## Stock\_Price\_Analysis

#### March 27, 2024

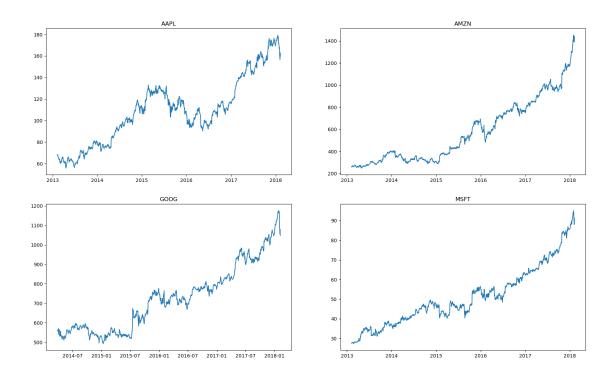
```
[1]: import pandas as pd
     import numpy as np
     import matplotlib.pyplot as plt
     import seaborn as sns
[2]: import glob
[]: glob.glob(r'C:\Users\Asus\Desktop\data python_
      →project\TimeSeries\individual_stocks_5yr\*csv')
[4]: len(glob.glob(r'C:\Users\Asus\Desktop\data python_

¬project\TimeSeries\individual_stocks_5yr\*csv'))
[4]: 505
[5]: ## use Warnings package to get rid of any future warning ...
     import warnings
     from warnings import filterwarnings
     filterwarnings('ignore')
[6]: company_list = [
         r'C:\\Users\\Asus\\Desktop\\data python⊔
      →project\\TimeSeries\\individual_stocks_5yr\\AAPL_data.csv',
         r'C:\\Users\\Asus\\Desktop\\data python_
      →project\\TimeSeries\\individual_stocks_5yr\\AMZN_data.csv',
         r'C:\\Users\\Asus\\Desktop\\data python⊔
      →project\\TimeSeries\\individual_stocks_5yr\\G00G_data.csv',
         r'C:\\Users\\Asus\\Desktop\\data python_

¬project\\TimeSeries\\individual_stocks_5yr\\MSFT_data.csv'
    ]
[7]: all_data = pd.DataFrame()
     for file in company_list:
         current_df = pd.read_csv(file)
```

```
##all_data = current_df.append(all_data , iqnore_index=True)
          all_data = pd.concat([all_data , current_df] , ignore_index=True)
      all_data.shape
     (4752, 7)
 [9]:
      all_data.head()
 [9]:
              date
                        open
                                high
                                          low
                                                 close
                                                           volume
                                                                   Name
        2013-02-08
                    67.7142
                             68.4014
                                      66.8928
                                               67.8542
                                                                   AAPL
                                                        158168416
      1 2013-02-11
                    68.0714
                             69.2771
                                      67.6071
                                               68.5614
                                                        129029425
                                                                   AAPL
      2 2013-02-12
                             68.9114
                                                                   AAPL
                    68.5014
                                      66.8205
                                               66.8428
                                                        151829363
      3 2013-02-13
                    66.7442
                             67.6628
                                      66.1742
                                               66.7156
                                                                   AAPL
                                                        118721995
      4 2013-02-14
                    66.3599
                             67.3771
                                      66.2885
                                               66.6556
                                                         88809154
                                                                   AAPL
[10]: all_data['Name'].unique()
[10]: array(['AAPL', 'AMZN', 'GOOG', 'MSFT'], dtype=object)
     0.1 Analysing Change in Price OF the Stock Overtime
[11]: all_data.isnull()
[11]:
                   open
                          high
                                  low
                                       close
                                              volume
                                                       Name
            date
      0
           False
                  False
                         False
                                False
                                       False
                                               False
                                                      False
                  False
                         False
                                False
      1
           False
                                       False
                                               False
                                                      False
      2
           False
                  False
                         False
                                False
                                               False
                                       False
                                                      False
      3
           False False
                        False
                                False False
                                               False False
      4
           False False
                         False
                                False False
                                               False False
      4747
           False False
                        False
                               False False
                                               False False
      4748 False False False False
                                               False False
      4749
           False False False
                                False False
                                               False False
      4750 False False False
                                False False
                                               False False
      4751 False False False False
                                               False False
      [4752 rows x 7 columns]
[12]: all_data.isnull().sum()
[12]: date
               0
      open
                0
     high
                0
      low
                0
      close
                0
      volume
                0
```

```
Name
      dtype: int64
[13]: all_data.dtypes
[13]: date
                 object
                float64
      open
                float64
      high
      low
                float64
                float64
      close
      volume
                  int64
      Name
                 object
      dtype: object
[14]: all_data['date'] = pd.to_datetime(all_data['date'])
[15]: all_data['date']
[15]: 0
             2013-02-08
      1
             2013-02-11
      2
             2013-02-12
      3
             2013-02-13
             2013-02-14
      4747
             2018-02-01
      4748
             2018-02-02
      4749
             2018-02-05
      4750
             2018-02-06
      4751
             2018-02-07
      Name: date, Length: 4752, dtype: datetime64[ns]
[16]: tech_list = all_data['Name'].unique()
[17]: tech_list
[17]: array(['AAPL', 'AMZN', 'GOOG', 'MSFT'], dtype=object)
[18]: plt.figure(figsize=(20,12))
      for index , company in enumerate(tech_list , 1):
          plt.subplot(2 , 2 , index) ## creating subplot for each stock
          filter1 = all_data['Name'] == company
          df = all_data[filter1]
          plt.plot(df['date'] , df['close']) ## plotting "date" vs "close"
          plt.title(company)
```



### 0.2 Analysing Moving Average of The Various stock

```
[19]: all_data.head(10)
```

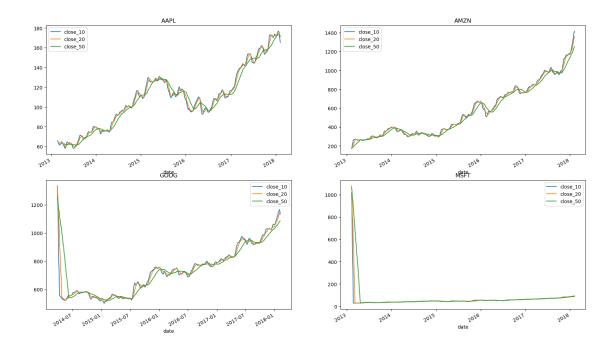
```
[19]:
              date
                        open
                                 high
                                            low
                                                    close
                                                              volume
                                                                       Name
      0 2013-02-08
                     67.7142
                              68.4014
                                        66.8928
                                                  67.8542
                                                           158168416
                                                                       AAPL
      1 2013-02-11
                     68.0714
                              69.2771
                                        67.6071
                                                  68.5614
                                                           129029425
                                                                       AAPL
      2 2013-02-12
                     68.5014
                              68.9114
                                        66.8205
                                                  66.8428
                                                           151829363
                                                                       AAPL
      3 2013-02-13
                     66.7442
                              67.6628
                                        66.1742
                                                  66.7156
                                                           118721995
                                                                       AAPL
      4 2013-02-14
                     66.3599
                              67.3771
                                        66.2885
                                                  66.6556
                                                            88809154
                                                                       AAPL
      5 2013-02-15
                     66.9785
                              67.1656
                                        65.7028
                                                  65.7371
                                                            97924631
                                                                       AAPL
                                        64.8356
      6 2013-02-19
                     65.8714
                              66.1042
                                                  65.7128
                                                           108854046
                                                                       AAPL
      7 2013-02-20
                     65.3842
                              65.3842
                                        64.1142
                                                  64.1214
                                                           118891367
                                                                       AAPL
      8 2013-02-21
                     63.7142
                              64.1671
                                        63.2599
                                                  63.7228
                                                           111596821
                                                                       AAPL
      9 2013-02-22
                     64.1785
                              64.5142
                                        63.7999
                                                  64.4014
                                                            82583823
                                                                       AAPL
```

```
[20]: all_data['close'].rolling(window=10).mean().head(14)
```

```
[20]: 0 NaN
1 NaN
2 NaN
3 NaN
4 NaN
```

```
5
                 NaN
      6
                 NaN
      7
                 NaN
      8
                 NaN
      9
            66.03251
      10
            65.57280
      11
            65.13051
      12
            64.79722
      13
            64.43137
      Name: close, dtype: float64
[21]: new_data = all_data.copy()
[22]: ma_day = [10, 20, 50]
      for ma in ma_day:
          new_data['close_'+str(ma)] = new_data['close'].rolling(ma).mean()
[23]:
      new_data.tail(7)
[23]:
                 date
                         open
                                 high
                                            low
                                                 close
                                                          volume
                                                                   Name
                                                                         close_10 \
                               93.660
      4745 2018-01-30
                        93.30
                                        92.1000
                                                 92.74
                                                        38635053
                                                                   MSFT
                                                                           91.862
      4746 2018-01-31
                        93.75
                               95.400
                                        93.5100
                                                 95.01
                                                        48756338
                                                                   MSFT
                                                                           92.349
      4747 2018-02-01
                                                 94.26
                                                                           92.765
                        94.79
                               96.070
                                        93.5813
                                                        47227882
                                                                   MSFT
      4748 2018-02-02
                       93.64
                               93.970
                                        91.5000
                                                 91.78
                                                        47867753
                                                                   MSFT
                                                                           92.943
      4749 2018-02-05
                        90.56
                               93.240
                                        88.0000
                                                 88.00
                                                        51031465
                                                                   MSFT
                                                                           92.582
      4750 2018-02-06
                        86.89
                               91.475
                                        85.2500
                                                 91.33
                                                        67998564
                                                                           92.525
                                                                   MSFT
      4751 2018-02-07
                        90.49
                               91.770
                                       89.2000
                                                 89.61
                                                        41107592
                                                                   MSFT
                                                                           92.304
            close_20
                       close 50
      4745
             89.8285
                        86.5244
      4746
             90.2815
                        86.7606
      4747
             90.6770
                        86.9978
      4748
             90.9105
                        87.1828
      4749
             90.9010
                        87.2684
      4750
             91.0535
                        87.4328
      4751
             91.1230
                        87.5598
[24]:
      new_data.set_index('date' , inplace=True)
[25]:
     new_data
[25]:
                                                                          close_10 \
                      open
                               high
                                          low
                                                 close
                                                            volume
                                                                    Name
      date
                  67.7142
                            68.4014
                                     66.8928
                                               67.8542
                                                                    AAPL
      2013-02-08
                                                        158168416
                                                                                NaN
                   68.0714
                            69.2771
                                               68.5614
                                                                    AAPL
      2013-02-11
                                     67.6071
                                                        129029425
                                                                                NaN
      2013-02-12
                  68.5014
                            68.9114
                                     66.8205
                                               66.8428
                                                        151829363
                                                                    AAPL
                                                                                NaN
```

```
2013-02-13 66.7442 67.6628 66.1742 66.7156 118721995 AAPL
                                                                           NaN
     2013-02-14 66.3599
                          67.3771 66.2885 66.6556
                                                      88809154 AAPL
                                                                           NaN
                          96.0700 93.5813 94.2600
     2018-02-01 94.7900
                                                      47227882 MSFT
                                                                        92.765
     2018-02-02 93.6400
                          93.9700 91.5000 91.7800
                                                      47867753 MSFT
                                                                        92.943
     2018-02-05 90.5600
                          93.2400 88.0000 88.0000
                                                      51031465 MSFT
                                                                        92.582
     2018-02-06 86.8900
                          91.4750 85.2500 91.3300
                                                                        92.525
                                                      67998564 MSFT
     2018-02-07 90.4900 91.7700 89.2000 89.6100
                                                      41107592 MSFT
                                                                        92.304
                 close_20 close_50
     date
     2013-02-08
                      NaN
                                NaN
     2013-02-11
                      NaN
                                NaN
     2013-02-12
                      NaN
                                NaN
                      NaN
     2013-02-13
                                NaN
     2013-02-14
                      NaN
                                NaN
     2018-02-01
                            86.9978
                  90.6770
     2018-02-02
                  90.9105
                            87.1828
     2018-02-05
                  90.9010
                            87.2684
     2018-02-06
                  91.0535
                            87.4328
     2018-02-07
                  91.1230
                            87.5598
     [4752 rows x 9 columns]
[26]: new_data.columns
[26]: Index(['open', 'high', 'low', 'close', 'volume', 'Name', 'close_10',
             'close 20', 'close 50'],
           dtype='object')
[27]: plt.figure(figsize=(20,12))
     for index , company in enumerate(tech_list , 1):
         plt.subplot(2 , 2 , index)
         filter1 = new data['Name'] == company
         df = new data[filter1]
         df[['close_10','close_20', 'close_50']].plot(ax=plt.gca())
         plt.title(company)
```



## 1 analyse Closing price change in apple stock

```
[28]:
     company_list
[28]: ['C:\\\Users\\\Asus\\\Desktop\\\data python
     project\\\TimeSeries\\\individual_stocks_5yr\\\AAPL_data.csv',
      'C:\\\Users\\\Asus\\\Desktop\\\data python
     project\\\TimeSeries\\\individual_stocks_5yr\\\AMZN_data.csv',
      'C:\\\Users\\\Asus\\\Desktop\\\data python
     project\\\TimeSeries\\\individual_stocks_5yr\\\\GOOG_data.csv',
      'C:\\\Users\\\\Asus\\\\Desktop\\\\data python
     project\\\TimeSeries\\\individual_stocks_5yr\\\MSFT_data.csv']
[30]: apple = pd.read_csv(r'C:\\\Users\\\Asus\\\Desktop\\\data python_
      [31]:
     apple.head()
[31]:
             date
                      open
                              high
                                       low
                                              close
                                                       volume
                                                              Name
        2013-02-08
                   67.7142
                           68.4014
                                   66.8928
                                            67.8542
                                                    158168416
                                                              AAPL
     1 2013-02-11
                   68.0714
                           69.2771
                                   67.6071
                                            68.5614
                                                    129029425
                                                              AAPL
     2 2013-02-12
                   68.5014
                           68.9114
                                   66.8205
                                            66.8428
                                                    151829363
                                                              AAPL
        2013-02-13
                                                              AAPL
     3
                   66.7442
                           67.6628
                                   66.1742
                                            66.7156
                                                    118721995
        2013-02-14
                   66.3599
                           67.3771
                                   66.2885
                                            66.6556
                                                     88809154
                                                              AAPL
```

```
[33]: apple['daily_retun(in %)'] =apple['close'].pct_change()*100
[34]: apple.head(5)
[34]:
              date
                       open
                                high
                                           low
                                                  close
                                                            volume
                                                                    Name
        2013-02-08 67.7142 68.4014
                                      66.8928
                                               67.8542 158168416
                                                                    AAPL
      1 2013-02-11
                     68.0714
                             69.2771
                                      67.6071
                                                68.5614
                                                         129029425
                                                                    AAPL
      2 2013-02-12
                     68.5014
                             68.9114
                                      66.8205
                                                66.8428
                                                         151829363
                                                                    AAPL
                                                                    AAPL
      3 2013-02-13
                     66.7442
                              67.6628
                                      66.1742
                                                66.7156
                                                         118721995
      4 2013-02-14
                    66.3599
                             67.3771
                                      66.2885
                                                66.6556
                                                          88809154
                                                                   AAPL
        daily_retun(in %)
      0
                      NaN
                  1.042235
      1
      2
                 -2.506658
      3
                 -0.190297
      4
                -0.089934
     import plotly.express as px
[36]: px.line(apple , x = 'date' ,y= 'daily_retun(in %)')
```



## 2 Performing Resampling Analysis

```
[38]: apple.dtypes

[38]: date object open float64 high float64 low float64 close float64 volume int64 Name object
```

```
daily_retun(in %) float64
dtype: object
```

```
[39]: apple['date'] = pd.to_datetime(apple['date'])
```

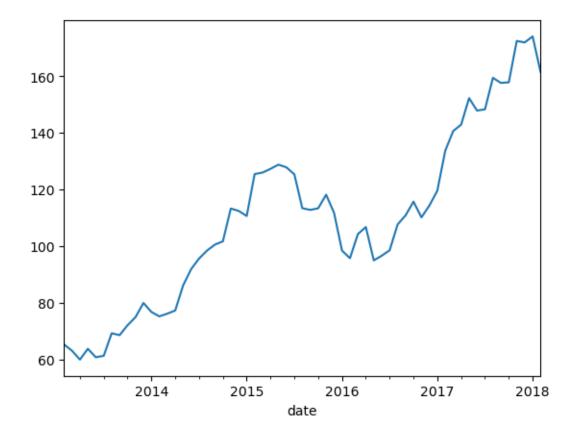
```
[40]: apple.dtypes
```

[40]: date datetime64[ns] open float64 high float64 low float64 float64 close volume int64 object Name daily\_retun(in %) float64 dtype: object

[44]: apple.set\_index('date', inplace = True )

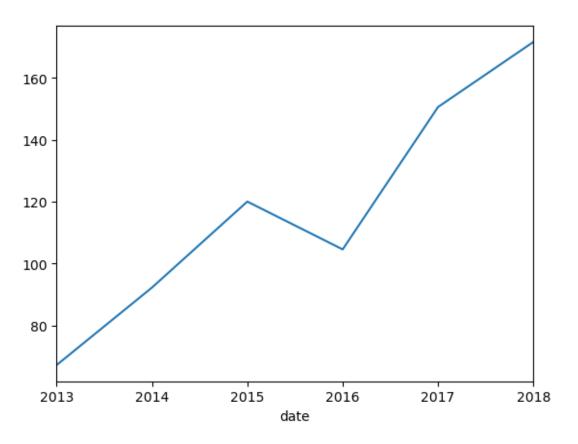
[46]: apple['close'].resample('M').mean().plot()

[46]: <Axes: xlabel='date'>



```
[47]: apple['close'].resample('Y').mean().plot()
```

[47]: <Axes: xlabel='date'>

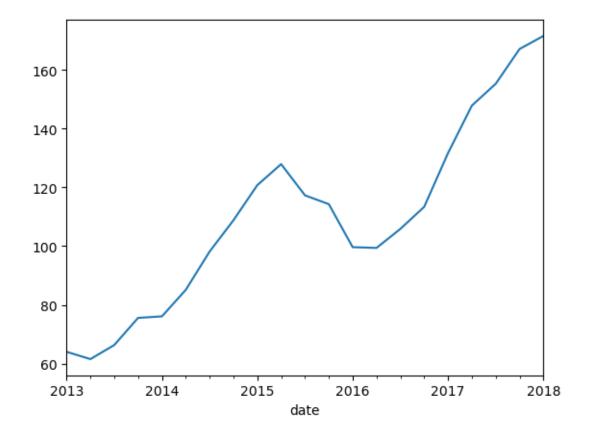


```
[48]: apple['close'].resample('Q').mean()
[48]: date
      2013-03-31
                     64.020291
      2013-06-30
                     61.534692
      2013-09-30
                     66.320670
                     75.567478
      2013-12-31
      2014-03-31
                     76.086293
      2014-06-30
                     85.117475
      2014-09-30
                     98.163311
      2014-12-31
                    108.821016
      2015-03-31
                    120.776721
      2015-06-30
                    127.937937
      2015-09-30
                    117.303438
      2015-12-31
                    114.299297
```

```
2016-03-31
               99.655082
2016-06-30
               99.401250
2016-09-30
              105.866094
2016-12-31
              113.399048
2017-03-31
              131.712500
2017-06-30
              147.875397
2017-09-30
              155.304603
2017-12-31
              167.148254
2018-03-31
              171.594231
Freq: Q-DEC, Name: close, dtype: float64
```

```
[49]: apple['close'].resample('Q').mean().plot()
```

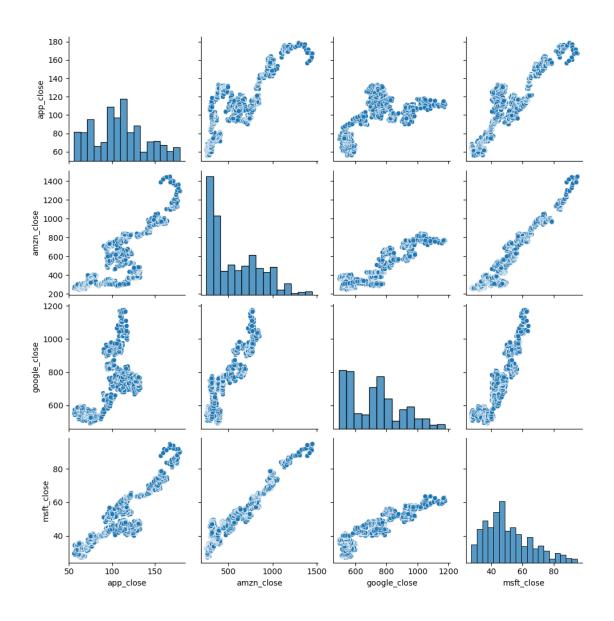
[49]: <Axes: xlabel='date'>



# performing Multi-Variante analysis to understand CO-Relation

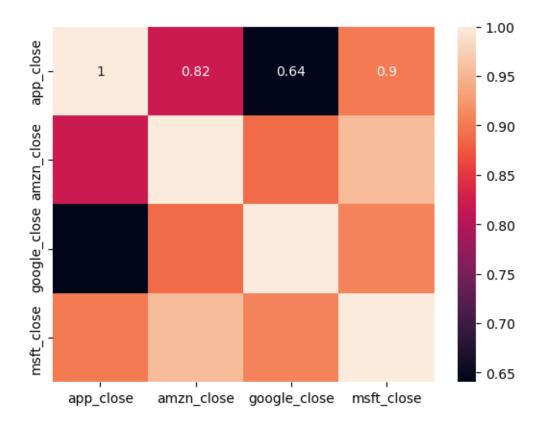
```
[50]: company_list
```

```
[50]: ['C:\\\Users\\\Asus\\\Desktop\\\data python
     project\\\TimeSeries\\\individual_stocks_5yr\\\AAPL_data.csv',
       'C:\\\Users\\\Asus\\\Desktop\\\data python
     project\\\TimeSeries\\\individual_stocks_5yr\\\AMZN_data.csv',
       'C:\\\Users\\\Asus\\\Desktop\\\data python
     project\\\TimeSeries\\\individual_stocks_5yr\\\\G00G_data.csv',
       'C:\\\Users\\\\Asus\\\Desktop\\\\data python
     project\\\TimeSeries\\\individual_stocks_5yr\\\MSFT_data.csv']
[51]: company_list[0]
[51]: 'C:\\\Users\\\Asus\\\Desktop\\\\data python
     project\\\TimeSeries\\\individual_stocks_5yr\\\AAPL_data.csv'
[54]: app = pd.read csv(company list[0])
     amzn = pd.read csv(company list[1])
     google = pd.read csv(company list[2])
     msft = pd.read csv(company list[3])
[53]: app.head()
[53]:
                                                 close
                                                                  Name
              date
                       open
                                high
                                          low
                                                           volume
     0 2013-02-08 67.7142
                             68.4014
                                      66.8928 67.8542 158168416 AAPL
                             69.2771 67.6071
     1 2013-02-11
                    68.0714
                                               68.5614 129029425 AAPL
     2 2013-02-12 68.5014 68.9114 66.8205 66.8428 151829363 AAPL
     3 2013-02-13
                    66.7442 67.6628 66.1742 66.7156 118721995 AAPL
     4 2013-02-14 66.3599 67.3771 66.2885 66.6556
                                                         88809154 AAPL
[55]: closing_price = pd.DataFrame()
[57]: closing_price['app_close'] = app['close']
      closing price['amzn close'] = amzn['close']
     closing_price['google_close'] = google['close']
      closing price['msft close'] = msft['close']
[58]: closing_price.head()
[58]:
                                             msft_close
        app_close
                   amzn_close
                               google_close
     0
          67.8542
                       261.95
                                     558.46
                                                  27.55
     1
          68.5614
                       257.21
                                     559.99
                                                  27.86
     2
          66.8428
                       258.70
                                     556.97
                                                  27.88
     3
          66.7156
                       269.47
                                     567.16
                                                  28.03
     4
          66.6556
                       269.24
                                     567.00
                                                  28.04
[59]:
     sns.pairplot(closing_price)
[59]: <seaborn.axisgrid.PairGrid at 0x1cbf5b48710>
```



#### [60]: closing\_price.corr() [60]: app\_close amzn\_close google\_close ${\tt msft\_close}$ 0.899689 app\_close 1.000000 0.819078 0.640522 amzn\_close 0.819078 1.000000 0.888456 0.955977 google\_close 1.000000 0.907011 0.640522 0.888456 msft\_close 0.899689 0.955977 0.907011 1.000000 [61]: sns.heatmap(closing\_price.corr(), annot = True)

[61]: <Axes: >



## 4 CO-Relation analysis

```
[62]:
     closing_price
[62]:
            app_close
                        amzn_close
                                    google_close
                                                    msft_close
              67.8542
                            261.95
      0
                                           558.46
                                                         27.55
      1
              68.5614
                            257.21
                                           559.99
                                                         27.86
      2
              66.8428
                            258.70
                                           556.97
                                                         27.88
      3
              66.7156
                            269.47
                                           567.16
                                                         28.03
      4
              66.6556
                            269.24
                                           567.00
                                                         28.04
      1254
              167.7800
                           1390.00
                                                         94.26
                                              NaN
      1255
              160.5000
                           1429.95
                                              NaN
                                                         91.78
      1256
                           1390.00
                                                         88.00
              156.4900
                                              {\tt NaN}
      1257
              163.0300
                           1442.84
                                              NaN
                                                         91.33
      1258
                                                         89.61
              159.5400
                           1416.78
                                              NaN
      [1259 rows x 4 columns]
[63]: (closing_price['app_close'] - closing_price['app_close'].shift(1))/

closing_price['app_close'].shift(1)*100
```

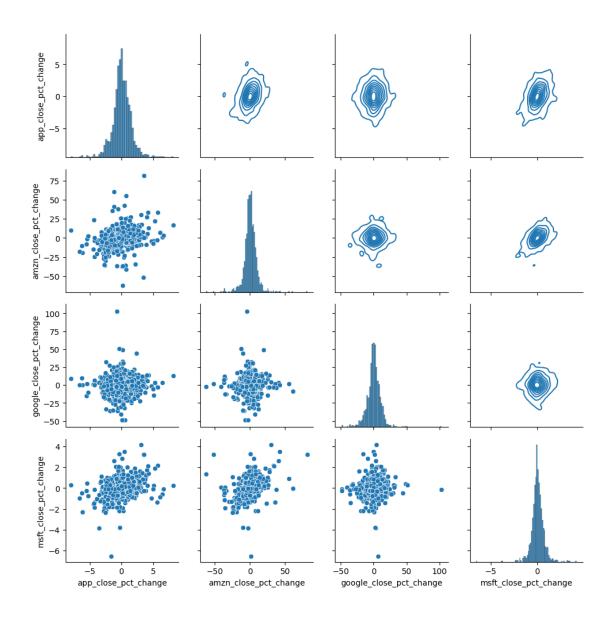
```
[63]: 0
                   NaN
              1.042235
      1
      2
             -2.506658
      3
             -0.190297
             -0.089934
      1254
              0.209043
      1255
             -4.339015
      1256
             -2.498442
      1257
              4.179181
      1258
             -2.140710
      Name: app_close, Length: 1259, dtype: float64
[64]: for col in closing_price.columns:
          closing_price[col + '_pct_change'] = (closing_price[col] - closing_price[col].
       ⇒shift(1))/closing price['app close'].shift(1)*100
[65]: closing_price.head(2)
[65]:
         app close amzn close
                                google_close msft_close app_close_pct_change
      0
           67.8542
                        261.95
                                       558.46
                                                    27.55
                                                                             NaN
           68.5614
                        257.21
                                       559.99
                                                    27.86
      1
                                                                        1.042235
                                google_close_pct_change msft_close_pct_change
         amzn_close_pct_change
      0
                           NaN
                                                     NaN
      1
                     -6.985566
                                                2.254835
                                                                        0.456862
[66]: closing_price.columns
[66]: Index(['app_close', 'amzn_close', 'google_close', 'msft_close',
             'app_close_pct_change', 'amzn_close_pct_change',
             'google_close_pct_change', 'msft_close_pct_change'],
            dtype='object')
[67]: closing_p = closing_price[['app_close_pct_change', 'amzn_close_pct_change',
             'google_close_pct_change', 'msft_close_pct_change']]
[68]: closing_p
[68]:
            app_close_pct_change
                                  amzn_close_pct_change
                                                          google_close_pct_change \
      0
                             NaN
                                                     NaN
                                                                               NaN
      1
                        1.042235
                                               -6.985566
                                                                          2.254835
      2
                       -2.506658
                                                2.173235
                                                                         -4.404811
      3
                       -0.190297
                                               16.112431
                                                                         15.244723
      4
                       -0.089934
                                               -0.344747
                                                                         -0.239824
      1254
                        0.209043
                                              -36.367437
                                                                               NaN
```

```
1255
                 -4.339015
                                          23.810943
                                                                          {\tt NaN}
1256
                 -2.498442
                                        -24.890966
                                                                          NaN
1257
                                                                          NaN
                  4.179181
                                          33.765736
1258
                 -2.140710
                                        -15.984788
                                                                          NaN
      msft_close_pct_change
0
1
                    0.456862
2
                    0.029171
3
                    0.224407
4
                    0.014989
1254
                  -0.447948
1255
                  -1.478126
1256
                  -2.355140
1257
                   2.127931
1258
                  -1.055021
```

[1259 rows x 4 columns]

```
[71]: g = sns.PairGrid(data = closing_p)
    g.map_diag(sns.histplot)
    g.map_lower(sns.scatterplot)
    g.map_upper(sns.kdeplot)
```

[71]: <seaborn.axisgrid.PairGrid at 0x1cbf713ef50>



# [72]: closing\_p.corr()

[72]:		app_close_pct_change	amzn_close_pct_change \	
	app_close_pct_change	1.000000	0.295576	
	amzn_close_pct_change	0.295576	1.000000	
	<pre>google_close_pct_change</pre>	0.038247	0.030862	
	msft_close_pct_change	0.360594	0.408107	
		<pre>google_close_pct_chang</pre>	ge msft_close_pct_change	
	app_close_pct_change	0.03824	47 0.360594	
	amzn_close_pct_change	0.03086	62 0.408107	
	<pre>google_close_pct_change</pre>	1.00000	0.051796	
	msft_close_pct_change	0.05179	96 1.000000	

[]:[