Prediksi Harga Saham Tesla Menggunakan Support Vector Regression

By Kelompok 2:

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IMPORT

```
In [1]: import pandas as pd
        import numpy as np
        from sklearn.model selection import train test split
        from sklearn.preprocessing import StandardScaler
        import matplotlib.pyplot as plt
        from sklearn.preprocessing import MinMaxScaler
         from sklearn.svm import SVR
        from sklearn.metrics import accuracy_score, confusion_matrix
        from sklearn.metrics import mean_squared_error, r2_score
        from sklearn.metrics import mean absolute error
        Read Dataset
In [2]:
        tesla = pd.read_csv('Tesla.csv')
        tesla.head()
              Date
                       Open High
                                     Low
                                               Close
                                                      Volume Adj Close
Out[2]:
        0 6/29/2010 19 000000 25 00 17 540001 23 889999 18766300 23 889999
        1 6/30/2010 25.790001 30.42 23.299999 23.830000 17187100 23.830000
           7/1/2010 25.000000 25.92 20.270000 21.959999
                                                      8218800 21.959999
           7/2/2010 23 000000 23 10 18 709999 19 200001
                                                      5139800 19 200001
```

```
4 7/6/2010 20.000000 20.00 15.830000 16.110001 6866900 16.110001

In [3]: tesla.info()
```

<class 'pandas.core.frame.DataFrame'> RangeIndex: 1692 entries, 0 to 1691 Data columns (total 7 columns): Column Non-Null Count Dtype 1692 non-null 0 Date 1692 non-null 1 0pen float64 High 2 1692 non-null float64 1692 non-null float64 Low Close 1692 non-null float64 5 Volume 1692 non-null int64 Adj Close 1692 non-null float64 dtypes: float64(5), int64(1), object(1) memory usage: 92.7+ KB

```
In [4]: #Melakukan Check terhadapa data apakah memiliki nilai null atau tidak
tesla.isnull().sum()
```

```
Out[4]: Date 0 Open 0 High 0 Low 0 Close 0 Volume 0 Adj Close 0 dtype: int64
```

```
In [5]: tesla.head()
```

```
Date
                         Open High
                                                  Close
                                                          Volume Adj Close
Out[5]:
                                          Low
          0 6/29/2010 19.000000 25.00
                                    17.540001 23.889999
                                                        18766300 23.889999
          1 6/30/2010 25.790001 30.42
                                    23.299999
                                              23.830000
                                                        17187100 23.830000
             7/1/2010 25.000000 25.92
                                    20.270000
                                              21.959999
                                                         8218800 21.959999
             7/2/2010 23.000000 23.10
                                    18.709999
                                              19.200001
                                                         5139800 19.200001
             7/6/2010 20.000000 20.00 15.830000 16.110001
                                                         6866900 16.110001
In [6]: #plotting the data
          plt.figure(figsize=(16,8))
          plt.title('Close Price History')
          plt.plot(tesla['Close'], color='red')
          plt.xlabel('Date', fontsize=18)
          plt.ylabel('Close Price USD', fontsize = 18)
          plt.show()
                                                                  Close Price History
            250
            200
         Close Price USD
             150
             100
             50
                                   250
                                                   500
                                                                                  1000
                                                                                                 1250
                                                                                                                1500
                                                                                                                                1750
                                                                       Date
          #Menentukan Variable X dan Y
          X = tesla[['Open', 'High', 'Low']].values
y = tesla['Close'].values
          #pembagian data menjadi set pelatihan (training set) dan set pengujian (testing set) menggunakan fungsi train t
In [8]:
          from sklearn.model_selection import train_test_split
          X train, X test, y train, y test = train test split(X, y, test size=0.2, random state=42)
          # Melakukan Uji Korelasi antar variabel X Dan Y
In [9]:
          import numpy as np
          correlation_matrix = np.corrcoef(X.T, y)
          correlation_with_target = correlation_matrix[-1, :-1]
          print(correlation_with_target)
          [0.99923326 0.99969092 0.9996561 ]
          #Melakukan PreProcessing data menggunakan teknik MinMaxScaler
In [10]:
          scaler = MinMaxScaler()
          X_scaled = scaler.fit_transform(X)
```

RBF

C = 0.1, Epsilon = 0.1, Gamma = 0.1

```
In [11]: svr = SVR(kernel='rbf', C=0.1, gamma=0.1, epsilon=0.1)
In [12]: from sklearn.model_selection import cross_val_score
    scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
In [13]: # Menampilkan hasil validasi silang
    print('R-squared scores:', scores)
```

```
print('R-squared mean:', scores.mean())
         print('R-squared std:', scores.std())
         R-squared scores: [-2019.38960196 -2684.90951015
                                                             -3.30158869
                                                                          -62.45166163
            -49.20031584]
         R\text{-squared mean: -963.8505356542116}
         R-squared std: 1153.079871338242
In [14]: svr.fit(X_train, y_train)
Out[14]: SVR(C=0.1, gamma=0.1)
In [15]: y_pred = svr.predict(X_test)
In [16]: mse = mean_squared_error(y_test, y_pred)
         rmse = np.sqrt(mse)
         mae = mean absolute error(y test, y pred)
         r2 = r2_score(y_test, y_pred)
         print("Mean Squared Error:", mse)
         print("Root Mean Squared Error:", rmse)
         print("Mean Absolute Error:", mae)
         print("R-squared:", r2)
         Mean Squared Error: 9778.692437946775
         Root Mean Squared Error: 98.88727136465428
         Mean Absolute Error: 89.75919412717663
         R-squared: -0.04855369558381595
         C = 0.1, Epsilon = 0.01, Gamma = 0.1
In [17]: svr = SVR(kernel='rbf', C=0.1, gamma=0.1, epsilon=0.01)
In [18]: from sklearn.model_selection import cross_val_score
         scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
In [19]: # Menampilkan hasil validasi silang
         print('R-squared scores:', scores)
         print('R-squared mean:', scores.mean())
         print('R-squared std:', scores.std())
         R-squared scores: [-2020.49249401 -2686.44247439
                                                             -3.30454679
                                                                          -62.47306825
            -49.21883306]
         R-squared mean: -964.3862832997313
         R-squared std: 1153.7326265024037
In [20]: svr.fit(X train, y train)
Out[20]: SVR(C=0.1, epsilon=0.01, gamma=0.1)
In [21]: y pred = svr.predict(X test)
In [22]: mse = mean_squared_error(y_test, y_pred)
         rmse = np.sqrt(mse)
         mae = mean_absolute_error(y_test, y_pred)
         r2 = r2_score(y_test, y_pred)
         print("Mean Squared Error:", mse)
```

print("Root Mean Squared Error:", rmse) print("Mean Absolute Error:", mae) print("R-squared:", r2)

Mean Squared Error: 9785.311386347861 Root Mean Squared Error: 98.92073284376669 Mean Absolute Error: 89.76901713602618 R-squared: -0.04926343493300611

C = 0.1, Epsilon = 0.001, Gamma = 0.1

```
In [23]: svr = SVR(kernel='rbf', C=0.1, gamma=0.1, epsilon=0.001)
In [24]: from sklearn.model_selection import cross_val_score
          scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
In [25]: # Menampilkan hasil validasi silang
          print('R-squared scores:', scores)
          print('R-squared mean:', scores.mean())
print('R-squared std:', scores.std())
```

```
R-squared scores: [-2020.70749192 -2686.74131275
                                                          -3.30454679
                                                                         -62.47459018
            -49.22014957]
         R-squared mean: -964.4896182442253
         R-squared std: 1153.8607497097312
In [26]: svr.fit(X_train, y_train)
Out[26]: SVR(C=0.1, epsilon=0.001, gamma=0.1)
In [27]: y_pred = svr.predict(X_test)
In [28]: mse = mean_squared_error(y_test, y_pred)
         rmse = np.sqrt(mse)
         mae = mean absolute error(y test, y pred)
         r2 = r2_score(y_test, y_pred)
         print("Mean Squared Error:", mse)
         print("Root Mean Squared Error:", rmse)
         print("Mean Absolute Error:", mae)
         print("R-squared:", r2)
         Mean Squared Error: 9785.974172187969
         Root Mean Squared Error: 98.92408287261485
         Mean Absolute Error: 89.76999943691114
         R-squared: -0.049334504408443225
         C = 0.1, Epsilon = 0.0001, Gamma = 0.1
```

```
In [29]: svr = SVR(kernel='rbf', C=0.1, gamma=0.1, epsilon=0.0001)
In [30]: from sklearn.model selection import cross val score
         scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
In [31]: # Menampilkan hasil validasi silang
         print('R-squared scores:', scores)
         print('R-squared mean:', scores.mean())
         print('R-squared std:', scores.std())
         R-squared scores: [-2020.72899234 -2686.7711975
                                                               -3.30454679
                                                                              -62.47451504
             -49.22008458]
         R-squared mean: -964.4998672507885
R-squared std: 1153.8736291596886
In [32]: svr.fit(X train, y train)
Out[32]: SVR(C=0.1, epsilon=0.0001, gamma=0.1)
In [33]: y_pred = svr.predict(X_test)
In [34]: mse = mean_squared_error(y_test, y_pred)
         rmse = np.sqrt(mse)
         mae = mean_absolute_error(y_test, y_pred)
          r2 = r2_score(y_test, y_pred)
         print("Mean Squared Error:", mse)
         print("Root Mean Squared Error:", rmse)
         print("Mean Absolute Error:", mae)
         print("R-squared:", r2)
         Mean Squared Error: 9786.040459681979
         Root Mean Squared Error: 98.92441791429444
         Mean Absolute Error: 89.77009766699963
```

C = 0.1, Epsilon = 0.1, Gamma = 0.01

R-squared: -0.04934161231139211

```
Out[38]: SVR(C=0.1, gamma=0.01)
In [39]: y_pred = svr.predict(X_test)
In [40]: mse = mean_squared_error(y_test, y_pred)
         rmse = np.sqrt(mse)
         mae = mean absolute error(y test, y pred)
         r2 = r2_score(y_test, y_pred)
         print("Mean Squared Error:", mse)
         print("Root Mean Squared Error:", rmse)
         print("Mean Absolute Error:", mae)
         print("R-squared:", r2)
         Mean Squared Error: 7576.57624150215
         Root Mean Squared Error: 87.0435307274593
         Mean Absolute Error: 79.33478140357875
         R-squared: 0.18757573486300294
         C = 0.1, Epsilon = 0.1, Gamma = 0.001
In [41]: svr = SVR(kernel='rbf', C=0.1, gamma=0.001, epsilon=0.1)
In [42]: from sklearn.model_selection import cross_val_score
         scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
In [43]: # Menampilkan hasil validasi silang
         print('R-squared scores:', scores)
         print('R-squared mean:', scores.mean())
         print('R-squared std:', scores.std())
         R-squared scores: [-1.25758953e+03 -1.60899790e+03 -4.11705432e-01 -3.18808385e+01
          -2.21923125e+01]
         R-squared mean: -584.2144578488567
         R-squared std: 702.1940003715492
In [44]: svr.fit(X_train, y_train)
Out[44]: SVR(C=0.1, gamma=0.001)
In [45]: y_pred = svr.predict(X_test)
In [46]: mse = mean_squared_error(y_test, y_pred)
         rmse = np.sqrt(mse)
         mae = mean_absolute_error(y_test, y_pred)
         r2 = r2_score(y_test, y_pred)
         print("Mean Squared Error:", mse)
         print("Root Mean Squared Error:", rmse)
         print("Mean Absolute Error:", mae)
         print("R-squared:", r2)
         Mean Squared Error: 4835.13255162105
         Root Mean Squared Error: 69.5351173984847
Mean Absolute Error: 62.25300227266322
         R-squared: 0.48153639785562374
         C = 0.1, Epsilon = 0.1, Gamma = 0.0001
In [47]: svr = SVR(kernel='rbf', C=0.1, gamma=0.0001, epsilon=0.1)
In [48]: from sklearn.model_selection import cross_val_score
         scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
In [49]: # Menampilkan hasil validasi silang
         print('R-squared scores:', scores)
         print('R-squared mean:', scores.mean())
         print('R-squared std:', scores.std())
         R-squared scores: [-8.06830614e+02 -1.01010361e+03 5.08481788e-01 -1.87234389e+01
          -1.11283482e+01]
         R-squared mean: -369.2555060137676
         R-squared std: 444.97448615727114
In [50]: svr.fit(X_train, y_train)
```

Out[50]: SVR(C=0.1, gamma=0.0001)

In [51]: y_pred = svr.predict(X_test)

```
In [52]: mse = mean_squared_error(y_test, y_pred)
    rmse = np.sqrt(mse)
    mae = mean_absolute_error(y_test, y_pred)
    r2 = r2_score(y_test, y_pred)

print("Mean Squared Error:", mse)
    print("Root Mean Squared Error:", rmse)
    print("Mean Absolute Error:", mae)
    print("R-squared:", r2)

Mean Squared Error: 2548.3977677130915
    Root Mean Squared Error: 50.4816577353903
    Mean Absolute Error: 44.61614665642437
    R-squared: 0.7267393453562616
```

C = 0.1, Epsilon = 0.01, Gamma = 0.01

```
In [53]: svr = SVR(kernel='rbf', C=0.1, gamma=0.01, epsilon=0.01)
In [54]: from sklearn.model_selection import cross_val_score
         scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
In [55]: # Menampilkan hasil validasi silang
         print('R-squared scores:', scores)
         print('R-squared mean:', scores.mean())
         print('R-squared std:', scores.std())
         R-squared scores: [-1.77824595e+03 -2.32705541e+03 -1.74466663e+00 -4.84316221e+01
          -3.68642979e+01]
         R-squared mean: -838.4683889066677
         R-squared std: 1006.5691213614599
In [56]: svr.fit(X train, y train)
Out[56]: SVR(C=0.1, epsilon=0.01, gamma=0.01)
In [57]: y_pred = svr.predict(X_test)
In [58]: mse = mean_squared_error(y_test, y_pred)
         rmse = np.sqrt(mse)
         mae = mean_absolute_error(y_test, y_pred)
         r2 = r2_score(y_test, y_pred)
         print("Mean Squared Error:", mse)
         print("Root Mean Squared Error:", rmse)
         print("Mean Absolute Error:", mae)
         print("R-squared:", r2)
         Mean Squared Error: 7578.462023220843
         Root Mean Squared Error: 87.05436245944739
         Mean Absolute Error: 79.33743977652306
```

C = 0.1, Epsilon = 0.01, Gamma = 0.001

R-squared: 0.18737352547736708

```
In [59]: svr = SVR(kernel='rbf', C=0.1, gamma=0.001, epsilon=0.01)
In [60]: from sklearn.model selection import cross val score
          scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
In [61]: # Menampilkan hasil validasi silang
          print('R-squared scores:', scores)
          print('R-squared mean:', scores.mean())
          print('R-squared std:', scores.std())
          R-squared scores: [-1.25689351e+03 -1.60804812e+03 -4.11705432e-01 -3.18786175e+01
           -2.21904888e+01]
          R-squared mean: -583.8844877810259
R-squared std: 701.7839272701302
In [62]: svr.fit(X_train, y_train)
Out[62]: SVR(C=0.1, epsilon=0.01, gamma=0.001)
In [63]: y_pred = svr.predict(X_test)
In [64]: mse = mean_squared_error(y_test, y_pred)
          rmse = np.sqrt(mse)
          mae = mean absolute error(y test, y pred)
          r2 = r2_score(y_test, y_pred)
          print("Mean Squared Error:", mse)
```

```
print("Root Mean Squared Error:", rmse)
print("Mean Absolute Error:", mae)
print("R-squared:", r2)
```

Mean Squared Error: 4831.369105627526 Root Mean Squared Error: 69.50805065334177 Mean Absolute Error: 62.24669590664343 R-squared: 0.48193994620625247

C = 0.1, Epsilon = 0.01, Gamma = 0.0001

```
In [65]: svr = SVR(kernel='rbf', C=0.1, gamma=0.0001, epsilon=0.01)
In [66]: from sklearn.model_selection import cross_val_score
         scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
In [67]: # Menampilkan hasil validasi silang
         print('R-squared scores:', scores)
         print('R-squared mean:', scores.mean())
         print('R-squared std:', scores.std())
         R-squared scores: [-8.07065229e+02 -1.01029381e+03 5.08481788e-01 -1.87435657e+01
          -1.11445000e+01]
         R-squared mean: -369.34772460692795
         R-squared std: 445.06964353515224
In [68]: svr.fit(X_train, y_train)
Out[68]: SVR(C=0.1, epsilon=0.01, gamma=0.0001)
In [69]: y_pred = svr.predict(X_test)
In [70]: mse = mean_squared_error(y_test, y_pred)
         rmse = np.sqrt(mse)
         mae = mean absolute error(y test, y pred)
         r2 = r2_score(y_test, y_pred)
         print("Mean Squared Error:", mse)
         print("Root Mean Squared Error:", rmse)
         print("Mean Absolute Error:", mae)
         print("R-squared:", r2)
         Mean Squared Error: 2549.420564015889
         Root Mean Squared Error: 50.49178709469381
         Mean Absolute Error: 44.61553151439951
         R-squared: 0.7266296725293543
```

C = 0.1, Epsilon = 0.001, Gamma = 0.01

```
In [71]: svr = SVR(kernel='rbf', C=0.1, gamma=0.01, epsilon=0.001)
In [72]: from sklearn.model_selection import cross_val_score
          scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
In [73]: # Menampilkan hasil validasi silang
          print('R-squared scores:', scores)
          print('R-squared mean:', scores.mean())
print('R-squared std:', scores.std())
          R-squared scores: [-1.77844727e+03 -2.32733351e+03 -1.74466663e+00 -4.84298775e+01
           -3.68628119e+01]
          R-squared mean: -838.5636266878976
          R-squared std: 1006.6894787517568
In [74]: svr.fit(X_train, y_train)
Out[74]: SVR(C=0.1, epsilon=0.001, gamma=0.01)
In [75]: y_pred = svr.predict(X_test)
In [76]: mse = mean_squared_error(y_test, y_pred)
          rmse = np.sqrt(mse)
          mae = mean_absolute_error(y_test, y_pred)
          r2 = r2_score(y_test, y_pred)
          print("Mean Squared Error:", mse)
          print("Root Mean Squared Error:", rmse)
          print("Mean Absolute Error:", mae)
          print("R-squared:", r2)
```

Mean Squared Error: 7579.00104709407 Root Mean Squared Error: 87.05745830825794 Mean Absolute Error: 79.3382666407961 R-squared: 0.1873157268015352

C = 0.1, Epsilon = 0.001, Gamma = 0.001

```
In [77]: svr = SVR(kernel='rbf', C=0.1, gamma=0.001, epsilon=0.001)
In [78]: from sklearn.model_selection import cross_val_score
         scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
In [79]: # Menampilkan hasil validasi silang
         print('R-squared scores:', scores)
         print('R-squared mean:', scores.mean())
         print('R-squared std:', scores.std())
         R-squared scores: [-1.25689351e+03 -1.60804812e+03 -4.11705432e-01 -3.18772736e+01
          -2.21893853e+01]
         R-squared mean: -583.8839982863731
         R-squared std: 701.7843153415885
In [80]: svr.fit(X_train, y_train)
Out[80]: SVR(C=0.1, epsilon=0.001, gamma=0.001)
In [81]: y_pred = svr.predict(X_test)
In [82]: mse = mean_squared_error(y_test, y_pred)
         rmse = np.sqrt(mse)
         mae = mean_absolute_error(y_test, y_pred)
         r2 = r2_score(y_test, y_pred)
         print("Mean Squared Error:", mse)
         print("Root Mean Squared Error:", rmse)
         print("Mean Absolute Error:", mae)
         print("R-squared:", r2)
         Mean Squared Error: 4831.369105627526
         Root Mean Squared Error: 69.50805065334177
         Mean Absolute Error: 62.24669590664343
         R-squared: 0.48193994620625247
         C = 0.1, Epsilon = 0.001, Gamma = 0.0001
In [83]: svr = SVR(kernel='rbf', C=0.1, gamma=0.0001, epsilon=0.001)
```

```
In [84]: from sklearn.model selection import cross val score
         scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
In [85]: # Menampilkan hasil validasi silang
         print('R-squared scores:', scores)
         print('R-squared mean:', scores.mean())
print('R-squared std:', scores.std())
         R-squared scores: [-8.07000839e+02 -1.01011058e+03 5.08481788e-01 -1.87439764e+01
           -1.11445000e+01]
         R-squared mean: -369.29828193619113
         R-squared std: 445.0041393084436
In [86]: svr.fit(X_train, y_train)
Out[86]: SVR(C=0.1, epsilon=0.001, gamma=0.0001)
In [87]: y_pred = svr.predict(X_test)
In [88]: mse = mean_squared_error(y_test, y_pred)
         rmse = np.sqrt(mse)
         mae = mean absolute error(y test, y pred)
          r2 = r2_score(y_test, y_pred)
         print("Mean Squared Error:", mse)
          print("Root Mean Squared Error:",
         print("Mean Absolute Error:", mae)
         print("R-squared:", r2)
         Mean Squared Error: 2549.4205640158875
         Root Mean Squared Error: 50.4917870946938
         Mean Absolute Error: 44.6155315143995
         R-squared: 0.7266296725293544
```

C = 0.1, Epsilon = 0.0001, Gamma = 0.01

```
In [89]: svr = SVR(kernel='rbf', C=0.1, gamma=0.01, epsilon=0.0001)
In [90]: from sklearn.model_selection import cross_val_score
         scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
In [91]: # Menampilkan hasil validasi silang
         print('R-squared scores:', scores)
         print('R-squared mean:', scores.mean())
         print('R-squared std:', scores.std())
         R-squared scores: [-1.77846740e+03 -2.32736132e+03 -1.74466749e+00 -4.84298775e+01
          -3.68628119e+01]
         R-squared mean: -838.5732155576504
         R-squared std: 1006.7014636833238
In [92]: svr.fit(X_train, y_train)
Out[92]: SVR(C=0.1, epsilon=0.0001, gamma=0.01)
In [93]: y_pred = svr.predict(X_test)
In [94]: mse = mean_squared_error(y_test, y_pred)
         rmse = np.sqrt(mse)
         mae = mean absolute error(y test, y pred)
         r2 = r2_score(y_test, y_pred)
         print("Mean Squared Error:", mse)
         print("Root Mean Squared Error:", rmse)
         print("Mean Absolute Error:", mae)
         print("R-squared:", r2)
         Mean Squared Error: 7579.054950984987
         Root Mean Squared Error: 87.0577678957196
         Mean Absolute Error: 79.33834894168106
         R-squared: 0.18730994677272395
         C = 0.1, Epsilon = 0.0001, Gamma = 0.001
In [95]: svr = SVR(kernel='rbf', C=0.1, gamma=0.001, epsilon=0.0001)
In [96]: from sklearn.model_selection import cross_val_score
         scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
In [97]: # Menampilkan hasil validasi silang
         print('R-squared scores:', scores)
         print('R-squared mean:', scores.mean())
         print('R-squared std:', scores.std())
         R-squared scores: [-1.25689351e+03 -1.60804812e+03 -4.11705432e-01 -3.18772736e+01
          -2.21893853e+01]
         R-squared mean: -583.8839982863727
         R-squared std: 701.7843153415881
In [98]: svr.fit(X_train, y_train)
         SVR(C=0.1, epsilon=0.0001, gamma=0.001)
Out[98]:
In [99]: y_pred = svr.predict(X_test)
In [100... mse = mean_squared_error(y_test, y_pred)
         rmse = np.sqrt(mse)
         mae = mean absolute error(y test, y pred)
         r2 = r2_score(y_test, y_pred)
         print("Mean Squared Error:", mse)
         print("Root Mean Squared Error:", rmse)
         print("Mean Absolute Error:", mae)
         print("R-squared:", r2)
```

C = 0.1, Epsilon = 0.0001, Gamma = 0.0001

Mean Squared Error: 4831.369105627526 Root Mean Squared Error: 69.50805065334177 Mean Absolute Error: 62.24669590664343

R-squared: 0.48193994620625247

```
In [101... svr = SVR(kernel='rbf', C=0.1, gamma=0.0001, epsilon=0.0001)

from skloars model selection import cross valueses
```

```
Th [107 | 110m 2kreath.moner_serection Tmbotr closs_var_scole
         scores = cross val score(svr, X, y, cv=5, scoring='r2')
In [103... # Menampilkan hasil validasi silang
         print('R-squared scores:', scores)
         print('R-squared mean:', scores.mean())
         print('R-squared std:', scores.std())
         R-squared scores: [-8.07000839e+02 -1.01009225e+03 5.08481788e-01 -1.87439764e+01
          -1.11445000e+01]
         R-squared mean: -369.2946174458489
         R-squared std: 444.9988624192593
In [104... svr.fit(X_train, y_train)
Out[104]: SVR(C=0.1, epsilon=0.0001, gamma=0.0001)
In [105_ y_pred = svr.predict(X_test)
In [106_ mse = mean_squared_error(y_test, y_pred)
         rmse = np.sqrt(mse)
         mae = mean absolute error(y test, y pred)
         r2 = r2_score(y_test, y_pred)
         print("Mean Squared Error:", mse)
         print("Root Mean Squared Error:", rmse)
         print("Mean Absolute Error:", mae)
         print("R-squared:", r2)
         Mean Squared Error: 2549.420564015889
         Root Mean Squared Error: 50.49178709469381
         Mean Absolute Error: 44.61553151439951
         R-squared: 0.7266296725293542
         C = 1, Epsilon = 0.1, Gamma = 0.1
In [107... svr = SVR(kernel='rbf', C=1, gamma=0.1, epsilon=0.1)
In [108... from sklearn.model selection import cross val score
         scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
In [109... # Menampilkan hasil validasi silang
         print('R-squared scores:', scores)
```

```
print('R-squared mean:', scores.mean())
print('R-squared std:', scores.std())
          R-squared scores: [-1.41733308e+03 -1.71915004e+03 -2.73084636e-02 -2.16727341e+01
           -1.44619579e+01]
          R-squared mean: -634.5290223389621
          R-squared std: 768.3558222571648
In [110_ svr.fit(X train, y train)
Out[110]: SVR(C=1, gamma=0.1)
In [111... y pred = svr.predict(X test)
In [112... mse = mean_squared_error(y_test, y_pred)
          rmse = np.sqrt(mse)
          mae = mean_absolute_error(y_test, y_pred)
          r2 = r2_score(y_test, y_pred)
          print("Mean Squared Error:", mse)
          print("Root Mean Squared Error:", rmse)
          print("Mean Absolute Error:", mae)
          print("R-squared:", r2)
          Mean Squared Error: 3115.928738412167
          Root Mean Squared Error: 55.82050464132483
          Mean Absolute Error: 46.65183009000264
          R-squared: 0.6658838986325751
```

C = 1, Epsilon = 0.01, Gamma = 0.1

```
print('R-squared std:', scores.std())
         R-squared scores: [-1.41811134e+03 -1.72020837e+03 -2.76727668e-02 -2.16767049e+01
          -1.44651427e+01]
         R-squared mean: -634.8978462234617
         R-squared std: 768.8119873003299
In [116... svr.fit(X_train, y_train)
Out[116]: SVR(C=1, epsilon=0.01, gamma=0.1)
In [117... y_pred = svr.predict(X_test)
In [118... mse = mean_squared_error(y_test, y_pred)
         rmse = np.sqrt(mse)
         mae = mean absolute error(y test, y pred)
         r2 = r2_score(y_test, y_pred)
         print("Mean Squared Error:", mse)
         print("Root Mean Squared Error:", rmse)
         print("Mean Absolute Error:", mae)
         print("R-squared:", r2)
         Mean Squared Error: 3115.866782113317
         Root Mean Squared Error: 55.81994967852727
         Mean Absolute Error: 46.64615551051413
         R-squared: 0.6658905421083299
         C = 1, Epsilon = 0.001, Gamma = 0.1
In [119_ svr = SVR(kernel='rbf', C=1, gamma=0.1, epsilon=0.001)
In [128... from sklearn.model selection import cross val score
         scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
```

```
In [121... # Menampilkan hasil validasi silang
         print('R-squared scores:', scores)
         print('R-squared mean:', scores.mean())
         print('R-squared std:', scores.std())
         R-squared scores: [-1.41816993e+03 -1.72028806e+03 -2.76655942e-02 -2.16760102e+01
          -1.44645855e+01]
         R-squared mean: -634.9252503944748
         R-squared std: 768.8466254775408
In [122... svr.fit(X_train, y_train)
Out[122]: SVR(C=1, epsilon=0.001, gamma=0.1)
In [123_ y_pred = svr.predict(X_test)
In [124... mse = mean_squared_error(y_test, y_pred)
         rmse = np.sqrt(mse)
         mae = mean absolute_error(y_test, y_pred)
          r2 = r2_score(y_test, y_pred)
         print("Mean Squared Error:", mse)
          print("Root Mean Squared Error:", rmse)
          print("Mean Absolute Error:", mae)
         print("R-squared:", r2)
         Mean Squared Error: 3115.8998650388207
         Root Mean Squared Error: 55.82024601377909
         Mean Absolute Error: 46.647433054246534
         R-squared: 0.6658869946786486
```

C = 1, Epsilon = 0.0001, Gamma = 0.1

```
In [128... svr.fit(X_train, y_train)
Out[128]: SVR(C=1, epsilon=0.0001, gamma=0.1)
In [129... y pred = svr.predict(X test)
In [130... mse = mean_squared_error(y_test, y_pred)
         rmse = np.sqrt(mse)
         mae = mean_absolute_error(y_test, y_pred)
         r2 = r2_score(y_test, y_pred)
         print("Mean Squared Error:", mse)
         print("Root Mean Squared Error:", rmse)
         print("Mean Absolute Error:", mae)
         print("R-squared:", r2)
         Mean Squared Error: 3115.903160822177
         Root Mean Squared Error: 55.82027553516891
         Mean Absolute Error: 46.647562404384026
         R-squared: 0.6658866412770215
         C = 1, Epsilon = 0.1, Gamma = 0.01
In [131_ svr = SVR(kernel='rbf', C=1, gamma=0.01, epsilon=0.1)
In [132... from sklearn.model_selection import cross_val_score
         scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
In [133…  # Menampilkan hasil validasi silang
         print('R-squared scores:', scores)
         print('R-squared mean:', scores.mean())
print('R-squared std:', scores.std())
         R-squared scores: [-5.87905151e+02 -3.46730887e+02 1.54369791e-01 -5.16348684e+00
          -2.25047693e-01]
         R-squared mean: -187.97404061348686
         R-squared std: 240.50376758602658
In [134... svr.fit(X train, y train)
Out[134]: SVR(C=1, gamma=0.01)
In [135... y pred = svr.predict(X test)
In [136... mse = mean squared error(y test, y pred)
         rmse = np.sqrt(mse)
         mae = mean_absolute_error(y_test, y_pred)
         r2 = r2_score(y_test, y_pred)
         print("Mean Squared Error:", mse)
         print("Root Mean Squared Error:", rmse)
print("Mean Absolute Error:", mae)
         print("R-squared:", r2)
         Mean Squared Error: 741.1941038872787
         Root Mean Squared Error: 27.224880236417548
         Mean Absolute Error: 13.982137785079981
         R-squared: 0.920522930677312
         C = 1, Epsilon = 0.1, Gamma = 0.001
```

```
In [142... mse = mean_squared_error(y_test, y_pred)
    rmse = np.sqrt(mse)
    mae = mean_absolute_error(y_test, y_pred)
    r2 = r2_score(y_test, y_pred)

print("Mean Squared Error:", mse)
    print("Root Mean Squared Error:", rmse)
    print("Mean Absolute Error:", mae)
    print("R-squared:", r2)

Mean Squared Error: 182.76205399167696
    Root Mean Squared Error: 13.518951660231535
    Mean Absolute Error: 5.723994619769737
    R-squared: 0.9804027145406672
```

C = 1, Epsilon = 0.1, Gamma = 0.0001

```
In [143... svr = SVR(kernel='rbf', C=1, gamma=0.0001, epsilon=0.1)
In [144. from sklearn.model selection import cross val score
         scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
In [145... # Menampilkan hasil validasi silang
         print('R-squared scores:', scores)
         print('R-squared mean:', scores.mean())
         print('R-squared std:', scores.std())
         R-squared scores: [-4.05330594 0.70054172 0.93959371 0.09328926 0.92864236]
         R-squared mean: -0.27824777539987283
         R-squared std: 1.9124253980903627
In [146... svr.fit(X train, y train)
Out[146]: SVR(C=1, gamma=0.0001)
In [147... y pred = svr.predict(X test)
In [148... | mse = mean_squared_error(y_test, y_pred)
         rmse = np.sqrt(mse)
         mae = mean absolute error(y test, y pred)
         r2 = r2_score(y_test, y_pred)
         print("Mean Squared Error:", mse)
         print("Root Mean Squared Error:", rmse)
         print("Mean Absolute Error:", mae)
         print("R-squared:", r2)
         Mean Squared Error: 38.83615023859141
         Root Mean Squared Error: 6.231865710891997
         Mean Absolute Error: 3.1107459272957545
         R-squared: 0.9958356611465864
```

C = 1, Epsilon = 0.01, Gamma = 0.01

```
In [149... svr = SVR(kernel='rbf', C=1, gamma=0.01, epsilon=0.01)
In [150_ from sklearn.model_selection import cross_val_score
          scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
In [151…  # Menampilkan hasil validasi silang
          print('R-squared scores:', scores)
          print('R-squared mean:', scores.mean())
print('R-squared std:', scores.std())
          R-squared scores: [-5.87901944e+02 -3.46439910e+02 1.53713609e-01 -5.16461121e+00
           -2.24893379e-01]
          R-squared mean: -187.91552888608052
          R-squared std: 240.46406129242695
In [152... svr.fit(X_train, y_train)
Out[152]: SVR(C=1, epsilon=0.01, gamma=0.01)
In [153... y_pred = svr.predict(X_test)
In [154... mse = mean_squared_error(y_test, y_pred)
          rmse = np.sqrt(mse)
          mae = mean absolute error(y test, y pred)
          r2 = r2_score(y_test, y_pred)
          print("Mean Squared Error:", mse)
```

```
print("Root Mean Squared Error:", rmse)
print("Mean Absolute Error:", mae)
print("R-squared:", r2)
```

Mean Squared Error: 741.4947150211656 Root Mean Squared Error: 27.230400566667498 Mean Absolute Error: 13.985534221284254

R-squared: 0.9204906966217498

C = 1, Epsilon = 0.01, Gamma = 0.001

```
In [155... svr = SVR(kernel='rbf', C=1, gamma=0.001, epsilon=0.01)
In [156. from sklearn.model_selection import cross_val_score
         scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
In [157... # Menampilkan hasil validasi silang
         print('R-squared scores:', scores)
         print('R-squared mean:', scores.mean())
         print('R-squared std:', scores.std())
         R-squared scores: [-49.56682404 -8.23790372 0.66087281 -1.78264359 0.77162529]
         R-squared mean: -11.630974651614945
         R-squared std: 19.248611500647957
In [158... svr.fit(X_train, y_train)
Out[158]: SVR(C=1, epsilon=0.01, gamma=0.001)
In [159... y_pred = svr.predict(X_test)
In [160... mse = mean_squared_error(y_test, y_pred)
         rmse = np.sqrt(mse)
         mae = mean absolute error(y test, y pred)
         r2 = r2_score(y_test, y_pred)
         print("Mean Squared Error:", mse)
         print("Root Mean Squared Error:", rmse)
         print("Mean Absolute Error:", mae)
         print("R-squared:", r2)
         Mean Squared Error: 182.82516642013775
         Root Mean Squared Error: 13.521285679259119
         Mean Absolute Error: 5.727556473525405
         R-squared: 0.9803959470949662
```

C = 1, Epsilon = 0.01, Gamma = 0.0001

Mean Absolute Error: 3.1085548511122325

R-squared: 0.9958365923155073

```
In [161  svr = SVR(kernel='rbf', C=1, gamma=0.0001, epsilon=0.01)
In [162... from sklearn.model selection import cross val score
         scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
In [163... # Menampilkan hasil validasi silang
         print('R-squared scores:', scores)
         print('R-squared mean:', scores.mean())
         print('R-squared std:', scores.std())
         R-squared scores: [-4.02765314 0.70032896 0.93921423 0.09026825 0.92837553]
         R-squared mean: -0.2738932322759272
         R-squared std: 1.902078642232936
In [164... svr.fit(X train, y train)
Out[164]: SVR(C=1, epsilon=0.01, gamma=0.0001)
In [165... y_pred = svr.predict(X_test)
In [166... mse = mean_squared_error(y_test, y_pred)
         rmse = np.sqrt(mse)
         mae = mean absolute_error(y_test, y_pred)
         r2 = r2_score(y_test, y_pred)
         print("Mean Squared Error:", mse)
         print("Root Mean Squared Error:", rmse)
         print("Mean Absolute Error:", mae)
         print("R-squared:", r2)
         Mean Squared Error: 38.82746626320429
         Root Mean Squared Error: 6.231168932327569
```

C = 1, Epsilon = 0.001, Gamma = 0.01

C = 1, Epsilon = 0.001, Gamma = 0.01

```
In [172... svr = SVR(kernel='rbf', C=1, gamma=0.01, epsilon=0.001)
In [173... from sklearn.model_selection import cross val score
         scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
In [174…  # Menampilkan hasil validasi silang
         print('R-squared scores:', scores)
         print('R-squared mean:', scores.mean())
         print('R-squared std:', scores.std())
         R-squared scores: [-5.87831399e+02 -3.46315047e+02 1.53672156e-01 -5.16499701e+00
          -2.24752948e-01]
         R-squared mean: -187.87650473334833
         R-squared std: 240.4240885065563
In [175... svr.fit(X_train, y_train)
Out[175]: SVR(C=1, epsilon=0.001, gamma=0.01)
In [176... y_pred = svr.predict(X_test)
In [177... mse = mean_squared_error(y_test, y_pred)
         rmse = np.sqrt(mse)
         mae = mean absolute error(y test, y pred)
         r2 = r2_score(y_test, y_pred)
         print("Mean Squared Error:", mse)
         print("Root Mean Squared Error:", rmse)
         print("Mean Absolute Error:", mae)
         print("R-squared:", r2)
         Mean Squared Error: 741.4545832722796
         Root Mean Squared Error: 27.229663664325336
         Mean Absolute Error: 13.985415832557267
         R-squared: 0.9204949998855932
In [178... mse = mean_squared_error(y_test, y_pred)
         rmse = np.sqrt(mse)
         mae = mean_absolute_error(y_test, y_pred)
         r2 = r2_score(y_test, y_pred)
         print("Mean Squared Error:", mse)
         print("Root Mean Squared Error:"
         print("Mean Absolute Error:", mae)
         print("R-squared:", r2)
         Mean Squared Error: 741.4545832722796
         Root Mean Squared Error: 27.229663664325336
         Mean Absolute Error: 13.985415832557267
         R-squared: 0.9204949998855932
```

C = 1, Epsilon = 0.001, Gamma = 0.001

```
In [179... svr = SVR(kernel='rbf', C=1, gamma=0.001, epsilon=0.001)
```

```
In [180... from sklearn.model_selection import cross_val score
          scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
In [181…  # Menampilkan hasil validasi silang
          print('R-squared scores:', scores)
          print('R-squared mean:', scores.mean())
          print('R-squared std:', scores.std())
          R-squared scores: [-49.56715056 -8.25617835 0.66094925 -1.78233726 0.77155577]
          R-squared mean: -11.634632229647334
          R-squared std: 19.248129457175207
In [182... svr.fit(X_train, y_train)
Out[182]: SVR(C=1, epsilon=0.001, gamma=0.001)
In [183... y pred = svr.predict(X test)
In [184... mse = mean_squared_error(y_test, y_pred)
          rmse = np.sqrt(mse)
          mae = mean_absolute_error(y_test, y_pred)
          r2 = r2_score(y_test, y_pred)
          print("Mean Squared Error:", mse)
          print("Root Mean Squared Error:",
          print("Mean Absolute Error:", mae)
          print("R-squared:", r2)
          Mean Squared Error: 182.79947123645465
          Root Mean Squared Error: 13.520335470558955
          Mean Absolute Error: 5.727464023723256
          R-squared: 0.9803987023487981
         C = 1, Epsilon = 0.001, Gamma = 0.0001
In [185... svr = SVR(kernel='rbf', C=1, gamma=0.0001, epsilon=0.001)
In [186... | from sklearn.model_selection import cross_val_score
          scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
In [187…  # Menampilkan hasil validasi silang
          print('R-squared scores:', scores)
          print('R-squared mean:', scores.mean())
print('R-squared std:', scores.std())
          R-squared scores: [-4.03600803 0.70024465 0.93913663 0.09072434 0.92832333]
          R-squared mean: -0.27551581601006764
R-squared std: 1.9053687960508894
In [188... svr.fit(X train, y train)
Out[188]: SVR(C=1, epsilon=0.001, gamma=0.0001)
```

```
In [189... y pred = svr.predict(X test)
```

```
In [190... mse = mean squared error(y test, y pred)
         rmse = np.sqrt(mse)
         mae = mean_absolute_error(y_test, y_pred)
         r2 = r2_score(y_test, y_pred)
         print("Mean Squared Error:", mse)
         print("Root Mean Squared Error:", rmse)
         print("Mean Absolute Error:", mae)
         print("R-squared:", r2)
```

Mean Squared Error: 38.90382732650471 Root Mean Squared Error: 6.237293269239848 Mean Absolute Error: 3.109878984468498 R-squared: 0.9958284042396852

C = 1, Epsilon = 0.0001, Gamma = 0.01

```
In [191... svr = SVR(kernel='rbf', C=1, gamma=0.01, epsilon=0.0001)
In [192... from sklearn.model selection import cross val score
         scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
In [193…  # Menampilkan hasil validasi silang
         print('R-squared scores:', scores)
         print('R-squared mean:', scores.mean())
```

```
print('R-squared std:', scores.std())
         R-squared scores: [-5.87825678e+02 -3.46302438e+02 1.53670161e-01 -5.16508113e+00
           -2.24748602e-01]
         R-squared mean: -187.87285517434216
         R-squared std: 240.42051083438238
In [194... svr.fit(X_train, y_train)
Out[194]: SVR(C=1, epsilon=0.0001, gamma=0.01)
In [195... y pred = svr.predict(X test)
In [196... mse = mean_squared_error(y_test, y_pred)
         rmse = np.sqrt(mse)
         mae = mean absolute error(y test, y pred)
          r2 = r2_score(y_test, y_pred)
         print("Mean Squared Error:", mse)
          print("Root Mean Squared Error:", rmse)
         print("Mean Absolute Error:", mae)
         print("R-squared:", r2)
         Mean Squared Error: 741.4407753078965
         Root Mean Squared Error: 27.229410116781754
         Mean Absolute Error: 13.985395039852294
         R-squared: 0.920496480491735
```

C = 1, Epsilon = 0.0001, Gamma = 0.001

```
In [197... svr = SVR(kernel='rbf', C=1, gamma=0.001, epsilon=0.0001)
In [198. from sklearn.model selection import cross val score
         scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
In [199_ # Menampilkan hasil validasi silang
         print('R-squared scores:', scores)
         print('R-squared mean:', scores.mean())
         print('R-squared std:', scores.std())
         R-squared scores: [-49.55786204 -8.25151954 0.66094538 -1.78222591
                                                                                   0.77154004]
         R-squared mean: -11.63182441353666
         R-squared std: 19.244640920625887
In [200... svr.fit(X train, y train)
Out[200]: SVR(C=1, epsilon=0.0001, gamma=0.001)
In [201... y_pred = svr.predict(X_test)
In [202... mse = mean_squared_error(y_test, y_pred)
         rmse = np.sqrt(mse)
         mae = mean absolute error(y test, y pred)
         r2 = r2 score(y test, y pred)
         print("Mean Squared Error:", mse)
         print("Root Mean Squared Error:", rmse)
         print("Mean Absolute Error:", mae)
         print("R-squared:", r2)
         Mean Squared Error: 182.79846095733873
         Root Mean Squared Error: 13.52029810904104
         Mean Absolute Error: 5.727515103465411
         R-squared: 0.9803988106794269
```

C = 1, Epsilon = 0.0001, Gamma = 0.0001

```
In [203... svr = SVR(kernel='rbf', C=1, gamma=0.0001, epsilon=0.0001)
In [204... from sklearn.model_selection import cross_val_score
    scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
In [205... # Menampilkan hasil validasi silang
    print('R-squared scores:', scores)
    print('R-squared mean:', scores.mean())
    print('R-squared std:', scores.std())
    R-squared scores: [-4.03744063 0.70017422 0.93912643 0.09070414 0.92831405]
    R-squared mean: -0.27582435804590333
    R-squared std: 1.905923822971147
In [206... svr.fit(X_train, y_train)
```

```
In [207_ y pred = svr.predict(X test)
In [208_ mse = mean_squared_error(y_test, y_pred)
         rmse = np.sqrt(mse)
         mae = mean absolute error(y test, y pred)
         r2 = r2_score(y_test, y_pred)
         print("Mean Squared Error:", mse)
         print("Root Mean Squared Error:", rmse)
         print("Mean Absolute Error:", mae)
         print("R-squared:", r2)
         Mean Squared Error: 38.90759830455955
         Root Mean Squared Error: 6.237595554743795
         Mean Absolute Error: 3.1100533373413217
         R-squared: 0.9958279998836835
         C = 10, Epsilon = 0.1, Gamma = 0.1
In [209... svr = SVR(kernel='rbf', C=10, gamma=0.1, epsilon=0.1)
In [210_ from sklearn.model_selection import cross_val_score
         scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
In [211... # Menampilkan hasil validasi silang
         print('R-squared scores:', scores)
         print('R-squared mean:', scores.mean())
         print('R-squared std:', scores.std())
         R-squared scores: [-1.05031499e+03 -1.34444692e+02 -4.29959723e-01 -2.86932334e+00
           4.19898943e-01]
         R-squared mean: -237.52781310430424
         R-squared std: 409.6701690006602
In [212... svr.fit(X_train, y_train)
Out[212]: SVR(C=10, gamma=0.1)
In [213... y_pred = svr.predict(X_test)
In [214... mse = mean_squared_error(y_test, y_pred)
         rmse = np.sqrt(mse)
         mae = mean absolute error(y test, y pred)
         r2 = r2_score(y_test, y_pred)
         print("Mean Squared Error:", mse)
         print("Root Mean Squared Error:",
         print("Mean Absolute Error:", mae)
         print("R-squared:", r2)
         Mean Squared Error: 593.5526798803174
         Root Mean Squared Error: 24.36293660214871
         Mean Absolute Error: 10.931244296627888
         R-squared: 0.9363542866327368
         C = 10, Epsilon = 0.01, Gamma = 0.1
In [215... svr = SVR(kernel='rbf', C=10, gamma=0.1, epsilon=0.01)
In [216... | from sklearn.model_selection import cross_val_score
         scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
In [217_ # Menampilkan hasil validasi silang
         print('R-squared scores:', scores)
         print('R-squared mean:', scores.mean())
print('R-squared std:', scores.std())
         R-squared scores: [-1.05060559e+03 -1.34502140e+02 -4.30287369e-01 -2.86937251e+00
           4.19859900e-01]
         R-squared mean: -237.59750668975545
         R-squared std: 409.78254163583324
In [218... svr.fit(X_train, y_train)
Out[218]: SVR(C=10, epsilon=0.01, gamma=0.1)
In [219... y_pred = svr.predict(X_test)
```

Out[206]: SVR(C=1, epsilon=0.0001, gamma=0.0001)

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C = 10, Epsilon = 0.001, Gamma = 0.1

```
In [221_ svr = SVR(kernel='rbf', C=10, gamma=0.1, epsilon=0.001)
In [222_ from sklearn.model_selection import cross_val_score
          scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
In [223… # Menampilkan hasil validasi silang
          print('R-squared scores:', scores)
          print('R-squared mean:', scores.mean())
print('R-squared std:', scores.std())
          R-squared scores: [-1.05064036e+03 -1.34512996e+02 -4.30352137e-01 -2.86935969e+00
            4.19867295e-01]
          R-squared mean: -237.6066407420929
          R-squared std: 409.79578699352174
In [224... svr.fit(X_train, y_train)
Out[224]: SVR(C=10, epsilon=0.001, gamma=0.1)
In [225... y pred = svr.predict(X test)
In [226... | mse = mean_squared_error(y_test, y_pred)
          rmse = np.sqrt(mse)
          mae = mean absolute error(y test, y pred)
          r2 = r2_score(y_test, y_pred)
          print("Mean Squared Error:", mse)
          print("Root Mean Squared Error:", rmse)
          print("Mean Absolute Error:", mae)
          print("R-squared:", r2)
          Mean Squared Error: 593.5817068018748
          Root Mean Squared Error: 24.363532313724026
          Mean Absolute Error: 10.933022304760422
          R-squared: 0.9363511741219319
```

C = 10, Epsilon = 0.0001, Gamma = 0.1

```
In [227... svr = SVR(kernel='rbf', C=10, gamma=0.1, epsilon=0.0001)
In [228_ from sklearn.model_selection import cross_val_score
          scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
In [229... # Menampilkan hasil validasi silang
          print('R-squared scores:', scores)
          print('R-squared mean:', scores.mean())
print('R-squared std:', scores.std())
          R-squared scores: [-1.05064442e+03 -1.34513291e+02 -4.30354369e-01 -2.86936827e+00
            4.19867335e-01]
          R-squared mean: -237.60751243927356
          R-squared std: 409.79737880763804
In [230... svr.fit(X_train, y_train)
Out[230]: SVR(C=10, epsilon=0.0001, gamma=0.1)
In [231_ y_pred = svr.predict(X_test)
In [232... mse = mean_squared_error(y_test, y_pred)
          rmse = np.sqrt(mse)
          mae = mean absolute error(y test, y pred)
          r2 = r2_score(y_test, y_pred)
          print("Mean Squared Error:", mse)
```

```
print("Root Mean Squared Error:", rmse)
print("Mean Absolute Error:", mae)
print("R-squared:", r2)

Mean Squared Error: 593.5841952362899
Root Mean Squared Error: 24.363583382505333
Mean Absolute Error: 10.933080400771745
R-squared: 0.9363509072910526
```

C = 10, Epsilon = 0.1, Gamma = 0.01

```
In [233... svr = SVR(kernel='rbf', C=10, gamma=0.01, epsilon=0.1)
In [234. from sklearn.model_selection import cross_val_score
         scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
In [235... # Menampilkan hasil validasi silang
         print('R-squared scores:', scores)
         print('R-squared mean:', scores.mean())
         print('R-squared std:', scores.std())
         R-squared scores: [-2.61040766e+02 8.67409039e-01 1.53948446e-01 -1.09361699e-01
           9.41529900e-01]
         R-squared mean: -51.83744811975613
         R-squared std: 104.60243884523832
In [236... svr.fit(X_train, y_train)
Out[236]: SVR(C=10, gamma=0.01)
In [237... y_pred = svr.predict(X_test)
In [238... mse = mean_squared_error(y_test, y_pred)
         rmse = np.sqrt(mse)
         mae = mean_absolute_error(y_test, y_pred)
         r2 = r2_score(y_test, y_pred)
         print("Mean Squared Error:", mse)
         print("Root Mean Squared Error:", rmse)
         print("Mean Absolute Error:", mae)
         print("R-squared:", r2)
         Mean Squared Error: 38.68663553997865
         Root Mean Squared Error: 6.219858160760473
         Mean Absolute Error: 2.600888830648178
         R-squared: 0.9958516933708096
```

C = 10, Epsilon = 0.1, Gamma = 0.001

```
In [239_ svr = SVR(kernel='rbf', C=10, gamma=0.001, epsilon=0.1)
In [240... from sklearn.model selection import cross val score
          scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
In [241… # Menampilkan hasil validasi silang
          print('R-squared scores:', scores)
          print('R-squared mean:', scores.mean())
print('R-squared std:', scores.std())
          R-squared scores: [-5.4196484
                                           0.98078866 0.72022279 0.83709419 0.99152955]
          R-squared mean: -0.37800264310943704
          R-squared std: 2.522803346338801
In [242_ svr.fit(X_train, y_train)
Out[242]: SVR(C=10, gamma=0.001)
In [243... y_pred = svr.predict(X_test)
In [244... mse = mean_squared_error(y_test, y_pred)
          rmse = np.sart(mse)
          mae = mean_absolute_error(y_test, y_pred)
          r2 = r2_score(y_test, y_pred)
          print("Mean Squared Error:", mse)
          print("Root Mean Squared Error:", rmse)
          print("Mean Absolute Error:", mae)
          print("R-squared:", r2)
```

Mean Squared Error: 3.44360923652481 Root Mean Squared Error: 1.8556964289788376 Mean Absolute Error: 1.1049455163286541 R-squared: 0.9996307472380364

C = 10 , Epsilon = 0.1 , Gamma = 0.0001

```
In [245... svr = SVR(kernel='rbf', C=10, gamma=0.01, epsilon=0.1)
In [246... | from sklearn.model_selection import cross_val_score
         scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
In [247... # Menampilkan hasil validasi silang
         print('R-squared scores:', scores)
         print('R-squared mean:', scores.mean())
         print('R-squared std:', scores.std())
         R-squared scores: [-2.61040766e+02 8.67409039e-01 1.53948446e-01 -1.09361699e-01
           9.41529900e-01]
         R-squared mean: -51.83744811975613
         R-squared std: 104.60243884523832
In [248... svr.fit(X_train, y_train)
Out[248]: SVR(C=10, gamma=0.01)
In [249... y_pred = svr.predict(X_test)
In [250... mse = mean_squared_error(y_test, y_pred)
         rmse = np.sqrt(mse)
         mae = mean_absolute_error(y_test, y_pred)
         r2 = r2_score(y_test, y_pred)
         print("Mean Squared Error:", mse)
         print("Root Mean Squared Error:", rmse)
         print("Mean Absolute Error:", mae)
         print("R-squared:", r2)
         Mean Squared Error: 38.68663553997865
         Root Mean Squared Error: 6.219858160760473
         Mean Absolute Error: 2.600888830648178
         R-squared: 0.9958516933708096
         C = 10, Epsilon = 0.01, Gamma = 0.01
In [251  svr = SVR(kernel='rbf', C=10, gamma=0.01, epsilon=0.01)
```

```
In [252_ from sklearn.model_selection import cross_val_score
          scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
In [253... # Menampilkan hasil validasi silang
          print('R-squared scores:', scores)
          print('R-squared mean:', scores.mean())
print('R-squared std:', scores.std())
          R-squared scores: [-2.58859001e+02 8.67131761e-01 1.54504214e-01 -1.11686868e-01
            9.41400949e-01]
          R-squared mean: -51.40153010013919
          R-squared std: 103.7295234589222
In [254... svr.fit(X_train, y_train)
Out[254]: SVR(C=10, epsilon=0.01, gamma=0.01)
In [255... y_pred = svr.predict(X_test)
In [256... mse = mean_squared_error(y_test, y_pred)
          rmse = np.sqrt(mse)
          mae = mean absolute error(y test, y pred)
          r2 = r2_score(y_test, y_pred)
          print("Mean Squared Error:", mse)
          print("Root Mean Squared Error:",
          print("Mean Absolute Error:", mae)
          print("R-squared:", r2)
          Mean Squared Error: 38.56972078868568
          Root Mean Squared Error: 6.210452542986355
          Mean Absolute Error: 2.5978530401191806
          R-squared: 0.9958642299543369
```

C = 10, Epsilon = 0.01, Gamma = 0.001

```
In [257... svr = SVR(kernel='rbf', C=10, gamma=0.001, epsilon=0.01)
In [258... from sklearn.model_selection import cross_val_score
          scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
In [259... # Menampilkan hasil validasi silang
         print('R-squared scores:', scores)
         print('R-squared mean:', scores.mean())
          print('R-squared std:', scores.std())
         R-squared scores: [-5.3142368 0.98 R-squared mean: -0.3565647424823163
                                         0.98124224 0.72055152 0.83811179 0.99150755]
         R-squared std: 2.480845425177572
In [260... svr.fit(X_train, y_train)
Out[260]: SVR(C=10, epsilon=0.01, gamma=0.001)
In [261... y_pred = svr.predict(X_test)
In [262... mse = mean_squared_error(y_test, y_pred)
         rmse = np.sqrt(mse)
         mae = mean absolute error(y test, y pred)
         r2 = r2_score(y_test, y_pred)
         print("Mean Squared Error:", mse)
         print("Root Mean Squared Error:", rmse)
         print("Mean Absolute Error:", mae)
         print("R-squared:", r2)
         Mean Squared Error: 3.431406507378138
         Root Mean Squared Error: 1.8524056001259923
         Mean Absolute Error: 1.1030264339302216
         R-squared: 0.9996320557173473
         C = 10, Epsilon = 0.01, Gamma = 0.0001
In [263... svr = SVR(kernel='rbf', C=10, gamma=0.0001, epsilon=0.01)
In [264... from sklearn.model selection import cross val score
         scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
In [265... # Menampilkan hasil validasi silang
         print('R-squared scores:', scores)
         print('R-squared mean:', scores.mean())
         print('R-squared std:', scores.std())
         R-squared scores: [0.55393612 0.96222393 0.99152583 0.94088271 0.99063584]
         R-squared mean: 0.8878408890550741
         R-squared std: 0.16802144990605025
In [266... svr.fit(X_train, y_train)
Out[266]: SVR(C=10, epsilon=0.01, gamma=0.0001)
In [267... y_pred = svr.predict(X_test)
In [268... mse = mean_squared_error(y_test, y_pred)
         rmse = np.sqrt(mse)
         mae = mean_absolute_error(y_test, y_pred)
         r2 = r2_score(y_test, y_pred)
         print("Mean Squared Error:", mse)
         print("Root Mean Squared Error:", rmse)
          print("Mean Absolute Error:", mae)
         print("R-squared:", r2)
         Mean Squared Error: 4.514465332460753
         Root Mean Squared Error: 2.124727119528706
```

C = 10, Epsilon = 0.001, Gamma = 0.01

Mean Absolute Error: 1.3212154822135076

R-squared: 0.9995159210356624

```
In [271…  # Menampilkan hasil validasi silang
          print('R-squared scores:', scores)
          print('R-squared mean:', scores.mean())
print('R-squared std:', scores.std())
          R-squared scores: [-2.58931194e+02 8.67403505e-01 1.54287836e-01 -1.12007780e-01
            9.41414579e-01]
          R-squared mean: -51.4160191837561
          R-squared std: 103.75837615735776
In [272... svr.fit(X_train, y_train)
Out[272]: SVR(C=10, epsilon=0.001, gamma=0.01)
In [273... y_pred = svr.predict(X_test)
In [274... mse = mean_squared_error(y_test, y_pred)
          rmse = np.sqrt(mse)
          mae = mean_absolute_error(y_test, y_pred)
          r2 = r2_score(y_test, y_pred)
          print("Mean Squared Error:", mse)
          print("Root Mean Squared Error:", rmse)
          print("Mean Absolute Error:", mae)
          print("R-squared:", r2)
          Mean Squared Error: 38.58944369927392
          Root Mean Squared Error: 6.212040220352241
          Mean Absolute Error: 2.598992798053232
          R-squared: 0.9958621150978859
```

C = 10, Epsilon = 0.001, Gamma = 0.001

```
In [275... svr = SVR(kernel='rbf', C=10, gamma=0.001, epsilon=0.001)
In [276... | from sklearn.model_selection import cross_val_score
          scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
In [277... # Menampilkan hasil validasi silang
         print('R-squared scores:', scores)
         print('R-squared mean:', scores.mean())
         print('R-squared std:', scores.std())
         R-squared scores: [-5.37618925 0.98107087 0.72060018 0.83817171 0.99150593]
         R-squared mean: -0.36896811015586917
         R-squared std: 2.5055978962028393
In [278... svr.fit(X_train, y_train)
Out[278]: SVR(C=10, epsilon=0.001, gamma=0.001)
In [279... y pred = svr.predict(X test)
In [280... | mse = mean_squared_error(y_test, y_pred)
         rmse = np.sqrt(mse)
         mae = mean_absolute_error(y_test, y_pred)
         r2 = r2_score(y_test, y_pred)
         print("Mean Squared Error:", mse)
         print("Root Mean Squared Error:", rmse)
         print("Mean Absolute Error:", mae)
         print("R-squared:", r2)
         Mean Squared Error: 3.4288990348301756
         Root Mean Squared Error: 1.8517286612325725
         Mean Absolute Error: 1.103194643733742
```

R-squared: 0.9996323245896555

C = 10, Epsilon = 0.001, Gamma = 0.0001

```
In [281_ svr = SVR(kernel='rbf', C=10, gamma=0.0001, epsilon=0.001)
In [282... from sklearn.model_selection import cross_val_score
           scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
In [283…  # Menampilkan hasil validasi silang
          print('R-squared scores:', scores)
          print('R-squared mean:', scores.mean())
print('R-squared std:', scores.std())
```

```
R-squared scores: [0.55858489 0.96282835 0.99149878 0.94073362 0.99064381]
         R-squared mean: 0.888857891124253
         R-squared std: 0.16621582413407984
In [284_ svr.fit(X_train, y_train)
Out[284]: SVR(C=10, epsilon=0.001, gamma=0.0001)
In [285... y_pred = svr.predict(X_test)
In [286... mse = mean_squared_error(y_test, y_pred)
         rmse = np.sqrt(mse)
         mae = mean absolute error(y test, y pred)
         r2 = r2_score(y_test, y_pred)
         print("Mean Squared Error:", mse)
         print("Root Mean Squared Error:", rmse)
         print("Mean Absolute Error:", mae)
         print("R-squared:", r2)
         Mean Squared Error: 4.543810374860177
         Root Mean Squared Error: 2.1316215364975504
         Mean Absolute Error: 1.324803154624826
         R-squared: 0.9995127744132638
         C = 10, Epsilon = 0.0001, Gamma = 0.01
In [287... svr = SVR(kernel='rbf', C=10, gamma=0.01, epsilon=0.0001)
In [288... from sklearn.model selection import cross val score
         scores = cross_val_score(svr, X, y, cv=5, scoring='r2')
In [289... # Menampilkan hasil validasi silang
         print('R-squared scores:', scores)
         print('R-squared mean:', scores.mean())
         print('R-squared std:', scores.std())
         R-squared scores: [-2.58920447e+02 8.67422665e-01 1.54297664e-01 -1.12060191e-01
           9.41416067e-01]
         R-squared mean: -51.41387416435939
         R-squared std: 103.7540752521381
In [290... svr.fit(X_train, y_train)
Out[290]: SVR(C=10, epsilon=0.0001, gamma=0.01)
In [291... y_pred = svr.predict(X_test)
In [292... mse = mean_squared_error(y_test, y_pred)
         rmse = np.sqrt(mse)
```

```
R-squared: 0.9958619009741032

In [293... from sklearn.model_selection import train_test_split
X_train, X_test, y_train, y_test = train_test_split(X, y, test_size=0.2, random_state=42)
```

Hasil dengan Error Terkecil

mae = mean absolute error(y test, y pred)

Mean Squared Error: 38.591440593303844 Root Mean Squared Error: 6.212200945985557 Mean Absolute Error: 2.599068906516067

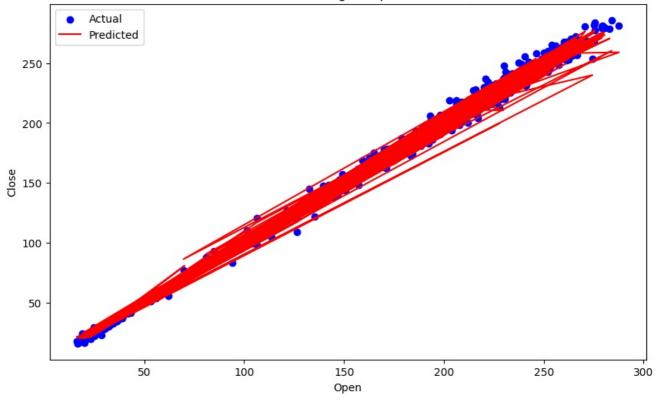
r2 = r2_score(y_test, y_pred)
print("Mean Squared Error:", mse)
print("Root Mean Squared Error:", rmse)
print("Mean Absolute Error:", mae)

print("R-squared:", r2)

C = 10, Epsilon = 0.001, Gamma = 0.001

```
R-squared scores: [-5.37618925 0.98107087 0.72060018 0.83817171 0.99150593]
          R-squared mean: -0.36896811015586917
          R-squared std: 2.5055978962028393
In [297... svr.fit(X_train, y_train)
Out[297]: SVR(C=10, epsilon=0.001, gamma=0.001)
In [298... y pred = svr.predict(X test)
In [299...
          mse = mean squared error(y test, y pred)
          rmse = np.sqrt(mse)
          mae = mean_absolute_error(y_test, y_pred)
          r2 = r2_score(y_test, y_pred)
          print("Mean Squared Error:", mse)
          print("Root Mean Squared Error:", rmse)
          print("Mean Absolute Error:", mae)
          print("R-squared:", r2)
         Mean Squared Error: 3.4288990348301756
Root Mean Squared Error: 1.8517286612325725
          Mean Absolute Error: 1.103194643733742
          R-squared: 0.9996323245896555
y train pred = svr.predict(X train)
          y_test_pred = svr.predict(X_test)
          # Menghitung koefisien determinasi (R-squared) untuk data latih dan data uji
          r_squared_train = r2_score(y_train, y_train_pred)
          r_squared_test = r2_score(y_test, y_test_pred)
          print("Koefisien Determinasi (R-squared) untuk Data Latih:", r squared train)
          print("Koefisien Determinasi (R-squared) untuk Data Uji:", r squared test)
          Koefisien Determinasi (R-squared) untuk Data Latih: 0.999436928173908
          Koefisien Determinasi (R-squared) untuk Data Uji: 0.9996323245896555
In [301… # Visualisasi data training
          plt.figure(figsize=(10, 6))
          plt.scatter(X_train[:, 0], y_train, color='blue', label='Actual')
plt.plot(X_train[:, 0], y_train_pred, color='red', label='Predicted')
          plt.title('SVR - Data Training (R-squared = {:.2f})'.format(r_squared_train))
          plt.xlabel('Open')
          plt.ylabel('Close')
          plt.legend()
          plt.show()
```

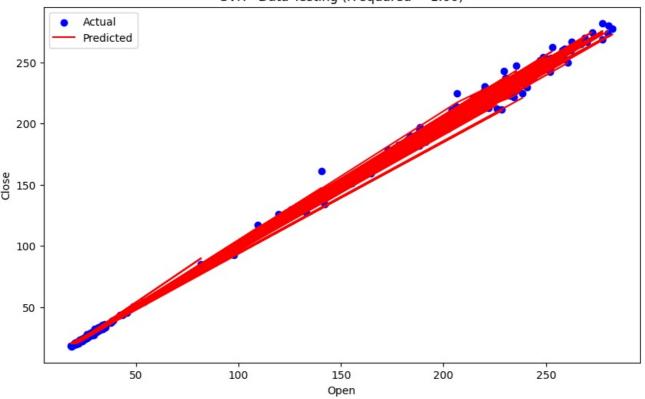




```
In [302... # Visualisasi data testing
              plt.figure(figsize=(10, 6))
              plt.scatter(X_test[:, 0], y_test, color='blue', label='Actual')
plt.plot(X_test[:, 0], y_test_pred, color='red', label='Predicted')
```

```
plt.title('SVR - Data Testing (R-squared = {:.2f})'.format(r_squared_test))
plt.xlabel('Open')
plt.ylabel('Close')
plt.legend()
plt.show()
```

SVR - Data Testing (R-squared = 1.00)

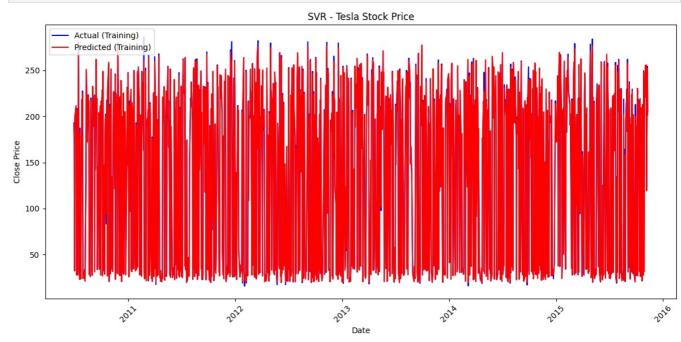


```
In [303... tesla['Date'] = pd.to_datetime(tesla['Date'])

In [304... # Visualisasi tren perubahan harga saham
    plt.figure(figsize=(12, 6))

# Plot data training
    plt.plot(tesla['Date'].iloc[:len(X_train)], y_train, color='blue', label='Actual (Training)')
    plt.plot(tesla['Date'].iloc[:len(X_train)], y_train_pred, color='red', label='Predicted (Training)')

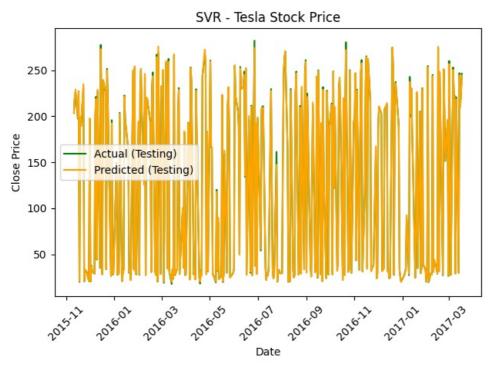
    plt.title('SVR - Tesla Stock Price')
    plt.xlabel('Date')
    plt.ylabel('Close Price')
    plt.ylabel('Close Price')
    plt.ticks(rotation=45)
    plt.tight_layout()
    plt.show()
```



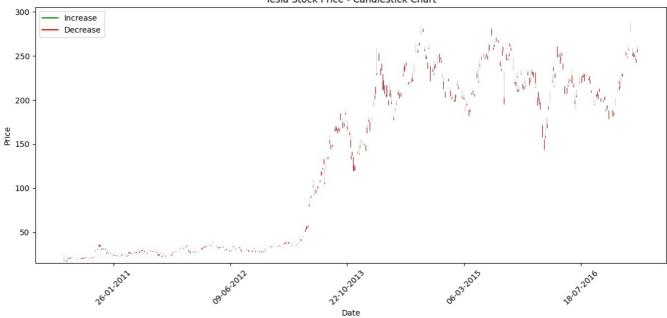
```
In [305... # Plot data testing
plt.plot(tesla['Date'].iloc[-len(X_test):], y_test, color='green', label='Actual (Testing)')
```

```
plt.plot(tesla['Date'].iloc[-len(X_test):], y_test_pred, color='orange', label='Predicted (Testing)')

plt.title('SVR - Tesla Stock Price')
plt.xlabel('Date')
plt.ylabel('Close Price')
plt.legend()
plt.xticks(rotation=45)
plt.tight_layout()
plt.show()
```



```
In [306...
         import matplotlib.dates as mpl_dates
         # Menggabungkan kolom 'Date' dengan fitur lainnya
         ohlc = tesla[['Date', 'Open', 'High', 'Low', 'Close']].values
         # Membuat grafik saham dengan candlestick chart
         fig, ax = plt.subplots(figsize=(12, 6))
         candlestick_data = np.column_stack((mpl_dates.date2num(ohlc[:, 0]), ohlc[:, 1:]))
         ax.plot([], [], color='green', label='Increase')
         ax.plot([], [], color='red', label='Decrease')
         ax.legend()
         candlestick width = 0.6
         ax.bar(ohlc[:,\ 0],\ ohlc[:,\ 3]\ -\ ohlc[:,\ 1],\ width=candlestick\_width,\ bottom=ohlc[:,\ 1],\ color=np.where(ohlc[:,\ 1])
         ax.bar(ohlc[:, 0], ohlc[:, 2] - ohlc[:, 3], width=candlestick_width, bottom=ohlc[:, 3], color='black', alpha=0.
         ax.xaxis.set major locator(plt.MaxNLocator(6))
         ax.xaxis.set_major_formatter(mpl_dates.DateFormatter('%d-%m-%Y'))
         plt.xticks(rotation=45)
         plt.title('Tesla Stock Price - Candlestick Chart')
         plt.xlabel('Date')
         plt.ylabel('Price')
         plt.tight layout()
         plt.show()
```



Linear

```
In [307...
         svr = SVR(kernel='linear', C=0.1, gamma=0.1)
In [308_ svr.fit(X_train, y_train)
Out[308]: SVR(C=0.1, gamma=0.1, kernel='linear')
In [309_ y pred = svr.predict(X test)
In [310_ mse = mean_squared_error(y_test, y_pred)
         rmse = np.sqrt(mse)
         mae = mean_absolute_error(y_test, y_pred)
         r2 = r2_score(y_test, y_pred)
         print("Mean Squared Error:", mse)
         print("Root Mean Squared Error:", rmse)
         print("Mean Absolute Error:", mae)
         print("R-squared:", r2)
         Mean Squared Error: 1.8688319110334317
         Root Mean Squared Error: 1.3670522707758588
         Mean Absolute Error: 0.9056468396128907
         R-squared: 0.999799608115382
```

Polynomial

```
In [311... svr = SVR(kernel='poly', C=0.1, gamma=0.1)
In [312... svr.fit(X_train, y_train)
Out[312]: SVR(C=0.1, gamma=0.1, kernel='poly')
In [313... y_pred = svr.predict(X_test)
In [314... mse = mean_squared_error(y_test, y_pred)
    rmse = np.sqrt(mse)
    r2 = r2_score(y_test, y_pred)
    print("Mean Squared Error:", mse)
    print("Root Mean Squared Error:", rmse)
    print("R-squared:", r2)

Mean Squared Error: 413728616.07087857
    Root Mean Squared Error: 20340.3199598944
    R-squared: -44362.46393986655
```

Sigmoid

```
In [315... svr = SVR(kernel='sigmoid', C=0.1, gamma=0.1)
In [316... svr.fit(X_train, y_train)
```

```
Out[316]: SVR(C=0.1, gamma=0.1, kernel='sigmoid')
In [317... y_pred = svr.predict(X_test)
In [318... mse = mean_squared_error(y_test, y_pred)
    rmse = np.sqrt(mse)
    r2 = r2_score(y_test, y_pred)
    print("Mean Squared Error:", mse)
    print("Root Mean Squared Error:", rmse)
    print("R-squared:", r2)

Mean Squared Error: 10992.334070999796
Root Mean Squared Error: 104.8443325649975
```

Kesimpulan

R-squared: -0.1786905648562198

Setelah melakukan analisis, dapat disimpulkan bahwa model SVR terbaik menggunakan fungsi kernel RBF dengan parameter C = 10, gamma = 0,001, dan epsilon = 0,001. Model ini memiliki tingkat akurasi yang cukup tinggi, yaitu 99,94% untuk data training dan 99,96% untuk data testing, sehingga dapat diandalkan dalam memprediksi harga saham Tesla.

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