Team 14 Project Proposal Climate Change Prediction with Machine Learning

Description of project:

Purpose of this project aims to predict the yearly temperature change of a given city over a given time period. The output value should be numerically based on multiple extra factors like maximum temperature, minimum temperature, hPAAtSeaLevel, hPA, Humidity, Visibility, AverageWindSpeed, MaxSustainedWindSpeed, Fog and Precipitation

Team Members:

- Wooyoung Chung
- Mahavir Chandaliya
- Bhavana Gangula
- Jiahong Zhan

GitHub: https://github.com/docmhvr/CMPE 257 PROJECT

Dataset: https://en.tutiempo.net/climate

The datasets were obtained from tutiempo.net. We are using two datasets:

- 1) San Jose weather data containing the weather outcome of everyday from 2019 to 2021
- 2) Madrid weather data containing the weather outcome of everyday from 1991 to 1995

Description of the problem:

Our team found a climate dataset from 2019 to 2021 for San Jose and from 1991 to 1995 for Madrid. We want the training data to be able to predict future weather conditions. The specific process for the program will be based on the average annual temperature, annual average maximum temperature, average annual minimum temperature, total annual precipitation, annual average wind speed, number of days with rain, number of days with snow, number of days with storm, number of foggy days, number of days with tornado and number of days with hail as input, Then predict the certain weather condition for the next week, month or year. According to the prediction performance of the model, the prediction accuracy of the model is analyzed.

Potential methods:

Currently, we have pre-processing the dataset and made the dataset fit for a model. We are planning to conduct supervised learning to predict one of the weather conditions based on the patterns from other weather conditions of a specific timeline of Madrid and San Jose.

We are planning to do further data analysis by running PCA and perform normalization and scaling of the data to make it fit for running a ML model. Few models we will try to run on data will include Logistic regression, SVM, etc and after analysis of model performance and accuracy we will decide on the best model and optimize the model further for better prediction.

Preprocessing & Initial Findings:

We performed the following pre-processing steps on the data:

- 1) Data integration: combined the weather datasets of San Jose and Madrid
- 2) Data cleaning: remove missing data
- 3) Data reduction: remove unnecessary features
- 4) Data transformation: create new features from current ones and convert the unit of temperature

We performed the following visualizations on the dataset:

- 1) Line Plots
- 2) Bar Plots
- 3) Histograms
- 4) Heatmaps

We will start working on further pre-processing steps once we better understand the data and the interdependence between different columns in the dataset.

