### Stock Market Prediction

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# Contents

0.1	Introduction		
	0.1.1	Introduction	1
	0.1.2	Project motivation	1
	0.1.3	Importance and prevalence of the problem	1
	0.1.4	Project goals	1
	0.1.5	Project outline	1
0.2	Backg	round	1
	0.2.1	The Stock Market	1
	0.2.2	Analysis of the problem	2
	0.2.3	Review of existing work	2
0.3	Metho	odology and Data	2
	0.3.1	Tools Used	2
	0.3.2	Data Used	3
	0.3.3	Simulation of strategies	3
	0.3.4	Defining a successful model	4
0.4	Attack	king the problem - Fundamental Analysis	4
	0.4.1	P/E Ratio	4
0.5	Attack	king the problem - Technical Analysis	4
	0.5.1	Hobbyist Approaches	4
	0.5.2	Review of Metrics	4
	0.5.3	OLMAR algorithm	4
	0.5.4	StatsModels	4
0.6	Attack	king the problem - Machine Learning	4
	0.6.1	KNN on metrics	4

#### Abstract

This project is an attempt to answer the question of whether stock market prices can be accurately predicted using modern Artificial Techniques. We take multiple approaches to the problem including Fundamental Analysis, Technical Analysis, and Machine Learning techniques.

#### 0.1 Introduction

#### 0.1.1 Introduction

#### 0.1.2 Project motivation

#### 0.1.3 Importance and prevalence of the problem

Explain size of the financial industry affected by the problem and why having better tools to predict the stock market may be important to the average person

#### 0.1.4 Project goals

#### 0.1.5 Project outline

How the project will meet those goals

#### 0.2 Background

#### 0.2.1 The Stock Market

What is the stock market

How the stock market works

Components of the stock market

#### Terminology

Fundamental analysis

#### The Efficient Market Hypothesis

Throughout this area of investigation, there is a very large elephant in the room, the Efficient Market Hypothesis (EMH). The hypothesis talks specifically about an agents ability to profit from make inefficiencies, i.e when stocks and shares are mispriced by the market. Its strongest proponents would claim that the very title of this report, predicting stock market, is all but impossible. The EMH comes in three main forms.

- The weak form of the efficient market hypothesis claims that prices fully reflect the information implicit in the sequence of past prices.
- The semi-strong form of the hypothesis asserts that prices reflect all relevant information that is publicly available
- the strong form of market efficiency asserts information that is known to any participant is reflected in market prices.

[2]

Informally, the weak form implies that you cannot profit using historical patterns in the share price, the semi-strong form implies that there is profit only to be made from insider trading, and the strong form says that even this is futile. Important to note is that the week form the hypothesis does not completely rule out profitable trading on the stock market. Trading profitably based on predictions from Fundamental analysis is still possible in the week form.

Clearly for the successful application of modern AI techniques to this problem, we must hope that at least the semi-strong and strong forms of the hypothesis are wrong and do allow for a sufficiently intelligent agent to profit. Luckily, many researchers do indeed question the validity of the hypothesis. There is evidence that the stock market does not always follow EMH. Basu [1] showed that fundamental analysis could yield information useful in future market forecasts. This result questions the semi-strong and strong forms of the hypothesis, but does not necessarily break the weak form.

Later in this report, we provide our own data and analysis that supports the view that at most only the week form of the EMH holds true.

#### 0.2.2 Analysis of the problem

Explanation of the difficulty of the problem

Separation of profitability and accuracy

Temporal reach of prediction

Want to avoid HFT
Fundamental is long term
Machine learning focus on short/medium

#### Formal definition of the problem

#### 0.2.3 Review of existing work

#### 0.3 Methodology and Data

#### 0.3.1 Tools Used

#### Python and associated packages

Python was the language of choice for this project. This was an easy decision for the following reasons.

1. Python as a language has an enourmous community behind it. Any problems that might be encountered on the way can be easily solved with a trip to Stack Overflow. Python is amoung the most popular languages on the site which makes it very likely there will be a direct answer to any query [4].

- 2. Python has an abundance of powerful tools ready for scientific computing. Packages such as Numpy, Pandas, and SciPy are freely available, performant and well documented. Packages such as these can dramatically reduce and simplify the code needed to write a given program. This makes iteration quick.
- 3. Python as a language is forgiving and allows for programs that look like pseudo code. This is useful when pseudo code given in academic papers needs to be implemented and tested. Using Python, this step is usually reasonably trivial.

However, I digress, Python is not without its flaws. The language is dynamically typed and packages are notorious for Duck Typing. This can be frustrating when a package method returns something that, for example, looks like an array rather than being an actual array. Coupled with the fact that standard Python documentation does not explicitly state the return type of a method, this can lead to a lot of trial and error type testing that would not otherwise happen in a strongly typed language such as Haskell. In my view, this is an issue that makes learning to use a new Python package more difficult than it otherwise could be.

The following packages were used throughout the project

#### Numpy

A staple of scientific computing, useful for efficient data structures and linear algebra.

#### Pandas

Useful for filtering and mutating the data into a desired form.

#### SciPy

Extensive library of numerical routines

#### Matplotlib

Used for graphing data

Quantopian/Zipline and Pyalgotrade

Statsmodels

0.3.2 Data Used

Data sources

Format of the data

Adjusted prices

0.3.3 Simulation of strategies

Similarity to real life

#### 0.3.4 Defining a successful model

Statistical significance of a model

# 0.4 Attacking the problem - Fundamental Analysis

We begin by approaching the problem using Fundamental Analysis.

Fundamental Analysis of stocks and shares is one of the earliest and forms of market prediction. It takes the view that the market has mispriced a security, but over time the price will be corrected to its intrinsic value. If we can accurately calculate the intrinsic value of a security, e.g how much is one share of company X actually worth, then we can choose to invest based on the difference between the current price and intrinsic value.

Graham et al. [3] laid the groundwork for the field with the book *Security Analysis*. He encouraged would-be investors to estimate the intrinsic value of a stock before buying or selling based on trends, a novel idea at the time. It stands as testament to his approach that his only A+ student was Warren Buffet who methodically applied the strategy and has enjoyed renowned success since. [6]

#### 0.4.1 P/E Ratio

One of the simplest and possible most well known approach to gauging the instrinsic value of a stock is to use the P/E Ratio. The P/E ratio is the ratio of a company's share price to its earnings per share.

#### 0.5 Attacking the problem - Technical Analysis

- 0.5.1 Hobbyist Approaches
- 0.5.2 Review of Metrics
- 0.5.3 OLMAR algorithm
- 0.5.4 StatsModels
- 0.6 Attacking the problem Machine Learning
- 0.6.1 KNN on metrics

[5]

## **Bibliography**

- [1] Sanjoy Basu. The relationship between earnings' yield, market value and return for nyse common stocks: Further evidence. *Journal of financial economics*, 12(1):129–156, 1983.
- [2] Elroy Dimson and Massoud Mussavian. A brief history of market efficiency. European financial management, 4(1):91–103, 1998.
- [3] Benjamin Graham, David Le Fevre Dodd, and Sidney Cottle. *Security analysis*. McGraw-Hill New York, 1934.
- [4] Stephen O'Grady. The redmonk programming language rankings: January 2015, January 2015. URL http://redmonk.com/sogrady/2015/01/14/language-rankings-1-15/.
- [5] pybrain.org. Classification with feed-forward neural networks, January 2015. URL http://pybrain.org/docs/tutorial/fnn.html.
- [6] Alice Schroeder. The snowball: Warren Buffett and the business of life. Random House LLC, 2008.