### EDA and Feature Selection

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#### 0.2 EDA and Feature Engineering

Cleaning the data and data preparation and Model Training

```
[]: import pandas as pd
      import numpy as np
      import matplotlib.pyplot as plt
      import seaborn as sns
      %matplotlib inline
[83]: df_train=pd.read_csv('train.csv')
      df_test=pd.read_csv('dftest.csv')
[84]: df_train.columns
[84]: Index(['User ID', 'Product ID', 'Gender', 'Age', 'Occupation', 'City Category',
             'Stay_In_Current_City_Years', 'Marital_Status', 'Product_Category_1',
             'Product_Category_2', 'Product_Category_3', 'Purchase'],
            dtype='object')
[85]: df test.columns
[85]: Index(['User_ID', 'Product_ID', 'Gender', 'Age', 'Occupation', 'City_Category',
             'Stay_In_Current_City_Years', 'Marital_Status', 'Product_Category_1',
             'Product_Category_2', 'Product_Category_3'],
            dtype='object')
[86]: df_train.columns
[86]: Index(['User_ID', 'Product_ID', 'Gender', 'Age', 'Occupation', 'City_Category',
             'Stay_In_Current_City_Years', 'Marital_Status', 'Product_Category_1',
             'Product_Category_2', 'Product_Category_3', 'Purchase'],
            dtype='object')
[87]: df_test.columns
```

```
[87]: Index(['User_ID', 'Product_ID', 'Gender', 'Age', 'Occupation', 'City_Category',
             'Stay_In_Current_City_Years', 'Marital_Status', 'Product_Category_1',
             'Product_Category_2', 'Product_Category_3'],
            dtype='object')
[88]: df= df_train.merge(df_test,how='left')
[89]: df.head()
[89]:
         User_ID Product_ID Gender
                                      Age
                                          Occupation City_Category
      0 1000001 P00069042
                                 F
                                     0 - 17
                                                   10
                                                                   Α
      1 1000001 P00248942
                                 F
                                    0-17
                                                   10
                                                                   Α
                                 F
      2 1000001 P00087842
                                     0 - 17
                                                   10
                                                                   Α
      3 1000001 P00085442
                                 F
                                     0 - 17
                                                   10
                                                                   Α
      4 1000002 P00285442
                                                                   C
                                      55+
                                                   16
        Stay_In_Current_City_Years
                                     Marital_Status Product_Category_1
      0
                                  2
                                                  0
      1
                                                                       1
      2
                                  2
                                                                      12
                                                  0
                                  2
      3
                                                  0
                                                                      12
      4
                                 4+
                                                  0
                                                                       8
         Product_Category_2 Product_Category_3 Purchase
      0
                        NaN
                                             NaN
                                                      8370
                        6.0
                                            14.0
      1
                                                     15200
      2
                                             NaN
                                                      1422
                        NaN
      3
                       14.0
                                             {\tt NaN}
                                                      1057
      4
                        NaN
                                             NaN
                                                      7969
[90]: df.info()
     <class 'pandas.core.frame.DataFrame'>
     RangeIndex: 550068 entries, 0 to 550067
     Data columns (total 12 columns):
      #
          Column
                                       Non-Null Count
                                                         Dtype
          _____
                                       _____
      0
          User_ID
                                       550068 non-null
                                                         int64
      1
          Product_ID
                                       550068 non-null
                                                         object
      2
                                       550068 non-null
          Gender
                                                        object
      3
          Age
                                       550068 non-null
                                                         object
      4
                                       550068 non-null
          Occupation
                                                         int64
      5
          City_Category
                                       550068 non-null
                                                        object
      6
          Stay_In_Current_City_Years
                                       550068 non-null
                                                        object
      7
          Marital_Status
                                       550068 non-null
                                                         int64
      8
          Product_Category_1
                                       550068 non-null
                                                         int64
          Product_Category_2
                                       376430 non-null
                                                        float64
      10 Product_Category_3
                                       166821 non-null
                                                        float64
```

```
dtypes: float64(2), int64(5), object(5)
     memory usage: 50.4+ MB
[91]: df.describe()
[91]:
                                           Marital Status Product Category 1 \
                  User ID
                               Occupation
             5.500680e+05
                            550068.000000
                                             550068.000000
                                                                 550068.000000
      count
             1.003029e+06
                                 8.076707
                                                  0.409653
                                                                       5.404270
      mean
      std
             1.727592e+03
                                 6.522660
                                                  0.491770
                                                                       3.936211
             1.000001e+06
      min
                                 0.000000
                                                  0.000000
                                                                       1.000000
      25%
             1.001516e+06
                                 2.000000
                                                  0.000000
                                                                       1.000000
      50%
             1.003077e+06
                                 7.000000
                                                  0.000000
                                                                       5.000000
             1.004478e+06
      75%
                                14.000000
                                                  1.000000
                                                                       8.000000
             1.006040e+06
                                20.000000
                                                  1.000000
                                                                      20.000000
      max
             Product_Category_2 Product_Category_3
                                                            Purchase
                  376430.000000
                                       166821.000000
                                                       550068.000000
      count
                                            12.668243
      mean
                        9.842329
                                                         9263.968713
      std
                        5.086590
                                             4.125338
                                                         5023.065394
      min
                        2.000000
                                             3.000000
                                                           12.000000
      25%
                        5.000000
                                             9.000000
                                                         5823.000000
      50%
                        9.000000
                                            14.000000
                                                         8047.000000
      75%
                       15.000000
                                            16.000000
                                                        12054.000000
                       18,000000
                                            18,000000
                                                        23961.000000
      max
[92]: # Droping unnecessasary columns
      df.drop(['User_ID'],axis=1,inplace=True)
[93]: # finding the null values
      df.isnull().sum()
[93]: Product_ID
                                          0
      Gender
                                          0
      Age
                                          0
                                          0
      Occupation
      City_Category
                                          0
      Stay_In_Current_City_Years
                                          0
      Marital Status
                                          0
      Product_Category_1
                                          0
      Product Category 2
                                     173638
      Product_Category_3
                                     383247
      Purchase
                                          0
      dtype: int64
[94]: #converting categorical data to numerical data
      pd.get_dummies(df['Gender'],drop_first=1)
```

550068 non-null int64

11 Purchase

```
[94]:
                  Μ
      0
              False
      1
              False
      2
              False
      3
              False
      4
               True
               True
      550063
      550064
             False
      550065
              False
      550066
             False
      550067 False
      [550068 rows x 1 columns]
```

# handling categorical data

```
[95]: # handling Gender columns
      df['Gender'] = df['Gender'].map({'F':0,'M':1})
[96]: df.head()
[96]:
        Product_ID Gender
                              Age
                                   Occupation City_Category
      0 P00069042
                         0 0-17
                                           10
      1 P00248942
                         0 0-17
                                           10
                                                           Α
      2 P00087842
                         0 0-17
                                           10
                                                           Α
      3 P00085442
                           0-17
                                           10
                                                           Α
      4 P00285442
                             55+
                                           16
        Stay_In_Current_City_Years
                                    Marital_Status
                                                    Product_Category_1
      0
                                  2
                                                  0
                                                                       1
      1
      2
                                  2
                                                  0
                                                                      12
      3
                                  2
                                                  0
                                                                      12
      4
                                 4+
         Product_Category_2 Product_Category_3 Purchase
      0
                                             NaN
                                                      8370
                        NaN
                                            14.0
      1
                        6.0
                                                     15200
      2
                        NaN
                                             NaN
                                                      1422
      3
                       14.0
                                             NaN
                                                      1057
                        NaN
                                             NaN
                                                       7969
[97]: # handling categorical Age col
      df['Age'].unique()
```

```
[97]: array(['0-17', '55+', '26-35', '46-50', '51-55', '36-45', '18-25'],
             dtype=object)
 [99]: df['Age']=df['Age'].map({'0-17':1,'18-25':2,'26-35':3,'36-45':4,'46-50':
        \hookrightarrow 5, '51-55':6, '55+':7})
[100]: df.head()
[100]:
                              Age Occupation City_Category
         Product_ID Gender
       0 P00069042
                           0
                                1
                                           10
       1 P00248942
                           0
                                1
                                           10
                                                           Α
       2 P00087842
                           0
                                1
                                           10
                                                           Α
       3 P00085442
                           0
                                1
                                           10
                                                           Α
       4 P00285442
                           1
                                7
                                           16
                                                           С
         Stay_In_Current_City_Years Marital_Status Product_Category_1 \
       0
                                   2
                                                    0
                                   2
                                                    0
       1
                                                                         1
       2
                                   2
                                                    0
                                                                        12
       3
                                   2
                                                    0
                                                                        12
       4
                                                                         8
                                  4+
                                                    0
          Product_Category_2 Product_Category_3 Purchase
                                                        8370
       0
       1
                          6.0
                                              14.0
                                                       15200
       2
                         NaN
                                              NaN
                                                        1422
                         14.0
                                                        1057
       3
                                              NaN
       4
                         NaN
                                              NaN
                                                        7969
[101]: df_city = pd.get_dummies(df['City_Category'], drop_first=True).astype(int)
[102]: df_city.head()
[102]:
          В
             C
          0
             0
       1
          0
            0
       2
         0 0
       3 0
             0
          0 1
[103]: df=pd.concat([df,df_city],axis=1)
[104]: df.drop(['City_Category'],axis=1,inplace=True)
[105]: df.head()
         Product_ID Gender Age Occupation Stay_In_Current_City_Years \
[105]:
       0 P00069042
                           0
                                1
                                           10
```

```
1 P00248942
                   0
                        1
                                    10
                                                                2
2 P00087842
                   0
                                                                2
                        1
                                    10
3 P00085442
                                                                2
                   0
                        1
                                    10
                        7
4 P00285442
                   1
                                    16
                                                               4+
                  Product_Category_1 Product_Category_2 Product_Category_3 \
   Marital_Status
0
                                     3
                                                       NaN
1
                0
                                    1
                                                       6.0
                                                                           14.0
2
                0
                                    12
                                                       NaN
                                                                            NaN
3
                0
                                    12
                                                      14.0
                                                                            NaN
4
                0
                                     8
                                                       NaN
                                                                            NaN
   Purchase B
                С
       8370 0 0
0
1
      15200 0 0
2
       1422
            0 0
3
       1057
             0
                0
4
       7969 0 1
```

## 2 Handling the Missing values

```
[106]: nullval=df.isnull().sum()
[107]: #Replacing Missing values
       df['Product_Category_2'].unique()
[107]: array([nan, 6., 14., 2., 8., 15., 16., 11., 5., 3., 4., 12., 9.,
              10., 17., 13., 7., 18.])
[108]: df['Product_Category_2'].value_counts()
[108]: Product_Category_2
       8.0
               64088
       14.0
               55108
       2.0
               49217
       16.0
               43255
       15.0
               37855
       5.0
               26235
       4.0
               25677
       6.0
               16466
       11.0
               14134
       17.0
               13320
       13.0
               10531
       9.0
               5693
       12.0
                5528
       10.0
                3043
```

```
3.0
                2884
       18.0
                2770
       7.0
                 626
       Name: count, dtype: int64
[109]: # Rplacing the null values with mode
       df['Product_Category_2']=df['Product_Category_2'].

¬fillna(df['Product_Category_2'].mode()[0])
[110]: # checking the null values in col
       df['Product_Category_2'].isnull().sum()
[110]: 0
[111]: #Replacing the null Values in Product category 3
       df['Product_Category_3'].value_counts()
[111]: Product_Category_3
       16.0
               32636
       15.0
               28013
       14.0
               18428
       17.0
               16702
      5.0
               16658
      8.0
               12562
      9.0
               11579
      12.0
               9246
       13.0
               5459
      6.0
               4890
       18.0
                4629
      4.0
                1875
       11.0
                1805
       10.0
                1726
       3.0
                 613
       Name: count, dtype: int64
[112]: #Replacing the missing values with mode
       df['Product_Category_3']=df['Product_Category_3'].

→fillna(df['Product_Category_3'].mode()[0])
[113]: # checking the null values in Product category col 3
       df['Product_Category_3'].isnull().sum()
[113]: 0
[114]: df['Stay_In_Current_City_Years'].unique()
[114]: array(['2', '4+', '3', '1', '0'], dtype=object)
```

```
[115]: #Replacing the 4+ with 4
df['Stay_In_Current_City_Years'] = df['Stay_In_Current_City_Years'].str.

→replace('+', '')
```

