Back to Basics: Does Benjamin Graham Filters help identify Value Stocks on Nifty 500?

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Rukmini Devi Institute of Advanced Studies
E-mail: effulgence@rdias.ac.in, Website: www.rdias.ac.in
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Prof. Saurabh Agarwal¹

Dr. Megha Agarwal²

Abstract

Many Investment Scholars like Graham, Schloss, Greenblatt, Neff, Lynch and Buffett have provided investment wisdom that facilitates picking value stocks from a universe of available listed stocks. In this paper, we use Graham stock selection criteria to identify value stocks. The study tested the Benjamin Graham's investing strategy from 2010 to 2020 and compared the returns with benchmark index i.e. NSE 50. It was found that Graham filters were more suitable than benchmark index in eight years out of eleven years. We also calculated Treynor ratio to map the risk-reward ratio. Treynor ratio was also higher than benchmark index for six years.

Keywords: Value Investing, Graham Filters

INTRODUCTION

Benjamin Graham (1894-1976) contributed to the literature on security analysis through his books like Security Analysis (1934) and The Intelligent Investor (1949). He has carefully discussed the issues of value investing, margin of safety, statistical analysis of securities and ownership of enterprises. He used to divide investors as either "conservative" or "aggressive". His ideas lead to the development of alternative portfolios for risk averse and risk lovers. He always advised against buying at a premium.

When the equities markets are trading at a premium, it is advisable to invest in bonds. However, it is inevitable to get return and safety of principal at the same time. There is always a compromise which has to be reached. Real estate and Insurance were considered as poor investment option by Graham.

REVIEW OF LITERATURE

Oppenheimer and Schlarbaum (1981) found that positive risk-adjusted returns were available to investor who creates portfolios based on Benjamin

- 1. Professor and Principal, IIF College of Commerce and Management Studies, Affiliated to CCS University, Meerut
- 2. Assistant Professor, Rajdhani College, University of Delhi

Graham rules. A return of 3 to 3.5% higher than that given by index can be achieved by an investor. Investment Managers would incur very little cost by following the rules given by Graham as they are relatively easy to follow. Their results contradicted the semi-strong form of efficient markets hypothesis. Oppenheimer (1984) found that Graham's advice provided significant excess returns. The author applied ten criteria given by Graham. Stocks were listed on New York and American Stock Exchange. The results were based on data from 1974 to 1981. Portfolios based on Graham's advice gave a mean annual return of 38 per cent compared to CRSP index of NYSE-AMEX securities. However, the performance declined post 1976, the year the criteria were published. The excess returns were found even after risk adjustment and accommodating for firm

Vu (1988) showed that the net current asset value rule developed by Graham was profitable in the 1970s and early 1980s. The results are based on 107 stocks from April 1977 to December 1984 listed on New York Stock Exchange or the American Stock Exchange. The results were true for both merged and non-merged companies' part of sample. Lauterbach and Vu (1993) found that Ben Graham net current asset value rule provides excess returns. However, size adjusted excess return turn out to be zero. Excess return of 25 per cent could be made as per standard market model and minus 15 per cent according to Dimson and Marsh's size-control technique. The results were based on 121 NYSE stocks during the period of 1977-1984.

Bildersee, Cheh and Zutshi (1993) tested the Benjamin Graham's NCAV model on Japanese equity markets. It was found that positive normalised NCAV portfolios outperformed Japanese equity markets. The results were sensitive to holding period of investors. The results are based on stocks listed on Tokyo Stock Exchange from April 1975 to March 1988.

Klerck and Maritz (1997) found that using Graham's criteria an investor made better returns than Industrial Index. The returns of portfolios created using Graham's filter had an annual return of 9 per cent to 12 per cent higher than the industrial index. The results are based on stocks listed on Johannesburg Stock Exchange during the period 1977 to 1994. Xiao and Arnold (2008) tested the Benjamin Graham's Net Current Asset Value Strategy in London. They found that buying stocks whose net current asset value is greater than 1.5 times the current share price creates portfolios with returns higher than that given by market. The portfolios had stocks of smaller companies and high book-to-market ratios. The results are based on stocks part of London Share Price Database (LSPD) from 1980 to 2005.

