### IMPORTING REQUIRED LIBRARIES

```
import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sns
from sklearn.tree import DecisionTreeClassifier,plot_tree
from sklearn.preprocessing import LabelEncoder
from sklearn.metrics import accuracy_score
from sklearn.metrics import recall_score
from sklearn.metrics import precision_score,fl_score
from sklearn.metrics import confusion_matrix,classification_report
from sklearn.preprocessing import StandardScaler
from sklearn.model_selection import
train_test_split,cross_validate,GridSearchCV,cross_val_predict
from sklearn.metrics import roc_auc_score,roc_curve
```

#### LOADING DATASET

<pre>df=pd.read_csv('city_day.csv') df</pre>										
NH3 \		City		Date	PM2.5	PM10	NO	N02	N0×	
0	Ahmedabad		01-01-	2015	NaN	l NaN	0.92	18.22	17.15	
NaN 1	Ah	medabad	02-01-	2015	NaN	l NaN	0.97	15.69	16.46	
NaN 2	Ah	medabad	03-01-	2015	NaN	l NaN	17.40	19.30	29.70	
NaN 3	Ah	medabad	04-01-	2015	NaN	I NaN	1.70	18.48	17.97	
NaN 4	Ah	medabad	05-01-	2015	NaN	I NaN	22.10	21.42	37.76	
NaN 										
 29526	Visakh	apatnam	27-06-	2020	15.02	2 50.94	7.68	25.06	19.54	
12.47 29527	Visakhapatnam		28-06-	2020	24.38	3 74.09	3.42	26.06	16.53	
11.99 29528	Visakhapatnam		29-06-		22.91		3.45	29.53	18.33	
10.71 29529	Visakhapatnam		30-06-		16.64		4.05	29.26	18.80	
10.03 29530	Visakhapatnam		01-07-		15.00		0.40	26.85	14.05	
5.20	VISAKII	apatnalli	01-07-	2020	13.00	, 00.00	0.40	20.03	14.03	
AQI_Bu	C0 cket	S02	03	Benz	ene 1	oluene	Xylene	AQI		

```
0
       0.92 27.64 133.36
                               0.00
                                        0.02
                                                0.00
                                                       NaN
NaN
1
       0.97 24.55
                     34.06
                               3.68
                                        5.50
                                                3.77
                                                       NaN
NaN
2
       17.40 29.07
                     30.70
                               6.80
                                       16.40
                                                2.25
                                                       NaN
NaN
       1.70 18.59
                     36.08
                               4.43
                                       10.14
                                                1.00
                                                       NaN
3
NaN
                               7.01
                                       18.89
4
       22.10 39.33
                     39.31
                                                2.78
                                                       NaN
NaN
. . .
29526
                                                0.73 41.0
       0.47
              8.55
                     23.30
                               2.24
                                       12.07
Good
29527
       0.52
             12.72
                     30.14
                               0.74
                                        2.21
                                                0.38 70.0
Satisfactory
29528
       0.48
              8.42
                     30.96
                               0.01
                                        0.01
                                                0.00 68.0
Satisfactory
29529
       0.52
              9.84
                     28.30
                               0.00
                                        0.00
                                                0.00
                                                      54.0
Satisfactory
29530
       0.59
              2.10
                     17.05
                                NaN
                                         NaN
                                                 NaN 50.0
Good
[29531 rows x 16 columns]
df.shape
(29531, 16)
df.columns
Index(['City', 'Date', 'PM2.5', 'PM10', 'N0', 'N02', 'N0x', 'NH3',
'CO', 'SO2'
       '03', 'Benzene', 'Toluene', 'Xylene', 'AQI', 'AQI_Bucket'],
     dtype='object')
df.info()
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 29531 entries, 0 to 29530
Data columns (total 16 columns):
#
                Non-Null Count Dtype
    Column
- - -
                                object
0
    City
                29531 non-null
1
    Date
                29531 non-null
                                object
 2
                24933 non-null float64
    PM2.5
3
                18391 non-null float64
    PM10
4
    NO
                25949 non-null float64
 5
    N02
                25946 non-null float64
 6
    N0x
                25346 non-null float64
 7
    NH3
                19203 non-null float64
```

```
CO
 8
                 27472 non-null
                                 float64
 9
     S02
                 25677 non-null
                                 float64
 10
    03
                 25509 non-null
                                 float64
 11
    Benzene
                 23908 non-null
                                 float64
 12
    Toluene
                 21490 non-null float64
13
    Xylene
                 11422 non-null float64
14
                 24850 non-null float64
    AQI
15
    AQI Bucket 24850 non-null object
dtypes: float64(13), object(3)
memory usage: 3.6+ MB
df.isnull().sum()
City
                  0
                  0
Date
               4598
PM2.5
              11140
PM10
NO
               3582
N02
               3585
               4185
N0x
NH3
              10328
C0
               2059
S02
               3854
03
               4022
               5623
Benzene
Toluene
               8041
Xylene
              18109
AQI
               4681
AQI Bucket
               4681
dtype: int64
```

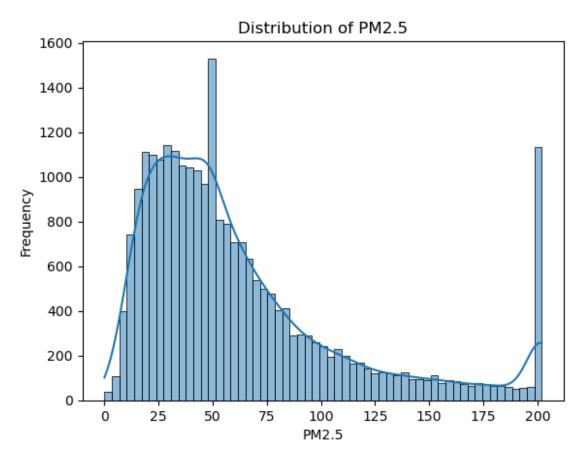
### **REFINING DATASET**

```
d=df.drop(['City', 'Date'],axis=1)
d.head()
  PM2.5 PM10
                 N0
                       N02
                             N0x
                                  NH3
                                         C0
                                               S02
                                                       03
Benzene \
               0.92 18.22 17.15
                                  NaN
                                        0.92 27.64
                                                   133.36
0
    NaN
          NaN
0.00
          NaN
               0.97 15.69 16.46
                                  NaN
                                        0.97 24.55
                                                     34.06
1
    NaN
3.68
2
    NaN
          NaN
              17.40 19.30 29.70
                                  NaN 17.40 29.07
                                                     30.70
6.80
3
    NaN
          NaN 1.70 18.48 17.97
                                  NaN
                                       1.70 18.59
                                                     36.08
4.43
    NaN
          NaN 22.10 21.42 37.76 NaN 22.10 39.33
                                                     39.31
4
7.01
```

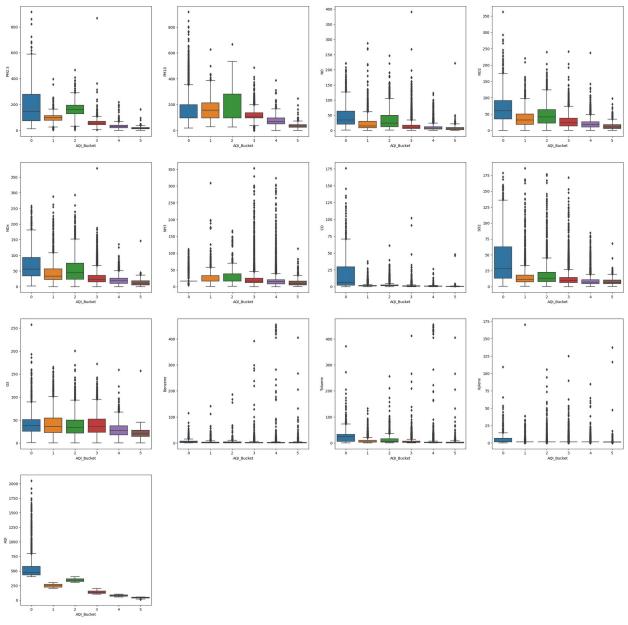
```
Xvlene
                    AQI AQI Bucket
   Toluene
0
                    NaN
      0.02
              0.00
                                NaN
1
      5.50
              3.77
                    NaN
                                NaN
2
     16.40
              2.25
                    NaN
                                NaN
3
     10.14
              1.00
                    NaN
                                NaN
4
     18.89
              2.78
                    NaN
                                NaN
d=d.dropna(subset=['AQI Bucket'])
d['AQI Bucket'].unique()
array(['Poor', 'Very Poor', 'Severe', 'Moderate', 'Satisfactory',
'Good'],
      dtype=object)
d['PM2.5'].fillna((d['PM2.5'].median()), inplace = True)
d['PM10'].fillna((d['PM10'].median()), inplace = True)
d['N0'].fillna((d['N0'].median()), inplace = True)
d['N02'].fillna((d['N02'].median()), inplace = True)
d['N0x'].fillna((d['N0x'].median()), inplace = True)
d['NH3'].fillna((d['NH3'].median()), inplace = True)
d['C0'].fillna((d['C0'].median()), inplace = True)
d['S02'].fillna((d['S02'].median()), inplace = True)
d['03'].fillna((d['03'].median()), inplace = True)
d['Benzene'].fillna((d['Benzene'].median()), inplace = True)
d['Toluene'].fillna((d['Toluene'].median()), inplace = True)
d['Xylene'].fillna((d['Xylene'].median()), inplace = True)
d['AQI'].fillna((d['AQI'].median()), inplace = True)
d['AQI Bucket']=d['AQI Bucket'].map({ 'Severe':0, 'Poor':1, 'Very
Poor': 2, 'Moderate': 3, 'Satisfactory': 4, 'Good': 5})
d['AQI Bucket']
28
         1
29
         2
30
         0
31
         0
32
         0
29526
         5
29527
         4
29528
         4
29529
         4
29530
Name: AQI_Bucket, Length: 24850, dtype: int64
d.info()
<class 'pandas.core.frame.DataFrame'>
Index: 24850 entries, 28 to 29530
```

```
Data columns (total 14 columns):
                 Non-Null Count Dtype
#
     Column
 0
     PM2.5
                 24850 non-null
                                 float64
1
     PM10
                 24850 non-null float64
2
     NO
                 24850 non-null float64
 3
     N02
                 24850 non-null float64
 4
     N0x
                 24850 non-null float64
5
     NH3
                 24850 non-null float64
 6
     C0
                 24850 non-null float64
 7
    S02
                 24850 non-null float64
 8
    03
                 24850 non-null float64
 9
                 24850 non-null float64
     Benzene
 10
   Toluene
                 24850 non-null float64
 11 Xylene
                 24850 non-null float64
12
    AQI
                 24850 non-null float64
13 AQI Bucket 24850 non-null int64
dtypes: float64(13), int64(1)
memory usage: 2.8 MB
d['AQI Bucket'].unique()
array([1, 2, 0, 3, 4, 5], dtype=int64)
d.isnull().sum()
PM2.5
              0
PM10
              0
NO
              0
N02
              0
              0
N0x
NH3
              0
C0
              0
S02
              0
03
              0
Benzene
              0
              0
Toluene
              0
Xylene
AQI
              0
AQI Bucket
              0
dtype: int64
sns.histplot(d['PM2.5'].dropna(), kde=True)
plt.title('Distribution of PM2.5')
plt.xlabel('PM2.5')
plt.ylabel('Frequency')
plt.show()
C:\Users\nishm\anaconda3\Lib\site-packages\seaborn\ oldcore.py:1119:
FutureWarning: use inf as na option is deprecated and will be removed
in a future version. Convert inf values to NaN before operating
```

```
instead.
  with pd.option_context('mode.use_inf_as_na', True):
```



```
features=list(d.drop(['AQI_Bucket'],axis=1).columns)
target=['AQI_Bucket']
plt.figure(figsize=(30,30))
for i in (features):
    c=features.index(i)+1
    plt.subplot(4,4,c)
    sns.boxplot(y=d[i].values, x=d['AQI_Bucket']).set(ylabel= i)
```

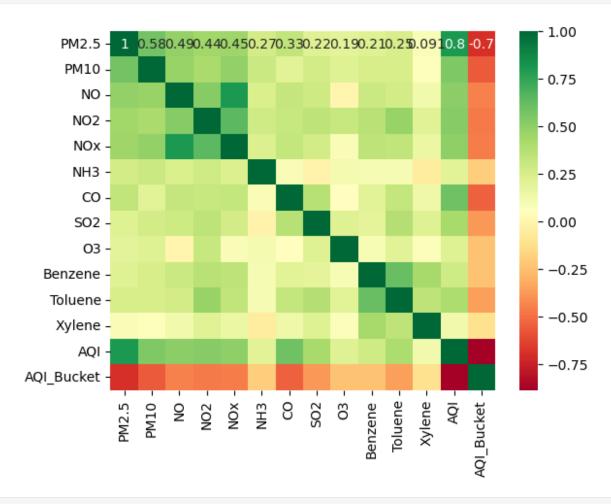


```
num_cols=[col for col in d.columns if d[col].dtypes in
["int",'float']]
num_cols

['PM2.5',
    'PM10',
    'NO',
    'NO2',
    'NOx',
    'NH3',
    'CO',
    'S02',
    '03',
```

```
'Benzene',
 'Toluene',
 'Xylene',
 'AQI']
def
outlier thresholds(dataframe, variable, low quantile=0.10, up quantile=0.
80):
    quantile one=dataframe[variable].quantile(low quantile)
    quantile three=dataframe[variable].quantile(up quantile)
    interquantile_range=quantile_three-quantile_one
    up limit=quantile_three+1.5*interquantile_range
    low limit=quantile one-1.5*interquantile range
    return low limit, up limit
def check outlier(dataframe, col name):
    low limit,up limit=outlier thresholds(dataframe, col name)
    if dataframe[(dataframe[col_name]>up_limit) |
(dataframe[col name]<low limit)].any(axis=None):</pre>
        return True
    else:
        return False
for col in num cols:
    print(col,check outlier(d,col))
PM2.5 True
PM10 True
NO True
NO2 True
N0x True
NH3 True
CO True
S02 True
03 True
Benzene True
Toluene True
Xylene True
AOI True
def replace with thresholds(dataframe, variable):
    low_limit, up_limit=outlier_thresholds(dataframe, variable)
    dataframe.loc[(dataframe[variable]<low_limit), variable]=low_limit</pre>
    dataframe.loc[(dataframe[variable]>up limit),variable]=up limit
for col in num cols:
    print(col,replace with thresholds(d,col))
PM2.5 None
PM10 None
NO None
```

```
NO2 None
NOx None
NH3 None
CO None
SO2 None
O3 None
Benzene None
Toluene None
Xylene None
AQI None
sns.heatmap(d.corr(),annot=True,cmap='RdYlGn')
<Axes: >
```

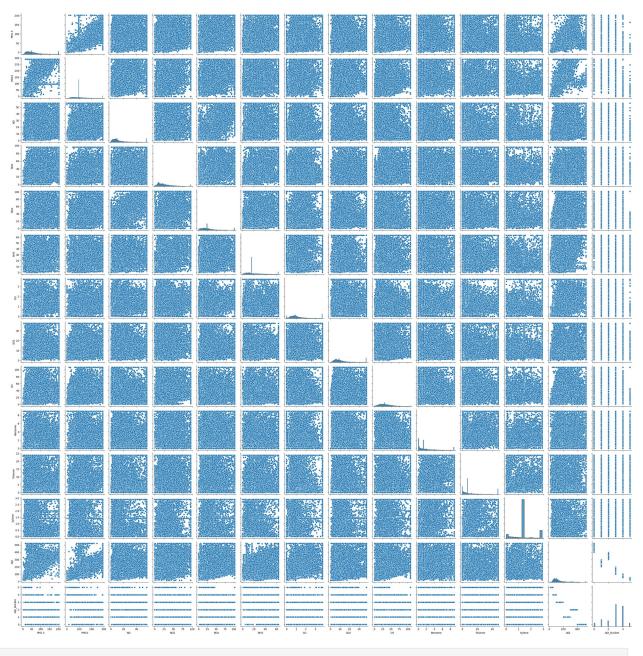


sns.pairplot(d)

C:\Users\nishm\anaconda3\Lib\site-packages\seaborn\\_oldcore.py:1119: FutureWarning: use\_inf\_as\_na option is deprecated and will be removed in a future version. Convert inf values to NaN before operating instead.

with pd.option context('mode.use inf as na', True): C:\Users\nishm\anaconda3\Lib\site-packages\seaborn\ oldcore.py:1119: FutureWarning: use inf as na option is deprecated and will be removed in a future version. Convert inf values to NaN before operating instead. with pd.option context('mode.use inf as na', True): C:\Users\nishm\anaconda3\Lib\site-packages\seaborn\ oldcore.py:1119: FutureWarning: use inf as na option is deprecated and will be removed in a future version. Convert inf values to NaN before operating instead. with pd.option context('mode.use inf as na', True): C:\Users\nishm\anaconda3\Lib\site-packages\seaborn\ oldcore.py:1119: FutureWarning: use inf as na option is deprecated and will be removed in a future version. Convert inf values to NaN before operating instead. with pd.option context('mode.use inf as na', True): C:\Users\nishm\anaconda3\Lib\site-packages\seaborn\ oldcore.py:1119: FutureWarning: use\_inf\_as\_na option is deprecated and will be removed in a future version. Convert inf values to NaN before operating instead. with pd.option context('mode.use inf as na', True): C:\Users\nishm\anaconda3\Lib\site-packages\seaborn\ oldcore.py:1119: FutureWarning: use inf as na option is deprecated and will be removed in a future version. Convert inf values to NaN before operating instead. with pd.option context('mode.use inf as na', True): C:\Users\nishm\anaconda3\Lib\site-packages\seaborn\ oldcore.py:1119: FutureWarning: use inf as na option is deprecated and will be removed in a future version. Convert inf values to NaN before operating instead. with pd.option context('mode.use inf as na', True): C:\Users\nishm\anaconda3\Lib\site-packages\seaborn\ oldcore.py:1119: FutureWarning: use inf as na option is deprecated and will be removed in a future version. Convert inf values to NaN before operating instead. with pd.option context('mode.use inf as na', True): C:\Users\nishm\anaconda3\Lib\site-packages\seaborn\ oldcore.py:1119: FutureWarning: use inf as na option is deprecated and will be removed in a future version. Convert inf values to NaN before operating instead. with pd.option context('mode.use inf as na', True): C:\Users\nishm\anaconda3\Lib\site-packages\seaborn\ oldcore.py:1119: FutureWarning: use\_inf\_as\_na option is deprecated and will be removed in a future version. Convert inf values to NaN before operating with pd.option context('mode.use\_inf\_as\_na', True): C:\Users\nishm\anaconda3\Lib\site-packages\seaborn\ oldcore.py:1119: FutureWarning: use inf as na option is deprecated and will be removed in a future version. Convert inf values to NaN before operating

instead. with pd.option context('mode.use inf as na', True): C:\Users\nishm\anaconda3\Lib\site-packages\seaborn\ oldcore.py:1119: FutureWarning: use inf as na option is deprecated and will be removed in a future version. Convert inf values to NaN before operating instead. with pd.option context('mode.use inf as na', True): C:\Users\nishm\anaconda3\Lib\site-packages\seaborn\ oldcore.py:1119: FutureWarning: use inf as na option is deprecated and will be removed in a future version. Convert inf values to NaN before operating instead. with pd.option\_context('mode.use\_inf\_as\_na', True): C:\Users\nishm\anaconda3\Lib\site-packages\seaborn\ oldcore.py:1119: FutureWarning: use inf as na option is deprecated and will be removed in a future version. Convert inf values to NaN before operating instead. with pd.option context('mode.use inf as na', True): <seaborn.axisgrid.PairGrid at 0x20f253105d0>



```
columns = ['PM2.5', 'PM10', 'N0', 'N02', 'N0x', 'NH3', 'C0',
'S02','03', 'Benzene', 'Toluene', 'Xylene', 'AQI', 'AQI_Bucket']
plt.figure(figsize=(30,30),facecolor='white')
plotnumber = 1
for column in columns:
    ax = plt.subplot(4,4,plotnumber)
    sns.distplot(d[column])
    plt.xlabel(column,fontsize=10)
    plotnumber+=1
plt.show()
```

C:\Users\nishm\AppData\Local\Temp\ipykernel 18452\2303030590.py:6: UserWarning: `distplot` is a deprecated function and will be removed in seaborn v0.14.0. Please adapt your code to use either `displot` (a figure-level function with similar flexibility) or `histplot` (an axes-level function for histograms). For a guide to updating your code to use the new functions, please see https://gist.github.com/mwaskom/de44147ed2974457ad6372750bbe5751 sns.distplot(d[column]) C:\Users\nishm\anaconda3\Lib\site-packages\seaborn\ oldcore.py:1119: FutureWarning: use inf as na option is deprecated and will be removed in a future version. Convert inf values to NaN before operating instead. with pd.option context('mode.use inf as na', True): C:\Users\nishm\AppData\Local\Temp\ipykernel 18452\2303030590.py:6: UserWarning: `distplot` is a deprecated function and will be removed in seaborn v0.14.0. Please adapt your code to use either `displot` (a figure-level function with similar flexibility) or `histplot` (an axes-level function for histograms). For a guide to updating your code to use the new functions, please see https://gist.github.com/mwaskom/de44147ed2974457ad6372750bbe5751 sns.distplot(d[column]) C:\Users\nishm\anaconda3\Lib\site-packages\seaborn\ oldcore.py:1119: FutureWarning: use inf as na option is deprecated and will be removed in a future version. Convert inf values to NaN before operating instead. with pd.option context('mode.use inf as na', True): C:\Users\nishm\AppData\Local\Temp\ipykernel 18452\2303030590.py:6: UserWarning: `distplot` is a deprecated function and will be removed in seaborn v0.14.0. Please adapt your code to use either `displot` (a figure-level function with similar flexibility) or `histplot` (an axes-level function for

histograms).

For a guide to updating your code to use the new functions, please see https://gist.github.com/mwaskom/de44147ed2974457ad6372750bbe5751

sns.distplot(d[column])

C:\Users\nishm\anaconda3\Lib\site-packages\seaborn\\_oldcore.py:1119: FutureWarning: use\_inf\_as\_na option is deprecated and will be removed in a future version. Convert inf values to NaN before operating instead.

with pd.option\_context('mode.use\_inf\_as\_na', True):
C:\Users\nishm\AppData\Local\Temp\ipykernel\_18452\2303030590.py:6:
UserWarning:

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C:\Users\nishm\AppData\Local\Temp\ipykernel 18452\2303030590.py:6:

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with pd.option\_context('mode.use\_inf\_as\_na', True):
C:\Users\nishm\AppData\Local\Temp\ipykernel\_18452\2303030590.py:6:
UserWarning:

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sns.distplot(d[column])

C:\Users\nishm\anaconda3\Lib\site-packages\seaborn\\_oldcore.py:1119: FutureWarning: use\_inf\_as\_na option is deprecated and will be removed in a future version. Convert inf values to NaN before operating instead.

with pd.option\_context('mode.use\_inf\_as\_na', True):
C:\Users\nishm\AppData\Local\Temp\ipykernel\_18452\2303030590.py:6:
UserWarning:

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```
https://gist.github.com/mwaskom/de44147ed2974457ad6372750bbe5751
  sns.distplot(d[column])
C:\Users\nishm\anaconda3\Lib\site-packages\seaborn\ oldcore.py:1119:
FutureWarning: use inf as na option is deprecated and will be removed
in a future version. Convert inf values to NaN before operating
instead.
  with pd.option context('mode.use inf as na', True):
C:\Users\nishm\AppData\Local\Temp\ipykernel 18452\2303030590.py:6:
UserWarning:
`distplot` is a deprecated function and will be removed in seaborn
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  sns.distplot(d[column])
C:\Users\nishm\anaconda3\Lib\site-packages\seaborn\ oldcore.py:1119:
FutureWarning: use inf as na option is deprecated and will be removed
in a future version. Convert inf values to NaN before operating
instead.
  with pd.option_context('mode.use_inf_as_na', True):
C:\Users\nishm\AppData\Local\Temp\ipykernel 18452\2303030590.py:6:
UserWarning:
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C:\Users\nishm\anaconda3\Lib\site-packages\seaborn\ oldcore.py:1119:
FutureWarning: use inf as na option is deprecated and will be removed
in a future version. Convert inf values to NaN before operating
instead.
  with pd.option context('mode.use inf as na', True):
C:\Users\nishm\AppData\Local\Temp\ipykernel 18452\2303030590.py:6:
UserWarning:
```

`distplot` is a deprecated function and will be removed in seaborn v0.14.0.

Please adapt your code to use either `displot` (a figure-level function with similar flexibility) or `histplot` (an axes-level function for histograms).

For a guide to updating your code to use the new functions, please see https://gist.github.com/mwaskom/de44147ed2974457ad6372750bbe5751

sns.distplot(d[column])

C:\Users\nishm\anaconda3\Lib\site-packages\seaborn\\_oldcore.py:1119: FutureWarning: use\_inf\_as\_na option is deprecated and will be removed in a future version. Convert inf values to NaN before operating instead.

with pd.option\_context('mode.use\_inf\_as\_na', True):
C:\Users\nishm\AppData\Local\Temp\ipykernel\_18452\2303030590.py:6:
UserWarning:

`distplot` is a deprecated function and will be removed in seaborn v0.14.0.

Please adapt your code to use either `displot` (a figure-level function with similar flexibility) or `histplot` (an axes-level function for histograms).

For a guide to updating your code to use the new functions, please see https://gist.github.com/mwaskom/de44147ed2974457ad6372750bbe5751

sns.distplot(d[column])

C:\Users\nishm\anaconda3\Lib\site-packages\seaborn\\_oldcore.py:1119: FutureWarning: use\_inf\_as\_na option is deprecated and will be removed in a future version. Convert inf values to NaN before operating instead.

with pd.option\_context('mode.use\_inf\_as\_na', True):
C:\Users\nishm\AppData\Local\Temp\ipykernel\_18452\2303030590.py:6:
UserWarning:

`distplot` is a deprecated function and will be removed in seaborn v0.14.0.

Please adapt your code to use either `displot` (a figure-level function with similar flexibility) or `histplot` (an axes-level function for histograms).

For a guide to updating your code to use the new functions, please see

https://gist.github.com/mwaskom/de44147ed2974457ad6372750bbe5751

sns.distplot(d[column])

C:\Users\nishm\anaconda3\Lib\site-packages\seaborn\\_oldcore.py:1119: FutureWarning: use\_inf\_as\_na option is deprecated and will be removed in a future version. Convert inf values to NaN before operating instead.

with pd.option\_context('mode.use\_inf\_as\_na', True):
C:\Users\nishm\AppData\Local\Temp\ipykernel\_18452\2303030590.py:6:
UserWarning:

`distplot` is a deprecated function and will be removed in seaborn v0.14.0.

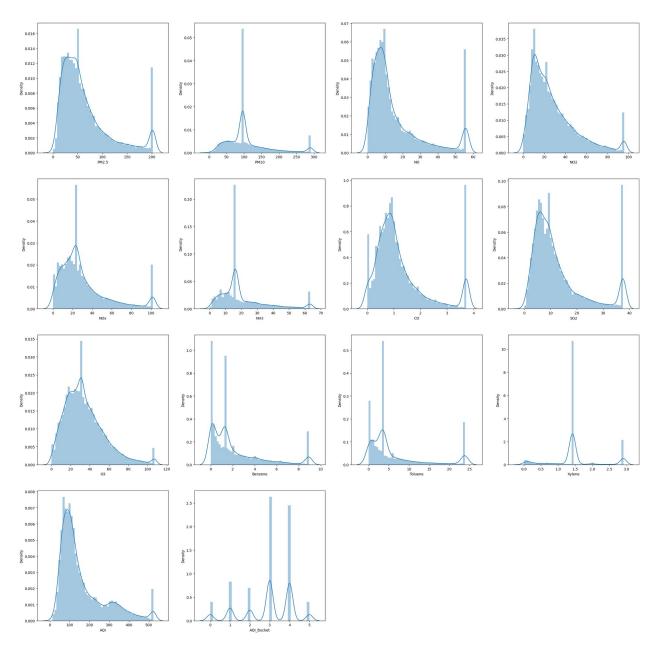
Please adapt your code to use either `displot` (a figure-level function with similar flexibility) or `histplot` (an axes-level function for histograms).

For a guide to updating your code to use the new functions, please see https://gist.github.com/mwaskom/de44147ed2974457ad6372750bbe5751

sns.distplot(d[column])

C:\Users\nishm\anaconda3\Lib\site-packages\seaborn\\_oldcore.py:1119: FutureWarning: use\_inf\_as\_na option is deprecated and will be removed in a future version. Convert inf values to NaN before operating instead.

with pd.option\_context('mode.use\_inf\_as\_na', True):



# SPLITTING DATA INTO TRAINING AND TESTING

```
x=d.drop(['AQI_Bucket'],axis=1)
y=d.iloc[:,13:14]

x_train,x_test,y_train,y_test=train_test_split(x,y,test_size=0.2,rando
m_state=0)

x_train.shape,x_test.shape,y_train.shape,y_test.shape
((19880, 13), (4970, 13), (19880, 1), (4970, 1))
```

#### **STANDARDIZATION**

```
scaler=StandardScaler()
x train=scaler.fit transform(x train)
x test=scaler.transform(x test)
x train
array([[-0.06792547, -0.19929759, -0.76516325, ..., -0.87890629,
        -0.067509 , -0.26944518],
       [-0.70258116, -0.52358378, -0.66643195, ..., -0.71651702,
        -0.067509 , -0.65212381],
       [ 2.82038053, -0.19929759, -0.34740223, ..., -0.76735192,
        -0.067509 , 2.43539696],
       [ 0.87946503, 1.24368844,
                                  0.42095567, ..., -0.51741365,
       -1.94870504, 0.42633415],
       [ 0.227662 , 1.60280477, 0.073717 , ..., 2.48678786,
        -1.51350297, 0.34805897],
       [-0.30584481, -1.11235643, -0.19829781, \ldots, -0.66003379,
        2.01935511, -1.00871072]])
x test
array([[-0.584387 , -0.19929759,
                                  0.51229892, ..., -0.37408747,
        -0.067509 , -0.89564658],
       [-0.52539199, -0.14013405, 0.59356754, ..., -0.37408747,
        -0.067509 , -0.47817898],
       [-0.87323802, -0.91434942, -0.46426785, \ldots, -0.43833713,
        -0.067509 , -0.92173831],
       [ 2.82038053, -0.19929759, -0.38501415, ..., 0.61648709,
        2.01935511, 2.6093418 ],
       [ 1.83522506, -0.19929759, -0.62008869, ..., -0.50470492,
        -0.067509 , 2.16578247],
                                 1.71185067, ..., -0.87890629,
       [-0.71217551, -0.19929759,
        -0.067509 , -0.3999038111)
```

### **DECISSION TREE CLASSIFIER**

```
dt=DecisionTreeClassifier()
df=dt.fit(x_train,y_train)
y_preddt=dt.predict(x_test)

train_accuracy=df.score(x_train,y_train)
test_accuracy=dt.score(x_test,y_test)
print("training Accuracy: {:.2f}".format(train_accuracy))
print("testing Accuracy: {:.2f}".format(test_accuracy))

training Accuracy: 1.00
testing Accuracy: 1.00
```

```
print("Accuracy:",accuracy_score(y_test,y_preddt))
print("confusion matrix:\n",confusion matrix(y test,y preddt))
print("classification report:\
n",classification report(y test,y preddt))
Accuracy: 1.0
confusion matrix:
                                 01
 [[ 258
           0
                 0
                           0
                      0
        539
     0
                0
                     0
                          0
                                01
     0
          0
             439
                                01
                     0
                          0
     0
          0
                0 1831
                          0
                                0]
     0
          0
                     0 1636
                                01
                0
     0
          0
                0
                     0
                          0
                             26711
classification report:
                precision
                              recall f1-score
                                                  support
           0
                    1.00
                               1.00
                                         1.00
                                                     258
           1
                    1.00
                               1.00
                                         1.00
                                                     539
           2
                                         1.00
                    1.00
                               1.00
                                                     439
           3
                    1.00
                               1.00
                                         1.00
                                                    1831
           4
                    1.00
                               1.00
                                         1.00
                                                    1636
           5
                    1.00
                               1.00
                                         1.00
                                                     267
    accuracy
                                         1.00
                                                    4970
   macro avg
                    1.00
                               1.00
                                         1.00
                                                    4970
                    1.00
                               1.00
                                         1.00
                                                    4970
weighted avg
```

#### LOGISTIC REGRESSION

```
from sklearn.linear model import LogisticRegression
lr=LogisticRegression()
lr.fit(x train,y train)
C:\Users\nishm\anaconda3\Lib\site-packages\sklearn\utils\
validation.py:1143: DataConversionWarning: A column-vector y was
passed when a 1d array was expected. Please change the shape of y to
(n samples, ), for example using ravel().
 y = column or 1d(y, warn=True)
C:\Users\nishm\anaconda3\Lib\site-packages\sklearn\linear model\
logistic.py:458: ConvergenceWarning: lbfgs failed to converge
(status=1):
STOP: TOTAL NO. of ITERATIONS REACHED LIMIT.
Increase the number of iterations (max iter) or scale the data as
shown in:
    https://scikit-learn.org/stable/modules/preprocessing.html
Please also refer to the documentation for alternative solver options:
https://scikit-learn.org/stable/modules/linear model.html#logistic-
```

```
regression
  n iter i = check optimize result(
LogisticRegression()
y predlr=lr.predict(x test)
y_predlr
array([4, 3, 4, ..., 0, 0, 3], dtype=int64)
print("confusion matrix:\n",confusion matrix(y test,y predlr))
print("classification report:\
n",classification report(y test,y predlr))
print("Accuracy:",accuracy score(y test,y predlr))
print("Precision:",precision_score(y_test,y_predlr,average=None))
print("Recall:", recall_score(y_test, y_predlr, average=None))
print("F1 score:",f1 score(y test,y predlr,average=None))
confusion matrix:
 [[ 251
           0
                     0
                                0]
                7
                           0
     0
       515
               9
                   15
                          0
                               01
     2
          5
            432
                               0]
                    0
                         0
     0
          6
               0 1785
                         40
                               01
     0
          0
                   52 1574
                              101
               0
                         66 201]]
          0
                    0
     0
               0
classification report:
               precision
                             recall f1-score
                                                support
                              0.97
           0
                   0.99
                                        0.98
                                                    258
           1
                   0.98
                              0.96
                                        0.97
                                                    539
           2
                   0.96
                              0.98
                                        0.97
                                                    439
           3
                   0.96
                              0.97
                                        0.97
                                                   1831
           4
                   0.94
                              0.96
                                        0.95
                                                   1636
           5
                   0.95
                              0.75
                                        0.84
                                                    267
                                        0.96
                                                   4970
    accuracy
                                        0.95
                                                   4970
   macro avg
                   0.96
                              0.93
weighted avg
                   0.96
                              0.96
                                        0.96
                                                   4970
Accuracy: 0.9573440643863179
Precision: [0.99209486 0.97908745 0.96428571 0.96382289 0.93690476
0.952606641
Recall: [0.97286822 0.9554731 0.98405467 0.97487712 0.96210269
0.75280899]
F1 score: [0.98238748 0.96713615 0.9740699 0.96931849 0.94933655
0.841004181
```

### KNN CLASSIFIER

from sklearn.neighbors import KNeighborsClassifier

```
knn=KNeighborsClassifier()
knn.fit(x train,y train)
C:\Users\nishm\anaconda3\Lib\site-packages\sklearn\neighbors\
_classification.py:215: DataConversionWarning: A column-vector y was
passed when a 1d array was expected. Please change the shape of y to
(n samples,), for example using ravel().
  return self. fit(X, y)
KNeighborsClassifier()
y predknn=lr.predict(x test)
y predknn
array([4, 3, 4, ..., 0, 0, 3], dtype=int64)
print("confusion matrix:\n",confusion_matrix(y_test,y_predknn))
print("classification report:\
n",classification report(y test,y predknn))
confusion matrix:
 [[ 251
                               01
           0
               7
                     0
               9
        515
                   15
                         0
                               0]
     0
     2
          5
            432
                    0
                         0
                               0]
               0 1785
          6
                        40
                               0]
     0
          0
               0
                   52 1574
                             10]
     0
          0
               0
                    0
                        66
                            20111
classification report:
               precision
                            recall f1-score
                                                support
                   0.99
                             0.97
                                        0.98
           0
                                                   258
           1
                   0.98
                             0.96
                                        0.97
                                                   539
           2
                   0.96
                             0.98
                                        0.97
                                                   439
           3
                   0.96
                             0.97
                                        0.97
                                                  1831
           4
                   0.94
                             0.96
                                        0.95
                                                  1636
           5
                   0.95
                             0.75
                                        0.84
                                                   267
                                        0.96
                                                  4970
    accuracy
                   0.96
                             0.93
                                        0.95
                                                  4970
   macro avg
weighted avg
                   0.96
                             0.96
                                        0.96
                                                  4970
print("Accuracy:",accuracy score(y test,y predknn))
print("Precision:",precision score(y test,y predknn,average=None))
print("Recall:", recall score(y test, y predknn, average=None))
print("F1 score:",f1 score(y test,y predknn,average=None))
Accuracy: 0.9573440643863179
Precision: [0.99209486 0.97908745 0.96428571 0.96382289 0.93690476
0.952606641
Recall: [0.97286822 0.9554731 0.98405467 0.97487712 0.96210269
```

```
0.75280899]
F1 score: [0.98238748 0.96713615 0.9740699 0.96931849 0.94933655
0.84100418]
```

#### NAIVE BAYES CLASSIFIER

```
from sklearn.naive bayes import GaussianNB
nb=GaussianNB()
nb.fit(x train,y train)
C:\Users\nishm\anaconda3\Lib\site-packages\sklearn\utils\
validation.py:1143: DataConversionWarning: A column-vector y was
passed when a 1d array was expected. Please change the shape of y to
(n samples, ), for example using ravel().
  y = column or 1d(y, warn=True)
GaussianNB()
y prednb=lr.predict(x test)
y prednb
array([4, 3, 4, ..., 0, 0, 3], dtype=int64)
print("confusion matrix:\n",confusion matrix(y test,y prednb))
print("classification report:\
n",classification report(y test,y prednb))
confusion matrix:
 [[ 251
                                01
         0
                     0
       515
               9
                   15
                          0
                               01
     0
     2
            432
                               01
                    0
                         0
     0
          6
               0 1785
                        40
                               0]
     0
          0
               0
                   52 1574
                             10]
     0
          0
                    0
                        66
                            201]]
               0
classification report:
                             recall f1-score
               precision
                                                support
                   0.99
                             0.97
                                        0.98
                                                   258
           1
                             0.96
                   0.98
                                        0.97
                                                   539
           2
                   0.96
                             0.98
                                        0.97
                                                   439
           3
                   0.96
                             0.97
                                        0.97
                                                  1831
           4
                             0.96
                                        0.95
                   0.94
                                                  1636
           5
                   0.95
                             0.75
                                        0.84
                                                   267
                                                  4970
                                        0.96
    accuracy
                   0.96
                             0.93
                                        0.95
                                                  4970
   macro avg
weighted avg
                   0.96
                             0.96
                                        0.96
                                                  4970
```

```
print("Accuracy:",accuracy_score(y_test,y_prednb))
print("Precision:",precision_score(y_test,y_prednb,average=None))
print("Recall:",recall_score(y_test,y_prednb,average=None))
print("F1 score:",f1_score(y_test,y_prednb,average=None))

Accuracy: 0.9573440643863179
Precision: [0.99209486 0.97908745 0.96428571 0.96382289 0.93690476 0.95260664]
Recall: [0.97286822 0.9554731 0.98405467 0.97487712 0.96210269 0.75280899]
F1 score: [0.98238748 0.96713615 0.9740699 0.96931849 0.94933655 0.84100418]
```

## ENSEMBLING LEARNING

#### RANDOM FOREST CLASSIFIER

```
from sklearn.ensemble import RandomForestClassifier
rf=RandomForestClassifier(n estimators=100, max depth=None, min samples
split=5,min_samples_leaf=4)
y predrf=lr.predict(x test)
y predrf
array([4, 3, 4, ..., 0, 0, 3], dtype=int64)
print("confusion matrix:\n",confusion_matrix(y_test,y_predrf))
print("classification report:\
n",classification report(y test,y predrf))
confusion matrix:
                   0
 [[ 251
        0
                          0
                               01
     0 515
               9
                   15
                         0
                               01
     2
          5 432
                    0
                         0
                               01
               0 1785
                        40
                               01
                   52 1574
     0
          0
               0
                             10]
                    0
                        66 20111
          0
classification report:
               precision recall f1-score
                                                support
           0
                   0.99
                             0.97
                                        0.98
                                                   258
           1
                   0.98
                             0.96
                                        0.97
                                                   539
           2
                   0.96
                             0.98
                                        0.97
                                                   439
           3
                   0.96
                             0.97
                                        0.97
                                                  1831
           4
                   0.94
                             0.96
                                        0.95
                                                  1636
                   0.95
           5
                             0.75
                                        0.84
                                                   267
                                        0.96
                                                  4970
    accuracy
```

```
0.96
                             0.93
                                       0.95
                                                 4970
   macro avq
                   0.96
                             0.96
                                       0.96
weighted avg
                                                 4970
print("Accuracy:",accuracy_score(y_test,y_predrf))
print("Precision:",precision score(y test,y predrf,average=None))
print("Recall:", recall_score(y_test, y_predrf, average=None))
print("F1 score:",f1 score(y test,y predrf,average=None))
Accuracy: 0.9573440643863179
Precision: [0.99209486 0.97908745 0.96428571 0.96382289 0.93690476
0.952606641
Recall: [0.97286822 0.9554731 0.98405467 0.97487712 0.96210269
0.752808991
F1 score: [0.98238748 0.96713615 0.9740699 0.96931849 0.94933655
0.841004181
```

#### **ADA BOOSTING**

```
from sklearn.ensemble import AdaBoostClassifier
abc=AdaBoostClassifier(n estimators=100, random state=2)
abc.fit(x train,y train)
C:\Users\nishm\anaconda3\Lib\site-packages\sklearn\utils\
validation.py:1143: DataConversionWarning: A column-vector y was
passed when a 1d array was expected. Please change the shape of y to
(n_samples, ), for example using ravel().
 y = column or 1d(y, warn=True)
AdaBoostClassifier(n estimators=100, random state=2)
y_predabc=lr.predict(x test)
y_predabc
array([4, 3, 4, ..., 0, 0, 3], dtype=int64)
print("confusion matrix:\n",confusion matrix(y test,y predabc))
print("classification report:\
n",classification report(y test,y predabc))
confusion matrix:
 [[ 251
          0
                          0
                               0]
               7
                     0
       515
               9
                   15
                         0
                              01
     0
     2
          5 432
                              0]
                    0
                         0
     0
          6
               0 1785
                       40
                              01
     0
          0
               0
                   52 1574
                             101
     0
          0
                        66 20111
               0
                    0
classification report:
               precision recall f1-score support
```

```
0.99
                              0.97
                                        0.98
                                                   258
           0
                   0.98
                              0.96
                                        0.97
                                                   539
           1
           2
                   0.96
                              0.98
                                        0.97
                                                   439
           3
                                                  1831
                   0.96
                              0.97
                                        0.97
           4
                   0.94
                              0.96
                                        0.95
                                                  1636
           5
                   0.95
                              0.75
                                        0.84
                                                   267
                                                  4970
    accuracy
                                        0.96
                                                  4970
                   0.96
                              0.93
                                        0.95
   macro avg
                   0.96
                              0.96
                                        0.96
                                                  4970
weighted avg
print("Accuracy:",accuracy_score(y_test,y_predabc))
print("Precision:",precision score(y test,y predabc,average=None))
print("Recall:", recall_score(y_test,y_predabc,average=None))
print("F1 score:",f1 score(y test,y predabc,average=None))
Accuracy: 0.9573440643863179
Precision: [0.99209486 0.97908745 0.96428571 0.96382289 0.93690476
0.952606641
Recall: [0.97286822 0.9554731 0.98405467 0.97487712 0.96210269
0.752808991
F1 score: [0.98238748 0.96713615 0.9740699 0.96931849 0.94933655
0.841004181
```

#### **GRADIENT BOOSTING**

```
from sklearn.ensemble import GradientBoostingClassifier
gbc=GradientBoostingClassifier(n estimators=100,learning rate=1.0,max
depth=1, random state=1)
gbc.fit(x_train,y_train)
C:\Users\nishm\anaconda3\Lib\site-packages\sklearn\ensemble\
gb.py:437: DataConversionWarning: A column-vector y was passed when a
1d array was expected. Please change the shape of y to (n samples, ),
for example using ravel().
 y = column or 1d(y, warn=True)
GradientBoostingClassifier(learning rate=1.0, max depth=1,
random state=1)
y predgbc=lr.predict(x test)
y predgbc
array([4, 3, 4, ..., 0, 0, 3], dtype=int64)
print("confusion matrix:\n",confusion matrix(y test,y predgbc))
print("classification report:\
n",classification report(y test,y predgbc))
```

```
confusion matrix:
 [[ 251
                  0
                       0
                             01
          0
               7
       515
     0
              9
                   15
                         0
                              0]
     2
          5
            432
                   0
                         0
                              01
          6
     0
               0 1785
                        40
                              0]
     0
          0
               0
                   52 1574
                             101
                    0
     0
          0
               0
                        66 201]]
classification report:
               precision
                            recall f1-score support
           0
                   0.99
                             0.97
                                       0.98
                                                  258
           1
                   0.98
                             0.96
                                       0.97
                                                  539
           2
                   0.96
                             0.98
                                       0.97
                                                  439
           3
                   0.96
                             0.97
                                       0.97
                                                 1831
                             0.96
           4
                   0.94
                                       0.95
                                                 1636
           5
                   0.95
                             0.75
                                       0.84
                                                  267
                                       0.96
                                                 4970
   accuracy
                   0.96
                             0.93
                                       0.95
                                                 4970
   macro avg
weighted avg
                   0.96
                             0.96
                                       0.96
                                                 4970
print("Accuracy:",accuracy_score(y_test,y_predgbc))
print("Precision:",precision score(y test,y predgbc,average=None))
print("Recall:", recall score(y test,y predgbc, average=None))
print("F1 score:",f1 score(y test,y predgbc,average=None))
Accuracy: 0.9573440643863179
Precision: [0.99209486 0.97908745 0.96428571 0.96382289 0.93690476
0.952606641
Recall: [0.97286822 0.9554731 0.98405467 0.97487712 0.96210269
0.752808991
F1 score: [0.98238748 0.96713615 0.9740699 0.96931849 0.94933655
0.841004181
```