Business Problem

The Management team at Walmart Inc. wants to analyze the customer purchase behavior (specifically, purchase amount) against the customer's gender and the various other factors to help the business make better decisions. They want to understand if the spending habits differ between male and female customers: Do women spend more on Black Friday than men? (Assume 50 million customers are male and 50 million are female).

```
In [1]: import pandas as pd import numpy as np import matplotlib.pyplot as plt import seaborn as sns
```

In [2]: WM = pd.read_csv(r"H:\Scaler\Confidence Interval\walmart_data.csv")

In [3]: #Checking the dataset
WM.head()

Out[3]:

	User_ID	Product_ID	Gender	Age	Occupation	City_Category	Stay_In_Current_City_Years	Marital_Status	Product_Category	Purchase
0	1000001	P00069042	F	0-17	10	Α	2	0	3	8370
1	1000001	P00248942	F	0-17	10	Α	2	0	1	15200
2	1000001	P00087842	F	0-17	10	Α	2	0	12	1422
3	1000001	P00085442	F	0-17	10	Α	2	0	12	1057
4	1000002	P00285442	М	55+	16	С	4+	0	8	7969

In [4]: #Checking the info

WM.info()

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 550068 entries, 0 to 550067
```

Data	columns (total 10 columns):		
#	Column	Non-Null Count	Dtype
0	User_ID	550068 non-null	int64
1	Product_ID	550068 non-null	object
2	Gender	550068 non-null	object
3	Age	550068 non-null	object
4	Occupation	550068 non-null	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	550068 non-null	int64
9	Purchase	550068 non-null	int64

dtypes: int64(5), object(5)
memory usage: 42.0+ MB

The data set contains 10 columns. The data type of columms is split between int64 and object. The columns User_ID,Occupation ,Marital_Status ,Product_Category & Purchase belong to int64 The columns Product_ID,Gender,Age,City_Category & Stay_In_Current_City_Years belong to the object category. There are no null values in all the columns

```
In [5]: WM.shape
Out[5]: (550068, 10)
```

The dataset has 550068 rows and 10 columns

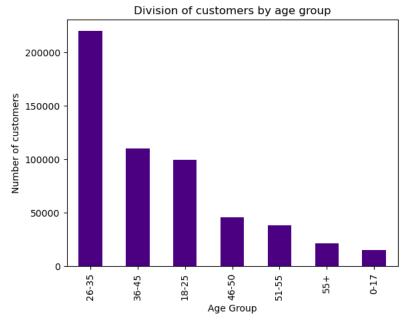
```
In [6]: WM.describe()
```

Out[6]:

	User_ID	Occupation	Marital_Status	Product_Category	Purchase
count	5.500680e+05	550068.000000	550068.000000	550068.000000	550068.000000
mean	1.003029e+06	8.076707	0.409653	5.404270	9263.968713
std	1.727592e+03	6.522660	0.491770	3.936211	5023.065394
min	1.000001e+06	0.000000	0.000000	1.000000	12.000000
25%	1.001516e+06	2.000000	0.000000	1.000000	5823.000000
50%	1.003077e+06	7.000000	0.000000	5.000000	8047.000000
75%	1.004478e+06	14.000000	1.000000	8.000000	12054.000000
max	1.006040e+06	20.000000	1.000000	20.000000	23961.000000

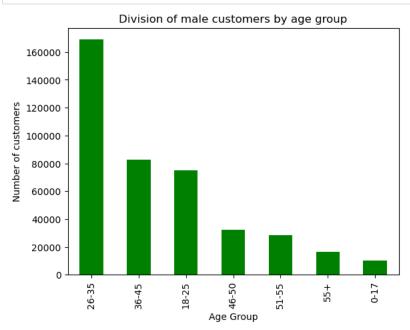
```
In [7]: WM.tail()
 Out[7]:
                   User_ID Product_ID
                                     Gender
                                              Age Occupation City_Category
                                                                            Stay_In_Current_City_Years Marital_Status Product_Category
                                                                                                                                  Purchase
                           P00372445
                                             51-55
                                                           13
                                                                         В
                                                                                                                               20
                                                                                                                                        368
           550063
                  1006033
                                                                         С
                                                                                                                0
           550064
                  1006035
                           P00375436
                                             26-35
                                                                                                  3
                                                                                                                               20
                                                                                                                                        371
                           P00375436
           550065 1006036
                                             26-35
                                                           15
                                                                         В
                                                                                                                               20
                                                                                                                                        137
           550066 1006038
                           P00375436
                                                                         С
                                                                                                  2
                                                                                                                0
                                                                                                                               20
                                               55+
                                                                                                                                        365
           550067 1006039
                           P00371644
                                           F 46-50
                                                            0
                                                                         В
                                                                                                 4+
                                                                                                                1
                                                                                                                               20
                                                                                                                                        490
 In [8]: WM.mode()
 Out[8]:
              User ID Product ID Gender
                                         Age Occupation City_Category Stay_In_Current_City_Years Marital_Status Product_Category Purchase
           0 1001680
                      P00265242
                                                                                                                                  7011
                                      M 26-35
                                                                    В
                                                                                                           0
 In [9]: WM.median()
          C:\Users\india\AppData\Local\Temp\ipykernel_17652\2619744334.py:1: FutureWarning: Dropping of nuisance columns in DataFrame red
          uctions (with 'numeric_only=None') is deprecated; in a future version this will raise TypeError. Select only valid columns bef
          ore calling the reduction.
            WM.median()
 Out[9]: User_ID
                                1003077.0
          Occupation
                                      7.0
          Marital Status
                                       0.0
          Product_Category
                                       5.0
          Purchase
                                   8047.0
          dtype: float64
In [10]: #Creating a dataset for male customers
          WMM = WM[WM['Gender']=='M']
In [11]: WMM.head()
Out[11]:
             User ID Product ID Gender
                                         Age Occupation City_Category Stay_In_Current_City_Years Marital_Status Product_Category Purchase
           4 1000002
                      P00285442
                                          55+
                                                      16
                                                                    C
                                                                                            4+
                                                                                                           0
                                                                                                                                  7969
                      P00193542
                                                      15
                                                                                             3
                                                                                                           0
                                                                                                                                 15227
           5
             1000003
                                     M 26-35
                                                                    Α
                                                                                                                           1
                                                                    В
                                                                                             2
             1000004
                      P00184942
                                     M 46-50
                                                                                                                           1
                                                                                                                                 19215
                      P00346142
                                                                    В
                                                                                                                                 15854
             1000004
                                     M 46-50
                                                                                                           1
                                                                    В
                                                                                             2
                                                                                                                                 15686
             1000004
                       P0097242
                                     M 46-50
          Creating a dataset for female customers
In [12]: WMF = WM[WM['Gender']=='F']
In [13]: WMF.head()
Out[13]:
               User_ID Product_ID Gender
                                           Age Occupation City_Category Stay_In_Current_City_Years Marital_Status
                                                                                                              Product_Category
                                                                                                                               Purchase
            0 1000001
                       P00069042
                                          0-17
                                                       10
                                                                     Α
                                                                                              2
                                                                                                            0
                                                                                                                            3
                                                                                                                                   8370
              1000001
                       P00248942
                                          0-17
                                                       10
                                                                     Α
                                                                                              2
                                                                                                            0
                                                                                                                                  15200
                                                                                                                            1
            2 1000001
                       P00087842
                                          0-17
                                                       10
                                                                     Α
                                                                                              2
                                                                                                            0
                                                                                                                           12
                                                                                                                                   1422
              1000001
                       P00085442
                                          0-17
                                                       10
                                                                     Α
                                                                                              2
                                                                                                            0
                                                                                                                           12
                                                                                                                                   1057
           14 1000006 P00231342
                                       F 51-55
                                                        9
                                                                     Α
                                                                                                            0
                                                                                                                            5
                                                                                                                                   5378
In [52]: def find_outliers_IQR(df):
              q1 = df.quantile(0.25)
              q3 = df.quantile(0.75)
              IQR = q3-q1
              outliers = df[((df<(q1-1.5*IQR)) | (df>(q3+1.5*IQR)))]
              return outliers
```

```
In [15]: WM['Age'].value_counts()
Out[15]: 26-35
                  219587
                  110013
         36-45
                   99660
         18-25
                   45701
         46-50
         51-55
                   38501
                   21504
         55+
                   15102
         0-17
         Name: Age, dtype: int64
In [16]: WM['Age'].value_counts().plot(kind='bar',color='indigo')
         plt.xlabel('Age Group')
         plt.ylabel('Number of customers')
         plt.title('Division of customers by age group')
         plt.show()
```

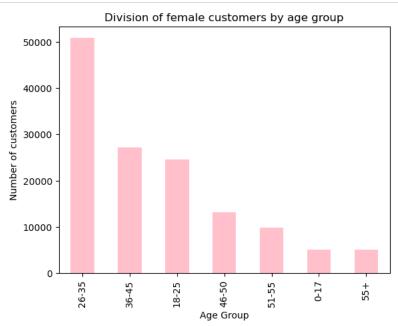


```
In [17]: WMM['Age'].value_counts()
Out[17]: 26-35
                   168835
         36-45
                   82843
         18-25
                    75032
         46-50
                    32502
         51-55
                    28607
         55+
                    16421
         0-17
                   10019
         Name: Age, dtype: int64
```

```
In [18]: WMM['Age'].value_counts().plot(kind='bar',color='green')
    plt.xlabel('Age Group')
    plt.ylabel('Number of customers')
    plt.title('Division of male customers by age group')
    plt.show()
```



```
In [19]: WMF['Age'].value_counts()
Out[19]: 26-35
                  50752
                  27170
         36-45
         18-25
                  24628
         46-50
                  13199
         51-55
                   9894
         0-17
                   5083
         55+
                   5083
         Name: Age, dtype: int64
In [20]: WMF['Age'].value_counts().plot(kind='bar',color='pink')
         plt.xlabel('Age Group')
         plt.ylabel('Number of customers')
         plt.title('Division of female customers by age group')
         plt.show()
```



```
In [21]: import seaborn as sns
In [23]: round(WM['Occupation'].mean(),2)
Out[23]: 8.08
In [27]: WM['Occupation'].mode()
Out[27]: 0
              4
          Name: Occupation, dtype: int64
In [25]: WM['Occupation'].median()
Out[25]: 7.0
In [29]: WM.isnull().sum()
Out[29]: User_ID
                                          0
          Product_ID
                                          0
          Gender
                                          0
          Age
          Occupation
                                          0
          City_Category
Stay_In_Current_City_Years
Marital_Status
                                          0
                                          0
          Product_Category
                                          0
          Purchase
                                          0
          dtype: int64
          There are no null values in the dataset
In [44]: sns.boxplot(y=WM['Occupation'])
          plt.show()
              20.0
              17.5
              15.0
              12.5
           12.5
10.0
7.5
               7.5
               5.0
               2.5
                0.0
```

```
In [42]: sns.boxplot(y=WM['Product_Category'])
         plt.show()
              20.0
                                                    •
             17.5
             15.0
           Product_Category
0.01 _
2.7
2.7
               5.0
               2.5
In [43]: sns.boxplot(y=WM['Purchase'])
         plt.show()
              25000
              20000
             15000
          Purchase
00001
               5000
                  0
In [54]: PC_outliers = find_outliers_IQR(WM['Product_Category'])
         print('number of outliers: '+ str(len(PC_outliers)))
         print('max outlier value: '+ str(PC_outliers.max()))
         print('min outlier values: '+ str(PC_outliers.min()))
         number of outliers: 4153
         max outlier value: 20
         min outlier values: 19
In [55]: Purchase_outliers = find_outliers_IQR(WM['Purchase'])
         print('number of outliers: '+ str(len(Purchase_outliers)))
         print('max outlier value: '+ str(Purchase_outliers.max()))
         print('min outlier values: '+ str(Purchase_outliers.min()))
         number of outliers: 2677
         max outlier value: 23961
         min outlier values: 21401
In [56]: WMMD = WMM = WM[WM['Marital_Status']==1]
```

```
In [57]: WMMD
Out[57]:
                                               Age Occupation City_Category
                                                                            Stay_In_Current_City_Years Marital_Status Product_Category Purchase
                   User_ID Product_ID Gender
                  1000004
                           P00184942
                                           M 46-50
                                                                          В
                                                                                                  2
                                                                                                                                       19215
                  1000004
                           P00346142
                                                                         В
                                                                                                   2
                                           M 46-50
                                                                                                                                 1
                                                                                                                                       15854
                  1000004
                            P0097242
                                           M 46-50
                                                            7
                                                                         В
                                                                                                   2
                                                                                                                                       15686
                   1000005
                           P00274942
                                           M 26-35
                                                            20
                                                                                                                                        7871
               10
                  1000005
                           P00251242
                                           M 26-35
                                                           20
                                                                          Α
                                                                                                                                 5
                                                                                                                                        5254
                                                                         С
           550060 1006026
                           P00371644
                                           M 36-45
                                                            6
                                                                                                   1
                                                                                                                1
                                                                                                                                20
                                                                                                                                        494
           550061 1006029
                                           F 26-35
                                                                         С
                           P00372445
                                                            1
                                                                                                   1
                                                                                                                1
                                                                                                                                20
                                                                                                                                        599
           550063 1006033
                           P00372445
                                           M 51-55
                                                            13
                                                                         В
                                                                                                   1
                                                                                                                                20
                                                                                                                                        368
                                                                                                                1
           550065 1006036
                                           F 26-35
                                                            15
                                                                         В
                                                                                                                                20
                                                                                                                                        137
                           P00375436
                                                                                                  4+
                                                                                                                1
           550067 1006039 P00371644
                                                            0
                                                                         В
                                           F 46-50
                                                                                                  4+
                                                                                                                                20
                                                                                                                                        490
          225337 rows × 10 columns
In [58]: WMS = WMM = WM[WM['Marital_Status']==0]
In [59]: WMS
Out[59]:
                   User_ID Product_ID Gender
                                               Age Occupation City_Category Stay_in_Current_City_Years Marital_Status Product_Category Purchase
                  1000001
                           P00069042
                                              0-17
                                                            10
                                                                                                  2
                                                                                                                0
                                                                                                                                        8370
                1
                  1000001
                           P00248942
                                           F
                                              0-17
                                                            10
                                                                          Α
                                                                                                  2
                                                                                                                0
                                                                                                                                 1
                                                                                                                                       15200
               2
                  1000001
                           P00087842
                                           F
                                              0-17
                                                            10
                                                                         Α
                                                                                                  2
                                                                                                                0
                                                                                                                                12
                                                                                                                                        1422
                                                                                                                0
               3
                  1000001
                           P00085442
                                           F
                                              0-17
                                                           10
                                                                         Α
                                                                                                  2
                                                                                                                                12
                                                                                                                                        1057
                                                                         С
                  1000002
                                                                                                                0
                                                                                                                                 8
                4
                           P00285442
                                           Μ
                                               55+
                                                            16
                                                                                                  4+
                                                                                                                                        7969
           550056 1006022 P00375436
                                                            17
                                                                         С
                                                                                                  4+
                                                                                                                0
                                                                                                                                        254
                                           M 26-35
                                                                                                                                20
           550059 1006025
                           P00370853
                                           F 26-35
                                                                         В
                                                                                                                0
                                                                                                                                19
                                                                                                                                         48
                                                            1
                                                                                                   1
                                                            7
                                                                                                                0
           550062 1006032
                           P00372445
                                             46-50
                                                                         Α
                                                                                                  3
                                                                                                                                20
                                                                                                                                        473
                                                                         С
           550064 1006035
                           P00375436
                                             26-35
                                                            1
                                                                                                  3
                                                                                                                0
                                                                                                                                20
                                                                                                                                        371
           550066 1006038 P00375436
                                                                          С
                                               55+
                                                                                                                                20
                                                                                                                                        365
          324731 rows × 10 columns
In [60]: WM['Age'].value_counts()
Out[60]:
          26-35
                    219587
          36-45
                    110013
          18-25
                     99660
          46-50
                     45701
          51-55
                     38501
          55+
                     21504
          0-17
                     15102
          Name: Age, dtype: int64
In [61]: WMF.info()
          <class 'pandas.core.frame.DataFrame'>
          Int64Index: 135809 entries, 0 to 550067
          Data columns (total 10 columns):
           #
               Column
                                              Non-Null Count
                                                                 Dtype
           0
               User_ID
                                               135809 non-null
                                                                 int64
           1
               Product ID
                                               135809 non-null
                                                                 object
           2
               Gender
                                               135809 non-null
                                                                 object
           3
               Age
                                               135809 non-null
                                                                 object
           4
               Occupation
                                               135809 non-null
           5
               City_Category
                                               135809 non-null
                                                                 object
               Stay_In_Current_City_Years
                                              135809 non-null
           6
                                                                 object
               Marital_Status
                                               135809 non-null
                                                                 int64
               Product_Category
                                               135809 non-null
                                                                 int64
               Purchase
                                               135809 non-null
          dtypes: int64(5), object(5)
          memory usage: 11.4+ MB
```

```
In [62]: WMF['Purchase'].mean()
Out[62]: 8734.565765155476
In [63]: WMM['Purchase'].mean()
Out[63]: 9265.907618921507
```

```
CALCULATING CONFIDENCE INTERVAL
In [64]: #Upper limit of confidence interval
         CIU = (pm+((1.96*std)/np.sqrt(n)))
         #Lower limit of confidence interval
         CIL = (pm-((1.96*std)/np.sqrt(n)))
         NameError
                                                   Traceback (most recent call last)
         Cell In [64], line 2
               1 #Upper limit of confidence interval
         ----> 2 CIU = (pm+((1.96*std)/np.sqrt(n)))
               3 #Lower limit of confidence interval
               4 CIL = (pm-((1.96*std)/np.sqrt(n)))
         NameError: name 'pm' is not defined
In [65]: WMM.head()
Out[65]:
            User_ID Product_ID Gender Age Occupation City_Category Stay_In_Current_City_Years Marital_Status Product_Category Purchase
                                                                                     2
                                                                                                 0
                                                                                                                 3
                                                                                                                       8370
          0 1000001
                    P00069042
                                   F 0-17
                                                 10
                                                              Α
          1 1000001
                    P00248942
                                   F 0-17
                                                 10
                                                              Α
                                                                                     2
                                                                                                 0
                                                                                                                 1
                                                                                                                      15200
                    P00087842
                                                                                     2
                                                                                                 0
                                                                                                                12
                                                                                                                       1422
          2 1000001
                                   F 0-17
                                                 10
                                                              Α
          3 1000001 P00085442
                                                 10
                                                                                     2
                                                                                                 0
                                                                                                                12
                                                                                                                       1057
                                   F 0-17
                                                              Α
          4 1000002 P00285442
                                                              С
                                                                                    4+
                                                                                                 0
                                                                                                                 8
                                                                                                                       7969
                                  M 55+
                                                 16
In [86]: num_people = 10000
         num_samples = 100
         means = []
         stds = []
         for i in range(num_people):
             sample = WMM['Purchase'].sample(num_samples)
             means.append(round(sample.mean(),2))
             stds.append(round(sample.mean(),2))
In [87]: means
          9754.24,
          9482.01,
          9317.79,
          9811.35,
          9356.86,
          9441.75,
          9087.72,
          10247.84,
          8994.89,
          9596.52,
          8583.8,
          9206.52,
          9172.4,
          8948.49.
          8813.83,
          9152.45,
          9894.45,
          9845.82,
          9114.87,
          0761 0
In [88]: sum(means)/len(means)
```

Out[88]: 9259.461187999968

```
In [89]: WMM.describe()
Out[89]:
                      User_ID
                                  Occupation Marital_Status Product_Category
                                                                                Purchase
           count 3.247310e+05
                               324731.000000
                                                  324731.0
                                                              324731.000000
                                                                            324731.000000
                 1.002999e+06
                                    7.944782
           mean
                                                       0.0
                                                                   5.339059
                                                                              9265.907619
                                    6.402753
                 1.700466e+03
                                                       0.0
                                                                   3.912070
                                                                              5027.347859
                 1.000001e+06
                                    0.000000
                                                       0.0
                                                                   1.000000
                                                                                12.000000
             25% 1.001524e+06
                                    3.000000
                                                      0.0
                                                                   1.000000
                                                                              5605.000000
             50% 1.003065e+06
                                    7.000000
                                                      0.0
                                                                   5.000000
                                                                              8044.000000
                 1.004386e+06
                                   14.000000
                                                       0.0
                                                                   8.000000
                                                                             12061.000000
             max 1.006040e+06
                                   20.000000
                                                      0.0
                                                                  20.000000
                                                                             23961.000000
In [91]: #Calculation upper confidence interval.
          CIU = (9259.46+((1.96*5027.35)/np.sqrt(10000)))
Out[91]: 9357.99606
In [92]: #Calculation upper confidence interval.
          CIL = (9259.46-((1.96*5027.35)/np.sqrt(10000)))
Out[92]: 9160.923939999999
```

CALCULATION CONFIDENCE INTERVAL FOR WOMEN

```
In [78]: WMF.head()
Out[78]:
               User_ID Product_ID Gender
                                             Age Occupation City_Category Stay_In_Current_City_Years Marital_Status Product_Category
            0 1000001
                        P00069042
                                             0-17
               1000001
                        P00248942
                                            0-17
                                                          10
                                                                         Α
                                                                                                   2
                                                                                                                 0
                                                                                                                                  1
                                                                                                                                         15200
                                                                                                   2
               1000001
                        P00087842
                                            0-17
                                                          10
                                                                         Α
                                                                                                                 0
                                                                                                                                 12
                                                                                                                                         1422
               1000001 P00085442
                                            0-17
                                                          10
                                                                         Α
                                                                                                   2
                                                                                                                 0
                                                                                                                                 12
                                                                                                                                         1057
                                        F 51-55
               1000006 P00231342
                                                                         Α
                                                                                                                 0
                                                                                                                                  5
                                                                                                                                         5378
In [80]: WMF.describe()
Out[80]:
                       User ID
                                  Occupation Marital_Status Product_Category
                                                                                  Purchase
                                                                             135809.000000
           count 1.358090e+05 135809.000000
                                              135809.000000
                                                               135809.000000
                  1.003130e+06
                                    6.740540
                                                   0.419619
                                                                    5.717714
                                                                                8734.565765
            mean
                  1.786631e+03
                                    6.239639
                                                   0.493498
                                                                    3.696752
                                                                                4767.233289
             std
             min
                 1.000001e+06
                                    0.000000
                                                   0.000000
                                                                    1.000000
                                                                                  12.000000
                  1.001569e+06
                                     1.000000
                                                   0.000000
                                                                    3.000000
                                                                                5433.000000
                  1.003159e+06
                                    4.000000
                                                   0.000000
                                                                    5.000000
                                                                                7914.000000
             75%
                  1.004765e+06
                                    11.000000
                                                   1.000000
                                                                    8.000000
                                                                               11400.000000
             max 1.006039e+06
                                    20.000000
                                                   1.000000
                                                                   20.000000
                                                                              23959.000000
In [93]: num_people = 10000
           num\_samples = 100
           means = []
           for i in range(num_people):
               sample = WMF['Purchase'].sample(num_samples)
               means.append(round(sample.mean(),2))
```

stds.append(round(sample.mean(),2))

```
In [94]: means
 Out[94]: [8721.82,
           8764.7,
           7969.66,
           8602.68,
           8840.88,
           8669.69,
           8379.92,
           9146.52,
           8758.54,
           9409.04,
           8264.77,
           8449.71,
           8232.15,
           9037.7,
           8891.59,
           8844.69,
           8895.26,
           8656.91,
           9611.71,
 In [95]: sum(means)/len(means)
Out[95]: 8731.888943999973
In [100]: #Calculation upper confidence interval.
          WCIU = (8731.88+((1.96*4767.23)/np.sqrt(10000)))
          round(WCIU,2)
Out[100]: 8825.32
In [101]: #Calculation lower confidence interval.
          WCLU = (8731.88-((1.96*4767.23)/np.sqrt(10000)))
          round(WCLU,2)
Out[101]: 8638.44
```

For men the 95% confidence interval is between 9160.92 & 9357.99 For women the confidence interval is between 8638.44 & 8825.32 This indicates that men are likely to spend more on Purchase than women

CREATING A DATASET FOR MARRIED AND UNMARRIED CUSTOMERS Married = 1 and dataset = WMMD Unmarried = 0 and dataset = WMS

In [103]: WMMD.head()

Out[103]:

	User_ID	Product_ID	Gender	Age	Occupation	City_Category	Stay_In_Current_City_Years	Marital_Status	Product_Category	Purchase
6	1000004	P00184942	М	46-50	7	В	2	1	1	19215
7	1000004	P00346142	М	46-50	7	В	2	1	1	15854
8	1000004	P0097242	М	46-50	7	В	2	1	1	15686
9	1000005	P00274942	М	26-35	20	Α	1	1	8	7871
10	1000005	P00251242	М	26-35	20	Α	1	1	5	5254

In [104]: WMS.head()

Out[104]:

	User_ID	Product_ID	Gender	Age	Occupation	City_Category	Stay_In_Current_City_Years	Marital_Status	Product_Category	Purchase
0	1000001	P00069042	F	0-17	10	Α	2	0	3	8370
1	1000001	P00248942	F	0-17	10	Α	2	0	1	15200
2	1000001	P00087842	F	0-17	10	Α	2	0	12	1422
3	1000001	P00085442	F	0-17	10	Α	2	0	12	1057
4	1000002	P00285442	М	55+	16	C	4+	0	8	7969

```
In [105]: WMMD.describe()
Out[105]:
                      User_ID
                                 Occupation Marital_Status Product_Category
                                                                             Purchase
            count 2.253370e+05 225337.000000
                                                225337.0
                                                            225337.000000
                                                                         225337.000000
            mean 1.003071e+06
                                   8.266823
                                                     1.0
                                                                           9261.174574
                                                                 5.498245
              std 1.765091e+03
                                   6.687118
                                                     0.0
                                                                 3.968868
                                                                           5016.897378
                 1.000004e+06
                                   0.000000
                                                     1.0
                                                                 1.000000
                                                                             12.000000
             min
             25% 1.001506e+06
                                   2.000000
                                                     1.0
                                                                 2.000000
                                                                           5843.000000
             50% 1.003093e+06
                                   7.000000
                                                     1.0
                                                                 5.000000
                                                                           8051.000000
             75% 1.004647e+06
                                  14.000000
                                                     1.0
                                                                 8.000000
                                                                          12042.000000
             max 1.006039e+06
                                  20.000000
                                                     1.0
                                                                20.000000
                                                                          23961.000000
In [106]: num_people = 10000
           num_samples = 100
           means = []
           stds = []
           for i in range(num_people):
               sample = WMMD['Purchase'].sample(num_samples)
               means.append(round(sample.mean(),2))
               stds.append(round(sample.mean(),2))
In [107]: means
            9155.79,
            8386.68,
            10085.47,
            9221.08,
            8806.89,
            9531.5,
            10334.29.
            9310.02,
            9835.62,
            9600.04,
            9267.64,
            8911.0.
            8846.98,
            10538.93,
            9212.75,
            8768.83,
            9688.71,
            8386.66,
            9778.48,
            0600 05
In [109]: round(sum(means)/len(means),2)
Out[109]: 9264.05
In [111]: #Calculation upper confidence interval.
           MCIU = (9264.05+((1.96*5016.90)/np.sqrt(10000)))
           round(WCIU,2)
Out[111]: 9362.38
In [113]: #Calculation lower confidence interval.
           MCIL = (9264.05-((1.96*5016.90)/np.sqrt(10000)))
           round(MCIL,2)
Out[113]: 9165.72
           For singles
In [114]: num_people = 10000
           num_samples = 100
           means = []
           stds = []
           for i in range(num_people):
               sample = WMS['Purchase'].sample(num_samples)
               means.append(round(sample.mean(),2))
               stds.append(round(sample.mean(),2))
```

```
In [115]: means
            9716.48,
            9087.42,
            9478.86,
            9612.14,
            9366.44,
            8725.42,
            9118.07,
            10078.16,
            9016.3,
            9455.98,
            10217.21,
            8892.04,
            8697.15,
            9130.1,
            10352.34,
            8860.88,
            9816.81,
            8881.55,
            8431.82.
            9711 58
In [116]: sum(means)/len(means)
Out[116]: 9272.273515999941
           WMS
In [117]: WMS.describe()
Out[117]:
                       User_ID
                                  Occupation Marital_Status Product_Category
                                                                                Purchase
            count 3.247310e+05 324731.000000
                                                  324731.0
                                                              324731.000000 324731.000000
            mean 1.002999e+06
                                    7.944782
                                                      0.0
                                                                  5.339059
                                                                             9265.907619
              std 1.700466e+03
                                    6.402753
                                                      0.0
                                                                  3.912070
                                                                             5027.347859
              min 1.000001e+06
                                    0.000000
                                                      0.0
                                                                  1.000000
                                                                               12.000000
             25% 1.001524e+06
                                    3.000000
                                                                             5605.000000
                                                      0.0
                                                                   1.000000
             50% 1.003065e+06
                                    7.000000
                                                      0.0
                                                                  5.000000
                                                                             8044.000000
             75% 1.004386e+06
                                   14.000000
                                                      0.0
                                                                  8.000000
                                                                            12061.000000
             max 1.006040e+06
                                   20.000000
                                                      0.0
                                                                 20.000000
                                                                            23961.000000
In [118]: #Calculation upper confidence interval.
           SCIU = (9272.27+((1.96*5027.35)/np.sqrt(10000)))
           round(SCIU,2)
Out[118]: 9370.81
In [119]: #Calculation upper confidence interval.
           SCIL = (9272.27-((1.96*5027.35)/np.sqrt(10000)))
           round(SCIL,2)
Out[119]: 9173.73
           For married customers the confidence interval is between 9165.72 & 9362.38 For single customers the confidence interval is between 9173.73 & 9370.81 The
           range is almost the same between married and single customers with single customers being slightly higher than the married customers
In [120]: WM['Age'].value_counts()
Out[120]: 26-35
                     219587
           36-45
                     110013
           18-25
                      99660
                      45701
           46-50
           51-55
                      38501
           55+
                      21504
           0-17
                      15102
           Name: Age, dtype: int64
In [122]: WM0_17 = WM[WM['Age']=='0-17']
```

In [124]: WM18_25 = WM[WM['Age']=='18-25']

In [125]: $WM26_35 = WM[WM['Age'] == '26-35']$

```
In [126]: WM36_45 = WM[WM['Age']=='36-45']
In [127]: WM46_50 = WM[WM['Age']=='46-50']
In [128]: WM51_55 = WM[WM['Age']=='51-55']
In [129]: WM55 = WM[WM['Age']=='55+']
           Calculating confidence interval for 0-17
In [131]: num people = 10000
           num\_samples = 100
           means = []
           stds = []
           for i in range(num_people):
               sample = WM0_17['Purchase'].sample(num_samples)
               means.append(round(sample.mean(),2))
               stds.append(round(sample.mean(),2))
In [132]: means
           8234.1/,
            9164.98,
            8551.08,
            9281.22,
            8624.8,
            8898.82,
            8560.64,
            9493.37.
            9033.54,
            8235.63,
            9042.51,
            8578.44,
            8482.57,
            9736.79,
            8545.48,
            9793.01,
            8728.93.
            8548.4,
            8165.24,
            8006.28,
In [136]: round(sum(means)/len(means),2)
Out[136]: 8937.97
In [135]: WM0_17.describe()
Out[135]:
                                Occupation Marital_Status Product_Category
                      User ID
                                                                           Purchase
           count 1.510200e+04 15102.000000
                                                15102.0
                                                            15102.000000 15102.000000
            mean 1.002722e+06
                                  8.761025
                                                               5.083764
                                                                         8933.464640
                                                    0.0
              std 1.776555e+03
                                  4.500672
                                                    0.0
                                                               3.800040
                                                                         5111.114046
             min 1.000001e+06
                                  0.000000
                                                    0.0
                                                               1.000000
                                                                           12.000000
             25% 1.001263e+06
                                 10.000000
                                                    0.0
                                                               2.000000
                                                                         5328.000000
             50% 1.002137e+06
                                 10.000000
                                                    0.0
                                                               5.000000
                                                                         7986.000000
             75% 1.004493e+06
                                 10.000000
                                                    0.0
                                                               8.000000 11874.000000
             max 1.006006e+06
                                 19.000000
                                                    0.0
                                                               20.000000 23955.000000
In [137]: #Calculation upper confidence interval.
           WMO_17CIU = (8937.97+((1.96*5111.11)/np.sqrt(10000)))
           round(WM0_17CIU,2)
Out[137]: 9038.15
In [138]: #Calculation upper confidence interval.
           WMO_17CIL = (8937.97 - ((1.96*5111.11)/np.sqrt(10000)))
           round(WM0_17CIL,2)
Out[138]: 8837.79
```

Calculating confidence interval for age range 18_25

```
In [140]: means = []
           stds = []
           for i in range(num_people):
               sample = WM18_25['Purchase'].sample(num_samples)
               means.append(round(sample.mean(),2))
               stds.append(round(sample.mean(),2))
In [141]: means
            8991.92,
            9311.67,
            9140.74,
            9277.66,
            9146.25,
            9145.16,
            9672.74,
            8601.46,
            9132.3,
            9902.19,
            9254.73.
            9181.89,
            7791.9,
            9293.62,
            9200.91,
            8996.68,
            9281.65,
            8707.71,
            9711.15,
            10129.75,
In [142]: round(sum(means)/len(means),2)
Out[142]: 9174.37
In [143]: WM18_25.describe()
Out[143]:
                      User ID
                                Occupation Marital_Status Product_Category
                                                                            Purchase
                                                                        99660.000000
            count 9.966000e+04 99660.000000
                                            99660.000000
                                                            99660.000000
                                                                         9169.663606
            mean 1.002801e+06
                                  6.736384
                                               0.211880
                                                                5.111088
              std 1.732154e+03
                                  5.947651
                                               0.408643
                                                                3.810009
                                                                         5034.321997
             min 1.000018e+06
                                  0.000000
                                               0.000000
                                                                1.000000
                                                                           12.000000
             25% 1.001314e+06
                                  4.000000
                                               0.000000
                                                                1.000000
                                                                         5415.000000
                                                                5.000000
             50% 1.002854e+06
                                  4.000000
                                               0.000000
                                                                         8027.000000
             75% 1.004217e+06
                                  11.000000
                                               0.000000
                                                                8.000000 12028.000000
             max 1.006031e+06
                                 20.000000
                                                1.000000
                                                               20.000000 23958.000000
In [144]: #Calculation upper confidence interval.
           WM18_25CIU = (9174.37+((1.96*5034.32)/np.sqrt(10000)))
           round(WM18_25CIU,2)
Out[144]: 9273.04
In [145]: #Calculation upper confidence interval.
           WM18_25CIL = (9174.37-((1.96*5034.32)/np.sqrt(10000)))
           round(WM18_25CIL,2)
Out[145]: 9075.7
           Calculating confidence interval for age range 26_35
In [146]: means = []
           stds = []
           for i in range(num_people):
               sample = WM26_35['Purchase'].sample(num_samples)
               means.append(round(sample.mean(),2))
               stds.append(round(sample.mean(),2))
```

```
In [147]: means
Out[147]: [8924.13,
            9096.95,
            9653.83,
            9405.86,
            10045.85,
            8893.15,
            9147.8,
            8946.44,
            8467.86,
            8898.61,
            9105.31.
            9913.21,
            8691.3,
            8764.1,
            10124.05,
            8051.61,
            8711.63,
            9578.55,
            10480.21,
In [148]: round(sum(means)/len(means),2)
Out[148]: 9249.59
In [149]: WM26_35.describe()
Out[149]:
                       User_ID
                                 Occupation Marital_Status Product_Category
                                                                               Purchase
            count 2.195870e+05 219587.000000 219587.000000
                                                             219587.000000 219587.000000
            mean 1.003113e+06
                                   7.896975
                                                 0.392970
                                                                  5.314272
                                                                            9252.690633
              std 1.732500e+03
                                    6.694999
                                                 0.488411
                                                                  3.886768
                                                                            5010.527303
                  1.000003e+06
                                   0.000000
                                                 0.000000
                                                                  1.000000
                                                                              12.000000
             25% 1.001599e+06
                                   2.000000
                                                 0.000000
                                                                  1.000000
                                                                            5475.000000
             50% 1.003243e+06
                                   7.000000
                                                 0.000000
                                                                  5.000000
                                                                            8030.00000
             75% 1.004524e+06
                                   14.000000
                                                 1.000000
                                                                           12047.000000
                                                                  8.000000
             max 1.006040e+06
                                  20.000000
                                                 1.000000
                                                                 20.000000
                                                                           23961.000000
In [150]: #Calculation upper confidence interval.
           WM26_35CIU = (9249.59+((1.96*5010.53)/np.sqrt(10000)))
           round(WM26_35CIU,2)
Out[150]: 9347.8
In [151]: #Calculation lower confidence interval.
           WM26_35CIL = (9249.59 - ((1.96*5010.53)/np.sqrt(10000)))
           round(WM26_35CIL,2)
Out[151]: 9151.38
           Calculating confidence interval for age range 36 45
In [152]: means = []
           stds = []
           for i in range(num_people):
               sample =WM36_45['Purchase'].sample(num_samples)
               means.append(round(sample.mean(),2))
               stds.append(round(sample.mean(),2))
```

```
In [153]: means
Out[153]: [10050.21,
             9356.72.
             9176.14.
             9225.59,
             9532.19,
             9206.74,
             8636.56,
             8893.02,
             8953.68,
             9137.01,
             9393.3.
             9369.97,
             8383.05,
             9251.93,
             9061.0,
             9531.87,
             8561.32,
             8943.7,
             8994.92,
In [154]: round(sum(means)/len(means),2)
Out[154]: 9326.69
In [155]: WM36_45.describe()
Out[155]:
                       User_ID
                                  Occupation Marital_Status Product_Category
                                                                                 Purchase
            count 1.100130e+05 110013.000000
                                                               110013.000000
                                                                             110013.000000
                                             110013.000000
             mean 1.003066e+06
                                     8.837365
                                                   0.396644
                                                                    5.494242
                                                                               9331.350695
               std 1.689593e+03
                                     6.589059
                                                   0.489203
                                                                    3.988229
                                                                               5022.923879
              min
                   1.000007e+06
                                     0.000000
                                                   0.000000
                                                                    1.000000
                                                                                 12.000000
              25% 1.001598e+06
                                     2.000000
                                                   0.000000
                                                                    1.000000
                                                                               5876.000000
              50% 1.003050e+06
                                     7.000000
                                                   0.000000
                                                                    5.000000
                                                                               8061.000000
             75% 1.004488e+06
                                    16.000000
                                                   1.000000
                                                                              12107.000000
                                                                    8.000000
              max 1.006026e+06
                                    20.000000
                                                   1.000000
                                                                   20.000000
                                                                              23960.000000
In [156]: #Calculation upper confidence interval.
           WM36_45CIU = (9326.69+((1.96*5022.92)/np.sqrt(10000)))
           round(WM36_45CIU,2)
Out[156]: 9425.14
In [157]: #Calculation lower confidence interval.
           WM36 45CIL = (9326.69 - ((1.96*5022.92)/np.sqrt(10000)))
           round(WM36_45CIL,2)
Out[157]: 9228.24
           Calculating confidence interval for age range 46_50
In [158]: WM46_50.describe()
Out[158]:
                       User_ID
                                  Occupation Marital_Status Product_Category
                                                                               Purchase
                                                               45701.000000 45701.000000
            count 4.570100e+04 45701.000000
                                              45701.000000
             mean 1.003190e+06
                                    8.517078
                                                  0.722326
                                                                   5.742194
                                                                             9208.625697
                  1.777321e+03
                                    6.676416
                                                  0.447857
                                                                   4.047325
                                                                             4967.216367
              std
                  1.000004e+06
                                    0.000000
                                                  0.000000
                                                                   1.000000
                                                                               12.000000
              25% 1.001798e+06
                                    1.000000
                                                  0.000000
                                                                   2.000000
                                                                             5888.000000
              50% 1.003430e+06
                                    7.000000
                                                  1.000000
                                                                   5.000000
                                                                             8036.000000
              75% 1.004661e+06
                                   16.000000
                                                  1.000000
                                                                   8.000000 11997.000000
              max 1.006039e+06
                                   20.000000
                                                  1.000000
                                                                  20.000000 23960.000000
```

```
In [159]: means = []
           stds = []
           for i in range(num_people):
               sample = WM46_50['Purchase'].sample(num_samples)
               means.append(round(sample.mean(),2))
               stds.append(round(sample.mean(),2))
In [161]: means
Out[161]: [8635.56,
            8911.07,
            9562.28,
            9317.37,
            9578.98,
            9060.79.
            10067.95,
            9075.03,
            8919.96.
            8392.75,
            8845.07,
            9230.85,
            8825.32,
            9457.54,
            9240.54,
            9120.83,
            8679.98,
            8692.49.
            8949.11,
In [162]: round(sum(means)/len(means),2)
Out[162]: 9212.25
In [163]: #Calculation upper confidence interval.
           WM46_50CIU = (9212.25+((1.96*4967.22)/np.sqrt(10000)))
           round(WM46_50CIU,2)
Out[163]: 9309.61
In [164]: #Calculation upper confidence interval.
           WM46_50CIL = (9212.25-((1.96*4967.22)/np.sqrt(10000)))
           round(WM46_50CIL,2)
Out[164]: 9114.89
           Calculating confidence interval for age range 51_55
In [165]: WM51_55.describe()
Out[165]:
                      User ID
                                Occupation Marital_Status Product_Category
                                                                            Purchase
                                                            38501.000000 38501.000000
            count 3.850100e+04 38501.000000
                                            38501.000000
            mean 1.002985e+06
                                  8.810109
                                               0.718475
                                                                5.774214
                                                                         9534.808031
              std 1.680563e+03
                                  6.669887
                                               0.449749
                                                                4.107277
                                                                         5087.368080
             min 1.000006e+06
                                  0.000000
                                               0.000000
                                                                1.000000
                                                                           12.000000
             25% 1.001591e+06
                                  2.000000
                                                0.000000
                                                                2.000000
                                                                         6017.000000
             50% 1.002878e+06
                                  7.000000
                                                1.000000
                                                                5.000000
                                                                         8130.000000
             75% 1.004373e+06
                                 16.000000
                                                1.000000
                                                                8.000000 12462.000000
             max 1.006033e+06
                                 20.000000
                                                1.000000
                                                               20.000000 23960.000000
In [166]: means = []
           stds = []
           for i in range(num_people):
               sample = WM51_55['Purchase'].sample(num_samples)
               means.append(round(sample.mean(),2))
               stds.append(round(sample.mean(),2))
```

```
In [168]: means
Out[168]: [9227.55,
            10645.19,
            9557.9,
            9546.36,
            9778.59,
            10063.12,
            8779.27,
            10056.93,
            9411.52,
            9528.84,
            9599.78,
            9049.17,
            9509.69,
            9167.54,
            9011.37,
            9379.44,
            10106.38,
            9490.98,
            8956.26,
In [169]: round(sum(means)/len(means),2)
Out[169]: 9538.48
In [170]: #Calculation upper confidence interval.
           WM51_55CIU = (9538.48+((1.96*5087.37)/np.sqrt(10000)))
           round(WM51_55CIU,2)
Out[170]: 9638.19
In [171]: #Calculation lower confidence interval.
           WM51_55CIL = (9538.48-((1.96*5087.37)/np.sqrt(10000)))
           round(WM51_55CIL,2)
Out[171]: 9438.77
           Calculating confidence interval for age 55 and over
In [172]: WM55.describe()
Out[172]:
                                Occupation
                                           Marital_Status Product_Category
                                                                            Purchase
            count 2.150400e+04 21504.000000
                                            21504.000000
                                                            21504.000000 21504.000000
            mean 1.002986e+06
                                   9.502697
                                                0.633417
                                                                6.066313
                                                                          9336.280459
              std 1.659541e+03
                                   6.370448
                                                0.481882
                                                                4.091461
                                                                          5011.493996
             min 1.000002e+06
                                  0.000000
                                                0.000000
                                                                1.000000
                                                                            12.000000
             25% 1.001739e+06
                                  2.000000
                                                0.000000
                                                                3.000000
                                                                          6018.000000
             50% 1.002661e+06
                                  13.000000
                                                1.000000
                                                                5.000000
                                                                          8105.500000
             75% 1.004193e+06
                                  14.000000
                                                1.000000
                                                                8.000000 11932.000000
             max 1.006038e+06
                                 20.000000
                                                1.000000
                                                               20.000000 23960.000000
In [173]: means = []
           stds = []
           for i in range(num_people):
               sample = WM55['Purchase'].sample(num_samples)
               means.append(round(sample.mean(),2))
               stds.append(round(sample.mean(),2))
```

```
In [174]: means
            0,00,01,
           8724.95,
           9810.16,
           9260.61,
           8706.44,
           8774.53,
           10055.58,
           9215.07,
           9556.29,
           9179.33,
           9626.99,
           9455.44,
           9022.54,
           10033.74,
            9545.02,
           9113.14,
           9790.72,
           9868.93,
           8822.73,
           9550.31,
In [175]: round(sum(means)/len(means),2)
Out[175]: 9329.97
In [176]: #Calculation upper confidence interval.
          WM55CIU = (9329.97+((1.96*5011.49)/np.sqrt(10000)))
          round(WM55CIU,2)
```

Out[176]: 9428.2

```
In [177]: #Calculation Lower confidence interval.
WM55CIL = (9329.97-((1.96*5011.49)/np.sqrt(10000)))
round(WM55CIL,2)
```

Out[177]: 9231.74

The 95% confidence interval for age range of 0-17 is in between 8837.79 & 9038.15

The 95% confidence interval for age range of 18_25 is in between 9075.7 & 9273.04

The 95% confidence interval for age range of 26_35 is in between 9151.38 & 9347.8

The 95% confidence interval for age range of 36_45 is in between 9228.24 & 9425.14

The 95% confidence interval for age range of 46_50 is in between 9114.89 & 9309.61

The 95% confidence interval for age range of 51_55 is in between 9438.77 & 9638.19

The 95% confidence interval for age range of 55 and above is in between 9231.74 & 9428.2

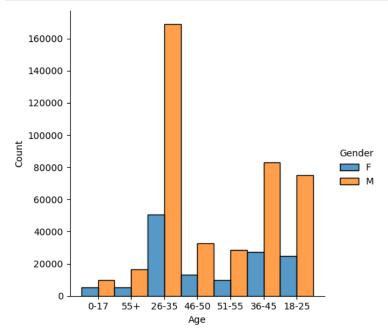
Confidence interval is highest in the age range of 51_55

In [180]: WM.head()

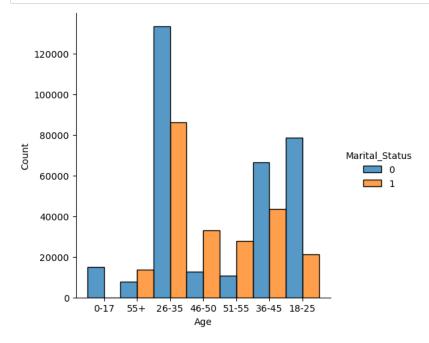
Out[180]:

	User_ID	Product_ID	Gender	Age	Occupation	City_Category	Stay_In_Current_City_Years	Marital_Status	Product_Category	Purchase
0	1000001	P00069042	F	0-17	10	Α	2	0	3	8370
1	1000001	P00248942	F	0-17	10	Α	2	0	1	15200
2	1000001	P00087842	F	0-17	10	Α	2	0	12	1422
3	1000001	P00085442	F	0-17	10	Α	2	0	12	1057
4	1000002	P00285442	М	55+	16	С	4+	0	8	7969

```
In [182]: sns.displot(WM, x="Age", hue="Gender", multiple="dodge")
plt.show()
```

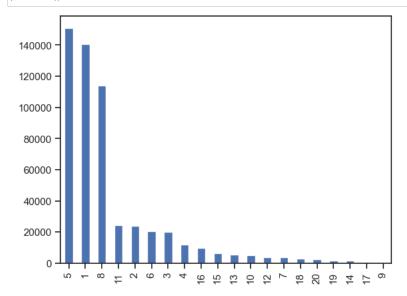


In [183]: sns.displot(WM, x="Age", hue="Marital_Status",multiple="dodge")
plt.show()

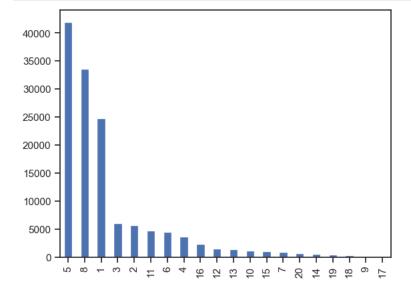


```
In [185]: WM['Product_Category'].value_counts()
Out[185]: 5
                 150933
                 140378
                113925
          8
                  24287
          11
                  23864
                  20466
                  20213
          3
4
                  11753
          16
                   9828
          15
                   6290
          13
                   5549
          10
                   5125
          12
                   3947
                   3721
          18
                   3125
          20
                   2550
          19
                   1603
          14
                   1523
          17
                    578
                    410
          Name: Product_Category, dtype: int64
```

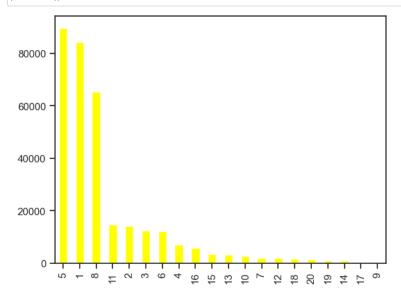
In [212]: WM['Product_Category'].value_counts().plot(kind='bar')
plt.show()



In [213]: WMF['Product_Category'].value_counts().plot(kind='bar')
plt.show()

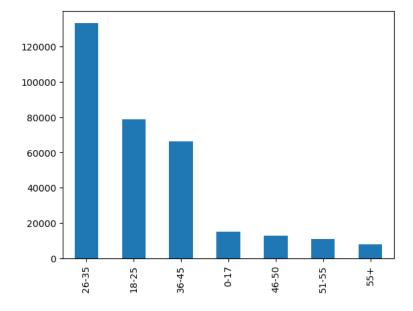


```
In [214]: WMM['Product_Category'].value_counts().plot(kind='bar',color='yellow')
    plt.show()
```



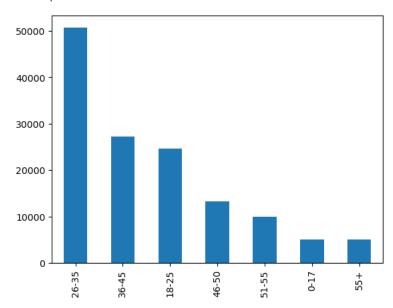
In [190]: WMM['Age'].value_counts().plot(kind='bar')

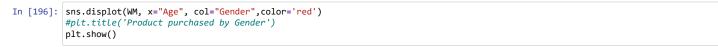
Out[190]: <AxesSubplot:>

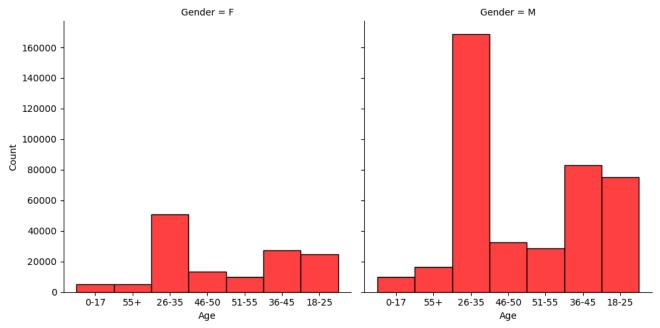


```
In [191]: WMF['Age'].value_counts().plot(kind='bar')
```

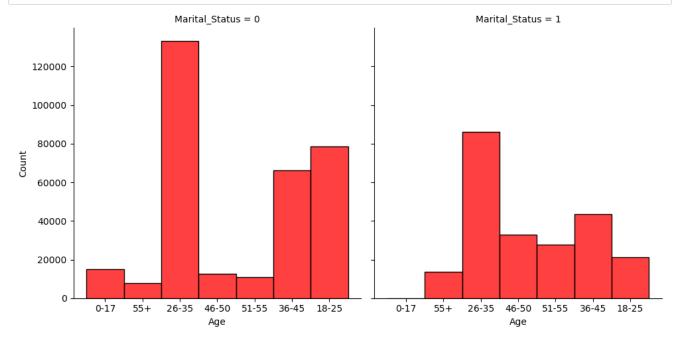
Out[191]: <AxesSubplot:>



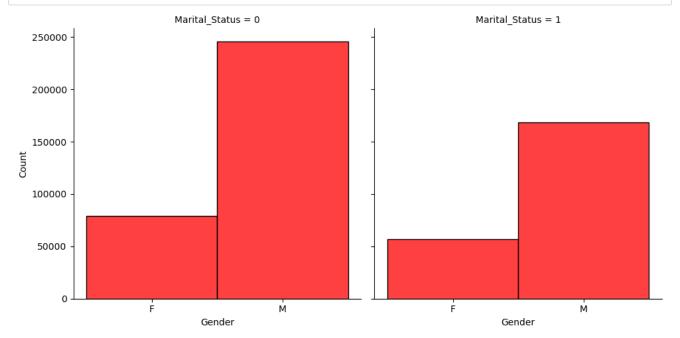




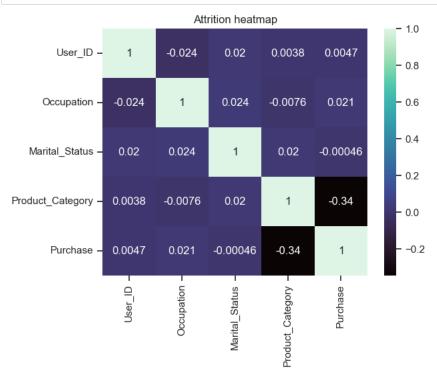
```
In [197]: sns.displot(WM, x="Age", col="Marital_Status",color='red')
#plt.title('Product purchased by Gender')
plt.show()
```



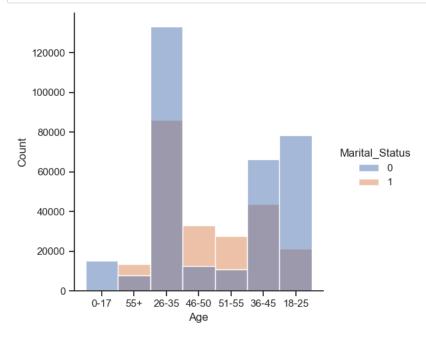




```
In [208]: ax = sns.heatmap(WM.corr(),annot=True,cmap='mako')
    plt.title('Attrition heatmap')
    plt.show()
```







CONCLUSION

For men the 95% confidence interval is between 9160.92 & 9357.99

For women the confidence interval is between 8638.44 & 8825.32

The confidence interval for men and women are not overlapping and men have a higher confidence interval.

For married and unmarried customers the confidence interval is overlapping .

For married customers the confidence interval is between 9165.72 & 9362.38 For single customers the confidence interval is between 9173.73 & 9370.81 The range is almost the same between married and single customers with single customers being slightly higher than the married customers

Confidence interval based on different age ranges

The 95% confidence interval for age range of 0-17 is in between 8837.79 & 9038.15

The 95% confidence interval for age range of 18_25 is in between 9075.7 & 9273.04

The 95% confidence interval for age range of 26_35 is in between 9151.38 & 9347.8

The 95% confidence interval for age range of 36_45 is in between 9228.24 & 9425.14

The 95% confidence interval for age range of 46_50 is in between 9114.89 & 9309.61

The 95% confidence interval for age range of 51_55 is in between 9438.77 & 9638.19

The 95% confidence interval for age range of 55 and above is in between 9231.74 & 9428.2

Confidence interval is highest in the age range of 51_55

Amongst the age ranges the highest confidence interval is for age range of 51_55.

Overall the product category 5 is the highest amongst both male and female customers .

The highest count of customers is for the age group 26-35.

Recommendations

Male customers have a higher confidence interval in purchase in comparison to women .So offers focused on bringing in more male customers would improve the business .

The age range of customers 26-35 has the highest count .Offers focused on this age range can improve the business as there is a hight count of visitors.

The age range of customers 51-55 has the highest confidence interval. Offers focused on this age range can improve the business as the confidence interval is high.

The product category 5 is the highest count amongst both male and female customers. Understanding its features and adding more of product 5 will improve husiness

 $The product category \ 15, 13, 10, 12, 18, 7, 20, 19, 14, 17, 9 \ seem to have very poor performance. If possible they can be discontinued.$

In []: