

# Essays on Financial Market Anomalies and Investment Strategies



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*To Zeinab,  
My Parents, and My Siblings*



# Foreword

This volume is the result of a research project carried out at the Department of Finance at the Stockholm School of Economics (SSE).

This volume is submitted as a doctor's thesis at SSE. In keeping with the policies of SSE, the author has been entirely free to conduct and present his research in the manner of his choosing as an expression of his own ideas.

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Director of Research  
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*Stockholm, May 1, 2016*

*Mahdi Heidari*

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# Introduction

The Efficient Market Hypothesis (EMH) is the backbone of asset pricing in financial economics. One version of EMH states that all publicly available information is already reflected in the price. There are, however, a number of documented patterns in the financial markets that are anomalies, given existing asset pricing models. Price momentum, which refers to the tendency of an asset's short-term performance continuation, is one of the most pervasive and long-standing market anomalies. The trading strategy based on the momentum effect – a combination of long position in the previous winners and short position in the previous losers or winner minus loser strategy – historically produces about a 50% higher average return than the market index.

The momentum effect was first introduced to the academia by Jegadeesh and Titman (1993). It has been widely studied for the last two decades and documented in different markets and asset classes. Several studies try to explain the existence of significantly positive excess returns from momentum strategies. But it is not clear whether these violations of market efficiency can be given a behavioral explanation or whether they are due to the rational response of investors to real market constraints. Finding a risk-based explanation for the momentum effects is a tremendously difficult task, as momentum constitutes perhaps the toughest challenge for rational theories of the cross-section of stock returns (Fama and French, 1996). As an alternative, a number of researchers have suggested behavioral theories of momentum effects.

This dissertation consists of three papers on momentum strategy and the comovement of stock returns. In the first paper, "Momentum Crash Management," I study the fat-tailed distribution of momentum return and

the predictability of momentum crashes. I suggest a dynamic momentum strategy with better performance than existing methods, while also taking into account the strategy's implantation cost. Momentum strategy has both high average returns and Sharpe ratios, and, even after controlling for regular risk factors, it still produces high alpha. At the same time, however, momentum returns suffer from very negative skewness and sometimes experience crashes. Momentum crashes primarily occur due to the short positions in the previous losers and after down markets, which tend to be followed by rebounds and high ex-ante volatility. In these situations, the previous losers that dropped significantly in the down market experience higher returns during market rebounds compared to previous winners that have had better prior returns (Daniel and Moskowitz, 2013).

In the first paper, I introduce a new momentum predictor, which I compare to the predictors explored in the prior literature. I also investigate whether momentum predictability can be used to manage risk, particularly downside risk or crash management of momentum strategies. Using momentum prediction results from two sub-samples of momentum crash and normal periods, as well as the correlation results in the sorted quintiles of momentum, I introduce an alternative momentum risk management method. I show that the new method is more successful than previous methods, in terms of both returns and implementation costs.

In the second paper of the dissertation, "Over or Under? Momentum, Idiosyncratic Volatility and Overreaction," I try to understand why the momentum effect exist in the equity market and how it can be explained by behavioral models. The models in the behavioral literature can be divided into two camps, depending on whether they characterize price momentum as investor underreaction or investor overreaction to information. While all of these models are based on imperfect revision and the processing of information, their underlying mechanisms are different. Identifying the working mechanism is a challenging yet important part of our understanding of the financial markets.

In this paper, I contribute to this line of research by using a simple model that illustrates the link between idiosyncratic volatility and investors' overreaction. I also use stock turnover as a measure of overreaction and present

evidence in support of the overreaction explanation for momentum effects. In addition, I shed some light on the relationship between momentum and idiosyncratic volatility that has been investigated in several studies with conflicting explanations. I also explore the relationship between stock momentum and industry momentum and show that the contribution of the industries to the momentum varies with the level of firm-specific information, which is proxied by idiosyncratic volatility.

In the third paper of the dissertation, “Cyclicalities of Price Comovement and Firm Investment,” I study the effects of firm investment on the idiosyncratic volatility of the stock and its synchronicity with the market. I first investigate Veldkamp’s (2005/2006) explanation of information signals’ generation by investment and examine whether, in cross section of stocks, a firm’s investment affects the comovement of stock return with the market. I then explore the differential effects of the investment on the stock return synchronicity depending on the state of the aggregate economy to determine whether, as Veldkamp (2005) posits, the countercyclical behavior of stock return comovement can be explained by firm investments during economic booms and busts. I use two forms of firm investment in this study: capital expenditure as a general form of investment and R&D investment as a specific form of investment. Moreover, I use both Fama-MacBeth and fixed effects methods in the analysis of panel data.

My results show that the deviation of a firm’s capital and R&D investment from the industry’s average level of investment contains information in the cross section of stocks and reduces the stock synchronicity with the market. Furthermore, I provide evidence for differential effects of the investment on the stock synchronicity with the market in economic expansions and recessions. The empirical results suggest that deviation from industry investment (both capital and R&D investment) has negative effect on stocks’ comovement and that the effect is stronger in economic expansion periods than in recession periods.





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