# **Prediction With Naive Bayes Algorithm**

# Importing Libraries

```
import pandas as pd
from sklearn.model_selection import train_test_split
from sklearn.naive_bayes import GaussianNB
from sklearn.metrics import confusion_matrix
from sklearn.metrics import classification_report
```

### Importing Datasets

In [318...

print("Classification")

```
In [312... AAPL_df=pd.read_csv('Labeled_Data_modeling/AAPL_modeling_data.csv',index_col = 0)
AMZN_df=pd.read_csv('Labeled_Data_modeling/AMZN_modeling_data.csv',index_col = 0)
IBM_df=pd.read_csv('Labeled_Data_modeling/IBM_modeling_data.csv',index_col = 0)
MSFT_df=pd.read_csv('Labeled_Data_modeling/MSFT_modeling_data.csv',index_col = 0)
TSLA_df=pd.read_csv('Labeled_Data_modeling/TSLA_modeling_data.csv',index_col = 0)
```

# APPI F

```
In [313...
           AAPL_df.head()
             Date Close/Last
                                 Volume
                                          Open
                                                   High
                                                            Low SameDay_Binary PreviousDay_Binary SameDay_Percentage PreviousDay_Percenta
             2021-
                      127.900
                              83466720.0
                                        125.83 127.920
                                                       125.1400
                                                                                                 0
             04-07
             2021-
                      130.360
                              88844590.0 128.95 130.390 128.5200
             04-08
             2021-
                      132.995
                             106686700.0 129.80 133.040 129.4700
                                                                                                 1
                                                                                                                    1
             04-09
             2021-
                      131.635
                              89321380.0 133.73 133.925 131.1425
                                                                                                 0
             2021-
                      131.635
                              89321380.0 133.73 133.925 131.1425
                                                                              0
                                                                                                 0
                                                                                                                    -1
             04-11
In [314...
           AAPL df.shape
Out[314... (172, 10)
In [315...
           AAPL df["day"] = AAPL df['Date'].map(lambda x: pd.to datetime(x).day)
           AAPL_df["month"] = AAPL_df['Date'].map(lambda x: pd.to_datetime(x).month)
           AAPL_df["year"] = AAPL_df['Date'].map(lambda x: pd.to_datetime(x).year)
In [316...
           AAPL df.head()
Out[316...
             Date Close/Last
                                 Volume
                                          Open
                                                  Hiah
                                                            Low SameDay_Binary PreviousDay_Binary SameDay_Percentage PreviousDay_Percenta
             2021-
          0
                      127 900
                              83466720 0 125 83 127 920 125 1400
                                                                                                 n
             04-07
             2021-
                      130.360
                              88844590.0 128.95 130.390 128.5200
             2021-
                      132.995
                             106686700.0 129.80 133.040 129.4700
                                                                                                                    1
             04-09
             2021-
                      131.635
                              89321380.0 133.73 133.925 131.1425
             04-10
             2021-
                      131.635
                              89321380.0 133.73 133.925 131.1425
                                                                              0
                                                                                                 0
                                                                                                                    -1
In [317...
           AAPL X classification=AAPL df[['day','Open']]
           AAPL_X_regression=AAPL_df.drop(["Open","Close/Last","SameDay_Binary","PreviousDay_Binary","SameDay_Percentage","F
           AAPL_Y_Binary_sameDay = AAPL_df["SameDay_Binary"]
           AAPL_Y_Binary_previousDay = AAPL_df["PreviousDay_Binary"]
           AAPL_Y_Percentage_sameDay = AAPL_df["SameDay_Percentage"]
           AAPL Y Percentage previousDay = AAPL df["PreviousDay Percentage"]
```

```
print(AAPL X classification.head(1))
          print()
          print("Regression")
          print(AAPL X regression.head(1))
          print()
          print("Binary Same day")
          print(AAPL Y Binary sameDay.head(1))
          print()
          print("Binary Previous Day")
          print(AAPL_Y_Binary_previousDay.head(1))
          print()
          print("Percentage Same Day")
          print(AAPL_Y_Percentage_sameDay.head(1))
          print()
          print("Percentage Previous Day")
          print(AAPL_Y_Percentage_previousDay.head(1))
         Classification
            day
                 0pen
            7 125.83
         Regression
                Volume
                        High
                                 Low day month
         0 83466720.0 127.92 125.14
         Binary Same day
         0 1
         Name: SameDay_Binary, dtype: int64
         Binary Previous Day
         0 0
         Name: PreviousDay_Binary, dtype: int64
         Percentage Same Day
         Name: SameDay Percentage, dtype: int64
         Percentage Previous Day
         Name: PreviousDay Percentage, dtype: int64
In [319... AAPL_df.isna().sum()
                                   0
Out[319... Date
         Close/Last
                                   0
                                   0
         Volume
         0pen
                                   0
         High
         Low
                                   0
         SameDay Binary
                                   0
         PreviousDay_Binary
                                   0
         SameDay Percentage
                                   0
         PreviousDay Percentage
                                   0
         day
         month
                                   0
                                   0
         year
         dtype: int64
In [320... AAPL_df.isnull().sum()
Out[320... Date
                                   0
         Close/Last
                                   0
         Volume
                                   0
         0pen
                                   0
         High
                                   0
         Low
                                   0
         SameDay_Binary
                                   0
         PreviousDay Binary
                                   0
         SameDay_Percentage
                                   0
         PreviousDay Percentage
                                   0
         day
                                   0
         month
                                   0
                                   0
         year
         dtype: int64
```

In [322] AAPL X classification previousDay train, AAPL X classification previousDay test, AAPL Y Binary previousDay train,

In [321... AAPL X classification sameDay train, AAPL X classification sameDay test, AAPL Y Binary sameDay train, AAPL Y Binary

```
AAPL X regression sameday train, AAPL X regression sameday test, AAPL Y Percentage sameDay train, AAPL Y Percentage
In [323...
                    AAPL X regression previousday train, AAPL X regression previousday test, AAPL Y Percentage previousDay train, AAF
In [324...
                  Naive Bayes on Apple Dataset
                  Prediction On Same Day Approach
In [302...
                    AAPL_sameDay_model = GaussianNB()
                     AAPL_sameDay_model.fit(AAPL_X_classification_sameDay_train,AAPL_Y_Binary_sameDay_train)
                    AAPL sameDay pred = Aapl sameDay model.predict(AAPL X classification sameDay test)
                  Accuracy for same day approach
In [303...
                    print("Accuray Score: ",AAPL sameDay model.score(AAPL X classification sameDay test,AAPL Y Binary sameDay test))
                   Accuray Score: 0.6571428571428571
                  Confusion Matrix For Same Day
In [304...
                    print("Confusion Matrix: \n",confusion_matrix(AAPL_Y_Binary_sameDay_test, AAPL_smaeDay_pred))
                    print("\n")
                    # Classification Report
                    matrix = classification report(AAPL Y Binary sameDay test, AAPL sameDay pred)
                    print("Classification Report For Same day: \n", matrix)
                   Confusion Matrix:
                     [[21 2]
                     [10 2]]
                   Classification Report For Same day:
                                                  precision
                                                                            recall f1-score
                                                                                                                   support
                                         0
                                                          0.68
                                                                              0.91
                                                                                                  0.78
                                                                                                                           23
                                                          0.50
                                                                              0.17
                                                                                                  0.25
                                                                                                                           12
                                                                                                   0.66
                                                                                                                           35
                          accuracy
                                                         0.59
                                                                              0.54
                                                                                                                           35
                         macro avg
                                                                                                  0.51
                   weighted avg
                                                         0.62
                                                                              0.66
                                                                                                  0.60
In [305...
                     #Extracting TN, FP, FN, TN
                    AAPL_sameDay_TN,AAPL_sameDay_FP,AAPL_sameDay_FN,AAPL_sameDay_TP = confusion_matrix(AAPL_Y_Binary_sameDay_test, AAPL_sameDay_TP = confusion_matrix(AAPL_Y_Binary_sameDay_test, AAPL_sameDay_TP = confusion_matrix(AAPL_Y_Binary_sameDay_test, AAPL_sameDay_TP = confusion_matrix(AAPL_Y_Binary_sameDay_test, AAPL_sameDay_test, AAPL_sameDay_test
                     (AAPL_sameDay_TN, AAPL_sameDay_FP, AAPL_sameDay_FN, AAPL_sameDay_TP)
Out[305... (21, 2, 10, 2)
                  Accuracy For Same Day with Confusion Matrix
                  (AAPL_sameDay_TP + AAPL_sameDay_TN)/len(AAPL_X_classification_sameDay_test)
In [306...
Out[306... 0.6571428571428571
                  Prediction on Previous Day Approach
In [307...
                    AAPL_previousDay_model = GaussianNB()
                     AAPL\_previousDay\_model.fit(AAPL\_X\_classification\_previousDay\_train,AAPL\_Y\_Binary\_previousDay\_train)
                    AAPL_previousDay_pred = Aapl_previousDay_model.predict(AAPL_X_classification_previousDay_test)
```

print("The accuracy is: ",AAPL\_previousDay\_model.score(AAPL\_X\_classification\_previousDay\_test,AAPL\_Y\_Binary\_previ

Accuracy

The accuracy is: 0.6857142857142857

```
In [309...
         print("Confusion Matrix: \n",confusion matrix(AAPL Y Binary previousDay test, AAPL previousDay pred))
         print("\n")
         # Classification Report
         matrix = classification report(AAPL Y Binary previousDay test, AAPL previousDay pred)
         print("Classification Report For Previous day: \n", matrix)
          [[18 4]
          [76]]
         Classification Report For Previous day:
                        precision
                                   recall f1-score
                                                       support
                    0
                            0.72
                                     0.82
                                               0.77
                                                            22
                    1
                           0.60
                                     0.46
                                                            13
                                               0.52
                                               0.69
                                                           35
            accuracy
            macro avg
                           0.66
                                    0.64
                                               0.64
                                                           35
                           0.68
                                     0.69
                                               0.68
                                                            35
         weighted avg
```

## Conclusion

Accuracy on the previous Day approach is higher

# **AMAZON**

```
AMZN \ df["day"] = AMZN \ df['Date'].map(lambda \ x: pd.to_datetime(x).day)
In [270...
                             AMZN_df["month"] = AMZN_df['Date'].map(lambda x: pd.to_datetime(x).month)
                            AMZN_df["year"] = AMZN_df['Date'].map(lambda x: pd.to_datetime(x).year)
In [271...
                            AMZN X classification=AMZN df[['day','Open']]
                            AMZN X regression=AMZN df.drop(["Open","Close/Last","SameDay Binary","PreviousDay Binary","SameDay Percentage","F
                            AMZN_Y_Binary_sameDay = AMZN_df["SameDay_Binary"]
                            AMZN_Y_Binary_previousDay = AMZN_df["PreviousDay_Binary"]
                            AMZN Y Percentage sameDay = AMZN df["SameDay Percentage"]
                            AMZN_Y_Percentage_previousDay = AMZN_df["PreviousDay_Percentage"]
In [276... AMZN df.isna().sum()
                                                                                                     0
Out[276... Date
                                                                                                    0
                          Close/Last
                           Volume
                                                                                                    0
                          0pen
                                                                                                    0
                          High
                                                                                                    0
                          Low
                           SameDay Binary
                                                                                                    0
                          PreviousDay_Binary
                                                                                                    0
                           SameDay Percentage
                          PreviousDay_Percentage
                                                                                                    0
                           day
                                                                                                    0
                          month
                                                                                                    0
                           year
                                                                                                     0
                           dtype: int64
In [277...
                            AMZN X classification sameDay train, AMZN X classification sameDay test, AMZN Y Binary sameDay train, AMZN Y Binary sameDay sameD
In [278...
                            AMZN X classification previousDay train, AMZN X classification previousDay test, AMZN Y Binary previousDay train,
```

AMZN X regression sameday train, AMZN X regression sameday test, AMZN Y Percentage sameDay train, AMZN Y Percentage

AMZN X regression previousday train, AMZN X regression previousday test, AMZN Y Percentage previousDay train, AMZ

#### Naive Bayes on Amazon Dataset

In [279...

In [280...

```
In [281_ AMZN_sameDay_model = GaussianNB()
   AMZN_sameDay_model.fit(AMZN_X_classification_sameDay_train,AMZN_Y_Binary_sameDay_train)
   AMZN_sameDay_pred = AMZN_sameDay_model.predict(AMZN_X_classification_sameDay_test)
```

#### Accuracy for same day approach

```
In [282_ print("Accuray Score: ",AMZN_sameDay_model.score(AMZN_X_classification_sameDay_test,AMZN_Y_Binary_sameDay_test))

Accuray Score: 0.6730769230769231
```

#### Confusion Matrix For Same Day

```
0
                    0.69
                              0.97
                                         0.80
                                                     36
           1
                   0.00
                              0.00
                                        0.00
                                                     16
                                        0.67
                                                     52
    accuracy
   macro avg
                   0.34
                              0.49
                                        0.40
                                                     52
                   0.48
                                        0.56
                                                     52
weighted avg
                              0.67
```

```
In [327... #Extracting TN,FP,FN,TN
AMZN_sameDay_TN,AMZN_sameDay_FP,AMZN_sameDay_FN,AMZN_sameDay_TP = confusion_matrix(AMZN_Y_Binary_sameDay_test, AN(AMZN_sameDay_TN,AMZN_sameDay_FP,AMZN_sameDay_FN,AMZN_sameDay_TP)
Out[327... (35, 1, 16, 0)
```

# Prediction on Previous Day Approach

```
In [328... AMZN_previousDay_model = GaussianNB()
   AMZN_previousDay_model.fit(AMZN_X_classification_previousDay_train,AMZN_Y_Binary_previousDay_train)
   AMZN_previousDay_pred = AMZN_previousDay_model.predict(AMZN_X_classification_previousDay_test)
```

#### Accuracy

```
In [329... print("The accuracy is: ",AMZN_previousDay_model.score(AMZN_X_classification_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previousDay_test,AMZN_Y_Binary_previ
```

#### Confusion Matrix For Previous Day

```
In [331... print("Confusion Matrix: \n",confusion_matrix(AMZN_Y_Binary_previousDay_test, AMZN_previousDay_pred))
    print("\n")
    # Classification Report
    matrix = classification_report(AMZN_Y_Binary_previousDay_test, AMZN_previousDay_pred)
    print("Classification Report For Previous day: \n",matrix)
Confusion Matrix:
    [[20 10]
    [20 2]]
```

```
Classification Report For Previous day:

precision recall f1-score support
```

0	0.50	0.67	0.57	30
1	0.17	0.09	0.12	22
accuracy			0.42	52
macro avg	0.33	0.38	0.34	52
weighted avg	0.36	0.42	0.38	52

#### Conclusion

Accuracy on the Same Day approach is higher

# **IBM**

```
In [404...
                        IBM_df.head()
Out[404...
                              Date Close/Last
                                                                     Volume
                                                                                            Open
                                                                                                                 High
                                                                                                                                             SameDay_Binary PreviousDay_Binary SameDay_Percentage PreviousDay_Percenta
                            2021-
                       0
                                                  134.93 2976136.0 133.8400 134.9400 133.780
                                                                                                                                                                                                                    0
                                                                                                                                                                                                                                                               1
                            04-07
                            2021-
                                                  135.12 4087228.0 134.5700 135.6299 134.160
                            04-08
                            2021-
                                                  135.73 3023916.0 134.8700 135.7400 134.710
                                                                                                                                                                                                                    1
                                                                                                                                                                                                                                                               1
                            04-09
                            2021-
                                                  133.61 4811004.0 133.1625 134.0750 132.185
                                                                                                                                                                                                                    0
                                                                                                                                                                                                                                                              0
                            04-10
                            2021-
                       4
                                                  133.61 4811004.0 133.1625 134.0750 132.185
                                                                                                                                                                           1
                                                                                                                                                                                                                    0
                                                                                                                                                                                                                                                               0
                            04-11
                         IBM_df["day"] = IBM_df['Date'].map(lambda x: pd.to_datetime(x).day)
In [405...
                        IBM df["month"] = IBM df['Date'].map(lambda x: pd.to datetime(x).month)
                        IBM df["year"] = IBM df['Date'].map(lambda x: pd.to datetime(x).year)
                        IBM_X_classification=IBM_df[['day','Open']]
IBM_X_regression=IBM_df.drop(["Open","Close/Last","SameDay_Binary","PreviousDay_Binary","SameDay_Percentage","PreviousDay_Binary
In [406...
                         IBM_Y_Binary_sameDay = IBM_df["SameDay_Binary"]
                         IBM Y Binary previousDay = IBM df["PreviousDay Binary"]
                        IBM_Y_Percentage_sameDay = IBM_df["SameDay_Percentage"]
                        IBM_Y_Percentage_previousDay = IBM_df["PreviousDay_Percentage"]
In [407... IBM df.isnull().sum()
                                                                                      0
Out[407... Date
                       Close/Last
                                                                                      0
                       Volume
                                                                                      0
                       0pen
                                                                                      0
                                                                                      0
                      High
                                                                                       0
                       Low
                       SameDay_Binary
                                                                                      0
                       PreviousDay_Binary
                                                                                      0
                       SameDay_Percentage
                                                                                      0
                       PreviousDay_Percentage
                                                                                      0
                       day
                                                                                      0
                      month
                                                                                      0
                                                                                       0
                      vear
                       dtype: int64
In [408...
                        IBM X classification sameDay train, IBM X classification sameDay test, IBM Y Binary sameDay train, IBM Y Binary s
In [409...
                        IBM X classification previousDay train, IBM X classification previousDay test, IBM Y Binary previousDay train,IBM
In [410...
                        IBM_X_regression_sameday_train, IBM_X_regression_sameday_test, IBM_Y_Percentage_sameDay_train, IBM_Y_Percentage_s
In [411...
                         IBM\_X\_regression\_previous day\_train, \ IBM\_X\_regression\_previous day\_test, \ IBM\_Y\_Percentage\_previous Day\_train, \ IBM\_Y\_Percentage\_
```

#### Prediction On Same Day Approach

```
In [412... IBM_sameDay_model = GaussianNB()
    IBM_sameDay_model.fit(IBM_X_classification_sameDay_train,IBM_Y_Binary_sameDay_train)
    IBM_sameDay_pred = IBM_sameDay_model.predict(IBM_X_classification_sameDay_test)
```

#### Accuracy for same day approach

```
In [413_ print("Accuray Score: ",IBM_sameDay_model.score(IBM_X_classification_sameDay_test,IBM_Y_Binary_sameDay_test))

Accuray Score: 0.6346153846153846
```

#### Confusion Matrix For Same Day

```
In [414... print("Confusion Matrix: \n",confusion_matrix(IBM_Y_Binary_sameDay_test, IBM_sameDay_pred))
          print("\n")
          # Classification Report
          matrix = classification report(IBM Y Binary sameDay test, IBM sameDay pred)
          print("Classification Report For Same day: \n",matrix)
         Confusion Matrix:
          [[10 11]
          [ 8 2311
         Classification Report For Same day:
                                    recall f1-score
                        precision
                                                         support
                    0
                            0.56
                                      0.48
                                                 0.51
                                                             21
                    1
                            0.68
                                      0.74
                                                 0.71
                                                             31
             accuracy
                                                 0.63
                                                             52
                            0.62
                                      0.61
                                                 0.61
                                                             52
            macro avg
```

```
In [415... #Extracting TN,FP,FN,TN
IBM_sameDay_TN,IBM_sameDay_FP,IBM_sameDay_FN,IBM_sameDay_TP = confusion_matrix(IBM_Y_Binary_sameDay_test, IBM_sameDay_TN,IBM_sameDay_TN,IBM_sameDay_FN,IBM_sameDay_TP)
```

52

#### Accuracy For Same Day with Confusion Matrix

0.63

0.63

0.63

```
In [416... (IBM_sameDay_TP + IBM_sameDay_TN)/len(IBM_X_classification_sameDay_test)
Out[416... 0.6346153846153846
```

#### Prediction on Previous Day Approach

```
Im [417... IBM_previousDay_model = GaussianNB()
    IBM_previousDay_model.fit(IBM_X_classification_previousDay_train,IBM_Y_Binary_previousDay_train)
    IBM_previousDay_pred = IBM_previousDay_model.predict(IBM_X_classification_previousDay_test)
```

### Accuracy

weighted avg

Out[415... (10, 11, 8, 23)

```
In [418... print("The accuracy is: ",IBM_previousDay_model.score(IBM_X_classification_previousDay_test,IBM_Y_Binary_previous
The accuracy is: 0.6346153846153846
```

#### Confusion Matrix For Previous Day

```
In [419... print("Confusion Matrix: \n",confusion_matrix(IBM_Y_Binary_previousDay_test, IBM_previousDay_pred))
print("\n")
# Classification Report
```

```
matrix = classification_report(IBM_Y_Binary_previousDay_test, IBM_previousDay_pred)
print("Classification Report For Previous day: \n",matrix)
Confusion Matrix:
 [[19 13]
 [ 6 14]]
Classification Report For Previous day:
               precision
                          recall f1-score
                                              support
           0
                   0.76
                             0.59
                                       0.67
                                                    32
           1
                   0.52
                             0.70
                                       0.60
                                                   20
                                                   52
   accuracy
                                       0.63
                  0.64
                             0.65
                                       0.63
                                                   52
  macro avq
weighted avg
                  0.67
                             0.63
                                       0.64
                                                   52
```

#### Conclusion

MSFT\_df.head()

In [420...

Accuracy on the previous Day and same day approach is same

# **MICROSOFT**

```
Low SameDay_Binary PreviousDay_Binary SameDay_Percentage PreviousDay_Percentage
Out[420...
              Date Close/Last
                                  Volume
                                             Open
                                                      High
             2021-
           0 202.
                       249.90 22719840.0 247.8100 250.930 247.19
                                                                                 1
                                                                                                     0
                                                                                                                          1
             2021-
                        253.25 23625200.0 252.7700 254.139 252.00
                                                                                                                          0
             04-08
             2021-
                       255.85 24326830.0 252.8700 255.990 252.44
                                                                                 1
             04-09
             2021-
                       255.75 25109805.0 256.0925 258.250 254.89
                                                                                 0
                                                                                                     0
                                                                                                                          0
             04-10
             2021-
                                                                                 0
                                                                                                     0
                                                                                                                          0
                       255.75 25109805.0 256.0925 258.250 254.89
           MSFT_df["day"] = MSFT_df['Date'].map(lambda x: pd.to_datetime(x).day)
In [421...
           MSFT_df["month"] = MSFT_df['Date'].map(lambda x: pd.to_datetime(x).month)
           MSFT_df["year"] = MSFT_df['Date'].map(lambda x: pd.to_datetime(x).year)
           MSFT X classification=MSFT df[['day','Open']]
In [422...
           MSFT_X_regression=MSFT_df.drop(["Open","Close/Last","SameDay_Binary","PreviousDay_Binary","SameDay_Percentage","FMSFT_Y_Binary_sameDay = MSFT_df["SameDay_Binary"]
           MSFT Y Binary previousDay = MSFT df["PreviousDay Binary"]
           MSFT_Y_Percentage_sameDay = MSFT_df["SameDay_Percentage"]
MSFT_Y_Percentage_previousDay = MSFT_df["PreviousDay_Percentage"]
In [423...
           MSFT_df.isna().sum()
Out[423... Date
                                         0
           Close/Last
                                         0
           Volume
                                         0
           0pen
                                         0
           High
                                         0
           Low
                                         0
           SameDay_Binary
                                         0
           PreviousDay_Binary
                                         0
           SameDay Percentage
                                         0
           PreviousDay Percentage
                                         0
           day
                                         0
           month
                                         0
                                         0
           year
           dtype: int64
```

```
In [372... MSFT X classification previousDay train, MSFT X classification previousDay test, MSFT Y Binary previousDay train,
In [373...
                    MSFT X regression sameday train, MSFT X regression sameday test, MSFT Y Percentage sameDay train, MSFT Y Percentage
In [374...
                    MSFT X regression previousday train, MSFT X regression previousday test, MSFT Y Percentage previousDay train, MSF
                  Naive Bayes on Microsoft Dataset
                  Prediction On Same Day Approach
In [375...
                    MSFT sameDay model = GaussianNB()
                     MSFT\_sameDay\_model.fit(MSFT\_X\_classification\_sameDay\_train,MSFT\_Y\_Binary\_sameDay\_train)
                     MSFT sameDay pred = MSFT sameDay model.predict(MSFT X classification sameDay test)
                  Accuracy for same day approach
                    print("Accuray Score: ",MSFT_sameDay_model.score(MSFT_X_classification_sameDay_test,MSFT_Y_Binary_sameDay_test))
In [376...
                   Accuray Score: 0.5576923076923077
                  Confusion Matrix For Same Day
In [378...
                    \verb|print("Confusion Matrix: \n", confusion_matrix(MSFT_Y_Binary_sameDay_test, MSFT_sameDay_pred)||
                     print("\n")
                     # Classification Report
                     matrix = classification_report(MSFT_Y_Binary_sameDay_test, MSFT_sameDay_pred)
                     print("Classification Report For Same day: \n",matrix)
                    Confusion Matrix:
                     [[24 5]
                     [18 5]]
                   Classification Report For Same day:
                                                                             recall f1-score
                                                   precision
                                                                                                                     support
                                          0
                                                           0.57
                                                                                0.83
                                                                                                     0.68
                                                                                                                              29
                                          1
                                                           0.50
                                                                                0.22
                                                                                                     0.30
                                                                                                                              23
                           accuracy
                                                                                                     0.56
                                                                                                                              52
                                                          0.54
                                                                                0.52
                                                                                                     0.49
                                                                                                                              52
                         macro avg
                   weighted avg
                                                          0.54
                                                                                0.56
                                                                                                     0.51
                                                                                                                              52
In [380...
                     #Extracting TN, FP, FN, TN
                     {\tt MSFT\_sameDay\_TN,MSFT\_sameDay\_FP,MSFT\_sameDay\_FN,MSFT\_sameDay\_TP = confusion\_matrix(MSFT\_Y\_Binary\_sameDay\_test, MSFT\_sameDay\_TP = confusion\_matrix(MSFT\_Y\_Binary\_sameDay\_test, MSFT\_sameDay\_TP = confusion\_matrix(MSFT\_Y\_Binary\_sameDay\_test, MSFT\_sameDay\_test, MSFT\_sameDay\_test,
                     (MSFT sameDay TN, MSFT sameDay FP, MSFT sameDay FN, MSFT sameDay TP)
Out[380... (24, 5, 18, 5)
                  Accuracy For Same Day with Confusion Matrix
                  (MSFT_sameDay_TP + MSFT_sameDay_TN)/len(MSFT_X_classification_sameDay_test)
In [381...
Out[381... 0.5576923076923077
                  Prediction on Previous Day Approach
                     MSFT_previousDay_model = GaussianNB()
In [382...
                     MSFT\_previousDay\_model.fit(MSFT\_X\_classification\_previousDay\_train, MSFT\_Y\_Binary\_previousDay\_train)
                     {\tt MSFT\_previousDay\_pred = MSFT\_previousDay\_model.predict(MSFT\_X\_classification\_previousDay\_test)}
                  Accuracy
```

print("The accuracy is: ",MSFT\_previousDay\_model.score(MSFT\_X\_classification\_previousDay\_test,MSFT\_Y\_Binary\_previ

In [383...

The accuracy is: 0.5576923076923077

#### Confusion Matrix For Previous Day

```
In [384...
          print("Confusion Matrix: \n",confusion_matrix(MSFT_Y_Binary_previousDay_test, MSFT_previousDay_pred))
          print("\n")
          # Classification Report
          matrix = classification_report(MSFT_Y_Binary_previousDay_test, MSFT_previousDay_pred)
          print("Classification Report For Previous day: \n",matrix)
         Confusion Matrix:
          [[20 7]
          [16 9]]
         Classification Report For Previous day:
                        precision
                                     recall f1-score
                                                         support
                    0
                            0.56
                                       0.74
                                                 0.63
                                                             27
                    1
                            0.56
                                       0.36
                                                 0.44
                                                             25
             accuracy
                                                 0.56
                                                             52
                            0.56
                                       0.55
                                                 0.54
                                                             52
            macro avo
         weighted avg
                            0.56
                                       0.56
                                                 0.54
                                                             52
```

#### Conclusion

PreviousDay\_Binary SameDay\_Percentage

day

PreviousDay Percentage

0

0

0

Accuracy on the previous Day approach and Same day is same

# **TESLA**

```
TSLA df.head()
In [386...
              Date Close/Last
                                 Volume
                                          Open
                                                   High
                                                                 SameDay_Binary PreviousDay_Binary SameDay_Percentage PreviousDay_Percentaç
             2021-
           0
                      670.970 26309430.0 687.00 691.3800 667.840
                                                                               0
                                                                                                  0
                                                                                                                     -1
             04-07
             2021-
                      683.800 23924330.0 677.38 689.5499 671.645
                                                                               1
             04-08
             2021-
           2
                      677.020 21437090.0 677.77 680.9700 669.430
                                                                               0
                                                                                                  0
                                                                                                                      0
             04-09
             2021-
                      717.105 39076550.0 728.20 742.7950 705.060
                                                                               0
                                                                                                                     -1
             04-10
             2021-
                                                                               0
                                                                                                  0
           4
                      717.105 39076550.0 728.20 742.7950 705.060
                                                                                                                     -1
             04-11
           TSLA_df["day"] = TSLA_df['Date'].map(lambda x: pd.to_datetime(x).day)
In [388...
           TSLA_df["month"] = TSLA_df['Date'].map(lambda x: pd.to_datetime(x).month)
           TSLA_df["year"] = TSLA_df['Date'].map(lambda x: pd.to_datetime(x).year)
           TSLA_X_classification=TSLA_df[['day','Open']]
In [389...
           TSLA_X_regression=TSLA_df.drop(["Open","Close/Last","SameDay_Binary","PreviousDay_Binary","SameDay_Percentage","F
           TSLA Y Binary sameDay = TSLA df["SameDay Binary"]
           TSLA_Y_Binary_previousDay = TSLA_df["PreviousDay_Binary"]
TSLA_Y_Percentage_sameDay = TSLA_df["SameDay_Percentage"]
           TSLA Y Percentage previousDay = TSLA df["PreviousDay Percentage"]
           TSLA df.isna().sum()
In [390...
                                        0
Out[390... Date
                                        0
           Close/Last
          Volume
                                        0
           0pen
                                        0
          High
          Low
                                        0
          SameDay Binary
                                        0
```

month 9 year 0 dtype: int64

In [391... TSLA\_X\_classification\_sameDay\_train, TSLA\_X\_classification\_sameDay\_test, TSLA\_Y\_Binary\_sameDay\_train, TSLA\_Y\_Binary\_sameDay\_train, TSLA\_Y\_Binary\_previousDay\_train, TSLA\_X\_classification\_previousDay\_test, TSLA\_Y\_Binary\_previousDay\_train, In [393... TSLA\_X\_regression\_sameday\_train, TSLA\_X\_regression\_sameday\_test, TSLA\_Y\_Percentage\_sameDay\_train, TSLA\_Y\_Per

# Naive Bayes on Tesla Dataset

In [394...

#### Prediction On Same Day Approach

```
In [395...
TSLA_sameDay_model = GaussianNB()
TSLA_sameDay_model.fit(TSLA_X_classification_sameDay_train,TSLA_Y_Binary_sameDay_train)
TSLA_sameDay_pred = TSLA_sameDay_model.predict(TSLA_X_classification_sameDay_test)
```

TSLA\_X\_regression\_previousday\_train, TSLA\_X\_regression\_previousday\_test, TSLA\_Y\_Percentage\_previousDay\_train, TSL

#### Accuracy for same day approach

```
In [396... print("Accuray Score: ",TSLA_sameDay_model.score(TSLA_X_classification_sameDay_test,TSLA_Y_Binary_sameDay_test))

Accuray Score: 0.6538461538461539
```

#### Confusion Matrix For Same Day

```
In [398... print("Confusion Matrix: \n",confusion_matrix(TSLA_Y_Binary_sameDay_test, TSLA_sameDay_pred))
print("\n")
# Classification Report
matrix = classification_report(TSLA_Y_Binary_sameDay_test, TSLA_sameDay_pred)
print("Classification Report For Same day: \n",matrix)
```

Confusion Matrix: [[28 4] [14 6]]

Classification Report For Same day:

		precision	recall	f1-score	support
	0	0.67	0.88	0.76	32
	1	0.60	0.30	0.40	20
accurac	су			0.65	52
macro av	/g	0.63	0.59	0.58	52
weighted av	/g	0.64	0.65	0.62	52

```
In [399... #Extracting TN,FP,FN,TN
TSLA_sameDay_TN,TSLA_sameDay_FP,TSLA_sameDay_FN,TSLA_sameDay_TP = confusion_matrix(TSLA_Y_Binary_sameDay_test, TS(TSLA_sameDay_TN,TSLA_sameDay_FP,TSLA_sameDay_FN,TSLA_sameDay_TP)
```

Out[399... (28, 4, 14, 6)

#### Accuracy For Same Day with Confusion Matrix

```
In [490... (TSLA_sameDay_TP + TSLA_sameDay_TN)/len(TSLA_X_classification_sameDay_test)
Out[490... 0.6538461538461539
```

#### Prediction on Previous Day Approach

```
In [401... TSLA_previousDay_model = GaussianNB()
   TSLA_previousDay_model.fit(TSLA_X_classification_previousDay_train,TSLA_Y_Binary_previousDay_train)
```

TSLA previousDay pred = TSLA previousDay model.predict(TSLA X classification previousDay test)

#### Accuracy

In [402\_ print("The accuracy is: ",TSLA\_previousDay\_model.score(TSLA\_X\_classification\_previousDay\_test,TSLA\_Y\_Binary\_previou

# Confusion Matrix For Previous Day

```
In [403__ print("Confusion Matrix: \n",confusion_matrix(TSLA_Y_Binary_previousDay_test, TSLA_previousDay_pred))
print("\n")
# Classification Report
matrix = classification_report(TSLA_Y_Binary_previousDay_test, TSLA_previousDay_pred)
print("Classification Report For Previous day: \n",matrix)
**Confusion Matrix**

**Co
```

Confusion Matrix: [[26 0] [26 0]]

Classification Report For Previous day:

	precision	recall	f1-score	support
e	0.50	1.00	0.67	26
1	0.00	0.00	0.00	26
accuracy	,		0.50	52
macro avg weighted avg		0.50 0.50	0.33 0.33	52 52

C:\Users\husey\anaconda3\lib\site-packages\sklearn\metrics\\_classification.py:1221: UndefinedMetricWarning: Preci sion and F-score are ill-defined and being set to 0.0 in labels with no predicted samples. Use `zero\_division` pa rameter to control this behavior.

\_warn\_prf(average, modifier, msg\_start, len(result))

#### Conclusion

Accuracy on the Same Day approach is higher

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