

# Financial Markets Microstructure

## Lecture 20

Asset Price Bubbles

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# Previously on FMM

- Information and trading volumes:
  - Private signals create disagreement → generate trade, which reveals and aggregates private info
  - Public signals should theoretically mitigate disagreement and lead to less trade
  - But IRL trading volumes increase around public announcements
  - **Kondor**: Possible explanation through second-order beliefs

Two stories for why bubbles may occur

- Rational herding

- Herding: following the actions of others, even when this goes against one's own private information
- We will look at different explanations for why this may be rational

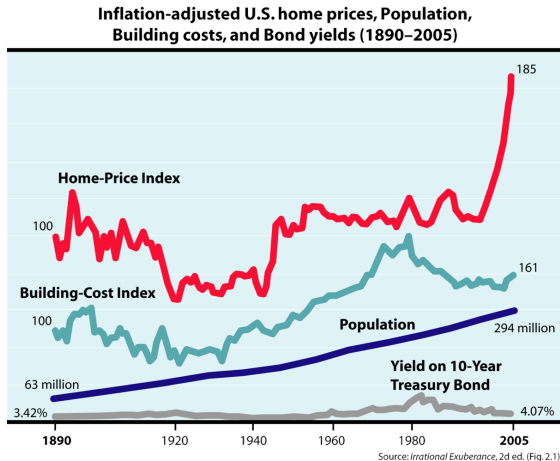
- Lack of common knowledge/coordination (Abreu and Brunnermeier [2003])

- There is a difference between everybody knowing that an asset is overpriced, and everybody knowing that everybody knows...
- Again, speculation depends on these *higher-order beliefs*

# Bubbles

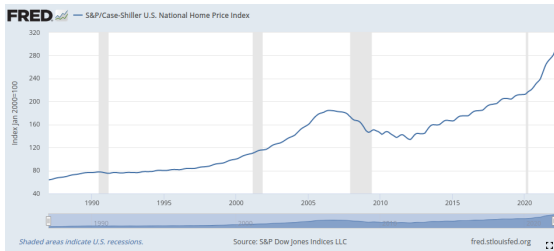
- **Wikipedia:** “Trade in high volumes at prices that are considerably at variance with intrinsic values”
- **Investopedia:** “A surge in equity prices, often more than warranted by the fundamentals and usually in a particular sector, followed by a drastic drop in prices as a massive sell-off occurs”
- **Chicago Fed:** “...a bubble exists when the market price of an asset exceeds its price determined by fundamental factors by a significant amount for a prolonged period”

# Examples of bubbles



- US **housing** market had a bubble in mid-2000s
- Its burst was a significant contributor to the Great Recession

# Examples of bubbles



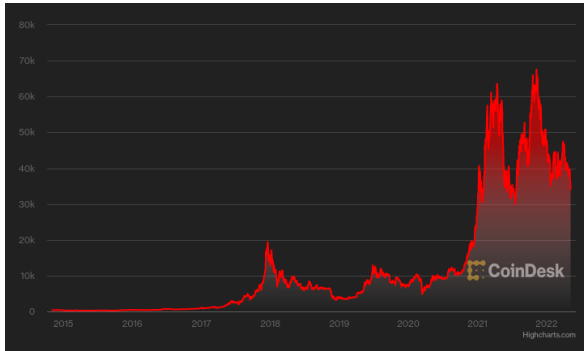
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- Its burst was a significant contributor to the Great Recession

# Examples of bubbles



- **Bitcoin** grew and burst pretty badly at the end of 2017.

