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# Clock Games: Theory and Experiments

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# Timing is crucial - 1

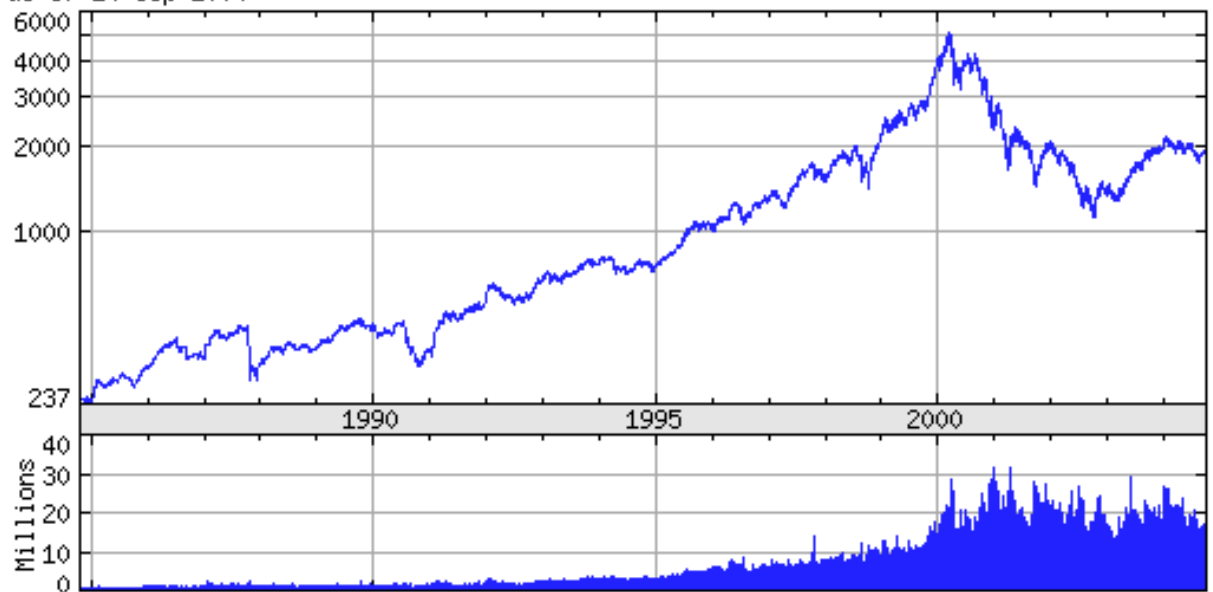
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- A firm contemplates a new product introduction for some high tech product
- Waiting reduces the costs of production and thereby increases profits
- However, waiting too long risks entry by a rival
- When should the new product be introduced?

# Timing is crucial - 2

- It's 1 January 2000 and tech stocks are zooming up...

NAS/NMS COMPOSITE (NASDAQ STOCK  
as of 24-Sep-2004



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# Timing is crucial - 3

- Mobutu has long been in power in (then) Zaire. Should you lead a revolution against him?
- Move too soon, a Mobutu will “deal” with you.
- Move too late the and the power vacuum will be filled.



# Timing is crucial - 4

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- Common features of many timing problems
  - time has to be “*ripe*”
  - *Congestion* effect: there is only room for  $K$  players
  - *Waiting* motive: first movers risk more
  - Uncertainty about rivals’ moves
- Examples
  - Currency attacks
  - Debt renegotiation

# Timing is crucial - 5

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## ■ Differences

- Few key players – few cohorts – many players
- Rivals' moves are difficult/easy to predict
- Rivals' moves are observable/unobservable

## ■ Observations

- Initial delay
- Sudden onset of action

## ■ Objectives of paper

- Provide tractable model
- Experimentally verify predictions  
given complexity of the game

# Some related literature

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- Theory on timing games
  - Pre-emption games
  - War of attrition games
  - Recent papers
    - Park & Smith (2003)
    - Morris (1995)
    - AB (2002,2003)
- Experimental literature
  - McKelvey and Palfrey (1992)

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# Model Setup

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- $I$  players each deciding when to “move”
- Players receive private signals about a state relevant variable  $\rightarrow$  player  $i$ 's clock starts at  $t_i$ 
  - Key tension: When you learn about the change in the state variable, don't know how many others have already learned this.
- Game ends when a critical number,  $K$ , of the players exit.

