Foreign Institutional Investor Trading and Future Returns: Evidence From an Emerging Economy

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Abstract: This study presents evidence that Foreign Institutional Investor (FII) trades are negatively related to future stock returns. For our sample period, portfolios of stocks that are formed based on positive, zero, and negative FII quarterly net buying yield average quarterly returns of 1.6%, 3.8%, and 2.4%, respectively. This suggests that investing in stocks in which FIIs do not trade yields superior returns to those in which they trade. Further, their sells perform better than their buys. We employ panel regressions to document a significant negative relation between FII trading and future 3-month and 12-month returns after controlling for several firm characteristics. The poor performance is magnified when FIIs trade in small stocks and when they trade more frequently than average. We also find that their quarterly net buying is negatively associated with returns during subsequent earnings announcement dates. Further, their trades during the announcements also generate poor performance in the three-month post-announcement period.

Keywords: Foreign Institutional Investors, Institutional Trading, Earnings Announcements, Investment Performance.

1. Introduction

Institutional investors who pick stocks spend substantial amounts acquiring and processing information with the intention of generating trading profits. The economic significance of these amounts has engendered a debate and led to several studies on whether institutions are 'smart money' traders. While most of this research focuses on U.S. institutions, a small group of academics have examined the question of whether institutions that invest in foreign countries (FIIs) are successful at picking stocks.

Some argue that FIIs are endowed with superior expertise and resources by virtue of being global firms, and are hence likely to be successful portfolio managers. For example, according to IOSCO (2012), "FIIs are highly specialized and manage substantial capital, can enhance market features in many ways, including increasing liquidity, influencing market psychology, and improving disclosures and corporate governance." Others contend that FIIs are likely to be disadvantaged in terms of experience and access to information vis-à-vis the incumbent domestic investors (Brennan and Cao (1997)) and hence likely to underperform. Additionally, local governments tend to tightly regulate foreign investors in terms of the types of securities that they can trade and thus limit their performance potential.

The evidence on the FII stock-level investment performance in multiple markets (including Finland, Indonesia, Japan, South Korea, and Taiwan) is mixed. While Grinblatt and Keloharju (2000), Huang and Shiu (2009), and Bae, Min, and Jung (2011) conclude that FIIs generate superior performance, Kang and Stulz (1997), Dvorak (2005), and Choe, Kho, and Stulz (2005) report the opposite. Be that as it may, our intention is not to resolve prior mixed evidence, as this evidence relates to multiple countries with differences in trading environments as well as information qualities and flows. Additionally, methodologies differ widely across studies. Our research objective is to evaluate the investing skill of FIIs in India, a large emerging market that is relatively unexplored.¹ While there are many anecdotal references in the Indian financial press of significant FII activity in Indian financial markets, formal evidence of their role, and the consequences of their activity, is limited.

In India, an FII refers to an institution established or incorporated outside India which proposes to make investments in securities in India. To be able to trade, FIIs have to be registered with the Securities and Exchange Board of India (SEBI).² The label "FII" masks considerable heterogeneity. FIIs include overseas mutual funds and similar financial market participants whom we may tend to regard a priori as professional and sophisticated. But it also includes smaller players and only some FIIs may have the resources for rigorous analysis before making an investment decision.

FII trades can be classified into two broad categories: trades on their own account and trades on behalf of foreign investors. To facilitate the latter, FIIs issue derivative instruments known as P-Notes, via investment banks. FIIs initiate trades on behalf of their clients and then P-Notes are issued to the clients to indicate that shares are held by the FII on behalf of the client. Information on the identity of P-Note holders is typically difficult to establish, at least at the time of the trade. Thus, P-Notes offer foreign investors an opportunity to get exposure to the Indian market without having to register as an FII with SEBI.³ A frequent claim in the financial press is that P-Note holders are connected to Indian corporate entities and thus help the latter to retain control in the investee firms or to even avoid paying taxes in India (see for example, Economic Times (2014)). Thus, it is possible

(<u>https://en.wikipedia.org/wiki/List_of_stock_exchanges</u>). Further, on cumulative foreign direct investment by 2013, India ranked seventh in Asia and twenty-sixth in the world (<u>https://en.wikipedia.org/wiki/List_of_countries_by_FDI_abroad</u>).

¹ In terms of economic significance, the National Stock Exchange (NSE) whose firms we study is the twelfth largest exchange in terms of market capitalization at the beginning of 2015. (<u>https://en.wikipedia.org/wiki/List_of_stock_exchanges</u>). Further, on cumulative foreign direct investment by

² The criteria to qualify for registration are contained in the SEBI (Foreign Institutional Investor) Regulations, 1995. In January 2014, SEBI issued the SEBI (Foreign Portfolio Investors) Regulations), 2014. This regulation employs the term Foreign Portfolio Investors to define a broader class of foreign investors that consists of FIIs and Qualified Foreign Investors. In this paper, we continue to use the label FII as most of the academic literature still does so.

³ See Parikh (2014) for a more detailed discussion of the structure of the market for P-Notes.

that FII trades related to P-Notes are motivated by the desire to retain corporate control or avoid taxes, potentially at the expense of a return maximization objective. Hence, whether FIIs are successful portfolio managers, and whether they even care about market performance, are open questions.

Our first test of evaluating FII investing skill is similar to that of Gompers and Metrick (2001) and Yan and Zhang (2009) who study U.S. institutional investors. We estimate panel regressions of three month and twelve month returns on lagged quarterly FII net buying and several firm characteristics. The coefficient on the net buying variable is indicative of FIIs' informedness that is *incremental* to that obtained by just picking stocks based on certain firm characteristics.

If FIIs possess private information about a future event / outcome, they can trade ahead of that outcome (for example, knowledge of an order that the firm has received but yet to announce to the public). In our second test of FII informedness, we use earnings announcements as future outcomes and test if FII trading is in the same direction as onequarter ahead unexpected earnings and announcement returns.

Even without being privately informed, FIIs can simply time their trades to take advantage of a known relation between public information and future returns. This would be a lower threshold of investing skill. In this study, we test FIIs' ability to trade to exploit the post-earnings announcement drift (PEAD) anomaly (Bernard and Thomas (1989)). Specifically, we correlate FII net trading during the earnings announcement with (a) announced unexpected earnings and (b) post-announcement returns. Positive correlations with both variables would be consistent with FIIs trading to take advantage of the PEAD.

Our study employs a database of daily stock-level trades of FIIs in India for the years 2003-2014. This firm-level data was not available till SEBI began releasing masked FII transaction data in a step towards compliance with a promise made in reply to a parliamentary

question. We aggregate daily trades over a quarter to construct a measure of quarterly net buying. Our first finding is that FIIs' trades are on average unprofitable over the sample period. Portfolios of stocks that are formed based on positive, zero, and negative FII quarterly net buying yield average quarterly returns of 1.6%, 3.8%, and 2.4%, respectively. This suggests that investing in stocks in which FIIs do not trade yields superior returns to those in which they trade. Further, their sells perform better than their buys. Panel regressions of 3month and 12-month returns confirm that quarterly FII trading is negatively associated with subsequent returns. A 10% increase in FII net buying is associated with 3% (6%) decline in returns in the subsequent quarter (year).

To understand the causes of this poor performance, we separate the sample into (a) small/large stocks and (b) stocks that are frequently traded by FIIs and those that are less frequently traded. Fewer analysts follow small firms and these firms face more uncertainty and are hence harder value. Hence, we expect that the relation between FII trading and subsequent returns to be more negative for small firms. Our results, especially for one-year returns, are consistent with this prediction. Researchers in behavioural finance have developed theoretical models that posit that traders who are overconfident trade too much and consequently suffer losses (Odean (1998); Barber and Odean (2000); Daniel and Hirshleifer (2015)). Therefore, we predict the FII trading losses will be magnified when they trade more frequently. We divide our sample based on the median number of transactions per quarter (buys + sells) and find that more frequent FII trading magnifies the negative relation between FII trading and subsequent returns. Thus, the poor performance of FIIs in India can be partly attributed to excessive trading.

We also examine the relation between FII trading and subsequent earnings surprises and announcement returns. We find that net quarterly FII buying is unrelated to unexpected earnings for the next quarter. In contrast, net buying is significantly negatively related to

earnings announcement returns: a 10% increase in lagged net buying is associated with 0.7% decrease in earnings announcement returns. The inability to predict earnings news and the poor returns around earnings announcements strengthens the conclusion that FIIs in India do not behave like informed traders. This contrasts with a bulk of the U.S. evidence that institutional trades are positively associated with subsequent earnings news (Gompers and Metrick (2001); Yan and Zhang (2009)).

Lastly, our examination of FII net buying during the earnings announcement suggests that they do not exploit the post-earnings announcement drift. For our sample, buying firms in the top quartile of unexpected earnings and shorting firms in the bottom quartile, generates average market-adjusted returns of 6.5% over the next 3 months. In contrast, we find that FII net buying during the earnings announcement is not related to unexpected earnings and is negatively related to subsequent three-month stock returns. We conclude that FIIs fail to exploit the PEAD strategy.

Our study adds to the evidence on FII performance by examining their medium-term performance in a relatively unexplored economy, India. In a contemporaneous study of Indian FIIs, Acharya, Anshuman, and Kumar (2014) find that abnormal returns associated with unusually low (high) daily FII flow innovations reverse (do not reverse) over the next two weeks, especially when global volatility is high. They interpret the low FII daily innovations leading to price reversals as evidence of limits to arbitrage. Our evidence suggests that reversals occur over longer periods – three months to one year, and are also concentrated around earnings announcements. Further, we find that both FII buys and sells are associated with poor subsequent performance. Our evidence that unusually high trading magnifies FII trading losses complements work on trading losses associated with overconfident individuals who trade too frequently (Barber and Odean (2000); Daniel and Hirshleifer (2015)).

The explanations for the underperformance of FIIs in India could be behavioural or rational. FIIs could be poor at picking stocks *or* other investors could follow FIIs, even though they are not smart and thus temporarily push prices away from fundamentals. Rational explanations would include losses related to global portfolio diversification, tax avoidance strategies, and the desire to maintain corporate control. Distinguishing between these explanations would provide an interesting subject for future research.

The rest of the paper is organized as follows. In section 2, we provide a brief review of prior literature that relates to our research. Section 3 describes our data sources and sample selection process and section 4 presents the variable definitions and main empirical models. In section 5, we present our results, and in section 6 we discuss our conclusions.

2. **Prior Literature**

We organize our brief overview of prior work on the informedness of institutional investors into (a) U.S. based evidence and (b) evidence on FIIs.

2.1. U.S. Evidence

A sizable literature examines the profitability of trades by *U.S.* institutional investors as a group. The conclusion from most studies in this literature is that institutional investors are informed and profit from their trades; their net buying is positively associated with subsequent stock returns. There are four key aspects to this conclusion. First, these findings obtain when researchers examine the relation between changes in quarterly shareholdings and subsequent medium-term returns of 3 months to one year (Nofsinger and Sias (1999); Gompers and Metrick (2001); Bennet Sias, and Starks (2003); Sias (2004); Yan and Zhang (2009)). Second, Pucket and Yan (2011) document that even intra-quarter trades are profitable – the average difference in returns between institutional buys and sells from trade execution date to the end of the quarter is positive. Third, several studies show that quarterly change in institutional shareholdings is positively related to subsequent earnings surprises and earnings announcement returns (Ali, Durtschi, Lev, and Trombley (2004); Ke and Petroni (2004); Yan and Zhang (2009); Campbell, Ramadorai, and Schwartz (2009); Baker, Litov, Wachter, and Wurgler (2010)). Fourth, a few studies that examine trades over relatively short intervals just before earnings announcements document a positive relation between institutional net buying and earnings announcement returns (Berkman and McKenzie (2012); Hendershott, Livdan, and Schurhoff (2014)).

The finding that institutions behave like informed traders is not without exceptions. Cai and Zheng (2004) find that quarterly institutional trading has negative predictive ability for next quarter's returns using a vector autoregression framework. Bushee and Goodman (2007) find that neither institutions collectively nor any specific class of institutions, *both* trade in the direction of future earnings surprises and cash out subsequent to these surprises. Griffin, Shu and Topaloglu (2012) study the trading behavior of institutions that are clients of investment banks and find that institutional net buying over two-, five-, ten-, and twenty-day windows do not generate abnormal profits before earnings, takeover, and seasoned equity offering announcements. More recently, Edelen, Ince, Kladlec (2015) find that institutional investors fail to tilt their portfolios to take advantage of seven well-known anomalies: profitability, corporate investment, earnings quality, financing, financial distress, momentum. Instead, they trade contrary to anomaly prescriptions.

2.2 Evidence on FII trades

The research on FIIs' trades also generates mixed evidence on informedness / profitability. Evidence that FIIs are informed is provided in Grinblatt and Keloharju (2000), Huang and Shiu (2009), and Bae, Min, and Jung (2011). Using daily data for the 16 largest

Finnish stocks, Grinblatt and Keloharju (2000) find that the daily trades of foreigners is positively associated with returns over the subsequent 6 months. Huang and Shiu (2009) find that, in Taiwan, stocks with high foreign ownership outperform stocks with low foreign ownership. Bae, Min, and Jung (2011) find that for Korean stocks, foreign investors' buys significantly outperform their sells over the 12-month period following their trades.

The opposite evidence that FIIs are not informed is provided in Kang and Stulz (1997), Dvorak (2005), and Choe, Kho, and Stulz (2005). Kang and Stulz (1997) find that foreign investors in Japanese stocks underperform relative to the market portfolio in terms of monthly returns, but this underperformance is not statistically significant. Using transaction-level data on a sample of 30 Indonesian stocks, Dvorak (2005) finds that foreign investors underperform relative to domestic investors. Choe, Kho, and Stulz (2005) using Korean intraday price data, show that foreign money managers pay more than domestic money managers when they buy and receive less when they sell for medium and large trades.

A few studies also examine FII trades around earnings announcements. Seasholes (2003) finds that foreign investors in Taiwan and South Korea accumulate shares before positive earnings news and sell shares before negative earnings news. Eom, Hahn, and Sohn (2010) find that, in Korea, foreign investors' pre-announcement trades predict earnings surprises, and that their trades after earnings announcements appear to exploit PEAD. In contrast, a subsequent study of Korean stocks, Park, Lee, and Song (2013) document that pre-announcement trading by foreign institutions does not forecast abnormal returns in the week following the earnings announcement.

3. Data Sources and Sample

We obtain data from three sources: the PROWESS database of the Centre for Monitoring Indian Economy Private Limited (CMIE), the website of the National Stock Exchange of India (NSE), and the website of the National Securities Depositories Limited (NSDL). PROWESS provides daily returns, prices, shares outstanding, and volumes; quarterly and annual financial statement data; and quarterly data on FII ownership. The NSE website (<u>http://www.nseindia.com</u>) is our source for earnings announcement dates. The NSDL website contains the FII trade dataset.⁴ We study NSE-listed stocks alone as they tend to be more frequently traded than stocks listed on the Mumbai Stock Exchange (BSE), the other major Indian Stock exchange.

The sample period begins in the first quarter of 2003 (the first quarter for which firmlevel FII trades are available) and ends in the second quarter of 2014. The initial sample consists of 57,596 firm-quarters for 1,846 NSE listed firms that have data on quarterly FII trading and contemporaneous quarterly stock returns. We exclude 10,926 firm-quarters that do not have data to compute one or more of the regression control variables (defined in section 4). An additional 156 observations are dropped because of missing data on quarterly FII ownership. The remaining 46,514 observations constitute the sample for the tests in which three- and twelve-month returns are regressed on lagged quarterly FII trading. In a second set of tests, we examine earnings announcement returns and post-announcement returns. For these tests, the requirement that earnings announcement dates, unexpected earnings, and postannouncement returns be available leaves us with a smaller sample of 28,460 firm-quarters. Panel A of Table 1 reports the screens employed to arrive at our final samples for the two sets of tests.

Panel B of Table 1 presents the year-by-year distribution of the number of firmquarters with and without FII ownership. The percentage of firm-quarters with FII ownership increases from 58% in 2003 to 80% in 2008, the year when the recent financial crisis peaked.

⁴ This data is freely available at

<u>https://www.fpi.nsdl.co.in/web/StaticReports/FIITradeWise2008/FIITradeWise2008.htm</u>. We thank Shyam Benegal who was instrumental in causing the data to become available in the public domain.

Subsequently, the percentage steadily drops to 72% in 2014 suggesting that the crisis had a significant impact on FII participation in India. Panel B reports a similar trend for mean percentage FII ownership. After peaking at 7.7% in 2008, that mean drops to 6.8% in 2014. The last column of Panel B reports a measure of mean FII turnover. We compute this measure for each firm-quarter by adding the aggregate shares bought and sold by FIIs in that quarter and dividing this sum by beginning of period shares outstanding. Interestingly, mean FII turnover increases until 2008 when it reaches 2.6% and then drops down to 1.4% by 2014. In general, FIIs have been trading less after the 2008 crisis.

4. Variables and Models

In this section, we define the dependent variables (stock returns), main independent variables (lagged FII trading), and regression control variables. We then present the models that evaluate the profitability of FII trading, where we forecast stock returns with lagged FII trading.

4.1. Stock returns

Our first two dependent variables are three-month and twelve-month stock returns. To measure them, we begin by defining the continuously compounded return on day t as the logarithm of the ratio of the closing price on day t to the closing price on day t-1. Daily closing prices reflect dividends and adjustments for stock splits. LEADRET₃ (LEADRET₁₂) is defined as the sum of daily continuously compounded returns over three (twelve months).

Our second two dependent variables are earnings announcement returns and postannouncement returns. We label the date on which firms announce quarterly financial results as day 0. Earnings announcement return (ERET) is defined as the sum of continuously compounded returns over the three-day interval (-1, +1). Post-announcement returns (POSTERET) are computed over the three month interval (+2, +64), assuming 21 trading days in a month. If a daily return is missing in a cumulation period, it is set to equal zero; however, if daily returns are missing for two-thirds or more of any cumulation period, we drop that observation. Our treatment of missing returns is similar to that of Hung, Li, and Wang (2014).

4.2 FII Trading Measures

Our main independent variable is quarterly firm-level FII *net* buying. However, we also examine quarterly buying and selling separately as FII buy and sell decisions might differ in their ability to predict subsequent returns. When forecasting post-announcement returns, FII net buying during the earnings announcement is the main independent variable because we wish to evaluate if FIIs are able to profit from the PEAD anomaly.

The NSDL' FII database's basic unit of observation is trading activity by an FII for a stock on a trading day on a specified exchange. The database reports six measures of trading activity for each FII-stock-exchange-day quadruple: (a) the number of buys; (b) the number of sells; (c) aggregate shares bought on a day; (d) aggregate shares sold on a day; (e) value of shares bought; and (f) value of shares sold. Unfortunately, SEBI masks the FII identifying codes and changes them every month; this renders FII-level analysis difficult. Therefore, for each stock-trading day pair, we aggregate daily data across FIIs. Because we have no reason to expect exchange-related effects, we also aggregate daily trades across exchanges (primarily the BSE and the NSE). Thus, the basic unit of analysis of FII trading is a firm-date observation.

To compute quarterly net FII buying, we begin by defining FII net trading for firm i and day t (NETFII) as the difference between shares bought (BUY_{it}) and shares sold (SOLD_{it}). We aggregate NETFII over a calendar quarter to obtain Q_NETBUY. We also

compute the sum of all FII buys (sells) in a quarter, Q_BUY (Q_SELL). For the earnings announcement tests, we compute EA_NETBUY as the sum of net FII buying over days (-1, +1). To control for cross-sectional differences in firm size, cumulated trading measures are divided by shares outstanding at the beginning of the period over which trades are cumulated. Lo and Wang (2000: 258) characterize this share turnover-type measure as "a natural measure of trading activity."

4.3. Control Variables

We rely on two prior studies of U.S. institutional trading - Gompers and Metrick (2001) and Yan and Zhang (2009), to define firm characteristics that are likely to be correlated with both FII trading and future returns. Before defining these variables, we motivate their choice.

