Home-Assignment

October 16, 2023

```
[36]: !pip install gdown
     Requirement already satisfied: gdown in c:\users\malir\anaconda3\lib\site-
     packages (4.7.1)
     Requirement already satisfied: requests[socks] in
     c:\users\malir\anaconda3\lib\site-packages (from gdown) (2.28.1)
     Requirement already satisfied: beautifulsoup4 in
     c:\users\malir\anaconda3\lib\site-packages (from gdown) (4.11.1)
     Requirement already satisfied: filelock in c:\users\malir\anaconda3\lib\site-
     packages (from gdown) (3.6.0)
     Requirement already satisfied: six in c:\users\malir\anaconda3\lib\site-packages
     (from gdown) (1.16.0)
     Requirement already satisfied: tqdm in c:\users\malir\anaconda3\lib\site-
     packages (from gdown) (4.64.1)
     Requirement already satisfied: soupsieve>1.2 in
     c:\users\malir\anaconda3\lib\site-packages (from beautifulsoup4->gdown) (2.3.1)
     Requirement already satisfied: charset-normalizer<3,>=2 in
     c:\users\malir\anaconda3\lib\site-packages (from requests[socks]->gdown) (2.0.4)
     Requirement already satisfied: idna<4,>=2.5 in
     c:\users\malir\anaconda3\lib\site-packages (from requests[socks]->gdown) (3.3)
     Requirement already satisfied: certifi>=2017.4.17 in
     c:\users\malir\anaconda3\lib\site-packages (from requests[socks]->gdown)
     (2022.9.14)
     Requirement already satisfied: urllib3<1.27,>=1.21.1 in
     c:\users\malir\anaconda3\lib\site-packages (from requests[socks]->gdown)
     (1.26.11)
     Requirement already satisfied: PySocks!=1.5.7,>=1.5.6 in
     c:\users\malir\anaconda3\lib\site-packages (from requests[socks]->gdown) (1.7.1)
     Requirement already satisfied: colorama in c:\users\malir\anaconda3\lib\site-
     packages (from tqdm->gdown) (0.4.5)
[37]: import numpy as np
      import pandas as pd
      import matplotlib.pyplot as plt
      import warnings
      import gdown
      import zipfile
```

```
[38]: warnings.filterwarnings('ignore')
      file_id = '1Qnp0WeRAlycJLGsr4ghyB-TzS4cQpaLl'
      url = f'https://drive.google.com/uc?id={file_id}'
      output = 'file.zip'
      gdown.download(url, output, quiet=False)
      extracted = "HomeAssignment"
      with zipfile.ZipFile('file.zip', 'r') as zip_ref:
         zip ref.extractall(extracted)
      csv_file_path = f"{extracted}/
       →Conditions_Contributing_to_COVID-19_Deaths_by_State_and_Age__Provisional_2020+2023.
      df = pd.read_csv(csv_file_path)
      df.head(10)
     Downloading...
     From: https://drive.google.com/uc?id=1QnpOWeRAlycJLGsr4ghyB-TzS4cQpaLl
     To: C:\Users\malir\file.zip
     100%|
      | 3.66M/3.66M [00:00<00:00, 6.18MB/s]
[38]:
                                                                           State \
        Data As Of
                    Start Date
                                  End Date
                                               Group
                                                      Year
                                                            Month
      0 06/25/2023 01/01/2020 06/24/2023 By Total
                                                       NaN
                                                              NaN United States
      1 06/25/2023 01/01/2020 06/24/2023 By Total
                                                       NaN
                                                              NaN United States
      2 06/25/2023 01/01/2020 06/24/2023 By Total
                                                       NaN
                                                              NaN United States
      3 06/25/2023 01/01/2020 06/24/2023 By Total
                                                       NaN
                                                              NaN United States
      4 06/25/2023 01/01/2020 06/24/2023 By Total
                                                       {\tt NaN}
                                                              NaN United States
      5 06/25/2023 01/01/2020 06/24/2023 By Total
                                                       {\tt NaN}
                                                              NaN United States
      6 06/25/2023 01/01/2020 06/24/2023 By Total
                                                       {\tt NaN}
                                                              NaN United States
      7 06/25/2023
                    01/01/2020 06/24/2023 By Total
                                                       {\tt NaN}
                                                              NaN United States
                                                              NaN United States
      8 06/25/2023 01/01/2020
                                06/24/2023 By Total
                                                       {\tt NaN}
      9 06/25/2023 01/01/2020 06/24/2023 By Total
                                                              NaN United States
                                                       {\tt NaN}
                                            Condition ICD10_codes
             Condition Group
                                                                    Age Group \
                                                                         0-24
      O Respiratory diseases Influenza and pneumonia
                                                          J09-J18
      1 Respiratory diseases Influenza and pneumonia