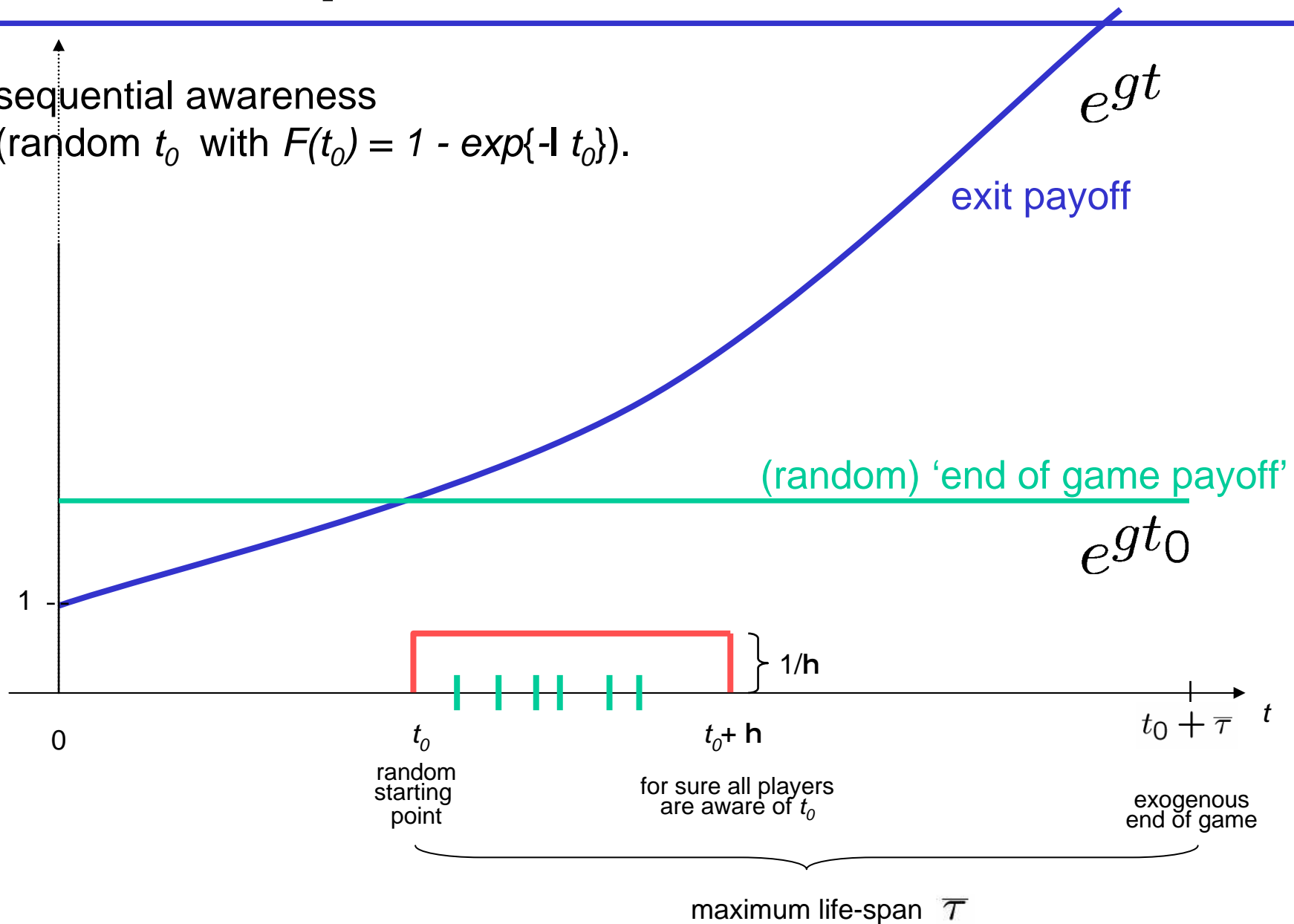
# Currency Attack Example

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- There are  $I$  key players in the market
- Each learns about a payoff relevant event:  
That there have been significant outflows in the reserves of some country.
  - But each is unsure of the timing that others have learned
- Upside from staying in: Enjoy supernormal profits from domestic exchange rate
- Downside: Once there outflows by enough ( $K$ ) key players, a devaluation will occur.

# Model setup

- sequential awareness  
(random  $t_0$  with  $F(t_0) = 1 - \exp\{-\lambda t_0\}$ ).



# Payoff structure

## ■ Payoffs

- 'exit payoff' (random) for first  $K$  players
- 'end of game payoff' for last  $I-K$  players

## ■ Tie-breaking rule

if  $K^{\text{th}}, K+1^{\text{th}}, \dots, K+n^{\text{th}}$  player exit at the same time  $t > t_0$ , exiting players receive the exit payoff with equal probability.

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# Costs and benefits of delay

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- Log Marginal Costs: Hazard rate associated with the end of the game  $\times$  expected payoff drop from this event
- Log Marginal Benefits: The growth rate from waiting an additional period
- In equilibrium we have the usual  $MC = MB$  condition for each of the players.

# Delay - unobserved actions ...

At  $t = t_i + \tau$

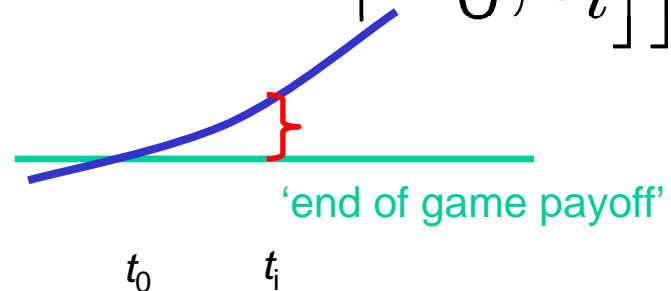
$$(1 - \Delta h) \underbrace{ge^{g(t_i + \tau)} \Delta}_{\text{benefit of waiting}} = \underbrace{\Delta h E \left[ e^{g(t_i + \tau)} - e^{gt_0} \mid D_{\Delta}, t_i \right]}_{\substack{\text{benefit of exiting} \\ = \text{size of payoff drop}}}$$

For  $\Delta \rightarrow 0$

$$g = h E \left[ 1 - e^{-g(t_i + \tau - t_0)} \mid D_0, t_i \right]$$

Solving for  $\tau$

$$\tau = \frac{1}{g} \left[ \ln \frac{h}{h-g} + \ln E \left[ e^{-g(t_i - t_0)} \mid D_0, t_i \right] \right]$$

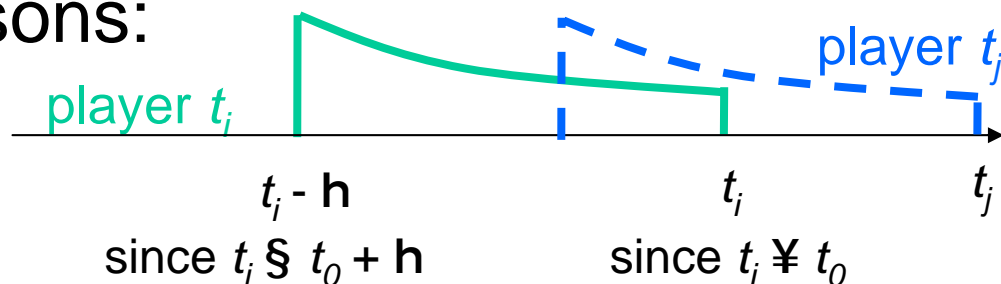


# Equilibrium hazard rate – unobserved actions

- If everybody waits for  $\tau$  periods, then at  $t_i + \tau$   
 $\text{Prob}(\text{payoff drop at } t_i + \tau + \Delta) =$   
 $= \text{Prob}(K^{\text{th}} \text{ of } \textit{others} \text{ received signal before } t_i + \Delta)$

