forage-1

November 6, 2024

Import the libraries

```
[13]: import pandas as pd
import numpy as np
import seaborn as sns
import matplotlib.pyplot as plt
import plotly.express as px
import plotly.graph_objects as go
```

0.1 Manually extracted the dataset from SEC's EDGAR database

- https://www.sec.gov/edgar/browse/?CIK=789019&owner=exclude
- https://www.sec.gov/edgar/browse/?CIK=1318605&owner=exclude
- https://www.sec.gov/edgar/browse/?CIK=320193&owner=exclude

```
[14]: df=pd.read_csv("forage_report.csv")
```

[17]: df

CTIJ.	Q.I						
[17]:		Year	Total Revenue N	Net Income Tot	al Assets	Total Liabilities	\
	0	2023	211915	72361	411976	205753	
	1	2022	198270	72738	364840	198298	
	2	2021	168088	61271	333779	191791	
	3	2023	96773	14974	106618	43009	
	4	2022	81462	12587	82338	36440	
	5	2021	53823	5644	62131	30548	
	6	2023	383285	96995	352583	290437	
	7	2022	394328	99803	352755	302083	
	8	2021	365817	94680	351002	287912	
		Cash	Flow from Operati	ing Activities	Company		
	0			87582	Microsoft		
	1			89035	Microsoft		
	2			76740	Microsoft		
	3			13256	Tacla		

8 104038 Apple

0.2 Year over year changes for Total Revenue and Net Income

```
[19]: df['Revenue Growth (%)']=df.groupby(['Company'])['Total Revenue'].
       →pct_change()*100
      df['Net Income Growth (%)']=df.groupby(['Company'])['Net Income'].
        →pct_change()*100
[21]: df
[21]:
         Year
               Total Revenue Net Income
                                            Total Assets
                                                          Total Liabilities
         2023
                       211915
                                     72361
                                                   411976
                                                                       205753
      0
      1 2022
                                     72738
                                                                       198298
                       198270
                                                   364840
      2 2021
                       168088
                                     61271
                                                   333779
                                                                       191791
      3
        2023
                        96773
                                     14974
                                                   106618
                                                                        43009
      4
        2022
                        81462
                                     12587
                                                   82338
                                                                        36440
        2021
      5
                        53823
                                      5644
                                                    62131
                                                                        30548
      6 2023
                       383285
                                     96995
                                                   352583
                                                                       290437
      7
         2022
                       394328
                                     99803
                                                   352755
                                                                       302083
      8 2021
                       365817
                                     94680
                                                   351002
                                                                       287912
         Cash Flow from Operating Activities
                                                            Revenue Growth (%)
                                                   Company
      0
                                         87582
                                               Microsoft
                                                                            NaN
      1
                                         89035
                                                Microsoft
                                                                     -6.438902
      2
                                         76740
                                                Microsoft
                                                                    -15.222676
      3
                                         13256
                                                    Tesla
                                                                            NaN
      4
                                                    Tesla
                                         14724
                                                                    -15.821562
      5
                                         11497
                                                    Tesla
                                                                    -33.928703
      6
                                        110543
                                                    Apple
                                                                            NaN
      7
                                        122151
                                                    Apple
                                                                       2.881146
      8
                                        104038
                                                                     -7.230275
                                                    Apple
         Net Income Growth (%)
      0
                            NaN
                       0.520999
      1
      2
                     -15.764800
      3
                            NaN
      4
                     -15.940964
                     -55.160086
      5
      6
                            NaN
      7
                       2.894995
      8
                      -5.133112
```

0.3 Handling the missing values

```
[23]: df.fillna(0, inplace=True)
[25]: df
[25]:
         Year
               Total Revenue
                                Net Income
                                            Total Assets
                                                            Total Liabilities
         2023
                                     72361
                                                   411976
                                                                        205753
                       211915
      1
         2022
                                     72738
                                                                        198298
                       198270
                                                   364840
      2
        2021
                       168088
                                     61271
                                                   333779
                                                                        191791
      3
        2023
                        96773
                                     14974
                                                   106618
                                                                         43009
      4 2022
                        81462
                                     12587
                                                    82338
                                                                         36440
      5
        2021
                        53823
                                      5644
                                                    62131
                                                                         30548
      6 2023
                       383285
                                                   352583
                                     96995
                                                                        290437
         2022
      7
                       394328
                                     99803
                                                   352755
                                                                        302083
        2021
                                                                        287912
      8
                       365817
                                     94680
                                                   351002
         Cash Flow from Operating Activities
                                                             Revenue Growth (%)
                                                   Company
      0
                                         87582
                                                 Microsoft
                                                                        0.000000
      1
                                         89035
                                                 Microsoft
                                                                       -6.438902
      2
                                         76740
                                                 Microsoft
                                                                      -15.222676
      3
                                         13256
                                                     Tesla
                                                                        0.000000
      4
                                         14724
                                                     Tesla
                                                                      -15.821562
      5
                                         11497
                                                     Tesla
                                                                      -33.928703
      6
                                         110543
                                                     Apple
                                                                        0.000000
      7
                                                     Apple
                                         122151
                                                                        2.881146
      8
                                         104038
                                                     Apple
                                                                       -7.230275
         Net Income Growth (%)
      0
                       0.00000
      1
                       0.520999
      2
                     -15.764800
      3
                       0.00000
      4
                     -15.940964
      5
                     -55.160086
      6
                       0.00000
      7
                       2.894995
      8
                      -5.133112
```

O.4 Year by year changes for Total Assets, Total Liabilities and Cash Flow from Operational Activities

```
[27]: df['Assets Growth (%)']=df.groupby('Company')['Total Assets'].pct_change()*100
df['Liabilities Growth (%)']=df.groupby('Company')['Total Liabilities'].

→pct_change()*100
df['Cash Flow from Operations Growth (%)']=df.groupby('Company')['Cash Flow
→from Operating Activities'].pct_change()*100
```

```
[29]:
         Year
               Total Revenue
                               Net Income
                                            Total Assets
                                                           Total Liabilities
         2023
                       211915
                                     72361
                                                   411976
                                                                        205753
      1
         2022
                       198270
                                     72738
                                                   364840
                                                                        198298
         2021
                       168088
                                     61271
                                                   333779
                                                                        191791
      3
         2023
                        96773
                                     14974
                                                   106618
                                                                         43009
      4
         2022
                        81462
                                     12587
                                                    82338
                                                                         36440
      5
         2021
                        53823
                                                                         30548
                                      5644
                                                    62131
         2023
      6
                       383285
                                     96995
                                                   352583
                                                                        290437
      7
         2022
                                     99803
                                                   352755
                                                                        302083
                       394328
         2021
                       365817
                                     94680
                                                   351002
                                                                        287912
         Cash Flow from Operating Activities
                                                             Revenue Growth (%)
                                                   Company
      0
                                         87582
                                                Microsoft
                                                                        0.00000
      1
                                         89035
                                                Microsoft
                                                                       -6.438902
      2
                                         76740
                                                 Microsoft
                                                                     -15.222676
      3
                                         13256
                                                     Tesla
                                                                        0.00000
      4
                                         14724
                                                     Tesla
                                                                     -15.821562
      5
                                         11497
                                                     Tesla
                                                                      -33.928703
      6
                                         110543
                                                     Apple
                                                                        0.00000
      7
                                         122151
                                                     Apple
                                                                        2.881146
      8
                                         104038
                                                     Apple
                                                                       -7.230275
         Net Income Growth (%)
                                  Assets Growth (%)
                                                      Liabilities Growth (%)
      0
                       0.000000
                                                 NaN
                                                                           NaN
      1
                       0.520999
                                         -11.441443
                                                                    -3.623276
      2
                                           -8.513595
                     -15.764800
                                                                    -3.281425
      3
                       0.000000
                                                 NaN
      4
                     -15.940964
                                         -22.772890
                                                                   -15.273547
      5
                     -55.160086
                                         -24.541524
                                                                   -16.169045
      6
                       0.00000
                                                 NaN
                                                                           NaN
                                            0.048783
                                                                     4.009820
      7
                       2.894995
      8
                      -5.133112
                                           -0.496945
                                                                    -4.691095
         Cash Flow from Operations Growth (%)
      0
                                             NaN
      1
                                       1.659017
      2
                                     -13.809176
      3
                                             NaN
      4
                                      11.074231
      5
                                     -21.916599
      6
                                             NaN
      7
                                      10.500891
```

[29]: df

8

-14.828368

0.5 Handling the missing values

```
[31]: df.fillna(0,inplace=True)
[33]: df
[33]:
         Year
                Total Revenue
                                Net Income
                                             Total Assets
                                                            Total Liabilities
         2023
                                     72361
                                                   411976
                                                                        205753
                       211915
      1
         2022
                                     72738
                                                                        198298
                       198270
                                                    364840
      2
         2021
                       168088
                                     61271
                                                    333779
                                                                        191791
      3
         2023
                        96773
                                     14974
                                                    106618
                                                                         43009
         2022
                        81462
                                     12587
                                                    82338
                                                                         36440
                        53823
      5
         2021
                                                     62131
                                                                         30548
                                      5644
         2023
                                     96995
                                                    352583
      6
                       383285
                                                                        290437
         2022
      7
                       394328
                                     99803
                                                    352755
                                                                        302083
         2021
      8
                       365817
                                     94680
                                                   351002
                                                                        287912
         Cash Flow from Operating Activities
                                                             Revenue Growth (%)
                                                    Company
      0
                                                                        0.00000
                                          87582
                                                 Microsoft
      1
                                          89035
                                                 Microsoft
                                                                       -6.438902
                                                 Microsoft
      2
                                          76740
                                                                      -15.222676
      3
                                          13256
                                                      Tesla
                                                                        0.000000
      4
                                          14724
                                                      Tesla
                                                                      -15.821562
      5
                                          11497
                                                      Tesla
                                                                      -33.928703
      6
                                         110543
                                                      Apple
                                                                        0.00000
      7
                                                      Apple
                                         122151
                                                                        2.881146
      8
                                         104038
                                                      Apple
                                                                       -7.230275
         Net Income Growth (%)
                                  Assets Growth (%)
                                                      Liabilities Growth (%)
      0
                       0.00000
                                            0.000000
                                                                      0.000000
      1
                       0.520999
                                          -11.441443
                                                                     -3.623276
      2
                     -15.764800
                                           -8.513595
                                                                     -3.281425
      3
                       0.000000
                                            0.000000
                                                                      0.000000
      4
                     -15.940964
                                          -22.772890
                                                                    -15.273547
      5
                     -55.160086
                                          -24.541524
                                                                    -16.169045
      6
                       0.00000
                                            0.00000
                                                                      0.00000
      7
                       2.894995
                                            0.048783
                                                                      4.009820
      8
                      -5.133112
                                           -0.496945
                                                                     -4.691095
         Cash Flow from Operations Growth (%)
      0
                                        0.000000
      1
                                        1.659017
      2
                                     -13.809176
      3
                                        0.000000
      4
                                       11.074231
      5
                                     -21.916599
      6
                                        0.000000
```

```
7
                                    10.500891
      8
                                   -14.828368
[37]: df.to_csv('final_report.csv')
[39]: summary = df.groupby('Company').agg({
          'Revenue Growth (%)': 'mean',
          'Net Income Growth (%)': 'mean',
          'Assets Growth (%)' : 'mean',
          'Liabilities Growth (%)' : 'mean',
          'Cash Flow from Operations Growth (%)' :'mean'
      }).reset_index()
[41]: print("Overview of Year-By-Year Changes of Microsoft, Tesla and Apple from the
      ⇔fiscal years 2021-2023")
      summary
     Overview of Year-By-Year Changes of Microsoft, Tesla and Apple from the fiscal
     years 2021-2023
[41]:
           Company Revenue Growth (%) Net Income Growth (%) Assets Growth (%) \
             Apple
                             -1.449710
                                                    -0.746039
                                                                       -0.149388
       Microsoft
                             -7.220526
                                                    -5.081267
                                                                       -6.651679
      1
                            -16.583422
            Tesla
                                                   -23.700350
                                                                      -15.771471
         Liabilities Growth (%) Cash Flow from Operations Growth (%)
      0
                     -0.227092
                                                            -1.442492
                     -2.301567
                                                            -4.050053
      1
      2
                     -10.480864
                                                            -3.614123
[43]: summary.to_csv('summary_report.csv')
```