## Impact of Behavioral Factors in Making Investment Decisions and Performance: Study on Investors of National Stock Exchange

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### Abstract

Market anomalies and irrational behavior caused investors changes in the stock market, and this has led to an investigation into the impact of various behavioral biases and factors affecting decision-making for individual investors. The purpose of this study was to find out the effect of the four factors, heuristic, prospect, market, herding on decisions of investors at NSE. Data are collected from the questionnaire on the basis of a likert scale. To determine the reliability of the questionnaire, the Cronbach alpha factor, which was 0.728, was used. EFA and multiple regression tests have been applied. Cronbach-alpha was used to check the interal consistency of the element. Cronbach alpha emphasized to each factor: Heuristic, Prospect, Market, Herding, Investment performance and Investors decisions that consistency at an acceptable level. The result of the analysis is that the four variables have greatly influenced the investment decision and return on investment. All behavioral variables have a significant impact on the decision-making process of investors, which led to the acceptance of all assumptions regarding the level of influence of behavioral factors in decision making for individual investors.

**Keywords:** heuristic, prospect, market, herding, investment performance and investors' decision

### 1. Introduction

### 1.1 Introduction to Problem

The stock market trends are determined by the investor's decision. Traditional finance has been used in the past year to understand how investors make their investment decisions. Most traditional financial theories consider investors as rational decision makers. This means that when an investor receives information, the investment decision is taken according to beliefs and updated information. In recent decades, it has been the concept of behavioral finance that combined psychological and sociological theories with finance. Behavioral finance was first considered by psychologist Daniel Kahneman and economist Vernon Smith, who received the Nobel Prize for Economics in 2002. In this context, psychologist Daniel Kahneman and Amos Tversky contributed to the field of psychology and finance and characterized the new field as behavior finance in the 1980s and this field is basically about how different people act in the financial markets or in financial environments. Basically, financing is based on how financial decisions of individuals and companies are affected by psychology in financial environments (Nofsinger, 2001).

This was the moment when the economy began to believe that investors were sometimes irrational and that their decisions might be biased due to the inability to process complex information and the lack of mental abilities. Therefore, your investment decisions are sometimes based on shortcuts of information processing and emotional files.

Understanding investors' decision making needs to study the behavioral factors that influence the decision of the investors of the National Stock Exchange. The paper attempts to study the behavioral factors (heuristics, prospects, market and herding) in the investment decision of the investors, which may even lead to the return of the investment.

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"Behavior of investor is a part of behavior finance, which seeks to understand and predict systematic financial market implications of psychological decision processes. Behavior finance closely combines individual behavior and market phenomena and uses knowledge taken from both the psychological field and financial theory." (Fromlet, 2001).

### 1.2 Heuristic Theory

In fact, heuristic methods are a golden rule and short spiritual clues that lead to greater comfort in the decision-making process, especially in complex and uncertain environments (Kahneman & Tversky, 1979). Kahneman and Tversky (1979) are the first authors to introduce factors heuristic methods into three sets including representativeness bias availability and anchor (Kahneman & Tversky, 1979). Waweru et al. (2008) added two factors to the heuristic factors that included the player's deception and belief.

### Representation

It is a tendency of investors to make investment decisions, assuming that recent events will continue in the future and ignore their long-term impact. They also buy some shares based on a few sample stocks, those with the highest sales. The representation refers to the degree of similarity that an event has with its older population (DeBondt & Thaler, 1995) or the extent to which the population appears (Kahneman & Tversky, 1979). Representation can lead to a certain prejudice, if people are overweight in recent experience and ignore the long-term average rate (Ritter, 2003).

**Overconfidence** is that investors overestimate their knowledge based on their positive market experience. In such a case, the investor underestimates the risk and his excessive optimism leads him to invest with little diversification. When people overestimate the reliability of their knowledge and skills, it is the manifestation of overconfidence (DeBondt & Thaler, 1995, p. 389; Hvide, 2002).

