

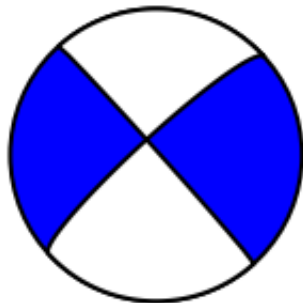
# Obspy seminar (www.obspy.org)

obspy.imaging

obspy.imaging.beachball: Beachball plot

```
In [1]: from obspy.imaging.beachball import Beachball

#moznost zadat uhly
fm2=[318, 88, -169] #strike,dip,rake
Beachball(fm2)
#moznost zadat momentovy tenzor:
# m11,m22,m33,m12,m13,m23
fm=[-0.33, -2.23, 2.55, 0.83, -0.32, 0.32]
Beachball(fm,facecolor='r')
```



Out[1]:

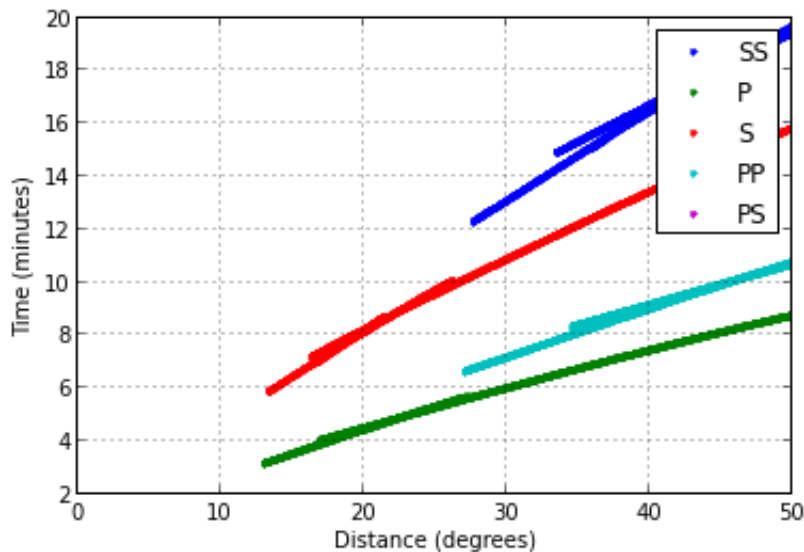




## obspy.taup

### obspy.taup.taup: Travel time calculation tool

```
In [2]: from obspy.taup.taup import travelTimePlot, getTravelTimes
#vykreslenie hodochron:
travelTimePlot(max_degree=50, phases=['P', 'S', 'PP', 'PS', 'SS'])
#vypocet casu sirenia a.i. v danej epicentralnej vzdialenosti
tt=getTravelTimes(delta=40., depth=100., model='iasp91')
#model moze byt iasp91, ak135. prem to nevie!
print tt[0] #vystup: rozne fazy
print tt[1]
```



```
{'phase_name': 'P', 'dT/dD': 8.2632751, 'take-off angle':  
37.41507, 'time': 444.74866, 'd2T/dD2': -0.0045646443, 'dT/dh':  
-0.098694056}  
{'phase_name': 'pP', 'dT/dD': 8.3460588, 'take-off angle':  
142.14453, 'time': 467.83313, 'd2T/dD2': -0.0045246622,  
'dT/dh': 0.098110832}
```

## obspy.signal

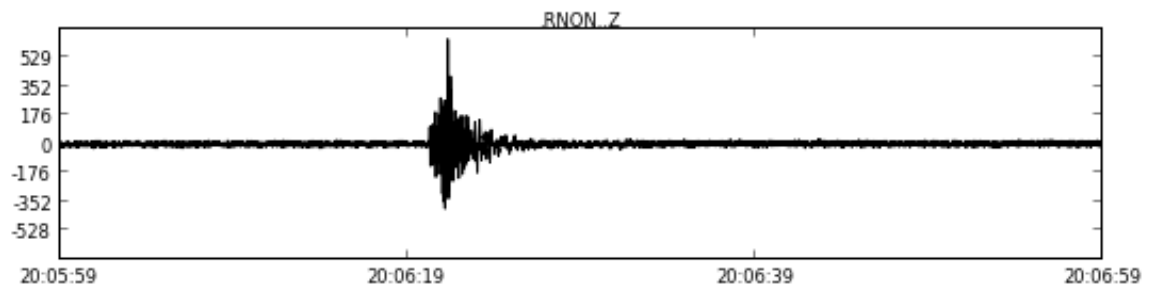
```
In [3]: #nacitame data
from obspy.core import read
st = read("./event.gse2")
tr = st[0]

print tr.stats
```

