## Coronavirus\_Portfolio

September 29, 2021

## 1 Coronavirus Portfolio Risk and Returns

```
[1]: import numpy as np
   import pandas as pd
   import matplotlib.pyplot as plt
   import seaborn as sns
   import math
   import warnings
   warnings.filterwarnings("ignore")
   # fix_yahoo_finance is used to fetch data
   import yfinance as yf
   yf.pdr_override()
[2]: # input
   # Coronavirus Stock
   symbols = ['GE','F','GM','CAH','RMD','MDT','CVS','RAD','WBA']
   start = '2019-12-01'
   end = '2020-03-31'
[3]: df = pd.DataFrame()
   for s in symbols:
      df[s] = yf.download(s,start,end)['Adj Close']
   1 of 1 completed
   1 of 1 completed
   [********* 100%********** 1 of 1 completed
   [********* 100%*************** 1 of 1 completed
   [********* 100%********** 1 of 1 completed
   [******** 100%*********** 1 of 1 completed
   [********* 100%*********** 1 of 1 completed
   [******** 100%*********** 1 of 1 completed
[4]: from datetime import datetime
   from dateutil import relativedelta
```

```
d1 = datetime.strptime(start, "%Y-%m-%d")
    d2 = datetime.strptime(end, "%Y-%m-%d")
    delta = relativedelta.relativedelta(d2,d1)
    print('How many years of investing?')
    print('%s years' % delta.years)
    How many years of investing?
    0 years
[5]: number_of_years = delta.years
[6]: days = (df.index[-1] - df.index[0]).days
    days
[6]: 119
[7]:
    df.head()
[7]:
                       GE
                                  F
                                            GM
                                                      CAH
                                                                  RMD
                                                                             MDT
    Date
    2019-12-02 11.138830
                           8.859331
                                     35.071316
                                               53.584694
                                                           148.676666
                                                                      109.697014
    2019-12-03 10.969152 8.741339
                                     34.729202
                                                53.476814
                                                           149.135651
                                                                      109.776138
    2019-12-04 10.879322 8.800335
                                     34.993114
                                                53.721989
                                                           149.814117
                                                                      110.715752
    2019-12-05 10.769532 8.780669
                                     34.884445
                                                53.202225
                                                           149.844055
                                                                      110.972908
    2019-12-06 11.078944 8.869164 35.111671 53.810249
                                                           150.253143 111.853165
                      CVS
                            RAD
                                       WBA
    Date
    2019-12-02 75.043564 8.81
                                 58.756363
    2019-12-03 74.209198 8.61
                                 58.478790
    2019-12-04 74.497253 8.44
                                 58.399483
    2019-12-05 73.980743 8.04 58.587837
    2019-12-06 74.854836 8.29 58.121910
[8]: df.tail()
[8]:
                  GE
                         F
                                   GM
                                             CAH
                                                         RMD
                                                                   MDT \
    Date
    2020-03-24 7.01 4.95
                            21.110001
                                       43.107567 135.059998
                                                              79.850243
                            21.490000
                                       41.830379 135.710007
    2020-03-25 7.56
                      5.39
                                                              86.279999
                            22.559999
                                       44.949097
                                                  146.520004
    2020-03-26 8.12
                      5.25
                                                              91.940002
    2020-03-27
                7.62
                      5.19
                            21.379999
                                       43.939224 141.949997
                                                              89.889999
    2020-03-30 7.89
                      5.03
                            21.320000
                                       47.958900 154.210007
                                                             92.050003
                                        WBA
                      CVS
                             RAD
    Date
    2020-03-24 54.349998 16.26 45.250000
```

```
    2020-03-25
    53.639999
    14.47
    41.439999

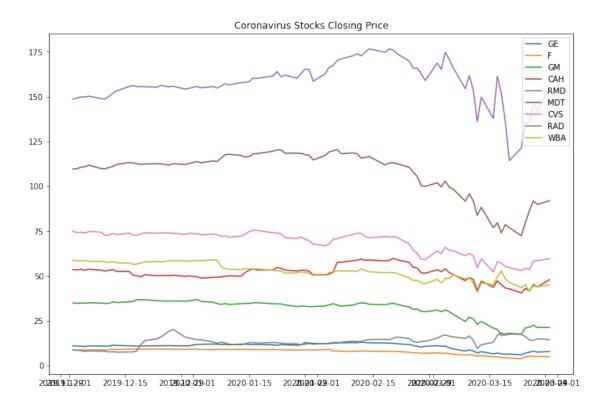
    2020-03-26
    58.310001
    14.11
    45.669998

    2020-03-27
    58.599998
    15.07
    44.000000

    2020-03-30
    59.680000
    14.61
    45.160000
```

```
[9]: plt.figure(figsize=(12,8))
   plt.plot(df)
   plt.title('Coronavirus Stocks Closing Price')
   plt.legend(labels=df.columns)
```

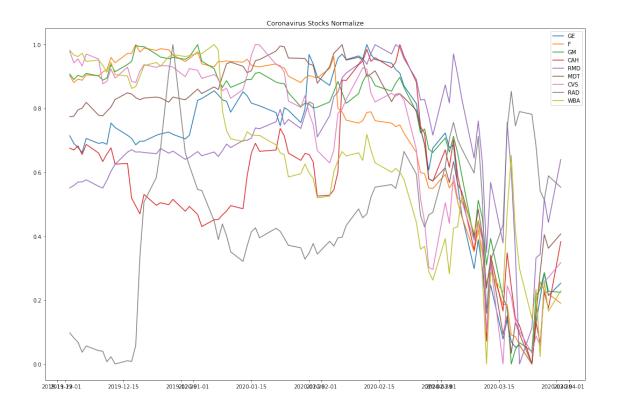
## [9]: <matplotlib.legend.Legend at 0x26650487320>



```
[10]: # Normalize the data
normalize = (df - df.min())/ (df.max() - df.min())

[11]: plt.figure(figsize=(18,12))
   plt.plot(normalize)
   plt.title('Coronavirus Stocks Normalize')
   plt.legend(labels=normalize.columns)
```

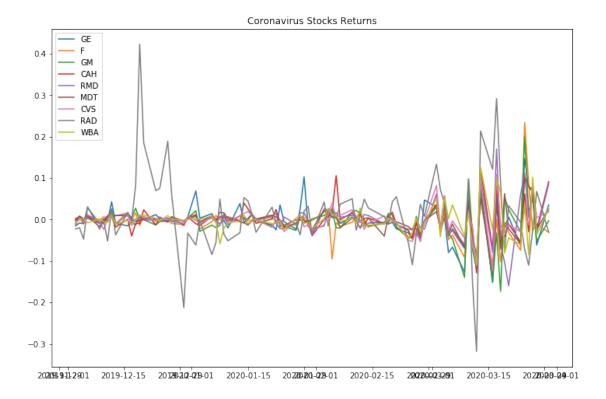
[11]: <matplotlib.legend.Legend at 0x266504fb978>



```
[12]: stock_rets = df.pct_change().dropna()

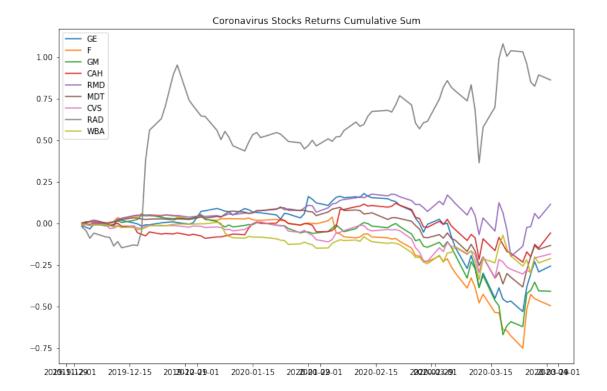
[13]: plt.figure(figsize=(12,8))
    plt.plot(stock_rets)
    plt.title('Coronavirus Stocks Returns')
    plt.legend(labels=stock_rets.columns)
```

[13]: <matplotlib.legend.Legend at 0x2665056af60>



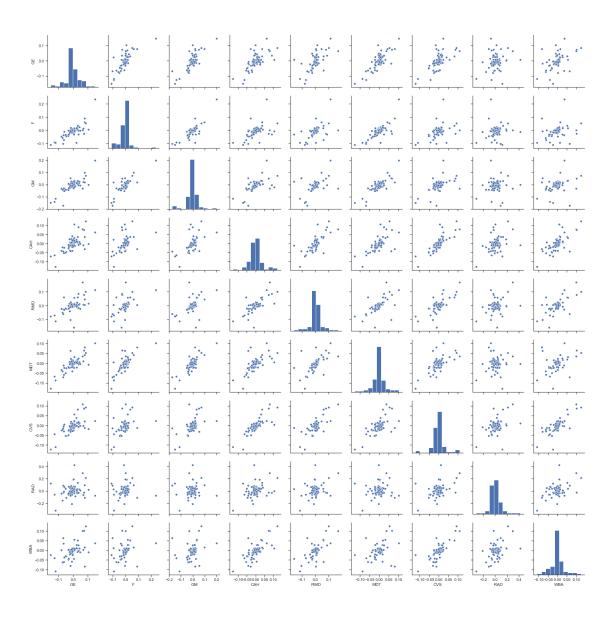
```
[14]: plt.figure(figsize=(12,8))
    plt.plot(stock_rets.cumsum())
    plt.title('Coronavirus Stocks Returns Cumulative Sum')
    plt.legend(labels=stock_rets.columns)
```

[14]: <matplotlib.legend.Legend at 0x266505df080>

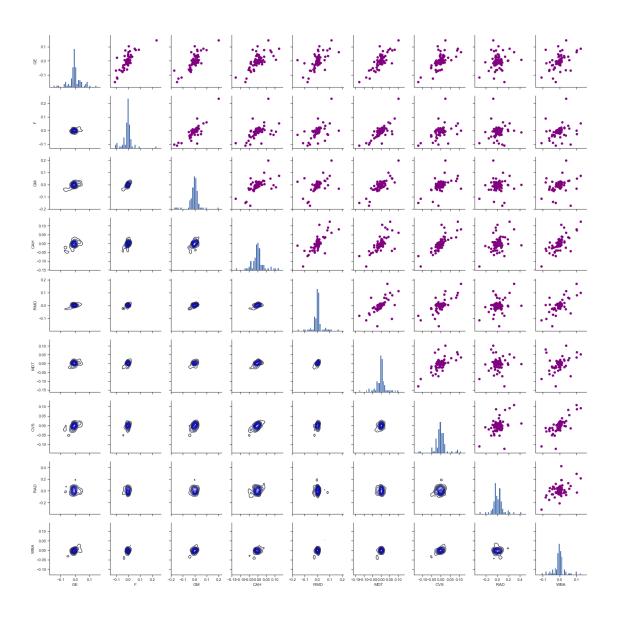


```
[15]: sns.set(style='ticks')
ax = sns.pairplot(stock_rets, diag_kind='hist')

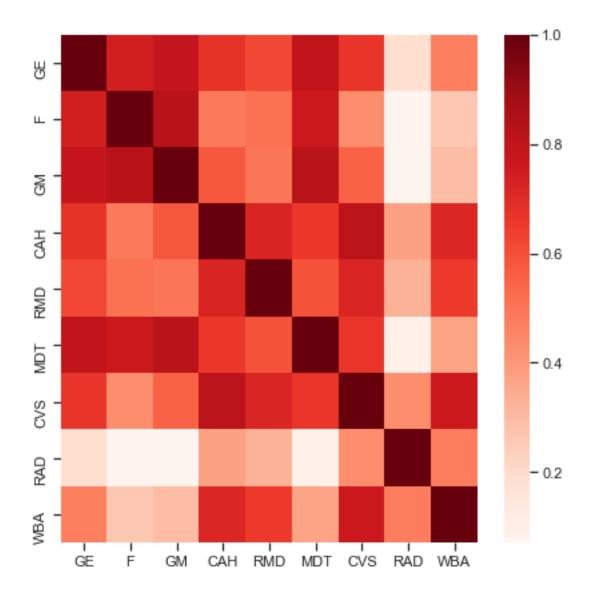
nplot = len(stock_rets.columns)
for i in range(nplot) :
    for j in range(nplot) :
        ax.axes[i, j].locator_params(axis='x', nbins=6, tight=True)
```



```
[16]: ax = sns.PairGrid(stock_rets)
ax.map_upper(plt.scatter, color='purple')
ax.map_lower(sns.kdeplot, color='blue')
ax.map_diag(plt.hist, bins=30)
for i in range(nplot) :
    for j in range(nplot) :
        ax.axes[i, j].locator_params(axis='x', nbins=6, tight=True)
```

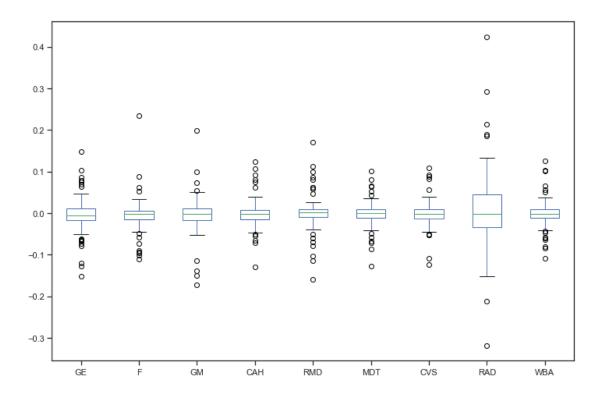


[17]: <matplotlib.axes.\_subplots.AxesSubplot at 0x2665449ce48>



```
[18]: # Box plot
stock_rets.plot(kind='box',figsize=(12,8))
```

[18]: <matplotlib.axes.\_subplots.AxesSubplot at 0x26654099048>

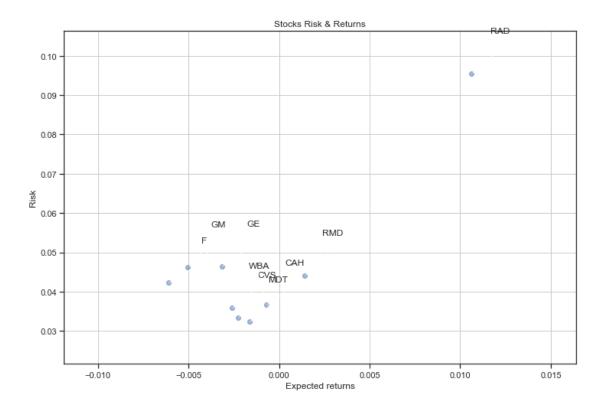


```
[19]: rets = stock_rets.dropna()

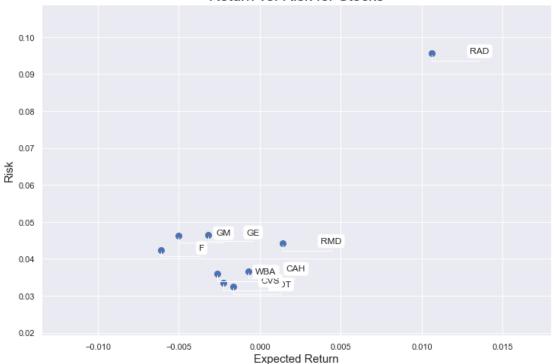
plt.figure(figsize=(12,8))
plt.scatter(rets.mean(), rets.std(),alpha = 0.5)

plt.title('Stocks Risk & Returns')
plt.xlabel('Expected returns')
plt.ylabel('Risk')
plt.grid(which='major')

for label, x, y in zip(rets.columns, rets.mean(), rets.std()):
    plt.annotate(
        label,
        xy = (x, y), xytext = (50, 50),
        textcoords = 'offset points', ha = 'right', va = 'bottom',
        arrowprops = dict(arrowstyle = '-', connectionstyle = 'arc3,rad=-0.3'))
```







```
[21]: rest_rets = rets.corr()
  pair_value = rest_rets.abs().unstack()
  pair_value.sort_values(ascending = False)
```

```
1.000000
[21]: WBA
            WBA
      RAD
            RAD
                    1.000000
      F
            F
                    1.000000
      GM
            GM
                    1.000000
      CAH
            CAH
                    1.000000
      \mathtt{MDT}
            MDT
                    1.000000
            CVS
      CVS
                    1.000000
      RMD
            RMD
                    1.000000
      GE
            GΕ
                    1.000000
      F
            GM
                    0.828619
      GM
            F
                    0.828619
            MDT
                    0.821094
      \mathtt{MDT}
            GM
                    0.821094
            CVS
      CAH
                    0.816546
      CVS
            CAH
                    0.816546
      GE
            MDT
                    0.800432
      MDT
            GE
                    0.800432
      GΕ
            GM
                    0.788193
      GM
            GE
                    0.788193
```

```
F
     MDT
             0.768480
MDT
     F
             0.768480
WBA
     CVS
             0.767721
CVS
     WBA
             0.767721
F
     GE
             0.746950
GE
     F
             0.746950
CAH
     RMD
             0.726041
RMD
     CAH
             0.726041
CVS
     RMD
             0.720843
RMD
     CVS
             0.720843
WBA
     CAH
             0.717412
RMD
     GM
             0.500164
GM
     RMD
             0.500164
CAH
     F
             0.490819
F
     CAH
             0.490819
RAD
     WBA
             0.479228
WBA
     RAD
             0.479228
GΕ
     WBA
             0.471037
WBA
     GE
             0.471037
CVS
     F
             0.435186
F
     CVS
             0.435186
CVS
     RAD
             0.430186
RAD
     CVS
             0.430186
     CAH
             0.378033
CAH
     RAD
             0.378033
MDT
     WBA
             0.370077
WBA
     MDT
             0.370077
RAD
     RMD
             0.329223
RMD
             0.329223
     RAD
GM
     WBA
             0.296149
WBA
     GM
             0.296149
F
     WBA
             0.265812
WBA
     F
             0.265812
RAD
     GE
             0.191933
GΕ
     RAD
             0.191933
RAD
     MDT
             0.094568
MDT
     RAD
             0.094568
F
     RAD
             0.076675
RAD
     F
             0.076675
             0.070843
     GM
GM
     RAD
             0.070843
Length: 81, dtype: float64
```

```
[22]: # Normalized Returns Data
Normalized_Value = ((rets[:] - rets[:].min()) / (rets[:].max() - rets[:].min()))
Normalized_Value.head()
```

```
[22]:
                       GE
                                  F
                                          GM
                                                   CAH
                                                             RMD
                                                                       MDT \
     Date
     2019-12-03 0.456216 0.280973 0.438667 0.502518 0.493460 0.560373
     2019-12-04 0.479782 0.339218
                                    0.485234 0.528695
                                                        0.497888 0.594432
     2019-12-05 0.473418 0.313143
                                    0.456510 0.472121
                                                        0.484718
                                                                  0.567331
     2019-12-06 0.603304
                          0.348881
                                     0.482322
                                              0.555848
                                                        0.492379
                                                                  0.591707
     2019-12-09 0.474026
                          0.316411
                                     0.452762
                                              0.472184 0.458577
                      CVS
                                RAD
                                         WBA
     Date
     2019-12-03 0.482436 0.398280
                                    0.445113
     2019-12-04 0.547075 0.402272
                                    0.459405
     2019-12-05 0.500471 0.364951
                                     0.478847
     2019-12-06 0.581263 0.470895
                                     0.431413
     2019-12-09 0.509191 0.397986
                                    0.470950
[23]:
     Normalized_Value.corr()
[23]:
                GE
                           F
                                    GM
                                            CAH
                                                      RMD
                                                                MDT
                                                                          CVS \
          1.000000
                    0.746950 0.788193
     GE
                                       0.678642
                                                 0.619876
                                                           0.800432
                                                                     0.671014
     F
          0.746950
                    1.000000
                              0.828619
                                       0.490819
                                                 0.513466
                                                           0.768480
                                                                     0.435186
     GM
          0.788193
                    0.828619
                              1.000000
                                       0.581750
                                                 0.500164
                                                           0.821094
                                                                     0.555005
     CAH 0.678642
                    0.490819
                              0.581750
                                       1.000000
                                                 0.726041
                                                           0.661041
                                                                     0.816546
     RMD
         0.619876
                    0.513466
                              0.500164
                                       0.726041
                                                 1.000000
                                                           0.596323
                                                                     0.720843
     MDT 0.800432
                    0.768480
                              0.821094
                                       0.661041
                                                 0.596323
                                                           1.000000
                                                                     0.666279
     CVS 0.671014
                    0.435186
                              0.555005
                                       0.816546
                                                 0.720843
                                                           0.666279
                                                                     1.000000
     RAD 0.191933 0.076675
                             0.070843 0.378033
                                                 0.329223
                                                           0.094568
                                                                     0.430186
     WBA 0.471037
                    0.265812 0.296149 0.717412
                                                 0.657893
                                                           0.370077
                                                                     0.767721
               RAD
                         WBA
     GE
          0.191933 0.471037
          0.076675
     F
                    0.265812
     GM
          0.070843 0.296149
     CAH 0.378033 0.717412
     RMD 0.329223
                    0.657893
     MDT
         0.094568
                    0.370077
     CVS 0.430186
                    0.767721
     RAD
          1.000000
                    0.479228
     WBA 0.479228
                    1.000000
[24]: normalized_rets = Normalized_Value.corr()
     normalized_pair_value = normalized_rets.abs().unstack()
     normalized_pair_value.sort_values(ascending = False)
[24]: WBA
          WBA
                 1.000000
     RAD
          RAD
                 1.000000
     F
          F
                 1.000000
```

GM	GM	1.000000
CAH	CAH	1.000000
MDT	MDT	1.000000
CVS	CVS	1.000000
RMD	RMD	1.000000
GE	GE	1.000000
F	GM	0.828619
GM	F	0.828619
	MDT	0.821094
MDT	GM	0.821094
CAH	CVS	0.816546
CVS	CAH	0.816546
GE	MDT	0.800432
MDT	GE	0.800432
GE	GM	0.788193
GM	GE	0.788193
F	MDT	0.768480
r MDT	F	0.768480
WBA	CVS	0.767721
CVS	WBA	0.767721
EVS F	WDA GE	
		0.746950
GE	F	0.746950
CAH	RMD	0.726041
RMD	CAH	0.726041
CVS	RMD	0.720843
RMD	CVS	0.720843
WBA	CAH	0.717412
RMD	GM	0.500164
GM	RMD	0.500164
CAH	F	0.490819
F	CAH	0.490819
RAD	WBA	0.479228
WBA	RAD	0.479228
GE	WBA	0.471037
WBA	GE	0.471037
CVS	F	0.435186
F	CVS	0.435186
CVS	RAD	0.430186
RAD	CVS	0.430186
10111	CAH	0.378033
CAH	RAD	0.378033
MDT	WBA	0.370033
WBA	MDT	0.370077
RAD	RMD	0.329223
RMD	RAD	0.329223
GM	WBA	0.296149

```
WBA GM
                  0.296149
     F
           WBA
                  0.265812
      WBA F
                  0.265812
      RAD GE
                  0.191933
      GE
          RAD
                  0.191933
     RAD MDT
                  0.094568
     MDT RAD
                  0.094568
     F
           RAD
                  0.076675
     RAD F
                  0.076675
           GM
                  0.070843
      GM
           RAD
                  0.070843
     Length: 81, dtype: float64
[25]: print("Stock returns: ")
      print(rets.mean())
      print('-' * 50)
      print("Stock risks:")
      print(rets.std())
     Stock returns:
     GE
           -0.003168
     F
           -0.006110
     GM
           -0.005045
     CAH
          -0.000709
     RMD
           0.001418
     MDT
          -0.001637
     CVS
          -0.002268
     RAD
           0.010633
     WBA
           -0.002613
     dtype: float64
     Stock risks:
     GF.
            0.046514
     F
            0.042287
     GM
            0.046332
     CAH
            0.036667
     RMD
            0.044185
     MDT
            0.032416
     CVS
            0.033483
     RAD
            0.095548
     WBA
            0.035877
     dtype: float64
[26]: table = pd.DataFrame()
      table['Returns'] = rets.mean()
      table['Risk'] = rets.std()
      table.sort_values(by='Returns')
```

```
[26]:
           Returns
                        Risk
         -0.006110 0.042287
     F
     GM -0.005045 0.046332
     GE -0.003168 0.046514
     WBA -0.002613 0.035877
     CVS -0.002268
                    0.033483
     MDT -0.001637
                    0.032416
     CAH -0.000709 0.036667
     RMD 0.001418 0.044185
     RAD 0.010633
                    0.095548
[27]: table.sort_values(by='Risk')
[27]:
           Returns
                        Risk
     MDT -0.001637 0.032416
     CVS -0.002268 0.033483
     WBA -0.002613 0.035877
     CAH -0.000709 0.036667
         -0.006110 0.042287
     RMD 0.001418 0.044185
     GM -0.005045
                    0.046332
     GE -0.003168
                    0.046514
     RAD 0.010633 0.095548
[28]: rf = 0.01
     table['Sharpe Ratio'] = (table['Returns'] - rf) / table['Risk']
[28]:
                        Risk Sharpe Ratio
           Returns
     GE
         -0.003168 0.046514
                                 -0.283100
         -0.006110 0.042287
                                 -0.380976
     GM -0.005045
                    0.046332
                                 -0.324721
     CAH -0.000709 0.036667
                                 -0.292073
     RMD 0.001418 0.044185
                                 -0.194236
     MDT -0.001637
                    0.032416
                                 -0.358984
     CVS -0.002268 0.033483
                                 -0.366402
     RAD 0.010633
                    0.095548
                                  0.006622
     WBA -0.002613 0.035877
                                 -0.351561
[29]: table['Max Returns'] = rets.max()
[30]: table['Min Returns'] = rets.min()
[31]: table['Median Returns'] = rets.median()
[32]: total_return = stock_rets[-1:].transpose()
     table['Total Return'] = 100 * total_return
```

## table [32]: Returns Risk Sharpe Ratio Max Returns Min Returns GE -0.003168 0.046514 -0.283100 0.147300 -0.151592 F -0.006110 0.042287 -0.380976 0.234414 -0.110124GM -0.005045 0.046332 -0.324721 0.199432 -0.173228 CAH -0.000709 0.036667 0.123378 -0.128674 -0.292073RMD 0.001418 0.044185 -0.194236 0.170376 -0.159883 MDT -0.001637 0.032416 -0.3589840.101893 -0.128237CVS -0.002268 -0.366402 0.108987 -0.123072 0.033483 RAD 0.010633 0.095548 0.006622 0.423077 -0.317764 WBA -0.002613 0.035877 -0.351561 0.126036 -0.109616 Median Returns Total Return GE -0.006267 3.543307 F -0.002235 -3.082849 GM -0.002286 -0.280634 CAH 9.148264 -0.002013RMD 0.002632 8.636851 MDT 0.000721 2.402941 CVS -0.002528 1.843007 RAD -0.002066 -3.052422 WBA -0.002246 2.636363 [33]: table['Average Return Days'] = (1 + total\_return)\*\*(1 / days) - 1 table [33]: Returns Risk Sharpe Ratio Max Returns Min Returns -0.151592 GE -0.003168 0.046514 -0.283100 0.147300 F -0.006110 0.042287 -0.380976 0.234414 -0.110124 GM -0.005045 0.046332 -0.3247210.199432 -0.173228CAH -0.000709 0.036667 -0.292073 0.123378 -0.128674 RMD 0.001418 0.044185 -0.1942360.170376 -0.159883MDT -0.001637 -0.358984 0.101893 -0.128237 0.032416 CVS -0.002268 0.033483 -0.3664020.108987 -0.123072RAD 0.010633 0.095548 0.006622 0.423077 -0.317764 WBA -0.002613 -0.351561 -0.109616 0.035877 0.126036

	Median Returns	Total Return	Average Return Days
GE	-0.006267	3.543307	0.000293
F	-0.002235	-3.082849	-0.000263
GM	-0.002286	-0.280634	-0.000024
CAH	-0.002013	9.148264	0.000736
RMD	0.002632	8.636851	0.000696
MDT	0.000721	2.402941	0.000200
CVS	-0.002528	1.843007	0.000153
RAD	-0.002066	-3.052422	-0.000260

```
[34]: initial_value = df.iloc[0]
      ending_value = df.iloc[-1]
      table['CAGR'] = ((ending_value / initial_value) ** (252.0 / days)) -1
      table
[34]:
            Returns
                          Risk
                                Sharpe Ratio
                                              Max Returns
                                                           Min Returns
      GE -0.003168
                     0.046514
                                   -0.283100
                                                  0.147300
                                                              -0.151592
          -0.006110
                     0.042287
                                   -0.380976
                                                  0.234414
                                                              -0.110124
      GM -0.005045
                     0.046332
                                   -0.324721
                                                  0.199432
                                                              -0.173228
      CAH -0.000709
                     0.036667
                                   -0.292073
                                                  0.123378
                                                              -0.128674
                     0.044185
      RMD 0.001418
                                   -0.194236
                                                  0.170376
                                                              -0.159883
      MDT -0.001637
                     0.032416
                                   -0.358984
                                                  0.101893
                                                              -0.128237
      CVS -0.002268
                     0.033483
                                   -0.366402
                                                  0.108987
                                                              -0.123072
      RAD 0.010633
                     0.095548
                                    0.006622
                                                  0.423077
                                                              -0.317764
      WBA -0.002613
                                                 0.126036
                                                              -0.109616
                     0.035877
                                   -0.351561
                                         Average Return Days
           Median Returns
                            Total Return
                                                                    CAGR
      GE
                -0.006267
                                3.543307
                                                      0.000293 -0.518212
                               -3.082849
      F
                -0.002235
                                                     -0.000263 -0.698413
      GM
                -0.002286
                               -0.280634
                                                     -0.000024 -0.651471
      CAH
                -0.002013
                                9.148264
                                                      0.000736 -0.209340
      RMD
                 0.002632
                                8.636851
                                                      0.000696 0.080455
      MDT
                 0.000721
                                2.402941
                                                      0.000200 -0.310242
      CVS
                -0.002528
                                1.843007
                                                      0.000153 -0.384360
      RAD
                                                     -0.000260 1.918721
                -0.002066
                               -3.052422
      WBA
                -0.002246
                                2.636363
                                                      0.000219 -0.427269
[35]: table.sort_values(by='Average Return Days')
[35]:
                         Risk
                                Sharpe Ratio
                                              Max Returns
                                                           Min Returns
            Returns
      F
          -0.006110
                     0.042287
                                   -0.380976
                                                  0.234414
                                                              -0.110124
      RAD 0.010633
                     0.095548
                                    0.006622
                                                  0.423077
                                                              -0.317764
      GM -0.005045
                     0.046332
                                   -0.324721
                                                  0.199432
                                                              -0.173228
      CVS -0.002268
                     0.033483
                                   -0.366402
                                                  0.108987
                                                              -0.123072
      MDT -0.001637
                     0.032416
                                   -0.358984
                                                  0.101893
                                                              -0.128237
      WBA -0.002613
                     0.035877
                                   -0.351561
                                                  0.126036
                                                              -0.109616
      GE -0.003168
                     0.046514
                                   -0.283100
                                                  0.147300
                                                              -0.151592
      RMD 0.001418
                     0.044185
                                   -0.194236
                                                  0.170376
                                                              -0.159883
      CAH -0.000709
                     0.036667
                                   -0.292073
                                                  0.123378
                                                              -0.128674
           Median Returns
                           Total Return Average Return Days
                                                                    CAGR
      F
                -0.002235
                               -3.082849
                                                     -0.000263 -0.698413
      RAD
                -0.002066
                               -3.052422
                                                     -0.000260 1.918721
      GM
                -0.002286
                               -0.280634
                                                     -0.000024 -0.651471
                -0.002528
                                1.843007
                                                      0.000153 -0.384360
      CVS
```

WBA

-0.002246

2.636363

0.000219

MDT	0.000721	2.402941	0.000200 -0.310242
WBA	-0.002246	2.636363	0.000219 -0.427269
GE	-0.006267	3.543307	0.000293 -0.518212
RMD	0.002632	8.636851	0.000696 0.080455
CAH	-0.002013	9.148264	0.000736 -0.209340