#### **Information Sharing in Financial Markets**

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## Info sharing is prevalent in financial markets

Professional investors share info among each other

- Shiller and Pound (1989) survey
- Hong, Kubik and Stein (2005), Pool, Stoffman, and Yonker (2015)
- Private investment communities: SumZero, Value Investors Club

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## Info sharing is prevalent in financial markets

Normal folks also share their investment ideas

• Twitter, Seeking Alpha, StockTwits, Reddit/ Wallstreetbets (WSB)



Word-of-mouth transmission of ideas appears to be an important contributor to day-to-day or hour-to-hour stock market fluctuations. — Shiller (2015, p.180)

Research questions:

- 1. Why do investors want to voluntarily share information?
- 2. Who shares information with whom?

We consider a classic Kyle model to study info sharing in financial markets

Provide one rational theory of info sharing:

- 1. The coarsely informed investors have a strategic motive to share their info: "trading against order flow"/"trading against error"
  - Unique info flow: less informed  $\Rightarrow$  more informed
- 2. After info sharing,
  - sender profit  $\uparrow$  but receiver profit  $\downarrow$
  - liquidity  $\downarrow$ , price efficiency  $\uparrow$ , and trading volume may  $\uparrow$  or  $\downarrow$

## Literature

- 1. Info sharing
  - Manipulation: Benabou and Laroque (1992)
  - Price correction acceleration: Ljungqqvist and Qian (2016), Kovbasyuk and Pagano (2015), Liu (2017), Schmidt (2019)
  - Commitment to aggressive trading: Indjejikian, Lu and Yang (2014)
  - Advantage over uninformed followers: Van Bommel (2003)
  - "Talk for her book": Pasquariello and Wang (2016)
  - Disagreement: Balasubramaniam (2020)

Our complementary explanation: info from less informed to more informed

- 2. Noise/supply info in financial markets:
  - Ganguli and Yang (2009), Marmora and Rytchkov (2018), Farboodi and Veldkamp (2020)

Our focus: noise in investor's info/sentiment; who shares with whom

# **Model Setup**

Two key departures from Kyle (1985)

- 1. Two rational investors with info of different precision;
- 2. Info can be shared between them.



## Model setup: Specifics

- A risky asset with date-2 value  $\tilde{v} \sim N(0, 1)$ .
- Two risk-neutral rational investors with different-quality info
  - H observes  $\tilde{v}$
  - L observes

$$\tilde{y} = \tilde{v} + \tilde{e}$$
, with  $\tilde{e} \sim N(0, \rho^{-1})$  and  $\rho \in (0, \infty)$ 

- At t = 0, info-sharing decisions:  $A_i \in \{$ Share, Not share $\}$
- Investor *i* places order *x*<sub>i</sub> to maximize expected profits

 $E[\tilde{x}_i(\tilde{v}-\tilde{p})|\mathcal{F}_i]$ 

For instance, if L shares but H does not,  $\mathcal{F}_H = \{\tilde{v}, \tilde{y}\}$  and  $\mathcal{F}_L = \{\tilde{y}\}$ 

• Trading. Noise traders  $\tilde{u} \sim N(0, \sigma_u^2)$  and market makers set pricing rule

$$\tilde{p} = E\left(\tilde{v}|\tilde{\omega}\right)$$
, with  $\tilde{\omega} = \tilde{x}_H + \tilde{x}_L + \tilde{u}$ 

## **Results**

Subgames at the trading stage

- **Subgame 1**: Neither investors shares info:  $A_L = \emptyset$  and  $A_H = \emptyset$ 
  - Info sets:  $\mathcal{F}_L = \{\tilde{y}\}$  and  $\mathcal{F}_H = \{\tilde{v}\}$
  - Trading strategies:  $\tilde{x}_L = \beta_y^{\otimes \otimes} \tilde{y}$  and  $\tilde{x}_H = \alpha_v^{\otimes \otimes} \tilde{v}$ , where

$$\beta_y^{\otimes \otimes} = \frac{\rho \sigma_u}{\sqrt{4 + \rho(5 + 2\rho)}} \text{ and } \alpha_v^{\otimes \otimes} = \frac{(2 + \rho)\sigma_u}{\sqrt{4 + \rho(5 + 2\rho)}}$$

