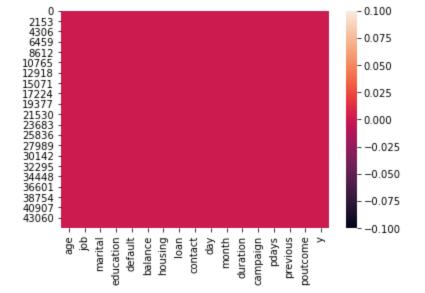
```
In [1]:
           import pandas as pd
           from sklearn.tree import DecisionTreeClassifier
           from sklearn.model_selection import train_test_split
           from sklearn import metrics
           import matplotlib.pyplot as plt
           import seaborn as sns
           get_ipython().run_line_magic('matplotlib', 'inline')
In [4]:
           data = pd.read_csv("bank.csv")
In [5]:
           data.head()
                                marital
Out[5]:
             age
                           job
                                        education
                                                   default
                                                           balance housing
                                                                               loan
                                                                                      contact
                                                                                              day
                                                                                                    month
                                                                                                           duration
                                                                                                                     campaig
          0
              58
                   management
                                married
                                                               2143
                                                                                                 5
                                                                                                                261
                                            tertiary
                                                        no
                                                                          yes
                                                                                 no
                                                                                     unknown
                                                                                                      may
          1
              44
                     technician
                                                                 29
                                                                                     unknown
                                                                                                 5
                                                                                                                151
                                  single
                                         secondary
                                                        no
                                                                          yes
                                                                                 no
                                                                                                      may
          2
                                married
                                                                  2
                                                                                                 5
                                                                                                                 76
              33
                   entrepreneur
                                         secondary
                                                                                yes
                                                                                     unknown
                                                                                                      may
                                                        no
                                                                          yes
          3
                                                                                                 5
              47
                     blue-collar
                                married
                                          unknown
                                                        no
                                                               1506
                                                                          yes
                                                                                     unknown
                                                                                                      may
                                                                                                                 92
          4
              33
                      unknown
                                  single
                                          unknown
                                                                  1
                                                                                     unknown
                                                                                                 5
                                                                                                      may
                                                                                                                198
                                                        nο
                                                                           nο
                                                                                 nο
In [6]:
           data.tail(10)
Out[6]:
                  age
                               job
                                     marital
                                              education default
                                                                 balance
                                                                          housing
                                                                                    Ioan
                                                                                            contact
                                                                                                    day
                                                                                                          month
                                                                                                                  duration
          45201
                                                                                                                      226
                   53
                       management
                                     married
                                                 tertiary
                                                             no
                                                                     583
                                                                                no
                                                                                      no
                                                                                            cellular
                                                                                                      17
                                                                                                             nov
          45202
                   34
                             admin.
                                       single
                                              secondary
                                                                     557
                                                                                no
                                                                                      no
                                                                                            cellular
                                                                                                      17
                                                                                                             nov
                                                                                                                      224
                                                             no
          45203
                   23
                            student
                                      single
                                                 tertiary
                                                                     113
                                                                                no
                                                                                      no
                                                                                            cellular
                                                                                                      17
                                                                                                             nov
                                                                                                                      266
                                                             no
          45204
                   73
                                                                    2850
                                                                                                                      300
                             retired
                                     married
                                              secondary
                                                                                            cellular
                                                                                                      17
                                                             no
                                                                                no
                                                                                      no
                                                                                                             nov
          45205
                   25
                          technician
                                       single
                                              secondary
                                                             no
                                                                     505
                                                                                no
                                                                                     yes
                                                                                            cellular
                                                                                                      17
                                                                                                             nov
                                                                                                                      386
          45206
                   51
                          technician
                                     married
                                                                     825
                                                                                                                      977
                                                 tertiary
                                                             no
                                                                                no
                                                                                      no
                                                                                            cellular
                                                                                                      17
                                                                                                             nov
          45207
                   71
                             retired
                                    divorced
                                                primary
                                                             no
                                                                    1729
                                                                                no
                                                                                      no
                                                                                            cellular
                                                                                                      17
                                                                                                             nov
                                                                                                                      456
          45208
                   72
                             retired
                                     married
                                              secondary
                                                             no
                                                                    5715
                                                                                no
                                                                                      no
                                                                                            cellular
                                                                                                      17
                                                                                                             nov
                                                                                                                     1127
          45209
                   57
                          blue-collar
                                                                     668
                                                                                                                      508
                                     married
                                              secondary
                                                             no
                                                                                no
                                                                                      no
                                                                                          telephone
                                                                                                      17
                                                                                                             nov
          45210
                   37
                       entrepreneur
                                     married
                                              secondary
                                                             no
                                                                    2971
                                                                                no
                                                                                      no
                                                                                            cellular
                                                                                                      17
                                                                                                             nov
                                                                                                                      361
In [7]:
           data.shape
          (45211, 17)
Out[7]:
In [8]:
           print("Number of rows", data.shape[0])
           print("Number of columns", data.shape[1])
          Number of rows 45211
          Number of columns 17
```

```
In [9]:
          data.info()
         <class 'pandas.core.frame.DataFrame'>
         RangeIndex: 45211 entries, 0 to 45210
         Data columns (total 17 columns):
                         Non-Null Count Dtype
              Column
              -----
                         -----
          0
                         45211 non-null int64
              age
          1
              job
                         45211 non-null object
          2
                         45211 non-null
              marital
                                         object
          3
              education 45211 non-null
                                         object
          4
              default
                         45211 non-null object
          5
              balance
                         45211 non-null
                                        int64
                         45211 non-null object
          6
              housing
          7
              loan
                         45211 non-null object
          8
              contact
                         45211 non-null object
          9
              day
                         45211 non-null
                                         int64
          10
              month
                         45211 non-null object
                         45211 non-null
          11
              duration
                                         int64
                         45211 non-null
          12
              campaign
                                         int64
          13
              pdays
                         45211 non-null int64
                         45211 non-null int64
          14
              previous
          15
                         45211 non-null object
              poutcome
          16 y
                         45211 non-null object
         dtypes: int64(7), object(10)
         memory usage: 5.9+ MB
In [15]:
          print("let me know? ", data.isnull().values.any())
         let me know? False
In [17]:
          data.isnull().sum()
                      0
         age
Out[17]:
                      0
         job
         marital
                      0
         education
                      0
         default
                      0
         balance
                      0
         housing
                      0
         loan
         contact
                      0
                      0
         day
         month
                      0
         duration
         campaign
                      0
                      0
         pdays
                      0
         previous
         poutcome
                      0
                      0
         dtype: int64
In [19]:
          sns.heatmap(data.isnull())
Out[19]: <AxesSubplot:>
```



```
In [20]: dup=data.duplicated().any()

In [21]: print(dup)
False

In [23]: data.describe()

    data.describe(include='all')
```

	age	job	marital	education	default	balance	housing	Ioan	contact	day ı
count	45211.000000	45211	45211	45211	45211	45211.000000	45211	45211	45211	45211.000000
unique	NaN	12	3	4	2	NaN	2	2	3	NaN
top	NaN	blue- collar	married	secondary	no	NaN	yes	no	cellular	NaN
freq	NaN	9732	27214	23202	44396	NaN	25130	37967	29285	NaN
mean	40.936210	NaN	NaN	NaN	NaN	1362.272058	NaN	NaN	NaN	15.806419
std	10.618762	NaN	NaN	NaN	NaN	3044.765829	NaN	NaN	NaN	8.322476
min	18.000000	NaN	NaN	NaN	NaN	-8019.000000	NaN	NaN	NaN	1.000000
25%	33.000000	NaN	NaN	NaN	NaN	72.000000	NaN	NaN	NaN	8.000000
50%	39.000000	NaN	NaN	NaN	NaN	448.000000	NaN	NaN	NaN	16.000000
75%	48.000000	NaN	NaN	NaN	NaN	1428.000000	NaN	NaN	NaN	21.000000
max	95.000000	NaN	NaN	NaN	NaN	102127.000000	NaN	NaN	NaN	31.000000

```
In [24]:
    data['marital'] = data['marital'].map({'single': 2, 'married': 3, 'divorced': 3})
    data['education'] = data['education'].map({'primary': 1, 'secondary': 2, 'tertiary': 3, 'undata['default'] = data['default'].map({'no': 0, 'yes': 1})
    data['housing'] = data['housing'].map({'no': 0, 'yes': 1})
    data['loan'] = data['loan'].map({'no': 0, 'yes': 1})
    data['y'] = data['y'].map({'no': 0, 'yes': 1})
```

Out[23]:

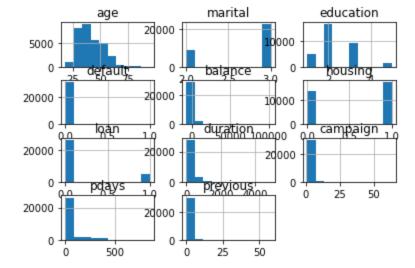
```
In [26]:
          data = data.drop(['job', 'contact', 'month', 'day', 'poutcome'], axis=1)
          X = data.iloc[:, :-1] # Features
          y = data.iloc[:, -1]
In [29]:
          X_train, X_test, y_train, y_test = train_test_split(X, y, test_size=0.3, random_state=1)
In [30]:
          clf = DecisionTreeClassifier()
In [31]:
          clf.fit(X_train, y_train)
          y_pred = clf.predict(X_test)
In [32]:
          accuracy = metrics.accuracy_score(y_test, y_pred)
          precision = metrics.precision_score(y_test, y_pred)
          recall = metrics.recall_score(y_test, y_pred)
          f1_score = metrics.f1_score(y_test, y_pred)
          print("Accuracy:", accuracy)
          print("Precision:", precision)
          print("Recall:", recall)
          print("F1 Score:", f1_score)
         Accuracy: 0.8522559716897671
         Precision: 0.3732512590934527
         Recall: 0.4300451321727917
         F1 Score: 0.3996405032953864
In [34]:
          data.hist()
          plt.xticks(rotation=90)
Out[34]: (array([-0.5, 0.,
                               0.5, 1., 1.5]),
                       ''),
           [Text(0, 0,
           Text(0, 0, ''),
           Text(0, 0, ''),
            Text(0, 0, ''),
            Text(0, 0, '')])
                                   marital
                                                  education
                    age
                                           20000
          10000
                          20000
             0
                              0
                   detault
                                   balance
                                                   nousing
                                           2d000
                          25000
          25000
             0
                              0
                                  duration
                                                  campaign 10
                    lgan
                          25000
                                           25000
          20000
                                  previous;
                   pdays
                                           25000
          20000
                          25000
             0
                              0
                     500
                                       200
In [35]:
          plt.hist(y_pred)
```

Loading [MathJax]/jax/output/CommonHTML/fonts/TeX/fontdata.js

```
Θ.,
                                              0.,
                                                                0.,
Out[35]: (array([[ 0., 10.,
                                  0.,
                                                    0.,
                                                          0.,
                                                                            0.],
                      0., 10.,
                                        0.,
                                                    0.,
                                                          0.,
                                                                      Θ.,
                                              0.,
                                                                Θ.,
                                  0.,
                                  Θ.,
                      0., 10.,
                                        0.,
                                              Θ.,
                                                    0.,
                                                          0.,
                                                                Θ.,
                                                                      0.,
                                                                            0.],
                                        0.,
                                                          0.,
                      0.,
                           10.,
                                                    0.,
                                                                0.,
                                                                      0.,
                                  0.,
                                              0.,
                                                                            0.],
                            3.,
                                        0.,
                                              0.,
                                                    1.,
                                                          0.,
                                                                0.,
                      2.,
                                  3.,
                                                                      0.,
                                                                            1.],
                                                    0.,
                                                          0.,
                           10.,
                                  0.,
                                        0.,
                                              0.,
                                                                0.,
                                  Θ.,
                                        Θ.,
                                              Θ.,
                                                    Θ.,
                                                          Θ.,
                                                                Θ.,
                      0., 10.,
                                                                      0.,
                                                                            0.],
                            9.,
                                                          0.,
                                                                Θ.,
                      0.,
                                  1.,
                                        0.,
                                              Θ.,
                                                    Θ.,
                                                                      0.,
                                                    0.,
                                                          0.,
                                        0.,
                                                                Θ.,
                                                                      0.,
                      0., 10.,
                                  0.,
                                              0.,
                      0., 10.,
                                        0.,
                                              0.,
                                                                0.,
                                                    0.,
                                                          Θ.,
                                  0.,
                                                                      0.,
                                                                0.,
                                        Θ.,
                                              0.,
                                                    0.,
                                                          Θ.,
                    [ 0., 10.,
                                                                      0.,
                                  0.,
                                                                            0.]]),
            array([-478. , -35.3,
                                        407.4, 850.1, 1292.8, 1735.5, 2178.2, 2620.9,
                    3063.6, 3506.3, 3949. ]),
            <a list of 11 BarContainer objects>)
           12000
           10000
            8000
            6000
            4000
            2000
               0
                       Ó
                                1000
                                           2000
                                                      3000
                                                                 4000
In [36]:
           X_train.hist()
           plt.hist(X_test.head(10))
            plt.hist(X_test.tail(10))
                                              Θ.,
                                        Θ.,
                                                          0.,
                                                                      0.,
Out[36]:
          (array([[10.,
                            0.,
                                  0.,
                                                    0.,
                                                                0.,
                                                                            0.],
                            0.,
                                  0.,
                                                    0.,
                                                          0.,
                                                                      0.,
                    [10.,
                                        0.,
                                              0.,
                                                                Θ.,
                                                                            0.],
                                  Θ.,
                    [10.,
                            Θ.,
                                        0.,
                                              0.,
                                                          0.,
                                                                      Θ.,
                                                    0.,
                                                                0.,
                                                                            0.],
                            Θ.,
                                        Θ.,
                                              Θ.,
                                                                Θ.,
                    [10.,
                                  0.,
                                                    0.,
                                                          0.,
                                                                      0.,
                     [ 4.,
                            2.,
                                  0.,
                                        1.,
                                              2.,
                                                    0.,
                                                          0.,
                                                                0.,
                                                                      0.,
                    [10.,
                            0.,
                                  0.,
                                        0.,
                                              0.,
                                                    0.,
                                                          0.,
                                                                0.,
                    [10.,
                            Θ.,
                                  0.,
                                        Θ.,
                                              Θ.,
                                                    Θ.,
                                                          0.,
                                                                Θ.,
                                                                      0.,
                                        0.,
                                                    0.,
                     [ 4.,
                            6.,
                                              Θ.,
                                                          Θ.,
                                                                Θ.,
                                                                      0.,
                                  0.,
                                                          Θ.,
                    [10.,
                            Θ.,
                                  Θ.,
                                        0.,
                                              Θ.,
                                                    0.,
                                                                Θ.,
                                                                      0.,
                            1.,
                                                          0.,
                    [ 9.,
                                  0.,
                                        0.,
                                              0.,
                                                    0.,
                                                                0.,
                                                                      0.,
                                                          0.,
                                                                0.,
                                  0.,
                                        0.,
                                              0.,
                                                    0.,
                                                                      0.,
                    [10.,
                            0.,
                            126., 774., 1422., 2070., 2718., 3366., 4014., 4662.,
            array([-522.,
```

5310., 5958.]),

<a list of 11 BarContainer objects>)



In [37]: sns.heatmap(X_train)
 sns.heatmap(X_test)

Out[37]: <AxesSubplot:>

