

# Information Asymmetries in Pay-Per-Bid Auctions: How Swoopo Makes Bank

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# WELCOME TO SWOOPO

Watch the video tour



## REGISTER NOW FOR FREE

BUY BIDS AND BID  
WITHOUT RISK!

Bid now - these auctions are about to end



Avatar The Game (Nintendo DS)



00:00:18

\$1.20

Bigvictor74

BID

Sharp AQUOS LC46LE700UN  
46-Inch LED HDTV



00:00:11

\$21.58

Joneyke

BID

Kindle DX 9.7" (Latest Generation)



00:00:18

\$29.88

Badboyutsch

BID

Toshiba Satellite 16.0-Inch Laptop



00:00:29

\$94.28

Kraylic666

BID

Apple iPhone 3GS 32GB (Black)



00:01:22

\$3.41

2deep

BID

Auction ID: 313644

[Add auction to watchlist](#)

## Apple iPad 64GB WiFi



The 9.7-inch high-resolution screen makes iPad perfect for watching HD movies, TV shows, podcasts, music videos, and more



Recently sold for \$48.94



NO IMAGE AVAILABLE

NO IMAGE AVAILABLE

NO IMAGE AVAILABLE

Click on an image to enlarge it

Price:

**\$50.85**

All prices are in US Dollars

Bidder:

**Cg1234**

1 BidButler + \$0.01 + 00:00:03

10 **00:00:07**

**BID**

It costs **\$0.60** to place a bid.  
Each bid raises the auction price by \$0.01  
This auction will end latest on  
Jul-11-2010 at 04:17 PDT

### BIDDING HISTORY

Statistics

Bidders in the last 15 minutes: **25**

\$50.85	Cg1234	BidButler
\$50.84	MI1234	Single bid
\$50.83	05116040855	Single bid
\$50.82	Cg1234	BidButler
\$50.81	schawnarc	Single bid
\$50.80	MI1234	Single bid
\$50.79	schawnarc	Single bid
\$50.78	Cg1234	BidButler
\$50.77	MI1234	Single bid



"I won a new Mino Flip camera. I use my flip every week."

Geoffrey M. - Summit, OH

**REGISTER**

### Savings:

Price: **\$829.00**  
Auction Price: **\$50.85**  
Savings: **\$778.18**

Have you tried using our BidButler yet?

In case you haven't, check out this helpful bid agent now!

[Want to know more?](#)

In 25 secs Swoopo earned  \* 60 cents = \$  in bid fees



In 25 secs Swoopo earned  $11 * 60$  cents = **\$6.60** in bid fees



In 25 secs Swoopo earned  $11 * 60 \text{ cents} = \mathbf{\$6.60}$  in bid fees

**Not bad. That's about \$1000/hour.**

(...but of course not all auctions are as profitable)



**2008 revenues were**  
**\$28,300,000**





**"Take your time in finding the right auction, don't rush into it."**

Adam O. - Story, IA

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**"I won a new Mino Flip camera. I use my flip every week."**

Geoffrey M. - Summit, OH

[REGISTER](#)



**"Love the site and so far I have won 3 items."**

Julio G. - Alameda, CA

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**"I received my item less than 5 days after my auction."**

Ken C. - Canyon, ID

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**"Can you say excited? I told a couple of close friends immediately ..."**

Marvin W. - Wake, NC

[REGISTER](#)





**The New York Times**

“...a scary website that seems to be exploiting the low-price allure of all-pay auctions.”



**The New York Times**

“...a scary website that seems to be exploiting the low-price allure of all-pay auctions.”

**The New York Times**

“...devilish...”



**The New York Times**

“...a scary website that seems to be exploiting the low-price allure of all-pay auctions.”

**The New York Times**

“...devilish...”

**msn** money

“The crack cocaine of online auction websites.”



