assignment

June 7, 2023

1 Seasonal snow assignment

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CEWA 568 Final Project

1.1 Teaching goals of this notebook

Analyze how snow accumulates and melts over the water year at a key study site, Paradise in Mount Rainier National Park.

1.2 Instructions

Questions are in bold. Please fill in your answers to the questions in the markdown cells labeled *Your answer here.*

1.3 Importing code packages

```
[1]: # We'll use Metloom to quickly download a time series of measurements from our

→SNOTEL site
!pip install -q metloom
```

```
[2]: from datetime import datetime import pandas as pd import matplotlib.pyplot as plt import numpy as np from metloom.pointdata import SnotelPointData from metloom.variables import SnotelVariables
```

$1.4\,$ Downloading data from Water Year 2021 (October 1st 2020 - September 30th 2021)

• Read the description of the Paradise SNOTEL site on this page: https://wcc.sc.egov.usda.gov/nwcc/site?sitenum=679

1. Describe the location of this site. What is its elevation?

Your answer here

```
[3]: | snotel_point = SnotelPointData("679:WA:SNTL", "Paradise")
     df = snotel_point.get_daily_data(
         datetime(2020, 10, 1), datetime(2021, 9, 30),
         [snotel_point.ALLOWED_VARIABLES.PRECIPITATION,
          snotel_point.ALLOWED_VARIABLES.PRECIPITATIONACCUM,
          snotel_point.ALLOWED_VARIABLES.SNOWDEPTH,
          snotel_point.ALLOWED_VARIABLES.SWE,
          snotel_point.ALLOWED_VARIABLES.TEMPAVG,
          snotel_point.ALLOWED_VARIABLES.TEMPMIN,
          snotel point ALLOWED VARIABLES TEMPMAX,
          snotel_point.ALLOWED_VARIABLES.SOILMOISTURE2IN
     )
     # Change the form of our resulting Pandas DataFrame
     df.reset_index(inplace=True)
     df.set_index("datetime", inplace=True)
     df.head()
[3]:
                                       site \
     datetime
     2020-10-01 08:00:00+00:00 679:WA:SNTL
     2020-10-02 08:00:00+00:00 679:WA:SNTL
     2020-10-03 08:00:00+00:00 679:WA:SNTL
     2020-10-04 08:00:00+00:00 679:WA:SNTL
     2020-10-05 08:00:00+00:00 679:WA:SNTL
                                                                geometry \
     datetime
     2020-10-01 08:00:00+00:00 POINT Z (-121.74765 46.78265 5130.00000)
     2020-10-02 08:00:00+00:00 POINT Z (-121.74765 46.78265 5130.00000)
     2020-10-03 08:00:00+00:00 POINT Z (-121.74765 46.78265 5130.00000)
     2020-10-04 08:00:00+00:00 PDINT Z (-121.74765 46.78265 5130.00000)
     2020-10-05 08:00:00+00:00 PDINT Z (-121.74765 46.78265 5130.00000)
                                PRECIPITATION PRECIPITATION_units \
     datetime
     2020-10-01 08:00:00+00:00
                                          0.0
                                                               in
                                          0.0
     2020-10-02 08:00:00+00:00
                                                               in
     2020-10-03 08:00:00+00:00
                                          0.0
                                                               in
     2020-10-04 08:00:00+00:00
                                          0.0
                                                               in
     2020-10-05 08:00:00+00:00
                                          0.0
                                                               in
                                ACCUMULATED PRECIPITATION \
```

```
datetime
2020-10-01 08:00:00+00:00
                                                  0.0
                                                  0.0
2020-10-02 08:00:00+00:00
2020-10-03 08:00:00+00:00
                                                  0.0
2020-10-04 08:00:00+00:00
                                                  0.0
2020-10-05 08:00:00+00:00
                                                  0.0
                           ACCUMULATED PRECIPITATION_units SNOWDEPTH \
datetime
2020-10-01 08:00:00+00:00
                                                                   0.0
                                                         in
2020-10-02 08:00:00+00:00
                                                                   0.0
                                                         in
2020-10-03 08:00:00+00:00
                                                         in
                                                                   0.0
2020-10-04 08:00:00+00:00
                                                         in
                                                                   0.0
2020-10-05 08:00:00+00:00
                                                         in
                                                                   0.0
                           SNOWDEPTH_units    SWE SWE_units
                                                          AVG AIR TEMP \
datetime
2020-10-01 08:00:00+00:00
                                        in 0.0
                                                                   64.22
                                                        in
                                        in 0.0
                                                                   61.88
2020-10-02 08:00:00+00:00
                                                        in
2020-10-03 08:00:00+00:00
                                        in 0.0
                                                                   56.66
                                                        in
2020-10-04 08:00:00+00:00
                                                                   50.18
                                        in 0.0
                                                        in
2020-10-05 08:00:00+00:00
                                        in 0.0
                                                                   55.04
                                                        in
                           AVG AIR TEMP_units MIN AIR TEMP MIN AIR TEMP_units
datetime
2020-10-01 08:00:00+00:00
                                         degF
                                                       60.08
                                                                           degF
2020-10-02 08:00:00+00:00
                                         degF
                                                       55.76
                                                                           degF
2020-10-03 08:00:00+00:00
                                         degF
                                                                           degF
                                                       48.20
2020-10-04 08:00:00+00:00
                                         degF
                                                       42.62
                                                                           degF
2020-10-05 08:00:00+00:00
                                         degF
                                                       44.60
                                                                           degF
                            MAX AIR TEMP MAX AIR TEMP_units
datetime
2020-10-01 08:00:00+00:00
                                   73.22
                                                        degF
2020-10-02 08:00:00+00:00
                                   70.70
                                                        degF
2020-10-03 08:00:00+00:00
                                   66.38
                                                        degF
2020-10-04 08:00:00+00:00
                                   59.00
                                                        degF
2020-10-05 08:00:00+00:00
                                   64.40
                                                        degF
                            SOIL MOISTURE -2IN SOIL MOISTURE -2IN_units \
datetime
2020-10-01 08:00:00+00:00
                                           2.6
                                                                     pct
2020-10-02 08:00:00+00:00
                                           2.7
                                                                     pct
2020-10-03 08:00:00+00:00
                                           2.8
                                                                     pct
2020-10-04 08:00:00+00:00
                                           1.8
                                                                     pct
2020-10-05 08:00:00+00:00
                                           2.5
                                                                     pct
```

datasource

```
      datetime

      2020-10-01 08:00:00+00:00
      NRCS

      2020-10-02 08:00:00+00:00
      NRCS

      2020-10-03 08:00:00+00:00
      NRCS

      2020-10-04 08:00:00+00:00
      NRCS

      2020-10-05 08:00:00+00:00
      NRCS
```

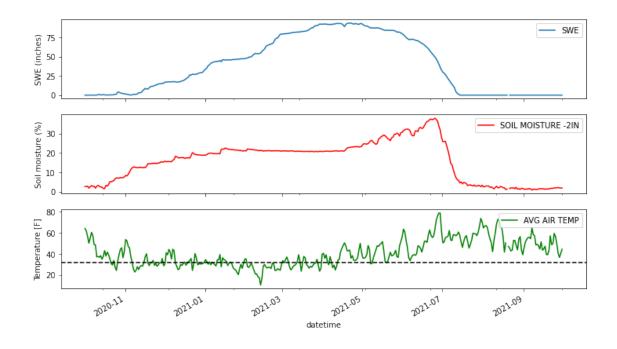
2. Which variables are measured by the sensors? What are their units?

Your answer here

1.5 Plotting SWE (snow water equivalent, the amount of liquid water contained in our snowpack per unit area) and other variables

- SWE is one of the key variables for snow hydrologists to track and estimate. If we have 10 inches of snow on the ground, that could melt down to 1 inch of water, or even 5 inches of water, depending on the snow density!
- By plotting several time series along the same x axis, we can get a better picture of what's going on at our site.

```
[4]: f,ax=plt.subplots(3,1,figsize=(12,7),sharex=True)
    df["SWE"].plot(ax=ax[0])
    ax[0].set_ylabel("SWE (inches)")
    ax[1].set_ylabel("Soil moisture (%)")
    ax[2].set_ylabel("Temperature [F]")
    df["SOIL MOISTURE -2IN"].plot(ax=ax[1],color='red')
    df["AVG AIR TEMP"].plot(ax=ax[2],color='green')
    ax[2].axhline(y=32,color='black',linestyle='--')
    for axs in ax:
        axs.legend(loc="upper right")
```



3. What do you notice about the timing of SWE, soil moisture, and temperature? Is temperature important in determining melt timing?

Your answer here

- 1.6 Let's compare to our chart from the lecture, which is found at https://www.nrcs.usda.gov/Internet/WCIS/AWS_PLOTS/siteCharts/POR/WTEQ/V
- 4. Did the peak occur earlier or later than other seasons in the last 30 years? Was it higher or lower?

