Install package for obtaining USGS streamflow data
!pip install -U dataretrieval
Import the functions for downloading data from NWIS
import dataretrieval.nwis as nwis

Specify the USGS site code
site = '04201500' # This code refers to the Rocky River near Berea OH
Get instantaneous values (iv)

df = nwis.get_record(sites=site, service='dv', start='2017-01-01', end='2022-02-18')

df

	00010_ Maximu m	00010_Ma ximum_cd	site_ no	00010_ Minimu m	00010_Mi nimum_c d	00010 _Mea n	00010_ Mean_c d	00060 _Mea n	00060_ Mean_c d
datetim e									
2017- 01-01 00:00:0 0+00:0 0	NaN	NaN	0420 1500	NaN	NaN	NaN	NaN	123.0	A
2017- 01-02 00:00:0 0+00:0	NaN	NaN	0420 1500	NaN	NaN	NaN	NaN	107.0	A
2017- 01-03 00:00:0 0+00:0 0	NaN	NaN	0420 1500	NaN	NaN	NaN	NaN	363.0	A
2017- 01-04 00:00:0 0+00:0 0	NaN	NaN	0420 1500	NaN	NaN	NaN	NaN	1710.0	A
2017- 01-05 00:00:0 0+00:0	NaN	NaN	0420 1500	NaN	NaN	NaN	NaN	549.0	A
•••									
2022- 02-13 00:00:0	- 999999.0	P, Eqp	0420 1500	- 999999.0	P, Eqp	- 99999 9.0	P, Eqp	728.0	P

	00010_ Maximu m	00010_Ma ximum_cd	site_ no	00010_ Minimu m	00010_Mi nimum_c d	00010 _Mea n	00010_ Mean_c d	00060 _Mea n	00060_ Mean_c d
datetim e									
0+00:0									
2022- 02-14 00:00:0 0+00:0	- 999999.0	P, Eqp	0420 1500	- 999999.0	P, Eqp	- 99999 9.0	P, Eqp	451.0	P
2022- 02-15 00:00:0 0+00:0 0	- 999999.0	P, Eqp	0420 1500	- 999999.0	P, Eqp	- 99999 9.0	P, Eqp	343.0	P
2022- 02-16 00:00:0 0+00:0	- 999999.0	P, Eqp	0420 1500	- 999999.0	P, Eqp	- 99999 9.0	P, Eqp	382.0	P
2022- 02-17 00:00:0 0+00:0	- 999999.0	P, Eqp	0420 1500	- 999999.0	P, Eqp	- 99999 9.0	P, Eqp	5730.0	P

1867 rows \times 9 columns

datetime

Question 1

The plot above shows the mean daily discharge (in cubic feet per second) of the Rocky River in Berea OH for the last 5 years. Here we can see an intra-annual cycle where discharge regularly increases during the melt season (February-April).

Question 2

Make an HTML table that contains the site name, site number and mean daily discharge between Oct 31, 2020 and Sep 30, 2021 (zero decimal places)** for three rivers in the US.

```
# Specify the USGS site code
willamette = '14211720' # WILLAMETTE RIVER AT EUGENE, OR
mississippi = '07032000' # MISSISSIPPI RIVER AT MEMPHIS, TN
detroit = '04165710' # DETROIT RIVER AT FORT WAYNE AT DETROIT, MI
# Get instantaneous values (iv)
wdf = nwis.get record(sites=willamette, service='dv', start='2020-10-31',
end='2021-09-30')
mdf = nwis.get record(sites=mississippi, service='dv', start='2020-10-31',
end='2021-09-30')
ddf = nwis.get record(sites=detroit, service='dv', start='2020-10-31',
end='2021-09-30')
wdf mean discharge = wdf['00060 Mean'].mean()
mdf mean discharge = mdf['00060 Mean'].mean()
ddf mean discharge = ddf['00060 Mean'].mean()
print("wdf = %.0f; mdf = %.0f; ddf = %.0f" %
(wdf mean discharge, mdf mean discharge, ddf mean discharge))
wdf = 27817; mdf = 572510; ddf = 234536
                                            Mean Daily Discharge (between Oct 31,
                                     Site
            Site Name
                                                   2020 and Sep 30, 2021)
                                   Number
WILLAMETTE RIVER AT EUGENE,
                                  14211720
                                           27817
OR
MISSISSIPPI RIVER AT MEMPHIS,
                                  07032000 572510
TN
DETROIT RIVER AT FORT WAYNE
                                  04165710 234536
AT DETROIT, MI
# Import packages
import numpy as np
import pandas as pd
import folium
# Read HTML table data
pd.read html('https://en.wikipedia.org/wiki/List of mountain peaks of Oregon'
mountains
```

```
# We would like the table that contains the highest summits of Oregon which
happens to be the second one
mountain_stats = mountains[1]
# Some wrangling
mountain_stats['Location'] =
mountain_stats['Location'].str.replace(mountain_stats['Location'].loc[0],
"45°22'25"N 121°41'45"W\ufeff / \ufeff45.3735°N 121.6959°W", regex=True)
mountain_stats
```