# Previous work predicts *profit-free equilibria*

[Augenblick '09, Platt et al. '09, Hinnosaar '09]

Some of this prior work  
tries to explain the profit  
using risk-loving preferences  
and sunk cost fallacies



# Previous work predicts *profit-free equilibria*

[Augenblick '09, Platt et al. '09, Hinnosaar '09]

## OUTCOMES dataset

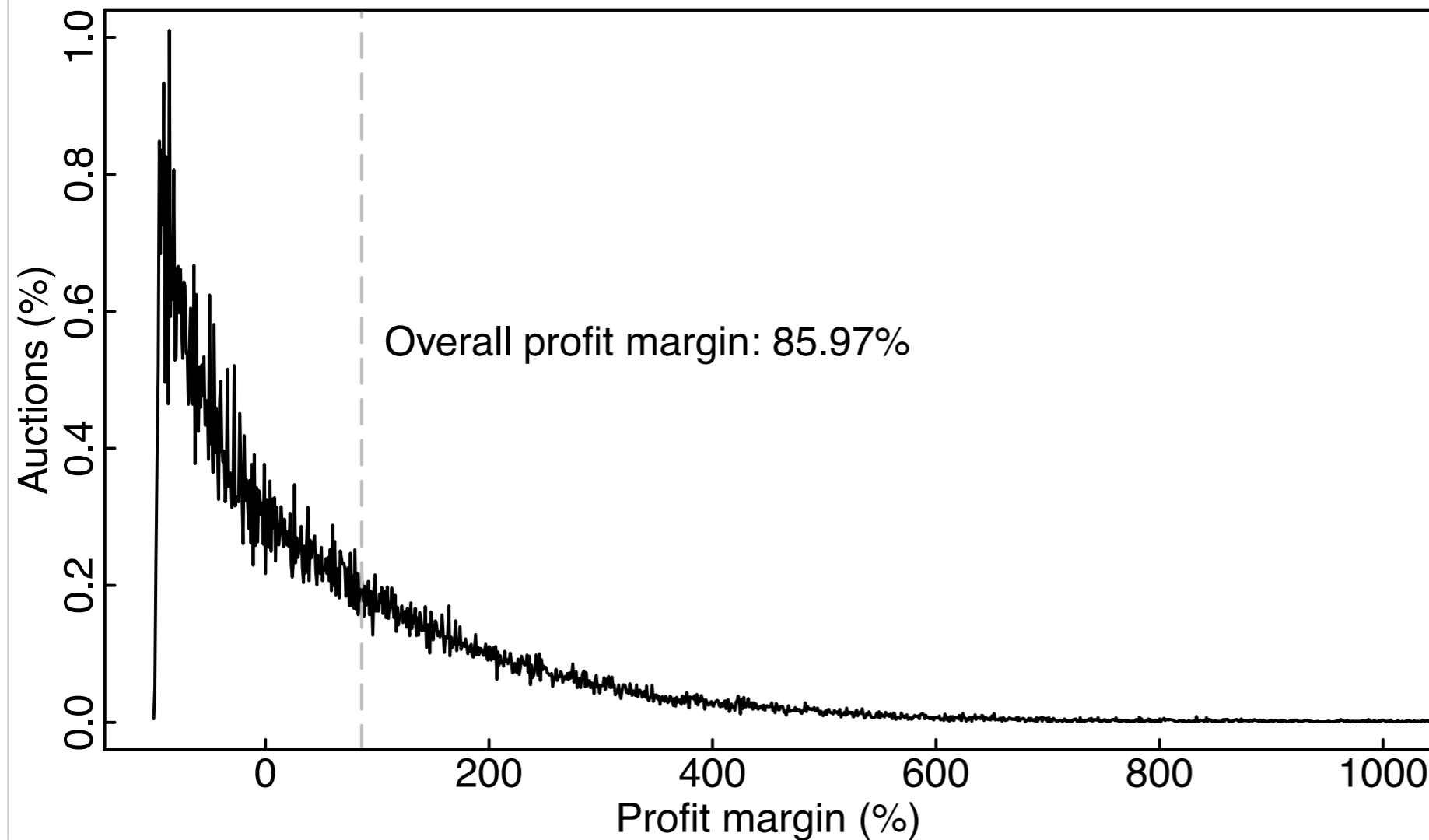
(121,419 auctions)

- Total number of bids
- Bid fee
- Price increment
- Retail price
- Winner



# Previous work predicts *profit-free equilibria*

[Augenblick '09, Platt et al. '09, Hinnosaar '09]

