## Airlines Portfolio

September 29, 2021

## 1 Airlines 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
    # Airlines Stock
    symbols = ['AAL','ALK','DAL','LUV','JBLU']
    start = '2019-12-01'
    end = '2020-04-14'
[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
    [********* 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]: 133
[7]:
    df.head()
[7]:
                      AAL
                                 ALK
                                            DAL
                                                       LUV
                                                                 JBLU
    Date
    2019-12-02
                                                            19.200001
                27.976612 67.725922 56.361004
                                                 56.319195
    2019-12-03 27.189522
                           66.234383
                                      55.238750
                                                 55.534775
                                                            18.799999
    2019-12-04 27.279188
                           66.542633
                                      55.675735
                                                 55.385830
                                                            19.320000
    2019-12-05
                27.139706 66.910545
                                      55.496971
                                                 55.137600
                                                            19.139999
    2019-12-06 27.627901 67.934738 55.755184
                                                 55.544704 19.020000
[8]: df.tail()
[8]:
                  AAL
                             ALK
                                        DAL
                                                   LUV
                                                        JBLU
    Date
                 9.50
                       26.670000
                                  22.320000
                                             30.700001
    2020-04-06
                                                        7.73
                       29.030001
    2020-04-07 10.22
                                  22.250000
                                             32.770000
                                                        8.76
    2020-04-08 11.33
                       29.139999
                                  23.230000
                                             34.299999
                                                        9.03
    2020-04-09 12.51
                       31.610001
                                  24.389999
                                             36.470001 9.50
    2020-04-13 11.56 29.510000 23.250000
                                             34.259998 9.03
[9]: plt.figure(figsize=(12,8))
    plt.plot(df)
    plt.title('Airlines Stocks Closing Price')
    plt.legend(labels=df.columns)
[9]: <matplotlib.legend.Legend at 0x25e092eee10>
```



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

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

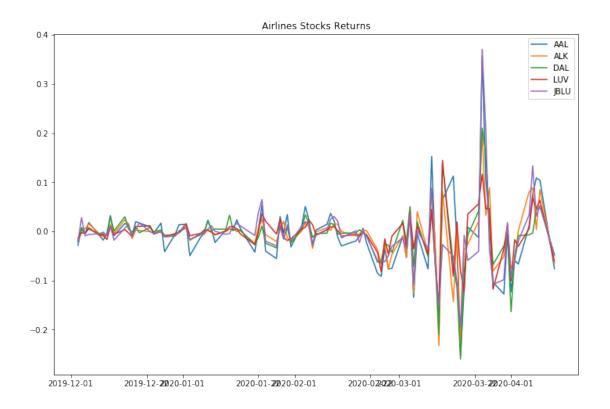
[11]: <matplotlib.legend.Legend at 0x25e09583390>



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

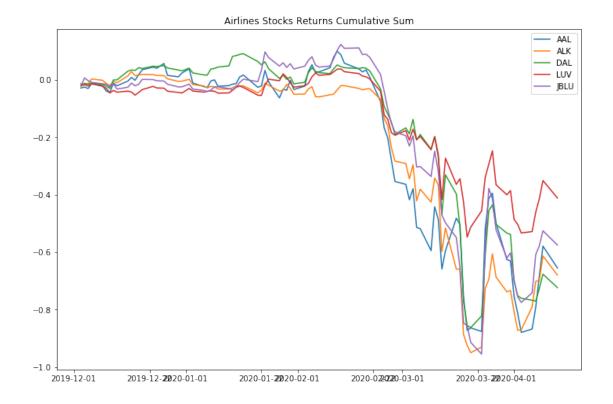
[13]: plt.figure(figsize=(12,8))
    plt.plot(stock_rets)
    plt.title('Airlines Stocks Returns')
    plt.legend(labels=stock_rets.columns)
```

[13]: <matplotlib.legend.Legend at 0x25e0935d438>



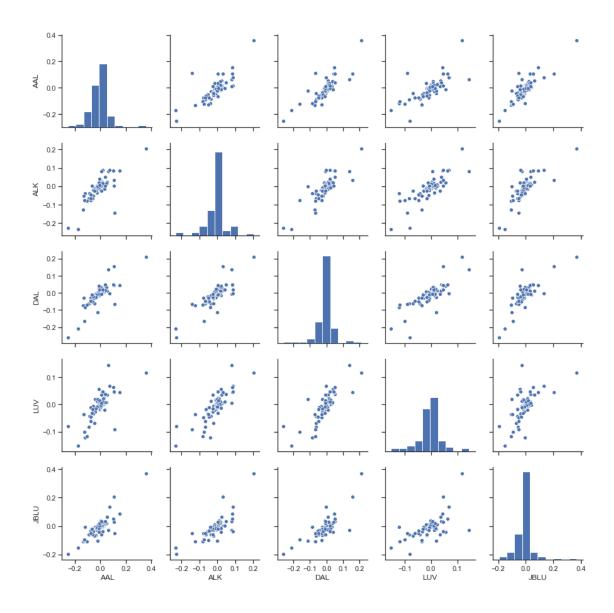
```
[14]: plt.figure(figsize=(12,8))
    plt.plot(stock_rets.cumsum())
    plt.title('Airlines Stocks Returns Cumulative Sum')
    plt.legend(labels=stock_rets.columns)
```

[14]: <matplotlib.legend.Legend at 0x25e093bd518>

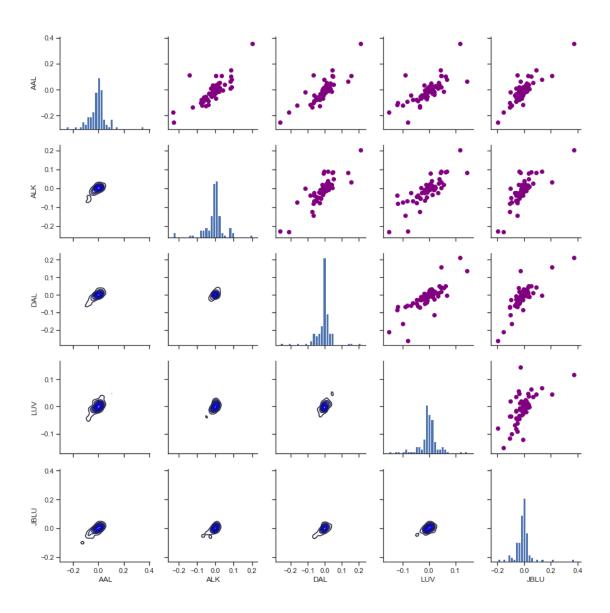


```
[15]: sns.set(style='ticks')
ax = sns.pairplot(stock_rets, diag_kind='hist')

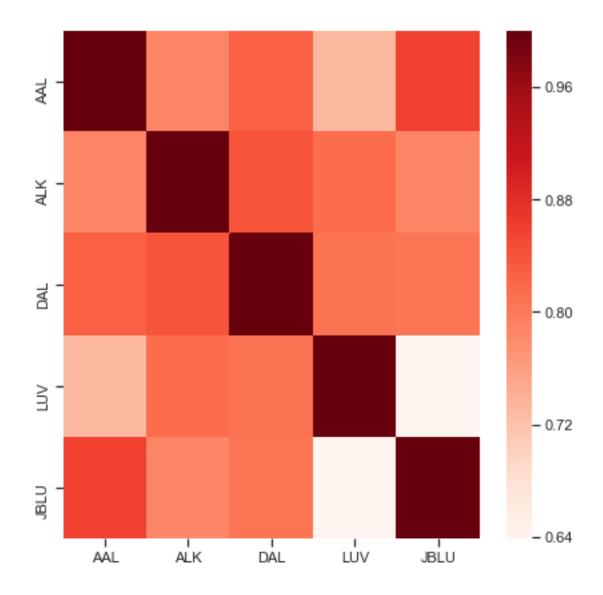
nplot = len(stock_rets.columns)
for i in range(nplot) :
    for j in range(nplot) :
        ax.axes[i, j].locator_params(axis='x', nbins=6, tight=True)
```



```
[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)
```

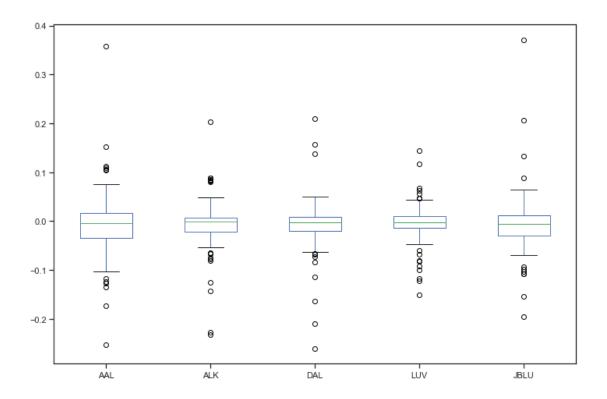


[17]: <matplotlib.axes.\_subplots.AxesSubplot at 0x25e0cf26198>



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

[18]: <matplotlib.axes.\_subplots.AxesSubplot at 0x25e0d42d4e0>

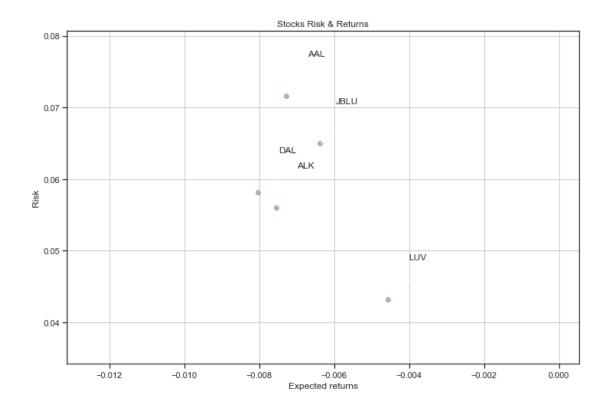


```
[19]: rets = stock_rets.dropna()

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)
```

```
[21]: JBLU
            JBLU
                     1.000000
      LUV
            LUV
                     1.000000
      ALK
            ALK
                     1.000000
            DAL
      DAL
                     1.000000
      AAL
            AAL
                     1.000000
             JBLU
                     0.859128
      JBLU
            AAL
                     0.859128
      DAL
            ALK
                     0.839744
      ALK
            \mathsf{DAL}
                     0.839744
      DAL
            AAL
                     0.827899
      AAL
            DAL
                     0.827899
      LUV
            ALK
                     0.816276
      ALK
            LUV
                     0.816276
      DAL
            LUV
                     0.808675
      LUV
            DAL
                     0.808675
            JBLU
      DAL
                     0.807102
      JBLU
            DAL
                     0.807102
      ALK
            AAL
                     0.789153
      AAL
            ALK
                     0.789153
```

```
JBLU ALK
                    0.787202
      AAL
            LUV
                    0.732962
     LUV
            AAL
                    0.732962
      JBLU LUV
                    0.638621
     LUV
            JBLU
                    0.638621
      dtype: float64
[22]: # Normalized Returns Data
      Normalized_Value = ((rets[:] - rets[:].min()) / (rets[:].max() - rets[:].min()))
      Normalized Value.head()
[22]:
                       AAL
                                 ALK
                                           DAL
                                                     LUV
                                                              JBLU
      Date
      2019-12-03 0.367220 0.483075 0.510561 0.464128 0.308579
      2019-12-04  0.418722  0.544336  0.569747  0.502181  0.394310
      2019-12-05 0.404941 0.546345
                                      0.546088 0.496091
                                                          0.328939
      2019-12-06 0.442793 0.568799
                                      0.562816 0.536239
                                                          0.334327
      2019-12-09 0.399137
                            0.522557
                                      0.540035 0.482827
                                                          0.337045
[23]: Normalized_Value.corr()
[23]:
                 AAL
                           ALK
                                     DAL
                                               LUV
                                                        JBLU
     AAL
            1.000000 0.789153 0.827899
                                         0.732962 0.859128
      ALK
            0.789153
                    1.000000 0.839744 0.816276 0.787202
     DAL
            0.827899   0.839744   1.000000   0.808675   0.807102
     LUV
            0.732962  0.816276  0.808675  1.000000  0.638621
      JBLU 0.859128 0.787202 0.807102 0.638621 1.000000
[24]: normalized_rets = Normalized_Value.corr()
      normalized_pair_value = normalized_rets.abs().unstack()
      normalized_pair_value.sort_values(ascending = False)
[24]: JBLU JBLU
                    1.000000
     LUV
           LUV
                    1.000000
      ALK
            ALK
                    1.000000
      DAL
            DAL
                    1.000000
      AAL
            AAL
                    1.000000
            JBLU
                    0.859128
      JBLU AAL
                    0.859128
     DAL
            ALK
                    0.839744
      ALK
            DAL
                    0.839744
     DAL
            AAL
                    0.827899
      AAL
            DAL
                    0.827899
     LUV
            ALK
                    0.816276
      ALK
            LUV
                    0.816276
      DAL
           LUV
                    0.808675
```

ALK

JBLU

0.787202

```
LUV
           DAL
                    0.808675
     DAL
            JBLU
                    0.807102
      JBLU DAL
                    0.807102
      ALK
            AAL
                    0.789153
      AAL
           ALK
                    0.789153
      ALK
            JBLU
                   0.787202
      JBLU ALK
                    0.787202
      AAL
           LUV
                    0.732962
     LUV
            AAL
                    0.732962
      JBLU LUV
                    0.638621
     LUV
            JBLU
                    0.638621
      dtype: float64
[25]: print("Stock returns: ")
      print(rets.mean())
      print('-' * 50)
      print("Stock risks:")
      print(rets.std())
     Stock returns:
     AAL
            -0.007272
     ALK
            -0.007548
     DAL
            -0.008032
     LUV
            -0.004565
     JBLU
            -0.006384
     dtype: float64
     Stock risks:
     AAL
             0.071660
     ALK
             0.056064
     DAL
             0.058122
     LUV
             0.043218
     JBLU
             0.064988
     dtype: float64
[26]: table = pd.DataFrame()
      table['Returns'] = rets.mean()
      table['Risk'] = rets.std()
      table.sort_values(by='Returns')
[26]:
            Returns
                          Risk
      DAL -0.008032 0.058122
      ALK -0.007548 0.056064
      AAL -0.007272 0.071660
      JBLU -0.006384 0.064988
     LUV -0.004565 0.043218
```

```
[27]: table.sort_values(by='Risk')
[27]:
            Returns
                         Risk
     LUV -0.004565 0.043218
      ALK -0.007548 0.056064
      DAL -0.008032
                    0.058122
      JBLU -0.006384 0.064988
      AAL -0.007272 0.071660
[28]: rf = 0.01
      table['Sharpe Ratio'] = (table['Returns'] - rf) / table['Risk']
      table
[28]:
                         Risk Sharpe Ratio
            Returns
      AAL -0.007272 0.071660
                                  -0.241029
      ALK -0.007548 0.056064
                                  -0.312989
      DAL -0.008032 0.058122
                                  -0.310245
      LUV -0.004565 0.043218
                                  -0.337021
      JBLU -0.006384 0.064988
                                  -0.252114
[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 \
      AAL -0.007272 0.071660
                                  -0.241029
                                                0.358049
                                                            -0.252246
      ALK -0.007548 0.056064
                                  -0.312989
                                                0.203079
                                                            -0.232385
     DAL -0.008032 0.058122
                                  -0.310245
                                                0.210171
                                                            -0.259924
     LUV -0.004565 0.043218
                                  -0.337021
                                                0.144441
                                                            -0.151094
      JBLU -0.006384 0.064988
                                  -0.252114
                                                0.370262
                                                            -0.195378
           Median Returns Total Return
      AAL
                -0.004230
                              -7.593923
      ALK
                -0.000512
                              -6.643468
      DAL
                -0.003102
                              -4.674044
     LUV
                -0.002829
                              -6.059783
      JBLU
                -0.005363
                              -4.947371
[33]: table['Average Return Days'] = (1 + total_return)**(1 / days) - 1
      table
```

```
Sharpe Ratio Max Returns Min Returns \
          -0.007272 0.071660
                                   -0.241029
      AAL
                                                  0.358049
                                                              -0.252246
      ALK -0.007548
                      0.056064
                                   -0.312989
                                                              -0.232385
                                                  0.203079
     DAL -0.008032
                      0.058122
                                   -0.310245
                                                  0.210171
                                                              -0.259924
                                   -0.337021
     LUV -0.004565
                      0.043218
                                                  0.144441
                                                              -0.151094
      JBLU -0.006384
                      0.064988
                                   -0.252114
                                                  0.370262
                                                              -0.195378
            Median Returns
                            Total Return Average Return Days
      AAL
                 -0.004230
                               -7.593923
                                                     -0.000594
      ALK
                 -0.000512
                               -6.643468
                                                     -0.000517
      DAL
                 -0.003102
                               -4.674044
                                                     -0.000360
     LUV
                               -6.059783
                                                     -0.000470
                 -0.002829
      JBLU
                               -4.947371
                 -0.005363
                                                     -0.000381
[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
                                   -0.241029
          -0.007272
                     0.071660
                                                  0.358049
                                                              -0.252246
      AAL
      ALK
          -0.007548
                      0.056064
                                   -0.312989
                                                  0.203079
                                                              -0.232385
      DAL
          -0.008032
                      0.058122
                                   -0.310245
                                                  0.210171
                                                              -0.259924
      LUV -0.004565
                      0.043218
                                   -0.337021
                                                  0.144441
                                                              -0.151094
      JBLU -0.006384 0.064988
                                   -0.252114
                                                  0.370262
                                                              -0.195378
            Median Returns Total Return Average Return Days
                                                                    CAGR
      AAL
                 -0.004230
                               -7.593923
                                                     -0.000594 -0.812617
      ALK
                                                     -0.000517 -0.792792
                 -0.000512
                               -6.643468
      DAL
                 -0.003102
                               -4.674044
                                                    -0.000360 -0.813204
     LUV
                 -0.002829
                               -6.059783
                                                     -0.000470 -0.610072
                                                     -0.000381 -0.760526
      JBLU
                 -0.005363
                               -4.947371
[35]: table.sort_values(by='Average Return Days')
[35]:
                                Sharpe Ratio Max Returns Min Returns \
                          Risk
             Returns
      AAL
          -0.007272 0.071660
                                   -0.241029
                                                  0.358049
                                                              -0.252246
      ALK -0.007548 0.056064
                                   -0.312989
                                                  0.203079
                                                              -0.232385
     LUV -0.004565
                      0.043218
                                                              -0.151094
                                   -0.337021
                                                  0.144441
      JBLU -0.006384
                      0.064988
                                   -0.252114
                                                  0.370262
                                                              -0.195378
          -0.008032 0.058122
                                   -0.310245
                                                  0.210171
                                                              -0.259924
            Median Returns
                            Total Return Average Return Days
                                                                    CAGR
                 -0.004230
      AAL
                               -7.593923
                                                     -0.000594 -0.812617
      ALK
                 -0.000512
                               -6.643468
                                                     -0.000517 -0.792792
     LUV
                 -0.002829
                               -6.059783
                                                     -0.000470 -0.610072
                               -4.947371
                                                     -0.000381 -0.760526
      JBLU
                 -0.005363
```

[33]:

Returns

Risk

DAL -0.003102 -4.674044

-0.000360 -0.813204