

Project 2 Optimize something

```
19 ''' Here error is volatility or standard deviation of daily return. '''
20 def error(guess_allocs, prices):
21     normalized_price = prices / prices.iloc[0, :]
22     daily_port_val = (normalized_price * guess_allocs).sum(axis = 1) # sv can be neglected here
23     dr = (daily_port_val / daily_port_val.shift(1)) - 1 # daily return
24     sddr = dr.std() # standard deviation of daily return
25     return sddr

36 # find the allocations for the optimal portfolio
37 guess_allocs = [1 / len(syms)] * len(syms)
38 result = spo.minimize(error, guess_allocs, args = (prices,), \
39     method='SLSQP', options = {'disp': True}, bounds = ((0., 1.),) * len(syms), \
40     constraints = ({ 'type': 'eq', 'fun': lambda allocs: 1.0 - np.sum(allocs) })))
```

Minimize volatility (std of daily return) to achieve 'optimal'.

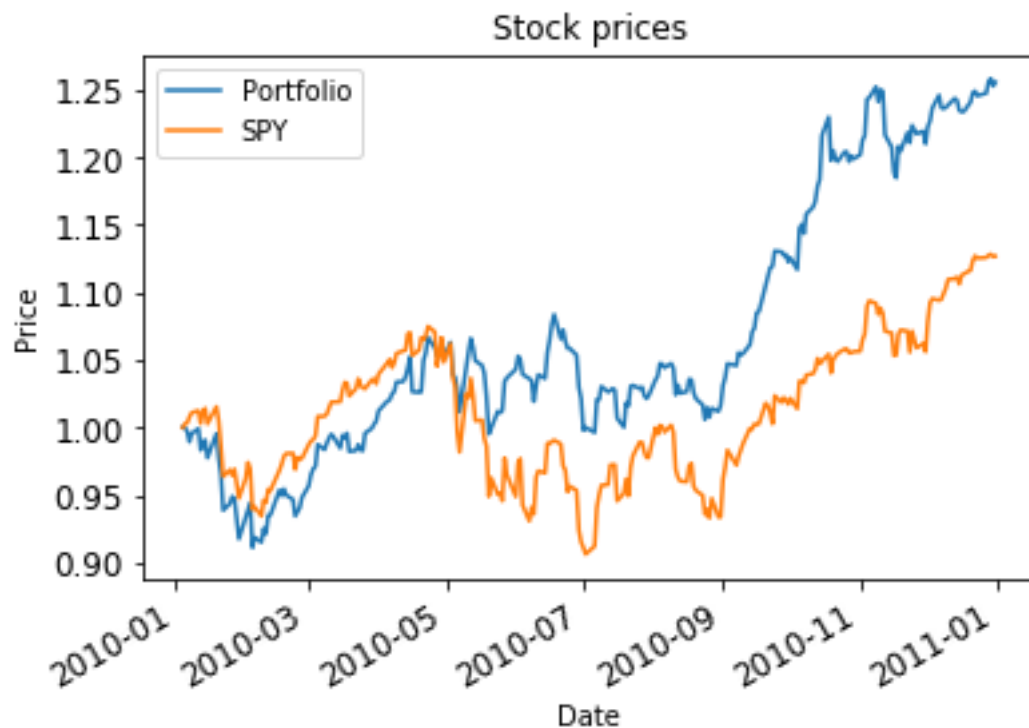
<https://stackoverflow.com/questions/35631192/element-wise-constraints-in-scipy-optimize-minimize>

Check StackOverflow answer to see how to use constraints to set sum of allocations to 1.

```
72 def test_code():
73     # This function WILL NOT be called by the auto grader
74     # Do not assume that any variables defined here are available to your function/code
75     # It is only here to help you set up and test your code
76
77     # Define input parameters
78     # Note that ALL of these values will be set to different values by
79     # the autograder!
80
81     start_date = '2010-01-01'
82     end_date = '2010-12-31'
83     symbols = ['GOOG', 'AAPL', 'GLD', 'XOM']
84
85     # Assess the portfolio
86     allocations, cr, adr, sddr, sr = optimize_portfolio(sd = start_date, ed = end_date, \
87         syms = symbols, \
88         gen_plot = True)
89
90     # Print statistics
91     print("Start Date:", start_date)
92     print("End Date:", end_date)
93     print("Symbols:", symbols)
94     print("Allocations:", allocations)
95     print("Sharpe Ratio:", sr)
96     print("Volatility (stdev of daily returns):", sddr)
97     print("Average Daily Return:", adr)
98     print("Cumulative Return:", cr)
```

Example Wiki Example 1

```
37 OptimizationTestCase(  
38     inputs=dict(  
39         start_date=str2dt('2010-01-01'),  
40         end_date=str2dt('2010-12-31'),  
41         symbols=['GOOG', 'AAPL', 'GLD', 'XOM']  
42     ),  
43     outputs=dict(  
44         allocs=[ 0.10612267, 0.00777928, 0.54377087, 0.34232718],  
45         benchmark=0.00828691718086 # BPH: updated from reference solution, Sunday 3 Sep 2017  
46     ),  
47     description="Wiki example 1",
```



Start Date: 2010-01-01

End Date: 2010-12-31

Symbols: ['GOOG', 'AAPL', 'GLD', 'XOM']

Allocations: [0.10612268 0.00777931 0.54377086 0.34232715]

Sharpe Ratio: 1.2787144472012433

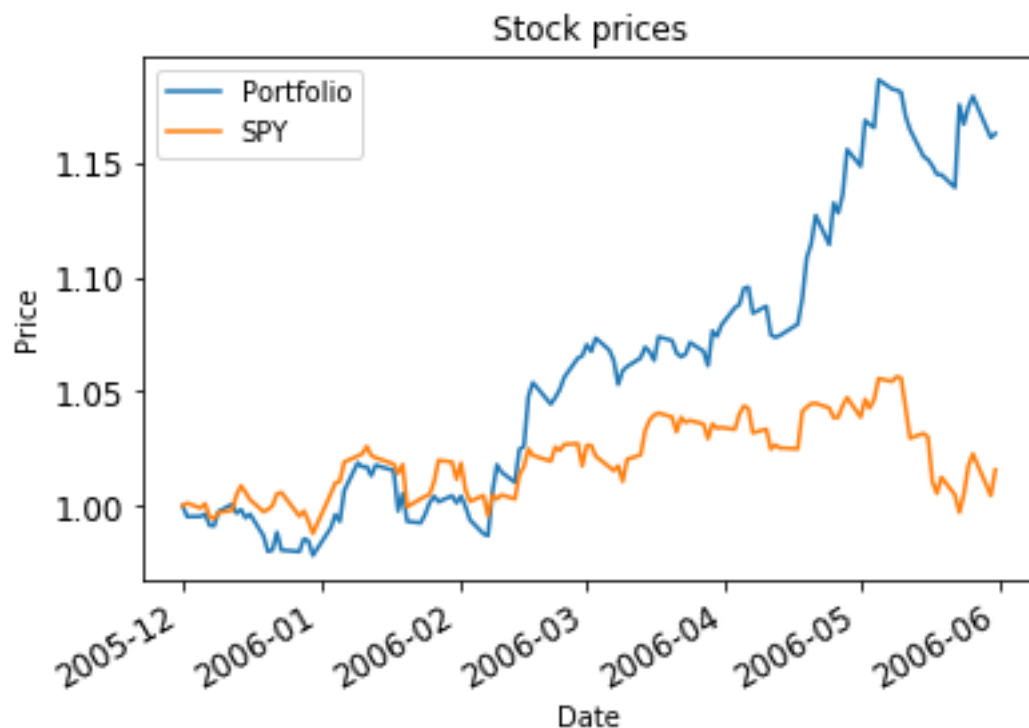
Volatility (stdev of daily returns): 0.008286917194624346

Average Daily Return: 0.0006635848786022384

Cumulative Return: 0.17105107382716445

Example Wiki Example 4

```
76 OptimizationTestCase(  
77     inputs=dict(  
78         start_date=str2dt('2005-12-01'),  
79         end_date=str2dt('2006-05-31'),  
80         symbols=['YHOO', 'HPQ', 'GLD', 'HNZ']  
81     ),  
82     outputs=dict(  
83         allocs=[ 0.10913451, 0.19186373, 0.15370123, 0.54530053],  
84         benchmark=0.00789501806472 # BPH: updated from reference solution, Sunday 3 Sep 2017  
85     ),  
86     description="Wiki example 4",
```



Start Date: 2005-12-01

End Date: 2006-05-31

Symbols: ['YHOO', 'HPQ', 'GLD', 'HNZ']

Allocations: [0.10913452 0.19186371 0.15370125 0.54530052]

Sharpe Ratio: 2.5438700682811914

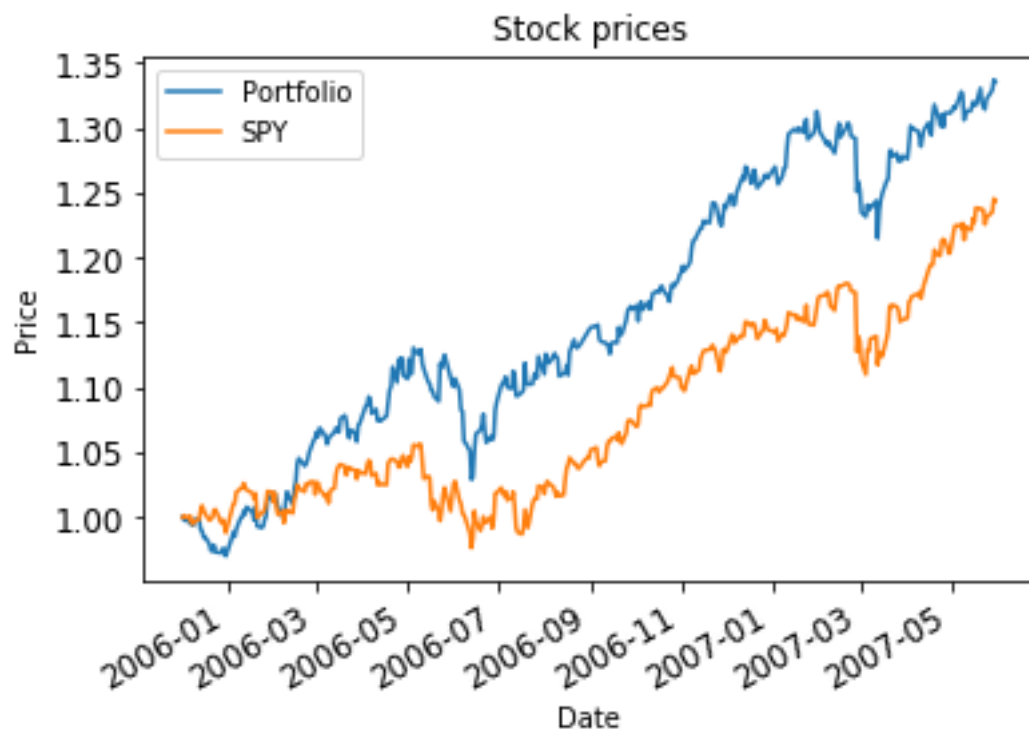
Volatility (stdev of daily returns): 0.007895018068826138

Average Daily Return: 0.0012577026136054606

Cumulative Return: 0.16278942404396135

MSFT vs HPQ

```
89 OptimizationTestCase(  
90     inputs=dict(  
91         start_date=str2dt('2005-12-01'),  
92         end_date=str2dt('2007-05-31'),  
93         symbols=['MSFT', 'HPQ', 'GLD', 'HNZ']  
94     ),  
95     outputs=dict(  
96         allocs=[ 0.29292607, 0.10633076, 0.14849462, 0.45224855],  
97         benchmark=0.00688155185985 # BPH: updated from reference solution, Sunday 3 Sep 2017  
98     ),  
99     description="MSFT vs HPQ",
```



Start Date: 2005-12-01

End Date: 2007-05-31

Symbols: ['MSFT', 'HPQ', 'GLD', 'HNZ']

Allocations: [0.29292602 0.10633095 0.14849463 0.4522484]

Sharpe Ratio: 1.8503796549242824

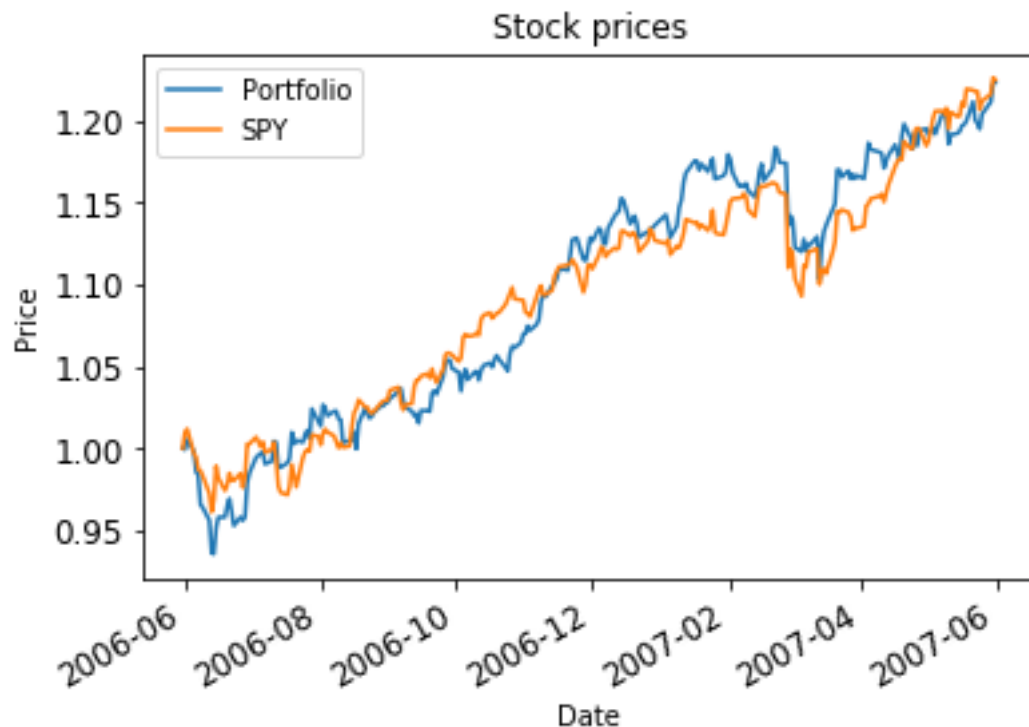
Volatility (stdev of daily returns): 0.006881551888743965

Average Daily Return: 0.0007974016746239188

Cumulative Return: 0.3354664739924902

MSFT vs AAPL

```
102 OptimizationTestCase(  
103     inputs=dict(  
104         start_date=str2dt('2006-05-31'),  
105         end_date=str2dt('2007-05-31'),  
106         symbols=['MSFT', 'AAPL', 'GLD', 'HNZ']  
107     ),  
108     outputs=dict(  
109         allocs=[ 0.20500321,  0.05126107,  0.18217495,  0.56156077],  
110         benchmark=0.00693253248047 # BPH: updated from reference solution, Sunday 3 Sep 2017  
111     ),  
112     description="MSFT vs AAPL",
```



Start Date: 2006-05-31

End Date: 2007-05-31

Symbols: ['MSFT', 'AAPL', 'GLD', 'HNZ']

Allocations: [0.20500314 0.05126108 0.18217498 0.56156079]

Sharpe Ratio: 1.9036061637809298

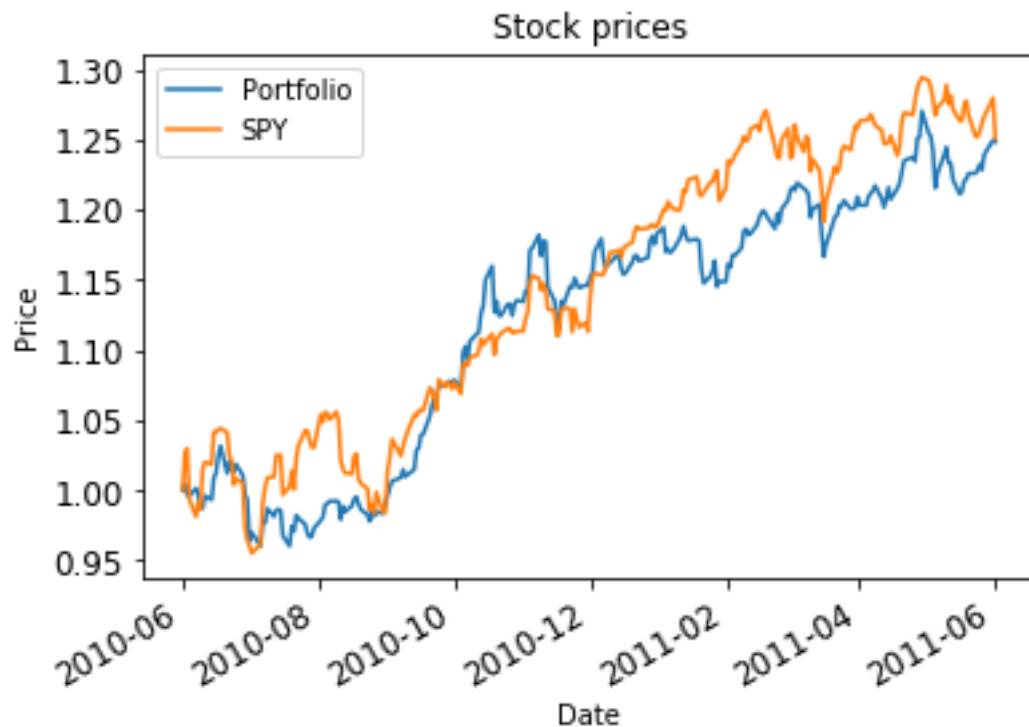
Volatility (stdev of daily returns): 0.006932532458168915

Average Daily Return: 0.000826416393743243

Cumulative Return: 0.22302855884452155

Apple Gld Goog

```
128 OptimizationTestCase(  
129     inputs=dict(  
130         start_date=str2dt('2010-06-01'),  
131         end_date=str2dt('2011-06-01'),  
132         symbols=['AAPL', 'GLD', 'GOOG']  
133     ),  
134     outputs=dict(  
135         allocs=[ 0.21737029, 0.66938007, 0.11324964],  
136         benchmark=0.00799161174614 # BPH: updated from reference solution, Sunday 3 Sep 2017  
137     ),  
138     description="Three symbols #1: AAPL, GLD, GOOG",
```



Start Date: 2010-06-01

End Date: 2011-06-01

Symbols: ['AAPL', 'GLD', 'GOOG']

Allocations: [0.21737034 0.66938008 0.11324958]

Sharpe Ratio: 1.815440096841097

Volatility (stdev of daily returns): 0.00799161179739867

Average Daily Return: 0.0009085445182779028

Cumulative Return: 0.24819364129477273