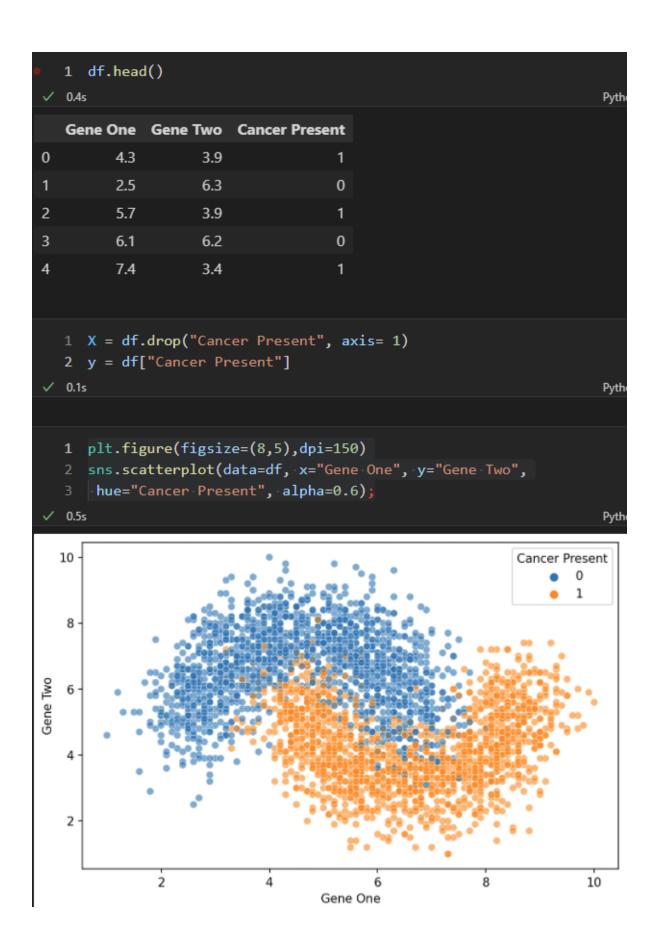


▼ Data Structure

Data & Scatter



 zoomed Plot style="Cancer Present": cancerr presetnt olanları x ve o olarak ayırır.

```
1 plt.figure(figsize=(8,5),dpi=150)
      sns.scatterplot(data=df, x="Gene One", y="Gene Two",
      hue="Cancer Present", alpha=0.7, style="Cancer Present")
   4 plt.xlim(2,6)
   5 plt.ylim(4,8)
✓ 0.8s
                                                                             Pytho
(4.0, 8.0)
   8.0
        Cancer Present
   7.5
   7.0
   6.5
Gene Two
   6.0
   5.5
   4.5
                                         4.0
     2.0
              2.5
                       3.0
                                3.5
                                                  4.5
                                                           5.0
                                                                    5.5
                                                                             6.0
                                      Gene One
```

pair plot

```
1 plt.figure(figsize=(8,5),dpi=150)
    2 sns.pairplot(data=df, hue="Cancer Present")
 ✓ 4.3s
<seaborn.axisgrid.PairGrid at 0x1f10db485e0>
<Figure size 1200x750 with 0 Axes>
  10 -
   8
Gene One
   6 -
   4
   2
                                                Cancer Present
  10
                                                       1
   8
Gene Two
   2
                      10
            Gene One
                                 Gene Two
```

▼ Model Preparing

scalerization

KNN Model

accuracy and Results

```
1 from sklearn.metrics import classification_report, confusion_matrix
 ✓ 0.1s
   1 confusion_matrix(y_test,y_pred)
 ✓ 0.8s
array([[420, 50],
       [ 47, 383]], dtype=int64)
   1 print(classification_report(y_test, y_pred))
 ✓ 0.2s
              precision
                           recall f1-score
                                              support
           0
                   0.90
                             0.89
                                       0.90
                                                  470
           1
                   0.88
                             0.89
                                       0.89
                                                  430
    accuracy
                                       0.89
                                                  900
                                       0.89
   macro avg
                  0.89
                             0.89
                                                  900
weighted avg
                                       0.89
                                                  900
                   0.89
                             0.89
```