	Ran k	Mountain peak	Mounta in range	Elevati on	Promine nce	Isolati on	Location
0	1	Mount Hood[6][7][8][9][a]	Cascade Range	3428.8 m	2349 m	92.2 k m	45°22′25″N 121°41′45″W / 45.3 735°N 121.6959°W
1	2	Mount Jefferson[10][11][12][13][b]	Cascade Range	3201 m	1767 m	77.5 k m	44°40′27″N 121°47′59″W / 44.6 743°N 121.7996°W
2	3	South Sister[14][15][16][17]	Cascade Range	3158.5 m	1705 m	63.4 k m	44°06′13″N 121°46′09″W / 44.1 035°N 121.7693°W
3	4	North Sister[18][19][20][21][c]	Cascade Range	3075 m	837 m	7 km	44°10′00″N 121°46′20″W / 44.1 666°N 121.7723°W
4	5	Middle Sister[22][23][24][25][d]	Cascade Range	3064 m	382 m	1.8 km	44°08′54″N 121°47′02″W / 44.1 483°N 121.7840°W
5	6	Sacajawea Peak[26][27][28][e][f]	Wallow a Mountai ns	3000 m	1949 m	202 k m	45°14′42″N 117°17′34″W / 45.2 450°N 117.2929°W
6	7	Steens Mountain[29][30][31][g]	Steens Mountai n	2968 m	1336 m	201 k m	42°38′11″N 118°34′36″W / 42.6 364°N 118.5767°W
7	8	Aneroid Mountain[32][33][34][35]	Wallow a Mountai ns	2958.7 m	647 m	9.48 k m	45°12′11″N 117°10′30″W / 45.2 030°N 117.1750°W
8	9	Twin Peaks[36][37][38][h]	Wallow a Mountai ns	2950 m	610 m	7.79 k m	45°18′17″N 117°20′43″W / 45.3 046°N 117.3452°W
9	10	Red Mountain[39][40][41][42]	Wallow	2913.8 m	610 m	11.84 k m	45°03′52″N 117°14′46″W / 45.0 644°N 117.2460°W

	Ran k	Mountain peak	Mounta in range	Elevati on	Promine nce	Isolati on	Location
			Mountai ns				
1 0	11	Mount McLoughlin[43][44][45][46][i][j]	Cascade Range	2895 m	1364 m	111.8 k m	42°26′40″N 122°18′56″W / 42.4 445°N 122.3156°W
1	12	Elkhorn Peak[47][48][49][k]	Wallow a Mountai ns	2816 m	567 m	5.32 k m	45°13′20″N 117°23′48″W / 45.2 223°N 117.3968°W
1 2	13	Mount Thielsen[50][51][52][53]	Cascade Range	2799.4 m	1025 m	81.1 k m	43°09′10″N 122°03′59″W / 43.1 528°N 122.0665°W
1 3	14	Broken Top[54][55][56][1]	Cascade Range	2798 m	669 m	5.52 k m	44°04′59″N 121°41′58″W / 44.0 830°N 121.6994°W
1 4	15	Rock Creek Butte[57][58][59][m]	Elkhorn Mountai ns	2777 m	1364 m	69.9 k m	44°49′00″N 118°06′14″W / 44.8 168°N 118.1039°W
1 5	16	Mount Bachelor[60][61][62][63]	Cascade Range	2764 m	818 m	11.02 k m	43°58′46″N 121°41′19″W / 43.9 794°N 121.6885°W
1 6	17	Strawberry Mountain[64][65][66][67] [n]	Strawbe rry Range	2756.1 m	1253 m	74.2 k m	44°18′44″N 118°43′00″W / 44.3 123°N 118.7166°W
1 7	18	Mount Scott[68][69][70][71]	Cascade Range	2722.9 m	920 m	25.9 k m	42°55′22″N 122°00′58″W / 42.9 229°N 122.0162°W
1 8	19	Diamond Peak[72][73][74][75]	Cascade Range	2666.4 m	952 m	41.4 k m	43°31′15″N 122°08′59″W / 43.5 207°N 122.1496°W
19	20	Pueblo Mountain[76][77][78][79] [0]	Pueblo Mountai ns	2633.3 m	927 m	45.5 k m	42°05′58″N 118°39′02″W / 42.0 995°N 118.6506°W
2 0	21	Crane Mountain[80][81][82][83]	Warner Mountai ns	2575.8 m	718 m	71.4 k m	42°03′46″N 120°14′27″W / 42.0 628°N 120.2408°W
2 1	22	Drake Peak[84][85][86][87][p]	Warner Mountai ns	2564 m	779 m	28.1 k m	42°18′00″N 120°07′26″W / 42.3 001°N 120.1238°W

	Ran k	Mountain peak	Mounta in range	Elevati on	Promine nce	Isolati on	Location
2 2	23	Mount Bailey[88][89][90][91][q]	Cascade Range	2553.3 m	908 m	12.49 k m	43°09′18″N 122°13′12″W / 43.1 551°N 122.2200°W
2 3	24	Gearhart Mountain[92][93][94][95]	Gearhart Mountai n	2550.6 m	1049 m	65.7 k m	42°29′46″N 120°52′38″W / 42.4 960°N 120.8773°W
2 4	25	Aspen Butte[96][97][98][99]	Cascade Range	2503.83 m	947 m	23.7 k m	42°18′56″N 122°05′15″W / 42.3 155°N 122.0876°W
2 5	26	Yamsay Mountain[100][101][102][103]	Cascade Volcani c Arc	2499.3 m	970 m	53.1 k m	42°55′50″N 121°21′39″W / 42.9 306°N 121.3607°W
2 6		Vinegar Hill[104][105][106][107][r]	Greenho rn Mountai ns	2482 m	884 m	23.5 k m	44°42′50″N 118°33′42″W / 44.7 138°N 118.5617°W
2 7	28	Pelican Butte[108][109][110][111]	Cascade Range	2449.8 m	669 m	15.98 k m	42°30′48″N 122°08′43″W / 42.5 134°N 122.1453°W
2 8	29	Lookout Mountain[112][113][114][s]	Strawbe rry Range	2450 m	650 m	10.73 k m	44°17′20″N 118°29′43″W / 44.2 889°N 118.4954°W
2 9	30	Warner Peak[115][116][117][118] [t]	Hart Mountai n	2445.8 m	648 m	35.6 k m	42°27′35″N 119°44′29″W / 42.4 597°N 119.7414°W
3 0	31	Paulina Peak[119][120][121][122] [u] atitude is string posi	Paulina Mountai ns		981 m	46.5 k m	43°41′21″N 121°15′18″W / 43.6 892°N 121.2549°W

```
lat1 = mountain_stats['Location'].iloc[0][27:34]

# The longitude is string position 37 to 45
lon1 = mountain_stats['Location'].iloc[0][37:45]

# Convert to float and multiple by -1
float(mountain_stats['Location'].iloc[0][37:45]) * -1
-121.6959

# To get these data from every row, we can write a quick for loop coords = []
for i in range(len(mountain_stats)):
    lat = float(mountain_stats['Location'].iloc[i][27:34])
    lon = float(mountain_stats['Location'].iloc[i][37:45]) * -1
    coords.append((lat, lon))
```

```
[(45.3735, -121.6959),
 (44.6743, -121.7996),
 (44.1035, -121.7693),
 (44.1666, -121.7723),
 (44.1483, -121.784),
 (45.245, -117.2929),
 (42.6364, -118.5767),
 (45.203, -117.175),
 (45.3046, -117.3452),
 (45.0644, -117.246),
 (42.4445, -122.3156),
 (45.2223, -117.3968),
 (43.1528, -122.0665),
 (44.083, -121.6994),
 (44.8168, -118.1039),
 (43.9794, -121.6885),
 (44.3123, -118.7166),
 (42.9229, -122.0162),
 (43.5207, -122.1496),
 (42.0995, -118.6506),
 (42.0628, -120.2408),
 (42.3001, -120.1238),
 (43.1551, -122.22),
 (42.496, -120.8773),
 (42.3155, -122.0876),
 (42.9306, -121.3607),
 (44.7138, -118.5617),
 (42.5134, -122.1453),
 (44.2889, -118.4954),
 (42.4597, -119.7414),
 (43.6892, -121.2549)]
# Get elevation value as a float
float(mountain stats['Elevation'].iloc[0][:-2])
3428.8
# To get these data from every row, we can write another quick for loop
elevation = []
for i in range(len(mountain stats)):
    elev = float(mountain stats['Elevation'].iloc[i][:-2])
    elevation.append(elev)
elevation
[3428.8,
3201.0,
3158.5,
 3075.0,
 3064.0,
 3000.0,
 2968.0,
 2958.7,
 2950.0,
 2913.8,
 2895.0,
 2816.0,
 2799.4,
 2798.0,
 2777.0,
 2764.0,
 2756.1,
```

```
2722.9,
 2666.4,
 2633.3,
 2575.8,
 2564.0,
 2553.3,
 2550.6,
 2503.83,
 2499.3,
 2482.0,
 2449.8,
 2450.0,
 2445.8,
 2435.0]
map = folium.Map(location=[44, -121], zoom start=7)
for i in range(0, len(coords)):
    folium.Marker(coords[i], popup=elevation[i]).add to(map)
map
```

Question 3

Make a new map of the tallest mountains in Oregon but include a popup that displays the Isolation data as a float.

```
# Get isolation value as a float
float(mountain stats['Isolation'].iloc[0][:-2])
92.2
# To get these data from every row, we can write another quick for loop
isolation = []
for r in range(len(mountain stats)):
    iso = float(mountain stats['Isolation'].iloc[r][:-2])
    isolation.append(iso)
isolation
[92.2,
77.5,
 63.4,
 7.0,
 1.8,
 202.0,
 201.0,
 9.48,
 7.79,
 11.84,
 111.8,
 5.32,
 81.1,
 5.52,
 69.9,
 11.02,
 74.2,
 25.9,
 41.4,
 45.5,
 71.4,
```

```
28.1,
12.49,
65.7,
23.7,
53.1,
23.5,
15.98,
10.73,
35.6,
46.5]
# Create map of tallest mountains with isolation data popup
map = folium.Map(location=[44, -121], zoom_start=7)
for i in range(0, len(coords)):
    folium.Marker(coords[i], popup=isolation[i]).add_to(map)
map
```

Make this Notebook Trusted to load map: File -> Trust Notebook

Grad Student Question

Add a popup that includes the name of the mountain as a string (without any square brackets).

```
import re
# Get string data from every row and remove square brackets + contents of
square brackets
mount name = []
for p in range(len(mountain stats)):
    name = str(mountain stats['Mountain peak'].iloc[p])
    name fix = re.sub(r'\[.*?\]','',name, flags=re.DOTALL)
    mount name.append(name fix)
mount name
['Mount Hood',
 'Mount Jefferson',
 'South Sister',
 'North Sister',
 'Middle Sister',
 'Sacajawea Peak',
 'Steens Mountain',
 'Aneroid Mountain',
 'Twin Peaks',
 'Red Mountain',
 'Mount McLoughlin',
 'Elkhorn Peak',
 'Mount Thielsen',
 'Broken Top',
 'Rock Creek Butte',
 'Mount Bachelor',
 'Strawberry Mountain',
 'Mount Scott',
 'Diamond Peak',
 'Pueblo Mountain',
 'Crane Mountain',
 'Drake Peak',
```

```
'Mount Bailey',
 'Gearhart Mountain',
 'Aspen Butte',
 'Yamsay Mountain',
 'Vinegar Hill',
 'Pelican Butte',
 'Lookout Mountain',
 'Warner Peak',
 'Paulina Peak']
# Create map of tallest mountains with corrected mountain name data popup
map = folium.Map(location=[44, -121], zoom start=7)
for i in range(0, len(coords)):
    folium.Marker(coords[i], popup=mount name[i]).add to(map)
map
# Install webdriver manager:
https://github.com/SergeyPirogov/webdriver manager
!pip3 install webdriver manager
# Import packages
from selenium import webdriver
from selenium.webdriver.firefox.service import Service
from selenium.webdriver.common.by import By
from selenium.webdriver.support.ui import WebDriverWait
from selenium.webdriver.support import expected conditions as EC
from webdriver manager.firefox import GeckoDriverManager
# Install Chrome webdriver
driver = webdriver.Firefox(service=Service(GeckoDriverManager().install()))
# Open a web browser at the following page
driver.get("https://en.wikipedia.org/wiki/Category:Ski areas and resorts in O
regon")
===== WebDriver manager =====
Current firefox version is 97.0
Get LATEST geckodriver version for 97.0 firefox
Driver [/Users/lily/.wdm/drivers/geckodriver/macos/v0.30.0/geckodriver] found
in cache
# Retrieve ski resort names
html list = driver.find element(By.ID, "mw-pages")
items = html list.find elements(By.TAG NAME, "li")
ski resort names = []
for item in items:
    text = item.text
    print(text)
    ski resort names.append(text)
driver.close()
Anthony Lakes (ski area)
Mount Ashland Ski Area
Cooper Spur ski area
Ferguson Ridge Ski Area
Hoodoo (ski area)
Mount Ashland Ski Area Expansion
Mount Bachelor ski area
Mount Hood Meadows
Mount Hood Skibowl
Snow Bunny
Spout Springs Ski Area
```

```
Summit Pass (Oregon)
Timberline Lodge ski area
Warner Canyon
Willamette Pass Resort
ski resort coords = []
# Loop through every ski resort to find it's coordinates
for resort in ski resort names:
    # Define URL to search in Google Maps and add 'Oregon' in for good
measure
    url = 'https://www.google.com/maps/place/' + resort + ' Oregon/'
    # Import web driver and search for ski resorts
webdriver.Firefox(service=Service(GeckoDriverManager().install()))
    driver.get(url)
    # Click search
    element = WebDriverWait(driver,
20).until(EC.element to be clickable((By.ID, "searchbox-searchbutton")))
    element.click()
    # Make the web driver wait until the URL updates (i.e. contains the @
sign we're looking for)
    WebDriverWait(driver, 20).until(EC.url contains("@"))
    # Retrieve the URL
    link = driver.current url
    # Split string
    lat, lon = link.rsplit('@', 1)[1].rsplit(',', 1)[0].rsplit(',', 1)
    # Append to list
    ski resort coords.append((lat, lon))
    # Close driver
    driver.close()
===== WebDriver manager =====
Current firefox version is 97.0
Get LATEST geckodriver version for 97.0 firefox
Driver [/Users/lily/.wdm/drivers/geckodriver/macos/v0.30.0/geckodriver] found
in cache
===== WebDriver manager =====
Current firefox version is 97.0
Get LATEST geckodriver version for 97.0 firefox
Driver [/Users/lily/.wdm/drivers/geckodriver/macos/v0.30.0/geckodriver] found
in cache
===== WebDriver manager =====
Current firefox version is 97.0
Get LATEST geckodriver version for 97.0 firefox
Driver [/Users/lily/.wdm/drivers/geckodriver/macos/v0.30.0/geckodriver] found
in cache
```

```
===== WebDriver manager =====
Current firefox version is 97.0
Get LATEST geckodriver version for 97.0 firefox
Driver [/Users/lily/.wdm/drivers/geckodriver/macos/v0.30.0/geckodriver] found
===== WebDriver manager =====
Current firefox version is 97.0
Get LATEST geckodriver version for 97.0 firefox
Driver [/Users/lily/.wdm/drivers/geckodriver/macos/v0.30.0/geckodriver] found
in cache
===== WebDriver manager =====
Current firefox version is 97.0
Get LATEST geckodriver version for 97.0 firefox
Driver [/Users/lily/.wdm/drivers/geckodriver/macos/v0.30.0/geckodriver] found
in cache
===== WebDriver manager =====
Current firefox version is 97.0
Get LATEST geckodriver version for 97.0 firefox
Driver [/Users/lily/.wdm/drivers/geckodriver/macos/v0.30.0/geckodriver] found
in cache
===== WebDriver manager =====
Current firefox version is 97.0
Get LATEST geckodriver version for 97.0 firefox
Driver [/Users/lily/.wdm/drivers/geckodriver/macos/v0.30.0/geckodriver] found
in cache
===== WebDriver manager =====
Current firefox version is 97.0
Get LATEST geckodriver version for 97.0 firefox
Driver [/Users/lily/.wdm/drivers/geckodriver/macos/v0.30.0/geckodriver] found
in cache
===== WebDriver manager =====
Current firefox version is 97.0
Get LATEST geckodriver version for 97.0 firefox
Driver [/Users/lily/.wdm/drivers/geckodriver/macos/v0.30.0/geckodriver] found
in cache
===== WebDriver manager =====
Current firefox version is 97.0
Get LATEST geckodriver version for 97.0 firefox
Driver [/Users/lily/.wdm/drivers/geckodriver/macos/v0.30.0/geckodriver] found
in cache
```

```
===== WebDriver manager =====
Current firefox version is 97.0
Get LATEST geckodriver version for 97.0 firefox
Driver [/Users/lily/.wdm/drivers/geckodriver/macos/v0.30.0/geckodriver] found
in cache
===== WebDriver manager =====
Current firefox version is 97.0
Get LATEST geckodriver version for 97.0 firefox
Driver [/Users/lily/.wdm/drivers/geckodriver/macos/v0.30.0/geckodriver] found
in cache
===== WebDriver manager =====
Current firefox version is 97.0
Get LATEST geckodriver version for 97.0 firefox
Driver [/Users/lily/.wdm/drivers/geckodriver/macos/v0.30.0/geckodriver] found
in cache
===== WebDriver manager =====
Current firefox version is 97.0
Get LATEST geckodriver version for 97.0 firefox
Driver [/Users/lily/.wdm/drivers/geckodriver/macos/v0.30.0/geckodriver] found
in cache
```

Question 4

Write a script to automatically derive the geographic coordinates for the following addresses and plot them on a folium map

```
address list = ['1844 SW Morrison St, Portland, OR 97205',
                '800 Occidental Ave S, Seattle, WA 98134',
                '1001 Stadium Dr, Inglewood, CA 90301',
                '2700 Martin Luther King Jr Blvd, Eugene, OR 97401']
address coords = []
# Loop through every ski resort to find it's coordinates
for name in address list:
    # Define URL to search in Google Maps and add 'Oregon' in for good
measure
   url = 'https://www.google.com/maps/place/' + name
    # Import web driver and search for ski resorts
webdriver.Firefox(service=Service(GeckoDriverManager().install()))
    driver.get(url)
    # Click search
    element = WebDriverWait(driver,
20).until(EC.element to be clickable((By.ID, "searchbox-searchbutton")))
    element.click()
```

```
# Make the web driver wait until the URL updates (i.e. contains the @
sign we're looking for)
    WebDriverWait(driver, 20).until(EC.url contains("@"))
    # Retrieve the URL
    link = driver.current url
    # Split string
    lat, lon = link.rsplit('0', 1)[1].rsplit(',', 1)[0].rsplit(',', 1)
    # Append to list
    address coords.append((lat, lon))
    # Close driver
    driver.close()
===== WebDriver manager =====
Current firefox version is 97.0
Get LATEST geckodriver version for 97.0 firefox
Driver [/Users/lily/.wdm/drivers/geckodriver/macos/v0.30.0/geckodriver] found
in cache
===== WebDriver manager =====
Current firefox version is 97.0
Get LATEST geckodriver version for 97.0 firefox
Driver [/Users/lily/.wdm/drivers/geckodriver/macos/v0.30.0/geckodriver] found
in cache
===== WebDriver manager =====
Current firefox version is 97.0
Get LATEST geckodriver version for 97.0 firefox
Driver [/Users/lily/.wdm/drivers/geckodriver/macos/v0.30.0/geckodriver] found
in cache
===== WebDriver manager =====
Current firefox version is 97.0
Get LATEST geckodriver version for 97.0 firefox
Driver [/Users/lily/.wdm/drivers/geckodriver/macos/v0.30.0/geckodriver] found
in cache
address coords
[('45.5\overline{2}16813', '-122.693017'),
 ('47.5933137', '-122.3344609'),
 ('33.9530049', '-118.3407129'),
 ('44.0594325', '-123.0710918')]
map = folium.Map(location=[44, -121], zoom start=7)
for i in range(0, len(address coords)):
    folium.Marker(address coords[i], popup=address list[i]).add to(map)
map
# Import package
import xarray as xr
# Define filepath
fp = '/Users/lily/Documents/GitHub/geospatial-data-science/labs/lab7/data'
```

```
# Read data
xds = xr.open_dataset(fp + '/era_monthly_snowfall_2020.nc',
decode_coords='all')
xds['time']
```

Question 5

Which ski resort received more snowfall in 2020, Mount Ashland, Willammette Pass or Hoodoo?

```
ski resort names
['Anthony Lakes (ski area)',
 'Mount Ashland Ski Area',
 'Cooper Spur ski area',
 'Ferguson Ridge Ski Area',
 'Hoodoo (ski area)',
 'Mount Ashland Ski Area Expansion',
 'Mount Bachelor ski area',
 'Mount Hood Meadows',
 'Mount Hood Skibowl',
 'Snow Bunny',
 'Spout Springs Ski Area',
 'Summit Pass (Oregon)',
 'Timberline Lodge ski area',
 'Warner Canyon',
 'Willamette Pass Resort']
# Get coords for the three ski resorts
ashland coords = ski resort coords[1]
hoodoo coords = ski resort coords[4]
willamette coords = ski resort coords[14]
# Print out coordinates for reference
print (ashland coords, hoodoo coords, willamette coords)
('42.081689', '-122.7069427') ('44.4086477', '-121.8736045') ('43.6000579',
'-122.0387287')
# Select location in dataset nearest to ski resort location
ashland = xds.sel(longitude=[-122.7069427], latitude=[42.081689],
method="nearest")
hoodoo = xds.sel(longitude=[-121.8736045], latitude=[44.4086477],
method="nearest")
willamette = xds.sel(longitude=[-122.0387287], latitude=[43.6000579],
method="nearest")
# Calculate sums for each nearest location
ashland snow = ashland['sf'].sum()
hoodoo snow = hoodoo['sf'].sum()
willamette snow = willamette['sf'].sum()
ashland snow.values
array(0.00922862, dtype=float32)
hoodoo snow.values
array(0.01859693, dtype=float32)
willamette snow.values
array(0.01963694, dtype=float32)
```

Willamette Pass Resort received the most snowfall (m of water equivalent) in 2020.

Grad Student Question 2

Rank the ski resorts by:

- a) Average snowfall in November
- b) Average snowfall in Spring (i.e. March, April, and May)
- c)Interannual variability in snowfall

```
import datetime
# Define filepath
fp = '/Users/lily/Documents/GitHub/geospatial-data-science/labs/lab7/data'
# Read data
xds long = xr.open dataset(fp + '/era monthly snowfall 1979 2020.nc',
decode coords='all')
ski resort coords
[('44.9629273', '-118.2357129'),
   ('42.081689', '-122.7069427'),
   ('45.4188609', '-121.6064525'),
   ('45.2816889', '-117.1148305'),
   ('44.4086477', '-121.8736045'),
   ('42.081689', '-122.7069427'),
   ('44.0028975', '-121.6812601'),
   ('45.331759', '-121.6673735'),
   ('45.2943644', '-121.7896261'),
   ('45.2871456', '-121.7312302'),
   ('45.7552462', '-118.0536097'),
   ('44.0304622', '-123.4893634'),
   ('45.3311319', '-121.7131951'),
   ('42.237378', '-120.2968271'),
   ('43.6000579', '-122.0387287')1
# Create list of tuple integers of coordinates
ski coord ints = []
for tuple in ski resort coords:
          temp = []
           for x in tuple:
                     if x.isalpha():
                                 temp.append(x)
                      elif x.isdigit():
                                  temp.append(int(x))
                                  temp.append(float(x))
           ski coord ints.append((temp[0],temp[1]))
print(ski coord ints)
[(44.9629273, -118.2357129), (42.081689, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.4188609, -122.7069427), (45.41886009, -122.7069427)
121.6064525), (45.2816889, -117.1148305), (44.4086477, -121.8736045),
```

```
(42.081689, -122.7069427), (44.0028975, -121.6812601), (45.331759, -121.6812601)
121.6673735), (45.2943644, -121.7896261), (45.2871456, -121.7312302),
(45.7552462, -118.0536097), (44.0304622, -123.4893634), (45.3311319, -123.4893634)
121.7131951), (42.237378, -120.2968271), (43.6000579, -122.0387287)]
# Create separate lists of ski resort coordinate latitudes and longitudes
ski resort lats, ski resort longs = zip(*ski coord ints)
resort lats list = list(ski resort lats)
resort_longs_list = list(ski resort longs)
# Create a new Dataset containing only November values
novembers = xds long.isel(time=(xds long.time.dt.month == 11))
novembers
# Calculate mean snowfall value across all novembers at the nearest location
to each coordinate pair
november snows = []
for i in range(len(ski resort coords)):
    ski resort = novembers.sel(longitude=[resort longs list[i]],
latitude=[resort lats list[i]], method="nearest")
    resort snow november = ski resort['sf'].mean()
    november snows.append(resort snow november.values)
# Create dictionary pairing ski resort name to average november snowfall
november snow dict = {}
# Convert to dictionary
for key in ski resort names:
   for value in november snows:
     november snow dict[key] = value
      november snows.remove(value)
     break
november snow dict
{'Anthony Lakes (ski area)': array(0.00186159, dtype=float32),
 'Mount Ashland Ski Area': array(0.0016192, dtype=float32),
 'Cooper Spur ski area': array(0.0016262, dtype=float32),
 'Ferguson Ridge Ski Area': array(0.00224436, dtype=float32),
 'Hoodoo (ski area)': array(0.00251084, dtype=float32),
 'Mount Ashland Ski Area Expansion': array(0.0016192, dtype=float32),
 'Mount Bachelor ski area': array(0.00325813, dtype=float32),
 'Mount Hood Meadows': array(0.00220338, dtype=float32),
 'Mount Hood Skibowl': array(0.00220338, dtype=float32),
 'Snow Bunny': array(0.00220338, dtype=float32),
 'Spout Springs Ski Area': array(0.00156591, dtype=float32),
 'Summit Pass (Oregon)': array(5.0190392e-05, dtype=float32),
 'Timberline Lodge ski area': array(0.00220338, dtype=float32),
 'Warner Canyon': array(0.00130316, dtype=float32),
 'Willamette Pass Resort': array(0.00286093, dtype=float32)}
```

Ski Resorts Ranked by Average snowfall (m in water equivalent) in November

1. Mount Bachelor ski area: 0.00325813

2. Willamette Pass Resort: 0.00286093

3. Hoodoo (ski area): 0.00251084

4. Ferguson Ridge Ski Area: 0.00224436

5. Mount Hood Meadows: 0.00220338

6. Mount Hood Skibowl: 0.00220338

7. Snow Bunny: 0.00220338

- Timberline Lodge ski area: 0.00220338
 Anthony Lakes (ski area): 0.00186159
 Mount Ashland Ski Area: 0.0016192
 Mount Ashland Ski Area Expansion: 0.0016192
 Cooper Spur ski area: 0.0016262
 Spout Springs Ski Area: 0.00156591
 Warner Canyon: 0.00130316
- 15. Summit Pass (Oregon): 5.0190392e-05

b) Average snowfall in Spring (i.e. March, April, and May)

```
# Create a new Dataset containing only Spring values
springs = xds long.isel(time=(xds long.time.dt.season == "MAM"))
springs
# Calculate mean snowfall value across all springs at the nearest location to
each coordinate pair
spring snows = []
for i in range(len(ski resort coords)):
    ski resort = springs.sel(longitude=[resort longs list[i]],
latitude=[resort_lats_list[i]], method="nearest")
    resort snow spring = ski resort['sf'].mean()
    spring snows.append(resort snow spring.values)
# Create dictionary pairing ski resort name to average spring snowfall value
spring snow dict = {}
# Convert to dictionary
for key in ski resort names:
   for value in spring snows:
      spring snow dict[key] = value
      spring snows.remove(value)
spring snow dict
{'Anthony Lakes (ski area)': array(0.00110986, dtype=float32),
 'Mount Ashland Ski Area': array(0.00102258, dtype=float32),
 'Cooper Spur ski area': array(0.00081359, dtype=float32),
 'Ferguson Ridge Ski Area': array(0.00153634, dtype=float32),
 'Hoodoo (ski area)': array(0.00152509, dtype=float32),
 'Mount Ashland Ski Area Expansion': array(0.00102258, dtype=float32),
 'Mount Bachelor ski area': array(0.0020058, dtype=float32),
 'Mount Hood Meadows': array(0.0014855, dtype=float32),
 'Mount Hood Skibowl': array(0.0014855, dtype=float32),
 'Snow Bunny': array(0.0014855, dtype=float32),
 'Spout Springs Ski Area': array(0.00070196, dtype=float32),
 'Summit Pass (Oregon)': array(6.345044e-05, dtype=float32),
 'Timberline Lodge ski area': array(0.0014855, dtype=float32),
 'Warner Canyon': array(0.00084139, dtype=float32),
 'Willamette Pass Resort': array(0.00175876, dtype=float32)}
```

Ski Resorts Ranked by Average snowfall (m in water equivalent) in Spring

- Willamette Pass Resort: 0.00175876
 Ferguson Ridge Ski Area: 0.00153634
- 3. Hoodoo (ski area): 0.00152509

- 4. Mount Hood Meadows: 0.0014855
- 5. Mount Hood Skibowl: 0.0014855
- 6. Snow Bunny: 0.0014855
- 7. Timberline Lodge ski area: 0.0014855
- 8. Anthony Lakes (ski area): 0.00110986
- 9. Mount Ashland Ski Area: 0.00102258
- 10. Mount Ashland Ski Area Expansion: 0.00102258
- 11. Cooper Spur ski area: 0.00081359
- 12. Warner Canyon: 0.00084139
- 13. Spout Springs Ski Area: 0.00070196
- 14. Mount Bachelor ski area: 0.0020058
- 15. Summit Pass (Oregon): 6.345044e-05

c)Interannual variability in snowfall

```
xds long
# Group dataset by year and sum each year
annual sums = xds long.groupby("time.year").sum()
annual sums
# Calculate variance across annual snowfall sums at the nearest location to
each coordinate pair
snow variances = []
for i in range(len(ski resort coords)):
    ski resort = annual sums.sel(longitude=[resort longs list[i]],
latitude=[resort lats list[i]], method="nearest")
    resort snow variance = ski resort['sf'].var()
    snow variances.append(resort snow variance.values)
# Create dictionary pairing ski resort name to average spring snowfall value
snow variance dict = {}
# Convert to dictionary
for key in ski resort names:
   for value in snow_variances:
      snow variance \overline{\text{dict}[\text{key}]} = value
      snow variances.remove(value)
     break
snow variance dict
{'Anthony Lakes (ski area)': array(5.2860837e-06, dtype=float32),
 'Mount Ashland Ski Area': array(1.4122033e-05, dtype=float32),
 'Cooper Spur ski area': array(8.515051e-06, dtype=float32),
 'Ferguson Ridge Ski Area': array(9.959952e-06, dtype=float32),
 'Hoodoo (ski area)': array(1.7184255e-05, dtype=float32),
 'Mount Ashland Ski Area Expansion': array(1.4122033e-05, dtype=float32),
 'Mount Bachelor ski area': array(2.3064722e-05, dtype=float32),
 'Mount Hood Meadows': array(1.5404597e-05, dtype=float32),
 'Mount Hood Skibowl': array(1.5404597e-05, dtype=float32),
 'Snow Bunny': array(1.5404597e-05, dtype=float32),
 'Spout Springs Ski Area': array(4.885678e-06, dtype=float32),
 'Summit Pass (Oregon)': array(8.8411645e-07, dtype=float32),
 'Timberline Lodge ski area': array(1.5404597e-05, dtype=float32),
 'Warner Canyon': array(5.5629016e-06, dtype=float32),
 'Willamette Pass Resort': array(1.8924553e-05, dtype=float32)}
```

Ski Resorts Ranked by Interannual snowfall variability (m in water equivalent)

- Mount Bachelor ski area: 2.3064722e-05
 Willamette Pass Resort: 1.8924553e-05
- 3. Hoodoo (ski area): 1.7184255e-05
- 4. Mount Hood Meadows: 1.5404597e-05
- 5. Mount Hood Skibowl: 1.5404597e-05
- 6. Snow Bunny: 1.5404597e-05
- 7. Timberline Lodge ski area: 1.5404597e-05
- 8. Mount Ashland Ski Area: 1.4122033e-05
- 9. Mount Ashland Ski Area Expansion: 1.4122033e-05
- 10. Ferguson Ridge Ski Area: 9.959952e-06
- 11. Cooper Spur ski area: 8.515051e-06
- 12. Warner Canyon: 5.5629016e-06
- 13. Anthony Lakes (ski area): 5.2860837e-06
- 14. Spout Springs Ski Area: 4.885678e-06
- 15. Summit Pass (Oregon): 8.8411645e-07