```
import pandas as pd
import numpy as np
import pickle
import matplotlib.pyplot as plt
%matplotlib inline
import seaborn as sns
import sklearn
from sklearn.preprocessing import LabelEncoder, OneHotEncoder
from sklearn.linear_model import LogisticRegression
from sklearn.tree import DecisionTreeClassifier
from sklearn.ensemble import RandomForestClassifier
from sklearn.neighbors import KNeighborsClassifier
from sklearn.svm import SVC
from \ sklearn.model\_selection \ import \ Randomized Search CV
import imblearn
from imblearn.over_sampling import SMOTE
from sklearn.model_selection import train_test_split
from sklearn.preprocessing import StandardScaler
from \ sklearn.metrics \ import \ accuracy\_score, \ classification\_report, \ confusion\_matrix, \ f1\_score
data = pd.read csv("WA Fn-UseC -Telco-Customer-Churn.csv")
```

	customerID	gender	SeniorCitizen	Partner	Dependents	tenure	PhoneService	MultipleLines	InternetService	OnlineSecurity	• • •
0	7590- VHVEG	Female	0	Yes	No	1	No	No phone service	DSL	No	
1	5575- GNVDE	Male	0	No	No	34	Yes	No	DSL	Yes	
2	3668- QPYBK	Male	0	No	No	2	Yes	No	DSL	Yes	
3	7795- CFOCW	Male	0	No	No	45	No	No phone service	DSL	Yes	
4	9237- HQITU	Female	0	No	No	2	Yes	No	Fiber optic	No	
7038	6840- RESVB	Male	0	Yes	Yes	24	Yes	Yes	DSL	Yes	
7039	2234- XADUH	Female	0	Yes	Yes	72	Yes	Yes	Fiber optic	No	
7040	4801- JZAZL	Female	0	Yes	Yes	11	No	No phone service	DSL	Yes	
7041	8361- LTMKD	Male	1	Yes	No	4	Yes	Yes	Fiber optic	No	
7042	3186-AJIEK	Male	0	No	No	66	Yes	No	Fiber optic	Yes	
7043 rows × 21 columns											
1											•

data.info()

<class 'pandas.core.frame.DataFrame'> RangeIndex: 7043 entries, 0 to 7042 Data columns (total 21 columns):

	COTO / COCOT TT		
#	Column	Non-Null Count	Dtype
0	customerID	7043 non-null	object
1	gender	7043 non-null	object
2	SeniorCitizen	7043 non-null	int64
3	Partner	7043 non-null	object
4	Dependents	7043 non-null	object
5	tenure	7043 non-null	int64
6	PhoneService	7043 non-null	object
7	MultipleLines	7043 non-null	object
8	InternetService	7043 non-null	object
9	OnlineSecurity	7043 non-null	object
10	OnlineBackup	7043 non-null	object
11	DeviceProtection	7043 non-null	object

```
4/12/23, 2:29 PM
         12 TechSupport
                                7043 non-null
                                                object
         13
             StreamingTV
                                7043 non-null
                                                object
                               7043 non-null
         14 StreamingMovies
                                                object
         15
             Contract
                                7043 non-null
                                                obiect
             PaperlessBilling 7043 non-null
         16
                                                object
             PaymentMethod
                                7043 non-null
         17
                                                object
         18 MonthlyCharges
                                7043 non-null
                                                float64
                                7043 non-null
         19 TotalCharges
                                                object
         20 Churn
                                7043 non-null
                                                object
        dtypes: float64(1), int64(2), object(18)
        memory usage: 1.1+ MB
   data.TotalCharges = pd.to_numeric("data.TotalCharges", errors='coerce')
   data.isnull().any()
                             False
        customerID
        gender
                             False
         SeniorCitizen
                             False
                             False
        Partner
        Dependents
                             False
        tenure
                             False
        PhoneService
                             False
        MultipleLines
                             False
        InternetService
                             False
        OnlineSecurity
                             False
        OnlineBackup
                             False
        DeviceProtection
                             False
        TechSupport
                             False
        StreamingTV
                             False
        StreamingMovies
                             False
        Contract
                             False
        PaperlessBilling
                             False
        PaymentMethod
                             False
        MonthlyCharges
                             False
        TotalCharges
                              True
        Churn
                             False
        dtype: bool
   data.fillna(data.median)
   data.isnull().sum()
                                0
        customerID
        gender
                                a
        SeniorCitizen
        Partner
        Dependents
        tenure
        PhoneService
        MultipleLines
        InternetService
        OnlineSecurity
        OnlineBackup
        DeviceProtection
        TechSupport
        StreamingTV
        {\tt StreamingMovies}
        Contract
                               a
        PaperlessBilling
        PaymentMethod
                                0
        MonthlyCharges
                               0
        TotalCharges
                             7043
        Churn
        dtype: int64
   from sklearn.preprocessing import LabelEncoder
   le = LabelEncoder()
   data["gender"] = le.fit_transform(data["gender"])
   data["Partner"] = le.fit_transform(data["Partner"])
   data["Dependents"] = le.fit transform(data["Dependents"])
   data["PhoneService"] = le.fit_transform(data["PhoneService"])
   data["MultipleLines"] = le.fit_transform(data["MultipleLines"])
   data["InternetService"] = le.fit_transform(data["InternetService"])
   data["OnlineSecurity"] = le.fit_transform(data["OnlineSecurity"])
   data["OnlineBackup"] = le.fit transform(data["OnlineBackup"])
   data["DeviceProtection"] = le.fit_transform(data["DeviceProtection"])
   data["TechSupport"] = le.fit_transform(data["TechSupport"])
   data["StreamingTV"] = le.fit_transform(data["StreamingTV"])
   data["StreamingMovies"] = le.fit_transform(data["StreamingMovies"])
   data["Contract"] = le.fit_transform(data["Contract"])
   data["PaperlessBilling"] = le.fit_transform(data["PaperlessBilling"])
```

data.head()

	customerID	gender	SeniorCitizen	Partner	Dependents	tenure	PhoneService	MultipleLines	InternetService	OnlineSecurity	• • •	Dev
0	7590- VHVEG	0	0	1	0	1	0	1	0	0		
1	5575- GNVDE	1	0	0	0	34	1	0	0	2		
2	3668- QPYBK	1	0	0	0	2	1	0	0	2		
3	7795- CFOCW	1	0	0	0	45	0	1	0	2		
4	9237- HQITU	0	0	0	0	2	1	0	1	0		
5 rows × 21 columns												
4												<b>&gt;</b>

```
x = data.iloc[:,1:19].values
y = data.iloc[:,20].values
     array([[ 0. ,
                      0. , 1. , ..., 1. , 2. , 29.85],
              1. ,
                      0. ,
                              0. , ...,
                                          0. ,
                                                  3. ,
                      0.,
                              0. , ...,
                                                  3. , 53.85],
            [ 1.
                                          1. ,
                      0.,
                             1. , ...,
                                          1. ,
                                                  2. , 29.6],
           [ 1. ,
                                                  3. , 74.4 ],
                      1. ,
                             1. , ..., 1. ,
                      0.,
                             0. , ...,
                                         1. ,
                                                0. , 105.65]])
У
     array([0, 0, 1, ..., 0, 1, 0])
from sklearn.preprocessing import OneHotEncoder
one = OneHotEncoder()
a= one.fit_transform(x[:,6:7]).toarray()
b= one.fit_transform(x[:,7:8]).toarray()
c= one.fit_transform(x[:,8:9]).toarray()
d= one.fit_transform(x[:,9:18]).toarray()
e= one.fit_transform(x[:,10:11]).toarray()
f= one.fit_transform(x[:,11:12]).toarray()
g= one.fit transform(x[:,12:13]).toarray()
h= one.fit_transform(x[:,13:14]).toarray()
i= one.fit_transform(x[:,14:15]).toarray()
j= one.fit_transform(x[:,16:17]).toarray()
x=np.delete(x,[6,7,8,9,10,11,12,13,14,16], axis=1)
x=np.concatenate((a,b,c,d,e,f,g,h,i,j,x),axis=1)
from imblearn.over_sampling import SMOTE
smt = SMOTE()
x_resample, y_resample = smt.fit_resample(x,y)
x_resample
     array([[0.00000000e+00, 1.00000000e+00, 0.00000000e+00, ...,
             0.00000000e+00, 1.00000000e+00, 2.98500000e+01],
            [1.00000000e+00, 0.00000000e+00, 0.00000000e+00, ...,
            1.00000000e+00, 0.00000000e+00, 5.69500000e+01],
            [1.00000000e+00, 0.00000000e+00, 0.00000000e+00, ...,
            1.00000000e+00, 1.00000000e+00, 5.38500000e+01],
            [1.00000000e+00, 0.00000000e+00, 0.00000000e+00, ...,
            1.00000000e+00, 1.00000000e+00, 5.08215503e+01],
            [1.24276898e-02, 9.87572310e-01, 0.00000000e+00, ...,
            1.24276898e-02, 1.00000000e+00, 4.83723698e+01],
```

```
[1.00000000e+00, 0.00000000e+00, 0.00000000e+00, ...,
1.00000000e+00, 8.12020336e-01, 4.53657929e+01]])

y_resample
    array([0, 0, 1, ..., 1, 1, 1])

x.shape, x_resample.shape
    ((7043, 1645), (10348, 1645))

y.shape, y_resample.shape
    ((7043,), (10348,))
```

data.describe()

	gender	SeniorCitizen	Partner	Dependents	tenure	PhoneService	MultipleLines	InternetService	OnlineSecurity	On
count	7043.000000	7043.000000	7043.000000	7043.000000	7043.000000	7043.000000	7043.000000	7043.000000	7043.000000	7
mean	0.504756	0.162147	0.483033	0.299588	32.371149	0.903166	0.940508	0.872923	0.790004	
std	0.500013	0.368612	0.499748	0.458110	24.559481	0.295752	0.948554	0.737796	0.859848	
min	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	
25%	0.000000	0.000000	0.000000	0.000000	9.000000	1.000000	0.000000	0.000000	0.000000	
50%	1.000000	0.000000	0.000000	0.000000	29.000000	1.000000	1.000000	1.000000	1.000000	
75%	1.000000	0.000000	1.000000	1.000000	55.000000	1.000000	2.000000	1.000000	2.000000	
max	1.000000	1.000000	1.000000	1.000000	72.000000	1.000000	2.000000	2.000000	2.000000	
4					_					

plt.figure(figsize=(12,5))

plt.subplot(1,2,1)

sns.distplot(data["tenure"])

plt.subplot(1,2,2)

sns.distplot(data["MonthlyCharges"])

```
<ipython-input-19-3bd718de5fe4>:3: UserWarning:
```

`distplot` is a deprecated function and will be removed in seaborn v0.14.0.

Please adapt your code to use either `displot` (a figure-level function with similar flexibility) or `histplot` (an axes-level function for histograms).

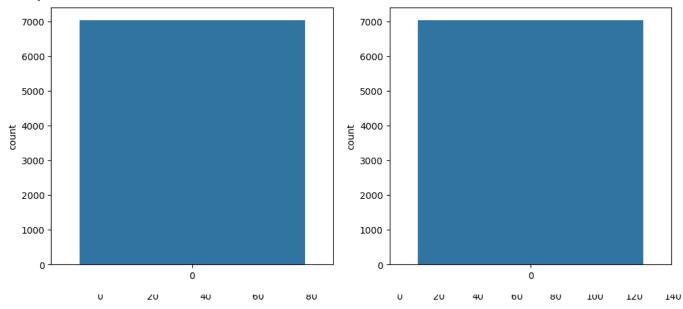
For a guide to updating your code to use the new functions, please see <a href="https://gist.github.com/mwaskom/de44147ed2974457ad6372750bbe5751">https://gist.github.com/mwaskom/de44147ed2974457ad6372750bbe5751</a>

```
sns.distplot(data["tenure"])
<ipython-input-19-3bd718de5fe4>:5: UserWarning:
```

```
plt.figure(figsize=(12,5))
plt.subplot(1,2,1)
sns.countplot(data["gender"])
```

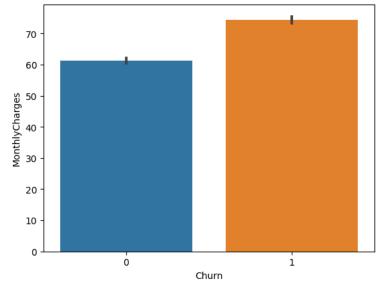
plt.subplot(1,2,2)
sns.countplot(data["Dependents"])

<Axes: ylabel='count'>



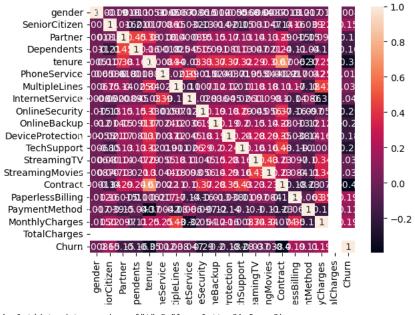
sns.barplot(x="Churn", y="MonthlyCharges",data=data)

<Axes: xlabel='Churn', ylabel='MonthlyCharges'>



sns.heatmap(data.corr(), annot=True)





sns.pairplot(data=data, markers=["^","v"], palette="inferno")

```
/usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:1507: UserWarning: Ignoring `palette` because no `hue` variable has been assi
  func(x=vector, **plot_kwargs)
/usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:1507: UserWarning: Ignoring `palette` because no `hue` variable has been assi
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/usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:1609: UserWarning: Ignoring `palette` because no `hue` variable has been assi
  func(x=x, y=y, **kwargs)
/usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:1609: UserWarning: Ignoring `palette` because no `hue` variable has been assi
  func(x=x, y=y, **kwargs)
/usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:1609: UserWarning: Ignoring `palette` because no `hue` variable has been assi
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                                                                                                                  variable has been assi
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/usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:1609: UserWarning: Ignoring `palette` because no `hue` variable has been assi
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/usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:1609: UserWarning: Ignoring `palette` because no `hue` variable has been assi
  func(x=x, y=y, **kwargs)
```

```
Classification Report
                   precision
                                 recall f1-score
                                                    support
                a
                        0.91
                                   0.65
                                             9.76
                                                       1033
                1
                        0.73
                                   0.94
                                             0.82
                                                       1037
                                             0.79
                                                       2070
         accuracy
                                                       2070
        macro avg
                        0.82
                                   0.79
                                             0.79
     weighted avg
                                   0.79
                                             0.79
                                                       2070
       : u::c(x-x, y-y,
                        KWUI 53/
def RandomForest(x_tarin,x_test,y_train,y_test):
   rf = RandomForestClassifier(criterion="entropy",n_estimators=10,random_state=0)
    rf.fit(x_train,y_train)
   y_rf_tr = rf.predict(x_train)
    print(accuracy_score (y_rf_tr,y_train))
    yPred_rf = rf.predict(x_test)
   print(accuracy_score(yPred_rf,y_test))
    print("***Random Forest ****")
    print("Confusion Matrix")
    print(confusion_matrix(y_test,yPred_rf))
    print("Classification Report")
    \verb|print(classification_report(y_test,yPred_rf))|\\
     / usi / tocat/ ttu/ pychono. 9/ utsc-packages/ seauoi ii/ axtsgi tu.py. tous. Osei wai nting. I tghoi ting | patecce | Decause ind | ind | valitable inds | Deen | assi
RandomForest(x_train,x_test,y_train,y_test)
     0.9885237980188452
     0.8130434782608695
     ***Random Forest ****
     Confusion Matrix
     [[737 296]
      [ 91 946]]
     Classification Report
                   precision
                                recall f1-score
                                   0.71
                                             0.79
                                                       1033
                0
                        0.89
                1
                        0.76
                                   0.91
                                             0.83
                                                       1037
                                             0.81
                                                       2070
         accuracy
                        0.83
                                   0.81
                                                       2070
        macro avg
                                             0.81
     weighted avg
                        0.83
                                   0.81
                                             0.81
                                                       2070
     /usi/juccai/iiu/pychono.o/uisc-packages/seauonn/axisgniu.py.iooo. Oserwarning. Ignoring parette decause no nue variable has been assi
def KNN(x_train,x_test,y_train,y_test):
    knn = KNeighborsClassifier()
   knn.fit(x_train,y_train)
   y_knn_tr = knn.predict(x_train)
   print(accuracy_score(y_knn_tr,y_train))
   yPred_knn = knn.predict(x_test)
    print(accuracy_score(yPred_knn,y_test))
    print("***KNN***")
   print("Confusion Matrix")
   print(confusion_matrix(y_test,yPred_knn))
    print("Classification Report")
    print(classification_report(y_test,yPred_knn))
       KNN(x_train,x_test,y_train,y_test)
     0.7798985262140614
     0.6589371980676328
     ***KNN***
     Confusion Matrix
     [[493 540]
      [166 871]]
     Classification Report
                   precision
                                recall f1-score
                                                    support
                0
                        0.75
                                   0.48
                                             0.58
                                                       1033
                1
                        0.62
                                   0.84
                                             0.71
                                                       1037
                                             0.66
                                                       2070
         accuracy
                                                       2070
                        0.68
                                   0.66
        macro avg
                                             0.65
     weighted avg
                        0.68
                                   0.66
                                             0.65
                                                       2070
       Tunc(x=x, y=y, *** kwangs)
def svm(x_tarin,x_test,y_train,y_test):
    svm = SVC(kernel = "linear")
```

```
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                        Conform ok { Testing Ok } Intelligent customer retention using machine learning for enhanced prediction of telecom customer chur...
       svm.fit(x_train,y_train)
       y_svm_tr = svm.predict(x_train)
       print (accuracy_score (y_svm_tr,y_train))
       yPred_svm= svm.predict(x_test)
       print(accuracy_score(yPred_svm,y_test))
       print("***Support Vector Machine***")
       print("Confusion_Matrix")
       print(confusion_matrix(y_test,yPred_svm))
       print("Classification Report")
       print(classification_report(y_test,yPred_svm))
           func(x=x, y=y, **kwargs)
   svm(x_train,x_test,y_train,y_test)
        0.8800434887654023
        0.7961352657004831
         ***Support Vector Machine***
        Confusion_Matrix
        [[756 277]
         [145 892]]
        Classification Report
                       precision
                                    recall f1-score
                                                       support
                   0
                            0.84
                                      0.73
                                                0.78
                                                          1033
                   1
                            0.76
                                      0.86
                                                0.81
                                                          1037
                                                0.80
                                                          2070
            accuracy
                            0.80
                                      0.80
                                                          2070
           macro avg
                                                0.80
         weighted avg
                            0.80
                                      0.80
                                                0.80
                                                          2070
           func(x=x, y=y, **kwargs)
   import keras
   from keras.models import Sequential
   from keras.layers import Dense
         /usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:lbd9: UserWarning: Ignoring palette because no hue variable has been assi
   classifier = Sequential()
           tunc(x=x, y=y, **kwargs)
   classifier.add(Dense(units=30, activation='relu'))
         /usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:1609: UserWarning: Ignoring `palette` because no `hue` variable has been assi
   classifier.add(Dense(units=30, activation='relu'))
           func(x=x, y=y, **kwargs)
   classifier.add(Dense(units=1, activation='sigmoid'))
         /usr/local/lib/nvthon3.9/dist-nackages/seaborn/axisgrid.nv:1609: UserWarning: Tgnoring `nalette` hecause no `hue` variable has heen assi
   classifier.compile(optimizer='adam', loss='binary_crossentropy', metrics=['accuracy'])
           func(y=y v=v **kwargs)
```

model\_history = classifier.fit(x\_train, y\_train, batch\_size=10, validation\_split=0.33, epochs=50)

```
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     Epoch 34/50
               555/555 [====
     Epoch 35/50
     555/555 [==========] - 1s 3ms/step - loss: 0.0152 - accuracy: 0.9935 - val loss: 1.8245 - val accuracy: 0.8342
     Epoch 36/50
                   555/555 [===
     Epoch 37/50
     555/555 [===
                    Epoch 38/50
     555/555 [===========] - 1s 3ms/step - loss: 0.0193 - accuracy: 0.9930 - val_loss: 1.9278 - val_accuracy: 0.8313
      Epoch 39/50
                  555/555 [===
     Epoch 40/50
     555/555 [============] - 2s 3ms/step - loss: 0.0133 - accuracy: 0.9937 - val_loss: 1.9476 - val_accuracy: 0.8291
      Epoch 41/50
     555/555 [=========] - 2s 4ms/step - loss: 0.0113 - accuracy: 0.9950 - val_loss: 1.9340 - val_accuracy: 0.8305
     Epoch 42/50
      555/555 [============] - 2s 4ms/step - loss: 0.0170 - accuracy: 0.9924 - val_loss: 1.9294 - val_accuracy: 0.8371
     Epoch 43/50
     555/555 [====
                Epoch 44/50
     555/555 [====
               Epoch 45/50
     555/555 [===========] - 1s 2ms/step - loss: 0.0164 - accuracy: 0.9931 - val_loss: 1.9367 - val_accuracy: 0.8357
     Epoch 46/50
     555/555 [===
                 Epoch 47/50
      555/555 [==========] - 2s 3ms/step - loss: 0.0120 - accuracy: 0.9939 - val loss: 2.0069 - val accuracy: 0.8320
     Tuartidedifitu, py thoma. a, utat-packages, seaborn, axtagritu.py. 1000. User warning. Ignoring patetic because no nue
  ann_pred = classifier.predict(x_test)
  ann_pred = (ann_pred>0.5)
  ann pred
      65/65 [============ ] - 0s 4ms/step
      array([[ True],
           [False],
           [ True],
           [ True],
           [Falsel.
          [ True]])
  print(accuracy_score(ann_pred,y_test))
  print("***ANN Model***")
  print("Confusion_Matrix")
  print(confusion_matrix(y_test, ann_pred))
  print("Classification Report")
  print(classification_report(y_test,ann_pred))
      0.8328502415458937
      ***ANN Model**
     Confusion Matrix
     [[896 137]
      [209 828]]
     Classification Report
               precision
                        recall f1-score
                                      support
             0
                   0.81
                          0.87
                                 0.84
                                        1033
                   0.86
                          0.80
                                 0.83
                                        1037
             1
                                        2070
                                 0.83
        accuracy
        macro avg
                   0.83
                          0.83
                                 0.83
                                        2070
      weighted avg
                   0.83
                          0.83
                                 0.83
                                        2070
       func(x=x, y=y, **kwargs)
  lr = LogisticRegression(random_state=0)
  lr.fit(x_train,y_train)
  print("Predicting on random input")
  print("output is: ",lr_pred_own)
     Predicting on random input
     output is: [1]
      /usr/local/lib/python3.9/dist-packages/sklearn/linear_model/_logistic.py:458: ConvergenceWarning: lbfgs failed to converge (status=1):
     STOP: TOTAL NO. of ITERATIONS REACHED LIMIT.
     Increase the number of iterations (max_iter) or scale the data as shown in:
        https://scikit-learn.org/stable/modules/preprocessing.html
     Please also refer to the documentation for alternative solver options:
```

```
https://scikit-learn.org/stable/modules/linear_model.html#logistic-regression
     n_iter_i = _check_optimize_result(
     dtc = DecisionTreeClassifier(criterion="entropy",random_state=0)
dtc.fit(x train,y train)
print("Predicting on random Input")
print("output is: ",dtc_pred_own)
   Predicting on random Input
   output is: [1]
    /ucr/local/lih/nython3 q/dict_nackagac/caahonn/avicgrid ny:1609. UcanWanning. Tgnoning `nalatta` hacauca no `hua` yariahla hac haan acci
rf = RandomForestClassifier(criterion="entropy",n estimators=10,random state=0)
rf.fit(x_train,y_train)
print("Predicting on rand input")
print("ouput is: ",rf_pred_own)
   Predicting on rand input
   ouput is: [1]
   /usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:1609: UserWarning: Ignoring palette because no hue variable has been assi
svc = SVC(kernel = "linear")
svc.fit(x train,y train)
print("Predicting on random input")
print("output is: ",svm_pred_own)
    knn = KNeighborsClassifier()
knn.fit(x_train,y_train)
print("predicting on random input")
print("output is: ",knn_pred_own)
   predicting on random input
   output is: [1]
    /usr/local/lih/nython3 9/dist-nackages/seahorn/axisgrid ny:1600: UserWarning: Tonoring `nalette` hecause no `hue` variable has been assi
print("Predicting on random input")
print(ann_pred_own)
ann_pred_own = (ann_pred_own>0.5)
print("output is: ",ann_pred_own)
    Predicting on random input
   1/1 [=======] - 0s 25ms/step
   [[0.]]
   output is: [[False]]
   /usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:lb09: UserWarning: Ignoring palette because no hue variable has been assi
def compareModel(x_train,x_test,y_train,y_test):
   logreg(x_train,x_test,y_train,y_test)
   print('-'*100)
   decisionTree(x_train,x_test,y_train,y_test)
   print('-'*100)
   RandomForest (x_train,x_test,y_train,y_test)
   print('-'*100)
   svm(x_train,x_test,y_train,y_test)
   print('-'*100)
   KNN(x_train,x_test,y_train,y_test)
   print('-'*100)
   /usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:1609: UserWarning: Ignoring `palette` because no `hue` variable has been assi
compareModel(x_train,x_test,y_train,y_test)
    /usr/local/lib/python3.9/dist-packages/sklearn/linear_model/_logistic.py:458: ConvergenceWarning: lbfgs failed to converge (status=1):
   STOP: TOTAL NO. of ITERATIONS REACHED LIMIT.
   Increase the number of iterations (max_iter) or scale the data as shown in:
       https://scikit-learn.org/stable/modules/preprocessing.html
   Please also refer to the documentation for alternative solver options:
      https://scikit-learn.org/stable/modules/linear_model.html#logistic-regression
     n_iter_i = _check_optimize_result(
    0.8682048804058952
   0.7990338164251207
    ***Logistic Regression***
    Confusion_Matrix
   [[820 213]
    [203 834]]
```

```
Classification Report
                 precision
                              recall f1-score
                                                support
               a
                      0.80
                                0.79
                                         9.89
                                                   1033
               1
                      0.80
                                0.80
                                         0.80
                                                   1037
                                         0.80
                                                   2070
        accuracy
                      0.80
                                0.80
                                         0.80
                                                   2070
       macro avg
    weighted avg
                                         0.80
                                                   2070
    0.9978255617298865
    0.793719806763285
     ***Decision Tree**
    Confusion_Matrix
    [[672 361]
     [ 66 971]]
    Classification Report
                 precision
                              recall f1-score
                                                support
               0
                      0.91
                                0.65
                                         0.76
                                                   1033
               1
                      0.73
                                0.94
                                         0.82
                                                   1037
                                         0.79
                                                   2070
        accuracy
       macro avg
                      0.82
                                0.79
                                         0.79
                                                   2070
                      0.82
                                0.79
                                         0.79
                                                   2070
    weighted avg
    0.9885237980188452
    0.8130434782608695
     ***Random Forest ****
    Confusion Matrix
    [[737 296]
     [ 91 946]]
    Classification Report
                 precision
                              recall f1-score
                                                support
               0
                      0.89
                                0.71
                                         0.79
                                                   1033
               1
                      0.76
                                0.91
                                         0.83
                                                   1037
                                         0.81
                                                   2070
        accuracy
       macro avg
                                                   2070
                      0.83
                                0.81
                                         0.81
print(accuracy_score(ann_pred,y_test))
print("***ANN Model***")
print("Confusion_Matrix")
print(confusion_matrix(y_test,ann_pred))
print("Classification Report")
print(classification_report (y_test,ann_pred))
    0.8328502415458937
     ***ANN Model***
    Confusion Matrix
    [[896 137]
     [209 828]]
    Classification Report
                 precision
                              recall f1-score
                                                support
               0
                      0.81
                                0.87
                                         0.84
                                                   1033
               1
                      0.86
                                0.80
                                         0.83
                                                   1037
                                                   2070
        accuracy
                                         0.83
                      0.83
                                0.83
                                                   2070
       macro avg
                                         0.83
                                                   2070
    weighted avg
                      0.83
                                0.83
                                         0.83
      tunc(x=x, y=y, **kwargs)
y_rf = rf.predict(x_train)
print(accuracy_score(y_rf,y_train))
yPred_rfcv = rf.predict(x_test)
print(accuracy_score(yPred_rfcv,y_test))
print("***Random Forest after Hyperparameter tuning***")
print("Confusion_Matric")
print(confusion_matrix(y_test,yPred_rfcv))
print("classification Report")
print(classification_report(y_test,yPred_rfcv))
print("Predicting on random input")
print("output is: ",rfcv_pred_own)
```

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Conform ok { Testing Ok } Intelligent customer retention using machine learning for enhanced prediction of telecom customer chur...
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    0.8130434782608695
         ***Random Forest after Hyperparameter tuning***
        Confusion_Matric
        [[737 296]
         [ 91 946]]
        classification Report
                                    recall f1-score
                      precision
                                                       support
                   a
                           0.89
                                     0.71
                                                0.79
                                                          1033
                   1
                           0.76
                                     0.91
                                                0.83
                                                          1037
                                                          2070
            accuracy
                                                0.81
                           0.83
                                     0.81
                                                0.81
                                                          2070
           macro avg
         weighted avg
                           0.83
                                     0.81
                                                0.81
                                                          2070
        Predicting on random input
        output is: [1]
          tunc(x=x, y=y, **kwargs)
        /usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:1609: UserWarning: Ignoring `palette` because no `hue` variable has been assi
          func(x=x, y=y, **kwargs)
         /usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:1609: UserWarning: Ignoring `palette` because no `hue` variable has been assi
          func(x=x, y=y, **kwargs)
         /usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:1609: UserWarning: Ignoring `palette` because no `hue` variable has been assi
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         /usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:1609: UserWarning: Ignoring `palette` because no `hue` variable has been assi
           func(x=x, y=y, **kwargs)
         /usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:1609: UserWarning: Ignoring `palette` because no `hue` variable has been assi
          func(x=x, y=y, **kwargs)
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          func(x=x, y=y, **kwargs)
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          func(x=x, y=y, **kwargs)
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          func(x=x, y=y, **kwargs)
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          func(x=x, y=y, **kwargs)
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                                                                                                                           variable has been assi
          func(x=x, y=y, **kwargs)
         /usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:1609: UserWarning: Ignoring `palette` because no `hue` variable has been assi
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          func(x=x, y=y, **kwargs)
         /usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:1609: UserWarning: Ignoring `palette` because no `hue`
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          func(x=x, y=y, **kwargs)
         /usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:1609: UserWarning: Ignoring `palette` because no `hue` variable has been assi
          func(x=x, y=y, **kwargs)
        /usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:1609: UserWarning: Ignoring `palette` because no `hue` variable has been assi
          func(x=x, y=y, **kwargs)
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           func(x=x, y=y, **kwargs)
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          func(x=x, y=y, **kwargs)
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          func(x=x, y=y, **kwargs)
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          func(x=x, y=y, **kwargs)
         /usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:1609: UserWarning: Ignoring `palette` because no `hue` variable has been assi
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         /usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:1609: UserWarning: Ignoring `palette` because no `hue` variable has been assi
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/usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:1609: UserWarning: Ignoring `palette` because no `hue` variable has been assi

/usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:1609: UserWarning: Ignoring `palette` because no `hue` variable has been assi

/usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:1609: UserWarning: Ignoring `palette` because no `hue` variable has been assi

func(x=x, y=y, \*\*kwargs)

func(x=x, y=y, \*\*kwargs)

func(x=x, y=y, \*\*kwargs)

func(x=x, y=y, \*\*kwargs)

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          func(x=x, y=y, **kwargs)
         /usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:1609: UserWarning: Ignoring `palette` because no `hue` variable has been assi
          func(x=x, y=y, **kwargs)
         /usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:1609: UserWarning: Ignoring `palette` because no `hue` variable has been assi
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         /usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:1609: UserWarning: Ignoring `palette` because no `hue` variable has been assi
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         /usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:1609: UserWarning: Ignoring `palette` because no `hue` variable has been assi
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          func(x=x, y=y, **kwargs)
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          func(x=x, y=y, **kwargs)
         /usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:1609: UserWarning: Ignoring `palette` because no `hue`
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          func(x=x, y=y, **kwargs)
         /usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:1609: UserWarning: Ignoring `palette` because no `hue` variable has been assi
          func(x=x, y=y, **kwargs)
         /usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:1609: UserWarning: Ignoring `palette` because no `hue`
                                                                                                                          variable has been assi
          func(x=x, y=y, **kwargs)
         /usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:1609: UserWarning: Ignoring `palette` because no `hue` variable has been assi
          func(x=x, y=y, **kwargs)
         /usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:1609: UserWarning: Ignoring `palette` because no `hue` variable has been assi
          func(x=x, y=y, **kwargs)
         /usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:1609: UserWarning: Ignoring `palette` because no
                                                                                                                     `hue
                                                                                                                           variable has been assi
          func(x=x, y=y, **kwargs)
         /usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:1609: UserWarning: Ignoring `palette` because no `hue` variable has been assi
          func(x=x, y=y, **kwargs)
         /usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:1609: UserWarning: Ignoring `palette` because no
                                                                                                                     `hue`
                                                                                                                           variable has been assi
          func(x=x, y=y, **kwargs)
         /usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:1609: UserWarning: Ignoring `palette` because no `hue` variable has been assi
          func(x=x, y=y, **kwargs)
         /usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:1609: UserWarning: Ignoring `palette` because no `hue` variable has been assi
          func(x=x, y=y, **kwargs)
         /usr/local/lib/python3.9/dist-packages/seaborn/axisgrid.py:1609: UserWarning: Ignoring `palette` because no `hue` variable has been assi
          func(x=x, y=y, **kwargs)
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