



Data Science Capstone

Share Market Data Analysis

Business Scenario

Problem statement:

The Nasdaq-100 is a stock market index comprised of 102 equity securities issued by 101 of the Nasdaq's largest nonfinancial companies. It includes sectors such as manufacturing, technology, retail, telecommunication, biotechnology, health care, transportation, media, and service providers.

The cluster trading strategy is used to build a diverse portfolio of investments. This method enables the identification of different company segments. One advantage of this analysis is that it can help to protect an investor's portfolio from risks.

Objective:

You must now create such segments so that customers can identify segments to invest in and segments to avoid. Use cluster analysis techniques to accomplish this task. You will also need to perform time-series forecasting for stock prices.

Dataset Snapshot

Nasdaq 100 Market cap.xlsx

1	Symb	Name	Market Cap	Last Sale	Net Change	Percentage Chan
2	AAPL	Apple Inc.	26,25,74,01,43,000	\$151.45	\$2.00	1.34%
3	ABNB	Airbnb, Inc.	69,56,99,44,167	\$116.65	\$0.26	0.22%
4	ADBE	Adobe Inc.	1,49,14,45,69,000	\$320.81	\$4.59	1.45%
5	ADI	Analog Devices, Inc.	75,48,47,63,090	\$146.76	\$2.23	1.54%
6	ADP	Automatic Data Processing, Inc.	98,33,27,62,096	\$236.78	\$0.13	-0.05%
7	ADSK	Autodesk, Inc.	46,28,12,59,186	\$214.405	\$7.315	3.53%
8	AEP	American Electric Power Company, Inc.	44,80,78,78,084	\$87.22	\$1.22	1.42%
9	ALGN	Align Technology, Inc.	17,17,36,46,636	\$219.87	\$8.48	4.01%
10	AMAT	Applied Materials, Inc.	75,73,73,36,004	\$88.035	\$3.095	3.64%
11	AMD	Advanced Micro Devices, Inc.	99,90,21,45,714	\$61.3889	\$2.6889	4.58%
12	AMGN	Amgen Inc.	1,39,43,50,75,361	\$260.66	\$0.66	-0.25%
13	AMZN	Amazon.com, Inc.	12,28,24,66,01,480	\$120.6898	\$0.8698	0.73%
14	ANSS	ANSYS, Inc.	18,89,86,89,082	\$217.055	\$0.985	0.46%
15	ASML	ASML Holding N.V.	1,96,49,48,40,000	\$494.70	\$21.73	4.59%
16	ATVI	Activision Blizzard, Inc	56,97,14,77,562	\$72.825	\$0.315	0.43%
17	AVGO	Broadcom Inc.	1,87,41,12,76,929	\$462.735	\$6.215	1.36%
18	AZN	Astrazeneca PLC	1,73,54,50,01,728	\$56.00	\$0.82	1.49%
19	BIDU	Baidu, Inc.	28,10,36,23,222	\$81.33	\$1.58	1.98%
20	BIIB	Biogen Inc.	39,23,71,16,778	\$270.39	\$4.23	-1.54%
21	BKNG	Booking Holdings Inc.	73,62,68,98,604	\$1,854.29	\$45.73	2.53%



Dataset Description

Nasdaq 100 Market cap.xlsx

Variables	Description
Symbol	Symbol of the stock
Name	Name of the company
Market Cap	Market capitalization of the stock
Last Sale	Last sales price of the stock
Net Change	Current period's closing price – Previous period's closing price
Percentage Change	$\frac{\text{Current period's closing price} - \text{Previous period's closing price}}{\text{Previous period's closing price}} * 100$

Dataset Snapshot

nasdaq100_metrics_ratios.xlsx

symbol	company	sector	subsector	asset_turnov	asset_turnov	asset_turnov	asset_turnov	asset_turnov
AAPL	Apple Inc.	Information Technology	Technology Hardware, Storage & Peripherals	0.66	0.72	0.74	0.83	1.08
ABNB	Airbnb	Consumer Discretionary	Internet & Direct Marketing Retail		0.55	0.64	0.36	0.5
ADBE	Adobe Inc.	Information Technology	Application Software	0.54	0.54	0.57	0.57	0.61
ADI	Analog Devices	Information Technology	Semiconductors	0.36	0.3	0.29	0.26	0.2
ADP	ADP	Information Technology	Data Processing & Outsourced Services		0.34	0.34	0.35	0.33
ADSK	Autodesk	Information Technology	Application Software		0.46	0.58	0.6	0.56
AEP	American Electric Power	Utilities	Electric Utilities	0.24	0.24	0.22	0.19	0.2
ALGN	Align Technology	Health Care	Health Care Supplies	0.93	1.03	1.06	0.67	0.73
AMAT	Applied Materials	Information Technology	Semiconductor Equipment	0.87	0.9	0.8	0.83	0.96
AMD	AMD	Information Technology	Semiconductors	1.53	1.6	1.27	1.3	1.54
AMGN	Amgen	Health Care	Biotechnology	0.29	0.32	0.37	0.42	0.42
AMZN	Amazon	Consumer Discretionary	Internet & Direct Marketing Retail	1.66	1.58	1.45	1.41	1.27
ANSS	Ansys	Information Technology	Application Software	0.38	0.42	0.37	0.31	0.31
ASML	ASML Holding	Information Technology	Semiconductor Equipment	0.54	0.56	0.55	0.58	0.63
ATVI	Activision Blizzard	Communication Services	Interactive Home Entertainment	0.39	0.41	0.34	0.38	0.37
AVGO	Broadcom Inc.	Information Technology	Semiconductors	0.34	0.4	0.38	0.33	0.36
AZN	AstraZeneca	Health Care	Pharmaceuticals	0.36	0.36	0.4	0.42	0.44
BIDU	Baidu	Communication Services	Interactive Media & Services	0.4	0.37	0.36	0.35	0.35
BIIB	Biogen	Health Care	Biotechnology	0.53	0.55	0.55	0.52	0.45
BKNG	Booking Holdings	Consumer Discretionary	Internet & Direct Marketing Retail	0.56	0.6	0.68	0.31	0.48
CDNS	Cadence Design Systems	Information Technology	Application Software	0.85	0.88	0.8	0.72	0.72

Note: The detailed dataset description is provided in the **Financial ratios - Data Dictionary** file under **Course Resources**

Dataset Description

NASDAQ_DATA

This folder contains historical share prices for 1609 companies.
The data for 1609 companies is available in the .csv format.

Hint: We don't need all files given in the folder but finding relevant files can be challenging.

Project Task: Week 1

Applied Data Science with Python

1. Check the stock symbols of the companies in **Nasdaq 100 Market cap.xlsx**. Only the relevant files in the **NASDAQ_DATA** folder should be read.
2. Append all files (imported in the previous step) that contain no more than 10 years of data. For this, you may use your discretion.
3. Read **Nasdaq 100 market cap.xlsx** and **nasdaq100_metrics_ratios.xlsx**.
4. Collate the two files imported in the previous step to include the fields **Market cap** and **Last sale** in addition to the various metrics and ratios already present in **nasdaq100_metrics_ratios.xlsx**
5. Identify the variables whose variance is less than .005 (as these do not contribute to model building), and eliminate those variables
6. Delete the variables in **nasdaq100_metrics_ratios.xlsx** where 30% or more of the values are missing

Project Task: Week 1

Applied Data Science with Python

7. Perform missing value imputation for variables with less than 30% missing values by considering the company's sector
8. Analyze the effect of COVID on stock prices in detail, create visuals to support the insights, and address the following:
 - a. Which sectors and companies saw the greatest impact, and which ones saw the least? You may use growth or degrowth as a measure of impact and may perform week over week, month over month (Mom), quarter over quarter (QoQ), or year over year (YoY) analysis as appropriate.
 - b. Which sector and company experienced the fastest and slowest recoveries?

Project Task: Week 1

Machine Learning

1. Perform PCA to reduce the number of variables in the data
2. After PCA, perform cluster analysis to identify cohorts, define these cohorts (cluster profiling), and specify the insights found
3. Highlight companies from different sectors falling into the same cohort, and share your findings
4. Plot seasonality, trend, and irregular components over time for the historical stock price of Apple
5. Based on trend and seasonality, choose an appropriate exponential smoothing method to forecast the weekend share price value for the next 12 months
6. Perform an augmented Dickey-Fuller test (ADF) to check for the stationarity of Apple stock.

Project Task: Week 1

Machine Learning

7. Analyze the ACF and PACF plots for Apple's historical stock prices, strategize for ARIMA modeling, determine the appropriate values of p , d , and q , and forecast the month-end share price value for the next 12 months
8. Find the mean absolute percentage error (MAPE) for a 12-month period to validate the model
9. Identify the top 2 companies from each sector based on market capitalization, create trend charts for the month-end share price for the last five years (using the variable "adjusted close"), display the 12-month rolling mean and standard deviation in the same chart, and share your observations regarding the stationarity of all companies
10. Conduct an ADF test to verify the stationarity of the companies selected in the previous step
11. Perform batch forecasting for the top 2 companies from each sector based on market capitalization for the weekend share price value for the next 12 months using Auto ARIMA, and find the MAPE for a 12-month period to validate the model

Hint: Leverage the **pmdarima** library for Auto ARIMA

Project Task: Week 2

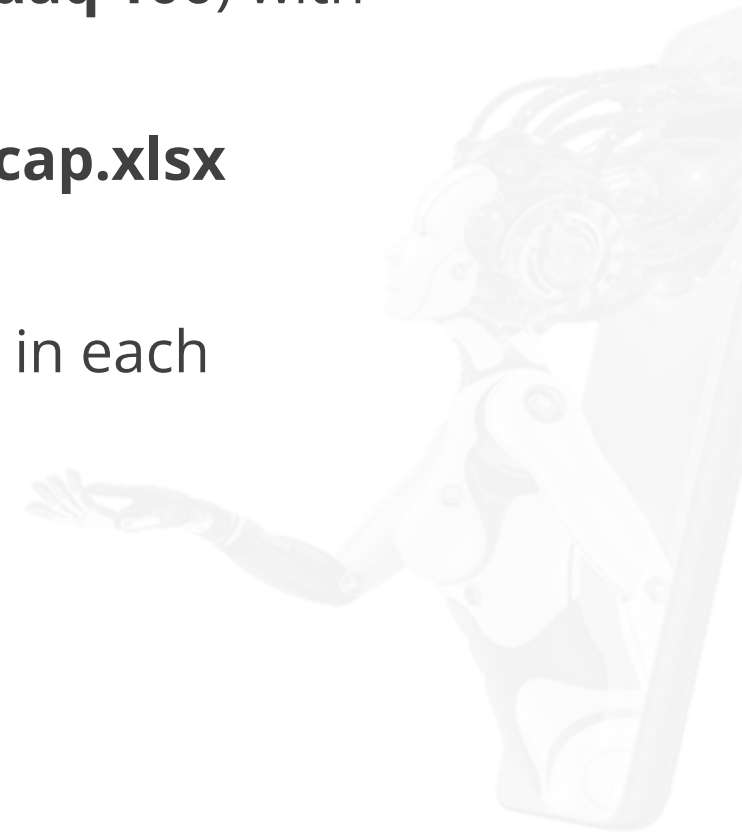
Excel

1. Create an Excel dashboard showcasing the following:
Hint: Use form controls to create a dynamic chart
 - a. Trend charts of share prices of the top company in each sector based on market capitalization for the past three months
 - b. The market capitalization and sub industry of the companies in the dashboard
2. Create a graph to compare **yoy_revenue_growth_latest** for different companies in various industries

Project Task: Week 2

SQL

1. Determine the market capitalization of the company in the IT sector (from **Nasdaq 100**) with the greatest **LastSale** value
2. Find the number of companies from each industry in the **Nasdaq 100 Market cap.xlsx**
3. List the top 5 companies based on market capitalization
4. Create a table with sectors and subsectors showcasing the count of companies in each subsector



Project Task: Week 2

Tableau

1. Create a dashboard in Tableau by choosing appropriate chart types and metrics useful for the business

Note: Give emphasis to data storytelling



Thank You