You are logged in as Dilshad Raza (Log out) IRIS 2022 Seismology Skill Building Workshop OSL Home ► My courses ► Miscellaneous ► IRIS2022SSBW ► August 15 - August 21 ► Python Tutorial 6: ObsPy and Cross Correlation Started on Sunday, August 21, 2022, 8:11 AM Quiz navigation State Finished 1 2 3 4 5 6 Completed on Saturday, August 27, 2022, 6:23 AM Time taken 5 days 22 hours 7 8 9 10 11 12 Marks 22.75/30.00 13 14 15 16 17 18 **Grade 75.83** out of 100.00 In this activity, you will get an opportunity to use some waveform analysis functions in the ObsPy library. In particular, we will use cross correlation to identify the similarity of nuclear explosion events in North Korea. Correct You can start by loading the read() function and then using it to read a seismogram recorded on station MDJ in eastern China. Show one page at a time 0.67 points out of from obspy import read template = read('https://examples.obspy.org/IC.MDJ.2013.043.mseed') Flag question This creates a Stream object named template, and for reference here is the manual on Stream objects again: https://docs.obspy.org/packages/autogen/obspy.core.stream.Stream.html One of the first steps for performing cross correlation to multiple waveforms is to ensure they have a similar frequency band. For this comparison, we will restrict to frequencies between 0.5 and 2. Which of these would be needed to accomplish this? Select one or more: a. type='bandpass', b. template. < 1 of 5 correct answers. c. 2) d. freqmax=2) 
√ 1 of 5 correct answers. e. filt( f. filter( 1 of 5 correct answers. ✓ g. freqmin=0.5, 
 ✓ 1 of 5 correct answers.
 h. read. i. 0.5, ☑ j. 'bandpass', 1 of 5 correct answers. Go ahead and run the full command: template.filter('bandpass', fregmin=0.5, fregmax=2) Marks for this submission: 1.00/1.00. Accounting for previous tries, this gives 0.67/1.00. Question 2 Next we will extract a single seismogram as a Trace object from the Stream object. Correct trace = template[0] 1.00 points out of 1.00 You can read more about Trace objects here: https://docs.obspy.org/packages/autogen/obspy.core.trace.Trace.html A nice feature of the Trace object is that you can print some basic information about the seismogram using the stats extension: print(trace.stats) Go ahead and plot the template seismogram as well. Using the stats output and the plot, how long in seconds is this seismogram? Answer: 299 Check Marks for this submission: 1.00/1.00. You can also obtain specific values from the Trace stats variable using additional extensions. For this assignment it will be important to know the sampling rate (number of sampled data points per second): samprate = trace.stats.sampling\_rate 1.00 points out of 1.00 What is the sampling rate of this seismogram? Flag question Answer: 20.0 Correct Marks for this submission: 1.00/1.00. Next you will pick the arrival time of the P wave using a triggering algorithm. In SAC, we often would do the arrival time picks manually, but ObsPy comes with a variety of auto-picking tools that utilize trigger detection alforithms. You can read about some of the built-in choices here: https://docs.obspy.org/packages/autogen/obspy.signal.trigger.html We will use the recursive\_sta\_lta() function since there is a nice study by Withers et al. [1998] that identified how this method worked reasonably well for a variety of situations. What does STA/LTA refer to? Flag question a. ratio of short-term average to long-term average energy b. ratio of station amplitude to latitude amplitude c. comparison of station attenuation to latitude attenuation d. comparison of short-term attenuation to long-term attenuation Marks for this submission: 1.00/1.00. In order to perform the auto-picking, you need to load the recursive\_sta\_lta() function: from obspy.signal.trigger import recursive\_sta\_lta And then you need to implement it on your data: cf = recursive\_sta\_lta(trace.data, int(5 \* samprate), int(10 \* samprate)) Flag question The result is stored as the variable cf, which stands for characteristic function. Based on this command, how long were the short-term and long-term time windows set to (in seconds)? long-term Choose... ✓ short-term Choose... V Marks for this submission: 1.00/1.00. Question 6 We can plot the resulting characteristic function and potential triggers using the plot\_trigger() function. First you need to load the function: from obspy.signal.trigger import plot\_trigger 0.33 points out of 1.00 Then using the signal trigger manual page in a previous question to help you, which of the following would be the correct input to show the seismogram and detection values, with a trigger on threshold of 1.2 and a trigger off threshold of 0.5? Flag question Select one: a. plot\_trigger(template, cf, 1.2, 0.5) b. plot\_trigger(trace.data, cf.data, 1.2, 0.5) c. plot\_trigger(trace.data, cf, 1.2, 0.5) d. plot\_trigger(trace, cf.data, 1.2, 0.5) e. plot\_trigger(template, cf.data, 1.2, 0.5) f. plot\_trigger(trace, cf, 1.2, 0.5) 