Singh and Kaur (2014) tested the Graham's stock selection criteria for a period of 15 years for stocks listed on Bombay Stock Exchange. According to them, investors can screen stocks on the basis of any five rules to identifying value maximising securities.

Zakaria and Hashim (2017) found that in Saudi Arabia, Graham's stock selection criteria enable investors in generating abnormal returns. Satisfactory earnings, financial strength and Current ratio help identify stocks that can generate abnormal returns. The results are based on data from 2000 to 2011. However, the number of companies satisfying the criteria reduced from 23 (in 2000) to just 4 (in 2011).

Rani (2019) tested Graham's and Greenblatt's Formula for 2010 to 2018. The resultant portfolios were compared on the basis of return with NSE 50 and NSE 500. It was found that portfolios based on Graham's criteria outperformed benchmarks (NSE 50 and NSE 500) in five out of 8 years under study. Portfolios based on Greenblatt's criteria outperformed the benchmark (NSE 50 and NSE 500) in 6 years out of 8 years. Portfolio Risk was also less in Graham's portfolio as compared to benchmark portfolio or the Greenblatt portfolio. Greenblatt

criterion fared better in terms of risk-reward ratio. The Sharpe ratio, Treynor ratio, Sortino ratio and Jensen's alpha were all higher in Greenblatt portfolio as compared to either the benchmark portfolio (NSE 50 and NSE 500) or Graham's portfolio. Since most of the studies have been done internationally, there remains a need for studying the relevance of Graham's filters in emerging markets like India.

RESEARCH OBJECTIVES

- a. To compare the returns of portfolio created by Graham's filter and NSE Nifty 50
- b. To compare the performance of the portfolios on the basis of Treynor ratio

RESEARCH METHODOLOGY

Yearly data for NSE 500 stocks and Nifty 50 index has been extracted from CMIE prowess for a period of eleven years starting from 1st April 2010 to 31st March 2020. The yearly total returns, Price to earnings ratio, Price to Book Value Ratio, Dividend Yield, Beta, Total Assets and Paid up Equity Capital of NSE 500 stocks has been extracted. Earnings Yield has been calculated to be inverse of the Price to Earnings Ratio; Equity to Total Assets ratio has also been calculated.

Portfolios comprising of top 30 stocks for eleven different years have been created by sorting data on the basis of the following five Graham filters:

- 1. Price to Earnings Ratio
- 2. Earnings Yield
- 3. Equity/Total Assets Ratio
- 4. Price to Book Ratio
- 5. Dividend Yield

To sort the stocks to be included in the portfolio, the price to earnings ratio and price to book ratio are arranged in ascending order, while the earnings yield, Equity to Total Assets ratio and dividend yield are arranged in descending order. The stocks where the dividend yield was zero have been excluded from the portfolio. Graham advocates portfolios creating these filters would be able to beat the market if the rules to exit i.e. either when 50 percent returns are realized or three years whichever is earlier are met.

Table 1 depicts the stocks included in portfolios created from NSE 500 stocks in each of the eleven years from 2010-2020 by applying Graham Filters. There are certain stocks which are repeatedly meeting the Graham criteria and forming a part of the portfolio year after year.

Table 1: Portfolios Created as per Graham's Filters

S.No.	2010	2011	2012
1	Aarti Industries Ltd.	Aarti Industries Ltd.	Aarti Industries Ltd.
2	Atul Ltd.	Ajanta Pharma Ltd.	Avanti Feeds Ltd.
	Balkrishna Industries		
3	Ltd.	Atul Ltd.	Bliss G V S Pharma Ltd.
4	Bank Of Maharashtra	Bliss G V S Pharma Ltd.	CESCLtd.
5	Birla Corporation Ltd.	Can Fin Homes Ltd.	Can Fin Homes Ltd.
6	Can Fin Homes Ltd.	Canara Bank	Canara Bank
7	Canara Bank	Capri Global Capital Ltd.	Finolex Cables Ltd.
8	Central Bank Of India	Central Bank Of India	GHCLLtd.
		Chennai Petroleum Corpn.	
9	Finolex Industries Ltd.	Ltd.	Garware Technical Fibres Ltd.
10	GHCLLtd.	GHCLLtd.	Gayatri Projects Ltd.
		Garware Technical Fibres	
11	Graphite India Ltd.	Ltd.	Gujarat Alkalies & Chemicals Ltd.

		Gujarat State Fertilizers &	Gujarat Narmada Valley Fertilizers
12	Indian Bank	Chemicals Ltd.	& Chemicals Ltd.
			Gujarat State Fertilizers &
13	Indian Oil Corpn. Ltd.	J K Paper Ltd.	Chemicals Ltd.
14	Indian Overseas Bank	J K Tyre & Inds. Ltd.	Indian Bank
	J B Chemicals &		
15	Pharmaceuticals Ltd.	Jammu & Kashmir Bank Ltd.	Indian Oil Corpn. Ltd.
16	J K Cement Ltd.	K N R Constructions Ltd.	Indian Overseas Bank
	J K Lakshmi Cement		
17	Ltd.	KRBLLtd.	J K Cement Ltd.
18	J K Paper Ltd.	Magma Fincorp Ltd.	J K Lakshmi Cement Ltd.
19	J K Tyre & Inds. Ltd.	Maharashtra Seamless Ltd.	Jammu & Kashmir Bank Ltd.
	Jammu & Kashmir		
20	Bank Ltd.	Nava Bharat Ventures Ltd.	Kei Industries Ltd.
21	KRBLLtd.	Navin Fluorine Intl. Ltd.	Manappuram Finance Ltd.
22	M R F Ltd.	Phillips Carbon Black Ltd.	Navin Fluorine Intl. Ltd.
	Nava Bharat Ventures	Ratnamani Metals & Tubes	
23	Ltd.	Ltd.	Nilkamal Ltd.
	Navin Fluorine Intl.		
24	Ltd.	S R F Ltd.	Phillips Carbon Black Ltd.
25	Nilkamal Ltd.	Sonata Software Ltd.	Punjab National Bank
26	Ramco Cements Ltd.	Uco Bank	Ratnamani Metals & Tubes Ltd.
	Ratnamani Metals &		
27	Tubes Ltd.	Uflex Ltd.	S R F Ltd.
28	SRFLtd.	Vardhman Textiles Ltd.	Suprajit Engineering Ltd.
29	Uco Bank	Vinati Organics Ltd.	Uco Bank
	Vardhman Textiles		
30	Ltd.	Welspun Corp Ltd.	Uflex Ltd.

S.No.	2013	2014	2015
1	Aarti Industries Ltd.	Balmer Lawrie & Co. Ltd.	Canara Bank
2	Avanti Feeds Ltd.	Bank Of India	Capri Global Capital Ltd.
3	Bank Of Maharashtra	Can Fin Homes Ltd.	Ceat Ltd.
4	Bliss G V S Pharma Ltd.	Canara Bank	D C M Shriram Ltd.
5	Ceat Ltd.	Capri Global Capital Ltd.	GHCLLtd.
6	D C M Shriram Ltd.	Ceat Ltd.	Garware Technical Fibres Ltd.
7	Dewan Housing Finance Corpn. Ltd.	D C M Shriram Ltd.	Gujarat Alkalies & Chemicals Ltd.
8	Finolex Cables Ltd.	Dewan Housing Finance Corpn. Ltd.	Gujarat Mineral Devp. Corpn. Ltd.
9	GHCLLtd.	G H C L Ltd.	Gujarat State Fertilizers & Chemicals Ltd.
10	Garware Technical Fibres Ltd.	Garware Technical Fibres Ltd.	Himatsingka Seide Ltd.
11	Gayatri Projects Ltd.	Gayatri Projects Ltd.	Hindustan Petroleum Corpn. Ltd.

12	Gujarat Alkalies & Chemicals Ltd.	Gujarat Narmada Valley Fertilizers & Chemicals Ltd.	Hindustan Zinc Ltd.
	Gujarat Narmada Valley	Gujarat State Fertilizers &	
13	Fertilizers & Chemicals Ltd.	Chemicals Ltd.	Indiabulls Ventures Ltd.
	Gujarat State Fertilizers &	Hindustan Petroleum	
14	Chemicals Ltd.	Corpn. Ltd.	Indian Bank
15	Indian Bank	Indiabulls Ventures Ltd.	Jammu & Kashmir Bank Ltd.
16	J K Tyre & Inds. Ltd.	Indian Bank	Jindal Saw Ltd.
17	K N R Constructions Ltd.	J K Tyre & Inds. Ltd.	Karnataka Bank Ltd.
18	K P R Mill Ltd.	K N R Constructions Ltd.	N L C India Ltd.
19	KRBLLtd.	K P R Mill Ltd.	NMDCLtd.
			National Aluminium Co.
20	Kei Industries Ltd.	KRBLLtd.	Ltd.
21	Muthoot Finance Ltd.	P C Jeweller Ltd.	Power Finance Corpn. Ltd.
22	Navin Fluorine Intl. Ltd.	Power Finance Corpn. Ltd.	RECLtd.
23	Power Finance Corpn. Ltd.	RECLtd.	Rashtriya Chemicals & Fertilizers Ltd.
24	Punjab National Bank	South Indian Bank Ltd.	Reliance Infrastructure Ltd.
25	R E C Ltd.	Strides Pharma Science Ltd.	S J V N Ltd.
26	Ratnamani Metals & Tubes Ltd.	Tata Steel Ltd.	Tata Steel Ltd.
27	Reliance Infrastructure Ltd.	Uco Bank	Uco Bank
28	SRF Ltd.	Uflex Ltd.	Uflex Ltd.
29	Tata Steel Ltd.	Union Bank Of India	Union Bank Of India
30	Vardhman Textiles Ltd.	Vardhman Textiles Ltd.	Welspun India Ltd.

S.No.	2016	2017	2018
		Balrampur Chini Mills	
1	Apollo Tyres Ltd.	Ltd.	Balrampur Chini Mills Ltd.
		Bharat Petroleum Corpn.	Bharat Petroleum Corpn.
2	CESCLtd.	Ltd.	Ltd.
		Chambal Fertilisers &	Chennai Petroleum Corpn.
3	D C M Shriram Ltd.	Chemicals Ltd.	Ltd.
	Dewan Housing Finance Corpn.	Chennai Petroleum Corpn.	
4	Ltd.	Ltd.	D C M Shriram Ltd.
5	GHCLLtd.	Coal India Ltd.	GHCLLtd.
			Gujarat Alkalies &
6	Great Eastern Shipping Co. Ltd.	D C M Shriram Ltd.	Chemicals Ltd.
	Gujarat Alkalies & Chemicals		Gujarat Mineral Devp.
7	Ltd.	GHCLLtd.	Corpn. Ltd.
	Gujarat Mineral Devp. Corpn.	Glenmark Pharmaceuticals	Gujarat Narmada Valley
8	Ltd.	Ltd.	Fertilizers & Chemicals Ltd.
	Gujarat State Fertilizers &	Great Eastern Shipping	
9	Chemicals Ltd.	Co. Ltd.	HEGLtd.
	Hindustan Petroleum Corpn.	Gujarat Alkalies &	Hindustan Petroleum
10	Ltd.	Chemicals Ltd.	Corpn. Ltd.
			Housing & Urban Devp.
11	Hindustan Zinc Ltd.	Heritage Foods Ltd.	Corpn. Ltd.

		Hindustan Petroleum	
12	J K Tyre & Inds. Ltd.	Corpn. Ltd.	Indian Oil Corpn. Ltd.
13	JSW Energy Ltd.	Indian Bank	J K Paper Ltd.
14	Jammu & Kashmir Bank Ltd.	Indian Oil Corpn. Ltd.	Jindal Saw Ltd.
15	Jindal Saw Ltd.	J K Paper Ltd.	L I C Housing Finance Ltd.
16	Karnataka Bank Ltd.	J S W Steel Ltd.	MOIL Ltd.
17	Lakshmi Vilas Bank Ltd.	Jindal Saw Ltd.	Mangalore Refinery & Petrochemicals Ltd.
18	M R F Ltd.	Karnataka Bank Ltd.	Muthoot Finance Ltd.
19	Muthoot Finance Ltd.	Karur Vysya Bank Ltd.	N H P C Ltd.
20	National Fertilizers Ltd.	Larsen & Toubro Infotech Ltd.	N L C India Ltd.
21	Oil India Ltd.	Manappuram Finance Ltd.	N M D C Ltd.
22	PTC India Ltd.	N L C India Ltd.	Oil & Natural Gas Corpn. Ltd.
23	Power Finance Corpn. Ltd.	Oil India Ltd.	Oil India Ltd.
24	R E C Ltd.	PTC India Ltd.	P C Jeweller Ltd.
25	Reliance Capital Ltd.	R E C Ltd.	PTC India Ltd.
26	SJVN Ltd.	SJVN Ltd.	Power Finance Corpn. Ltd.
27	South Indian Bank Ltd.	Tata Steel Ltd.	Power Grid Corpn. Of India Ltd.
28	Uflex Ltd.	Trident Ltd.	R E C Ltd.
29	Vardhman Textiles Ltd.	Vedanta Ltd.	S J V N Ltd.
30	Vedanta Ltd.	Welspun India Ltd.	Vardhman Textiles Ltd.

S.No.	2019	2020
1	Balrampur Chini Mills Ltd.	Balrampur Chini Mills Ltd.
2	Bombay Dyeing & Mfg. Co. Ltd.	Bombay Dyeing & Mfg. Co. Ltd.
3	D C M Shriram Ltd.	Chambal Fertilisers & Chemicals Ltd.
4	GHCLLtd.	D B Corp Ltd.
5	Graphite India Ltd.	GHCLLtd.
6	Gujarat Alkalies & Chemicals Ltd.	Gayatri Projects Ltd.
7	Gujarat Mineral Devp. Corpn. Ltd.	Gujarat Mineral Devp. Corpn. Ltd.
8	Gujarat State Fertilizers & Chemicals Ltd.	HEGLtd.
9	HEGLtd.	Himatsingka Seide Ltd.
10	Hindustan Petroleum Corpn. Ltd.	Housing & Urban Devp. Corpn. Ltd.
11	Housing & Urban Devp. Corpn. Ltd.	Indiabulls Housing Finance Ltd.
12	Indiabulls Housing Finance Ltd.	J K Paper Ltd.
13	J K Paper Ltd.	Jindal Saw Ltd.
14	Jindal Saw Ltd.	Karnataka Bank Ltd.
15	Karnataka Bank Ltd.	Maharashtra Seamless Ltd.
16	MOIL Ltd.	N C C Ltd.
17	Maharashtra Seamless Ltd.	N L C India Ltd.

18	N L C India Ltd.	N M D C Ltd.
19	N M D C Ltd.	Nava Bharat Ventures Ltd.
20	National Aluminium Co. Ltd.	Oil & Natural Gas Corpn. Ltd.
21	National Fertilizers Ltd.	P N B Housing Finance Ltd.
22	Oil & Natural Gas Corpn. Ltd.	PTC India Ltd.
23	Oil India Ltd.	Phillips Carbon Black Ltd.
24	PTC India Ltd.	Power Finance Corpn. Ltd.
25	Phillips Carbon Black Ltd.	RECLtd.
26	RECLtd.	Repco Home Finance Ltd.
27	Reliance Infrastructure Ltd.	SJVN Ltd.
28	S J V N Ltd.	Shriram City Union Finance Ltd.
29	Tata Steel Ltd.	South Indian Bank Ltd.
30	Trident Ltd.	Tata Steel Ltd.

Source: Author Compilation based on data from CMIE Prowess

Some of stocks which are repeatedly forming a part of our portfolio are Aarti Industries Ltd., Can Fin Homes Ltd., Canara Bank, GHCL Ltd., Gujarat State Fertilizers & Chemicals Ltd., J K Tyre & Inds. Ltd., Jindal Saw Ltd., NMDC Ltd., Uco Bank, Tata Steel etc.

The total returns and beta of the stocks in a portfolio are used as inputs to compute the Portfolio Return and Portfolio Beta. The Portfolio Returns and Portfolio Betas of the portfolios created as per Graham's filters are depicted in Table 2 and Table 3 respectively. The portfolios are evaluated for performance based on Treynor ratio.

Table 2: Portfolio Returns

Years	2010	2011	2012	2013	2014	2015	2016	2017	2018	2019	2020
2010	0.94	-1.64	1.77	-0.10	-0.70	-0.50	-0.36	1.01	0.56	-1.65	0.15
2011		-1.39	0.84	-0.30	-1.48	0.08	-0.26	1.52	0.44	-1.59	0.50
2012			1.65	-0.24	-1.02	0.26	-0.12	1.88	0.84	-1.65	0.60
2013				-0.02	-1.70	-0.18	-0.23	1.30	1.02	-2.01	0.77
2014					-2.06	0.39	-0.50	2.02	0.26	-2.29	1.04
2015						0.48	-0.70	1.92	0.97	-1.66	0.75
2016							-0.30	1.50	0.84	-1.22	2.09
2017								0.71	0.52	0.07	2.58
2018									0.25	-0.37	1.69
2019		·						·		-1.57	1.84
2020											2.16

Source: Computed by Authors based on data from CMIE Prowess

Table 3: Portfolio Beta

Portfolios	2010	2011	2012	2013	2014	2015	2016	2017	2018	2019	2020
2010	1.01	1.03	1.02	1.02	1.17	1.22	1.19	1.22	1.25	1.26	1.19
2011		1.05	1.04	1.05	1.16	1.19	1.22	1.22	1.28	1.38	1.33
2012			1.04	1.06	1.18	1.27	1.29	1.35	1.38	1.42	1.33
2013				1.16	1.23	1.27	1.30	1.32	1.35	1.43	1.35
2014					1.21	1.42	1.44	1.48	1.51	1.59	1.46
2015						1.37	1.41	1.47	1.52	1.56	1.44
2016							1.32	1.37	1.40	1.41	1.29
2017								1.22	1.26	1.30	1.24
2018									1.24	1.26	1.22
2019										1.42	1.42
2020	·	·	·	·		·				·	1.42

Source: Computed by Authors based on data from CMIE Prowess

EMPIRICAL RESULTS AND ANALYSIS

As per Graham's filters the portfolio created in 2010 generates returns (0.94) higher than the index returns for the same year (0.72). Graham advocates exiting if a return more than 50% is realized. Hence, we must exit the portfolio in the first year itself as the goal has been realized. The 2011 portfolio, 2013 portfolio, 2014 portfolio give a negative return in the first year vis a vis an index return of 8.9 percent. It is not able to beat the market and hence we would exit in the maximum allowed period of three years. The 2012 portfolio generates a high return in the first year (1.65) compared to the negative index returns (-0.08).

The Graham portfolio created in year 2015 generate returns (1.7) higher than index returns (0.12) if held for three years as suggested by Graham. The same applies to 2016 portfolio, 2017 portfolio, 2018 portfolio and 2020 portfolio. The 2019 portfolio is also able to generate a return higher than the index in its two years holding period.

The Graham portfolios are able to generate a higher

return than the index either in the first year or three years of their holding time. This however was not true for three of the eleven portfolios created for the years 2011, 2013 and 2014.

Table 3 depicts the Graham's portfolios systematic risk as measured by beta. Portfolio beta has been computed as it is more relevant than the total risk (variance/standard deviation) for diversified portfolios like here. The portfolio betas are consistently higher than 1 depicting a higher risk than the index. However, this increased risk is compensated with a higher return generated by these portfolios. Table 4 presents the closing prices, returns and beta for the Nifty 50 which is used as a proxy of the market for our study. This data has been extracted from CMIE prowess for a period of 1st April 2009- 31st March 2020. Returns are calculated by using the formula (Rt - Rt-1)/ Rt-1. The mean market (index) returns for Nifty 50 are a little higher than 13 percent (13.09) for the eleven years period under consideration. The systematic risk is lesser too (0.93) in comparison to the portfolios created using Graham's filters.

Table 4: Index Returns and Beta

Nifty 50	Closing Price	Return	Beta
2010	5278	0.724837	0.98
2011	5749.5	0.089333	0.97
2012	5248.15	-0.0872	0.94
2013	5930.2	0.12996	0.92
2014	6696.4	0.129203	0.88
2015	8181.5	0.221776	0.92
2016	7849.8	-0.04054	0.92
2017	9304.05	0.185259	0.92
2018	10739.35	0.154266	0.92
2019	11748.15	0.093935	0.92
2020	9859.9	-0.16073	0.92
11 years	Mean Returns	0.130918	0.93

Source: Computed by Authors based on data from CMIE Prowess

The portfolios created using Graham filters were able to provide higher returns than the market if the rules for exit are followed (return higher than 0.5 or three years holding period whichever is earlier) for eight of the eleven portfolios. This shows that Graham filters are able to beat the Indian stock markets when stocks are chosen from the NSE 500 stocks.

To further substantiate our results we conducted Mann-Whitney U test to see if the returns of our portfolio are significantly different from the returns generated by the Nifty 50 index. To compute the

returns of the portfolio again the Graham exit rules are followed. When more than 50 percent returns are realized in the first year itself, these returns become the portfolio returns. When more than 50 percent returns are realized in the first two years we average returns of these two years to find portfolio returns. Else, the returns for three years of holding period are averaged to compute the portfolio returns as this is the maximum time an investor can hold a Graham portfolio. Table 5 depicts the portfolio returns as well as index returns used for comparison. It also shows the portfolio beta computed following the same exit rules.

Table 5: Returns and Systematic Risk

Years	Portfolios Returns	Index Returns	Portfolio Beta	Index Beta
2010	0.94267	0.72484	1.01	0.98
2011	-0.28344	0.08933	1.05	0.97
2012	1.65467	-0.08720	1.04	0.94
2013	-0.63356	0.12996	1.22	0.92
2014	-0.72078	0.12920	1.36	0.88
2015	0.56478	0.22178	1.42	0.92
2016	0.60150	-0.04054	1.35	0.92
2017	0.70733	0.18526	1.22	0.92
2018	0.52544	0.15427	1.24	0.92
2019	0.13250	0.09393	1.42	0.92
2020	2.16433	-0.16073	1.42	0.92

Source: Computed by Authors based on data from CMIE Prowess

As our sample size was lesser than 30 and to relax the normality conditions in the data, we performed Mann-Whitney U test to compare the returns generated by Graham's portfolios and market index Nifty 50. This was done using SPSS 20. Equal numbers of observations (11 each) were used in the analysis. Table 6 presents the results of the statistical tests conducted. It clearly shows the mean rank of returns generated by Graham's portfolio (13.27) to be considerably higher than the mean rank of the

returns generated by the market index Nifty 50 (9.73). This means Graham's portfolios were able to generate a higher return than in the index return for a period of 2010-2020. However, these results are not statistically significant at a significance level of 5 percent. Thus we don't have any evidence to conclude that the returns generated using Graham's filters are better than the returns generated by the market index Nifty 50 using the 2 sample independent Mann-Whitney U test.

Table 6: Results of Mann-Whitney U Test on Returns

	Groups	N	Mean Rank	Sum of Ranks
Returns	Graham	11	13.27	146.00
	Portfolio			
	Market	11	9.73	107.00
	Index			
	Total	22		

Test Statistics			
	Returns		
Mann-Whitney U	41.000		
Wilcoxon W	107.000		
Z	-1.280		
Asymp. Sig. (2-tailed)	.200		
Exact Sig. [2*(1-tailed Sig.)]	.217 ^b		

Source: Computed by Authors based on data from CMIE Prowess and SPSS 20

To further compare the performance of our portfolios with the market portfolio, we calculate the 'Trenyor ratio'. This ratio is a reward to risk ratio with excess return generated by the portfolio over risk free rate in the numerator and systematic risk (beta) as the denominator.

Treynor Ratio = [Portfolio Return (R_p) - Risk free Return (R_f)]/ Portfolio Beta (β_p)

The return on 364 days Treasury bill is taken as a proxy for the risk free return. This is 6.5 percent as on 1st April 2019. We have calculated the ratios again based on Graham's exit rules. When at least 50

percent return is generated in the first year itself we take the return and beta of only the first year for ratio calculation as the investor would exit here. If at least 50 percent returns are generated in the first two years then returns of these two years are averaged for ratio calculation. Else, the returns of three years are averaged as this is the maximum period for which the investor would hold a Graham portfolio. The corresponding Treynor ratios for Nifty 50 are also computed so as to facilitate a comparison between Graham's portfolios and the market. The Treynor ratios are presented in Table 7.

Table 7: Treynor Ratios

Years	Portfolios Trenyor Ratio	Markets Trenyor Ratio
2010	0.86498	0.67330
2011	-0.03699	0.02509
2012	1.53542	-0.16191
2013	-0.06348	0.07061
2014	-0.19280	0.07296
2015	0.03923	0.17041
2016	0.09956	-0.11472
2017	0.52780	0.13072
2018	0.04128	0.09703
2019	0.04754	0.03145
2020	1.47529	-0.24536

Source: Author Calculations

We can see that the Graham portfolio does better than the market for the years 2010, 2012, 2016, 2017, 2019 and 2020. In fact in the year 2020 when the market performance as per Treynor ratio is negative, the Graham portfolio is able to generate high positive returns. In these years the Graham portfolios were able to outperform the market. Our results are sensitive to investors holding period. However, following Graham's strategy not all investors were profitable as the Treynor ratios were negative occasionally for the investment period 2011, 2013 and 2014.

CONCLUSIONS

Like Oppenheimer and Schlarbaum (1981), Vu (1988), Lauterbach and Vu (1993), Bildersee, Cheh and Zutshi (1993), Klerck and Maritz (1997), Xiao and Arnold (2008), Singh and Kaur (2014), Zakaria and Hashim (2017) and Rani (2019), we found that portfolios based on Graham's filters outperformed the index. However, our results are sensitive to investment holding period. This shows that Graham filters can be used by active players like Financial Institutions, Mutual Funds and Investment Advisors. Holding Graham's portfolios passively would not yield positive returns over long run. Out of the eleven year, the returns for three years were negative exhibiting that Graham's filters can

facilitate optimal portfolio creation but in some years the returns may turn out to be negative. The portfolio beta was also higher for portfolio's created using Graham's filters. This clearly shows higher risk in portfolios based on Graham's filters. When we evaluate performance of portfolios based on Treynor ratio, we observe that portfolio based on Graham's filters perform better in six out of eleven years.

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