

```
In [1]: from warnings import filterwarnings
filterwarnings('ignore')
```

```
In [2]: import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sns
from sklearn.preprocessing import scale
from sklearn.model_selection import train_test_split, GridSearchCV, cross_val_score
from sklearn.metrics import accuracy_score, f1_score, precision_score, recall_score, classification_report, con
from sklearn.metrics import roc_auc_score, roc_curve
from sklearn.linear_model import LogisticRegression
from sklearn.naive_bayes import GaussianNB
from sklearn.neighbors import KNeighborsClassifier
from sklearn.svm import SVC
from sklearn.neural_network import MLPClassifier
from sklearn import tree
from sklearn.tree import DecisionTreeClassifier
from sklearn.ensemble import RandomForestClassifier
from sklearn.ensemble import GradientBoostingClassifier
from xgboost import XGBClassifier
from lightgbm import LGBMClassifier
from catboost import CatBoostClassifier
import os
```

```
In [3]: df = pd.read_csv('cleaning_data.csv')
df.head()
```

```
Out[3]:
```

	BataryaGucu	Bluetooth	MikroislemciHizi	CiftHat	OnKameraMP	4G	DahiliBellek	Kalinlik	Agirlik	CekirdekSayisi	ArkaKameraMP	Cozun
0	1325	1	1.9	1	2.0	1	50	0.1	146	1	10	
1	1046	0	2.8	0	0.0	0	58	0.2	100	8	0	
2	843	1	1.3	0	1.0	1	16	0.9	119	7	4	
3	894	1	0.5	0	1.0	0	50	0.5	199	3	14	
4	936	1	1.0	1	1.0	1	18	0.2	153	3	18	

```
In [4]: df.info()
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 2000 entries, 0 to 1999
Data columns (total 19 columns):
#   Column                                Non-Null Count  Dtype
---  -
0   BataryaGucu                          2000 non-null   int64
1   Bluetooth                            2000 non-null   int64
2   MikroislemciHizi                     2000 non-null   float64
3   CiftHat                              2000 non-null   int64
4   OnKameraMP                           2000 non-null   float64
5   4G                                    2000 non-null   int64
6   DahiliBellek                         2000 non-null   int64
7   Kalinlik                             2000 non-null   float64
8   Agirlik                              2000 non-null   int64
9   CekirdekSayisi                       2000 non-null   int64
10  ArkaKameraMP                         2000 non-null   int64
11  CozunurlukYukseklk                  2000 non-null   int64
12  CozunurlukGenislik                   2000 non-null   int64
13  RAM                                  2000 non-null   float64
14  BataryaOmru                          2000 non-null   int64
15  3G                                    2000 non-null   int64
16  Dokunmatik                           2000 non-null   int64
17  WiFi                                  2000 non-null   int64
18  FiyatAraligi                         2000 non-null   int64
dtypes: float64(4), int64(15)
memory usage: 297.0 KB
```

```
In [5]: df.corr()
```

Out[5]:		BataryaGucu	Bluetooth	MikroislemciHizi	CiftHat	OnKameraMP	4G	DahiliBellek	Kalinlik	Agirlik	Cekirde
	BataryaGucu	1.000000	-0.011252	0.011482	0.041847	0.032192	-0.015665	-0.004004	0.034085	0.001844	-0
	Bluetooth	-0.011252	1.000000	-0.021419	0.035198	-0.002186	0.013443	-0.041177	-0.004049	0.008605	-0
	MikroislemciHizi	0.011482	-0.021419	1.000000	0.001315	-0.000246	0.043073	0.006545	-0.014364	0.012350	-0
	CiftHat	0.041847	0.035198	0.001315	1.000000	0.028692	0.003187	0.015679	0.022142	0.008979	0
	OnKameraMP	0.032192	-0.002186	-0.000246	0.028692	1.000000	0.017030	-0.028572	-0.001774	0.024632	-0
	4G	-0.015665	0.013443	0.043073	0.003187	0.017030	1.000000	-0.008690	0.001823	0.016537	0
	DahiliBellek	-0.004004	-0.041177	0.006545	0.015679	-0.028572	-0.008690	1.000000	0.006886	-0.034214	-0
	Kalinlik	0.034085	-0.004049	-0.014364	0.022142	-0.001774	0.001823	0.006886	1.000000	0.021756	-0
	Agirlik	0.001844	0.008605	0.012350	0.008979	0.024632	0.016537	-0.034214	0.021756	1.000000	-0
	CekirdekSayisi	-0.029727	-0.036161	-0.005724	0.024658	-0.013685	0.029706	-0.028310	-0.003504	-0.018989	1
	ArkaKameraMP	0.031441	0.009952	-0.005245	0.017143	0.644543	0.005598	-0.033273	0.026282	0.018844	-0
	CozunurlukYükseklik	0.014901	0.006872	-0.014523	0.020875	-0.010676	0.019236	0.010441	0.025263	0.000939	-0
	CozunurlukGenislik	-0.008402	0.041533	-0.009476	-0.014291	-0.005633	-0.007448	-0.008335	0.023566	0.000090	0
	RAM	0.001017	-0.025398	0.003289	-0.041740	0.013733	-0.006855	0.033154	-0.009837	-0.004101	0
	BataryaOmru	0.052510	-0.013934	-0.011432	0.039404	-0.007037	0.046628	-0.002790	0.017003	0.006209	0
	3G	-0.011522	-0.030236	0.046433	-0.014008	-0.002083	0.584246	0.009366	0.012065	-0.001551	0
	Dokunmatik	0.010516	0.010061	-0.019756	-0.017117	0.014375	0.016758	0.026999	0.002638	0.014368	-0
	WiFi	0.008343	-0.021863	0.024471	0.022740	-0.021473	-0.017620	-0.006993	0.028353	0.000409	0
	FiyatAraligi	-0.123526	0.006261	0.004029	0.003131	-0.030718	-0.010295	-0.006767	0.007832	-0.015783	-0

# Logistic Regression

## Model

In [4]:

x = df.drop(["FiyatAraligi"], axis=1)  
y = df["FiyatAraligi"]

In [7]:

x

Out[7]:

	BataryaGucu	Bluetooth	MikroislemciHizi	CiftHat	OnKameraMP	4G	DahiliBellek	Kalinlik	Agirlik	CekirdekSayisi	ArkaKameraMP	Co
0	1325	1	1.9	1	2.0	1	50	0.1	146	1	10	
1	1046	0	2.8	0	0.0	0	58	0.2	100	8	0	
2	843	1	1.3	0	1.0	1	16	0.9	119	7	4	
3	894	1	0.5	0	1.0	0	50	0.5	199	3	14	
4	936	1	1.0	1	1.0	1	18	0.2	153	3	18	
...	...	...	...	...	...	...	...	...	...	...	...	...
1995	689	1	2.9	0	3.0	0	7	0.8	147	2	6	
1996	1654	1	1.8	1	1.0	1	11	0.3	146	7	2	
1997	742	1	2.2	0	4.0	1	56	0.2	190	7	14	
1998	704	1	2.2	0	4.0	1	53	0.2	186	6	6	
1999	1872	1	0.5	1	5.0	0	26	0.5	172	4	10	

  
2000 rows × 18 columns

In [8]:

y # we have 4 options at our dependent variable but logistic regression uses binary variables. Though we are go

Out[8]:

0	0
1	1
2	2
3	1
4	0
..	
1995	3
1996	2
1997	1
1998	0
1999	0

  
Name: FiyatAraligi, Length: 2000, dtype: int64

In [9]:

type(y)

```
Out[9]: pandas.core.series.Series
```

```
In [5]: x_train, x_test, y_train, y_test = train_test_split(x, y,
                                                         test_size=0.20,
                                                         random_state=42)
```

```
In [39]: loj = LogisticRegression(solver="liblinear")
loj_model = loj.fit(x_train, y_train)
loj_model
```

```
Out[39]: LogisticRegression
LogisticRegression(solver='liblinear')
```

```
In [40]: print(loj_model.intercept_)
print(loj_model.coef_)

[-4.67698256e-01 -1.06383753e+01 -2.38788595e-03  8.39182976e+00]
[[-2.14649867e-04 -2.22428059e-02 -1.20152973e-01  6.68291579e-02
  2.09175358e-02  2.28252799e-01 -9.00934000e-03 -2.36655132e-01
 -1.24644139e-03  1.45234553e-02 -2.74953163e-02 -4.69641212e-05
 -3.42613796e-04  4.76842428e-04 -2.03194470e-02 -2.76141055e-01
  1.22628186e-01 -1.29971050e-02]
 [ 1.90124032e-03 -2.16865897e-01 -1.56704418e-01 -1.78779122e-01
 -4.93215676e-03 -6.70117319e-01 -1.92015626e-03 -7.39160984e-01
 -2.31428396e-02 -1.24006670e-01 -1.44501257e-02  1.49288926e-03
  8.95163215e-04  3.90767256e-03 -3.31756891e-02  4.28372993e-01
 -3.95328802e-01 -3.49392428e-02]
 [-1.42795020e-04 -3.96514764e-03 -1.66069095e-02 -9.60335627e-04
  4.1186525e-03 -3.95180275e-03  1.93454215e-03  7.58727299e-03
  1.17242704e-04 -4.23122294e-02  6.27290199e-03  1.02077503e-04
  3.18357945e-06 -5.57377000e-04  1.43959624e-02 -6.25027269e-04
 -7.97423721e-03  3.16247897e-03]
 [-2.99718158e-03  3.25548856e-01  4.50555516e-01 -6.03182181e-02
 -3.98500626e-02  2.41511796e-01  3.98290876e-03  9.71004846e-02
  1.65060807e-02  1.49414910e-01  3.17934044e-02 -2.13337939e-03
 -1.00824519e-03 -5.95217425e-03  3.82036677e-02  9.87738401e-02
  2.90215102e-01  3.75971400e-02]]
```

## Prediction & Model Tuning

```
In [41]: y_pred = loj_model.predict(x_test)
confusion_matrix(y_test, y_pred)
```

```
Out[41]: array([[ 53,  22,  22,   0],
 [   0,  94,   0,   0],
 [  25,   0,  63,  12],
 [   0,   0,   2, 107]], dtype=int64)
```

```
In [42]: accuracy_score(y_test, y_pred)
```

```
Out[42]: 0.7925
```

```
In [43]: print(classification_report(y_test, y_pred))
```

	precision	recall	f1-score	support
0	0.68	0.55	0.61	97
1	0.81	1.00	0.90	94
2	0.72	0.63	0.67	100
3	0.90	0.98	0.94	109
accuracy			0.79	400
macro avg	0.78	0.79	0.78	400
weighted avg	0.78	0.79	0.78	400

```
In [17]: loj_parameters = {'penalty' : ['l1', 'l2', 'elasticnet'],
                           'solver' : ['lbfgs', 'liblinear', 'newton-cg', 'newton-cholesky', 'sag', 'saga'],
                           'multi_class' : ['auto', 'ovr', 'multinomial']}
loj_cv = GridSearchCV(loj, loj_parameters, cv=10)
loj_cv.fit(x_train, y_train) # optimized model
```

```
Out[17]: GridSearchCV
estimator: LogisticRegression
LogisticRegression
```

```
In [18]: loj_cv.best_params_
```

```
Out[18]: {'multi_class': 'auto', 'penalty': 'l2', 'solver': 'newton-cg'}
```

```
In [44]: loj = LogisticRegression(multi_class = 'auto')
```

```
In [44]: loj = LogisticRegression(multi_class = 'auto',
                                penalty = 'l2',
                                solver = 'newton-cg')
loj_tuned = loj.fit(x_train, y_train) # optimized model

In [45]: y_pred = loj_tuned.predict(x_test)
accuracy_score(y_test, y_pred) # Our result is better than up to result but this model can was overfit. We will

Out[45]: 0.975

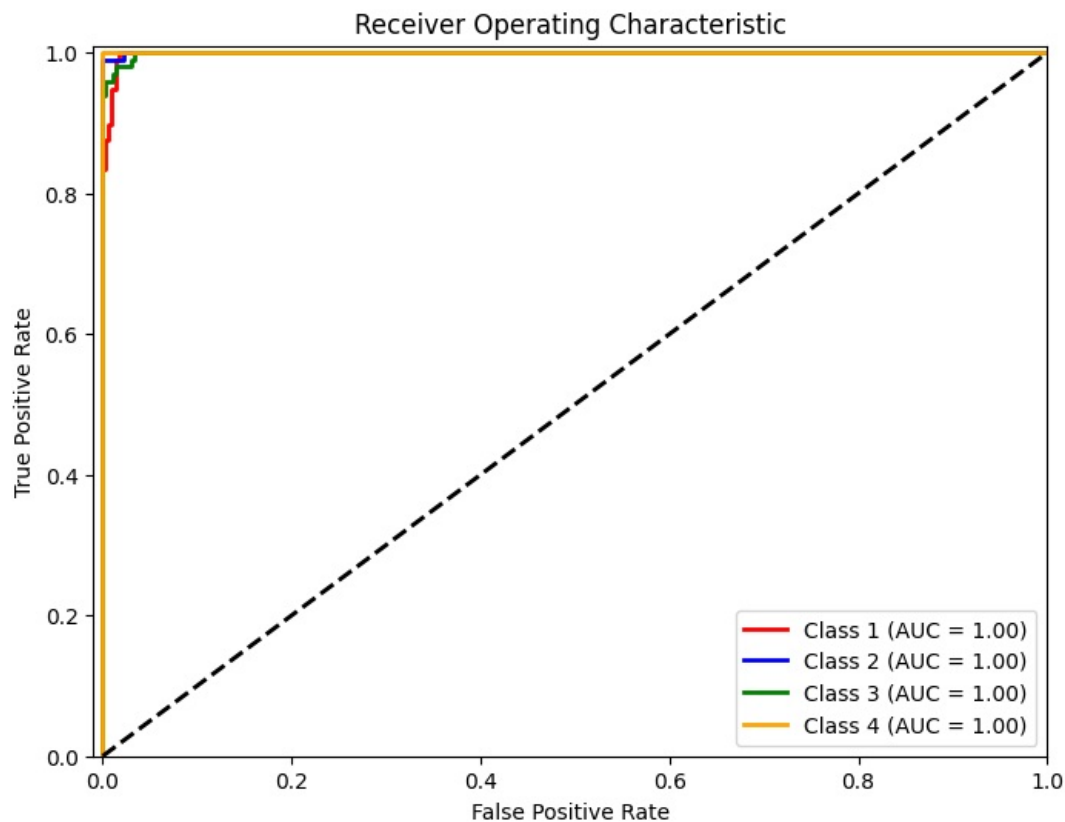
In [46]: print(classification_report(y_test, y_pred))
```

	precision	recall	f1-score	support
0	0.96	0.95	0.95	97
1	0.97	0.99	0.98	94
2	0.98	0.96	0.97	100
3	0.99	1.00	1.00	109
accuracy			0.97	400
macro avg	0.97	0.97	0.97	400
weighted avg	0.97	0.97	0.97	400

```
In [22]: # FPR, TPR and threshold value calculate for every class
fpr = {}
tpr = {}
thresh = {}
for i in range(4):
    fpr[i], tpr[i], thresh[i] = roc_curve(y_test, loj_tuned.predict_proba(x_test)[: ,i], pos_label=i)

# ROC curves draw
plt.figure(figsize=(8,6))
colors = ['red', 'blue', 'green', 'orange']
for i in range(4):
    plt.plot(fpr[i], tpr[i], color=colors[i], lw=2,
             label='Class {0} (AUC = {1:0.2f})'
             ''.format(i+1, np.trapz(tpr[i],fpr[i])))

plt.plot([0, 1], [0, 1], 'k--', lw=2)
plt.xlim([-0.01, 1.0])
plt.ylim([0.0, 1.01])
plt.xlabel('False Positive Rate')
plt.ylabel('True Positive Rate')
plt.title('Receiver Operating Characteristic')
plt.legend(loc="lower right")
plt.show()
```



## Naive Bayes

### Model & Prediction

## MODEL & EVALUATION

```
In [47]: nb = GaussianNB()  
nb_model = nb.fit(x_train, y_train)  
nb_model
```

```
Out[47]: ▼ GaussianNB  
GaussianNB()
```

```
In [48]: nb_model.predict(x_test)[0:10]
```

```
Out[48]: array([0, 3, 1, 2, 0, 0, 1, 2, 1, 2], dtype=int64)
```

```
In [49]: y_pred = nb_model.predict(x_test)  
accuracy_score(y_test, y_pred)
```

```
Out[49]: 0.81
```

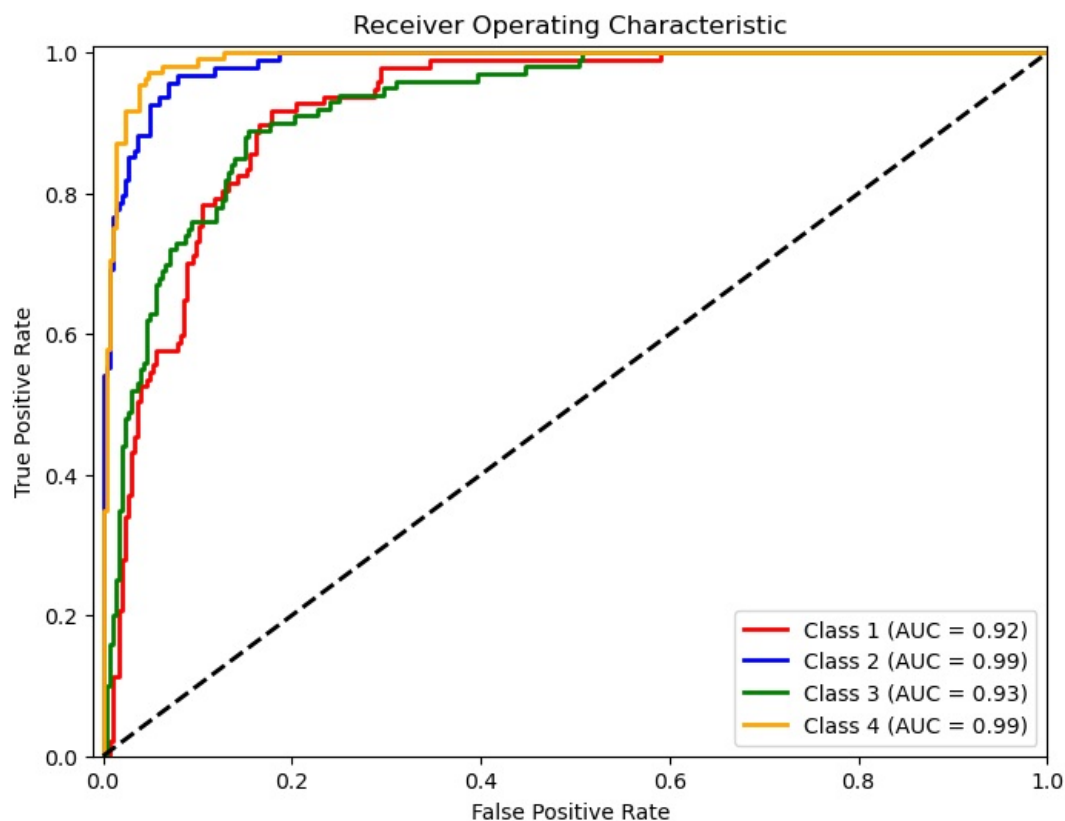
```
In [50]: cross_val_score(nb_model, x_test, y_test, cv=10).mean()
```

```
Out[50]: 0.8
```

```
In [51]: print(classification_report(y_test, y_pred))
```

	precision	recall	f1-score	support
0	0.70	0.71	0.70	97
1	0.88	0.86	0.87	94
2	0.73	0.74	0.74	100
3	0.93	0.92	0.92	109
accuracy			0.81	400
macro avg	0.81	0.81	0.81	400
weighted avg	0.81	0.81	0.81	400

```
In [52]: # FPR, TPR and threshold value calculate for every class  
fpr = {}  
tpr = {}  
thresh = {}  
for i in range(4):  
    fpr[i], tpr[i], thresh[i] = roc_curve(y_test, nb_model.predict_proba(x_test)[: ,i], pos_label=i)  
  
# ROC curves draw  
plt.figure(figsize=(8,6))  
colors = ['red', 'blue', 'green', 'orange']  
for i in range(4):  
    plt.plot(fpr[i], tpr[i], color=colors[i], lw=2,  
            label='Class {0} (AUC = {1:0.2f})'.  
            ''.format(i+1, np.trapz(tpr[i],fpr[i])))  
  
plt.plot([0, 1], [0, 1], 'k--', lw=2)  
plt.xlim([-0.01, 1.0])  
plt.ylim([0.0, 1.01])  
plt.xlabel('False Positive Rate')  
plt.ylabel('True Positive Rate')  
plt.title('Receiver Operating Characteristic')  
plt.legend(loc="lower right")  
plt.show()
```



## KNN

### Model & Prediction

```
In [88]: knn = KNeighborsClassifier()
knn_model = knn.fit(x_train, y_train)
knn_model
```

```
Out[88]: KNeighborsClassifier
KNeighborsClassifier()
```

```
In [89]: y_pred = knn_model.predict(x_test)
accuracy_score(y_test, y_pred)
```

```
Out[89]: 0.9275
```

```
In [13]: print(classification_report(y_test, y_pred))
```

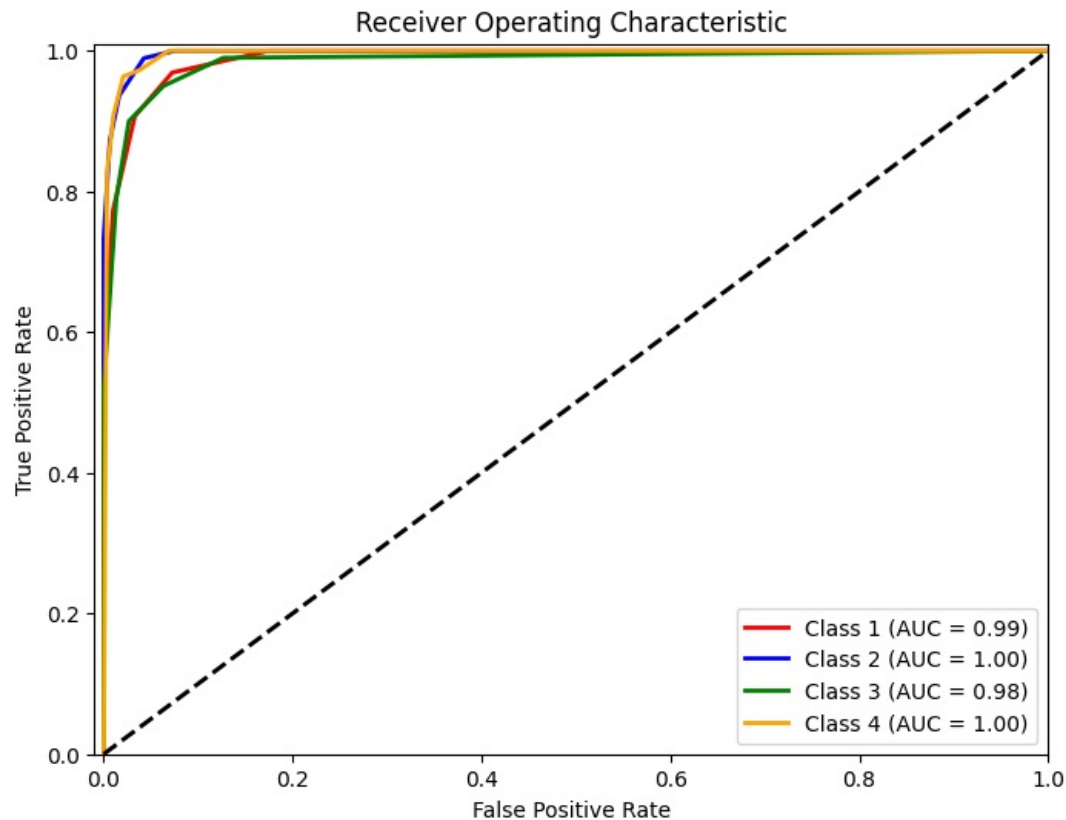
	precision	recall	f1-score	support
0	0.90	0.91	0.90	97
1	0.95	0.94	0.94	94
2	0.92	0.90	0.91	100
3	0.95	0.96	0.95	109
accuracy			0.93	400
macro avg	0.93	0.93	0.93	400
weighted avg	0.93	0.93	0.93	400

```
In [14]: # FPR, TPR and threshold value calculate for every class
fpr = {}
tpr = {}
thresh = {}
for i in range(4):
    fpr[i], tpr[i], thresh[i] = roc_curve(y_test, knn_model.predict_proba(x_test)[: ,i], pos_label=i)

# ROC curves draw
plt.figure(figsize=(8,6))
colors = ['red', 'blue', 'green', 'orange']
for i in range(4):
    plt.plot(fpr[i], tpr[i], color=colors[i], lw=2,
             label='Class {0} (AUC = {1:0.2f})'.format(i+1, np.trapz(tpr[i], fpr[i])))

plt.plot([0, 1], [0, 1], 'k--', lw=2)
plt.xlim([-0.01, 1.0])
```

```
plt.ylim([0.0, 1.01])
plt.xlabel('False Positive Rate')
plt.ylabel('True Positive Rate')
plt.title('Receiver Operating Characteristic')
plt.legend(loc="lower right")
plt.show()
```