First, a large body of work on return predictability has established that small stocks, high book-to-market stocks, and stocks with high recent returns have predictable future returns. This predictability has been interpreted either as anomalous evidence that contradicts market efficiency or as returns to stocks with higher risk. FII trades are likely to be correlated with these characteristics either because FIIs wish to exploit anomalies or because of their risk preferences. Second, because FIIs trade on behalf of their clients, they are governed by fiduciary (prudence) considerations in their investment choices (Del Guercio (1996)). Gompers and Metrick (2001) employ four firm characteristics that capture this fiduciary motive: age, dividend yield, membership in the S&P 500, and return volatility. They predict that institutional ownership will be positively related to age, dividend yield, and S&P 500 membership, and negatively related to volatility. Lastly, because institutions are likely to demand liquid stocks, Gompers and Metrick (2001) suggest three indicators of liquidity that

are expected to be positively related to institutional trading: market capitalization, per-share stock price, and share turnover.

Building on the above, with the exception of the S&P 500 dummy that is not relevant to the Indian market, we include the following nine variables in the regressions of stock returns on lagged FII trading:

- 1. MCAP: Market Capitalization at the beginning of the quarter in which FII trading is measured.
- 2. BM: Book value of equity divided by MCAP. Book value of equity is measured either on the date MCAP is measured or on the year end date of the most recently concluded fiscal year.
- **3. LAGRET3:** The cumulative return over the 3 months prior to the quarter over which FII trading is measured.
- **4. LAGRET9:** The cumulative return measured over the 9 months prior to the 3-month period over which LAGRET3 is measured.
- 5. AGE: The number of years since the year of incorporation.
- **6. DIVY:** Annual cash dividend paid in the fiscal year for which book value of equity is measured, divided by MCAP.
- **7. VOL:** The standard deviation of monthly returns over the twelve months before the quarter in which FII trading is measured.
- 8. PRC: Share price at the beginning of the quarter.
- **9. TO:** The average monthly volume divided by shares outstanding over the three months before the quarter in which FII trading is measured.

If non-institutional investors follow institutions, an increase (decrease) in institutional ownership of a stock could increase (decrease) the demand in that stock and thus influence subsequent returns. Therefore, Gompers and Metrick (2001) argue that to evaluate the investing skill of institutions, it is important to control for the level of institutional ownership which reflect "demand shocks" for stocks held by institutions. Accordingly, we also include the end-of-quarter FII ownership percentage (FIIP) when forecasting stock returns.

4.4. Regression Models

We evaluate FII trade profitability in three ways. First, we examine the relation between quarterly FII trading and subsequent 3-month and 12-month returns. Second, we predict earnings announcement returns with lagged quarterly FII trading. Third, we evaluate the ability of FII trades during earnings announcements to forecast subsequent three-month returns; this allows us to test if FIIs exploit the PEAD anomaly.

The first model that we estimate is:

$$LEADRET_{j,it} = \alpha_0 + \alpha_1 Q_N ETBUY_{it} + \alpha_2 FIIP_{it} + \alpha_3 MCAP_{it} + \alpha_4 BM_{it} + \alpha_5 LAGRET3_{it} + \alpha_6 LAGRET9_{it} + \alpha_7 AGE_{it} + \alpha_8 DIVY_{it} + \alpha_9 VOL_{it} + \alpha_{10} PRC_{it} + \alpha_{11}TO_{it} + \varepsilon_{it}, j = 3 \text{ or } 12 \text{ months}$$
(1)

where LEADRET₃ and LEADRET₁₂ are the one-quarter ahead and one-year ahead returns, respectively, and Q_NETBUY is lagged quarterly FII net buying. The coefficient on Q_NETBUY captures returns to the investing skill of FIIs (or lack thereof) that are *incremental* to the returns obtained by just picking stocks based on the nine firm characteristics (control variables). To account for unobserved firm heterogeneity and economy-level factors that cause returns to vary, we include firm and quarter fixed effects in all regressions. Standard errors are adjusted to account for heteroscedasticity and two-way clustering, across firms and over quarters.

In our second model, we predict earnings announcement returns with quarterly FII net buying in the quarter that just precedes the earnings announcement:

$$ERET_{it} = \alpha_0 + \alpha_1 Q_N ETBUY_{it} + \alpha_2 FIIP_{it} + \alpha_3 MCAP_{it} + \alpha_4 BM_{it} + \alpha_5 LAGRET3_{it} + \alpha_6 LAGRET9_{it} + \alpha_7 AGE_{it} + \alpha_8 DIVY_{it} + \alpha_9 VOL_{it} + \alpha_{10} PRC_{it} + \alpha_{11}TO_{it} + \alpha_{12}EA_N ETBUY_{it} + \alpha_{13} MRET_{it} + \alpha_{14}UE_{it} + + \varepsilon_{2.it}$$
(2)

where ERET is the earnings-announcement return. Compared to Eq. (1), we include three additional variables to explain earnings announcement returns: FII net buying during the announcement (EA_NETBUY), unexpected earnings (UE), and market returns during the announcement (MRET). Including EA_NETBUY allows us to measure the market reaction to FII trades during the announcement. UE measures earnings news during the announcement and is defined as the difference between EPS in quarter t and its lagged value, from four quarters before, divided by the closing price per share measured on day -2 relative to the earnings announcement. MRET is defined as the return on the CNX Nifty Index summed over days -1 to +1. The index daily return is calculated as the daily percentage change in the Index.

Our third model is intended to assess FIIs' ability to forecast post-earnings announcement returns. We focus here on their trading during the earnings announcements (EA_NETBUY). The model we estimate is: $POSTERET_{it} = \alpha_0 + \alpha_1 EA_NETBUY_{it} + \alpha_2 FIIP_{it} + \alpha_3 MCAP_{it} + \alpha_4 BM_{it}$

$$+ \alpha_5 LAGRET3_{it} + \alpha_6 LAGRET9_{it} + \alpha_7 AGE_{it} + \alpha_8 DIVY_{it} + \alpha_9 VOL_{it} + \alpha_{10} PRC_{it} + \alpha_{11} TO_{it} + \alpha_{12} UE_{it} + \varepsilon_{3,it}$$
(3)

where POSTERET is the three-month post-announcement return. As with Eq. (2), we include UE as an additional explanatory variable. But here it does not capture contemporaneous earnings news; rather, it is included to confirm that the PEAD anomaly obtains in the Indian market.

5. Results

5.1. Descriptive Statistics

Table 2 reports descriptive statistics. All variables are winsorized at 1% and 99% levels. The mean quarterly FII buying (QBUY) and selling (QSELL), scaled by shares outstanding at the start of each quarter, is each less than 1%, with buys marginally larger than sells, yielding a mean net FII buying (Q_NETBUY) of 0.1%. In untabulated results, we find that the unscaled mean quarterly net buys equals 191,559 shares. The median FII net buying is zero reflecting the fact that close to half (49%) of the firm quarters have no FII trading. During earnings announcements, mean net FII buying (EA_NETBUY) is -10,367 shares, indicating that FIIs are net sellers during the announcements. Again, the median and even the 25th and 75th percentiles of EA_NETBUY equal 0, because 66% of the observations have no FII activity during earnings announcements. The mean FII ownership (FIIP) at the end of a quarter is 6.3% while the median again is much lower at 1.8%.

Mean and median values for three and twelve month raw returns (LEADRET₃ and LEADRET₁₂) are positive. In contrast, the mean (median) earnings announcement return (ERET) is -0.3% (-0.6%). Mean unexpected earnings divided by share price (UE) is also negative at -1.5%. Thus, our sample firms' performance is marginally poor at earnings announcement dates.

The average firm has a market capitalization of ₹30,545 million (approximately \$509 million), share price of ₹216 (approximately \$3.60), dividend yield of 1.7%, a book-to-market ratio of 1.0, and is aged 32 years. The monthly volatility and turnover for the average firm are 13.6% and 1.9%, respectively.⁵

⁵ As a benchmark comparison, we examine descriptive statistics reported by Yan and Zhang (2009) for the same control variables for U.S. stocks for the years 1980-2003. The average U.S. firm has a market capitalization of \$961 million, a dividend yield of 2.2%, a book-to-market ratio of 0.7, and has 12 years of CRSP return data (their proxy for age). The monthly volatility and turnover for the average firm are 13.6% and 7.8% respectively. Thus, the average Indian firm is smaller but older than the average U.S. firm, and has significantly lower monthly turnover.

5.2. Determinants of FII Trading

Several studies of U.S. institutions estimate regressions of institutional trading / ownership on firm characteristics to identify institutional style preferences (Gompers and Metrick (2001); Bennett, Sias, and Starks (2003); Sias (2005); Yan and Zhang (2009)). We too estimate similar regressions. Evidence of significant relations between FII trading and firm characteristics would validate the need to include these characteristics in regressions of stock returns on lagged FII trading to avoid any correlated omitted variable bias as many of these characteristics are likely related to future returns.

Table 3 reports panel regressions of quarterly FII net buying (Q_NETBUY) on nine firm characteristics: past 3 month and 9 month returns, market capitalization, price, book-to-market ratio, dividend yield, age, monthly volatility, and monthly volume. Note that all independent variables are measured prior to the quarter in which Q_NETBUY is measured.

The evidence indicates that FIIs tend to prefer larger stocks and stocks with lower book-to-market ratios. Additionally, they behave like momentum investors as evidenced by the significant positive correlation between their net buying and lagged 3-month and 9-month returns. The prudence argument suggests that FIIs would prefer older stocks and stocks with less volatility and higher dividend yields. The evidence on prudence is mixed: while FIIs do avoid high volatility stocks, they show a preference for young stocks and low dividend yield stocks. The proxies for liquidity are share price, turnover, and market capitalization; we expect that FIIs would prefer to invest in stocks with high prices, large market capitalization, and high turnover. The evidence on the liquidity motive is also mixed. FIIs do prefer largecap stocks, but tend to be net-buyers of low-price stocks. FII net buying is not significantly related to turnover.

While the evidence on market capitalization, past returns, and dividend yield is similar to that for U.S. stocks, the evidence on trading preferences related to age, volatility, book-tomarket ratios, and share price differs. While not the focus of the paper, these differences raise interesting questions about why institutional investor preferences could differ across countries and exchanges.

5.3. Quarterly FII Trades and Subsequent 3 and 12 Month Returns

To provide a simple and intuitive answer to the question of whether FII trades are profitable, we form portfolios based on the sign of net FII buying for a calendar quarter and compute value-weighted portfolio returns over the next quarter. We evaluate three portfolios: stocks where net FII buying is positive, negative, and zero, and label these the net buy, net sell, and no trade portfolios. We repeat this exercise for each of the 46 quarters from the first quarter of 2003 to the second quarter of 2014. We then calculate the product of 1 plus each portfolio return over time to arrive at the future value of $\mathbf{\xi}1$ at the end of the third quarter of 2014.

Figure 1 plots the value of investing $\overline{\mathbf{x}}$ 1 in each of the portfolios over time. All three portfolios rise in value up to the third quarter of 2007, decline until the last quarter of 2008 (the period of the financial crisis) before displaying some cyclicality. If we had invested in the net buy portfolio every quarter, $\overline{\mathbf{x}}$ 1 would have grown to $\overline{\mathbf{x}}$ 2.07 at the end of the third quarter of 2014. A $\overline{\mathbf{x}}$ 1 investment in the net sell portfolio would be worth $\overline{\mathbf{x}}$ 2.99 after 46 quarters. The no-trade portfolio registers the highest returns of the three portfolios: $\overline{\mathbf{x}}$ 1 invested in a portfolio of stocks in which FIIs *do not invest* grows to $\overline{\mathbf{x}}$ 5.62. The implied average quarterly returns for the net buy, no trade, and net sell portfolios are 1.6%, 3.8%, and 2.4%, respectively. Clearly, FII sells outperform FII buys. Moreover, interestingly, avoiding

stocks in which FIIs trade yields superior returns to strategies of following either FII buys or sells.

The univariate analysis of Figure 1 tells us the FII sells outperform buys. Because FII trading is associated with various firm characteristics, a portion of this return differential could be attributed to these characteristics. The question that we are interested in is whether FII net buying is incrementally associated with future returns after controlling for the returns associated with the characteristics.

Table 4 reports panel regressions of 3-month and 12 month returns (LEADRET₃ and LEADRET₁₂) on lagged quarterly FII net buying (Q_NETBUY) and control variables. The regressions control for firm and quarter effects (not reported) and standard errors are adjusted for clustering by firm and quarter. All regression variables are winsorized at the 1% and 99% levels. We follow Gompers and Metrick (2001) and Yan and Zhang (2009) and express the following strictly positive variables in natural logarithms: MCAP, PRC, AGE, QSTD, and QTO.

When LEADRET₃ is the dependent variable, the coefficient on Q_NETBUY is negative and statistically significant confirming the univariate evidence in Figure 1. The coefficient suggests that a 10% increase in FII net buying is associated with 3% decline in returns in the subsequent quarter. In column (2), we replace FII net buying with separate variables for FII buying and selling. The coefficients on both Q_BUY and Q_SELL are statistically significant and negative and positive, respectively – stocks that FII buy experience declines in returns in the next quarter and those that they sell experience return increases. In columns (3) and (4), we report results when the dependent variable is the 12month return. Again, Q_NETBUY is statistically significant with a coefficient of -0.611 - a10% increase in FII net buying is associated with 6% lower returns in the next one year. Examining buying and selling separately in column (4) indicates that FII buys (sells) exhibit

negative (positive) twelve-month returns; the coefficient on Q_SELL, however, is not statistically significant at the 10% level.

All regressions include FIIPC, the quarter-end FII ownership at the beginning of the return cumulation period. Gompers and Metrick (2001) argue that this variable captures demand shocks that cause other investors to follow FIIs and thus create persistence in returns. The coefficient on FIIPC is negative but not statistically significant. While the sign of the coefficient does not support the demand shock theory, the lack of statistical significance prevents us from drawing any conclusions.

Turning to the control variables, the statistically significant variables for both the 3month and 12-month returns are LAGRET3 (positive), LAGRET9 (positive), BM (positive), and MCAP (negative). Thus, the size, book-to-market, and momentum effects document in the U.S. market obtain in India. Three variables are significantly related to 12 month returns alone – share price (positive), dividend yield (positive), and turnover (negative).

Overall, our evidence leads to the following conclusion: FIIs trades are not profitable after controlling for firm characteristics that predict returns. To understand the causes of the poor performance, we examine if it is concentrated in stocks with certain characteristics. Following Yan and Zhang (2009), we divide the sample into small and large stocks estimate the regressions reported in table 4 for the two samples. We also examine the effect of FII trading frequency.

Generally, fewer analysts follow small firms; further, these firms face more uncertainty and are hence harder value. Therefore, we expect that the relation between FII trading and subsequent returns is likely to be more negative for small firms. Excessive trading can be detrimental to performance purely from a transaction cost perspective. Additionally, several papers develop theoretical models that posit that traders who are overconfident trade too much and consequently suffer losses (Odean (1998); Barber and Odean (2000); Daniel

and Hirshleifer (2015)). Overconfident investors tend to place excessive weight on their private valuation and less on market valuation. This overconfidence leads to more frequent trading and subsequent trading losses. In light of this evidence, we expect the relation between FII trading and subsequent returns to be more negative for firms where FIIs trade more frequently during the quarter.

We divide firms into two groups based on the median beginning of quarter market capitalization. Large (small) stocks are defined as those with market capitalization greater (less) than that of the median stock. Similarly, firms for which the number of FII transactions exceeded (was less than) the median number of FII transactions (excluding no trades) were classified as "frequently FII traded firms" ("less frequently FII traded firms"). The number of transactions equals the sum of the number of buys and the number of sells in a quarter.

We re-estimate the regressions reported in Table 4 (Eq. (1)) for small/large stocks and stocks where FIIs trade frequently/less frequently. Panel A of Table 5 reports the results for small versus large stocks. For 3-month returns, the coefficient on Q_NETBUY is negative and statistically significant for both small and large stocks. For small stocks, the coefficient on Q_NETBUY is -0.392 which is 56% more negative than that for large stocks (-0.250). For 12-month returns, the coefficient on Q_NETBUY is -1.027 and statistically significant for small stocks; for large stocks it is negative, but not statistically significant at the 10% level. The collective evidence suggests that FII trades are less profitable when they trade in small stocks.

Panel B of Table 5 reports the results for the frequently and less frequently FII-traded stocks. For both three-month and one-year returns, the coefficient on Q_NETBUY is not statistically significant for stocks where FII trade less frequently. In contrast, when FIIs trade frequently, Q_NETBUY is negatively and significantly associated with subsequent returns. For 3-month returns, the coefficient is -0.401 (t-statistic = -2.51); a 10% increase in FII

quarterly net buying is associate with 4% lower returns in the next quarter. Similarly, for one year returns, a 10% increase in FII quarterly net buying is associated with 6.46% decrease returns over the next one year. The lesson is: avoid (buy) stocks that FIIs buy (sell), especially when their trading levels are relatively high.

5.4. FII Trades and Earnings Announcements

Our results thus far indicate that quarterly FII trading is negatively associated with subsequent returns over intermediate horizons – three and twelve months. To provide more direct evidence on FIIs' investing skills, we examine the relation between FII trades and future earnings news. We examine both unexpected earnings and earnings announcement abnormal returns. Additionally, we also evaluate FII performance in the post-announcement period.

Because large sample evidence on returns and volume around earnings announcements for Indian firms is unavailable, we begin by providing descriptive evidence on (a) market volume and FII trading around announcements and (b) return movements prior to, during and subsequent to earnings announcements. In this manner, we confirm that return and volume patterns documented in other countries are observed in India as well.

Figure 2 presents mean volume deflated by shares outstanding in the 130-day window around the earnings announcement date. Average volume displays a significant spike on day 0. It hovers around 0.25% in the pre- and post-announcement periods, but touches 0.36% on day 0 and 0.32% on day 1. We can safely conclude that earnings announcements stimulate trading.

In Figure 3 and 4, we plot the mean daily FII buying and selling (both as a percentage of daily shares outstanding) separately. Again, we observe a spike in buying and selling magnitudes on day 1, with a more pronounced spike for selling activity. Table 6 contains

volume and FII trading data for days -9 to +9. The numbers confirm the visual information provided by the plots: days 0 and 1 represent the peak in trading activity for the market and FIIs in the 19-day interval.

Table 7 relates unexpected earnings to market-adjusted returns before, during, and after earnings announcements. We divide sample firms in each quarter into four portfolios based on the distribution of unexpected earnings (UE) in the previous quarter. Recall that UE is the difference between EPS in quarter t and EPS from quarter t-4, divided by closing price on day -2. Using last quarter's UE ensures that the UE distribution is public knowledge on the date from which returns are cumulated. Next, for each firm-quarter, we compute the cumulative return over three horizons: days (-64, -2), (-1, +1), and (+2, +64). Averaging cumulative returns over firms in event-time produces a portfolio cumulative return (CR) for each UE portfolio and each of the three horizons. Cumulative market-adjusted returns are computed similarly. Cumulative abnormal returns (CAR) are defined as the difference between the portfolio-level CR and the market-level CR.

Columns (1) and (2) of Table 7 contain the mean and median values of UE for the four quartiles. The mean (median) UE spread is 17.9% (7.7%) and is statistically significant at conventional levels based on a t-test (Wilcoxon Z test). The next four columns contain evidence on the relation between UE and pre- and during-announcement CARs. Consistent with prior research, pre-announcement CARs are significantly higher for the high UE quartile compared to the low UE quartile; the mean (median) difference is 12.6% (10.9%) and statistically significant. This supports the idea that markets anticipate the sign of future earnings surprises; that is prices lead earnings (Beaver, Lambert, and Morse (1980)). UE is also positively correlated with earnings announcement returns; the mean spread between the high and low UE quartiles is 3.7%.

Columns (7) and (8) contain the average post-announcement abnormal returns for the low and high UE portfolios. The mean (median) hedge portfolio return (spread) is 6.5% (5.5%) and is statistically significant; thus, the results confirm the presence of the PEAD anomaly for this sample of Indian firms. The magnitude of the three month PEAD is close to that documented in U.S. and Canada, but larger than that reported for U.K. and China in prior research. Cao and Narayanamoorthy (2012) report a 6.3% hedge portfolio return for U.S. stocks for the years 1987-2008 and for Canada, Chudek, Truong, and Veeraraghavan (2011) report a 6.8% drift, for the years 1994-2009. Truong (2011) reports a 4.6% hedge portfolio return for Chinese stocks for 1994-2009. For the U.K., Liu, Strong, and Xu (2003) document a three-month drift of 2.9% for the years 1988-1998.⁶

Overall, we observe a spike in mean volume and FII trading during the earnings announcements, suggesting that these announcements stimulate trading in general and by FIIs in particular. Further, our Indian sample exhibits behavior consistent with three stylized facts related to earnings announcements documented in prior research: markets anticipate the sign of future unexpected earnings, earnings announcement returns are positively correlated with unexpected earnings, and markets under-react to information on unexpected earnings.

To test if FII trading is related to future earnings news, we estimate panel regressions of UE on Q_NETBUY, with Q_NETBUY being measured over the calendar quarter before the earnings announcement. In addition to the nine control variables that we include in our models for FII net buying and 3-month and one year returns (Tables 3-5), we include the lagged value of UE to account for the positive autocorrelation in UE documented in prior research (Foster (1977); Bernard and Thomas (1989)). Table 8, Column (1) contains the regression results. The coefficient on Q_NETBUY is negative and has a very small t-statistic

⁶ Sen (2009) is the only study that we are aware of that documents the PEAD in India. His sample consists of 582 Mumbai Stock Exchange (BSE) firms for the years 2001-2006. He reports a hedge portfolio return of 10.05% from a trading strategy that buys (sells) stocks in the highest (lowest) quintile of unexpected earnings. Return performance is measured up to the next earnings announcement (approximately three months).

of -0.22. Thus, quarterly FII trades are unrelated to subsequent quarterly unexpected earnings. In and of itself, this does not constitute evidence on the investing skill of FIIs; perhaps their objective function does not require that they forecast short-term earnings growth.

In column (2) we report regressions of earnings announcement returns (ERET) on Q_NETBUY and control variables (Eq. (2)). The coefficient on Q_NETBUY is -0.07 and significant at the 5% level (t-statistic = -1.97) suggesting that FII investing decisions generate trading losses around earnings announcements. A 10% increase in lagged net buying is associated with 0.7% decrease in earnings announcement returns. Because FII trades are uncorrelated with unexpected earnings, these losses are driven by a factor that influences ERET but not UE. In column (3), we include Q_BUY and Q_SELL, separate variables for lagged quarterly FII buying and selling. While Q_BUY is negatively related to ERET (t-statistic = -1.64), Q_SELL is positively related to ERET (t-statistic = 1.78). This implies that FII buying generates losses during earnings announcements and their sells are timed poorly – they miss out on positive returns during earnings announcements. Interestingly, ERET bears a strong positive relation with contemporaneous net buying by FIIs (EA_NETBUY). Thus, while FIIs make trading losses during earnings announcements, investors react positively to their trades at the announcement. Further research is needed to understand these somewhat conflicting findings.

We next examine the profitability of trades during earnings announcements by relating post-announcement returns to FII trading during the announcement. Column (4) of Table 8 reports the estimates of Eq. (3) in which the 3-month post-announcement return (POSTERET) is regressed on FII net buying during the announcement window (EA_NETBUY) and control variables. The coefficient is -3.49 negative and significant at the 1% level (t-statistic = -2.61) suggesting that FII trades during the earnings announcement perform poorly in the next three months. In the last column of the Table 8, we separately

examine the performance of FII buys and sells (EA_BUY and EA_SELL). Again, EA_BUY is negatively related to POSTERET (t-statistic = -2.33) and EA_SELL is positively related to POSTERET (t-statistic = 2.52).

The presence of the PEAD anomaly reported in table 7 would suggest that FIIs could profit by executing trades on earnings announcement dates in the direction of the sign of UE. In untabulated work, we examine this possibility, by estimating panel regressions of EA_NETBUY on UE and the nine control variables defined in section 4. Interestingly, the coefficient on UE is small and negative (-0.0004) and not significant at conventional levels (p-value = 0.35). In combination with the poor post-announcement performance of FII trades during earnings announcements, this evidence suggests a failure to capitalize on the PEAD anomaly.

Overall, the evidence on earnings announcements suggests that FII trades both in the quarter before earnings announcements and during these announcements are unprofitable. These findings confirm the general tendency of FII trades to be associated with poor medium-term performance. Additionally, based on their announcement date trades FIIs appear to miss the opportunity to profit from the post-earnings announcement drift.

6. Conclusions

This study presents evidence that Foreign Institutional Investor (FII) trades are unprofitable. Portfolios of stocks that are formed based on positive, zero, and negative FII quarterly net buying yield average quarterly returns of 1.6%, 3.8%, and 2.4%, respectively. This suggests that investing in stocks in which FIIs do not trade yields superior returns to those in which they trade. Further, their sells perform better than their buys. Panel regressions of 3-month and 12-month returns on lagged quarterly FII net buying and several firm characteristics establish that poor FII performance holds in a multivariate setting. The poor

performance is magnified when FIIs trade in small stocks and when they trade more frequently than normal. We also find that their quarterly trades are negatively associated with returns during earnings announcement dates. Further, their trades during the announcements also generate poor performance in the three-month post-announcement period. Collectively, the evidence leads us to conclude that FIIs in India do not behave like informed investors.

Our findings lead to the question of why FIIs perform poorly in the Indian market. The first possibility is that FIIs are either not smart or are overconfident. The evidence that their losses are magnified when they trade more frequently suggests that overconfidence is a partial explanation. A second explanation is that other investors perceive FIIs as smart money and follow /mimic their trades. This herding in turn could lead to prices overshooting true values and subsequently reversing.⁷ A third possibility is that FIIs are global investors who are willing to accept losses in Indian markets some of the time because some of their Indian trades are executed to rebalance global portfolios and thus reduce risk. A fourth possibility is that FIIs might be conduits for Indian funds routed back to India via foreign countries. Because some of these funds may represent income on which taxes have been avoided, FIIs might be willing to accept trading losses as the benefit from tax avoidance exceeds these losses. Lastly, the desire to increase or maintain corporate control might cause some FIIs to behave like long-term investors and accept short-term losses. Disentangling these alternate explanations would be a very interesting subject for future research. This paper only takes the first step in understanding FII flows into India and raises more research possibilities.

⁷ The idea that other investors will mimic FIIs (even though they may not be smart) becomes especially relevant during earnings announcements. This is because earnings announcements serve as focal points. Schelling (1960) illustrates the idea of a focal point in coordination games through an abundance of examples. He shows that any aspect of the problem that has an innate saliency can serve as a potential focal point. The problem before agents is that even without direct communication and with interests that are not zero-sum but not fully aligned either, they need to coordinate their actions, for which they need to coordinate expectations. An anticipated earnings announcement is a natural focal point for market participants.

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The figure tracks the value of 1 invested on March 31, 2003 in three portfolios of stocks: stocks in which FIIs are net buyers in a quarter (net buy portfolio), stocks in which they did not trade during the quarter (no trade portfolio), and stocks in which FIIs are net sellers (net sell portfolio). Portfolios are formed at the end of each quarter and one-quarter ahead value-weighted returns are calculated, with weights equalling the market capitalization at the end of the quarter in which portfolios are formed. Quarterly returns are computed by summing continuously compounded daily returns. We then calculate the product of 1 plus each portfolio return over time to arrive at the future value of \mathbf{T} at the end of the third quarter of 2014. Data on daily returns are obtained from the PROWESS database. Data on FII trading are obtained from the NSDL website: https://www.fpi.nsdl.co.in/



Mean Volume / Shares Outstanding around Earnings Announcements

The figure documents mean daily trading volume divided by shares outstanding for days -65 to +65 around the earnings announcement date. The sample consists of 28,460 earnings announcements from 2003, Q1 to 2014, Q2. Data on daily volume and shares outstanding are obtained from the PROWESS database and earnings announcement dates are obtained from the NSE web site, <u>http://www.nseindia.com/</u>.



Mean FII Buying Divided by Shares Outstanding Around Earnings Announcements

The figure documents the mean daily buying by FIIs divided by shares outstanding at end of quarter t-1 for days -65 to +65 around the earnings announcement date. FII buying for a firm on a day is obtained by adding all FII buys for that firm. The sample consists of 28,460 earnings announcements from 2003, Q1 to 2014, Q2. Data on FII trading are obtained from the NSDL website: <u>https://www.fpi.nsdl.co.in/</u>, earnings announcement dates are obtained from the NSE web site, <u>http://www.nseindia.com/</u>, and daily shares outstanding are from the PROWESS database.



Mean FII Selling Divided by Shares Outstanding Around Earnings Announcements

The figure documents the mean daily selling by FIIs divided by shares outstanding at end of quarter t-1 for days -65 to +65 around the earnings announcement date. FII selling for a firm on a day is obtained by adding all FII sells for that firm. The sample consists of 28,460 earnings announcements from 2003, Q1 to 2014, Q2. Data on FII trading are obtained from the NSDL website: <u>https://www.fpi.nsdl.co.in/</u>, earnings announcement dates are obtained from the NSE web site, <u>http://www.nseindia.com/</u>, and daily shares outstanding are from the PROWESS database.



Sample Selection and Yearly Distribution

We conduct two sets of analyses relating FII trading to subsequent stock returns. In the first set of tests, we predict 3-month and 12 month returns with FII trading; in the second set, we predict earnings announcement returns. Panel A reports the screens used to arrive at the final samples for the two set of tests. The initial sample consists of observations with non-missing data for quarterly FII trading and contemporaneous stock returns. The sample period is from 2003, Q1 to 2014, Q2. Panel B reports the yearly frequencies of total number of firm-quarters, firm-quarters with zero FII ownership, and firm-quarters with non-zero FII ownership. The panel also reports the yearly percentages of firms with FII ownership, mean FII ownership, and mean turnover. Data on FII trading are obtained from the NSDL website: <u>https://www.fpi.nsdl.co.in/</u>. Stock returns, quarterly ownership data, and data items used to define control variables are from the PROWESS database. Data on earnings announcement dates are from the NSE website, www.nseindia.com. Variable definitions are contained in Table 2.

Panel A: Sample Selection

	Firms	Firm-quarters
Initial Sample:	1,846	57,596
Less:		
Missing data for control variables		10,926
Missing data for FII ownership		156
Sample for 3 month return and 12 month return tests	1,696	46,514
Less:		
Missing earnings announcement dates		14,655
Missing unexpected earnings		1,955
Missing post- earnings announcement returns		1,084
Sample for earnings announcement tests	1,535	28,460

Panel B: Frequency Distribution of firm-quarters by FII Ownership and Year

						Mean FII
			Non-Zero	% of Obs.	Mean %	(Buys +
	# of firm-	Zero FII	FII	With FII	FII	Sells)/Shares
Year	quarters	Ownership	ownership	ownership	ownership	Outstanding
2003	2,511	1,050	1,461	58%	2.8%	0.7%
2004	2,526	838	1,688	67%	4.2%	1.1%
2005	2,826	653	2,173	77%	5.9%	1.7%
2006	3,036	637	2,399	79%	7.3%	2.2%
2007	3,372	699	2,673	79%	8.3%	2.7%
2008	4,108	840	3,268	80%	7.7%	2.6%
2009	4,618	1,062	3,556	77%	6.4%	1.9%
2010	4,763	1,099	3,664	77%	6.5%	2.1%
2011	5,131	1,329	3,802	74%	6.4%	1.7%
2012	5,510	1,610	3,900	71%	6.0%	1.5%
2013	5,465	1,599	3,866	71%	6.4%	1.4%
2014	2,648	749	1,899	72%	6.8%	1.6%
Total	46,514	12,165	34,349			

Descriptive Statistics

This table presents descriptive statistics. QBUY (QSELL) is the sum of all FII buys (sells) for a firm over a quarter divided by the shares outstanding at the beginning of that quarter. Q_NETBUY is the difference between sum of quarterly buys and the sum of quarterly sells, divided by the shares outstanding at the beginning of the quarter. EA NETBUY is the net FII buying during the earnings announcement interval, (-1, +1). FIIP is the percentage FII ownership at the end of each quarter. Returns over various horizons are computed by summing continuously compounded returns over those horizons. LEADRET3 (LEADRET12) is the three-month (twelve-month) return following the quarter over which Q_NETBUY is measured. ERET is the earnings announcement return over days (-1, +1) relative to the earnings announcement date. MRET is the market return over days (-1, +1), with the percentage changes in the CNX Nifty Index employed to measure market return. UE equals earnings per share for quarter t less earnings per share for quarter t-4 divided by closing price on day -2 relative to the earnings announcement for quarter t-1. We employ 9 control variables in our analyses: LAGRET3, LAGRET9, MCAP, PRC, BM, DIVY, AGE, QSTD, and QTO. LAGRET3 is the return over the 3 months prior to the quarter over which FII trading is measured. LAGRET9 is the return measured over the 9 months prior to the 3-month period over which LAGRET3 is measured. MCAP is the share price times shares outstanding measured at the beginning of the quarter. PRC is the share price at the beginning of the quarter. BM is defined as book value of equity divided by MCAP. Book value of equity is measured either on the date MCAP is measured or on the year end date of the most recently concluded fiscal year. DIVY is the annual cash dividend paid in the fiscal year for which book value of equity is measured, divided by MCAP. AGE is the number of years since the year of incorporation. QSTD is the standard deviation of monthly returns over the twelve months before the quarter in which FII trading is measured. QTO is the average monthly volume divided by shares outstanding over the three months before the quarter in which FII trading is measured. Data on FII trading are obtained from the NSDL website: https://www.fpi.nsdl.co.in/. Quarterly FII ownership, daily stock returns, prices, and shares outstanding, quarterly earnings per share, and data items used to define control variables are from the PROWESS database. Earnings announcement dates are from the NSE website. All variables are winsorized at the 1% and 99% levels.

	# obs.	Mean	Median	Std. Dev.	Q1	Q3
QBUY	46,514	0.9%	0.0%	2.1%	0.0%	0.7%
QSELL	46,514	0.9%	0.0%	1.9%	0.0%	0.7%
Q_NETBUY	46,514	0.1%	0.0%	1.2%	0.0%	0.0%
EA_NETBUY	28,460	-10,367	0	915,944	0	0
LEADRET3	46,221	2.7%	1.7%	29.6%	-14.5%	19.6%
LEADRET12	42,694	7.8%	8.3%	62.0%	-28.7%	47.1%
ERET	28,460	-0.3%	-0.6%	6.6%	-4.0%	2.9%
MRET	28,460	-0.01%	-0.03%	2.9%	-1.5%	1.4%
UE	28,212	-1.1%	0.1%	11.29%	-1.36%	1.03%
FIIP	46,514	6.3%	1.8%	9.0%	0.0%	9.7%
LAGRET3	46,514	1.3%	0.6%	29.3%	-15.4%	17.8%
LAGRET9	46,514	2.6%	2.1%	54.4%	-29.3%	35.4%

MCAP (million ₹)	46,514	31545.1	3136.5	99124.7	828.5	14940.3
PRC (₹)	46,514	215.8	83.5	372.7	28.5	229.3
BM	46,514	1.0	0.7	1.9	0.3	1.4
DIVY	46,514	1.7%	1.0%	2.2%	0.0%	2.5%
AGE (years)	46,514	32.5	25.0	22.2	17.0	43.0
QSTD	46,514	15.0%	13.6%	7.0%	9.9%	18.8%
QTO	46,514	5.1%	1.9%	8.6%	0.7%	5.3%

Determinants of FII Trading

This table reports the results of panel regressions of net FII buying on nine stock characteristics. The sample period is from 2003, Q1 to 2014, Q2. Q NETBUY is the difference between sum of quarterly buys and the sum of quarterly sells, divided by the shares outstanding at the beginning of the quarter. Data on FII trading are obtained from the NSDL website: https://www.fpi.nsdl.co.in/. LAGRET3 is the return over the 3 months prior to the quarter over which FII trading is measured. LAGRET9 is the return measured over the 9 months prior to the 3-month period over which LAGRET3 is measured. MCAP is the share price times shares outstanding measured at the beginning of the quarter. PRC is the share price at the beginning of the quarter. BM is defined as book value of equity divided by MCAP. Book value of equity is measured either on the date MCAP is measured or on the year end date of the most recently concluded fiscal year. DIVY is the annual cash dividend paid in the fiscal year for which book value of equity is measured, divided by MCAP. AGE is the number of years since the year of incorporation. QSTD is the standard deviation of monthly returns over the twelve months before the quarter in which FII trading is measured. QTO is the average monthly volume divided by shares outstanding over the three months before the quarter in which FII trading is measured. MCAP, PRC, AGE, QSTD, and QTO are expressed in natural logarithms. All regressions include firm and quarter fixed effects and standard errors are adjusted for two-way clustering. All variables are winsorized at the 1% and 99% levels. Quarterly FII ownership, stock returns, and data items used to define control variables are from the PROWESS database.

	Coef.	t-stat.
Intercept	0.001	7.25
*		(0.00)
LAGRET3	0.004	9.19
		(0.00)
LAGRET9	0.002	9.07
		(0.00)
MCAP	0.001	3.93
		(0.00)
PRC	-0.001	-3.98
		(0.00)
BM	0.000	-1.84
		(0.07)
DIVY	-0.032	-6.78
		(0.00)
AGE	-0.002	-1.95
		(0.05)
QSTD	-0.001	-2.51
		(0.01)
QTO	0.000	1.38
		(0.17)
Firm Effects		Yes
Quarter Effects		Yes
# of obs.		46,509
Adj. R ²		3.06%

Dependent Variable: Q_NETBUY

FII Trading and Future Returns

This table reports the results of panel regressions of stock returns cumulated over three months and twelve month intervals on lagged quarterly FII trading and firm characteristics. The sample period is from 2003, Q1 to 2014, Q2. Cumulative Returns are computed by summing continuously compounded returns. LEADRET₃ (LEADRET₁₂) is the three-month (twelve-month) return following the quarter over which FII trading is measured. We examine three trading variables: QBUY, QSELL, and Q_NETBUY, QBUY (QSELL) is the sum of all FII buys (sells) for a firm over a quarter divided by the shares outstanding at the beginning of that quarter. Q_NETBUY is the difference between sum of quarterly buys and the sum of quarterly sells, divided by the shares outstanding at the beginning of the quarter. Data on FII trading are obtained from the NSDL website: <u>https://www.fpi.nsdl.co.in/</u>. FIIP is the percentage FII ownership at the end of each quarter. LAGRET3 is the return over the 3 months prior to the quarter over which FII trading is measured. LAGRET9 is the return measured over the 9 months prior to the 3-month period over which LAGRET3 is measured. MCAP is the share price times shares outstanding measured at the beginning of the quarter. BM is defined as book value of equity divided by MCAP. Book value of equity is measured if no the date MCAP is measured or on the year end date of the most recently concluded fiscal year. DIVY is the annual cash dividend paid in the fiscal year for which book value of equity is measured. MCAP, PRC, AGE is the number of years since the year of incorporation. QSTD is the standard deviation of monthly returns over the quarter in which FII trading is measured. MCAP, pRC, AGE, QSTD, and QTO are expressed in natural logarithms. All regressions include firm and quarter fixed effects and standard errors are adjusted for two-way clustering. All variables are winsorized at the 1% and 99% levels. Quarterly FII ownership, stock returns, and data items used to define control variables are from the PROWESS da

	Deper	Dependent Variable: LEADRET ₃			Dependent Variable: LEADRET ₁₂			
	(1)		(2)		(3)		(4)	
	Coef.	t-stat.	Coef.	t-stat.	Coef.	t-stat.	Coef.	t-stat.
Intercept	0.016	3.70	0.016	3.69	0.360	16.19	0.360	16.20
		(0.00)				(0.00)		(0.00)
Q_NETBUY	-0.300	-2.03			-0.611	-2.27		
		(0.04)				(0.02)		
QBUY			-0.299	-2.25			-0.555	-2.14
				(0.02)				(0.03)
QSELL			0.238	1.87			0.412	1.44
				(0.06)				(0.15)
FIIP	-0.001	-1.56	-0.001	-1.43	-0.002	-1.37	-0.002	-1.24
		(0.12)		(0.15)		(0.17)		(0.21)
LAGRET3	0.052	2.27	0.052	2.26	0.072	1.83	0.071	1.81
		(0.02)		(0.02)		(0.07)		(0.07)
LAGRET9	0.016	1.70	0.016	1.70	0.049	3.01	0.049	3.00
		(0.09)		(0.09)		(0.00)		(0.00)
MCAP	-0.072	-8.84	-0.072	-8.72	-0.273	-15.09	-0.272	-15.50
		(0.00)		(0.00)		(0.00)		(0.00)
PRC	0.011	1.53	0.010	1.50	0.025	2.00	0.024	1.95

		(0.13)		(0.13)		(0.05)		(0.05)
BM	0.006	3.00	0.006	2.99	0.013	2.67	0.013	2.67
		(0.00)		(0.00)		(0.01)		(0.01)
DIVY	0.008	0.08	0.007	0.07	0.554	2.01	0.553	2.01
		(0.94)		(0.95)		(0.04)		(0.04)
AGE	-0.037	-1.59	-0.037	-1.59	-0.100	-1.50	-0.100	-1.49
		(0.11)		(0.11)		(0.13)		(0.14)
QSTD	0.002	0.24	0.002	0.24	-0.005	-0.28	-0.005	-0.28
		(0.81)		(0.81)		(0.78)		(0.78)
QTO	-0.003	-0.80	-0.002	-0.77	-0.015	-2.74	-0.014	-2.73
		(0.42)		(0.44)		(0.01)		(0.01)
Firm Effects		Yes		Yes		Yes		Yes
Quarter Effects		Yes		Yes		Yes		Yes
# of obs.		46,216		46,216		42,691		42,691
Adj. R ²		50.3%		50.3%		56.44%		56.43%

FII Trading and Future Returns: Effect of Firm Size and Frequency of FII Trading

This table reports the results of panel regressions of stock returns cumulated over three months and twelve month intervals on lagged quarterly FII trading and firm characteristics for (a) small versus large stocks (b) firms in which FIIs traded frequently versus those in which FIIs traded less frequently. Large (small) stocks have market capitalization greater (less) than that of the median stock. Firms in which the number of FII transactions exceeded (was less than) the median number of FII transactions were classified as "frequently FII traded firms" ("less frequently FII traded firms"). The number of transactions equals the sum of the number of buys and the number of sells in a quarter. Classifications were made in to the two groups were made in each quarter. The sample period is from 2003, Q1 to 2014, Q2. Cumulative Returns are computed by summing continuously compounded daily returns. LEADRET₃ (LEADRET₁₂) is the three-month (twelve-month) return following the quarter over which FII trading is measured. Q_NETBUY is the difference between sum of quarterly buys and the sum of quarterly sells, divided by the shares outstanding at the beginning of the quarter. Data on FII trading are obtained from the NSDL website: https://www.fpi.nsdl.co.in/. FIIP is the percentage FII ownership at the end of each quarter. LAGRET3 is the return over the 3 months prior to the quarter over which FII trading is measured. LAGRET9 is the return measured over the 9 months prior to the 3-month period over which LAGRET3 is measured. MCAP is the share price times shares outstanding measured at the beginning of the quarter. PRC is the share price at the beginning of the quarter. BM is defined as book value of equity divided by MCAP. Book value of equity is measured either on the date MCAP is measured or on the year end date of the most recently concluded fiscal year. DIVY is the annual cash dividend paid in the fiscal year for which book value of equity is measured, divided by MCAP. AGE is the number of years since the year of incorporation. QSTD is the standard deviation of monthly returns over the twelve months before the quarter in which FII trading is measured. QTO is the average monthly volume divided by shares outstanding over the three months before the quarter in which FII trading is measured. MCAP, PRC, AGE, QSTD, and QTO are expressed in natural logarithms. All regressions include firm and quarter fixed effects and standard errors are adjusted for two-way clustering. All variables are winsorized at the 1% and 99% levels. Quarterly FII ownership, stock returns, and data items used to define control variables are from the PROWESS database.

	De	pendent Variab	le: LEADRET ₃		Dependent Variable: LEADRET ₁₂			
	Small St	ocks	Large St	ocks	Small St	ocks	Large Stocks	
	Coef.	t-stat.	Coef.	t-stat.	Coef.	t-stat.	Coef.	t-stat.
Intercept	0.015	3.71	0.015	2.64	-0.635	-34.19	0.229	7.26
		(0.00)		(0.01)		(0.00)		(0.00)
Q_NETBUY	-0.392	-1.70	-0.250	-1.66	-1.027	-2.16	-0.354	-1.28
		(0.09)		(0.10)		(0.03)		(0.20)
FIIP	-0.001	-1.47	-0.001	-1.38	-0.002	-0.78	-0.002	-1.58
		(0.14)		(0.17)		(0.43)		(0.11)
LAGRET3	0.051	2.66	0.051	1.85	0.108	2.85	0.043	0.99
		(0.01)		(0.06)		(0.00)		(0.32)
LAGRET9	0.028	3.37	0.012	0.95	0.069	3.80	0.058	2.90
		(0.00)		(0.34)		(0.00)		(0.00)
MCAP	-0.074	-7.94	-0.078	-7.78	-0.284	-13.17	-0.284	-12.34
		(0.00)		(0.00)		(0.00)		(0.00)
PRC	0.015	1.48	0.011	1.71	0.034	1.88	0.027	2.01
		(0.14)		(0.09)		(0.06)		(0.04)

Panel A: Small versus Large Stocks

BM	0.006	4.49	0.004	0.87	0.014	3.08	0.005	0.39
		(0.00)		(0.39)		(0.00)		(0.70)
DIVY	-0.064	-0.53	0.075	0.51	0.465	1.46	0.493	1.18
		(0.60)		(0.61)		(0.15)		(0.24)
AGE	-0.044	-2.05	-0.007	-0.23	-0.140	-2.05	0.014	0.15
		(0.04)		(0.82)		(0.04)		(0.88)
QSTD	0.001	0.08	-0.002	-0.22	-0.012	-0.54	-0.003	-0.14
		(0.94)		(0.82)		(0.59)		(0.89)
QTO	-0.002	-0.70	-0.001	-0.29	-0.013	-2.14	-0.012	-1.81
		(0.48)		(0.77)		(0.03)		(0.07)
Firm effects		Yes		Yes		Yes		Yes
Quarter effects		Yes		Yes		Yes		Yes
# of obs.		23,029		23,187		21,042		21,649
Adj. \mathbb{R}^2		53.24%		48.84%		56.63%		56.29%

Panel B: Frequent FII Trading versus Less Frequent FII Trading

_	Dej	Dependent Variable: LEADRET3				Dependent Variable: LEADRET12			
	Less Frequent l	FII Trading	Frequent FII	Frequent FII Trading		FII Trading	Frequent FII Trading		
	Coef.	t-stat.	Coef.	t-stat.	Coef.	t-stat.	Coef.	t-stat.	
Intercept	0.025	5.55	-0.008	-1.41	-0.051	-1.73	-0.024	-0.75	
		(0.00)		(0.16)		(0.08)			
FIIQ_NETBUY	0.027	0.17	-0.401	-2.51	-0.101	-0.25	-0.646	-2.18	
		(0.86)		(0.01)		(0.80)		(0.03)	
FIIP	-0.001	-1.55	0.000	-0.50	-0.002	-1.33	-0.001	-0.67	
		(0.12)		(0.62)		(0.19)		(0.50)	
LAGRET3	0.054	2.52	0.044	1.40	0.084	2.15	0.035	0.69	
		(0.01)		(0.16)		(0.03)		(0.49)	
LAGRET9	0.021	2.17	0.004	0.30	0.056	3.20	0.049	2.14	
		(0.03)		(0.77)		(0.00)		(0.03)	
MCAP	-0.073	-8.13	-0.072	-6.54	-0.281	-13.90	-0.258	-9.49	
		(0.00)		(0.00)		(0.00)		(0.00)	
PRC	0.013	1.62	0.005	0.48	0.031	2.25	0.000	-0.01	
		(0.11)		(0.63)		(0.03)		(1.00)	

BM	0.005	3.16	0.010	1.62	0.014	2.82	0.013	0.80
		(0.00)		(0.11)		(0.01)		(0.42)
DIVY	0.025	0.21	-0.194	-1.16	0.632	2.06	0.171	0.33
		(0.84)		(0.25)		(0.04)		(0.74)
AGE	-0.038	-1.54	-0.037	-1.07	-0.126	-1.80	-0.022	-0.23
		(0.12)		(0.29)		(0.07)		(0.82)
QSTD	0.002	0.19	-0.004	-0.37	-0.004	-0.20	-0.013	-0.47
		(0.85)		(0.71)		(0.84)		(0.64)
QTO	-0.002	-0.79	-0.001	-0.31	-0.014	-2.64	-0.013	-1.24
		(0.43)		(0.76)		(0.01)		(0.21)
Firm Effects		Yes		Yes		Yes		Yes
Ouarter Effects		Yes		Yes		Yes		Yes
C								
# of obs.		34,677		11,539		31,906		10,790
Adj. R^2		50.75%		50.49%		55.85%		57.90%
-								

FII Trading Around Earnings Announcements

The table reports the mean daily trading volume divided by shares outstanding, fraction of firms with non-zero FII trading, mean shares bought and sold by FIIs, and mean buying /selling by FIIs divided by shares outstanding at end of quarter t-1, for days –9 to +9 relative to the earnings announcement date. FII buying (selling) for a firm on a day is obtained by adding all FII buys (sells) for that firm. The sample consists of 28,460 earnings announcements from 2003, Q1 to 2014, Q2. Data on FII trading are obtained from the the NSDL website: <u>https://www.fpi.nsdl.co.in/</u>, and earnings announcement dates, daily shares outstanding are obtained from PROWESS, and earnings announcement dates are from the NSE web site, <u>http://www.nseindia.com/</u>.

		Mean Volume		Mean Quantity	Mean Quantity	Mean Quantity	Mean Quantity
Event-	# of	/Shares	% firms with	Bought	Sold	Bought/Shares	Sold/ Shares
day	obs.	Outstanding	FII Trading	(# of shares)	(# of shares)	Outstanding	Outstanding
-9	28,224	0.235%	26.8%	66,167	56,955	0.016%	0.014%
-8	28,225	0.239%	27.2%	71,567	60,871	0.015%	0.014%
-7	28,227	0.235%	27.1%	62,913	60,589	0.015%	0.014%
-6	28,240	0.233%	27.0%	62,145	58,647	0.015%	0.014%
-5	28,240	0.238%	27.0%	66,933	59,692	0.015%	0.014%
-4	28,221	0.244%	26.8%	68,712	64,186	0.015%	0.014%
-3	28,208	0.245%	27.0%	62,988	62,026	0.015%	0.015%
-2	28,212	0.255%	26.5%	59,142	63,165	0.014%	0.015%
-1	28,251	0.273%	26.8%	69,083	67,682	0.016%	0.016%
0	28,285	0.358%	27.5%	77,805	81,512	0.017%	0.019%
1	28,287	0.318%	27.4%	79,543	87,603	0.019%	0.020%
2	28,263	0.269%	26.8%	70,382	77,650	0.017%	0.017%
3	28,249	0.256%	26.6%	67,047	71,601	0.016%	0.016%
4	28,250	0.247%	26.5%	67,852	65,998	0.016%	0.015%
5	28,244	0.240%	26.5%	63,467	64,718	0.015%	0.015%
б	28,231	0.238%	26.1%	66,299	61,934	0.016%	0.015%
7	28,243	0.244%	26.3%	69,122	61,525	0.015%	0.014%
8	28,211	0.241%	26.1%	68,375	64,253	0.015%	0.013%
9	28,243	0.235%	26.0%	63,502	62,483	0.014%	0.014%

Average Stock Returns around Earnings Announcements, by Unexpected Earnings Quartile

This table reports the relation between mean unexpected earnings divided by price (UE) and mean cumulative abnormal stock return (CAR) over days (-64,-2), (-1, +1), and (+2, +64) relative to the earnings announcement date. UE equals earnings per share for quarter t less earnings per share for quarter t-4 divided by closing price on day -2 relative to the earnings announcement for quarter t. In each quarter, firms are assigned to UE quartiles based on the distribution of UE in the previous quarter. For each firm-quarter, CAR is obtained by summing firm return less the market returns over days (-64,-2), (-1, +1), and (+2, +64). Market return is based on the CNX Nifty Index. Mean CARs for each UE quartile are equally weighted averages for that quartile. Tests of difference of means (medians) based on the t-statistic (Wilcoxon statistic). The sample consists of 28,460 earnings announcements from 2003, Q1 to 2014, Q2. Data on earnings per share, firm returns, closing prices, and market returns are obtained from the PROWESS database and earnings announcement dates are obtained from the NSE web site, <u>http://www.nseindia.com/</u>.

				Pre-Announcement		Earnings Announcement		Post- Announcement	
Portfolio	# of obs.	Unexpected Earnings/Price		Abnormal Return (-64, -2)		Abnormal Return (-1, 0,+1)		Abnormal Return (+2, +64)	
		Mean	Median	Mean	Median	Mean	Median	Mean	Median
		(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)
1 (Low)	6,900	-11.2%	-4.7%	-7.6%	-7.6%	-1.9%	-1.9%	-5.2%	-5.4%
2	7,249	-0.6%	-0.4%	-0.8%	-1.8%	-0.9%	-1.0%	-2.2%	-2.5%
3	6,912	0.4%	0.4%	3.2%	1.8%	0.1%	-0.2%	-0.3%	-0.7%
4 (High)	7,151	6.7%	3.0%	3.9%	2.4%	1.5%	0.8%	1.3%	-0.1%
(4) - (1)		17.9%	7.7%	11.4%	10.0%	3.4%	2.7%	6.5%	5.5%
t-test		80.39		29.42		32.17		16.81	
(p-value)		(0.00)		(0.00)		(0.00)		(0.00)	
Wilcoxon Z			102.64		29.02		31.25		16.76
(p-value)			(0.00)		(0.00)		(0.00)		(0.00)

Unexpected Earnings, Earnings Announcement Returns, Post-Announcement Returns and FII Trading

The table reports regressions explaining (a) unexpected earnings (UE); (b) earnings announcement returns (ERET); and (c) post-announcement returns (POSTERET). The two main independent variables are lagged quarterly FII trading from the calendar quarter immediately before the earnings announcement (Q NETBUY) and FII trading during the earnings announcement (EA NETBUY). The control variables are LAGRET3, LAGRET9, MCAP, PRC, BM, DIVY, AGE, OSTD, and OTO. The sample period is from 2003, O1 to 2014, O2. UE equals earnings per share for quarter t less earnings per share for quarter t-4 divided by closing price on day -2 relative to the earnings announcement for quarter t. Cumulative Returns are computed by summing continuously compounded daily returns. ERET is obtained by summing returns over days (-1, +1) relative to the earnings announcement date. MRET is the market return over days (-1, +1), with the percentage changes in the CNX Nifty Index employed to measure market return. POSTERET is obtained by summing returns over days (+2, +64) relative to the earnings announcement date. Q_NETBUY is the difference between sum of quarterly buys and the sum of quarterly sells, divided by the shares outstanding at the beginning of the quarter. EA NETBUY is net FII buying divided by daily shares outstanding summed over days (-1, +1). Data on FII trading are obtained from the NSDL website: https://www.fpi.nsdl.co.in/. FIIP is the percentage FII ownership at the end of each quarter. LAGRET3 is the return over the 3 months prior to the quarter over which O NETBUY is measured. LAGRET9 is the return measured over the 9 months prior to the 3-month period over which LAGRET3 is measured. MCAP is the share price times shares outstanding measured at the beginning of the quarter. PRC is the share price at the beginning of the quarter. BM is defined as book value of equity divided by MCAP. Book value of equity is measured either on the date MCAP is measured or on the year end date of the most recently concluded fiscal year. DIVY is the annual cash dividend paid in the fiscal year for which book value of equity is measured, divided by MCAP. AGE is the number of years since the year of incorporation. QSTD is the standard deviation of monthly returns over the twelve months before the quarter in which Q_NETBUY is measured. QTO is the average monthly volume divided by shares outstanding over the three months before the quarter in which Q_NETBUY is measured. MCAP, PRC, AGE, QSTD, and QTO are expressed in natural logarithms. All regressions include firm and quarter fixed effects and standard errors are adjusted for two-way clustering. All variables are winsorized at the 1% and 99% levels. Ouarterly FII ownership, stock returns, and data items used to define control variables are from the PROWESS database.

	Dependent Variable: UE			Dependent Variable: ERET				Dependent Variable: POSTERET			
	(1)		(2	(2)		(3)		(4)		(5)	
	Coef.	t-stat	Coef.	t-stat	Coef.	t-stat	Coef.	t-stat	Coef.	t-stat	
		(p-value)		(p-value)		(p-value)		(p-value)		(p-value)	
Intercept	0.019	15.07	0.010	10.60	0.010	10.55	0.156	5.28	0.156	32.93	
		(0.00)		(0.00)		(0.00)		(0.00)		(0.00)	
MRET			0.850	16.93	0.850	16.93					
				(0.00)		(0.00)					
UE			0.063	9.59	0.063	9.59	0.093	5.06			
				(0.00)		(0.00)		(0.00)			
LAG_UE	0.249	9.84	-0.010	-2.49	-0.010	-2.49					
		(0.00)		(0.01)		(0.01)					
Q_NETBUY	0.002	0.07	-0.072	-1.97							
		(0.95)		(0.05)							

Q_BUY					-0.052	-1.64 (0.10)				
Q_SELL					0.061	1.76 (0.08)				
EA_NETBUY			6.476	11.70 (0.00)	6.470	11.67 (0.00)	-3.609	-2.62 (0.01)		
EA_BUY									-3.803	-2.33 (0.02)
EA_SELL									3.643	2.52 (0.01)
FIIP			0.000	1.80 (0.07)	0.000	1.70 (0.09)	-0.001	-1.60 (0.11)	-0.001	-1.62 (0.10)
LAGRET3	0.035	6.22 (0.00)	0.002	0.50 (0.62)	0.002	0.49 (0.62)	0.010	0.51 (0.61)	0.010	0.52 (0.60)
LAGRET9	-0.010	-3.58 (0.00)	0.001	0.41 (0.68)	0.001	0.40 (0.69)	0.009	1.18 (0.24)	0.009	1.18 (0.24)
MCAP	-0.013	-4.82 (0.00)	-0.010	-5.16 (0.00)	-0.010	-5.10 (0.00)	-0.063	-6.05 (0.00)	-0.063	-6.08 (0.00)
PRC	-0.003	-1.22 (0.22)	0.001	1.10 (0.27)	0.001	1.13 (0.26)	0.005	0.79 (0.43)	0.005	0.77 (0.44)
BM	-0.020	-7.68 (0.00)	0.001	1.97 (0.05)	0.001	1.98 (0.05)	0.007	1.37 (0.17)	0.007	1.37 (0.17)
DIVY	-0.251	-2.81 (0.01)	-0.015	-0.51 (0.61)	-0.015	-0.50 (0.62)	0.004	0.03 (0.97)	0.003	0.03 (0.98)
AGE	0.010	0.88 (0.38)	-0.002	-0.40 (0.69)	-0.002	-0.40 (0.69)	0.020	0.77 (0.44)	0.020	0.77 (0.44)
QSTD	-0.003	-0.99 (0.32)	0.000	0.17 (0.86)	0.000	0.17 (0.87)	0.002	0.25 (0.81)	0.001	0.24 (0.81)
QTO	-0.004	-3.47 (0.00)	-0.002	-4.49 (0.00)	-0.002	-4.47 (0.00)	0.000	-0.01 (0.99)	0.000	-0.01 (1.00)
Firm Effects		Yes								
Quarter Effects		Yes								
# of ous.		20,211		20,211				20,211		20,211
Adjusted R ²		13.42%		19.81%				37.59%		37.60%