- Random for **two** reasons:

- $t_0$  is random



- Timing of  $K^{\text{th}}$  signal within window of awareness is random

$$\binom{I-1}{1} \pi(\Delta|t_0) \binom{I-2}{K-1} [\Pi(\Delta|t_0)]^{K-1} [1 - \Pi(\Delta|t_0)]^{I-1-K}$$

- Condition on fact that payoff drop did not occur



## ... Delay – unobservable actions

**Proposition 1:** In unique symmetric equilibrium

$$\text{delay } \tau = \frac{1}{g} \ln \left( \frac{\lambda F(K, I, \eta(\lambda - g))}{g - (g - \lambda) F(K, I, \eta\lambda)} \right),$$

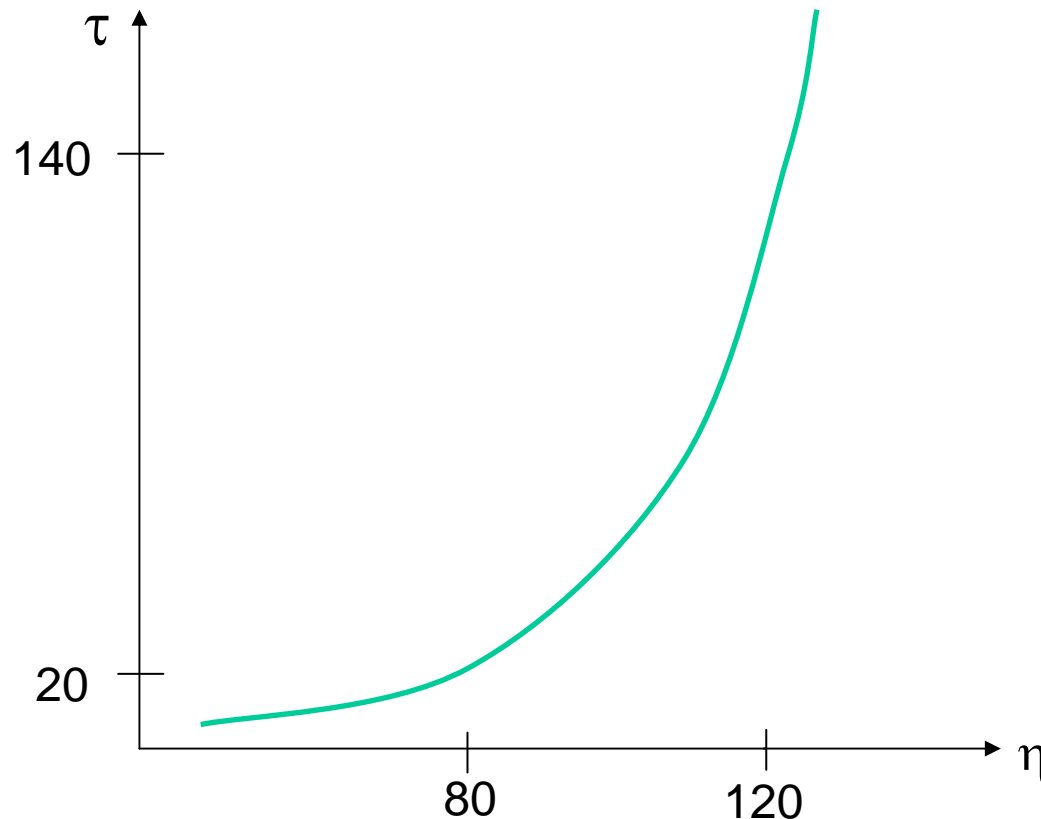
where  $F(a, b, x)$  is a Kummer function.

Integral representation

$$\frac{\Gamma(b)}{\Gamma(b-a)\Gamma(a)} \int_0^1 e^{xz} z^{a-1} (1-z)^{b-a-1} dz$$

# Delay increases with window of awareness

**Proposition 2:** Delay increases with window of  $\eta$ .



*Why?*

Makes it more difficult to predict moves of others.

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# Herding – observable actions

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**Proposition 3:** All players exit after observing the first player exiting (if first player exits in equilibrium after receiving the signal).

*Intuition:* backwards induction

# Delay of first player – observable action

$$g = h_1 \frac{I-K}{I-1} E \left[ 1 - e^{-g(t_i + \tau - t_0)} \mid D_0, t_i \right]$$

$h_1$  = hazard rate of the first player exiting

$\frac{I-K}{I-1}$  = probability of *not* receiving the high exit payoff when herding after first

$$\tau_1 = \frac{1}{g} \left[ \ln \frac{h_1}{h_1 - g \frac{I-1}{I-K}} + \ln E \left[ e^{-g(t_i - t_0)} \mid D_0, t_i \right] \right]$$

Simplifies to a ratio of Kummer functions

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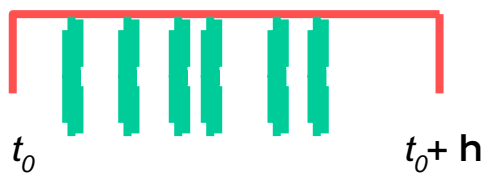
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# Information Clustering

■ Our model - CC model - AB model



$l$  players



continuum of players  
in  $l$  groups



continuum of players  
no information clustering

# Comparison to AB (unobservable)

## ■ Proposition 6: $\tau > \tau_{AB}$ .

### ■ 2 effects:

■ Individual player carries more weight (focus of CC-model)

■ Synchronization is more complicated

■ In AB: hazard rate  $>$  prob. of being “K<sup>th</sup>” player conditional on knowing to “K<sup>th</sup>” player,  $t_i$  knows that next player exits an instant later with probability 1 and causes payoff drop.