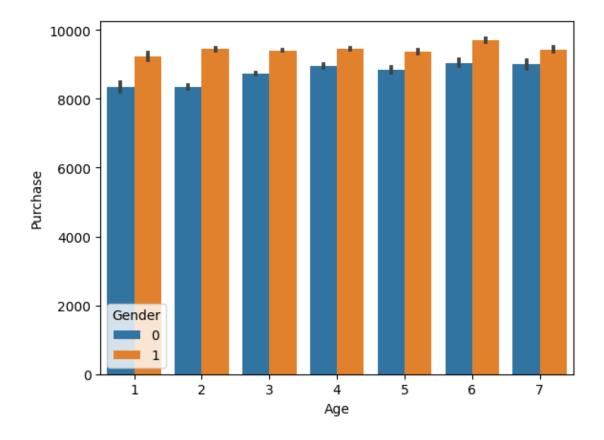
```
[116]: #converting object to integer

df['Stay_In_Current_City_Years']=df['Stay_In_Current_City_Years'].astype(int)
```

### 3 Visualization

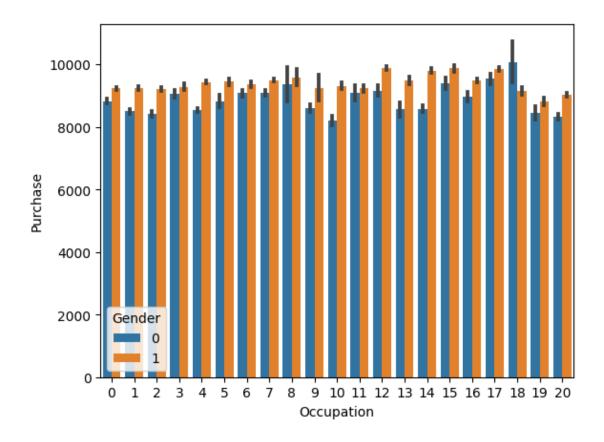
```
[117]: #bar plot cmparing 'Age' and 'Purchase'
sns.barplot(x='Age', y='Purchase', hue='Gender', data=df)
```

[117]: <Axes: xlabel='Age', ylabel='Purchase'>



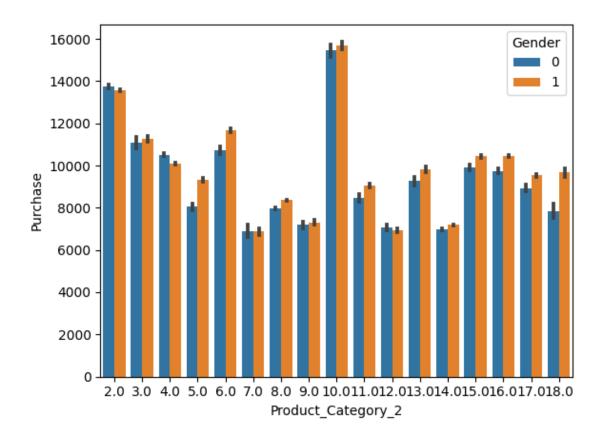
```
[118]: #Visualization of purchase with occupation
sns.barplot(x='Occupation',y='Purchase',hue='Gender',data=df)
```

[118]: <Axes: xlabel='Occupation', ylabel='Purchase'>



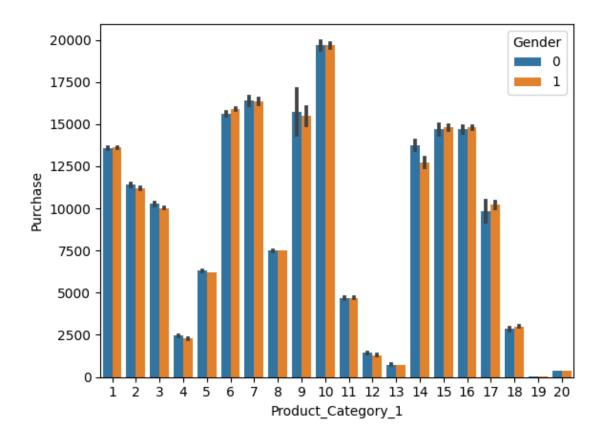
```
[119]: sns.barplot(x='Product_Category_2',y='Purchase',hue='Gender',data=df)
```

[119]: <Axes: xlabel='Product\_Category\_2', ylabel='Purchase'>



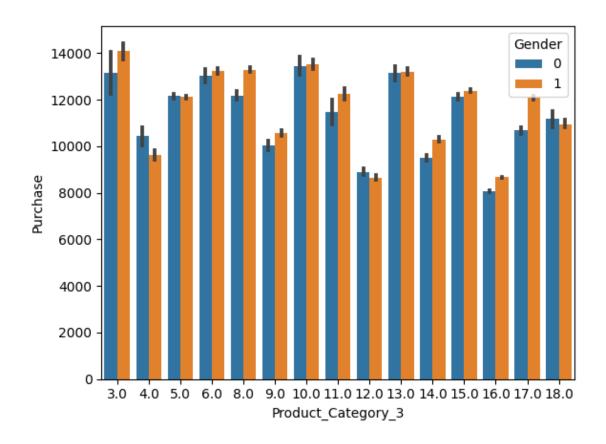
```
[120]: sns.barplot(x='Product_Category_1',y='Purchase',hue='Gender',data=df)
```

[120]: <Axes: xlabel='Product\_Category\_1', ylabel='Purchase'>



```
[121]: sns.barplot(x='Product_Category_3',y='Purchase',hue='Gender',data=df)
```

[121]: <Axes: xlabel='Product\_Category\_3', ylabel='Purchase'>



# 4 Feature Scaling

```
[122]: df_test=df[df['Purchase'].isnull()]
[123]: df_train=df[~df['Purchase'].isnull()]
[129]: X=df_train.drop('Purchase',axis=1)
       X.head()
       X.shape
[129]: (550068, 11)
[132]: Y=df_train['Purchase']
       Y
[132]: 0
                  8370
       1
                 15200
       2
                   1422
                   1057
       3
       4
                  7969
```

```
550063
                368
     550064
                371
     550065
                137
     550066
                365
     550067
                490
     Name: Purchase, Length: 550068, dtype: int64
[133]: from sklearn.model_selection import train_test_split
     X_train,X_test,Y_train,Y_test=train_test_split(X,Y,test_size=0.
      →33,random_state=42)
[134]: X_train.drop('Product_ID',axis=1,inplace=True)
     X_test.drop('Product_ID',axis=1,inplace=True)
[136]: from sklearn.preprocessing import StandardScaler
     sc=StandardScaler()
     X_train=sc.fit_transform(X_train)
     X_test=sc.fit_transform(X_test)
[137]: print(X train)
     -0.67282374]
      -0.67282374]
      [ 0.57141282  0.37105599  1.36872445 ... -1.09182956 -0.85056064
        1.48627336]
      [-1.75004823 -1.10505734 -1.08485545 ... 0.36891877 1.17569512
      -0.67282374]
      [-1.75004823 -1.10505734 -0.62480922 ... 0.36891877 1.17569512
      -0.67282374
      [-1.75004823 -1.10505734 -0.93150671 ... 0.36891877 -0.85056064
      -0.67282374]]
[138]: print(X_test)
     1.490841 ]
      [-1.73937798 0.37396835 0.44724923 ... 0.36853635 1.1720971
       -0.67076234]
      [-1.73937798 \quad 0.37396835 \quad -1.23835749 \dots \quad 0.36853635 \quad -0.85317164
      -0.67076234]
       [ \ 0.57491817 \ -1.10638572 \ -0.93188354 \ \dots \ \ 0.36853635 \ -0.85317164 
        1.490841 ]
```

```
1.490841 ]
[ 0.57491817 -1.10638572 -0.62540959 ... 0.36853635 1.1720971 -0.67076234]]
```

[]: