



High-Frequency Trading: What is it Good for?

Austin Gerig
University of Oxford



Motivation

- High-speed computerized trading -- known as high frequency trading (HFT) -- dominates modern financial markets (~50% of trades).
- Evidence suggests HFT increases market efficiency.
- However, there are serious concerns that HFT is:
 - is unfair.
 - is destabilizing.
 - syphons money from markets with no added social benefit.

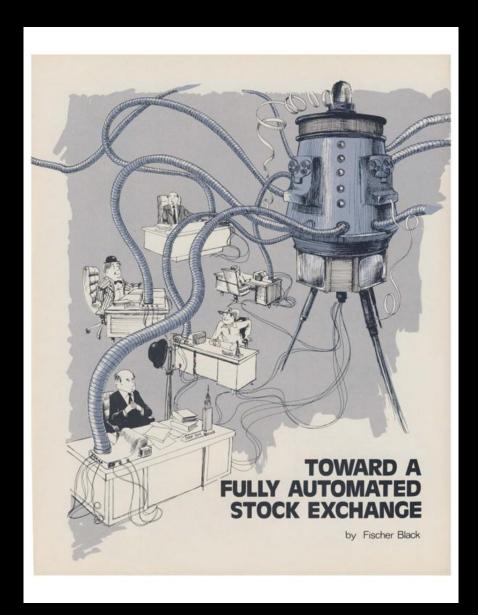
Results

- Using a special dataset from NASDAQ, I show that HFT synchronizes security prices.
- With a simple model (and drawing parallels with recent work in ecology), I demonstrate how synchronization:
 - increases the accuracy of prices.
 - lowers transaction costs.
 - increases instability during times of market stress.

What is high frequency trading (HFT)?

- HFT is autonomous computerized trading that seeks quick profits using high-speed connections to financial exchanges.
- HFT is part of a larger trend towards automation in financial markets.





In 1971, Fischer Black predicted that most activity on financial exchanges could (and would) be automated.

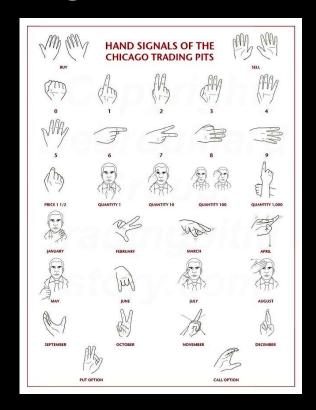
NYSE today





Trading pit nostalgia



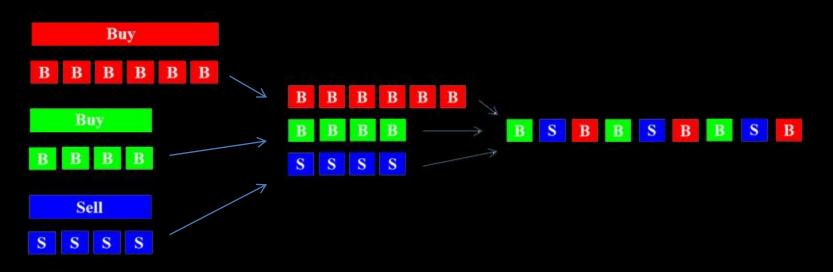


"Across Europe, Asia, Australia, South America and Canada it's already ceased as a form of communication with the closure of all derivatives trading pits in those regions. Only three futures exchanges in the US continue ... Eventually, these last remaining pits will close and end the functional purpose of the hand gestures that hundreds of thousands used to transact and share information since the late 19th century."

http://tradingpithistory.com

Two categories of automation

- Algorithmic trading
 - Minimize the execution cost of a large long-term position.
 - On the floor this was known as "working an order" (see Gerig, Farmer, and Lillo (2011)).



 Note: Sometimes the term "algorithmic trading" is used to refer to any type of automated trading.