## Model Tuning

```
In [15]: knn_params = {'n_neighbors': np.arange(1,100)}
knn_cv = GridSearchCV(knn, knn_params, cv=10)
knn_cv.fit(x_train, y_train)
```

```
Out[15]: ▸ GridSearchCV
▸ estimator: KNeighborsClassifier
▸ KNeighborsClassifier
```

```
In [16]: knn_cv.best_params_
```

```
Out[16]: {'n_neighbors': 15}
```

```
In [53]: knn = KNeighborsClassifier(15)
knn_tuned = knn.fit(x_train, y_train) # optimized model
```

```
In [55]: y_pred = knn_tuned.predict(x_test)
accuracy_score(y_test, y_pred)
```

```
Out[55]: 0.9225
```

## SVM

### Model & Prediction

```
In [56]: svm_model_linear = SVC(kernel="linear").fit(x_train, y_train)
svm_model_linear
```

```
Out[56]: ▾ SVC
SVC(kernel='linear')
```

```
In [57]: y_pred_linear = svm_model_linear.predict(x_test)
accuracy_score(y_test, y_pred_linear)
```

Out[57]: 0.9825

let's do using rbf kernel

```
In [58]: svm_model_rbf = SVC(kernel="rbf").fit(x_train, y_train)
svm_model_rbf
```

Out[58]: 

```
In [59]: y_pred_rbf = svm_model_rbf.predict(x_test)
accuracy_score(y_test, y_pred_rbf)
```

Out[59]: 0.9575

```
In [60]: print(classification_report(y_pred_linear, y_test)) # better than rbf kernel
```

	precision	recall	f1-score	support
0	1.00	0.94	0.97	103
1	0.98	1.00	0.99	92
2	0.96	0.99	0.97	97
3	0.99	1.00	1.00	108
accuracy			0.98	400
macro avg	0.98	0.98	0.98	400
weighted avg	0.98	0.98	0.98	400

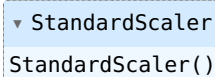
```
In [61]: print(classification_report(y_pred_rbf, y_test))
```

	precision	recall	f1-score	support
0	0.95	0.94	0.94	98
1	0.97	0.96	0.96	95
2	0.92	0.98	0.95	94
3	0.99	0.96	0.97	113
accuracy			0.96	400
macro avg	0.96	0.96	0.96	400
weighted avg	0.96	0.96	0.96	400

## Artificial Neureal Network

### Model & Tahmin

```
In [26]: from sklearn.preprocessing import StandardScaler
scaler = StandardScaler()
scaler.fit(x_train)
```

Out[26]: 

```
In [27]: x_train_scaled = scaler.transform(x_train)
x_test_scaled = scaler.transform(x_test)
```

```
In [28]: x_train_scaled[0:5]
```

Out[28]: array([[ -0.79776826, 1.02148066, -1.00800608, -0.96801137, 1.05214835,  
-0.98142253, -0.21445191, -1.03316872, 0.31817032, 0.65243169,  
 1.02459764, -0.88223152, -0.83174836, -1.27555582, -0.56610356,  
-0.56772709, 1.00375706, -0.98634324],  
[ -1.57856933, 1.02148066, 1.08383533, -0.96801137, 1.73335985,  
-0.98142253, -1.59489547, -0.68624953, 1.20440877, 1.08558136,  
 0.6932807 , 1.64274472, 0.67366813, -1.70424199, -1.30219922,  
-0.56772709, -0.996257 , 1.01384584],  
[ 0.26737077, -0.97897106, -1.00800608, -0.96801137, -0.31027463,  
-0.98142253, -0.32488739, 0.00758886, -0.11065473, -0.21386765,  
-0.63198706, -0.77351111, -0.7536046 , -0.0464107 , 0.354016 ,  
-0.56772709, -0.996257 , 1.01384584],  
[ 0.00334266, -0.97897106, 1.20688482, 1.03304572, 0.59800736,  
 1.01892912, -1.04271804, 1.04834643, -1.19701154, -0.21386765,  
 0.36196376, -1.39255185, -0.55594686, 0.35565469, 0.90608775,  
 1.76140969, 1.00375706, 1.01384584],  
[ 0.06878553, 1.02148066, 0.46858786, -0.96801137, -0.99148613,  
-0.98142253, -1.3740245 , -1.03316872, 1.26158544, -0.64701732,  
 0.36196376, -0.66479069, 0.51048558, 0.35932652, -1.30219922,  
-0.56772709, -0.996257 , -0.98634324]])



```
In [29]: x_test_scaled[0:5]
```

```
Out[29]: array([[ 0.44564616, -0.97897106,  0.96078583,  1.03304572, -0.53734513,
        -0.98142253, -1.48445998, -1.38008791, -0.31077309,  0.21928202,
         0.19630529, -0.50060067, -1.06158294, -0.00785649,  1.45815949,
        -0.56772709,  1.00375706, -0.98634324],
       [-0.13882632, -0.97897106, -0.76190709,  1.03304572,  0.59800736,
         1.01892912, -0.10401642,  1.74218482,  0.20381698, -0.21386765,
         1.68723152,  0.21828536, -0.00434387, -1.22690408,  0.90608775,
         1.76140969, -0.996257, -0.98634324],
       [-0.53374015,  1.02148066,  1.32993432, -0.96801137,  1.50628935,
        -0.98142253,  1.33164488,  1.74218482,  0.71840704, -0.21386765,
         0.52762223, -0.67366582,  0.90809941,  0.86512112, -0.01403182,
        -0.56772709, -0.996257, -0.98634324],
       [-0.59466972, -0.97897106, -1.25410507, -0.96801137,  0.14386636,
         1.01892912, -1.04271804, -0.33933033,  1.51888048,  0.21928202,
        -0.30067012,  1.65605742,  1.26204466, -0.48244052,  0.354016,
         1.76140969, -0.996257,  1.01384584],
       [ 1.29866004, -0.97897106,  1.20688482,  1.03304572, -0.08320414,
        -0.98142253, -1.48445998,  0.35450805, -1.19701154, -0.21386765,
         1.02459764, -0.4406935, -1.55802563,  0.51354339, -0.56610356,
        -0.56772709, -0.996257, -0.98634324]])
```

```
In [30]: mlp_model = MLPClassifier().fit(x_train_scaled, y_train)
```

```
In [31]: y_pred = mlp_model.predict(x_test_scaled)
accuracy_score(y_test, y_pred) # Learning rate is looking very low. Though let's do optimization
```

```
Out[31]: 0.9075
```

## Model Tuning

```
In [32]: mlp_params = {"alpha": [0.1, 0.01, 0.02, 0.005, 0.0001, 0.00001],
                      "hidden_layer_sizes": [(10,10,10),
                                             (100,100,100),
                                             (100,100),
                                             (3,5),
                                             (5, 3)],
                      "solver" : ["lbfgs","adam","sgd"],
                      "activation": ["relu","logistic"]}
mlp_model = MLPClassifier()
mlp_cv_model = GridSearchCV(mlp_model, mlp_params,
                           cv=10,
                           n_jobs=-1,
                           verbose=2)
mlp_cv_model.fit(x_train, y_train)
```

Fitting 10 folds for each of 180 candidates, totalling 1800 fits

```
Out[32]: > GridSearchCV
> estimator: MLPClassifier
> MLPClassifier
```

```
In [33]: mlp_cv_model.best_params_
```

```
Out[33]: {'activation': 'logistic',
          'alpha': 0.005,
          'hidden_layer_sizes': (100, 100),
          'solver': 'adam'}
```

```
In [34]: mlp_tuned = MLPClassifier(activation='logistic',
                                   alpha= 0.005,
                                   hidden_layer_sizes= (100, 100),
                                   solver= 'adam')
mlp_tuned.fit(x_train_scaled, y_train)
```

```
Out[34]: MLPClassifier(activation='logistic', alpha=0.005, hidden_layer_sizes=(100, 100))
```

```
In [35]: y_pred = mlp_tuned.predict(x_test_scaled)
accuracy_score(y_test, y_pred)
```

```
Out[35]: 0.98
```

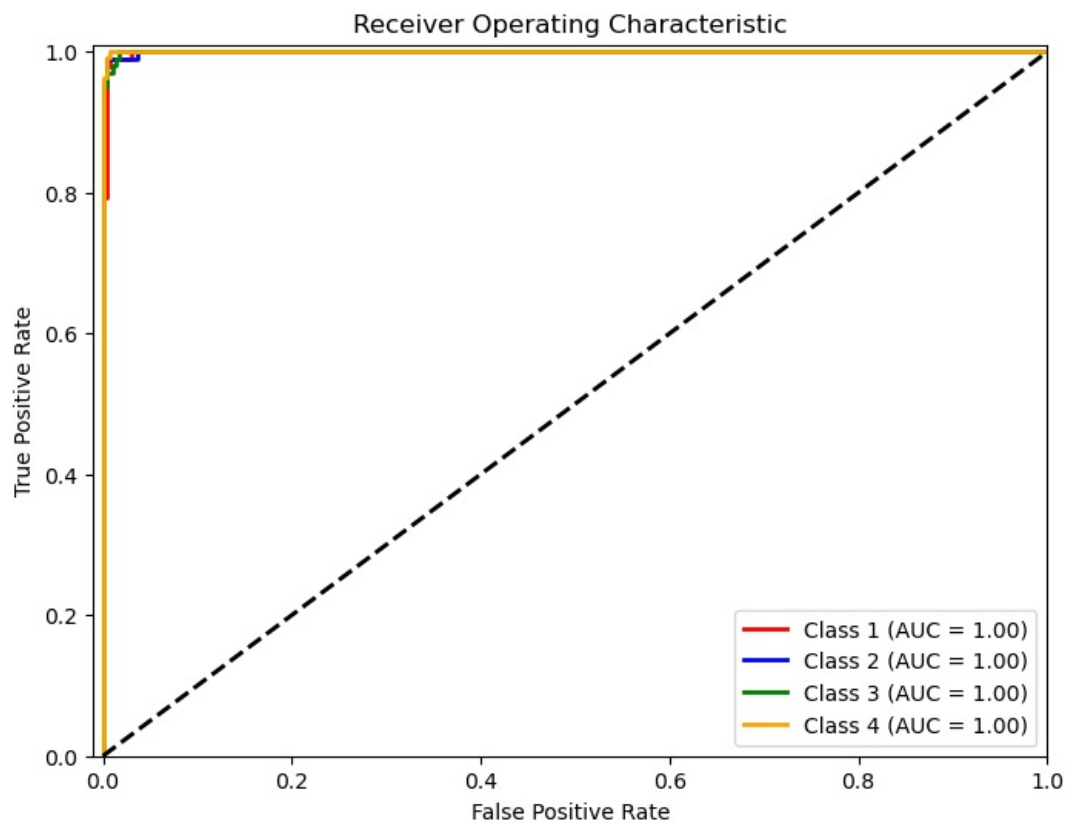
```
In [36]: print(classification_report(y_pred, y_test))
```

	precision	recall	f1-score	support
0	0.99	0.96	0.97	100
1	0.98	0.99	0.98	93
2	0.97	0.98	0.97	99
3	0.98	0.99	0.99	108
accuracy			0.98	400
macro avg	0.98	0.98	0.98	400
weighted avg	0.98	0.98	0.98	400

```
In [37]: # FPR, TPR and threshold value calculate for every class
fpr = {}
tpr = {}
thresh = {}
for i in range(4):
    fpr[i], tpr[i], thresh[i] = roc_curve(y_test, mlp_tuned.predict_proba(x_test_scaled)[:i], pos_label=i)

# ROC curves draw
plt.figure(figsize=(8,6))
colors = ['red', 'blue', 'green', 'orange']
for i in range(4):
    plt.plot(fpr[i], tpr[i], color=colors[i], lw=2,
             label='Class {0} (AUC = {1:0.2f})'.format(i+1, np.trapz(tpr[i],fpr[i])))

plt.plot([0, 1], [0, 1], 'k--', lw=2)
plt.xlim([-0.01, 1.0])
plt.ylim([0.0, 1.01])
plt.xlabel('False Positive Rate')
plt.ylabel('True Positive Rate')
plt.title('Receiver Operating Characteristic')
plt.legend(loc="lower right")
plt.show()
```



As we see after to optimize our success rate increased and it wasn't overfit

## CART

### Model & Prediction

```
In [73]: cart = DecisionTreeClassifier(max_depth=2)
cart_model = cart.fit(x_train, y_train)
```

```
In [74]: cart_model
```

```
Out[74]: ▼ DecisionTreeClassifier
DecisionTreeClassifier(max_depth=2)
```

```
In [75]: y_pred = cart_model.predict(x_test)
accuracy_score(y_test, y_pred)
```

```
Out[75]: 0.75
```

## Model Tuning

```
In [35]: cart_params = {'max_depth': range(1,10),
                        'min_samples_split': list(range(2,50))}
cart = DecisionTreeClassifier()
cart_cv = GridSearchCV(cart, cart_params,
                       cv=10,
                       n_jobs=-1,
                       verbose=2)
cart_cv_model = cart_cv.fit(x_train, y_train)
```

[illegible]

[illegible]

[illegible]

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[illegible]

[illegible]

```
In [36]: cart_cv_model.best_params
```

```
In [62]: cart = DecisionTreeClassifier(max_depth = 8,
                                     min_samples_split = 21)
cart_tuned = cart.fit(x_train, y_train)
```

```
Out[63]: 0.8575
```

```
In [20]: print(classification_report(y_pred, y_test))
```

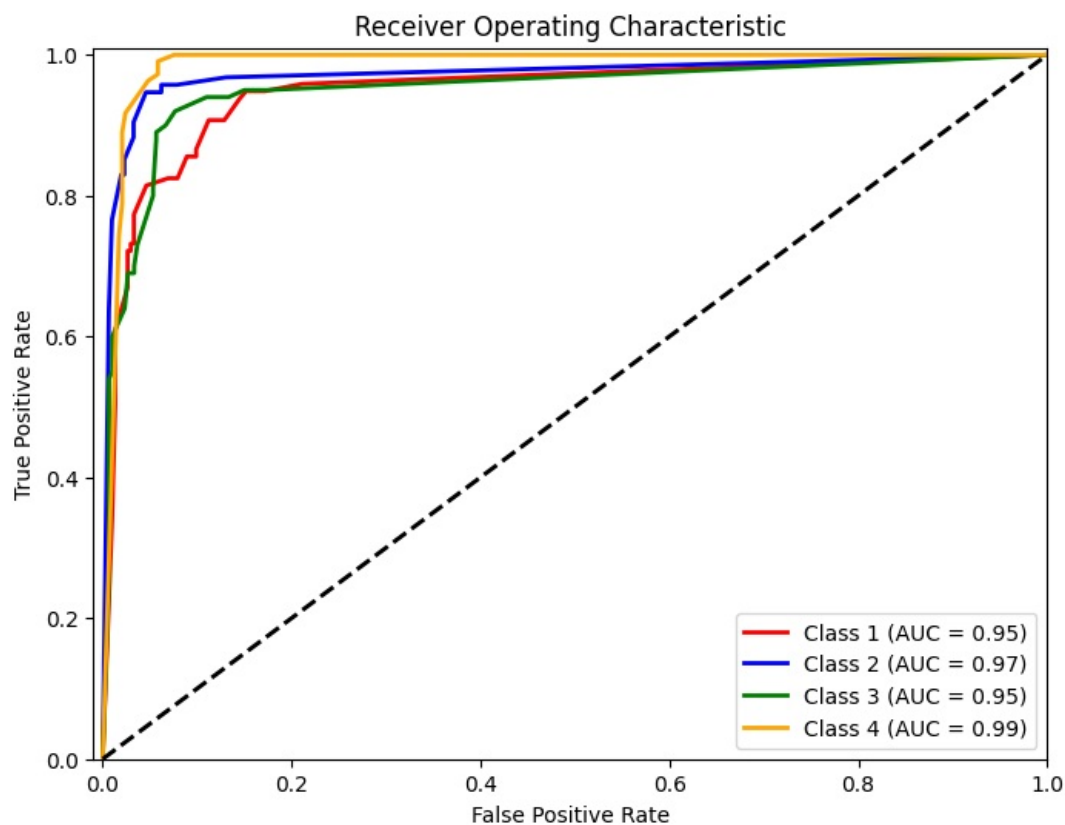
```
print(classification_report(y_pred, y_test))
```

	precision	recall	f1-score	support
0	0.82	0.77	0.80	104
1	0.88	0.89	0.89	93
2	0.80	0.83	0.82	96
3	0.92	0.93	0.93	107
accuracy			0.86	400
macro avg	0.86	0.86	0.86	400
weighted avg	0.86	0.86	0.86	400

```
In [40]: # FPR, TPR and threshold value calculate for every class
fpr = {}
tpr = {}
thresh = {}
for i in range(4):
    fpr[i], tpr[i], thresh[i] = roc_curve(y_test, cart_tuned.predict_proba(x_test)[: ,i], pos_label=i)

# ROC curves draw
plt.figure(figsize=(8,6))
colors = ['red', 'blue', 'green', 'orange']
for i in range(4):
    plt.plot(fpr[i], tpr[i], color=colors[i], lw=2,
             label='Class {0} (AUC = {1:0.2f})'
             ''.format(i+1, np.trapz(tpr[i],fpr[i])))

plt.plot([0, 1], [0, 1], 'k--', lw=2)
plt.xlim([-0.01, 1.0])
plt.ylim([0.0, 1.01])
plt.xlabel('False Positive Rate')
plt.ylabel('True Positive Rate')
plt.title('Receiver Operating Characteristic')
plt.legend(loc="lower right")
plt.show()
```



## Random Forests

### Model & Prediction

```
In [76]: rf = RandomForestClassifier()
rf_model = rf.fit(x_train, y_train)
```

```
In [77]: y_pred = rf_model.predict(x_test)
accuracy_score(y_test, y_pred)
```

```
Out[77]: 0.8775
```

## Model Tuning

```
In [43]: rf_params = {"max_depth": [2,3,5,8,10],
                      "max_features": [2,5,8],
                      "n_estimators": [10,500,1000],
                      "min_samples_split": [2,5,10]}
rf = RandomForestClassifier()
rf_cv = GridSearchCV(rf, rf_params,
                     cv=10,
                     n_jobs=-1,
                     verbose=2)
rf_cv_model = rf_cv.fit(x_train, y_train)
```

Fitting 10 folds for each of 135 candidates, totalling 1350 fits

[illegible]

[illegible]

[illegible]



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[illegible]

[illegible]

[illegible]

```
[CV] END max_depth=10, max_features=8, min_samples_split=10, n_estimators=10; total time= 0.1s
[CV] END max_depth=10, max_features=8, min_samples_split=10, n_estimators=10; total time= 0.1s
[CV] END max_depth=10, max_features=8, min_samples_split=10, n_estimators=10; total time= 0.1s
[CV] END max_depth=10, max_features=8, min_samples_split=10, n_estimators=10; total time= 0.1s
[CV] END max_depth=10, max_features=8, min_samples_split=10, n_estimators=10; total time= 0.1s
[CV] END max_depth=10, max_features=8, min_samples_split=10, n_estimators=10; total time= 0.1s
[CV] END max_depth=10, max_features=8, min_samples_split=10, n_estimators=10; total time= 0.1s
[CV] END max_depth=10, max_features=8, min_samples_split=10, n_estimators=10; total time= 0.1s
[CV] END max_depth=10, max_features=8, min_samples_split=10, n_estimators=10; total time= 0.1s
[CV] END max_depth=10, max_features=8, min_samples_split=10, n_estimators=10; total time= 0.1s
[CV] END max_depth=10, max_features=8, min_samples_split=10, n_estimators=500; total time= 2.4s
[CV] END max_depth=10, max_features=8, min_samples_split=10, n_estimators=500; total time= 2.3s
[CV] END max_depth=10, max_features=8, min_samples_split=10, n_estimators=500; total time= 2.3s
[CV] END max_depth=10, max_features=8, min_samples_split=10, n_estimators=500; total time= 2.3s
[CV] END max_depth=10, max_features=8, min_samples_split=10, n_estimators=500; total time= 2.3s
[CV] END max_depth=10, max_features=8, min_samples_split=10, n_estimators=500; total time= 2.3s
[CV] END max_depth=10, max_features=8, min_samples_split=10, n_estimators=500; total time= 2.3s
[CV] END max_depth=10, max_features=8, min_samples_split=10, n_estimators=500; total time= 2.3s
[CV] END max_depth=10, max_features=8, min_samples_split=10, n_estimators=1000; total time= 4.6s
[CV] END max_depth=10, max_features=8, min_samples_split=10, n_estimators=1000; total time= 4.5s
[CV] END max_depth=10, max_features=8, min_samples_split=10, n_estimators=1000; total time= 4.5s
[CV] END max_depth=10, max_features=8, min_samples_split=10, n_estimators=1000; total time= 4.5s
[CV] END max_depth=10, max_features=8, min_samples_split=10, n_estimators=1000; total time= 4.5s
[CV] END max_depth=10, max_features=8, min_samples_split=10, n_estimators=1000; total time= 4.5s
[CV] END max_depth=10, max_features=8, min_samples_split=10, n_estimators=1000; total time= 4.6s
[CV] END max_depth=10, max_features=8, min_samples_split=10, n_estimators=1000; total time= 4.6s
[CV] END max_depth=10, max_features=8, min_samples_split=10, n_estimators=1000; total time= 4.6s
```

In [44]: rf\_cv\_model.best\_params\_

Out[44]: {'max\_depth': 10,  
'max\_features': 8,  
'min\_samples\_split': 5,  
'n\_estimators': 500}

In [64]: rf\_tuned = RandomForestClassifier(max\_depth = 10,  
max\_features = 8,  
min\_samples\_split = 5,  
n\_estimators = 500)  
rf\_tuned.fit(x\_train, y\_train)

Out[64]: **RandomForestClassifier**  
RandomForestClassifier(max\_depth=10, max\_features=8, min\_samples\_split=5,  
n\_estimators=500)

In [65]: y\_pred = rf\_tuned.predict(x\_test)  
accuracy\_score(y\_test, y\_pred)

Out[65]: 0.9125

In [48]: Importance = pd.DataFrame({"Importance": rf\_tuned.feature\_importances\_\*100},  
index = x\_train.columns)  
Importance.sort\_values(by = "Importance",  
axis = 0,  
ascending = True).plot(kind = "barh", color = "r")  
plt.xlabel("Değişken Önem Düzeyleri")

Out[48]: Text(0.5, 0, 'Değişken Önem Düzeyleri')



```
min_samples_split = 2,  
n_estimators = 100)  
gbm_tuned = gbm.fit(x_train, y_train)
```

```
In [67]: y_pred = gbm_tuned.predict(x_test)  
accuracy_score(y_test, y_pred)
```

```
Out[67]: 0.915
```

## XGBoost

### Model & Prediction

```
In [80]: xgb_model = XGBClassifier().fit(x_train, y_train)
```

```
In [81]: y_pred = xgb_model.predict(x_test)  
accuracy_score(y_test, y_pred)
```

```
Out[81]: 0.93
```

### Model Tuning

```
In [11]: xgb_params = {  
    'n_estimators': [100, 500, 1000],  
    'subsample': [0.6, 0.8, 1.0],  
    'max_depth': [3, 4, 5],  
    'learning_rate': [0.1, 0.01, 0.05],  
    'min_samples_split': [2, 5, 10]}  
xgb = XGBClassifier()  
xgb_cv = GridSearchCV(xgb, xgb_params,  
                      cv = 10,  
                      n_jobs = -1,  
                      verbose = 2)  
xgb_cv_model = xgb_cv.fit(x_train, y_train)
```

Fitting 10 folds for each of 243 candidates, totalling 2430 fits  
[02:53:27] WARNING: C:\buildkite-agent\builds\buildkite-windows-cpu-autoscaling-group-i-07593ffd91cd9da33-1\xgb  
oost\xgboost-ci-windows\src\learner.cc:767:  
Parameters: { "min\_samples\_split" } are not used.

```
In [12]: xgb_cv_model.best_params_
```

```
Out[12]: {'learning_rate': 0.1,  
    'max_depth': 4,  
    'min_samples_split': 2,  
    'n_estimators': 500,  
    'subsample': 0.6}
```

```
In [68]: xgb = XGBClassifier(learning_rate = 0.1,  
    max_depth = 4,  
    min_samples_split = 2,  
    n_estimators = 500,  
    subsample = 0.6)  
xgb_tuned = xgb.fit(x_train, y_train)
```

[03:23:21] WARNING: C:\buildkite-agent\builds\buildkite-windows-cpu-autoscaling-group-i-07593ffd91cd9da33-1\xgb  
oost\xgboost-ci-windows\src\learner.cc:767:  
Parameters: { "min\_samples\_split" } are not used.

```
In [69]: y_pred = xgb_tuned.predict(x_test)  
accuracy_score(y_test, y_pred)
```

```
Out[69]: 0.9275
```

## CatBoost

### Model & Prediction

```
In [82]: cat_model = CatBoostClassifier().fit(x_train, y_train)
```

```
Learning rate set to 0.081046  
0:   learn: 1.2717028    total: 5.67ms    remaining: 5.66s  
1:   learn: 1.1833891    total: 10.8ms   remaining: 5.37s  
2:   learn: 1.1151186    total: 16ms     remaining: 5.32s  
3:   learn: 1.0376020    total: 23.3ms   remaining: 5.8s  
4:   learn: 0.9682810    total: 28.5ms   remaining: 5.68s
```

5:	learn: 0.9271879	total: 34.4ms	remaining: 5.7s
6:	learn: 0.8798053	total: 38.6ms	remaining: 5.48s
7:	learn: 0.8353139	total: 42.7ms	remaining: 5.3s
8:	learn: 0.7937513	total: 47.2ms	remaining: 5.19s
9:	learn: 0.7511193	total: 51.2ms	remaining: 5.07s
10:	learn: 0.7263842	total: 55.1ms	remaining: 4.95s
11:	learn: 0.6942446	total: 59ms	remaining: 4.86s
12:	learn: 0.6686105	total: 62.6ms	remaining: 4.75s
13:	learn: 0.6370311	total: 66.3ms	remaining: 4.67s
14:	learn: 0.6115176	total: 70.3ms	remaining: 4.62s
15:	learn: 0.5906100	total: 74.1ms	remaining: 4.56s
16:	learn: 0.5677915	total: 77.9ms	remaining: 4.5s
17:	learn: 0.5468161	total: 82ms	remaining: 4.47s
18:	learn: 0.5359260	total: 85.9ms	remaining: 4.43s
19:	learn: 0.5202595	total: 91ms	remaining: 4.46s
20:	learn: 0.5038326	total: 94.8ms	remaining: 4.42s
21:	learn: 0.4874713	total: 98.6ms	remaining: 4.38s
22:	learn: 0.4762413	total: 102ms	remaining: 4.35s
23:	learn: 0.4629430	total: 106ms	remaining: 4.32s
24:	learn: 0.4517652	total: 110ms	remaining: 4.29s
25:	learn: 0.4423234	total: 114ms	remaining: 4.26s
26:	learn: 0.4337366	total: 118ms	remaining: 4.27s
27:	learn: 0.4231196	total: 122ms	remaining: 4.24s
28:	learn: 0.4117561	total: 126ms	remaining: 4.23s
29:	learn: 0.4018168	total: 131ms	remaining: 4.22s
30:	learn: 0.3919916	total: 135ms	remaining: 4.21s
31:	learn: 0.3835022	total: 139ms	remaining: 4.19s
32:	learn: 0.3763968	total: 143ms	remaining: 4.18s
33:	learn: 0.3718074	total: 147ms	remaining: 4.17s
34:	learn: 0.3630852	total: 151ms	remaining: 4.16s
35:	learn: 0.3570718	total: 155ms	remaining: 4.14s
36:	learn: 0.3477973	total: 158ms	remaining: 4.12s
37:	learn: 0.3438388	total: 163ms	remaining: 4.11s
38:	learn: 0.3398750	total: 166ms	remaining: 4.1s
39:	learn: 0.3364118	total: 170ms	remaining: 4.08s
40:	learn: 0.3314051	total: 174ms	remaining: 4.06s
41:	learn: 0.3277496	total: 178ms	remaining: 4.06s
42:	learn: 0.3246369	total: 182ms	remaining: 4.05s
43:	learn: 0.3193332	total: 186ms	remaining: 4.05s
44:	learn: 0.3155783	total: 192ms	remaining: 4.07s
45:	learn: 0.3127380	total: 196ms	remaining: 4.06s
46:	learn: 0.3090766	total: 201ms	remaining: 4.07s
47:	learn: 0.3060279	total: 208ms	remaining: 4.12s
48:	learn: 0.3022312	total: 212ms	remaining: 4.12s
49:	learn: 0.2967522	total: 217ms	remaining: 4.13s
50:	learn: 0.2946694	total: 222ms	remaining: 4.13s
51:	learn: 0.2913679	total: 226ms	remaining: 4.12s
52:	learn: 0.2865557	total: 234ms	remaining: 4.17s
53:	learn: 0.2825314	total: 240ms	remaining: 4.2s
54:	learn: 0.2783217	total: 245ms	remaining: 4.21s
55:	learn: 0.2761865	total: 250ms	remaining: 4.21s
56:	learn: 0.2728544	total: 257ms	remaining: 4.25s
57:	learn: 0.2698671	total: 262ms	remaining: 4.25s
58:	learn: 0.2674704	total: 267ms	remaining: 4.26s
59:	learn: 0.2653935	total: 273ms	remaining: 4.28s
60:	learn: 0.2619215	total: 278ms	remaining: 4.28s
61:	learn: 0.2580365	total: 284ms	remaining: 4.3s
62:	learn: 0.2567747	total: 291ms	remaining: 4.32s
63:	learn: 0.2545168	total: 296ms	remaining: 4.32s
64:	learn: 0.2530320	total: 301ms	remaining: 4.32s
65:	learn: 0.2505556	total: 307ms	remaining: 4.34s
66:	learn: 0.2473474	total: 313ms	remaining: 4.35s
67:	learn: 0.2451151	total: 319ms	remaining: 4.37s
68:	learn: 0.2425302	total: 325ms	remaining: 4.38s
69:	learn: 0.2397799	total: 331ms	remaining: 4.4s
70:	learn: 0.2379619	total: 339ms	remaining: 4.43s
71:	learn: 0.2365799	total: 345ms	remaining: 4.45s
72:	learn: 0.2331767	total: 353ms	remaining: 4.49s
73:	learn: 0.2315117	total: 360ms	remaining: 4.51s
74:	learn: 0.2293287	total: 367ms	remaining: 4.53s
75:	learn: 0.2281428	total: 373ms	remaining: 4.54s
76:	learn: 0.2270126	total: 380ms	remaining: 4.56s
77:	learn: 0.2247497	total: 387ms	remaining: 4.57s
78:	learn: 0.2229260	total: 395ms	remaining: 4.6s
79:	learn: 0.2201835	total: 404ms	remaining: 4.64s
80:	learn: 0.2190042	total: 410ms	remaining: 4.66s
81:	learn: 0.2168943	total: 418ms	remaining: 4.68s
82:	learn: 0.2139148	total: 423ms	remaining: 4.67s
83:	learn: 0.2123306	total: 427ms	remaining: 4.66s
84:	learn: 0.2098447	total: 433ms	remaining: 4.66s
85:	learn: 0.2091172	total: 441ms	remaining: 4.69s
86:	learn: 0.2058625	total: 449ms	remaining: 4.72s
87:	learn: 0.2053902	total: 454ms	remaining: 4.7s
88:	learn: 0.2029889	total: 458ms	remaining: 4.69s
89:	learn: 0.2014844	total: 464ms	remaining: 4.69s
90:	learn: 0.1997856	total: 468ms	remaining: 4.67s
91:	learn: 0.1984586	total: 471ms	remaining: 4.65s
92:	learn: 0.1960737	total: 475ms	remaining: 4.64s
93:	learn: 0.1942660	total: 482ms	remaining: 4.64s

94:	learn: 0.1929161	total: 486ms	remaining: 4.63s
95:	learn: 0.1911708	total: 490ms	remaining: 4.61s
96:	learn: 0.1902074	total: 497ms	remaining: 4.63s
97:	learn: 0.1884600	total: 501ms	remaining: 4.61s
98:	learn: 0.1861981	total: 506ms	remaining: 4.6s
99:	learn: 0.1849892	total: 510ms	remaining: 4.59s
100:	learn: 0.1835635	total: 517ms	remaining: 4.6s
101:	learn: 0.1822115	total: 522ms	remaining: 4.59s
102:	learn: 0.1805335	total: 526ms	remaining: 4.58s
103:	learn: 0.1798795	total: 533ms	remaining: 4.59s
104:	learn: 0.1790386	total: 537ms	remaining: 4.57s
105:	learn: 0.1774465	total: 541ms	remaining: 4.56s
106:	learn: 0.1764200	total: 545ms	remaining: 4.55s
107:	learn: 0.1754278	total: 552ms	remaining: 4.56s
108:	learn: 0.1744442	total: 558ms	remaining: 4.56s
109:	learn: 0.1735904	total: 565ms	remaining: 4.57s
110:	learn: 0.1726062	total: 569ms	remaining: 4.56s
111:	learn: 0.1706629	total: 575ms	remaining: 4.56s
112:	learn: 0.1692244	total: 582ms	remaining: 4.57s
113:	learn: 0.1682710	total: 585ms	remaining: 4.55s
114:	learn: 0.1676993	total: 589ms	remaining: 4.54s
115:	learn: 0.1667727	total: 595ms	remaining: 4.53s
116:	learn: 0.1659054	total: 598ms	remaining: 4.52s
117:	learn: 0.1646372	total: 602ms	remaining: 4.5s
118:	learn: 0.1634150	total: 605ms	remaining: 4.48s
119:	learn: 0.1617735	total: 611ms	remaining: 4.48s
120:	learn: 0.1611335	total: 615ms	remaining: 4.46s
121:	learn: 0.1607142	total: 618ms	remaining: 4.45s
122:	learn: 0.1597713	total: 623ms	remaining: 4.44s
123:	learn: 0.1583032	total: 627ms	remaining: 4.43s
124:	learn: 0.1572222	total: 631ms	remaining: 4.42s
125:	learn: 0.1560870	total: 638ms	remaining: 4.43s
126:	learn: 0.1553035	total: 643ms	remaining: 4.42s
127:	learn: 0.1550364	total: 646ms	remaining: 4.4s
128:	learn: 0.1539692	total: 650ms	remaining: 4.39s
129:	learn: 0.1526549	total: 655ms	remaining: 4.38s
130:	learn: 0.1516819	total: 660ms	remaining: 4.38s
131:	learn: 0.1508098	total: 664ms	remaining: 4.36s
132:	learn: 0.1496971	total: 667ms	remaining: 4.35s
133:	learn: 0.1486553	total: 673ms	remaining: 4.35s
134:	learn: 0.1482532	total: 677ms	remaining: 4.33s
135:	learn: 0.1475403	total: 680ms	remaining: 4.32s
136:	learn: 0.1465857	total: 684ms	remaining: 4.31s
137:	learn: 0.1450133	total: 690ms	remaining: 4.31s
138:	learn: 0.1436576	total: 694ms	remaining: 4.29s
139:	learn: 0.1433413	total: 697ms	remaining: 4.28s
140:	learn: 0.1419578	total: 701ms	remaining: 4.27s
141:	learn: 0.1412495	total: 706ms	remaining: 4.26s
142:	learn: 0.1397887	total: 709ms	remaining: 4.25s
143:	learn: 0.1389578	total: 713ms	remaining: 4.24s
144:	learn: 0.1381841	total: 718ms	remaining: 4.23s
145:	learn: 0.1376186	total: 721ms	remaining: 4.22s
146:	learn: 0.1366782	total: 725ms	remaining: 4.21s
147:	learn: 0.1361739	total: 728ms	remaining: 4.19s
148:	learn: 0.1355746	total: 732ms	remaining: 4.18s
149:	learn: 0.1350867	total: 737ms	remaining: 4.17s
150:	learn: 0.1343685	total: 740ms	remaining: 4.16s
151:	learn: 0.1336928	total: 744ms	remaining: 4.15s
152:	learn: 0.1330006	total: 749ms	remaining: 4.14s
153:	learn: 0.1323118	total: 753ms	remaining: 4.13s
154:	learn: 0.1314684	total: 756ms	remaining: 4.12s
155:	learn: 0.1306512	total: 760ms	remaining: 4.11s
156:	learn: 0.1304375	total: 764ms	remaining: 4.1s
157:	learn: 0.1296586	total: 768ms	remaining: 4.09s
158:	learn: 0.1289533	total: 771ms	remaining: 4.08s
159:	learn: 0.1286117	total: 775ms	remaining: 4.07s
160:	learn: 0.1281296	total: 778ms	remaining: 4.06s
161:	learn: 0.1273084	total: 783ms	remaining: 4.05s
162:	learn: 0.1265437	total: 786ms	remaining: 4.04s
163:	learn: 0.1258828	total: 789ms	remaining: 4.02s
164:	learn: 0.1248544	total: 793ms	remaining: 4.01s
165:	learn: 0.1242879	total: 798ms	remaining: 4.01s
166:	learn: 0.1238815	total: 801ms	remaining: 4s
167:	learn: 0.1234804	total: 805ms	remaining: 3.98s
168:	learn: 0.1223782	total: 808ms	remaining: 3.97s
169:	learn: 0.1218170	total: 814ms	remaining: 3.98s
170:	learn: 0.1213518	total: 818ms	remaining: 3.96s
171:	learn: 0.1202675	total: 821ms	remaining: 3.95s
172:	learn: 0.1198894	total: 825ms	remaining: 3.94s
173:	learn: 0.1189230	total: 830ms	remaining: 3.94s
174:	learn: 0.1186202	total: 834ms	remaining: 3.93s
175:	learn: 0.1178995	total: 838ms	remaining: 3.92s
176:	learn: 0.1176920	total: 841ms	remaining: 3.91s
177:	learn: 0.1170213	total: 847ms	remaining: 3.91s
178:	learn: 0.1165422	total: 850ms	remaining: 3.9s
179:	learn: 0.1159154	total: 853ms	remaining: 3.89s
180:	learn: 0.1152075	total: 857ms	remaining: 3.88s
181:	learn: 0.1148459	total: 864ms	remaining: 3.88s
182:	learn: 0.1137684	total: 868ms	remaining: 3.87s



183:	learn: 0.1134186	total: 871ms	remaining: 3.86s
184:	learn: 0.1127520	total: 878ms	remaining: 3.87s
185:	learn: 0.1121780	total: 882ms	remaining: 3.86s
186:	learn: 0.1115317	total: 885ms	remaining: 3.85s
187:	learn: 0.1110334	total: 889ms	remaining: 3.84s
188:	learn: 0.1102634	total: 895ms	remaining: 3.84s
189:	learn: 0.1100678	total: 898ms	remaining: 3.83s
190:	learn: 0.1097478	total: 903ms	remaining: 3.82s
191:	learn: 0.1092108	total: 906ms	remaining: 3.81s
192:	learn: 0.1086512	total: 912ms	remaining: 3.81s
193:	learn: 0.1079181	total: 915ms	remaining: 3.8s
194:	learn: 0.1076076	total: 918ms	remaining: 3.79s
195:	learn: 0.1071329	total: 922ms	remaining: 3.78s
196:	learn: 0.1066362	total: 927ms	remaining: 3.78s
197:	learn: 0.1064403	total: 930ms	remaining: 3.77s
198:	learn: 0.1060233	total: 934ms	remaining: 3.76s
199:	learn: 0.1054765	total: 937ms	remaining: 3.75s
200:	learn: 0.1050564	total: 943ms	remaining: 3.75s
201:	learn: 0.1047403	total: 946ms	remaining: 3.74s
202:	learn: 0.1043094	total: 949ms	remaining: 3.73s
203:	learn: 0.1041559	total: 953ms	remaining: 3.72s
204:	learn: 0.1038236	total: 958ms	remaining: 3.71s
205:	learn: 0.1034109	total: 962ms	remaining: 3.71s
206:	learn: 0.1031200	total: 966ms	remaining: 3.7s
207:	learn: 0.1026077	total: 970ms	remaining: 3.69s
208:	learn: 0.1020673	total: 976ms	remaining: 3.69s
209:	learn: 0.1018493	total: 980ms	remaining: 3.69s
210:	learn: 0.1013113	total: 985ms	remaining: 3.68s
211:	learn: 0.1010428	total: 992ms	remaining: 3.69s
212:	learn: 0.1004899	total: 996ms	remaining: 3.68s
213:	learn: 0.1001241	total: 999ms	remaining: 3.67s
214:	learn: 0.0997176	total: 1.01s	remaining: 3.67s
215:	learn: 0.0993054	total: 1.01s	remaining: 3.67s
216:	learn: 0.0990284	total: 1.01s	remaining: 3.66s
217:	learn: 0.0986864	total: 1.02s	remaining: 3.65s
218:	learn: 0.0981005	total: 1.02s	remaining: 3.64s
219:	learn: 0.0978665	total: 1.02s	remaining: 3.64s
220:	learn: 0.0973460	total: 1.03s	remaining: 3.63s
221:	learn: 0.0968130	total: 1.03s	remaining: 3.62s
222:	learn: 0.0964517	total: 1.04s	remaining: 3.62s
223:	learn: 0.0959080	total: 1.04s	remaining: 3.61s
224:	learn: 0.0955058	total: 1.04s	remaining: 3.6s
225:	learn: 0.0950454	total: 1.05s	remaining: 3.59s
226:	learn: 0.0947959	total: 1.05s	remaining: 3.59s
227:	learn: 0.0944620	total: 1.06s	remaining: 3.58s
228:	learn: 0.0940267	total: 1.06s	remaining: 3.57s
229:	learn: 0.0936580	total: 1.06s	remaining: 3.57s
230:	learn: 0.0931979	total: 1.07s	remaining: 3.56s
231:	learn: 0.0930331	total: 1.07s	remaining: 3.55s
232:	learn: 0.0928653	total: 1.08s	remaining: 3.54s
233:	learn: 0.0924074	total: 1.08s	remaining: 3.54s
234:	learn: 0.0920642	total: 1.08s	remaining: 3.53s
235:	learn: 0.0917315	total: 1.09s	remaining: 3.53s
236:	learn: 0.0913729	total: 1.09s	remaining: 3.52s
237:	learn: 0.0911011	total: 1.1s	remaining: 3.52s
238:	learn: 0.0906809	total: 1.1s	remaining: 3.51s
239:	learn: 0.0901226	total: 1.11s	remaining: 3.51s
240:	learn: 0.0899046	total: 1.11s	remaining: 3.5s
241:	learn: 0.0896562	total: 1.12s	remaining: 3.5s
242:	learn: 0.0888880	total: 1.12s	remaining: 3.49s
243:	learn: 0.0885402	total: 1.12s	remaining: 3.48s
244:	learn: 0.0883556	total: 1.13s	remaining: 3.48s
245:	learn: 0.0879051	total: 1.13s	remaining: 3.48s
246:	learn: 0.0877062	total: 1.14s	remaining: 3.47s
247:	learn: 0.0874015	total: 1.14s	remaining: 3.46s
248:	learn: 0.0872807	total: 1.15s	remaining: 3.46s
249:	learn: 0.0867934	total: 1.15s	remaining: 3.46s
250:	learn: 0.0864720	total: 1.16s	remaining: 3.45s
251:	learn: 0.0859585	total: 1.16s	remaining: 3.45s
252:	learn: 0.0857256	total: 1.17s	remaining: 3.45s
253:	learn: 0.0854997	total: 1.17s	remaining: 3.45s
254:	learn: 0.0851370	total: 1.18s	remaining: 3.45s
255:	learn: 0.0848627	total: 1.18s	remaining: 3.44s
256:	learn: 0.0845201	total: 1.19s	remaining: 3.44s
257:	learn: 0.0842352	total: 1.2s	remaining: 3.44s
258:	learn: 0.0840931	total: 1.2s	remaining: 3.43s
259:	learn: 0.0837543	total: 1.2s	remaining: 3.42s
260:	learn: 0.0834474	total: 1.21s	remaining: 3.42s
261:	learn: 0.0830299	total: 1.21s	remaining: 3.42s
262:	learn: 0.0827711	total: 1.22s	remaining: 3.41s
263:	learn: 0.0824819	total: 1.22s	remaining: 3.4s
264:	learn: 0.0821756	total: 1.23s	remaining: 3.4s
265:	learn: 0.0817282	total: 1.23s	remaining: 3.4s
266:	learn: 0.0815027	total: 1.24s	remaining: 3.39s
267:	learn: 0.0812483	total: 1.24s	remaining: 3.38s
268:	learn: 0.0810272	total: 1.25s	remaining: 3.39s
269:	learn: 0.0807855	total: 1.25s	remaining: 3.38s
270:	learn: 0.0805173	total: 1.25s	remaining: 3.37s
271:	learn: 0.0800233	total: 1.26s	remaining: 3.38s

272:	learn: 0.0797333	total: 1.27s	remaining: 3.37s
273:	learn: 0.0792043	total: 1.27s	remaining: 3.36s
274:	learn: 0.0791158	total: 1.28s	remaining: 3.37s
275:	learn: 0.0789004	total: 1.28s	remaining: 3.36s
276:	learn: 0.0787020	total: 1.28s	remaining: 3.35s
277:	learn: 0.0784383	total: 1.29s	remaining: 3.36s
278:	learn: 0.0783316	total: 1.3s	remaining: 3.35s
279:	learn: 0.0780954	total: 1.3s	remaining: 3.35s
280:	learn: 0.0778444	total: 1.31s	remaining: 3.35s
281:	learn: 0.0777231	total: 1.31s	remaining: 3.35s
282:	learn: 0.0771985	total: 1.32s	remaining: 3.34s
283:	learn: 0.0770071	total: 1.33s	remaining: 3.34s
284:	learn: 0.0767632	total: 1.33s	remaining: 3.34s
285:	learn: 0.0764563	total: 1.33s	remaining: 3.33s
286:	learn: 0.0763107	total: 1.34s	remaining: 3.33s
287:	learn: 0.0758238	total: 1.34s	remaining: 3.33s
288:	learn: 0.0755996	total: 1.35s	remaining: 3.32s
289:	learn: 0.0753409	total: 1.36s	remaining: 3.32s
290:	learn: 0.0751111	total: 1.36s	remaining: 3.32s
291:	learn: 0.0747060	total: 1.36s	remaining: 3.31s
292:	learn: 0.0742441	total: 1.37s	remaining: 3.31s
293:	learn: 0.0740392	total: 1.38s	remaining: 3.31s
294:	learn: 0.0738012	total: 1.38s	remaining: 3.3s
295:	learn: 0.0736580	total: 1.39s	remaining: 3.31s
296:	learn: 0.0734682	total: 1.39s	remaining: 3.3s
297:	learn: 0.0733021	total: 1.4s	remaining: 3.29s
298:	learn: 0.0730383	total: 1.41s	remaining: 3.3s
299:	learn: 0.0727812	total: 1.41s	remaining: 3.29s
300:	learn: 0.0724846	total: 1.42s	remaining: 3.3s
301:	learn: 0.0722212	total: 1.42s	remaining: 3.29s
302:	learn: 0.0720950	total: 1.43s	remaining: 3.29s
303:	learn: 0.0719152	total: 1.44s	remaining: 3.29s
304:	learn: 0.0716130	total: 1.44s	remaining: 3.28s
305:	learn: 0.0713946	total: 1.44s	remaining: 3.27s
306:	learn: 0.0712338	total: 1.45s	remaining: 3.27s
307:	learn: 0.0709582	total: 1.46s	remaining: 3.27s
308:	learn: 0.0707637	total: 1.46s	remaining: 3.26s
309:	learn: 0.0705713	total: 1.47s	remaining: 3.26s
310:	learn: 0.0704183	total: 1.47s	remaining: 3.26s
311:	learn: 0.0701358	total: 1.47s	remaining: 3.25s
312:	learn: 0.0698944	total: 1.48s	remaining: 3.24s
313:	learn: 0.0697336	total: 1.48s	remaining: 3.24s
314:	learn: 0.0694459	total: 1.49s	remaining: 3.23s
315:	learn: 0.0690810	total: 1.49s	remaining: 3.23s
316:	learn: 0.0687983	total: 1.5s	remaining: 3.23s
317:	learn: 0.0685956	total: 1.5s	remaining: 3.22s
318:	learn: 0.0684598	total: 1.5s	remaining: 3.21s
319:	learn: 0.0683595	total: 1.51s	remaining: 3.21s
320:	learn: 0.0681744	total: 1.51s	remaining: 3.2s
321:	learn: 0.0679967	total: 1.52s	remaining: 3.2s
322:	learn: 0.0677958	total: 1.52s	remaining: 3.19s
323:	learn: 0.0676527	total: 1.53s	remaining: 3.19s
324:	learn: 0.0675654	total: 1.53s	remaining: 3.18s
325:	learn: 0.0674219	total: 1.54s	remaining: 3.18s
326:	learn: 0.0671411	total: 1.54s	remaining: 3.17s
327:	learn: 0.0669731	total: 1.55s	remaining: 3.17s
328:	learn: 0.0668252	total: 1.55s	remaining: 3.16s
329:	learn: 0.0664867	total: 1.55s	remaining: 3.15s
330:	learn: 0.0662759	total: 1.56s	remaining: 3.15s
331:	learn: 0.0660049	total: 1.56s	remaining: 3.15s
332:	learn: 0.0658044	total: 1.57s	remaining: 3.14s
333:	learn: 0.0655181	total: 1.57s	remaining: 3.13s
334:	learn: 0.0652947	total: 1.58s	remaining: 3.13s
335:	learn: 0.0651168	total: 1.58s	remaining: 3.12s
336:	learn: 0.0649990	total: 1.58s	remaining: 3.12s
337:	learn: 0.0647168	total: 1.59s	remaining: 3.11s
338:	learn: 0.0646670	total: 1.59s	remaining: 3.11s
339:	learn: 0.0644502	total: 1.6s	remaining: 3.1s
340:	learn: 0.0643212	total: 1.6s	remaining: 3.09s
341:	learn: 0.0640964	total: 1.6s	remaining: 3.09s
342:	learn: 0.0639497	total: 1.61s	remaining: 3.09s
343:	learn: 0.0636645	total: 1.61s	remaining: 3.08s
344:	learn: 0.0635142	total: 1.62s	remaining: 3.07s
345:	learn: 0.0633244	total: 1.62s	remaining: 3.07s
346:	learn: 0.0630372	total: 1.63s	remaining: 3.06s
347:	learn: 0.0629630	total: 1.63s	remaining: 3.06s
348:	learn: 0.0628631	total: 1.64s	remaining: 3.05s
349:	learn: 0.0626656	total: 1.64s	remaining: 3.05s
350:	learn: 0.0624849	total: 1.65s	remaining: 3.05s
351:	learn: 0.0622891	total: 1.65s	remaining: 3.04s
352:	learn: 0.0621762	total: 1.66s	remaining: 3.04s
353:	learn: 0.0620096	total: 1.66s	remaining: 3.03s
354:	learn: 0.0619171	total: 1.67s	remaining: 3.02s
355:	learn: 0.0617328	total: 1.67s	remaining: 3.02s
356:	learn: 0.0616484	total: 1.68s	remaining: 3.02s
357:	learn: 0.0615245	total: 1.68s	remaining: 3.01s
358:	learn: 0.0613479	total: 1.68s	remaining: 3.01s
359:	learn: 0.0611046	total: 1.69s	remaining: 3s
360:	learn: 0.0609209	total: 1.69s	remaining: 3s

361:	learn: 0.0607411	total: 1.7s	remaining: 2.99s
362:	learn: 0.0605887	total: 1.71s	remaining: 2.99s
363:	learn: 0.0603464	total: 1.71s	remaining: 2.99s
364:	learn: 0.0601768	total: 1.71s	remaining: 2.98s
365:	learn: 0.0599936	total: 1.72s	remaining: 2.98s
366:	learn: 0.0598824	total: 1.72s	remaining: 2.97s
367:	learn: 0.0597540	total: 1.73s	remaining: 2.97s
368:	learn: 0.0596257	total: 1.73s	remaining: 2.96s
369:	learn: 0.0594817	total: 1.74s	remaining: 2.96s
370:	learn: 0.0593703	total: 1.74s	remaining: 2.95s
371:	learn: 0.0592919	total: 1.75s	remaining: 2.95s
372:	learn: 0.0591427	total: 1.75s	remaining: 2.95s
373:	learn: 0.0589475	total: 1.76s	remaining: 2.94s
374:	learn: 0.0587734	total: 1.76s	remaining: 2.94s
375:	learn: 0.0586748	total: 1.77s	remaining: 2.94s
376:	learn: 0.0584181	total: 1.77s	remaining: 2.93s
377:	learn: 0.0583233	total: 1.78s	remaining: 2.93s
378:	learn: 0.0582116	total: 1.78s	remaining: 2.92s
379:	learn: 0.0581088	total: 1.79s	remaining: 2.92s
380:	learn: 0.0578922	total: 1.79s	remaining: 2.91s
381:	learn: 0.0576076	total: 1.8s	remaining: 2.91s
382:	learn: 0.0574485	total: 1.8s	remaining: 2.9s
383:	learn: 0.0573236	total: 1.81s	remaining: 2.9s
384:	learn: 0.0570832	total: 1.81s	remaining: 2.89s
385:	learn: 0.0568475	total: 1.82s	remaining: 2.89s
386:	learn: 0.0566872	total: 1.82s	remaining: 2.89s
387:	learn: 0.0565525	total: 1.83s	remaining: 2.88s
388:	learn: 0.0563975	total: 1.83s	remaining: 2.88s
389:	learn: 0.0562772	total: 1.83s	remaining: 2.87s
390:	learn: 0.0561691	total: 1.84s	remaining: 2.87s
391:	learn: 0.0559919	total: 1.84s	remaining: 2.86s
392:	learn: 0.0558375	total: 1.85s	remaining: 2.86s
393:	learn: 0.0556668	total: 1.85s	remaining: 2.85s
394:	learn: 0.0555261	total: 1.86s	remaining: 2.85s
395:	learn: 0.0554364	total: 1.86s	remaining: 2.84s
396:	learn: 0.0551839	total: 1.86s	remaining: 2.83s
397:	learn: 0.0550234	total: 1.87s	remaining: 2.83s
398:	learn: 0.0549007	total: 1.87s	remaining: 2.82s
399:	learn: 0.0547278	total: 1.88s	remaining: 2.81s
400:	learn: 0.0546119	total: 1.88s	remaining: 2.81s
401:	learn: 0.0545443	total: 1.88s	remaining: 2.8s
402:	learn: 0.0542863	total: 1.89s	remaining: 2.8s
403:	learn: 0.0541858	total: 1.89s	remaining: 2.79s
404:	learn: 0.0540504	total: 1.9s	remaining: 2.79s
405:	learn: 0.0538713	total: 1.9s	remaining: 2.78s
406:	learn: 0.0537831	total: 1.9s	remaining: 2.77s
407:	learn: 0.0536579	total: 1.91s	remaining: 2.77s
408:	learn: 0.0534779	total: 1.91s	remaining: 2.76s
409:	learn: 0.0533003	total: 1.92s	remaining: 2.76s
410:	learn: 0.0531412	total: 1.92s	remaining: 2.75s
411:	learn: 0.0530187	total: 1.92s	remaining: 2.75s
412:	learn: 0.0527988	total: 1.93s	remaining: 2.74s
413:	learn: 0.0525911	total: 1.93s	remaining: 2.73s
414:	learn: 0.0523675	total: 1.94s	remaining: 2.73s
415:	learn: 0.0522304	total: 1.94s	remaining: 2.72s
416:	learn: 0.0520928	total: 1.94s	remaining: 2.72s
417:	learn: 0.0519005	total: 1.95s	remaining: 2.71s
418:	learn: 0.0517320	total: 1.95s	remaining: 2.71s
419:	learn: 0.0516205	total: 1.96s	remaining: 2.7s
420:	learn: 0.0514924	total: 1.96s	remaining: 2.69s
421:	learn: 0.0513940	total: 1.96s	remaining: 2.69s
422:	learn: 0.0512332	total: 1.97s	remaining: 2.68s
423:	learn: 0.0510575	total: 1.97s	remaining: 2.68s
424:	learn: 0.0509307	total: 1.97s	remaining: 2.67s
425:	learn: 0.0507797	total: 1.98s	remaining: 2.67s
426:	learn: 0.0506878	total: 1.98s	remaining: 2.66s
427:	learn: 0.0504984	total: 1.99s	remaining: 2.65s
428:	learn: 0.0503606	total: 1.99s	remaining: 2.65s
429:	learn: 0.0502526	total: 1.99s	remaining: 2.64s
430:	learn: 0.0501522	total: 2s	remaining: 2.64s
431:	learn: 0.0500270	total: 2s	remaining: 2.63s
432:	learn: 0.0499285	total: 2s	remaining: 2.63s
433:	learn: 0.0497749	total: 2.01s	remaining: 2.62s
434:	learn: 0.0496367	total: 2.01s	remaining: 2.61s
435:	learn: 0.0495681	total: 2.02s	remaining: 2.61s
436:	learn: 0.0494548	total: 2.02s	remaining: 2.6s
437:	learn: 0.0493257	total: 2.02s	remaining: 2.6s
438:	learn: 0.0492221	total: 2.03s	remaining: 2.59s
439:	learn: 0.0491348	total: 2.03s	remaining: 2.59s
440:	learn: 0.0489926	total: 2.04s	remaining: 2.58s
441:	learn: 0.0488062	total: 2.04s	remaining: 2.58s
442:	learn: 0.0486618	total: 2.04s	remaining: 2.57s
443:	learn: 0.0485102	total: 2.05s	remaining: 2.57s
444:	learn: 0.0483782	total: 2.06s	remaining: 2.56s
445:	learn: 0.0482397	total: 2.06s	remaining: 2.56s
446:	learn: 0.0481267	total: 2.06s	remaining: 2.55s
447:	learn: 0.0479065	total: 2.07s	remaining: 2.55s
448:	learn: 0.0477265	total: 2.08s	remaining: 2.55s
449:	learn: 0.0476225	total: 2.08s	remaining: 2.54s

450:	learn: 0.0475018	total: 2.08s	remaining: 2.54s
451:	learn: 0.0474088	total: 2.09s	remaining: 2.54s
452:	learn: 0.0473139	total: 2.1s	remaining: 2.53s
453:	learn: 0.0472178	total: 2.1s	remaining: 2.53s
454:	learn: 0.0470890	total: 2.11s	remaining: 2.52s
455:	learn: 0.0470075	total: 2.11s	remaining: 2.52s
456:	learn: 0.0468664	total: 2.12s	remaining: 2.52s
457:	learn: 0.0468162	total: 2.12s	remaining: 2.51s
458:	learn: 0.0467190	total: 2.13s	remaining: 2.51s
459:	learn: 0.0465838	total: 2.13s	remaining: 2.51s
460:	learn: 0.0464579	total: 2.14s	remaining: 2.5s
461:	learn: 0.0463299	total: 2.14s	remaining: 2.5s
462:	learn: 0.0462407	total: 2.15s	remaining: 2.49s
463:	learn: 0.0461478	total: 2.15s	remaining: 2.49s
464:	learn: 0.0460679	total: 2.16s	remaining: 2.48s
465:	learn: 0.0459570	total: 2.16s	remaining: 2.48s
466:	learn: 0.0458341	total: 2.17s	remaining: 2.48s
467:	learn: 0.0457845	total: 2.17s	remaining: 2.47s
468:	learn: 0.0457027	total: 2.18s	remaining: 2.47s
469:	learn: 0.0456310	total: 2.19s	remaining: 2.46s
470:	learn: 0.0455793	total: 2.19s	remaining: 2.46s
471:	learn: 0.0454713	total: 2.19s	remaining: 2.45s
472:	learn: 0.0453410	total: 2.2s	remaining: 2.45s
473:	learn: 0.0451401	total: 2.21s	remaining: 2.45s
474:	learn: 0.0450046	total: 2.21s	remaining: 2.44s
475:	learn: 0.0449096	total: 2.22s	remaining: 2.44s
476:	learn: 0.0448365	total: 2.22s	remaining: 2.44s
477:	learn: 0.0447778	total: 2.23s	remaining: 2.43s
478:	learn: 0.0446625	total: 2.23s	remaining: 2.43s
479:	learn: 0.0445841	total: 2.24s	remaining: 2.42s
480:	learn: 0.0445260	total: 2.24s	remaining: 2.42s
481:	learn: 0.0443803	total: 2.25s	remaining: 2.42s
482:	learn: 0.0442838	total: 2.25s	remaining: 2.41s
483:	learn: 0.0441873	total: 2.25s	remaining: 2.4s
484:	learn: 0.0441229	total: 2.26s	remaining: 2.4s
485:	learn: 0.0439902	total: 2.26s	remaining: 2.4s
486:	learn: 0.0439230	total: 2.27s	remaining: 2.39s
487:	learn: 0.0438423	total: 2.27s	remaining: 2.38s
488:	learn: 0.0437339	total: 2.28s	remaining: 2.38s
489:	learn: 0.0436222	total: 2.28s	remaining: 2.37s
490:	learn: 0.0435628	total: 2.29s	remaining: 2.37s
491:	learn: 0.0435257	total: 2.29s	remaining: 2.36s
492:	learn: 0.0433653	total: 2.29s	remaining: 2.36s
493:	learn: 0.0432342	total: 2.3s	remaining: 2.35s
494:	learn: 0.0431222	total: 2.3s	remaining: 2.35s
495:	learn: 0.0430213	total: 2.31s	remaining: 2.34s
496:	learn: 0.0429440	total: 2.31s	remaining: 2.34s
497:	learn: 0.0428578	total: 2.31s	remaining: 2.33s
498:	learn: 0.0427807	total: 2.32s	remaining: 2.33s
499:	learn: 0.0427051	total: 2.32s	remaining: 2.32s
500:	learn: 0.0425893	total: 2.33s	remaining: 2.32s
501:	learn: 0.0424644	total: 2.33s	remaining: 2.31s
502:	learn: 0.0423089	total: 2.33s	remaining: 2.31s
503:	learn: 0.0422214	total: 2.34s	remaining: 2.3s
504:	learn: 0.0420928	total: 2.34s	remaining: 2.3s
505:	learn: 0.0419563	total: 2.35s	remaining: 2.29s
506:	learn: 0.0418263	total: 2.35s	remaining: 2.29s
507:	learn: 0.0416749	total: 2.35s	remaining: 2.28s
508:	learn: 0.0415737	total: 2.36s	remaining: 2.28s
509:	learn: 0.0414214	total: 2.36s	remaining: 2.27s
510:	learn: 0.0413216	total: 2.37s	remaining: 2.27s
511:	learn: 0.0412358	total: 2.37s	remaining: 2.26s
512:	learn: 0.0411181	total: 2.38s	remaining: 2.25s
513:	learn: 0.0410714	total: 2.38s	remaining: 2.25s
514:	learn: 0.0410260	total: 2.38s	remaining: 2.24s
515:	learn: 0.0409312	total: 2.39s	remaining: 2.24s
516:	learn: 0.0409008	total: 2.39s	remaining: 2.23s
517:	learn: 0.0408687	total: 2.4s	remaining: 2.23s
518:	learn: 0.0408248	total: 2.4s	remaining: 2.22s
519:	learn: 0.0406726	total: 2.4s	remaining: 2.22s
520:	learn: 0.0406154	total: 2.41s	remaining: 2.21s
521:	learn: 0.0405059	total: 2.41s	remaining: 2.21s
522:	learn: 0.0404144	total: 2.42s	remaining: 2.2s
523:	learn: 0.0403184	total: 2.42s	remaining: 2.2s
524:	learn: 0.0401183	total: 2.43s	remaining: 2.19s
525:	learn: 0.0400436	total: 2.43s	remaining: 2.19s
526:	learn: 0.0399963	total: 2.43s	remaining: 2.18s
527:	learn: 0.0399269	total: 2.44s	remaining: 2.18s
528:	learn: 0.0398269	total: 2.44s	remaining: 2.18s
529:	learn: 0.0397507	total: 2.45s	remaining: 2.17s
530:	learn: 0.0396397	total: 2.45s	remaining: 2.16s
531:	learn: 0.0394991	total: 2.46s	remaining: 2.16s
532:	learn: 0.0393883	total: 2.46s	remaining: 2.15s
533:	learn: 0.0392777	total: 2.46s	remaining: 2.15s
534:	learn: 0.0392284	total: 2.47s	remaining: 2.15s
535:	learn: 0.0391007	total: 2.47s	remaining: 2.14s
536:	learn: 0.0389954	total: 2.48s	remaining: 2.13s
537:	learn: 0.0389230	total: 2.48s	remaining: 2.13s
538:	learn: 0.0388040	total: 2.49s	remaining: 2.13s

539:	learn: 0.0386879	total: 2.49s	remaining: 2.12s
540:	learn: 0.0386306	total: 2.49s	remaining: 2.12s
541:	learn: 0.0385654	total: 2.5s	remaining: 2.11s
542:	learn: 0.0384619	total: 2.5s	remaining: 2.11s
543:	learn: 0.0383373	total: 2.51s	remaining: 2.1s
544:	learn: 0.0382659	total: 2.51s	remaining: 2.1s
545:	learn: 0.0381789	total: 2.52s	remaining: 2.09s
546:	learn: 0.0380670	total: 2.52s	remaining: 2.09s
547:	learn: 0.0380047	total: 2.52s	remaining: 2.08s
548:	learn: 0.0378677	total: 2.53s	remaining: 2.08s
549:	learn: 0.0378191	total: 2.54s	remaining: 2.07s
550:	learn: 0.0377250	total: 2.54s	remaining: 2.07s
551:	learn: 0.0376561	total: 2.54s	remaining: 2.06s
552:	learn: 0.0375793	total: 2.55s	remaining: 2.06s
553:	learn: 0.0374910	total: 2.55s	remaining: 2.05s
554:	learn: 0.0374380	total: 2.56s	remaining: 2.05s
555:	learn: 0.0373507	total: 2.56s	remaining: 2.04s
556:	learn: 0.0372330	total: 2.57s	remaining: 2.04s
557:	learn: 0.0371479	total: 2.57s	remaining: 2.04s
558:	learn: 0.0371135	total: 2.57s	remaining: 2.03s
559:	learn: 0.0370540	total: 2.58s	remaining: 2.03s
560:	learn: 0.0369706	total: 2.58s	remaining: 2.02s
561:	learn: 0.0369367	total: 2.59s	remaining: 2.02s
562:	learn: 0.0368826	total: 2.59s	remaining: 2.01s
563:	learn: 0.0368140	total: 2.6s	remaining: 2.01s
564:	learn: 0.0367514	total: 2.6s	remaining: 2s
565:	learn: 0.0366429	total: 2.61s	remaining: 2s
566:	learn: 0.0365326	total: 2.61s	remaining: 1.99s
567:	learn: 0.0364655	total: 2.62s	remaining: 1.99s
568:	learn: 0.0363794	total: 2.62s	remaining: 1.98s
569:	learn: 0.0363257	total: 2.62s	remaining: 1.98s
570:	learn: 0.0362359	total: 2.63s	remaining: 1.98s
571:	learn: 0.0361826	total: 2.63s	remaining: 1.97s
572:	learn: 0.0361131	total: 2.64s	remaining: 1.96s
573:	learn: 0.0360430	total: 2.64s	remaining: 1.96s
574:	learn: 0.0359905	total: 2.65s	remaining: 1.96s
575:	learn: 0.0359371	total: 2.65s	remaining: 1.95s
576:	learn: 0.0358479	total: 2.65s	remaining: 1.95s
577:	learn: 0.0357780	total: 2.66s	remaining: 1.94s
578:	learn: 0.0356761	total: 2.66s	remaining: 1.94s
579:	learn: 0.0356239	total: 2.67s	remaining: 1.93s
580:	learn: 0.0355091	total: 2.67s	remaining: 1.92s
581:	learn: 0.0354275	total: 2.67s	remaining: 1.92s
582:	learn: 0.0353137	total: 2.68s	remaining: 1.92s
583:	learn: 0.0352355	total: 2.68s	remaining: 1.91s
584:	learn: 0.0351887	total: 2.68s	remaining: 1.9s
585:	learn: 0.0351073	total: 2.69s	remaining: 1.9s
586:	learn: 0.0350387	total: 2.69s	remaining: 1.9s
587:	learn: 0.0349246	total: 2.7s	remaining: 1.89s
588:	learn: 0.0348927	total: 2.7s	remaining: 1.88s
589:	learn: 0.0348360	total: 2.71s	remaining: 1.88s
590:	learn: 0.0347381	total: 2.71s	remaining: 1.88s
591:	learn: 0.0346575	total: 2.71s	remaining: 1.87s
592:	learn: 0.0345695	total: 2.72s	remaining: 1.86s
593:	learn: 0.0345336	total: 2.72s	remaining: 1.86s
594:	learn: 0.0344625	total: 2.73s	remaining: 1.86s
595:	learn: 0.0343760	total: 2.73s	remaining: 1.85s
596:	learn: 0.0343443	total: 2.73s	remaining: 1.85s
597:	learn: 0.0342939	total: 2.74s	remaining: 1.84s
598:	learn: 0.0342061	total: 2.74s	remaining: 1.84s
599:	learn: 0.0341176	total: 2.75s	remaining: 1.83s
600:	learn: 0.0340791	total: 2.75s	remaining: 1.83s
601:	learn: 0.0339879	total: 2.76s	remaining: 1.82s
602:	learn: 0.0338787	total: 2.76s	remaining: 1.82s
603:	learn: 0.0338089	total: 2.77s	remaining: 1.81s
604:	learn: 0.0337139	total: 2.77s	remaining: 1.81s
605:	learn: 0.0336352	total: 2.78s	remaining: 1.81s
606:	learn: 0.0335478	total: 2.78s	remaining: 1.8s
607:	learn: 0.0334929	total: 2.79s	remaining: 1.8s
608:	learn: 0.0334194	total: 2.79s	remaining: 1.79s
609:	learn: 0.0333835	total: 2.8s	remaining: 1.79s
610:	learn: 0.0333464	total: 2.8s	remaining: 1.78s
611:	learn: 0.0333105	total: 2.81s	remaining: 1.78s
612:	learn: 0.0332495	total: 2.81s	remaining: 1.77s
613:	learn: 0.0331900	total: 2.82s	remaining: 1.77s
614:	learn: 0.0331513	total: 2.82s	remaining: 1.77s
615:	learn: 0.0330919	total: 2.83s	remaining: 1.76s
616:	learn: 0.0330059	total: 2.83s	remaining: 1.76s
617:	learn: 0.0329768	total: 2.84s	remaining: 1.75s
618:	learn: 0.0329398	total: 2.85s	remaining: 1.75s
619:	learn: 0.0328872	total: 2.85s	remaining: 1.75s
620:	learn: 0.0328064	total: 2.85s	remaining: 1.74s
621:	learn: 0.0327233	total: 2.86s	remaining: 1.74s
622:	learn: 0.0326406	total: 2.87s	remaining: 1.73s
623:	learn: 0.0325289	total: 2.87s	remaining: 1.73s
624:	learn: 0.0324363	total: 2.87s	remaining: 1.72s
625:	learn: 0.0323781	total: 2.88s	remaining: 1.72s
626:	learn: 0.0323511	total: 2.88s	remaining: 1.71s
627:	learn: 0.0322594	total: 2.88s	remaining: 1.71s

628:	learn: 0.0322316	total: 2.89s	remaining: 1.7s
629:	learn: 0.0321654	total: 2.89s	remaining: 1.7s
630:	learn: 0.0320346	total: 2.9s	remaining: 1.69s
631:	learn: 0.0319071	total: 2.9s	remaining: 1.69s
632:	learn: 0.0318566	total: 2.91s	remaining: 1.68s
633:	learn: 0.0318176	total: 2.91s	remaining: 1.68s
634:	learn: 0.0317369	total: 2.91s	remaining: 1.67s
635:	learn: 0.0317030	total: 2.92s	remaining: 1.67s
636:	learn: 0.0316564	total: 2.92s	remaining: 1.67s
637:	learn: 0.0315754	total: 2.93s	remaining: 1.66s
638:	learn: 0.0315054	total: 2.93s	remaining: 1.66s
639:	learn: 0.0314754	total: 2.94s	remaining: 1.65s
640:	learn: 0.0314144	total: 2.94s	remaining: 1.65s
641:	learn: 0.0313672	total: 2.94s	remaining: 1.64s
642:	learn: 0.0313181	total: 2.95s	remaining: 1.64s
643:	learn: 0.0312473	total: 2.95s	remaining: 1.63s
644:	learn: 0.0311951	total: 2.96s	remaining: 1.63s
645:	learn: 0.0311342	total: 2.96s	remaining: 1.62s
646:	learn: 0.0310806	total: 2.96s	remaining: 1.62s
647:	learn: 0.0310189	total: 2.97s	remaining: 1.61s
648:	learn: 0.0309918	total: 2.97s	remaining: 1.61s
649:	learn: 0.0309346	total: 2.98s	remaining: 1.6s
650:	learn: 0.0308916	total: 2.98s	remaining: 1.6s
651:	learn: 0.0308602	total: 2.99s	remaining: 1.59s
652:	learn: 0.0308061	total: 2.99s	remaining: 1.59s
653:	learn: 0.0307175	total: 3s	remaining: 1.58s
654:	learn: 0.0306840	total: 3s	remaining: 1.58s
655:	learn: 0.0306214	total: 3s	remaining: 1.57s
656:	learn: 0.0305990	total: 3.01s	remaining: 1.57s
657:	learn: 0.0305734	total: 3.01s	remaining: 1.56s
658:	learn: 0.0305402	total: 3.02s	remaining: 1.56s
659:	learn: 0.0304786	total: 3.02s	remaining: 1.55s
660:	learn: 0.0304541	total: 3.02s	remaining: 1.55s
661:	learn: 0.0303739	total: 3.03s	remaining: 1.55s
662:	learn: 0.0303088	total: 3.03s	remaining: 1.54s
663:	learn: 0.0302756	total: 3.04s	remaining: 1.54s
664:	learn: 0.0301880	total: 3.04s	remaining: 1.53s
665:	learn: 0.0301563	total: 3.05s	remaining: 1.53s
666:	learn: 0.0301162	total: 3.05s	remaining: 1.52s
667:	learn: 0.0300133	total: 3.06s	remaining: 1.52s
668:	learn: 0.0299410	total: 3.06s	remaining: 1.51s
669:	learn: 0.0298950	total: 3.06s	remaining: 1.51s
670:	learn: 0.0298229	total: 3.07s	remaining: 1.5s
671:	learn: 0.0297702	total: 3.08s	remaining: 1.5s
672:	learn: 0.0297104	total: 3.08s	remaining: 1.5s
673:	learn: 0.0296533	total: 3.08s	remaining: 1.49s
674:	learn: 0.0295624	total: 3.09s	remaining: 1.49s
675:	learn: 0.0295441	total: 3.09s	remaining: 1.48s
676:	learn: 0.0294828	total: 3.1s	remaining: 1.48s
677:	learn: 0.0294206	total: 3.1s	remaining: 1.47s
678:	learn: 0.0293971	total: 3.11s	remaining: 1.47s
679:	learn: 0.0293520	total: 3.11s	remaining: 1.46s
680:	learn: 0.0293220	total: 3.12s	remaining: 1.46s
681:	learn: 0.0292723	total: 3.12s	remaining: 1.46s
682:	learn: 0.0292069	total: 3.13s	remaining: 1.45s
683:	learn: 0.0290865	total: 3.13s	remaining: 1.45s
684:	learn: 0.0290403	total: 3.14s	remaining: 1.44s
685:	learn: 0.0289953	total: 3.14s	remaining: 1.44s
686:	learn: 0.0289561	total: 3.15s	remaining: 1.43s
687:	learn: 0.0288851	total: 3.15s	remaining: 1.43s
688:	learn: 0.0288099	total: 3.16s	remaining: 1.42s
689:	learn: 0.0287547	total: 3.16s	remaining: 1.42s
690:	learn: 0.0287124	total: 3.16s	remaining: 1.42s
691:	learn: 0.0286427	total: 3.17s	remaining: 1.41s
692:	learn: 0.0286155	total: 3.17s	remaining: 1.41s
693:	learn: 0.0285594	total: 3.18s	remaining: 1.4s
694:	learn: 0.0285065	total: 3.19s	remaining: 1.4s
695:	learn: 0.0284812	total: 3.19s	remaining: 1.39s
696:	learn: 0.0284261	total: 3.19s	remaining: 1.39s
697:	learn: 0.0283686	total: 3.2s	remaining: 1.39s
698:	learn: 0.0282986	total: 3.21s	remaining: 1.38s
699:	learn: 0.0282618	total: 3.21s	remaining: 1.38s
700:	learn: 0.0282095	total: 3.21s	remaining: 1.37s
701:	learn: 0.0281765	total: 3.22s	remaining: 1.37s
702:	learn: 0.0281309	total: 3.22s	remaining: 1.36s
703:	learn: 0.0280914	total: 3.23s	remaining: 1.36s
704:	learn: 0.0280445	total: 3.23s	remaining: 1.35s
705:	learn: 0.0280117	total: 3.24s	remaining: 1.35s
706:	learn: 0.0279687	total: 3.24s	remaining: 1.34s
707:	learn: 0.0279048	total: 3.25s	remaining: 1.34s
708:	learn: 0.0278637	total: 3.25s	remaining: 1.34s
709:	learn: 0.0278240	total: 3.26s	remaining: 1.33s
710:	learn: 0.0277714	total: 3.27s	remaining: 1.33s
711:	learn: 0.0277312	total: 3.27s	remaining: 1.32s
712:	learn: 0.0276587	total: 3.27s	remaining: 1.32s
713:	learn: 0.0276095	total: 3.28s	remaining: 1.31s
714:	learn: 0.0275430	total: 3.28s	remaining: 1.31s
715:	learn: 0.0274816	total: 3.29s	remaining: 1.3s
716:	learn: 0.0274392	total: 3.29s	remaining: 1.3s

717:	learn: 0.0274085	total: 3.29s	remaining: 1.29s
718:	learn: 0.0273734	total: 3.3s	remaining: 1.29s
719:	learn: 0.0272716	total: 3.3s	remaining: 1.28s
720:	learn: 0.0272017	total: 3.31s	remaining: 1.28s
721:	learn: 0.0271738	total: 3.31s	remaining: 1.27s
722:	learn: 0.0271320	total: 3.31s	remaining: 1.27s
723:	learn: 0.0271118	total: 3.32s	remaining: 1.26s
724:	learn: 0.0270686	total: 3.32s	remaining: 1.26s
725:	learn: 0.0270131	total: 3.33s	remaining: 1.25s
726:	learn: 0.0269504	total: 3.33s	remaining: 1.25s
727:	learn: 0.0268919	total: 3.33s	remaining: 1.25s
728:	learn: 0.0268517	total: 3.34s	remaining: 1.24s
729:	learn: 0.0268003	total: 3.34s	remaining: 1.24s
730:	learn: 0.0267529	total: 3.35s	remaining: 1.23s
731:	learn: 0.0267231	total: 3.35s	remaining: 1.23s
732:	learn: 0.0266954	total: 3.35s	remaining: 1.22s
733:	learn: 0.0266586	total: 3.36s	remaining: 1.22s
734:	learn: 0.0266357	total: 3.37s	remaining: 1.21s
735:	learn: 0.0265857	total: 3.37s	remaining: 1.21s
736:	learn: 0.0265367	total: 3.37s	remaining: 1.2s
737:	learn: 0.0264988	total: 3.38s	remaining: 1.2s
738:	learn: 0.0264529	total: 3.38s	remaining: 1.19s
739:	learn: 0.0264062	total: 3.38s	remaining: 1.19s
740:	learn: 0.0263795	total: 3.39s	remaining: 1.18s
741:	learn: 0.0263258	total: 3.4s	remaining: 1.18s
742:	learn: 0.0262370	total: 3.4s	remaining: 1.18s
743:	learn: 0.0262183	total: 3.4s	remaining: 1.17s
744:	learn: 0.0261960	total: 3.41s	remaining: 1.17s
745:	learn: 0.0261372	total: 3.41s	remaining: 1.16s
746:	learn: 0.0261093	total: 3.42s	remaining: 1.16s
747:	learn: 0.0260315	total: 3.42s	remaining: 1.15s
748:	learn: 0.0259861	total: 3.42s	remaining: 1.15s
749:	learn: 0.0259461	total: 3.43s	remaining: 1.14s
750:	learn: 0.0258764	total: 3.43s	remaining: 1.14s
751:	learn: 0.0258510	total: 3.44s	remaining: 1.13s
752:	learn: 0.0258113	total: 3.44s	remaining: 1.13s
753:	learn: 0.0257773	total: 3.45s	remaining: 1.12s
754:	learn: 0.0257414	total: 3.45s	remaining: 1.12s
755:	learn: 0.0257018	total: 3.46s	remaining: 1.11s
756:	learn: 0.0256641	total: 3.46s	remaining: 1.11s
757:	learn: 0.0256194	total: 3.46s	remaining: 1.1s
758:	learn: 0.0255812	total: 3.47s	remaining: 1.1s
759:	learn: 0.0255262	total: 3.47s	remaining: 1.1s
760:	learn: 0.0254754	total: 3.48s	remaining: 1.09s
761:	learn: 0.0254391	total: 3.48s	remaining: 1.09s
762:	learn: 0.0253936	total: 3.48s	remaining: 1.08s
763:	learn: 0.0253288	total: 3.49s	remaining: 1.08s
764:	learn: 0.0252544	total: 3.49s	remaining: 1.07s
765:	learn: 0.0252194	total: 3.5s	remaining: 1.07s
766:	learn: 0.0251845	total: 3.5s	remaining: 1.06s
767:	learn: 0.0251501	total: 3.51s	remaining: 1.06s
768:	learn: 0.0251330	total: 3.51s	remaining: 1.05s
769:	learn: 0.0250820	total: 3.52s	remaining: 1.05s
770:	learn: 0.0250543	total: 3.52s	remaining: 1.05s
771:	learn: 0.0250293	total: 3.52s	remaining: 1.04s
772:	learn: 0.0250016	total: 3.53s	remaining: 1.04s
773:	learn: 0.0249196	total: 3.54s	remaining: 1.03s
774:	learn: 0.0248868	total: 3.54s	remaining: 1.03s
775:	learn: 0.0248660	total: 3.54s	remaining: 1.02s
776:	learn: 0.0248344	total: 3.55s	remaining: 1.02s
777:	learn: 0.0247753	total: 3.55s	remaining: 1.01s
778:	learn: 0.0247432	total: 3.56s	remaining: 1.01s
779:	learn: 0.0247358	total: 3.56s	remaining: 1s
780:	learn: 0.0246938	total: 3.57s	remaining: 1s
781:	learn: 0.0246373	total: 3.57s	remaining: 995ms
782:	learn: 0.0245967	total: 3.57s	remaining: 991ms
783:	learn: 0.0245401	total: 3.58s	remaining: 986ms
784:	learn: 0.0245131	total: 3.58s	remaining: 981ms
785:	learn: 0.0244912	total: 3.59s	remaining: 977ms
786:	learn: 0.0244628	total: 3.59s	remaining: 972ms
787:	learn: 0.0244076	total: 3.59s	remaining: 967ms
788:	learn: 0.0243883	total: 3.6s	remaining: 963ms
789:	learn: 0.0243336	total: 3.6s	remaining: 958ms
790:	learn: 0.0242890	total: 3.61s	remaining: 953ms
791:	learn: 0.0242542	total: 3.61s	remaining: 948ms
792:	learn: 0.0242118	total: 3.62s	remaining: 944ms
793:	learn: 0.0241875	total: 3.62s	remaining: 939ms
794:	learn: 0.0241464	total: 3.62s	remaining: 934ms
795:	learn: 0.0241145	total: 3.63s	remaining: 930ms
796:	learn: 0.0240757	total: 3.63s	remaining: 925ms
797:	learn: 0.0240476	total: 3.63s	remaining: 920ms
798:	learn: 0.0240070	total: 3.64s	remaining: 916ms
799:	learn: 0.0239691	total: 3.64s	remaining: 911ms
800:	learn: 0.0239285	total: 3.65s	remaining: 907ms
801:	learn: 0.0238936	total: 3.65s	remaining: 902ms
802:	learn: 0.0238313	total: 3.66s	remaining: 898ms
803:	learn: 0.0238120	total: 3.66s	remaining: 893ms
804:	learn: 0.0237811	total: 3.67s	remaining: 889ms
805:	learn: 0.0237516	total: 3.67s	remaining: 884ms

806:	learn: 0.0237321	total: 3.68s	remaining: 880ms
807:	learn: 0.0236875	total: 3.68s	remaining: 875ms
808:	learn: 0.0236688	total: 3.69s	remaining: 870ms
809:	learn: 0.0236293	total: 3.69s	remaining: 866ms
810:	learn: 0.0235863	total: 3.69s	remaining: 861ms
811:	learn: 0.0235655	total: 3.7s	remaining: 857ms
812:	learn: 0.0235514	total: 3.7s	remaining: 852ms
813:	learn: 0.0235195	total: 3.71s	remaining: 848ms
814:	learn: 0.0234684	total: 3.72s	remaining: 844ms
815:	learn: 0.0234277	total: 3.72s	remaining: 839ms
816:	learn: 0.0233961	total: 3.73s	remaining: 835ms
817:	learn: 0.0233335	total: 3.73s	remaining: 830ms
818:	learn: 0.0233021	total: 3.74s	remaining: 826ms
819:	learn: 0.0232816	total: 3.74s	remaining: 821ms
820:	learn: 0.0232385	total: 3.75s	remaining: 817ms
821:	learn: 0.0232002	total: 3.75s	remaining: 812ms
822:	learn: 0.0231661	total: 3.75s	remaining: 808ms
823:	learn: 0.0231152	total: 3.76s	remaining: 803ms
824:	learn: 0.0230738	total: 3.76s	remaining: 799ms
825:	learn: 0.0230399	total: 3.77s	remaining: 794ms
826:	learn: 0.0230139	total: 3.77s	remaining: 790ms
827:	learn: 0.0229581	total: 3.78s	remaining: 785ms
828:	learn: 0.0229277	total: 3.79s	remaining: 781ms
829:	learn: 0.0229021	total: 3.79s	remaining: 776ms
830:	learn: 0.0228657	total: 3.79s	remaining: 772ms
831:	learn: 0.0227940	total: 3.8s	remaining: 767ms
832:	learn: 0.0227503	total: 3.8s	remaining: 762ms
833:	learn: 0.0227117	total: 3.8s	remaining: 757ms
834:	learn: 0.0226893	total: 3.81s	remaining: 753ms
835:	learn: 0.0226577	total: 3.81s	remaining: 748ms
836:	learn: 0.0226351	total: 3.82s	remaining: 743ms
837:	learn: 0.0226038	total: 3.82s	remaining: 739ms
838:	learn: 0.0225831	total: 3.82s	remaining: 734ms
839:	learn: 0.0225510	total: 3.83s	remaining: 729ms
840:	learn: 0.0225268	total: 3.83s	remaining: 724ms
841:	learn: 0.0224848	total: 3.83s	remaining: 719ms
842:	learn: 0.0224174	total: 3.84s	remaining: 715ms
843:	learn: 0.0223726	total: 3.84s	remaining: 710ms
844:	learn: 0.0223412	total: 3.84s	remaining: 705ms
845:	learn: 0.0223057	total: 3.85s	remaining: 700ms
846:	learn: 0.0222861	total: 3.85s	remaining: 696ms
847:	learn: 0.0222478	total: 3.85s	remaining: 691ms
848:	learn: 0.0222217	total: 3.86s	remaining: 686ms
849:	learn: 0.0221899	total: 3.86s	remaining: 682ms
850:	learn: 0.0221535	total: 3.87s	remaining: 677ms
851:	learn: 0.0221289	total: 3.87s	remaining: 672ms
852:	learn: 0.0221004	total: 3.87s	remaining: 668ms
853:	learn: 0.0220796	total: 3.88s	remaining: 664ms
854:	learn: 0.0220332	total: 3.88s	remaining: 659ms
855:	learn: 0.0220258	total: 3.89s	remaining: 654ms
856:	learn: 0.0220048	total: 3.89s	remaining: 650ms
857:	learn: 0.0219698	total: 3.9s	remaining: 645ms
858:	learn: 0.0219368	total: 3.9s	remaining: 640ms
859:	learn: 0.0219220	total: 3.9s	remaining: 636ms
860:	learn: 0.0218885	total: 3.91s	remaining: 631ms
861:	learn: 0.0218386	total: 3.91s	remaining: 626ms
862:	learn: 0.0218023	total: 3.92s	remaining: 622ms
863:	learn: 0.0217760	total: 3.92s	remaining: 617ms
864:	learn: 0.0217428	total: 3.92s	remaining: 613ms
865:	learn: 0.0217055	total: 3.93s	remaining: 608ms
866:	learn: 0.0216816	total: 3.93s	remaining: 603ms
867:	learn: 0.0216555	total: 3.94s	remaining: 599ms
868:	learn: 0.0216410	total: 3.94s	remaining: 594ms
869:	learn: 0.0216092	total: 3.94s	remaining: 589ms
870:	learn: 0.0215784	total: 3.95s	remaining: 585ms
871:	learn: 0.0215682	total: 3.95s	remaining: 580ms
872:	learn: 0.0215223	total: 3.96s	remaining: 576ms
873:	learn: 0.0214963	total: 3.96s	remaining: 571ms
874:	learn: 0.0214816	total: 3.96s	remaining: 566ms
875:	learn: 0.0214391	total: 3.97s	remaining: 562ms
876:	learn: 0.0214141	total: 3.97s	remaining: 557ms
877:	learn: 0.0213758	total: 3.98s	remaining: 553ms
878:	learn: 0.0213533	total: 3.98s	remaining: 548ms
879:	learn: 0.0213282	total: 3.98s	remaining: 543ms
880:	learn: 0.0212796	total: 3.99s	remaining: 539ms
881:	learn: 0.0212645	total: 3.99s	remaining: 534ms
882:	learn: 0.0212167	total: 3.99s	remaining: 529ms
883:	learn: 0.0211518	total: 4s	remaining: 525ms
884:	learn: 0.0211366	total: 4s	remaining: 520ms
885:	learn: 0.0211090	total: 4.01s	remaining: 516ms
886:	learn: 0.0210816	total: 4.01s	remaining: 511ms
887:	learn: 0.0210668	total: 4.02s	remaining: 507ms
888:	learn: 0.0210400	total: 4.02s	remaining: 502ms
889:	learn: 0.0210203	total: 4.02s	remaining: 497ms
890:	learn: 0.0210042	total: 4.03s	remaining: 493ms
891:	learn: 0.0209710	total: 4.03s	remaining: 488ms
892:	learn: 0.0209296	total: 4.04s	remaining: 484ms
893:	learn: 0.0208960	total: 4.04s	remaining: 479ms
894:	learn: 0.0208699	total: 4.05s	remaining: 475ms



895:	learn: 0.0208222	total: 4.05s	remaining: 470ms
896:	learn: 0.0207694	total: 4.06s	remaining: 466ms
897:	learn: 0.0207377	total: 4.06s	remaining: 461ms
898:	learn: 0.0207056	total: 4.06s	remaining: 457ms
899:	learn: 0.0206805	total: 4.07s	remaining: 452ms
900:	learn: 0.0206519	total: 4.07s	remaining: 448ms
901:	learn: 0.0206118	total: 4.08s	remaining: 443ms
902:	learn: 0.0205899	total: 4.08s	remaining: 439ms
903:	learn: 0.0205454	total: 4.09s	remaining: 434ms
904:	learn: 0.0205109	total: 4.09s	remaining: 429ms
905:	learn: 0.0204868	total: 4.09s	remaining: 425ms
906:	learn: 0.0204630	total: 4.1s	remaining: 420ms
907:	learn: 0.0204344	total: 4.1s	remaining: 416ms
908:	learn: 0.0203998	total: 4.11s	remaining: 411ms
909:	learn: 0.0203779	total: 4.11s	remaining: 407ms
910:	learn: 0.0203580	total: 4.12s	remaining: 402ms
911:	learn: 0.0203341	total: 4.12s	remaining: 398ms
912:	learn: 0.0202945	total: 4.13s	remaining: 394ms
913:	learn: 0.0202341	total: 4.13s	remaining: 389ms
914:	learn: 0.0201936	total: 4.14s	remaining: 385ms
915:	learn: 0.0201596	total: 4.15s	remaining: 380ms
916:	learn: 0.0201110	total: 4.15s	remaining: 376ms
917:	learn: 0.0200977	total: 4.16s	remaining: 372ms
918:	learn: 0.0200747	total: 4.17s	remaining: 367ms
919:	learn: 0.0200428	total: 4.17s	remaining: 363ms
920:	learn: 0.0200252	total: 4.18s	remaining: 359ms
921:	learn: 0.0199882	total: 4.19s	remaining: 354ms
922:	learn: 0.0199592	total: 4.2s	remaining: 350ms
923:	learn: 0.0199315	total: 4.2s	remaining: 346ms
924:	learn: 0.0198954	total: 4.21s	remaining: 341ms
925:	learn: 0.0198760	total: 4.22s	remaining: 337ms
926:	learn: 0.0198434	total: 4.22s	remaining: 333ms
927:	learn: 0.0198250	total: 4.23s	remaining: 328ms
928:	learn: 0.0198081	total: 4.24s	remaining: 324ms
929:	learn: 0.0197946	total: 4.25s	remaining: 320ms
930:	learn: 0.0197560	total: 4.26s	remaining: 315ms
931:	learn: 0.0197299	total: 4.26s	remaining: 311ms
932:	learn: 0.0197069	total: 4.27s	remaining: 307ms
933:	learn: 0.0196579	total: 4.28s	remaining: 302ms
934:	learn: 0.0196444	total: 4.28s	remaining: 298ms
935:	learn: 0.0196061	total: 4.29s	remaining: 293ms
936:	learn: 0.0195799	total: 4.29s	remaining: 289ms
937:	learn: 0.0195547	total: 4.3s	remaining: 284ms
938:	learn: 0.0195330	total: 4.3s	remaining: 280ms
939:	learn: 0.0194593	total: 4.31s	remaining: 275ms
940:	learn: 0.0194281	total: 4.31s	remaining: 271ms
941:	learn: 0.0194054	total: 4.32s	remaining: 266ms
942:	learn: 0.0193791	total: 4.32s	remaining: 261ms
943:	learn: 0.0193603	total: 4.33s	remaining: 257ms
944:	learn: 0.0193085	total: 4.33s	remaining: 252ms
945:	learn: 0.0192623	total: 4.34s	remaining: 248ms
946:	learn: 0.0192336	total: 4.34s	remaining: 243ms
947:	learn: 0.0192049	total: 4.35s	remaining: 238ms
948:	learn: 0.0191854	total: 4.35s	remaining: 234ms
949:	learn: 0.0191475	total: 4.36s	remaining: 229ms
950:	learn: 0.0191080	total: 4.36s	remaining: 225ms
951:	learn: 0.0190848	total: 4.36s	remaining: 220ms
952:	learn: 0.0190757	total: 4.37s	remaining: 216ms
953:	learn: 0.0190577	total: 4.37s	remaining: 211ms
954:	learn: 0.0190396	total: 4.38s	remaining: 206ms
955:	learn: 0.0190106	total: 4.38s	remaining: 202ms
956:	learn: 0.0189963	total: 4.39s	remaining: 197ms
957:	learn: 0.0189349	total: 4.39s	remaining: 193ms
958:	learn: 0.0189151	total: 4.4s	remaining: 188ms
959:	learn: 0.0188846	total: 4.4s	remaining: 183ms
960:	learn: 0.0188510	total: 4.41s	remaining: 179ms
961:	learn: 0.0188206	total: 4.41s	remaining: 174ms
962:	learn: 0.0187986	total: 4.42s	remaining: 170ms
963:	learn: 0.0187729	total: 4.42s	remaining: 165ms
964:	learn: 0.0187516	total: 4.42s	remaining: 160ms
965:	learn: 0.0187177	total: 4.43s	remaining: 156ms
966:	learn: 0.0186825	total: 4.43s	remaining: 151ms
967:	learn: 0.0186691	total: 4.44s	remaining: 147ms
968:	learn: 0.0186466	total: 4.44s	remaining: 142ms
969:	learn: 0.0186285	total: 4.44s	remaining: 137ms
970:	learn: 0.0186103	total: 4.45s	remaining: 133ms
971:	learn: 0.0185859	total: 4.45s	remaining: 128ms
972:	learn: 0.0185602	total: 4.46s	remaining: 124ms
973:	learn: 0.0185415	total: 4.46s	remaining: 119ms
974:	learn: 0.0185027	total: 4.47s	remaining: 115ms
975:	learn: 0.0184852	total: 4.47s	remaining: 110ms
976:	learn: 0.0184517	total: 4.47s	remaining: 105ms
977:	learn: 0.0184214	total: 4.48s	remaining: 101ms
978:	learn: 0.0184077	total: 4.48s	remaining: 96.2ms
979:	learn: 0.0183859	total: 4.49s	remaining: 91.6ms
980:	learn: 0.0183615	total: 4.49s	remaining: 87ms
981:	learn: 0.0183490	total: 4.5s	remaining: 82.5ms
982:	learn: 0.0183254	total: 4.5s	remaining: 77.9ms
983:	learn: 0.0183100	total: 4.5s	remaining: 73.3ms

984:	learn: 0.0182787	total: 4.51s	remaining: 68.7ms
985:	learn: 0.0182645	total: 4.51s	remaining: 64.1ms
986:	learn: 0.0182489	total: 4.52s	remaining: 59.5ms
987:	learn: 0.0182303	total: 4.52s	remaining: 54.9ms
988:	learn: 0.0182142	total: 4.53s	remaining: 50.4ms
989:	learn: 0.0181772	total: 4.53s	remaining: 45.8ms
990:	learn: 0.0181534	total: 4.54s	remaining: 41.2ms
991:	learn: 0.0181047	total: 4.54s	remaining: 36.6ms
992:	learn: 0.0180819	total: 4.54s	remaining: 32ms
993:	learn: 0.0180633	total: 4.55s	remaining: 27.5ms
994:	learn: 0.0180240	total: 4.55s	remaining: 22.9ms
995:	learn: 0.0180068	total: 4.56s	remaining: 18.3ms
996:	learn: 0.0179672	total: 4.56s	remaining: 13.7ms
997:	learn: 0.0179526	total: 4.57s	remaining: 9.15ms
998:	learn: 0.0179209	total: 4.57s	remaining: 4.58ms
999:	learn: 0.0178871	total: 4.58s	remaining: 0us

```
In [83]: y_pred = cat_model.predict(x_test)
accuracy_score(y_test, y_pred)
```

```
Out[83]: 0.9425
```

## Model Tuning

```
In [21]: cat_params = {'iterations': [200,500],
                        'learning_rate': [0.01,0.05, 0.1],
                        'depth': [3,5,8]}
cat = CatBoostClassifier()
cat_cv = GridSearchCV(cat, cat_params,
                      cv=5,
                      n_jobs = -1,
                      verbose = 2)
cat_cv_model = cat_cv.fit(x_train, y_train)
```

Fitting 5 folds for each of 18 candidates, totalling 90 fits

0:	learn: 1.3210651	total: 3.48ms	remaining: 1.74s
1:	learn: 1.2613843	total: 6.96ms	remaining: 1.73s
2:	learn: 1.2088009	total: 9.78ms	remaining: 1.62s
3:	learn: 1.1658894	total: 12.4ms	remaining: 1.53s
4:	learn: 1.1252462	total: 15ms	remaining: 1.48s
5:	learn: 1.0957008	total: 17.4ms	remaining: 1.43s
6:	learn: 1.0655415	total: 19.5ms	remaining: 1.37s
7:	learn: 1.0363936	total: 21.6ms	remaining: 1.33s
8:	learn: 1.0106390	total: 23.6ms	remaining: 1.29s
9:	learn: 0.9784369	total: 25.9ms	remaining: 1.27s
10:	learn: 0.9528020	total: 28.2ms	remaining: 1.25s
11:	learn: 0.9315465	total: 30.3ms	remaining: 1.23s
12:	learn: 0.9084348	total: 32.7ms	remaining: 1.22s
13:	learn: 0.8872876	total: 34.9ms	remaining: 1.21s
14:	learn: 0.8642760	total: 37.1ms	remaining: 1.2s
15:	learn: 0.8456024	total: 38.9ms	remaining: 1.18s
16:	learn: 0.8258013	total: 40.9ms	remaining: 1.16s
17:	learn: 0.8045096	total: 43.4ms	remaining: 1.16s
18:	learn: 0.7885936	total: 45.3ms	remaining: 1.15s
19:	learn: 0.7744609	total: 47.3ms	remaining: 1.13s
20:	learn: 0.7598776	total: 49.5ms	remaining: 1.13s
21:	learn: 0.7494610	total: 51.5ms	remaining: 1.12s
22:	learn: 0.7330622	total: 53.5ms	remaining: 1.11s
23:	learn: 0.7185213	total: 55.8ms	remaining: 1.11s
24:	learn: 0.7065307	total: 58.4ms	remaining: 1.11s
25:	learn: 0.6942748	total: 60.6ms	remaining: 1.1s
26:	learn: 0.6849825	total: 63.1ms	remaining: 1.1s
27:	learn: 0.6733485	total: 65.4ms	remaining: 1.1s
28:	learn: 0.6618658	total: 67.6ms	remaining: 1.1s
29:	learn: 0.6517091	total: 69.9ms	remaining: 1.09s
30:	learn: 0.6438311	total: 72.1ms	remaining: 1.09s
31:	learn: 0.6345434	total: 74.5ms	remaining: 1.09s
32:	learn: 0.6265974	total: 76.7ms	remaining: 1.08s
33:	learn: 0.6176994	total: 79.2ms	remaining: 1.08s
34:	learn: 0.6107301	total: 81.6ms	remaining: 1.08s
35:	learn: 0.6026589	total: 84.1ms	remaining: 1.08s
36:	learn: 0.5956419	total: 86.4ms	remaining: 1.08s
37:	learn: 0.5913461	total: 88.7ms	remaining: 1.08s
38:	learn: 0.5870731	total: 91.2ms	remaining: 1.08s
39:	learn: 0.5784643	total: 93.5ms	remaining: 1.07s
40:	learn: 0.5738319	total: 95.8ms	remaining: 1.07s
41:	learn: 0.5673390	total: 98.3ms	remaining: 1.07s
42:	learn: 0.5658154	total: 101ms	remaining: 1.07s
43:	learn: 0.5588086	total: 103ms	remaining: 1.07s
44:	learn: 0.5518758	total: 106ms	remaining: 1.07s
45:	learn: 0.5460820	total: 108ms	remaining: 1.06s
46:	learn: 0.5404973	total: 110ms	remaining: 1.06s
47:	learn: 0.5370412	total: 112ms	remaining: 1.06s
48:	learn: 0.5296249	total: 115ms	remaining: 1.05s
49:	learn: 0.5244972	total: 116ms	remaining: 1.05s
50:	learn: 0.5182349	total: 118ms	remaining: 1.04s
51:	learn: 0.5112527	total: 120ms	remaining: 1.03s

52:	learn: 0.5064300	total: 122ms	remaining: 1.02s
53:	learn: 0.5021630	total: 124ms	remaining: 1.02s
54:	learn: 0.4964337	total: 126ms	remaining: 1.02s
55:	learn: 0.4934815	total: 128ms	remaining: 1.01s
56:	learn: 0.4923312	total: 130ms	remaining: 1.01s
57:	learn: 0.4871356	total: 133ms	remaining: 1.01s
58:	learn: 0.4846832	total: 135ms	remaining: 1.01s
59:	learn: 0.4812210	total: 137ms	remaining: 1.01s
60:	learn: 0.4799209	total: 140ms	remaining: 1s
61:	learn: 0.4743603	total: 142ms	remaining: 1s
62:	learn: 0.4733464	total: 144ms	remaining: 1s
63:	learn: 0.4685406	total: 147ms	remaining: 999ms
64:	learn: 0.4650241	total: 149ms	remaining: 998ms
65:	learn: 0.4601138	total: 151ms	remaining: 994ms
66:	learn: 0.4559336	total: 153ms	remaining: 987ms
67:	learn: 0.4521011	total: 155ms	remaining: 984ms
68:	learn: 0.4482509	total: 157ms	remaining: 982ms
69:	learn: 0.4447805	total: 159ms	remaining: 979ms
70:	learn: 0.4412071	total: 162ms	remaining: 980ms
71:	learn: 0.4380611	total: 164ms	remaining: 977ms
72:	learn: 0.4354827	total: 167ms	remaining: 979ms
73:	learn: 0.4319237	total: 170ms	remaining: 976ms
74:	learn: 0.4280377	total: 172ms	remaining: 973ms
75:	learn: 0.4267384	total: 174ms	remaining: 971ms
76:	learn: 0.4223317	total: 176ms	remaining: 969ms
77:	learn: 0.4186762	total: 179ms	remaining: 966ms
78:	learn: 0.4158168	total: 181ms	remaining: 964ms
79:	learn: 0.4116457	total: 183ms	remaining: 961ms
80:	learn: 0.4099362	total: 185ms	remaining: 957ms
81:	learn: 0.4074805	total: 187ms	remaining: 952ms
82:	learn: 0.4052843	total: 188ms	remaining: 944ms
83:	learn: 0.4030971	total: 189ms	remaining: 936ms
84:	learn: 0.4008780	total: 190ms	remaining: 928ms
85:	learn: 0.3997459	total: 191ms	remaining: 920ms
86:	learn: 0.3971253	total: 192ms	remaining: 912ms
87:	learn: 0.3958294	total: 193ms	remaining: 905ms
88:	learn: 0.3947792	total: 194ms	remaining: 897ms
89:	learn: 0.3910472	total: 195ms	remaining: 890ms
90:	learn: 0.3886695	total: 198ms	remaining: 889ms
91:	learn: 0.3872147	total: 200ms	remaining: 886ms
92:	learn: 0.3864823	total: 201ms	remaining: 882ms
93:	learn: 0.3847119	total: 203ms	remaining: 878ms
94:	learn: 0.3829277	total: 206ms	remaining: 877ms
95:	learn: 0.3815210	total: 208ms	remaining: 874ms
96:	learn: 0.3793530	total: 209ms	remaining: 869ms
97:	learn: 0.3780227	total: 211ms	remaining: 865ms
98:	learn: 0.3762159	total: 213ms	remaining: 861ms
99:	learn: 0.3739799	total: 215ms	remaining: 858ms
100:	learn: 0.3715207	total: 217ms	remaining: 856ms
101:	learn: 0.3696601	total: 218ms	remaining: 852ms
102:	learn: 0.3690073	total: 222ms	remaining: 856ms
103:	learn: 0.3673820	total: 224ms	remaining: 853ms
104:	learn: 0.3666611	total: 226ms	remaining: 850ms
105:	learn: 0.3652307	total: 227ms	remaining: 844ms
106:	learn: 0.3633233	total: 229ms	remaining: 842ms
107:	learn: 0.3625943	total: 231ms	remaining: 839ms
108:	learn: 0.3612391	total: 233ms	remaining: 835ms
109:	learn: 0.3598078	total: 234ms	remaining: 830ms
110:	learn: 0.3567952	total: 235ms	remaining: 825ms
111:	learn: 0.3558667	total: 236ms	remaining: 819ms
112:	learn: 0.3545059	total: 238ms	remaining: 814ms
113:	learn: 0.3519369	total: 239ms	remaining: 808ms
114:	learn: 0.3508636	total: 240ms	remaining: 803ms
115:	learn: 0.3489125	total: 241ms	remaining: 797ms
116:	learn: 0.3474051	total: 242ms	remaining: 792ms
117:	learn: 0.3456095	total: 245ms	remaining: 794ms
118:	learn: 0.3436230	total: 247ms	remaining: 789ms
119:	learn: 0.3422197	total: 248ms	remaining: 784ms
120:	learn: 0.3402030	total: 249ms	remaining: 779ms
121:	learn: 0.3390662	total: 250ms	remaining: 774ms
122:	learn: 0.3382987	total: 251ms	remaining: 769ms
123:	learn: 0.3378405	total: 252ms	remaining: 764ms
124:	learn: 0.3362017	total: 253ms	remaining: 759ms
125:	learn: 0.3353997	total: 254ms	remaining: 754ms
126:	learn: 0.3346457	total: 255ms	remaining: 749ms
127:	learn: 0.3331454	total: 256ms	remaining: 745ms
128:	learn: 0.3323007	total: 257ms	remaining: 740ms
129:	learn: 0.3309408	total: 259ms	remaining: 736ms
130:	learn: 0.3290050	total: 261ms	remaining: 735ms
131:	learn: 0.3272301	total: 262ms	remaining: 732ms
132:	learn: 0.3264202	total: 264ms	remaining: 728ms
133:	learn: 0.3260324	total: 265ms	remaining: 724ms
134:	learn: 0.3241394	total: 266ms	remaining: 719ms
135:	learn: 0.3229779	total: 267ms	remaining: 715ms
136:	learn: 0.3214411	total: 268ms	remaining: 711ms
137:	learn: 0.3211015	total: 269ms	remaining: 706ms
138:	learn: 0.3189641	total: 270ms	remaining: 702ms
139:	learn: 0.3173286	total: 272ms	remaining: 698ms
140:	learn: 0.3169722	total: 273ms	remaining: 694ms

141:	learn: 0.3158052	total: 274ms	remaining: 690ms
142:	learn: 0.3148739	total: 275ms	remaining: 687ms
143:	learn: 0.3132286	total: 277ms	remaining: 685ms
144:	learn: 0.3125743	total: 278ms	remaining: 682ms
145:	learn: 0.3124381	total: 280ms	remaining: 678ms
146:	learn: 0.3115057	total: 281ms	remaining: 675ms
147:	learn: 0.3098365	total: 283ms	remaining: 672ms
148:	learn: 0.3082801	total: 284ms	remaining: 669ms
149:	learn: 0.3071553	total: 285ms	remaining: 666ms
150:	learn: 0.3049346	total: 286ms	remaining: 662ms
151:	learn: 0.3042607	total: 288ms	remaining: 658ms
152:	learn: 0.3034181	total: 289ms	remaining: 655ms
153:	learn: 0.3021525	total: 290ms	remaining: 651ms
154:	learn: 0.3015522	total: 292ms	remaining: 650ms
155:	learn: 0.3014578	total: 293ms	remaining: 647ms
156:	learn: 0.2998253	total: 295ms	remaining: 644ms
157:	learn: 0.2987631	total: 296ms	remaining: 640ms
158:	learn: 0.2974780	total: 297ms	remaining: 637ms
159:	learn: 0.2965097	total: 298ms	remaining: 633ms
160:	learn: 0.2959727	total: 299ms	remaining: 630ms
161:	learn: 0.2946289	total: 300ms	remaining: 626ms
162:	learn: 0.2935701	total: 301ms	remaining: 623ms
163:	learn: 0.2924825	total: 302ms	remaining: 619ms
164:	learn: 0.2918879	total: 303ms	remaining: 616ms
165:	learn: 0.2906477	total: 304ms	remaining: 613ms
166:	learn: 0.2896425	total: 306ms	remaining: 609ms
167:	learn: 0.2889283	total: 307ms	remaining: 607ms
168:	learn: 0.2881842	total: 309ms	remaining: 605ms
169:	learn: 0.2872788	total: 310ms	remaining: 602ms
170:	learn: 0.2869147	total: 311ms	remaining: 599ms
171:	learn: 0.2857760	total: 312ms	remaining: 596ms
172:	learn: 0.2842250	total: 313ms	remaining: 592ms
173:	learn: 0.2828891	total: 315ms	remaining: 589ms
174:	learn: 0.2814904	total: 316ms	remaining: 586ms
175:	learn: 0.2809901	total: 317ms	remaining: 583ms
176:	learn: 0.2807382	total: 318ms	remaining: 580ms
177:	learn: 0.2804443	total: 319ms	remaining: 577ms
178:	learn: 0.2795263	total: 320ms	remaining: 574ms
179:	learn: 0.2783916	total: 321ms	remaining: 571ms
180:	learn: 0.2776987	total: 323ms	remaining: 569ms
181:	learn: 0.2769965	total: 324ms	remaining: 567ms
182:	learn: 0.2762558	total: 326ms	remaining: 565ms
183:	learn: 0.2756746	total: 327ms	remaining: 562ms
184:	learn: 0.2748243	total: 328ms	remaining: 559ms
185:	learn: 0.2736299	total: 330ms	remaining: 556ms
186:	learn: 0.2727997	total: 331ms	remaining: 554ms
187:	learn: 0.2722299	total: 332ms	remaining: 551ms
188:	learn: 0.2716904	total: 333ms	remaining: 548ms
189:	learn: 0.2714092	total: 334ms	remaining: 545ms
190:	learn: 0.2705472	total: 335ms	remaining: 542ms
191:	learn: 0.2700435	total: 336ms	remaining: 540ms
192:	learn: 0.2691573	total: 338ms	remaining: 537ms
193:	learn: 0.2684360	total: 340ms	remaining: 536ms
194:	learn: 0.2681012	total: 341ms	remaining: 533ms
195:	learn: 0.2679548	total: 342ms	remaining: 531ms
196:	learn: 0.2670651	total: 343ms	remaining: 528ms
197:	learn: 0.2667586	total: 344ms	remaining: 525ms
198:	learn: 0.2658871	total: 345ms	remaining: 523ms
199:	learn: 0.2649154	total: 347ms	remaining: 520ms
200:	learn: 0.2635807	total: 348ms	remaining: 517ms
201:	learn: 0.2626310	total: 349ms	remaining: 515ms
202:	learn: 0.2622961	total: 350ms	remaining: 512ms
203:	learn: 0.2616688	total: 352ms	remaining: 510ms
204:	learn: 0.2606020	total: 353ms	remaining: 508ms
205:	learn: 0.2601926	total: 356ms	remaining: 508ms
206:	learn: 0.2593079	total: 357ms	remaining: 506ms
207:	learn: 0.2582663	total: 358ms	remaining: 503ms
208:	learn: 0.2570459	total: 360ms	remaining: 501ms
209:	learn: 0.2568319	total: 361ms	remaining: 498ms
210:	learn: 0.2561383	total: 362ms	remaining: 495ms
211:	learn: 0.2553577	total: 363ms	remaining: 493ms
212:	learn: 0.2544871	total: 364ms	remaining: 490ms
213:	learn: 0.2533137	total: 365ms	remaining: 488ms
214:	learn: 0.2524541	total: 366ms	remaining: 485ms
215:	learn: 0.2522559	total: 367ms	remaining: 483ms
216:	learn: 0.2518124	total: 368ms	remaining: 481ms
217:	learn: 0.2512226	total: 370ms	remaining: 479ms
218:	learn: 0.2509632	total: 372ms	remaining: 477ms
219:	learn: 0.2500786	total: 373ms	remaining: 475ms
220:	learn: 0.2493668	total: 375ms	remaining: 473ms
221:	learn: 0.2484252	total: 376ms	remaining: 471ms
222:	learn: 0.2482757	total: 377ms	remaining: 468ms
223:	learn: 0.2476902	total: 378ms	remaining: 466ms
224:	learn: 0.2466863	total: 379ms	remaining: 463ms
225:	learn: 0.2464783	total: 380ms	remaining: 461ms
226:	learn: 0.2459354	total: 381ms	remaining: 459ms
227:	learn: 0.2453567	total: 382ms	remaining: 456ms
228:	learn: 0.2446004	total: 383ms	remaining: 454ms
229:	learn: 0.2439275	total: 385ms	remaining: 452ms

230:	learn: 0.2433805	total: 387ms	remaining: 450ms
231:	learn: 0.2432260	total: 388ms	remaining: 448ms
232:	learn: 0.2426405	total: 389ms	remaining: 446ms
233:	learn: 0.2418350	total: 390ms	remaining: 444ms
234:	learn: 0.2407784	total: 392ms	remaining: 442ms
235:	learn: 0.2403636	total: 393ms	remaining: 439ms
236:	learn: 0.2400407	total: 394ms	remaining: 437ms
237:	learn: 0.2399377	total: 395ms	remaining: 435ms
238:	learn: 0.2395624	total: 396ms	remaining: 433ms
239:	learn: 0.2391364	total: 397ms	remaining: 431ms
240:	learn: 0.2381516	total: 399ms	remaining: 428ms
241:	learn: 0.2374997	total: 400ms	remaining: 426ms
242:	learn: 0.2366962	total: 403ms	remaining: 426ms
243:	learn: 0.2358804	total: 405ms	remaining: 425ms
244:	learn: 0.2353731	total: 406ms	remaining: 423ms
245:	learn: 0.2346824	total: 409ms	remaining: 422ms
246:	learn: 0.2340018	total: 412ms	remaining: 422ms
247:	learn: 0.2334474	total: 415ms	remaining: 421ms
248:	learn: 0.2327982	total: 417ms	remaining: 421ms
249:	learn: 0.2324127	total: 419ms	remaining: 419ms
250:	learn: 0.2321929	total: 421ms	remaining: 418ms
251:	learn: 0.2315817	total: 424ms	remaining: 417ms
252:	learn: 0.2311017	total: 426ms	remaining: 416ms
253:	learn: 0.2308177	total: 429ms	remaining: 415ms
254:	learn: 0.2299518	total: 431ms	remaining: 415ms
255:	learn: 0.2295334	total: 434ms	remaining: 414ms
256:	learn: 0.2288408	total: 436ms	remaining: 413ms
257:	learn: 0.2277278	total: 438ms	remaining: 411ms
258:	learn: 0.2275563	total: 441ms	remaining: 410ms
259:	learn: 0.2269617	total: 443ms	remaining: 409ms
260:	learn: 0.2266912	total: 445ms	remaining: 407ms
261:	learn: 0.2258958	total: 446ms	remaining: 405ms
262:	learn: 0.2250745	total: 448ms	remaining: 404ms
263:	learn: 0.2248777	total: 451ms	remaining: 403ms
264:	learn: 0.2241243	total: 454ms	remaining: 403ms
265:	learn: 0.2234348	total: 456ms	remaining: 401ms
266:	learn: 0.2226115	total: 457ms	remaining: 399ms
267:	learn: 0.2219551	total: 459ms	remaining: 397ms
268:	learn: 0.2215492	total: 461ms	remaining: 396ms
269:	learn: 0.2212617	total: 462ms	remaining: 394ms
270:	learn: 0.2210748	total: 465ms	remaining: 393ms
271:	learn: 0.2208873	total: 468ms	remaining: 392ms
272:	learn: 0.2206083	total: 470ms	remaining: 391ms
273:	learn: 0.2201642	total: 472ms	remaining: 389ms
274:	learn: 0.2193864	total: 473ms	remaining: 387ms
275:	learn: 0.2186670	total: 475ms	remaining: 385ms
276:	learn: 0.2185844	total: 476ms	remaining: 383ms
277:	learn: 0.2180152	total: 477ms	remaining: 381ms
278:	learn: 0.2176870	total: 480ms	remaining: 380ms
279:	learn: 0.2175650	total: 481ms	remaining: 378ms
280:	learn: 0.2173658	total: 482ms	remaining: 376ms
281:	learn: 0.2168903	total: 484ms	remaining: 374ms
282:	learn: 0.2167815	total: 485ms	remaining: 372ms
283:	learn: 0.2166001	total: 486ms	remaining: 370ms
284:	learn: 0.2161882	total: 488ms	remaining: 368ms
285:	learn: 0.2160388	total: 489ms	remaining: 366ms
286:	learn: 0.2156082	total: 490ms	remaining: 363ms
287:	learn: 0.2149456	total: 491ms	remaining: 361ms
288:	learn: 0.2147529	total: 492ms	remaining: 359ms
289:	learn: 0.2143638	total: 494ms	remaining: 358ms
290:	learn: 0.2142195	total: 496ms	remaining: 356ms
291:	learn: 0.2140345	total: 498ms	remaining: 354ms
292:	learn: 0.2134837	total: 499ms	remaining: 352ms
293:	learn: 0.2131221	total: 500ms	remaining: 350ms
294:	learn: 0.2128319	total: 501ms	remaining: 348ms
295:	learn: 0.2127408	total: 502ms	remaining: 346ms
296:	learn: 0.2123279	total: 503ms	remaining: 344ms
297:	learn: 0.2122647	total: 504ms	remaining: 342ms
298:	learn: 0.2115901	total: 506ms	remaining: 340ms
299:	learn: 0.2112150	total: 507ms	remaining: 338ms
300:	learn: 0.2108557	total: 508ms	remaining: 336ms
301:	learn: 0.2107243	total: 510ms	remaining: 335ms
302:	learn: 0.2102569	total: 511ms	remaining: 333ms
303:	learn: 0.2100633	total: 513ms	remaining: 331ms
304:	learn: 0.2099769	total: 514ms	remaining: 328ms
305:	learn: 0.2093057	total: 515ms	remaining: 326ms
306:	learn: 0.2088209	total: 516ms	remaining: 324ms
307:	learn: 0.2084186	total: 517ms	remaining: 322ms
308:	learn: 0.2080124	total: 518ms	remaining: 320ms
309:	learn: 0.2076718	total: 519ms	remaining: 318ms
310:	learn: 0.2075625	total: 520ms	remaining: 316ms
311:	learn: 0.2068982	total: 522ms	remaining: 314ms
312:	learn: 0.2063015	total: 523ms	remaining: 312ms
313:	learn: 0.2061209	total: 525ms	remaining: 311ms
314:	learn: 0.2055175	total: 527ms	remaining: 310ms
315:	learn: 0.2053088	total: 529ms	remaining: 308ms
316:	learn: 0.2049388	total: 530ms	remaining: 306ms
317:	learn: 0.2045913	total: 531ms	remaining: 304ms
318:	learn: 0.2041915	total: 533ms	remaining: 302ms

319:	learn: 0.2039349	total: 534ms	remaining: 300ms
320:	learn: 0.2036380	total: 535ms	remaining: 299ms
321:	learn: 0.2032117	total: 537ms	remaining: 297ms
322:	learn: 0.2030053	total: 538ms	remaining: 295ms
323:	learn: 0.2029338	total: 539ms	remaining: 293ms
324:	learn: 0.2024864	total: 540ms	remaining: 291ms
325:	learn: 0.2019629	total: 542ms	remaining: 290ms
326:	learn: 0.2016067	total: 544ms	remaining: 288ms
327:	learn: 0.2013976	total: 545ms	remaining: 286ms
328:	learn: 0.2010651	total: 546ms	remaining: 284ms
329:	learn: 0.2006636	total: 548ms	remaining: 282ms
330:	learn: 0.2003499	total: 549ms	remaining: 280ms
331:	learn: 0.2002749	total: 550ms	remaining: 278ms
332:	learn: 0.1999822	total: 551ms	remaining: 276ms
333:	learn: 0.1996499	total: 552ms	remaining: 275ms
334:	learn: 0.1994917	total: 554ms	remaining: 273ms
335:	learn: 0.1991152	total: 555ms	remaining: 271ms
336:	learn: 0.1988865	total: 557ms	remaining: 269ms
337:	learn: 0.1985612	total: 558ms	remaining: 268ms
338:	learn: 0.1979157	total: 560ms	remaining: 266ms
339:	learn: 0.1974938	total: 561ms	remaining: 264ms
340:	learn: 0.1969468	total: 563ms	remaining: 262ms
341:	learn: 0.1966136	total: 564ms	remaining: 261ms
342:	learn: 0.1961162	total: 566ms	remaining: 259ms
343:	learn: 0.1958825	total: 567ms	remaining: 257ms
344:	learn: 0.1953951	total: 568ms	remaining: 255ms
345:	learn: 0.1949623	total: 569ms	remaining: 253ms
346:	learn: 0.1946392	total: 570ms	remaining: 251ms
347:	learn: 0.1942749	total: 572ms	remaining: 250ms
348:	learn: 0.1941493	total: 574ms	remaining: 248ms
349:	learn: 0.1938356	total: 575ms	remaining: 246ms
350:	learn: 0.1932578	total: 576ms	remaining: 245ms
351:	learn: 0.1931376	total: 577ms	remaining: 243ms
352:	learn: 0.1928578	total: 579ms	remaining: 241ms
353:	learn: 0.1925204	total: 580ms	remaining: 239ms
354:	learn: 0.1923450	total: 581ms	remaining: 237ms
355:	learn: 0.1922093	total: 582ms	remaining: 235ms
356:	learn: 0.1918354	total: 583ms	remaining: 234ms
357:	learn: 0.1917173	total: 585ms	remaining: 232ms
358:	learn: 0.1916321	total: 586ms	remaining: 230ms
359:	learn: 0.1910993	total: 588ms	remaining: 229ms
360:	learn: 0.1909486	total: 589ms	remaining: 227ms
361:	learn: 0.1907566	total: 591ms	remaining: 225ms
362:	learn: 0.1904625	total: 592ms	remaining: 223ms
363:	learn: 0.1900501	total: 593ms	remaining: 222ms
364:	learn: 0.1896202	total: 594ms	remaining: 220ms
365:	learn: 0.1894650	total: 595ms	remaining: 218ms
366:	learn: 0.1888791	total: 597ms	remaining: 216ms
367:	learn: 0.1887649	total: 598ms	remaining: 215ms
368:	learn: 0.1882510	total: 599ms	remaining: 213ms
369:	learn: 0.1878843	total: 600ms	remaining: 211ms
370:	learn: 0.1877554	total: 602ms	remaining: 209ms
371:	learn: 0.1872687	total: 605ms	remaining: 208ms
372:	learn: 0.1868264	total: 606ms	remaining: 206ms
373:	learn: 0.1864776	total: 609ms	remaining: 205ms
374:	learn: 0.1862952	total: 611ms	remaining: 204ms
375:	learn: 0.1858533	total: 612ms	remaining: 202ms
376:	learn: 0.1856069	total: 613ms	remaining: 200ms
377:	learn: 0.1851048	total: 615ms	remaining: 198ms
378:	learn: 0.1846264	total: 617ms	remaining: 197ms
379:	learn: 0.1842510	total: 620ms	remaining: 196ms
380:	learn: 0.1839288	total: 623ms	remaining: 195ms
381:	learn: 0.1837933	total: 626ms	remaining: 193ms
382:	learn: 0.1835428	total: 628ms	remaining: 192ms
383:	learn: 0.1832866	total: 630ms	remaining: 190ms
384:	learn: 0.1830660	total: 631ms	remaining: 188ms
385:	learn: 0.1825602	total: 632ms	remaining: 187ms
386:	learn: 0.1822742	total: 635ms	remaining: 185ms
387:	learn: 0.1821821	total: 637ms	remaining: 184ms
388:	learn: 0.1818541	total: 639ms	remaining: 182ms
389:	learn: 0.1816666	total: 641ms	remaining: 181ms
390:	learn: 0.1814358	total: 643ms	remaining: 179ms
391:	learn: 0.1812888	total: 645ms	remaining: 178ms
392:	learn: 0.1807179	total: 647ms	remaining: 176ms
393:	learn: 0.1805072	total: 649ms	remaining: 175ms
394:	learn: 0.1802893	total: 651ms	remaining: 173ms
395:	learn: 0.1801247	total: 652ms	remaining: 171ms
396:	learn: 0.1797678	total: 654ms	remaining: 170ms
397:	learn: 0.1794976	total: 655ms	remaining: 168ms
398:	learn: 0.1790361	total: 656ms	remaining: 166ms
399:	learn: 0.1787674	total: 658ms	remaining: 164ms
400:	learn: 0.1787225	total: 659ms	remaining: 163ms
401:	learn: 0.1781359	total: 660ms	remaining: 161ms
402:	learn: 0.1777932	total: 661ms	remaining: 159ms
403:	learn: 0.1774277	total: 662ms	remaining: 157ms
404:	learn: 0.1769658	total: 664ms	remaining: 156ms
405:	learn: 0.1765731	total: 666ms	remaining: 154ms
406:	learn: 0.1765445	total: 668ms	remaining: 153ms
407:	learn: 0.1761315	total: 670ms	remaining: 151ms

408:	learn: 0.1759312	total: 671ms	remaining: 149ms
409:	learn: 0.1756009	total: 672ms	remaining: 148ms
410:	learn: 0.1754754	total: 673ms	remaining: 146ms
411:	learn: 0.1751560	total: 675ms	remaining: 144ms
412:	learn: 0.1750231	total: 676ms	remaining: 142ms
413:	learn: 0.1749221	total: 677ms	remaining: 141ms
414:	learn: 0.1748716	total: 679ms	remaining: 139ms
415:	learn: 0.1745959	total: 681ms	remaining: 137ms
416:	learn: 0.1744202	total: 682ms	remaining: 136ms
417:	learn: 0.1743585	total: 684ms	remaining: 134ms
418:	learn: 0.1741706	total: 685ms	remaining: 132ms
419:	learn: 0.1740952	total: 686ms	remaining: 131ms
420:	learn: 0.1735581	total: 687ms	remaining: 129ms
421:	learn: 0.1734511	total: 688ms	remaining: 127ms
422:	learn: 0.1732066	total: 689ms	remaining: 126ms
423:	learn: 0.1731434	total: 691ms	remaining: 124ms
424:	learn: 0.1729493	total: 692ms	remaining: 122ms
425:	learn: 0.1728802	total: 693ms	remaining: 120ms
426:	learn: 0.1725026	total: 694ms	remaining: 119ms
427:	learn: 0.1722333	total: 697ms	remaining: 117ms
428:	learn: 0.1718248	total: 699ms	remaining: 116ms
429:	learn: 0.1714004	total: 700ms	remaining: 114ms
430:	learn: 0.1710243	total: 701ms	remaining: 112ms
431:	learn: 0.1707870	total: 703ms	remaining: 111ms
432:	learn: 0.1704622	total: 704ms	remaining: 109ms
433:	learn: 0.1701154	total: 705ms	remaining: 107ms
434:	learn: 0.1698438	total: 706ms	remaining: 106ms
435:	learn: 0.1696099	total: 707ms	remaining: 104ms
436:	learn: 0.1695698	total: 709ms	remaining: 102ms
437:	learn: 0.1694544	total: 710ms	remaining: 100ms
438:	learn: 0.1691441	total: 712ms	remaining: 98.9ms
439:	learn: 0.1690164	total: 714ms	remaining: 97.3ms
440:	learn: 0.1687206	total: 715ms	remaining: 95.7ms
441:	learn: 0.1684613	total: 716ms	remaining: 94ms
442:	learn: 0.1682735	total: 718ms	remaining: 92.3ms
443:	learn: 0.1682218	total: 719ms	remaining: 90.7ms
444:	learn: 0.1677963	total: 720ms	remaining: 89ms
445:	learn: 0.1677530	total: 721ms	remaining: 87.3ms
446:	learn: 0.1676913	total: 723ms	remaining: 85.7ms
447:	learn: 0.1675338	total: 724ms	remaining: 84ms
448:	learn: 0.1674538	total: 725ms	remaining: 82.4ms
449:	learn: 0.1673750	total: 727ms	remaining: 80.7ms
450:	learn: 0.1671042	total: 729ms	remaining: 79.2ms
451:	learn: 0.1670058	total: 730ms	remaining: 77.5ms
452:	learn: 0.1666066	total: 731ms	remaining: 75.9ms
453:	learn: 0.1664194	total: 733ms	remaining: 74.2ms
454:	learn: 0.1662461	total: 734ms	remaining: 72.6ms
455:	learn: 0.1660763	total: 736ms	remaining: 71ms
456:	learn: 0.1658964	total: 737ms	remaining: 69.3ms
457:	learn: 0.1656535	total: 738ms	remaining: 67.7ms
458:	learn: 0.1655003	total: 740ms	remaining: 66.1ms
459:	learn: 0.1653476	total: 741ms	remaining: 64.4ms
460:	learn: 0.1652021	total: 742ms	remaining: 62.8ms
461:	learn: 0.1645402	total: 744ms	remaining: 61.2ms
462:	learn: 0.1644567	total: 745ms	remaining: 59.6ms
463:	learn: 0.1642713	total: 747ms	remaining: 57.9ms
464:	learn: 0.1640530	total: 748ms	remaining: 56.3ms
465:	learn: 0.1637208	total: 749ms	remaining: 54.7ms
466:	learn: 0.1635703	total: 750ms	remaining: 53ms
467:	learn: 0.1634750	total: 751ms	remaining: 51.4ms
468:	learn: 0.1632163	total: 753ms	remaining: 49.8ms
469:	learn: 0.1630559	total: 754ms	remaining: 48.1ms
470:	learn: 0.1629327	total: 755ms	remaining: 46.5ms
471:	learn: 0.1628623	total: 756ms	remaining: 44.9ms
472:	learn: 0.1628331	total: 757ms	remaining: 43.2ms
473:	learn: 0.1626020	total: 760ms	remaining: 41.7ms
474:	learn: 0.1625264	total: 761ms	remaining: 40.1ms
475:	learn: 0.1623817	total: 763ms	remaining: 38.5ms
476:	learn: 0.1623027	total: 764ms	remaining: 36.8ms
477:	learn: 0.1621926	total: 765ms	remaining: 35.2ms
478:	learn: 0.1618631	total: 766ms	remaining: 33.6ms
479:	learn: 0.1616972	total: 767ms	remaining: 32ms
480:	learn: 0.1616376	total: 769ms	remaining: 30.4ms
481:	learn: 0.1615947	total: 770ms	remaining: 28.7ms
482:	learn: 0.1612696	total: 771ms	remaining: 27.1ms
483:	learn: 0.1609891	total: 772ms	remaining: 25.5ms
484:	learn: 0.1608418	total: 773ms	remaining: 23.9ms
485:	learn: 0.1605867	total: 775ms	remaining: 22.3ms
486:	learn: 0.1602867	total: 777ms	remaining: 20.7ms
487:	learn: 0.1599936	total: 778ms	remaining: 19.1ms
488:	learn: 0.1596746	total: 779ms	remaining: 17.5ms
489:	learn: 0.1596137	total: 781ms	remaining: 15.9ms
490:	learn: 0.1593599	total: 782ms	remaining: 14.3ms
491:	learn: 0.1592449	total: 783ms	remaining: 12.7ms
492:	learn: 0.1591946	total: 784ms	remaining: 11.1ms
493:	learn: 0.1591193	total: 786ms	remaining: 9.54ms
494:	learn: 0.1587012	total: 787ms	remaining: 7.95ms
495:	learn: 0.1585541	total: 788ms	remaining: 6.35ms
496:	learn: 0.1583058	total: 789ms	remaining: 4.76ms

497:	learn: 0.1581542	total: 792ms	remaining: 3.18ms
498:	learn: 0.1579877	total: 793ms	remaining: 1.59ms
499:	learn: 0.1579240	total: 794ms	remaining: 0us

In [22]: `cat_cv_model.best_params_`

Out[22]: `{'depth': 3, 'iterations': 500, 'learning_rate': 0.05}`

In [70]: `cat = CatBoostClassifier(depth = 3,  
 iterations = 500,  
 learning_rate = 0.05)  
cat_tuned = cat.fit(x_train, y_train)`

0:	learn: 1.3210651	total: 2.2ms	remaining: 1.1s
1:	learn: 1.2613843	total: 4ms	remaining: 995ms
2:	learn: 1.2088009	total: 5.41ms	remaining: 897ms
3:	learn: 1.1658894	total: 6.9ms	remaining: 856ms
4:	learn: 1.1252462	total: 8.57ms	remaining: 848ms
5:	learn: 1.0957008	total: 10.2ms	remaining: 843ms
6:	learn: 1.0655415	total: 12.2ms	remaining: 858ms
7:	learn: 1.0363936	total: 13.5ms	remaining: 828ms
8:	learn: 1.0106390	total: 17.2ms	remaining: 937ms
9:	learn: 0.9784369	total: 18.4ms	remaining: 904ms
10:	learn: 0.9528020	total: 19.6ms	remaining: 872ms
11:	learn: 0.9315465	total: 20.7ms	remaining: 840ms
12:	learn: 0.9084348	total: 21.8ms	remaining: 818ms
13:	learn: 0.8872876	total: 23.8ms	remaining: 826ms
14:	learn: 0.8642760	total: 25.2ms	remaining: 815ms
15:	learn: 0.8456024	total: 26.6ms	remaining: 803ms
16:	learn: 0.8258013	total: 27.9ms	remaining: 792ms
17:	learn: 0.8045096	total: 30.1ms	remaining: 807ms
18:	learn: 0.7885936	total: 31.5ms	remaining: 798ms
19:	learn: 0.7744609	total: 32.7ms	remaining: 784ms
20:	learn: 0.7598776	total: 33.9ms	remaining: 773ms
21:	learn: 0.7494610	total: 35.2ms	remaining: 764ms
22:	learn: 0.7330622	total: 36.3ms	remaining: 752ms
23:	learn: 0.7185213	total: 37.7ms	remaining: 749ms
24:	learn: 0.7065307	total: 39.1ms	remaining: 742ms
25:	learn: 0.6942748	total: 40.3ms	remaining: 735ms
26:	learn: 0.6849825	total: 41.4ms	remaining: 726ms
27:	learn: 0.6733485	total: 42.6ms	remaining: 717ms
28:	learn: 0.6618658	total: 43.7ms	remaining: 710ms
29:	learn: 0.6517091	total: 44.9ms	remaining: 704ms
30:	learn: 0.6438311	total: 46.1ms	remaining: 698ms
31:	learn: 0.6345434	total: 47.3ms	remaining: 692ms
32:	learn: 0.6265974	total: 48.5ms	remaining: 687ms
33:	learn: 0.6176994	total: 49.7ms	remaining: 681ms
34:	learn: 0.6107301	total: 50.9ms	remaining: 677ms
35:	learn: 0.6026589	total: 52.1ms	remaining: 671ms
36:	learn: 0.5956419	total: 53.4ms	remaining: 668ms
37:	learn: 0.5913461	total: 54.4ms	remaining: 661ms
38:	learn: 0.5870731	total: 55.5ms	remaining: 656ms
39:	learn: 0.5784643	total: 56.7ms	remaining: 652ms
40:	learn: 0.5738319	total: 57.9ms	remaining: 648ms
41:	learn: 0.5673390	total: 59ms	remaining: 643ms
42:	learn: 0.5658154	total: 60.3ms	remaining: 641ms
43:	learn: 0.5588086	total: 61.4ms	remaining: 636ms
44:	learn: 0.5518758	total: 62.6ms	remaining: 633ms
45:	learn: 0.5460820	total: 63.9ms	remaining: 631ms
46:	learn: 0.5404973	total: 65.1ms	remaining: 628ms
47:	learn: 0.5370412	total: 66.4ms	remaining: 625ms
48:	learn: 0.5296249	total: 67.5ms	remaining: 621ms
49:	learn: 0.5244972	total: 68.7ms	remaining: 618ms
50:	learn: 0.5182349	total: 70.1ms	remaining: 617ms
51:	learn: 0.5112527	total: 71.5ms	remaining: 616ms
52:	learn: 0.5064300	total: 73ms	remaining: 615ms
53:	learn: 0.5021630	total: 74.6ms	remaining: 616ms
54:	learn: 0.4964337	total: 75.9ms	remaining: 614ms
55:	learn: 0.4934815	total: 77.2ms	remaining: 612ms
56:	learn: 0.4923312	total: 78.4ms	remaining: 609ms
57:	learn: 0.4871356	total: 79.7ms	remaining: 607ms
58:	learn: 0.4846832	total: 80.9ms	remaining: 605ms
59:	learn: 0.4812210	total: 82ms	remaining: 601ms
60:	learn: 0.4799209	total: 82.9ms	remaining: 597ms
61:	learn: 0.4743603	total: 84ms	remaining: 594ms
62:	learn: 0.4733464	total: 85.2ms	remaining: 591ms
63:	learn: 0.4685406	total: 86.4ms	remaining: 588ms
64:	learn: 0.4650241	total: 87.5ms	remaining: 585ms
65:	learn: 0.4601138	total: 88.6ms	remaining: 582ms
66:	learn: 0.4559336	total: 89.8ms	remaining: 580ms
67:	learn: 0.4521011	total: 91ms	remaining: 578ms
68:	learn: 0.4482509	total: 92.1ms	remaining: 575ms
69:	learn: 0.4447805	total: 93.3ms	remaining: 573ms
70:	learn: 0.4412071	total: 94.5ms	remaining: 571ms
71:	learn: 0.4380611	total: 95.8ms	remaining: 569ms
72:	learn: 0.4354827	total: 96.8ms	remaining: 566ms
73:	learn: 0.4319237	total: 97.9ms	remaining: 564ms
74:	learn: 0.4280377	total: 99ms	remaining: 561ms



75:	learn: 0.4267384	total: 100ms	remaining: 559ms
76:	learn: 0.4223317	total: 101ms	remaining: 556ms
77:	learn: 0.4186762	total: 102ms	remaining: 554ms
78:	learn: 0.4158168	total: 103ms	remaining: 551ms
79:	learn: 0.4116457	total: 105ms	remaining: 549ms
80:	learn: 0.4099362	total: 106ms	remaining: 547ms
81:	learn: 0.4074805	total: 107ms	remaining: 545ms
82:	learn: 0.4052843	total: 108ms	remaining: 543ms
83:	learn: 0.4030971	total: 109ms	remaining: 540ms
84:	learn: 0.4008780	total: 110ms	remaining: 538ms
85:	learn: 0.3997459	total: 111ms	remaining: 536ms
86:	learn: 0.3971253	total: 112ms	remaining: 534ms
87:	learn: 0.3958294	total: 114ms	remaining: 533ms
88:	learn: 0.3947792	total: 115ms	remaining: 531ms
89:	learn: 0.3910472	total: 116ms	remaining: 530ms
90:	learn: 0.3886695	total: 117ms	remaining: 527ms
91:	learn: 0.3872147	total: 118ms	remaining: 525ms
92:	learn: 0.3864823	total: 120ms	remaining: 524ms
93:	learn: 0.3847119	total: 121ms	remaining: 523ms
94:	learn: 0.3829277	total: 122ms	remaining: 521ms
95:	learn: 0.3815210	total: 123ms	remaining: 519ms
96:	learn: 0.3793530	total: 125ms	remaining: 517ms
97:	learn: 0.3780227	total: 126ms	remaining: 515ms
98:	learn: 0.3762159	total: 127ms	remaining: 514ms
99:	learn: 0.3739799	total: 128ms	remaining: 513ms
100:	learn: 0.3715207	total: 130ms	remaining: 512ms
101:	learn: 0.3696601	total: 131ms	remaining: 510ms
102:	learn: 0.3690073	total: 132ms	remaining: 509ms
103:	learn: 0.3673820	total: 133ms	remaining: 507ms
104:	learn: 0.3666611	total: 134ms	remaining: 505ms
105:	learn: 0.3652307	total: 135ms	remaining: 503ms
106:	learn: 0.3633233	total: 137ms	remaining: 501ms
107:	learn: 0.3625943	total: 138ms	remaining: 499ms
108:	learn: 0.3612391	total: 139ms	remaining: 497ms
109:	learn: 0.3598078	total: 140ms	remaining: 496ms
110:	learn: 0.3567952	total: 141ms	remaining: 494ms
111:	learn: 0.3558667	total: 142ms	remaining: 492ms
112:	learn: 0.3545059	total: 143ms	remaining: 491ms
113:	learn: 0.3519369	total: 144ms	remaining: 489ms
114:	learn: 0.3508636	total: 145ms	remaining: 487ms
115:	learn: 0.3489125	total: 147ms	remaining: 485ms
116:	learn: 0.3474051	total: 148ms	remaining: 483ms
117:	learn: 0.3456095	total: 149ms	remaining: 482ms
118:	learn: 0.3436230	total: 150ms	remaining: 480ms
119:	learn: 0.3422197	total: 151ms	remaining: 479ms
120:	learn: 0.3402030	total: 152ms	remaining: 477ms
121:	learn: 0.3390662	total: 153ms	remaining: 475ms
122:	learn: 0.3382987	total: 155ms	remaining: 474ms
123:	learn: 0.3378405	total: 156ms	remaining: 472ms
124:	learn: 0.3362017	total: 157ms	remaining: 470ms
125:	learn: 0.3353997	total: 158ms	remaining: 468ms
126:	learn: 0.3346457	total: 159ms	remaining: 466ms
127:	learn: 0.3331454	total: 160ms	remaining: 464ms
128:	learn: 0.3323007	total: 161ms	remaining: 463ms
129:	learn: 0.3309408	total: 162ms	remaining: 461ms
130:	learn: 0.3290050	total: 163ms	remaining: 460ms
131:	learn: 0.3272301	total: 164ms	remaining: 458ms
132:	learn: 0.3264202	total: 166ms	remaining: 457ms
133:	learn: 0.3260324	total: 167ms	remaining: 455ms
134:	learn: 0.3241394	total: 168ms	remaining: 454ms
135:	learn: 0.3229779	total: 169ms	remaining: 452ms
136:	learn: 0.3214411	total: 170ms	remaining: 450ms
137:	learn: 0.3211015	total: 171ms	remaining: 448ms
138:	learn: 0.3189641	total: 172ms	remaining: 447ms
139:	learn: 0.3173286	total: 173ms	remaining: 445ms
140:	learn: 0.3169722	total: 174ms	remaining: 443ms
141:	learn: 0.3158052	total: 175ms	remaining: 442ms
142:	learn: 0.3148739	total: 176ms	remaining: 440ms
143:	learn: 0.3132286	total: 178ms	remaining: 439ms
144:	learn: 0.3125743	total: 179ms	remaining: 437ms
145:	learn: 0.3124381	total: 180ms	remaining: 436ms
146:	learn: 0.3115057	total: 181ms	remaining: 434ms
147:	learn: 0.3098365	total: 183ms	remaining: 435ms
148:	learn: 0.3082801	total: 184ms	remaining: 433ms
149:	learn: 0.3071553	total: 185ms	remaining: 432ms
150:	learn: 0.3049346	total: 186ms	remaining: 430ms
151:	learn: 0.3042607	total: 187ms	remaining: 429ms
152:	learn: 0.3034181	total: 188ms	remaining: 427ms
153:	learn: 0.3021525	total: 189ms	remaining: 426ms
154:	learn: 0.3015522	total: 190ms	remaining: 424ms
155:	learn: 0.3014578	total: 192ms	remaining: 422ms
156:	learn: 0.2998253	total: 193ms	remaining: 421ms
157:	learn: 0.2987631	total: 194ms	remaining: 419ms
158:	learn: 0.2974780	total: 195ms	remaining: 418ms
159:	learn: 0.2965097	total: 196ms	remaining: 417ms
160:	learn: 0.2959727	total: 198ms	remaining: 417ms
161:	learn: 0.2946289	total: 199ms	remaining: 416ms
162:	learn: 0.2935701	total: 201ms	remaining: 415ms
163:	learn: 0.2924825	total: 202ms	remaining: 413ms

164:	learn: 0.2918879	total: 203ms	remaining: 412ms
165:	learn: 0.2906477	total: 204ms	remaining: 410ms
166:	learn: 0.2896425	total: 205ms	remaining: 409ms
167:	learn: 0.2889283	total: 206ms	remaining: 408ms
168:	learn: 0.2881842	total: 208ms	remaining: 407ms
169:	learn: 0.2872788	total: 209ms	remaining: 406ms
170:	learn: 0.2869147	total: 210ms	remaining: 404ms
171:	learn: 0.2857760	total: 211ms	remaining: 403ms
172:	learn: 0.2842250	total: 213ms	remaining: 402ms
173:	learn: 0.2828891	total: 214ms	remaining: 401ms
174:	learn: 0.2814904	total: 215ms	remaining: 400ms
175:	learn: 0.2809901	total: 217ms	remaining: 399ms
176:	learn: 0.2807382	total: 218ms	remaining: 398ms
177:	learn: 0.2804443	total: 219ms	remaining: 397ms
178:	learn: 0.2795263	total: 221ms	remaining: 396ms
179:	learn: 0.2783916	total: 222ms	remaining: 395ms
180:	learn: 0.2776987	total: 223ms	remaining: 394ms
181:	learn: 0.2769965	total: 225ms	remaining: 393ms
182:	learn: 0.2762558	total: 226ms	remaining: 392ms
183:	learn: 0.2756746	total: 228ms	remaining: 391ms
184:	learn: 0.2748243	total: 230ms	remaining: 391ms
185:	learn: 0.2736299	total: 231ms	remaining: 389ms
186:	learn: 0.2727997	total: 232ms	remaining: 388ms
187:	learn: 0.2722299	total: 233ms	remaining: 386ms
188:	learn: 0.2716904	total: 234ms	remaining: 385ms
189:	learn: 0.2714092	total: 235ms	remaining: 383ms
190:	learn: 0.2705472	total: 236ms	remaining: 382ms
191:	learn: 0.2700435	total: 237ms	remaining: 380ms
192:	learn: 0.2691573	total: 238ms	remaining: 379ms
193:	learn: 0.2684360	total: 239ms	remaining: 378ms
194:	learn: 0.2681012	total: 240ms	remaining: 376ms
195:	learn: 0.2679548	total: 242ms	remaining: 375ms
196:	learn: 0.2670651	total: 243ms	remaining: 374ms
197:	learn: 0.2667586	total: 245ms	remaining: 374ms
198:	learn: 0.2658871	total: 247ms	remaining: 373ms
199:	learn: 0.2649154	total: 248ms	remaining: 372ms
200:	learn: 0.2635807	total: 249ms	remaining: 370ms
201:	learn: 0.2626310	total: 250ms	remaining: 369ms
202:	learn: 0.2622961	total: 251ms	remaining: 367ms
203:	learn: 0.2616688	total: 252ms	remaining: 366ms
204:	learn: 0.2606020	total: 253ms	remaining: 365ms
205:	learn: 0.2601926	total: 255ms	remaining: 363ms
206:	learn: 0.2593079	total: 256ms	remaining: 362ms
207:	learn: 0.2582663	total: 257ms	remaining: 360ms
208:	learn: 0.2570459	total: 259ms	remaining: 360ms
209:	learn: 0.2568319	total: 260ms	remaining: 359ms
210:	learn: 0.2561383	total: 261ms	remaining: 358ms
211:	learn: 0.2553577	total: 262ms	remaining: 356ms
212:	learn: 0.2544871	total: 263ms	remaining: 355ms
213:	learn: 0.2533137	total: 264ms	remaining: 353ms
214:	learn: 0.2524541	total: 265ms	remaining: 352ms
215:	learn: 0.2522559	total: 267ms	remaining: 350ms
216:	learn: 0.2518124	total: 268ms	remaining: 349ms
217:	learn: 0.2512226	total: 269ms	remaining: 348ms
218:	learn: 0.2509632	total: 270ms	remaining: 346ms
219:	learn: 0.2500786	total: 271ms	remaining: 345ms
220:	learn: 0.2493668	total: 272ms	remaining: 344ms
221:	learn: 0.2484252	total: 274ms	remaining: 343ms
222:	learn: 0.2482757	total: 275ms	remaining: 342ms
223:	learn: 0.2476902	total: 276ms	remaining: 340ms
224:	learn: 0.2466863	total: 277ms	remaining: 339ms
225:	learn: 0.2464783	total: 278ms	remaining: 337ms
226:	learn: 0.2459354	total: 279ms	remaining: 336ms
227:	learn: 0.2453567	total: 281ms	remaining: 335ms
228:	learn: 0.2446004	total: 282ms	remaining: 333ms
229:	learn: 0.2439275	total: 283ms	remaining: 332ms
230:	learn: 0.2433805	total: 284ms	remaining: 330ms
231:	learn: 0.2432260	total: 285ms	remaining: 329ms
232:	learn: 0.2426405	total: 286ms	remaining: 327ms
233:	learn: 0.2418350	total: 287ms	remaining: 326ms
234:	learn: 0.2407784	total: 288ms	remaining: 325ms
235:	learn: 0.2403636	total: 290ms	remaining: 324ms
236:	learn: 0.2400407	total: 291ms	remaining: 323ms
237:	learn: 0.2399377	total: 292ms	remaining: 322ms
238:	learn: 0.2395624	total: 294ms	remaining: 321ms
239:	learn: 0.2391364	total: 295ms	remaining: 319ms
240:	learn: 0.2381516	total: 296ms	remaining: 318ms
241:	learn: 0.2374997	total: 297ms	remaining: 316ms
242:	learn: 0.2366962	total: 298ms	remaining: 315ms
243:	learn: 0.2358804	total: 299ms	remaining: 314ms
244:	learn: 0.2353731	total: 300ms	remaining: 312ms
245:	learn: 0.2346824	total: 301ms	remaining: 311ms
246:	learn: 0.2340018	total: 302ms	remaining: 310ms
247:	learn: 0.2334474	total: 303ms	remaining: 308ms
248:	learn: 0.2327982	total: 305ms	remaining: 308ms
249:	learn: 0.2324127	total: 307ms	remaining: 307ms
250:	learn: 0.2321929	total: 308ms	remaining: 305ms
251:	learn: 0.2315817	total: 309ms	remaining: 304ms
252:	learn: 0.2311017	total: 310ms	remaining: 302ms

253:	learn: 0.2308177	total: 311ms	remaining: 301ms
254:	learn: 0.2299518	total: 312ms	remaining: 300ms
255:	learn: 0.2295334	total: 313ms	remaining: 298ms
256:	learn: 0.2288408	total: 314ms	remaining: 297ms
257:	learn: 0.2277278	total: 315ms	remaining: 296ms
258:	learn: 0.2275563	total: 317ms	remaining: 295ms
259:	learn: 0.2269617	total: 318ms	remaining: 293ms
260:	learn: 0.2266912	total: 319ms	remaining: 292ms
261:	learn: 0.2258958	total: 320ms	remaining: 291ms
262:	learn: 0.2250745	total: 322ms	remaining: 290ms
263:	learn: 0.2248777	total: 323ms	remaining: 289ms
264:	learn: 0.2241243	total: 324ms	remaining: 287ms
265:	learn: 0.2234348	total: 325ms	remaining: 286ms
266:	learn: 0.2226115	total: 326ms	remaining: 285ms
267:	learn: 0.2219551	total: 327ms	remaining: 283ms
268:	learn: 0.2215492	total: 328ms	remaining: 282ms
269:	learn: 0.2212617	total: 329ms	remaining: 281ms
270:	learn: 0.2210748	total: 330ms	remaining: 279ms
271:	learn: 0.2208873	total: 332ms	remaining: 278ms
272:	learn: 0.2206083	total: 333ms	remaining: 277ms
273:	learn: 0.2201642	total: 334ms	remaining: 275ms
274:	learn: 0.2193864	total: 335ms	remaining: 274ms
275:	learn: 0.2186670	total: 337ms	remaining: 274ms
276:	learn: 0.2185844	total: 338ms	remaining: 272ms
277:	learn: 0.2180152	total: 339ms	remaining: 271ms
278:	learn: 0.2176870	total: 340ms	remaining: 269ms
279:	learn: 0.2175650	total: 341ms	remaining: 268ms
280:	learn: 0.2173658	total: 342ms	remaining: 267ms
281:	learn: 0.2168903	total: 343ms	remaining: 265ms
282:	learn: 0.2167815	total: 344ms	remaining: 264ms
283:	learn: 0.2166001	total: 346ms	remaining: 263ms
284:	learn: 0.2161882	total: 347ms	remaining: 262ms
285:	learn: 0.2160388	total: 348ms	remaining: 260ms
286:	learn: 0.2156082	total: 349ms	remaining: 259ms
287:	learn: 0.2149456	total: 351ms	remaining: 258ms
288:	learn: 0.2147529	total: 352ms	remaining: 257ms
289:	learn: 0.2143638	total: 353ms	remaining: 256ms
290:	learn: 0.2142195	total: 354ms	remaining: 254ms
291:	learn: 0.2140345	total: 355ms	remaining: 253ms
292:	learn: 0.2134837	total: 356ms	remaining: 252ms
293:	learn: 0.2131221	total: 358ms	remaining: 251ms
294:	learn: 0.2128319	total: 359ms	remaining: 249ms
295:	learn: 0.2127408	total: 360ms	remaining: 248ms
296:	learn: 0.2123279	total: 361ms	remaining: 247ms
297:	learn: 0.2122647	total: 362ms	remaining: 245ms
298:	learn: 0.2115901	total: 363ms	remaining: 244ms
299:	learn: 0.2112150	total: 364ms	remaining: 243ms
300:	learn: 0.2108557	total: 365ms	remaining: 241ms
301:	learn: 0.2107243	total: 367ms	remaining: 240ms
302:	learn: 0.2102569	total: 368ms	remaining: 239ms
303:	learn: 0.2100633	total: 369ms	remaining: 238ms
304:	learn: 0.2099769	total: 370ms	remaining: 237ms
305:	learn: 0.2093057	total: 371ms	remaining: 235ms
306:	learn: 0.2088209	total: 372ms	remaining: 234ms
307:	learn: 0.2084186	total: 374ms	remaining: 233ms
308:	learn: 0.2080124	total: 375ms	remaining: 232ms
309:	learn: 0.2076718	total: 376ms	remaining: 230ms
310:	learn: 0.2075625	total: 377ms	remaining: 229ms
311:	learn: 0.2068982	total: 378ms	remaining: 228ms
312:	learn: 0.2063015	total: 379ms	remaining: 227ms
313:	learn: 0.2061209	total: 380ms	remaining: 225ms
314:	learn: 0.2055175	total: 382ms	remaining: 224ms
315:	learn: 0.2053088	total: 383ms	remaining: 223ms
316:	learn: 0.2049388	total: 385ms	remaining: 222ms
317:	learn: 0.2045913	total: 386ms	remaining: 221ms
318:	learn: 0.2041915	total: 388ms	remaining: 220ms
319:	learn: 0.2039349	total: 389ms	remaining: 219ms
320:	learn: 0.2036380	total: 390ms	remaining: 217ms
321:	learn: 0.2032117	total: 391ms	remaining: 216ms
322:	learn: 0.2030053	total: 392ms	remaining: 215ms
323:	learn: 0.2029338	total: 393ms	remaining: 214ms
324:	learn: 0.2024864	total: 395ms	remaining: 213ms
325:	learn: 0.2019629	total: 396ms	remaining: 211ms
326:	learn: 0.2016067	total: 397ms	remaining: 210ms
327:	learn: 0.2013976	total: 400ms	remaining: 209ms
328:	learn: 0.2010651	total: 401ms	remaining: 208ms
329:	learn: 0.2006636	total: 402ms	remaining: 207ms
330:	learn: 0.2003499	total: 403ms	remaining: 206ms
331:	learn: 0.2002749	total: 404ms	remaining: 205ms
332:	learn: 0.1999822	total: 406ms	remaining: 203ms
333:	learn: 0.1996499	total: 407ms	remaining: 202ms
334:	learn: 0.1994917	total: 408ms	remaining: 201ms
335:	learn: 0.1991152	total: 409ms	remaining: 200ms
336:	learn: 0.1988865	total: 411ms	remaining: 199ms
337:	learn: 0.1985612	total: 412ms	remaining: 197ms
338:	learn: 0.1979157	total: 414ms	remaining: 196ms
339:	learn: 0.1974938	total: 416ms	remaining: 196ms
340:	learn: 0.1969468	total: 417ms	remaining: 195ms
341:	learn: 0.1966136	total: 418ms	remaining: 193ms

342:	learn: 0.1961162	total: 420ms	remaining: 192ms
343:	learn: 0.1958825	total: 421ms	remaining: 191ms
344:	learn: 0.1953951	total: 422ms	remaining: 190ms
345:	learn: 0.1949623	total: 423ms	remaining: 188ms
346:	learn: 0.1946392	total: 425ms	remaining: 187ms
347:	learn: 0.1942749	total: 426ms	remaining: 186ms
348:	learn: 0.1941493	total: 427ms	remaining: 185ms
349:	learn: 0.1938356	total: 429ms	remaining: 184ms
350:	learn: 0.1932578	total: 431ms	remaining: 183ms
351:	learn: 0.1931376	total: 432ms	remaining: 182ms
352:	learn: 0.1928578	total: 433ms	remaining: 180ms
353:	learn: 0.1925204	total: 434ms	remaining: 179ms
354:	learn: 0.1923450	total: 435ms	remaining: 178ms
355:	learn: 0.1922093	total: 437ms	remaining: 177ms
356:	learn: 0.1918354	total: 438ms	remaining: 175ms
357:	learn: 0.1917173	total: 439ms	remaining: 174ms
358:	learn: 0.1916321	total: 440ms	remaining: 173ms
359:	learn: 0.1910993	total: 442ms	remaining: 172ms
360:	learn: 0.1909486	total: 443ms	remaining: 171ms
361:	learn: 0.1907566	total: 445ms	remaining: 169ms
362:	learn: 0.1904625	total: 447ms	remaining: 169ms
363:	learn: 0.1900501	total: 448ms	remaining: 167ms
364:	learn: 0.1896202	total: 449ms	remaining: 166ms
365:	learn: 0.1894650	total: 450ms	remaining: 165ms
366:	learn: 0.1888791	total: 451ms	remaining: 164ms
367:	learn: 0.1887649	total: 453ms	remaining: 162ms
368:	learn: 0.1882510	total: 454ms	remaining: 161ms
369:	learn: 0.1878843	total: 455ms	remaining: 160ms
370:	learn: 0.1877554	total: 456ms	remaining: 159ms
371:	learn: 0.1872687	total: 458ms	remaining: 157ms
372:	learn: 0.1868264	total: 459ms	remaining: 156ms
373:	learn: 0.1864776	total: 460ms	remaining: 155ms
374:	learn: 0.1862952	total: 463ms	remaining: 154ms
375:	learn: 0.1858533	total: 464ms	remaining: 153ms
376:	learn: 0.1856069	total: 465ms	remaining: 152ms
377:	learn: 0.1851048	total: 466ms	remaining: 151ms
378:	learn: 0.1846264	total: 468ms	remaining: 149ms
379:	learn: 0.1842510	total: 469ms	remaining: 148ms
380:	learn: 0.1839288	total: 470ms	remaining: 147ms
381:	learn: 0.1837933	total: 472ms	remaining: 146ms
382:	learn: 0.1835428	total: 473ms	remaining: 144ms
383:	learn: 0.1832866	total: 474ms	remaining: 143ms
384:	learn: 0.1830660	total: 475ms	remaining: 142ms
385:	learn: 0.1825602	total: 477ms	remaining: 141ms
386:	learn: 0.1822742	total: 478ms	remaining: 140ms
387:	learn: 0.1821821	total: 479ms	remaining: 138ms
388:	learn: 0.1818541	total: 481ms	remaining: 137ms
389:	learn: 0.1816666	total: 482ms	remaining: 136ms
390:	learn: 0.1814358	total: 483ms	remaining: 135ms
391:	learn: 0.1812888	total: 485ms	remaining: 134ms
392:	learn: 0.1807179	total: 486ms	remaining: 132ms
393:	learn: 0.1805072	total: 487ms	remaining: 131ms
394:	learn: 0.1802893	total: 488ms	remaining: 130ms
395:	learn: 0.1801247	total: 489ms	remaining: 129ms
396:	learn: 0.1797678	total: 491ms	remaining: 127ms
397:	learn: 0.1794976	total: 492ms	remaining: 126ms
398:	learn: 0.1790361	total: 494ms	remaining: 125ms
399:	learn: 0.1787674	total: 495ms	remaining: 124ms
400:	learn: 0.1787225	total: 496ms	remaining: 123ms
401:	learn: 0.1781359	total: 498ms	remaining: 121ms
402:	learn: 0.1777932	total: 499ms	remaining: 120ms
403:	learn: 0.1774277	total: 500ms	remaining: 119ms
404:	learn: 0.1769658	total: 501ms	remaining: 118ms
405:	learn: 0.1765731	total: 503ms	remaining: 116ms
406:	learn: 0.1765445	total: 504ms	remaining: 115ms
407:	learn: 0.1761315	total: 505ms	remaining: 114ms
408:	learn: 0.1759312	total: 506ms	remaining: 113ms
409:	learn: 0.1756009	total: 509ms	remaining: 112ms
410:	learn: 0.1754754	total: 510ms	remaining: 110ms
411:	learn: 0.1751560	total: 511ms	remaining: 109ms
412:	learn: 0.1750231	total: 513ms	remaining: 108ms
413:	learn: 0.1749221	total: 514ms	remaining: 107ms
414:	learn: 0.1748716	total: 515ms	remaining: 105ms
415:	learn: 0.1745959	total: 516ms	remaining: 104ms
416:	learn: 0.1744202	total: 517ms	remaining: 103ms
417:	learn: 0.1743585	total: 519ms	remaining: 102ms
418:	learn: 0.1741706	total: 520ms	remaining: 100ms
419:	learn: 0.1740952	total: 521ms	remaining: 99.2ms
420:	learn: 0.1735581	total: 522ms	remaining: 98ms
421:	learn: 0.1734511	total: 525ms	remaining: 97ms
422:	learn: 0.1732066	total: 526ms	remaining: 95.7ms
423:	learn: 0.1731434	total: 527ms	remaining: 94.5ms
424:	learn: 0.1729493	total: 528ms	remaining: 93.2ms
425:	learn: 0.1728802	total: 530ms	remaining: 92ms
426:	learn: 0.1725026	total: 531ms	remaining: 90.7ms
427:	learn: 0.1722333	total: 532ms	remaining: 89.5ms
428:	learn: 0.1718248	total: 533ms	remaining: 88.3ms
429:	learn: 0.1714004	total: 535ms	remaining: 87ms
430:	learn: 0.1710243	total: 536ms	remaining: 85.8ms

431:	learn: 0.1707870	total: 537ms	remaining: 84.6ms
432:	learn: 0.1704622	total: 540ms	remaining: 83.6ms
433:	learn: 0.1701154	total: 541ms	remaining: 82.3ms
434:	learn: 0.1698438	total: 543ms	remaining: 81.1ms
435:	learn: 0.1696099	total: 544ms	remaining: 79.8ms
436:	learn: 0.1695698	total: 545ms	remaining: 78.6ms
437:	learn: 0.1694544	total: 546ms	remaining: 77.3ms
438:	learn: 0.1691441	total: 547ms	remaining: 76ms
439:	learn: 0.1690164	total: 548ms	remaining: 74.8ms
440:	learn: 0.1687206	total: 550ms	remaining: 73.5ms
441:	learn: 0.1684613	total: 551ms	remaining: 72.3ms
442:	learn: 0.1682735	total: 552ms	remaining: 71ms
443:	learn: 0.1682218	total: 554ms	remaining: 69.9ms
444:	learn: 0.1677963	total: 556ms	remaining: 68.7ms
445:	learn: 0.1677530	total: 557ms	remaining: 67.5ms
446:	learn: 0.1676913	total: 558ms	remaining: 66.2ms
447:	learn: 0.1675338	total: 559ms	remaining: 64.9ms
448:	learn: 0.1674538	total: 561ms	remaining: 63.7ms
449:	learn: 0.1673750	total: 562ms	remaining: 62.4ms
450:	learn: 0.1671042	total: 563ms	remaining: 61.2ms
451:	learn: 0.1670058	total: 564ms	remaining: 59.9ms
452:	learn: 0.1666066	total: 565ms	remaining: 58.7ms
453:	learn: 0.1664194	total: 567ms	remaining: 57.4ms
454:	learn: 0.1662461	total: 568ms	remaining: 56.2ms
455:	learn: 0.1660763	total: 570ms	remaining: 55ms
456:	learn: 0.1658964	total: 572ms	remaining: 53.8ms
457:	learn: 0.1656535	total: 573ms	remaining: 52.5ms
458:	learn: 0.1655003	total: 574ms	remaining: 51.3ms
459:	learn: 0.1653476	total: 575ms	remaining: 50ms
460:	learn: 0.1652021	total: 576ms	remaining: 48.7ms
461:	learn: 0.1645402	total: 578ms	remaining: 47.5ms
462:	learn: 0.1644567	total: 579ms	remaining: 46.3ms
463:	learn: 0.1642713	total: 580ms	remaining: 45ms
464:	learn: 0.1640530	total: 581ms	remaining: 43.8ms
465:	learn: 0.1637208	total: 583ms	remaining: 42.5ms
466:	learn: 0.1635703	total: 584ms	remaining: 41.3ms
467:	learn: 0.1634750	total: 587ms	remaining: 40.1ms
468:	learn: 0.1632163	total: 588ms	remaining: 38.9ms
469:	learn: 0.1630559	total: 589ms	remaining: 37.6ms
470:	learn: 0.1629327	total: 591ms	remaining: 36.4ms
471:	learn: 0.1628623	total: 592ms	remaining: 35.1ms
472:	learn: 0.1628331	total: 593ms	remaining: 33.8ms
473:	learn: 0.1626020	total: 594ms	remaining: 32.6ms
474:	learn: 0.1625264	total: 595ms	remaining: 31.3ms
475:	learn: 0.1623817	total: 596ms	remaining: 30ms
476:	learn: 0.1623027	total: 597ms	remaining: 28.8ms
477:	learn: 0.1621926	total: 598ms	remaining: 27.5ms
478:	learn: 0.1618631	total: 600ms	remaining: 26.3ms
479:	learn: 0.1616972	total: 602ms	remaining: 25.1ms
480:	learn: 0.1616376	total: 603ms	remaining: 23.8ms
481:	learn: 0.1615947	total: 604ms	remaining: 22.5ms
482:	learn: 0.1612696	total: 605ms	remaining: 21.3ms
483:	learn: 0.1609891	total: 606ms	remaining: 20ms
484:	learn: 0.1608418	total: 608ms	remaining: 18.8ms
485:	learn: 0.1605867	total: 609ms	remaining: 17.5ms
486:	learn: 0.1602867	total: 610ms	remaining: 16.3ms
487:	learn: 0.1599936	total: 611ms	remaining: 15ms
488:	learn: 0.1596746	total: 613ms	remaining: 13.8ms
489:	learn: 0.1596137	total: 614ms	remaining: 12.5ms
490:	learn: 0.1593599	total: 616ms	remaining: 11.3ms
491:	learn: 0.1592449	total: 618ms	remaining: 10ms
492:	learn: 0.1591946	total: 619ms	remaining: 8.78ms
493:	learn: 0.1591193	total: 620ms	remaining: 7.53ms
494:	learn: 0.1587012	total: 621ms	remaining: 6.27ms
495:	learn: 0.1585541	total: 622ms	remaining: 5.02ms
496:	learn: 0.1583058	total: 623ms	remaining: 3.76ms
497:	learn: 0.1581542	total: 624ms	remaining: 2.51ms
498:	learn: 0.1579877	total: 625ms	remaining: 1.25ms
499:	learn: 0.1579240	total: 626ms	remaining: 0us

```
In [71]: y_pred = cat_tuned.predict(x_test)
accuracy_score(y_test, y_pred)
```

```
Out[71]: 0.935
```

## Compare of All Models

```
In [92]: models = [
    loj_tuned,
    nb_model,
    knn_model,
    svm_model_linear,
    mlp_tuned,
    cart_tuned,
    rf_tuned,
    gbm_tuned,
```

```

    xgb_tuned,
    cat_tuned
]

for model in models:
    names = model.__class__.__name__
    y_pred = model.predict(x_test)
    accuracy = accuracy_score(y_test, y_pred)
    print("-"*28)
    print(names + ":" )
    print("Accuracy: {:.4%}".format(accuracy))

```

```

-----
LogisticRegression:
Accuracy: 97.5000%

```

```

-----
GaussianNB:
Accuracy: 81.0000%

```

```

-----
KNeighborsClassifier:
Accuracy: 92.7500%

```

```

-----
SVC:
Accuracy: 98.2500%

```

```

-----
MLPClassifier:
Accuracy: 23.5000%

```

```

-----
DecisionTreeClassifier:
Accuracy: 85.7500%

```

```

-----
RandomForestClassifier:
Accuracy: 91.2500%

```

```

-----
GradientBoostingClassifier:
Accuracy: 91.5000%

```

```

-----
XGBClassifier:
Accuracy: 92.7500%

```

```

-----
CatBoostClassifier:
Accuracy: 93.5000%

```

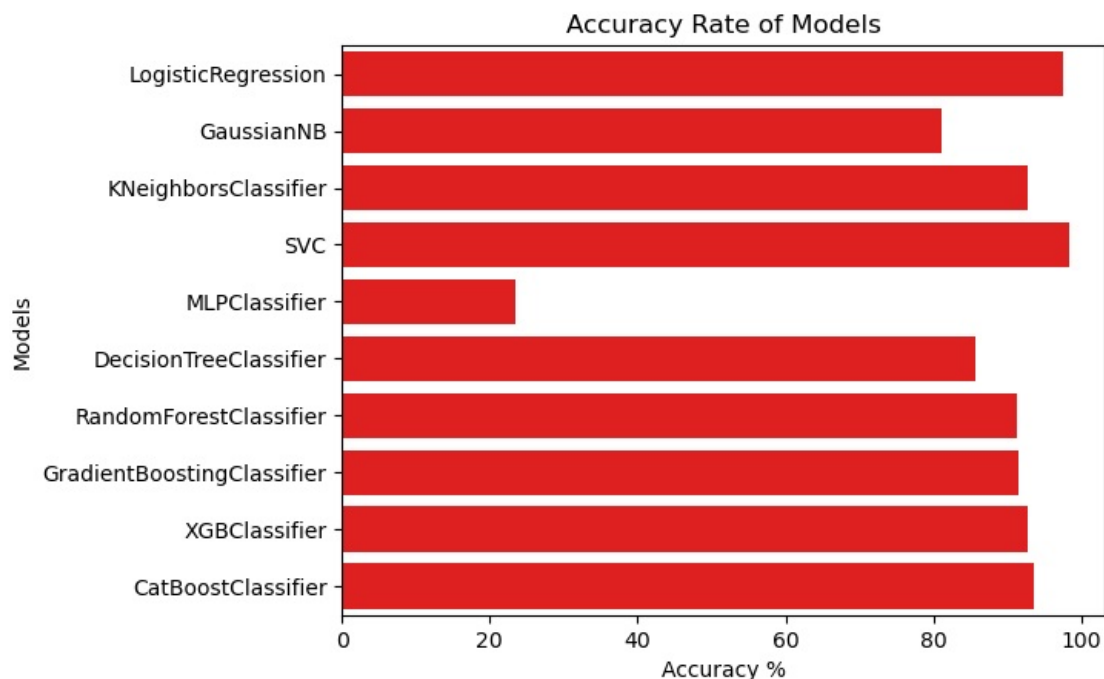
```

In [93]: result = []
results = pd.DataFrame(columns= ["Models", "Accuracy"])

for model in models:
    names = model.__class__.__name__
    y_pred = model.predict(x_test)
    accuracy = accuracy_score(y_test, y_pred)
    result = pd.DataFrame([[names, accuracy*100]], columns= ["Models", "Accuracy"])
    results = results.append(result)

sns.barplot(x= 'Accuracy', y= 'Models', data=results, color="r")
plt.xlabel('Accuracy %')
plt.title('Accuracy Rate of Models');

```



As we see it seems the most successful algorithm is SVC.