

# *How Wise are Crowds? Insights from Retail Orders and Stock Returns*

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5★, December 3, 2010

# CONVENTIONAL WISDOM: INSTITUTIONAL INVESTOR

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# CONVENTIONAL WISDOM: RETAIL INVESTOR



# RECENT EVIDENCE: BERNIE OR BURNS?



# MORE FUNDAMENTALLY: WHY STUDYING RETAIL INVESTORS?

- Do retail investors enhance/hurt the price discovery process?
- Market Efficiency
  - ▶ Retail investors are less and less relevant from long term perspective
  - ▶ (Increasingly sophisticated) Institutional investors are dominant
  - ▶ Is this good/bad news for market efficiency?
    - ★ Some positive evidence (Boehmer Kelley 2009)
    - ★ Still an open question: “There is no clear theoretical presumption that—absent any policy intervention—the rise of sophisticated investors should necessarily be beneficial to market efficiency”, J. Stein (AFA 2009 P. Address)
- Gain insights about more sophisticated investors
  - ▶ Even if not quantitatively important...they face a simple problem (no agency problem, internal conflicts,...)
  - ▶ “intermediate step” to understand more complex behavior

# MAIN FINDINGS

- Buy-Sell imbalances of market and limit orders predict the cross section of returns within a month (up to 20 days)
- Market order imbalances predict (negative) tone of news up to a month. Limit order imbalances do not.
- Market orders show daily return momentum, limit orders are contrary to daily returns.

# THIS PAPER IN THE LITERATURE

<b>Closest Papers</b>	<b>Market and Period</b>	<b>Retail Order Flow Sample</b>	<b>Leading Source of Correlation with Returns</b>
Kaniel Saar Titman 2008	NYSE 2000- 2003		Liquidity Provision Premium
Kaniel, Liu, Saar, Titman 2008	same		Information about firms' cash-flows
Barber, Odean , Zhu 2009	TAQ up to 2000		Mechanical: retail buying predicts more retail buying
Dorn, Huberman, Sengmueller 2008	German Broker 1998-2000		Mechanical
Kelley Tetlock	Big US OTC Market Center 2003-2007	Market and limit orders	Information (Market orders), Liquidity Premium (limit orders)



# RETURN PREDICTABILITY AND VIOLATIONS OF MARKET EFFICIENCY

- This is **not** the interesting point of the paper....
- The effect of order imbalance in the Fama-McBeth regressions is stronger for small-illiquid stocks, negligible for big size low spread stocks
- Robust predictability pattern: the autocorrelation of index returns by size is zero for largest most liquid stocks, positive for small stocks (daily, weekly,...)
- Amihud and Mendelson (1987, 1989) show that prices can look like random walk but in fact there is a partial adjustment to information (that the market makers may not see)
- Kelley and Tetlock: not a violation of semi-strong form efficiency (retail order flow is not public info)

# RETAIL MARKET ORDERS AND NEWS TONE

- **New Finding:** Retail market order imbalance predicts (negative) news tone
- Consistent with KSLT 08 (earning announcements)
- Different from KLT 08: liquidity provision to institutions seems less plausible than at the NYSE.
- No reversals on horizons up to 60 days: pure order splitting/temporary price pressure less plausible...
- **Take away:** Retail investors may be well-informed about fundamentals
- Thought provoking!

# INFORMATION CONTENT OF RETAIL TRADES IN PERSPECTIVE

- Older studies (before 2000) reached opposite conclusions.
- **Interesting question: Why is the information content increasing?**

## Possible Explanations

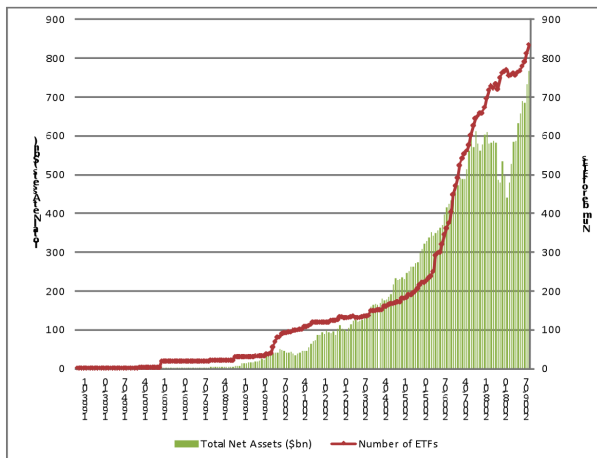
- Broker's order selection/internalization?
  - ▶ Kelley Tetlock no significant differences between order flows from brokers that do and don't internalize
  - ▶ Brokers did not start internalizing during the very last few years only...
- New networks of insider traders camouflaging? (on the news show)
- Learning? (e.g. Seru et al. 2010). Evolutionary elimination of behavioral investors?

# FINANCIAL INNOVATION AND HOUSEHOLD'S INVESTMENTS

- Why is that individual investors trade in the first place?
  - ▶ Retirement, Consumption smoothing, hedging, meeting life goals... (Non-information driven)
  - ▶ Information about a firms' fundamentals
- Conjecture: Recent Revolution in Investment instruments may play important role.
  - ▶ Households' investment problem fundamentally changed: asset allocation more complex (easy broad exposures to derivatives, commodity futures, international assets, etc.), security selection less complex (delegation, index funds,...)
  - ▶ Asset allocation changed significantly: bigger weight on Mutual Funds + ETFs.
  - ▶ Consequence: more **information** in individual stocks order flow (far less "noise")

# ETF REVOLUTION

FIGURE: ETF Net Assets and Number of ETFs (1993-2010)



Source: Petajisto (2010)

# EVOLUTION OR FINANCIAL INNOVATION?

- Potential interesting test: Look at information content of retail options order flow before and after 2000.
- If no significant difference financial innovation is more plausible

# THEORY: WHY PAYING FOR ORDER FLOW?

## CHALLENGE TO CONVENTIONAL WISDOM

- Parlour and Seppi 2003:
  - ▶ “Retail order flow is widely believed to be uninformed”
  - ▶ Source of payments: Competition between OTC market makers to attract **uninformed** flow
  - ▶ Profitable because liquidity provision rents more than compensate for adverse selection risks
  - ▶ Consequences on prices: wider bid-ask spreads, consumers welfare decreases.
- **Based on Kelley and Tetlock this makes no sense!**
- Why do Market makers then still pay for order flow?
  - ▶ Either this practice is dying...
  - ▶ Or we need a new conceptual framework

# THEORY: WHY PAYING FOR ORDER FLOW?

## ALTERNATIVE VIEW

- Conjecture: OTC MM pay for order flow because they purchase a signal
  - ▶ Loose money with retail traders and profit from other traders
- Insights from models with decentralized trade:
  - ▶ Investors in an OTC market may be willing to participate in small trades in which they lose money to learn a signal (Golosov Lorenzoni Tsyvinski 2010)
  - ▶ This may over-incentivize research and information acquisition, not obvious whether welfare is improving



# IS THIS CONSISTENT WITH RETURN PREDICTABILITY OVER A MONTH?

- Interesting empirical question: can one make profits (after transaction costs) trading on retail order flow information?
- If so, why is that the (informed) OTC Market maker does not eliminate the predictability persistence in the data? does it question her rationality?
  - ▶ Optimal rate of information transmission into prices (Kyle 1985)
  - ▶ Arrival of subsequent information may induce MM to trade less aggressively
  - ▶ But OTC MM are not monopolists: risk of losing profits against informed competitors will induce more aggressive profile (Holden Subrahmanyam 1992)
  - ▶ Limited capital? Why not selling the signal to some other unconstrained investor?
- Consequences on market quality?

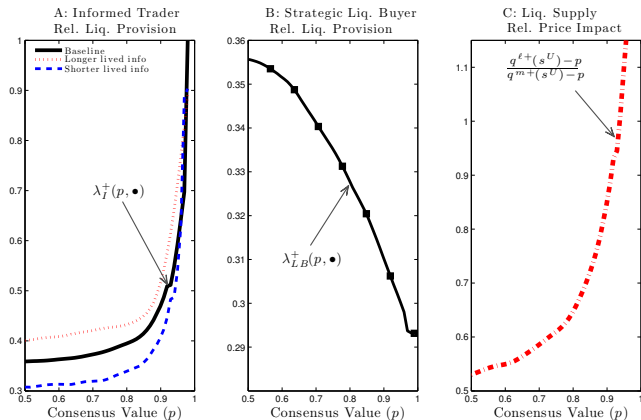
# LIMIT ORDER IMBALANCE DOES NOT PREDICT NEWS TONE

- **Plausible take away:** Retail limit order flow in OTC markets do not predict news tone. Why?
  - ▶ Retail traders do not monitor the market often (more difficult to include limit orders in their trading plan)
  - ▶ Orders of magnitude higher operational latencies than sophisticated traders. When latency gap is extremely large slow investors (retail or institutional) do not submit limit orders (Pagnotta Philippon 2011)
- **Implausible take away (Kelley Tetlock):**
  - ▶ Informed investors don't use limit orders
  - ▶ Evidence against supporting experimental evidence (Bloomfield O'Hara Saar 2005) and models of information with limit order trading (Kaniel Liu 2006, Pagnotta 2010)

# SOPHISTICATED INVESTORS IN EXCHANGES

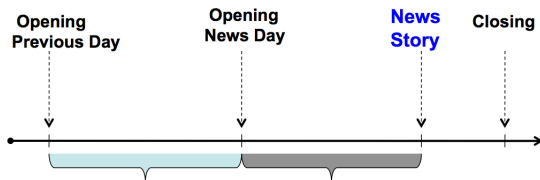
## LOOKING INTO TRADING DYNAMICS

FIGURE: Make-Take Trading Intensities and Relative Price Impact of Limit Orders



Source: Pagnotta (2010)

# TESTING ORDER TYPE'S RELATIVE INFORMATION TRANSMISSION IN EXCHANGES



- News: same measure of negative news tone (Harvard4 + Loughran-McDonald's FinDic)
- Order Flow: prop. data from NYSE (2002: post decimalization, pre HFT, high trading consolidation period)
- Test: does the relative price impact of limit orders increase as the market approaches asset specific news release?
- Outlook of results: when tested on individual stocks, up to 70% display strong evidence of the information effect.

# LOOKING FORWARD

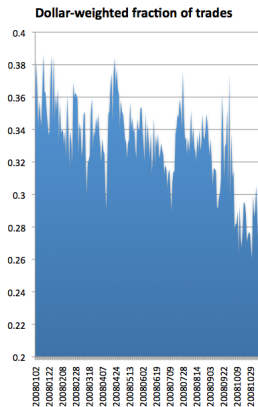
## RETAIL INVESTORS AS LIQUIDITY PROVIDERS IN EQUITY MARKETS

- Retail investors providing liquidity to whom?
  - ▶ Little institutional flow at the OTC market center (less than 1%)
  - ▶ Very little retail order flow at the NYSE (e.g. Boehmer and Kelley 09)
- Would retail investors survive as liquidity providers in an era of ultra-high-frequency market makers?
  - ▶ If retail coordination depends on observables like past returns and volume (Barber et al. 2009), HFT will easily eat them (front-running, etc.)

# LOOKING FORWARD

BIG CHALLENGE EVEN FOR INSTITUTIONS!

FIGURE: Fraction of Trades where HFT do not Participate (NASDAQ 2008)



Source: Pagnotta Philippon (2011)

# LOOKING FORWARD

## TOUGH TIMES FOR STOCK PICKERS

Correlation of stocks in the S&P 500 index to movement of the whole index. The higher the percentage, the more stocks are moving in lock step.

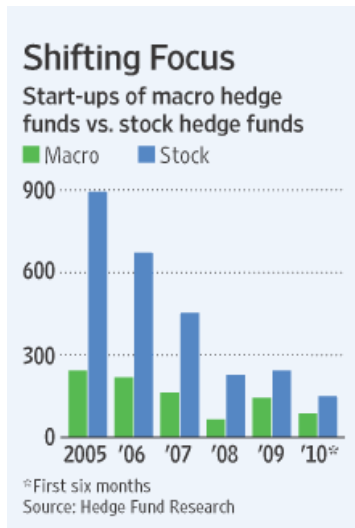


Sources: Barclays Capital; Morningstar

# LOOKING FORWARD

## TOUGH TIMES FOR STOCK PICKERS

*"Stock picking is a dead art form"* Jim Bianco on WSJ Sep. 24, 2010





# LOOKING FORWARD

- Trend: retail order flow in individual stocks may eventually become irrelevant...
  - ▶ Non-information driven: ↓
  - ▶ Liquidity provision: ↓
  - ▶ Stock picking: ↓
- Some interesting questions: **Individuals and institutions**
  - ▶ **Individuals**: real consequences of big shifts in households' asset allocation (e.g. disrupting effects on commodity prices, attenuation of home biases, real state cycles, ....)
  - ▶ Consequences of complex dynamic interaction of sophisticated **institutions** (e.g. high-frequency investors) on market stability, long-term liquidity, inefficient arm-races,...

# CONCLUSION

- Nice empirical contribution!
- Lots of food for thought