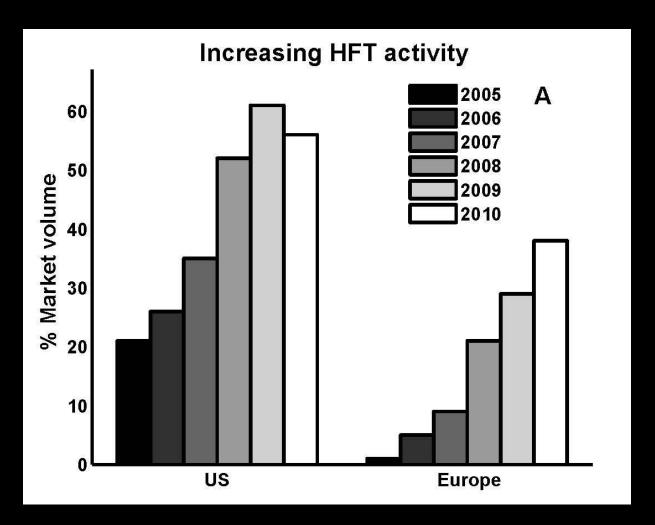
Two categories of automation

- High frequency trading
 - Short-term speculative trading.
 - On the floor this was known as "scalping" or "market making"

In some ways, HFT is small ...

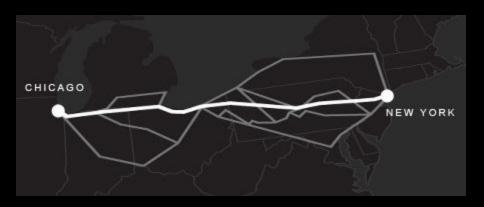
- Implemented by small, obscure proprietary firms.
 - Allston Trading, DRW Holdings, Getco, RGM Advisors, Tradebot, Tradeworx, etc.
 - Most firms have several hundred million USD in capital.
 - Large hedge funds typically have \$30 billion.
- Total revenues are relatively small.
 - Approx \$5 billion per year (Tabb Group).
 - Approx \$2.8 billion per year in US equities (Brogaard, 2010).
 - Total hedge fund revenue is ~100 times this.

... in other ways, HFT is large

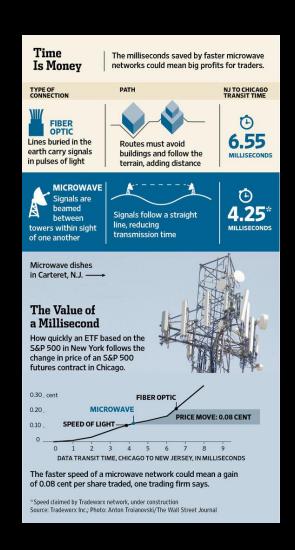


US equity volume is measured in shares; European equity volume is measured in value. Source: TABB Group

... and influential







HFT is driving faster data connections between major financial centers.

HFT worries regulators

• A large portion of trading is "unrelated to the fundamentals of the company that's being traded. It's got very little to do with whether you think IBM's got a great business plan . . . and a lot more to do with what's the minuscule aberrational price move that you can take advantage of because you've co-located your computer with the exchange and can jump on that in microseconds. And that worries me in some ways."

Mary Schapiro, Chairman SEC

 "It is therefore not clear that high frequency trading, based on computer algorithms, can possibly deliver significant positive social value – price discovery at the nano-second interval cannot possibly give a significant allocative efficiency benefit over price discovery on a second-by-second basis."

Adair Turner, FSA Chairman



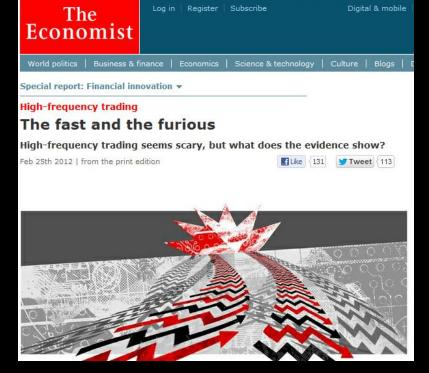
Numerous calls to study HFT ...

- SEC (United States)
 - "Concept Release on Equity Market Structure"
- BIS Foresight project (United Kingdom)
 - "The Future of Computer Trading in Financial Markets"
- ESMA (Europe)
 - "Guidelines on systems and controls in a highly automated trading environment for trading platforms, investment firms and competent authorities"
- European Commission
 - "Consultation on financial sector taxation"

... countless newspaper articles

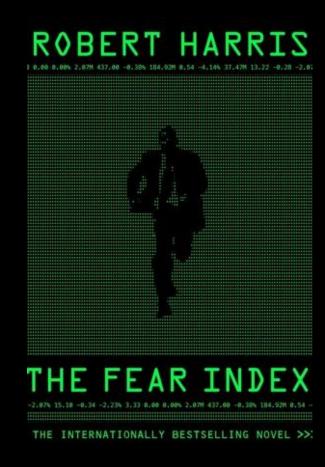


The SEC probe illustrates a bigger push by regulators to examine less-transparent parts of the securities markets, such as the fast-growing area of so-called high-frequency trading. High-speed trading firms use powerful computer systems for ...





... even a novel



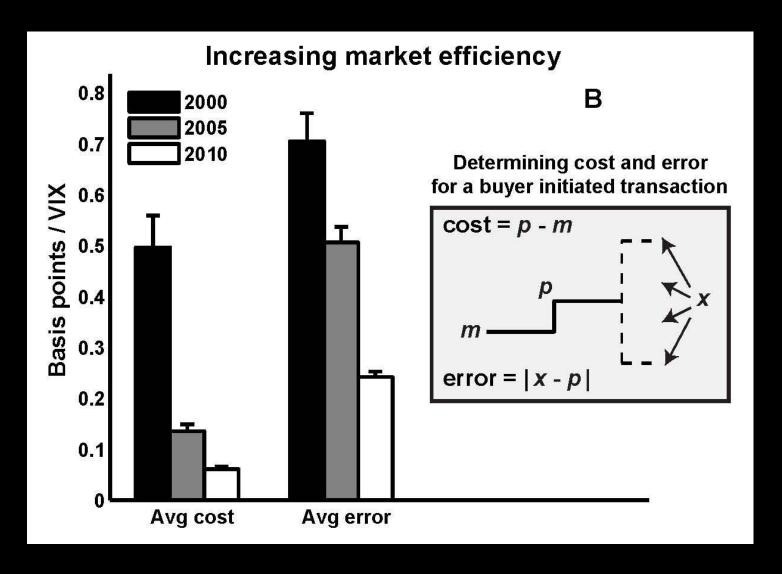
"At the nexus of high finance and sophisticated computer programming, a terrifying future may be unfolding even now."

What do we know?

- HFT increases market efficiency:
 - Lowers transaction costs.
 - Increases the accuracy of prices.

Sources:

- (Hendershott et al., 2011)
- (Hendershott and Riordan, 2011a)
- (Hendershott and Riordan, 2011b)
- (Brogaard, 2010)
- (Castura et al., 2010)
- (Menkveld, 2012)



Data from 35 large-cap US stocks during the last full week of February in 2000, 2005, and 2010. Error bars report the standard error of the mean across the 35 stocks (Gerig, 2012).

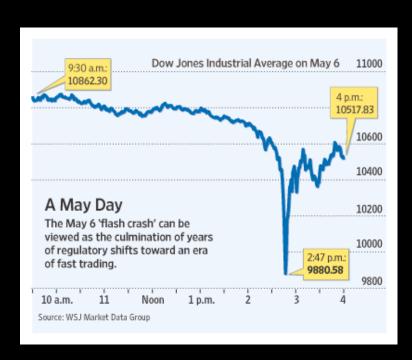
What do we know?

HFT potentially:

- Increases the instability of the market.
- Creates spurious relationships in markets.

Sources:

- The rapid fall and subsequent rise in prices that occurred in US markets on May 6, 2010, was, in part, due to HFT. (Kirilenko et al., 2011)
- Correlations between equities and commodities have steadily increased as HFT has increased. (Bicchetti and Maystr, 2012)



Yet we still know relatively little!!!

- We still don't know HFT's purpose.
- Is HFT needed?
- Where do profits come from?
- Does society benefit from microsecond speeds?
- Should we tax HFT?

The great mystery

 "Apparently, it (HFT) leads to market efficiency and better price determination, but if people are making profits out of it, where are the profits coming? It seems to me ultimately that they are coming from my members and I do worry about that."

 Chris Hitchen, Chief Executive of the Railways Pension Trustee Company

A PROPOSAL:

HFT synchronizes security prices

To the extent that two securities are related to one another, HFT activity ensures that a price change in the first security coincides nearly instantaneously with a similar price change in the second security.

• Synchronization:

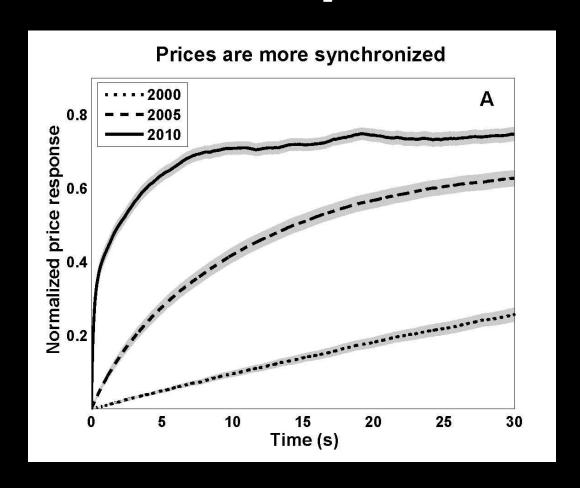
- increases the efficiency of markets.
- can be profitable for the firms that do it.
- is impossible to do without high-speed computerized trade.

THE EVIDENCE

NASDAQ data

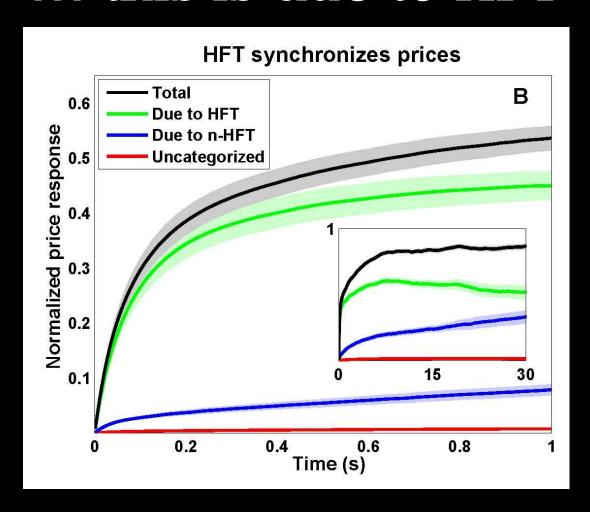
- Market data for 120 stocks (40 of which are large-cap stocks) traded on NASDAQ from Feb. 22-26, 2010.
- All market activity from 26 proprietary HFT firms is flagged. I know all of their trades and quotes.
- I supplement this data with Thomson-Reuters tick data for 35 of the 40 large-cap stocks (data is from the same period in 2000, 2005, and 2010).

Prices are more synchronized ...



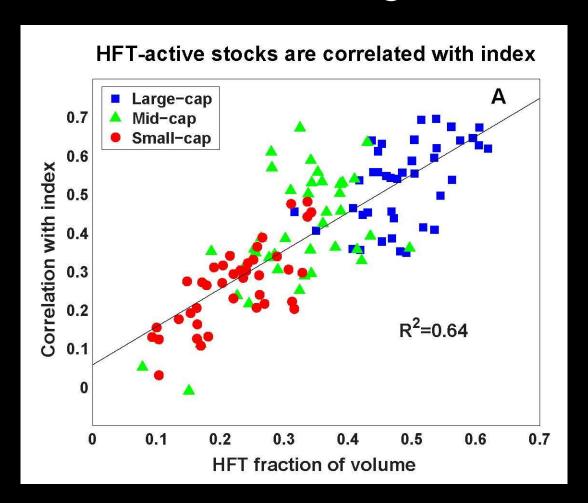
Normalized price response of stock i to a price movement of stock $j\neq i$. Data is from 35 US large-cap stocks during the last full week of February in 2000, 2005, and 2010. The standard error of the mean across the 35 stocks is shown in gray (Gerig, 2012).

... this is due to HFT



The price response of the full 40 US stocks in Feb. 2010 (black) is decomposed into the amount due to HFT activity (green), non-HFT activity (blue), and an amount that could not be categorized (red). Standard errors are shown in shaded color (Gerig, 2012).

