## **Analytics for Hospitals Health-Care Data TEAM ID: PNT2022TMID16292**

```
import os
for dirname, _, filenames in os.walk('input'):
    for filename in filenames:
        print(os.path.join(dirname, filename))
import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
from matplotlib.colors import ListedColormap
import seaborn as sns
from warnings import filterwarnings
filterwarnings('ignore')
pd.options.display.max columns = None
pd.options.display.max rows = None
pd.options.display.float format = '{:.6f}'.format
from sklearn.model selection import train test split
import statsmodels
import statsmodels.api as sm
from sklearn.preprocessing import StandardScaler
from sklearn import metrics
from sklearn.linear model import LogisticRegression
from sklearn.metrics import classification report
from sklearn.metrics import cohen kappa score
from sklearn.metrics import confusion matrix
from sklearn.metrics import roc curve
from sklearn.metrics import accuracy score
from sklearn.tree import DecisionTreeClassifier
from sklearn.ensemble import RandomForestClassifier
from sklearn import tree
from sklearn.model selection import GridSearchCV
from sklearn.ensemble import
AdaBoostClassifier,GradientBoostingClassifier
from catboost import CatBoostClassifier
from sklearn.feature selection import RFE
plt.rcParams['figure.figsize'] = [15,8]
train = pd.read csv("D:/HealthCare/train data.csv")
test = pd.read_csv("D:/HealthCare/test data.csv")
train.head()
   case_id Hospital_code Hospital_type_code City_Code_Hospital
0
         1
                        8
         2
                        2
                                                                5
1
                                            С
2
         3
                       10
                                                                1
                                            е
3
         4
                       26
                                            b
                                                                2
                                                                2
4
         5
                       26
                                            b
  Hospital_region_code    Available Extra Rooms in Hospital
Department \
                     Ζ
                                                         3
```

```
radiotherapy
                      Ζ
                                                            2
radiotherapy
                      Χ
                                                            2
anesthesia
                      Υ
                                                            2
radiotherapy
                      Υ
                                                            2
radiotherapy
  Ward_Type Ward_Facility_Code
                                  Bed Grade patientid
City Code Patient \
                               F
                                   2.000000
                                                   31397
7.000000
                               F
          S
                                   2.000000
                                                   31397
7.000000
          S
                               Ε
                                   2.000000
                                                   31397
7.000000
3
                               D
                                   2.000000
                                                   31397
          R
7.000000
          S
                               D
                                   2.000000
                                                   31397
7.000000
  Type of Admission Severity of Illness Visitors with Patient
                                                                       Age
                                                                     51-60
0
          Emergency
                                  Extreme
                                                                  2
1
              Trauma
                                  Extreme
                                                                     51-60
2
              Trauma
                                                                     51-60
                                  Extreme
3
              Trauma
                                  Extreme
                                                                  2
                                                                     51-60
                                                                     51-60
4
              Trauma
                                  Extreme
                                                                  2
   Admission_Deposit
                        Stay
         491\overline{1}.000000
0
                        0-10
         5954.000000
                       41-50
1
2
         4745.000000
                       31-40
3
         7272.000000
                       41-50
         5558.000000
                       41-50
print(train.shape)
print(test.shape)
(318438, 18)
(137057, 17)
train.dtypes
```

```
case id
                                        int64
Hospital code
                                        int64
Hospital_type_code
                                       object
City Code Hospital
                                        int64
Hospital region code
                                       obiect
Available Extra Rooms in Hospital
                                        int64
Department
                                       obiect
Ward Type
                                       object
Ward Facility Code
                                       object
Bed Grade
                                      float64
patientid
                                        int64
City_Code_Patient
                                      float64
Type of Admission
                                       object
Severity of Illness
                                       object
Visitors with Patient
                                        int64
                                       object
Admission Deposit
                                      float64
Stay
                                       object
dtype: object
train.nunique()
case id
                                      318438
Hospital code
                                          32
Hospital_type_code
                                           7
                                          11
City Code Hospital
Hospital region code
                                           3
Available Extra Rooms in Hospital
                                          18
Department
                                           5
                                           6
Ward Type
Ward Facility Code
                                           6
Bed Grade
                                           4
                                       92017
patientid
City Code Patient
                                          37
                                           3
Type of Admission
                                           3
Severity of Illness
Visitors with Patient
                                          28
                                          10
Admission Deposit
                                        7300
Stay
                                          11
dtype: int64
train.duplicated().sum()
0
train['Hospital code'] = train['Hospital code'].astype(object)
train['City Code Hospital'] =
train['City Code Hospital'].astype(object)
train['Available Extra Rooms in Hospital'] = train['Available Extra
Rooms in Hospital'].astype(object)
```

```
train['Bed Grade'] = train['Bed Grade'].astype(object)
train['City Code Patient'] = train['City Code Patient'].astype(object)
train.dtypes
case id
                                        int64
Hospital code
                                       object
Hospital type code
                                       object
City Code Hospital
                                       object
Hospital region code
                                       object
Available Extra Rooms in Hospital
                                       object
Department
                                       object
Ward Type
                                       object
Ward Facility Code
                                       object
Bed Grade
                                       object
patientid
                                        int64
City Code Patient
                                       object
Type of Admission
                                       object
Severity of Illness
                                       object
Visitors with Patient
                                        int64
Age
                                       object
Admission Deposit
                                      float64
                                       object
Stav
dtype: object
test['Hospital code'] = test['Hospital code'].astype(object)
test['City Code Hospital'] = test['City Code Hospital'].astype(object)
test['Available Extra Rooms in Hospital'] = Test['Available Extra
Rooms in Hospital'].astype(object)
test['Bed Grade'] = test['Bed Grade'].astype(object)
test['City Code Patient'] = test['City Code Patient'].astype(object)
test.dtypes
case id
                                        int64
Hospital code
                                       obiect
Hospital type code
                                       obiect
City_Code_Hospital
                                       object
Hospital region code
                                       object
Available Extra Rooms in Hospital
                                       object
Department
                                       object
Ward Type
                                       object
Ward Facility Code
                                       object
Bed Grade
                                       object
patientid
                                        int64
City Code Patient
                                       object
Type of Admission
                                       object
Severity of Illness
                                       object
Visitors with Patient
                                        int64
Age
                                       object
```

```
Admission_Deposit
dtype: object

train.drop(['case_id', 'patientid'], axis=1, inplace=True)

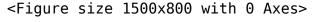
test.drop(['case_id', 'patientid'], axis=1, inplace=True)

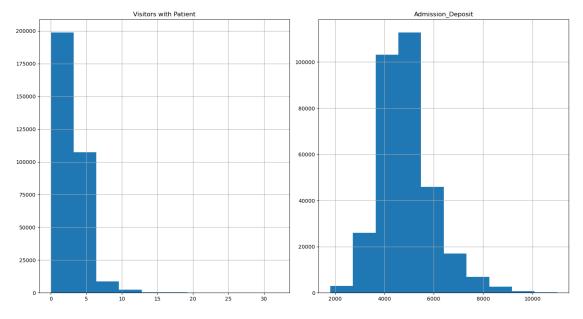
train['Stay'] .replace ('More than 100 Days', '100+', inplace=True)

plt.figure(figsize=(15,8))

train.drop('Stay', axis = 1).hist()
plt.tight_layout()
plt.show()

print('Skewness:')
train.drop('Stay', axis = 1).skew()
```

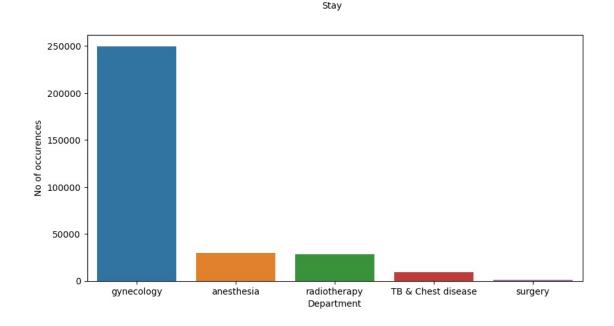




## Skewness:

```
Hospital_code -0.280783
City_Code_Hospital 0.538809
Available Extra Rooms in Hospital 0.971930
Bed Grade 0.051754
City_Code_Patient 1.581736
Visitors with Patient 3.137125
Admission_Deposit 0.931454
dtype: float64
```

train['Stay'] .replace('More than 100 Days', '>100', inplace=True)



20000

21-30

11-20

31-40

51-60

0-10

41-50

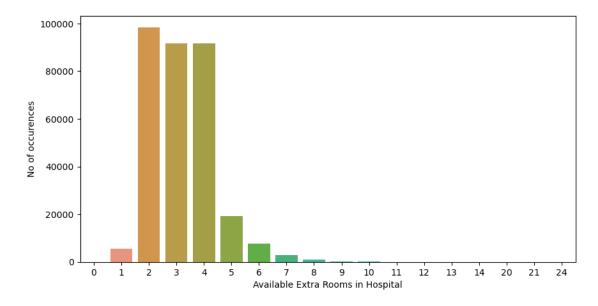
71-80

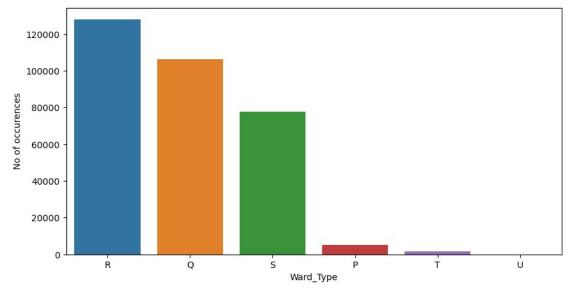
100+

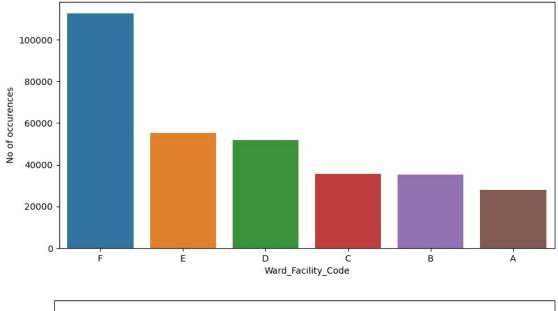
81-90

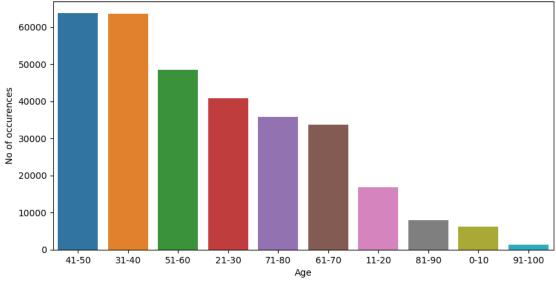
91-100

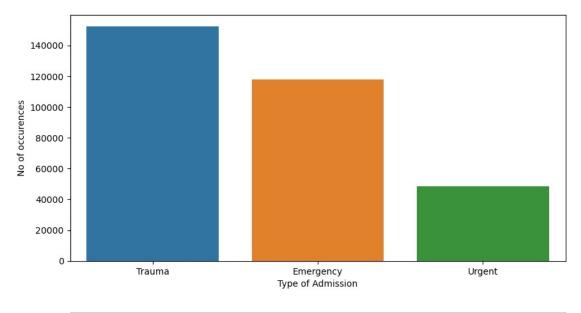
61-70

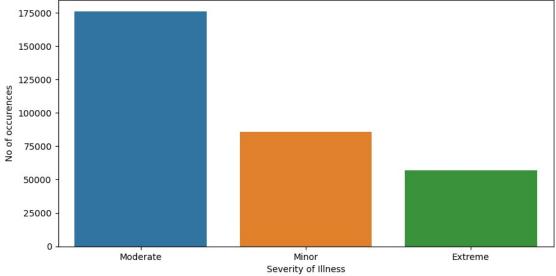


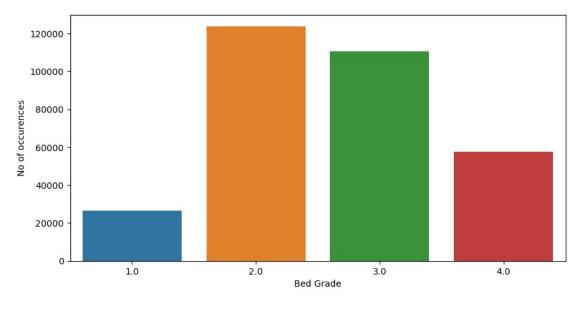


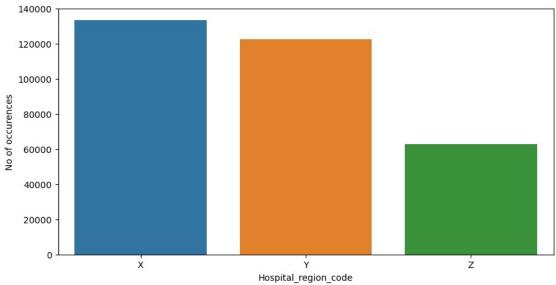


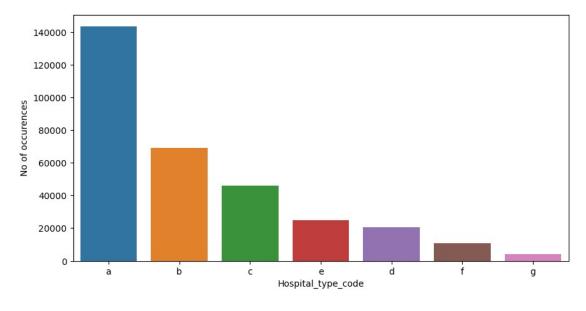


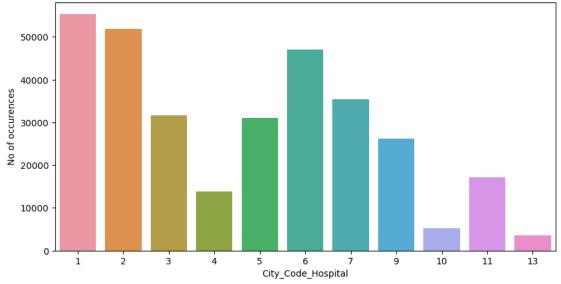


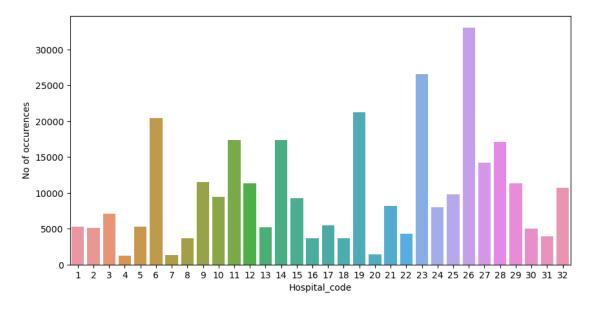


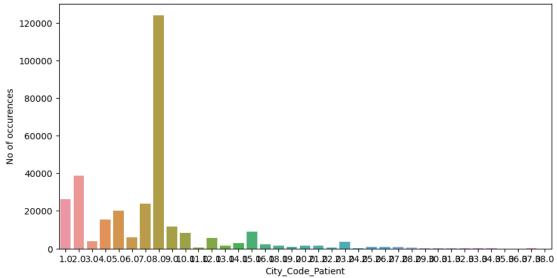


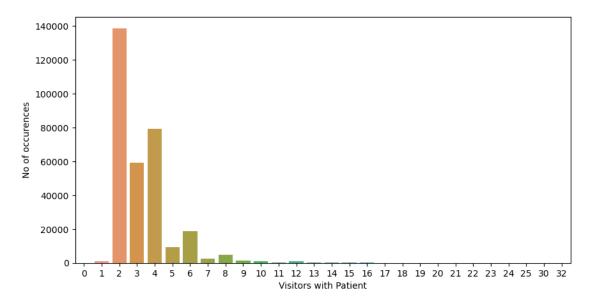






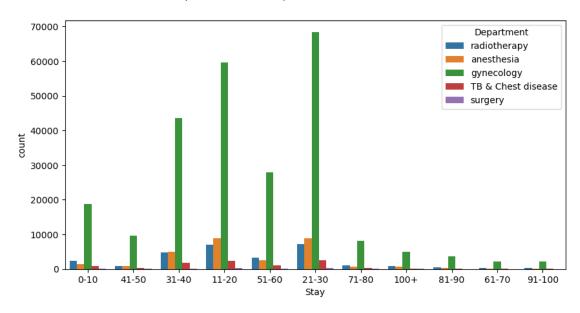


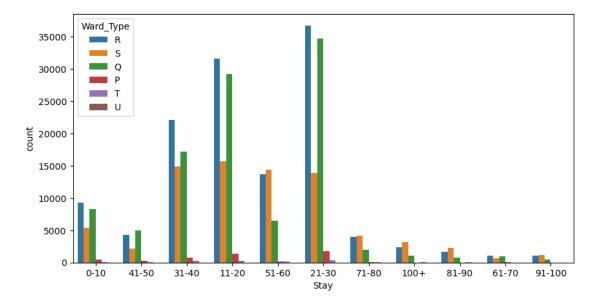


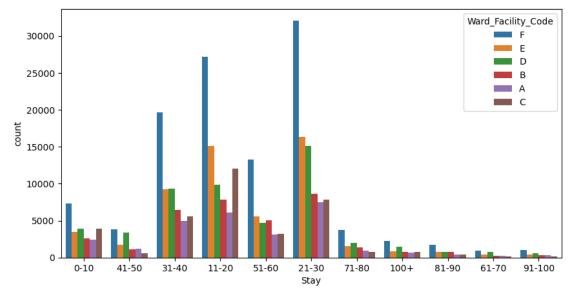


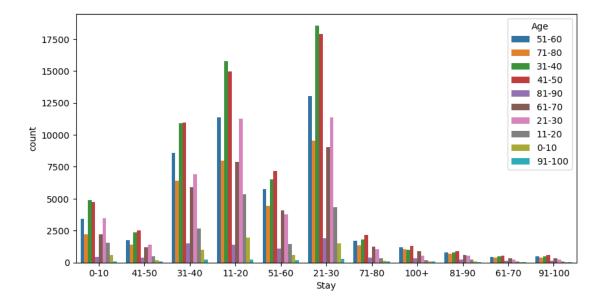
plt.figure(figsize=(10,5))

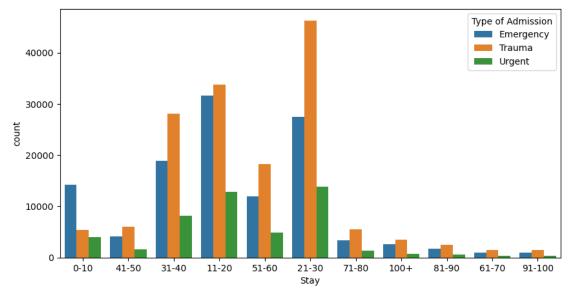
sns.countplot(x='Stay',hue=i,data=train)

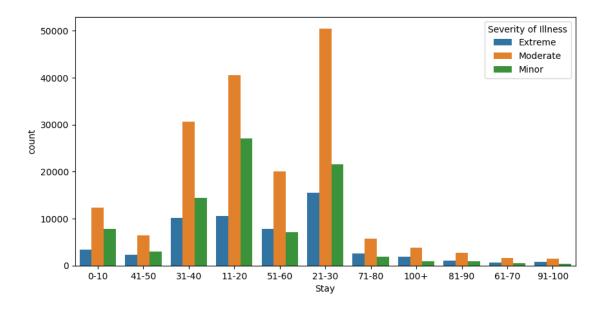


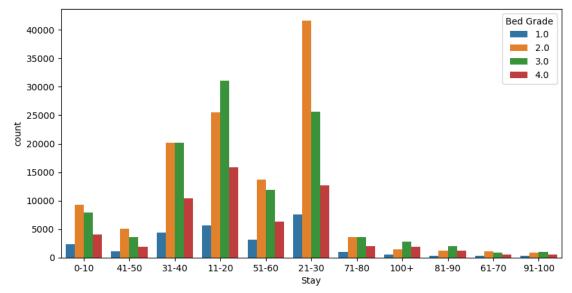


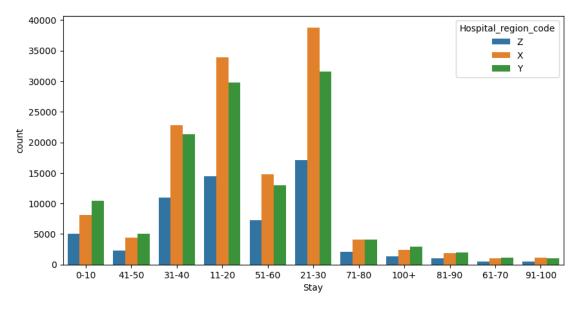


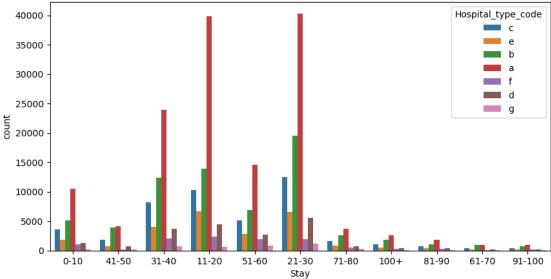




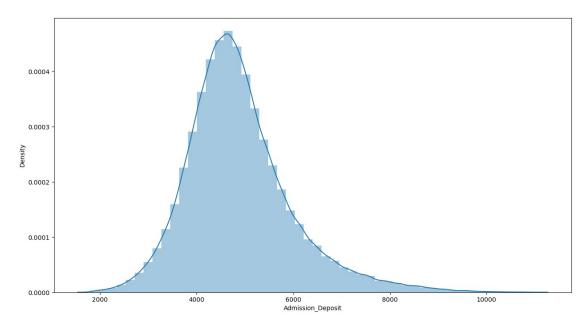








sns.distplot( train['Admission\_Deposit'])
<AxesSubplot:xlabel='Admission\_Deposit', ylabel='Density'>



Total = train.isnull().sum().sort\_values(ascending=False)

Percent =
(train.isnull().sum()\*100/train.isnull().count()).sort\_values(ascendin
g=False)

missing\_data = pd.concat([Total, Percent], axis = 1, keys = ['Total',
'Percentage of Missing Values'])
missing data

	Total	Percentage of Missing Values
City_Code_Patient	4532	1.423197
Bed Grade	113	0.035486
Hospital_code	0	0.000000
Hospital_type_code	0	0.000000
City_Code_Hospital	0	0.000000
Hospital_region_code	0	0.000000
Available Extra Rooms in Hospital	0	0.000000
Department	0	0.000000
Ward_Type	0	0.000000
Ward_Facility_Code	0	0.000000
Type of Admission	0	0.000000
Severity of Illness	0	0.000000
Visitors with Patient	0	0.000000
Age	0	0.000000
Admission_Deposit	0	0.000000
Stay	0	0.000000

Total = train.isnull().sum().sort\_values(ascending=False)

```
Percent =
(train.isnull().sum()*100/train.isnull().count()).sort_values(ascendin)
```

```
q=False)
missing_data = pd.concat([Total, Percent], axis = 1, keys = ['Total',
'Percentage of Missing Values'])
missing data
                                    Total
                                           Percentage of Missing Values
City Code Patient
                                     4532
                                                                1.423197
Bed Grade
                                      113
                                                                0.035486
Hospital code
                                        0
                                                                0.000000
Hospital type code
                                        0
                                                                0.000000
City Code Hospital
                                        0
                                                                0.000000
Hospital region code
                                        0
                                                                0.000000
Available Extra Rooms in Hospital
                                        0
                                                                0.000000
Department
                                        0
                                                                0.000000
Ward_Type
                                        0
                                                                0.000000
Ward Facility Code
                                        0
                                                                0.000000
Type of Admission
                                        0
                                                                0.000000
Severity of Illness
                                        0
                                                                0.000000
Visitors with Patient
                                        0
                                                                0.000000
                                        0
                                                                0.000000
Admission Deposit
                                        0
                                                                0.000000
                                        0
                                                                0.000000
Stay
Total = test.isnull().sum().sort values(ascending=False)
Percent =
(test.isnull().sum()*100/test.isnull().count()).sort values(ascending=
False)
missing data = pd.concat([Total, Percent], axis = 1, keys = ['Total',
'Percentage of Missing Values'])
missing data
                                           Percentage of Missing Values
                                    Total
City_Code_Patient
                                     2157
                                                                1.573798
Bed Grade
                                       35
                                                                0.025537
Hospital code
                                        0
                                                                0.000000
Hospital type code
                                        0
                                                                0.000000
City Code Hospital
                                        0
                                                                0.000000
Hospital region code
                                        0
                                                                0.000000
Available Extra Rooms in Hospital
                                        0
                                                                0.000000
Department
                                        0
                                                                0.000000
Ward Type
                                        0
                                                                0.000000
Ward_Facility_Code
                                        0
                                                                0.000000
Type of Admission
                                        0
                                                                0.000000
                                        0
Severity of Illness
                                                                0.000000
Visitors with Patient
                                        0
                                                                0.000000
                                        0
                                                                0.000000
                                                                0.000000
Admission Deposit
                                        0
```

```
train.dropna(subset = ['Bed Grade', 'City Code Patient'], inplace =
True)
test['Bed Grade'] = test['Bed Grade'].fillna(test['Bed Grade'].mode()
[0], inplace = True)
test['City Code Patient'] =
test['City_Code_Patient'].fillna(test['City_Code_Patient'].mode()[0],
inplace = True)
df num train = train.select dtypes([np.number])
df_num_train.head()
   Visitors with Patient Admission Deposit
0
                        2
                                 4911.000000
                        2
1
                                 5954.000000
                        2
2
                                 4745.000000
                        2
3
                                 7272.000000
                        2
4
                                 5558.000000
df cat train = train.select dtypes([np.object])
df cat train.head()
  Hospital_code Hospital_type_code City_Code_Hospital
Hospital_region_code \
              8
                                                      3
                                  С
Ζ
1
              2
                                                      5
                                  С
Ζ
2
             10
                                                      1
                                  е
Χ
3
                                                      2
             26
                                  b
Υ
4
                                                      2
             26
                                  b
Υ
  Available Extra Rooms in Hospital
                                         Department Ward Type
0
                                      radiotherapy
                                                             R
                                   2
                                                             S
1
                                       radiotherapy
                                                             S
2
                                    2
                                         anesthesia
3
                                                             R
                                    2
                                       radiotherapy
4
                                                             S
                                    2
                                       radiotherapy
  Ward Facility Code Bed Grade City Code Patient Type of Admission \
0
                                          7.000000
                       2.000000
                                                            Emergency
                    F
1
                       2.000000
                                          7.000000
                                                               Trauma
2
                    Ε
                       2.000000
                                          7.000000
                                                               Trauma
3
                       2.000000
                                                               Trauma
                    D
                                          7.000000
4
                       2.000000
                                          7.000000
                                                               Trauma
  Severity of Illness
                          Age
                                Stay
              Extreme
                        51-60
                                0 - 10
```

```
2
               Extreme 51-60
                                31-40
3
                        51-60
               Extreme
                               41-50
4
               Extreme
                        51-60
                               41-50
df num test = test.select dtypes([np.number])
df_num_test.head()
   Visitors with Patient
                           Admission_Deposit
0
                        2
                                  3095.000000
                        4
                                  4018.000000
1
2
                        3
                                  4492.000000
3
                        3
                                  4173.000000
4
                        4
                                  4161.000000
df_cat_test = test.select_dtypes([np.object])
df_cat_test.head()
  Hospital code Hospital type code City Code Hospital
Hospital region code \
             21
                                                       3
0
                                   С
Ζ
1
             29
                                                       4
                                   а
Χ
2
                                                       2
             26
                                   b
Υ
3
X
                                                       6
              6
                                   а
4
             28
                                   b
                                                      11
Χ
  Available Extra Rooms in Hospital
                                       Department Ward_Type
Ward_Facility_Code \
                                    3
                                                           S
                                       gynecology
Α
1
                                    2
                                       gynecology
                                                           S
F
2
                                    3
                                       gynecology
                                                           Q
D
3
                                    3
                                       gynecology
                                                           Q
F
4
                                    2
                                       gynecology
                                                           R
  Bed Grade City Code Patient Type of Admission Severity of Illness
Age
                          None
                                        Emergency
                                                              Moderate
0
       None
71-80
                          None
                                           Trauma
                                                              Moderate
       None
71-80
                                        Emergency
                                                              Moderate
2
       None
                          None
```

41-50

Extreme 51-60

```
71-80
                                         Trauma
                                                            Moderate
       None
                         None
3
71-80
                         None
                                         Trauma
                                                            Moderate
4
       None
71-80
admission_encode = {'Trauma': 1, 'Urgent': 2, 'Emergency' : 3 }
severity encode = {'Minor': 1, 'Moderate': 2, 'Extreme': 3 }
df cat train['Type of Admission'] = df cat train['Type of
Admission'].map (admission encode)
df cat train['Severity of \overline{Illness'}] = df cat train['Severity of
Illness'].map (severity encode)
df cat test['Type of Admission'] = df cat test['Type of
Admission'].map (admission encode)
df cat test['Severity of Illness'] = df cat test['Severity of
Illness'].map (severity encode)
df_cat_train['Stay'] = df_cat_train['Stay'].replace({'0-10':1, '11-
20':2, '21-30':3, '31-40':4, '41-50':5, '51-60':6, '61-70':7,
                                       '71-80':8, '81-90':9, '91-
100':10,'100+':11})
df cat train['Age'] = df cat train['Age'].replace({'0-10':1, '11-20':2,
'21-30':3, '31-40':4, '41-50':5, '51-60':6, '61-70':7,
                                       '71-80':8, '81-90':9, '91-
100':10})
df cat test['Age'] = df cat test['Age'].replace({'0-10':1, '11-20':2,
'21-30':3, '31-40':4, '41-50':5, '51-60':6,'61-70':7,
                                       '71-80':8, '81-90':9, '91-
100':10})
df cat train['Stay']=df cat train['Stay'].astype(int)
from sklearn.preprocessing import LabelEncoder
LE=LabelEncoder()
df cat train['Hospital code']=LE.fit transform(df cat train['Hospital
code'l)
df cat train['Hospital type code']=LE.fit transform(df cat train['Hosp
ital type code'l)
df cat train['City Code Hospital']=LE.fit transform(df cat train['City
Code Hospital'])
df cat train['Hospital region code']=LE.fit transform(df cat train['Ho
spital region code'])
df cat train['Department']=LE.fit transform(df cat train['Department']
```

```
df cat train['Ward Type']=LE.fit transform(df cat train['Ward Type'])
df cat train['Ward Facility Code']=LE.fit transform(df cat train['Ward
Facility Code'])
df cat train['City Code Patient']=LE.fit transform(df cat train['City
Code Patient'])
df cat train['Bed Grade']=LE.fit transform(df cat train['Bed Grade'])
df cat train.head()
   Hospital code
                  Hospital_type_code City Code Hospital
0
                                     2
1
               1
                                                          4
                                                          0
2
               9
                                     4
3
                                     1
              25
                                                          1
4
              25
                                     1
                                                          1
   Hospital region code Available Extra Rooms in Hospital
                                                             Department
0
                       2
                                                           3
                                                                        3
                       2
                                                           2
                                                                        3
1
2
                       0
                                                           2
                                                                        1
3
                                                           2
                                                                        3
                       1
4
                       1
                                                           2
                                                                        3
              Ward Facility Code
                                   Bed Grade City Code Patient
   Ward Type
0
           2
           3
                                5
                                                                6
1
                                            1
           3
2
                                4
                                                                6
                                            1
           2
3
                                 3
                                            1
                                                                6
           3
                                 3
4
                                            1
                                                                6
   Type of Admission
                       Severity of Illness
                                             Age
                                                  Stay
0
                    3
                                          3
                                               6
                                                      1
                                          3
                    1
                                                      5
1
                                               6
                                          3
2
                    1
                                               6
                                                      4
3
                                          3
                                                      5
                    1
                                               6
                                                      5
from sklearn.preprocessing import LabelEncoder
LE=LabelEncoder()
df cat test['Hospital code']=LE.fit transform(df cat test['Hospital co
df cat test['Hospital type code']=LE.fit transform(df cat test['Hospit
al_type_code'])
```

```
df cat test['City Code Hospital']=LE.fit transform(df cat test['City C
ode Hospital'])
df cat test['Hospital region code']=LE.fit transform(df cat test['Hosp
ital region code'])
df cat test['Department']=LE.fit transform(df cat test['Department'])
df_cat_test['Ward_Type']=LE.fit_transform(df_cat_test['Ward_Type'])
df cat test['Ward Facility Code']=LE.fit transform(df cat test['Ward F
acility Code'])
df cat test['City Code Patient']=LE.fit transform(df cat test['City Co
de Patient'])
df cat test['Bed Grade']=LE.fit transform(df cat test['Bed Grade'])
df cat test.head()
                   Hospital_type_code City_Code_Hospital
   Hospital code
0
               20
                                                          3
1
               28
                                     0
2
               25
                                     1
                                                          1
                                                          5
3
               5
                                     0
4
               27
                                                          9
                                     1
   Hospital region code Available Extra Rooms in Hospital
                                                              Department
                                                                        2
0
                       2
                                                           3
                                                                        2
1
                       0
                                                           2
2
                                                           3
                                                                        2
                       1
3
                                                                        2
                       0
                                                           3
                       0
                                                           2
                                                                        2
4
              Ward Facility Code
   Ward Type
                                    Bed Grade City Code Patient
0
           3
           3
                                 5
1
                                            0
                                                                 0
                                 3
2
           1
                                            0
                                                                 0
3
           1
                                 5
                                            0
                                                                 0
4
           2
                                 5
                                            0
                                                                 0
   Type of Admission
                       Severity of Illness
                                             Age
0
                    3
                                          2
                                               8
                                          2
1
                    1
                                               8
2
                    3
                                          2
                                               8
                                          2
                                               8
3
                    1
4
                    1
                                               8
```

from sklearn.preprocessing import StandardScaler
sc = StandardScaler()

```
num_scaled = sc.fit_transform(df_num_train)
df num scaled = pd.DataFrame(num scaled, columns =
df num train.columns)
num_scaled_test = sc.fit_transform(df_num_test)
df num scaled test = pd.DataFrame(num scaled test, columns =
df num test.columns)
df num scaled.shape
(313793, 2)
df cat train = df cat train.reset index(drop=True)
df num scaled = df num scaled.reset index(drop=True)
df cat test = df cat test.reset index(drop=True)
df num scaled test = df num scaled test.reset index(drop=True)
df cat train.shape
(313793, 14)
df full = pd.concat([df num scaled, df cat train],axis=1)
df full test =
                pd.concat([df num scaled test, df cat test],axis=1)
df full.shape
(313793, 16)
df full.head()
   Visitors with Patient
                          Admission Deposit
                                              Hospital_code
0
               -0.727035
                                    0.026796
1
               -0.727035
                                    0.986987
                                                           1
2
               -0.727035
                                   -0.126025
                                                           9
3
               -0.727035
                                                          25
                                    2.200344
4
               -0.727035
                                    0.622427
                                                          25
  Hospital type code City Code Hospital
                                            Hospital region code
0
                    2
                                         2
                                                                2
1
                    2
                                         4
                                                                2
2
                                         0
                    4
                                                                0
3
                    1
                                         1
                                                                1
4
                    1
                                         1
                                                                1
                                      Department
  Available Extra Rooms in Hospital
                                                   Ward Type
0
                                                3
                                                           2
                                   2
1
                                                3
                                                           3
2
                                                           3
                                   2
                                                1
```

3 4			2	3 3	2	
`	Ward_Facility_Code	Bed Grade	City_Code_	_Patient	Type of	Admission
0	5	1		6		3
1	5	1		6		1
2	4	1		6		1
3	3	1		6		1
4	3	1		6		1

	Severity	of	Illness	Age	Stay
0	_		3	6	1
1			3	6	5
2			3	6	4
3			3	6	5
4			3	6	5

sns.heatmap(df\_full.corr(), annot = True)

## <AxesSubplot:>



```
X = df full.drop('Stay',axis=1)
y = df_full['Stay']
X = sm.add constant(X)
X_train, X_test, y_train, y_test = train_test_split(X, y, random_state
= 10, test size = 0.3)
print('X_train', X_train.shape)
print('y train', y train.shape)
print('X test', X test.shape)
print('y_test', y_test.shape)
X train (219655, 16)
y train (219655,)
X test (94138, 16)
y_test (94138,)
from sklearn.model_selection import KFold,cross_val_score
kfold=KFold(n splits=10, shuffle=True, random state=10)
LR = LogisticRegression()
LR.fit(X train,y train)
y_pred_LR=LR.predict(X test)
accuracy_score(y_test,y_pred_LR)*100
37.94217000573626
print(classification_report(y_test,y_pred_LR))
              precision
                            recall f1-score
                                                support
                              0.02
                                        0.03
           1
                   0.48
                                                   6901
           2
                   0.37
                              0.45
                                        0.41
                                                  23205
           3
                   0.40
                              0.64
                                        0.49
                                                  25792
           4
                   0.32
                              0.19
                                        0.24
                                                  16289
           5
                   0.00
                              0.00
                                        0.00
                                                   3439
           6
                   0.37
                              0.46
                                        0.41
                                                  10470
           7
                              0.00
                                        0.00
                   0.00
                                                    822
           8
                   0.00
                              0.00
                                        0.00
                                                   3093
           9
                   0.11
                              0.00
                                        0.01
                                                   1412
          10
                   0.00
                              0.00
                                        0.00
                                                   782
          11
                   0.49
                              0.32
                                        0.39
                                                   1933
                                        0.38
                                                  94138
    accuracy
                                        0.18
   macro avg
                   0.23
                              0.19
                                                  94138
```

weighted avg

0.34

0.38

0.33

```
decision tree classification = DecisionTreeClassifier(criterion =
'entropy', random_state = 10)
decision tree = decision tree classification.fit(X train, y train)
y pred DT=decision tree.predict(X test)
accuracy score(y test,y pred DT)*100
29.678769466102956
print(classification report(y test,y pred DT))
                            recall f1-score
              precision
                                                support
                              0.19
           1
                    0.19
                                        0.19
                                                   6901
           2
                    0.34
                              0.34
                                        0.34
                                                  23205
           3
                    0.39
                              0.38
                                        0.38
                                                  25792
           4
                    0.25
                              0.25
                                        0.25
                                                  16289
           5
                   0.06
                              0.07
                                        0.07
                                                   3439
           6
                   0.31
                              0.30
                                        0.31
                                                  10470
           7
                   0.03
                              0.04
                                        0.03
                                                    822
           8
                   0.15
                              0.15
                                        0.15
                                                   3093
           9
                    0.22
                              0.23
                                        0.22
                                                   1412
          10
                   0.08
                              0.10
                                        0.09
                                                    782
          11
                   0.32
                              0.35
                                        0.33
                                                   1933
                                        0.30
                                                  94138
    accuracy
   macro avg
                   0.21
                              0.22
                                        0.21
                                                  94138
                   0.30
                              0.30
                                        0.30
                                                  94138
weighted avg
dt tuned = DecisionTreeClassifier(criterion = 'gini', max_depth=11,
random state = 10)
decision_tree_tuned = dt_tuned.fit(X_train, y_train)
y pred DT tuned = decision tree tuned.predict(X test)
accuracy score(y test,y pred DT tuned)*100
40.82198474579872
print(classification report(y test,y pred DT tuned))
              precision
                            recall f1-score
                                                support
           1
                    0.36
                              0.13
                                        0.19
                                                   6901
           2
                    0.41
                              0.46
                                        0.44
                                                  23205
           3
                    0.41
                              0.67
                                        0.51
                                                  25792
           4
                    0.39
                              0.23
                                        0.29
                                                  16289
           5
                   0.07
                              0.00
                                        0.00
                                                   3439
           6
                   0.41
                                                  10470
                              0.45
                                        0.43
```

7

0.00

0.00

0.00

```
8
                   0.27
                              0.03
                                        0.05
                                                   3093
           9
                   0.35
                              0.21
                                        0.27
                                                   1412
                                        0.05
          10
                   0.20
                              0.03
                                                   782
          11
                   0.52
                              0.36
                                        0.43
                                                   1933
                                        0.41
                                                 94138
    accuracy
                   0.31
                              0.23
                                        0.24
                                                 94138
   macro avg
weighted avg
                   0.38
                              0.41
                                        0.37
                                                 94138
rf classification = RandomForestClassifier(random state = 10)
rf model = rf classification.fit(X train, y train)
y pred RF = rf model.predict(X test)
accuracy_score(y_test,y_pred RF)*100
38.315026875438186
print(classification report(y test,y pred RF))
              precision
                            recall f1-score
                                               support
                              0.19
                                        0.23
           1
                   0.30
                                                   6901
           2
                   0.39
                              0.44
                                        0.42
                                                 23205
           3
                   0.41
                              0.54
                                        0.47
                                                 25792
           4
                   0.33
                              0.27
                                        0.29
                                                 16289
           5
                   0.09
                              0.02
                                        0.04
                                                   3439
           6
                   0.40
                              0.44
                                        0.42
                                                 10470
           7
                   0.10
                              0.02
                                        0.03
                                                   822
           8
                   0.28
                              0.10
                                        0.15
                                                   3093
           9
                   0.37
                              0.22
                                        0.28
                                                   1412
                   0.24
                              0.06
                                        0.09
          10
                                                   782
          11
                   0.52
                              0.44
                                        0.48
                                                   1933
                                        0.38
                                                 94138
    accuracy
                   0.31
                              0.25
                                        0.26
                                                 94138
   macro avg
weighted avg
                   0.36
                              0.38
                                        0.37
                                                 94138
rf classification tuned = RandomForestClassifier(criterion = 'gini',
n estimators = 47, random state = 10)
rf model tuned = rf classification tuned.fit(X train, y train)
y pred RF tuned = rf model tuned.predict(X test)
accuracy_score(y_test,y_pred_RF_tuned)*100
37.94323227602031
print(classification report(y test,y pred RF tuned))
```

```
recall f1-score
              precision
                                                support
           1
                    0.29
                              0.19
                                         0.23
                                                   6901
           2
                    0.38
                              0.44
                                         0.41
                                                  23205
           3
                    0.41
                              0.53
                                         0.46
                                                  25792
           4
                    0.32
                              0.27
                                         0.30
                                                  16289
           5
                    0.09
                              0.02
                                         0.04
                                                   3439
           6
                    0.39
                                                  10470
                              0.43
                                         0.41
           7
                    0.10
                              0.02
                                         0.03
                                                    822
           8
                    0.28
                              0.11
                                         0.15
                                                   3093
           9
                    0.36
                              0.22
                                         0.27
                                                   1412
                    0.22
                                                    782
          10
                              0.05
                                         0.08
          11
                    0.52
                              0.43
                                        0.47
                                                   1933
                                         0.38
                                                  94138
    accuracy
                    0.31
                              0.25
                                         0.26
                                                  94138
   macro avq
weighted avg
                    0.36
                              0.38
                                         0.36
                                                  94138
dt tuned = DecisionTreeClassifier(criterion = 'gini', max depth=11,
random state = 10)
ada model DT = AdaBoostClassifier(base estimator=dt tuned,
random state = 10)
ada model DT.fit(X train, y train)
AdaBoostClassifier(base estimator=DecisionTreeClassifier(max depth=11,
random state=10),
                    random state=10)
y pred ada model DT = ada model DT.predict(X test)
accuracy score(y test,y pred ada model DT)*100
29.91990482058255
print(classification_report(y_test,y_pred_ada_model_DT))
                                    f1-score
              precision
                            recall
                                                support
           1
                    0.19
                              0.16
                                         0.17
                                                   6901
           2
                    0.33
                              0.34
                                         0.33
                                                  23205
           3
                    0.38
                              0.39
                                         0.39
                                                  25792
           4
                    0.22
                              0.27
                                         0.24
                                                  16289
           5
                    0.06
                              0.04
                                         0.05
                                                   3439
           6
                    0.31
                              0.36
                                         0.33
                                                  10470
           7
                    0.00
                              0.00
                                        0.00
                                                    822
           8
                    0.14
                              0.10
                                        0.11
                                                   3093
           9
                    0.22
                              0.10
                                         0.13
                                                   1412
                    0.10
                                                    782
          10
                              0.01
                                         0.02
```

11

0.45

0.20

0.27

```
0.30
                                                94138
    accuracy
                                       0.19
                                                94138
                   0.22
                             0.18
   macro avq
                   0.29
                             0.30
                                       0.29
                                                94138
weighted avg
ada model DT tuned = AdaBoostClassifier(base estimator=dt tuned,
n = 1, random state = 10
ada model DT tuned.fit(X train, y train)
AdaBoostClassifier(base estimator=DecisionTreeClassifier(max depth=11,
random state=10),
                   n estimators=1, random state=10)
y pred ada model DT tuned = ada model DT.predict(X test)
accuracy score(y test,y pred ada model DT tuned)*100
29.91990482058255
print(classification report(y test,y pred ada model DT tuned))
                           recall f1-score
              precision
                                              support
           1
                   0.19
                             0.16
                                       0.17
                                                 6901
           2
                                       0.33
                   0.33
                             0.34
                                                23205
           3
                   0.38
                             0.39
                                       0.39
                                                25792
                   0.22
                             0.27
                                       0.24
           4
                                                16289
           5
                   0.06
                             0.04
                                       0.05
                                                 3439
           6
                   0.31
                                       0.33
                             0.36
                                                10470
           7
                   0.00
                             0.00
                                       0.00
                                                  822
           8
                   0.14
                             0.10
                                       0.11
                                                 3093
           9
                   0.22
                             0.10
                                       0.13
                                                 1412
          10
                   0.10
                             0.01
                                       0.02
                                                  782
                                       0.27
                                                 1933
          11
                   0.45
                             0.20
                                                94138
                                       0.30
    accuracy
                   0.22
                             0.18
                                       0.19
                                                94138
   macro avg
weighted avg
                   0.29
                             0.30
                                       0.29
                                                94138
rf classification tuned = RandomForestClassifier(criterion = 'gini',
n = 47, random state = 10)
ada model rf =
AdaBoostClassifier(base estimator=rf classification tuned,
n estimators=1, random state = 10)
ada model rf.fit(X train, y train)
```

```
AdaBoostClassifier(base estimator=RandomForestClassifier(n estimators=
47,
random state=10),
                   n estimators=1, random state=10)
y pred ada model RF = ada model rf.predict(X test)
accuracy score(y test,y pred ada model RF)*100
38.081327412946955
print(classification report(y test,y pred ada model RF))
                           recall
              precision
                                   f1-score
                                               support
                             0.20
           1
                   0.29
                                       0.23
                                                  6901
           2
                   0.39
                             0.44
                                        0.41
                                                 23205
           3
                             0.53
                   0.41
                                       0.46
                                                 25792
           4
                   0.32
                             0.27
                                       0.30
                                                 16289
           5
                   0.10
                             0.03
                                       0.04
                                                  3439
           6
                             0.43
                                       0.41
                                                 10470
                   0.40
           7
                   0.12
                             0.02
                                       0.03
                                                   822
           8
                   0.26
                             0.10
                                       0.15
                                                  3093
           9
                   0.39
                             0.24
                                       0.29
                                                  1412
          10
                   0.23
                             0.05
                                       0.09
                                                  782
          11
                   0.51
                             0.44
                                       0.47
                                                  1933
                                       0.38
                                                 94138
    accuracy
                                       0.26
                                                 94138
                   0.31
                             0.25
   macro avg
                   0.36
                                       0.36
                                                 94138
weighted avg
                             0.38
ada model rf tuned =
AdaBoostClassifier(base estimator=rf classification tuned,
n = 4, random state = 10)
ada model rf tuned.fit(X train, y train)
AdaBoostClassifier(base estimator=RandomForestClassifier(n estimators=
47,
random state=10),
                   n estimators=4, random state=10)
from sklearn.ensemble import GradientBoostingClassifier
GB=GradientBoostingClassifier(random state=10)
GB.fit(X_train, y_train)
GradientBoostingClassifier(random state=10)
y pred GB = GB.predict(X test)
accuracy_score(y_test,y_pred_GB)*100
```

41.5475153498056

print(classification\_report(y\_test,y\_pred\_GB))

	precision	recall	f1-score	support
1	0.41	0.12	0.19	6901
2	0.42	0.51	0.46	23205
3	0.42	0.66	0.52	25792
4	0.41	0.17	0.24	16289
5	0.14	0.00	0.00	3439
6	0.39	0.53	0.45	10470
7	0.00	0.00	0.00	822
8	0.30	0.01	0.02	3093
9	0.31	0.20	0.24	1412
10	0.17	0.01	0.01	782
11	0.52	0.40	0.45	1933
accuracy macro avg weighted avg	0.32 0.39	0.24 0.42	0.42 0.23 0.37	94138 94138 94138

GB\_tuned=GradientBoostingClassifier(n\_estimators=29, random\_state=10)
GB\_tuned.fit(X\_train, y\_train)

 $Gradient Boosting Classifier (n\_estimators = 29, random\_state = 10)$ 

from sklearn.naive\_bayes import GaussianNB
NB = GaussianNB()
NB.fit(X train,y train)

GaussianNB()

y\_pred\_NB = NB.predict(X\_test)
accuracy\_score(y\_test,y\_pred\_NB)\*100

36.37850814761308

print(classification\_report(y\_test,y\_pred\_NB))

	precision	recall	f1-score	support
1	0.30 0.36	0.09 0.41	0.14 0.39	6901 23205
3	0.39	0.41	0.39	25792
4	0.32	0.15	0.21	16289
5	0.08	0.01	0.01	3439
6	0.33	0.38	0.36	10470
7	0.04	0.00	0.00	822
8	0.10	0.01	0.02	3093
9	0.12	0.02	0.04	1412

10 11	0.50 0.42	0.00 0.37	0.00 0.39	782 1933
accuracy macro avg	0.27	0.19	0.36 0.18	94138 94138
weighted avg	0.33	0.36	0.32	94138

from sklearn.neighbors import KNeighborsClassifier

knn=KNeighborsClassifier(n\_neighbors=565,weights='distance')
knn.fit(X\_train,y\_train)

KNeighborsClassifier(n\_neighbors=565, weights='distance')

y\_pred\_KNN = NB.predict(X\_test)
accuracy\_score(y\_test,y\_pred\_KNN)\*100

36.37850814761308

print(classification\_report(y\_test,y\_pred\_NB))

	precision	recall	f1-score	support
1	0.30	0.09	0.14	6901
2	0.36	0.41	0.39	23205
3	0.39	0.65	0.49	25792
4	0.32	0.15	0.21	16289
5	0.08	0.01	0.01	3439
6	0.33	0.38	0.36	10470
7	0.04	0.00	0.00	822
8	0.10	0.01	0.02	3093
9	0.12	0.02	0.04	1412
10	0.50	0.00	0.00	782
11	0.42	0.37	0.39	1933
accuracy			0.36	94138
macro avg	0.27	0.19	0.18	94138
weighted avg	0.33	0.36	0.32	94138

from catboost import CatBoostClassifier

```
cb =
CatBoostClassifier(random_state=10,use_best_model=True,iterations=1000)
cb.fit(X_train,y_train,use_best_model=True,verbose=100,eval_set=(X_test,y_test))
Learning rate set to 0.120271
```

0: learn: 2.1972797 test: 2.1978440 best: 2.1978440 (0) total:

```
532ms remaining: 8m 50s
100: learn: 1.5115382 test: 1.5242638 best: 1.5242638 (100) total:
37.5s remaining: 5m 34s
200: learn: 1.4818453 test: 1.5070444 best: 1.5070444 (200) total: 1m
     remaining: 5m 9s
300: learn: 1.4638516 test: 1.5016071 best: 1.5016071 (300) total: 1m
57s
     remaining: 4m 32s
400: learn: 1.4484799 test: 1.4983697 best: 1.4983697 (400) total: 2m
35s remaining: 3m 52s
500: learn: 1.4345747 test: 1.4970449 best: 1.4970449 (500) total: 3m
14s remaining: 3m 13s
600: learn: 1.4237650 test: 1.4965192 best: 1.4964737 (579) total: 3m
     remaining: 2m 37s
56s
700: learn: 1.4123374 test: 1.4963260 best: 1.4961744 (652) total: 4m
34s
     remaining: 1m 57s
800: learn: 1.4018164 test: 1.4964416 best: 1.4961744 (652) total: 5m
13s remaining: 1m 17s
900: learn: 1.3915056 test: 1.4967396 best: 1.4961744 (652) total: 5m
52s remaining: 38.8s
999: learn: 1.3815565 test: 1.4971529 best: 1.4961744 (652) total: 6m
37s
     remaining: Ous
bestTest = 1.496174357
bestIteration = 652
```

Shrink model to first 653 iterations.

<catboost.core.CatBoostClassifier at 0x1f1be732bb0>

cb pred = cb.predict(X\_test) accuracy\_score(y\_test,cb\_pred)\*100

## 42.54180033567741

print(classification\_report(y\_test,cb\_pred))

	precision	recall	f1-score	support
1	0.41	0.16	0.23	6901
2	0.43	0.51	0.47	23205
3	0.43	0.66	0.52	25792
4	0.41	0.24	0.30	16289
5	0.24	0.00	0.01	3439
6	0.41	0.48	0.44	10470
7	0.12	0.00	0.00	822
8	0.42	0.03	0.05	3093
9	0.36	0.21	0.27	1412
10	0.29	0.01	0.02	782
11	0.52	0.43	0.47	1933
accuracy			0.43	94138

```
0.37
                            0.25
                                      0.25
                                               94138
   macro avq
                                      0.39
                                               94138
weighted avg
                   0.41
                            0.43
cb pred train= cb.predict(X train)
accuracy score(y train,cb pred train)*100
45.57692745441715
print(classification_report(y_train,cb_pred_train))
              precision
                           recall f1-score
                                             support
           1
                   0.46
                            0.19
                                      0.27
                                               16349
           2
                   0.45
                            0.54
                                      0.49
                                               53890
           3
                   0.45
                                      0.54
                            0.68
                                               60524
           4
                   0.47
                            0.26
                                      0.34
                                               38023
           5
                   0.63
                            0.01
                                      0.02
                                                8102
           6
                   0.45
                            0.53
                                      0.48
                                               23993
           7
                   0.79
                            0.01
                                      0.02
                                                1876
           8
                   0.71
                            0.06
                                      0.10
                                                7003
           9
                   0.55
                            0.31
                                      0.40
                                                3349
          10
                   0.84
                            0.07
                                      0.12
                                                1931
          11
                   0.62
                            0.51
                                      0.56
                                                4615
                                      0.46
                                              219655
    accuracy
                                      0.30
                   0.58
                            0.29
                                              219655
   macro avg
weighted avg
                   0.48
                            0.46
                                      0.42
                                              219655
ls = df full test.columns.tolist()
in data = df full test[ls]
out data = cb.predict (in data)
test = pd.read csv("D:/HealthCare/test data.csv")
submit = pd.DataFrame()
submit ['case id'] = test['case id']
submit ['Stay'] = out data
stay decode
              = { 1 : '0-10', 2 : '11-20', 3 : '21-30', 4 :
'31-40', 5 : '41-50', 6 : '51-60', 7 : '61-70', 8 : '71-80', 9 : '81-
90',
                        10 : '91-100', 11 : 'More than 100 Days' }
submit ['Stay'] = submit ['Stay'].map(stay decode)
submit.head(15)
```

```
case id
              Stay
0
     318439
              0-10
1
     318440
            51-60
2
     318441
             21-30
3
     318442
             21-30
4
     318443
            51-60
5
     318444
            21-30
6
     318445
             21-30
7
     318446
            21-30
8
     318447
             21-30
9
     318448
             21-30
10
     318449
            21-30
11
     318450
            51-60
12
     318451
            21-30
13
             21-30
     318452
14
     318453
             31-40
count = submit ['Stay'].value_counts()
count
21-30
                       85076
51-60
                       23685
11-20
                       12285
31-40
                        6693
0-10
                        5242
More than 100 Days
                        2407
81-90
                        1329
71-80
                         174
41-50
                         127
91-100
                          32
61-70
                           7
Name: Stay, dtype: int64
sns.barplot(x=count.index.values, y=count.values,data=submit)
<AxesSubplot:>
```