▼ Choosing K

accuracy and import

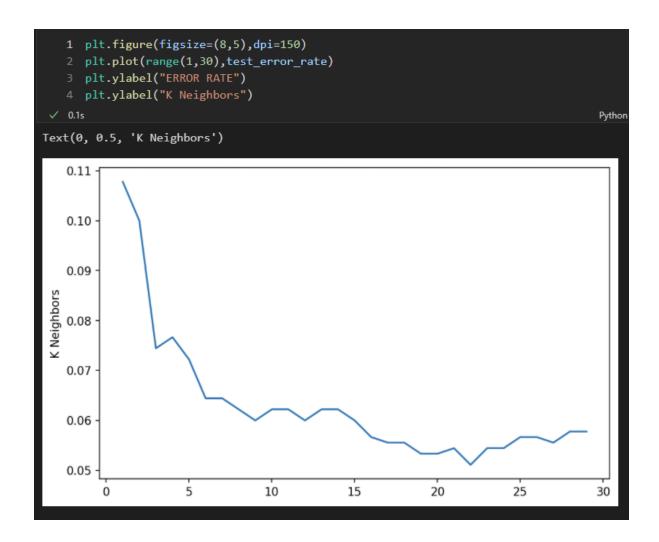
K Choosing Func

```
1 test_error_rate =[]
   3 \vee \text{for } k \text{ in range}(1,30):
         knn_model = KNeighborsClassifier(n_neighbors=k)
         knn_model.fit(scaled_X_Train,y_train)
         y_pred_test = knn_model.predict(scaled_X_Test)
         test_error = 1 - accuracy_score(y_test, y_pred_test)
         test_error_rate.append(test_error)
 √ 1.5s
   1 test_error_rate

√ 0.5s

Output exceeds the size limit. Open the full output data in a text editor
[0.1077777777777775,
0.099999999999998,
0.0722222222222219,
0.0622222222222218,
0.060000000000000005,
0.0622222222222218,
0.0622222222222218,
0.060000000000000005,
0.0622222222222218,
0.0622222222222218,
0.0600000000000000005,
```

• Elbow (Best K neighbor num)



▼ Pipeline

• scalarization and parameters

Grid Search cv

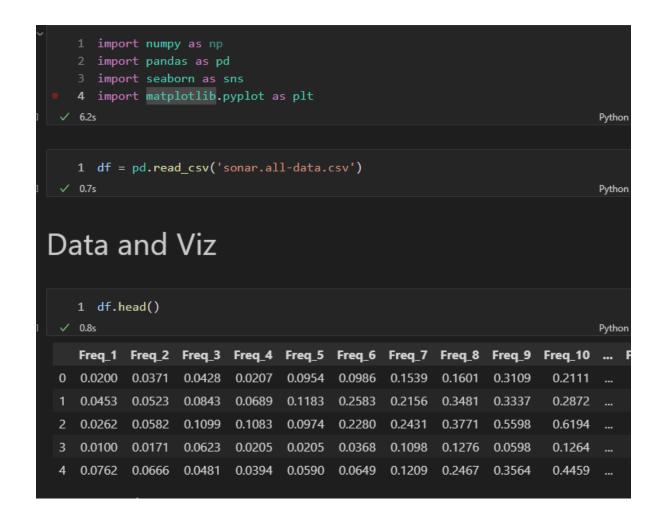
```
1 from sklearn.pipeline import Pipeline
 ✓ 0.2s
   1 pipe = Pipeline(operations)
 ✓ 0.8s
                                 + Code
                                         + Markdown
   1 from sklearn.model selection import GridSearchCV
 ✓ 0.3s
   1 k_values = list(range(1,20))
   2 k_values
✓ 0.1s
[1, 2, 3, 4, 5, 6, 7, 8, 9, 10, 11, 12, 13, 14, 15, 16, 17, 18, 19]
   1 param_grid = {'knn__n_neighbors': k_values}
 ✓ 0.6s
   1 full_cv_classifier = GridSearchCV(pipe, param_grid, cv=5, scoring="accuracy")
 ✓ 0.1s
   1 full_cv_classifier.fit(X_train,y_train)
 ✓ 2.9s
GridSearchCV(cv=5,
             estimator=Pipeline(steps=[('scaler', StandardScaler()),
                                       ('knn', KNeighborsClassifier())]),
             param_grid={'knn__n_neighbors': [1, 2, 3, 4, 5, 6, 7, 8, 9, 10, 11,
                                              12, 13, 14, 15, 16, 17, 18, 19]},
             scoring='accuracy')
```

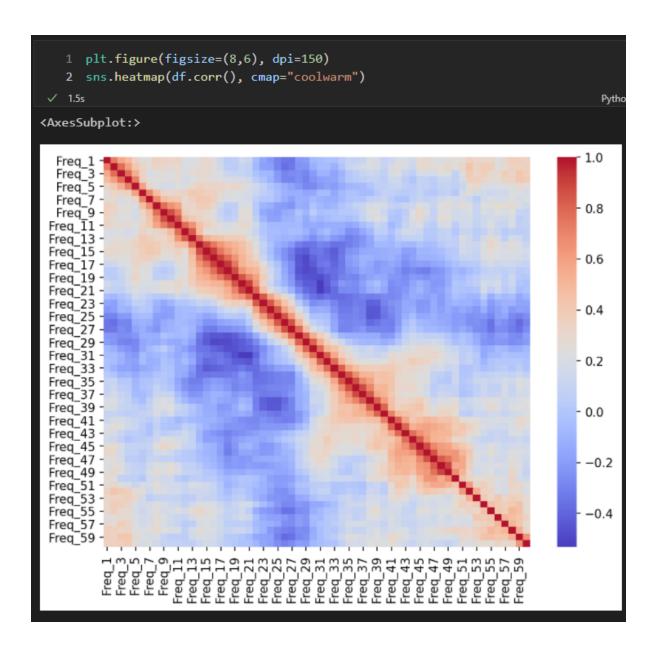
best parameters

```
1 full cv classifier.best estimator .get params()
 ✓ 0.9s
{'memory': None,
 'steps': [('scaler', StandardScaler()),
  ('knn', KNeighborsClassifier(n_neighbors=14))],
 'verbose': False,
 'scaler': StandardScaler(),
 'knn': KNeighborsClassifier(n_neighbors=14),
 'scaler copy': True,
 'scaler with mean': True,
 'scaler with std': True,
 'knn__algorithm': 'auto',
 'knn leaf size': 30,
 'knn metric': 'minkowski',
 'knn metric params': None,
 'knn n jobs': None,
 'knn__n_neighbors': 14,
 'knn p': 2,
 'knn__weights': 'uniform'}
   1 full pred = full cv classifier.predict(X test)
 ✓ 0.1s
   1 print(classification report(y test,full pred))
 ✓ 0.9s
              precision
                           recall f1-score
                                              support
           0
                   0.93
                             0.95
                                       0.94
                                                  470
           1
                   0.95
                             0.92
                                       0.93
                                                  430
                                       0.94
                                                  900
    accuracy
   macro avg
                   0.94
                             0.94
                                       0.94
                                                  900
weighted avg
                             0.94
                                       0.94
                   0.94
                                                  900
```

• Predicted Example

▼ Project





```
1 df["Target"] = df["Label"].map({"R":0,"M":1})
✓ 0.4s
                                                                             Python
   1 df.head()
✓ 0.6s
                                                                             Python
   Freq_1 Freq_2 Freq_3 Freq_4 Freq_5 Freq_6 Freq_7 Freq_8 Freq_9 Freq_10 ...
0 0.0200 0.0371 0.0428 0.0207 0.0954 0.0986 0.1539 0.1601 0.3109
                                                                       0.2111 ...
1 0.0453 0.0523 0.0843 0.0689 0.1183 0.2583 0.2156 0.3481 0.3337
                                                                       0.2872
2 0.0262 0.0582 0.1099 0.1083 0.0974 0.2280
                                               0.2431 0.3771 0.5598
                                                                       0.6194 ...
   0.0100 0.0171 0.0623 0.0205
                                0.0205 0.0368
                                               0.1098 0.1276 0.0598
                                                                       0.1264
                                                                       0.4459 ...
  0.0762 0.0666 0.0481 0.0394 0.0590 0.0649 0.1209 0.2467 0.3564
5 rows × 62 columns
```

```
1 df.corr()["Target"].sort_values()
 ✓ 0.6s
Freq_36
         -0.269151
Freq_35
         -0.227670
Freq_37
        -0.209055
Freq_34
         -0.172010
Freq_31
         -0.110728
Freq_10
         0.341142
Freq_49
        0.351312
Freq_12
          0.392245
Freq_11
          0.432855
          1.000000
Target
Name: Target, Length: 61, dtype: float64
```

```
1 from sklearn.model_selection import train_test_split
0.6s
1 X=df.drop(["Target","Label"], axis=1)
2 y=df["Label"]
0.4s
1 X_cv, X_test, y_cv, y_test = train_test_split(X, y, test_size=0.1, random_state=42)
1 from sklearn.neighbors import KNeighborsClassifier
2 from sklearn.preprocessing import StandardScaler
1 scaler = StandardScaler()
0.5s
1 knn = KNeighborsClassifier()
1 operations = [("scaler", scaler), ("knn", knn)]
0.3s
1 from sklearn.pipeline import Pipeline
0.4s
1 pipe = Pipeline(operations)
```

```
1 from sklearn.model_selection import GridSearchCV
✓ 0.4s
   1 k_values = list(range(1,30))
✓ 0.4s
   1 param_grid = {"knn__n_neighbors" : k_values}
✓ 0.6s
   1 full_cv_classifier = GridSearchCV(pipe,param_grid,cv=5,scoring="accuracy" )
   1 full_cv_classifier.fit(X_cv,y_cv)
✓ 1.9s
GridSearchCV(cv=5,
            estimator=Pipeline(steps=[('scaler', StandardScaler()),
                                       ('knn', KNeighborsClassifier())]),
            param_grid={'knn__n_neighbors': [1, 2, 3, 4, 5, 6, 7, 8, 9, 10, 11,
                                              12, 13, 14, 15, 16, 17, 18, 19,
                                              20, 21, 22, 23, 24, 25, 26, 27,
                                              28, 29]},
            scoring='accuracy')
```

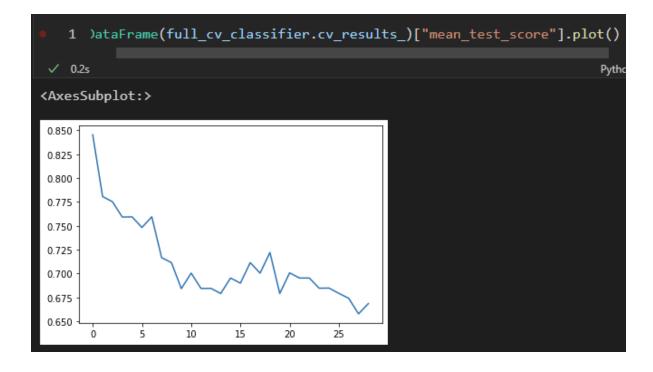
• en iyi parametre değerleri

```
1 full_cv_classifier.best_estimator_.get_params()
✓ 0.4s
{'memory': None,
 'steps': [('scaler', StandardScaler()),
 ('knn', KNeighborsClassifier(n_neighbors=1))],
 'verbose': False,
 'scaler': StandardScaler(),
 'knn': KNeighborsClassifier(n_neighbors=1),
 'scaler_copy': True,
 'scaler with mean': True,
 'scaler with std': True,
 'knn algorithm': 'auto',
 'knn leaf_size': 30,
 'knn metric': 'minkowski',
 'knn metric params': None,
 'knn__n_jobs': None,
 'knn__n_neighbors': 1,
 'knn_p': 2,
 'knn_weights': 'uniform'}
```

• sonuçları DF'ye çevirme

	1 pd.DataFrame(full_cv_classifier.cv_results_) ✓ 0.9s				
	mean_fit_time	std_fit_time	mean_score_time	std_score_time	
0	0.008377	0.000489	0.007380	0.004351	
1	0.006981	0.001092	0.005585	0.001018	
2	0.005784	0.001466	0.003989	0.000892	
3	0.006981	0.001093	0.004788	0.000977	
4	0.004987	0.001093	0.004588	0.001353	
_	0.005505	0.001630	0.004300	0.000700	

• ortalama test sonucu plotu



• aynısı ama daha şeqil

```
1 plt.figure(figsize=(9,6), dpi=150)
      scores = full_cv_classifier.cv_results_['mean_test_score']
      plt.plot(k_values,scores,'o-')
      plt.xlabel("K")
   5 plt.ylabel("Accuracy")
                                                                               Pythor
Text(0, 0.5, 'Accuracy')
   0.850
   0.825
   0.800 -
   0.775
Accuracy
0.750
   0.725
   0.700
   0.675
   0.650 -
                                10
                                           15
                                                                   25
                    5
                                                        20
                                                                                30
```

Evaluation 1 y_pred = full_cv_classifier.predict(X_test) Pytho 1 from sklearn.metrics import classification_report,confusion_matrix ✓ 0.3s Pytho 1 confusion_matrix(y_test,y_pred) ✓ 0.9s Pytho array([[12, 1], [1, 7]], dtype=int64) 1 print(classification_report(y_test,y_pred)) ✓ 0.9s Pytho precision recall f1-score support 0.92 М 0.92 0.92 13 0.88 0.88 0.88 8 21 0.90 accuracy 21 macro avg 0.90 0.90 0.90 weighted avg 0.90 0.90 0.90 21