# Examples of bubbles



- **Bitcoin** grew and burst pretty badly at the end of 2017.
- ...and is just pretty volatile overall
- (to be fair, like with any fiat currency, not clear what bitcoin's fundamental value is, so can say that any positive price is a bubble)

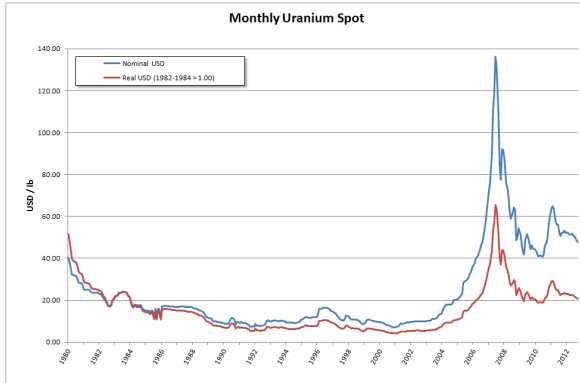


# Examples of bubbles



- we remember the **Gamestop** frenzy of January 2021...

# Examples of bubbles



- In the early noughties, the price of **uranium** was upward trending
- In late 2006 the Cigar Lake Mine in Canada containing the largest known undeveloped reserves was flooded
- This seemingly set off an uncontrolled increase in price followed by a crash: classic bubble behavior

# This lecture:

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**1** Herd Behavior in Financial Markets

**2** Abreu and Brunnermeier: Bubbles and Crashes

# Herding: Introduction

- **Herding**: ignoring private information in favor of “wisdom of the crowd”
  - 1 Herding may be the efficient response to new information or similarity between agents...
  - 2 ...but it may also be the inefficient result of a certain decision making process. Here: focus on the latter
- In **financial markets**: momentum trading, positive-feedback trading
- In 1992, a wave (a herd?) of articles showing that herding could be result of rational [informational cascade](#)
- Today we look at this and other ‘rational’ explanations
- Note: I will follow the presentation in Bikhchandani and Sharma [2000].  
See Bikhchandani et al. [2021] for a comprehensive review of the literature.

# Preview

- Agents arrive at the market sequentially and need to make a decision
- Every agent has a private signal and observes decisions of previous agents (but not their signals!)
- Ideally: pool private information to find best decision
- But here: **sequential decision making**
  - First-comers: make decisions based on information
  - But as time goes by, people may start disregarding their own information and just choose the most popular action
  - Herding ensues, but it is *fully rational*: public information swamps private information
- **Informational cascade**: a few pieces of information may determine everyone's choice

- **State** (fundamental)  $v \in \{L, H\}$ ;
- In each period  $t \in \{1, 2, \dots\}$  an individual arrives and needs to make a **decision**  $d_t \in \{0, 1\}$  (invest or not);
- **Payoffs**  $u(d_t, v)$ :
  - $u(0, v) = 0$ ,
  - $u(1, L) = L - m < 0$ ,
  - $u(1, H) = H - m > 0$ ,
  - (say for now that price (midquote)  $m$  is fixed and there is no spread:  $a = b = m$ )

# Model: Beliefs

- Represent all beliefs  $p$  about  $v$  as probabilities of  $v = H$  conditional on relevant info.
- “Market belief”  $q_t$ 
  - $q_0$  is the public prior belief – e.g.,  $1/2$ ;
  - $q_t$  incorporates info contained in decisions at  $t = 1, 2, \dots, t - 1$
- Period- $t$  agent observes  $q_t$  and a private signal  $\eta_t$  and forms private belief  $r_t$ .
  - Suppose  $\eta_t \in \{h, l\}$  with  $\mathbb{P}(\eta_t = h | v = H) = \mathbb{P}(\eta_t = l | v = L) = \rho$ .
- All beliefs calculated using Bayes’ rule

# Decisions

- Agent behaves optimally  $\Rightarrow$  chooses  $d_t = 1$  iff  $r_t \geq \bar{r} \equiv \frac{m-L}{H-L}$ .
- Use Bayes' rule to compute  $r_t(\eta_t, q_t)$ :

$$r_t(h, q_t) = \frac{q_t \rho}{q_t \rho + (1 - q_t)(1 - \rho)}$$

$$r_t(l, q_t) = \frac{q_t(1 - \rho)}{q_t(1 - \rho) + (1 - q_t)\rho}$$

Note  $r_t(h, q_t) > q_t > r_t(l, q_t)$ .



