Homework 1: On REST APIs and Data Visualization

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1 Scenario of Interest

Assume that, in order to build a dataset of securities' data, we want to retrieve the data related to the quotations of a given list of securities (from publicly available web resources):

- AAPL (Apple)
- GE (General Electric)
- GM (General Motors)
- ..

It is possible to retrieve historical stock data thanks to the following API:

https://financialmodelingprep.com/api/v3/historical-price-full/AAPL?serietype=line&apikey=

In this particular case, the URL features the AAPL symbol, which corresponds to Apple. By changing the symbol in the URL, you can retrieve data for a different security. A list of symbols can be found here (leftmost column in the table – see Figure 1 for an except):

http://markets.cboe.com/us/equities/market_statistics/listed_symbols/

Another aspect of the URL is the apikey parameter: the key already in the URL (Section 2) should work. Otherwise, you can try the following ones:

- >>>>>>>>

If you query the API (i.e., by clicking the first link) you will get the usual response in JSON format (see Figure 2 for an except).

Cboe Listed Symbols

The following symbols are listed on Cboe. This list was last updated as of 2022-08-11 10:46:54.

| SYMBOL VOLUME MATCHED ROUTED BID SIZE BID PRICE ASK SIZE ASK PRICE LAST PRICE UVXY 1,609,096 1,606,333 2,763 15,207 \$9,07 6,324 \$9.08 \$9.08 ARKG 337,680 335,862 1,818 100 \$43.29 100 \$43.47 \$43.47 IEFA 318,852 310,374 8,478 1,000 \$62.95 6,600 \$62.96 \$62.93 VIXY 286,648 280,261 6,387 2,361 \$13.40 3,300 \$13.41 \$13.41 IIB 275,672 274,872 800 600 \$62.73 401 \$62.75 \$62.74 INDA 167,657 165,757 1,900 2,800 \$43.52 1,100 \$43.53 \$43.52 LYIX 150,978 148,418 2,560 200 \$8.99 414 \$9.00 \$9.00 BBEU 135,260 132,643 2,617 11,600 \$48.96 9,600 <t></t> | <u>↓</u> CSV | <u>↓</u> XML | | | | | | | |
|--|--------------|--------------|-----------|--------|----------|-----------|----------|-----------|------------|
| ARKG 337,680 335,862 1,818 100 \$43.29 100 \$43.47 \$43.47 IEFA 318,852 310,374 8,478 1,000 \$62.95 6,600 \$62.96 \$62.93 VIXY 286,648 280,261 6,387 2,361 \$13.40 3,300 \$13.41 \$13.41 ITB 275,672 274,872 800 600 \$62.73 401 \$62.75 \$62.74 INDA 167,657 165,757 1,900 2,800 \$43.52 1,100 \$43.53 \$43.52 UVIX 150,978 148,418 2,560 200 \$8.99 414 \$9.00 \$9.00 IBBEU 135,260 132,643 2,617 11,600 \$48.96 9,600 \$48.98 \$48.95 HEFA 133,686 114,442 19,244 2,175 \$32.89 300 \$32.90 \$32.89 USHY 130,382 128,428 1,954 1,800 \$37.14 3,400 \$37.15 \$37.14 GOVT 127,715 126,756 959 69,200 \$23.98 18.000 \$23.99 \$23.99 | SYMBOL | VOLUME | MATCHED | ROUTED | BID SIZE | BID PRICE | ASK SIZE | ASK PRICE | LAST PRICE |
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| UVIX 150,978 148,418 2,560 200 \$8.99 414 \$9.00 \$9.00 BBEU 135,260 132,643 2,617 11,600 \$48.96 9,600 \$48.98 \$48.95 HEFA 133,686 114,442 19,244 2,175 \$32.89 300 \$32.90 \$32.89 USHY 130,382 128,428 1,954 1,800 \$37.14 3,400 \$37.15 \$37.14 GOVT 127,715 126,756 959 69,200 \$23.98 18,000 \$23.99 \$23.99 | <u>ITB</u> | 275,672 | 274,872 | 800 | 600 | \$62.73 | 401 | \$62.75 | \$62.74 |
| BBEU 135,260 132,643 2,617 11,600 \$48.96 9,600 \$48.98 \$48.95 HEFA 133,686 114,442 19,244 2,175 \$32.89 300 \$32.90 \$32.89 USHY 130,382 128,428 1,954 1,800 \$37.14 3,400 \$37.15 \$37.14 GOVT 127,715 126,756 959 69,200 \$23.98 18,000 \$23.99 \$23.99 | INDA | 167,657 | 165,757 | 1,900 | 2,800 | \$43.52 | 1,100 | \$43.53 | \$43.52 |
| HEFA 133,686 114,442 19,244 2,175 \$32.89 300 \$32.90 \$32.89 USHY 130,382 128,428 1,954 1,800 \$37.14 3,400 \$37.15 \$37.14 GOVT 127,715 126,756 959 69,200 \$23.98 18,000 \$23.99 \$23.99 | UVIX | 150,978 | 148,418 | 2,560 | 200 | \$8.99 | 414 | \$9.00 | \$9.00 |
| USHY 130,382 128,428 1,954 1,800 \$37.14 3,400 \$37.15 \$37.14 GOVT 127,715 126,756 959 69,200 \$23,98 18,000 \$23.99 \$23.99 | BBEU | 135,260 | 132,643 | 2,617 | 11,600 | \$48.96 | 9,600 | \$48.98 | \$48.95 |
| GOVT 127,715 126,756 959 69,200 \$23,98 18,000 \$23.99 \$23.99 | HEFA | 133,686 | 114,442 | 19,244 | 2,175 | \$32.89 | 300 | \$32.90 | \$32.89 |
| | <u>USHY</u> | 130,382 | 128,428 | 1,954 | 1,800 | \$37.14 | 3,400 | \$37.15 | \$37.14 |
| VXX 89.898 79.614 10.284 51 \$21.14 100 \$21.17 \$21.16 | GOVT | 127,715 | 126,756 | 959 | 69,200 | \$23.98 | 18,000 | \$23.99 | \$23.99 |
| | <u>VXX</u> | 89,898 | 79,614 | 10,284 | 51 | \$21.14 | 100 | \$21.17 | \$21.16 |
| <u>IGV</u> 76,199 76,027 172 100 \$314.75 100 \$314.88 \$314.83 | IGV | 76,199 | 76,027 | 172 | 100 | \$314.75 | 100 | \$314.88 | \$314.83 |

Figure 1: Snippet of symbols table.

```
"symbol": "AAPL",
"historical": [ {
    "date": "2022-08-10",
    "close": 169.24
}, {
    "date": "2022-08-09",
    "close": 164.92
}, {
    "date": "2022-08-08",
    "close": 164.87
}, {
    "date": "2022-08-05",
    "close": 165.35
}, {
    "date": "2022-08-04",
    "close": 165.81
}, {
    "date": "2022-08-04",
    "close": 166.1300049
}, {
    "date": "2022-08-02",
    "close": 160.0099945
}, {
    "date": "2022-08-01",
    "close": 161.5099945
}, {
    "date": "2022-07-29",
    "close": 162.5099945
}, {
    "date": "2022-07-28",
    "close": 157.3500061
}, {
```

Figure 2: Snippet of JSON response for AAPL.

2 Goal #1: File Manipulation

Select three (or more) symbols amongst the ones in table (see second link and/or Figure 1) and write a program to store the results in different .json files (a file for each response).

Hint. You can use the following lines of code to create a file, given a response variable response and a symbol stored in the variable symbol.

```
file = open("./"+symbol+".json", "w+")
file.writelines(response.text)
file.close()
```

Next, your Python program must be able to merge the contents of several .json files and convert it into a .csv (comma separated value) file.

Hint. Use json.loads() to load each .json content in Python objects. Then, perform the necessary manipulations to create a unique (merged) object containing all the data.

An example of conversion from .json to .csv is shown in Figure 3.

```
symbol, date, close
                                             AAPL, 2022-08-10, 169.24
                                             AAPL,2022-08-09,164.92
                                             AAPL, 2022-08-08, 164.87
                                             AAPL,2022-08-05,165.35
                                             AAPL, 2022-08-04, 165.81
                                             AAPL, 2022-08-03, 166. 1300049
                                             AAPL, 2022-08-02, 160.0099945
'close': 164.92},
'close': 164.87},
'close': 165.35},
'close': 165.81},
                                             AAPL, 2022-08-01, 161.5099945
                                             AAPL, 2022-07-29, 162.5099945
                                             AAPL, 2022-07-28, 157. 3500061
'close':
'close':
                                             AAPL, 2022-07-27, 156. 7899933
'close':
                                             AAPL, 2022-07-26, 151.6000061
                                             AAPL, 2022-07-25, 152.9499969
                                             AAPL, 2022-07-22, 154.0899963
                                             AAPL, 2022-07-21, 155.3500061
                                             AAPL, 2022-07-20, 153.0399933
        153.0399933}
                                             AAPL,2022-07-19,151.0
                                             AAPL,2022-07-18,147.0700073
       150.1699982}
148.4700012}
145.4900055}
                                             AAPL,2022-07-15,150.1699982
```

Figure 3: Example of conversion from .json to .csv.

(a) .json snippet for AAPL

Figure 3 shows an example of conversion for AAPL to show the desired output. However, the .csv file must contain the data related to all of the three securities

(b) .csv snippet for AAPL

(stacked together) – see Figure 4.

```
GE,1962-01-04,5.859375
                                                                                      GE.1962-01-03.5.9294872
AAPL.2022-08-10.169.24
                                           AAPL,1980-12-22,0.132254
AAPL,2022-08-09,164.92
                                                                                      GE,1962-01-02,5.989583
                                           AAPL,1980-12-19,0.126116
AAPL,2022-08-08,164.87
                                                                                      GM.2022-08-10.37.95
AAPL.2022-08-05.165.35
                                           AAPL,1980-12-18,0.118862
                                                                                      GM.2022-08-09.36.62
                                           AAPL.1980-12-17.0.115513
AAPL,2022-08-04,165.81
                                                                                      GM.2022-08-08.37.56
                                           AAPL,1980-12-16,0.112723
AAPL,2022-08-03,166.1300049
AAPL,2022-08-02,160.0099945
                                                                                      GM.2022-08-05.36.06
                                           AAPL,1980-12-15,0.121652
AAPL,2022-08-01,161.5099945
                                           AAPL,1980-12-12,0.128348
                                                                                      GM.2022-08-04.36.23
                                                                                      GM,2022-08-03,37.31
AAPL,2022-07-29,162.5099945
                                           GE,2022-08-10,77.14
AAPL,2022-07-28,157.3500061
                                           GE,2022-08-09,74.93
                                                                                      GM,2022-08-02,36.13
AAPL,2022-07-27,156.7899933
                                           GE,2022-08-08,75.18
                                                                                      GM.2022-08-01.36.77
AAPL, 2022-07-26, 151.6000061
                                           GE,2022-08-05,74.36
                                                                                      GM, 2022-07-29, 36.26
AAPL,2022-07-25,152.9499969
                                           GE,2022-08-04,73.67
                                                                                      GM,2022-07-28,35.74
AAPL,2022-07-22,154.0899963
                                           GE.2022-08-03.74.74
                                                                                      GM,2022-07-27,34.68
AAPL, 2022-07-21, 155.3500061
                                           GE,2022-08-02,74.36
                                                                                      GM,2022-07-26,33.34
AAPL,2022-07-20,153.0399933
                                           GE,2022-08-01,75.8
AAPL,2022-07-19,151.0
                                                                                      GM,2022-07-25,34.52
                                           GE,2022-07-29,73.91
AAPL, 2022-07-18, 147. 0700073
                                                                                      GM,2022-07-22,34.67
                                           GE,2022-07-28,73.14
AAPL,2022-07-15,150,1699982
                                                                                      GM,2022-07-21,35.13
                                           GE, 2022-07-27, 71.58
                                                                                      GM,2022-07-20,34.76
```

(a) Beginning of file with AAPL

(b) After AAPL, I add GE

(c) After GE, I add GM

Figure 4: Final .csv file example.

Hint. If you properly manipulate the data and then you load the data in a Pandas DataFrame, you can use the to_csv() function to create a .csv file.

3 Goal #2: Time series plotting

As you can see from the .csv file, you have the evolution of the close over time (i.e., date) for each symbol. The next step is to plot the time series for each symbol.

To do so, you can import the .csv file back and consider each symbol separately. Then, make sure to sort the close values so that most recent ones appear first. Finally, use the Matplotlib library to plot the close evolution over time. An example for AAPL is given in Figure [5].

Hint. If you are familiar with Pandas DataFrames, you can import your .csv file thanks to the read_csv() function and then the sort_values() method to sort the DataFrame according to one of its columns.

Extra bit. As you can see, the plot in Figure 5 looks nice thanks to the titles on the x and y axes, the "AAPL" plot title and the grid. You can add those thanks to the plt.title(), plt.xlabel(), plt.ylabel() and plt.grid() functions. Go and read the docs to see how do they work:

- https://matplotlib.org/stable/api/_as_gen/matplotlib.pyplot.title.html
- https://matplotlib.org/stable/api/_as_gen/matplotlib.pyplot.xlabel.html

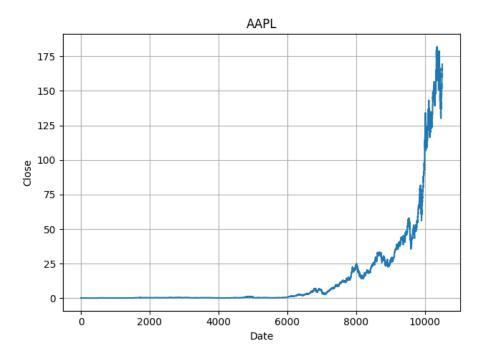


Figure 5: AAPL time series.

- https://matplotlib.org/stable/api/_as_gen/matplotlib.pyplot.ylabel.html
- https://matplotlib.org/stable/api/_as_gen/matplotlib.pyplot.grid.html

And yet, there is a very inelegant feature in the plot: the labels on the x axis. We plotted the close values as a function of the date, but there are no dates on the x axis! You can change the labels on the x axis by modifying the so-called x-ticks. Go and read the docs to see how do they work:

• https://matplotlib.org/stable/api/_as_gen/matplotlib.pyplot.xticks.html

A nicer example is given in Figure 6.

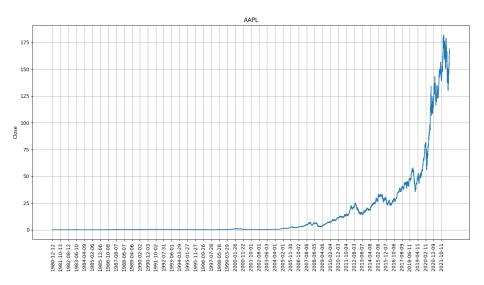


Figure 6: AAPL time series.