed triggering by unloading? (14-year)

Summary

- We build a **two-layer regional velocity model** (near-surface linear gradient + half-space) using **a blast and waveform fitting**, then accurately locate the two small earthquakes (M 1.7&2.3) using the constructed velocity model and **waveform simulation**.
- The epicenters of these two earthquakes are situated in a recently constructed commercial development. They are **likely triggered by mass unloading** (though cannot exclude deglaciation).
- Earthquake source depths are determined as 0.7 km using waveform fitting and Rg/S amplitude ratio. Such shallow source depth **explains the “really loud bang”** reported by local residents.
- Potential applications: station-sparse regions and other planets.

Reference

- Miao Zhang, Min Liu, Alexandre Plourde, Feng Bao, Ruijia Wang and John Gosse. Source characterization for two small earthquakes in Dartmouth, Nova Scotia, Canada: pushing the limit of single station. *Seismological Research Letters*, 2021, in press.



Thank you for your attention!

Miao Zhang

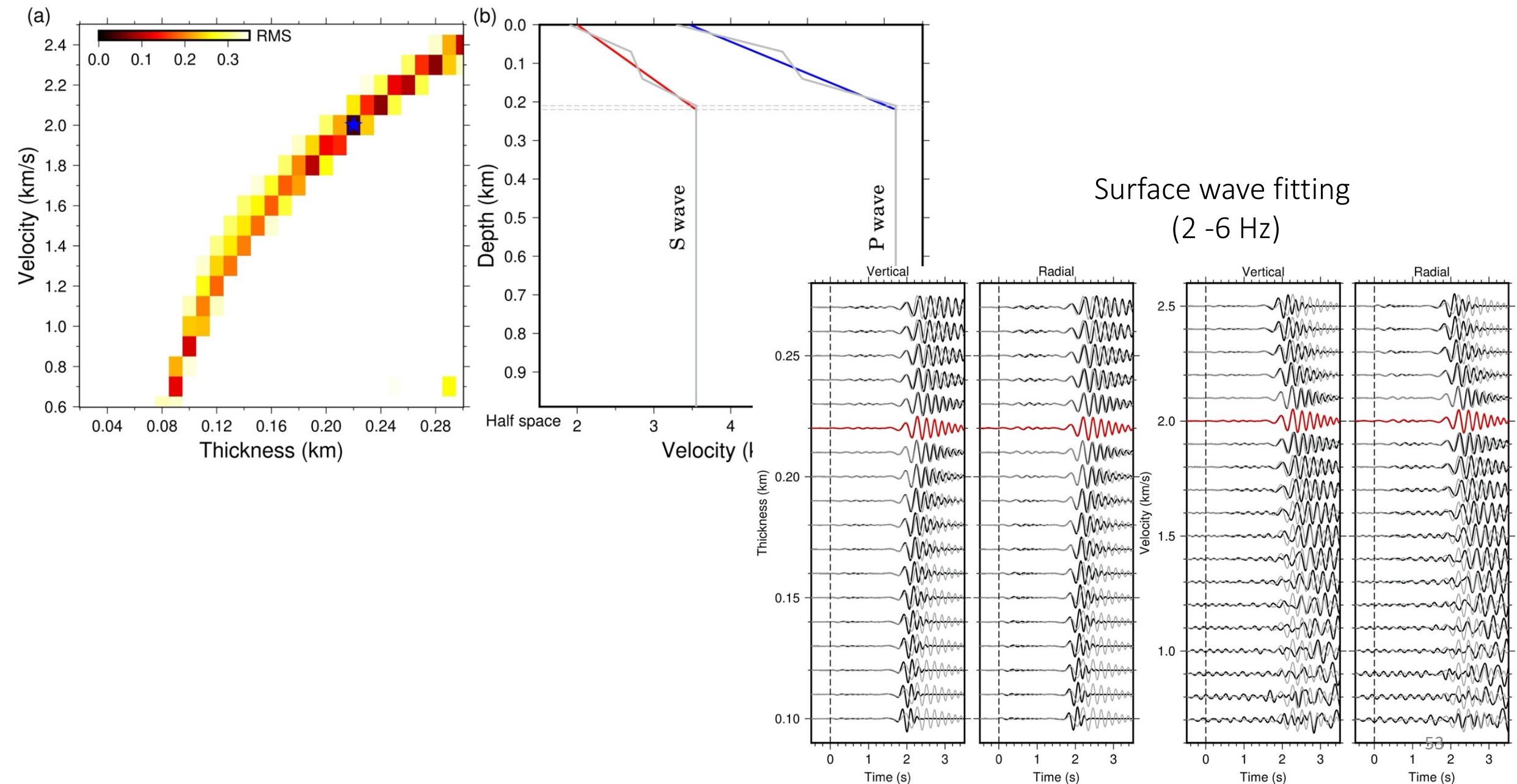
Miao.Zhang@dal.ca

Dalhousie

A photograph of a large, historic stone building with a central tower and a clock, identified as a Dalhousie University building. The word "Dalhousie" is overlaid in red text on the left side of the image.

backup

Synthetic test: construct a three-layer model with similar average velocity in the shallow layer

