Data Analysis CAPESTONE

Import Librairies

```
In [9]: import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
import seaborn as sns
```

import & Inspect DATA

In [10]: startups = pd.read_excel('startup-expansion.xlsx')

In [11]: startups

Out[11]:

	Store ID	City	State	Sales Region	New Expansion	Marketing Spend	Revenue
	0 1	Peoria	Arizona	Region 2	Old	2601	48610
	1 2	Midland	Texas	Region 2	Old	2727	45689
	2 3	Spokane	Washington	Region 2	Old	2768	49554
	3 4	Denton	Texas	Region 2	Old	2759	38284
	4 5	Overland Park	Kansas	Region 2	Old	2869	59887
						•••	
14	15 146	Paterson	New Jersey	Region 1	New	2251	34603
14	14 7	Brownsville	Texas	Region 2	New	3675	63148
14	17 148	Rockford	Illinois	Region 1	New	2648	43377
14	14 9	College Station	Texas	Region 2	New	2994	22457
14	. 9 150	Thousand Oaks	California	Region 2	New	2431	40141

150 rows × 7 columns

```
In [12]: startups.info()
```

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 150 entries, 0 to 149
Data columns (total 7 columns):

Column	Non-Null Count	Dtype
Store ID	150 non-null	int64
City	150 non-null	object
State	150 non-null	object
Sales Region	150 non-null	object
New Expansion	150 non-null	object
Marketing Spend	150 non-null	int64
Revenue	150 non-null	int64
	Store ID City State Sales Region New Expansion Marketing Spend	Store ID 150 non-null City 150 non-null State 150 non-null Sales Region 150 non-null New Expansion 150 non-null Marketing Spend 150 non-null

dtypes: int64(3), object(4)

memory usage: 8.3+ KB

In [14]: startups.describe().round(2)

	Store ID	Marketing Spend	Revenue
count	150.00	150.00	150.00
mean	75.50	2893.15	39301.43
std	43.45	367.86	15465.75
min	1.00	1811.00	15562.00
25%	38.25	2662.25	21113.50
50%	75.50	2898.00	42993.00
75%	112.75	3111.50	51145.50
max	150.00	3984.00	68828.00

In []:

Out[14]:

Preprocessing DATA

```
In [17]: startups['City'].value_counts()
Out[17]: Rochester
                                   2
            Killeen
                                   1
            Wichita Falls
                                   1
            Naperville
                                   1
            Clovis
                                   1
            Akron
                                   1
            Fullerton
                                   1
            Manchester
                                   1
            Everett
                                   1
            Thousand Oaks
                                   1
            Name: City, Length: 149, dtype: int64
In [19]: startups['State'].unique()
Out[19]: array(['Arizona', 'Texas', 'Washington', 'Kansas', 'New York', 'Alabama', 'California', 'Massachusetts', 'New Mexico', 'Mississippi', 'Oregon', 'Florida', 'Oklahoma', 'New Jersey', 'Utah', 'Colorado',
                      'Michigan', 'South Carolina', 'Virginia', 'Ohio', 'New Hampshire',
                      'Connecticut', 'Iowa', 'Arkansas', 'Tennessee', 'North Carolina',
                      'Georgia', 'Illinois', 'Montana', 'Indiana', 'South Dakota', 'Louisiana', 'Minnesota', 'Wisconsin', 'Rhode Island'],
                    dtype=object)
In [20]: startups['State'].value_counts()
```

```
Out[20]: California
                            40
         Texas
                            17
         Florida
                            12
         Washington
                             7
                             5
         Colorado
                             5
         Illinois
         Georgia
                             4
                             4
         Alabama
         Connecticut
                             4
                             4
         New Jersey
                             3
         Arizona
                             3
         Tennessee
                             3
         Iowa
                             3
         Michigan
         South Carolina
                             3
                             3
         Utah
                             3
         Massachusetts
                             3
         Kansas
         New York
                             3
         Louisiana
                             2
                             2
         North Carolina
                             2
         0hio
                             2
         Virginia
         0regon
                             2
         Mississippi
                             1
         New Mexico
                             1
         Arkansas
                             1
                             1
         New Hampshire
         0klahoma
                             1
                             1
         Montana
         Indiana
                             1
                             1
         South Dakota
                             1
         Minnesota
                             1
         Wisconsin
         Rhode Island
                             1
         Name: State, dtype: int64
In [21]: startups['Sales Region'].unique()
Out[21]: array(['Region 2', 'Region 1'], dtype=object)
In [24]:
         startups['Sales Region'].value_counts()
Out[24]: Region 2
                      86
         Region 1
                      64
         Name: Sales Region, dtype: int64
In [23]: startups['New Expansion'].unique()
Out[23]: array(['Old', 'New'], dtype=object)
In [25]: startups['New Expansion'].value_counts()
Out[25]: Old
                 140
         New
                  10
         Name: New Expansion, dtype: int64
In [26]: startups.isna().sum()
```

```
Out[26]: Store ID 0
City 0
State 0
Sales Region 0
New Expansion 0
Marketing Spend 0
Revenue 0
dtype: int64
```

```
In [27]: startups.duplicated().sum()
```

