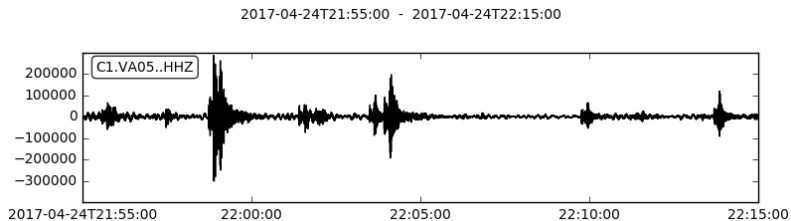


# Earthquake detection and location: towards automatization Day2

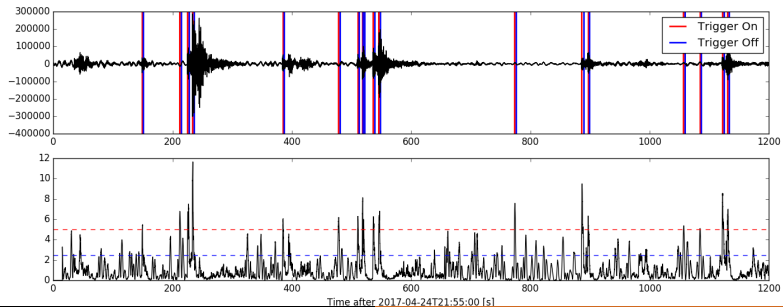
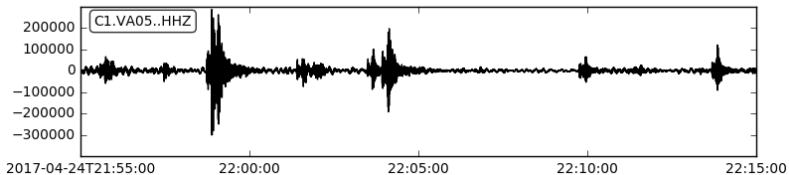
**Christian Sippl**

*Geofyzikální ústav Akademie věd ČR, v.v.i.*

Universidad de Concepcion, January 13-17, 2020



2017-04-24T21:55:00 - 2017-04-24T22:15:00



- **Monday:** Intro and earthquake detection basics (triggers)
- **Tuesday:** Phase pickers and the earthquake association problem
- **Wednesday:** Basic earthquake location techniques, uncertainty estimation
- **Thursday:** Multi-event (re)location techniques, use of cross-correlations
- **Friday:** Putting it all together: how to design an automated approach

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## Tuesday: The earthquake association problem, and use of targeted phase pickers

- *9:00 - 10:30*: Arrival association and multistation triggering
- *11:00 - 12:30*: Exercises: Coincidence trigger(s)
- *13:30 - 15:15*: Targeted phase pickers, S-wave picking
- *15:30 - 17:00*: Exercises: Building a polarization picker

## Day2: Goals

- 1 You know different approaches of associating station picks to events
- 2 You know the basics of targetted P- and S-phase pickers
- 3 You have practical experience in using coincidence triggers and S-phase pick estimation

Central question: how to define events from lists of trigger alerts?

Basic problems:

- False alerts and missed onsets
- Phase misidentifications
- Overlapping events, teleseisms etc.

Partial solution: looking not at single station but at larger network

Earthquake signal should be coherent over multiple stations, most noise sources are local



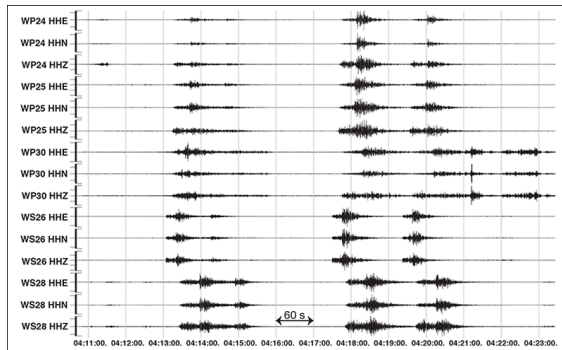
General approaches from simple to complicated:

### Arrival time association

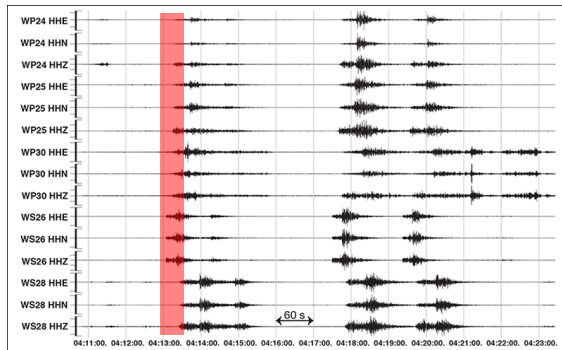
- 1 Coincidences (= time window)
- 2 Traveltime grid (= raytracing)
- 3 Wavefront methods

1-3: also increasing area (local to global) possible

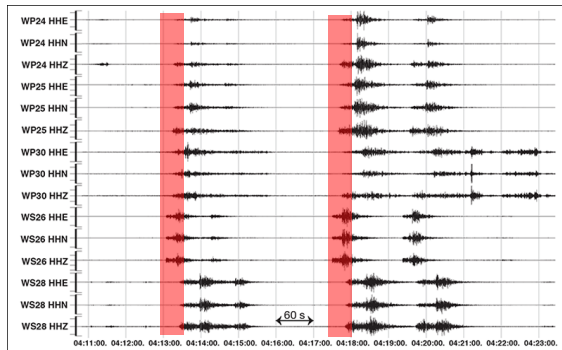
- Define time window length and minimum number of stations
- If at least this amount of stations has trigger alert in such a time window, event is defined
- Problems: Are phases consistent? Only works for small arrays



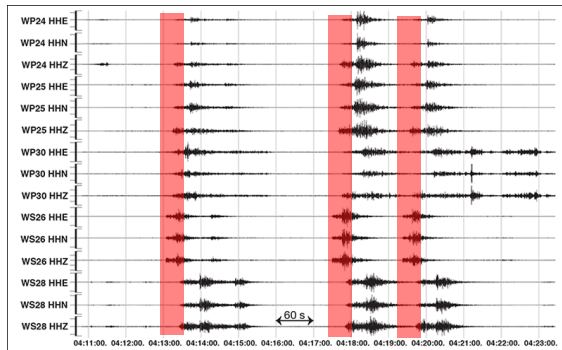
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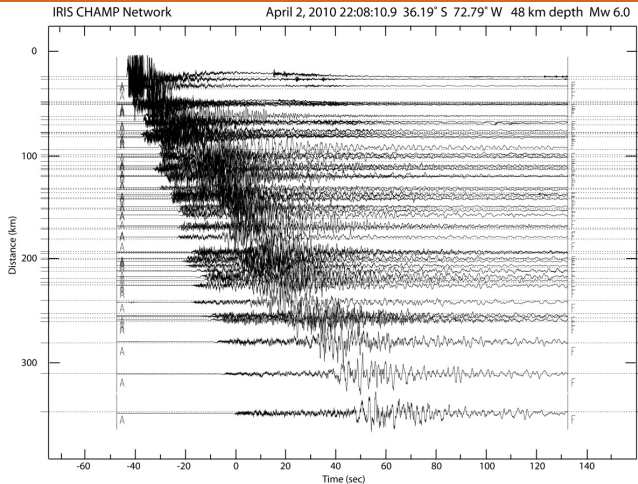


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Static time window is not appropriate if stations are far apart (or: time window gets larger and larger, may catch other signals)

### └ Arrival time association

#### └ Simplest implementation: Coincidence trigger

- + Simple and (for local networks) quite effective
- + Can be directly coupled with the different trigger algorithms
- + Computationally cheap
  - Becomes problematic for larger (regional-scale) regions
  - Location and origin time estimates are rather rough (closest station)
  - Requires “clean” alert input

### Question

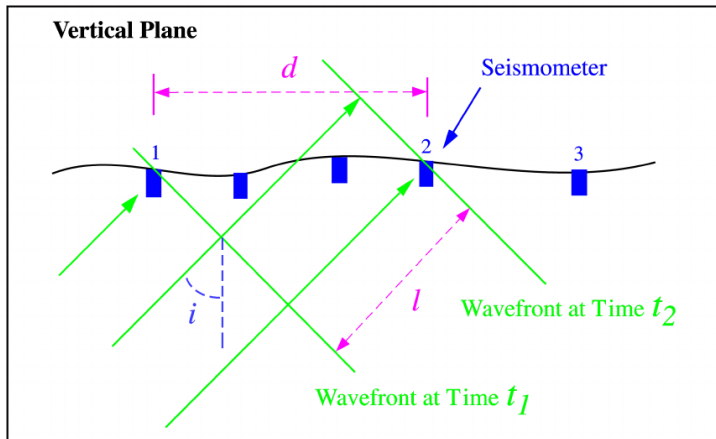
What is necessary to overcome the main deficiency of the coincidence method?



### Question

What is necessary to overcome the main deficiency of the coincidence method?

Instead of assuming arrivals at roughly the same time, we should look for arrivals with a consistent velocity



If absolute velocity is  $V$ , apparent velocity is  $V / \cos \theta$  (always faster, infinity for teleseismic event from directly below)

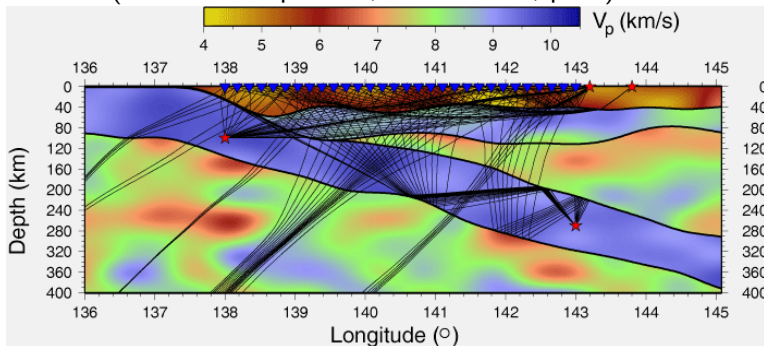
Instead of static time window, one could write an algorithm that:

- 1 identifies potential “groups” of alerts
- 2 Chooses the closest station (=station with earliest alert)
- 3 Only retains alerts in a certain corridor of “allowed” apparent velocities

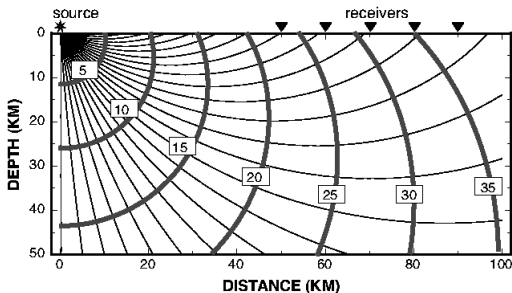
But: apparent velocity depends highly on depth → it is hard to determine a meaningful velocity corridor (or at least upper boundary)

more sophisticated method: traveltime grids

Forward calculation, i.e. get theoretical traveltimes for given location and velocity model  
Gives ONLY first arrivals (=search for quickest, not shortest, path)!



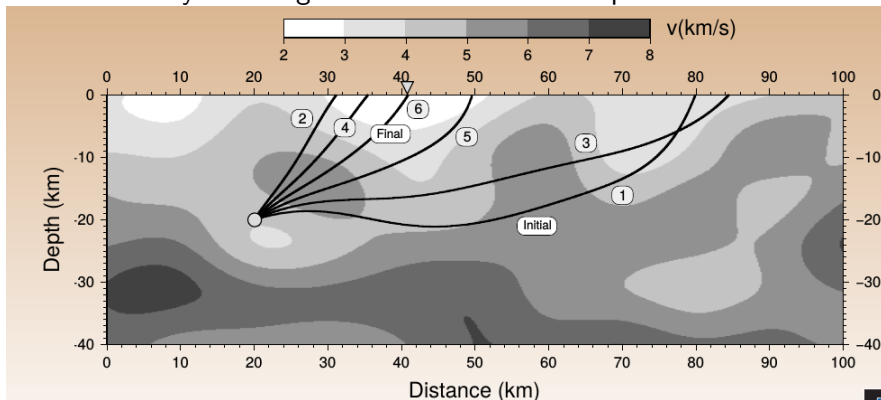
- Assumption of point source and (usually layered) velocity model
- Seismic waves propagation occurs on a spherical surface (distorted if velocity model is not homogeneous)
- First arrivals can be described as “rays” that are normal to this spherical surface



Attention: ray tracing is high-frequency approximation!!

