Can We Trust Financial Analysts? Reliability of Stock Recommendations and Firm-Specific Characteristics

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Abstract

We examine the reliability of analysts' stock recommendations issued for Italian listed firms by exploring absolute stock returns. Research findings reveal that absolute stock returns following recommendations differ depending on whether they are positive, neutral or negative recommendations, but slightly more than fifty percent of recommendations are confirmed by absolute stock returns. On the basis of the logistic regression model, we also document that the reliability of stock recommendations is inversely connected to the uncertainty faced by investors who hold stocks in a specific firm, as suggested by the estimate of explanatory variables, such as the firm's beta, the interest coverage ratio and cash flow volatility.

Keywords: stock recommendations, absolute stock returns, financial analysts, Italian listed firms, forecast accuracy

1. Introduction

Stock recommendations published by brokerage houses provide a rare opportunity for examining an unequivocal course of action (Elton, Gruber, & Grossman, 1986). Although stock recommendations are officially distributed to professional investors, there is no doubt that stock rating systems used by brokerage houses, such as "Buy" or "Sell" recommendations, provide a clear indication for investment decisions. Nonprofessional investors can be particularly subject to recommendations of financial analysts. The limited skills of some investors have been underlined by several studies which have shown that small investors tend to take recommendations literally (Malmendier & Shanthikumar, 2007) and respond merely to the issuance of stock recommendations (Mikhail, Walther, & Willis, 2007). Such rating systems implicitly assume the existence of unsophisticated investors since professional investors are more interested in information rather than recommendations. Two main questions related to this topic are addressed in this paper.

First, do absolute stock returns confirm stock recommendations? Unlike the methodologies used by previous research, we use the absolute stock return to assess the reliability of analysts' stock recommendations issued by brokerage houses. To illustrate the relevance of absolute stock returns, assume that the return on a stock for a period of one year is -5%. If the return of the market is -7%, the stock would have an *ex post* abnormal return of 2% certainly does not meet the expectations of some investors since the absolute stock return of -5% could be lower than the required return of other investments with similar risks and certainly lower than the return on an investment with no risk of financial loss. Similarly, if the annual return on a stock is 12% and the return of the market is 14%, the stock would have an *ex post* abnormal return of -2%. The absolute stock return of 12% could, however, be higher than the required return of other investments with similar risks. The analysis of absolute stock returns can facilitate the decision-making of investors who are not interested and/or do not have the expertise and resources for measuring stock returns on the basis of various indicators, such as the abnormal stock return, calculated by subtracting market performances or other benchmarks from a single stock or portfolio return. For the purposes of this study, we called this type of private or business investors "nonprofessional and unsophisticated investors" (hereafter, unsophisticated investors).

Second, which firm-specific characteristics can explain the reliability of stock recommendations? The level of reliability of stock recommendations for each company should presumably vary because of the many circumstances that can affect analysts' forecasts. We highlight this issue by examining the role of various explanatory variables, including some firm-specific characteristics. In particular, without formulating *a priori*

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specific hypotheses, we assume the existence of relationships between the reliability of stock recommendations and some stock market indicators, proxies of financial risk, firm size and firm profitability. Using a sample of 5,443 analysts' stock recommendations issued for Italian listed firms, empirical tests revealed the existence of a significant negative correlation between the level of reliability for each firm of our sample and the firms' beta. Our findings indicate also a positive correlation between the level of reliability of a subsample of 130 non-financial firms and the interest coverage ratio, whilst a negative association was found between the level of reliability and cash flow volatility.

The remainder of this article is organized as follows: the second section presents a brief review of the related literature, the third section describes how the firm sample was selected and the survey methodology; the fourth section reports on the results; the last section provides some concluding remarks.

