1 WeatherEDA

October 29, 2023

1 Exploratory data analysis of the Irish weather

1.0.1 Reviewing the Data

```
[36]: #Loading the libraries required

import numpy as np
import pandas as pd
from pandas import DataFrame, Series
import matplotlib.pyplot as plt
import seaborn as sns
```

```
[37]:
        day month year
                              station maxtp mintp rain wdsp
                                                                 hg
                                                                     sun
              jan 2021 Dublin Airport
                                         5.0
                                              -1.9
                                                     0.0
                                                           8.8 19.0
                                                                     6.6
     1
          2
              jan 2021 Dublin Airport
                                         3.5
                                              -2.4
                                                     0.1 10.1 19.0 2.4
     2
             jan 2021 Dublin Airport
                                         3.9
                                              -2.5
                                                     4.1
                                                         9.2 30.0 0.6
     3
              jan 2021 Dublin Airport
                                                     0.5 11.5 27.0 0.6
                                         5.3
                                               2.2
              jan 2021 Dublin Airport
                                         5.2
                                               1.2
                                                     1.0
                                                          9.5 25.0 1.0
```

Observations The dataset has temperature recordings taken at three airports (Dublin, Shannon, Cork)in Ireland.

Records are collected everyday in single year 2021.

Weather values included are days of year, location, maximum and minimum temperatures, rain and avg. wind speed, highest gust, sunshine duration.

Temporal resolution is the spacing between datapoints/observations. Here we can see that **spacing** between data is daily.

```
[38]: # Type of data contained in columns of loaded dataset.
print('\n\n', weather.dtypes,'\n')
```

```
#Finding unique stations of recording.
      weather.station.unique()
      day
                   int64
     month
               object
                 int64
     year
     station
                object
     maxtp
                float64
                float64
     mintp
     rain
                float64
     wdsp
                float64
                float64
     hg
     sun
                float64
     dtype: object
[38]: array(['Dublin Airport', 'Shannon Airport', 'Cork Airport'], dtype=object)
[39]: # To check how many years are there in dataset
      weather.year.unique()
[39]: array([2021])
[40]: # Which weather measurements reported?
      # panda function to review header names.
      list(weather)
[40]: ['day',
       'month',
       'year',
       'station',
       'maxtp',
       'mintp',
       'rain',
       'wdsp',
       'hg',
       'sun']
```

1.0.2 Data Cleaning

```
[41]: #Finding missing records
      weather.isna().sum()
[41]: day
                  0
      month
      year
                  0
      station
                  0
      maxtp
                  2
                  2
      mintp
      rain
                  4
      wdsp
                  1
                  3
      hg
                  2
      sun
      dtype: int64
```

Observations There are two missing maximum and minimum temperature measurements, 4 missing rain measurements, 1 missing mean windspeed measurement, 3 missing highest gust measurements and 2 missing hours of sunlight measurements.

A plausible reason for the missing measurements is that the equipment was not working correctly on the days where there is no measurement. For example, the thermometer may have been broken on the days there were no temperature measurements.

Filling the missing values with the mean would not be a very good strategy, as the mean is the average value across the year (and locations). A better strategy would be to fill the missing values with the mean for that month at that weather station. We still lose information about weather on that specific date with this method. To include information about the weather on the specific date of the missing measurement, we could compare the measurements at other locations with their mean values to see how close/far away they are from the mean value and use this relationship to determine an appropriate measurement at the weather station with the missing value.

In all cases, we are making inferences about the weather that may or not be true. Given that we do not have sufficient information about the true values, the best strategy is to leave them empty.

