

## Stock Return Synchronicity and Analysts' Forecast Properties

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**Abstract:** Using stock return synchronicity as a measure of a firm's information environment, our research investigates how the firms' stock return synchronicity affects analysts' forecast properties for the accuracy and optimism of the analysts' annual earnings forecasts. Stock return synchronicity represents the degree to which market and industry information explains firm-level stock return variations. A higher stock return synchronicity indicates the higher quality of a firm's information environment, because a firm's stock price reflects more market-level and industry-level information relative to firm-specific information. Our study shows that stock return synchronicity positively affects the forecast properties. Our finding shows that when stock return synchronicity is high, analysts' annual earnings forecasts are more accurate and less optimistically biased.

**Abstrak:** Dengan menggunakan sinkronisitas tingkat pengembalian saham sebagai pengukuran lingkungan informasi perusahaan, penelitian ini menguji bagaimana sinkronisasi tingkat pengembalian saham mempengaruhi properti peramalan analis untuk keakuratan dan optimisme peramalan pendapatan tahunan. Sinkronisitas tingkat pengembalian saham merepresentasikan derajat informasi pasar dan industri dalam menjelaskan variasi tingkat pengembalian saham perusahaan. Sinkronisitas tingkat pengembalian saham yang lebih tinggi mengindikasikan lingkungan informasi yang berkualitas tinggi karena harga saham lebih banyak merefleksikan informasi pasar dan industri relatif terhadap informasi khusus perusahaan. Studi menunjukkan sinkronisasi tingkat pengembalian saham berpengaruh positif terhadap properti peramalan. Temuan menunjukkan bahwa ketika sinkronisitas tingkat pengembalian saham tinggi, maka peramalan pendapatan tahunan analis lebih akurat dan bias optimisme menjadi berkurang.

**Keywords:** analysts; forecast accuracy; forecast bias; information environment; stock return synchronicity

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## Introduction

This study investigates how firms' stock return synchronicity affects the accuracy and optimism of analysts' annual earnings forecasts. Stock return synchronicity represents the degree to which market and industry information explains firm-level stock return variations. A higher stock return synchronicity indicates the higher quality of a firm's information environment, because a firm's stock price with a higher stock return synchronicity reflects more market-level and industry-level information, relative to firm-specific information. Our research posit that stock return synchronicity mitigates analysts' forecasting difficulties because the higher synchronicity represents the higher quality of a firm's information environment.

Our sample is composed of analysts' annual earnings forecasts for U.S. firms over the period from 2001-2013. For the analysts' forecast property measures, our research used the analysts' annual earnings forecast accuracy and the bias in their annual earnings forecasts. Following Durnev et al. (2003) and Piotroski and Roulstone (2004), our research calculated each firm's stock return synchronicity to measure the market and industry-wide information components incorporated into the firm's stock price. Using stock return synchronicity as a measure of a firm's information environment, our research investigated the relation between a firm's information environment and the analysts' annual earnings forecast properties.

Our study shows that stock return synchronicity affects the analysts' forecasts positively. Specifically, our research finds that when the stock return synchronicity is high (i.e., more market- and industry-wide information relative to firm-specific information), the analysts' earnings forecasts are more ac-

curate and less positively biased. A higher stock return synchronicity means less firm-specific information and a higher quality of the firm's information environment. Our results suggest that as informativeness improves (e.g., less unexplained firm-specific information), it positively affects analysts' forecast properties. As a result, as stock return synchronicity increases, analysts' forecasts are more accurate and less biased.

The rest of the paper proceeds as follows. The next section presents the literature review and our hypothesis development. Section 3 describes the sample and methodology, and Section 4 reports the empirical results and discussion. Section 5 concludes.

## Literature Review

Market-level, industry-level, and firm-specific information is reflected in each firm's stock price. In his seminal paper, Roll (1988) reports the relationship between an individual firm's stock returns and contemporaneous market and industry movements. The ability of market-wide information to account for firm-level stock returns is measured by the stock return synchronicity. Roll (1988) first proposed the stock return synchronicity measure. Stock return synchronicity is based on the correlation between the individual firm's stock return and the returns of the overall market and the corresponding industry. Stock return synchronicity is higher when the stock price incorporates relatively more public news. And the residual component of returns represents the firm-specific information (Piotroski and Roulstone 2004).

Since Roll's study (1988), stock price synchronicity has been used in several studies to measure this quality. Stock return synchronicity has been reported to be related to the quality of a firm's information envi-

ronment. Piotroski and Roulstone (2004) investigated the relation between informed trading and stock return synchronicity. They found that they are positively related, consistent with insider and institutional trading and facilitate the market to incorporate firm-specific information into prices. In their research on patterns of comovement in asset returns, Barberis et al. (2005) reported that the increase of firm-level transparency (e.g., by adding the S&P 500 index) improved stock return synchronicity. Chan and Hameed (2006) studied the association between stock return synchronicity and analyst coverage in emerging markets. They found that because analysts facilitate the incorporation of greater market-wide information into the stock price, more analyst coverage increased stock return synchronicity. Chen et al. (2007) examined how the amount of private information impounded in a stock's price affected the sensitivity of corporate investment to a stock's price. In doing so, they used stock return synchronicity to measure the amount of private information in a stock's price and showed that when stock price synchronicity is lower, corporate investment is more sensitive to stock prices. Hutton et al. (2009) found that the transparency of financial statements was negatively associated with the revelation of firm-specific information and as a result, less transparent firms' returns were more synchronous with the market. Focusing on major information revealing events such as Seasoned Equity Offerings (SEOs) and cross-listings settings, Dasgupta et al. (2010) developed a numerical model to show how new disclosures and improvements in transparency affected stock return synchronicity. Based on their theoretical model, they empirically verified that a more transparent information environment is positively associated with stock

return synchronicity. From a microstructure prospective, Kelly (2014) also showed that stock return synchronicity is associated with lower information costs and more liquidity, and corroborates stock return synchronicity as a measure of the quality of the information environment. Recently, Cho and Park (2015) showed that as firms' earnings become more volatile, such firms' stock returns incorporate less firm-specific information. In summary, these studies indicate that as more market- and industry-wide information accounts for firm-level stock returns, that firm's stock return synchronicity increases.

Most research regarding analysts primarily focuses on sell-side analysts because their forecasts are publicly available. The evidence in most of the previous studies documents that there exists an optimistic bias in their forecasts. Some studies suggest increased access to management as a determinant of forecast bias. Das et al. (1998) and Lim (2001) reported that analysts tend to issue more optimistically biased forecasts if firms' earnings are less predictable. They argued that when information asymmetry was high, analysts issued biased forecasts to improve the information flow from management and as a result, improve their forecast accuracy. In addition, Gu and Wu (2003) posited that in the presence of earnings skewness, analysts' biased forecasts should be regarded as a rational effort to reduce their absolute forecast error. These results suggest that analysts' forecasts are biased to obtain an information advantage from management. Hong and Kubik (2003) also reported that analysts who issued optimistic forecasts were more prone to be promoted to a more renowned brokerage house. Moreover, the turnover decisions of affiliated analysts' depends more on optimism than their forecast accuracy.

Research on analysts' forecasting abilities identifies analysts' expertise, the size of the brokerage firm, and the complexity of the forecasting task as being positively associated with accuracy (e.g., Brown et al. 1987; Mikhail et al. 1997; Sinha et al. 1997; Clement 1999). Several studies have investigated the inefficiency of analysts in incorporating relevant information into their forecasts. Specifically, Stober (1992) showed that analysts do not include the necessary accounting information, and neglect to incorporate the pertinent accounting information into their forecasts. Additionally, Abarbanell and Bushee (1997) found that the analysts did not comprehend the implication of the information about future earnings and failed to fully reflect that information into their forecasts. Bradshaw et al. (2001) also showed that financial analysts did not understand the anticipated future earnings decreases related to high accrual reversals in later years. Duru and Reeb (2002) studied the relation between corporations' international diversification and analysts' annual earnings forecast properties. Using corporations' international diversification as a proxy for the complexity of the forecasting task, their study showed that corporations' international diversification negatively affects analysts' forecast properties. Byard et al. (2006) investigated how corporate governance affected the quality of information available to financial analysts, and found that the quality of financial analysts' information was positively associated with the quality of the corporate governance mechanisms. Weber (2009) investigated whether analysts appreciated the effect of book-tax differences in the current period on future earnings, and found that the analysts failed to incorporate these implications when information environments were weak and the analysts inexperienced.

The preceding discussion indicates that a firm's information environment is associated with the analysts' forecast properties.

In this study, our research investigates how the firms' stock return synchronicity affects the accuracy and optimism of the analysts' annual earnings forecasts. Our research argues that the more firm-specific information that firms retain (e.g., not reflected into the market), the analysts are likely to have less relevant information, and of a lower quality, about those firms and their forecasting task becomes more complex. Because stock return synchronicity is higher when the price incorporates relatively more public news, our research hypothesizes that stock return synchronicity mitigates analysts' forecasting complexities and difficulties. Specifically, using stock return synchronicity as a measure of a firm's information environment, our research investigates how the firm's stock return synchronicity affects the analysts' forecast properties, and the accuracy and optimism of their annual earnings forecasts. Our research expects that as a firm's stock return incorporates more market- and industry-wide variations, relative to firm-specific information, its stock price is more synchronous with the market. Because a higher synchronicity represents the higher quality of a firm's information environment, our research posits that higher synchronicity positively affects the analysts' forecast properties. Following these discussions, our research develops and empirically tests the following hypothesis.

*Hypothesis: Analysts' annual earnings forecasts for firms with more synchronous market- and industry-wide information are more accurate and less biased.*

## Methods

### *Sample*

To construct our sample, our study started with the analysts' annual earnings forecasts drawn from the US detailed history edition of the Institutional Brokers' Estimate System (I/B/E/S) database for the period of the fiscal years 2001 through 2013. Our study obtained firm-related information from the annual COMPUSTAT database. Our study retained stock price and return data from the Center for Research into Security Prices (CRSP) database. To measure the stock return synchronicity, weekly stock return data from the CRSP were assigned to each firm's fiscal year from COMPUSTAT to match the

time period of its reported financial data. Our study required all sample firms to be available in the CRSP and retained firms with at least 45 weekly return observations per year, and with a primary SIC code. Following previous research, our study required at least 10 firms within the narrowest SIC grouping and excluded (regulated) utility (SIC codes 4900-4999) and financial firms (SIC codes 6900-6999) from the sample. To mitigate the influence of extreme observations, our study winsorized the observations at the 1th and 99th percentiles. Table 1 describes the descriptive stats for our sample. As seen in Table 1, the sample firm-year observations increase steadily from 1,015 in 2001 to 1,485 in 2013. The final sample consists of 17,703 firm-year observations over the thirteen year period.

Table 1. Distribution of Number of Firms

Year	No. of Firms	Percent
2001	1,015	5.73
2002	1,192	6.73
2003	1,187	6.71
2004	1,357	7.67
2005	1,395	7.88
2006	1,427	8.06
2007	1,461	8.25
2008	1,418	8.01
2009	1,398	7.90
2010	1,422	8.03
2011	1,468	8.29
2012	1,478	8.35
2013	1,485	8.39
Total	17,703	100.00

### *Stock Return Synchronicity*

Following Durnev et al. (2003) and Piotroski and Roulstone (2004), we calculated firm-specific measures of the stock return synchronicity from a standard market model regression as

$$R_{i,t} = \alpha + \beta_1 * R_{M,t} + \beta_2 * R_{I,t} + \epsilon \dots (1)$$

where  $R_{i,t}$  is firm  $i$ 's returns in year  $t$ ,  $R_{M,t}$  is the CRSP value-weighted market returns in year  $t$ , and  $R_{I,t}$  is the firm  $i$ 's primary SIC industry  $I$ 's value-weighted return in year  $t$ . Stock return synchronicity is measured for each-firm year in the sample period.  $R^2$  is the coefficient of determination and firm-specific volatility of the market comovement (synchronicity) is measured by  $(1-R^2)$  from Equation (1). Following extant studies, we computed synchronicity ( $Synch$ ) as

$$Synch_{i,t} = \ln \left( \frac{R^2}{1-R^2} \right) \dots (2)$$

Stock return synchronicity is based on the correlation between the individual firm's stock returns and the returns of the overall market and the corresponding industry. Piotroski and Roulstone (2004) characterized *Synch* as the degree to which the market and industry information explains firm-level stock return variations. *Synch* assesses the portion of individual firms' stock returns that can be explained by the market and industry, while the residual (unexplained) portion captures firm-specific information impounded in the firms' returns. Stock return synchronicity is higher when the price incorporates relatively more public news and the residual component of the returns represents firm-specific information. Therefore, high values of *Synch* indicate a higher level of market- and industry-level information (i.e., a lower level of firm-specific return variation relative to contemporaneous market and industry return variations) and represent the higher quality of a firm's information environment. To construct the stock return synchronicity measure, our study followed the common practice of the log transformation of  $R^2$ . This transformation allowed us to use an unbounded continuous variable with a more normal distribution. Additionally, our study used lagged *synch* for firm  $i$  in year  $t-1$  because analysts' earnings for firm  $i$  in year  $t$  were forecasted after analysts had knowledge of the individual firms' stock return comovement.

### **Analysts' Forecast Properties**

For the analysts' forecast properties, our study used the two most commonly used analysts' annual earnings forecast measures, forecast accuracy and bias. Our study measured forecast accuracy (*Accuracy*) as the negative value of the absolute difference between the actual annual Earnings Per Share (EPS) and the forecasted EPS, scaled by the closing

stock price at time  $t-1$  (Price <sub>$t-1$</sub> ). Our study multiplied the absolute forecast error by negative one to make the higher value represent more accurate forecasts:

$$\text{Accuracy}_{i,t} = -\text{abs} \left( \frac{\text{MF}_{i,t} - \text{Actual}_{i,t}}{\text{Price}_{i,t-1}} \right) \quad \dots \dots (3)$$

where MF <sub>$i,t$</sub> , our measure of the analysts' forecast consensus, is the mean value of annual EPS forecasts of all the analysts following firm  $i$ , issued within the 90-day period after the year  $t-1$  earnings announcement date from I/B/E/S. Actual <sub>$i,t$</sub>  is the actual EPS of firm  $i$  in year  $t$  from I/B/E/S. Our study used the mean value of the analysts' EPS forecasts as a proxy for earnings expectations. When our study used the median value of the analysts' annual EPS forecasts instead, our inferences were robust. If an individual analyst announced multiple forecasts within the 90 day period after the year  $t-1$  earnings announcement date, our study chose the most recent individual analyst's forecasts within the 90-day period. As a forecast optimism measure, our study measured the analysts' forecast bias (*Bias*). Our study defined *Bias* as the signed difference between the analysts' consensus EPS forecast and the actual EPS, scaled by Price <sub>$t-1$</sub> :

$$\text{Bias}_{i,t} = \frac{\text{MF}_{i,t} - \text{Actual}_{i,t}}{\text{Price}_{i,t-1}} \dots \dots (4)$$

Because *Bias* is the signed difference value, the higher value of *Bias* means there is more positive optimism in the analysts' annual forecasts.

### **Empirical Results and Discussion**

In Table 2 our study presents descriptive statistics of our variables of interest. The

mean and median of *Accuracy* are -0.0289 and -0.0106, respectively. By construction, these values are negative. The more accurate the analysts' forecasts are, the closer *Accuracy* comes to zero. The mean (0.0106) and median (0.0014) of *Bias* are positive. These re-

sults indicate that the analysts' annual forecasts are optimistic and are consistent with the literature.

The mean and median of  $R^2$ 's from Eq. (1) are 0.3232 and 0.3009. The mean value of 0.3232 indicates that 32.32 percent of firm

Table 2. Descriptive Statistics of Firm Characteristics (n=17,703)

Variable	Mean	Std. dev	Q1	Q2	Q3
Accuracy	-0.0289	0.0621	-0.0286	-0.0106	-0.0036
Bias	0.0106	0.0589	-0.0062	0.0014	0.0170
$R^2$	0.3232	0.1805	0.1804	0.3009	0.4463
Synch	-0.8984	0.9860	-1.5139	-0.8431	-0.2156
Size	7.5923	1.7618	6.3543	7.5259	8.7061
$\Delta$ earnings	0.0415	0.0929	0.0069	0.0160	0.0388
Loss	0.1893	0.3918	0.0000	0.0000	0.0000
Follow	11.7307	9.9145	5.0000	8.0000	15.0000
Dispersion	0.0099	0.0192	0.0018	0.0042	0.0101

**Variable definitions:**

**Accuracy:**  $-\text{abs} \left( \frac{\text{MF}_{I,t} - \text{Actual}_{I,t}}{\text{Price}_{I,t-1}} \right)$ , where  $\text{MF}_{I,t}$  is the mean value of the annual EPS forecasts of all the analysts following firm  $i$ , issued within the 90-day period after the year  $t-1$  earnings announcement date and  $\text{Actual}_{I,t}$  is the actual EPS of firm  $i$  in year  $t$ .

**Bias:** Signed difference between the actual EPS and forecasted EPS, scaled by Price  $t-1$ , by the closing stock price at year  $t-1$ .

**Synch:** Natural logarithm of  $(\frac{R^2}{1-R^2})$  from  $R_{i,t} = \alpha + \beta_1 * R_{M,t} + \beta_2 * R_{I,t} + \varepsilon$ , where  $R_{I,t}$  is the firm  $I$ 's returns in year  $t$ ,  $R_{M,t}$  is the CRSP value-weighted market returns in year  $t$ , and  $R_{i,t}$  is firm  $i$ 's primary SIC industry  $i$ 's value-weighted return in year  $t$ .

**$R^2$ :** Coefficient of determination from , where  $R_{i,t}$  is the firm  $i$ 's returns in year  $t$ ,  $R_{M,t}$  is the CRSP value-weighted market returns in year  $t$ , and  $R_{i,t}$  is firm  $i$ 's primary SIC industry  $i$ 's value-weighted return in year  $t$ .

**Size:** Natural logarithm of price per share multiplied by the number of shares outstanding at year  $t$ .

**$\Delta$ earnings:** Absolute value of the magnitude of change in the current year's earnings per share from previous year's earnings per share

**Loss:** Indicator variable where 1 is for the loss firm year and 0 for otherwise

**Follow:** Number of analysts following firm  $i$ .

**Dispersion:** Standard deviation of analysts' annual earnings forecasted, scaled by the closing stock price at year  $t-1$ .

Table 3. Correlation of Firm Characteristics (n=17,703)

	Accuracy	Bias	R <sup>2</sup>	Synch	Size	ΔEarnings	Loss	Follow	Dispersion
<i>Accuracy</i>	1.0000	-0.2733 ***	0.0845 ***	0.0845 ***	0.1663 ***	-0.6309 ***	-0.3398 ***	0.1586 ***	-0.5593 ***
<i>Bias</i>	-0.5001 ***	1.0000	-0.0763 ***	-0.0766 ***	-0.0876 ***	0.0131 *	0.3013 ***	-0.0687 ***	0.1087 ***
<i>R<sup>2</sup></i>	0.0779 ***	0.0689 ***	1.0000	0.9999 ***	0.3189 ***	-0.0673 ***	-0.0918 ***	0.2914 ***	-0.0229 ***
<i>Synch</i>	0.0763 ***	-0.0715 ***	0.9708 ***	1.0000	0.3188 ***	-0.0673 ***	-0.0917 ***	0.2916 ***	-0.0227 ***
<i>Size</i>	0.0648 ***	-0.0495 ***	0.3258 ***	0.3155 ***	1.0000	-0.1313 ***	-0.2592 ***	0.4680 ***	-0.1364 ***
<i>Δ Earnings</i>	-0.7632 ***	0.2659 ***	-0.0562 ***	-0.0542 ***	-0.0647 ***	1.0000	0.3013 ***	-0.1220 ***	0.5441 ***
<i>Loss</i>	-0.3145 ***	0.3274 ***	-0.0941 ***	-0.0900 ***	-0.2643 ***	0.2630 ***	1.0000	-0.1007 ***	0.3756 ***
<i>Follow</i>	0.0909 ***	-0.0525 ***	0.3048 ***	0.2899 ***	0.4310 ***	-0.0872 ***	-0.0887 ***	1.0000	-0.0907 ***
<i>Dispersion</i>	-0.6056 ***	0.1311 ***	-0.0396 ***	-0.0418 ***	-0.0682 ***	0.6228 ***	0.2961 ***	-0.0748 ***	1.0000

, \*\*, and \*\*\* indicate statistical significance at the 10, 5, and 1 % levels, respectively.  
All variables are defined in Table 2.

$\hat{R}^2$ 's returns are explained by contemporaneous market and industry movements. The residual component of returns represents firm-specific information, which is unexplained by market comovement. These  $R^2$ 's are considerably distributed. Inter-quartile ranges are from 0.1804 (25<sup>th</sup> percentile) and 0.4463 (75<sup>th</sup> percentile). The mean and median of *Synch*, firm-specific return variation measure, are -0.8984 and -0.8431, respectively. *Synch* is the log transformation value of  $R^2$ . While the bottom quartile *Synch* is -1.5139, the top quartile is -0.2156. Our sample firms also show considerable variation in other firm characteristic variables.

Table 3 reports the correlation matrix. Spearman rank correlations appear above the diagonal and Pearson correlations below. Because both correlations show almost identical results, our study reports only the Spearman rank correlation results. First, there exists a significant positive correlation between *Synch* and  $R^2$  (0.9999, p-value < 0.0001). As our study expected, there is a significant positive correlation between *Synch* and *Accuracy* (0.0845, p-value < 0.0001) and a significant negative correlation between *Synch* and *Bias* (-0.0766, p-value < 0.0001). These results show that as individual firms' stock returns and market and industry stock price movements are more positively associated, analysts' forecasts become more accurate and less positively biased. In untabulated results, our study further investigated the correlation between the information asymmetry measure and our variables of interest. As a proxy for information asymmetry, our study used *Spread*, which is the median daily closing bid-ask spread scaled by the average of the closing bid and ask prices median during the 45-day period before the year  $t-1$  earnings announcement date. The correlation between *Spread* and *Synch* is significantly nega-

tive (-0.1893, p-value < 0.0001). The correlation between *Spread* and *Accuracy* is significantly negative (-0.3219, p-value < 0.0001) and the correlation between *Spread* and *Bias* is significantly positive (0.1752, p-value < 0.0001). These results indicate that as *Synch* increases, there is less information asymmetry. The correlations among the other variables support the results reported in previous studies.

To investigate the relationship between the analysts' forecast properties and the firm-specific stock return synchronicity, our study estimated the following OLS regressions. For heteroscedasticity and correlation among the observations, the standard errors are clustered by both firm and time following Gow et al. (2010) in order to report the p-values.

$$\begin{aligned} \text{Forecast Properties}_{i,t}: \quad & \beta_0\alpha + \beta_1\text{Synch}_{i,t-1} \\ & + \beta_2\text{SIZE}_{i,t} + \beta_3\Delta\text{earnings}_{i,t} \\ & + \beta_4\text{Loss}_{i,t} + \beta_5\text{Follow}_{i,t} \\ & + \beta_6\text{Dispersion}_{i,t} + \varepsilon \end{aligned} \quad .....(5)$$

*Accuracy* (or *Bias*), our measure of the analysts' forecast properties, is the dependent variable in this study. Our main independent variable, *Synch*, captures the degree to which market and industry information is impounded into individual firms' stock prices. *Synch* measures the ability of market-wide information to account for firm-level stock returns and has been considered to represent a firm's information environment. High values of *Synch* designate a higher level of market- and industry-level information and a lower level of firm-specific information.

Following previous research, our study included the following additional variables that have been reported to be associated with earnings forecast accuracy and bias to con-

trol for possible biases. To control for any potential omitted variables correlated with firm size, our study added *Size*. *Size* is the natural logarithm of the price per share multiplied by the number of shares outstanding at year  $t$ . To control for earnings forecast complexity, our study included  $\Delta$ *earnings* and *Loss*.  $\Delta$ *earnings* is the magnitude of change in the current year's earnings and *Loss* is an indicator variable, 1 for the loss firm year and 0 for otherwise. Previous research reports that analysts' forecasts are more positively biased and less accurate in a loss year and the size of the change in earnings is connected with the analysts' forecast accuracy (e.g., Lang and Lundholm 1996; Brown 2001; Duru and Reeb 2002). Our research also included *Follow* and *Dispersion* to control for forecast attributes. *Follow* is the number of analysts following firm  $i$ . Previous studies reported that as more analysts follow firm  $i$ , the analysts' forecasting accuracy improves and becomes less optimistically biased (e.g., Lys and Soo 1995;

Das et al. 1998). *Dispersion* is the standard deviation of analysts' annual earnings forecasts, scaled by the closing stock price at year  $t-1$ . Previous research suggests that forecast dispersion is positively related to uncertainty among analysts so that *Dispersion* is associated with less accurate and less optimistic forecasts (e.g., Lang and Lundholm 1996; Bamber et al. 1997; Gu and Wu 2003).

Table 4 shows the results of our primary tests. Our study ran multiple regressions to examine our hypothesis, after controlling for potential determinants that are associated with earnings forecast accuracy and bias. In Table 4, our study analyzed the relation between stock return synchronicity and analysts' forecast properties, *Accuracy* and *Bias*. As reported in the first column of Table 4, when the dependent variable is *Accuracy*, the coefficient on *Synch* is positive (0.0019) and significant at the 1 percent level, consistent with our univariate results in Table 3. These results indicate that as more market- and in-

Table 4. Regression Analysis (n=17,703)

Dependent Variable	Accuracy		Bias	
	Coefficient	t-stat.	Coefficient	t-stat.
Intercept	0.0064	1.93 *	-0.0189	-3.18 ***
Synch	0.0019	2.79 ***	-0.0029	-2.03 **
Size	-0.0011	-2.80 ***	0.0022	2.97 ***
$\Delta$ Earnings	-0.4123	-6.55 ***	0.1693	2.24 **
Loss	-0.0158	-4.79 ***	0.0459	6.72 ***
Follow	0.0001	2.27 **	-0.0002	-1.37
Dispersion	-0.6203	-3.10 ***	-0.3830	-1.85 *
Adj. R <sup>2</sup>	0.6199		0.1571	

\*, \*\*, and \*\*\* indicate statistical significance at the 10, 5, and 1% levels, respectively.

All variables are defined in Table 2.

dustry-wide information accounts for firm-level stock returns, analysts' annual earnings forecasts are more accurate. These results suggest that stock return synchronicity affects analysts to forecast annual earnings more accurately. As our second test, our study ran a separate regression with *Bias* as another dependent variable and the results are reported in the second column of Table 4. As we expected, we found a significantly negative *Synch* coefficient (-0.0029) at the 5 percent level.<sup>1</sup> Our research found that when firms' returns are more synchronous with market and industry information, the analysts tend to issue less optimistically biased forecasts. These results indicate that greater stock return synchronicity is negatively related to optimistic analysts' forecast bias. The consequences for the control variables are comparable to those of other studies. The coefficients on all the control variables are significantly different from zero at the conventional level and have the expected signs. The only exception is *Follow* in the bias model. The coefficient on *Follow* is not significant, but with the expected negative sign. In both models, *Äarnings* and *Loss*, negatively affect analysts' forecasting accuracy and positively affect their bias. These results verify that the magnitude of change in the current year's earnings and the poor operation results negatively affect analysts' forecast properties. *Dispersion*, uncertainty among the analysts, is also connected with less accurate and less biased analysts' forecasts.

Overall, these results indicate that stock return synchronicity positively influences analysts' forecast properties. The estimated *Synch* coefficient is significantly positive in the ac-

curacy model, consistent with our hypothesis. In the bias model, our research find that the negative coefficient is on *Synch*, which is also consistent with our hypothesis that analysts' annual earnings forecasts for firms with more synchronous and more market- and industry-wide information are more accurate and less biased. Higher stock return synchronicity means less firm-specific information and the higher quality of a firm's information environment. Specifically, for firms with stock returns that can be explained by the market and industry (e.g., with less firm-specific information impounded in firms' returns), the analysts' annual earnings forecasts are more accurate and less positively biased. As more value-relevant firm-related information is reflected into the market, the firms' information environment improves. This indicates that as its informativeness improves (e.g., less unexplained firm-specific information), it positively affects the analysts' forecast properties. In addition, untabulated results indicate that the correlation between the information asymmetry measure (*Spread*) and *Synch* is significantly negative. *Spread* is significantly and negatively related to *Accuracy*, and positively to *Bias*. These results show that as *Synch* increases, there is less information asymmetry. In summary, our results suggest that a higher *Synch* is associated with a lower information asymmetry because a firm's stock price with a higher *Synch* reflects more market-level and industry-level information, relative to firm-specific information. As a result, when stock return synchronicity is high, analysts' forecasts are more accurate and less biased.

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<sup>1</sup> Out of 17,703 firm-year observations, 9,850 observations are positively biased and the remaining 7,853 observations are negatively. Untabulated analyses show that the mitigating effect of *Synch* on optimism in analysts' forecasts is limited to the positive analysts' forecasting bias.

## Conclusion

Using a sample of U.S. firms over the period from 2001-2013, our research investigated the relationship between a firm's information environment and analysts' forecast properties. Our research posited that if more firm-specific information exists, the analysts were likely to have less information about those firms and their forecasting task would become more difficult. To study this relationship, using stock return synchronicity as the measure of a firm's information environment, our research investigated how the firms' stock return synchronicity affected the analysts' forecast properties for the accuracy and optimism of the analysts' annual earnings forecasts. Stock return synchronicity represents the degree to which market and industry information explains firm-level stock return variations. Higher stock return synchronicity indicates a better information environment because a firm's stock price reflects more market-level and industry-level information relative to firm-specific information. Our research hypothesized that stock return synchronicity mitigated the analysts' forecasting difficulties because a higher stock return synchronicity represents the higher quality of a firm's information environment.

Our study has several implications. Our findings emphasize the importance of a firm's information environment and its effect on analysts' forecasting tasks. They show that stock return synchronicity positively influences the analysts' forecast properties. For firms with stock returns that can be explained more by the market and industry (e.g., with less firm-specific information reflected in the market), analysts' annual earnings forecasts are more accurate and less biased. These results indicate that as a firm's information environment improves, it alleviates the analysts' fore-

casting complexities and difficulties, and therefore positively affects the forecast's properties. Our results suggest that the gathering and dissemination of firm related information is associated with the analysts' forecast properties. Specifically, our results highlight the importance of the facilitation of the reflection of firm-specific information into the market. Our finding that a firm's information environment is associated with the analysts' forecast properties suggests that market participants, such as the analysts and investors, could benefit from the reflection of more firm-specific information and the facilitation of the impounding process. It also emphasizes the importance of the prompt dissemination of value relevant information into the market to increase the stock market's efficiency.

There also exist some limitations in our study. Following extant research, our research included in our test model a number of control variables which appear to potentially affect the analysts' forecasting accuracy and bias. However, our research could not control for all the possibly influential factors in this study. In addition, our research implicitly limited our sample by requiring certain restrictions, including that all the sample firms had analysts' annual earnings forecasts. With these restrictions, our sample firms were limited to relatively big ones with easily available public information. During our 2001-2013 sample period, there were several regulation changes that could affect the firms information environment. However, most of these changes were intended to facilitate the dissemination of the firm-specific information's flow into the market, which likely attenuated our findings.

Combined with these results, our study shows that stock return synchronicity positively influences the analysts' forecast prop-

erties. This study suggests that a firm's information environment is related positively to

the analysts' forecast properties and mitigates their forecasting difficulties.

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