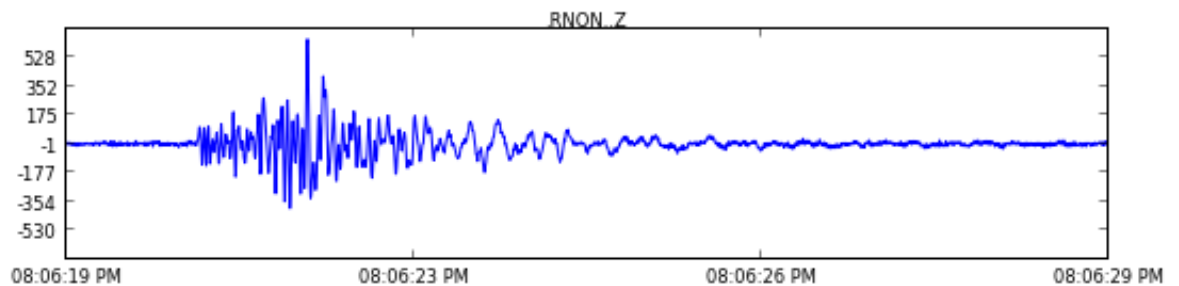
```
network:
station: RNON
location:
channel: Z
starttime: 2004-06-09T20:05:59.849998Z
endtime: 2004-06-09T20:06:59.844998Z
sampling_rate: 200.0
delta: 0.005
npts: 12000
calib: 0.596000015736
_format: GSE2
gse2: AttribDict({'instype': ' ', 'datatype':
'CM6', 'hang': -1.0, 'auxid': 'RNON', 'vang': -1.0, 'calper':
1.0})
```

```
In [4]: #vykreslenie pre kontrolu a kopia
tr.plot()
tr2=tr.copy()
tr2.plot(color='blue', tick_format='%I:%M:%S %p',
starttime=st[0].stats.starttime+20,
endtime=st[0].stats.endtime-30,
outfile='/home/mess/trplot.png')
```

2004-06-09T20:05:59Z - 2004-06-09T20:06:59Z



2004-06-09T20:06:19Z - 2004-06-09T20:06:29Z

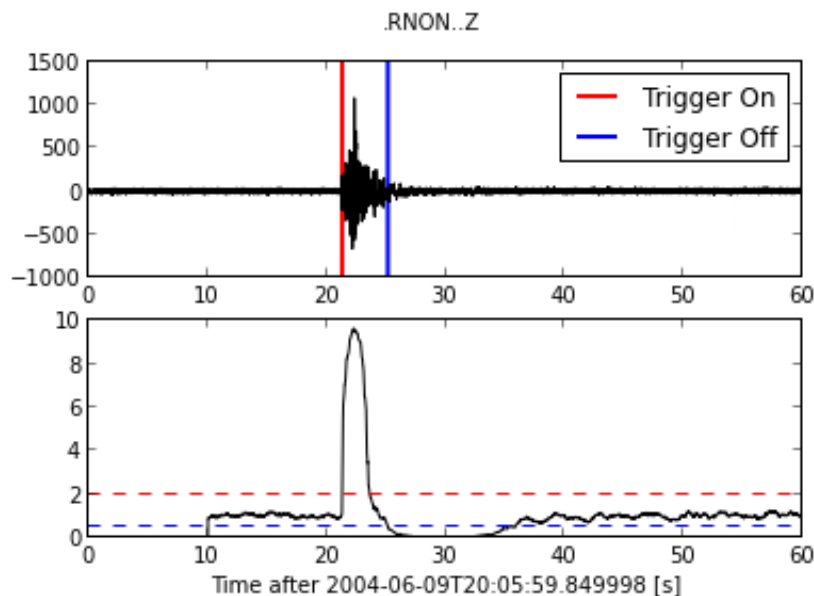


## Trigger/Picker: obspy.signal.trigger

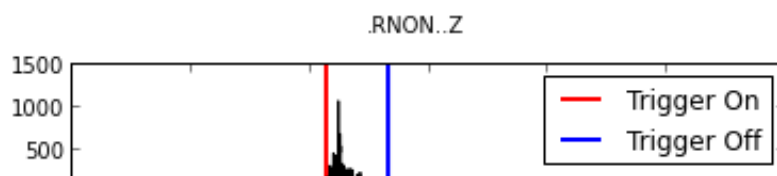
```
In [5]: #Metody z obspy.signal.trigger - mnoho
#skusime classicSTALTA(array,nsta,nlta):
from obspy.signal.trigger import classicSTALTA
t_sta=1. #casove okno pre sta
t_lta=10. #casove okno pre lta
samp=tr.stats.sampling_rate #vzorkovacia frekvencia
cft=classicSTALTA(tr.data,int(t_sta*samp),int(t_lta*samp))
print cft #vystup je charakteristica funkcia v tvar np.array

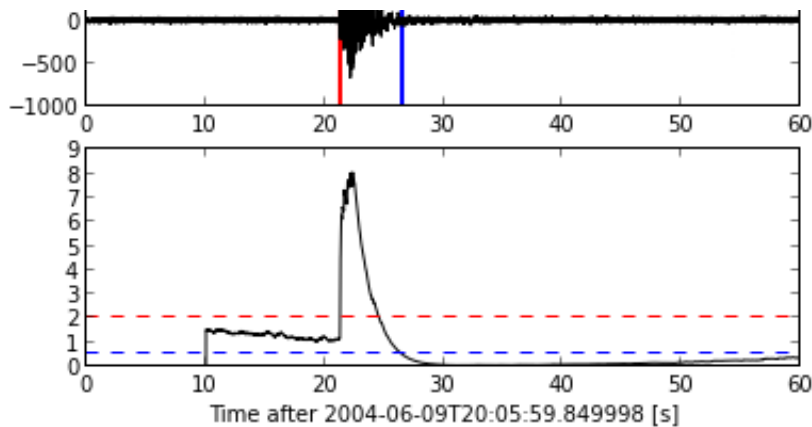
[ 0.          0.          0.          ...,  0.91793631
 0.91849621
 0.9185254 ]
```

```
In [6]: #vykreslenie cft
from obspy.signal.trigger import plotTrigger
thr_on=2. #threshold pre trigger ON
thr_off=.5 #threshold fpre trigger OFF
plotTrigger(tr,cft,thr_on,thr_off)
```



```
In [7]: #Dalsia metoda: rekurzivny STA/LTA
from obspy.signal.trigger import recSTALTA, plotTrigger
cft2=recSTALTA(tr.data,int(t_sta*samp),int(t_lta*samp))
plotTrigger(tr,cft2,thr_on,thr_off)
```





```
In [8]: #Ziskat hodnoty pre ON a OFF pre dane thresholds
from obspy.signal.trigger import triggerOnset
trg=triggerOnset(cft,thr_on,thr_off)
trg2=triggerOnset(cft2,thr_on,thr_off)
#porovnajme metody:
print trg/samp #vystup bude takto v sekundach
print trg2/samp

[[ 21.28  25.13]]
[[ 21.28  26.49]]
```

### Coincidence trigger - ziska zoznam prekryvajucich sa triggerov na sieti stanic

```
In [9]: from obspy.signal import coincidenceTrigger
#nenacitame dalsie data, ale
#skopirujeme to iste
#spustame coinc. trigger na 2 rovnake zaznamy.
st2=st.copy() #kopia
st2=st.copy()+st2 #vyrobime dalsi trace
#premenujeme stanicu na druhom trace, ma to detekciu
st2[1].stats.station="RN02"

coinc_sum=2 #minimalny pocet prekryvov
#este sa zadavaju parametre pre trigger
trig=coincidenceTrigger('classicSTALTA',thr_on,thr_off,st2,
                        coinc_sum,sta=t_sta,lta=t_lta)

print trig # vystup

[{'duration': 3.8500001430511475, 'coincidence_sum': 2.0,
 'stations': ['RN02', 'RN0N'], 'trace_ids': ['.RN02..Z',
 '.RN0N..Z'], 'time': UTCDateTime(2004, 6, 9, 20, 6, 21,
 129998)}]
```

### Baer Picker

```
In [10]: from obspy.signal.trigger import pkBaer
#nejake nastavenia:
tdownmax=25
```

```

min_nr_samples=100
sigma=12.
preset=100
p_pick, phase_info = pkBaer(tr.data,samp,tdownmax,
                             min_nr_samples,thr_on,sigma,preset,6)
print p_pick/samp #vystup v s

```

21.27

## obspy.signal.cross\_correlation

```

In [11]: #nacistame data
from obspy.core import read
st1=read("/home/mess/Downloads/BW.UH1..EHZ.D.2010.147.a.slist.gz")
st2=read("/home/mess/Downloads/BW.UH1..EHZ.D.2010.147.b.slist.gz")
#st1 = read("http://examples.obspy.org/BW.UH1..EHZ.D.2010.147.a.slist.gz")
#st2 = read("http://examples.obspy.org/BW.UH1..EHZ.D.2010.147.b.slist.gz")
tr1=st1[0]
tr2=st2[0]
print tr1,tr2
tr1.plot(),tr2.plot() #vykreslime aby sme videli zaznamy

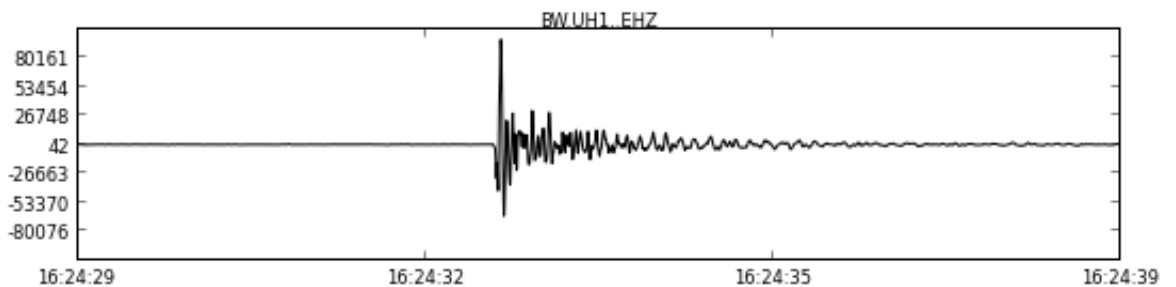
```

```

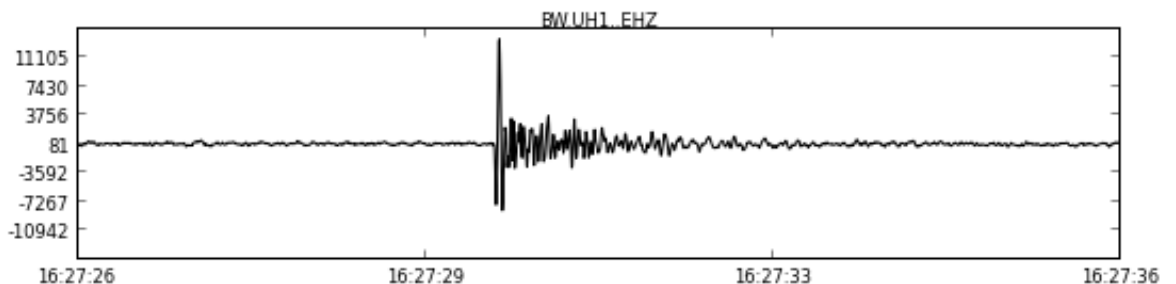
BW.UH1..EHZ | 2010-05-27T16:24:29.315000Z - 2010-05-27T16:24:39.315000Z | 200.0 Hz, 2001 samples
BW.UH1..EHZ | 2010-05-27T16:27:26.585000Z - 2010-05-27T16:27:36.585000Z | 200.0 Hz, 2001 samples

```

2010-05-27T16:24:29Z - 2010-05-27T16:24:39Z



2010-05-27T16:27:26Z - 2010-05-27T16:27:36Z




Out[11]: (None, None)

## xcorr

```
In [12]: from obspy.signal.cross_correlation import xcorr, xcorr_max
tr1cp=tr1.copy()
tr2cp=tr2.copy()
#varovanie od autorov:
#!!!shift_len has to be selected carefully,
#!!!make it a bit bigger than the highest signal shifts
#!!!that can ever occur
index, maxim, xcfct = xcorr(tr1.data,tr2.data,
                             shift_len=500,full_xcorr=True)

print index/samp,maxim #kedy a ake max je dosiahnute v xcorrelacii
print xcfct #vystup je v tvare np.array
```



```
0.015 0.904679169228
[ 0.00834656  0.00145004 -0.00579788 ..., -0.00946704
 -0.01712502
 -0.02328115]
```

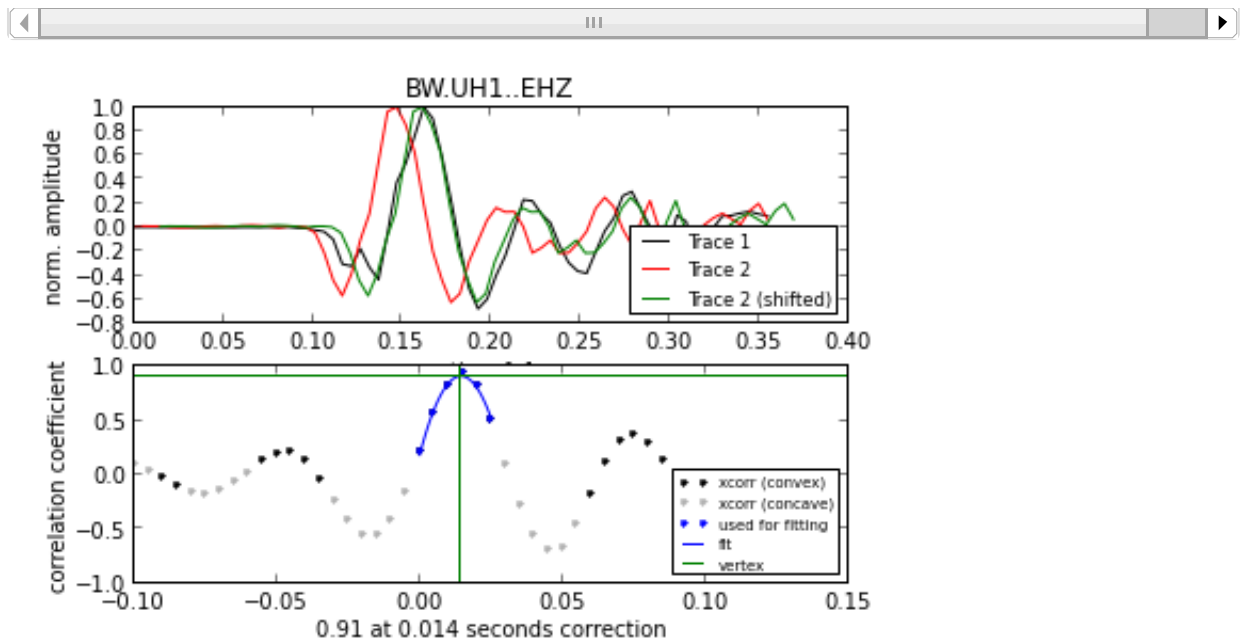
## xcorrPickCorrection

```
In [13]: #oprava pickovaneho casu pomocou kroskorelacie s inym zaznamom
from obspy.core import UTCDateTime
from obspy.signal.cross_correlation import xcorrPickCorrection
from obspy.signal.trigger import recSTALTA
from obspy.signal.trigger import triggerOnset,plotTrigger

#urcit pick1, vyuzijeme trigger!
t_sta=.1
t_lta=1.
samp=tr1cp.stats.sampling_rate
thr_on=4.
thr_off=0.5
cft1=recSTALTA(tr1cp.data,int(t_sta*samp),int(t_lta*samp))
trg1=triggerOnset(cft1,thr_on,thr_off)
pick1=trg1[0][0]/samp
#plotTrigger(tr1cp,cft1,thr_on,thr_off)

t1=tr1.stats.starttime+pick1
#zly pick pre druhy zaznam (aby mal co opravit):
#pouzijeme pick pre prvý zaznam
t2=tr2.stats.starttime+pick1

#oprava pre t2 o dt
#aj vykreslenie
dt,coeff = xcorrPickCorrection(t1,tr1,t2,tr2,t_before=0.05,
                               t_after=0.2,cc_maxlag=0.1,plot=True)
#vystup: dt & korelacny koeficient pre posunuty zaznam
print dt,coeff
```