                                                          J09-J18
                                                                        25 - 34
      2 Respiratory diseases Influenza and pneumonia
                                                                        35 - 44
                                                          J09-J18
      3 Respiratory diseases Influenza and pneumonia
                                                          J09-J18
                                                                        45-54
      4 Respiratory diseases Influenza and pneumonia
                                                          J09-J18
                                                                        55-64
      5 Respiratory diseases Influenza and pneumonia
                                                          J09-J18
                                                                        65-74
      6 Respiratory diseases Influenza and pneumonia
                                                          J09-J18
                                                                        75-84
      7 Respiratory diseases Influenza and pneumonia
                                                          J09-J18
                                                                          85+
      8 Respiratory diseases Influenza and pneumonia
                                                          J09-J18 Not stated
      9 Respiratory diseases Influenza and pneumonia
                                                          J09-J18
                                                                     All Ages
```

```
0
                  1554.0
                                       1630.0
                                               {\tt NaN}
                  5775.0
                                       5998.0
                                               {\tt NaN}
      1
      2
                 15026.0
                                      15643.0 NaN
      3
                 37335.0
                                      38794.0 NaN
      4
                 82382.0
                                      85404.0 NaN
      5
                128349.0
                                     132400.0 NaN
      6
                137362.0
                                     140693.0 NaN
      7
                119833.0
                                     121695.0 NaN
      8
                    12.0
                                         12.0 NaN
      9
                527628.0
                                     542269.0 NaN
[39]:
     df.describe()
[39]:
                      Year
                                            COVID-19 Deaths Number of Mentions
                                     Month
      count
             571320.000000
                            521640.000000
                                               4.111710e+05
                                                                    4.167610e+05
               2021.304348
                                  6.071429
                                               1.266096e+02
                                                                    1.362334e+02
      mean
                                  3.425349
                                               3.052289e+03
                                                                    3.279466e+03
      std
                  1.039850
                                               0.000000e+00
                                                                    0.000000e+00
     min
               2020.000000
                                  1.000000
      25%
               2020.000000
                                  3.000000
                                               0.000000e+00
                                                                    0.000000e+00
      50%
               2021.000000
                                               0.000000e+00
                                                                    0.000000e+00
                                  6.000000
      75%
               2022.000000
                                  9.000000
                                               1.900000e+01
                                                                    2.100000e+01
      max
               2023.000000
                                 12.000000
                                               1.135624e+06
                                                                    1.135624e+06
[40]: df["Start Date"] = pd.to_datetime(df["Start Date"], format='\%m/\%d/\%Y')
      df["End Date"] = pd.to_datetime(df["End Date"], format='%m/%d/%Y')
      start_date_filtered = pd.to_datetime('01/01/2020', format='%m/%d/%Y')
      end_date_filtered = pd.to_datetime('06/24/2023', format='%m/%d/%Y')
      filtered_df = df[(df["Start Date"] == start_date_filtered) & (df["End Date"] ==_
       →end_date_filtered)]
[41]: filtered_df["Start Date"].unique()
[41]: array(['2020-01-01T00:00:00.000000000'], dtype='datetime64[ns]')
[42]: filtered_df["End Date"].unique()
[42]: array(['2023-06-24T00:00:00.000000000'], dtype='datetime64[ns]')
[43]: filtered_df["Age Group"].unique()
[43]: array(['0-24', '25-34', '35-44', '45-54', '55-64', '65-74', '75-84',
             '85+', 'Not stated', 'All Ages'], dtype=object)
```