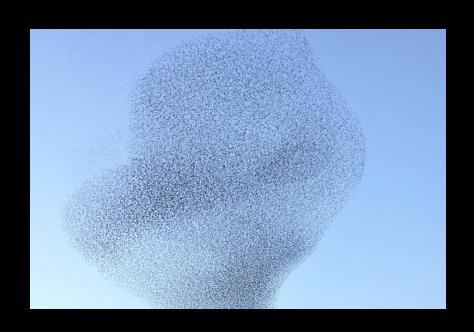
Synchronization and HFT go hand-in-hand



Plot of stock correlation vs. the fraction of volume due to HFT for that stock. Correlations are between the 30 second returns of the stock and the equal-weighted average 30 second returns of all 120 stocks. Volume is measured in shares. (Gerig, 2012).

WHAT ARE THE EFFECTS OF SYNCHRONIZATION?

Synchronization in nature



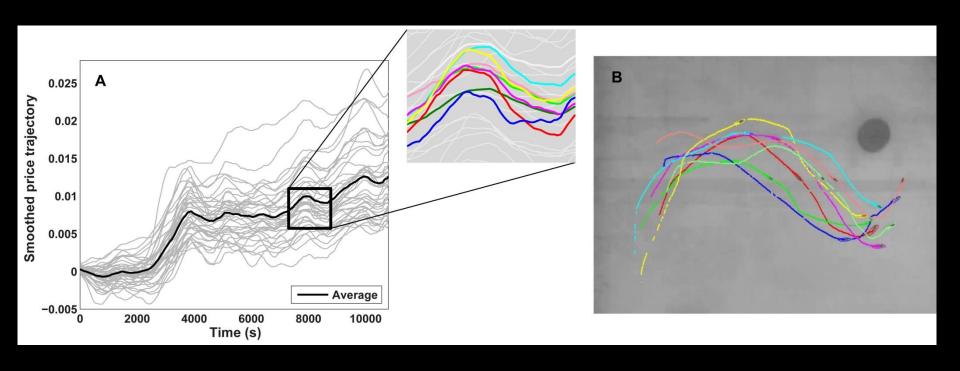


Animals that move synchronously propagate information quickly, even when only a small number of individuals are informed.

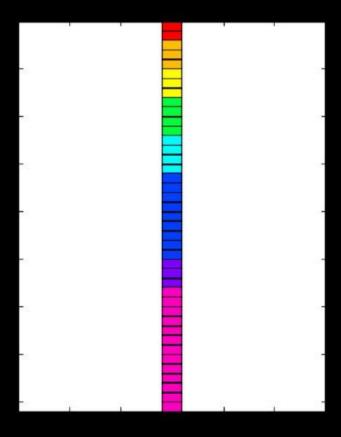
- -Ward et al. (2008) Quorum decision-making facilitates information transfer in fish shoals. PNAS 105(19), 6948-6953.
- Couzin et al. (2005) Effective leadership and decision making in animal groups on the move. Nature 433, 513-516.

... markets are no different

If prices are synchronized, then only a small number of informed traders are needed for prices to correctly adjust.



(A) Smoothed price trajectories of 40 large-cap US stocks in 30 second intervals from 1pm to 4pm on Feb. 25, 2010. (B) Tracked motion of schooling mosquitofish.



Price movements of 40 large-cap US stocks in one minute intervals on Feb. 24, 2010. Colors correspond to market sector.

Synchronization increases efficiency



(1) Country X is likely to default.

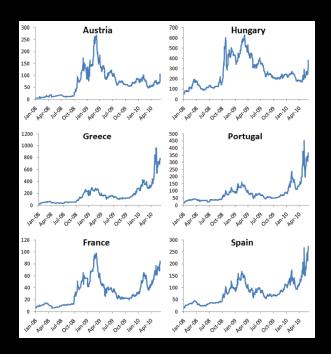


(2) Firm A buys securities that track probability of default.



(3) These security prices increase.

(4) If markets are synchronized, the prices of all other securities adjust.



Prices are more accurate

- An investor who purchases or sells any security in the market receives a more accurate price.
- Transaction costs are reduced
 - Liquidity providers are more confident in market prices and require less of a price concession to transact with an order.

... but who loses?



Country X



Country Y



Firm A





Firm B



- Imagine that country X and Y are related, so that when X is likely to default so is Y.
- Firm A follows X and Firm B follows Y.

... but who loses?



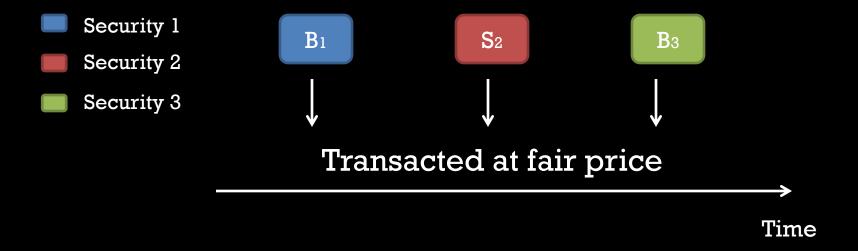
Firms A and B make less money when prices are tightly synchronized because they now must compete with each other when processing information.

Modelling cross-asset price discovery



Manoj Narang, CEO Tradeworx

Model



- n securities trade asynchronously over a single period.
- One unit-sized order to buy or sell is submitted for each security (Bi or Si). P(Bi)=P(Si)=0.5
- Orders are immediately transacted by liquidity providers at the fair price, i.e., at the expected future price of the security.

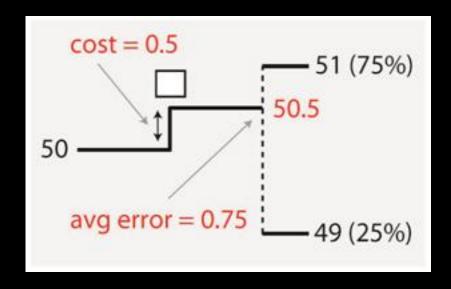
Model

- The final price of a security increases or decreases by δ_i with equal probability. $P(+\delta_i) = P(-\delta_i) = 0.5$
- Orders are correlated with final price change,

$$P(B_i | +\delta_i) = \phi_i > 0.5$$

• Final price changes of securities are correlated, ρ_{ij}

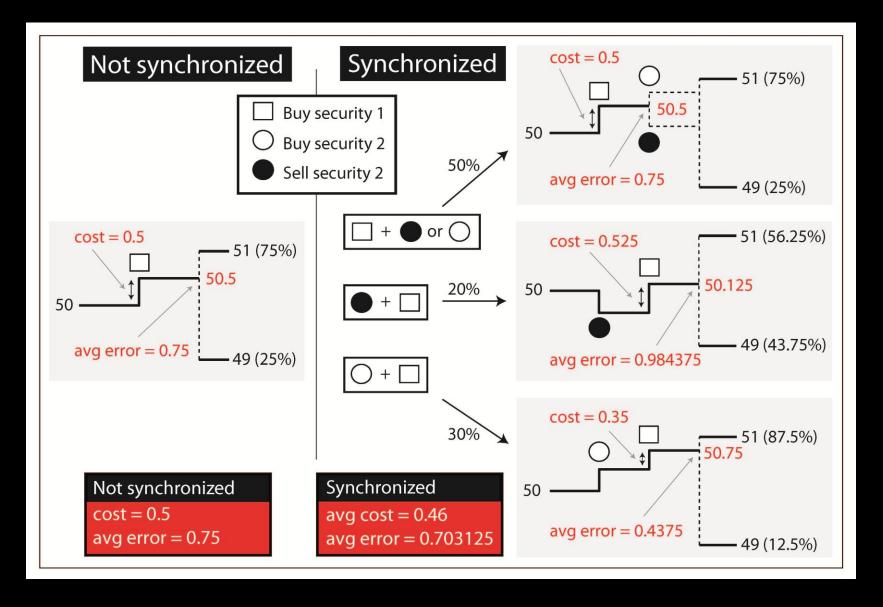
Example



Adding a second security

- A second security is added with the same properties as the first.
- Final prices are correlated with $\rho_{ij} = 0.8$
- What happens to the average cost and pricing error for the buy order?

Synchronization increases efficiency



Equations

$$\mathcal{P}(B_2|B_1) = \frac{\mathcal{P}(B_2, B_1)}{\mathcal{P}(B_1)},$$

$$= \frac{1}{\mathcal{P}(B_1)} \sum_{x_1, x_2} \mathcal{P}(B_2, B_1|x_1, x_2) \mathcal{P}(x_1, x_2),$$

$$= \frac{1}{\mathcal{P}(B_1)} \sum_{x_1, x_2} \mathcal{P}(B_2|x_2) \mathcal{P}(B_1|x_1) \mathcal{P}(x_1, x_2),$$

$$= 0.60.$$

$$\mathcal{P}(S_2|B_1) = \frac{\mathcal{P}(S_2, B_1)}{\mathcal{P}(B_1)},$$

$$= \frac{1}{\mathcal{P}(B_1)} \sum_{x_1, x_2} \mathcal{P}(S_2, B_1|x_1, x_2) \mathcal{P}(x_1, x_2),$$

$$= \frac{1}{\mathcal{P}(B_1)} \sum_{x_1, x_2} \mathcal{P}(S_2|x_2) \mathcal{P}(B_1|x_1) \mathcal{P}(x_1, x_2),$$

$$= 0.40.$$

$$p_1 = E[x_1|B_1, B_2],$$

$$= x_1^+ \mathcal{P}(x_1^+|B_1, B_2) + x_1^- \mathcal{P}(x_1^-|B_1, B_2),$$

$$= 51 \times 0.875 + 49 \times 0.125,$$

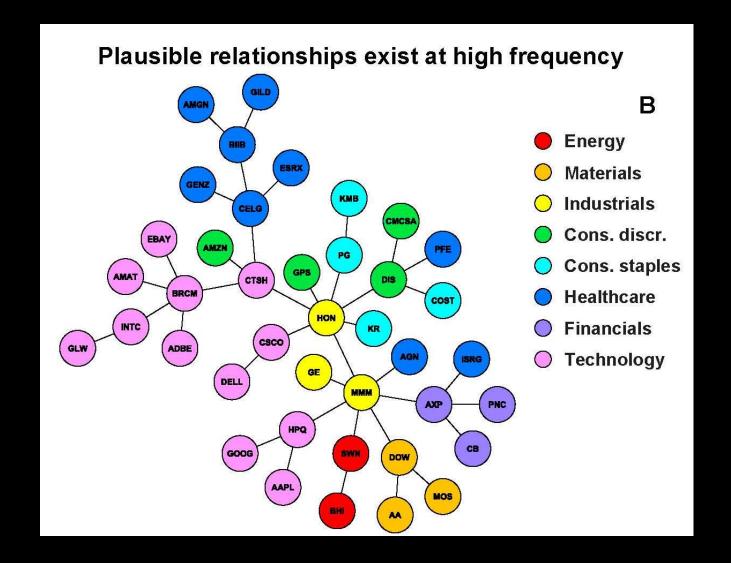
$$= 50.75$$

$$p_1 = E[x_1|B_1, S_2],$$

 $= x_1^+ \mathcal{P}(x_1^+|B_1, S_2) + x_1^- \mathcal{P}(x_1^-|B_1, S_2),$
 $= 51 \times 0.5625 + 49 \times 0.4375,$
 $= 50.125$

What should worry regulators?

- When prices are tightly connected, errors can quickly propagate through the financial system.
- HFT firms are run by scientists/engineers, are they enforcing spurious relationships?



Minimum spanning tree derived from the 30 second correlation matrix for the 40 large-cap stocks. The ticker for each stock is shown on the corresponding node, and nodes are color-coded according to GICS sector (Gerig, 2012).

Conclusions

- There are, on average, over one thousand transactions per second in US equities alone during the trading day.
- High-speed computerized trade is needed to keep prices connected.
- Markets are most efficient if prices are updated at timescales corresponding to the frequency of trade: currently milliseconds to microseconds.
- HFT activity requires careful monitoring to ensure that:
 - errors do not propagate from one security to the rest of the market.
 - that correct relationships between securities are being enforced.