# Herds and cascades

- If  $r_t(h, q_t) > \bar{r} > r_t(l, q_t)$  then the agent follows their signal
  - their action is informative
  - public belief is updated:  $q_{t+1}(q_t, d_t = 1) = r_t(h, q_t)$ ;  $q_{t+1}(q_t, d_t = 0) = r_t(l, q_t)$ .
- If  $r_t(h, q_t) > r_t(l, q_t) > \bar{r}$  then the agent chooses  $d_t = 1$  regardless of private signal
  - action uninformative →  $q_{t+1} = q_t$
  - next agent will also ignore private signal!
    - Everyone ignores private signals and chooses the same action (we have a **herd**)
    - Market belief  $q_t$  is frozen in place; private information is not aggregated!
    - This **herd may be incorrect** (unless  $q_t = 0$  or  $q_t = 1$ )
    - (Same happens if  $\bar{r} > r_t(h, q_t) > r_t(l, q_t)$  with  $d_t = 0$ )

# What triggers the herd?

- A few incorrect signals can be enough enough to set off a herd
- A small piece of information 'cascades' through the system
- Each agent is rational, but together they may seem stupid: their information taken together is very precise, but there is no information aggregation
- A specific example with numbers of how a herd may arise: [here](#)

# Herds and cascades: comments

- Incorrect herds only occur if distribution of  $\eta_i$  is bounded – otherwise strong enough signals could overpower the public info
- In a slightly richer model, the opposite outcome is also possible – state of permanent uncertainty in which everyone acts solely on their private signal, ignoring public information
- Terminology:
  - **Herd** = action convergence ( $d_{t+1} = d_t$  from some point onwards)
  - **Cascade** = public belief convergence ( $q_{t+1} = q_t$  from some point onwards)
  - Distinction is not super important for our purposes

# What if we introduce a price?

- As before: unknown asset value  $v$ , and each trader receives a private signal  $\eta_i$
- With probability  $\pi$  the trader is a noise trader, who buys/sells/abstains with equal probability, w.p.  $1 - \pi$  rational as above
- A risk-neutral market maker quotes competitive bid-ask prices
- What will happen?

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- A risk-neutral market maker quotes competitive bid-ask prices
- What will happen?
  - This is standard Glosten-Milgrom, so no herds!
  - Prices adjust in such a way that following private signals is optimal, and prices themselves then incorporate all private signals!

# More layered model

- However, the GM result is in part due to model simplicity
- Avery and Zemsky [1998] expand on this analysis
  - Suppose  $v \in \{0, \frac{1}{2}, 1\}$
  - If  $v = \frac{1}{2}$ , this is perfectly revealed by the private signal:  $\eta_t = \frac{1}{2}$
  - If  $v \in \{0, 1\}$ , trader  $t$  receives informative signal with precision  $\rho_t \equiv \mathbb{P}(\eta_t = v)$
  - Furthermore, a proportion  $\mu \in \{\mu^H, \mu^L\}$  of traders have perfect information:  $\rho_t = 1$  after a good signal
  - The remaining traders have noisy info:  $\rho_t \in (\frac{1}{2}, 1)$  after a good signal

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- Three levels of uncertainty (for MM):
  - Event uncertainty:  $v = 1/2$  (no event) or  $v \in \{0, 1\}$  (event)
  - Value uncertainty: if event,  $v = 1$  or  $v = 0$
  - Composition uncertainty: many informed traders ( $\mu^H$ : well-informed economy) or few ( $\mu^L$ : poorly-informed economy)

# Herding can occur with pricing and multi-layered uncertainty

- In GM, price mechanism worked as a screening device: made sure that high types bought and low types sold
- But now, it is possible to 'misprice' such that herding occurs, at least temporarily
  - Can be because  $\mu = \mu_H$  so all traders know  $v$ , but MM does not (non-speculative bubble)
  - Can be because  $\mu = \mu_L$  but traders do not know that and perceive past order flow as more informative than it is (speculative bubble)
- This allows bubbles to occur

See numerical example [here](#)



## Other types of herding: Reputational herding

A brief example.