-0.0144620095442 0.914092955583

## PPSD = Probabilistic Power Spectral Densities

Class to compile probabilistic power spectral densities for one combination of network/station/location/channel/sampling\_rate

```
In [14]: #nacitat data
from obspy.core import read
from obspy.xseed import Parser
from obspy.signal import PPSD
st = read("/home/mess/Downloads/BW.KW1..EHZ.D.2011.037")
print st
```

```
3 Trace(s) in Stream:
BW.KW1..EHZ | 2011-02-06T00:00:00.935000Z - 2011-02-
06T05:07:21.115000Z | 200.0 Hz, 3688037 samples
BW.KW1..EHZ | 2011-02-06T05:50:15.079999Z - 2011-02-
06T06:07:21.514999Z | 200.0 Hz, 205288 samples
BW.KW1..EHZ | 2011-02-06T07:49:55.940000Z - 2011-02-
07T00:00:01.130000Z | 200.0 Hz, 11641039 samples
```

```
In [15]: #nacitat poles&zeroes
parser = Parser("/home/mess/Downloads/dataless.seed.BW_KW1")
paz=parser.getPAZ("BW.KW1..EHZ")
print paz
```

```
{'sensitivity': 465550000.0, 'digitizer_gain': 629121.0,
'seismometer_gain': 740.0, 'zeros': [0j, 0j, (-434.1+0j)],
'gain': 818400000000.0, 'poles': [(-0.03691+0.03712j),
(-0.03691-0.03712j), (-371.2+0j), (-373.9+475.5j), (-373.9-
475.5j), (-588.4+1508j), (-588.4-1508j)]}
```



In [16]:

```
#tr2=st[0]
st2=st.copy()
tr2=st2[0]

#ak chceme rychly vypocet...
#st2=st[0:1] #len prvy trace
#st2.decimate(factor=2) #downsample na polovicnu frekvenciu
#print st2

#inicializuje ppsd:
ppsd=PPSD(tr2.stats,paz)
#pridat data do ppsd:
ppsd.add(st2)
print ppsd.times
#rozdeli data do lhodinovyh segmentov
# & preprocessing(demean,taper..)
```

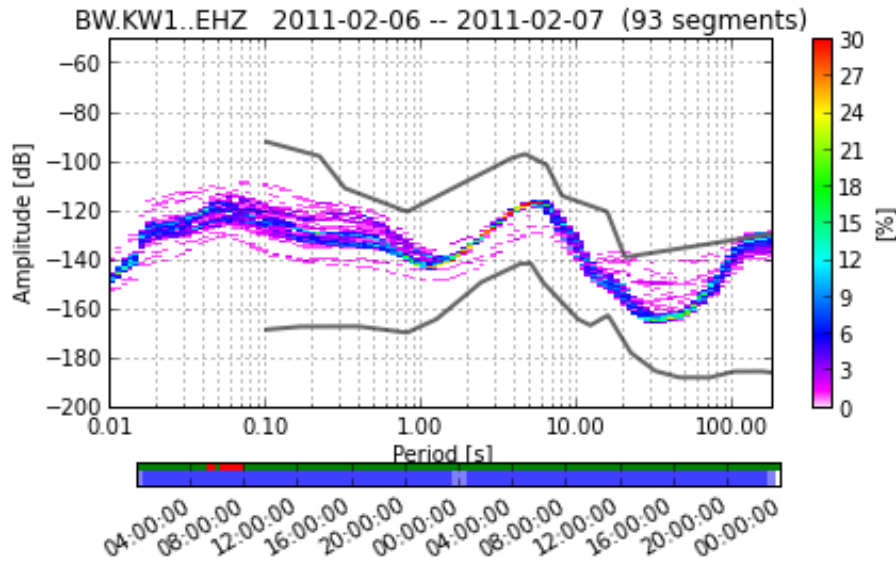
```
[UTCDateTime(2011, 2, 6, 0, 0, 0, 935000), UTCDateTime(2011, 2,
6, 0, 30, 0, 935000), UTCDateTime(2011, 2, 6, 1, 0, 0, 935000),
UTCDateTime(2011, 2, 6, 1, 30, 0, 935000), UTCDateTime(2011, 2,
6, 2, 0, 0, 935000), UTCDateTime(2011, 2, 6, 2, 30, 0, 935000),
UTCDateTime(2011, 2, 6, 3, 0, 0, 935000), UTCDateTime(2011, 2,
6, 3, 30, 0, 935000), UTCDateTime(2011, 2, 6, 4, 0, 0, 935000),
UTCDateTime(2011, 2, 6, 4, 30, 0, 935000), UTCDateTime(2011, 2,
6, 5, 0, 0, 935000), UTCDateTime(2011, 2, 6, 5, 30, 0, 935000),
UTCDateTime(2011, 2, 6, 6, 0, 0, 935000), UTCDateTime(2011, 2,
6, 6, 30, 0, 935000), UTCDateTime(2011, 2, 6, 7, 0, 0, 935000),
UTCDateTime(2011, 2, 6, 7, 30, 0, 935000), UTCDateTime(2011, 2,
6, 8, 0, 0, 935000), UTCDateTime(2011, 2, 6, 8, 30, 0, 935000),
UTCDateTime(2011, 2, 6, 9, 0, 0, 935000), UTCDateTime(2011, 2,
6, 9, 30, 0, 935000), UTCDateTime(2011, 2, 6, 10, 0, 0,
935000), UTCDateTime(2011, 2, 6, 10, 30, 0, 935000),
UTCDateTime(2011, 2, 6, 11, 0, 0, 935000), UTCDateTime(2011, 2,
6, 11, 30, 0, 935000), UTCDateTime(2011, 2, 6, 12, 0, 0,
935000), UTCDateTime(2011, 2, 6, 12, 30, 0, 935000),
UTCDateTime(2011, 2, 6, 13, 0, 0, 935000), UTCDateTime(2011, 2,
6, 13, 30, 0, 935000), UTCDateTime(2011, 2, 6, 14, 0, 0,
935000), UTCDateTime(2011, 2, 6, 14, 30, 0, 935000),
UTCDateTime(2011, 2, 6, 15, 0, 0, 935000), UTCDateTime(2011, 2,
6, 15, 30, 0, 935000), UTCDateTime(2011, 2, 6, 16, 0, 0,
935000), UTCDateTime(2011, 2, 6, 16, 30, 0, 935000),
UTCDateTime(2011, 2, 6, 17, 0, 0, 935000), UTCDateTime(2011, 2,
6, 17, 30, 0, 935000), UTCDateTime(2011, 2, 6, 18, 0, 0,
935000), UTCDateTime(2011, 2, 6, 18, 30, 0, 935000),
UTCDateTime(2011, 2, 6, 19, 0, 0, 935000), UTCDateTime(2011, 2,
6, 19, 30, 0, 935000), UTCDateTime(2011, 2, 6, 20, 0, 0,
935000), UTCDateTime(2011, 2, 6, 20, 30, 0, 935000),
UTCDateTime(2011, 2, 6, 21, 0, 0, 935000), UTCDateTime(2011, 2,
6, 21, 30, 0, 935000), UTCDateTime(2011, 2, 6, 22, 0, 0,
935000), UTCDateTime(2011, 2, 6, 22, 30, 0, 935000),
UTCDateTime(2011, 2, 6, 23, 0, 0, 935000)]
```

```
In [17]: print len(ppsd.times) #pocet hodinovych sekvencii
#a dalsie data
st3=read("/home/mess/Downloads/BW.KW1..EHZ.D.2011.038")
ppsd.add(st3) #ma detekciu,nemozno pridat dvakrat tie iste data

print len(ppsd.times) #po pridani dat
```