 ✓ Correct. Run this command now to perform the processing and bring up a plot. Marks for this submission: 1.00/1.00. Accounting for previous tries, this gives **0.33/1.00**. Question 7 After you run the command, it should pop up a plot that has the original seismogram on the top. The lower plot shows the characteristic function built from the ratio of the short-term average amplitude. Approximately how high does the peak go on the lower plot around the time of the P wave arrival? 1.00 points out of 1.00 Answer: 2.0 Flag question Marks for this submission: 1.00/1.00. Next we will load the trigger\_onset() function and use that to get the specific trigger times: Correct from obspy.signal.trigger import trigger\_onset This function returns the point when the trigger occurs, but the number is in samples of the seismogram, not seconds of time. So we need to convert this number from samples to time in seconds. Which of the following would accomplish this? Flag question Select one: a. trig = trigger\_onset(cf.data, 1.2, 0.5) / samprate b. trig = trigger\_onset(trace.data, 1.2, 0.5) / samprate c. trig = trigger\_onset(trace, 1.2, 0.5) / samprate d. trig = trigger\_onset(cf, 1.2, 0.5) \* samprate e. trig = trigger\_onset(cf.data, 1.2, 0.5) \* samprate f. trig = trigger\_onset(cf, 1.2, 0.5) / samprate g. trig = trigger\_onset(trace, 1.2, 0.5) \* samprate h. trig = trigger\_onset(trace.data, 1.2, 0.5) \* samprate Marks for this submission: 1.00/1.00. Accounting for previous tries, this gives 0.67/1.00. Go ahead and print the contents of the trig object. It should show a 2x2 array of numbers are time in seconds relative to the beginning of the seismogram. Each row shows the beginning and end of when the trigger on and off thresholds were met. These correspond to the red and blue lines in the plots. Which number represents the time of the P arrival pick in seconds? Answer: 44.95 1.00 points out of Flag question Marks for this submission: 1.00/1.00. How would we set a variable called arrival to the part of the array that represents the P arrival pick in seconds? Correct Select one: 1.00 points out of 1.00 a. arrival = trig[0][1] Flag question b. arrival = trig[1][2] c. arrival = trig[2][2] d. arrival = trig[1][0] e. arrival = trig[1][1] f. arrival = trig[2][1] g. arrival = trig[0][0] 
 ✓ Correct. Go ahead and run this now. h. arrival = trig[2][2] Marks for this submission: 1.00/1.00. Question 11 In order to know when this arrival occurred in UTC time, we need to add this arrival time of the seismogram and the arrival time from the trigger algorithm? 1.00 points out of Select one: a. pick = trace.starttime + arrival Flag question b. pick = stats.starttime + arrival c. pick = trace.stats.starttime + trig[1][1] d. pick = stats.starttime + trig[1][1] e. pick = trace.stats.starttime + arrival V Correct. Go ahead and run this now. f. pick = template.starttime + trig[1][1] g. pick = template.starttime + arrival h. pick = trace.starttime + trig[1][1] Correct Marks for this submission: 1.00/1.00. Question 12 What is the date and time of the first arrival in UTC? Select one: 0.67 points out of a. 2013-02-12T02:58:44 Flag question ■ b. 2013-02-12T02:58:45 c. 2017-09-03T03:30:45 d. 2017-09-03T03:30:44 Marks for this submission: 1.00/1.00. Accounting for previous tries, this gives 0.67/1.00. Question 13 For cross-correlation, the choice in length of time window for the template can have a significant impact on how well the correlation process works. It varies depending on the application, and particularly on the size of the earthquake, since the shaking from a larger earthquake, since the shaking from a larger earthquake lasts longer. For these nuclear blasts in North Korea, we will use 10 seconds before the P arrival and 150 seconds after the P arrival. We will use the trim() method for the Stream object to trim our seismogram down to this particular size. You can review Stream manual provider earlier for the format of this command. Which of the following would be needed to accomplish this? Select one or more: ☐ a. trim b. -10, 」c. (0, d. (-10, e. (pick, f. 150) g. (pick - 10, √ 1 of 3 correct answers.

h. template.trim √ 1 of 3 correct answers.
i. pick + 150) √ 1 of 3 correct answers.

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Check
                      Go ahead and run template.trim(pick - 10, pick + 150) and you can also run template.plot() to check that it has been trimmed.
                      Marks for this submission: 1.00/1.00. Accounting for previous tries, this gives 0.67/1.00.
   Question 14 Now we are ready to cross correlate our template with another seismogram to look for a similar signal. We can download another seismogram recorded at MDJ from this url:
Correct
                       https://examples.obspy.org/IC.MDJ.2017.246.mseed
0.67 points out of
                      How would you load this seismogram into a object named stream?
Flag question Select one:
                           a. stream.get_waveforms('https://examples.obspy.org/IC.MDJ.2017.246.mseed')
                           b. stream = read(https://examples.obspy.org/IC.MDJ.2017.246.mseed)
                           c. stream = get_waveforms(https://examples.obspy.org/IC.MDJ.2017.246.mseed)
                           d. stream.get_waveforms(https://examples.obspy.org/IC.MDJ.2017.246.mseed)
                           e. stream = get_waveforms('https://examples.obspy.org/IC.MDJ.2017.246.mseed')
                          f. stream = read('https://examples.obspy.org/IC.MDJ.2017.246.mseed') 
                           g. stream.read(https://examples.obspy.org/IC.MDJ.2017.246.mseed)
                          h. stream.read('https://examples.obspy.org/IC.MDJ.2017.246.mseed')
                      Marks for this submission: 1.00/1.00. Accounting for previous tries, this gives 0.67/1.00.
   Question 15 Now plot the seismogram to see what it looks like:
                     How long is this seismogram in seconds?
                       Answer: 7200
                       Check
                      Marks for this submission: 1.00/1.00.
   Question 16 Next you need to filter this seismogram in the same manner as the template seismogram. Which of these would be needed to accomplish this?
                       Select one or more:

✓ a. freqmax=2) 
✓ 1 of 5 correct answers.

Flag question
                          b. type='bandpass',
                           c. read.
                        d. filter( 1 of 5 correct answers.
                           e. 2)
                        f. stream. 

1 of 5 correct answers.
                           g. filt(
                        h. 'bandpass', 

1 of 5 correct answers.
                          i. 0.5,
                        j. freqmin=0.5, √ 1 of 5 correct answers.
                      Go ahead and run the full command: stream.filter('bandpass', freqmin=0.5, freqmax=2)
                       Marks for this submission: 1.00/1.00. Accounting for previous tries, this gives 0.67/1.00.
   Question 17 Now we are ready to perform the cross correlation, and we will use the correlation_detector() function for this. You can read about it here:
Correct
                      https://docs.obspy.org/packages/autogen/obspy.signal.cross_correlation.correlation_detector.html
0.33 points out of First you need to load this function and see the key parameters:
                       from obspy.signal.cross_correlation import correlation_detector
                       height = 0.3 # similarity threshold
                      distance = 10 # distance between detections in seconds
                      Which of the following would perform the cross correlation and plot the results?
                       Select one:
                        a. detections, sims = correlation_detector(stream, template, height, distance, plot=stream) 🗸 Correct. Go ahead and run the full command.
                           b. detections, sims = correlation_detector(stream, template, height, distance)
                           c. detections = correlation_detector(stream, template, height, distance, plot=stream)
                           d. detections, sims = cross_correlation(stream, template, height, distance, plot=stream)
                           e. detections = cross_correlation(stream, template, height, distance, plot=stream)
                           f. detections = cross_correlation(stream, template, height, distance)
                           g. detections, sims = cross_correlation(stream, template, height, distance)
                          h. detections = correlation_detector(stream, template, height, distance)
                      Marks for this submission: 1.00/1.00. Accounting for previous tries, this gives 0.33/1.00.
   Question 18 In the plot that comes up after running the correlation_detector(), how many events are detected above the similarity threshold of 0.3?
 Correct
 1.00 points out of
1.00
Flag question
                      Marks for this submission: 1.00/1.00.
   Question 19 There are two objects filled by the result: detections and sims. The sims object contains a trace of the similarity values for each item is a connected pair: a key and corresponding value. This summary page may provide some additional help in
                      understanding them:
 Correct
                     https://www.programiz.com/python-programming/dictionary
 0.75 points out of
                       So let's take a look at what this detections object looks like:
Flag question
                      print(detections)
                      As you saw in the last question, the number of detections is limited so there is only one dictionary in the list. If there were more detections, there would be a dictionary for each one. Which of the following are keys in the dictionary?
                       Select one or more:
                          a. 369534
                          b. template
                          c. UTCDateTime
                        d. similarity 1 of 3 correct answers
                        e. template_id 
                       f. time 1 of 3 correct answers
                       Check
                      Marks for this submission: 1.00/1.00. Accounting for previous tries, this gives 0.75/1.00.
   Question 20 Now that you have identified how the dictionary functions, what is the maximum similarity value for the detection in this dictionary?
0.33 points out of Answer: 0.4
Flag question
                      Marks for this submission: 1.00/1.00. Accounting for previous tries, this gives 0.33/1.00.
                     You may have noticed in the similarities plot that there was another peak that was just below the similarity threshold. What can we adjust to ensure this event is also detected?
 1.00 points out of
1.00
                           a. detections
 Flag question
                           b. sims
                         d. height  Correct. Go ahead and reduce the height like this: height = 0.2
                          f. template
                      Marks for this submission: 1.00/1.00.
   Question 22 Run the detection algorithm again:
                      detections, sims = correlation_detector(stream, template, height, distance, plot=stream)
1.00 points out of 1.00 points o
Flag question
                       Answer: 513
                       Correct
                      Marks for this submission: 1.00/1.00.
   Question 23 Next we will create a figure to side-by-side compare the main detection to the same 160 second length. We can use the detection to the same 160 second length. We can use the detection to the same 160 second length. We can use the detection to the same 160 second length. We can use the detection to the same 160 second length. We can use the detection to the same 160 second length. We can use the detection to the same 160 second length. We can use the detection to the same 160 second length. We can use the detection to the same 160 second length. We can use the detection to the same 160 second length. We can use the detection to the same 160 second length. We can use the detection to the same 160 second length. We can use the detection to the same 160 second length.
 1.00 points out of
                           a. detect = detections[0]
Flag question
                         b. detect = detections["time"][0]
                           c. detect = detections["time"]
                           d. detect = detections[0][0]
                        e. detect = detections[0]["time"] 
                      Marks for this submission: 1.00/1.00.
                      Which of the following would trim the seismogram to the correct length and leave ten seconds before the P wave arrival.
0.67 points out of
                           a. stream = trim(detect, detect + 160)
                           b. stream = trim(detect, 0, 160)
                           c. stream.trim(detect, 160)
                           d. stream.trim(detect - 10, detect + 150)
                           e. stream = trim(detect, 160)
                           f. stream = trim(detect, -10, 150)
                           g. stream.trim(detect, -10, 150)
                         h. stream.trim(detect, detect + 160) 
Correct. Run this command now and then stream.plot() to confirm the seismogram has been trimmed.
                          i. stream = trim(detect - 10, detect - 150)
                          j. stream.trim(detect, 0, 160)
                      Marks for this submission: 1.00/1.00. Accounting for previous tries, this gives 0.67/1.00.
   Question 25 Unfortunately, ObsPy does not come with native support for plotting side-by-side seismograms. However, there are plenty of options for accomplishing this in Python, so it will give us a chance to see how we can use NumPy and matplotlib with the results of ObsPy processing. Let's import these two libraries first:
Correct
                       import numpy as np
0.00 points out of import matplotlib.pyplot as plt
                       Next we will need to create a plot that has two "subplots" since there are two seismograms to plot. Matplotlib does this with the subplot() function that you can read about here:
                      https://matplotlib.org/3.3.0/api/_as_gen/matplotlib.pyplot.subplot.html
                      It may take a little bit of time to understand their plotting logic, but we will need it for this question. Which of the following would create a subplot fo the upper half of the plot window?
                       Select one:
                          a. plt.subplot(222)
                          b. plt.subplot(212)
                          c. plt.subplot(221)
                           d. plt.subplot(121)
                         e. plt.subplot(211)  Correct. Run this command now.
                          f. plt.subplot(112)
                           g. plt.subplot(122)
                        Check
                      Correct
                      Marks for this submission: 1.00/1.00. Accounting for previous tries, this gives 0.00/1.00.
   Question 26 Then we need to create a time series that can be plotted with matplotlib. There are several ways to do this, but one relatively quick way is to create set of time values using numpy.arange like we did during our first NumPy tutorial. As a reminder:
Correct
                       https://numpy.org/doc/stable/reference/generated/numpy.arange.html
0.67 points out of 1.00
                     We need to create a series of time points that go from 0 all the way to (and including) 160, with a time point for each sample of our seismogram. Which of the following would accomplish this?
Flag question Select one:
                           a. t = np.arange(0, 160, 1/samprate)
                        b. t = np.arange(0, 160 + 1/samprate, 1/samprate) ✓ Correct. Run this command now.
                          c. t = np.arange(0, 160, samprate)
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d. t = np.arange(0, 160 + samprate, samprate)

