```
Charity Donors Prediction
          In this project we will predict the chances of a certain person donating to CharityML.
          Importing required libraries
 In [1]: import pandas as pd
          import numpy as np
          import matplotlib.pyplot as plt
          import seaborn as sns
           %matplotlib inline
          Importing our data
 In [2]: data=pd.read_csv('census.csv')
 In [3]: data.head()
 Out[3]:
                                           education- marital-
                                                                                                 capital- capital-
                                                                                                                  per-
              age workclass education_level
                                                              occupation relationship race
                                                                                            sex
                                                                                                                 week
                                                num
                                                      status
                                                                                                   gain
                                                                                                           loss
                                                      Never-
                                                                  Adm-
                   State-gov
              39
                                  Bachelors
                                                13.0
                                                                        Not-in-family White
                                                                                            Male 2174.0
                                                                                                            0.0
                                                                                                                  40.0
                                                      married
                                                                 clerical
                                                      Married-
                   Self-emp-
                                                                  Exec-
                                  Bachelors
                                                                           Husband White
                                                                                                            0.0
                                                                                                                  13.0
                                                         civ-
                                                              managerial
                                                      spouse
                                                               Handlers-
           2 38
                      Private
                                   HS-grad
                                                 9.0 Divorced
                                                                        Not-in-family White
                                                                                                            0.0
                                                                                                                  40.0
                                                                cleaners
                                                     Married-
                                                               Handlers-
                                                                                                            0.0
                                                                                                                  40.0
           3 53
                      Private
                                      11th
                                                                           Husband Black
                                                                                                    0.0
                                                                                           Male
                                                        civ-
                                                                cleaners
                                                      spouse
                                                      Married-
                                                                  Prof-
           4 28
                      Private
                                  Bachelors
                                                13.0
                                                        civ-
                                                                              Wife Black Female
                                                                                                            0.0
                                                                                                                  40.0
                                                                specialty
                                                      spouse
          Checking for null values
 In [4]: | data.isnull().sum()
 Out[4]: age
                                0
          workclass
          education_level
          education-num
          marital-status
          occupation
          relationship
          race
          sex
          capital-gain
          capital-loss
          hours-per-week
                                0
          native-country
          income
          dtype: int64
           So, there are no null values.
          Finding relation between different features and our
          target_variable
          Target variable is income.
          Relation between age and income.
In [11]: | sns.countplot(x='age', hue='income', data=data)
Out[11]: <matplotlib.axes._subplots.AxesSubplot at 0x2cc76d850c8>
             1200
                                       income
                                      <=50K
              1000
               800
               600
               400
               200
          We can see that the number of people earning 50K or less decreases with the increase in age.
          Relation between workclass and income.
In [14]: | sns.countplot(x='income', hue='workclass', data=data)
Out[14]: <matplotlib.axes._subplots.AxesSubplot at 0x2cc782c0448>
                                                     workclass
              25000
                                                    State-gov
                                                     Self-emp-not-inc
              20000
                                                     Private
            넡 15000
                                                    Self-emp-inc
                                                    Without-pay
             10000
               5000
                            <=50K
                                                    >50K
                                        income
          We can see that the majority of people who earn less than 50K work in private sector.
          Relation between education level and income.
In [16]: sns.countplot(x='income', hue='education_level', data=data)
Out[16]: <matplotlib.axes._subplots.AxesSubplot at 0x2cc782bc708>
                                                    education level
                                                  Bachelors
                                                      11th
              12000
                                                       Masters
                                                       9th
              10000
                                                       Assoc-acdm
               8000
                                                       Doctorate
               6000
                                                       Prof-school
                                                       5th-6th
               4000
                                                       10th
                                                       Preschool
               2000
                                                      12th
                                                      1st-4th
                            <=50K
                                                    >50K
                                        income
          Relation between marital status and income.
In [20]: sns.countplot(x='income', hue='marital-status', data=data)
Out[20]: <matplotlib.axes._subplots.AxesSubplot at 0x2cc7869e308>
             14000
                                                 marital-status
              12000
                                                Married-civ-spouse
                                                Divorced
              10000
                                                Married-spouse-absent
              8000
                                                Married-AF-spouse
                                            Widowed
               6000
               4000
               2000
                            <=50K
                                                    >50K
                                        income
          We see that the majority of people earning more than 50K are married.
In [21]: sns.countplot(x='income', hue='occupation', data=data)
Out[21]: <matplotlib.axes._subplots.AxesSubplot at 0x2cc78720b08>
                                                   occupation
              5000
                                                  Adm-clerical
                                                  Exec-managerial
              4000
              3000
                                                   Farming-fishing
                                                   Machine-op-inspct
              2000
                                                   Tech-support
                                                   Protective-serv
              1000
                                                   Armed-Forces
                                                   Priv-house-serv
                           <=50K
                                                   >50K
                                       income
          This graphs does not help us in drawing useful conclusions.
          Relation between relationship and income.
          sns.countplot(x='income', hue='relationship', data=data)
Out[22]: <matplotlib.axes._subplots.AxesSubplot at 0x2cc78720a88>
                                                     relationship
              10000
                                                      Not-in-family
                                                      Husband
               8000
                                                      Wife
                                                      Own-child
                                                      Unmarried
               6000
                                                      Other-relative
               4000
               2000
                            <=50K
                                                    >50K
          We can conclude that most of the people with income more than 50K are married and are male.
          Relation between race and income.
In [23]: sns.countplot(x='income', hue='race', data=data)
Out[23]: <matplotlib.axes._subplots.AxesSubplot at 0x2cc788ef748>
              30000
                                                      race
                                                  White
              25000
                                                  Asian-Pac-Islander
              20000
                                                  Amer-Indian-Eskimo
             15000
             10000
               5000
                            <=50K
                                                    >50K
                                        income
          Most of the earners with income more than 50K are white.
          Relation between sex and income.
In [24]: sns.countplot(x='income', hue='sex', data=data)
Out[24]: <matplotlib.axes._subplots.AxesSubplot at 0x2cc78969cc8>
                                                           sex
              20000
                                                           Male
                                                           Female
             17500
             15000
             12500
            8 10000
               7500
               5000
               2500
                            <=50K
                                                    >50K
                                        income
          Most of the earners with income more than 50K are male.
          Relation between one's native country and income.
          Converting categorical data into indicator data
In [29]: data.head()
Out[29]:
                                                                                                                hours-
                                                                                                 capital- capital-
                                           education-
              age workclass education_level
                                                              occupation relationship race
                                                                                            sex
                                                                                                                  per-
                                                                                                   gain
                                                      status
                                                                                                           loss
                                                                                                                       C
                                                num
                                                                                                                 week
                                                       Never-
                                                                        Not-in-family White
                                                                                                 2174.0
                                                                                                            0.0
                                                                                                                  40.0
              39
                   State-gov
                                  Bachelors
                                                13.0
                                                                                            Male
                                                      married
                                                                 clerical
                                                      Married-
                    Self-emp-
                                                                  Exec-
              50
                                                                                                    0.0
                                                                                                            0.0
                                                                                                                  13.0
           1
                                  Bachelors
                                                13.0
                                                                           Husband White
                                                                                            Male
                                                         civ-
                      not-inc
                                                              managerial
                                                      spouse
                                                               Handlers-
           2 38
                      Private
                                   HS-grad
                                                 9.0 Divorced
                                                                        Not-in-family White
                                                                                            Male
                                                                                                    0.0
                                                                                                            0.0
                                                                                                                  40.0
                                                                cleaners
                                                      Married-
                                                               Handlers-
           3 53
                                      11th
                                                                                                    0.0
                                                                                                            0.0
                                                                                                                  40.0
                      Private
                                                         civ-
                                                                           Husband Black
                                                                                            Male
                                                                cleaners
                                                      spouse
                                                      Married-
                                                                  Prof-
           4 28
                      Private
                                  Bachelors
                                                13.0
                                                         civ-
                                                                              Wife Black Female
                                                                                                    0.0
                                                                                                            0.0
                                                                                                                  40.0
                                                                specialty
                                                      spouse
          marital_status=pd.get_dummies(data['marital-status'],drop_first=True)
           relationship=pd.get_dummies(data['relationship'], drop_first=True)
           race=pd.get_dummies(data['race'], drop_first=True)
           sex=pd.get_dummies(data['sex'], drop_first=True)
          Concatinating this data into our main dataframe.
In [31]: data=pd.concat([data, marital_status, relationship, race, sex], axis=1)
           data.head()
Out[31]:
                                           education-
                                                                                                 capital-
                                                                                                                   Other-
                                                     marital-
              age workclass education_level
                                                              occupation relationship race
                                                                                                              in-
                                                                                            sex
                                                      status
                                                                                                                  relative
                                                num
                                                                                                   gain
                                                                                                            family
                                                       Never-
                                                                  Adm-
                   State-gov
               39
                                  Bachelors
                                                13.0
                                                                        Not-in-family White
                                                                                            Male
                                                                                                 2174.0
                                                                 clerical
                                                      married
                                                      Married-
                    Self-emp-
                                                                  Exec-
                                  Bachelors
                                                13.0
                                                                           Husband White
                                                                                            Male
                                                         civ-
                                                              managerial
                                                      spouse
                                                               Handlers-
           2 38
                      Private
                                   HS-grad
                                                 9.0 Divorced
                                                                        Not-in-family White
                                                                cleaners
                                                      Married-
                                                               Handlers-
           3
              53
                                      11th
                                                                                                    0.0 ...
                                                                                                               0
                                                                                                                       0
                      Private
                                                 7.0
                                                                           Husband Black
                                                                                            Male
                                                         civ-
                                                                cleaners
                                                      spouse
                                                      Married-
                                                                  Prof-
           4 28
                      Private
                                  Bachelors
                                                13.0
                                                         civ-
                                                                              Wife Black Female
                                                                                                    0.0 ...
                                                                specialty
                                                      spouse
          5 rows × 30 columns
In [33]: |workclass=pd.get_dummies(data['workclass'], drop_first=True)
In [34]: data=pd.concat([data,workclass],axis=1)
           data.head()
Out[34]:
                                           education- marital-
                                                              occupation relationship
                                                      status
                                                                                                   gain
                                                num
                                                       Never-
                                                                  Adm-
                                                13.0
                                                                                                 2174.0 ...
               39
                   State-gov
                                  Bachelors
                                                                        Not-in-family White
                                                                                            Male
                                                      married
                                                                 clerical
                                                      Married-
                    Self-emp-
                                                                  Exec-
           1 50
                                  Bachelors
                                                13.0
                                                                           Husband White
                                                                                            Male
                                                                                                    0.0 ...
                                                                                                                     0
                                                         civ-
                      not-inc
                                                              managerial
                                                      spouse
                                                               Handlers-
                      Private
                                   HS-grad
                                                 9.0 Divorced
                                                                        Not-in-family White
                                                                cleaners
                                                      Married-
                                                               Handlers-
           3 53
                      Private
                                      11th
                                                         civ-
                                                                           Husband Black
                                                                                            Male
                                                                                                    0.0 ...
                                                                                                                     0
                                                                cleaners
                                                      spouse
                                                      Married-
                                                                   Prof-
           4 28
                                                                                                                     0
                      Private
                                  Bachelors
                                                                              Wife Black Female
                                                                                                    0.0 ...
                                                         civ-
                                                                specialty
          5 rows × 36 columns
          Separating our required features
In [35]: data.drop(['workclass','education_level','education-num','marital-status','occupation','rela
           tionship','race','sex'],axis=1,inplace=True)
In [36]: data.head()
Out[36]:
                                                         Married-
                                                                Married-
                                  hours-
                   capital- capital-
                                          native-
                                                                                         ... Black Other White Male
                                                            AF-
                                    per-
                                                 income
                                                                     civ-
                                                                         spouse-
                             loss
                                                                                  married
                                         country
                     gain
                                                         spouse
                                   week
                                                                          absent
                                                                 spouse
                                          United-
               39
                   2174.0
                              0.0
                                    40.0
                                                  <=50K
                                                              0
                                                                                                      0
                                          States
                                          United-
                              0.0
                                    13.0
                                                  <=50K
                                                                                       0 ...
                                                                                                      0
           1 50
                      0.0
                                                                                                            1
                                                                                                                 1
                                          States
                                          United-
           2 38
                                    40.0
                                                  <=50K
                                                                                                      0
                      0.0
                              0.0
                                          States
                                          United-
                                                                                       0 ...
                                                  <=50K
                                                                                                      0
                                                                                                            0
           3 53
                      0.0
                              0.0
                                    40.0
                                                                                                1
                                                                                                                  1
                                           States
                                                  <=50K
                                                                                       0 ...
                                    40.0
           4 28
                      0.0
                              0.0
                                           Cuba
          5 rows × 28 columns
In [37]: data.drop('native-country', axis=1, inplace=True)
In [38]:
          data.head()
Out[38]:
                                                 Married- Married- Married-
                                  hours-
                   capital- capital-
                                                                           Never-
                                                                                 Separated ... Black Other White Male
              age
                                    per- income
                                                    AF-
                                                             civ-
                                                                 spouse-
                             loss
                                                                          married
                     gain
                                   week
                                                                  absent
                                                 spouse
                                                         spouse
               39
                   2174.0
                              0.0
                                    40.0
                                          <=50K
                                                                                                               1
                                                                                                                   1
               50
                      0.0
                              0.0
                                    13.0
                                          <=50K
                                                      0
                                                              1
                                                                       0
                                                                                         0 ...
                                                                                                                    1
              38
                      0.0
                              0.0
                                    40.0
                                          <=50K
                                                                                        0 ...
                                                                                                               0
              53
                                    40.0
                                          <=50K
                                                      0
                                                              1
                                                                                                  1
                                                                                                                    1
                      0.0
                              0.0
                              0.0
                                          <=50K
               28
                      0.0
                                    40.0
          5 rows × 27 columns
In [39]: | data.drop('hours-per-week', axis=1, inplace=True)
In [40]: | data.head()
Out[40]:
                                          Married- Married- Married-
                   capital- capital-
                                                                   Never-
                                             AF-
                                                                           Separated Widowed ... Black Other White Male
                                  income
                                                      civ-
                                                          spouse-
                             loss
                                                                   married
                     gain
                                          spouse
                                                  spouse
                                                           absent
               39
                   2174.0
                              0.0
                                   <=50K
                                                                        0
           1
              50
                      0.0
                              0.0
                                   <=50K
                                                       1
                                                        0
                              0.0
                                   <=50K
                                                                0
                                                                        0
                                                                                  0
           3 53
                      0.0
                              0.0
                                   <=50K
                                                       1
                                                                                                    1
                                                                                                          0
                                                                                                                 0
                                                                                                                      1
                                   <=50K
               28
                      0.0
                              0.0
          5 rows × 26 columns
          Checking the relation between profit and income
In [41]: def profit(cols):
               gain=cols[0]
               loss=cols[1]
               return gain-loss
In [43]: | data['profit']=data[['capital-gain', 'capital-loss']].apply(profit,axis=1)
Out[43]:
                                          Married- Married- Married-
                   capital-
                          capital-
                                                                           Separated Widowed ... Other White Male
                                  income
                                             AF-
                                                      civ-
                                                          spouse-
                                                                   married
                     gain
                             loss
                                           spouse
                                                  spouse
                                                           absent
               39
                   2174.0
                              0.0
                                   <=50K
               50
                      0.0
                              0.0
                                   <=50K
                              0.0 <=50K
           2 38
                      0.0
                                   <=50K
                      0.0
                                                                                                                0
               28
                              0.0
                                  <=50K
          5 rows × 27 columns
In [47]: | sns.countplot(x='profit', hue='income', data=data)
Out[47]: <matplotlib.axes._subplots.AxesSubplot at 0x2cc7c0c2ec8>
                      income
              30000
                    <=50K
                     >50K
              25000
              20000
            8 15000
              10000
               5000
                                        profit
In [48]: | sns.countplot(x='capital-gain', hue='income', data=data)
Out[48]: <matplotlib.axes._subplots.AxesSubplot at 0x2cc7c8b3248>
                                                         income
              30000
                                                        <=50K
              25000
              20000
            8 <sub>15000</sub>
             10000
               5000
                                      capital-gain
          As this is of no use. Therefore, we will be dropping capital-gain and capital loss.
In [51]: data.drop(['capital-gain', 'capital-loss'], axis=1, inplace=True)
In [52]: data.head()
Out[52]:
                                                                               Not-
                          Married- Married-
                                                                                      Other-
                                                    Never-
                                                                                            ... Other White Male
                                                           Separated Widowed
              age income
                              AF-
                                      civ-
                                           spouse-
                                                                                     relative
                                                   married
                                                                              family
                           spouse
                                            absent
                                   spouse
               39
                    <=50K
                                                         0
                    <=50K
                                                                  0
                    <=50K
                                                         0
                                                                  0
                                                                            0
                                                                                  0
                                                                                                         0
                                                                                                                     0
                    <=50K
                                                 0
                                                                                          0 ...
                                                                                                   0
               28
                    <=50K
          5 rows × 25 columns
          Converting income column
In [55]: income=pd.get_dummies(data['income'],drop_first=True)
In [56]: data=pd.concat([data,income],axis=1)
Out[56]:
                          Married- Married- Married-
                                                                                               White Male
                                                                                                                  Private
                                                           Separated Widowed
                              AF-
                                                                                 in-
              age income
                                      civ- spouse-
                                                   married
                                                                                     relative
                                            absent
                           spouse
                                   spouse
               39
                   <=50K
                    <=50K
                                                         0
                                                                  0
                                                                                                   0
                                                                                                               0
                                                                  0
           4 28
                   <=50K
                                                                                                   0
          5 rows × 26 columns
          Dropping income column.
In [57]: data.drop('income', axis=1, inplace=True)
In [59]: data.head()
Out[59]:
                   Married-
                           Married-
                                   Married-
                                                                              Other- Own-
                                                                                                         Local-
                                            Never-
                                                                                           ... White Male
                                                    Separated Widowed
                                                                         in-
                                                                                                                 Private e
                               civ-
                                   spouse-
                                                                             relative child
                                            married
                                                                       family
                   spouse
                           spouse
                                     absent
              39
                                                                                                                     0
           1 50
                                                                                                                     0
                                                                    0
                                                                          0
                                                                                        0
           3 53
                                                 0
                                                           0
                                                                    0
                                                                                        0
                                1
                                                                          0
                                                                                  0
                                                                                                                     1
              28
                                                                                        0 ...
```

5 rows × 25 columns

**Building our model** 

**Training and testing our model** 

In [61]: | from sklearn.model\_selection import train\_test\_split

In [63]: x\_test,x\_train,y\_test,y\_train=train\_test\_split(x,y,test\_size=0.2)

Out[64]: DecisionTreeClassifier(ccp\_alpha=0.0, class\_weight=None, criterion='gini',

max\_depth=None, max\_features=None, max\_leaf\_nodes=None, min\_impurity\_decrease=0.0, min\_impurity\_split=None,

min\_weight\_fraction\_leaf=0.0, presort='deprecated',

min\_samples\_leaf=1, min\_samples\_split=2,

random\_state=None, splitter='best')

Importing required libraries.

Importing required libraries.

y=data['>50K']

Splitting our data.

In [62]:

x=data.drop('>50K',axis=1)

In [64]: classifier.fit(x\_train,y\_train)

Predicting from testing set.

In [66]: test\_predictions

In [65]: | test\_predictions=classifier.predict(x\_test)

Out[66]: array([0, 0, 0, ..., 1, 0, 0], dtype=uint8)

In [67]: **from sklearn.metrics import** accuracy\_score

In [68]: accuracy=accuracy score(y test.test predictions)

**Checking accuracy**