

# Warren\_Buffet\_Vaccine\_Portfolio

September 29, 2021

## 1 Warren Buffet Vaccine Portfolio Risk and Returns (Coronavirus)

```
[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")

# yahoo finance is used to fetch data
import yfinance as yf
yf.pdr_override()
```

```
[2]: # input
# 4 Companies Vaccine
symbols = ['ABBV', 'MRK', 'PFE', 'BMY']
start = '2020-01-01'
end = '2020-11-27'
```

```
[3]: df = pd.DataFrame()
for s in symbols:
    df[s] = yf.download(s, start, end)['Adj Close']
```

```
[*****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]: 328
```

```
[7]: df.head()
```

```
[7]:
```

	ABBV	MRK	PFE	BMJ
Date				
2020-01-02	84.852608	89.912033	35.677311	61.879055
2020-01-03	84.047203	89.140297	35.485886	61.331974
2020-01-06	84.710480	89.521278	35.440315	61.527363
2020-01-07	84.227234	87.137688	35.321815	62.455448
2020-01-08	84.824188	86.551559	35.604385	62.387066

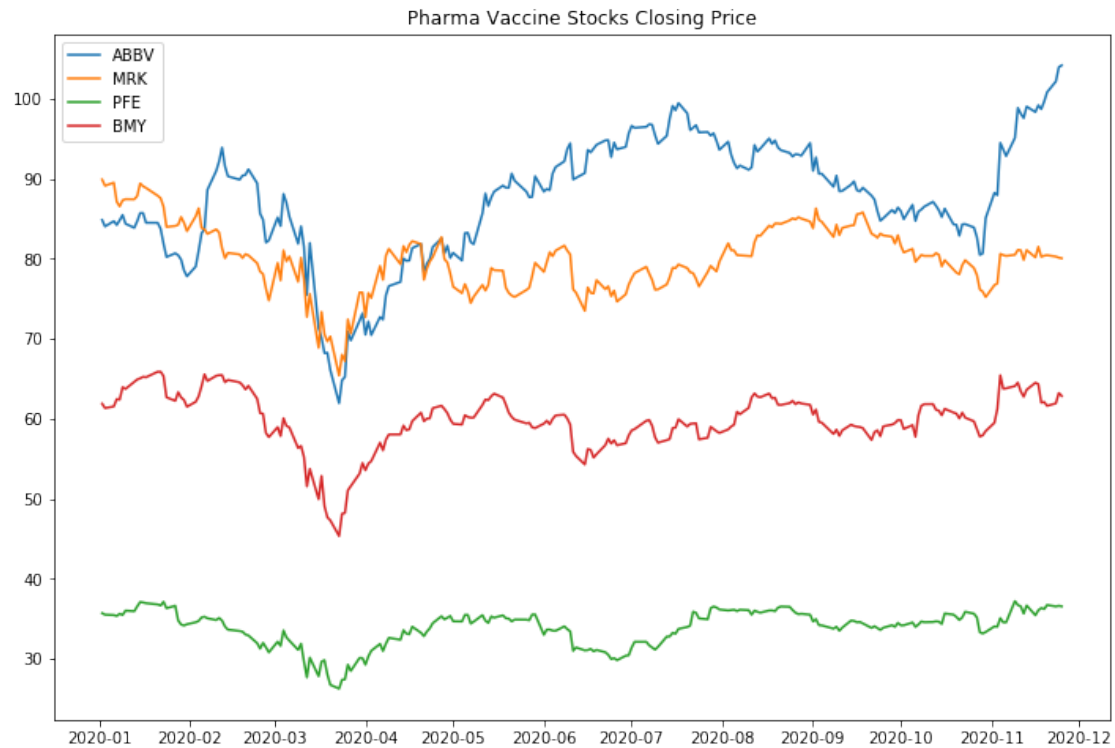
```
[8]: df.tail()
```

```
[8]:
```

	ABBV	MRK	PFE	BMJ
Date				
2020-11-19	99.669998	80.389999	36.189999	62.090000
2020-11-20	100.839996	80.449997	36.700001	61.610001
2020-11-23	102.180000	80.279999	36.520000	61.919998
2020-11-24	103.959999	80.139999	36.599998	63.220001
2020-11-25	104.199997	80.059998	36.529999	62.840000