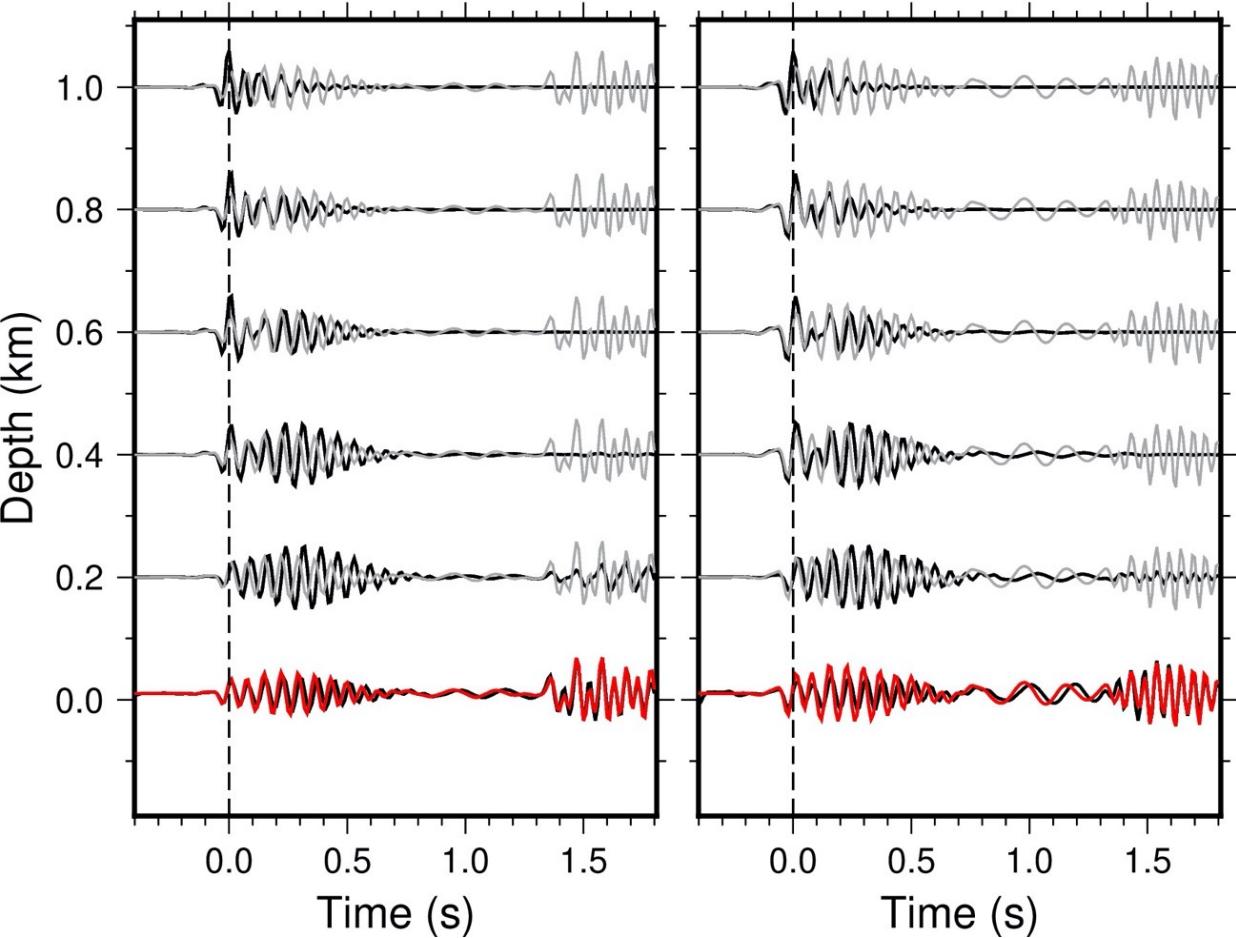


Body wave fitting

(7 - 20 Hz)