Out[27]: 0

In [28]: startups['Store ID'].duplicated().sum()

Out[28]: 0

Exploring & Analysing Data

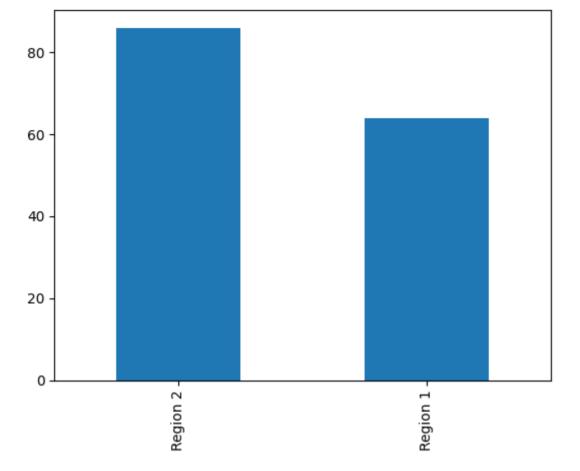
In [29]: startups.sample(10)

Out[29]:

	Store ID	City	State	Sales Region	New Expansion	Marketing Spend	Revenue
112	113	Knoxville	Tennessee	Region 2	Old	3086	56504
140	141	Chattanooga	Tennessee	Region 2	New	3587	55357
137	138	Norwalk	California	Region 2	Old	3112	19703
147	148	Rockford	Illinois	Region 1	New	2648	43377
134	135	Santa Rosa	California	Region 2	Old	3067	59060
44	45	San Bernardino	California	Region 2	Old	3399	59870
41	42	Newport News	Virginia	Region 1	Old	2758	57625
77	78	New Haven	Connecticut	Region 1	Old	3162	45550
55	56	Thornton	Colorado	Region 2	Old	2642	46490
89	90	Tacoma	Washington	Region 2	Old	2552	45666

```
In [35]: startups['Sales Region'].value_counts().plot.bar()
```

Out[35]: <Axes: >



In [37]: startups.groupby("New Expansion").groups

Out[37]: {'New': [140, 141, 142, 143, 144, 145, 146, 147, 148, 149], 'Old': [0, 1, 2, 3, 4, 5, 6, 7, 8, 9, 10, 11, 12, 13, 14, 15, 16, 17, 18, 19, 20, 21, 22, 23, 24, 25, 26, 27, 2 8, 29, 30, 31, 32, 33, 34, 35, 36, 37, 38, 39, 40, 41, 42, 43, 44, 45, 46, 47, 48, 4 9, 50, 51, 52, 53, 54, 55, 56, 57, 58, 59, 60, 61, 62, 63, 64, 65, 66, 67, 68, 69, 7 0, 71, 72, 73, 74, 75, 76, 77, 78, 79, 80, 81, 82, 83, 84, 85, 86, 87, 88, 89, 90, 9 1, 92, 93, 94, 95, 96, 97, 98, 99, ...]}

In [38]: startups[startups['New Expansion']=='New']

Out[38]:

	Store ID	City	State	Sales Region	New Expansion	Marketing Spend	Revenue
140	141	Chattanooga	Tennessee	Region 2	New	3587	55357
141	142	Tempe	Arizona	Region 2	New	2911	48954
142	143	Joliet	Illinois	Region 1	New	3279	48315
143	144	Rancho Cucamonga	California	Region 2	New	2945	52366
144	145	Glendale	California	Region 2	New	2363	49376
145	146	Paterson	New Jersey	Region 1	New	2251	34603
146	147	Brownsville	Texas	Region 2	New	3675	63148
147	148	Rockford	Illinois	Region 1	New	2648	43377
148	149	College Station	Texas	Region 2	New	2994	22457
149	150	Thousand Oaks	California	Region 2	New	2431	40141

```
Brownsville
                                63148
          Chattanooga
                                55357
          College Station
                                22457
          Glendale
                                49376
          Joliet
                                48315
          Paterson
                                34603
          Rancho Cucamonga
                                 52366
          Rockford
                                 43377
          Tempe
                                 48954
          Thousand Oaks
                                 40141
          Name: Revenue, dtype: int64
In [46]:
          startups[startups['New Expansion']=='Old'].groupby('City').max()['Revenue'].nlargest(
Out[46]: City
          Little Rock
                              68828
          Grand Rapids
                              65475
          Rochester
                              64906
          0xnard
                              64302
          Fontana
                              63027
          Providence
                              62337
          Birmingham
                              60338
          Overland Park
                              59887
          San Bernardino
                              59870
          Worcester
                              59840
          Name: Revenue, dtype: int64
          startups['Profit'] = startups['Revenue'] - startups['Marketing Spend']
In [47]:
In [48]:
          startups
Out [48]:
                Store
                                                    Sales
                                                                  New
                                                                           Marketing
                               City
                                         State
                                                                                      Revenue
                                                                                                Profit
                                                                              Spend
                   ID
                                                   Region
                                                             Expansion
             0
                     1
                             Peoria
                                        Arizona
                                                  Region 2
                                                                   Old
                                                                               2601
                                                                                        48610
                                                                                               46009
                    2
                           Midland
                                         Texas
                                                  Region 2
                                                                   Old
                                                                               2727
                                                                                        45689
                                                                                               42962
             2
                    3
                           Spokane
                                    Washington
                                                  Region 2
                                                                   Old
                                                                               2768
                                                                                               46786
                                                                                        49554
             3
                    4
                            Denton
                                         Texas
                                                  Region 2
                                                                   Old
                                                                               2759
                                                                                        38284
                                                                                                35525
                           Overland
             4
                    5
                                                                   Old
                                                                               2869
                                                                                        59887
                                                                                                57018
                                        Kansas
                                                  Region 2
                              Park
          145
                  146
                                                  Region 1
                                                                                2251
                                                                                        34603
                                                                                               32352
                           Paterson
                                    New Jersey
                                                                  New
          146
                  147
                         Brownsville
                                         Texas
                                                  Region 2
                                                                  New
                                                                               3675
                                                                                        63148
                                                                                                59473
          147
                  148
                                                                               2648
                           Rockford
                                         Illinois
                                                  Region 1
                                                                  New
                                                                                        43377
                                                                                                40729
                            College
          148
                  149
                                         Texas
                                                  Region 2
                                                                  New
                                                                               2994
                                                                                        22457
                                                                                                19463
                            Station
                          Thousand
          149
                  150
                                      California
                                                 Region 2
                                                                               2431
                                                                                        40141
                                                                                                37710
                                                                  New
                              Oaks
         150 rows × 8 columns
```