2. Literature Review

A large number of studies have examined the extent of the impact of buy and sell recommendations on stock prices in order to investigate capital market efficiency. Although some researchers have suggested that investors cannot benefit from analysts' recommendations (e.g., Logue & Tuttle, 1973; Bidwell, 1977; Menendez-Requejo, 2005; Erdogan, Palmon, & Yezegel, 2011), numerous analyses have documented a significant price reaction to stock recommendations by exploring the existence of abnormal stock returns (Womack, 1996; Barber, Lehavy, McNichols, & Trueman, 2001; Jegadeesh, Kim, Krische, & Lee, 2004; Lidèn, 2007). Several specific aspects of this issue have been addressed, such as stock price reactions to recommendation revisions (Ivković & Jegadeesh, 2004; Elton, Gruber, & Grossman., 1986; Jegadeesh & Kim, 2006; Chang & Chan, 2008), the difference between returns on initiating and continuing recommendations (Chan, Brown, & Ho, 2006), abnormal returns subsequent to stock recommendations released to a limited clientele (Schlumpf, Schmid, & Zimmermann, 2008), stock rating distributions over time for the prediction of future recommendations (Barber, Lehavy, McNichols, & Trueman, 2006) and various determinants of stock recommendations that affect price performance, including the strength of the recommendation, the analysts' reputations and the size of the brokerage house (Stickel, 1995). Research literature have furthermore explored effects of stock recommendations on different phenomena, such as brokerage firm trading (Irvine, 2004), earnings management (Abaranell & Lehavy, 2003) and the tendency of analysts to follow consensus forecasts according to the "herd behaviour" phenomenon (Jegadeesh & Kim, 2010; Lin, Chen, & Chen, 2011). Although several aspects of market reactions and other effects of stock recommendations have been analyzed, the absolute stock return that follows recommendations published by brokerage houses remains largely unexplored.

Similarly, there has been little discussion about how the reliability of stock recommendations is affected by firm-specific characteristics. In particular, two main research areas related to this topic have been explored by empirical studies. First, numerous analyses have examined the impact of several factors on earning forecast accuracy rather than on stock recommendations. To name just a few, the issue has been examined by exploring how the accuracy of analysts' earnings forecasts has been affected by a change of chief executive officer (Choi, Chen, Wright, & Wu, 2014), the model of reporting firms' primary operating assets (Liang & Riedl, 2014), the geographical proximity of financial analysts to hubs of information (Cavezzali, Crepaldi, & Rigoni, 2014), investor expectations (Walther, 2013), strategic patterns of internationalization (Mauri, Lin, & De Figueiredo, 2013), non-financial disclosure (Dhaliwal, Radhakrishnan, Tsang, & Yang, 2012), CEO stock options (Kanagaretnam, Lobo, & Mathieu, 2012), change in the composition and ability of analysts (Nowland & Simon, 2010), the affiliation of analysts to investment banks or to other institutions (Jacob, Rock, & Weber, 2008) and corporate transparency (Chiang & Chia, 2005). And, more closely related to our study, some researchers have examined how firm-specific characteristics affect the accuracy of earnings forecasts. In particular, Parkash, Dhaliwal and Salatka (1995) suggested that the accuracy of earnings forecast is positively associated with the proxies of business risk, financial risk and ownership concentration and negatively correlated to the information index of the firm, measured by firm size and the number of analysts studying a firm. Moreover, Jaggi and Jain (1998) found that earnings forecasts are more accurate with short time horizons and that the beta coefficient and industry classification do not have a significant explanatory power on the accuracy of analyst forecasts.

Second, stock recommendations have been expressly analysed in connection with phenomena that are only marginally related to our research questions. In particular, an issue that has dominated the field concerns how earning forecasts are reflected in stock recommendations. Although several studies have highlighted the existence of a positive influence especially for long-term forecasts (e.g., Bandyopadhyay, Brown, & Richardson, 1995; Lustgarten & Tag, 2008; Bradshaw, 2002; Chen & Chen, 2009; Loh, & Mian, 2006), it was also found that there is little evidence that stock recommendations and earnings forecasts are related to each other (e.g., Francis & Soffer, 1997; Bradshaw, 2004; Barniv, Hope, Myring, & Thomas, 2010). The association between earnings

forecasts and recommendations has also been studied in the presence of some determinants such as analysts' conflict of interest and analysts' expertise (Ertimur, Sunder, & Sunder, 2008). Other factors have been analysed in connection with stock recommendations, such as the type of analysts' affiliation (Lin & McNichols, 1998; Michaely & Womak, 1999), the conflict of interest between a proprietary trading division and a brokerage division (Shen & Chih, 2009), the role of analyst optimism (Mokoaleli-Mokoteli, Taffler, & Agarwal, 2009) and the investor sentiment (Bagnoli, Clement, Crawley, & Watts, 2009).

3. Firm Sample and Methodology

The sample examined in this study contains 5,443 stock recommendations issued for 154 companies listed on the Italian stock exchange (Borsa Italiana) between 2009 and 2013. Stock recommendations, except in a few cases, are written in English and were downloaded directly from the Italian stock exchange's website (Borsa Italiana, 2014) and individually analyzed. More specifically, the sample selection was made on the basis of the following criteria. Firms were included in the sample if brokerage houses covered each company for at least three years in the period between 2009 and 2013. 161 firms did not match this criterion, of which 53 companies were not rated and 108 companies were not covered sufficiently over the period 2009-2013. By examining the stock recommendations individually, the analysts' ratings were classified into three main groups: positive recommendations (buy, outperform, accumulate, add, underweight, undervalued), neutral recommendations (neutral, hold, in line) and negative recommendations (sell, underperform, reduce). Table 1 shows the sample of stock recommendations according to the above-mentioned classification criteria.

Table 1. Sample of stock recommendations

Years	Positive		Neutral		Negative		Total	
	Unit	%	Unit	%	Unit	%	Unit	
2013	476	58.05%	258	31.46%	86	10.49%	820	
2012	670	64.49%	297	28.59%	72	6.93%	1039	
2011	802	63.30%	366	28.89%	99	7.81%	1267	
2010	644	60.02%	331	30.85%	98	9.13%	1073	
2009	648	52.09%	447	35.93%	149	11.98%	1244	
Total	3240		1699		504		5443	

In order to ascertain the ability of stock recommendations to predict stock prices, the present paper compared analysts' ratings with the absolute stock returns. More specifically, for each stock recommendation, the analysis was articulated on the basis of the following stages. First, we calculated the average stock price M_0 for five days around the date of publication t=0 of each stock recommendation, from day t=-2 to day t=2. Second, we computed the average stock price M_1 from the day of publication t=0 to the day of the subsequent stock recommendation provided by the same brokerage house. If the subsequent recommendation was absent, the average was calculated over a period of twelve months or for a shorter period if stock prices were not available. Third, we computed the absolute stock returns as $(M_1-M_0)/M_0$ in order to verify whether the positive and the negative stock recommendations were confirmed by stock returns. More specifically, stock recommendations were considered reliable if $(M_1-M_0)/M_0>0$ for positive recommendations and $(M_1-M_0)/M_0<0$ for negative recommendations. We did not consider stock recommendations classified as "neutral" since their information content does not provide a clear indication for the future stock price.

The ability of stock recommendations to predict stock prices over the period 2009-2013 allows us to identify a level of reliability for each firm. The level of reliability was obtained by dividing the number of reliable positive and negative recommendations for a firm by the total number of positive and negative recommendations issued for the same firm. The level of reliability LR_i is formally described as:

$$LR_i = (RPR_i + RNR_i)/(TPR_i + TNR_i)$$
(1)

where RPR_i is the number of reliable positive recommendations, RNR_i is the number of reliable negative recommendations, TPR_i is the total number of positive recommendations and TNR_i is the total number of negative recommendations issued for each firm.

The correlation between the level of reliability of stock recommendations and some potential explanatory variables was therefore tested using the logistic regression model. More specifically, this study has divided the firm sample into two groups: firms which have stock recommendations with a high level of reliability and firms which have recommendations with a low level of reliability. We supposed that firms belonging to the first group

are above the median of the level of reliability, whilst firms of the second group are below the median. This paper assumes the binary dependent variable Y (firms with reliable stock recommendations Y=1; firms with unreliable stock recommendations Y=0) and several average market indicators and financial ratios over the period 2009-2013 as independent variables x_p using the logistic regression model. Assuming p = P(Y=1), the model has the following general form:

$$logit(p) = \log(p/(1-p)) = \beta_0 + \beta_1 x_1 + \beta_2 x_2 + \dots + \beta_p x_p$$
 (2)

where log(p/(1-p)) is the natural logarithm of the odds, p is the probability between 0 and 1 that the dependent variable occurs, β_p is the pth parameter of the logistic regression model obtained by the method of maximum likelihood and x_n is the *pth* explanatory variable.

According to this procedure, three main sets of explanatory variables were examined. The first set is derived from stock markets: the logarithm of the daily average stock trading volume (LogSTV) for the period covered by brokerage houses, the firm's beta (Beta) and the number of analysts that covered each firm (NA). The number of analysts can be used as proxy of the amount of information available about a firm (Parkash, Dhaliwal, & Salatka, 1995; Ertimur, Sunder, & Sunder, 2007) and therefore interpreted as a factor that could reduce ceteris paribus the uncertainty faced by investors who hold stocks in a specific firm.

The second group of variables are proxies of firm size and profitability. We used the average value of the following variables for the period covered by brokerage houses: the logarithm of book value of total assets (LogTA), the return on assets ratio (ROA) and the market to book ratio (MB). To avoid the problem of multicollinearity, we excluded measures of firm profitability from our model, such as ROS (return on sale), ROI (return on investment), ROTA (EBIT to total assets) and the asset turnover ratio (revenues to assets). As in the aforementioned case of the number of analysts covering the company, proxies of firm size have also been considered by some studies as factors that increase the amount of information available about a firm (for example, Atiase, 1985; Brushan, 1989; Kasznik & Lev, 1995; Parkash, Dhaliwal, & Salatka, 1995).

Lastly, as proxies of financial risk, we considered the total debt to total assets ratio (DtoA), EBIT to interest expenses also known as the interest coverage ratio (ICR) and cash flow volatility (CFV). Cash flow volatility was computed as the coefficient of variation of cash flow obtained by dividing the standard deviation by the mean of annual cash flow from operations for the period 2009-2013 or, if not available, for a shorter period.

Data relating to the number of analysts were collected from the Italian stock exchange (Borsa Italiana, 2014) whilst market data and fundamentals were obtained from the Thomson Reuters databank.

In the first stage of the regression analysis, we used stock market indicators regardless of fundamentals in order to have a more homogeneous sample. In the second stage, the regression analysis was carried out using a subsample of 130 non-financial firms. Although raw data were collected over time, the correlation did not use time series data itself, but examined the reliability level of stock recommendations as defined in equation (1) and the average value of the above-mentioned explanatory variables in a cross-sectional regression. The correlation matrix of the variables examined is presented in Table 2. Panel A shows correlations of variables used in the first stage of the regression analysis related to the entire sample of 5.443 analysts' stock recommendations for 154 firms. Panel B presents correlations related to the subsample of 4,620 analysts' stock recommendations for the 130 non-financial firms. The results confirm the absence of the multicollinearity problem. The Variable Inflation Factor (VIF) was also used to test the multicollinearity.

Table 2. Correlation matrix

Panel A	LogSTV	Beta	NA				VIF
LogSTV	1						1.690
Beta	0.3776	1					1.220
NA	0.5278	0.0338	1				1.450
Panel B	ROA	ICR	CFV	LogTA	DtoA	MB	VIF
ROA	1						1.662
ICR	0.5664	1					1.544
CFV	-0.0602	-0.0078	1				1.001
LogTA	0.0678	-0.1168	-0.0288	1			1.153
DtoA	-0.3862	-0.3052	0.0195	0.2408	1		1.283
MB	0.2018	0.2258	-0.0302	-0.187	-0.1853	1	1.103