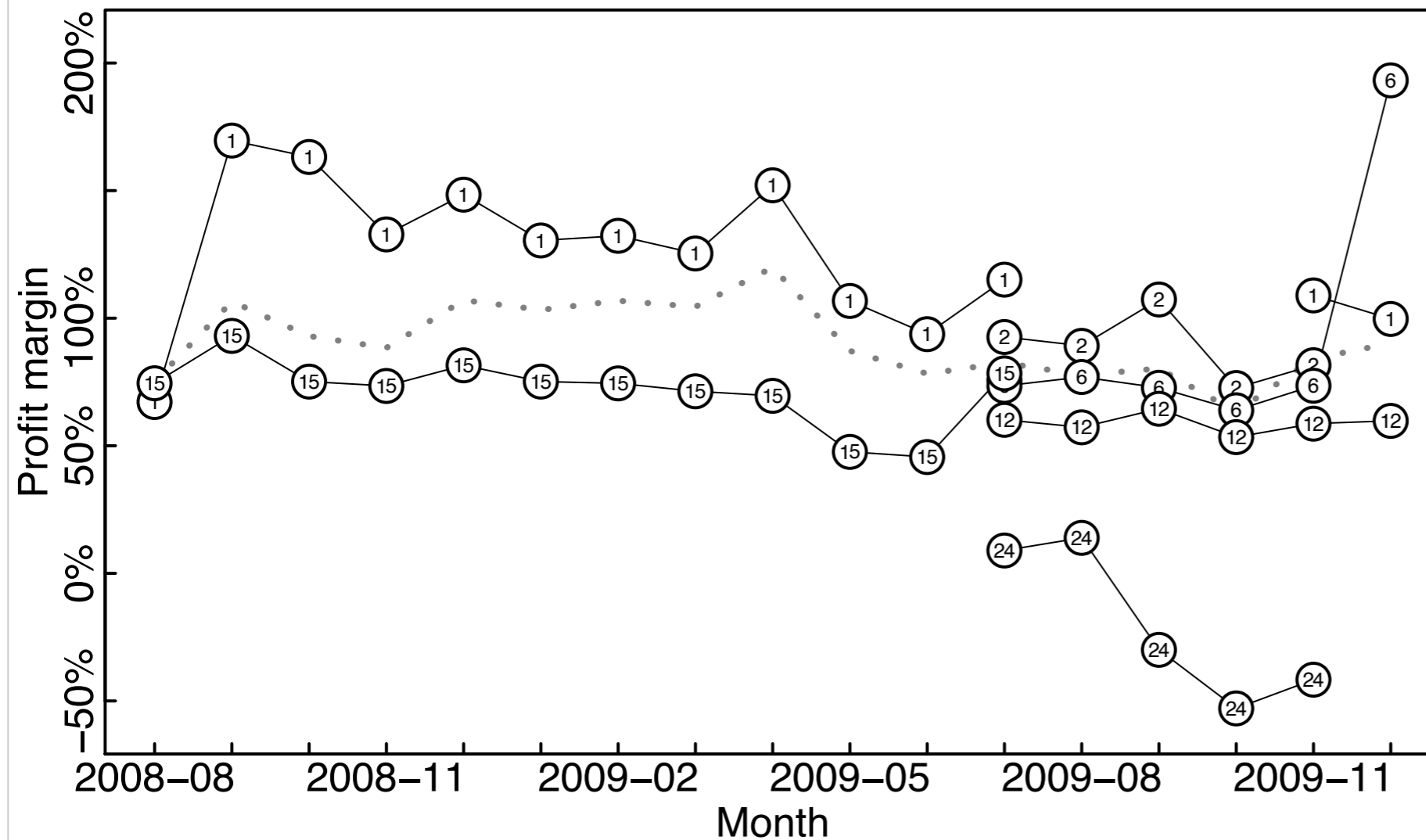


From OUTCOMES dataset



# Previous work predicts *profit-free equilibria*

[Augenblick '09, Platt et al. '09, Hinnosaar '09]



## Basic symmetric pay-per-bid model

- $n$ , number of players
- $b$ , bid cost (60 cents for Swoopo)
- $v$ , value of the auctioned item (\$10s to \$1,000s)

### Fixed-price auctions

- $p$ , fixed purchase price (usually \$0)
- last bidder acquires item for price  $p$

### Ascending-price auctions

- $s$ , price increment (between 1 and 24 cents/bid)
- last bidder acquires item for  $sq$ 
  - where  $q$  number of bids