1.0.3 Data Analysis

```
[42]: #nunique - gives the count of unique values,
print ('Total number of stations: ' + str(weather.station.nunique()))

#unique - prints unique column values
print ('Station names: ')
print (weather.station.unique())

#Prints station names and records for each
weather.station.value_counts()
```

```
Total number of stations: 3
     Station names:
     ['Dublin Airport' 'Shannon Airport' 'Cork Airport']
[42]: Dublin Airport
                         365
      Shannon Airport
                         365
                         365
      Cork Airport
      Name: station, dtype: int64
[43]: #Finding Lowest Temparature
      #weather.iloc[weather.mintp.arqmin()]
      #qet location of min of lowest temperature and store it in variable
      lowestTemp = weather.loc[weather.mintp == weather.mintp.min()]
      #display the required columns for the min of lowest temperature
      weather.iloc[lowestTemp.index, [0,1,2,3,5]]
[43]:
         day month year
                                 station mintp
               jan 2021 Dublin Airport
                                           -5.9
[44]: #Finding Max rainfall Temparature
      MaxRain = weather.loc[weather.rain == weather.rain.max()]
      weather.iloc[MaxRain.index, [0,1,2,3,6]]
[44]:
            day month year
                                  station rain
```

1029 27 oct 2021 Cork Airport 50.1

Observations The lowest temperature was recorded at Dublin airport on January 9th 2021. The largest amount of rainfall was recorded at Cork Airport on October 27th 2021.

1.0.4 Statistical Analysis

```
[45]: #4. Create a numerical summary (mean, standard deviation, minimum, maximum, etc.

4) for each

4 of the weather measurements. Discuss and interpret your results.

4 Explanation:

4 Describe function displays the statistical data of paramater provided.

5 Below we calculate statistical data of all weather points individually for the whole year.

4 This provides the count of datapoints, Min and max records.

5 Mean provides the average of all datapoints, whereas median (also 50% mentioned below) sorts

6 the datapoints and it is middle of the list.
```

```
# These two above variables decide how the data is distributed.

# (25,50,75%) are the quantiles of datapoints in which the maximum counture of data is distributed.

# 1. Maxtp,Mintp - density of the datapoints are near to the avergae of a max tp values as median and mean

# are close.

# 2. Rain - mean and median are far away hence this decribes there are are and some outliers which fetches the median far from mean.

# 3. Wind speed, highest gust, sun - This feature has normal curve but due to some outliers it stretches

# mean away from median.

##Code:

weather.describe()
```

[45]:		day	year		maxtp	mir	ntp	rain	\
	count	1095.000000	1095.0	1093	.000000	1093.000000 6.950046 4.687423 -5.900000		1091.000000	
	mean	15.720548	2021.0	13	.732662			2.596242	
	std	8.800266	0.0	5	.107554			4.864790	
	min	1.000000	2021.0	0	.600000			0.000000	
	25%	8.000000	2021.0	10.200000 13.400000		3.4000	000	0.000000	
	50%	16.000000	2021.0			7.1000	000	0.300000	
	75%	23.000000	2021.0	17	.600000	10.700000 18.700000		3.050000	
	max	31.000000	2021.0	29	.600000			50.100000	
		wdsp		hg	sun				
	count	1094.000000	1092.00	0000	1093.00				
	mean	8.587020	22.86	3553	4.03				
	std	3.705469	8.39	8.396710		3.958998 0.000000			
	min	1.900000	7.000000		0.00				
	25%	6.000000	17.00	0000	0.30	0.300000			
	50%	7.900000	21.00	0000	2.90	0000			
	75%	10.600000	28.00	0000	6.60	0000			
	max	26.300000	64.00	0000	15.20	0000			

Observations Unsurprisingly, the maximum air temperature has a higher mean of 13.73 C and the maximum air temperature has a lower mean of 6.95 C. Both measurements have similar standard deviations. The median is approximately equal to the mean for both temperature measurements, indicating that their disctributions are symmetric.

The daily rain fall has a mean of 2.60 mm and standard deviation of 4.86 mm. The median (0.30

mm) is significantly lower than the mean, indicating that the distribution is right skewed.