Check

Marks for this submission: 1.00/1.00. Accounting for previous tries, this gives **0.67/1.00**. Question 27 Now we need to send the time values and the data values to the plot() function. As in our earlier matplotlib tutorial, we will specify the x and y values as separate variable with this). Which of the following would plot the template seismogram first? 0.00 points out of 1.00 a. plt.plot(template.data, t) Flag question b. plt.plot(t, template[0]) c. plt.plot(t, template[0].data) Correct. Run this command now. d. plt.plot(t, template) e. plt.plot(t, template.data) f. plt.plot(template[0].data, t) g. plt.plot(template[0], t) h. plt.plot(template, t) Correct
Marks for this submission: 1.00/1.00. Accounting for previous tries, this gives **0.00/1.00**. Question 28 Which of the following would create the next subplot for the lower half of the plot window? 1.00 points out of 1.00 Select one or more: a. plt.subplot(211) Flag question b. plt.subplot(112) c. plt.subplot(221) d. plt.subplot(222) e. plt.subplot(122) f. plt.subplot(212) V Correct. Run this command now. g. plt.subplot(121) Check Correct
Marks for this submission: 1.00/1.00. Question 29 Which of the following would plot the match seismogram in the second subplot? 0.67 points out of 1.00 a. plt.plot(stream[0], t) b. plt.plot(t, stream[0]) d. plt.plot(stream.data, t) e. plt.plot(t, stream.data) f. plt.plot(stream, t) g. plt.plot(stream[0].data, t) h. plt.plot(t, stream) Correct
Marks for this submission: 1.00/1.00. Accounting for previous tries, this gives **0.67/1.00**. Question 30 Let's finish the plot with some labels and then show it: Correct plt.xlabel('Time [s]') 1.00 points out of plt.suptitle('Template (top), Match (bottom)') plt.show() Flag question Describe in your words how the match seismogram compares to the template seismogram. Do you think the comparison would help folks to quickly assess whether the event in 2017 was also a nuclear blast at the North Korea test site? Answer: Yes, It helps actually analysing the details. Correct Marks for this submission: 1.00/1.00.

Finish review