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

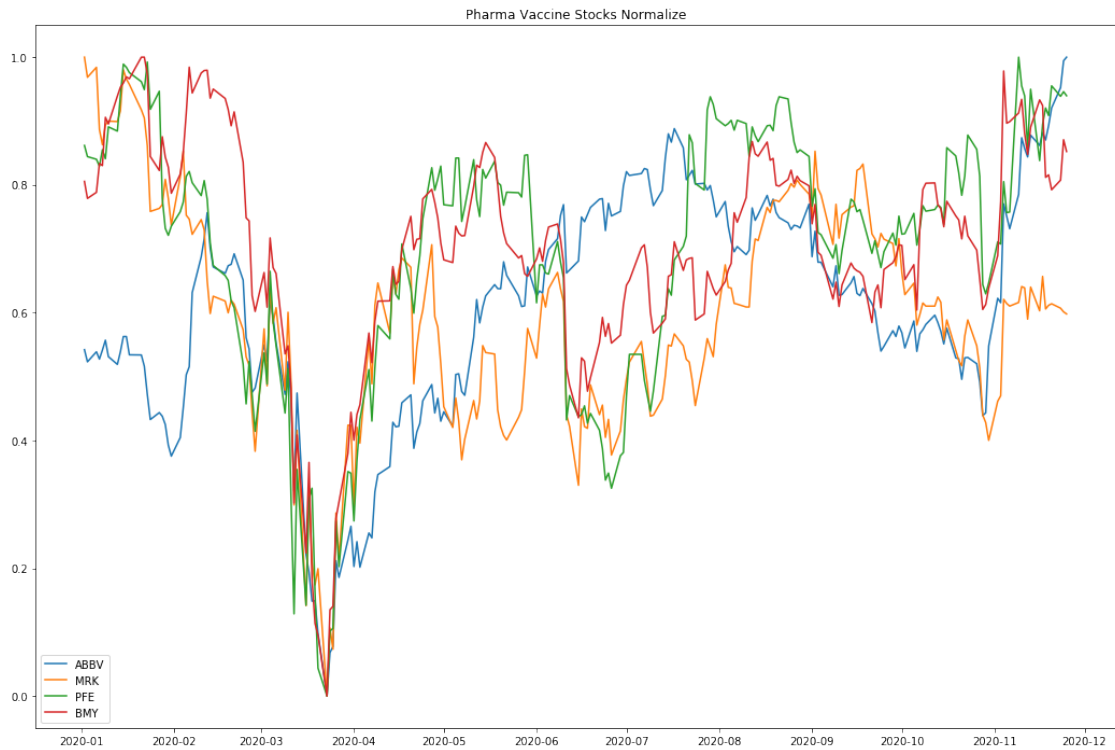
```
[9]: <matplotlib.legend.Legend at 0x2521b8897b8>
```



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

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

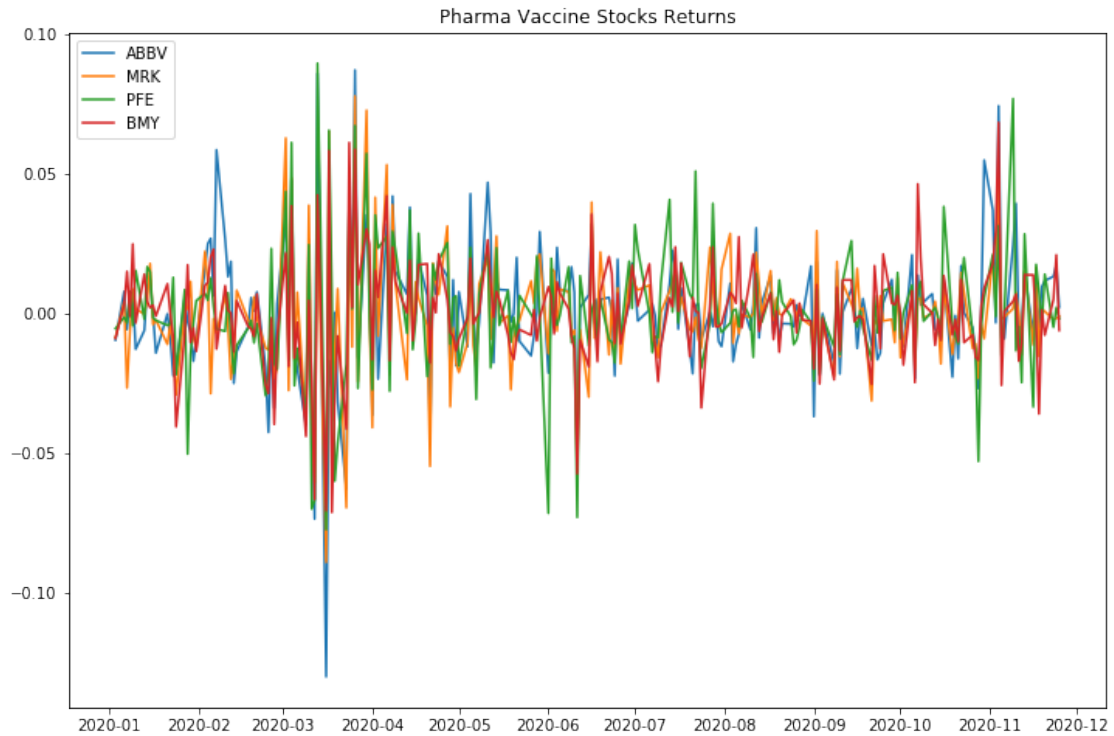
```
[11]: <matplotlib.legend.Legend at 0x2521bcf2f28>
```



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

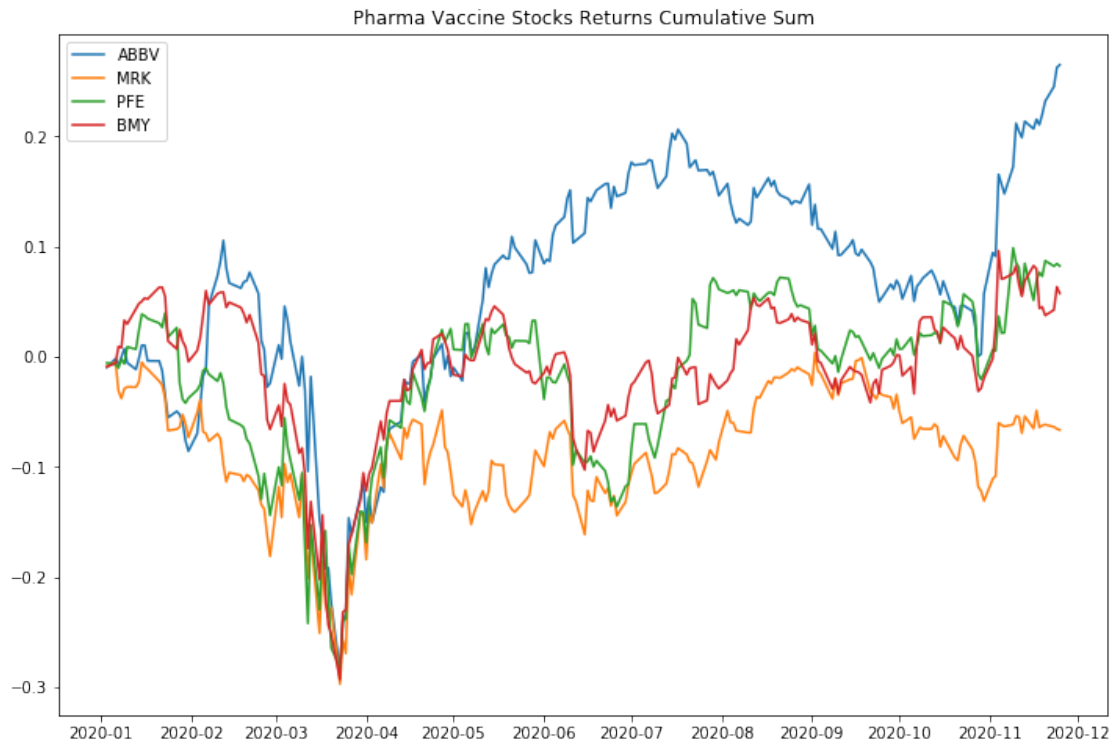
```
[13]: plt.figure(figsize=(12,8))
plt.plot(stock_returns)
plt.title('Pharma Vaccine Stocks Returns')
plt.legend(labels=stock_returns.columns)
```

```
[13]: <matplotlib.legend.Legend at 0x2521ba9b7b8>
```



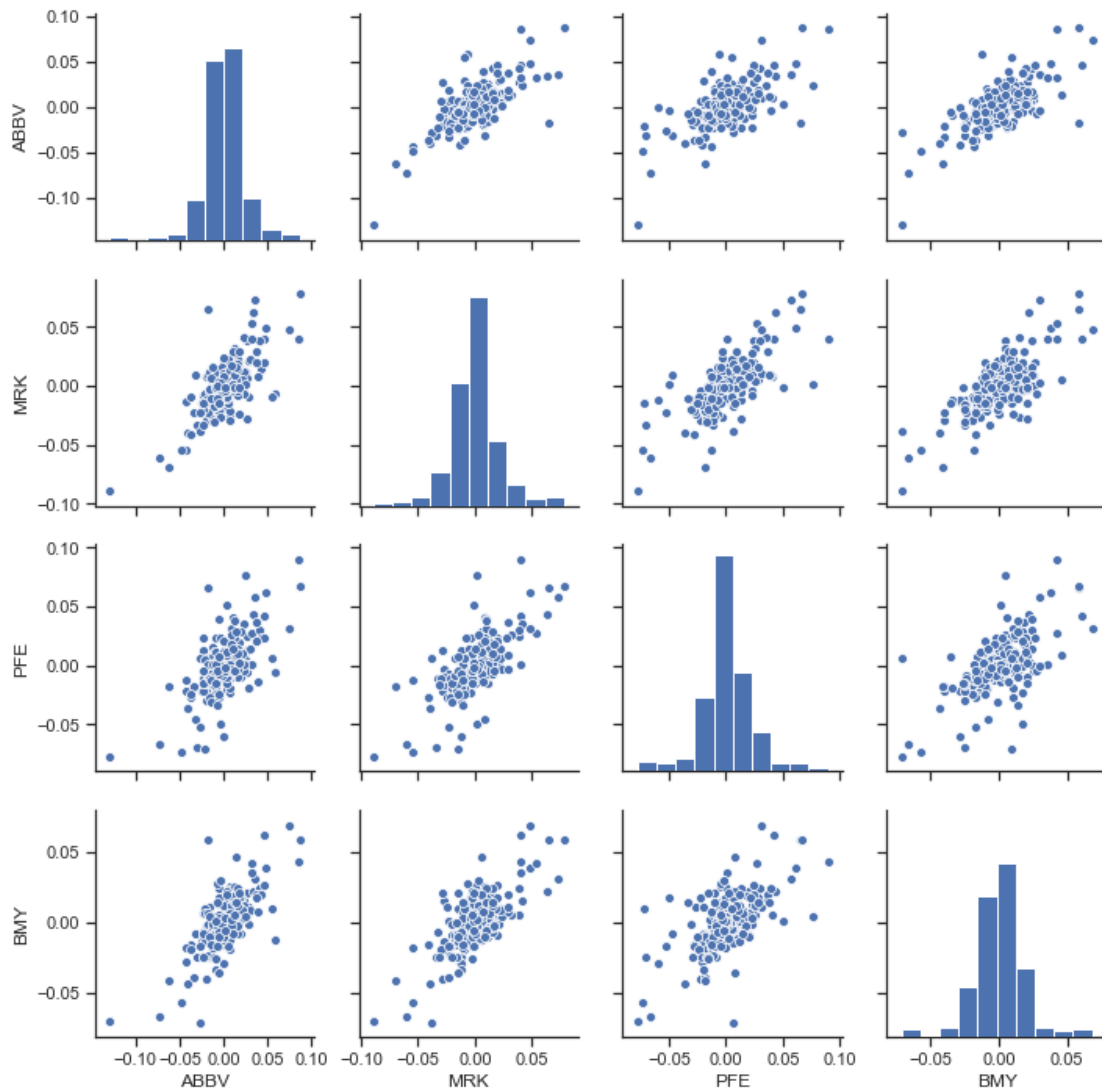
```
[14]: plt.figure(figsize=(12,8))  
plt.plot(stock_rets.cumsum())  
plt.title('Pharma Vaccine Stocks Returns Cumulative Sum')  
plt.legend(labels=stock_rets.columns)
```

[14]: <matplotlib.legend.Legend at 0x2521baabf28>

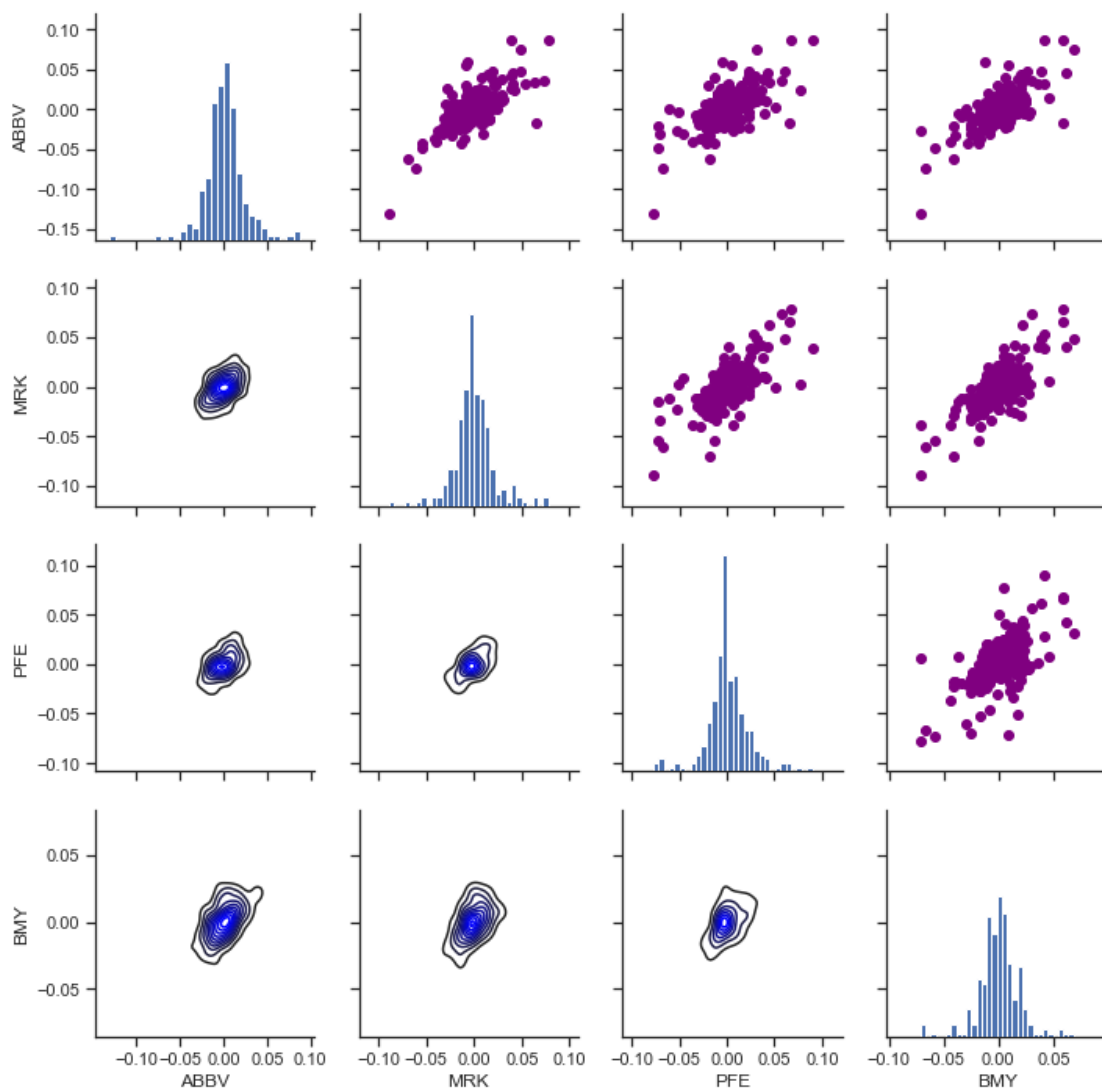


```
[15]: sns.set(style='ticks')
ax = sns.pairplot(stock_returns, diag_kind='hist')

nplot = len(stock_returns.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)
```

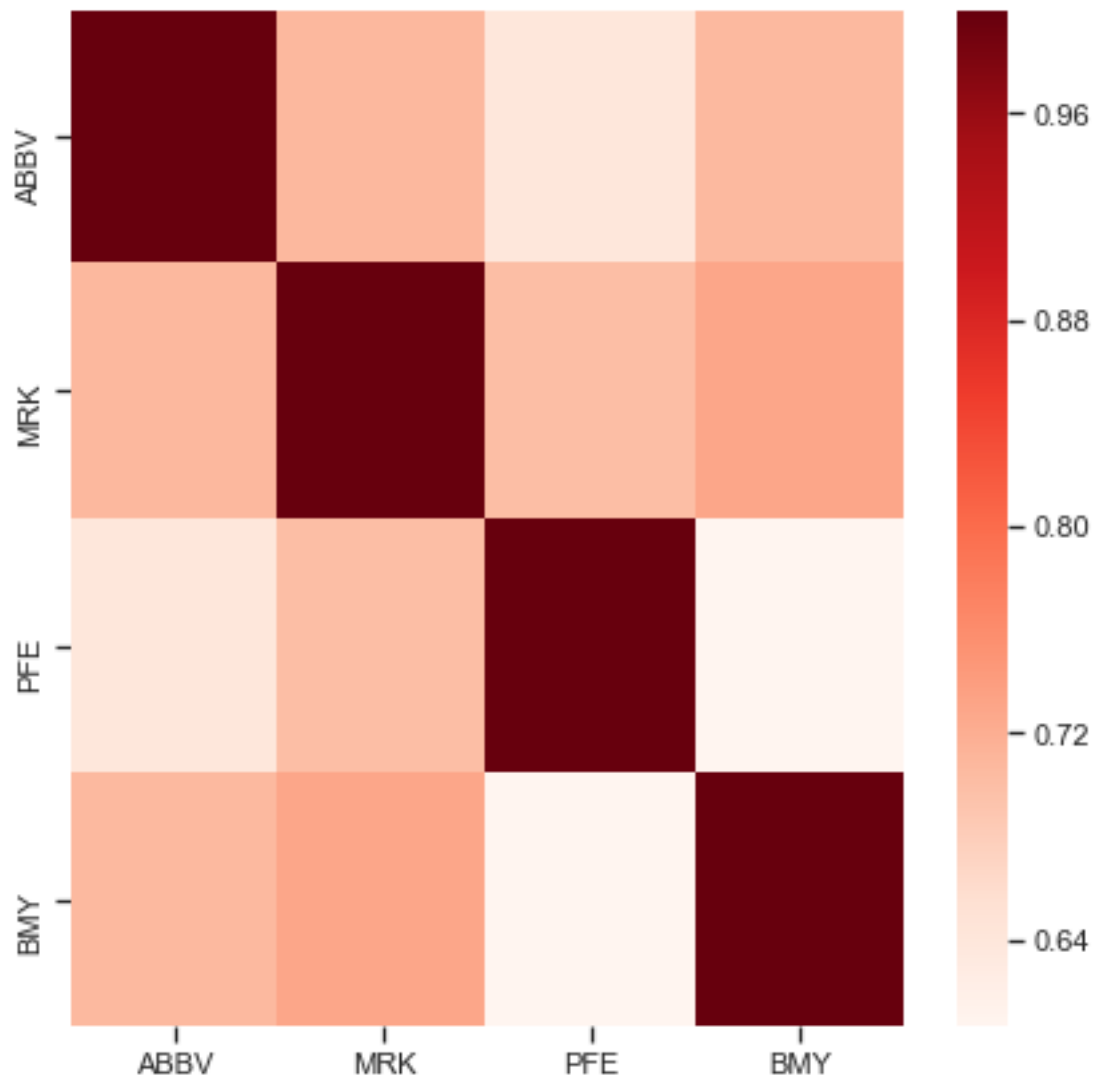


```
[17]: plt.figure(figsize=(7,7))
      corr = stock_rets.corr()

      # plot the heatmap
      sns.heatmap(corr,
                  xticklabels=corr.columns,
                  yticklabels=corr.columns,
                  cmap="Reds")
```

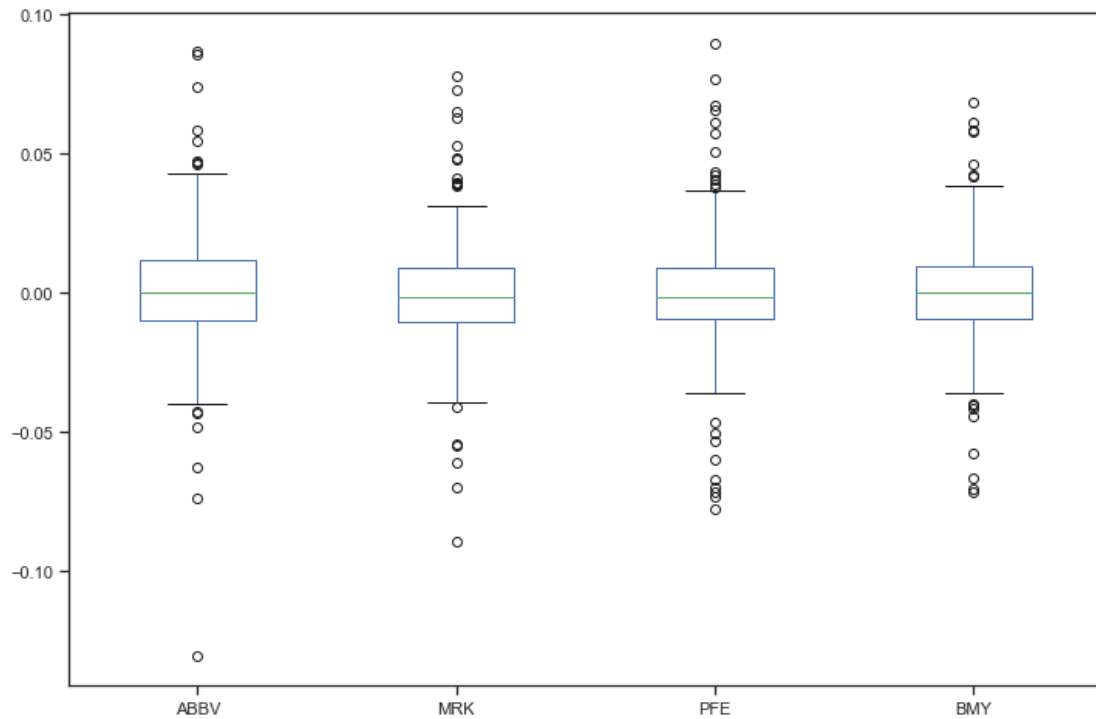
```
[17]: <matplotlib.axes._subplots.AxesSubplot at 0x2521d597240>
```





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

```
[18]: <matplotlib.axes._subplots.AxesSubplot at 0x2521e9077b8>
```

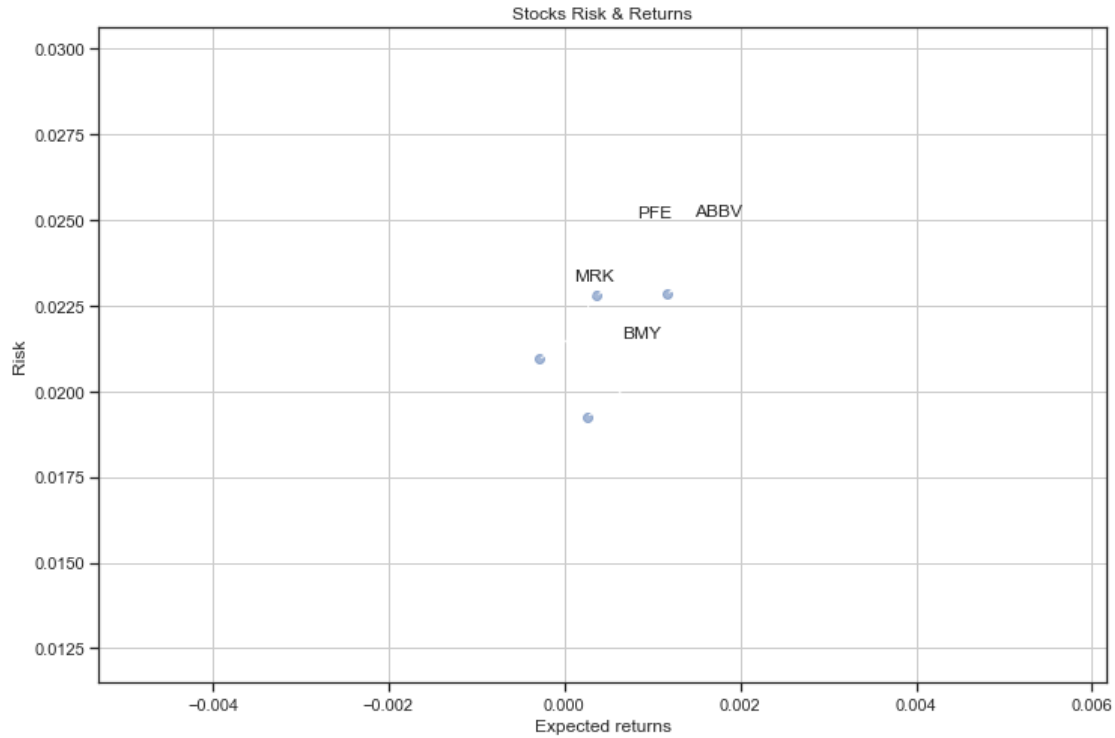


```
[19]: rets = stock_rets.dropna()

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'))
```



```
[20]: rets = stock_rets.dropna()
area = np.pi*20.0

sns.set(style='darkgrid')
plt.figure(figsize=(12,8))
plt.scatter(rets.mean(), rets.std(), s=area)
plt.xlabel("Expected Return", fontsize=15)
plt.ylabel("Risk", fontsize=15)
plt.title("Return vs. Risk for Stocks", fontsize=20)

for label, x, y in zip(rets.columns, rets.mean(), rets.std()) :
    plt.annotate(label, xy=(x,y), xytext=(50, 0), textcoords='offset points',
                arrowprops=dict(arrowstyle='-',
    ↪connectionstyle='bar,angle=180,fraction=-0.2'),
                bbox=dict(boxstyle="round", fc="w"))
```



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

```
[21]: BMY    BMY    1.000000
      PFE    PFE    1.000000
      MRK    MRK    1.000000
      ABVV   ABVV   1.000000
      BMY    MRK    0.730678
      MRK    BMY    0.730678
           ABVV   0.708299
      ABVV   MRK    0.708299
      BMY    ABVV   0.706911
      ABVV   BMY    0.706911
      PFE    MRK    0.701532
      MRK    PFE    0.701532
      PFE    ABVV   0.640402
      ABVV   PFE    0.640402
      BMY    PFE    0.606196
      PFE    BMY    0.606196
dtype: float64
```

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

```
[22]:
```

	ABBV	MRK	PFE	BMV
Date				
2020-01-03	0.554937	0.481979	0.431144	0.446546
2020-01-06	0.634973	0.559048	0.455590	0.532701
2020-01-07	0.572374	0.373827	0.443254	0.617934
2020-01-08	0.631270	0.493109	0.511199	0.502036
2020-01-09	0.634126	0.586201	0.437214	0.688237

```
[23]: Normalized_Value.corr()
```

```
[23]:
```

	ABBV	MRK	PFE	BMV
ABBV	1.000000	0.708299	0.640402	0.706911
MRK	0.708299	1.000000	0.701532	0.730678
PFE	0.640402	0.701532	1.000000	0.606196
BMV	0.706911	0.730678	0.606196	1.000000

```
[24]: normalized_rets = Normalized_Value.corr()
normalized_pair_value = normalized_rets.abs().unstack()
normalized_pair_value.sort_values(ascending = False)
```

```
[24]:
```

BMV	BMV	1.000000
PFE	PFE	1.000000
MRK	MRK	1.000000
ABBV	ABBV	1.000000
BMV	MRK	0.730678
MRK	BMV	0.730678
	ABBV	0.708299
ABBV	MRK	0.708299
BMV	ABBV	0.706911
ABBV	BMV	0.706911
PFE	MRK	0.701532
MRK	PFE	0.701532
PFE	ABBV	0.640402
ABBV	PFE	0.640402
BMV	PFE	0.606196
PFE	BMV	0.606196

dtype: float64

```
[25]: print("Stock returns: ")
print(rets.mean())
print('-' * 50)
print("Stock risks:")
print(rets.std())
```

```
Stock returns:
ABBV    0.001163
MRK     -0.000291
PFE     0.000362
BMY     0.000253
dtype: float64
```

```
-----
Stock risks:
ABBV    0.022844
MRK     0.020943
PFE     0.022804
BMY     0.019263
dtype: float64
```

```
[26]: table = pd.DataFrame()
      table['Returns'] = rets.mean()
      table['Risk'] = rets.std()
      table.sort_values(by='Returns')
```

```
[26]:      Returns      Risk
MRK  -0.000291  0.020943
BMY   0.000253  0.019263
PFE   0.000362  0.022804
ABBV   0.001163  0.022844
```

```
[27]: table.sort_values(by='Risk')
```

```
[27]:      Returns      Risk
BMY   0.000253  0.019263
MRK  -0.000291  0.020943
PFE   0.000362  0.022804
ABBV   0.001163  0.022844
```

```
[28]: rf = 0.01
      table['Sharpe Ratio'] = (table['Returns'] - rf) / table['Risk']
      table
```

```
[28]:      Returns      Risk  Sharpe Ratio
ABBV   0.001163  0.022844    -0.386856
MRK  -0.000291  0.020943    -0.491361
PFE   0.000362  0.022804    -0.422622
BMY   0.000253  0.019263    -0.506008
```

```
[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	\
ABBV	0.001163	0.022844	-0.386856	0.087174	-0.130022	
MRK	-0.000291	0.020943	-0.491361	0.077836	-0.088990	
PFE	0.000362	0.022804	-0.422622	0.089607	-0.077346	
BMV	0.000253	0.019263	-0.506008	0.068419	-0.071178	

	Median Returns	Total Return
ABBV	0.000535	0.230856
MRK	-0.001376	-0.099828
PFE	-0.001306	-0.191256
BMV	0.000249	-0.601077

```
[33]: table['Average Return Days'] = (1 + total_return)**(1 / days) - 1
table
```

```
[33]:
```

	Returns	Risk	Sharpe Ratio	Max Returns	Min Returns	\
ABBV	0.001163	0.022844	-0.386856	0.087174	-0.130022	
MRK	-0.000291	0.020943	-0.491361	0.077836	-0.088990	
PFE	0.000362	0.022804	-0.422622	0.089607	-0.077346	
BMV	0.000253	0.019263	-0.506008	0.068419	-0.071178	

	Median Returns	Total Return	Average Return Days
ABBV	0.000535	0.230856	0.000007
MRK	-0.001376	-0.099828	-0.000003
PFE	-0.001306	-0.191256	-0.000006
BMV	0.000249	-0.601077	-0.000018

```
[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	\
ABBV	0.001163	0.022844	-0.386856	0.087174	-0.130022	
MRK	-0.000291	0.020943	-0.491361	0.077836	-0.088990	
PFE	0.000362	0.022804	-0.422622	0.089607	-0.077346	
BMV	0.000253	0.019263	-0.506008	0.068419	-0.071178	

	Median Returns	Total Return	Average Return Days	CAGR
ABBV	0.000535	0.230856	0.000007	0.170937
MRK	-0.001376	-0.099828	-0.000003	-0.085305

PFE	-0.001306	-0.191256	-0.000006	0.018312
BMV	0.000249	-0.601077	-0.000018	0.011910

```
[35]: table.sort_values(by='Average Return Days')
```

```
[35]:
```

	Returns	Risk	Sharpe Ratio	Max Returns	Min Returns	\
BMV	0.000253	0.019263	-0.506008	0.068419	-0.071178	
PFE	0.000362	0.022804	-0.422622	0.089607	-0.077346	
MRK	-0.000291	0.020943	-0.491361	0.077836	-0.088990	
ABV	0.001163	0.022844	-0.386856	0.087174	-0.130022	

	Median Returns	Total Return	Average Return Days	CAGR
BMV	0.000249	-0.601077	-0.000018	0.011910
PFE	-0.001306	-0.191256	-0.000006	0.018312
MRK	-0.001376	-0.099828	-0.000003	-0.085305
ABV	0.000535	0.230856	0.000007	0.170937