```
In [1]: ▶ #import packages
             import pandas as pd
             import seaborn as sns
             import matplotlib.pyplot as plt
             from pandas import set_option
          data = 'C:\\Users\\HP\\Documents\\WORKSPACE\\Pharm Data2.xlsx'
In [2]:

    df= pd.read_excel(data)

In [3]:
In [4]:

    df.head()
    Out[4]:
                                                                                                                                                           Nar
                                Customer
                                                                                          Sub-
                                                                                                    Product
                                                                                                              Product
                 Distributor
                                             City Country Latitude Longitude
                                                                              Channel
                                                                                                                      Quantity Price
                                                                                                                                      Sales
                                                                                                                                             Month Year
                                   Name
                                                                                        channel
                                                                                                      Name
                                                                                                                Class
                                                                                                                                                           Sal
                                                                                                                                                            R
                    Gottlieb-
                              Zieme, Doyle
                                                                                                                Mood
                                                                                                                                                            Μŧ
                                           Lublin
                                                   Poland
                                                          51.2333
                                                                     22.5667
                                                                              Hospital
                                                                                         Private
                                                                                                                           4.0
                                                                                                                                 368
                                                                                                                                     1472.0 January 2018
                                                                                                   Topipizole
                 Cruickshank
                                and Kunze
                                                                                                             Stabilizers
                                                                                                                                                          Gerra
                    Gottlieb-
                                                                                                                                                          Jess
                                Feest PLC Świecie
                                                                                                            Antibiotics
                                                   Poland
                                                          53,4167
                                                                     18.4333 Pharmacy
                                                                                          Retail
                                                                                                  Choriotrisin
                                                                                                                           7.0
                                                                                                                                 591 4137.0 January 2018
                 Cruickshank
                            Medhurst-Beer
                    Gottlieb-
                                                                                                                                                           Ste
                            Pharmaceutical
                                           Rybnik
                                                   Poland
                                                           50.0833
                                                                     18.5000 Pharmacy
                                                                                      Institution
                                                                                                   Acantaine
                                                                                                            Antibiotics
                                                                                                                          30.0
                                                                                                                                  66 1980.0 January 2018
                                                                                                                                                          Pep
                 Cruickshank
                                   Limited
                    Gottlieb-
                                Barton Ltd
                                                                                                    Lioletine
                                                                                                                                                            Ma
                                          Czeladź
                                                   Poland
                                                           50 3333
                                                                     19 0833
                                                                              Hospital
                                                                                         Private
                                                                                                            Analgesics
                                                                                                                           6.0
                                                                                                                                 435 2610.0 January 2018
                 Cruickshank
                               Pharma Plc
                                                                                                   Refliruvax
                                                                                                                                                          Gerra
                    Gottlieb-
                               Keeling LLC
                                                                                                Oxymotroban
                                                                                                                                                            An
                                          Olsztyn
                                                   Poland
                                                          53.7800
                                                                     20.4942 Pharmacy
                                                                                          Retail
                                                                                                            Analgesics
                                                                                                                          20.0
                                                                                                                                 458 9160.0 January 2018
                 Cruickshank
                                Pharmacy
                                                                                                  Éexoformin
In [5]: ► df.info()
             <class 'pandas.core.frame.DataFrame'>
             RangeIndex: 254082 entries, 0 to 254081
             Data columns (total 18 columns):
              #
                  Column
                                        Non-Null Count
                                                           Dtype
              0
                  Distributor
                                        254082 non-null
                                                           object
              1
                  Customer Name
                                        254082 non-null
                                                           object
              2
                                        254082 non-null
                  Citv
                                                           object
              3
                  Country
                                        254082 non-null
                                                           object
              4
                   Latitude
                                        254082 non-null
                                                           float64
              5
                  Longitude
                                        254082 non-null
                                                           float64
                                        254082 non-null
                  Channel
                                                           object
              7
                  Sub-channel
                                        254082 non-null
                                                           object
              8
                  Product Name
                                        254082 non-null
                                                           object
              9
                  Product Class
                                        254082 non-null
                                                           object
              10
                  Quantity
                                        254082 non-null
                                                           float64
              11
                  Price
                                        254082 non-null
                                                           int64
              12
                  Sales
                                        254082 non-null
                                                           float64
              13
                  Month
                                        254082 non-null
                                                           object
                                        254082 non-null
              14
                  Year
                                                           int64
                                        254082 non-null
              15
                  Name of Sales Rep
                                                           object
                                        254082 non-null
              16
                  Manager
                                                           object
                  Sales Team
                                        254082 non-null
                                                           object
             dtypes: float64(4), int64(2), object(12)
             memory usage: 34.9+ MB
In [6]: ▶ #checking for missing values
             df.isnull().sum()
   Out[6]: Distributor
                                     0
             Customer Name
                                     0
                                     0
             Citv
             Country
                                     0
             Latitude
                                     a
             Longitude
             Channel
                                     0
             Sub-channel
                                     0
             Product Name
                                     0
                                     0
             Product Class
             Quantity
                                     0
             Price
                                     0
                                     a
             Sales
             Month
                                     0
```

Year

Manager

Sales Team

dtype: int64

Name of Sales Rep

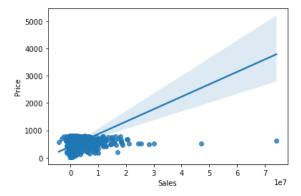
0

0

0

0

In [7]: #plt.title(" Correlation between Bill payment and Loan payment for July", fontsize = 20)
sns.regplot(x="Sales", y="Price", data=df);



There is a postive linear relationship between Price and Sales at a lower price the higher the sales

Out[8]: <AxesSubplot:>



There is a strong correlation between quatity and sales



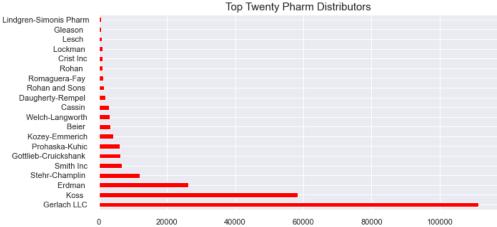
120000 - 1000000 - 100000 - 100000 - 100000 - 100000 - 100000 - 100000 - 1000000 - 100000 - 100000 - 100000 - 100000 - 100000 - 100000 - 1000000 - 100000 - 100000 - 100000 - 100000 - 100000 - 100000 - 1000000 - 100000 - 100000 - 100000 - 100000 - 100000 - 100000 - 1000000 - 100000 - 100000 - 100000 - 100000 - 100000 - 100000 - 1000000 - 100000 - 100000 - 100000 - 100000 - 100000 - 100000 - 1000000 - 100000 - 100000 - 100000 - 100000 - 100000 - 100000 - 1000000 - 100000 - 100000 - 100000 - 100000 - 100000 - 100000 - 1000000 - 100000 - 100000 - 100000 - 100000 - 100000 - 100000 - 1000000 - 100000 - 100000 - 100000 - 100000 - 100000 - 100000 - 1000000 - 100000 - 100000 - 100000 - 100000 - 100000 - 100000 - 1000000 - 100000 - 100000 - 100000 - 100000 - 100000 - 100000 - 1000000 - 100000 - 100000 - 100000 - 100000 - 100000 - 100000 - 1000000 - 100000 - 100000 - 100000 - 100000 - 100000 - 100000 - 1000000 - 100000 - 100000 - 100000 - 100000 - 100000 - 100000 - 1000000 - 100000 - 100000 - 100000 - 100000 - 100000 - 100000 - 10000

We can see that there is a positive linear relationship between Quantity and Sales the higher the qunatity sold the higher the sales that is being made.

```
In [10]: ► #descriptive analysis of the data
                 df.describe()
    Out[10]:
                                                                                     Price
                                Latitude
                                               Longitude
                                                                 Quantity
                                                                                                     Sales
                                                                                                                       Year
                         254082.000000 254082.000000 254082.000000 254082.000000
                                                                                             2.540820e+05 254082.000000
                  count
                               50.962222
                                               10.803212
                                                               112.872139
                                                                               412.207720
                                                                                             4.643772e+04
                                                                                                               2018.385187
                  mean
                                1.625526
                                                4.143311
                                                               744.310385
                                                                               224.963687
                                                                                             3.491918e+05
                     std
                                                                                                                  1.041352
                    min
                               47.514200
                                                6.083800
                                                             -7200.000000
                                                                                22.000000
                                                                                            -4.161600e+06
                                                                                                               2017.000000
                    25%
                               49.805600
                                                7.891100
                                                                 5.000000
                                                                               195.000000
                                                                                             1.704000e+03
                                                                                                               2018.000000
                    50%
                               51.133300
                                                9.397800
                                                                20.000000
                                                                               430.000000
                                                                                             5.850000e+03
                                                                                                               2018.000000
                    75%
                               52.083300
                                                12.133300
                                                                50.000000
                                                                               605.000000
                                                                                             2.156525e+04
                                                                                                               2019.000000
                               54.781900
                                               23.566700 117600.000000
                                                                               794.000000
                                                                                            7.420560e+07
                                                                                                               2020.000000
                    max
In [11]: ► #checking for unique disributors
                 df['Distributor'].unique()
    Out[11]: array(['Gottlieb-Cruickshank ', 'Carter-Conn ', 'Prohaska-Kuhic ', 'Smith Inc ', 'Rohan ', 'Schuppe Inc ', 'Cassin ', 'Graham and Sons ', 'Stehr-Champlin ', 'Kris LLC ', 'Rogahn-Klein ', 'Lindgren-Simonis Pharm', 'Beier ', 'Gerlach LLC ', 'Erdman ', 'Koss ', 'Schaefer LLC ', 'Crist Inc ', 'Rohan and Sons ', 'Lockman ', 'Kozey-Emmerich ', 'Gleason ', 'Romaguera-Fay ', 'Daugherty-Rempel ', 'Wilden Caylond '
                           'Welch-Langworth ', 'Bashirian-Kassulke ', 'Nader-Gaylord ', 'Hansen Group Pharm', 'Lesch '], dtype=object)
In [12]:
             (df['Distributor'].value_counts())
    Out[12]: Gerlach LLC
                                                    111364
                 Koss
                                                     58360
                 Erdman
                                                     26238
                 Stehr-Champlin
                                                     11942
                 Smith Inc
                                                      6802
                 Gottlieb-Cruickshank
                                                       6427
                 Prohaska-Kuhic
                                                       6109
                 Kozey-Emmerich
                                                       4305
                 Beier
                                                       3311
                 Welch-Langworth
                                                       3125
                 Cassin
                                                       3007
                 Daugherty-Rempel
                                                       1960
                 Rohan and Sons
                                                       1575
                 Romaguera-Fay
                                                       1356
                 Rohan
                                                       1185
                 Crist Inc
                                                       1157
                 Lockman
                                                       1013
                 Lesch
                                                        974
                 Gleason
                                                        779
                 Lindgren-Simonis Pharm
                                                        759
                 Schaefer LLC
                                                        572
                 Nader-Gaylord
                                                        324
                 Hansen Group Pharm
                                                        318
                 Schuppe Inc
                                                        269
                 Rogahn-Klein
                                                        227
                 Graham and Sons
                                                        213
                 Carter-Conn
                                                        181
                 Bashirian-Kassulke
                                                        178
                 Kris LLC
                                                         52
```

Name: Distributor, dtype: int64





From the above analysis we can see that Gerlach LLC of all the distributor had the highest occurrence with a count of 111,364. we can then say for a fact that Gerlach LLC was a major dististributor amongts others.

```
In [48]: #checkiong the distributor with the highest amount of sales dist_sales =df.groupby('Distributor')[['Sales']].sum().sort_values(by=['Sales'],ascending=False)[:10];
```


 Distributor

 Gerlach LLC
 3.501834e+09

 Koss
 3.087827e+09

 Erdman
 1.522610e+09

 Kozey-Emmerich
 1.232932e+09

 Romaguera-Fay
 4.449925e+08

 Bashirian-Kassulke
 3.493407e+08

 Welch-Langworth
 2.606324e+08

 Daugherty-Rempel
 2.321302e+08

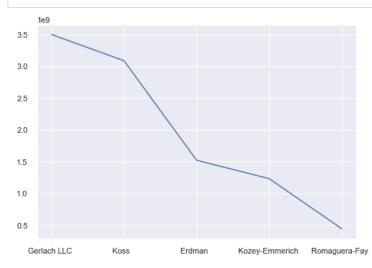
 Beier
 1.508344e+08

Rohan and Sons 1.425120e+08

Sales

```
In [51]: 

#plot showing the analysis of sales by distributor
plt.plot(df.groupby('Distributor')[['Sales']].sum().sort_values(by=['Sales'],ascending=False)[:5]);
```



Out[18]:

	Distributor	Month	Sales
79	Gerlach LLC	July	3.622057e+08
83	Gerlach LLC	November	3.580536e+08
80	Gerlach LLC	June	3.570305e+08
122	Koss	June	3.055939e+08
123	Koss	March	3.028968e+08
81	Gerlach LLC	March	3.007010e+08
117	Koss	August	3.001932e+08
118	Koss	December	2.932541e+08
82	Gerlach LLC	May	2.927934e+08
125	Koss	November	2.894637e+08
84	Gerlach LLC	October	2.874368e+08
85	Gerlach LLC	September	2.847042e+08
74	Gerlach LLC	April	2.745771e+08
127	Koss	September	2.656886e+08
1	Bashirian-Kassulke	August	2.595039e+08
121	Koss	July	2.563525e+08
126	Koss	October	2.516082e+08
77	Gerlach LLC	February	2.507439e+08
78	Gerlach LLC	January	2.504595e+08
75	Gerlach LLC	August	2.502074e+08
119	Koss	February	2.353290e+08
76	Gerlach LLC	December	2.329213e+08
124	Koss	May	2.324940e+08
116	Koss	April	2.101942e+08
73	Erdman	September	1.726316e+08
135	Kozey-Emmerich	March	1.617111e+08
64	Erdman	December	1.557550e+08
68	Erdman	June	1.540488e+08
120	Koss	January	1.447594e+08
137	Kozey-Emmerich	November	1.415153e+08
138	Kozey-Emmerich	October	1.402210e+08
71	Erdman	November	1.372861e+08
67	Erdman	July	1.342499e+08
72	Erdman	October	1.278108e+08
65	Erdman	February	1.265052e+08
69	Erdman	March	1.254089e+08
129	Kozey-Emmerich	August	1.174838e+08
133	Kozey-Emmerich	July	1.167387e+08
130	Kozey-Emmerich	December	1.145090e+08
62	Erdman	April	1.113199e+08
70	Erdman	May	1.068488e+08
63	Erdman	August	9.821901e+07
139	Kozey-Emmerich	September	9.491943e+07
131	Kozey-Emmerich	February	9.057764e+07
128	Kozey-Emmerich	April	8.762715e+07
136	Kozey-Emmerich	May	8.432686e+07
224	Romaguera-Fay	March	7.332049e+07
66	Erdman	January	7.252580e+07
221	Romaguera-Fay	January	7.234593e+07
220	Romaguera-Fay	February	5.701198e+07

```
In [21]: ▶ #analysis of products based on slaes
              product_sales = df.groupby('Product Name')[['Sales']].sum().sort_values(by=['Sales'],ascending=False)
In [22]:
           ▶ product_sales.head(10)
    Out[22]:
                                            Sales
                         Product Name
                            Ionclotide 169083391.0
                            Tetratanyl 126091294.0
                          Sumanazole
                                      113861431.0
                             Betanem 107073473.0
                       Docstryl Rivacin 103811886.0
                           Travoloride 101167660.0
                          Propratecan
                                      100878712.0
                                       97313783.0
                            Ketastadil
                                       96643552.0
                     Nevanide Actozide
               Cephozumab Synmethate
                                       95320320.0
          lonciotide was the product with the most sales with a total sale of 169,083,391.
In [55]:
           #visul analysis to show the product with the most sale.
              plt.plot(df.groupby('Product Name')[['Sales']].sum().sort_values(by=['Sales'],ascending=False).head());
              plt.show()
                    1e8
               1.7
               1.6
               1.5
               1.4
               1.3
               1.2
               1.1
                   lonclotide
                                  Tetratanyl
                                                               Betanem
                                                                           Docstryl Rivacin
                                                Sumanazole
In [23]:
           ⋈ #product by quantiy
              product_quant = df.groupby('Product Name')[['Quantity']].sum().sort_values(by=['Quantity'],ascending= False)
In [24]: ▶ product_quant.head(10)
    Out[24]:
                                    Quantity
                      Product Name
                          Ionclotide
                                   267961.0
                          Tetratanyl 246754.0
                        Sumanazole 215239.0
                                   193393.0
               Formolovir Amanferon
                          Symdocet 193282.0
                          Hepavice 177452.0
                                   177196.0
                         Amavirase
                          Betanem 175243.0
               Dantocept Ferurenone 173490.0
```

Zyvance 172260.0

```
In [25]: | (df['Channel'].value_counts())
   Out[25]: Pharmacy
                          129971
             Hospital
                          124111
             Name: Channel, dtype: int64
In [26]: | plt.style.use('seaborn')
             sns.set(style="darkgrid")
             plt.figure(figsize = (10, 5))
             plt.title('Top Distribution Channel', fontsize = 15)
             df['Channel'].value_counts()[:20].plot(kind='bar', color='red')
             plt.show()
              120000
               100000
               80000
               60000
               40000
               20000
                  0
                                                                              Hospital
In [27]:
          #channerl of distribution by sales
             chan_sales = df.groupby('Channel')[['Sales']].sum().sort_values(by=['Sales'],ascending=False)
In [28]:

    ★ chan_sales

   Out[28]:
                              Sales
                Channel
              Pharmacy 6.218312e+09
               Hospital 5.580676e+09
         From the above table we can see that Pharmacy was the channnel where the most sales were made with a total of 6.2 Billion
          Myear_sales = df.groupby('Year')[['Sales']].sum().sort_values(by=['Sales'],ascending=True)
In [29]:
In [30]:
          Out[30]:
                          Sales
              Year
              2020 2.659672e+09
              2017 2.701481e+09
              2019 2.930937e+09
              2018 3.506897e+09
In [31]: | (df['Country'].value_counts())
   Out[31]: Germany
                         213598
             Poland
                          40484
             Name: Country, dtype: int64
In [32]: | df.groupby('Sub-channel')[['Sales']].sum().sort_values(by=['Sales'],ascending=False)
   Out[32]:
                                Sales
              Sub-channel
                   Retail 3.343097e+09
              Government 3.058240e+09
                Institution 2.875215e+09
                  Private 2.522435e+09
```

```
In [33]: | (df['City'].value_counts()).head(10)
   Out[33]: Friedberg
                          796
             Neustadt
                          440
             Bergheim
             Ettlingen
                          437
             Keh1
                          436
            Merseburg
                          436
            01denburg
                          434
             Zeitz
                          431
            Hamburg
                          430
            Apolda
                          429
             Name: City, dtype: int64
In [34]: | M | df.groupby('City')[['Sales']].sum().sort_values(by=['Sales'],ascending=False)[:10]
   Out[34]:
                                 Sales
                      City
                  Butzbach 9.356178e+07
                 Baesweiler 6.489050e+07
                  Cuxhaven 5.600668e+07
                  Friedberg 5.218363e+07
                  Altenburg 5.088532e+07
                 Emsdetten 4.593901e+07
                   Bottrop 4.445462e+07
                   Freising 4.377938e+07
                      Trier 4.349563e+07
             Castrop-Rauxel 4.206666e+07
In [35]: | (df['Sub-channel'].value_counts())
   Out[35]: Retail
                            68351
            Government
                            65605
             Institution
                            61620
                            58506
            Private
             Name: Sub-channel, dtype: int64
In [36]: | (df['Product Class'].value_counts())
   Out[36]: Antiseptics
                                 52037
             Mood Stabilizers
                                 46415
                                 44751
            Analgesics
            Antibiotics
                                 36979
                                 36955
            Antipiretics
             Antimalarial
                                 36945
             Name: Product Class, dtype: int64
In [37]: | df.groupby('Product Class')[['Quantity']].sum().sort_values(by=['Quantity'],ascending=False)
   Out[37]:
                               Quantity
               Product Class
                  Analgesics 5.553144e+06
                  Antiseptics 5.499913e+06
              Mood Stabilizers 5.169781e+06
                 Antimalarial 4.249075e+06
                  Antibiotics 4.154322e+06
                 Antipiretics 4.052544e+06
Out[38]:
                              Sales
              Sub-channel
                  Retail 3.343097e+09
              Government 3.058240e+09
               Institution 2.875215e+09
```

Private 2.522435e+09

```
Out[39]:
                 Month
                August 1.186627e+09
              November 1.108803e+09
                 March 1.108802e+09
                  June 1.064033e+09
                  July
                      1.042537e+09
             September 1.029988e+09
              December 9.750071e+08
               February 9.721298e+08
               October 9.716484e+08
                  May 8.651872e+08
                  April 8.000346e+08
               January 6.741911e+08
Out[40]:
                             Sales
             Sales Team
                  Delta 3.635341e+09
                Charlie 2.824970e+09
                 Bravo 2.757702e+09
                   Alfa 2.580974e+09
In [41]:
          plt.plot(df.groupby('Sales Team')[['Sales']].sum().sort_values(by=['Sales'],ascending=False))
            plt.show()
                 1e9
              3.6
              3.4
              3.2
              3.0
              2.8
              2.6
                  Delta
                                   Charlie
                                                     Bravo
         | (df.groupby('Sales Team')[['Quantity']].sum().sort_values(by=['Quantity'],ascending=False))
 In [ ]:
 In [ ]:
          M (df['Manager'].value_counts())
 In [ ]:
          \label{eq:manager} \verb|M| df.groupby(['Manager', 'Country'])[['Sales']].sum().sort\_values(by=['Sales'],ascending=False)
 In [ ]:
In [ ]: ▶
          M #dist_sales = df.groupby('Distributor')[['Sales']].count().sort_values(by= ['Sales'], ascending=False)
 In [ ]:
            #dist_sales.sort_values(ascending=True)
          M
 In [ ]:
```

In [39]: | df.groupby('Month')[['Sales']].sum().sort_values(by=['Sales'],ascending=False)