4. Results

Panel A of Table 3 presents the descriptive statistics of stock returns for the sample of 154 firms. Research findings revealed that the mean and the median of the absolute stock returns differ depending on whether they are positive, neutral or negative recommendations (respectively 1.74% and 0.75% for positive recommendations, 1.23% and -0.21% for neutral recommendations, 0.64% and -0.49% for negative recommendations), whilst the values of standard deviation increased, with the highest value for negative recommendations. A possible explanation for these results is that stock recommendations can on average forecast stock prices and the predictions appear to be more accurate in the case of positive recommendations compared with negative recommendations, as suggested by the increasing value of standard deviations. Although these results validate the reliability of stock recommendations, only a part of the analysts' forecasts is confirmed by stock returns. As shown in Panel B of Table 3, 55.1% of positive recommendations were able to forecast a positive stock return and 53% of negative recommendations predicted a negative stock return. It is quite obvious that these results reflect almost a random guess. Panel B of Table 3 provides more details about the frequency distribution of absolute stock returns. We also analysed the reliability level of stock recommendations for each firm as defined in equation (1). Table 4 shows the level of reliability for positive and/or negative stock recommendations for the whole sample of 154 firms. In particular, the reliability levels of the positive and negative stock recommendations are normally distributed around the mean of 54% whilst the median assumes a value of about 55.5%. In line with the findings illustrated above, these results show that only 84 firms, about 55% of our firm sample, had a level of reliability greater than the mean.

Table 3. Descriptive statistics of stock returns

Panel A				Stock	recommend	dations				
	Positive				Neutral			Negative		
Stock returns:										
Mean		1.74%			1.23%			0.64%		
Median		0.75%			-0.21%			-0.49%		
St.Deviation		12.19%			15.40%		17.54%			
Panel B				Stock	recommend	dations				
	Positive				Neutral			Negative		
	Unit	%	Cum %	Unit	%	Cum %	Unit	%	Cum %	
Stock returns:										
Less than (60%)	1	0.03%		2	0.12%		2	0.40%		
(60%)-(40%)	7	0.22%		5	0.29%		6	1.19%		
(40%)-(20%)	54	1.67%		58	3.41%		23	4.56%		
(20%)-(10%)	208	6.42%		152	8.95%		60	11.90%		
(10%)-0%	1185	36.57%	44.9%	661	38.91%	51.7%	176	34.92%	53%	
0%-10%	1340	41.36%		543	31.96%		145	28.77%		
10%-20%	301	9.29%		164	9.65%		49	9.72%		
20%-40%	112	3.46%		89	5.24%		33	6.55%		
40%-60%	18	0.56%		15	0.88%		4	0.79%		
60%-80%	6	0.19%		3	0.18%		3	0.60%		
More than 80%	8	0.25%	55.1%	7	0.41%	48.3%	3	0.60%	47%	
Total	3240	100%	100%	1699		100%	504		100%	

The regression analysis was therefore performed assuming the reliability level of the overall positive and negative stock recommendations computed for each firm according to equation (1) as the dependent variable (firms with reliable stock recommendations Y=1; firms with unreliable stock recommendations Y=0) and some average market indicators and financial ratios as explanatory variables. The results of logistic regression according to model (2) are shown in Table 5.

The first step of the logistic regression focused on the average stock market indicators as defined in section 3. The research findings presented in Panel A of Table 5 indicate that the probability of having firms with reliable stock recommendations increases as the beta coefficient (Beta) decreases. The strong correlation suggests that volatility, measured by the firm's beta, is a valid predictor of the accuracy of stock recommendations. The regression analysis did not reveal any statistical significance for the daily stock trading volume (LogSTV) and

the number of analysts that covered the firms (NA). The second step of the logistic regression involved the average financial ratios for the subsample of 130 non-financial firms. As shown in panel B of Table 5, the regression revealed the existence of a positive correlation between the level of reliability and the interest coverage ratio (ICR). In other words, the ability of firms to pay interest on outstanding debt with their revenues allows brokerage houses to provide more accurate stock recommendations. Furthermore, the regression analysis showed that the probability of having reliable stock recommendations increases as the cash flow volatility (CFV) decreases, as indicated by the negative value of the coefficient of variation of cash flow.

Table 4. Reliability of stock recommendations

			Stock recor	nmendations		
	Positive		Negative		Positive and Negative	
	Firms	%	Firms	%	Firms	%
Level of reliability:						
0-10%	7	4.5%	12	7.8%	3	1.9%
10%-20%	5	3.2%	1	0.6%	3	1.9%
20%-30%	7	4.5%	5	3.2%	6	3.9%
30%-40%	18	11.7%	5	3.2%	20	13.0%
40%-50%	27	17.5%	11	7.1%	26	16.9%
50%-60%	38	24.7%	9	5.8%	45	29.2%
60%-70%	27	17.5%	6	3.9%	30	19.5%
70%-80%	8	5.2%	3	1.9%	10	6.5%
80%-90%	6	3.9%	2	1.3%	4	2.6%
More 90%	5	3.2%	9	5.8%	5	3.2%
n.a.*	6	3.9%	91	59.1%	2	1.3%
Total	154		154		154	

Note. * Stock recommendations not available for the specified class of ratings.

Table 5. Reliability of stock recommendations and regression results

Panel A	Estimate	Std Error	z value	Pr(> z)	
Const	0.928842	0.467723	1.9859	0.04705	**
Log Stock trading volume (LogSTV)	-0.0990498	0.200727	-0.4935	0.62169	
Beta coefficient (Beta)	-1.08139	0.413396	-2.6159	0.00890	***
Number of analysts (NA)	0.0634223	0.0778028	0.8152	0.41498	
Panel B	Estimate	Std Error	z value	Pr(> z)	
Const	0.651638	0.887752	0.7340	0.46293	
Return on assets ratio (ROA)	-0.448037	3.15542	-0.1420	0.88709	
Interest coverage ratio (ICR)	0.0202323	0.0111783	1.8100	0.07030	*
Cash flow volatility (CFV)	-0.462226	0.258679	-1.7869	0.07396	*
Log Total assets (LogTA)	-0.125592	0.227605	-0.5518	0.58109	
Total debt to total assets (DtoA)	0.337311	1.39455	0.2419	0.80887	
Market to book ratio (MB)	-0.0888563	0.133487	-0.6657	0.50563	

Note. *** Significant at the 0.01 level, ** Significant at the 0.05 level, * Significant at the 0.10 level (two-tailed).

These results suggest that the level of reliability is associated with the uncertainty faced by investors who hold stocks in a specific firm. Market risk measured by firm's beta (Beta) and financial risk measured by the interest coverage ratio (ICR) and cash flow volatility (CFV) are negatively associated with the reliability of stock recommendations. Although our analysis focused on stock recommendations rather than on the accuracy of earnings forecasts, the present findings seem to be consistent with other research which outlined that uncertainty in earnings forecasts is positively correlated to financial risk (Parkash, Dhaliwal, & Salatka, 1995). On the contrary, our research findings differ from other studies that did not find a significant explanatory power of the firm's beta (Jaggi & Jain, 1998) and those that have identified a correlation between the accuracy of earnings forecasts and the number of analysts studying a firm (Parkash, Dhaliwal, & Salatka, 1995).

5. Conclusions

This paper has analysed a sample of 5,443 stock recommendations issued by brokerage houses on 154 companies listed on the Italian stock exchange between 2009 and 2013 in order to verify whether stock recommendations are confirmed by absolute stock returns and which firm-specific characteristics can explain the different level of reliability of stock recommendations for each firm.

Two main findings emerge from the present research. First, descriptive statistics revealed a limited ability of stock recommendations to forecast absolute stock returns. Although the mean and the median of absolute stock returns following recommendations differ depending on positive, neutral and negative recommendations, research findings showed that a portion just over 50% of positive and negative recommendations were confirmed by absolute stock returns and that the level of reliability of stock recommendations for each firm are normally distributed around the mean of 54%. Second, explanatory variables which are statistically significant for the level of reliability seem to be connected in different ways to the uncertainty faced by investors who hold stocks in a specific firm. The reduction in uncertainty, as revealed by the positive value of the interest coverage ratio and the negative estimate of the firm's beta and cash flow volatility, is associated with the increasing level of reliability of stock recommendations for each firm.

These results enhance our overall understanding about the role of stock recommendations in providing reliable forecasts. More specifically, the information about the reliability of stock recommendations can help unsophisticated investors who are interested in absolute stock returns to improve their decision-making. Likewise, research findings may also be useful to firms in analysing investors' behaviour in order to optimize their financial policy.

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