SURVEY REPORT ON VARIOUS STOCK PREDICTION MODEL BASED ON MACHINE LEARNING ALGORITHMS

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Abstract: With the evolution of Machine learning in the field of computer science and engineering, its application in different domain also grew like in Medical, Marketing, Telecommunication, Finance, etc. The reason for the growth of popularity of machine learning in these domains is the high accuracy prediction. This is why stock return prediction became very popular in this field over past few years. Apart from this, various studies also claimed that the Investor's sentiment also important for stock return prediction and using their sentiments with the stock market data result in high accuracy and precision. The only problem with that is to choose perfect model for the prediction. As different model return different accuracy depending upon the data. So in order to determine the best predictive model, in this paper various models for stock market prediction and User-generated textual sentiments analysis are studied so as to extract the detailed version of best models for stock market prediction.

Keywords - Stock Prediction, Machine Learning, Support Vector Machine, Piecewise linear representation, Latent Dirichlet Allocation, Bayesian Model

I. INTRODUCTION

Stock market is one of the best places to get good returns. It is one of the core and critical component of capital markets, which plays important part in supporting and promoting the economic development. Predicting the stock market helps to get good returns, but it's not easy task. Prediction of stock market is one of the foremost challenges that are faced by investors for better gain. In a book[14] by Burton Malkiel which is published in 1973 "A Random Walk Down Wall Street" claimed that the stock price can be predicted by looking at price history. After that various paper and journals are being published on stock market prediction and forecasting. Researchers used various models for stock prediction like Neural network, Time series analysis method, Support vector Machine, etc. Out of which Support Vector machine is considered to be the best model for stock market.

II. MACHINE LEARNING

Originally coined by Arthur Samuel in 1959, Machine Learning(ML) is one of the most important subfield of artificial intelligence in the field of computer science. It provides computer an ability to "learn by itself". That is, it gives computer, capability to learn from previous data without being programmed explicitly. Evolved from pattern recognition and learning theory, it has provided us capability like image recognition in self-driving cars, practical speech recognition in virtual assistants or in humanoid robot, recommendation system for movies and ecommerce platform, effective web search, and a vastly improved understanding of the human genome. It also provides prediction ability like for weather forecasting, cancer prediction in medical diagnosis, stock return in financial market, etc.

III. LITERATURE SURVEY

In this paper, researchers [Pei-Chann et.al 2008] uses a new approach in which Piecewise Linear Representation (PLR) is used to disintegrate historical data into different parts. The result of this data is the turning points which can be trough (low) or can be peak (high) of the previous data. This result is used as an input data for the Neural Network which is used for training the model. After this, testing data can trigger the model whenever any buying or selling point is observed by Neural network. The researchers further developed an intelligent PLR (IPLR) model to iteratively enhance the threshold value of the model. Thus, it further increases the efficiency of the model.[12]

In the paper, According to the researcher [Ming-Chih Lin et al 2011], there are two features of financial reports which are important for better stock prediction. First ones are the quantitative and other are qualitative features. Considering only one(quantitative and qualitative) feature will not provide complete information. Hence in this paper, author extracted both features of the these reports and assign a weights to justify both the features together. They then use HRK(Hierarchical agglomerative and Recursive K-means clustering)in which they apply HAC to do the initial clustering and then repeatedly used K-means to do further clustering so as to get purity of cluster. The reason for using this method is that it provide noise free data and avoids the over fitting problem.[11]

This paper proposed a different method to forecast stock returns in which researchers [JiangJiao Duan et. al 2013] mine sentiments and opinions from messages posted on Web forums. The Parameters for the model are estimated in such way that they

are best suited with the training data by using regular Baum-Welch algorithm and Genetic Algorithm(GA). A Bayesian model is used to established relation between the stock market returns and the combination of sentiments and opinions.[4]

In this paper researchers[Xiaotian Jin et.al 2014] proposes a new and better stock prediction method which is based on the social network and regression model(SVM regression Model, Least Square regression, Ridge Regression). In this paper dataset from NASDAQ stock market and from Twitter is used for verification. Experimental result shows that the proposed method accurately predict stock price.[3]

In this paper, Support vector machine along with Piecewise linear representation (PLR) is used for predicting the stock price. According to the researchers, SVM has great capability of generalization which prevent it from overfitting. In the mean time, PLR produces a junction from adjacent segment in which the junction is the inflection point of stock price.[5]

In this paper, researchers compared two different stock prediction methodology based on new articles. First they build up a framework which take the textual documents(news) as an input and generates the predicted price movements as output. Secondly, they construct the summaries of the news articles and use them as an input for framework. Then, they compared the performance of the prediction based on those two different information sets. The reason that they summarize the news is that this helps them to extracts the major information from the article and filters the noises that might distract the focus of readers.[10]

In this paper, stock return prediction method is defined by using sentiment analysis using financial microblogs. Researchers [Bo Zhao et. al 2016] analyze the microblogs contexts to find the financial sentiments of microblogs and then combine these sentiments and the training data to predict the stock market movements. In this model, Support vector machine is used along with the LDA (Latent Dirichlet Allocation) for microblogs filtering.[2]

In this paper, On day closing of Karachi Stock Exchange (KSE) is used for predicting the stock market return by using different learning models. In the paper, prediction model uses various attributes as an input and predicts stock market as Negative and Positive. The attributes that are used in the model includes rates of Oil, Gold, Silver, Foreign Exchange (FEX), Interest, NEWS and social media feed. Compared with various machine learning algorithms, the maximum accuracy was resulted by SVM. The algorithm produced 100% accuracy on training set but 60% on the test set with the average accuracy of 80%. [6]

In this paper, instead of using the news, social media or webforum's data, researchers [Zhihua Jiang et. al 2016] uses search indexes(Baidu Search Index, most popular search engine of China). Baidu Index is used for predicting the fluctuations in stock market. In the paper, a relation between the searched keyword and volatility of stock is found and a logistic regression model is built upon this for prediction.[7]

This paper studied the analysis of the announcement during the suspension period. It establish a prediction model based on content of announcement through NLP and try to predict the trend of next trade day. The researchers [Zhihua Jiang et. al 2016] focus on the announcement of the stock price during the suspension period (time when stock market stop trading). After that they select the appropriate classification algorithm for classifying the announcement as up and down. After properly classifying the announcements, they are used with stock data for prediction. Overall in this paper feasibility of using text classification to predict the trend of stock are analysed.[8]

In this paper, a new hybrid approach is used for the prediction of stock market in which sentiment are collected from different sources such as from news articles or from some social media platform like Twitter along with prediction using clustering algorithm. This is because it helps researchers to construct a model for predicting stock market movement. This model is based upon the opinion mining and clustering. In this paper, National Stock Exchange(NSE) market data is used. According to the researchers [Vivek Rajput et.al 2016], this methodology will result two output set. One is from sentiment analysis while another one from clustering based prediction with respect to some specialized parameters of stock exchange.[9]

In this paper researcher integrates sentiment analysis using the method based upon support vector machine. Since the stock data is nonlinear and dynamic, hence Support vector machine(SVM) is used in the prediction of the stock price as the SVM solution is unique and globally optimal. Along with the model researchers [Rui et. al 2018] employs sentimental analysis to create list of sentiments and then mix it with the stock's data. Furthermore, researchers [Rui et. al 2018] incorporate the day-of-a-week effect into cogitation which state that the average stock market return on Mondays is lower respective of the other days of the week and this effect helps to construct a more reliable and pragmatic sentiment indexes.[1]

IV. SURVEY REPORT

Table 4.1 Submerges the work accomplished by various researchers in this field-

S NO.	AUTHOR	PAPER TITLE	MODEL	ACCURACY
1.	Rui Ren, Desheng Dash Wu and Tianxiang Liu	Forecasting Stock Market Movement Direction Using Sentiment Analysis and Support Vector Machine(2018-IEEE)	1. Support Vector Machine	89.93% with a rise of 18.6%

2	D . 71	Constant of Desting the East free	1	C	C
2.	Bo Zhao, Yongji He, Chunfeng Yuan,	Stock Market Prediction Exploiting Microblog	1.	Support Vector	performance increases from
	and Yihua Huang	Sentiment Analysis(2016-IEEE)		Machine	64.81% to
	and Thua Huang	Sentiment Analysis(2010-IEEE)	2	Latent	69.09%.
			۷.	Dirichlet	09.09%.
				Allocation	
3.	Xiaotian Jin, Defeng	Enhanced Stock Prediction using Social	1.	Support	82.1%(Bullish)
	Guo, Hongjian Liu	Network and Statistical Model(2014 -		Vector Mashina	83.2%(Bearish)
		IEEE)		Machine	
				(SVM)	
				regression model	
			2.	Least square	
			۷.	regression	
			3.	Ridge	
			5.	regression	
4.	JiangJiao Duan,	Mining Opinion and Sentiment for Stock	1	Bayesian	up to between
	Jianping Zeng	Return		model	90.1%
	P8 2018	Prediction Based on Web-Forum			and 76.8%
	4	Messages(2013-IEEE)			
			10		
	M. CI. CI		10000	0	72 (0-1)
5.	Xi Chen, Zhi-jie He	Prediction of Stock trading signal based on	1.	Support	72.40%
		Support Vector Machine(2015-IEEE)		Vector	
			RA.	Machine	
			2.	(SVM) Piecewise	
			2.	linear	
				representation(
				PLR)	
6.	Mehak Usmani,	Stock market prediction Using Machine	1.	Neural	80%
	Syed Hasan Adil,	Learning technique(2016-IEEE)		Networks	
	Kamran Raza, Syed		2.	Support	
	SaadAzhar Ali			Vector	
			Manager	Machine	
			1	28	
7.	Zhihua Jiang, Yanna	BDI Based Stock Prediction(2016-	1.	Regression	High
	Chen	ICOACS)	San Carlos		
8.	Zhihua Jiang, Xixi	Announcement based stock prediction(2016-IEEE)	1.	Support	Upto 80%
	Pan, Pei Chen			Vector	
			1	Machine	
		W. Contraction of the second sec			
		×	-	(SVM)	
		7	2.	(SVM) Naive Bayes	
9.	Vivek Raiput	Stock Market Prediction Using Hybrid	2.	Naive Bayes	High
9.	Vivek Rajput, SarikaBobde	Stock Market Prediction Using Hybrid Approach(2016-ICCCA)		Naive Bayes Sentimental	High
9.		Stock Market Prediction Using Hybrid Approach(2016-ICCCA)		Naive Bayes Sentimental analysis	High
9.			1.	Naive Bayes Sentimental	High
9.			1.	Naive Bayes Sentimental analysis Clustering	High
9.			1.	Naive Bayes Sentimental analysis Clustering algorithm(Den	High
	SarikaBobde	Approach(2016-ICCCA)	1. 2.	Naive Bayes Sentimental analysis Clustering algorithm(Den clue)	
9.	SarikaBobde Xiaodong Li,	Approach(2016-ICCCA) Does Summarization Help Stock	1.	Naive Bayes Sentimental analysis Clustering algorithm(Den clue) Support	High 54.7%
	SarikaBobde Xiaodong Li, Haoran Xie,	Approach(2016-ICCCA) Does Summarization Help Stock Prediction? News Impact Analysis via	1. 2.	Naive Bayes Sentimental analysis Clustering algorithm(Den clue) Support Vector	
	SarikaBobde Xiaodong Li, Haoran Xie, Yangqiu Song,	Approach(2016-ICCCA) Does Summarization Help Stock	1. 2.	Naive Bayes Sentimental analysis Clustering algorithm(Den clue) Support Vector Machine	
	SarikaBobde Xiaodong Li, Haoran Xie, Yangqiu Song, Shanfeng Zhu, Qing	Approach(2016-ICCCA) Does Summarization Help Stock Prediction? News Impact Analysis via	1. 2.	Naive Bayes Sentimental analysis Clustering algorithm(Den clue) Support Vector	
	SarikaBobde Xiaodong Li, Haoran Xie, Yangqiu Song,	Approach(2016-ICCCA) Does Summarization Help Stock Prediction? News Impact Analysis via	1. 2. 1.	Naive Bayes Sentimental analysis Clustering algorithm(Den clue) Support Vector Machine (SVM)	

				(SPSR)	
11.	Ming-Chih Lin, Anthony J. T. Lee, Rung-Tai Kao, Kuo- Tay Chen	Stock Price Movement Prediction Using Representative Prototypes of Financial Reports(2011-ACM Transactions)	1.	HRK (Hierarchical agglomerative Clusterimg (HAC)and Recursive K- means clustering)	57.7% -76.9% (Depending upon different sectors)
12.	Pei-Chann Chang, Chin-Yuan Fan, and Chen-Hao Liu	Integrating a Piecewise Linear Representation Method and a Neural Network Model for Stock Trading Points Prediction(2009-IEEE)	1.	piecewise linear representation (PLR) backpropagati on neural network (BPN) models	profit improved by 16.5%

IV. CONCLUSION

Stock market research is an area where every one wishes they could gauge the sentiments before investing in it. Though predicting stock movements is not easy. Technologies allowed us predict the movements to a large extent, if not full. The standard classical theory which is based on Efficient Market Hypothesis (EMH) had been in the use for many years. But behavioral finance overtook the classical theory by considering the fact that human sentiment plays an important role in predicting the stock prices. Given that various media on the Internet publish news articles and most of the researchers found that automation of that analysis of huge amount of data could produce informed decisions in a short span of time. Properly analyzing it and employing them with the stock data results a good prediction model. In this research various machine learning algorithm are compared so as to get best of them which can be used for the model.

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