Based on the current results, we can see that we will need to do further data analysis before feeding the data to the model. The data needs to be scaled and normalized as well as there are a few outliers present in the data which need to be removed to give more accurate predictions.

```
In [66]:
           import pandas as pd
           import numpy as np
In [67]:
           dfSanJose = pd.read_excel("724945-0.xlsx")
           dfMadried = pd.read_excel("Madried.xlsx")
In [68]:
           #Madrid Dataset
           dfMadried
                                                                    PP
                                                                         VV
Out[68]:
                    Υ
                       M
                            D
                                  Т
                                     TM
                                           Tm
                                                  SLP
                                                        STP
                                                              Н
                                                                                V
                                                                                    VM
                                                                                          VG FG RA
                                                                                                      SN GR TS TR
              0 1991
                                5.3
                                      9.6
                                           0.0
                            1
                                                           - 86
                                                                     0
                                                                         3.4
                                                                               2.4
                                                                                     13
                                                                                                    0
                                                                                                         0
                                                                                                              0
                                                                                                                  0
                                                                                                                      0
                                           0.0
                 1991
                            2
                                2.6
                                      6.4
                                                           - 88
                                                                     0
                                                                         3.7
                                                                               4.1
                                                                                                    0
                                                                                                         0
                                                                                                              0
                                                                                                                  0
                                                                                                                      0
                                                                                   11.1
                 1991
                                2.3
                                      5.2
                                          -1.0
                                                           - 87
                                                                     0
                                                                         2.6
                                                                               2.0
                                                                                    9.4
                                                                                                              0
                                                                                                                  0
                            3
              3
                 1991
                                3.9
                                     10.0
                                           0.0
                                                           - 63
                                                                     0
                                                                         8.0
                                                                               4.4
                                                                                   25.9
                                                                                                    0
                                                                                                         0
                                                                                                              0
                                                                                                                  0
                                                                                                                      0
                            4
                 1991
                            5
                                2.9
                                     10.4
                                          -3.0
                                                             69
                                                                        10.5
                                                                               5.2
                                                                                   18.3
                                                                                                         0
                 1995
                                                1008.8
           1821
                                9.7
                                     11.0
                                           6.5
                                                       941.1
                                                             87
                                                                        10.1
                                                                                   22.2
                                                                                         33.5
                                                                                                         0
                                                                                                                  0
                                                                                                                      0
                       12
                           27
                                                                    6.1
                                                                              11.7
           1822
                 1995
                      12
                          28
                               11.3
                                    14.0
                                           8.0
                                                1012.8
                                                         945
                                                             78
                                                                     0
                                                                        12.4
                                                                              14.6
                                                                                   22.2
                                                                                         40.7
                                                                                                                      0
           1823
                1995
                                9.0
                                    10.2
                                               1011.6 943.1 95
                                                                   7.87
                                                                         6.9
                                                                               8.5
                                                                                   16.5
                                                                                                         0
                                                                                                              0
                                                                                                                  0
                                                                                                                      0
                      12 29
                                           7.6
                 1995
                      12 30
                               11.5
                                    14.0
                                           8.8
                                                1001.6
                                                       935.1 91
                                                                 21.08
                                                                        10.3
                                                                              17.8
                                                                                   29.4
                                                                                         53.5
           1825 1995 12 31
                                           8.0 1004.8 937.7 79
                                                                  1.02 12.4 19.8
                                                                                     37 51.9
                                                                                                0
                                                                                                         0
                                                                                                              0
                                                                                                                  0
                                                                                                                      0
                              11.3 14.0
          1826 rows × 20 columns
In [69]:
           #San Jose Dataset
           dfSanJose
                                                                         VV
                                     TM Tm
                                                 SLP
                                                                   PP
                                                                                   VM
Out[69]:
                    Υ
                       M
                            D
                                  Τ
                                                         STP
                                                               Н
                                                                                V
                                                                                          VG
                                                                                              FG
                                                                                                  RA
                                                                                                       SN
                                                                                                            GR
                                                                                                               TS
                                                                                                                   TR
              0 2019
                                8.9
                                          2.8
                                               1021.0 1019.3 29
                                                                  0.00
                                                                        16.1
                                                                             13.7
                                                                                   25.9
                                                                                        42.4
                                                                                                                 0
                                                                                                                      0
                                    13.3
                                                                                               0
                                                                                                    0
                                                                                                         0
                                                                                                             0
                                               1023.9
                                                                                                                      0
                 2019
                                6.4
                                    13.9
                                          0.6
                                                      1022.2 43
                                                                  0.00
                                                                        16.1
                                                                              6.3
                                                                                   11.1
                                                                                                    0
                                                                                                         0
                                                                                                                 0
                                               1023.7
                 2019
                                7.1
                                    14.4
                                          0.6
                                                        1022 54
                                                                  0.00
                                                                        16.1
                                                                              5.0
                                                                                   14.8
                                                                                                    0
                                                                                                                      0
                                                                                                                      0
              3 2019
                                               1017.6
                                                      1015.9 62
                                                                  0.00
                                                                        16.1
                                                                              3.3
                                                                                   16.5
                                                                                                    0
                                                                                                                 0
                                7.9
                                    16.7
                                          1.1
                2019
                                               1008.9
                                                       1007.2 72
                                                                  0.00
                                                                       15.8
                                                                             20.9
                                                                                   44.6
                                                                                        59.4
                                                                                                                      0
                            5
                               10.7 16.7
                                          1.7
                 2021
                       12
                          27
                                8.9
                                    11.7
                                           3.3
                                               1014.8
                                                       1013.1 81
                                                                  0.00
                                                                        14.2
                                                                             11.1
                                                                                   24.1
                                                                                          37
                                                                                                                      0
                                                        1011 76
           1092
                 2021
                       12 28
                                7.2
                                               1012.7
                                                                              7.4
                                                                                   18.3
                                                                                               0
                                                                                                         0
                                                                                                             0
                                                                                                                 0
                                                                                                                      0
                                    11.7
                                           5.6
                                                                  6.60
                                                                        16.1
           1093
                 2021
                                               1007.0
                                                       1005.5
                                                              80
                                                                                   33.5
                                                                                          50
                                                                                               0
                                                                                                                 0
                                                                                                                      0
                       12
                           29
                                9.6
                                    12.8
                                           5.6
                                                                  0.00
                                                                        15.8
                                                                             17.6
                                                                                                         0
           1094 2021 12 30
                                8.5 12.8
                                          5.0
                                              1011.5
                                                        1010 85
                                                                  6.86
                                                                        14.0
                                                                              5.6
                                                                                   14.8
                                                                                               0
                                                                                                         0
                                                                                                                 0
           1095 2021 12 31 8.2 12.8 2.8 1012.3 1010.7 74 0.00 16.1 10.7 24.1
          1096 rows × 20 columns
In [70]:
           #combining the two datasets
           frames = [dfSanJose, dfMadried]
           df = pd.concat(frames)
           df
Out[70]:
                    Y M D
                                  T TM Tm
                                                 SLP
                                                         STP H
                                                                     PP
                                                                          VV
                                                                                V VM
                                                                                          VG FG RA SN GR TS TR
                                8.9 13.3 2.8 1021.0 1019.3 29
              0 2019
                                                                    0.0 16.1 13.7 25.9
                                                                                         42.4
                                                                                                                  0
                                                                                                                      0
              1 2019
                            2
                                6.4 13.9 0.6 1023.9
                                                     1022.2 43
                                                                       16.1
                                                                               6.3 11.1
                                                                    0.0
                               7.1 14.4 0.6 1023.7
                                                        1022 54
                                                                    0.0 16.1
              2 2019
                            3
                                                                               5.0 14.8
                                                                                                                  0
                                                                                                                       0
```

0.0 16.1

3.3 16.5

- 0

0

0

3 2019 1 4 7.9 16.7 1.1 1017.6 1015.9 62

```
2019
                5 10.7 16.7 1.7 1008.9 1007.2 72
                                                      0.0 15.8 20.9
                                          941.1 87
1821 1995 12 27
                    9.7 11.0
                             6.5 1008.8
                                                      6.1 10.1 11.7 22.2
                                                                          33.5
                                                                                         0
                                                                                                     0
1822 1995
                             8.0
                                 1012.8
                                           945 78
                                                          12.4
                                                                    22.2
                                                                          40.7
          12 28
                  11.3 14.0
                                                               14.6
                                                                                         0
1823 1995 12 29
                       10.2 7.6 1011.6
                                         943.1 95
                                                     7.87
                                                           6.9
                                                                8.5
                                                                                         0
                    9.0
                                                                    16.5
                                                                                0
                                                                                     1
                                                                                             0
                                                                                                 0
                                                                                                     0
1824 1995 12 30
                                 1001.6
                                         935.1 91
                  11.5 14.0
                             8.8
                                                    21.08
                                                          10.3
                                                              17.8 29.4
                                                                          53.5
                                                                                0
                                                                                         0
                                                                                                 0
                                                                                                     0
1825 1995 12 31 11.3 14.0 8.0 1004.8
                                         937.7 79
                                                    1.02 12.4 19.8
                                                                      37 51.9
                                                                                0
                                                                                         0
```

2922 rows × 20 columns

```
In [71]:
          #renaming columns to be more legible
          df = df.rename(columns={"Y":"Year","M":"Month","D":"Day","T":"Temp","TM":"MaxTemp","Tm":"MinTemp","SLP":
In [72]:
          #Number of Missing Variables
          np.sum(df=='-')
Out[72]: Year
                                      0
         Month
                                      0
                                      0
         Day
         Temp
                                      0
         MaxTemp
                                      0
         MinTemp
                                      0
         hPAAtSeaLevel
                                    925
         hPA
                                    279
         Humidity
                                      4
         TotalRainfall
                                      2
```

0

0

5

0

0

0

0

0

0

2285

? Storm StormWithRain dtype: int64

Visibility

MaxWindSpeed

Fog

Rain

Snow

AverageWindSpeed

MaxSustainedWindSpeed

#getting rid of null rows except for MaxWindSpeed
#Getting rid of MaxWindSpeed column because too many missing rows as well as not very useful
df = df.drop(["MaxWindSpeed"],axis=1)

df = df[df[:]!='-']
df = df.dropna(axis=0)

df

In [73]:

Out[73]:		Year	Month	Day	Temp	MaxTemp	MinTemp	hPAAtSeaLevel	hPA	Humidity	TotalRainfall	Visibility	AverageW
	0	2019	1	1	8.9	13.3	2.8	1021.0	1019.3	29	0.0	16.1	
	1	2019	1	2	6.4	13.9	0.6	1023.9	1022.2	43	0.0	16.1	
	2	2019	1	3	7.1	14.4	0.6	1023.7	1022	54	0.0	16.1	
	3	2019	1	4	7.9	16.7	1.1	1017.6	1015.9	62	0.0	16.1	
	4	2019	1	5	10.7	16.7	1.7	1008.9	1007.2	72	0.0	15.8	
	•••		•••		•••		•••		•••				
	1821	1995	12	27	9.7	11.0	6.5	1008.8	941.1	87	6.1	10.1	
	1822	1995	12	28	11.3	14.0	8.0	1012.8	945	78	0	12.4	
	1823	1995	12	29	9.0	10.2	7.6	1011.6	943.1	95	7.87	6.9	
	1824	1995	12	30	11.5	14.0	8.8	1001.6	935.1	91	21.08	10.3	
	1825	1995	12	31	11.3	14.0	8.0	1004.8	937.7	79	1.02	12.4	

1989 rows × 19 columns

In [74]: #dropping unneccessary columns

```
df = df.drop(["Year", "Month", "Day", "?", "StormWithRain", "TotalRainfall", "Storm"], axis=1)
           #combining rain and snow as percipitation
           df["Percipitation"] = df["Rain"] | df["Snow"]
           df= df.drop(["Rain","Snow"],axis=1)
           #Convert temp to F from C
           df["Temp"] = df["Temp"]*9/5 + 32
           df["MaxTemp"] = df["MaxTemp"]*9/5 + 32
           df["MinTemp"] = df["MinTemp"]*9/5 + 32
In [75]:
           df
                                                            hPA Humidity Visibility AverageWindSpeed MaxSustainedWindSpee
                       MaxTemp MinTemp hPAAtSeaLevel
Out[75]:
             0 48.02
                           55.94
                                                   1021.0 1019.3
                                     37.04
                                                                       29
                                                                               16.1
                                                                                                  13.7
                                                                                                                          25.
             1 43.52
                           57.02
                                     33.08
                                                   1023.9 1022.2
                                                                       43
                                                                               16.1
                                                                                                   6.3
                                                                                                                          11.
             2 44.78
                           57.92
                                                   1023.7
                                                           1022
                                                                       54
                                                                               16.1
                                                                                                   5.0
                                                                                                                          14.
                                     33.08
             3 46.22
                           62.06
                                                   1017.6 1015.9
                                     33.98
                                                                       62
                                                                               16.1
                                                                                                   3.3
                                                                                                                          16.
                51.26
                           62.06
                                     35.06
                                                   1008.9 1007.2
                                                                       72
                                                                               15.8
                                                                                                  20.9
                                                                                                                          44.
```

1821 49.46

1822 52.34

1823 48.20

1824 52.70

1825 52.34

In [76]:

In [77]:

Out[77]: Temp

In [78]:

In [79]:

MaxTemp MinTemp

Humidity

Visibility

hPA

Fog

hPAAtSeaLevel

AverageWindSpeed

Percipitation

dtype: object

MaxSustainedWindSpeed

df.to csv("PreprocessedDataset")

data = pd.read_csv("PreprocessedDataset")

Out[76]: Temp

1989 rows × 11 columns

np.sum(df[:])

hPAAtSeaLevel

AverageWindSpeed

Percipitation

dtype: object

np.max(df[:])

MaxSustainedWindSpeed

MaxTemp

MinTemp

Humidity

Visibility

hPA

Fog

51.80

57.20

50.36

57.20

57.20

43.70

46.40

45.68

47.84

46.40

119954.34

144820.98

2022681.4

1960627.2

97317.0

121715

27205.3

20296.1

46192.9

havior, use 'frame.max(axis=0)' or just 'frame.max()'
return reduction(axis=axis, out=out, **passkwargs)

89.78 107.96

78.98

1037.1

1030.9

98

19.0

41.9

79.5 1

1

75

387

1008.8

1012.8

1011.6

1001.6

1004.8

941.1

945

943.1

935.1

937.7

87

78

95

79

C:\Users\MAHAVIR\anaconda3\lib\site-packages\numpy\core\fromnumeric.py:84: FutureWarning: In a future ve rsion, DataFrame.max(axis=None) will return a scalar max over the entire DataFrame. To retain the old be

10.1

12.4

6.9

10.3

12.4

11.7

14.6

8.5

17.8

19.8

22.

22.

16.

29.

3

[]	data.head(10)											
Out[80]:	Ur	nnamed: 0	Temp	MaxTemp	MinTemp	hPAAtSeaLev	vel hPA	Humidity	Visibility	AverageWindSpeed	MaxSustainedV	
	0	0	48.02	55.94	37.04	102	1.0 1019.3	29	16.1	13.7		
	1	1	43.52	57.02	33.08	1023	3.9 1022.2	43	16.1	6.3		
	2	2	44.78	57.92	33.08	1023	3.7 1022.0	54	16.1	5.0		
	3	3	46.22	62.06	33.98	1017	7.6 1015.9	62	16.1	3.3		
	4	4	51.26	62.06	35.06	1008	3.9 1007.2	72	15.8	20.9		
	5	5	49.64	55.94	42.98	1012	2.4 1010.7	86	13.7	17.4		
	6	6	54.50	62.06	42.98	1016	5.7 1014.6	83	14.8	12.6		
	7	7	56.48	62.06	48.92	1017	7.9 1016.1	79	16.1	9.1		
	8	8	57.92	60.98	51.08	101!	5.9 1014.1	80	15.3	16.9		
	9	9	52.52	62.06	42.98	1020	0.7 1019.2	87	13.4	5.4		
	1										+	
In [81]:	Range		1989 e (tota	entries, 0 nl 12 colum	mns):							
	2	MaxTemp			1989 non-	-null floa	at64 at64					
	4	MinTemp hPAAtSe			1989 non-	-null floa	at64					
	5 6	hPA Humidit	:y		1989 non-		at64 54					
	7 Visibility8 AverageWindSpeed				1989 non-		at64 at64					
	9	_		lindSpeed	1989 non-		at64 54					
	10 Fog 1989 non-null int64 11 Percipitation 1989 non-null int64 dtypes: float64(8), int64(4) memory usage: 186.6 KB											
In [82]:	data.value_counts()											
Out[82]:	Unnamed: 0 Temp ustainedWindSpeed			•	•		vel hPA	Humidi	ty Visi	bility AverageWir	ndSpeed MaxS	
	0			55.94	37.04	1021.0	1019	.3 29	16.1	13.7	25.9	
	0 1137	0	43.52	1 62.60	29.12	1026.5	956.9	9 65	10.0	4.1	14.8	
	0 1151	0	46.76	1 60.80	37.40	1017.2	948.9	9 79	7.9	4.1	33.5	
	1 1150	0	51.08	1 60.44	42.44	1015.8	947.	5 75	11.9	20.4	25.9	
	0 1149	0	50 36	1 55.40	46.40	1012.2	944.4	4 71	11.4		35.2	
		1	30.30	1	40.40	1012.2	J	7 7 1	11.4	21.9	33.2	
	 653		77.36	93.92	59.00	1015.4	1013	.8 29	16.1	10.0	22.2	
	0 652	0	72.14	1 89.96	53.96	1018.3	1016	.5 50	16.1	8.1	22.2	
		0		1 87.08	53.96	1017.7		.0 47	16.1		24.1	
	0	0		1								
	650 0	0		84.92 1	53.96	1019.0		.3 50	16.1		25.9	
	1825 0	1	52.34	57.20 1	46.40	1004.8	937.	7 79	12.4	19.8	37.0	
	Lengt	th: 1989	, dtyp	e: int64								
In [83]:	data	data.columns										

In [80]:

data.head(10)

```
dtype='object')
In [84]:
            data.plot()
Out[84]:
                       Unnamed: 0
            1750
                        Temp
                        MaxTemp
            1500
                        MinTemp
            1250
                        hPAAtSeaLevel
                        hPA
            1000
                        Humidity
                       Visibility
             750
                       AverageWindSpeed
                       MaxSustainedWindSpeed
             500
                       Fog
                       Percipitation
             250
               0
                               500
                                           1000
                                                       1500 1750 2000
                         250
                                      750
                                                  1250
In [85]:
            data.plot(subplots=True, figsize=(12,10))
Out[85]: array([, , , ,
                    , , , ],
                   dtype=object)
                       Unnamed: 0
            1000
              75
              50
             100
                                                                                                                        MaxTemp
              50
              75
              50
                                                                                                                         MinTemp
              25
            1025
                                                                                                                    hPAAtSeaLevel
            1000
            1000
                                                                                                                             hPA
             950
             100
                      MANNE THE PARTY AND
              50
                       Humidity
                      Hilbar
              10
                       Visibility
                                                                    AverageWindSpeed
              25
               0
              75
50
25
                       MaxSustainedWindSpeed
               1
                                                                                                                             Fog
               0 -
                                                                                                                      Percipitation
                                  250
                                              500
                                                            750
                                                                        1000
                                                                                     1250
                                                                                                  1500
                                                                                                              1750
                                                                                                                           2000
In [86]:
            data.plot(kind="bar")
Out[86]:
                       Unnamed: 0
            1750
                        Temp
                       MaxTemp
            1500
                       MinTemp
                       hPAAtSeaLevel
            1250
                       Humidity
            1000
                       Visibility
                       AverageWindSpeed
```

'Fog', 'Percipitation'],

750

```
MaxSustainedWindSpeed
500
           Fog
           Percipitation
250
```

```
In [88]:
              data.diff().hist()
Out[88]: array([[,
                        ]], dtype=object)
                      Unnamed: 0
                                                  Temp
                                                                       MaxTemp
              2000
                                      1000
                                         <sup>0</sup> hpaatseaLevel
                    Mig Temp
                                                             1000
                                       500
               500
                        Humidity,
                 0
                                                             AverageWindSpeed
                                              _iVisibility
                                      1000
               500
              MaxSustainedwindSpeed
                                                                     Percipitation
                                                   Fģg
              1000
                                                             1000
                                      1000
                                  50
In [89]:
              import seaborn as sns
In [101...
              sns.heatmap(data[['Temp']], annot=True)
Out[101...
             95
190
285
380
475
570
665
760
855
950
1045
1140
1235
1330
1425
                                                                              - 80
                                                                              - 70
                                                                               - 60
                                                                               - 50
              1615
1710
              1900
                                            Temp
In [102...
              sns.heatmap(data[['MaxTemp']], annot=True)
Out[102...
             95
190
285
380
475
570
665
760
855
950
1045
1140
1235
1330
1425
                                                                              - 100
                                                                              - 90
                                                                               - 80
```

- 70

60

```
1710
1805
1900
                                                        MaxTemp
In [103...
                   sns.heatmap(data[['MinTemp']], annot=True)
Out[103...
                  95
190
285
380
475
570
665
760
855
950
1045
1140
1235
1330
1425
1520
1615
1710
1805
1900
                                                                                                         - 70
                                                                                                          - 60
                                                                                                         - 50
                                                                                                          - 40
                                                                                                          - 30
                                                         MinTemp
In [104...
                   sns.heatmap(data[['hPAAtSeaLevel']], annot=True)
Out[104...
                  95
190
285
380
475
570
665
760
855
950
1045
1140
1235
1330
1425
1520
1615
1710
1805
1900
                                                                                                         - 1035
                                                                                                         - 1030
                                                                                                         - 1025
                                                                                                         - 1020
                                                                                                         - 1015
                                                                                                         - 1010
                                                                                                          - 1005
                                                                                                          - 1000
                                                    hPAAtSeaLevel
In [105...
                   sns.heatmap(data[['Humidity']], annot=True)
Out[105...
                  95
190
285
380
475
570
665
760
855
950
1045
1140
1235
                                                                                                         - 90
                                                                                                         - 80
                                                                                                         - 70
                                                                                                           60
                                                                                                           50
                  1330
1425
1520
1615
1710
1805
1900
                                                        Humidity
In [106...
                   sns.heatmap(data[['AverageWindSpeed']], annot=True)
Out[106...
                    95
190
285
380
475
                                                                                                         - 40
                                                                                                          - 35
```