**Predicts zero profit!**



# Symmetric equilibrium for fixed-price auctions

**Indifference condition:** A player's expected profit per bid should be zero.

$\mu$ , probability that somebody places a subsequent bid

$$b = (v - p)(1 - \mu)$$



$$\mu = 1 - \frac{b}{v - p}$$

$\beta$ , probability that an individual player places a subsequent bid

$$1 - \mu = (1 - \beta)^{n-1}$$



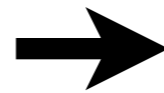
$$\beta = 1 - \left( \frac{b}{v - p} \right)^{\frac{1}{n-1}}$$

# Symmetric equilibrium for ascending-price auctions

**Indifference condition:** The player making the  $(q+1)$ st bid is betting  $b$  no future player will bid

$\mu_{q+1}$ , probability that somebody places the  $(q+1)$ st bid

$$b = (v - sq)(1 - \mu_{q+1})$$



$$\mu_{q+1} = 1 - \frac{b}{v - sq}$$

$\beta_{q+1}$ , probability that a player bids after  $q$  bids have been placed

$$1 - \mu_{q+1} = (1 - \beta_{q+1})^{n-1}$$

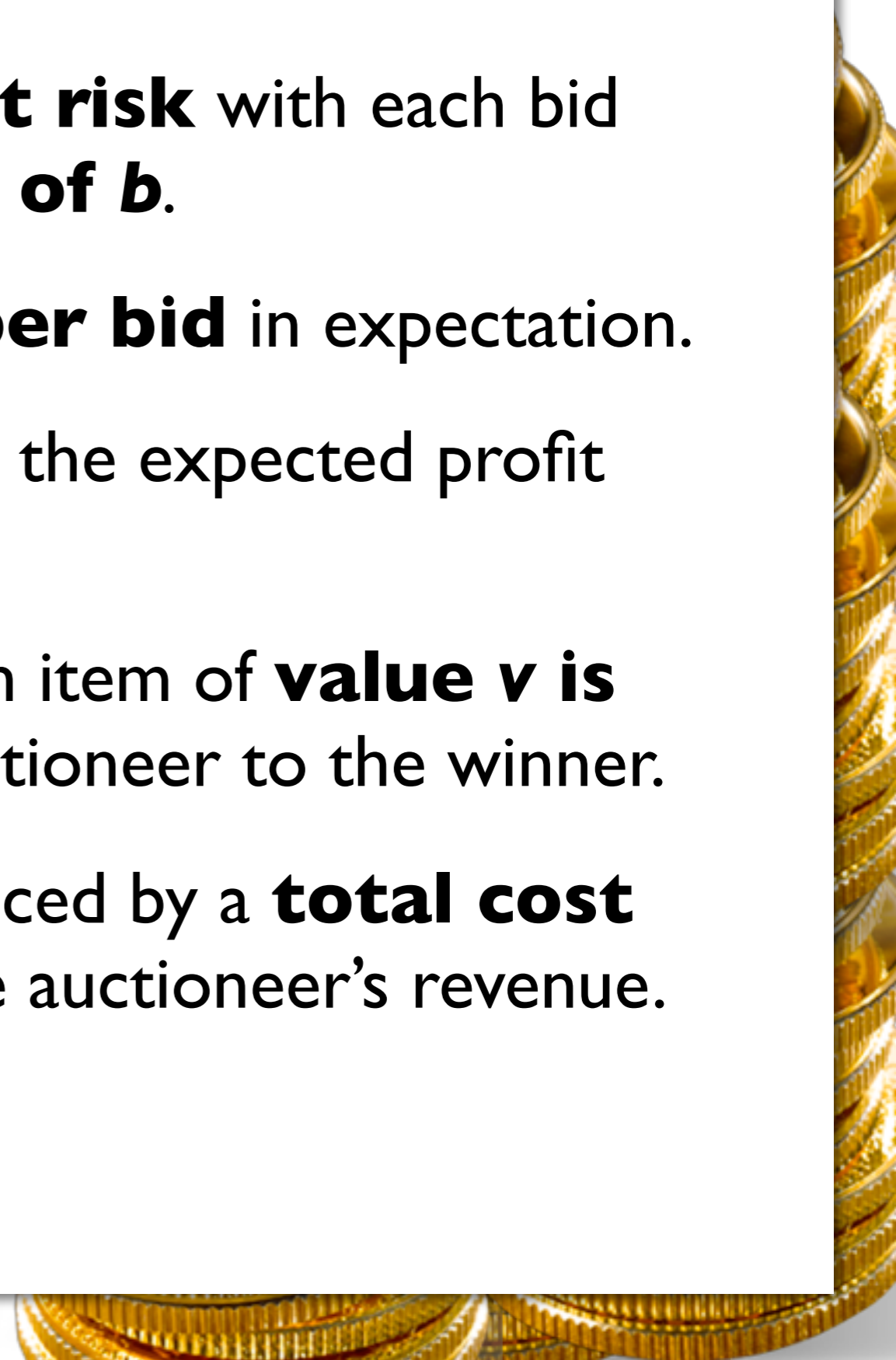


$$\beta_{q+1} = 1 - \left( \frac{b}{v - sq} \right)^{\frac{1}{n-1}}$$

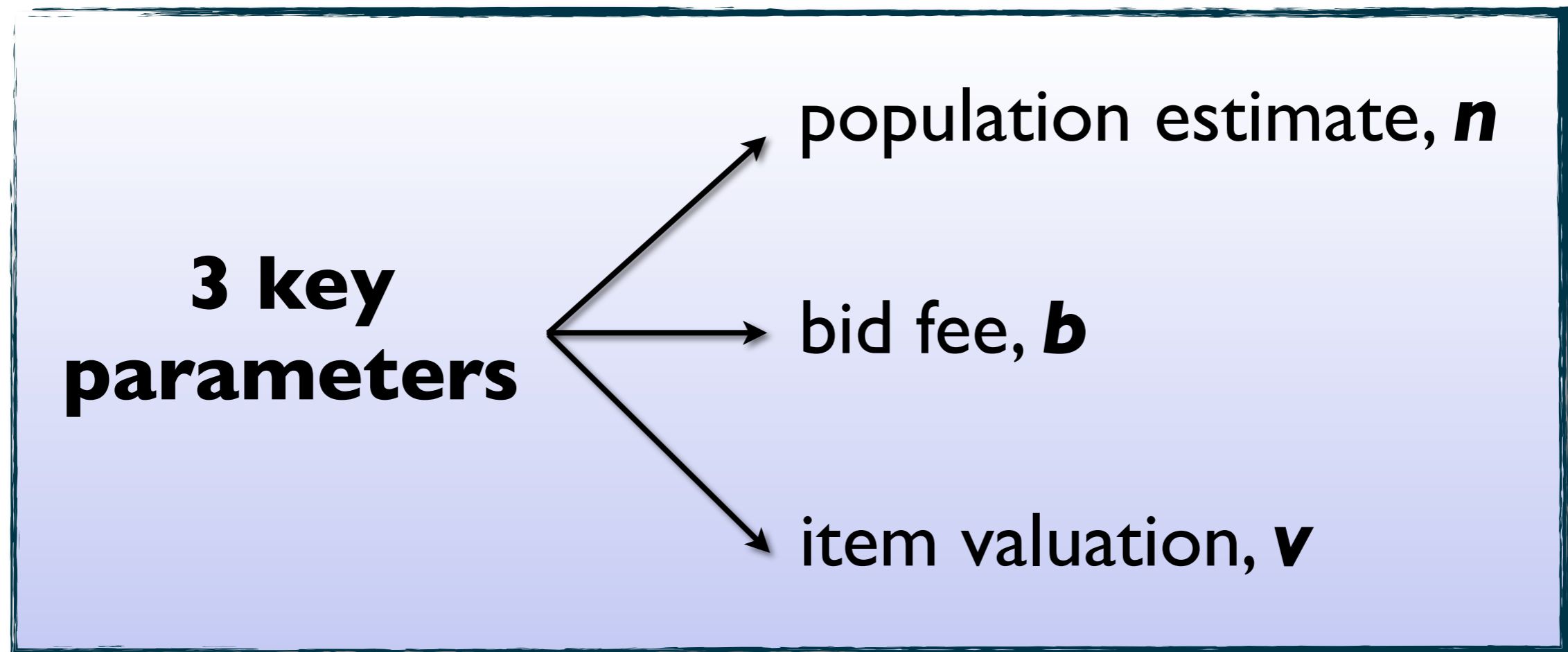
Time varying

## Expected revenue in equilibrium is $v$

- A player puts a value of  **$b$  at risk** with each bid for an **expected reward of  $b$** .
- This implies **zero profit per bid** in expectation.
- Since players are symmetric the expected profit across all bids is also zero.
- At the end of the auction an item of **value  $v$  is transferred** from the auctioneer to the winner.
- This has to be counterbalanced by a **total cost of  $v$**  in bid fees which is the auctioneer's revenue.