Vertical

Radial



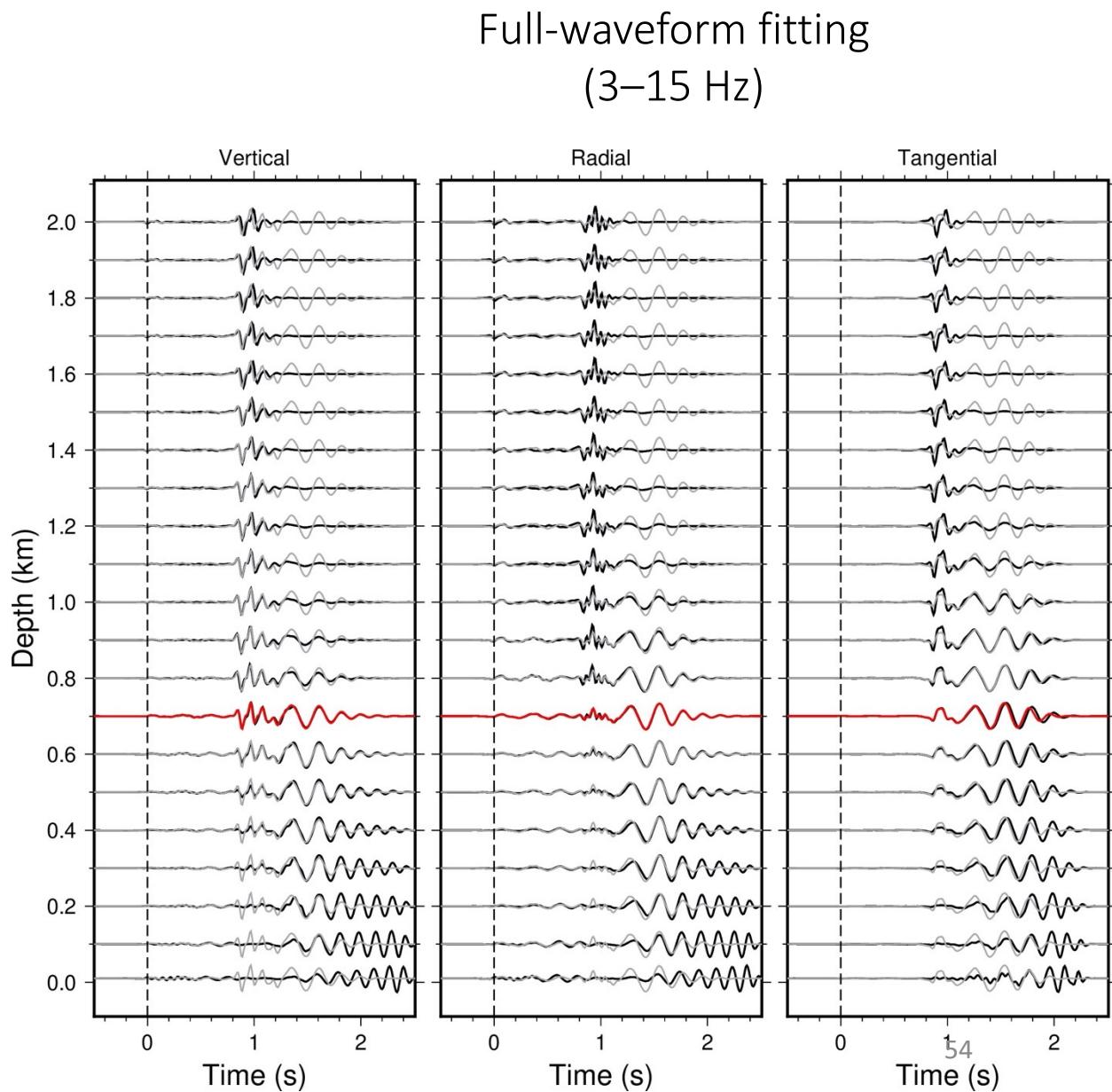
Full-waveform fitting

(3–15 Hz)