■ In BM: hazard rate  $>$  prob. of being “K<sup>th</sup>”  
\* prob.  $K+1^{\text{th}}$  follows in next instant.



## ■ Proposition 7: Fix $K=\kappa l$ . As $l \rightarrow \infty$ , $\tau \rightarrow \tau_{AB}$ .

■ (Kummer functions converge to exponentials.)



# Comparison with AB (observable)

■ **Proposition 9:**  $\tau_{1,AB} = 0$ .

■ **Intuition**

- If at  $t_i + \tau_{AB,1}$  payoff hadn't occurred it will occur with prob. one in next instant (i.e. hazard rate =  $\infty$ )
- Hazard rate is continuous
- For any  $\tau_{AB,1} > 0$  player  $i$  has incentive to exit earlier.
- Hence,  $\tau_{AB,1} = 0$ .

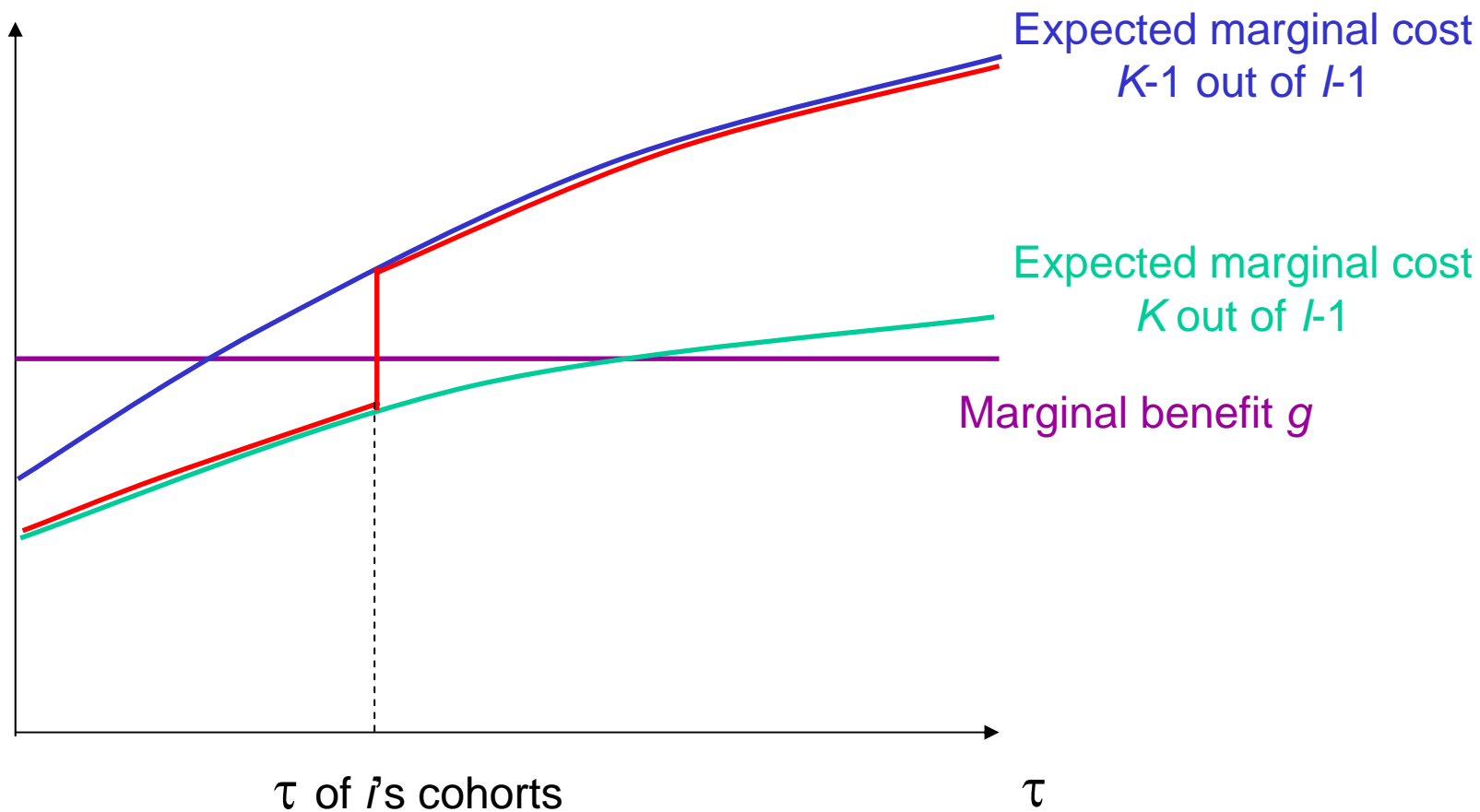
■ **Corollary:**  $\tau_1 > \tau_{1,AB} = 0$ .

- Same reasoning as in case with unobservable actions.

