

# PythonNotebook8\_solution\_2023

January 26, 2024

```
[1]: import pandas as pd
import matplotlib.pyplot as plt
import numpy as np
from datetime import datetime
import matplotlib
```

```
[2]: ice = pd.read_csv('T1_ice.csv')
# if the file cannot be found, you will get an error message here.
```

```
[3]: seafloor = pd.read_csv('T1_seafloor.csv')
```

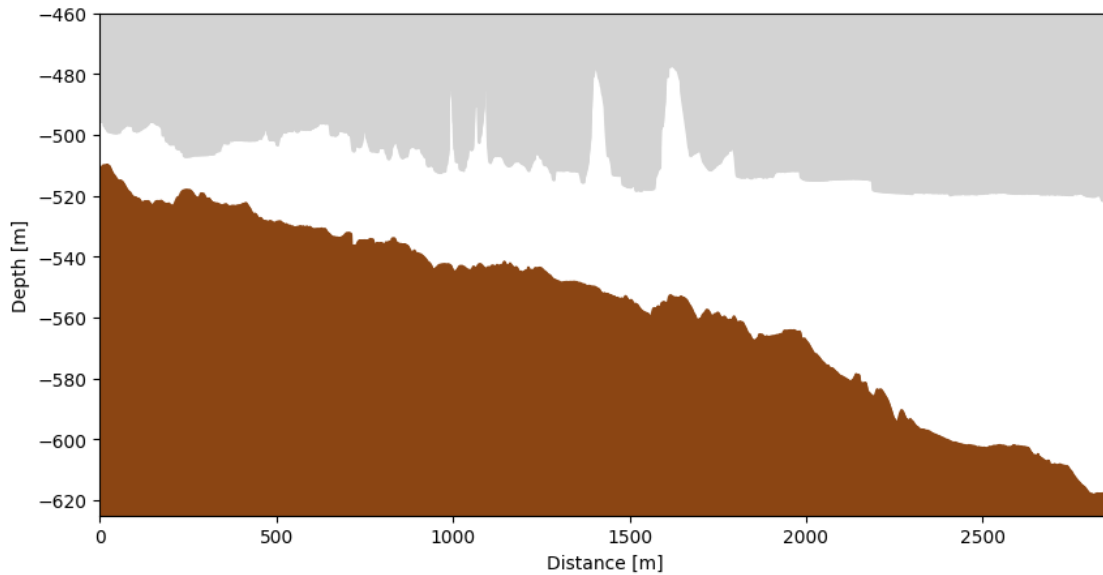
## 0.1 Exercise 8.1.1 Improve the above plot to make it easier to understand

- use `plt.fill_between` to color everything below the seafloor line brown
- use `plt.fill_between` to color everything above the ice base line grey
- adjust the limits of the x- and y-axis to make the plot look nice

```
[4]: plt.figure(figsize=(10,5))
plt.plot(ice['distance(m)'],ice['ice(m)'], color='lightgrey')
plt.plot(seafloor['distance(m)'],seafloor['seafloor(m)'], color='saddlebrown')
plt.xlabel('Distance [m]')
plt.ylabel('Depth [m]')
plt.xlim(np.min(seafloor['distance(m)']),np.max(seafloor['distance(m)']))

# SOLUTION #
plt.fill_between(seafloor['distance(m)'],seafloor['seafloor(m)'],-625,color='saddlebrown')
plt.fill_between(ice['distance(m)'],ice['ice(m)'], -460,color='lightgrey')
plt.ylim(-625,-460)
```

```
[4]: (-625.0, -460.0)
```



## 0.2 Exercise 8.1.2 Load another csv file and plot the data onto the plot from 8.1.1

- use `pd.load_csv` to import `T1_ocean_1Hz.csv` into a dataframe called `ocean`
- check what the dataframe looks like
- drop columns so that you are only left with: `time(UTC)`, `distance(m)`, `depth(m)`, `Absolute_Salinity(g/kg)`
- use `plt.scatter` to plot the depth as a function of distance
- use the `s` argument to change the size of the plotted markers

```
[5]: # Load and check data
```

```
# SOLUTION #
```

```
ocean = pd.read_csv('T1_ocean_1Hz.csv')
ocean
```

```
[5]:
```