Out[44]: City

In [49]: startups['ROMS']= round((startups['Profit'] / startups['Marketing Spend'])*100,2)
In [52]: startups['ROMS']

```
1
                   1575.43
           2
                   1690.25
           3
                   1287.60
           4
                   1987.38
           145
                   1437.23
           146
                   1618.31
           147
                   1538.10
           148
                    650.07
           149
                   1551.21
           Name: ROMS, Length: 150, dtype: float64
In [53]:
           startups['ROMS%'] = startups['ROMS']/100
In [54]:
           startups['ROMS%']
Out[54]:
          0
                   17.6890
           1
                   15.7543
           2
                   16.9025
           3
                   12.8760
           4
                   19.8738
                    . . .
           145
                   14.3723
           146
                   16.1831
           147
                   15.3810
                    6.5007
           148
           149
                   15.5121
           Name: ROMS%, Length: 150, dtype: float64
In [55]:
           startups
Out[55]:
                 Store
                                                  Sales
                                                               New
                                                                     Marketing
                              City
                                          State
                                                                                 Revenue
                                                                                            Profit
                                                                                                     ROMS
                                                                         Spend
                    ID
                                                 Region
                                                         Expansion
                                                 Region
             0
                     1
                            Peoria
                                        Arizona
                                                                Old
                                                                           2601
                                                                                    48610
                                                                                           46009
                                                                                                    1768.90
                                                      2
                                                 Region
                     2
                                                                Old
                                                                                           42962
              1
                           Midland
                                          Texas
                                                                           2727
                                                                                   45689
                                                                                                    1575.43
                                                      2
                                                 Region
             2
                     3
                          Spokane
                                    Washington
                                                                Old
                                                                          2768
                                                                                   49554
                                                                                           46786
                                                                                                    1690.25
                                                 Region
             3
                     4
                                                                Old
                                                                          2759
                                                                                    38284
                                                                                            35525
                                                                                                    1287.60
                            Denton
                                          Texas
                          Overland
                                                 Region
             4
                     5
                                                                          2869
                                                                Old
                                                                                    59887
                                                                                            57018
                                                                                                    1987.38
                                        Kansas
                              Park
                                                      2
                                                 Region
                                    New Jersey
                                                                                                    1437.23
           145
                   146
                          Paterson
                                                               New
                                                                           2251
                                                                                    34603
                                                                                            32352
                                                 Region
           146
                   147
                        Brownsville
                                                                          3675
                                                                                    63148
                                                                                            59473
                                                                                                    1618.31
                                          Texas
                                                               New
                                                      2
                                                 Region
           147
                  148
                          Rockford
                                         Illinois
                                                                                            40729
                                                                                                    1538.10
                                                               New
                                                                          2648
                                                                                    43377
                                                      1
                           College
                                                 Region
           148
                                                                          2994
                                                                                            19463
                                                                                                     650.07
                   149
                                          Texas
                                                               New
                                                                                    22457
                            Station
                         Thousand
                                                 Region
           149
                   150
                                      California
                                                               New
                                                                           2431
                                                                                    40141
                                                                                            37710
                                                                                                    1551.21
                              Oaks
                                                      2
          150 rows × 10 columns
```

Out[52]:

0

1768.90

In [56]: startups.to_csv('startups_modified.csv')
In []:

√ 432K Sum of Marketing Spend

Startup Expansion

5M Sum of Profit

6M

New Expansion

☐ New ☐ Old

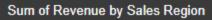
Region 1

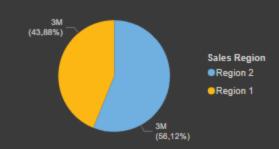
Region 2

Sales Region

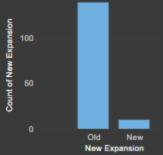
Sum of Profit by State







Count of New Expansion by New Expansion





Sum of Profit by State and New Expansion



Sum of Profit by Store ID