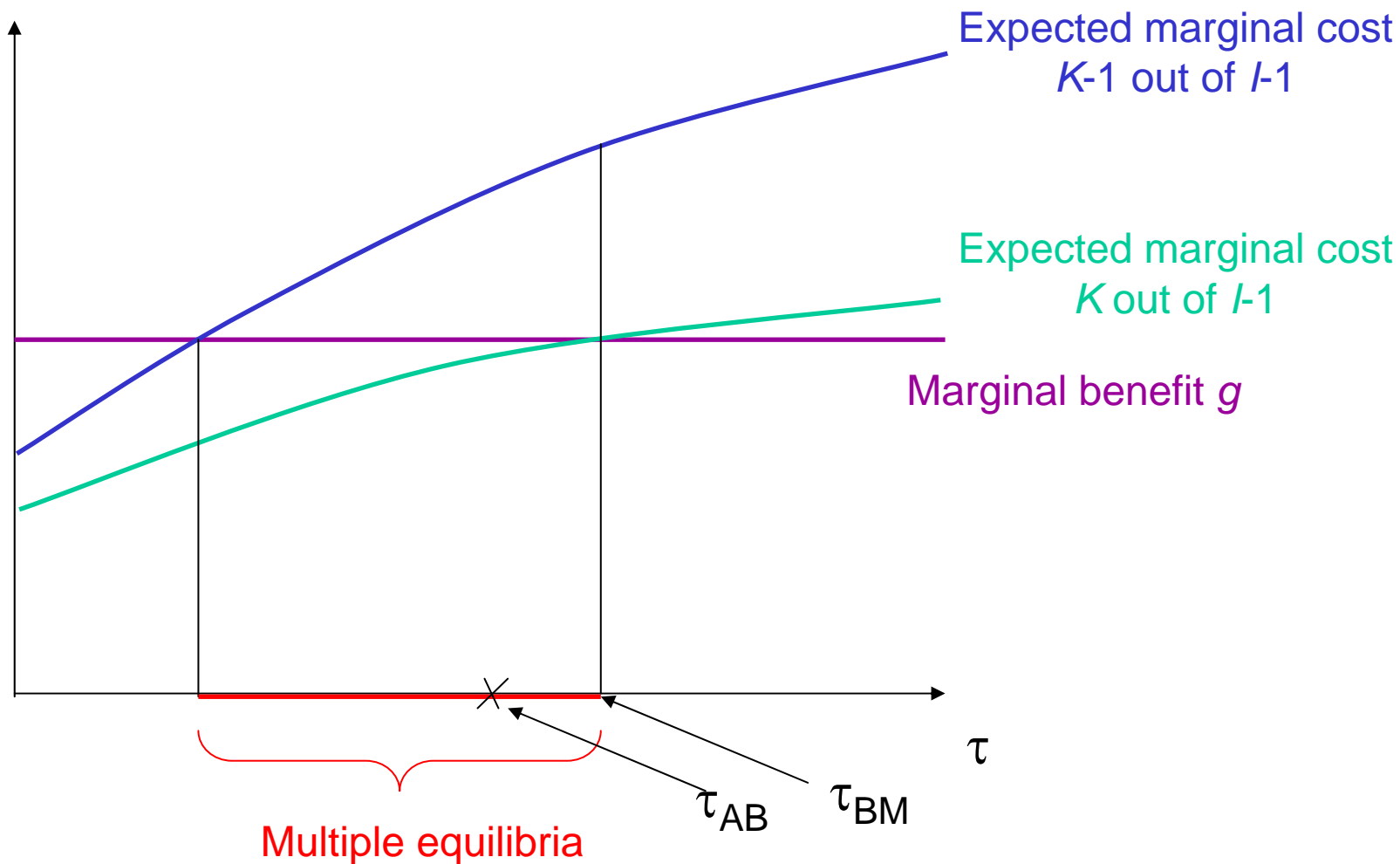
# Isolating information clustering (CC-model)

- Continuum of players, but  $I$  cohorts
- Difference:
  - player  $i$  knows that his cohort exits at  $t_i + \tau$ 
    - Before  $t_i + \tau$ : drop if  $K^{\text{th}}$  cohort out of  $(I-1)$  exits
    - After  $t_i + \tau$ : drop if  $(K-1)^{\text{th}}$  out of  $(I-1)$  exits  
(since own cohort exited)
    - At  $t_i + \tau$ : drop occurs with strictly positive prob.

# Isolating information clustering (CC-model)



# Isolating information clustering (CC-model)



Reasoning for  $\tau_1$  in case with observable actions is analogous.

# Key conclusions

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- Information clustering creates an additional force for equilibrium delay in the unobservable case
- Information clustering is *necessary* to get equilibrium delay in the observable case
- What matters for equilibrium delay?
  - Transparency
  - Synchronicity
  - Clustering

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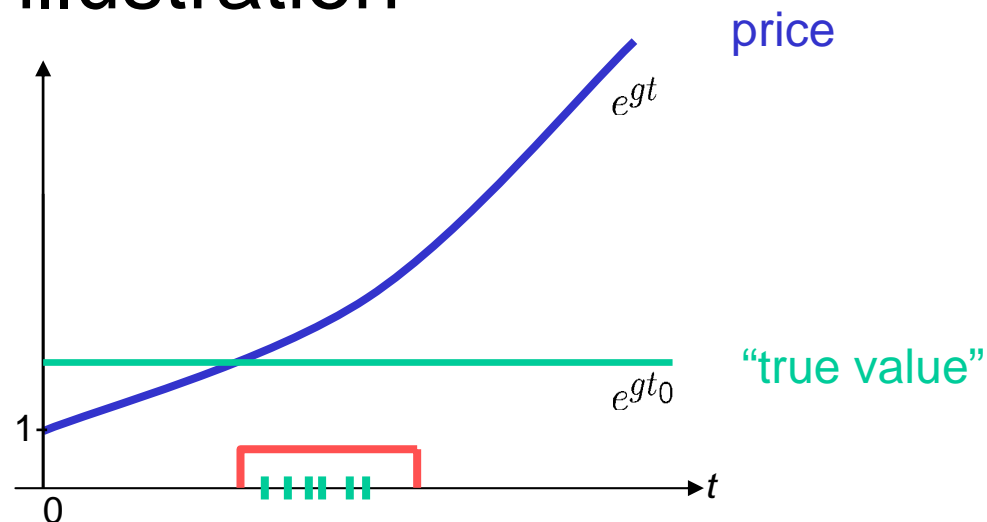
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# Experimental design - 1

## ■ Stock market illustration



- $g=2\%$ ,  $\lambda=1\%$ , ( $\frac{1}{2}$  second)
- 2 parallel rounds (randomly matched)
- 6 players per round
- First 3 sell at exit price  $e^{gt}$ , others  $e^{gt_0}$

# Experimental design - 2

Welcome to economic experiment! - Microsoft Internet Explorer

File Edit View Favorites Tools Help

Back Forward Stop Home Search Favorites Media

Address <http://www.ocf.berkeley.edu/~pplin/login.php3?name=group6&pass=group6> Go Links >>

# Experiment!

Thank you group6 for participating.

This is round 1 of the experiment

Price in ECU  
1.319

**Sell**

Min true value: unknown  
Max true value: unknown

Haas School of Business

Applet Bubble started Internet



# Experimental design - 3

The screenshot shows a Microsoft Internet Explorer browser window with the title "Welcome to economic experiemet! - Microsoft Internet Explorer". The address bar contains the URL <http://www.ocf.berkeley.edu/~pplin/login.php3?name=group4&pass=group4>. The main content area displays the following text:

## Welcome to Investment Decision Experiment!

Thank you group4 for participating.  
This is round 1 of the experiment

The interface features a black rectangular area with the following information:

- Price in ECU: 5.277
- Min true value: 0.906
- Max true value: 2.913
- message: the price of asset is above its true value

A blue button labeled "Sell" is positioned below the price information. The background of the page is watermarked with "Haas School of Business". At the bottom of the browser window, a status bar shows "Applet Bubble started" on the left and "Internet" on the right.

# Experimental design - 4

Welcome to economic experiement! - Microsoft Internet Explorer

File Edit View Favorites Tools Help

Back Forward Stop Home Search Favorites Media

Address <http://www.ocf.berkeley.edu/~pplin/login.php3?name=group1&pass=group1> Go Links >>

This is round 1 of the experiment

The Market has Closed  
True Value of Asset: 1.268

Cumulative Profits: 1.27  
profits of other players  
1.49  
23.77  
40.57  
1.27  
1.27

Applet Bubble started Internet

# Experimental design - 5

- Average payout: ECU 30.32 = \$15.16
- Hovering to avoid coordination via mouse-click
- “Learning by doing:” focus on periods 20,...,45
- Obvious mistakes: sale within 10 periods (5 sec.)
- 16 Sessions
- Treatments:

	unobservable	observable
$\eta=50$	<i>Compressed</i>	X
$\eta=90$	<i>Baseline</i>	<i>Observable</i>

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# Measures

## ■ Delay measures

■ delay

$$t_{\text{exit } i} - t_i$$

■ bubble length

$$t_{\text{exit } [K]} - t_0$$

■ Notice censoring!

## ■ Herding measure

■  $\text{GAP}^{2,1}$

$$t_{\text{exit } [2]} - t_{\text{exit } [1]}$$

■  $\text{GAP}^{3,2}$

$$t_{\text{exit } [3]} - t_{\text{exit } [2]}$$

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# Theory Predictions

Table 1: Theory Predictions

	<b>Baseline</b>	<b>Treatment Compressed</b>	<b>Observable</b>
<b>Bubble Length</b>	62	26	26
<b>Delay Length</b>	23	5	13*
<b>Gap Length</b>	13	7	1

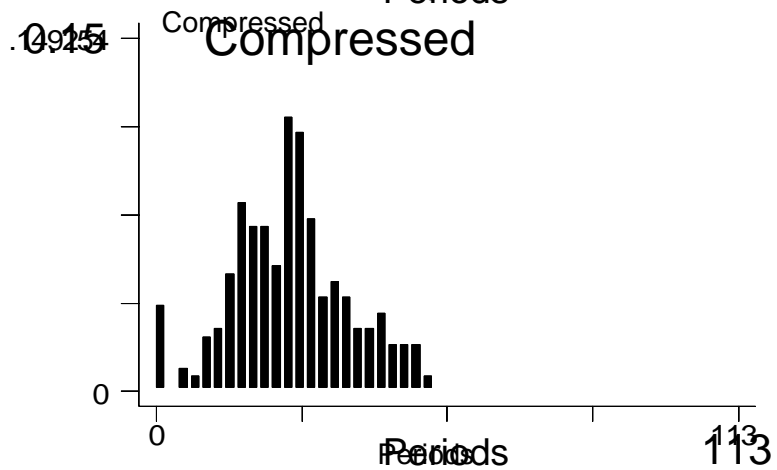
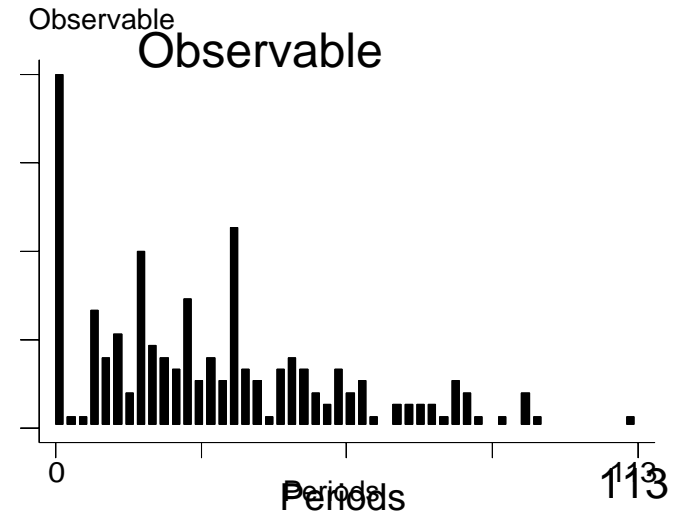
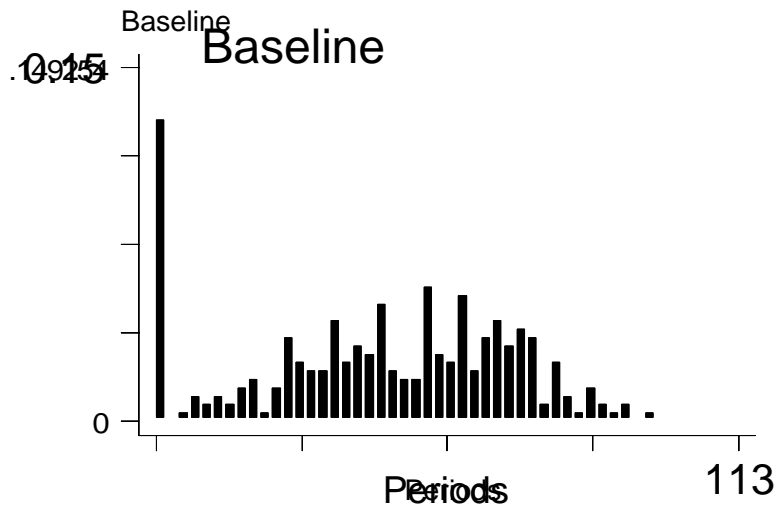
\*For the Observable treatment, Delay is only meaningful for first seller

# Descriptive Statistic

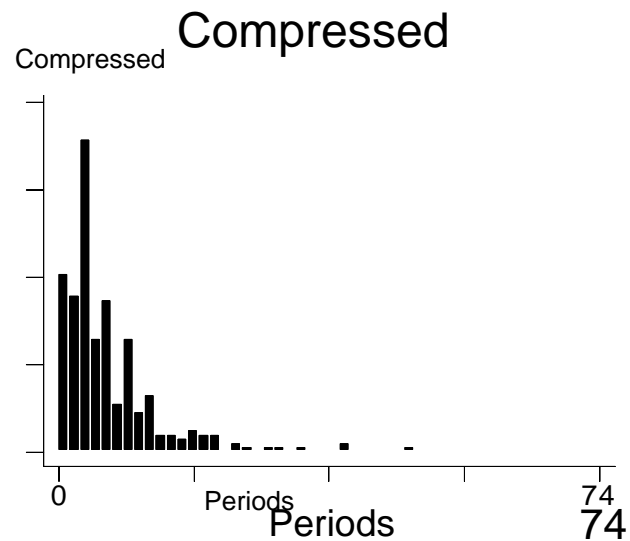
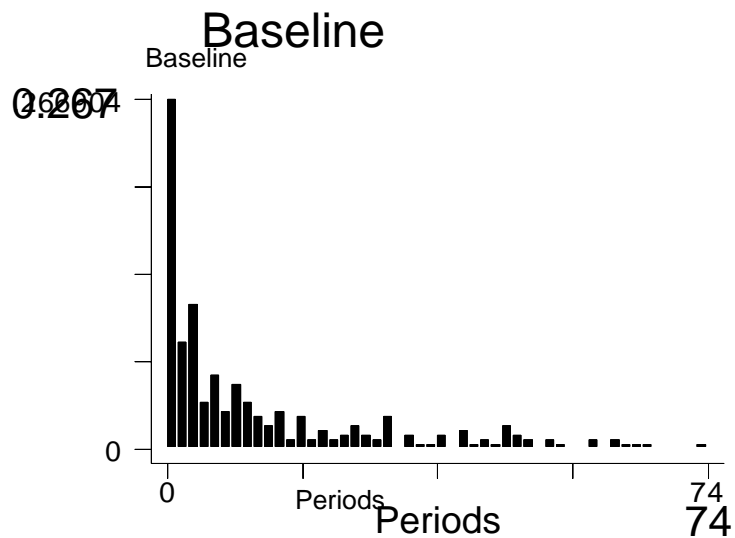
	Baseline	Treatment Compressed	Observable
Number of Sessions	6	6	4
<b>Bubble Length</b>	44.00 (25.00)	26.46 (11.31)	31.00 (24.55)
<b>Delay Length</b>			
Seller 1	7.26 (9.60)	3.97 (4.25)	7.06 (12.72)
Seller 2	10.18 (13.68)	5.34 (5.39)	
Seller 3	12.67 (16.14)	6.66 (6.79)	
<b>Gap Length</b>			
Between 1st & 2nd seller	23.27 (27.63)	18.59 (26.37)	9.48 (25.81)
Between 2nd & 3rd seller	15.22 (15.87)	8.68 (9.51)	1.85 (1.49)



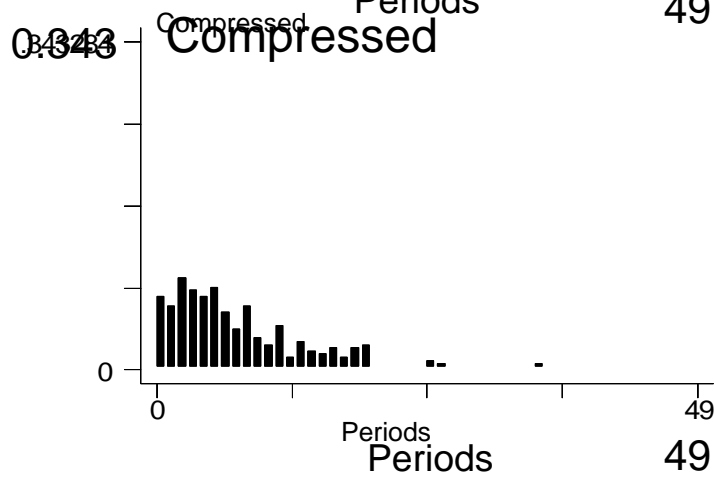
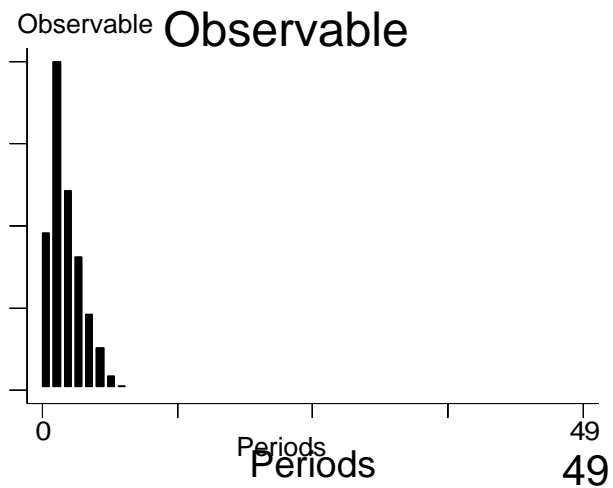
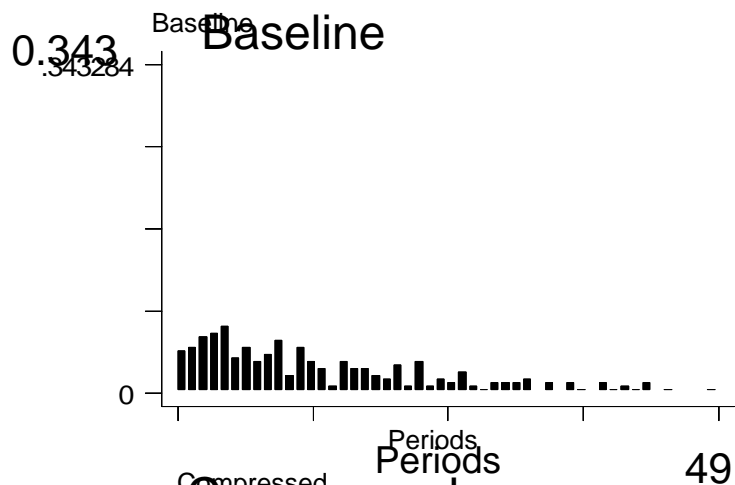
# Histograms – Bubble Length



# Histogram - Third Player's Delay



# Histogram - Gap Length



# Results – Session Level Analysis

■ Prediction 1: Bubble Length		
	Baseline > Compressed	5 %
■ Prediction 2: Delay		
■ Player 1:	Baseline > Compressed	5 %
■ Player 2:		5 %
■ Player 3:		1 %
■ Player 1:	Baseline > Observable	failed to reject =
■ Prediction 3: GAP		
■ GAP21:	Baseline > Observable	5 %
■ GAP32:		5 %

# Results: Delay – Individual Level Analysis

	Robust-Cluster-OLS			Tobit	
	Seller 1	Seller 2	Seller 3	Baseline	Compressed
<b>Constant</b>	11.512 (12.48)**	15.643 (11.33)**	19.597 (11.17)**	18.635 (35.09)**	9.036 (39.32)**
<b>Compressed</b>	-3.471 (4.50)**	-5.165 (4.60)**	-6.697 (4.91)**		
<b>Observable</b>	-0.654 (0.52)				
$t_0$	-0.054 (10.39)**	-0.069 (8.89)**	-0.087 (9.41)**		
<b>Round Fixed Effects</b>	Yes	Yes	Yes	Yes	Yes
Observations	738	584	583	1681	1788
<i>R</i> -squared	0.23	0.26	0.28		

# Results: Herding – Individual Level Analysis

	All Treatments		Observable Treatment Only	
	GAP21	GAP32	GAP21	GAP32
Constant	14.24 (7.55)**	11.431 (12.18)**	3.278 (1.57)	1.733 (10.35)**
Compressed	-3.858 (-1.48)	-6.182 (6.52)**		
Observable	-12.83 (4.67)**	-13.028 (15.45)**		
$t_0$	0.112 (5.66)**	0.047 (5.02)**	0.084 (2.48)*	0.002 (0.87)
Round Fixed Effects	Yes	Yes	Yes	Yes
Observations	785	786	201	201
<i>R</i> -squared	0.15	0.29	0.25	0.25

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# $t_0$ -effect & exiting before $t_i$

## ■ $t_0$ -effect

- Risk aversion - stakes are higher for large  $t_0$
- Difference in risk aversion among players
  - Delay of first seller < Delay of third seller
  - Effect becomes larger for large  $t_0$
- Misperception of constant arrival rate
- Waiting for a fixed (absolute) price increase

## ■ Exiting before $t_i$

- mistakes
- Worries that others suffer  $t_0$ -effect (risk aversion)
- Effect is larger in Baseline since bubble is larger



# Probit of Non-Delay

	Baseline and Compressed Only		Seller 1 Only
$t_0$	0.017	+0.3 %	0.017
	(17.44)**		(13.46)**
<b>Compressed</b>	-0.435	-7.1 %	-0.223
	(2.90)**		(1.20)
<b>Observable</b>			-0.03
			(0.18)
<b>Constant</b>	-2.474		-1.373
	(12.85)**		(3.34)**
<b>Round Fixed Effects</b>	Yes		Yes
<b>Observations</b>	2259		738

base rate 8.8 %

# Conclusion

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- Many timing games have in common
  - Time has to be “ripe”
  - Congestion effect
  - Costly to be pioneer
  - Uncertainty about others moves
- Theoretical predictions of clock games:
  - Delay increases with
    - number of key players
    - uncertainty about others moves
  - Herding/sudden onset if moves are observable
    - Initial delay for first player decreases with number of players
- Experiment
  - Comparative static/Treatment effects are confirmed
  - Delay and herding less strong (in terms of levels)
  - Additional insights:  $t_0$ -effect, ...