Trading Activity of Foreign Institutional Investors and Volatility Discussion at NIPFP-DEA Conference

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- Employs data from 2006 to 2009 from SEBI and NSE to conduct the analysis.
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 - Second, using stock-specific investor-classified volume.

- This is an important question, focus of a longstanding debate! Closely related to another question.
- Why do FII flows forecast equity returns?
 - Price pressure. FIIs trade in a manner that pushes prices away from fundamental value.
 - Information. FIIs are better informed than domestic investors about movements in fundamental value.
- Answers to these questions get us to the heart of the debate are FIIs a *stabilizing* or *destabilizing* influence in emerging equity markets?
- Essentially the same question that the authors are asking.

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 - But important methodological lessons have emerged.

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 - **Cross-sectional variation:** Some studies find that FIIs do better in large, liquid stocks, while domestics are better in small stocks.
 - **Source of volatility:** Separate the fundamental components of returns from non-fundamental components when analyzing the effects of FIIs on returns.
 - Volume and returns: Can't assume volume and returns arise independently, since they are equilibrium outcomes.

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- I will focus my detailed suggestions on the first of these issues.

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 - **Suggestion:** Expected and unexpected trading activity can be better identified if stock returns also used in the decomposition, rather than fitting a univariate time-series model for volume.
 - Note: Bessembinder and Seguin (1992) don't do this, but the literature has moved very far since then.

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 - **Suggestion:** Normalize aggregate (stock-specific) rupee volume by index (stock) market capitalization to avoid spurious or unbalanced regressions.

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- 1. Why are the specifications estimated separately for FIIs, DIIs etc?
 - Descriptive statistics show that volume from these different market participants is correlated.
 - So, any specification explaining volatility should include all measures simultaneously. Otherwise omitted variable bias affects the results.
- 2. It would be useful to see the volume and volatility measures simply plotted against each other in the aggregate study.
 - This is a useful visual check to see the relationship you are fitting.

- 3. I didn't clearly understand the trading process underlying the counterparties referred to in the second section of the paper. Do you know who initiates the trade?
- 4. The standard errors need to be nonparametric (or at least robust) since there are jumps, volatility clustering etc.
 - Are they? If not, statistical significance is in doubt.