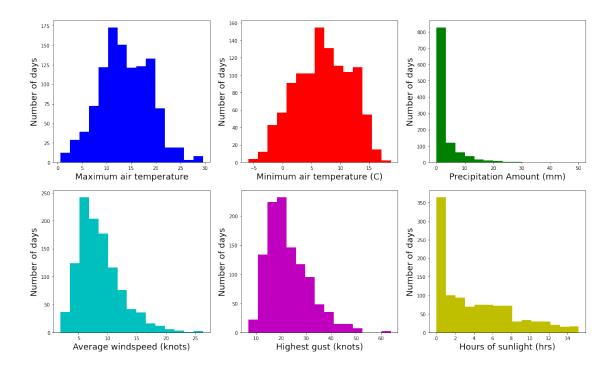
The average windspeed has a mean of 8.59 knots, while the highest gust has a much larger mean of 22.86. The standard deviation for the largest gust is also higher. This is to be expected.

The mean hours of sunlight per day is 4.04, with a standard deviation 0f 3.96. The median is slighlty lower than the mean, suggesting that the distribution may be right skewed (more days with less sunlight).

1.0.5 Graphical Summary

```
[46]: fig = plt.figure(figsize=(20,12))
      plt.subplot(2,3,1)
      plt.hist(weather.maxtp, color='b', bins=15)
      plt.xlabel('Maximum air temperature',size=18)
      plt.ylabel('Number of days',size=18)
      plt.subplot(2,3,2)
      plt.hist(weather.mintp, color='r', bins=15)
      plt.xlabel('Minimum air temperature (C)',size=18)
      plt.ylabel('Number of days',size=18)
      plt.subplot(2,3,3)
      plt.hist(weather.rain, color='g', bins=15)
      plt.xlabel('Precipitation Amount (mm)',size=18)
      plt.ylabel('Number of days',size=18)
      plt.subplot(2,3,4)
      plt.hist(weather.wdsp, color='c', bins=15)
      plt.xlabel('Average windspeed (knots)',size=18)
      plt.ylabel('Number of days',size=18)
      plt.subplot(2,3,5)
      plt.hist(weather.hg, color='m', bins=15)
      plt.xlabel('Highest gust (knots)',size=18)
      plt.ylabel('Number of days',size=18)
      plt.subplot(2,3,6)
      plt.hist(weather.sun, color='y', bins=15)
      plt.xlabel('Hours of sunlight (hrs)', size=18)
      plt.ylabel('Number of days',size=18)
```

[46]: Text(0, 0.5, 'Number of days')



Observations The two temperature measurements are, as expected from the numerical summaries, more or less symmetric. The centre's of each of these three graphes matches the mean/median, and the range/spread matches the min and max values.

The precipitation distribution is right skewed, which we predicted in the previous part. This makes sense, as there are many days that it rains just a little, but not many where it rains a lot. For the plot, we can see that there are over 800 days with little to no rain. Hence, we should not expect to have too many days with very heavy rainfall measurements.

The two windspeed measurements have a slight right-skew, with less days of high windspeeds than low windspeeds.

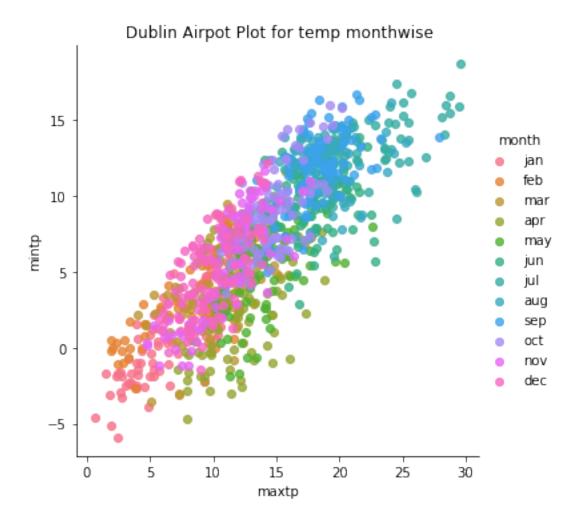
As expected, distribution of hours of sunlight is also right skewed. There are in fact a large number of days (~350) with little to no sunlight. These would correspond to overcast days, which we get quite often in Ireland.

```
[47]: import seaborn as sns
sns.lmplot(x='maxtp', y='mintp', data=weather, hue='month',fit_reg=False).

⇔set(title=

' Dublin Airpot Plot for tempu

⇔monthwise')
plt.show()
```



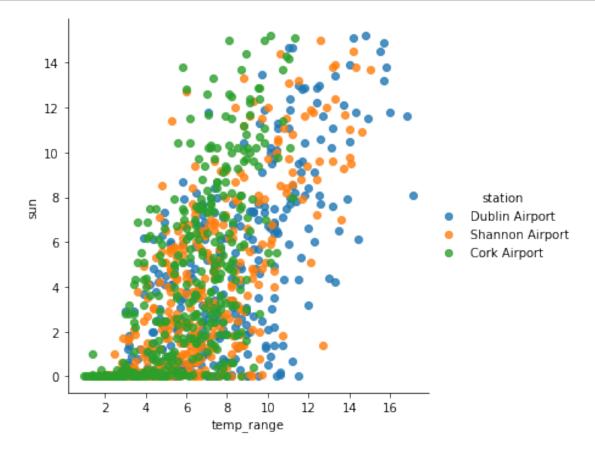
Observations As one would expect, as the maximum and minimum daily temperatures are positively correlated. If the maximum temperature for the day is high, the minimum temperature will also be higher. Also unsurprisingly is the fact that the temperatures (both min and max) are higher during the summer months (July, Aug, Oct) and lowest in the winter months (Dec, Jan, Feb).

A somewhat less obvious observation is that the minimum temperatures are higher in Autumn than in Spring (greenish points lower than the purpleish points).

```
[48]: #Adding new variable representing temperature range
weather['temp_range'] = weather.maxtp - weather.mintp
weather.head()
```

```
[48]:
         day month
                    year
                                  station maxtp
                                                   mintp
                                                          rain
                                                                 wdsp
                                                                             sun
                                                                         hg
                          Dublin Airport
                                                    -1.9
                                                                             6.6
      0
               jan
                    2021
                                              5.0
                                                            0.0
                                                                  8.8
                                                                       19.0
                           Dublin Airport
                    2021
                                              3.5
                                                    -2.4
                                                            0.1
                                                                 10.1
                                                                       19.0
                                                                             2.4
      1
               jan
      2
                          Dublin Airport
                                                    -2.5
                                                            4.1
                                                                       30.0
               jan
                    2021
                                              3.9
                                                                  9.2
                                                                             0.6
```

```
3
     4
               2021
                      Dublin Airport
                                          5.3
                                                  2.2
                                                        0.5
                                                              11.5
                                                                     27.0
                                                                           0.6
4
     5
                      Dublin Airport
                                          5.2
                                                  1.2
                                                        1.0
                                                               9.5
                                                                     25.0
                                                                           1.0
               2021
         jan
   temp_range
0
           6.9
           5.9
1
2
           6.4
3
           3.1
4
           4.0
```



Observations There seems to be a weak positive correlation between daily temperature range and hours of sunlight. On days when there is a lot of sunlight (clear skys) the temperature range tends to be great. We also see that the temperature range tends to be higher in Dublin compared to Cork, particularly on days with lots of sunlight (blue dots more to the right than green points). The measurements for Shannon span across those for Dublin and Cork.

1.0.6 Comparitive Analysis

```
[50]: print('Dublin Airport')
      weather.loc[weather.station=='Dublin Airport'].drop(['day','year'],axis=1).
        →describe()
     Dublin Airport
[50]:
                                              rain
                                mintp
                                                          wdsp
                                                                         hg
                                                                                     sun
                   maxtp
             364.000000
                          364.000000
                                       364.000000
                                                    365.000000
                                                                 364.000000
                                                                              364.000000
      count
               13.590934
                             6.001099
                                         1.828846
                                                      8.625753
                                                                  22.623626
                                                                                4.089835
      mean
                                         3.878082
                                                      3.456376
                                                                   7.790196
      std
               5.258806
                            4.748774
                                                                                3.981802
      min
               1.500000
                           -5.900000
                                         0.000000
                                                      2.600000
                                                                  10.000000
                                                                                0.000000
      25%
                            2.000000
                                         0.00000
                                                                  17.000000
               10.000000
                                                      6.100000
                                                                                0.500000
      50%
               13.300000
                            6.200000
                                         0.100000
                                                      7.900000
                                                                  21.000000
                                                                                2.900000
      75%
               18.100000
                            9.900000
                                         1.325000
                                                     10.500000
                                                                  27.250000
                                                                                6.800000
              26.800000
      max
                           15.800000
                                        26.900000
                                                     24.400000
                                                                  50.000000
                                                                               15.200000
              temp_range
      count
              364.000000
               7.589835
      mean
      std
               3.199411
      min
               1.400000
      25%
               5.200000
      50%
               7.350000
      75%
               9.800000
               17.100000
      max
[51]: print('Shannon Airport')
      weather.loc[weather.station=='Shannon Airport'].drop(['day','year'],axis=1).
        ⊶describe()
     Shannon Airport
[51]:
                                                                                          \
                   maxtp
                                mintp
                                              rain
                                                          wdsp
                                                                         hg
                                                                                     sun
      count
             364.000000
                          364.000000
                                       365.000000
                                                    365.000000
                                                                 363.000000
                                                                              364.000000
      mean
               14.368681
                            7.611813
                                         2.549041
                                                      7.815342
                                                                  21.796143
                                                                                3.856044
      std
               5.175728
                            4.820239
                                         4.007511
                                                      3.575878
                                                                   8.372032
                                                                                3.817264
               0.600000
                                         0.00000
                                                                   8.000000
                                                                                0.00000
      min
                           -4.600000
                                                      1.900000
      25%
                            4.275000
                                         0.00000
                                                      5.400000
                                                                  16.000000
                                                                                0.400000
               11.100000
      50%
               14.100000
                            7.650000
                                         0.500000
                                                      6.900000
                                                                  20.000000
                                                                                2.700000
      75%
               18.000000
                           11.525000
                                         3.400000
                                                      9.700000
                                                                  26.000000
                                                                                6.200000
               29.600000
                           18.700000
                                        20.700000
                                                     25.800000
                                                                  61.000000
                                                                               15.000000
      max
              temp_range
             364.000000
      count
               6.756868
      mean
      std
               2.834320
```

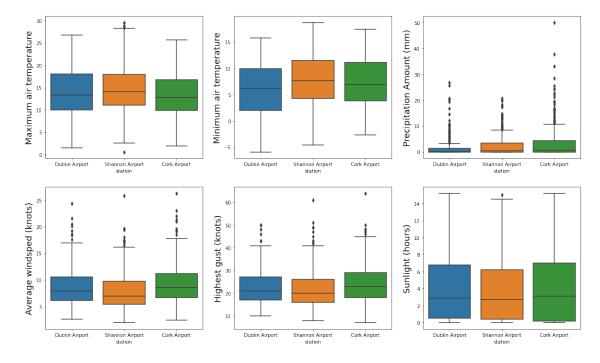
```
min
               1.700000
      25%
               4.800000
      50%
               6.300000
      75%
               8.425000
              15.000000
      max
[52]: print('Cork Airport')
      weather.loc[weather.station=='Cork Airport'].drop(['day','year'],axis=1).
       →describe()
     Cork Airport
[52]:
                  maxtp
                               mintp
                                            rain
                                                         wdsp
                                                                       hg
                                                                                   sun
      count 365.000000
                         365.000000
                                      362.000000
                                                  364.000000
                                                               365.000000
                                                                            365.000000
      mean
              13.239726
                            7.236438
                                        3.415470
                                                     9.321978
                                                                24.164384
                                                                              4.164110
      std
               4.826949
                            4.339971
                                        6.234737
                                                     3.924194
                                                                 8.843284
                                                                              4.077572
               1.900000
                          -2.700000
                                        0.000000
                                                     2.400000
                                                                 7.000000
                                                                              0.000000
      min
      25%
               9.900000
                            3.800000
                                        0.000000
                                                     6.600000
                                                                18.000000
                                                                              0.200000
      50%
              12.800000
                            6.900000
                                        0.600000
                                                     8.500000
                                                                23.000000
                                                                              3.100000
      75%
              16.800000
                           11.100000
                                        4.300000
                                                    11.200000
                                                                29.000000
                                                                              7.000000
              25.700000
                           17.400000
                                       50.100000
                                                    26.300000
                                                                64.000000
                                                                             15.200000
      max
             temp_range
      count
             365.000000
      mean
               6.003288
               2.342826
      std
      min
               1.000000
      25%
               4.300000
      50%
               6.200000
      75%
               7.800000
      max
              11.300000
[53]: fig = plt.figure(figsize=(20,12))
      plt.subplot(2,3,1)
      sns.boxplot(data=weather, x="station", y="maxtp", orient="v")
      plt.ylabel('Maximum air temperature',size=18)
      plt.subplot(2,3,2)
      sns.boxplot(data=weather, x="station", y="mintp", orient="v")
      plt.ylabel('Minimum air temperature',size=18)
      plt.subplot(2,3,3)
      sns.boxplot(data=weather, x="station", y="rain", orient="v")
      plt.ylabel('Precipitation Amount (mm)',size=18)
      plt.subplot(2,3,4)
```

```
sns.boxplot(data=weather, x="station", y="wdsp", orient="v")
plt.ylabel('Average windsped (knots)',size=18)

plt.subplot(2,3,5)
sns.boxplot(data=weather, x="station", y="hg", orient="v")
plt.ylabel('Highest gust (knots)',size=18)

plt.subplot(2,3,6)
sns.boxplot(data=weather, x="station", y="sun", orient="v")
plt.ylabel('Sunlight (hours)',size=18)
```

[53]: Text(0, 0.5, 'Sunlight (hours)')



Observations On average, the maximum daily temperature is slightly higher in Shannon, with a mean of 14.4 C (median 14.1 C) compared to 13.6 C (median 13.3 C) in Dublin and 13.2 C (median 12.8 C) in Cork. The highest daily temperature was also in Shannon, at 29.6 C. This agrees with the boxplots which show a higher median in Shannon, as well as a number of high temperature outliers for Shannon. In terms of minimum daily temperature, Cork and Shannon are similar, with Dublin having a mean minimum daily temperature of 1-1.5 C lower. Looking at the boxplots Cork and Shannon have similar IQRs, but the range of minimum daily temperature is larger in Shannon. The boxplot for Dublin is shifted down, indicating a lower minimum daily temperature, as expected.

The west of Ireland is know for getting more rain than the east. Hence, it is not surprising that the lowest average rainfall is in Dublin. The rainest day by far was recorded in Cork (50.1 mm compared to 26.9 mm in Dublin). From the boxplots, the range and IQR are significantly smalled

for Dublin. However, Dublin appears to have more heavy rainfall outliers than Shannon, but less than Cork.

Cork was the wettest location in 2021. The average windspeeds are comparable, with Cork having slightly stronger average windspeeds, 9.32 knots compared to 8.63 knots (Dublin) and 7.82 knots (Shannon). The boxplots show that Shannon has a slightly lower range and IQR, but a similarly large high windspeed outlyier as Cork. Cork also had stronger gusts, with a mean of 24.2 knots (median 23 knots) compared to 22.6 knots (median 21.0 knots) in Dublin and 21.8 knots (median 20.0) in Shannon. The boxplots support these findings, with Cork having the largest range and IQR, and the highest median highest gust.

Finally, the average hours of sunlight per day is comparable across locations; Dublin 4.1 hrs (median 2.9 hrs), Shannon 3.9 hrs (median 2.7 hrs), Cork 4.2 hrs (median 3.1 hrs). The standard deviation, interquartile range and range are all very similar, which can also been seen on the boxplots.