```
D12-practice-7 - Jupyter Notebook
In [2]:
         import pandas as pd
         import numpy as np
         import matplotlib.pyplot as plt
         import seaborn as sns
In [3]: df=pd.read_csv(r"c7_used_cars.csv")
Out[3]:
                 Unnamed: 0 model year
                                          price transmission mileage fuelType tax mpg engineSize
                                                                                                   Make
              0
                                         25000
                                                                                                     VW
                             T-Roc
                                   2019
                                                   Automatic
                                                              13904
                                                                        Diesel
                                                                              145
                                                                                   49.6
                                                                                               2.0
              1
                             T-Roc 2019
                                         26883
                                                   Automatic
                                                               4562
                                                                        Diesel 145
                                                                                   49.6
                                                                                               2.0
                                                                                                     VW
              2
                             T-Roc 2019
                                         20000
                                                     Manual
                                                               7414
                                                                        Diesel
                                                                             145
                                                                                   50.4
                                                                                               2.0
                                                                                                     VW
              3
                          3
                             T-Roc 2019
                                         33492
                                                   Automatic
                                                               4825
                                                                                   32.5
                                                                                                     VW
                                                                        Petrol 145
                                                                                               2.0
              4
                          4
                             T-Roc 2019
                                         22900
                                                   Semi-Auto
                                                               6500
                                                                        Petrol 150
                                                                                   39.8
                                                                                               1.5
                                                                                                     VW
              ...
                         ...
                                ...
                                      ...
                                                                  ...
                                                                           ...
                                                                               ...
                                                                                     ...
                                                                                                ...
                                                                                                      ...
          99182
                      10663
                               A3 2020
                                         16999
                                                     Manual
                                                               4018
                                                                        Petrol
                                                                             145
                                                                                   49.6
                                                                                               1.0
                                                                                                    Audi
          99183
                      10664
                                A3 2020
                                         16999
                                                     Manual
                                                                1978
                                                                        Petrol 150
                                                                                   49.6
                                                                                               1.0
                                                                                                    Audi
          99184
                      10665
                                A3 2020
                                         17199
                                                     Manual
                                                                609
                                                                        Petrol 150
                                                                                   49.6
                                                                                               1.0
                                                                                                    Audi
          99185
                      10666
                               Q3 2017
                                         19499
                                                   Automatic
                                                               8646
                                                                        Petrol 150
                                                                                   47 9
                                                                                                    Audi
                                                                                               14
          99186
                      10667
                               Q3 2016
                                        15999
                                                     Manual
                                                              11855
                                                                        Petrol 150
                                                                                               1.4
                                                                                                    Audi
         99187 rows × 11 columns
In [4]: df.info()
         <class 'pandas.core.frame.DataFrame'>
         RangeIndex: 99187 entries, 0 to 99186
         Data columns (total 11 columns):
                              Non-Null Count Dtype
               Column
               -----
                               _____
               Unnamed: 0
          0
                              99187 non-null
                                                 int64
                              99187 non-null
          1
               model
                                                 object
          2
               year
                              99187 non-null
                                                 int64
                              99187 non-null int64
          3
               price
```

```
transmission
                 99187 non-null object
    mileage
                 99187 non-null int64
6
    fuelType
                 99187 non-null object
7
    tax
                 99187 non-null int64
```

99187 non-null float64 9 engineSize 10 Make 99187 non-null object dtypes: float64(2), int64(5), object(4) memory usage: 8.3+ MB

99187 non-null

float64

```
In [5]: df=df.dropna()
```

8

mpg

In [6]: df.isnull().sum()

```
Out[6]: Unnamed: 0
                         0
        model
                         0
        year
                         0
        price
                         0
        transmission
                         0
        mileage
                         0
        fuelType
                         0
        tax
                         0
                         0
        mpg
        engineSize
        Make
                         0
        dtype: int64
```