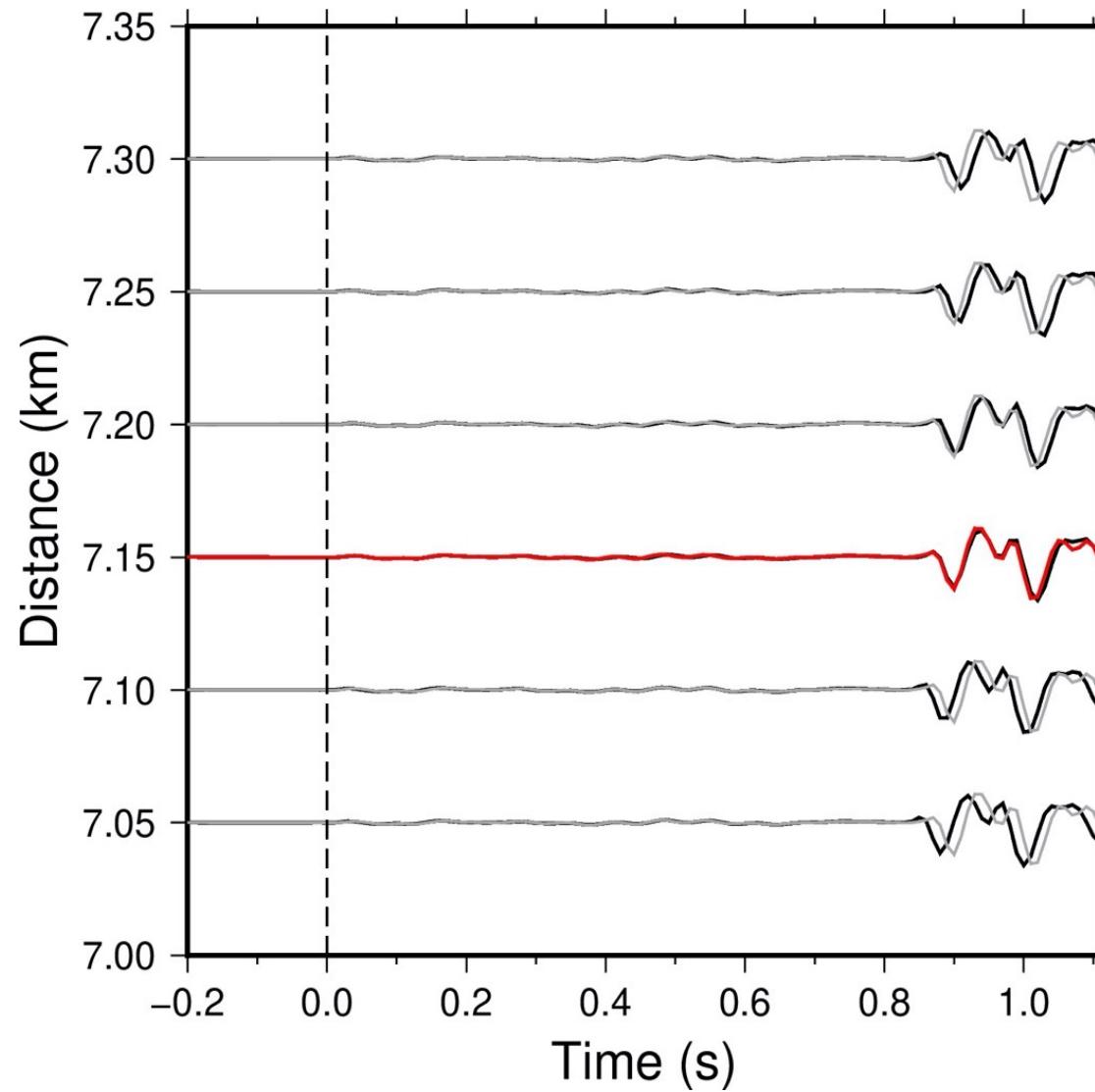
Vertical

Radial

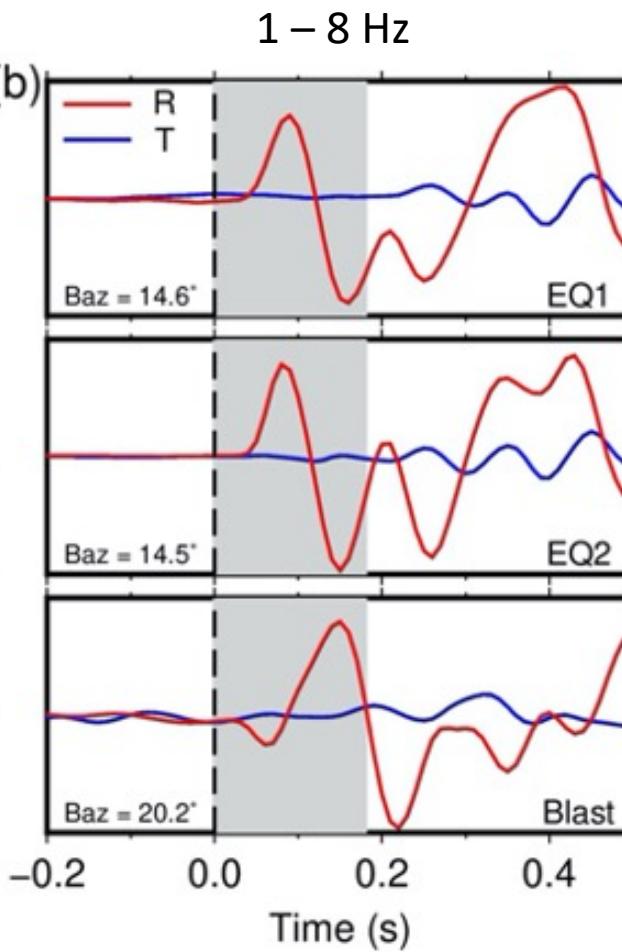
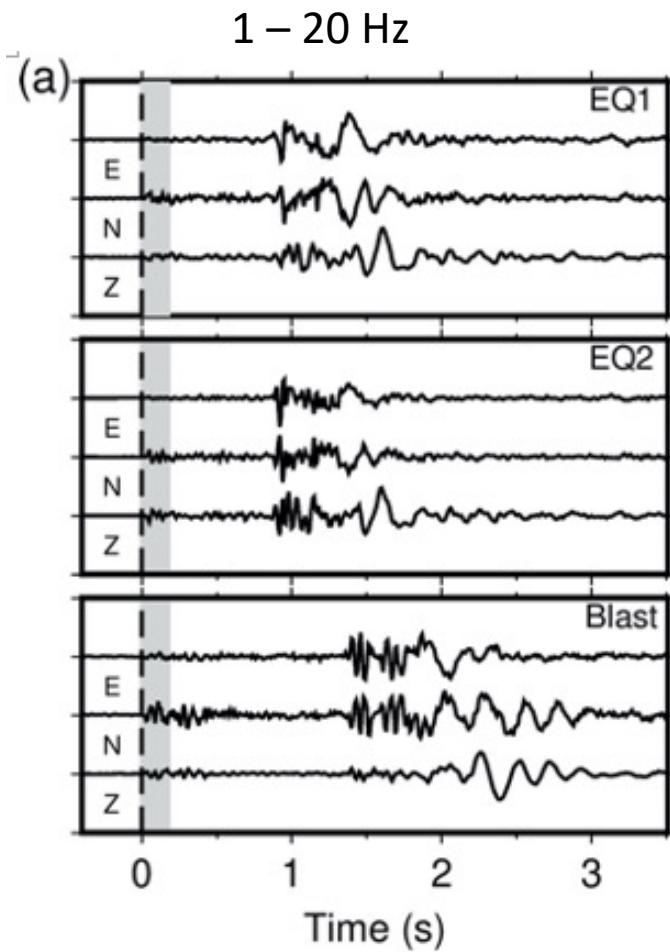
Tangential



Vertical body wave fitting (5–15 Hz)

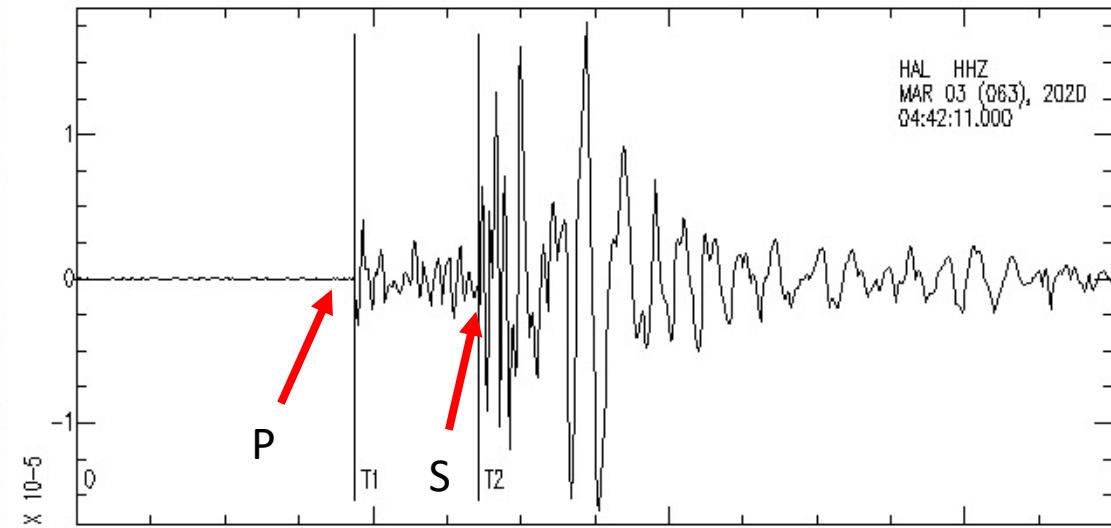


Back azimuth estimation



Station azimuth calibration: $\text{Baz}_{\text{obs}} - \text{Baz}_{\text{ref}} = 2.6^\circ$
Calibrated baz for the two events: 17.15°
Time window and frequency effects.: within 2.5°

Initial epicentral distance estimation



Source-station distance (estimated from ts-tp 0.85 sec with a source depth of 0 km): 7.1 km