**Anchoring** refers to investors who use historical trends to define the size of stock prices and make investment decisions. The anchor is a phenomenon used in the situation where people use it to estimate some initial values, which are preferred for the initial, since the different starting points produced different estimates (Kahneman & Tversky, 1979).

**Gambler's** fallacy is the perception of investors that the trend will return to the market in a positive way. This prejudice arises in the stock market when the investor mistakes the inverse points and is considered the end of good or bad results. Investors are trying to predict the conversion into stocks when they suffer from this bias, believing that this trend will return (Waweru et al., 2008).

**Availability bias** is based on the information available to investors. They make their investment decisions based on the information they have and therefore invest in family companies in a less diversified way.

## 1.3 Prospect Theory

It describes the decision-making process of the investor. The investor can regret his decision which can lead to the loss. The levels of mental stress caused by loss or profit are the aversion to loss and the investor's evaluation of their financial transaction prepares them to invest or avoid investments, which are called their spiritual accounting. According to Huang (2001), there are two forms of spiritual accounting that include loss-making and a narrower framework in two asset valuation frameworks, one for the individual shares and the other for the portfolio. The individual inventory framework was more successful. This enables an investor to organize his portfolio, which can lead to better performance and thus improve return on investment.

## 1.4 Market Theory

Investor decisions are influenced by changes in market prices, stock preferences, changes in consumer reactions, etc. This can lead an investor to respond to the market situation insufficiently or excessively. Changes in fundamental values, the market price, market information can lead to the reaction of an investor and his decisions to invest in the market. Investors can mistakenly observe that market information can affect their decisions in the market and this over-reaction can in turn lead to significant stock market changes. Past trends in equities should not motivate the investor to respond to expectations and past experience. The market-related factors are not behavioral factors, but affect investor behavior and can lead to significant changes in investor decision-making.

## 1.5 Herding Effect

It's the tendency of investors to follow the reactions of others. Grazing is considered an important factor, as it greatly influences the risk characteristics and performance values (Tan, Chiang, Mason, & Nelling, 2008). The heritage can greatly contribute to the analysis and performance evaluation because individuals with poor ability

try to imitate individuals' behaviors that have a great ability to develop their reputation (Kallinterakis, Munir, & Markovic, 2010), the decisions of buying and selling other investors depend on the decisions of other investors as this leads to a decrease risk The efficient market is due to the fact that rational investors do not follow the masses, rating leads to speculative conditions that make the market ineffective.

**Perceived risk**: the risk capacity of investors varies from person to person. A subjective construct influenced by how the event is interpreted (Tversky & Koehler, 1994; Weber, 2004). Investors' perception of risk is influenced by the amount of information available to them. Incomplete information can lead to greater risk and in turn can cause a loss. The tendency to risk is a common risk-taking behavior. Weber et al. (2002) has a scale of risk appetite specific domain, including the financial domain, which differentiates domain between investment and gambling. They found that perception of benefits and risks, and keeping no danger, are related to gender differences and risk-taking domination.

## 1.5 Objective of the Study

- 1) To identify the behavioral variables influencing individual investment decision makers at the NSE.
- 2) To know the impact levels (if any) of the behavioral factors influence the individual investment decisions at the NSE.
- To know the impact of the individual investment decisions on the investment performance of investors at the NSE.

## 2. Research Methodology

The study population consisted of individual NSE investors. A cross-sectional design was used in this study. The study conforms to the nature of this study to describe the general trend of investor behavior rather than a specific case and the data from this study were not compiled in phases, but were performed in a single period. The data collected from the questionnaires provide the basic concepts of the factors that influence investor decisions. The application documents were sent to 361 respondents using stratified random sampling.