|       | time(UTC)            | latitude | longitude | distance(m) | depth(m)  | \ |
|-------|----------------------|----------|-----------|-------------|-----------|---|
| 0     | 10-Jan-2020 20:16:56 | -75.2071 | -104.8253 | 2861.5250   | -613.3393 |   |
| 1     | 10-Jan-2020 20:16:56 | -75.2071 | -104.8253 | 2861.4987   | -613.3446 |   |
| 2     | 10-Jan-2020 20:16:56 | -75.2071 | -104.8253 | 2861.4575   | -613.4449 |   |
| 3     | 10-Jan-2020 20:16:56 | -75.2071 | -104.8253 | 2861.4022   | -613.5580 |   |
| 4     | 10-Jan-2020 20:16:56 | -75.2071 | -104.8253 | 2861.3292   | -613.6709 |   |
| ...   | ...                  | ...      | ...       | ...         | ...       |   |
| 17954 | 09-Jan-2020 20:34:22 | -75.2222 | -104.7969 | 0.5095      | -501.9610 |   |
| 17955 | 09-Jan-2020 20:34:22 | -75.2222 | -104.7969 | 0.3128      | -501.8992 |   |
| 17956 | 09-Jan-2020 20:34:22 | -75.2222 | -104.7969 | 0.1738      | -501.8257 |   |
| 17957 | 09-Jan-2020 20:34:22 | -75.2222 | -104.7969 | 0.0737      | -501.7498 |   |
| 17958 | 09-Jan-2020 20:34:22 | -75.2222 | -104.7969 | -0.0000     | -501.7370 |   |

|       | pressure(db) | insitu_temperature(C) | conductivity(mS/cm) | \ |
|-------|--------------|-----------------------|---------------------|---|
| 0     | 620.7120     | 0.0508                | 28.9044             |   |
| 1     | 620.7174     | 0.0509                | 28.9044             |   |
| 2     | 620.8190     | 0.0509                | 28.9039             |   |
| 3     | 620.9336     | 0.0512                | 28.9036             |   |
| 4     | 621.0481     | 0.0514                | 28.9032             |   |
| ...   | ...          | ...                   | ...                 |   |
| 17954 | 507.8577     | -0.7238               | 27.9853             |   |
| 17955 | 507.7951     | -0.7238               | 27.9853             |   |
| 17956 | 507.7207     | -0.7238               | 27.9845             |   |
| 17957 | 507.6437     | -0.7241               | 27.9842             |   |
| 17958 | 507.6308     | -0.7243               | 27.9839             |   |

|       | Conservative_Temperature(C) | Absolute_Salinity(g/kg) | \ |
|-------|-----------------------------|-------------------------|---|
| 0     | 0.0284                      | 34.5637                 |   |
| 1     | 0.0284                      | 34.5636                 |   |
| 2     | 0.0285                      | 34.5629                 |   |
| 3     | 0.0287                      | 34.5621                 |   |
| 4     | 0.0290                      | 34.5612                 |   |
| ...   | ...                         | ...                     |   |
| 17954 | -0.7362                     | 34.2727                 |   |
| 17955 | -0.7362                     | 34.2727                 |   |
| 17956 | -0.7362                     | 34.2717                 |   |
| 17957 | -0.7365                     | 34.2717                 |   |
| 17958 | -0.7367                     | 34.2714                 |   |

|       | thermal_driving(C) | density_anomaly(kg/m <sup>3</sup> ) | potential_temperature(C) | \ |
|-------|--------------------|-------------------------------------|--------------------------|---|
| 0     | 2.3921             | 27.6228                             | 0.0144                   |   |
| 1     | 2.3922             | 27.6227                             | 0.0144                   |   |
| 2     | 2.3923             | 27.6222                             | 0.0145                   |   |
| 3     | 2.3925             | 27.6215                             | 0.0147                   |   |
| 4     | 2.3928             | 27.6208                             | 0.0149                   |   |
| ...   | ...                | ...                                 | ...                      |   |
| 17954 | 1.5218             | 27.4251                             | -0.7498                  |   |
| 17955 | 1.5217             | 27.4251                             | -0.7498                  |   |
| 17956 | 1.5216             | 27.4243                             | -0.7498                  |   |
| 17957 | 1.5213             | 27.4244                             | -0.7501                  |   |
| 17958 | 1.5210             | 27.4241                             | -0.7503                  |   |