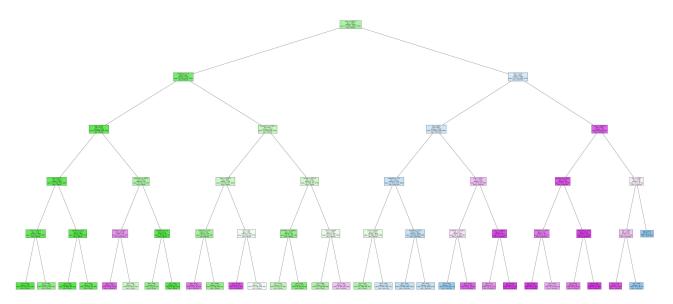
```
In [7]:
         df.describe()
 Out[7]:
                  Unnamed: 0
                                   year
                                                price
                                                           mileage
                                                                           tax
                                                                                      mpg
                                                                                             engineSize
                99187 000000
                            99187 000000
                                         99187.000000
                                                       99187.000000
                                                                  99187 000000 99187 000000
                                                                                           99187 000000
          count
                 6294.413532
                             2017.087723
                                          16805.347656
                                                       23058.914213
                                                                     120.299838
                                                                                  55.166825
                                                                                               1.663280
          mean
            std
                 4265.588536
                                2.123934
                                          9866.773417
                                                       21148.523721
                                                                      63.150926
                                                                                  16.138522
                                                                                               0.557646
                    0.000000
                             1970.000000
                                           450.000000
                                                          1.000000
                                                                      0.000000
                                                                                   0.300000
                                                                                               0.000000
            min
           25%
                 2755.000000
                             2016.000000
                                          9999.000000
                                                        7425.000000
                                                                     125.000000
                                                                                  47.100000
                                                                                               1.200000
           50%
                 5591.000000
                             2017.000000
                                          14495.000000
                                                       17460.000000
                                                                     145.000000
                                                                                  54.300000
                                                                                               1.600000
                 9420.000000
                             2019.000000
                                         20870.000000
                                                       32339.000000
                                                                     145.000000
                                                                                  62.800000
                                                                                               2.000000
           75%
                17964.000000
                             2060.000000
                                        159999.000000
                                                      323000.000000
                                                                     580.000000
                                                                                 470.800000
                                                                                               6.600000
           max
In [8]: df.columns
dtype='object')
In [12]: df['transmission'].value_counts()
Out[12]: Manual
                       56445
                       22677
         Semi-Auto
         Automatic
                       20056
         0ther
                           9
         Name: transmission, dtype: int64
In [13]: g1={"transmission":{'Other':0, 'Manual':1, 'Semi-Auto':2, 'Automatic':3}}
         df=df.replace(g1)
         print(df)
                 Unnamed: 0
                                     year
                                            price transmission mileage fuelType tax
                              model
                                                                    13904
         0
                          0
                              T-Roc
                                      2019
                                            25000
                                                               3
                                                                            Diesel
                                                                                     145
         1
                          1
                              T-Roc
                                      2019
                                            26883
                                                               3
                                                                     4562
                                                                             Diesel
                                                                                     145
         2
                          2
                              T-Roc
                                      2019
                                            20000
                                                               1
                                                                     7414
                                                                            Diesel
                                                                                     145
         3
                                      2019
                                            33492
                                                                     4825
                                                                             Petrol
                                                                                    145
                          3
                              T-Roc
                                                               3
          4
                                      2019
                                            22900
                                                               2
                                                                     6500
                                                                             Petrol 150
                              T-Roc
         99182
                      10663
                                 Δ3
                                      2020
                                            16999
                                                               1
                                                                     4018
                                                                             Petrol
                                                                                     145
         99183
                      10664
                                      2020
                                            16999
                                                                     1978
                                 Α3
                                                               1
                                                                             Petrol
                                                                                     150
         99184
                      10665
                                 А3
                                      2020
                                            17199
                                                               1
                                                                      609
                                                                             Petrol
                                                                                     150
         99185
                      10666
                                 Q3
                                            19499
                                      2017
                                                               3
                                                                     8646
                                                                             Petrol
                                                                                     150
         99186
                      10667
                                 Q3
                                     2016
                                            15999
                                                                    11855
                                                                             Petrol 150
                  mpg engineSize Make
         0
                 49.6
                              2.0
                                      VW
         1
                 49.6
                              2.0
                                      VW
         2
                 50.4
                              2.0
                                      VW
         3
                 32.5
                              2.0
                                      VW
         4
                 39.8
                                      VW
                              1.5
         99182
                49.6
                              1.0
                                    Audi
                 49.6
                                    Audi
         99183
                              1.0
         99184
                49.6
                              1.0
                                    Audi
         99185 47.9
                                   Audi
                              1.4
         99186 47.9
                              1.4
                                   Audi
          [99187 rows x 11 columns]
In [16]: | x=df[['Unnamed: 0','year','price','mileage','tax','mpg','engineSize']]
         y=df["transmission"]
In [17]: from sklearn.model_selection import train_test_split
         x_train,x_test,y_train,y_test=train_test_split(x,y,train_size=0.70)
```

```
In [18]:
         from sklearn.ensemble import RandomForestClassifier
         rfc=RandomForestClassifier()
         rfc.fit(x_train,y_train)
Out[18]: RandomForestClassifier()
In [19]: parameters={'max_depth':[1,2,3,4,5],
                      min_samples_leaf':[5,10,15,20,25],
                     'n_estimators':[10,20,30,40,50]}
In [20]: from sklearn.model_selection import GridSearchCV
         grid search=GridSearchCV(estimator=rfc,param grid=parameters,cv=2,scoring="accuracy")
         grid_search.fit(x_train,y_train)
Out[20]: GridSearchCV(cv=2, estimator=RandomForestClassifier(),
                      param_grid={'max_depth': [1, 2, 3, 4, 5],
                                   'min_samples_leaf': [5, 10, 15, 20, 25],
                                   'n_estimators': [10, 20, 30, 40, 50]},
                      scoring='accuracy')
In [21]: grid_search.best_score_
Out[21]: 0.7316289788275961
In [22]: parameters={'max_depth':[1,2,3,4,5],
                      'min_samples_leaf':[5,10,15,20,25],
                     'n_estimators':[10,20,30,40,50]}
In [23]: rfc_best=grid_search.best_estimator_
```

In [24]: from sklearn.tree import plot_tree
 plt.figure(figsize=(80,40))
 plot_tree(rfc_best.estimators_[5],feature_names=x.columns,class_names=['Other','Manual','Semi-Auto','Automatic

```
Out[24]: [Text(2332.622950819672, 1993.2, 'price <= 17522.5\ngini = 0.585\nsamples = 43793\nvalue = [5, 39360, 15914,
                 14151]\nclass = Manual'),
                   Text(1170.8852459016393, 1630.80000000000000, 'engineSize <= 1.75\ngini = 0.382\nsamples = 27985\nvalue = [4,
                 34127, 4247, 6032]\nclass = Manual'),
                  Text(585.4426229508197, 1268.4, 'mpg <= 75.35\ngini = 0.278\nsamples = 21692\nvalue = [2, 28959, 2403, 3019]
                 \nclass = Manual').
                  Text(292.72131147540983, 906.0, 'year <= 2017.5 \\ line = 0.262 \\ line = 20670 \\ line = [2, 27909, 2372, 244] \\ line = [2, 27909, 2472, 244] \\ line = [2, 27909, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 2472, 24
                 6]\nclass = Manual'),
                  Text(146.36065573770492, 543.599999999999, 'price <= 10572.5\ngini = 0.293\nsamples = 12886\nvalue = [0, 17
                 004, 1735, 1685]\nclass = Manual'),
                  Text(73.18032786885246, 181.1999999999999, 'gini = 0.168\nsamples = 8567\nvalue = [0, 12277, 431, 784]\ncla
                 ss = Manual'),
                  Text(219.54098360655738, 181.19999999999982, 'gini = 0.483\nsamples = 4319\nvalue = [0, 4727, 1304, 901]\ncl
                 ass = Manual'),
                  Text(439.08196721311475, 543.599999999999, 'engineSize <= 1.45\ngini = 0.208\nsamples = 7784\nvalue = [2, 1
                 0905, 637, 761]\nclass = Manual'),
                  Text(365.9016393442623, 181.1999999999999, 'gini = 0.179\nsamples = 6087\nvalue = [2, 8662, 467, 457]\nclas
                 s = Manual'),
                  Text(512.2622950819672, 181.1999999999999, 'gini = 0.302\nsamples = 1697\nvalue = [0, 2243, 170, 304]\nclas
                 s = Manual').
                  Text(878.1639344262295, 906.0, 'Unnamed: 0 <= 2936.0\ngini = 0.477\nsamples = 1022\nvalue = [0, 1050, 31, 57
                 3]\nclass = Manual'),
                   Text(731.8032786885246, 543.599999999999, 'mileage <= 32515.0\ngini = 0.458\nsamples = 455\nvalue = [0, 23
                 4, 15, 495]\nclass = Automatic'),
                  Text(658.6229508196722, 181.19999999999982, 'gini = 0.323\nsamples = 292\nvalue = [0, 90, 7, 393]\nclass = A
                 utomatic'),
                  Text(804.983606557377, 181.199999999999999, 'gini = 0.516 \\ nsamples = 163 \\ nvalue = [0, 144, 8, 102] \\ nclass = Mathematical (a) \\ nclass 
                 anual'),
                  Text(1024.5245901639344, 543.599999999999, 'engineSize <= 1.45\ngini = 0.188\nsamples = 567\nvalue = [0, 81
                 6, 16, 78]\nclass = Manual'),
                  Text(951.344262295082, 181.1999999999999, 'gini = 0.501\nsamples = 42\nvalue = [0, 47, 9, 15]\nclass = Manu
                  Text(1097.704918032787, 181.19999999999982, 'gini = 0.154\nsamples = 525\nvalue = [0, 769, 7, 63]\nclass = M
                 anual'),
                  Text(1756.327868852459, 1268.4, 'Unnamed: 0 <= 7360.0\ngini = 0.61\nsamples = 6293\nvalue = [2, 5168, 1844,
                 3013]\nclass = Manual'),
                  Text(1463.6065573770493, 906.0, 'price <= 13989.5\ngini = 0.621\nsamples = 3150\nvalue = [0, 2520, 1477, 103
                 4]\nclass = Manual'),
                  Text(1317.2459016393443, 543.599999999999, 'engineSize <= 1.85\ngini = 0.558\nsamples = 1376\nvalue = [0, 1
                 352, 434, 458]\nclass = Manual'),
                  Text(1244.0655737704917, 181.19999999999982, 'gini = 0.431\nsamples = 203\nvalue = [0, 52, 34, 231]\nclass =
                 Automatic').
                  Text(1390.4262295081967, 181.1999999999982, 'gini = 0.488\nsamples = 1173\nvalue = [0, 1300, 400, 227]\ncla
                 ss = Manual'),
                  Text(1609.967213114754, 543.599999999999, 'tax <= 15.0\ngini = 0.642\nsamples = 1774\nvalue = [0, 1168, 104
                 3, 576]\nclass = Manual'),
                  Text(1536.7868852459017, 181.1999999999999, 'gini = 0.214\nsamples = 100\nvalue = [0, 10, 9, 143]\nclass =
                 Automatic'),
                  Text(1683.1475409836066, 181.199999999999982, 'gini = 0.623\nsamples = 1674\nvalue = [0, 1158, 1034, 433]\ncl
                 ass = Manual'),
                  Text(2049.0491803278687, 906.0, 'mileage <= 28122.0\ngini = 0.557\nsamples = 3143\nvalue = [2, 2648, 367, 19
                 79]\nclass = Manual'),
                  Text(1902.688524590164, 543.599999999999, 'Unnamed: 0 <= 10822.0\ngini = 0.507\nsamples = 641\nvalue = [0,
                 673, 115, 246]\nclass = Manual'),
                  Text(1829.5081967213114, 181.1999999999999, 'gini = 0.565\nsamples = 286\nvalue = [0, 257, 51, 150]\nclass
                 = Manual'),
                  Text(1975.8688524590164, 181.199999999999982, 'gini = 0.438\nsamples = 355\nvalue = [0, 416, 64, 96]\nclass =
                  Text(2195.409836065574, 543.599999999999, 'price <= 12916.0\ngini = 0.556\nsamples = 2502\nvalue = [2, 197
                 5, 252, 1733]\nclass = Manual'),
                  Text(2122.2295081967213, 181.19999999999982, 'gini = 0.499\nsamples = 1315\nvalue = [0, 1289, 88, 698]\nclas
                 s = Manual'),
                  Text(2268.590163934426, 181.1999999999999, 'gini = 0.559\nsamples = 1187\nvalue = [2, 686, 164, 1035]\nclas
                 s = Automatic'),
                  Text(3494.3606557377047, 1630.80000000000000, 'mpg <= 73.35\ngini = 0.634\nsamples = 15808\nvalue = [1, 5233,
                 11667, 8119]\nclass = Semi-Auto'),
                  Text(2927.2131147540986, 1268.4, 'tax <= 202.5\ngini = 0.632\nsamples = 15305\nvalue = [1, 5209, 11540, 749]
                 9]\nclass = Semi-Auto'),
                  Text(2634.4918032786886, 906.0, 'engineSize <= 1.65\ngini = 0.631\nsamples = 14635\nvalue = [1, 5119, 11153,
                 68911\nclass = Semi-Auto').
                  Text(2488.1311475409834, 543.5999999999999, 'price <= 21422.0\ngini = 0.636\nsamples = 4079\nvalue = [1, 288
                 5, 2278, 1306]\nclass = Manual'),
                  Text(2414.9508196721313, 181.19999999999982, 'gini = 0.576\nsamples = 2176\nvalue = [1, 1969, 864, 593]\ncla
                 ss = Manual'),
                   Text(2561.311475409836, 181.1999999999999, 'gini = 0.639\nsamples = 1903\nvalue = [0, 916, 1414, 713]\nclas
```

s = Semi-Auto'), Text(2780.8524590163934, 543.599999999999, 'engineSize <= 2.05\ngini = 0.588\nsamples = 10556\nvalue = [0, 2234, 8875, 5585]\nclass = Semi-Auto'), Text(2707.6721311475408, 181.1999999999982, 'gini = 0.611\nsamples = 7209\nvalue = [0, 2089, 5841, 3475]\nc lass = Semi-Auto'), Text(2854.032786885246, 181.1999999999999, 'gini = 0.511\nsamples = 3347\nvalue = [0, 145, 3034, 2110]\ncla ss = Semi-Auto'), Text(3219.934426229508, 906.0, 'year <= 2017.5\ngini = 0.552\nsamples = 670\nvalue = [0, 90, 387, 608]\nclas s = Automatic'), Text(3073.5737704918033, 543.5999999999999, 'Unnamed: 0 <= 7262.5\ngini = 0.57\nsamples = 569\nvalue = [0, 7] 7, 384, 458]\nclass = Automatic'), Text(3000.3934426229507, 181.1999999999999, 'gini = 0.523\nsamples = 323\nvalue = [0, 56, 330, 138]\nclass = Semi-Auto'), Text(3146.754098360656, 181.19999999999982, 'gini = 0.322\nsamples = 246\nvalue = [0, 21, 54, 320]\nclass = Automatic'), Text(3366.2950819672133, 543.599999999999, 'price <= 23995.5\ngini = 0.177\nsamples = 101\nvalue = [0, 13, 3, 150]\nclass = Automatic'), Text(3293.1147540983607, 181.19999999999982, 'gini = 0.43\nsamples = 22\nvalue = [0, 10, 0, 22]\nclass = Aut omatic'), Text(3439.4754098360654, 181.19999999999982, 'gini = 0.087\nsamples = 79\nvalue = [0, 3, 3, 128]\nclass = Au tomatic'), Text(4061.5081967213114, 1268.4, 'price <= 30245.0\ngini = 0.325\nsamples = 503\nvalue = [0, 24, 127, 620]\n class = Automatic'), Text(3805.377049180328, 906.0, 'Unnamed: 0 <= 5660.0\ngini = 0.267\nsamples = 435\nvalue = [0, 24, 78, 567] \nclass = Automatic'), Text(3659.0163934426228, 543.599999999999, 'Unnamed: 0 <= 342.5\ngini = 0.416\nsamples = 193\nvalue = [0, 1 3, 69, 219]\nclass = Automatic'), Text(3585.8360655737706, 181.1999999999999, 'gini = 0.044\nsamples = 56\nvalue = [0, 1, 1, 88]\nclass = Aut omatic'), Text(3732.1967213114754, 181.199999999999982, 'gini = 0.507\nsamples = 137\nvalue = [0, 12, 68, 131]\nclass = Automatic'), Text(3951.7377049180327, 543.599999999999, 'engineSize <= 1.65\ngini = 0.104\nsamples = 242\nvalue = [0, 1 1, 9, 348]\nclass = Automatic'), Text(3878.55737704918, 181.1999999999999, 'gini = 0.448\nsamples = 40\nvalue = [0, 10, 8, 45]\nclass = Auto matic'), Text(4024.9180327868853, 181.199999999999982, 'gini = 0.013\nsamples = 202\nvalue = [0, 1, 1, 303]\nclass = A Text(4317.639344262295, 906.0, 'year <= 2019.5\ngini = 0.499\nsamples = 68\nvalue = [0, 0, 49, 53]\nclass = Automatic'). Text(4244.459016393443, 543.599999999999, 'mpg <= 149.1\ngini = 0.486\nsamples = 51\nvalue = [0, 0, 33, 46] \nclass = Automatic'), Text(4171.2786885245905, 181.199999999999982, 'gini = 0.229\nsamples = 25\nvalue = [0, 0, 5, 33]\nclass = Aut omatic'), Text(4317.639344262295, 181.199999999999982, 'gini = 0.433\nsamples = 26\nvalue = [0, 0, 28, 13]\nclass = Sem i-Auto'), Text(4390.819672131148, 543.599999999999, 'gini = 0.423\nsamples = 17\nvalue = [0, 0, 16, 7]\nclass = Semi-Auto')]



In []: