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# Stock Market Data: Obtaining Data, Visualization & Analysis in Python

[Automated Trading](#)

Aug 30, 2024

13 min

Lead

By [Chainika Thakar](#) (Originally written by [Ishan Shah](#))

Success in the trading journey requires the trader to know the [key concepts before starting trading](#) and one of them is mastering the stock market data analysis. For conducting the data analysis, the trader first needs



to fetch the data and visualise it for the “identification of historical price trends and patterns”.

You must be wondering “**What is the benefit of this identification**”?

The answer is that forecasting future price movements becomes possible with this analysis of historical movements in price. For instance, an analysis of the historical performance of S&P 500 stock tickers can be done to predict future movements of the same. If you are looking to fetch the stock market data and analyse the historical data in Python, you have come to the right place.

After reading this blog, you will be able to:

- Get historical data for stocks
- Plot the data and analyse the performance
- Get the fundamental, futures and options data

For easy navigation through the blog, we have mentioned below what this blog covers, and that is:

- [Importance and techniques of data analysis in stock trading](#)
- [Steps for obtaining stock market data in Python](#)
- [How to fetch stock market data in Python?](#)



- [How to get stock market data for different geographies?](#)
- [Real-life example of stock market data fetching and analysis in Python](#)
  - [Intraday or minute frequency stock data](#)
  - [Resample stock data](#)
  - [Fundamental data](#)
  - [Stock market data analysis](#)
- [Data visualisation techniques](#)

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## Importance and techniques of data analysis in stock trading

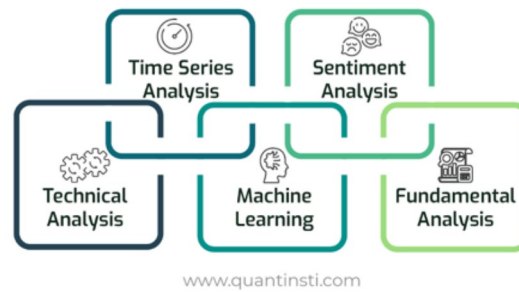
Data analysis is fundamental to stock trading as it transforms previous market data into actionable insights for the future.

Through rigorous analysis, traders can identify historical patterns, forecast future price movements, and make informed decisions. It helps in understanding market trends, volatility, and potential risks, thereby enhancing the ability to devise robust trading strategies.

Here are some key techniques:



## Importance and techniques of data analysis in stock trading



- **Technical Analysis:** Uses historical price and volume data to identify patterns and trends, helping to forecast future price movements.
- **Time Series Analysis:** Analyses stock price data over time to identify trends, cycles, and seasonal effects, providing insights into future performance.
- **Machine Learning:** Employs algorithms to model and predict stock prices based on historical data, improving the accuracy of predictions.
- **Sentiment Analysis:** Gauges market sentiment by analysing news articles, social media, and other sources, offering insights into market psychology.
- **Fundamental Analysis:** Examines a company's financial statements, health, and industry position to determine its intrinsic value and potential for future growth.

Effective data analysis reduces emotional bias and enhances precision, leading to improved trading performance and gainful returns. In an era driven by



vast amounts of data, leveraging analytical tools is indispensable for gaining a competitive edge in stock trading.

Let us now see the steps for obtaining the stock market data.

## Steps for obtaining stock market data in Python

### Steps for Obtaining Stock Market Data in Python



**Step 1: Set Up Python Environment:** Ensure Python is installed on your system. Create a virtual environment using Anaconda or virtualenv to isolate project dependencies and maintain a clean workspace.

**Step 2: Install Required Libraries:** Use pip or conda



to install essential libraries such as Pandas, NumPy, and yfinance. These libraries will help in data manipulation, numerical operations, and fetching stock market data.

**Step 3: Fetch Stock Market Data:** Utilise the yfinance library to download historical market data. This can be done using the `yf.download()` function, specifying the stock ticker, start and end dates, and data interval.

Now, we will discuss how to fetch the stock market data in Python by installing and importing the libraries.

---

## How to fetch stock market data in Python?

### Yahoo Finance

One of the first sources from which you can get historical daily price-volume stock market data is Yahoo finance. You can use `pandas_datareader` or `yfinance` module to get the data and then can download or store it in a CSV file by using `pandas.to_csv` method. Additionally, you can explore [Yahoo Finance futures](#) data to analyze market trends



and incorporate it into your trading strategies.

If yfinance is not installed on your computer, then run the below line of code from your Jupyter Notebook to install yfinance.

!pip install yfinance

Output:

```
Collecting yfinance==0.1.63
  Downloading yfinance-0.1.63.tar.gz (26 kB)
  Requirement already satisfied: pandas>=0.24 in c:\users\academy\miniconda3\lib\site-packages (from yfinance==0.1.63) (1.2.4)
  Requirement already satisfied: numpy>=1.15 in c:\users\academy\miniconda3\lib\site-packages (from yfinance==0.1.63) (1.20.3)
  Requirement already satisfied: requests>=2.20 in c:\users\academy\miniconda3\lib\site-packages (from yfinance==0.1.63) (2.25.0)
  Requirement already satisfied: multitasking>=0.0.7 in c:\users\academy\miniconda3\lib\site-packages (from yfinance==0.1.63) (0.0.9)
  Requirement already satisfied: lxml>=4.5.1 in c:\users\academy\miniconda3\lib\site-packages (from yfinance==0.1.63) (4.6.3)
  Requirement already satisfied: python-dateutil>=2.7.3 in c:\users\academy\miniconda3\lib\site-packages (from yfinance==0.1.63) (2.8.1)
  Requirement already satisfied: pytz>=2017.3 in c:\users\academy\miniconda3\lib\site-packages (from pandas>=0.24->yfinance==0.1.63) (2021.1)
  Requirement already satisfied: six>=1.5 in c:\users\academy\miniconda3\lib\site-packages (from python-dateutil>=2.7.3->pandas>=0.24->yfinance==0.1.63) (1.15.0)
  Requirement already satisfied: chardet<4,>=3.0.2 in c:\users\academy\miniconda3\lib\site-packages (from requests>=2.20->yfinance==0.1.63) (3.0.4)
  Requirement already satisfied: certifi>=2017.4.17 in c:\users\academy\miniconda3\lib\site-packages (from requests>=2.20->yfinance==0.1.63) (2021.5.30)
  Requirement already satisfied: idna<3,>=2.5 in c:\users\academy\miniconda3\lib\site-packages (from requests>=2.20->yfinance==0.1.63) (2.10)
  Requirement already satisfied: urllib3<1.27,>=1.21.1 in c:\users\academy\miniconda3\lib\site-packages (from requests>=2.20->yfinance==0.1.63) (1.25.11)
  Building wheels for collected packages: yfinance
    Building wheel for yfinance (setup.py): started
    Building wheel for yfinance (setup.py): finished with status 'done'
    Created wheel for yfinance: filename=yfinance-0.1.63-py3-none-any.whl size=23908 sha256=091b3fb3632e1d5221ca8707446548c8fbb9cfd0b03dbc9014ec2379234ef8d77
    Stored in directory: c:\users\academy\appdata\local\pip\cache\wheels\44\19\52\4db92c8786b13e717b9664529da13bf8d7b74aff580ca64fc0
  Successfully built yfinance
  Installing collected packages: yfinance
    Attempting uninstall: yfinance
      Found existing installation: yfinance 0.1.59
      Uninstalling yfinance-0.1.59:
        Successfully uninstalled yfinance-0.1.59
    Successfully installed yfinance-0.1.63
```

1	# Import yfinance package
2	import yfinance as yf
3	
4	# Set the start and end date
5	start_date = '1990-01-01'
6	end_date = '2024-08-1'
7	
8	# Set the ticker
9	ticker = 'AMZN'
10	
11	# Get the data
12	data = yf.download(ticker, start_date, end_date)
13	
14	# Print 5 rows

15 data.tail()

AMZN\_data.py hosted with ❤ by GitHub

[view raw](#)

### Output:

```
[*****100%*****]
```

	Open	High	Lo
Date			
2024-07-25	182.910004	183.899994	176.80
2024-07-26	180.389999	183.190002	180.24
2024-07-29	183.839996	184.750000	182.38
2024-07-30	184.720001	185.860001	179.38
2024-07-31	185.050003	187.940002	184.46

To visualise the adjusted close price data, you can use the matplotlib library and plot method as shown below.

```
1 # Import matplotlib for plotting
2 import matplotlib.pyplot as plt
3 %matplotlib inline
4
5 # Plot adjusted close price data
6 data['Adj Close'].plot()
7 plt.xlabel('Year')
8 plt.ylabel('Adjusted close price')
9 plt.title('Adjusted close price data')
10 plt.show()
```

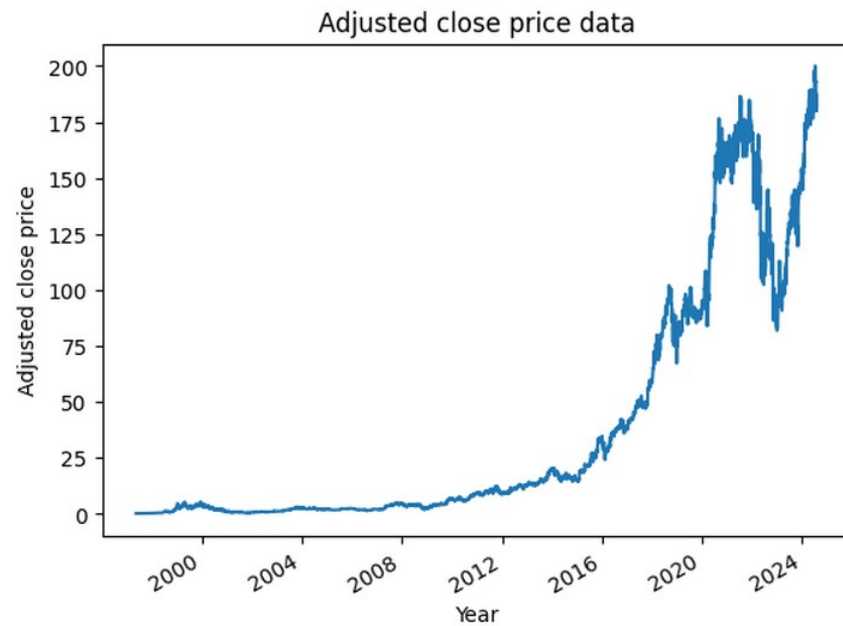




Visualise.py hosted with ❤ by GitHub

[view raw](#)

## Output:



*Data Source: Yahoo Finance*

Let us improve the plot by resizing, giving appropriate labels and adding grid lines for better readability.

```
1 # Plot the adjusted close price
2 data['Adj Close'].plot(figsize=(10, 7))
3
4
5 # Define the label for the title of the figure
6 plt.title("Adjusted Close Price of %s" % ticker, fontsi:
7
8
9 # Define the labels for the x-axis and y-axis
10 plt.ylabel('Price', fontsize=14)
11 plt.xlabel('Year', fontsize=14)
12
13
```

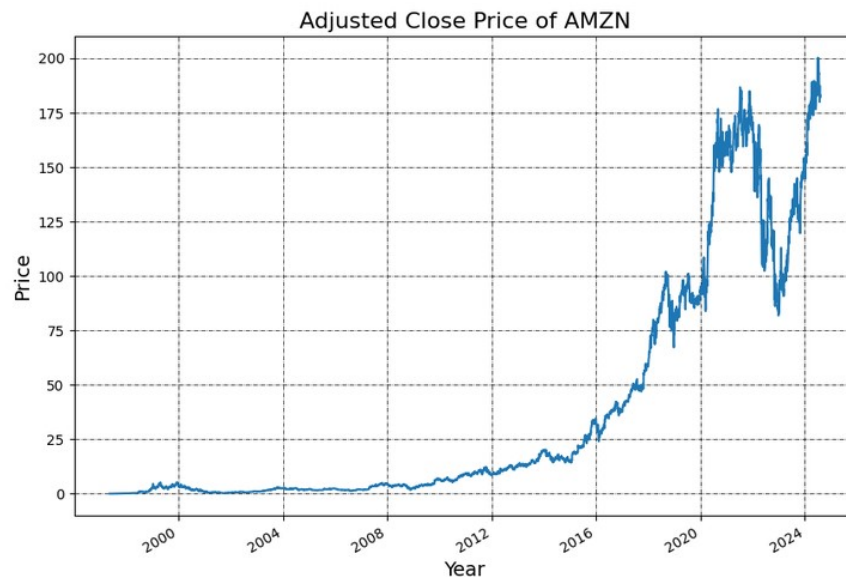


```
14 # Plot the grid lines
15 plt.grid(which="major", color='k', linestyle='-.', linev
16
17
18 # Show the plot
19 plt.show()
```

Adj\_close\_AMZN.py hosted with ❤ by GitHub

[view raw](#)

## Output:



*Data Source: Yahoo Finance*

## Advantages of Yahoo Finance

1. Adjusted close price stock market data is available
2. Most recent stock market data is available
3. Doesn't require an API key to fetch the stock market data

Below is an interesting video by Nitesh Khandelwal (Co-Founder and CEO, of QuantInsti) that answers all



your questions related to getting Data for Algo  
Trading.



Now we will discuss how we can get the stock market  
data for various geographies.

---

## How to get stock market data for different geographies?

To [get stock market data](#) for different geographies,



search the ticker symbol on Yahoo finance and use that as the ticker.

To get the stock market data of multiple stock tickers, you can create a list of tickers and call the yfinance download method for each stock ticker.

For simplicity, I have created a dataframe data to store the adjusted close price of the stocks.

```
1 # Import packages
2 import yfinance as yf
3 import pandas as pd
4
5 # Set the start and end date
6 start_date = '1990-01-01'
7 end_date = '2024-08-1'
8
9 # Define the ticker list
10 tickers_list = ['AAPL', 'IBM', 'MSFT', 'WMT']
11
12 # Create placeholder for data
13 data = pd.DataFrame(columns=tickers_list)
14
15 # Fetch the data
16 for ticker in tickers_list:
17     data[ticker] = yf.download(ticker,
18                               start_date,
19                               end_date)['Adj Close']
20
21 # Print first 5 rows of the data
22 data.tail()
```

Stock\_data\_geographies.py hosted with ❤ by GitHub

[view raw](#)

**Output:**



```
[*****100%*****]
[*****100%*****]
[*****100%*****]
[*****100%*****]
```

	AAPL	IBM	MS
Date			
2024-07-25	217.490005	191.979996	418.39
2024-07-26	217.960007	191.750000	425.26
2024-07-29	218.240005	191.500000	426.73
2024-07-30	218.800003	191.039993	422.92
2024-07-31	222.080002	192.139999	418.35

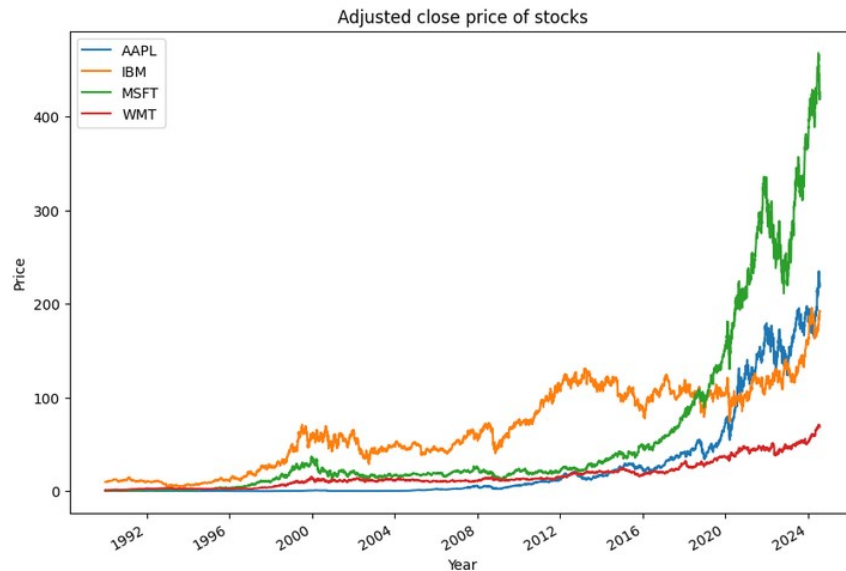
```
1 import matplotlib.pyplot as plt
2
3 data.plot(figsize=(10, 7))
4
5 # Add labels and title
6 plt.xlabel('Year')
7 plt.ylabel('Price')
8 plt.title('Adjusted close price of stocks')
9
10 # Show the plot
11 plt.show()
```

Adj\_close\_price.py hosted with ❤ by GitHub

[view raw](#)

Output:





*Data Source: Yahoo Finance*

Let us now check the real life example of stock market data fetching as well as the analysis.

## Real-life example of stock market data fetching and analysis in Python

If you want to analyse the stock market data for all the stocks which make up S&P 500 then the below code will help you. It gets the list of stocks from the Wikipedia page and then fetches the stock market data from yahoo finance.

```
1 # Import packages
2 import yfinance as yf
```



```

3 import pandas as pd
4
5 # Read and print the stock tickers that make up S&P500
6 tickers = pd.read_html(
7     'https://en.wikipedia.org/wiki/List_of_S%26P_500_com
8     print(tickers.head())

```

S&P500.py hosted with ❤ by GitHub

[view raw](#)

## Output:

	Symbol	Security	GICS Sector
0	MMM	3M	Industrials
1	AOS	A. O. Smith	Industrials
2	ABT	Abbott	Health Care
3	ABBV	AbbVie	Health Care
4	ACN	Accenture	Information Technology

	Headquarters Location	Date added	C
0	Saint Paul, Minnesota	1957-03-04	667
1	Milwaukee, Wisconsin	2017-07-26	911
2	North Chicago, Illinois	1957-03-04	18
3	North Chicago, Illinois	2012-12-31	15511
4	Dublin, Ireland	2011-07-06	14673

```

1 # Get the data for these tickers from yahoo finance
2 data = yf.download(tickers.Symbol.to_list(), '2021-1-1', ':
3 print(data.head())

```

Data\_yfinance.py hosted with ❤ by GitHub

[view raw](#)

## Output:

Ticker	A	AAL	AAPL
Date			



2021-01-04	115.980736	15.13	126.830078	90
2021-01-05	116.928986	15.43	128.398163	91
2021-01-06	120.135468	15.52	124.076103	90
2021-01-07	123.332176	15.38	128.309967	91
2021-01-08	124.212006	15.13	129.417419	92

Ticker	ACGL	ACN	ADBE
Date			
2021-01-04	34.900002	243.104004	485.339996
2021-01-05	35.040001	244.488007	485.690002
2021-01-06	36.580002	247.161118	466.309998
2021-01-07	36.240002	249.493027	477.739990
2021-01-08	36.439999	250.403015	485.100006

## Intraday or minute frequency stock data

The below code fetches the stock market data for MSFT for the past 5 days of 1-minute frequency.

```

1 import yfinance as yf
2 intraday_data = yf.download(tickers="MSFT",
3                             period="5d",
4                             interval="1m",
5                             auto_adjust=True)
6 intraday_data.head()
```

Intraday\_data.py hosted with ❤ by GitHub

[view raw](#)

### Output:

```
[*****100%*****]
```





	Open	High	
Datetime			
2024-08-02 09:30:00-04:00	412.744995	413.940002	41
2024-08-02 09:31:00-04:00	413.000000	413.399994	41
2024-08-02 09:32:00-04:00	413.500000	414.714996	41
2024-08-02 09:33:00-04:00	414.600006	415.000000	41
2024-08-02 09:34:00-04:00	412.899994	413.149994	41

## Resample stock data

### Convert 1-minute data to 1-hour data or resample stock data

During strategy modelling, you might be required to work with a custom frequency of stock market data such as 15 minutes or 1 hour or even 1 month.

If you have minute level data, then you can easily construct the 15 minutes, 1 hour or daily candles by resampling them. Thus, you don't have to buy them



separately.

In this case, you can use the pandas [resample](#) method to convert the stock market data to the frequency of your choice. The implementation of these is shown below where a 1-minute frequency data is converted to 10-minute frequency data.

The first step is to define the dictionary with the conversion logic. For example, to get the open value the first value will be used, to get the high value the maximum value will be used and so on.

The name Open, High, Low, Close and Volume should match the column names in your dataframe.

```
1 ohlcv_dict = {  
2   'Open': 'first',  
3   'High': 'max',  
4   'Low': 'min',  
5   'Close': 'last',  
6   'Volume': 'sum'  
7 }
```

Define\_dictionary.py hosted with ❤ by GitHub

[view raw](#)

Convert the index to datetime timestamp as by default string is returned. Then call the resample method with the frequency such as:

- 10T for 10 minutes,
- D for 1 day and



- M for 1 month

```

1  # Import package & get the data
2  import yfinance as yf
3  intraday_data = yf.download(tickers="MSFT",
4                               period="5d",
5                               interval="1m",
6                               auto_adjust=True)
7
8  # Define the resampling logic
9  ohlcv_dict = {
10     'Open': 'first',
11     'High': 'max',
12     'Low': 'min',
13     'Close': 'last',
14     'Volume': 'sum'
15 }
16
17 # Resample the data
18 intraday_data_10 = intraday_data.resample('10T').agg(ohlcv_dict)
19 intraday_data_10.head()
```

Resample\_data.py hosted with ❤ by GitHub

[view raw](#)

## Output:

```
[*****100%*****]
```

	Open	High	
Datetime			
2024-08-02 09:30:00-04:00	412.744995	415.000000	41
2024-08-02	411.589996	413.434998	40

	Open	High	
Datetime			
09:40:00-04:00			
2024-08-02 09:50:00-04:00	408.000000	408.695007	40
2024-08-02 10:00:00-04:00	407.570007	408.000000	40
2024-08-02 10:10:00-04:00	405.859985	406.970001	40

### Suggested read:

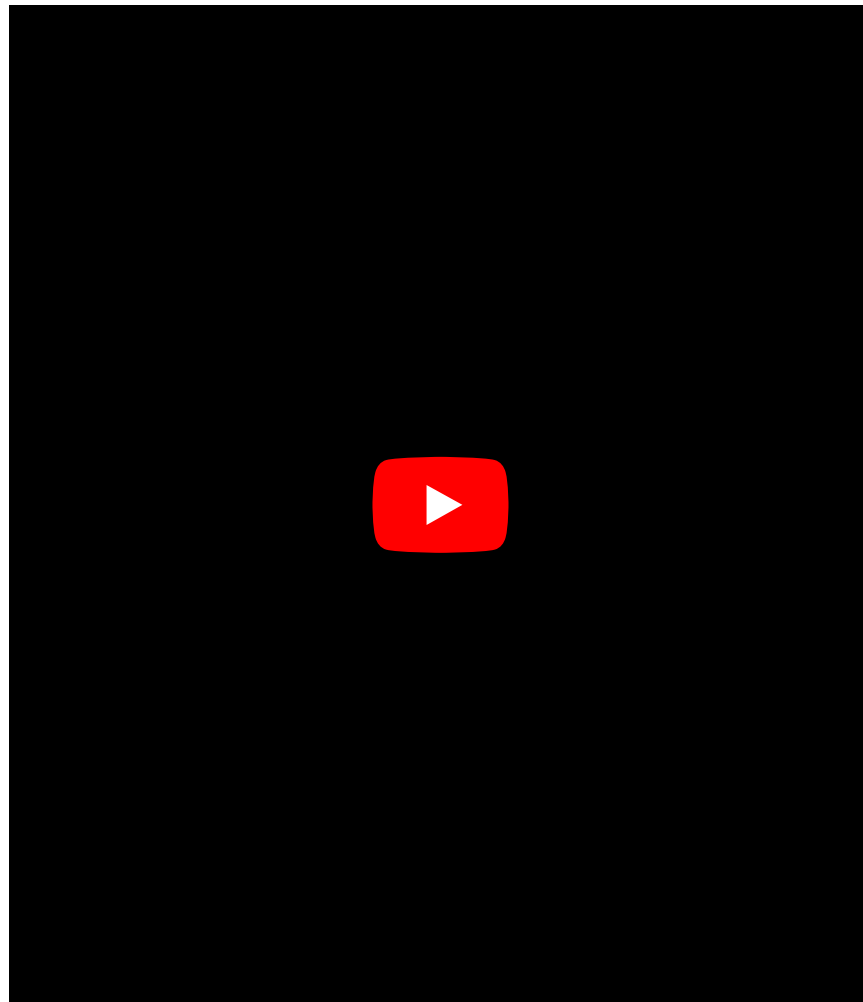
- [How to Get Historical Market Data Through Python API](#)

## Fundamental data

We have used yfinance to get the fundamental data.

Below is a video that covers fundamental data analysis in detail.





The first step is to set the ticker and then call the appropriate properties to get the right stock market data.

If yfinance is not installed on your computer, then run the below line of code from your Jupyter Notebook to install yfinance.

```
1 !pip install yfinance
2 # Import yfinance
3 import yfinance as yf
4
5 # Set the ticker as MSFT
6 msft = yf.Ticker("MSFT")
```



MSFT\_ticker.py hosted with ❤ by GitHub

[view raw](#)

## Key Ratios

You can fetch the latest price to book ratio and price to earnings ratio as shown below.

```

1 # fetch the latest price to book ratio and price to earn:
2
3 # Get the latest price to book ratio
4 pb_ratio = msft.info['priceToBook']
5 print('Price to Book Ratio is: ', pb_ratio)
6 # Get the latest price to earnings ratio
7 pe_ratio = msft.info['trailingPE']
8 print('Price to Earnings Ratio is: ', pe_ratio)

```

Ratios.py hosted with ❤ by GitHub

[view raw](#)

### Output:

```

Price to Book Ratio is:  11.540634
Price to Earnings Ratio is:  35.321186

```

## Revenues

```

1 import matplotlib.pyplot as plt
2 import yfinance as yf
3
4 # Set the ticker as MSFT
5 msft = yf.Ticker("MSFT")
6
7 # Get the financials data and sort the columns (dates) :
8 financials = msft.financials.sort_index(axis=1)
9
10 # Select the 'Total Revenue' row

```

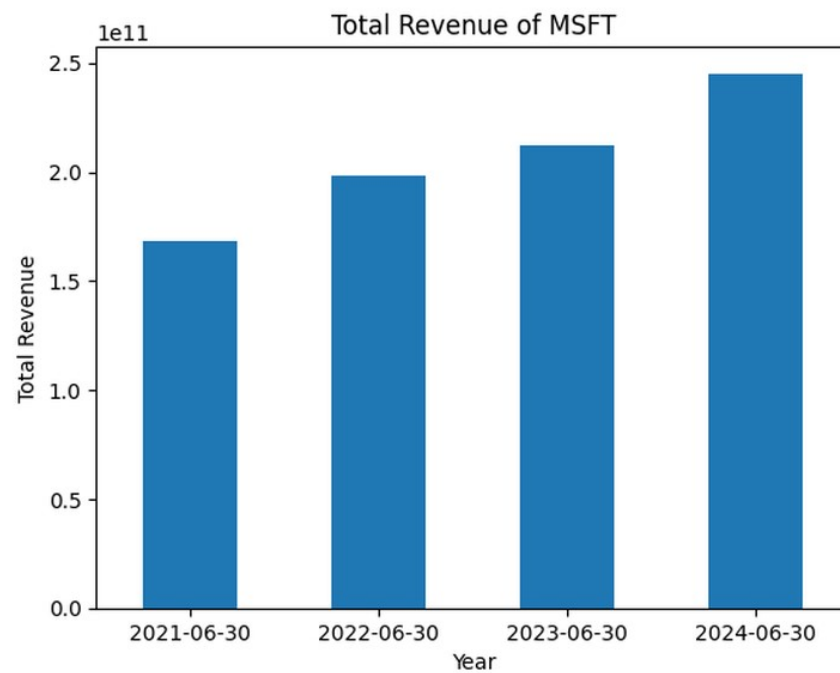


```
11 total_revenue = financials.loc['Total Revenue']
12
13 # Plot the total revenue as a bar chart
14 total_revenue.plot.bar()
15
16 # Format the x-axis to show dates without time
17 plt.xticks(range(len(total_revenue.index)), total_revenue.index)
18 plt.xlabel('Year')
19 plt.ylabel('Total Revenue')
20 plt.title('Total Revenue of MSFT')
21
22 # Show the plot
23 plt.show()
```

Total\_revenue\_MSFT.py hosted with ❤ by GitHub

[view raw](#)

### Output:



*Data Source: Yahoo Finance*

## Earnings Before Interest and Taxes



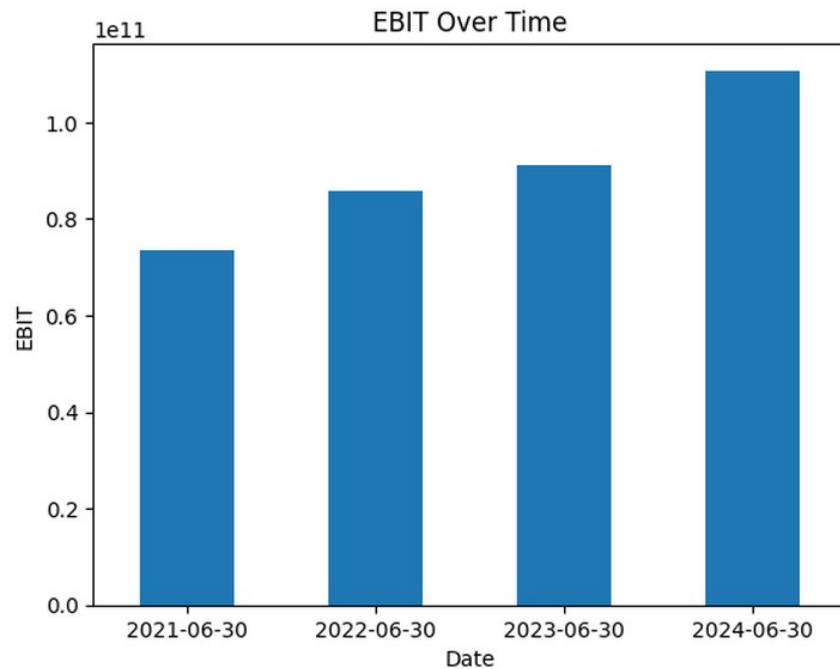
## (EBIT)

```
1 # Assuming EBIT is a pandas Series with a DateTimeIndex
2 EBIT_sorted = EBIT.sort_values(ascending=True)
3
4 # Plotting the sorted EBIT
5 EBIT_sorted.plot.bar()
6 plt.xticks(range(len(EBIT_sorted.index)), EBIT_sorted.i
7 plt.xlabel('Date')
8 plt.ylabel('EBIT')
9 plt.title('EBIT Over Time')
10 plt.show()
```

EBIT.py hosted with ❤ by GitHub

[view raw](#)

### Output:



*Data Source: Yahoo Finance*

## Balance sheet, cash flows and other information





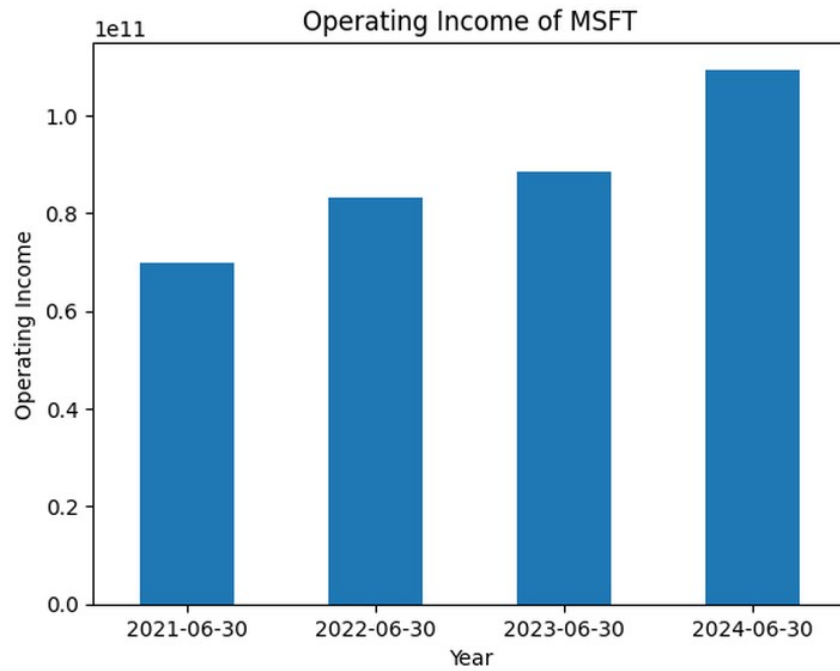
```

1 # Checking Operating income or EBIT (Earnings before in
2 import yfinance as yf
3
4 # Set the ticker as MSFT
5 msft = yf.Ticker("MSFT")
6
7 # Get the financials data
8 financials = msft.financials
9
10 # Display the available rows in the financials DataFrame
11 print(financials.index)
12 import matplotlib.pyplot as plt
13 import yfinance as yf
14
15 # Set the ticker as MSFT
16 msft = yf.Ticker("MSFT")
17
18 # Get the financials data and sort the columns (dates) :
19 financials = msft.financials.sort_index(axis=1)
20
21 # Check if 'Operating Income' is available
22 if 'Operating Income' in financials.index:
23     # Select the 'Operating Income' row
24     operating_income = financials.loc['Operating Income']
25
26     # Plot Operating Income as a bar chart (acting as a
27     operating_income.plot.bar()
28
29     # Format the x-axis to show dates without time
30     plt.xticks(range(len(operating_income.index)), operi
31     plt.xlabel('Year')
32     plt.ylabel('Operating Income')
33     plt.title('Operating Income of MSFT')
34     # Show the plot
35     plt.show()
36 else:
37     print("Operating Income data is not available.")

```

Operating\_income\_MSFT.py hosted with ❤ by GitHub

[view raw](#)**Output:**



## Stock market data analysis

After you have the stock market data, the next step is to create trading strategies and analyse the performance. The ease of analysing the performance is the key advantage of Python.

We will analyse the cumulative returns and different ratios such as

- [Sharpe ratio](#),
- Sortino ratio, and
- Calmar ratio.

I have created a simple buy-and-hold strategy for illustration purposes with four stocks namely:



- Apple
- Amazon
- Microsoft
- Walmart

Install pyfolio if not already installed, as shown in the first line of the code, following which we will analyse the performance using the pyfolio tear sheet.

```

1  # If you already have a version of pyfolio on your syst
2  !pip install pyfolio-reloaded==0.9.5
3  # Define the ticker list
4  tickers_list = ['AAPL', 'AMZN', 'MSFT', 'WMT']
5
6  # Import pandas and create a placeholder for the data
7  import pandas as pd
8  data = pd.DataFrame(columns=tickers_list)
9
10 # Fetch the data
11 import yfinance as yf
12 for ticker in tickers_list:
13     data[ticker] = yf.download(ticker, period='5y')['/
14
15 # Compute the returns of individual stocks and then com
16 # The mean return is the daily portfolio returns with tl
17 data = data.pct_change().dropna().mean(axis=1)
18
19 # Import Pyfolio
20 import pyfolio as pf
21
22 # Get the full tear sheet
23 pf.create_simple_tear_sheet(data)

```

Tear\_sheet.py hosted with ❤ by GitHub

[view raw](#)

**Output:**



<b>Start date</b>	2019-08-09
<b>End date</b>	2024-08-07
<b>Total months</b>	59
<b>Backtest</b>	
<b>Annual return</b>	23.101%
<b>Cumulative returns</b>	181.993%
<b>Annual volatility</b>	24.33%
<b>Sharpe ratio</b>	0.98
<b>Calmar ratio</b>	0.79
<b>Stability</b>	0.74
<b>Max drawdown</b>	-29.312%
<b>Omega ratio</b>	1.19
<b>Sortino ratio</b>	1.42
<b>Skew</b>	-0.07
<b>Kurtosis</b>	6.07
<b>Tail ratio</b>	0.96
<b>Daily value at risk</b>	-2.971%



Above in the output you can see the tear sheet which includes all the analysed backtested figures for a total of 59 months.

It is important to note that [backtesting](#) results do not guarantee future performance. The presented strategy results are intended solely for educational purposes and should not be interpreted as investment advice. A comprehensive evaluation of the strategy across multiple parameters is necessary to assess its effectiveness.

Now we will see the various techniques used for data visualisation for you to be able to use any one.

---

## Data visualisation techniques

Data visualisation techniques help interpret and communicate insights from stock market data. Here are some common techniques and their uses:

**1. Line Charts:** Line charts plot stock prices over time, showing trends and patterns. They are ideal for visualising price movements and historical performance.



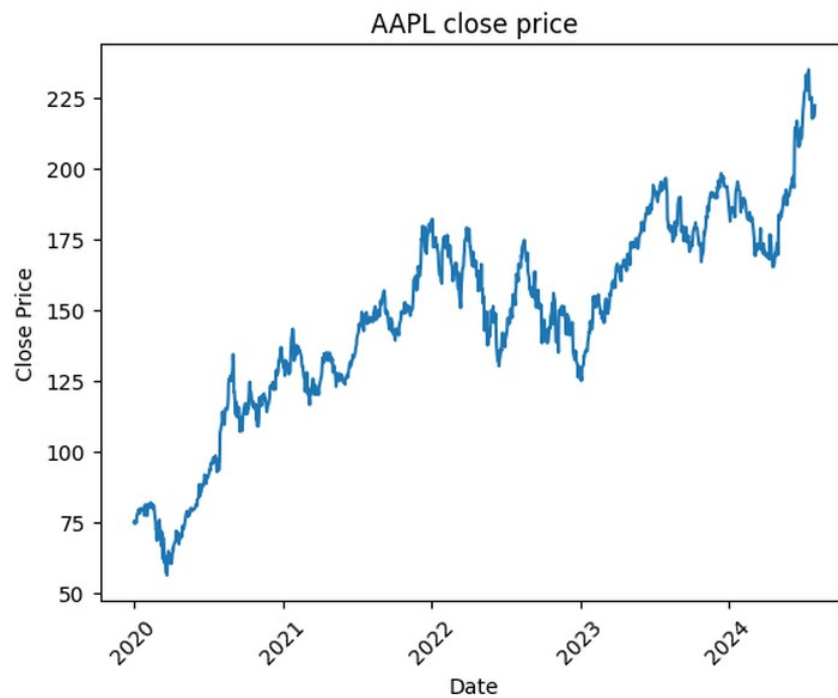
## Code Example:

```
1 import yfinance as yf
2 import matplotlib.pyplot as plt
3
4 # Download historical stock data for Apple (AAPL)
5 stock_data = yf.download('AAPL', start='2020-01-01', end='2024-01-01')
6
7 # Plotting the closing price over time
8 plt.plot(stock_data.index, stock_data['Close'])
9 plt.title('AAPL close price')
10 plt.xlabel('Date')
11 plt.ylabel('Close Price')
12 # Rotate x-axis labels
13 plt.xticks(rotation=45)
14 plt.show()
```

AAPL\_close\_price.py hosted with ❤ by GitHub

[view raw](#)

## Output:



The above plot shows the line chart displaying close

price of AAPL over a period of time.

**2. Candlestick Charts:** Candlestick charts display the open, high, low, and close prices for a given period, revealing market sentiment and trends. They are commonly used for technical analysis.

### Code Example:

```
1 import yfinance as yf
2 import plotly.graph_objects as go
3
4 # Download historical stock data for Apple (AAPL)
5 stock_data = yf.download('AAPL', start='2020-01-01', end='2020-03-31')
6
7 # Plotting the candlestick chart with Plotly
8 fig = go.Figure(data=[go.Candlestick(x=stock_data.index,
9                                     open=stock_data['Open'],
10                                    high=stock_data['High'],
11                                    low=stock_data['Low'],
12                                    close=stock_data['Close'])])
13 fig.update_layout(title='AAPL Candlestick Chart', xaxis=stock_data.index)
14
15 # Display the figure
16 fig.show()
```

AAPL\_candlestick\_chart.py hosted with ❤ by GitHub

[view raw](#)

### Output:

AAPL Candlestick Chart



Above plot shows a candlestick chart using Plotly for the specified date range and a line chart below the for the closing prices.

**3. Bar Charts:** Bar charts compare different stock metrics such as trading volume or price changes. They are useful for visualising discrete data points.

### Code Example:

```
1 import yfinance as yf
2 import matplotlib.pyplot as plt
3
4 # Download historical stock data for Apple (AAPL)
5 stock_data = yf.download('AAPL', start='2024-07-01', end='2024-07-01')
6
7 # Plotting the trading volume over time with a bar chart
8 plt.bar(stock_data.index, stock_data['Volume'])
9 plt.title('AAPL Trading Volume Over Time')
10 plt.xlabel('Date')
11 plt.ylabel('Volume')
12 plt.xticks(rotation=45) # Rotate x-axis labels for better readability
13 plt.show()
```

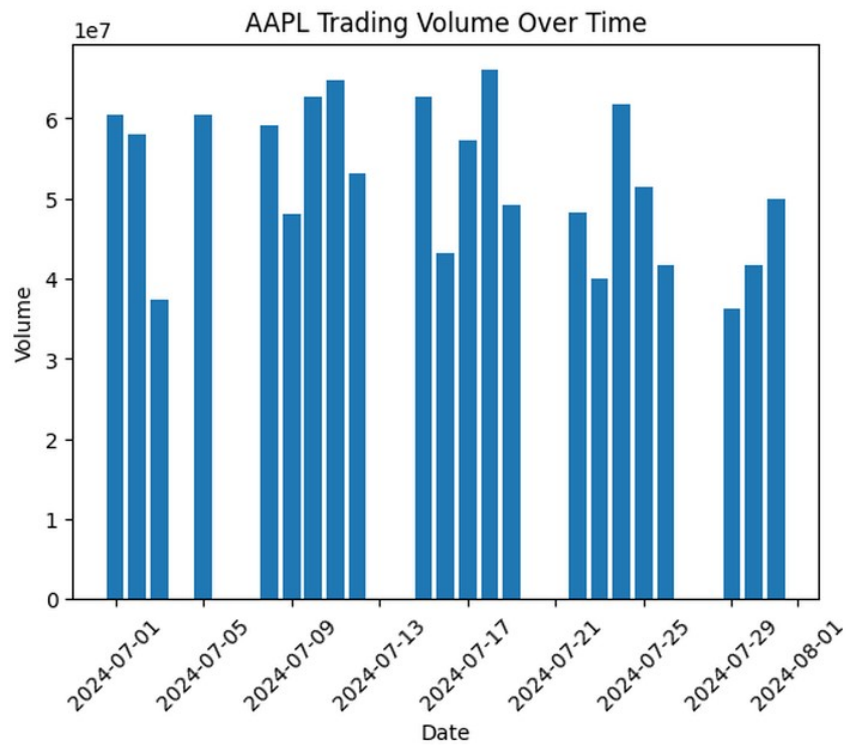
Bar\_chart.py hosted with ❤ by GitHub

[view raw](#)





## Output:



Above plot is a bar chart displaying the trading volume for Apple Inc. over the specified date range.

**4. Histogram:** Histograms show the distribution of stock returns or other numerical data. They help understand the frequency distribution of returns.

## Code Example:

```

1 import yfinance as yf
2 import matplotlib.pyplot as plt
3
4 # Download historical stock data for Apple (AAPL)
5 stock_data = yf.download('AAPL', start='2020-01-01', end='2024-07-31')
6
7 # Calculate daily returns

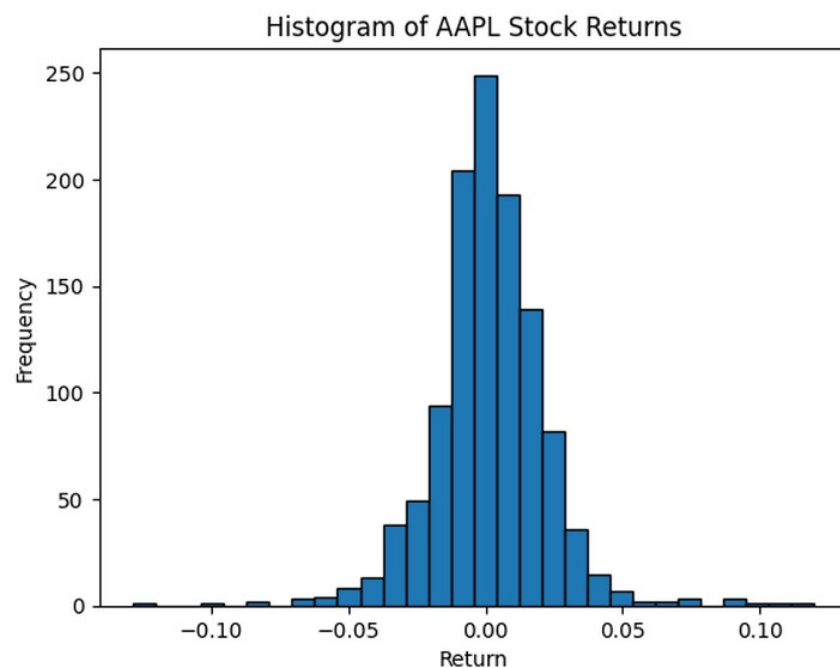
```

```
8 stock_data['Return'] = stock_data['Close'].pct_change()
9
10 # Drop NaN values that result from the percentage change
11 stock_data = stock_data.dropna()
12
13 # Plotting the histogram of stock returns
14 plt.hist(stock_data['Return'], bins=30, edgecolor='black')
15 plt.title('Histogram of AAPL Stock Returns')
16 plt.xlabel('Return')
17 plt.ylabel('Frequency')
18 plt.show()
```

Histogram.py hosted with ❤ by GitHub

[view raw](#)

### Output:



The above histogram shows the distribution of daily returns for Apple Inc. over the specified period.

**5. Scatter Plots:** Scatter plots visualise the relationship between two variables, such as stock



price and trading volume, helping to identify correlations.

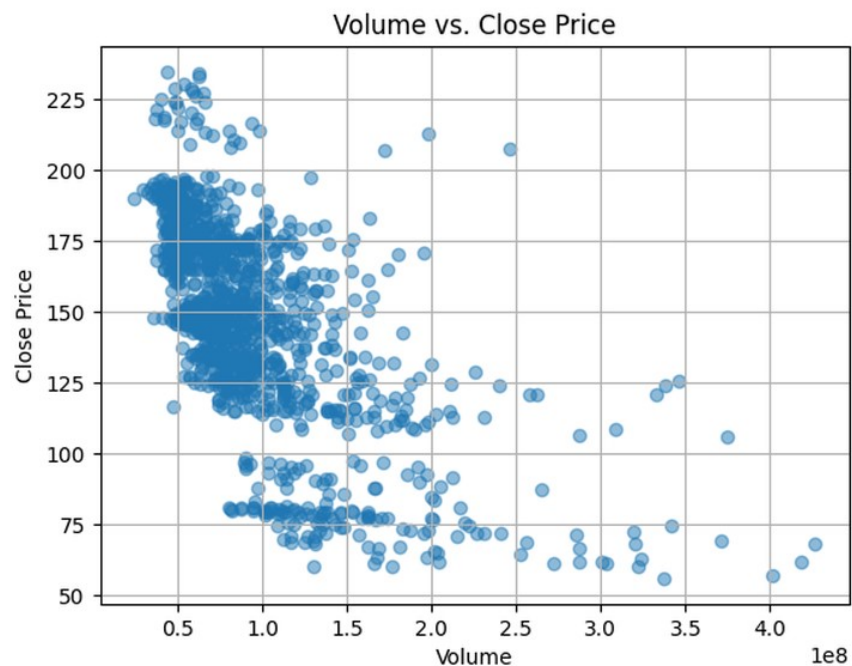
### Code Example:

```
1 import yfinance as yf
2 import matplotlib.pyplot as plt
3
4 # Download historical stock data for Apple (AAPL)
5 stock_data = yf.download('AAPL', start='2020-01-01', end='2020-12-31')
6
7 # Scatter plot of Volume vs. Close Price
8 plt.scatter(stock_data['Volume'], stock_data['Close'], s=10)
9 plt.title('Volume vs. Close Price')
10 plt.xlabel('Volume')
11 plt.ylabel('Close Price')
12 plt.grid(True)
13 plt.show()
```

Scatter\_plots.py hosted with ❤ by GitHub

[view raw](#)

### Output:



The above scatter plot shows the relationship between the trading volume and the closing price of the stock. Each point on the scatter plot represents a single trading day's volume and closing price.

**6. Heatmaps:** Heatmaps display data intensity through colour variations, useful for visualising correlations between different stocks or metrics.

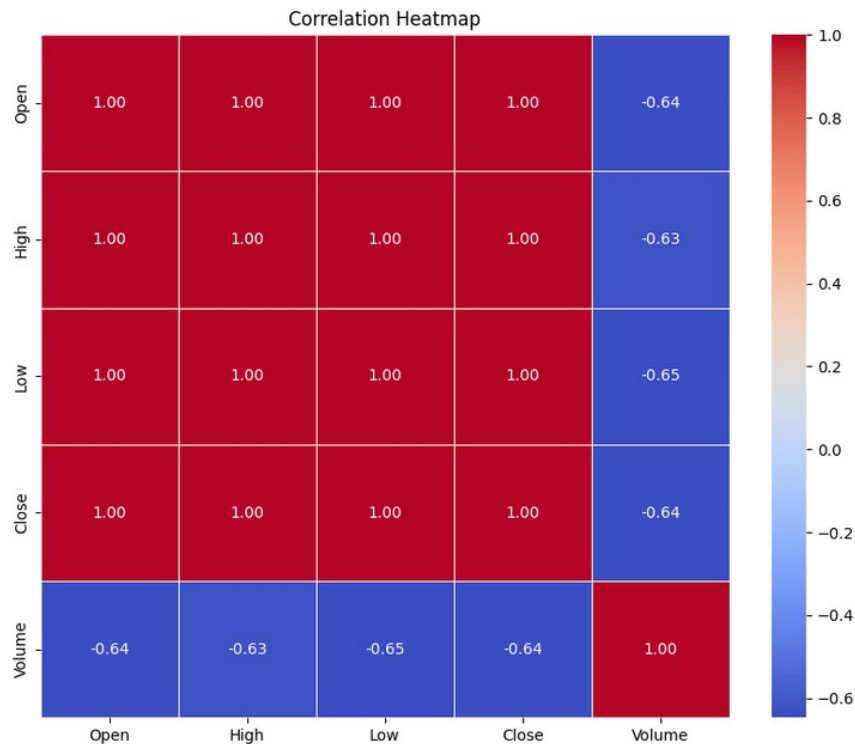
### Code Example:

```
1 import yfinance as yf
2 import seaborn as sns
3 import matplotlib.pyplot as plt
4
5 # Download historical stock data for Apple (AAPL)
6 stock_data = yf.download('AAPL', start='2020-01-01', end='2020-01-01')
7
8 # Calculate the correlation matrix
9 correlation_matrix = stock_data[['Open', 'High', 'Low',
10
11 # Plot the heatmap
12 plt.figure(figsize=(10, 8))
13 sns.heatmap(correlation_matrix, annot=True, cmap='coolw:
14 plt.title('Correlation Heatmap')
15 plt.show()
```

Heatmap.py hosted with ❤ by GitHub

[view raw](#)

### Output:



The heatmap above visualises the correlation between the selected numeric columns of Apple Inc.'s stock data, with a colour map that highlights the strength of the correlations.

**7. Box Plots:** Box plots summarise the distribution of stock returns, showing median, quartiles, and outliers. They are useful for understanding volatility and return distributions.

### Code Example:

```

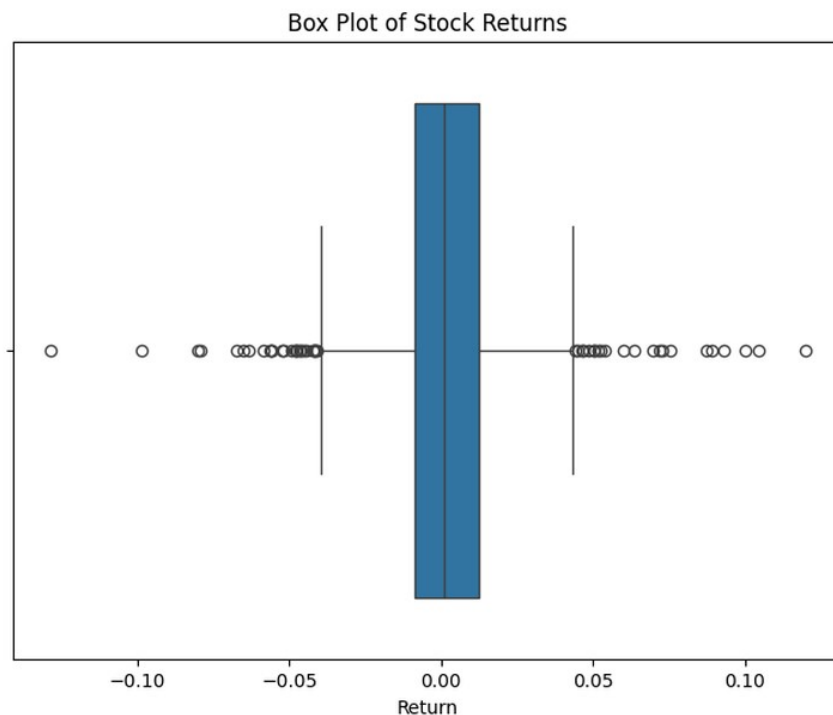
1 import yfinance as yf
2 import seaborn as sns
3 import matplotlib.pyplot as plt
4
5 # Download historical stock data for Apple (AAPL)
    
```

```
6 stock_data = yf.download('AAPL', start='2020-01-01', end='2020-01-01', as_of='2020-01-01')
7
8 # Calculate daily returns
9 stock_data['Return'] = stock_data['Close'].pct_change()
10
11 # Drop NaN values resulting from the percentage change calculation
12 stock_data = stock_data.dropna()
13
14 # Plotting the box plot of stock returns
15 plt.figure(figsize=(8, 6))
16 sns.boxplot(x=stock_data['Return'])
17 plt.title('Box Plot of Stock Returns')
18 plt.xlabel('Return')
19 plt.show()
```

Box\_plot.py hosted with ❤ by GitHub

[view raw](#)

## Output:



The box plot above visualises the distribution of daily stock returns, showing key statistical summaries such as the [median](#), quartiles (one of the [quantiles](#)), and



potential outliers (an important part of [data cleaning](#)).

Each technique provides unique insights into stock market data, helping to uncover trends, relationships, and anomalies in the market.

### Suggested reads on Data Visualisation using Python:

- [Seaborn for Python Data Visualization](#)
- [Plotly Python for an Interactive Data Visualization](#)
- [Bokeh for Data Visualization in Python](#)

You will find it very useful and knowledgeable to read through this list consisting of some of our top blogs on:

- [Python for Trading](#)
- [Machine Learning](#)
- [Sentiment Trading](#)
- [Algorithmic Trading](#)
- [Options Trading](#)
- [Technical Analysis](#)

---

## Conclusion

Data analysis is vital in stock trading, transforming



raw data into actionable insights that inform trading strategies and decisions. Setting up a robust Python environment and following systematic steps to obtain and visualise stock market data are essential for effective analysis. Also, utilising various visualisation techniques helps in identifying trends, patterns, and correlations within the data.

Fetching stock market data in Python can be done using libraries like `yfinance`, which allows for the retrieval of historical data across different geographies. We also discussed real-life examples, such as analysing S&P 500 stock tickers, intraday data, and resampling, to demonstrate the practical applications of these techniques.

Additionally, incorporating fundamental data enriches the analysis, providing a comprehensive view of market conditions. By mastering these tools and techniques, traders can enhance their ability to make informed, data-driven decisions in the stock market.

Moreover, [Getting market data](#) is a comprehensive course to help with learning how to fetch various data like pricing data of stocks, fundamental data and news headlines data. This course is available **FREE** of cost and can be accessed to gain a thorough knowledge for fetching data, performing quality checks,





visualisation as well as the analysis of the data with Python language.

With this course, you will learn all the abovementioned essentials of stock market data with the help of various formats such as videos, documentation, codes, etc. Also, you can take the quiz to confirm the gained information.

---

### File in the download

- Stock market data analysis in Python - Python notebook

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*Note: The original post has been revamped on 30<sup>th</sup> August 2024 for recentness, and accuracy.*

*Disclaimer: All investments and trading in the stock market involve risk. Any decision to place trades in the financial markets, including trading in stock or options or other financial instruments is a personal decision that should only be made after thorough research, including a personal risk and financial assessment and the engagement of professional assistance to the extent you believe necessary. The*



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<https://blog.quantinsti.com/stock-market-data-analysis-python/>



Jun 06, 2024

## Automated Forex Trading: A Step-by-Step Guide



Sep 11, 2024

# Automated Trading Systems: Architecture, Protocols, Types of Latency



## 31 Comments

[Sign Up To Comment](#)**Mohamed Afkar** • 5 Years Ago

Merci

**QuantInsti** • 5 Years Ago

De rien

**Bryce Viorst** • 4 Years Ago

Thank you! unfortunately I keep coming up with the error 'numpy.int64' object has no attribute 'to\_pydatetime' when I try to run the full tear sheet. Do you know how to fix this? Thanks.

**QuantInsti** • 4 Years Ago

Hi! Thank you for the comment. You can downgrade your pandas to 0.25 and it should work fine. You can read



through this thread if it doesn't fix:

<https://github.com/quantopian/pyfolio/issues/520> We hope this helps?



**Alejandro Mazzuca** • 4 Years Ago

Gracias!



**QuantInsti** • 4 Years Ago

De nada...



**sandeep bhanu teja** • 4 Years Ago

For indian market we can get futures and options data from nsepy. But where can we get equity data.



**QuantInsti** • 4 Years Ago

Hi! You can just replace the ticker with the stock which you want the data for. You can get the ticker information from Yahoo Finance. For example, for HDFC Bank the ticker is HDFCBANK.NS and for Nifty it is ^NSEI.

```
from pandas_datareader import data
```

## Set the start and end date

```
startdate = '1990-01-01' enddate =
```



'2019-02-01'

## Set the ticker

```
ticker = 'HDFCBANK.NS'
```

## Get the data

```
data = data.getdatayahoo(ticker,  
startdate, enddate)
```



**Jeremy Karsenty** • 4 Years Ago

Bonjour, Merci beaucoup très instructif. Y a t-il un moyen de récupérer les metrics de [Ticker.info](#) sur plusieurs années et non uniquement le last ?



**QuantInsti** • 4 Years Ago

Unfortunately, the free data is only of the last 1 year. However, you can use Quandl to get fundamental data which is older than a year. The link to it is as follows. <https://www.quandl.com/databases/ZFA/data>



**Supriya Devidutta** • 4 Years Ago

thx , beautifully explained, nice piece of article,

**QuantInsti** • 4 Years Ago





Thank you. We're glad you liked it.



**Pradhyumn Jain** • 4 Years Ago

How do I get Implied volatility data while importing option chain data?



**Ishan Shah** • 4 Years Ago

Thanks, Pradhyumn for your question. IV is a derived data. You can use the black Scholes model to get the IV. For example, you can use python mibian library, pass the option price, strike price, underlying price, days to expiry, type of option (call/put) to get the implied volatility.



**Lif Moon** • 4 Years Ago

Visualization and Analysis with pyfolio

Hi, I am trying to follow your outstanding tutorial. But, when trying to use "pyfolio" I get some error messages: AttributeError: module 'pandas.core.indexing' has no attribute 'getindexerslist' Any suggestions? Thank you for your time, Li



**Dan Sch** • 4 Years Ago

In the course : Course Name: Python for Trading: Basic, Section No: 5, Unit No: 7, Unit



type: Notebook

Why to import data from Yahoo and also from Quandle?

DS



**QuantInsti** • 4 Years Ago

Hi Dan, thanks for your comment. To address your question, these are used only for illustration purpose. And considering that Quandl and Yahoo are widely used. Yahoo provides daily data and some days of minute level data for free and also has wide coverage in terms of asset class. We hope this helps.

S

**swetha biofincapital** • 3 Years Ago

where can we get historical market cap data for a specified date



**QuantInsti** • 3 Years Ago

Thank you for the comment, Swetha. Perhaps this article may be of assistance to you: <https://blog.quantinsti.com/historical-market-data-python-api>



R

**Rajesh Kumar Kumar** • 3 Years Ago

When I give the following code, I am getting the error mentioned below. Kindly help.

```
import pandas as pd
```

```
!pip install pandas_datareader==0.7.0
```

```
from pandasdatareader import data
data=data.getdata_yahoo('AAPL',start='2017-01-01',end='2017-04-30') data.head()
```

```
ImportError: cannot import name 'urlencode'
from 'pandas.io.common' (C:
\Users\rciinturk2\Anaconda3\lib\site-
packages\pandas\io\common.py)
```

**QuantInsti** • 3 Years Ago

Hi, Rajesh. Thanks for your comment. The solution is to upgrade the pandas-datareader version. You can use the below command to do that.

```
!pip install pandas-datareader
--upgrade
```

We hope this helps.

**DrSaaie K B** • 3 Years Ago





Hello, Though I studied programming 30 years back, I found it an uphill task to install [yfinance.py](#) on jupyter notebook. At last, I could install it. After its installation the following messages appeared:

```
Requirement already satisfied: yfinance
Requirement already satisfied: numpy>=1
Requirement already satisfied: multitask
Requirement already satisfied: lxml>=4.
Requirement already satisfied: pandas>=0
Requirement already satisfied: requests
Requirement already satisfied: pytz>=20
Requirement already satisfied: python-da
Requirement already satisfied: six>=1.5
Requirement already satisfied: chardet<
Requirement already satisfied: urllib3<
Requirement already satisfied: idna<3,>
Requirement already satisfied: certifi>
```

In windows settings>>App; I could not find yfinance under installed files.

I am determined to install this. I request you to help me. If possible inform me by email me at [bleess.vskp@gmail.com](mailto:bleess.vskp@gmail.com)



**QuantInsti** • 3 Years Ago

Thank you for the comment. Could you kindly confirm if you had



activated the environment in which you installed yfinance prior to running the python files?



DrSaaie K B • 3 Years Ago

Very grateful to you for your prompt response. Your webpage inspired me a lot and I studied Python for 3 hours. I have also learned about Jupyter and Anaconda environment today after receiving your comments. My child helped me in activating the environment. After activating the environment today, I tried to install yfinance 0.1.54.

The last sentence of anaconda activation is as follows: "'D:\Python-Anaconda\envs\stock-screener\Scripts\spyder-script.py', '--reset'] To activate this environment, use

**\$ conda activate stock-screener**

**To deactivate an active environment, use**



## \$ conda deactivate"

After this activation using activate command, installation of yfinance 0.1.54 returned the following lines:

```
(stock-screener) D:\STOCK
SCANNER GITHUB\yfinance-
python\yfinance-0.1.54\dist\yfinance-
0.1.54\yfinance-0.1.54>python
setup.py usage: setup.py [globalopts]
cmd1 [cmd1opts] [cmd2 [cmd2opts]
...] or: setup.py --help [cmd1 cmd2
...] or: setup.py --help-commands or:
setup.py cmd --help
```

error: no commands supplied Now I am stuck-up here. Kindly guide me further. I am determined to run this package with your gracious help.  
Regards.



QuantInsti • 3 Years Ago

Hi! Thanks for your comment. After activating your environment by running

```
conda activate stock-screener ,
```

please run the command



```
pip install yfinance==0.1.63 .
```

This should install yfinance on your system.



**Manu Bhatnagar** • 3 Years Ago

Hi, I get this error when I run your program  
Exception in thread Thread-6: Traceback (most recent call last): File "C:\Users\myname\anaconda3\lib\threading.py", line 926, in *bootstrap* inner self.run() . . . File "C:\Users\myname\anaconda3\lib\json\decoder.py", line 355, in *raw\_decode* raise JSONDecodeError("Expecting value", s, err.value) from None  
json.decoder.JSONDecodeError: Expecting value: line 1 column 1 (char 0)



**QuantInsti** • 3 Years Ago

Hi Manu, thank you for your comment. Could you please provide more information on what code cell you were trying to run when you faced this error? This would help us understand your query better and advise accordingly.



**joydip biswas** • Last Year

Thanks for the post. Is there any module available to download data from MCX ?



**QuantInsti** • Last Year

Hi Joydip, thanks for your comment.  
Sure, you can get the MCX  
commodities data from here: [https://  
www.mcxindia.com/market-data/  
bhavcopy](https://www.mcxindia.com/market-data/bhavcopy)

**PRINCE SISHOLIA** • 6 Months Ago

I am facing issue in plotting bar graph for EBIT  
and Revenue

**QuantInsti** • 6 Months Ago

Hi! Thank you for your comment and  
for sharing your observation. The  
same has been updated on the blog.  
Do have a look.

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## About

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