47  
93

```
In [18]: #vykreslit vysledok:
ppsd.plot()
```



## obspy.signal.tf\_misfit

### Continuous wavelet transform

```
In [28]: from obspy.signal.tf_misfit import cwt
#data
st3=read()#"./G.SCZ..BHE.sac")
tr3=st3[0]

#vstupne parametre
dt=tr3.stats.delta
fmin=0.05
fmax=50
w0=6 #hodnota odporucana z literatury

scalogram=cwt(tr3.data,dt,w0,fmin,fmax) #zatial len Morlet
```

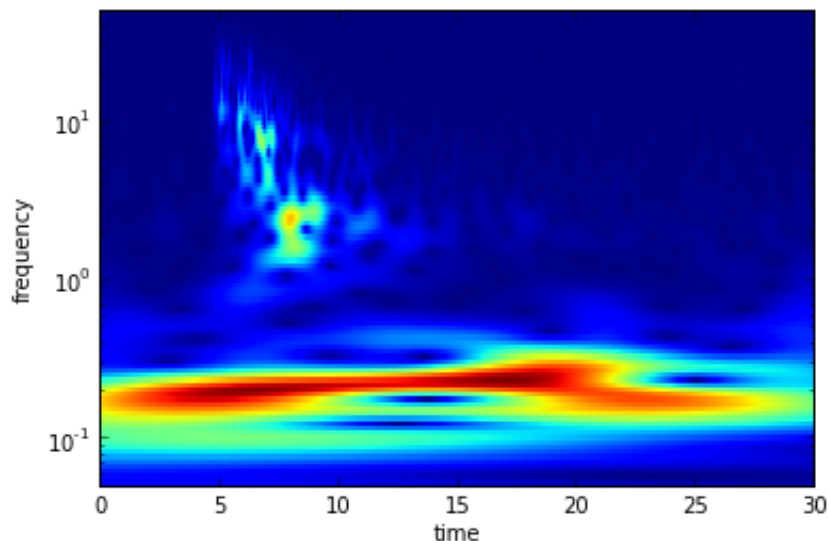
```
tr3.plot()
```

2009-08-24T00:20:03Z - 2009-08-24T00:20:32Z



```
In [27]: #vykreslenie pomocou matplotlib.  
import numpy as np  
import matplotlib.pyplot as plt  
fig=plt.figure()  
ax=fig.add_subplot(111)  
t0=0.  
tmax=dt*tr3.stats.npts  
ax.imshow(np.abs(scalogram)[-1::-1], extent=[t0,tmax,fmin,fmax],  
          interpolation='nearest')  
ax.set_xlabel('time')  
ax.set_ylabel('frequency')  
ax.set_yscale('log')  
plt.show
```

Out[27]: <function matplotlib.pyplot.show>

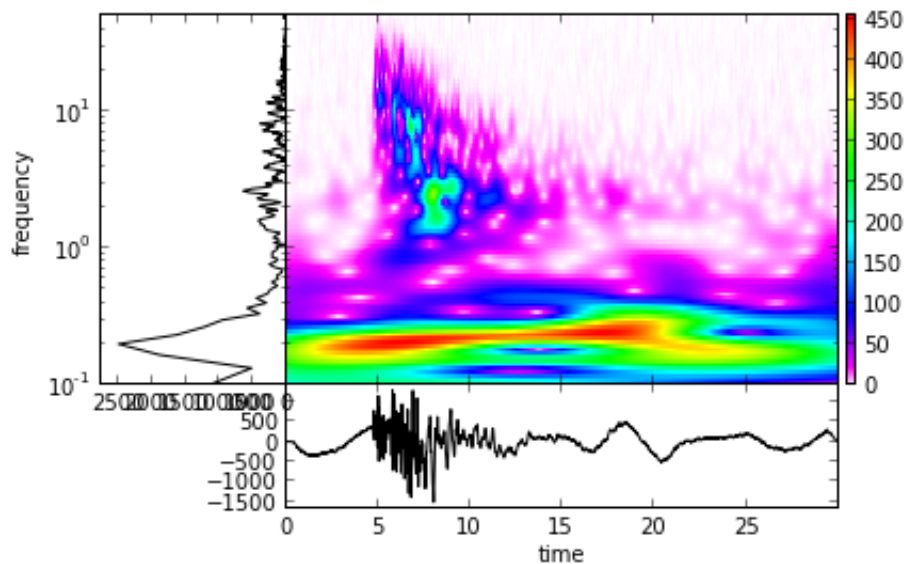


## TF reprezentacia

```
In [21]: #vykreslit TF reprezentaciu  
from obspy.signal.tf_misfit import plotTfr
```

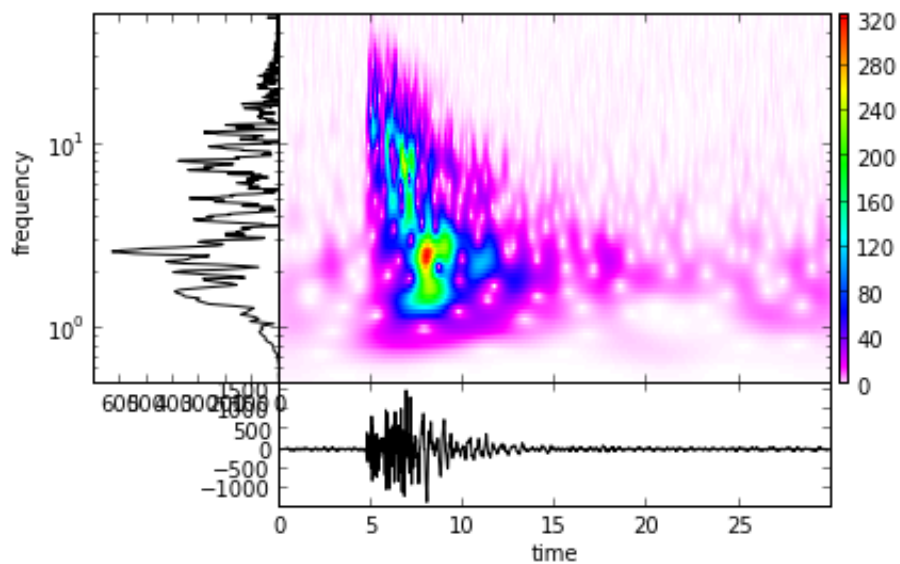
```
plotTfr(tr3.data,dt,fmin=1,fmax=50)
```

```
(1, 100, 3000)
```



```
In [22]: #a dalsia TF reprezentacia: pre filtrovany signal
tr3_filt=tr3.copy()
#odfiltrujeme dlhovlnny signal:
tr3_filt.filter('highpass',freq=1.,zerophase=True)
plotTfr(tr3_filt.data,dt,fmin=0.5,fmax=50.)
```

```
(1, 100, 3000)
```



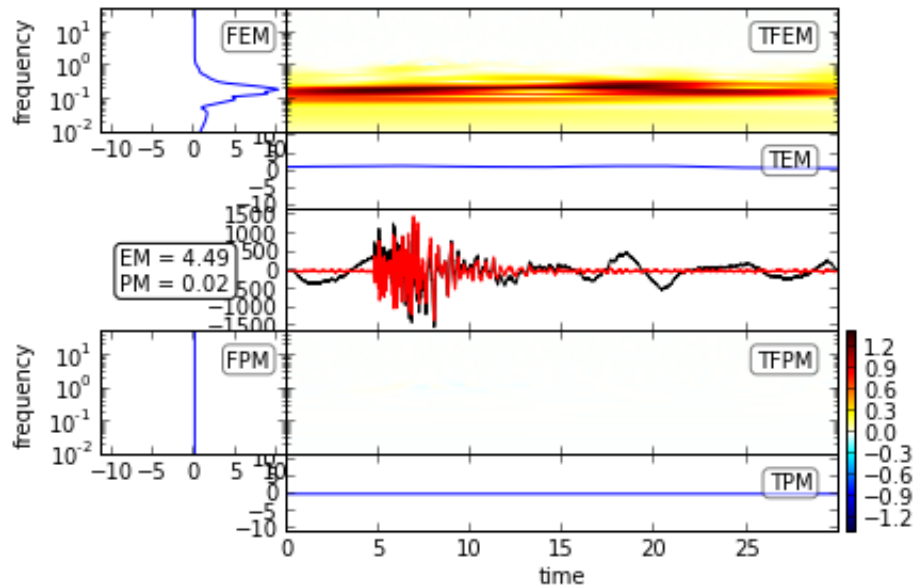
## TF Misfits

```
In [23]: from obspy.signal.tf_misfit import plotTfMisfits,em,pm
#pouzijeme povodny a filtrovany zaznam (bez dlhovlnnej zlozky)
#vykreslenie TF Misfitov:
plotTfMisfits(tr3.data,tr3_filt.data,fmin=0.01,fmax=50.)
```

```

#pouzili sme filter, ktory nemeni fazu -> nulove pm
#hodnoty:
print em(tr3.data,tr3_filt.data,fmin=0.01,fmax=50.)
print pm(tr3.data,tr3_filt.data,fmin=0.01,fmax=50.)
#podobne sa ziskau funkcie fem.tem.fpm. tpm (np.array)

```

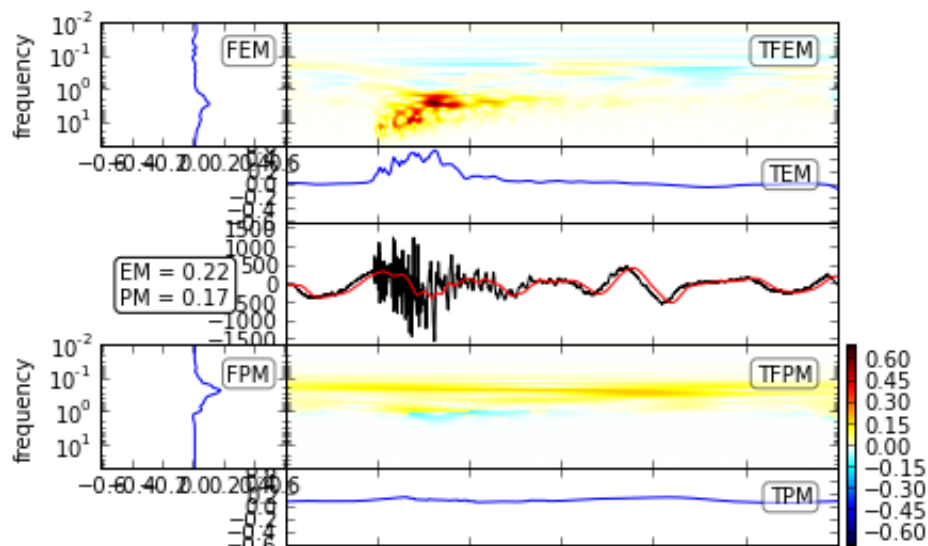


4.49337036855  
0.0167142748561

```

In [24]: #odfiltrujeme vysoke frekvencie, dovolime fazovy posun
tr3_filt2=tr3.copy()
#vnesieme fazovy posun na dlhovlnnejsej zlozke
tr3_filt2.filter('lowpass',freq=1.,zerophase=False)
#vykreslenie TF misfitov
plotTFmisfits(tr3.data,tr3_filt2.data,fmin=50.,fmax=0.01)
#hodnoty:
#odfiltrovanie vysokofrekv. casti - rozdiel v obalkach:
print em(tr3.data,tr3_filt2.data,fmin=50.,fmax=0.01)
#fazovy posun:
print pm(tr3.data,tr3_filt2.data,fmin=50.,fmax=0.01)

```



0.215362001055  
0.173672743528

## obspy.signal.invsim.estimateMagnitude

```
In [26]: from obspy.core import read, UTCDateTime
from obspy.core.util.geodetics import gps2DistAzimuth
from obspy.xseed import Parser
from obspy.signal.invsim import estimateMagnitude
#LOKALNE MAGNITUDO!

#data
st5 = read("http://localhost/data/Advanced%20bsPy%20Exercise/Lk

#nuly a poly
parser = Parser("http://localhost/data/Advanced%20bsPy%20Exerci
paz = parser.getPAZ("CH.LKBD..EHZ")

# maximalna amplituda na N zlozke
trn = st5.select(component="N")[0]
amplmax_n = max(trn.data)
amplmin_n = min(trn.data)
# maximalna amplituda na E zlozke
tre = st5.select(component="E")[0]
amplmax_e = max(tre.data)
amplmin_e = min(tre.data)
# maximalna amplituda na Z zlozke
trz = st5.select(component="Z")[0]
amplmax_z = max(trz.data)
amplmin_z = min(trz.data)

#vyrobime pole zo vsetkych zloziek
ampl = [amplmax_n-amplmin_n, amplmax_e-amplmin_e,
        amplmax_z-amplmin_z]
samp=st5[0].stats.sampling_rate

#poloha stanice a eventu
sta_lat = 46.38703
sta_lon = 7.62714
event_lat = 46.218
event_lon = 7.706
event_depth=5.2

#vypocet epicentralnej vzdialenosti
epi_dist, az, baz= gps2DistAzimuth(event_lat, event_lon,
                                   sta_lat, sta_lon)
epi_dist = epi_dist / 1000 #v km
```

```
epi_dist= sqrt(epi_dist**2+event_depth**2) #pridat hlbku  
  
# vstup: poles&zeroes, peak-to-peak amplitude  
# ... hypocentral distance, timespan of peak-to-peak ampl.  
print estimateMagnitude([paz,paz,paz], ampl,  
                          h_dist=epi_dist,timespan=0.5)  
#ML z katalogu bolo 2.3
```

2.28777972093

## FK Analysis

## Array response function