### 2.1 Design of Measurements and Questionnaire

To measure the data, we used a questionnaire divided into 3 parts: personal information, behavioral factors that influence investment decisions and the impact on return on investment. The 5-point Likert scales were used to assess the degrees of investor's decision agreement with the impact of behavioral factors in the investment decision, as well as the return on investment. The 5 points on the scale are respectively from 1 to 5: strongly disagree, disagree, neutral, agree and strongly agree.

Behavioral factors influencing the investors' decision-making are divided into four groups: heuristic, prospect, market, and herding effect, which are presented in the Table 1, Table 2 and Table 3.

Table 1. Variable description

Theory	Behavioral variables			
Heuristic Theory	- Representativeness			
	- Overconfidence			
	- Anchoring			
	- Gambler's fallacy			
	- Availability bias			
Prospect Theory	- Loss aversion			
	- Regret aversion			
	- Mental accounting			
Market	- Price changes			
	- Market information			
	- Past trends of stocks			
	- Fundamentals of underlying stocks			
	- Customer preference			
	- Over-reaction to price changes			
Herding Effect	- Buying and Selling decisions of other investors			
	- Choice of stock to trade of other investors			
	- Volume of stock to trade of other investors			
	- Speed of herding			

### Table 2. Variable description

Investment Decisions	I feel it is risky to invest in stocks market
	I want to invest in share market in the next time
	I am likely to invest in share market in the next time

### Table 3. Variable description

	The return rate of my recent stock investment meets my expectation.			
Investment Performance	My earned rate of return is equal to or higher than the average return rate of the market.			
	I am satisfied with my investment decisions in the last year (including selling, buying,			
	choosing stocks, and deciding the stock volumes).			

### Research Model

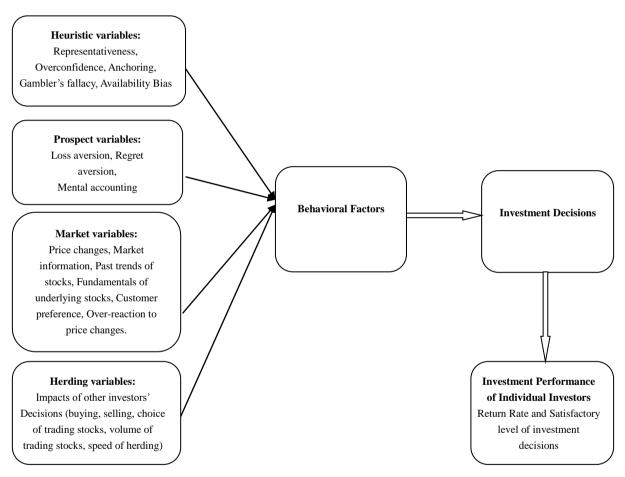


Figure 1. Research model

## 2.2 Hypotheses

H1: The behavioral variables that influence the investment decisions of individuals at the National Stock Exchange are grouped in four factors as the reviewed theories: Heuristics, Prospect, Market, and Herding.

H2: The behavioral factors have influence on the investment decisions of individual investors at the National Stock Exchange at high levels.

H3: The investment decisions of individual investors have positive influence on the investment performance at the National Stock Exchange.

### 2.3 Data Analysis Method

The data collected was processed and analyzed by SPSS. The statistical techniques used for the data to reach the objectives of the research include descriptive statistics, factor analysis and multiple regression analysis.

A total of 500 questionnaires were distributed for data collection, but 361 were completed and processed. Exploratory factor analysis (EFA) and multiple regression tests were used to identify the factors of investor behavior and to know the impact of behavioral factors in investment decisions and impact of investment decisions on investment performance.

### 2.4 Multicollinearity

In order to detect multicollinearity problem among independent variable multicollinearity test was applied.

### 3. Analysis and Interpretation

# 3.1 Factor Analysis of Behavioral Variables Influencing the Individual Investment Decisions and Investment Performance

The exploratory factor analysis (EFA) is used for the variables of behavior and return on investment (Q1 to Q18) to identify the factors to which these variables belong to the requirements of the factor analysis to reduce the variables. After a few rounds to eliminate the insufficient variables, the analysis shows that the remaining variables are grouped into six factors (five factors of behavioral variables and an investment performance factor), in the KMO = 0.649 (sig = 0.000), % of the total variance explained = 69.544%, and all factor loads are more than 0.5. These indices show that the factor analysis for these variables is quite adequate and accepted. The result is presented in the Table 4.

Table 4. KMO and Bartlett's test

Kaiser-Meyer-Olkin Measure of Sar	.649	
	Approx. Chi-Square	2158.024
Bartlett's Test of Sphericity	Df	153
	Sig.	.000

	Communalities						
	Initial	Extraction					
H1	1.000	.875					
H2	1.000	.678					
H3	1.000	.733					
H4	1.000	.531					
HUR1	1.000	.785					
HUR2	1.000	.814					
HUR3	1.000	.689					
IP1	1.000	.519					
IP2	1.000	.821					
IP3	1.000	.789					
PROS1	1.000	.659					
PROS2	1.000	.722					
PROS3	1.000	.665					
M1	1.000	.651					
M2	1.000	.716					
PR1	1.000	.643					
PR2	1.000	.650					
PR3	1.000	.577					

Extraction Method: Principal Component Analysis

Total Variance Explained

Component	onent Initial Eigenvalues			Extraction Sums of Squared Loadings			Rotation Sums of Squared Loadings		
	Total	% of Variance	Cumulative %	Total	% of Variance	Cumulative %	Total	% of Variance	Cumulative %
1	3.792	21.066	21.066	3.792	21.066	21.066	3.112	17.291	17.291
2	2.114	11.745	32.811	2.114	11.745	32.811	2.333	12.961	30.252
3	2.007	11.148	43.959	2.007	11.148	43.959	2.064	11.464	41.716
4	1.840	10.224	54.184	1.840	10.224	54.184	1.950	10.835	52.551
5	1.673	9.296	63.480	1.673	9.296	63.480	1.863	10.353	62.903
6	1.092	6.064	69.544	1.092	6.064	69.544	1.195	6.641	69.544
7	.886	4.923	74.467						
8	.738	4.103	78.570						
9	.597	3.317	81.887						
10	.546	3.032	84.919						

11	.536	2.980	87.900
12	.477	2.652	90.551
13	.452	2.509	93.060
14	.335	1.860	94.920
15	.313	1.737	96.657
16	.262	1.455	98.112
17	.191	1.060	99.172
18	.149	.828	100.000
Extraction 1	Method: Pri	ncipal Compo	nent Analysis.

## 3.1.1 Factor Analysis

## **INFERENCE:**

KMO and Bartlett's test Table 4. KMO statistics is greater than 0.05, indicating that factor analysis can be used for given data.

- In this KMO AND Bartlett's test, sampling adequacy is .649 which is above then .5, which means sampling adequacy is accurate.
- ➤ Bartlett's test value is .000 which is significant value.

### INTEREPRETATION:

From the Table 4, it is inferred that the given value is more than 1 for four factors and the cumulative value is accumulated to the extent of 69.544 the variable is well explained by the six factors.

Table 5. Rotated Component Matrix<sup>a</sup>

Factors	Variables	Factor Loading						
		F1	F2	F3	F4	F5	F6	
Herding	Q.1 My Investment decision of purchasing shares is influenced by decisions of other investors.	.730						
	Q.2 My Decision of purchase of volume of stock is affected by other investors purchase.	.720						
	Q.3 Other investors' decisions of buying and selling stocks have impact on my investment decisions	.670						
	Q.4 I usually react quickly to the changes of other investors' decisions and follow their reactions to the stock market	.646						
Heuristics	Q.5 I believe that my skills and knowledge of stock market can help me to outperform the market.		.770					
	Q.6 I rely on my previous experiences in the market for my next investment.		.735					
	Q.7 I try to estimate the changes in stock prices in the future based on the current stock prices.		.697					
Investment	Q.16 I feel it is risky to invest in stocks market			.807				
Decision	Q.17 I want to invest in share market in the next time			.756				
	Q.18 I am likely to invest in share market in the next time			.421				
Investment	Q.8 The return rate of my recent stock investment meets my expectation.				.676			
Performance	Q.9 My earned rate of return is equal to or higher than the average return rate of the market.				.628			
	Q.10 I am satisfied with my investment decisions in the last year (including selling, buying, choosing stocks, and deciding the stock volumes).				.496			
Prospect	Q.11 After a prior gain, I have become more risk seeking than usual.					.822		
	Q.12 After a prior loss, I have become more risk averse.					.557		
	Q.13 You avoid selling shares that have decreased in value and readily sell shares that have increased in value.					.413		
Market	Q.14 I react to price change of stocks in market						.693	
	Q.15 I analyze the companies' customer preference before investing in their stocks						.383	
	Extraction Method: Principal Component Analysis.							
	Rotation Method: Varimax with Kaiser Normalization.							
	a. Rotation converged in 9 iterations.							

### INTERPRETATION

As shown in the table 5 the variables herding, heuristics, investment performance, prospect, and market are grouped into related factors. Some of the factor loadings of the variables have been removed from the analysis since their factor loadings are less than 0.5. The result illustrates those behavioral variables that are the investment decisions of individuals in the NSE are grouped into four factors such as the revised theories: Herding, Heuristics, Prospect and Market, and hence supporting H1. As such, there are four behavioral factors that influence investment decisions of individual investors in the NSE. Factor in the herding, the four original questionnaire variables remain after factor analysis.

### 3.2 Reliability

Table 6. Reliability table

Variables	Cronbach' Alpha
Herding	0.766
Heuristics	0.748
Prospect	0.694
Market	0.610
Investment Decisions	0.651
Investment Performance	0.619
Overall Reliability	0.709

The internal consistency of the items used to measure each factor was calculated using the Cronbach's alpha, which is the procedure of choice to examine the internal consistency of the items using the Likert-type scale (Walsh & Betz, 1995). Cronbach's alpha for each factor: factor 1 (Herding), factor 2 (Heuristics), factor 3 (Investment performance), factor 4 (Prospect), factor 5 (Market), factor 6 (Investment decision) was 0.766, 0.748, 0.619,.694, 610 and 0.651, respectively. As the marginal acceptable reliability should be higher than 0.60 (Gliner& Morgan, 2000), all the measures in this study are above 0.60, demonstrating reliability. Therefore, the results of the reliability analysis confirmed that consistency on each of the factors is at an acceptable level.

Table 7. Overall reliability

Scale: ALL VARIABLES Overall Reliability

Case Processing Summary						
		N	%			
	Valid	322	89.2			
Cases	Excluded <sup>a</sup>	39	10.8			
	Total	361	100.0			
a. Listwise deletion based on a	all variables in the procedure.					
Reliability Statistics						
	Cronbach's Alpha		N of Items			
	.709		18			
	Item Statistics					
	Mean	Std. Deviation	N			
H1	3.0435	1.28663	322			
H2	3.0807	1.11056	322			
Н3	3.3975	.94904	322			
H4	2.3416	1.06256	322			
HUR1	3.5559	.89215	322			
HUR2	3.6739	.98708	322			
HUR3	3.6584	.87972	322			
IP1	3.4348	.85221	322			
IP2	3.0807	1.16798	322			
IP3	3.5124	1.01461	322			
PROS1	3.4379	.86694	322			
PROS2	3.6335	1.00893	322			
PROS3	3.6398	.94755		322		

M1	3.5342	.95396	322
M2	3.8199	.84932	322
PR1	3.3230	.93130	322
PR2	3.5404	.96347	322
PR3	3.2174	1.13947	322

Table 8. Regression

		Variabl	les Entered/Remo	ved <sup>a</sup>				
Model		Variables Entered		Variables Removed Metho				
1	Herding, Heuristi	cs, Prospect Market				Enter		
a. Depende	ent Variable: investment d	lecisions						
b. All reque	ested variables entered.							
Model Sun	nmary							
Model		R	R Square Adjusted R Square		Std. Error of the Estimate			
1	.5	.571ª		.318	.53525			
a. Predictor	rs: (Constant), Herding, I	Heuristics, Prospect and M	/Iarket					
ANOVAa								
Model		Sum of Squares	Df	Mean Square	F	Sig.		
	Regression	43.987	4	10.997	38.384	.000 <sup>b</sup>		
1	Residual	90.817	317	.286				
	Total	134.803	321					

a. Dependent Variable: investment decisions

b. Predictors: (Constant), Herding, Heuristics, Prospect and Market

Model		Unstandardized Coefficients		Standardized Coefficients	t	Sig.	Collinearity Statistics	
		В	Std. Error	Beta			Tolerance	VIF
	(Constant)	1.424	.239		5.950	.000		
	Herding	.276	.040	.343	6.933	.000	.932	1.073
1	Heuristics,	.127	.047	.137	2.680	.008	.923	1.084
	Prospect	.260	.046	.280	5.614	.000	.932	1.073
	Market	.073	.033	.102	2.201	.028	.929	1.076

a	Depend	lent \	Variabl	e: inve	estment	decisions

	CollinearityDiagnostics <sup>a</sup>								
Model	Dimension	Eigenvalue	Condition Index	Variance Proportions					
				(Constant)	Н	erding He	uristics	Prospects	Market
	1	4.891	1.000		.00	.00	.00	.00	.00
	2	.038	11.350		.00	.60	.00	.06	.39
1	3	.034	12.060		.00	.03	.01	.77	.35
	4	.026	13.652		.02	.29	.59	.06	.19
	5	.011	20.809		.98	.07	.39	.11	.07
a. Depe	ndent Variable:	Investment_Dec	cisions			•			

## 3.3 Multicollinearity

To detect the multicollinear problem, the independent variable multicollinearity test was applied Table 8. The values of the Variation Inflation Factor (VIF) for all variables are less than ten, indicating that the multicollinearity problem is minimized and that the variables for regression analysis can be used (Chatterjee et al., 2000; Kleinbaum et al., 1988).

## 3.4 Regression

H2: The behavioral factors have influence on the investment decisions of individual investors at the National Stock Exchange at high levels.

## Interpretation

The hypothesis is accepted because (p <0.05, 0.000) in this study is behavioral factors (Herding, Heuristics, Prospect and Market) that influence the investment decisions of individual investors in the National Stock

Exchange at high levels (Table 8).

H3: The investment decisions of individual investors have positive influence on the investment performance at the National Stock Exchange.

Table 9. Regression

		Variables Enter	ed/Removed <sup>a</sup>					
Model	Variables Er	itered	red Variables Removed			ethod		
1	investment de	cisions	•		Е	nter		
a. Dependent Variable:	Investment Performance							
b. All requested variable	es entered.							
		Model Su	ımmary					
Model	R	R Square	Adjusted	d R Square	Std. I	Error of the	r of the Estimate	
1	.465ª	.216		.214			5.17896	
a. Predictors: (Constant	), investment decisions							
ANOVAa								
Model		Sum of Squares	Df	Mean Square	F		Sig.	
	Regression	2364.904	1	2364.904	:	88.172	.000 <sup>t</sup>	
1	Residual	8582.912	320	26.822				
	Total	10947.817	321					
a. Dependent Variable:	Investment Performance							
b. Predictors: (Constant	), investment decisions							
Coefficientsa								
Model		Unstandardized Coefficients		Standardized Coefficients		Т	Sig.	
		В	Std. Error	Beta				
	(Constant)	-3.742	1.578			-2.371	.018	
1	investment decisions	4.188	.446		.465	9.390	.000	

### Interpretation

The hypothesis is accepted because (p <0.05, 0.000) indicating that investment decisions by individual investors have a positive impact on the performance of the investment in the National Stock Exchange (Table 9).

### 3.5 Summary of the Hypotheses Test

Table 10. Summary of hypotheses

Sr. No.	Hypotheses	status
1	H1: The behavioral variables that influence the investment decisions of individuals at the National Stock Exchange	Accepted
	are grouped in four factors as the reviewed theories: Heuristics, Prospect, Market, and Herding.	
2	H2: The behavioral factors have influence on the investment decisions of individual investors at the National Stock	Accepted
	Exchange at high levels.	
3	H3: The investment decisions of individual investors have positive influence on the investment performance at the	Accepted
	National Stock Exchange.	

### 4. Findings of the Study

The internal consistency of the elements used to measure each factor was calculated using the Cronbach's alpha, which is the procedure of choice to examine the internal consistency of the elements using the Likert-type scale (Walsh & Betz, 1995). Cronbach's alpha for each factor: factor 1 (Herding), factor 2 (heuristics), factor 3 (investment performance), factor 4 (prospect), factor 5 (market) and factor 6 (investment decisions) were 0.766, 0.748, 0.610, 0.694, 0.610 and 0.651, and the overall reliability was 0.709. As the marginal acceptable reliability should be higher than 0.60 (Gliner & Morgan, 2000), all the measures in this study are above 0.60, demonstrating reliability. Therefore, the results of the reliability analysis confirmed that consistency on each of the factors is at an acceptable level.

The finding of the analysis is that the four variables significantly affected the investment decision and the return on

investment. All behavioral variables have a major impact on investors' decision-making, which has led to the acceptance of all hypotheses related to the impact of the behavioral factors in the decision-making of individual investors.

### 5. Implications of the Study

Capital markets are an essential part of the financial sectors of modern economies and even more of growing economies. Well-developed capital markets promote economic growth through increased savings and mobilization, access to external savings, the spread of financial risk and the facilitating role in converting savings into investments. The stock market decisions play an important role in determining market trends, which then influence the economy. In order to understand and provide an adequate explanation for investor decisions, it is important to investigate which behavior factors influence investor decisions in the Stock Exchange and how these factors influence their investment performance. In this sense, we have examined each of the behavioral factors.

### 6. Conclusion

Based on the analysis, it was found that there are four behavioral factors affecting the investment decisions of individual investors in the National Stock Exchange: Herding, Market, Prospect, Heuristic. The herding factor includes four behavioral variables: follows the decisions of other investors (buying and selling, choice of trading stocks, volume of stock; herding speed). The market factor consists of three variables: changes in prices, market information and past trends of the stocks, fundamentals of the underlying shares, customer preference, over-reaction to price changes. The prospect theory has three variables: loss aversion, regret aversion and mental accounting, that have significant impact on investment decision making: aversion to loss, regret aversion and mental accounting (two sub-variables). And that decision-making influences the return on investment of individual investors that include two factors, namely the rate of return and the satisfactory level of investment decisions.

While heuristic variables are grouped into five factors: representativeness, overconfidence-gamble's fallacy and anchoring and availability bias. The factor of over-dependence gamble's fallacy consists of two variables: overconfidence and gamble's fallacy while two variables: anchoring and ability bias belong to the factor of anchoring-ability bias.

The findings indicate that hypothesis H1 is supported. The four behavioral factors affect investment decisions by individual investors on the National Stock Exchange at high levels and investment decisions by individual investors have a positive impact on investment performance on the National Stock Exchange. The findings indicate that hypotheses H2 and H3 are also supported.

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