- **Two managers:** Invest or not in project of unknown value (gets imperfect signal  $\eta \in \{1, 0\}$ )
- **Type:** Each manager either smart or dumb (doesn't know). If both managers smart, observe same  $\eta$ ; if one or both dumb, observe independent signals  $\eta$
- **Payoffs:** Managers **maximizes their reputation** (want to appear smart)
- **Herding:** Manager 1 moves first, then manager 2
  - If manager 1 invests, manager 2 can deduce that  $\eta_1 = 1$ . Suppose  $\eta_2 = 0$ . Then one of the two (or both) must be dumb.
  - If manager 2 does not invest, he reveals this. If player 1's investment then succeeds, people will assume that manager 2 is the dumb manager
  - Investing might be better: even if the investment fails, people might think that both managers are smart, but got an 'unlucky' signal

# Herding: Conclusion

- **Herding:** may occur when private information cannot be easily aggregated
- **Price mechanism:** alleviates problem by providing private incentives to trade and thus reveal information, which is then incorporated into prices
- **Multi-layered uncertainty:** can make the herds occur even with flexible prices
- **Aside:** *Momentum trading* often assumed to be a 'behavioral feature': but it may be perfectly rational
- **Empirical estimation of herding:** some conclusions can be tested in the data but to a very limited extent; see Bikhchandani and Sharma [2000] and Bikhchandani et al. [2021] for details.

# This lecture:

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1 Herd Behavior in Financial Markets

2 Abreu and Brunnermeier: Bubbles and Crashes

# Abreu and Brunnermeier [2003]: Introduction

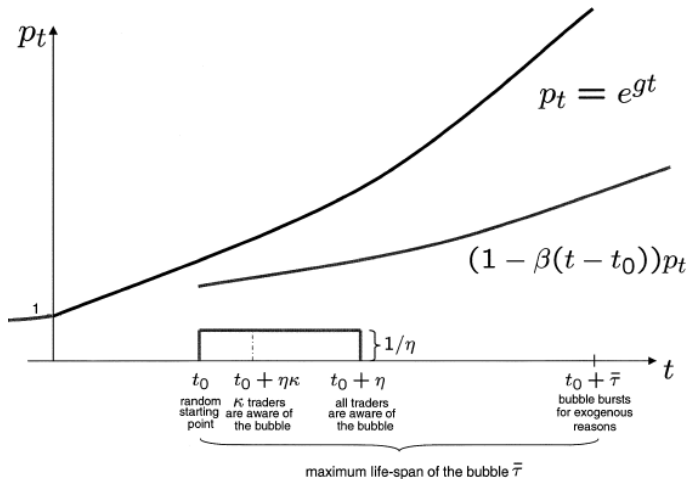
- Efficient market hypothesis: bubbles are impossible
  - In finite model, use backward induction argument: no mispricing in last period, which should be foreseen in second-last period, etc. → unravelling
- This requires that all traders agree on when the bubble will collapse (at least on the distribution of times)
- Here: a model in which coordination is needed to cause a crash
- Coordination, in turn, depends on beliefs about others
  - Back to higher order beliefs

# Model

- **Single asset traded:** value at  $t$  is  $v_t$
- **Progress:** At  $t = 0$ , technological progress makes  $v_t$  grow at rate  $g$
- **Slowdown:** at some random time  $t_0$ , there is a slowdown and  $v_t$  growth slows to  $r < g$
- **Price:** Price grows at rate  $g$  until either
  - At least a fraction  $\kappa$  of rational traders sell the asset ( $\kappa$  is the *absorption capacity* of the economy), or
  - The market is exogenously corrected at time  $t_0 + \bar{\tau}$
- **Gradual learning:** Each period, a fraction  $1/\eta$  of rational traders become aware of the mispricing
  - But they don't know  $t_0$ , and hence don't know how many others know of the mispricing

- **Behavioral traders** think progress will last forever
  - When enough rational traders sell, absorption capacity of behavioral traders is reached and price must drop
  - At this point, everybody becomes aware of the mispricing
  - If this doesn't happen, then market exogenously collapses when mispricing is too big
- **Rational traders** know progress is temporary, but not when it stops
  - Implication: when you learned that progress has stopped, you are not sure what other people believe
  - Suppose you learn at  $t'$ . At  $t' + \eta$  you know that everybody knows
  - But somebody else might learn that progress stopped at  $t'' > t'$ ; he will not know that everybody knows until  $t'' + \eta > t' + \eta$

# Graphically



(Note: graph is from the paper and it has a mistake)

# Why bubbles then?

- In this model there is never *common knowledge*: you are never sure what the others know. This prevents usual backward induction
- At least  $\kappa$  traders must sell to burst bubble: coordination important
- But it is hard to coordinate without common knowledge
- Therefore, mispricing can go on for a long time

Even if traders realize the market will crash, they don't know exactly when, incentivizing them to ride the bubble



# Definition of a bubble

- In this setting, let's use a very strict definition of a bubble
- In particular, notice that after  $t_0 + \eta\kappa$ , the mispricing is known by enough traders to correct it

## Definition

A bubble is persistent mispricing *beyond*  $t_0 + \eta\kappa$

- Thus, in this definition it is not enough that the asset is priced over its value for there to be a bubble
- The mispricing must be well-known to traders

# Some observations

The following is shown in the paper:

- Traders either take the maximum long (buy) or short (sell) position
- When a rational trader 'goes short', all traders who learned of the mispricing before him will already have gone short
- Once a rational trader goes short, he never re-enters the market: he waits for the bubble to burst

# Bubbles and crashes

Generally, in the model, there are two possible types of equilibria

- Exogenous crash

- When the growth rate  $g$  under the bubble is high, dispersion  $\eta$  and absorption capacity  $\kappa$  are high, informed traders sell out very slowly
- In effect, they take a chance on 'riding the bubble'
- As a result, selling will never be sufficient to burst the bubble, which will burst at the exogenous date  $t_0 + \bar{\tau}$

- Endogenous crash

- When traders have incentives to sell quick, this leads to unraveling: enough traders will sell to make the bubble burst
- However, 'bubble incentives' remain: the sooner the price crashes, the smaller the cost of riding the bubble
- Therefore, the bubble will be smaller but still exist

# The role of 'sunspots'

- **Sunspot equilibria:** refers to equilibria where *economically irrelevant information* has an influence
- In our case: suppose an uninformative event is observed with a certain probability
- If informed traders decide to coordinate their actions around this event (eg. use the strategy 'sell when event occurs'), it can become pivotal
- Example from article: in 1980s trade data had big market impact in the US; in 1990s Alan Greenspan's statements were more influential
  - If sufficiently many people react to an event you must too - even if the event carries little/no information by itself

# Abreu and Brunnermeier: Conclusion

- Standard arguments against bubbles rely a lot on common knowledge between agents
- When we dispense with common knowledge, belief dispersion among agents can cause mispricings to persist even after everyone has observed the mispricing
- Thus, bubbles may not be fixed by the market
- As a side-effect, seemingly insignificant events can serve to coordinate actions and cause crashes

## References I

- D. Abreu and M. K. Brunnermeier. Bubbles and crashes. *Econometrica*, 71(1):173–204, 2003. URL <https://doi.org/10.1111/1468-0262.00393>. Publisher: Wiley Online Library.
- C. Avery and P. Zemsky. Multidimensional Uncertainty and Herd Behavior in Financial Markets. *The American Economic Review*, 88(4):724–748, 1998. ISSN 0002-8282. URL <https://www.jstor.org/stable/117003>. Publisher: American Economic Association.
- S. Bikhchandani and S. Sharma. Herd Behavior in Financial Markets. *IMF Staff Papers*, 47(3): 279–310, 2000. ISSN 1020-7635. URL <https://doi.org/10.2307/3867650>. Publisher: Palgrave Macmillan Journals.
- S. Bikhchandani, D. Hirshleifer, O. Tamuz, and I. Welch. Information Cascades and Social Learning. 2021.

## References II

- L. Smith and P. N. Sørensen. Observational learning. *The New Palgrave Dictionary of Economics Online Edition*, pages 29–52, 2011. URL <http://www.econ.ku.dk/Sorensen/papers/observational-learning.pdf>.

# Herding example: Setup

- This example follows that in Bikhchandani and Sharma [2000]
- Suppose  $q_0 = 1/2$
- **Payoffs:** Let  $L - m = -1$ ;  $H - m = 1$ 
  - Then  $\bar{r} = 1/2$
  - Suppose that agents flip a 50/50 coin whenever indifferent
- Suppose the following signal sequence realized:  $\{h, l, l, l, \dots\}$
- Denote by  $\mathbb{I}_i$  agent  $i$ 's information set



# Herding example: Analysis

## First agent

- Information set  $\mathbb{I}_1 = \{\eta_1 = h\}$

- Then

$$r_1(h, 1/2) = \mathbb{P}(v = H | \mathbb{I}_1) = \frac{\frac{1}{2}\rho}{\frac{1}{2}\rho + \frac{1}{2}(1 - \rho)} = \rho$$

- Since  $\rho > 1/2$ : invest.
- **Thus**, given  $\eta_1 = h$ , first agent invests:  $d_1 = 1$

## Herding example: Analysis (2)

### Second agent

- Second agent can perfectly deduce first agent's signal:  $\eta_1 = h$  if  $d_1 = 1$ ,  $\eta_1 = l$  otherwise.
  - In other words,  $q_2 = r_1 = \rho$ , no information is lost.
  - Second agent receives  $\eta_2 = l$ , his information set is  $\mathbb{I}_2 = \{\eta_1 = 1, \eta_2 = -1\}$
- Signals are *symmetric*, so

$$r_2(l, \rho) = \mathbb{P}(v = H | \mathbb{I}_2) = \frac{\frac{1}{2}\rho(1 - \rho)}{\frac{1}{2}\rho(1 - \rho) + \frac{1}{2}(1 - \rho)\rho} = 1/2$$

- Thus, second agent is indifferent, flips a coin to decide. If  $d_2 = 0$  then we are back to  $q_3 = 1/2$ .
- But suppose the coin-toss decides invest:  $d_2 = 1$

## Herding example: Analysis (3)

### Third agent

- Third agent can also perfectly deduce the first agent's signal
- Information set is  $\mathbb{I}_3 = \{\eta_1 = h, d_2 = 1, \eta_3 = l\}$ . Furthermore,

$$\mathbb{P}(d_2 = 1 | v = H) = \rho + (1 - \rho)(1/2) = (1 + \rho)/2$$

$$\mathbb{P}(d_2 = 1 | v = L) = \rho(1/2) + (1 - \rho) = 1 - \rho/2$$

$$\Rightarrow q_3(q_2 = \rho, d_2 = 1) = \frac{\rho^{\frac{1+\rho}{2}}}{\rho^{\frac{1+\rho}{2}} + (1 - \rho) \left(1 - \frac{\rho}{2}\right)}$$

$$\Rightarrow r_3(l, q_3) = \frac{\rho^{\frac{1+\rho}{2}}(1 - \rho)}{\rho^{\frac{1+\rho}{2}}(1 - \rho) + (1 - \rho) \left(1 - \frac{\rho}{2}\right) \rho} = \frac{1 + \rho}{3} > \frac{1}{2}$$

- Hence,  $d_3 = 1$

## Herding example: Analysis (4)

### Fourth agent

- Information set  $\mathbb{I}_4 = \{\eta_1 = h, d_2 = d_3 = 1, \eta_4 = l\}$
- Agent four knows that agent three would have invested regardless of his signal
- So he doesn't learn anything from  $d_3$ . So  $q_4 = q_3$  and  $r_4(l, q_4) = r_3(l, q_3)$
- Hence  $d_4 = 1$
- Same for all subsequent agents:  $d_i = 1$  for all  $i$ , regardless of  $\eta_i$ !
- We have a herd! – and a very inefficient one at that! (Look at signals)

[back](#)

# Herding with prices example

Take an extreme case of Avery and Zemsky's model: suppose the following parameter values

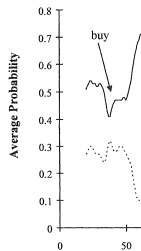
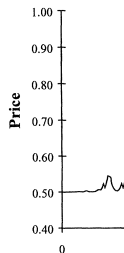
- $\mathbb{P}(v = 1/2) = 0.9999$ : very small prior probability of an 'event';  
 $\mathbb{P}(v = 1) = \mathbb{P}(v = 0) = 0.00005$
- $\frac{\mathbb{P}(\mu = \mu^H)}{\mathbb{P}(\mu = \mu^L)} = 99$ : high prior probability of a well-informed economy
- If economy is poorly informed: all traders have  $p_i = 0.51$ , i.e. very poor signal about value

Suppose we're in an unlikely state of the world

- 1 Value is low ( $v = 0$ ) implying that there is an event
- 2 The economy is poorly informed ( $\mu = \mu^L$ )

How will market learn state of the world? Let's look at a simulation

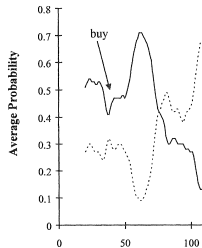
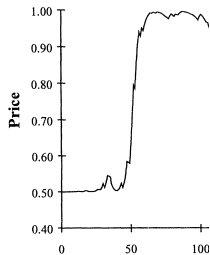
## Herding with prices example (2)



Three of first five traders buy

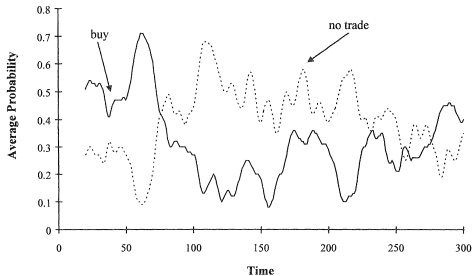
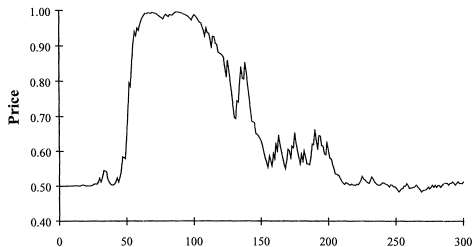
- Since economy poorly informed: herd buying starts
- MM thinks it's likely that economy is well informed: price goes up

## Herding with prices example (3)



As the price goes up, the herd is broken: trading volume diminishes as rational traders drop out

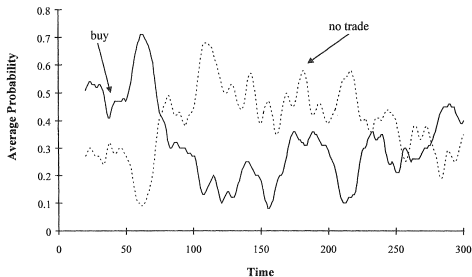
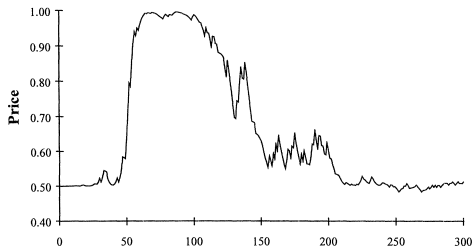
## Herding with prices example (4)



As herd becomes apparent, MM realizes that only a few informative trades have been made → price toward  $1/2$



## Herding with prices example (5)



Rational traders only re-enter in period 220: trade based on information (buy if high/sell if low)

In the example, the price is persistently above the level that would ensue if traders pooled their information