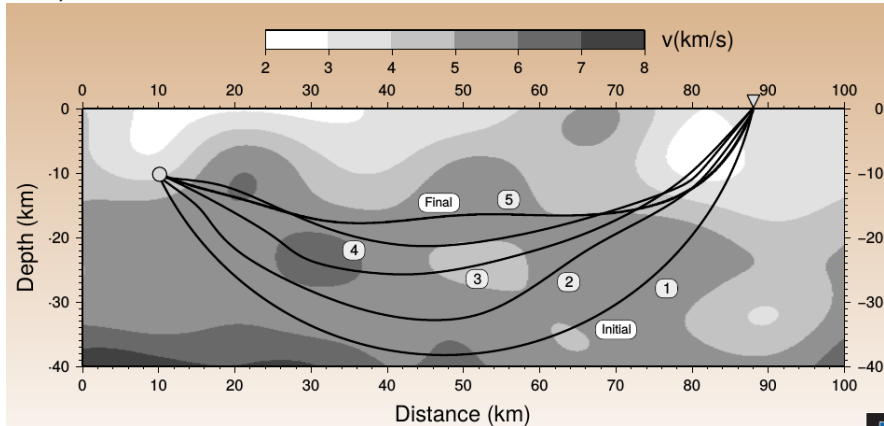
## Shooting Methods:

Shoot rays in the general direction and compare travel times

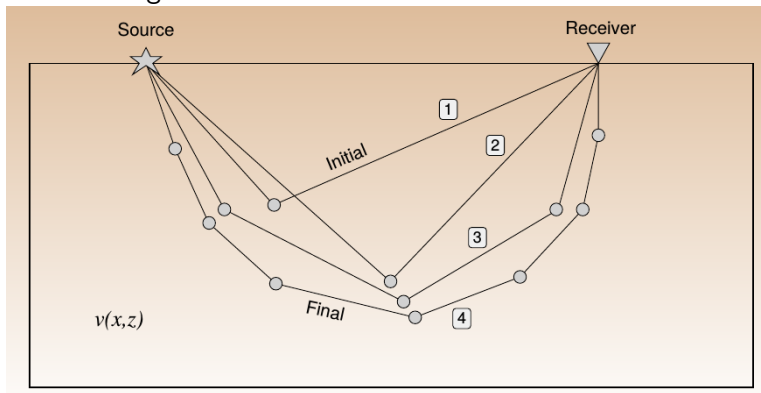


## Bending methods:

Assume a rough “first guess” raypath that connects source and receiver; keep ends fixed and perturb (“bend”) raypath, minimizing traveltime

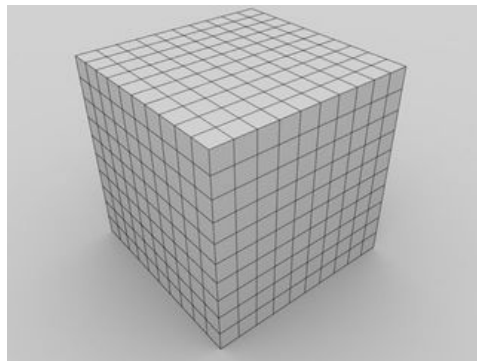


In practice, most methods today use schemes that combine the two concepts in different ways;  
one example: pseudo-bending

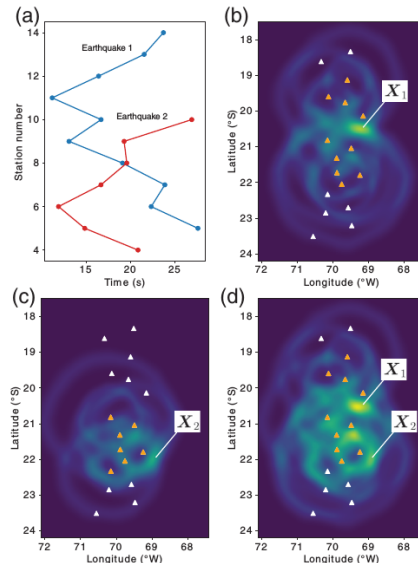


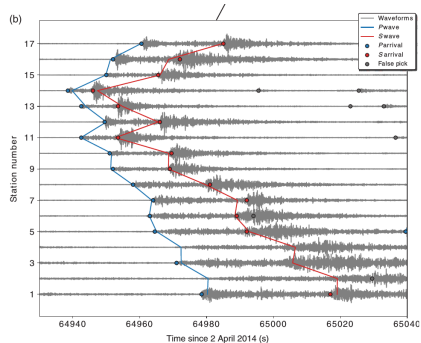
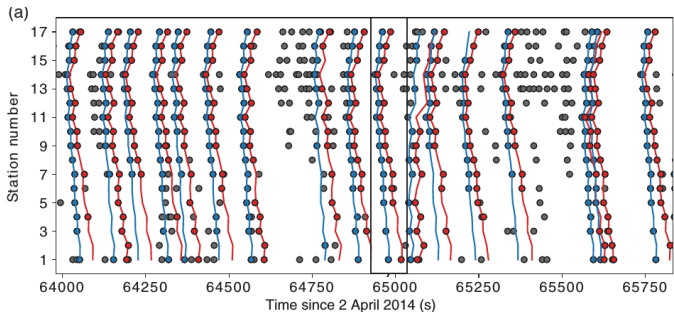


- Subsurface is discretized into a grid of nodes
- These nodes are potential sources, traveltimes from each node to all stations are computed with ray tracing
- Then: input of trigger list; algorithm compares traveltime patterns to pre-computed ones
- Subsets of trigger alerts that fit to traveltime patterns from specific nodes are kept as “events”, rest is discarded



- Takes list of picks as input
- Entire waveform is backpropagated, and this is repeated for all stations
- Regional grid: all nodes are checked for coherency, maximum should be approximate earthquake location
- Claim: can also handle simultaneous events (see figure)





Each

grey dot is a pick; blue: associated as P; red: associated as S ( $\rightarrow$  pair blue+red is event)

---

```
from obspy.signal import trigger
output = trigger.coincidence_trigger('recstalta',5.,
1,in_stream,5,details=True,sta=0.8,lta=12.)
#Input: trigger type,trigger threshold,detrigger threshold,input
        Stream,coincidence sum)
```

---

How can we construct an input Stream containing all necessary Traces?

```
from obspy.core import Stream, UTCDateTime
from obspy.clients.fdsn import Client

client = Client('GFZ')
t1 = UTCDateTime(2015,1,1,0,0,0)
st = Stream()
stations = ['PATCX', 'HMBCX', 'PB01', 'PB02', 'PB03', 'PB04', 'PB07', 'PB09']
for j in stations:
    tr = client1.get_waveforms('CX',j,'--','HHZ',t1,t1+86400.)
    st.append(tr[0])
print(st)
```

#8 Trace(s) in Stream:

```
#CX.HMBCX..HHZ | 2014-12-31T23:59:59.680000Z - 2015-01-02T00:00:03.720000Z | 100.0
Hz, 8640405 samples
```

---

```
print(type(output))
#list
print(len(output))
5
#Output is a list, each element is one 'event'
print(type((output[0])))
#dict
```

---

## Accessing parts of this dictionary

---

```
print output[0].keys()
#[u'coincidence_sum', u'cft_std_wmean', u'similarity',
# u'stations', u'trace_ids', u'cft_stds', u'time',
# u'duration', u'cft_peak_wmean', u'cft_peaks']
print output[0]['cft_peaks']
#[13.662237430293125, 12.937480467513232, 8.697322694813776, 11.148089376098383,
  6.396752460694139, 3.527443856751875, 3.9680128002287374]
```

---

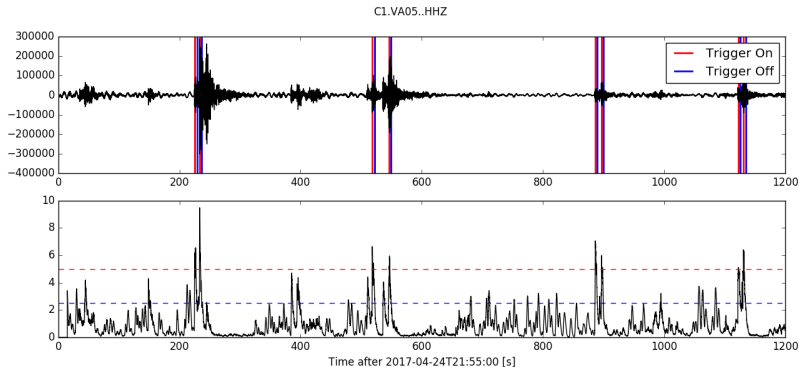
## Exercises

### 5. Coincidence trigger

- Download vertical component data for January 1, 2015 from stations PATCX, HMBCX, PB01, PB02, PB03, PB04, PB07 and PB09 from the GEOFON data server (network code CX).
- Put all data traces into one Stream object and apply the coincidence trigger. Adjust the value for `coincidence_sum` so that you get a good number of events (maybe between 15 and 30).
- Extract approximate origin time and the stations with alerts
- Now we want determine exact arrival times for each station. For this, we can apply a simple STA/LTA on a small time window (discuss strategy). Try this out using `plot_trigger()` to check if picks are OK.
- Finally, write these picks to a file. Modify your script so it can run in a loop (over all events found by the coincidence trigger).



We have discussed and tried out triggers to find earthquakes; but: these are usually not phase-specific, plus arrival times are imprecise

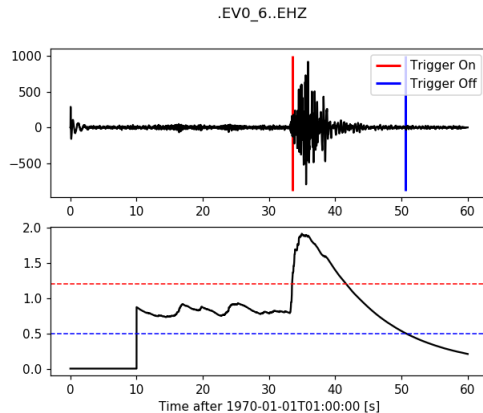


→ Targeted phase pickers: Derive precise phase arrival plus quality rating  
often not operating on raw data but on pre-defined time windows

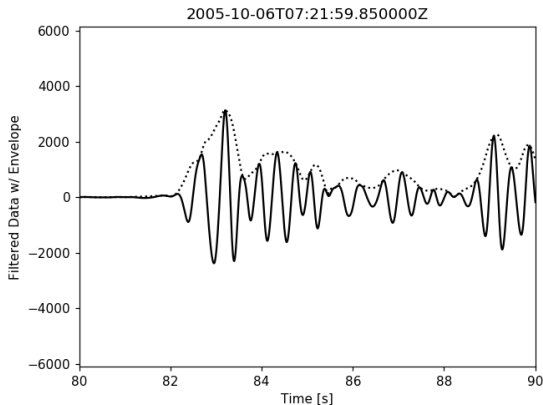
STA/LTA alerts are not very reliable (false alerts), and nearly always late

→ They should only be used as “first guesses”, and be refined and checked afterwards.

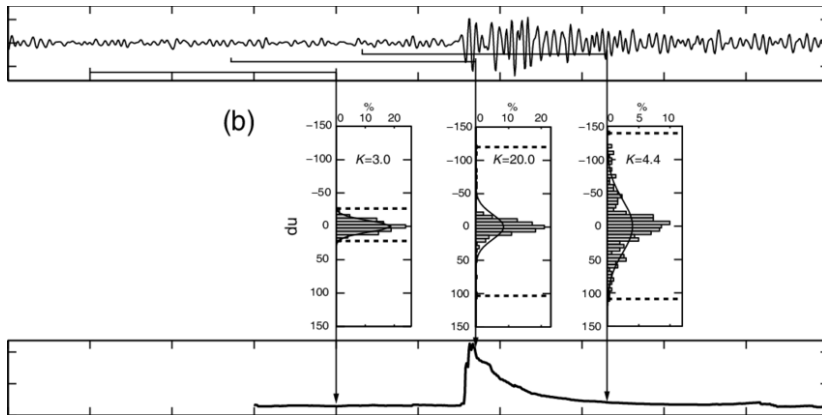
Targeted phase pickers are more precise and usually supply quality weighting (=uncertainty estimate)



comparable to STA/LTA on envelope function (show what that is)



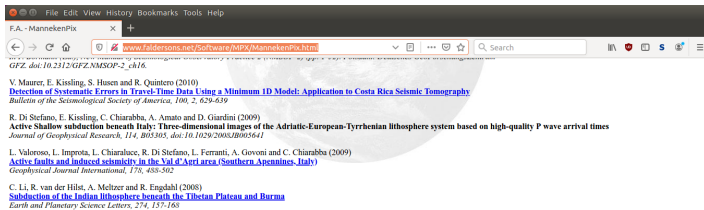
takes typical STA/LTA-delay into account; uses mostly spectral parameters to define weighting  
Wrapper is available in `obspy.signal.trigger`



Kurtosis is a statistical measure that can be roughly described as “tailedness” of a distribution (i.e. presence of outliers → higher kurtosis)

- └ Targeted phase pickers
- └ Refining P picks: MPX

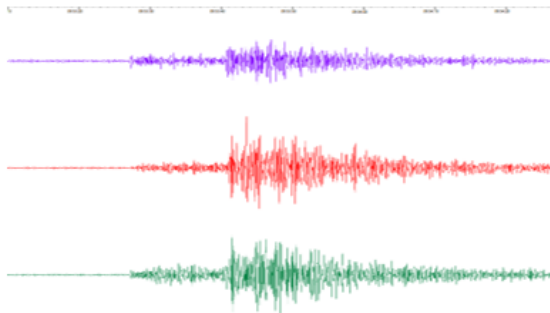
- Searches for P arrival in pre-defined window
- Uses adaptive Wiener pre-filtering, then a modified version of the Baer picker
- Weighting engine based on Fisher statistics, can be calibrated with handpicked dataset
- Problem: only executable is available, no source code



## Download MPX 1.7.9

Hardware	Operating System	Source	Executable	User Guide
PC	MS WINDOWS 32-BIT	No	<a href="#">Download (ZIP 305 KB)</a>	<a href="#">Download (ZIP 191 KB)</a>
PC	LINUX	No	<a href="#">Download (GZ 293 KB)</a>	<a href="#">Download (GZ 189 KB)</a>
MAC	OS X	No	<a href="#">Contact</a>	<a href="#">Contact</a>
HP	UNIX	No	<a href="#">Contact</a>	<a href="#">Download (GZ 189 KB)</a>
SUN	SOLARIS	No	<a href="#">Contact</a>	<a href="#">Download (GZ 189 KB)</a>
OTHER	OTHER	No	<a href="#">Contact</a>	<a href="#">Contact</a>

<http://www.faldersons.net/Software/MPX/MannekenPix.html>



S-picking is nearly always done relative to P (if P exists, look for S in time window after P)

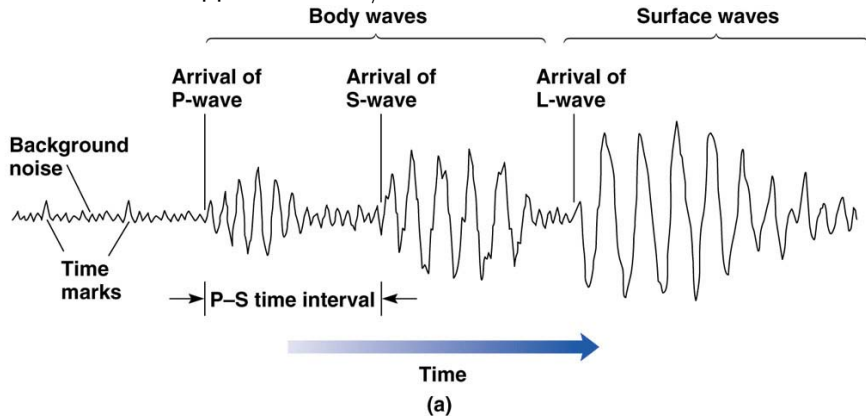
Problem: S-arrival is inside P-wave coda

### Question

What changes from P coda to S onset?

## Amplitude

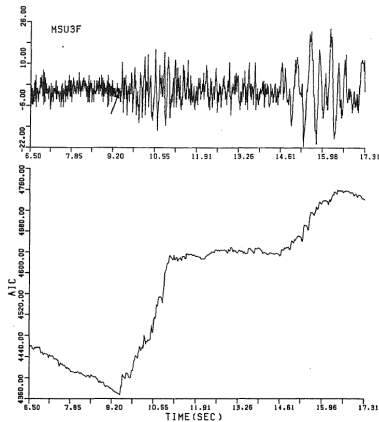
Simple but often functional approach: STA/LTA on horizontals in fixed time window after P





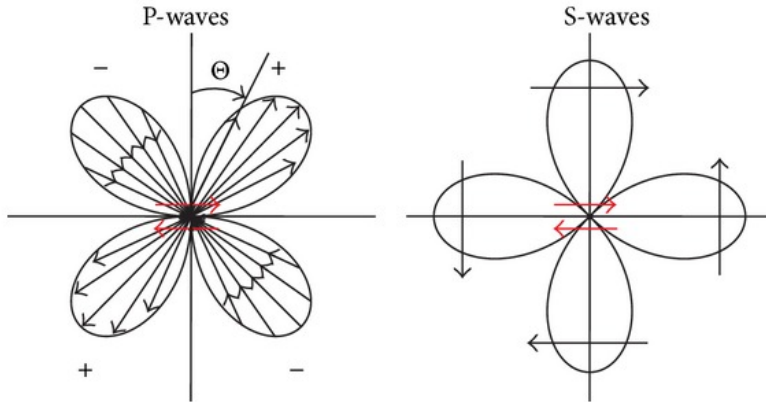
## Spectral content

S-waves are usually lower-frequent than P-wave energy



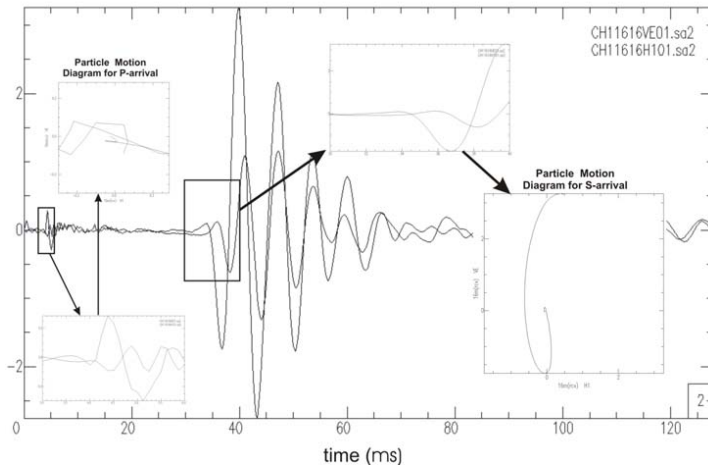
As for P-phases, there are autoregressive S-wave pickers

## Polarization

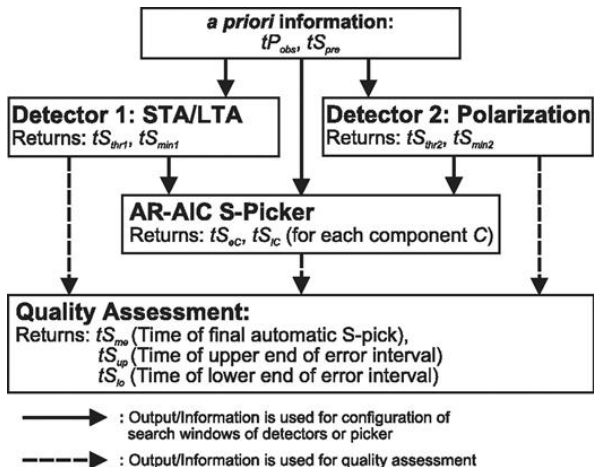


Double-couple radiation patterns, amplitudes are opposite

Linear polarization (in propagation direction) for P, perpendicular to propagation direction for S



Task: continuously measure this polarization direction along the waveform, pick changepoint  
(=S onset)



- Probably the most sophisticated algorithm for S picking at the moment
- Combines three different approaches (STA/LTA, polarization, AIC)
- Quality weighting by evaluating consistency between the different methods

## Exercises

### 6. S-picker

The next step in automatically detecting and location earthquakes is finding S arrivals.

Take a single test event from the event catalog you built in the morning, and take a time window from the P-pick to 90 seconds after it. On this time window, try out applying an STA/LTA on one of the horizontal components, and also try to evaluate the amplitude ratio between horizontal and vertical trace against time. Does one of these (or both) give a clear indication for S? Extend the analysis to more event (from the catalog), and debate what could best be used as an S-wave detector. Write such a detector that adds an S-pick to your events.