|       | practical_salinity(psu) | speed_of_sound(m/s) | dissolved_oxygen(ml/l) |
|-------|-------------------------|---------------------|------------------------|
| 0     | 34.3945                 | 1458.6991           | 4.4275                 |
| 1     | 34.3944                 | 1458.6994           | 4.4277                 |
| 2     | 34.3937                 | 1458.7004           | 4.4282                 |
| 3     | 34.3929                 | 1458.7023           | 4.4287                 |
| 4     | 34.3920                 | 1458.7042           | 4.4290                 |
| ...   | ...                     | ...                 | ...                    |
| 17954 | 34.1051                 | 1452.8557           | 4.5015                 |

|       |         |           |        |
|-------|---------|-----------|--------|
| 17955 | 34.1051 | 1452.8546 | 4.5015 |
| 17956 | 34.1041 | 1452.8521 | 4.5015 |
| 17957 | 34.1041 | 1452.8494 | 4.5017 |
| 17958 | 34.1038 | 1452.8478 | 4.5017 |

[17959 rows x 16 columns]

```
[6]: # Drop columns

# SOLUTION #
ocean = ocean.
ocean.drop(columns=['latitude', 'longitude', 'pressure(db)', 'insitu_temperature(C)', 'conductivity(m/cm)', 'Conservative_Temperature(C)', 'thermal_driving(C)', 'density_anomaly(kg/m^3)', 'potential_temperature(C)', 'practical_salinity(psu)', 'speed_of_sound(m/s)', 'dissolved_oxygen(ml/l)'])
ocean
```

|       |             | time(UTC) | distance(m) | depth(m)  | Absolute_Salinity(g/kg) |
|-------|-------------|-----------|-------------|-----------|-------------------------|
| 0     | 10-Jan-2020 | 20:16:56  | 2861.5250   | -613.3393 | 34.5637                 |
| 1     | 10-Jan-2020 | 20:16:56  | 2861.4987   | -613.3446 | 34.5636                 |
| 2     | 10-Jan-2020 | 20:16:56  | 2861.4575   | -613.4449 | 34.5629                 |
| 3     | 10-Jan-2020 | 20:16:56  | 2861.4022   | -613.5580 | 34.5621                 |
| 4     | 10-Jan-2020 | 20:16:56  | 2861.3292   | -613.6709 | 34.5612                 |
| ...   |             | ...       | ...         | ...       | ...                     |
| 17954 | 09-Jan-2020 | 20:34:22  | 0.5095      | -501.9610 | 34.2727                 |
| 17955 | 09-Jan-2020 | 20:34:22  | 0.3128      | -501.8992 | 34.2727                 |
| 17956 | 09-Jan-2020 | 20:34:22  | 0.1738      | -501.8257 | 34.2717                 |
| 17957 | 09-Jan-2020 | 20:34:22  | 0.0737      | -501.7498 | 34.2717                 |
| 17958 | 09-Jan-2020 | 20:34:22  | -0.0000     | -501.7370 | 34.2714                 |

[17959 rows x 4 columns]

```
[7]: # Plot the depth as function of distance and use `s` to change the marker size

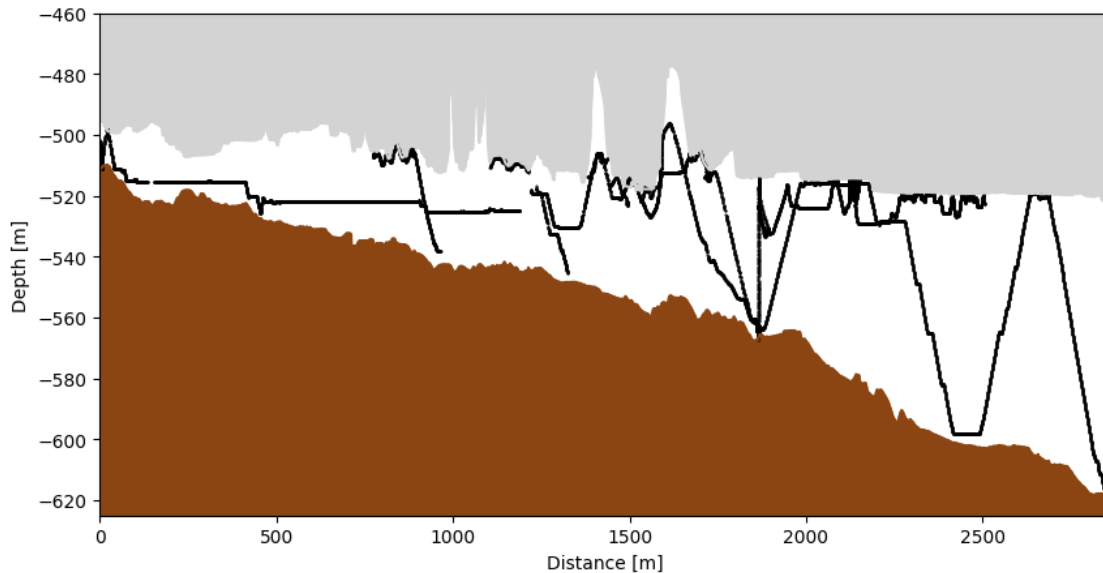
plt.figure(figsize=(10,5))
plt.plot(ice['distance(m)'],ice['ice(m)'], color='lightgrey')
plt.plot(seafloor['distance(m)'],seafloor['seafloor(m)'], color='saddlebrown')
plt.xlabel('Distance [m]')
plt.ylabel('Depth [m]')
plt.xlim(np.min(seafloor['distance(m)']),np.max(seafloor['distance(m)']))

# Fill in the solution from 6.2.2 here #
plt.fill_between(seafloor['distance(m)'],seafloor['seafloor(m)'],-625,color='saddlebrown')
plt.fill_between(ice['distance(m)'],ice['ice(m)'], -460,color='lightgrey')
plt.ylim(-625,-460)
```

```
# SOLUTION #

# Add scatter plot here#
plt.scatter(ocean['distance(m)'],ocean['depth(m)'],s=.2, color='k')
```

[7]: <matplotlib.collections.PathCollection at 0x269d62c7a00>



### 0.3 Exercise 8.1.3 dip deeper into the scatter plot

Now that we have plotted the journey of ICEFIN it would be nice to plot some of the components that it has been measuring on it's journey below the ice shelf.

With scatter plots we are able to color the markers based on data. In this exercise we will use the `Absolute_Salinity(g/kg)` column as data to be colored.

Have a look at the scatter plot [documentation](#)!

- copy and use the same scatter plot as above
- parse the `Absolute_Salinity(g/kg)` column to the `c` argument of the scatter plot
- use the `cmap` argument to add a colormap of choice
- use the `vmin` and `vmax` arguments to control the range of the colormap (`vmin = 34.3` and `vmax = 34.6` should be good)
- add a colorbar to the plot

```
[8]: plt.figure(figsize=(10,5))
plt.plot(ice['distance(m)'],ice['ice(m)'], color='lightgrey')
plt.plot(seafloor['distance(m)'],seafloor['seafloor(m)'], color='saddlebrown')
plt.xlabel('Distance [m]')
plt.ylabel('Depth [m]')
```

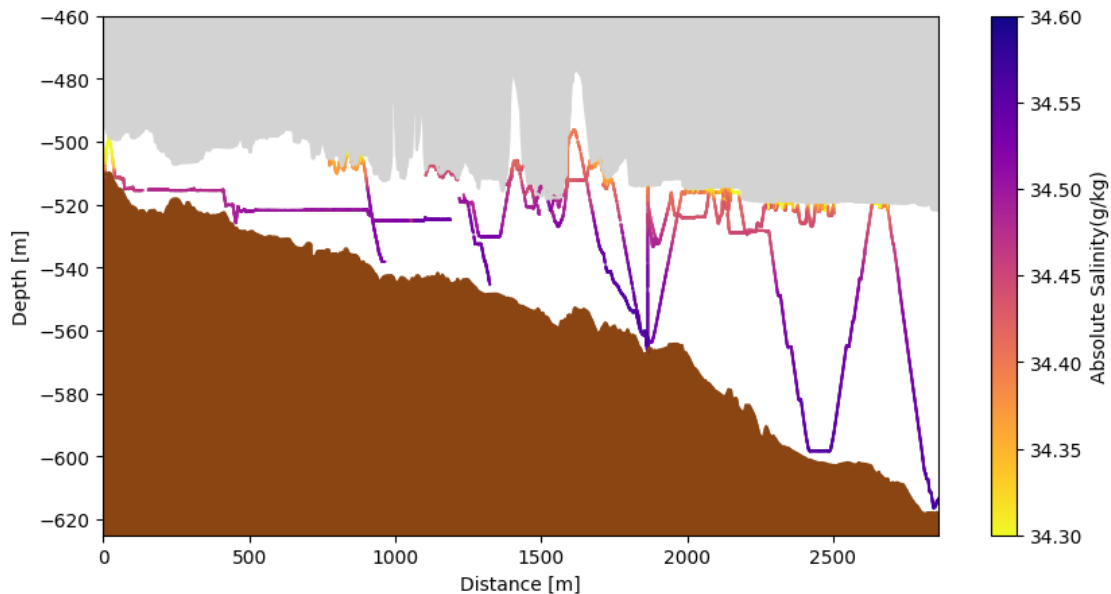
```
plt.xlim(np.min(seafloor['distance(m)']),np.max(seafloor['distance(m)']))

# Fill in the solution from 6.2.2 here #
plt.fill_between(seafloor['distance(m)'],seafloor['seafloor(m)'],-625,color='saddlebrown')
plt.fill_between(ice['distance(m)'],ice['ice(m)'], -460,color='lightgrey')
plt.ylim(-625,-460)

# SOLUTION #

# Add scatter plot here #
# cm = plt.cm.get_cmap('plasma_r')
cm = matplotlib.colormaps.get_cmap('plasma_r')
vmin = 34.3
vmax = 34.6
plt.scatter(ocean['distance(m)'],ocean['depth(m)'],c=ocean['Absolute_Salinity(g/kg)'], s=.2, cmap=cm,vmin=vmin,vmax = vmax)
plt.colorbar(label='Absolute Salinity(g/kg)')
```

[8]: <matplotlib.colorbar.Colorbar at 0x269d6380550>



[9]: ocean\_mean = ocean.groupby(['time(UTC)'],as\_index=False).mean()

#### 0.4 Exercise 8.2.1 creating a column with distances

In the example below we create a new column `time_delta` which contains the time it takes from ICEFIN to get from point `i` to `i+1` and the result is stored at `i+1`.

It is now your task to create a new column which contains the distance travelled between point  $i$  and  $i+1$ , and store the result at  $i+1$ .

- create a new column called `travelled_distance` with NaN values in every row
- use the columns `distance(m)` and `depth(m)` to calculate the euclidean distance and store the result in `travelled_distance`

Euclidean distance:

$$dist = \sqrt{(x_2 - x_1)^2 + (y_2 - y_1)^2}$$

```
[10]: # Creating a new column with NaN values
ocean_mean['time_delta'] = np.nan

[11]: # Loop through the dataframe and fill in the new column

for i in range(len(ocean_mean)-1):
    date_format = '%d-%b-%Y %H:%M:%S'
    time2 = datetime.strptime(ocean_mean['time(UTC)'].iloc[i+1], date_format)
    time1 = datetime.strptime(ocean_mean['time(UTC)'].iloc[i], date_format)
    ocean_mean['time_delta'].at[i+1] = (time2-time1).seconds
ocean_mean
```

```
[11]:
```

|      | time(UTC)            | distance(m) | depth(m)    | Absolute_Salinity(g/kg) | \ |
|------|----------------------|-------------|-------------|-------------------------|---|
| 0    | 09-Jan-2020 05:30:02 | 1864.504000 | -519.591700 | 34.443100               |   |
| 1    | 09-Jan-2020 05:30:11 | 1864.504000 | -522.580738 | 34.458025               |   |
| 2    | 09-Jan-2020 05:30:20 | 1864.504000 | -527.018589 | 34.476633               |   |
| 3    | 09-Jan-2020 05:30:28 | 1864.504000 | -531.471256 | 34.509967               |   |
| 4    | 09-Jan-2020 05:30:37 | 1864.504000 | -535.751850 | 34.521138               |   |
| ...  | ...                  | ...         | ...         | ...                     |   |
| 2563 | 11-Jan-2020 23:10:53 | 2499.645878 | -520.624211 | 34.376311               |   |
| 2564 | 11-Jan-2020 23:11:02 | 2500.899763 | -519.747450 | 34.299400               |   |
| 2565 | 11-Jan-2020 23:11:11 | 2502.174011 | -520.237222 | 34.317922               |   |
| 2566 | 11-Jan-2020 23:11:19 | 2503.573775 | -521.522025 | 34.372900               |   |
| 2567 | 11-Jan-2020 23:11:28 | 2504.304733 | -522.464750 | 34.400467               |   |

|      | time_delta |
|------|------------|
| 0    | NaN        |
| 1    | 9.0        |
| 2    | 9.0        |
| 3    | 8.0        |
| 4    | 9.0        |
| ...  | ...        |
| 2563 | 8.0        |
| 2564 | 9.0        |
| 2565 | 9.0        |
| 2566 | 8.0        |
| 2567 | 9.0        |

[2568 rows x 5 columns]

```
[12]: # Create a new column with NaN values

# SOLUTION #

ocean_mean['travelled_distance'] = np.nan
ocean_mean
```

```
[12]:
```

|      |             | time(UTC) | distance(m) | depth(m)    | Absolute_Salinity(g/kg) | \ |
|------|-------------|-----------|-------------|-------------|-------------------------|---|
| 0    | 09-Jan-2020 | 05:30:02  | 1864.504000 | -519.591700 | 34.443100               |   |
| 1    | 09-Jan-2020 | 05:30:11  | 1864.504000 | -522.580738 | 34.458025               |   |
| 2    | 09-Jan-2020 | 05:30:20  | 1864.504000 | -527.018589 | 34.476633               |   |
| 3    | 09-Jan-2020 | 05:30:28  | 1864.504000 | -531.471256 | 34.509967               |   |
| 4    | 09-Jan-2020 | 05:30:37  | 1864.504000 | -535.751850 | 34.521138               |   |
| ...  |             | ...       | ...         | ...         | ...                     |   |
| 2563 | 11-Jan-2020 | 23:10:53  | 2499.645878 | -520.624211 | 34.376311               |   |
| 2564 | 11-Jan-2020 | 23:11:02  | 2500.899763 | -519.747450 | 34.299400               |   |
| 2565 | 11-Jan-2020 | 23:11:11  | 2502.174011 | -520.237222 | 34.317922               |   |
| 2566 | 11-Jan-2020 | 23:11:19  | 2503.573775 | -521.522025 | 34.372900               |   |
| 2567 | 11-Jan-2020 | 23:11:28  | 2504.304733 | -522.464750 | 34.400467               |   |

|      | time_delta | travelled_distance |
|------|------------|--------------------|
| 0    | NaN        | NaN                |
| 1    | 9.0        | NaN                |
| 2    | 9.0        | NaN                |
| 3    | 8.0        | NaN                |
| 4    | 9.0        | NaN                |
| ...  | ...        | ...                |
| 2563 | 8.0        | NaN                |
| 2564 | 9.0        | NaN                |
| 2565 | 9.0        | NaN                |
| 2566 | 8.0        | NaN                |
| 2567 | 9.0        | NaN                |

[2568 rows x 6 columns]

```
[13]: # Fill in the column with the euclidean distance

# SOLUTION #

for i in range(len(ocean_mean)-1):
    ocean_mean['travelled_distance'].at[i+1] = np.
    ↪sqrt((ocean_mean['distance(m)'].iloc[i+1] - ocean_mean['distance(m)'].
    ↪iloc[i]) ** 2 + (ocean_mean['depth(m)'].iloc[i+1] - ocean_mean['depth(m)'].
    ↪iloc[i]) ** 2)
ocean_mean
```



```
[13]:
```

|      |             | time(UTC) | distance(m) | depth(m)    | Absolute_Salinity(g/kg) | \         |
|------|-------------|-----------|-------------|-------------|-------------------------|-----------|
| 0    | 09-Jan-2020 | 05:30:02  | 1864.504000 | -519.591700 |                         | 34.443100 |
| 1    | 09-Jan-2020 | 05:30:11  | 1864.504000 | -522.580738 |                         | 34.458025 |
| 2    | 09-Jan-2020 | 05:30:20  | 1864.504000 | -527.018589 |                         | 34.476633 |
| 3    | 09-Jan-2020 | 05:30:28  | 1864.504000 | -531.471256 |                         | 34.509967 |
| 4    | 09-Jan-2020 | 05:30:37  | 1864.504000 | -535.751850 |                         | 34.521138 |
| ...  |             | ...       | ...         | ...         | ...                     |           |
| 2563 | 11-Jan-2020 | 23:10:53  | 2499.645878 | -520.624211 |                         | 34.376311 |
| 2564 | 11-Jan-2020 | 23:11:02  | 2500.899763 | -519.747450 |                         | 34.299400 |
| 2565 | 11-Jan-2020 | 23:11:11  | 2502.174011 | -520.237222 |                         | 34.317922 |
| 2566 | 11-Jan-2020 | 23:11:19  | 2503.573775 | -521.522025 |                         | 34.372900 |
| 2567 | 11-Jan-2020 | 23:11:28  | 2504.304733 | -522.464750 |                         | 34.400467 |

|      | time_delta | travelled_distance |
|------|------------|--------------------|
| 0    | NaN        | NaN                |
| 1    | 9.0        | 2.989038           |
| 2    | 9.0        | 4.437851           |
| 3    | 8.0        | 4.452667           |
| 4    | 9.0        | 4.280594           |
| ...  | ...        | ...                |
| 2563 | 8.0        | 1.678182           |
| 2564 | 9.0        | 1.530012           |
| 2565 | 9.0        | 1.365132           |
| 2566 | 8.0        | 1.900015           |
| 2567 | 9.0        | 1.192908           |

[2568 rows x 6 columns]

## 0.5 Exercise 8.2.2 calculating the velocity

In the example below we create a new column `time_delta` which contains the time it takes from ICEFIN to get from point `i` to `i+1` and the result is stored at `i+1`.

It is now your task to create a new column which contains the distance travelled between point `i` and `i+1`, and store the result at `i+1`.

- create a new column with the velocity using `time_delta` and `travelled_distance`
- what is the maximum velocity?
- what is the minimum velocity?
- what is the mean velocity?

Hint: Since there might be NaN values it might be needed to use i.e. `np.nanmin()` instead of `np.min()`

```
[14]: # Create a new column with the velocities

# SOLUTION #
```

```
ocean_mean['velocity'] = ocean_mean['travelled_distance']/
    ↪ocean_mean['time_delta']
ocean_mean
```

```
[14]:
```

|      |             | time(UTC) | distance(m) | depth(m)    | Absolute_Salinity(g/kg) | \ |
|------|-------------|-----------|-------------|-------------|-------------------------|---|
| 0    | 09-Jan-2020 | 05:30:02  | 1864.504000 | -519.591700 | 34.443100               |   |
| 1    | 09-Jan-2020 | 05:30:11  | 1864.504000 | -522.580738 | 34.458025               |   |
| 2    | 09-Jan-2020 | 05:30:20  | 1864.504000 | -527.018589 | 34.476633               |   |
| 3    | 09-Jan-2020 | 05:30:28  | 1864.504000 | -531.471256 | 34.509967               |   |
| 4    | 09-Jan-2020 | 05:30:37  | 1864.504000 | -535.751850 | 34.521138               |   |
| ...  |             | ...       | ...         | ...         | ...                     |   |
| 2563 | 11-Jan-2020 | 23:10:53  | 2499.645878 | -520.624211 | 34.376311               |   |
| 2564 | 11-Jan-2020 | 23:11:02  | 2500.899763 | -519.747450 | 34.299400               |   |
| 2565 | 11-Jan-2020 | 23:11:11  | 2502.174011 | -520.237222 | 34.317922               |   |
| 2566 | 11-Jan-2020 | 23:11:19  | 2503.573775 | -521.522025 | 34.372900               |   |
| 2567 | 11-Jan-2020 | 23:11:28  | 2504.304733 | -522.464750 | 34.400467               |   |

|      | time_delta | travelled_distance | velocity |
|------|------------|--------------------|----------|
| 0    | NaN        | NaN                | NaN      |
| 1    | 9.0        | 2.989038           | 0.332115 |
| 2    | 9.0        | 4.437851           | 0.493095 |
| 3    | 8.0        | 4.452667           | 0.556583 |
| 4    | 9.0        | 4.280594           | 0.475622 |
| ...  | ...        | ...                | ...      |
| 2563 | 8.0        | 1.678182           | 0.209773 |
| 2564 | 9.0        | 1.530012           | 0.170001 |
| 2565 | 9.0        | 1.365132           | 0.151681 |
| 2566 | 8.0        | 1.900015           | 0.237502 |
| 2567 | 9.0        | 1.192908           | 0.132545 |

[2568 rows x 7 columns]

```
[15]: # Calculate the max, min and mean velocities

# SOLUTION #

min_vel = np.nanmin(ocean_mean['velocity'])
max_vel = np.nanmax(ocean_mean['velocity'])
mean_vel = np.nanmean(ocean_mean['velocity'])

print(f'The minimum velocity is {min_vel:.2f} m/s, the maximum velocity is_
    ↪{max_vel:.2f} m/s, and the mean velocity is {mean_vel:.2f} m/s')
```

The minimum velocity is 0.00 m/s, the maximum velocity is 0.65 m/s, and the mean velocity is 0.22 m/s