Your answer here

- 1.7 Let's add in some remote sensing data. Check out the runoff onset map and select 2021: https://egagli.github.io/view_sar_snowmelt_timing_map/
- 5. Zoom into the SNOTEL location coordinates, on the south slopes of Mount Rainier. What is the approximate calendar date of runoff onset for the closest areas that are? (You should convert day of year to calendar date)

Your answer here

6. Would we expect date of runoff onset to happen at the same time as maximum SWE? Do they end up matching?

Your answer here

1.8 Now let's combine our snow data with some river measurements

- There is a stream gage on the Nisqually River downstream of Paradise, near the Long-mire Wilderness Information Center (2700 feet). Take a look at the station information and status page here (as of June 2023, there is no new data being collected): https://waterdata.morageology.com/station.php?g=4B300A32
- We downloaded a CSV from https://waterdata.morageology.com/data.php?g=4B300A32
- As we can see below, we get several measurements that could give us some clues to what's happening in the watershed upstream...

```
[5]: downstream_df = pd.read_csv("longmire_wy2021.csv", parse_dates=True)
     # A bit of reformatting for the date field
     # What is GMT, and why do you think it's commonly used as the timestamp for
     → measurements?
     downstream_df["GMT Datetime"] = pd.to_datetime(downstream_df["GMT Datetime"])
     downstream_df.set_index("GMT Datetime")
     # Replace missing data values with not-a-number (NaN) to be consistent
     downstream_df = downstream_df.replace(-999.9999, np.nan)
     downstream_df = downstream_df.replace(-999.0, np.nan)
     downstream df = downstream df.replace(999.9999, np.nan)
     downstream_df.head()
[5]:
              GMT Datetime
                                  Local Datetime
                                                  Stage (ft)
                                                               Rainfall (in)
     0 2020-10-01 07:00:00
                            2020-10-01 00:00:00
                                                      1.0901
                                                                         0.0
     1 2020-10-01 07:15:00
                            2020-10-01 00:15:00
                                                                         0.0
                                                      1.1156
     2 2020-10-01 07:30:00
                            2020-10-01 00:30:00
                                                                         0.0
                                                      1.0812
     3 2020-10-01 07:45:00
                            2020-10-01 00:45:00
                                                      1.0766
                                                                         0.0
     4 2020-10-01 08:00:00
                            2020-10-01 01:00:00
                                                      1.0740
                                                                         0.0
        Turbidity (ntu)
                         Air Temperature (°C)
                                                Dew Point Temperature (°C)
     0
                    NaN
                                        12.530
                                                                        NaN
     1
                    NaN
                                        12.549
                                                                        NaN
     2
                    NaN
                                        12.478
                                                                        NaN
     3
                    NaN
                                        12.429
                                                                        NaN
     4
                                        12.369
                    NaN
                                                                        NaN
        Water Temperature (°C)
                                Enclosure Temperature (°C)
     0
                         6.549
                                                       12.2
     1
                         6.526
                                                       12.0
     2
                         6.506
                                                       12.0
     3
                         6.492
                                                       11.8
     4
                         6.484
                                                       11.6
        Turbidity Temperature (°C)
                                     10-hour Fuel Temperature (°C)
```

12.5

NaN

0

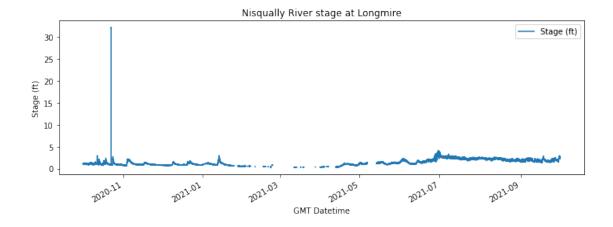
1		NaN	12.4
2		NaN	12.4
3		NaN	12.4
4		NaN	12.3
	Relative Humidity (%)	Unnamed: 12	Water Conductivity (S/cm) \
0	-99.0	NaN	12.629
1	-99.0	NaN	12.612
2	-99.0	NaN	12.604
3	-99.0	NaN	12.601
4	-99.0	NaN	12.624
	Air Level (ft) Water	Level (psi)	Battery (V)
0	30.926	13.855	13.2
1	30.926	13.866	13.2
2	30.928	13.852	13.2
3	30.928	13.850	13.2
4	30.926	13.848	13.2

1.9 Plotting the water level over the year

In our case, we are only curious about the stage (height level) of the Nisqually River, and connecting this to what's happening relative to the snow at our Paradise site.

```
[6]: f,ax=plt.subplots(figsize=(12,4))
downstream_df.plot.line("GMT Datetime", "Stage (ft)",ax=ax)
plt.ylabel("Stage (ft)")
ax.set_title("Nisqually River stage at Longmire")
```

[6]: Text(0.5, 1.0, 'Nisqually River stage at Longmire')



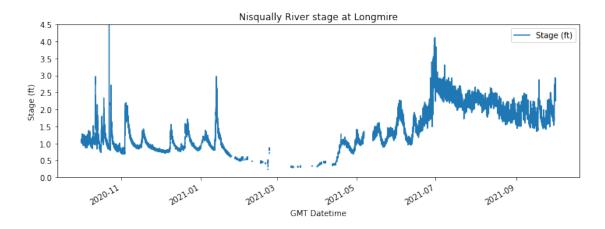
7. Hmm... is that a plausible measurement of the stage in November? What would have happened in the park if that outlier was real?

Your answer here

Let's plot again with the y axis range reduced so that we can see the rest of the data. Now we can see the rest of the time series more clearly.

```
[7]: f,ax=plt.subplots(figsize=(12,4))
downstream_df.plot.line("GMT Datetime", "Stage (ft)",ax=ax)
plt.ylim(0,4.5) # crop the y axis
plt.ylabel("Stage (ft)")
plt.title("Nisqually River stage at Longmire")
```

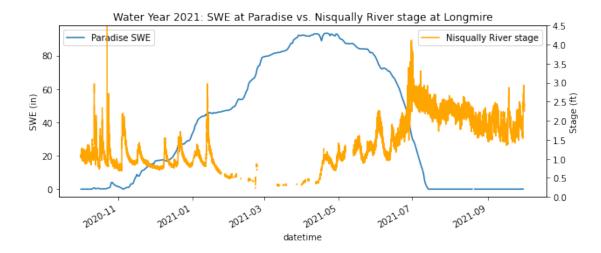
[7]: Text(0.5, 1.0, 'Nisqually River stage at Longmire')



1.10 Let's plot our two datasets together

```
[8]: fig, ax = plt.subplots(nrows=1, sharex=True, figsize=(10,4))
    ax0 = ax
    df["SWE"].plot(ax=ax0, label="Paradise SWE")
    ax0.set ylabel("SWE (in)")
    ax0.set_title("Water Year 2021: SWE at Paradise vs. Nisqually River stage at ⊔
     →Longmire")
    ax1 = ax0.twinx()
    ax1.plot(downstream_df["GMT_Datetime"], downstream_df["Stage (ft)"], u
     ax1.set_ylim(0, 4.5)
    # ax1.set_title("Nisqually River stage at Longmire (downstream of Paradise)")
    ax1.set_ylabel("Stage (ft)")
    \# axes[2].plot(downstream_df["GMT Datetime"], downstream_df["Water Temperature_\_
     → (°C)"])
    ax0.legend(loc=2)
    ax1.legend(loc=0)
```

[8]: <matplotlib.legend.Legend at 0x7fdbfc1f1e50>



8. Zoom in on late October-November 2020. What does the Paradise SWE measurement tell us about the spikes in the river downstream? Which other variables would help us figure out what is going on here?

Your answer here

9. What's going on with this stream gage in the middle of the winter? * Hint: https://www.nps.gov/thingstodo/explore-longmire-in-winter.htm

Your answer here

1.11 Transitioning to spring

10. From the April 20th peak SWE for this year, to reaching 0, how long does the melt process take? Based on your understanding of the SNOTEL station and the areas higher on the mountain, can you comment on how this relates to the observed river stage over the summer?

Your answer here

(Bonus) Coding exercise: pick a smaller time period and plot the daily temperature range, precipitation, and SWE

[9]: #Your answer here

1.12 Wrapping up

11. We found a maximum SWE of 93 inches at the Paradise SNOTEL station for 2021. All of this snow eventually melted and ended up somewhere. Based on your analysis in this assignment, where do you think the water went?

Your answer here

12. Let's say you were tasked to determine the average day of snowmelt in the Nisqually River Basin. What are the benefits of using each dataset: SNOTEL station SWE, SNOTEL station temperature, Nisqually streamgage, snowmelt map from a remote sensing satellite. Do you think combining datasets would lead to a more accurate prediction?

Your answer here

[]: