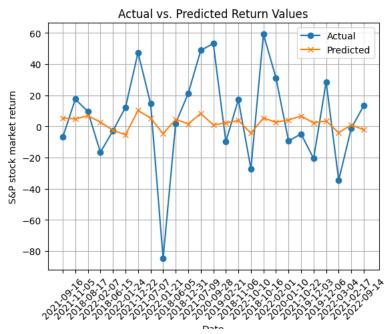
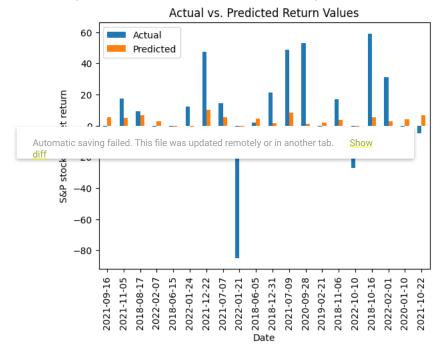
```
import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
\quad \hbox{from date time import date time} \\
from sklearn.model_selection import train_test_split
from sklearn.preprocessing import StandardScaler
from sklearn.svm import SVR
from sklearn.metrics import mean_squared_error, mean_absolute_error
data_index = pd.read_csv('sp500.csv')
data_index = data_index.drop(['Open', 'High', 'Low', 'Close*', 'Volume', 'Adj Close**'], axis='columns')
data_index.set_index('Date', inplace=True)
data_index.plot()
      <Axes: xlabel='Date'>
                                                                               Return
         200
         100
           0
       -100
       -200
       -300
            2023-01-02022-03-12021-06-02020-08-12019-10-29019-01-12018-03-28
                                                 Date
# read and merge datasets
data_ohlc = pd.read_csv('sp500.csv')
# data_ohlc['Date'] = pd.to_datetime(data_ohlc['Date'])
# data_ohlc['Date'] = data_ohlc['Date'].dt.strftime("%Y-%m-%d")
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        - parmer se (wata_onite, wata_index, on- bace, now-
merged[['Open', 'High', 'Low', 'Close', 'Volume', 'Adj Close']] = merged[['Open', 'High', 'Low', 'Close*', 'Volume', 'Adj Close**']].replace(
# merged[['Close', 'Volume']] = merged[['Close*', 'Volume']].astype(float)
merged = merged.drop(['Close*', 'S&P500', 'Adj Close**'], axis='columns')
merged['Date'] = [int(datetime.strptime(date, '%Y-%m-%d').timestamp()) for date in merged['Date']]
# merged.dropna(inplace=True)
merged.to_csv('form1.csv',index=False)
# pd.read_csv('form1.csv').info()
set = pd.read_csv('form1.csv')
set.head(10)
```

```
Date
                        0pen
                                High
                                                     Volume Return
                                                                       Close Adj Close
                                          Low
      0 1672704000 3853.29 3878.46 3794.33 3.959140e+09
                                                             -15.36 3824.14
                                                                                 3824.14
X = set[['Date', 'Open', 'High', 'Low', 'Volume', 'Close', 'Adj Close']]
# X = set[['Volume', 'S&P500', 'Close', 'Day', 'Month', 'Year']]
y = set['Return']
X_train, X_test, y_train, y_test = train_test_split(X, y, test_size=0.2, random_state=4)
scaler = StandardScaler()
X_train_scaled = scaler.fit_transform(X_train)
X_test_scaled = scaler.transform(X_test)
# svm_model = SVR(kernel='poly', degree=3, C=100)# best parameter
svm_model = SVR(kernel='linear')
# svm_model = SVR(kernel='rbf', C=1.0, epsilon=0.1)
svm_model.fit(X_train_scaled, y_train)
               SVR
     SVR(kernel='linear')
y_pred = svm_model.predict(X_test_scaled)
mse = mean_squared_error(y_test, y_pred)
mae = mean_absolute_error(y_test, y_pred)
print(f"Mean Squared Error (MSE): {mse:.2f}")
print(f"mean Absolute Error (MAE): {mae:.2f}")
     Mean Squared Error (MSE): 1790.62
     mean Absolute Error (MAE): 28.78
 X_{\text{test}['Date']} = [\text{datetime.fromtimestamp(timestamp).strftime('%Y-%m-%d') for timestamp in } X_{\text{test}['Date']}] 
quick_test = pd.DataFrame({'Actual': y_test, 'Predicted' : y_pred})
merged_df = quick_test.join(X_test)
merged_df = merged_df.drop([ 'Open','High', 'Low', 'Volume', 'Adj Close', 'Close'], axis='columns')
merged_df
            Actual Predicted
                                     Date
      326
              -6.95
                     5.397390 2021-09-16
      290
             17.47
                     4.769143 2021-11-05
      4404
              0 11
                     6 704049 2049 09 47
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                                                                 Show
 diff
      1145
              -2.83
                     -2.534731 2018-06-15
       ...
                            ...
      578
             -15.71
                     -3.077816 2020-09-16
      925
              -6.21
                     1.825251 2019-05-02
      163
               9.81
                     -8.229415 2022-05-10
      354
               7.42
                     7.806443 2021-08-06
      1096
             17.71
                     8.584455 2018-08-24
     252 rows × 3 columns
merged_df = quick_test.join(X_test)
merged_df = merged_df.head(25)
plt.plot(merged_df['Date'], merged_df['Actual'], label='Actual', marker='o')
plt.plot(merged_df['Date'], merged_df['Predicted'], label='Predicted', marker='x')
plt.xlabel('Date')
plt.ylabel('S&P stock market return')
plt.title('Actual vs. Predicted Return Values')
plt.legend()
plt.xticks(rotation=45)
plt.grid()
plt.show()
```



```
# X_test['Date'] = [datetime.fromtimestamp(timestamp).strftime('%Y-%m-%d') for timestamp in X_test['Date']]
# merged_df = quick_test.join(X_test)
merged_df.set_index('Date', inplace=True)
graph = merged_df.head(20)
graph.plot(kind='bar')
plt.xlabel('Date')
plt.ylabel('S&P stock market return')
plt.title('Actual vs. Predicted Return Values')
```

Text(0.5, 1.0, 'Actual vs. Predicted Return Values')



## \*\*\*\* WITH OTHER DATA \*\*\*\*

```
# read and merge datasets
data_ohlc = pd.read_csv('sp500.csv')
# data_ohlc['Date'] = pd.to_datetime(data_ohlc['Date'])
# data_ohlc['Date'] = data_ohlc['Date'].dt.strftime("%Y-%m-%d")
data_index = pd.read_csv('sp500_index.csv')
merged = pd.merge(data_ohlc, data_index, on='Date', how='inner')
```

```
merged[['Open','High', 'Low', 'Adj Close', 'Close', 'Volume']] = merged[['Open','High', 'Low', 'Adj Close**', 'Close*', 'Volume']].replace({'
# merged[['Open','High', 'Low', 'Adj Close**', 'Close', 'Volume']] = merged[['Close*', 'Volume']].astype(float)
merged = merged.drop(['Adj Close**', 'Close*', 'S&P500'], axis='columns')
# merged.dropna(inplace=True)
print(merged)
                Date
                         0pen
                                  High
                                            Low
                                                      Volume
                                                              Return Adj Close
          2023-01-03 3853.29 3878.46 3794.33 3.959140e+09
                                                              -15.36
                                                                        3824,14
                                                                        3839.50
          2022-12-30
                      3829.06
                               3839.85
                                       3800.34
                                                2.979870e+09
    1
                                                               -9.78
          2022-12-29 3805.45 3858.19 3805.45 3.003680e+09
                                                               66.06
                                                                        3849.28
    3
          2022-12-28 3829.56 3848.32 3780.78 3.083520e+09 -46.03
                                                                        3783.22
          2022-12-27
                      3843.34 3846.65 3813.22 3.030300e+09 -15.57
                                                                        3829.25
    1255 2018-01-08 2742.67 2748.51 2737.60 3.246160e+09
                                                                4.56
                                                                        2747.71
          2018-01-05
                      2731.33
                               2743.45
                                       2727.92
                                                3.239280e+09
                                                               19.16
                                                                        2743.15
          2018-01-04 2719.31 2729.29 2719.07 3.697340e+09
                                                               10.93
                                                                        2723.99
    1257
    1258
          2018-01-03 2697.85 2714.37 2697.77 3.544030e+09
                                                               17.25
                                                                        2713.06
    1259
          2018-01-02 2683.73 2695.89 2682.36
                                                3.397430e+09
                                                                        2695.81
                                                               22.20
            Close
    0
          3824.14
          3839.50
    1
    2
          3849.28
    3
          3783.22
          3829.25
    1255 2747.71
    1256 2743.15
    1257
          2723.99
    1258 2713.06
    1259 2695.81
    [1260 rows x 8 columns]
data_news = pd.read_csv('sp500_news.csv')
merged_data = pd.merge(merged, data_news, on='Date', how='inner')
# merged_data['Date'] = pd.to_datetime(merged_data['Date'])
# merged_data['Day'] = merged_data['Date'].dt.day
# merged_data['Month'] = merged_data['Date'].dt.month
# merged_data['Year'] = merged_data['Date'].dt.year
merged_data['Date'] = [int(datetime.strptime(date, '%Y-%m-%d').timestamp()) for date in merged_data['Date']]
print(merged_data)
merged_data.info()
merged_data.isnull().sum()
               Date
                        0pen
                                 High
                                          Low
                                                     Volume
                                                             Return Adj Close
                                                                         32.10
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                                                                          37.18
         1591574400 3199.92 3233.13 3196.00 8.498300e+09
                                                              38.46
                                                                       3232.39
         1591315200
                     3163.84 3211.72 3163.84 8.639300e+09
                                                                       3193.93
    610 1515369600 2742.67
                              2748.51 2737.60 3.246160e+09
                                                               4.56
                                                                       2747.71
                                                                       2743.15
         1515110400
                     2731.33
                              2743.45
                                       2727.92
                                                3.239280e+09
                                                              19.16
    612 1515024000 2719.31
                              2729.29 2719.07 3.697340e+09
                                                                       2723.99
    613 1514937600 2697.85 2714.37 2697.77 3.544030e+09
                                                              17.25
                                                                       2713.06
    614 1514851200 2683.73 2695.89 2682.36 3.397430e+09
                                                              22.20
                                                                       2695.81
           Close Positive Negative
                                      Neutral Price_change
    0
         3002.10 0.067369 0.743126 0.189504
                                                         -1
    1
         3190.14 0.390972 0.240399 0.368628
                                                         -1
          3207.18 0.296441 0.337487
                                      0.366072
                                                          -1
         3232.39 0.523481 0.124646 0.351873
                                                          1
         3193.93 0.567891 0.070503 0.361606
                                                          1
        2747.71 0.281969 0.176601 0.541430
    611 2743.15 0.134174 0.150020 0.715806
                                                          1
         2723.99 0.201664 0.272806 0.525530
        2713.06 0.203532 0.295476 0.500992
    614 2695.81 0.255685 0.267352 0.476963
    [615 rows x 12 columns]
     <class 'pandas.core.frame.DataFrame'>
    Int64Index: 615 entries, 0 to 614
    Data columns (total 12 columns):
         Column
                       Non-Null Count Dtype
     0
         Date
                       615 non-null
                                       int64
         0pen
                       615 non-null
                                       float64
                       615 non-null
                                       float64
         High
```

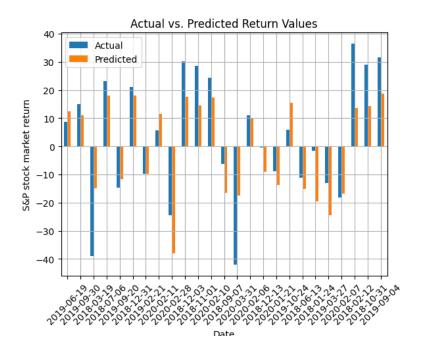
```
3
          Low
                        615 non-null
                                         float64
          Volume
                        615 non-null
                                         float64
                        615 non-null
                                         float64
      5
          Return
      6
          Adi Close
                        615 non-null
                                         float64
      7
          Close
                        615 non-null
                                         float64
          Positive
                        615 non-null
                                         float64
          Negative
                        615 non-null
                                         float64
      10
         Neutral
                        615 non-null
                                         float64
      11 Price_change
                        615 non-null
                                         int64
     dtypes: float64(10), int64(2)
     memory usage: 62.5 KB
     Date
                     0
                     0
     0pen
     High
                     0
     Low
                     0
     Volume
                     0
     Return
                     0
     Adj Close
                     0
     Close
                     0
     Positive
                     0
     Negative
     Neutral
                     0
     Price_change
merged_data.loc[:, 'ma20'] = merged_data.Close.rolling(20).mean()
merged_data.dropna(inplace=True)
# merged_data.loc[:, "rsi"] = talib.RSI(merged_data.Close, 14)
# print(merged_data)
merged_data.to_csv('form1.csv',index=False)
# pd.read_csv('form1.csv').info()
set = pd.read_csv('form1.csv')
set.head(10)
               Date
                        0pen
                                High
```

```
Adi
                                                                             Close
                                                   Volume Return
                                                                     Close
    0 1589414400 2794.54 2852.80 2766.64 5.651130e+09
                                                            32.50 2852.50 2852.50
                                                            -50.12 2820.00 2820.00
    1 1589328000
                  2865.86 2874.14 2793.15 6.151650e+09
    2 1589241600 2939.50 2945.82 2869.59 5.119630e+09
                                                            -60.07 2870.12 2870.12
    3 1589155200
                   2915 46 2944 25 2903 44 4 819730e+09
                                                                  2930 19 2930 19
                                                             0.39
    4 1588896000 2908.83 2932.16 2902.88 4.876030e+09
                                                            48.61 2929.80 2929.80
    5 1588809600 2878.26 2901.92 2876.48 5.178790e+09
                                                            32 77 2881 19 2881 19
    £ 4500700000 0000 44 0004 44 0047 65 4 0005700±00
                                                            20 02 2040 42
                                                                           2848.42
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                                                              Show
                                                                           2868.44
diff
```

```
# merged['Date'] = pd.to_datetime(merged['Date'])
# merged['Day'] = merged['Date'].dt.day
# merged['Month'] = merged['Date'].dt.month
# merged['Year'] = merged['Date'].dt.year
# print(merged)
# merged.to_csv('form1.csv',index=False)
# # pd.read_csv('form1.csv').info()
# set = pd.read_csv('form1.csv')
# set.head()
X = set[['Date', 'Open', 'High', 'Low', 'Volume', 'Adj Close', 'Positive', 'Negative', 'Neutral', 'Price_change', 'ma20', 'Close']]
# X = set[['Volume', 'S&P500', 'Close', 'Day', 'Month', 'Year']]
y = set['Return']
X_train, X_test, y_train, y_test = train_test_split(X, y, test_size=0.2, random_state=4)
scaler = StandardScaler()
X_train_scaled = scaler.fit_transform(X_train)
X_test_scaled = scaler.transform(X_test)
# svm_model = SVR(kernel='poly', degree=2, C=100)# best parameter
svm_model = SVR(kernel='linear')
```

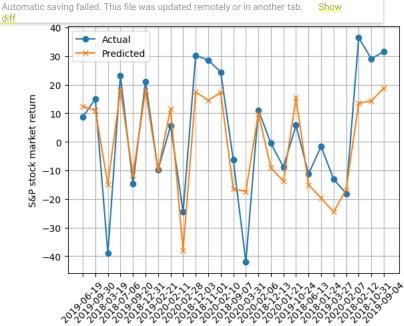
```
# svm_model = SVR(kernel='rbf', C=1.0, epsilon=0.1)
svm_model.fit(X_train_scaled, y_train)
               SVR
      SVR(kernel='linear')
y_pred = svm_model.predict(X_test_scaled)
mse = mean_squared_error(y_test, y_pred)
mae = mean_absolute_error(y_test, y_pred)
print(f"Mean Squared Error (MSE): {mse:.2f}")
print(f"Mean Absolute Error (MAE): {mae:.2f}")
     Mean Squared Error (MSE): 415.98
     Mean Absolute Error (MAE): 13.93
quick_test = pd.DataFrame({'Actual': y_test, 'Predicted' : y_pred})
quick_test.head(10)
           Actual Predicted
      228
              8.71
                    12.470199
      157
             14.95
                    10.933563
      543
            -39.09
                  -14.925421
      467
             23.21
                    18.101486
      163
            -14.72 -11.529882
      345
             21.11
                    17.920783
      310
             -9.82
                    -9.871308
      65
              5.66
                    11.605153
            -24 54 -38 064555
       53
             30 20 17 454317
      363
merged_df = quick_test.join(X_test)
merged_df = merged_df.drop([ 'Open', 'High', 'Low', 'Volume', 'Adj Close', 'Positive', 'Negative', 'Neutral', 'Price_change', 'ma20', 'Close']
merged\_df['Date'] = [datetime.fromtimestamp(timestamp).strftime('%Y-%m-%d') \ for \ timestamp \ in \ merged\_df['Date']]
merged_df
 Automatic saving failed. This file was updated remotely or in another tab.
 diff
             14.95 10.933563 2019-09-30
      157
      543
            -39.09
                  -14.925421 2018-03-19
             23.21
                    18.101486 2018-07-06
      467
      163
            -14.72 -11.529882 2019-09-20
      348
            116.60
                    33.186884 2018-12-26
      480
             -5.91
                    -1.609366 2018-06-18
      398
             38.76
                    16.891868 2018-10-12
      117
             23.35
                    16.620362 2019-11-25
      159
             -7.25
                    -6.650064 2019-09-26
     120 rows v 2 columns
merged_df.set_index('Date', inplace=True)
# Create the bar chart
graph = merged_df.head(25)
graph.plot(kind='bar')
plt.xlabel('Date')
plt.ylabel('S&P stock market return')
plt.title('Actual vs. Predicted Return Values')
```

```
plt.legend()
plt.xticks(rotation=45)
plt.grid()
plt.show()
```



X\_test['Date'] = [datetime.fromtimestamp(timestamp).strftime('%Y-%m-%d') for timestamp in X\_test['Date']]

merged\_df = quick\_test.join(X\_test)
merged\_df = merged\_df.head(25)
plt.plot(merged\_df['Date'], merged\_df['Actual'], label='Actual', marker='o')
plt.plot(merged\_df['Date'], merged\_df['Predicted'], label='Predicted', marker='x')
plt.xlabel('Date')
plt.ylabel('S&P stock market return')
plt.title('Actual vs. Predicted Return Values')
plt.legend()
plt.xticks(rotation=45)
plt.grid()
plt.show()



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