Project

Exploratory Data Analysis in Python for Retail

```
In [129...
            #Python version
            from platform import python_version
            print("Python version is: ", python_version())
            Python version is: 3.9.13
In [130...
            #Import packages
            import pandas as pd
            import numpy as np
            import matplotlib.pyplot as plt
            import seaborn as sns
            import datetime as dt
            #import dataset
In [131...
            dataset = pd.read_csv("dataset.csv")
            #Checking the first 5 columns of the dataset
In [132...
            dataset.head()
Out[132]:
               ID Pedido Data Pedido
                                      ID Cliente
                                                  Segmento
                                                               Pais
                                                                        Cidade
                                                                                  Estado
                                                                                         ID Produto
                                                                                                     Cate
                CA-2017-
                                                             United
                                                                                            FUR-BO-
                           08/11/2017
                                       CG-12520
                                                  Consumer
                                                                    Henderson
                                                                                Kentucky
                                                                                                       Furr
                  152156
                                                             States
                                                                                            10001798
                CA-2017-
                                                             United
                                                                                            FUR-CH-
                           08/11/2017
                                       CG-12520
                                                  Consumer
                                                                    Henderson
                                                                                Kentucky
                                                                                                       Furr
                                                                                            10000454
                  152156
                                                             States
                CA-2017-
                                                             United
                                                                                            OFF-LA-
                                                                                                         (
                                                                           Los
                           12/06/2017
                                       DV-13045
                                                  Corporate
                                                                               California
                 138688
                                                                       Angeles
                                                                                           10000240
                                                             States
                                                                                                       Sur
                US-2016-
                                                             United
                                                                          Fort
                                                                                            FUR-TA-
            3
                                       SO-20335
                                                                                  Florida
                           11/10/2016
                                                  Consumer
                                                                                                       Furr
                  108966
                                                                                           10000577
                                                             States
                                                                    Lauderdale
                US-2016-
                                                             United
                                                                          Fort
                                                                                             OFF-ST-
                           11/10/2016
                                       SO-20335
                                                  Consumer
                                                                                  Florida
                                                                                           10000760
                  108966
                                                             States
                                                                    Lauderdale
                                                                                                       Sur
In [133...
            #Checking the last 5 columns of the dataset
            dataset.tail()
```

```
CA-2018-
                                                               United
                                                                                              OFF-PA-
           9695
                              15/12/2018
                                          KM-16660
                                                    Consumer
                                                                       Inglewood
                                                                                  California
                     154116
                                                               States
                                                                                             10004569
                                                                                              OFF-AP-
                   CA-2018-
                                                               United
           9696
                              15/12/2018
                                         KM-16660
                                                    Consumer
                                                                       Inglewood
                                                                                  California
                     154116
                                                               States
                                                                                             10000027
                   CA-2018-
                                                               United
                                                                                              TEC-PH-
           9697
                              15/12/2018
                                         KM-16660
                                                    Consumer
                                                                       Inglewood
                                                                                  California
                     154116
                                                                                             10000675
                                                               States
                   CA-2017-
                                                                                               OFF-FA-
                                                               United
                                                                         San Luis
                                                                                  California
           9698
                                          SP-20920
                              30/10/2017
                                                    Consumer
                     105291
                                                               States
                                                                          Obispo
                                                                                             10003059
                   CA-2018-
                                                        Home
                                                               United
                                                                                              OFF-PA-
           9699
                              31/07/2018
                                          LB-16795
                                                                      Wilmington
                                                                                  Delaware
                     147032
                                                        Office
                                                               States
                                                                                             10003256
           #Cheacking shape of dataset
In [134...
           dataset.shape
           (9700, 11)
Out[134]:
           Exploratory Analysis
           #checking coloumns of dataset
In [135...
           dataset.columns
           Index(['ID_Pedido', 'Data_Pedido', 'ID_Cliente', 'Segmento', 'Pais', 'Cidade',
Out[135]:
                   'Estado', 'ID_Produto', 'Categoria', 'SubCategoria', 'Valor_Venda'],
                  dtype='object')
           #Checking types of data
In [136...
           dataset.dtypes
           ID_Pedido
                              object
Out[136]:
           Data_Pedido
                              object
                              object
           ID_Cliente
           Segmento
                              object
           Pais
                              object
           Cidade
                              object
           Estado
                              object
           ID_Produto
                              object
           Categoria
                              object
           SubCategoria
                              object
           Valor_Venda
                             float64
           dtype: object
           #Statistical summary of the valor venda column
In [137...
           dataset["Valor_Venda"].describe()
                      9700.000000
           count
Out[137]:
           mean
                       230.469892
           std
                       627.504252
           min
                          0.444000
           25%
                         17.248000
           50%
                         54.272000
           75%
                       209.932500
                     22638.480000
           Name: Valor_Venda, dtype: float64
In [138...
           #Checking duplicate data
           dataset[dataset.duplicated()]
```

ID Pedido Data Pedido ID Cliente Segmento

Pais

Cidade

Estado ID Produto

Out[133]:

1- City with the highest sales volume in the "office supplies" category

```
In [141... #Filter the dataframe by categorizing "Office Supplies"
    categorize = dataset[dataset["Categoria"] == "Office Supplies"]
In [142... categorize.head()
```

```
Cidade
                                                                               Estado ID Produto Cate
Out[142]:
              ID Pedido Data Pedido ID Cliente Segmento
                                                             Pais
               CA-2017-
                                                           United
                                                                                          OFF-LA-
                                                                                                       (
                                                                         Los
                           12/06/2017
                                      DV-13045
                                                 Corporate
                                                                              California
                 138688
                                                            States
                                                                                         10000240
                                                                     Angeles
                                                                                                     Sur
               US-2016-
                                                           United
                                                                                          OFF-ST-
                                                                                                      (
                                                                        Fort
                           11/10/2016
                                      SO-20335
                                                 Consumer
                                                                                Florida
                 108966
                                                            States
                                                                  Lauderdale
                                                                                         10000760
                                                                                                     Sur
               CA-2015-
                                                           United
                                                                                          OFF-AR-
                                                                                                      (
                                                                         Los
           6
                           09/06/2015
                                      BH-11710
                                                 Consumer
                                                                              California
                 115812
                                                            States
                                                                                         10002833
                                                                     Angeles
                                                                                                     Sur
               CA-2015-
                                                                                           OFF-BI-
                                                           United
                                                                         Los
                                                                                                      (
           8
                                      BH-11710
                           09/06/2015
                                                 Consumer
                                                                              California
                 115812
                                                            States
                                                                                         10003910
                                                                     Angeles
                                                                                                     Sur
               CA-2015-
                                                           United
                                                                                          OFF-AP-
                                                                                                       (
                                                                         Los
           9
                                      BH-11710
                           09/06/2015
                                                 Consumer
                                                                              California
                 115812
                                                            States
                                                                     Angeles
                                                                                         10002892
                                                                                                     Sup
In [143...
           #Group by city and calculate total of Valor_venda
           total_sales_volume = categorize.groupby("Cidade")["Valor_Venda"].sum()
           #City with the highest sales volume
In [144...
           City_Highest_Sales_Volume = total_sales_volume.idxmax()
           print("The city with the highest sales volume in the office supplies category: ", (
           The city with the highest sales volume in the office supplies category:
           City
In [145...
           #Checking the result
           checking_result = total_sales_volume.sort_values(ascending = False)
           print(checking_result)
           Cidade
           New York City
                              68362.814
           Los Angeles
                              47098.100
           San Francisco
                              41771.198
           Seattle
                              34856.878
           Philadelphia
                              29313.687
           Ormond Beach
                                  2.808
           Pensacola
                                  2.214
           Jupiter
                                  2.064
           Elyria
                                  1.824
                                  1.392
           Name: Valor_Venda, Length: 480, dtype: float64
```

2 Total sale by order date

```
In [146... #Group by Data_Pedido of Valor_venda
    total_sale_by_Data_Pedido = dataset.groupby("Data_Pedido")["Valor_Venda"].sum()
    print(total_sale_by_Data_Pedido)
```

```
Data_Pedido
          01/01/2018
                         1481.8280
          01/02/2015
                         468.9000
          01/02/2017
                         161.9700
          01/03/2015
                         2203.1510
          01/03/2016
                         1642.1744
          31/10/2017
                         2346.5790
          31/10/2018
                         523.9280
          31/12/2015
                         5253.2700
          31/12/2016
                         1381.3440
          31/12/2017
                          731.7680
          Name: Valor_Venda, Length: 1226, dtype: float64
In [147...
           #Data Pedido with highest sale volume
           Data_Pedido_highest_sale = total_sale_by_Data_Pedido.idxmax()
           print(Data_Pedido_highest_sale)
          18/03/2015
In [148...
           #Checking the result
           result = total_sale_by_Data_Pedido.sort_values(ascending = False)
           print(result)
          Data_Pedido
                         28106.716
          18/03/2015
          02/10/2017
                         18452.972
          22/10/2018
                         15158.877
          23/03/2018
                         14816.068
          08/09/2015
                         14228.428
          01/10/2015
                             4.710
          24/06/2015
                             4.272
          28/01/2015
                             3.928
          12/07/2018
                             3.816
          19/07/2016
                             2.025
          Name: Valor_Venda, Length: 1226, dtype: float64
In [149...
           #PLot
           plt.figure(figsize = (20,6))
           result.plot(x = "Data_Pedido", y = "Valor_Venda", color = "blue")
           plt.title(" Total sale by order date")
           plt.show()
                                                   Total sale by order date
          25000
          15000
          10000
```

3 What is the total sales by state?

16/08/2016

18/03/2015

27/10/2018 Data_Pedido 24/05/2016

11/04/2015

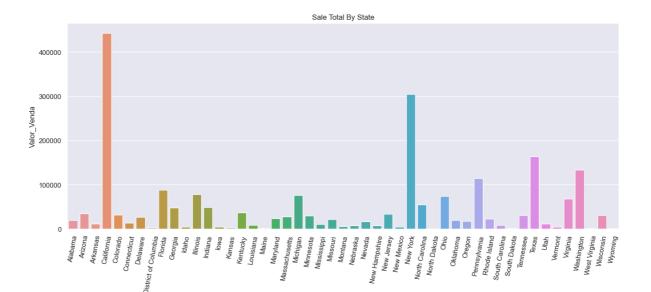
10/02/2018

13/09/2018

```
0
                            19510.6400
                 Alabama
1
                 Arizona
                            35272.6570
2
                Arkansas
                            11673.8300
3
              California 442927.0975
4
                Colorado
                            31841.5980
5
             Connecticut
                            13366.7370
6
                            26452.5890
                Delaware
7
    District of Columbia
                             2865.0200
8
                 Florida
                            88043.7000
9
                 Georgia
                            48083.1600
10
                    Idaho
                             4292.5160
11
                Illinois
                            78109.9270
                 Indiana
12
                            48718.4000
13
                             4443.5600
                    Iowa
14
                  Kansas
                             2914.3100
15
                Kentucky
                            36409.5800
16
               Louisiana
                             9131.0500
17
                   Maine
                             1270.5300
18
                Maryland
                            23705.5230
19
           Massachusetts
                            27363.2640
20
                Michigan
                            76081.1740
21
               Minnesota
                            29863.1500
22
             Mississippi
                            10771.3400
23
                Missouri
                            22205.1500
24
                             5589.3520
                 Montana
25
                Nebraska
                             7194.9500
                            16729.1020
26
                  Nevada
27
           New Hampshire
                             7132.5440
28
              New Jersey
                            34265.7120
29
              New Mexico
                             4783.5220
30
                New York 304536.4010
          North Carolina
31
                            55165.9640
            North Dakota
32
                              919.9100
33
                    Ohio
                            74277.8020
34
                Oklahoma
                            19683.3900
35
                  Oregon
                            17284.4620
36
            Pennsylvania
                           114411.6800
            Rhode Island
37
                            22525.0260
38
          South Carolina
                             8481.7100
39
            South Dakota
                             1315.5600
40
               Tennessee
                            30661.8730
41
                    Texas 163549.8602
42
                    Utah
                            11220.0560
                             4524.4700
43
                 Vermont
44
                Virginia
                            68194.6700
45
              Washington
                           133826.0060
46
           West Virginia
                             1209.8240
47
               Wisconsin
                            31154.4700
48
                 Wyoming
                             1603.1360
#PLot
plt.figure(figsize = (16,6))
```

Estado Valor_Venda

```
In [151... #Plot
    plt.figure(figsize = (16,6))
    sns.barplot(data = Categorizing_by_state, x = "Estado", y = "Valor_Venda")
    plt.title("Sale Total By State")
    plt.xticks(rotation = 80)
    plt.show()
```

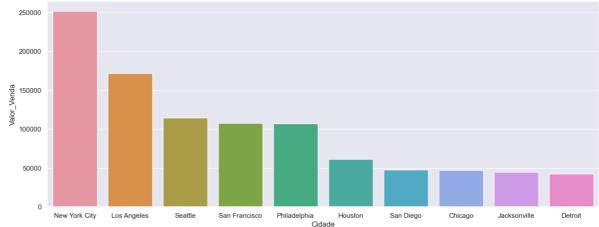


Estado

4 Which 10 cities have the highest total sales?

```
In [152...
           #Categorizing by cities
           cities_with_highest_total_sales = dataset.groupby("Cidade")["Valor_Venda"].sum().re
           result = cities_with_highest_total_sales.sort_values(by = 'Valor_Venda', ascending
In [153...
           result.head(10)
                              Valor_Venda
Out[153]:
                      Cidade
           327
                New York City
                              251749.2190
           265
                  Los Angeles
                              171654.6330
           450
                      Seattle
                              114725.4780
                 San Francisco
                              107489.9520
           436
                  Philadelphia
                              107197.8030
           372
           207
                     Houston
                               61590.1868
           435
                   San Diego
                               47458.3790
            80
                     Chicago
                               46974.3430
           216
                  Jacksonville
                               44713.1830
           123
                      Detroit
                               42446.9440
In [154...
           plt.figure(figsize = (16, 6))
           sns.set_palette('coolwarm')
           sns.barplot(data = result.head(10), x = 'Cidade', y = 'Valor_Venda')
           plt.title("10 cities have the highest total sales")
           plt.show()
```

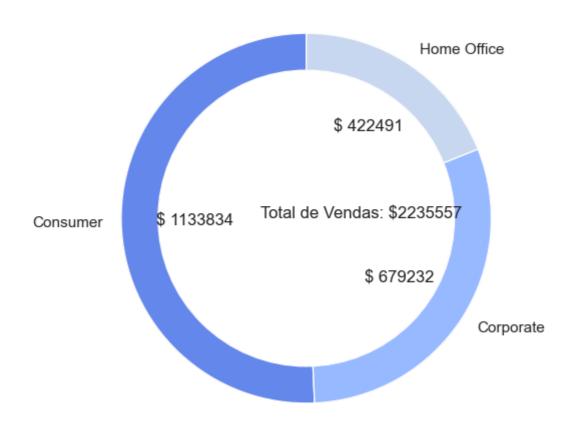




5 Which segment had the highest total sales

```
In [155...
           #Categorizing
           categorizing_by_segment = dataset.groupby('Segmento')['Valor_Venda'].sum().reset_ir
           result_categorizing_by_segment = categorizing_by_segment.sort_values(by = 'Valor_Ve
In [156...
In [157...
           result_categorizing_by_segment
Out[157]:
               Segmento
                         Valor_Venda
           0
               Consumer 1.133834e+06
               Corporate 6.792322e+05
           2 Home Office 4.224914e+05
In [158...
           #Covert datas to absolute value
           #Function to convert data to absolute value
           def autopct_format(values):
               def my_format(pct):
                   total = sum(values)
                   val = int(round(pct*total/100.0))
                   return '$ {v:d}'.format(v=val)
               return my format
In [159...
           #Plot using Pizza Graphic
           #Figure size
           plt.figure(figsize = (16,6))
           #Pie Chart
           plt.pie(result_categorizing_by_segment["Valor_Venda"],
                   labels = result_categorizing_by_segment["Segmento"],
                   autopct = autopct_format(result_categorizing_by_segment["Valor_Venda"])
                  ,startangle = 90)
           #Clean inside of the circle
           centre_circle = plt.Circle((0,0), 0.80, fc = 'white')
           fig = plt.gcf()
           fig.gca().add_artist(centre_circle)
           #Labels and anotations
           plt.annotate(text = 'Total de Vendas: ' + '$' + str(int(sum(result_categorizing_by_
                        xy = (-0.25, 0)
```

Total de Vendas Por Segmento



6 Total sales by segment and by year

| In [160 | <pre>dataset.head()</pre> | | | | | | | | | | | | |
|-----------|---------------------------|--------------------|---|------------|-----------|------------------|--------------------|------------|---------------------|----------|--|--|--|
| Out[160]: | | ID_Pedido | Data_Pedido | ID_Cliente | Segmento | Pais | Cidade | Estado | ID_Produto | Cate | | | |
| | 0 | CA-2017- 152156 | 08/11/2017 | CG-12520 | Consumer | United States | Henderson | Kentucky | FUR-BO- 10001798 | Furr | | | |
| | 1 | CA-2017- 152156 | 08/11/2017 | CG-12520 | Consumer | United States | Henderson | Kentucky | FUR-CH- 10000454 | Furr | | | |
| | 2 | CA-2017- 138688 | 12/06/2017 | DV-13045 | Corporate | United States | Los Angeles | California | OFF-LA- 10000240 | Suţ | | | |
| | 3 | US-2016- 108966 | 11/10/2016 | SO-20335 | Consumer | United States | Fort Lauderdale | Florida | FUR-TA- 10000577 | Furr | | | |
| | 4 | US-2016- 108966 | 11/10/2016 | SO-20335 | Consumer | United States | Fort Lauderdale | Florida | OFF-ST- 10000760 | Sur (| | | |
| 1 | | | | | | | | | | • | | | |
| In [161 | to | tal_sales_ | s <i>by segment</i> _by_segment _by_segment | | groupby(" | Segment | o")["Valor | _Venda"] | .sum() | | | | |

```
Segmento
Out[161]:
           Consumer
                            1.133834e+06
           Corporate
                            6.792322e+05
           Home Office
                            4.224914e+05
           Name: Valor_Venda, dtype: float64
           #Convert date column to datetime
In [162...
           dataset['Data_Pedido'] = pd.to_datetime(dataset["Data_Pedido"], dayfirst = True)
           dataset.dtypes
In [163...
           ID_Pedido
                                      object
Out[163]:
           Data Pedido
                             datetime64[ns]
           ID Cliente
                                      object
           Segmento
                                      object
           Pais
                                      object
           Cidade
                                      object
           Estado
                                      object
           ID_Produto
                                      object
           Categoria
                                      object
           SubCategoria
                                      object
           Valor Venda
                                     float64
           dtype: object
           #Extract the year by creating a new variable
In [164...
           dataset["Year"] = dataset["Data_Pedido"].dt.year
           dataset.head()
In [165...
Out[165]:
              ID_Pedido Data_Pedido
                                      ID_Cliente
                                                 Segmento
                                                             Pais
                                                                      Cidade
                                                                                Estado ID_Produto
                                                                                                   Cate
               CA-2017-
                                                            United
                                                                                          FUR-BO-
           0
                                       CG-12520
                           2017-11-08
                                                 Consumer
                                                                   Henderson
                                                                              Kentucky
                                                                                                    Furr
                                                                                          10001798
                 152156
                                                            States
               CA-2017-
                                                            United
                                                                                          FUR-CH-
                           2017-11-08
                                       CG-12520
           1
                                                 Consumer
                                                                   Henderson
                                                                              Kentucky
                                                                                                    Furr
                 152156
                                                                                          10000454
                                                            States
               CA-2017-
                                                            United
                                                                                          OFF-LA-
                                                                                                       (
                                                                         Los
           2
                           2017-06-12
                                       DV-13045
                                                                              California
                                                 Corporate
                 138688
                                                                                          10000240
                                                            States
                                                                     Angeles
                                                                                                     Sur
                US-2016-
                                                            United
                                                                         Fort
                                                                                          FUR-TA-
           3
                           2016-10-11
                                       SO-20335
                                                                                Florida
                                                 Consumer
                                                                                                    Furr
                 108966
                                                            States
                                                                   Lauderdale
                                                                                          10000577
                US-2016-
                                                                                           OFF-ST-
                                                            United
                                                                         Fort
                                                                                                       (
           4
                           2016-10-11
                                       SO-20335
                                                 Consumer
                                                                                Florida
                 108966
                                                            States
                                                                   Lauderdale
                                                                                          10000760
                                                                                                     Sur
In [166...
           #Total sales by year
           Total_sales_by_year = dataset.groupby("Year")["Valor_Venda"].sum()
           Total sales by year
           Year
Out[166]:
           2015
                    470768.6001
           2016
                    454072.5154
           2017
                    595365.9240
           2018
                    715350.9152
           Name: Valor_Venda, dtype: float64
           #Total sales by segment and year
In [167...
           Total_sales_by_segment_and_year = dataset.groupby(["Segmento", "Year"])["Valor_Venc
           Total_sales_by_segment_and_year
```

```
Segmento
                        Year
Out[167]:
           Consumer
                        2015
                                 256719.9166
                                 265295.2593
                        2016
                        2017
                                 288459.5572
                        2018
                                 323359.6019
           Corporate
                        2015
                                 125819.5957
                        2016
                                 114643.1229
                        2017
                                 203266.7398
                        2018
                                 235502.7284
           Home Office
                        2015
                                  88229.0878
                        2016
                                  74134.1332
                        2017
                                 103639.6270
                                 156488.5849
                        2018
           Name: Valor_Venda, dtype: float64
```

The company manager wishes to offer a discount following the rules below:

- 1) If Sales Value is over 1000, get a 15% discount
- 2) If Sales Value is under 1000, get a 10% discount

7 How many Sales will receive a 15% discount

```
In [168...
            dataset["Discount"] = np.where(dataset["Valor_Venda"] > 1000, 0.15, 0.10)
In [169...
            dataset.head()
Out[169]:
                          Data_Pedido
                                        ID Cliente
                                                                 Pais
                                                                          Cidade
                                                                                    Estado ID_Produto
               ID Pedido
                                                   Segmento
                                                                                                        Cate
                CA-2017-
                                                               United
                                                                                               FUR-BO-
            0
                            2017-11-08
                                         CG-12520
                                                    Consumer
                                                                      Henderson
                                                                                  Kentucky
                                                                                                         Furr
                  152156
                                                                                              10001798
                                                               States
                CA-2017-
                                                               United
                                                                                               FUR-CH-
                            2017-11-08
                                         CG-12520
                                                    Consumer
                                                                      Henderson
                                                                                  Kentucky
                                                                                                         Furr
                  152156
                                                               States
                                                                                              10000454
                CA-2017-
                                                                                               OFF-LA-
                                                               United
                                                                             Los
                                                                                                            (
            2
                            2017-06-12
                                         DV-13045
                                                    Corporate
                                                                                  California
                  138688
                                                               States
                                                                         Angeles
                                                                                              10000240
                                                                                                          Sur
                US-2016-
                                                               United
                                                                                               FUR-TA-
                                                                            Fort
            3
                            2016-10-11
                                         SO-20335
                                                    Consumer
                                                                                    Florida
                                                                                                         Furr
                  108966
                                                                                              10000577
                                                               States
                                                                      Lauderdale
                US-2016-
                                                               United
                                                                            Fort
                                                                                               OFF-ST-
                                                                                                            (
                            2016-10-11
                                         SO-20335
                                                   Consumer
                                                                                    Florida
                  108966
                                                               States
                                                                      Lauderdale
                                                                                              10000760
                                                                                                          Sur
In [170...
            dataset["Discount"].value_counts()
            0.10
                     9243
Out[170]:
            0.15
                      457
            Name: Discount, dtype: int64
            print("So 457 values will receive a 15% discount")
In [171...
            So 457 values will receive a 15% discount
```

Consider that the company decides to grant a 15% discount on the previous item.

8 What would be the average sales value before and after the discount?

```
#All values affected by 15%
In [172...
            before_discount15 = dataset[dataset['Discount'] == 0.15]
            before_discount15.head()
                ID_Pedido Data_Pedido ID_Cliente
                                                                           Cidade
Out[172]:
                                                    Segmento
                                                                  Pais
                                                                                         Estado ID_Produto
                 CA-2015-
                                                               United
                                                                                                    FUR-TA-
                             2015-06-09
            10
                                          BH-11710
                                                                                       California
                                                     Consumer
                                                                       Los Angeles
                   115812
                                                                States
                                                                                                   10001539
                 CA-2016-
                                                                                                    FUR-TA-
                                                               United
            24
                             2016-09-25
                                          EB-13870
                                                     Consumer
                                                                             Orem
                                                                                          Utah
                   106320
                                                                States
                                                                                                   10000577
                 US-2016-
                                                                                                   FUR-BO-
                                                               United
            27
                             2016-09-17
                                          TB-21520
                                                     Consumer
                                                                       Philadelphia
                                                                                    Pennsylvania
                   150630
                                                                States
                                                                                                   10004834
                 CA-2017-
                                                                United
                                                                                                    TEC-PH-
            35
                             2017-12-08
                                         GH-14485
                                                     Corporate
                                                                        Richardson
                                                                                          Texas
                   117590
                                                                States
                                                                                                   10004977
                                                                          New York
                                                                                                    TEC-PH-
                 CA-2017-
                                                               United
            54
                             2017-12-11
                                         JM-15265
                                                     Corporate
                                                                                       New York
                   105816
                                                                States
                                                                              City
                                                                                                   10002447
            #Average of all values before the 15% discount
In [173...
            average_before_discount15 = before_discount15.groupby("Discount")['Valor_Venda'].me
            print(average_before_discount15)
In [174...
            Discount
            0.15
                     2116.807815
            Name: Valor Venda, dtype: float64
            #All value after 15% discount
In [175...
            dataset["Valor Venda With Discount"] = dataset["Valor Venda"] - (dataset["Valor Venda"] -
            dataset.head()
                                       ID_Cliente
                                                                Pais
                                                                         Cidade
Out[175]:
               ID_Pedido Data_Pedido
                                                   Segmento
                                                                                    Estado
                                                                                           ID_Produto
                                                                                                        Cate
                CA-2017-
                                                              United
                                                                                              FUR-BO-
            0
                            2017-11-08
                                        CG-12520
                                                                      Henderson
                                                    Consumer
                                                                                  Kentucky
                                                                                                         Furr
                  152156
                                                                                              10001798
                                                               States
                CA-2017-
                                                              United
                                                                                              FUR-CH-
                            2017-11-08
                                        CG-12520
                                                    Consumer
                                                                      Henderson
                                                                                  Kentucky
                                                                                                         Furr
                  152156
                                                               States
                                                                                              10000454
                CA-2017-
                                                              United
                                                                                               OFF-LA-
                                                                             Los
                            2017-06-12
                                        DV-13045
                                                    Corporate
                                                                                  California
                  138688
                                                               States
                                                                                              10000240
                                                                         Angeles
                                                                                                          Sur
                US-2016-
                                                              United
                                                                            Fort
                                                                                               FUR-TA-
            3
                            2016-10-11
                                        SO-20335
                                                    Consumer
                                                                                    Florida
                                                                                                         Furr
                  108966
                                                               States
                                                                      Lauderdale
                                                                                              10000577
                US-2016-
                                                              United
                                                                            Fort
                                                                                               OFF-ST-
                                                                                                            (
                            2016-10-11
                                        SO-20335
                                                    Consumer
                                                                                    Florida
                  108966
                                                                                              10000760
                                                               States
                                                                      Lauderdale
                                                                                                          Sur
            discount15 = dataset[dataset["Discount"] == 0.15]
In [176...
```

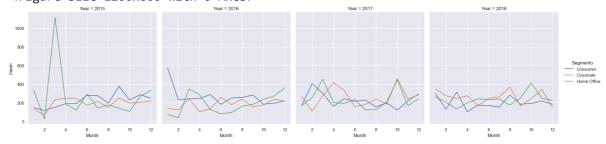
```
groupby_discount15 = discount15.groupby("Discount")["Valor_Venda_With_Discount"]
In [177...
           #Average of all values affected by 15
In [178...
           average_after_discount15 = groupby_discount15.mean()
In [179...
           print(average_after_discount15)
           Discount
           0.15
                    1799.286643
           Name: Valor_Venda_With_Discount, dtype: float64
           9 What is the average sales per segment, per year and per
           month?
           #Create the column of the month
In [180...
           dataset["Month"] = dataset["Data_Pedido"].dt.month
In [181...
           dataset.head()
Out[181]:
              ID Pedido Data Pedido
                                     ID Cliente
                                               Segmento
                                                            Pais
                                                                    Cidade
                                                                              Estado ID Produto
                                                                                                 Cate
               CA-2017-
                                                                                        FUR-BO-
                                                          United
                                     CG-12520
                          2017-11-08
                                                Consumer
                                                                 Henderson
                                                                            Kentucky
                                                                                                  Furr
                 152156
                                                           States
                                                                                       10001798
               CA-2017-
                                                                                        FUR-CH-
                                                          United
                          2017-11-08 CG-12520
                                                Consumer
                                                                                                  Furr
                                                                 Henderson
                                                                            Kentucky
                 152156
                                                                                       10000454
                                                           States
               CA-2017-
                                                          United
                                                                                        OFF-LA-
                                                                       Los
                                                                                                    (
                          2017-06-12 DV-13045
                                                Corporate
                                                                            California
                 138688
                                                                                       10000240
                                                           States
                                                                    Angeles
                                                                                                  Sur
               US-2016-
                                                          United
                                                                       Fort
                                                                                        FUR-TA-
                          2016-10-11
                                     SO-20335
                                                Consumer
                                                                              Florida
                                                                                                  Furr
                 108966
                                                                                       10000577
                                                           States
                                                                Lauderdale
               US-2016-
                                                          United
                                                                       Fort
                                                                                        OFF-ST-
                                                                                                    (
                          2016-10-11 SO-20335
                                                Consumer
                                                                              Florida
                 108966
                                                          States Lauderdale
                                                                                       10000760
                                                                                                  Sur
           #Group by year, by month and segment, and calculate aggregation statistics
In [182...
           dataset1 = dataset.groupby(['Year', "Month", 'Segmento'])["Valor_Venda"].agg([np.st
In [183...
           dataset1
```

| Year | Month | Segmento | | | |
|------|-------|-------------|------------|------------|--------|
| 2015 | 1 | Consumer | 6896.6290 | 146.736787 | 36.440 |
| | | Corporate | 1701.5280 | 130.886769 | 51.940 |
| | | Home Office | 5607.5500 | 329.855882 | 62.820 |
| | 2 | Consumer | 3167.8540 | 117.327926 | 22.776 |
| | | Corporate | 623.1180 | 69.235333 | 62.310 |
| ••• | ••• | ••• | | | |
| 2018 | 11 | Corporate | 44357.9862 | 341.215278 | 79.530 |
| | | Home Office | 24009.3840 | 247.519423 | 56.560 |
| | 12 | Consumer | 48107.4558 | 183.616244 | 52.533 |
| | | Corporate | 20524.4320 | 153.167403 | 46.460 |
| | | Home Office | 13022.3910 | 224.523983 | 49.260 |

144 rows × 3 columns

```
In [184... #Extract the levels
    year = dataset1.index.get_level_values(0)
    month = dataset1.index.get_level_values(1)
    segment = dataset1.index.get_level_values(2)
```

<Figure size 1200x600 with 0 Axes>





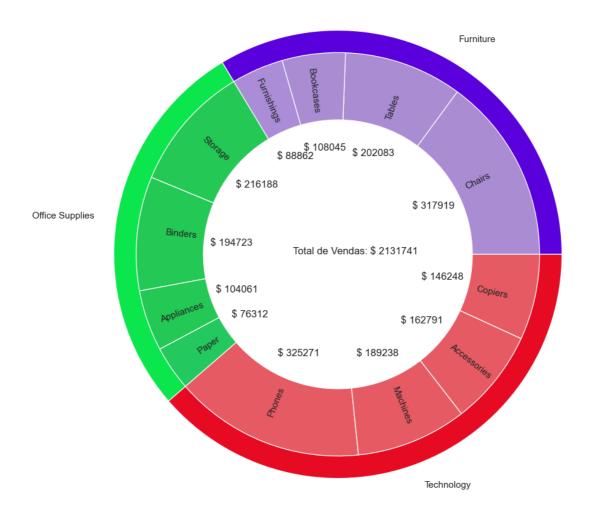
10 What The Total Sales By Categories e Subcategories For only Top 12 Subcategories

```
In [188...
            dataset.head()
Out[188]:
               ID_Pedido
                           Data_Pedido
                                        ID_Cliente
                                                                  Pais
                                                                           Cidade
                                                                                     Estado ID_Produto
                                                                                                          Cate
                CA-2017-
                                                                United
                                                                                                FUR-BO-
            0
                            2017-11-08
                                         CG-12520
                                                     Consumer
                                                                        Henderson
                                                                                    Kentucky
                                                                                                           Furr
                  152156
                                                                States
                                                                                                10001798
                CA-2017-
                                                                                                FUR-CH-
                                                                United
                            2017-11-08
                                         CG-12520
            1
                                                     Consumer
                                                                        Henderson
                                                                                    Kentucky
                                                                                                           Furr
                  152156
                                                                States
                                                                                                10000454
                CA-2017-
                                                                                                 OFF-LA-
                                                                United
                                                                                                              (
                                                                              Los
                                                                                   California
            2
                            2017-06-12
                                         DV-13045
                                                     Corporate
                                                                                                10000240
                  138688
                                                                States
                                                                          Angeles
                                                                                                            Sur
                 US-2016-
                                                                United
                                                                                                 FUR-TA-
                                                                              Fort
            3
                            2016-10-11
                                         SO-20335
                                                     Consumer
                                                                                      Florida
                                                                                                           Furr
                  108966
                                                                                                10000577
                                                                States
                                                                       Lauderdale
                 US-2016-
                                                                                                 OFF-ST-
                                                                United
                                                                              Fort
                                                                                                              (
                            2016-10-11
                                         SO-20335
                                                     Consumer
                                                                                     Florida
                  108966
                                                                States
                                                                       Lauderdale
                                                                                                10000760
                                                                                                            Sur
In [189...
            #Group by Categorie and SubCategorie, and calculate only numeric sum
            dataset2 = dataset.groupby(["Categoria", "SubCategoria"]).sum(numeric_only = True)
```

```
# Convert the Sales Value column to an integer and sort by category
In [190...
            dataset3 = dataset2[['Valor_Venda']].astype(int).sort_values(by = 'Categoria').res
            # Dataframe with categories and subcategories
In [192...
            dataset3
Out[192]:
                    Categoria SubCategoria
                                            Valor_Venda
             0
                     Furniture
                                     Chairs
                                                 317919
             1
                     Furniture
                                     Tables
                                                 202083
             2
                    Furniture
                                 Bookcases
                                                 108045
                                                  88862
             3
                     Furniture
                                 Furnishings
             4 Office Supplies
                                   Storage
                                                 216188
                                                 194723
             5 Office Supplies
                                    Binders
             6 Office Supplies
                                 Appliances
                                                 104061
             7 Office Supplies
                                                  76312
                                     Paper
             8
                   Technology
                                    Phones
                                                 325271
             9
                                                 189238
                   Technology
                                  Machines
            10
                   Technology
                                Accessories
                                                 162791
            11
                                                 146248
                   Technology
                                    Copiers
            #Create another dataframe with only the totals by category
In [195...
            dataset3_cat = dataset3.groupby('Categoria').sum(numeric_only = True).reset_index()
            # Dataframe with categories
In [196...
            dataset3_cat
Out[196]:
                  Categoria Valor_Venda
                   Furniture
                                  716909
              Office Supplies
                                  591284
            2
                 Technology
                                  823548
In [197...
            # Color lists for categories
            colors_categories = ['#5d00de',
```

'#0ee84f', '#e80e27']

```
# Plot
In [201...
          # Size of the figure
          fig, ax = plt.subplots(figsize = (18,12))
          # Graphics of the categories
          p1 = ax.pie(dataset3_cat['Valor_Venda'],
                      radius = 1,
                      labels = dataset3_cat['Categoria'],
                      wedgeprops = dict(edgecolor = 'white'),
                      colors = colors_categories)
          # Graphics of the subcategories
          p2 = ax.pie(dataset3['Valor_Venda'],
                      radius = 0.9,
                       labels = dataset3['SubCategoria'],
                       autopct = autopct_format(dataset3['Valor_Venda']),
                       colors = colors_subcategories,
                       labeldistance = 0.7,
                      wedgeprops = dict(edgecolor = 'white'),
                       pctdistance = 0.53,
                       rotatelabels = True)
          # Clean the center of the circle
          centre_circle = plt.Circle((0, 0), 0.6, fc = 'white')
          # Labels and notes
          fig = plt.gcf()
          fig.gca().add_artist(centre_circle)
          plt.annotate(text = 'Total de Vendas: ' + '$ ' + str(int(sum(dataset3['Valor_Venda'
          plt.title('Total de Vendas Por Categoria e Top 12 SubCategorias')
          plt.show()
```



In []: