



Using Python and Azure Cloud for (stock) trading and investing

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dataMinds connect 2021

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Our Partners



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About me



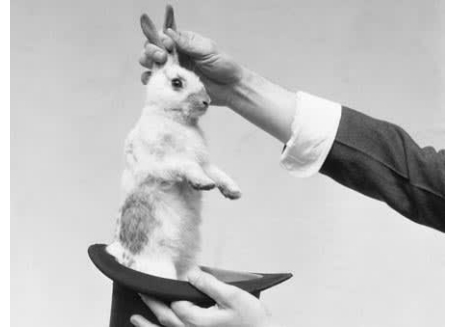
- Solution architect Microsoft Business Solutions @Inetum – Realdolmen
- Blogs:
 - <https://jopx.blogspot.com>
 - <https://jopxfin.blogspot.com>
- Twitter: @jopxtwits
- Got bored during Covid and started with Python

The fine print

The information in this presentation represents an opinion and is for information purposes only. It is not intended to be investment advice. Seek a duly licensed professional for investment advice.

Objective

- Get you excited about investing/trading and data
- Get you thinking about quantitative/algorithmic trading
- Look at using Jupyter notebooks for trading/investing



What are we not covering?

- Crypto currencies, bonds, forex, derivative contracts (futures/options)
- Portfolio analysis and composition
- Usage of (advanced) machine learning algorithms
- The magic recipe

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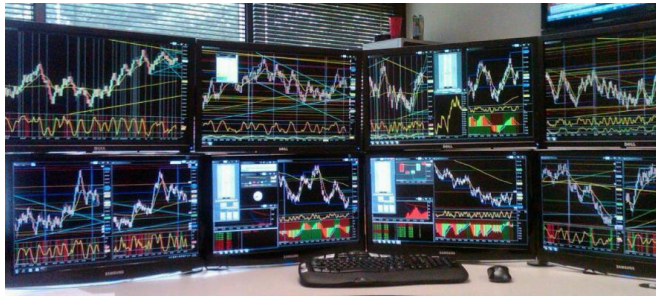
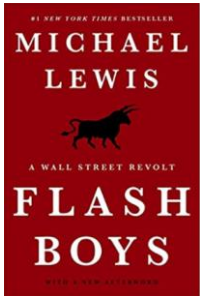
Agenda

- Introduction to trading and finance
- Data first approach to trading
- Python, Anaconda and VS Code
- Quantitative trading system development process in Python examples
- Azure Machine Learning Service

<https://github.com/jorisp/tradingnotebooks>

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Trading vs investing



HFT trading

Milliseconds-minutes

Day trading

Intraday

Swing trading

Few days to weeks

Position trading

Weeks to months

Investing

Months to years ...

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Word of warning: Efficient market hypothesis (EMH)

- EMH: Share prices reflect all information and consistently beating the market (adjusted for risk) is impossible (Fama and Samuelson, 1960)
- Active vs passive investing
- Criticisms:
 - Behavioral finance – systematic irrationality e.g. meme stocks (AMC and Gamestop), ;..
 - Many investors have consistently beaten the market
- <https://www.youtube.com/watch?v=bM9bYOBuKF4>



Mr. Market



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So, do you believe that you can beat the market?

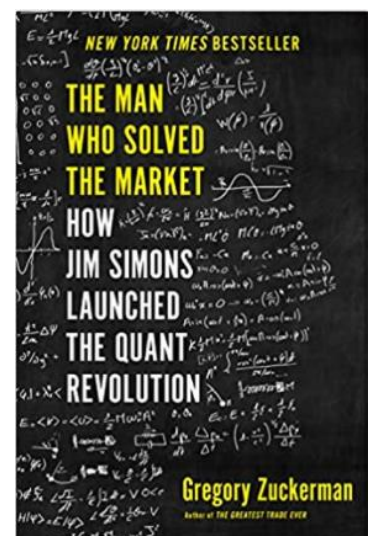
- [Day Trading for a Living? by Fernando Chague, Rodrigo De-Losso, Bruno Giovannetti :: SSRN, \(June, 2020\)](#) - 97% lost money
- [The cross-section of speculator skill: Evidence from day trading \(2013\)](#) – only 1% consistently beats the market
- What about smart money?
 - Over a 15-year period – 90% of actively managed funds failed to beat the market (Spiva 2020)



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Data first approach towards trading

- RenTech – 66% average yearly return since 1988
- “There’s no data like more data”(*)
- Quantitative or algorithmic trading
- Only 1 AI driven Belgian investment fund on the market - <https://bit.ly/3mnLWAq>



<https://twitter.com/TrungTPhan/status/1424399014204637186?s=20>

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Why Python?

[Python and Statistics for Financial Analysis \(Coursera\)](#)

- General purpose language
- Concise, expressive and readable
- Interactivity with Jupyter notebooks
- Massive open-source software development community
- First class citizen in the Data & AI world
- <https://www.python.org/>



matplotlib



pandas



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PYTHON

NumPy, SciPy, Pandas, Scikit-learn, Jupyter /
IPython, Numba, Matplotlib, Spyder, Numexpr,
Cython, Theano, Scikit-image, NLTK, NetworkX and
150+ packages

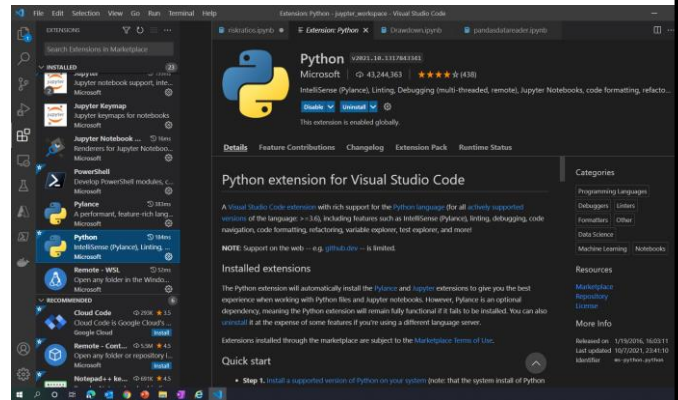
conda

- Popular Python distro (150+ packages for data science)
- 25 M+ users
- Open-source individual edition - <https://www.anaconda.com/products/individual>
- **conda**: cross platform and language agnostic package and environment manager.
- **Environments**: custom isolated sandboxes with different versions of packages and/or python
- Conda sheat cheat - <https://bit.ly/3liHtzU>
- Be careful using both Pip and Conda

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Visual Studio Code Python extension

- Available in the extension marketplace
- Works on any OS
- Requires Python 3
- Features:
 - Syntax coloring
 - Code completion
 - Linting
 - Debugging
 - Code navigation
 - Code formatting
 - Jupyter notebook support



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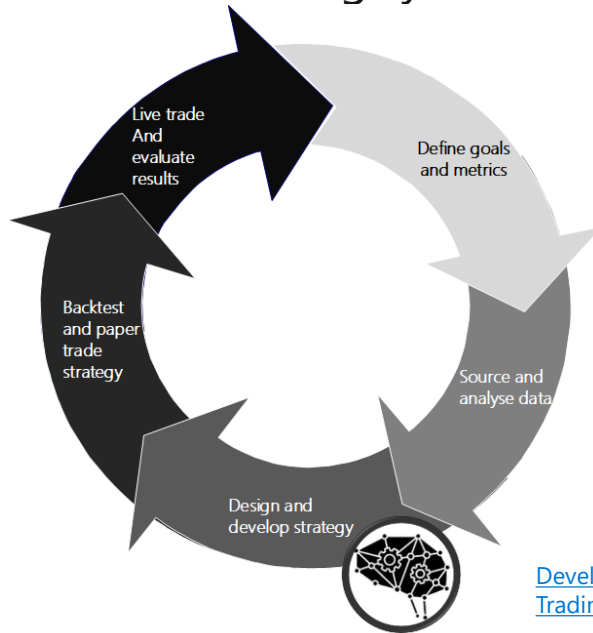
Demo1: Anaconda + Python + VS Code

Time for a live demo, what could wrong?

<https://github.com/jorisp/tradingnotebooks/blob/master/AlphaVantage%20GOOG.ipynb>

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Quantitative trading system development process



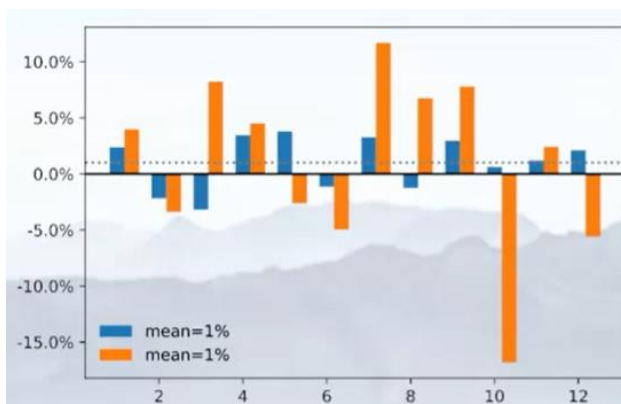
- Non-linear process
- Extract signals to generate alpha
- Avoid investor bias and mistakes
- Risk vs return
- Back-testing framework

[Development Process](#) | [Learning Path: Hands-On Algorithmic Trading with Python \(oreilly.com\)](#)

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Risk and return

Goals and metrics of a trading/investment strategy



- Volatility as measure for risk
- Different metrics for comparing reward (return) to risk (standard deviation)
- Beta, Sharpe ratio, max drawdown, Sortino ratio, Calmar ratio, sterling ratio, ...

[Introduction to Portfolio Construction and Analysis with Python\(Coursera\)](#)

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Demo2: Risk and return

Time for a live demo, what could wrong?
<https://github.com/jorisp/tradingnotebooks/blob/master/riskratios.ipynb>

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Source and analyze data

Types of data

				
<p>Market data</p> <ul style="list-style-type: none">• OHLC• Volume• Market book	<p>Technical indicators</p> <ul style="list-style-type: none">• Derived from market data – (Exponential) Moving Average, Relative Strength Index, Moving Average Convergence/Div ergence, ...	<p>Company data</p> <ul style="list-style-type: none">• Revenue, debt financing, profit margin• Ratios: PE, EPS, ...• Some gotchas to consider	<p>Economic data</p> <ul style="list-style-type: none">• GDP, inflation, interest rates, ...• Commodities• Shipping prices• ...	<p>Alternative data</p> <ul style="list-style-type: none">• Non-traditional sources such as satellite imagery, social media activity, ...• Most hyped

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Source and analyze data

Where to find the data?

Market data	Technical indicators	Company data	Economic data	Alternative data
<ul style="list-style-type: none">yFinanceQuandl (*)Alphavantage	<ul style="list-style-type: none">Calculate yourself (Python TA-Lib)AlphavantageyFinance	<ul style="list-style-type: none">yFinanceAlphavantage	<ul style="list-style-type: none">QuandlWorld BankSt. Louis FED (FRED)Fama/French dataset	<ul style="list-style-type: none">Quiver QuantitativeBuild your own models e.g. NLP on earnings transcriptsFSMA(**)



Pandas-datareader as wrapper library around multiple sources

Build a web scraper with Python and Beautiful Soup

(*) Quandl recently renamed to Nasdaq Data Link

(**) FSMA insider trading list <https://www.fsma.be/en/transaction-search>

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Demo3: Sourcing data

Time for a live demo, what could wrong?

<https://github.com/jorisp/tradingnotebooks/blob/master/sourcingdata.ipynb>

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Design and develop a strategy

- Generating alpha
- Main strategies:
 - Momentum trading – “The trend is your friend (until it ends)
 - Mean reverting trading strategy
- SMA cross-over example

Quant	Momentum (time-series or cross-sectional)	Pair-trading, most types of statistical arbitrage	Advanced models (e.g. HMM, regime switching)	HF Market-making, Cash-futures arbitrage	News-based automated trading
Technical	MA cross-over, Continuation patterns	Swing, Retracement, Pivot trading	Opening range, dual thrusts, patterns	Range-based short gamma (vol selling)	Nothing much here
Fundamental	Factor-based investing	value investing	value/ RV (relative value) strategies	Cross-asset, cross country RV/ short gamma	Usually discretionary
	Trending	Mean-reverting	Break-out	Carry	Event-based



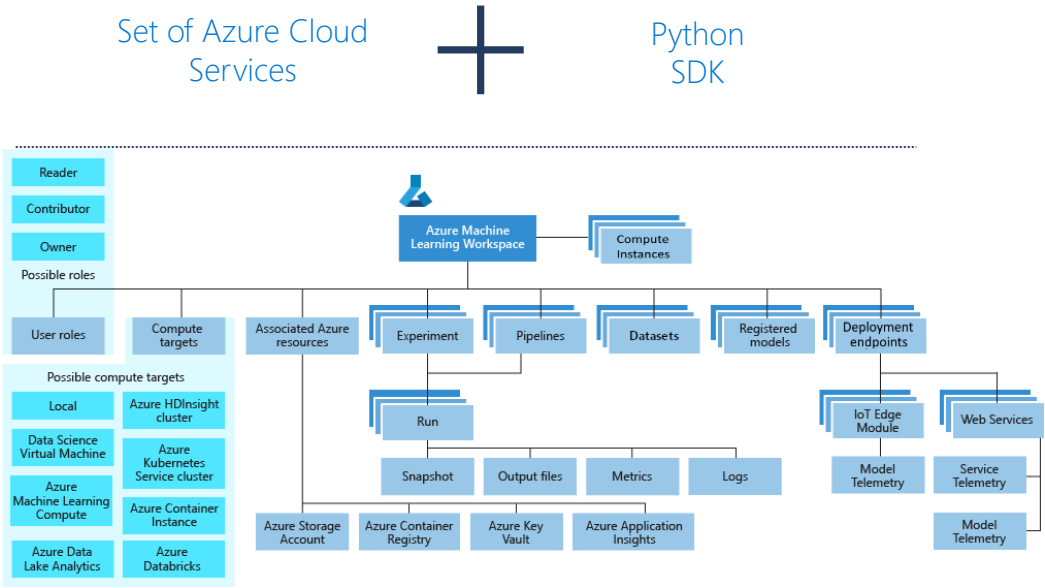
Quantinsti Youtube - <https://bit.ly/3iLo352>

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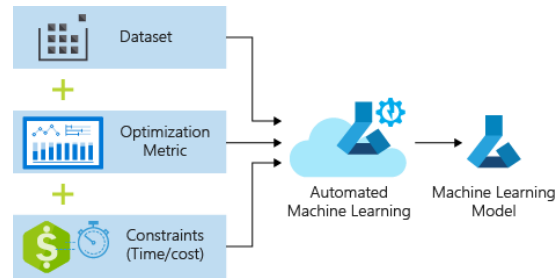
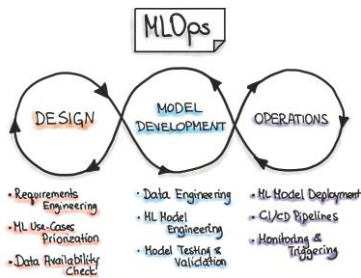
Azure Machine Learning service



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Azure Machine Learning Service

Key features



- Support MLOps process
- Track ML models with MLflow (<https://mlflow.org/>) and AzureML
- AutoML - <https://bit.ly/3v64bOX>

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Summary

- Start by building a foundational portfolio with index ETFs
- Diversify and spread out amounts to entering the market.
- Trading and building a trading system is a full-time activity
- No easy way to make money fast
- Python and Jupyter Notebooks easy solution to gather/transform/visualize information
- Use Azure when you need to scale or get started quickly (otherwise work locally)



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What do you think?

- 1.Open the form
- 2.Provide constructive feedback
- 3.Be eligible for an amazing prize

bit.ly is CASE SENSITIVE!



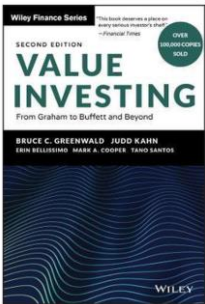
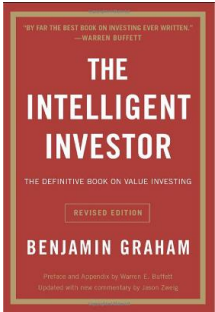
http://bit.ly/dMC2021_FeedbackTuesday

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My favorite books on investing

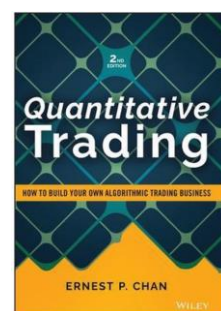
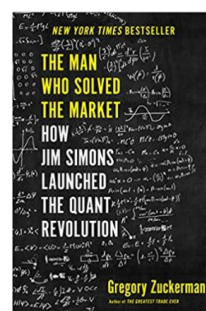
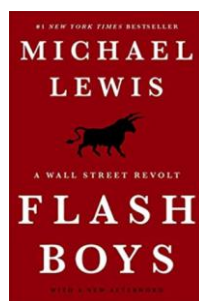
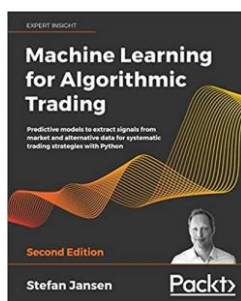
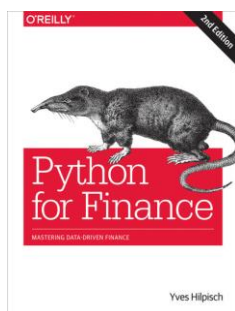
- The intelligent investor, Benjamin Graham
- Verdubbel je geld in vijf jaar, Sam Hollanders
- God dobbelt niet op de beurs, Jan Longeval
- Value investing. From Graham to Buffett and Beyond, Bruce C. Greenwald



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My favorite books on trading

- Python for Finance, Yves Hilpisch
- Machine Learning for Algorithmic Trading, Stefan Jansen
- Flash Boys, Michael Lewis
- The man who solved the market, Gregory Zuckerman
- Quantitative trading: how to build your own algorithmic trading business (2nd edition), Ernest Chan



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References – Getting started

- <https://spaarvarkens.be/> (NL)
- Vlaamse Federatie van Beleggers (VFB) - <https://www.vfb.be/> (NL)
- Chess Capital (NL only) - <https://www.chesscapital.be/start-hier/> (NL)
- Chess Capital podcast – Alles over waardebeleggen - <https://spoti.fi/301gXmj> (NL)
- Inside Beleggen Podcast van Trends - <https://spoti.fi/303EPFV> (NL)
- De Beurs van Tegenwoordig (De Tijd) - <https://spoti.fi/3mA4nly> (NL)

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References

- Investing
 - Efficient Capital Markets: a review of theory and empirical work (Journal of Finance, 1970) - <https://www.jstor.org/stable/2325486>
 - Handel in voorkennis, impact van alternatieve data op beurskoersen - <https://t.co/U6cblO2Nyf?amp=1> (Reportage VPRO Tegenlicht)
 - Coursera courses
- Python
 - <https://docs.microsoft.com/en-us/learn/paths/python-first-steps/>
 - <https://aka.ms/python-getting-started>
 - PyCon and [PyVideo.org](https://pyvideo.org)
 - Master the basics of Conda environments in Python - <https://www.youtube.com/watch?v=1VVCd0eSkYc>
 - <https://realpython.com/beautiful-soup-web-scraper-python/>
 - <https://beautiful-soup-4.readthedocs.io/en/latest/>

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References

- Python and VS Code
 - <https://www.youtube.com/watch?v=HUtHp3duGbl>
- Sourcing data
 - Quiver Quantitative - <https://www.quiverquant.com/> (Alternative financial data)
 - <https://github.com/ranaroussi/yfinance>
 - <https://www.alphavantage.co/>
 - <https://data.nasdaq.com/> (Quandl)
 - <https://mrjbq7.github.io/ta-lib/>

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Questions?