COVID-19 Deaths Number of Mentions Flag

```
[44]: for i in ["Not stated", "All Ages"]:
        filtered_df = filtered_df[filtered_df['Age Group'] != i]
[45]: filtered_df['Age Group'].unique()
[45]: array(['0-24', '25-34', '35-44', '45-54', '55-64', '65-74', '75-84',
             '85+'], dtype=object)
[46]: filtered_df = filtered_df[filtered_df["State"] != "United States"]
[47]: filtered_df["State"].unique()
[47]: array(['Alabama', 'Alaska', 'Arizona', 'Arkansas', 'California',
             'Colorado', 'Connecticut', 'Delaware', 'District of Columbia',
             'Florida', 'Georgia', 'Hawaii', 'Idaho', 'Illinois', 'Indiana',
             'Iowa', 'Kansas', 'Kentucky', 'Louisiana', 'Maine', 'Maryland',
             'Massachusetts', 'Michigan', 'Minnesota', 'Mississippi',
             'Missouri', 'Montana', 'Nebraska', 'Nevada', 'New Hampshire',
             'New Jersey', 'New Mexico', 'New York', 'New York City',
             'North Carolina', 'North Dakota', 'Ohio', 'Oklahoma', 'Oregon',
             'Pennsylvania', 'Rhode Island', 'South Carolina', 'South Dakota',
             'Tennessee', 'Texas', 'Utah', 'Vermont', 'Virginia', 'Washington',
             'West Virginia', 'Wisconsin', 'Wyoming', 'Puerto Rico'],
            dtype=object)
[48]: filtered_df.drop(columns=["Data As Of", "Start Date", "End_
       ⇔Date", "Group", "Year", "Month", "ICD10_codes", "Flag"], inplace=True)
      filtered df
[48]:
                   State
                               Condition Group
                                                               Condition Age Group \
      230
                 Alabama Respiratory diseases Influenza and pneumonia
                                                                              0-24
      231
                 Alabama Respiratory diseases Influenza and pneumonia
                                                                             25 - 34
      232
                 Alabama Respiratory diseases Influenza and pneumonia
                                                                             35 - 44
      233
                 Alabama Respiratory diseases Influenza and pneumonia
                                                                             45-54
      234
                 Alabama Respiratory diseases Influenza and pneumonia
                                                                             55-64
      12413 Puerto Rico
                                      COVID-19
                                                                COVID-19
                                                                             45-54
      12414 Puerto Rico
                                      COVID-19
                                                                COVID-19
                                                                             55 - 64
      12415 Puerto Rico
                                      COVID-19
                                                                COVID-19
                                                                             65 - 74
      12416 Puerto Rico
                                      COVID-19
                                                                COVID-19
                                                                             75-84
      12417 Puerto Rico
                                                                COVID-19
                                                                               85+
                                      COVID-19
             COVID-19 Deaths Number of Mentions
      230
                        20.0
                                            20.0
      231
                       103.0
                                            108.0
      232
                       230.0
                                            237.0
      233
                       547.0
                                            564.0
```

| 234 | 1188.0 | 1224.0 |
|-------|--------|--------|
| ••• | ••• | ••• |
| 12413 | 439.0 | 439.0 |
| 12414 | 780.0 | 780.0 |
| 12415 | 1238.0 | 1238.0 |
| 12416 | 1640.0 | 1640.0 |
| 12417 | 1713.0 | 1713.0 |
| | | |

[9752 rows x 6 columns]

```
[49]: filtered_df.isnull().sum()
```

```
[49]: State 0
Condition Group 0
Condition 0
Age Group 0
COVID-19 Deaths 1646
Number of Mentions 1572
```

dtype: int64

```
[50]: fig, axes = plt.subplots(1, 3, figsize=(18, 5)) # 1 row, 3 columns

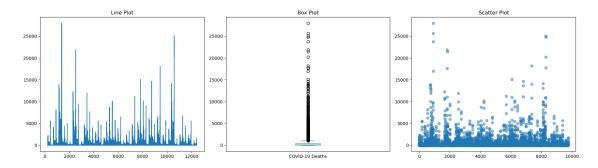
filtered_df["COVID-19 Deaths"].plot.line(ax=axes[0])
axes[0].set_title("Line Plot")

filtered_df["COVID-19 Deaths"].plot.box(ax=axes[1])
axes[1].set_title("Box Plot")

x_values = range(len(filtered_df))
y_values = filtered_df["COVID-19 Deaths"]
axes[2].scatter(x_values, y_values, marker='o', alpha=0.5)
axes[2].set_title("Scatter Plot")

plt.tight_layout()

plt.show()
```



```
[51]: filtered_df.dropna(subset=["COVID-19 Deaths"],inplace=True)
[52]: filtered_df["Number of Mentions"].fillna(method="ffill",inplace=True)
      filtered_df
[52]:
                               Condition Group
                   State
                                                               Condition Age Group \
      230
                                                                              0-24
                 Alabama Respiratory diseases Influenza and pneumonia
      231
                 Alabama Respiratory diseases Influenza and pneumonia
                                                                             25-34
                 Alabama Respiratory diseases Influenza and pneumonia
      232
                                                                             35 - 44
      233
                 Alabama
                         Respiratory diseases Influenza and pneumonia
                                                                             45-54
      234
                 Alabama Respiratory diseases Influenza and pneumonia
                                                                             55-64
      12413 Puerto Rico
                                      COVID-19
                                                                COVID-19
                                                                             45-54
      12414 Puerto Rico
                                                                             55-64
                                      COVID-19
                                                                COVID-19
      12415 Puerto Rico
                                                                             65 - 74
                                      COVID-19
                                                                COVID-19
      12416 Puerto Rico
                                      COVID-19
                                                                COVID-19
                                                                             75-84
      12417 Puerto Rico
                                      COVID-19
                                                                COVID-19
                                                                               85+
             COVID-19 Deaths Number of Mentions
      230
                        20.0
                                            20.0
      231
                       103.0
                                           108.0
      232
                       230.0
                                           237.0
      233
                       547.0
                                           564.0
      234
                      1188.0
                                          1224.0
                       •••
      12413
                       439.0
                                           439.0
                       780.0
                                           780.0
      12414
      12415
                      1238.0
                                          1238.0
      12416
                      1640.0
                                          1640.0
      12417
                      1713.0
                                          1713.0
      [8106 rows x 6 columns]
[53]: age_group = {'0-24': 0,'25-34': 1,'35-44': 2,'45-54': 3,'55-64': 4,'65-74':
       45,'75-84': 6,'85+': 7
      filtered_df["Age Group"] = filtered_df["Age Group"].map(age_group)
[54]: condition dict = filtered df["Condition"].value counts().to dict()
      two_most_frequent = sorted(condition_dict, key=condition_dict.get,_
       ⇔reverse=True)[:2]
      condition dict = {k: k if k in two_most_frequent else "Other" for k in_
       ⇔condition_dict}
      filtered df["Broad Condition Group"] = filtered df["Condition"].
       →map(condition dict)
```

```
[55]: broad_cond_grp = {'COVID-19':0, 'All other conditions and causes (residual)':
       filtered_df["Broad Condition Group"] = filtered_df["Broad Condition Group"].
       →map(broad cond grp)
[56]: filtered_df = filtered_df.reset_index(drop=True)
[57]: from sklearn.preprocessing import StandardScaler
      scaler = StandardScaler()
      filtered_df[["COVID-19 Deaths"]] = scaler.fit_transform(filtered_df[["COVID-19"]

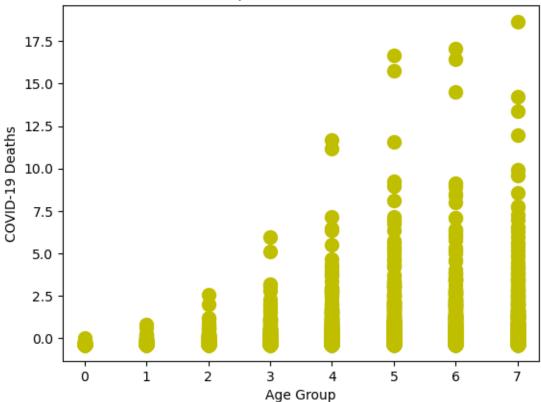
→Deaths"]])
      final_df = filtered_df[["Age Group","COVID-19 Deaths","Broad Condition Group"]]
      final_df
[57]:
            Age Group COVID-19 Deaths Broad Condition Group
      0
                   0
                             -0.354732
                                                            2
                             -0.298298
                                                            2
      1
                    1
      2
                    2
                             -0.211946
                                                            2
                                                            2
      3
                    3
                             0.003593
      4
                    4
                             0.439432
                                                            2
     8101
                   3
                             -0.069840
                                                           0
      8102
                    4
                             0.162018
                                                            0
                             0.473428
      8103
                   5
                                                            0
      8104
                   6
                             0.746762
                                                            0
      8105
                   7
                             0.796398
                                                            0
```

[8106 rows x 3 columns]

1 Defining functions for visualizing decision boundaries

```
[76]: final_df.plot.scatter("Age Group", "COVID-19 Deaths", c="y", cmap="prism", umarker="o", s=100, colorbar=False, title="samples: the true labels");
```





2 Implementing classification algorithms and building models

2.1 Train-Test Split

2.2 K Nearest Neighbor

```
[59]: from sklearn.neighbors import KNeighborsClassifier
from sklearn.metrics import precision_score, recall_score, f1_score
knn = KNeighborsClassifier(n_neighbors = 5)
knn.fit(X_train,y_train)
knn_preds = knn.predict(X_test)
```

```
[60]: knn_precision = precision_score(y_test, knn_preds, average='weighted')
knn_recall = recall_score(y_test, knn_preds, average='weighted')
knn_f1 = f1_score(y_test, knn_preds, average='weighted')
scores_dict = {"KNN":[knn_precision,knn_recall,knn_f1]}
```

3 Logistic Regression

```
[61]: from sklearn.linear_model import LogisticRegression
    logreg = LogisticRegression(class_weight="balanced")
    logreg.fit(X_train,y_train)
    logreg_preds = logreg.predict(X_test)
```

```
[62]: logreg_precision = precision_score(y_test, logreg_preds, average='weighted')
logreg_recall = recall_score(y_test, logreg_preds, average='weighted')
logreg_f1 = f1_score(y_test, logreg_preds, average='weighted')
scores_dict["Logistic Regression"] = [logreg_precision,logreg_recall,logreg_f1]
```

4 SVM: Linear

```
[63]: from sklearn.svm import SVC

svm_linear = SVC(kernel="linear", probability=True)
svm_linear.fit(X_train,y_train)
svm_linear_preds = svm_linear.predict(X_test)
```

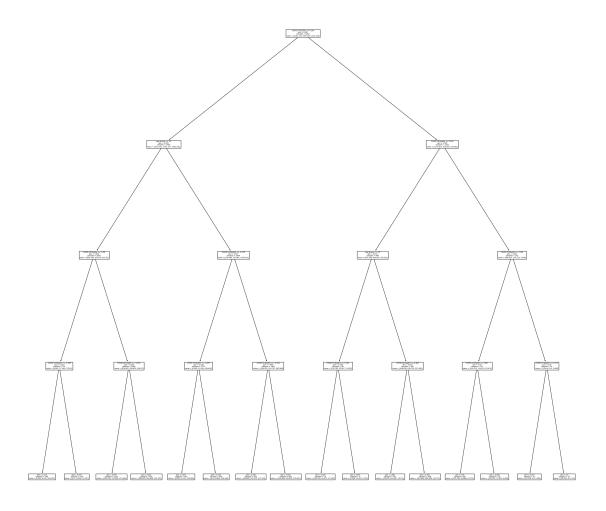
5 SVM: Poly

```
svm_poly_recall = recall_score(y_test, svm_poly_preds, average='weighted')
         svm_poly_f1 = f1_score(y_test, svm_poly_preds, average='weighted')
         scores_dict[f"SVM Poly {i}"] =
       [65]: {'knn': [0.8767339014987222, 0.8945745992601726, 0.8848504775905255],
      'logistic regression': [0.8892218935784733,
       0.7108508014796547,
       0.7762237836042594],
      'SVM Linear': [0.8387275588616173, 0.905055487053021, 0.8616981201653263],
      'SVM Poly 3': [0.8387275588616173, 0.905055487053021, 0.8616981201653263],
      'SVM Poly 4': [0.8387275588616173, 0.905055487053021, 0.8616981201653263],
      'SVM Poly 5': [0.8760157013394425, 0.9075215782983971, 0.8652560619711612]}
     6 Decision Tree
[72]: from sklearn.tree import DecisionTreeClassifier
     from sklearn import tree
     dec tree = DecisionTreeClassifier(max depth=4, min samples leaf=5,,,
      →random_state=42, class_weight="balanced")
     dec_tree.fit(X_train,y_train)
     dec_tree_preds = dec_tree.predict(X_test)
[67]: dec_tree_precision = precision_score(y_test, dec_tree_preds, average='weighted')
     dec tree recall = recall score(y test, dec tree preds, average='weighted')
     dec_tree_f1 = f1_score(y_test, dec_tree_preds, average='weighted')
     scores_dict["Decision Tree"] = [dec_tree_precision,dec_tree_recall,dec_tree_f1]
```

tree.plot_tree(dec_tree, feature_names=dec_tree.feature_names_in_)

[74]: plt.figure(figsize=(30,30))

plt.show()



```
[68]: scores_df = pd.DataFrame(scores_dict,index=['Precision', 'Recall', 'F1'])
      scores_df
[68]:
                          logistic regression SVM Linear
                                                           SVM Poly 3 SVM Poly 4 \
                      knn
                                                              0.838728
     Precision
                0.876734
                                      0.889222
                                                  0.838728
                                                                          0.838728
                                                              0.905055
     Recall
                0.894575
                                      0.710851
                                                  0.905055
                                                                          0.905055
     F1
                0.884850
                                      0.776224
                                                 0.861698
                                                              0.861698
                                                                         0.861698
                SVM Poly 5 Decision Tree
     Precision
                  0.876016
                                 0.890258
     Recall
                  0.907522
                                  0.718866
     F1
                  0.865256
                                 0.783061
```

[]:[