• Pricing rule  $\tilde{p} = \lambda^{\varnothing \varnothing} \tilde{\omega}$ , where

$$\lambda^{\varnothing\varnothing} = \frac{\sqrt{4 + \rho(5 + 2\rho)}}{(4 + 3\rho)\sigma_u}$$

## Equilibrium at the trading stage

- **Subgame 2**: L shares but H does not:  $A_L = S$  and  $A_H = \emptyset$ 
  - Info sets:  $\mathcal{F}_L = \{\tilde{y}\}$  and  $\mathcal{F}_H = \{\tilde{v}, \tilde{y}\}$
  - Trading strategies:  $\tilde{x}_L = \beta_y^{S \otimes} \tilde{y}$  and  $\tilde{x}_H = \alpha_v^{S \otimes} \tilde{v} + \alpha_y^{S \otimes} \tilde{y}$ , where

$$\beta_y^{S\varnothing} = \frac{2\rho\sigma_u}{\sqrt{(1+\rho)(9+8\rho)}}, \ \alpha_v^{S\varnothing} = \frac{3\sigma_u\sqrt{1+\rho}}{\sqrt{9+8\rho}},$$
  
and  $\alpha_y^{S\varnothing} = -\frac{\rho\sigma_u}{\sqrt{(1+\rho)(9+8\rho)}}$ 

• Pricing rule  $\tilde{p} = \lambda^{S \varnothing} \tilde{\omega}$ , where

$$\lambda^{S\varnothing} = \frac{\sqrt{9+8\rho}}{6\sigma_u\sqrt{1+\rho}}.$$

H trades against the information shared by L:  $\alpha_y^{S\varnothing} < 0!$ 



• Interpretation 1: Trade against order flow

$$\tilde{x}_{H} = \underbrace{\frac{1}{2\lambda^{S\varnothing}}E\left(\tilde{v}|\tilde{v},\tilde{y}\right)}_{\text{Forecasting fundamental}} \underbrace{-\frac{1}{2}E\left(\tilde{x}_{L}|\tilde{v},\tilde{y}\right)}_{\text{Trading against order flow}}$$

- H has known the fundamental perfectly:  $\frac{\partial E(\tilde{v}|\tilde{v},\tilde{y})}{\partial \tilde{y}} = 0$
- As L always trades on her information  $(\beta_y^{S\varnothing} > 0)$ ,  $\alpha_y^{S\varnothing} = \frac{\partial}{\partial \tilde{y}} \left[ -\frac{1}{2} E(\tilde{x}_L | \tilde{v}, \tilde{y}) \right] = -\frac{\beta_y^{S\varnothing}}{2} < 0$
- Interpretation 2: Trade against error

$$ilde{x}_{H} = lpha_{v}^{Sarnothing} ilde{v} + lpha_{y}^{Sarnothing} ilde{y} = \left( lpha_{v}^{Sarnothing} + lpha_{y}^{Sarnothing} 
ight) ilde{v} + lpha_{y}^{Sarnothing} ilde{e}$$

• L's trading on  $\tilde{e}$  is dumb money in the eye of H

## Equilibrium at the trading stage

• **Subgame 3**: H shares info:  $A_H = S$ 

- Info sets: F<sub>L</sub> = {ỹ} and F<sub>H</sub> = {ṽ} (or F<sub>H</sub> = {ṽ, ỹ})
  Trading strategies: x̃<sub>L</sub> = β<sub>v</sub><sup>S</sup> ṽ and x̃<sub>H</sub> = α<sub>v</sub><sup>S</sup> ṽ, where

$$\beta_v^{\cdot S} = \alpha_v^{\cdot S} = \frac{\sigma_u}{\sqrt{2}},$$

• Pricing rule 
$$\tilde{p} = \lambda^{\varnothing \varnothing} \tilde{\omega}$$
, where

$$\lambda^{\varnothing\varnothing} = \frac{\sqrt{4 + \rho(5 + 2\rho)}}{(4 + 3\rho)\sigma_u}$$

# Equilibrium at the info-sharing stage

Go back to date 0 to analyze investors' info sharing decisions.

$$\mathbf{L} \qquad \begin{array}{c} \mathbf{H} \\ \text{Not share } (\varnothing) & \text{Share } (S) \\ \mathbf{L} \qquad \begin{array}{c} \text{Not Share } (\varnothing) & \frac{\rho(1+\rho)\sigma_u}{(4+3\rho)\sqrt{4+5\rho+2\rho^2}}, \frac{(2+\rho)^2\sigma_u}{(4+3\rho)\sqrt{4+5\rho+2\rho^2}} & \frac{\sigma_u}{3\sqrt{2}}, \frac{\sigma_u}{3\sqrt{2}} \\ \text{Share } (S) & \frac{2\rho\sigma_u}{3\sqrt{(1+\rho)(9+8\rho)}}, \frac{(9+4\rho)\sigma_u}{6\sqrt{(1+\rho)(9+8\rho)}} & \frac{\sigma_u}{3\sqrt{2}}, \frac{\sigma_u}{3\sqrt{2}} \end{array}$$

## Proposition

There exists a unique equilibrium in which L shares her info whereas H does not.

#### Decomposition of L's profit:

$$\underbrace{\pi_{L}^{S\varnothing} - \pi_{L}^{\varnothing \varnothing}}_{\text{total effect: } > 0} = \underbrace{\pi_{L}^{direct} - \pi_{L}^{\varnothing \varnothing}}_{\text{direct effect: } > 0} + \underbrace{\pi_{L}^{S\varnothing} - \pi_{L}^{direct}}_{\text{indirect effect: } > 0}$$

- <u>Direct effect</u>: holding constant L's trading rule and the market maker's pricing rule, H trades against L's info
- <u>Indirect effect</u>: investor L's trading rule and the market maker's pricing rule adjust in response to info sharing

## Proposition

From no info sharing to info sharing:

(1) L's profit  $\uparrow$ , H's profit  $\downarrow$ , and the combined profit  $\uparrow$ 

• H's profit:

$$\underbrace{\pi_{H}^{S\varnothing} - \pi_{H}^{\varnothing \varnothing}}_{\text{total effect: } < 0} = \underbrace{\pi_{H}^{direct} - \pi_{H}^{\varnothing \varnothing}}_{\text{direct effect: } > 0} + \underbrace{\pi_{H}^{S\varnothing} - \pi_{H}^{direct}}_{\text{indirect effect: } < 0}$$

• Example: if  $\rho = 1$  and  $\sigma_u = 1$ , via info sharing,  $\pi_L \uparrow 32.7\%$ ,  $\pi_H \downarrow 4.1\%$ , and  $\pi_H + \pi_L \uparrow 2.6\%$  (noise traders are harmed)

## Proposition

From no info sharing to info sharing:

- (1) L's profit  $\uparrow$ , H's profit  $\downarrow$ , and the combined profit  $\uparrow$
- (2) *Market liquidity* ↓, *and market efficiency* ↑. *Trading volume* ↑ *iff L owns imprecise info.*

H trading against error  $\Rightarrow$  Less error in the aggregate order flow

- 1. Market liquidity  $\lambda$
- 2. Price efficiency  $Var^{-1}(\tilde{v}|\tilde{p})$
- 3. Trading volume:  $TV = \frac{1}{2} \left( E \left[ |\tilde{x}_H| + |\tilde{x}_L| + |\tilde{\omega}| + |\tilde{u}| \right] \right)$

## **Extensions and Variations**

## Extensions and variations

- 1. Imperfectly informed H-investor
  - Result: L still shares if H is well informed
- 2. Ex-post info sharing
  - <u>Result</u>: That L shares information with H is always an equilibrium
- 3. H: "I am not listening"
  - <u>Result</u>: That all Hs commit not to listen cannot be sustained in equilibrium
- 4. Publicly shared info
  - <u>Result</u>: L still shares if market makers have low ability to interpret the shared info
- 5. Other extensions
  - Endogenous info acquisition by L
  - Multiple Hs and Ls
  - Three differentially informed investors

## 1. Imperfectly informed H-investor



- Investor *i*'s info:  $\tilde{y}_i = \tilde{v} + \tilde{e}_i$ ,  $\tilde{e}_i \sim N(0, \rho_i^{-1})$  and  $\rho_i \in (0, +\infty]$
- WLOG, assume  $\rho_1 \ge \rho_2$  and 2 shares info with 1

$$\tilde{x}_1 = \underbrace{\alpha_y}_{>0} \underbrace{\tilde{y}_1}_{>0} + \underbrace{\alpha_2}_{<0 \text{ iff } \rho_1 > \hat{\rho}_1 \equiv 2(1+\rho_2)} \underbrace{\tilde{y}_2}_{>0}$$

# 2. Ex-post info sharing



#### **Results**:

- Neither L nor H shares info in equilibrium? No, "someone must share info in equilibrium"
- (2) H shares info in equilibrium? No, "H never shares info in equilibrium"
- (3) There exists an equilibrium in which L always shares whereas H does not share.

- *L* observes  $\tilde{y}$  and a number *M* of Hs observe  $\tilde{v}$
- Hs can commit not to receiving the shared info

## Proposition

- (1) When  $M \ge 3$ , *L* shares and every *H* commits not to use the shared info
- (2)  $\exists \hat{M} > 0$  such that when  $M > \hat{M}$  the following equilibrium always exists:
  - L shares her info and all Hs use L's shared information
  - *Hs'* profits would be higher had they all committed not to use the shared info.

## 4: Publicly shared information



• Info may be leaked to market makers in the communication process.

• Baseline model:  $\chi_H = \infty$  and  $\chi_M = 0$ 

#### L's sharing decisions:



Applications

# Application 1: Market chatters: private communication among investors

#### • Private communication/ Market chatters: Zaloom (2003)

- Shiller and Pound (1986), Hong et al. (2005), Pool et al. (2015)
- Private investment communities: SumZero, Value Investors Club
- Consistent evidence
  - 1. Crawford et al. (2017): predominantly small hedge fund managers share in Value Investors Club
    - $\sim$  coarsely informed investors more likely to share
  - 2. Cowgill and Zitzewitz (2015): more experienced traders trade against optimism bias in Google's prediction markets
    - ~ trade against error

- Mapping to our model
  - L: representative social media posters
  - H: hedge funds who analyze tweets or r/wallstreetbets
  - MM has low ability to read the public info
- So, social media opinions can be truthful but noisy. We thus explain
  - Why info sharing is so prevalent?
  - Why investment posts contain fundamental info (Chen et al, 2014),
  - but noisy at the same time (Antweiler and Frank, 2004)?
- The merit of sentiment trading strategy? If H is already well informed, trading against social media sentiment can backfire

- 1. A coarsely informed investor has a strategic incentive to share her info with the well informed.
  - Trading against order flow/ error
- 2. After info sharing, sender profit  $\uparrow$  but receiver profit  $\downarrow$ . Noise traders  $\downarrow$ .
- 3. Market liquidity  $\downarrow$ , price efficiency  $\uparrow$ , and trading volume may  $\uparrow$  or  $\downarrow$ .