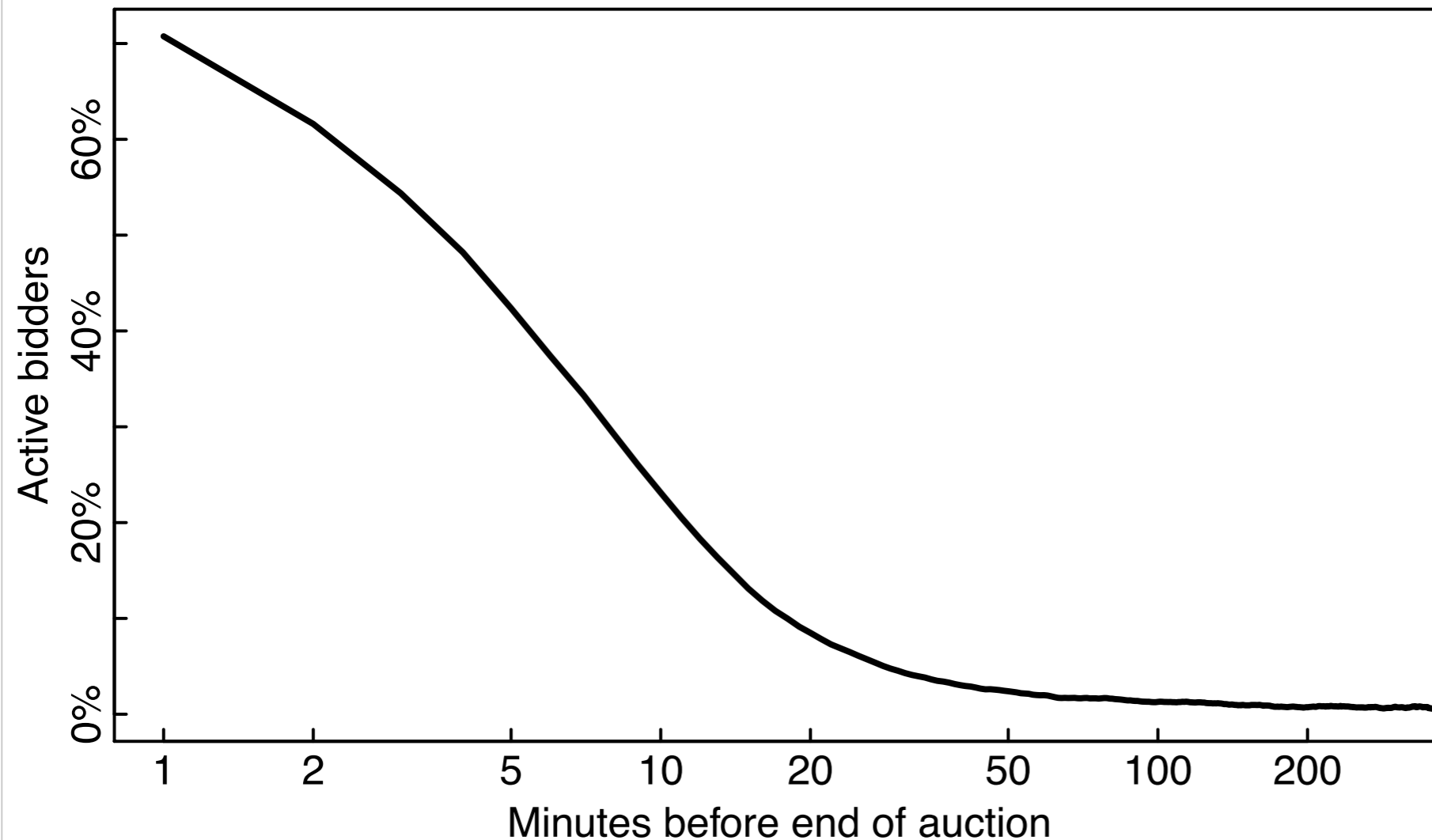
# Our contribution: Asymmetric players



- 1) What if these parameters vary from player to player?
- 2) What if some players aren't aware that they vary?

# Mistaken population estimates for fixed-price auctions

*Not just a theoretical concern:*  
Swoopo displays the list of bidders active  
in the last 15 minutes.



# Mistaken population estimates for fixed-price auctions

## TRACE dataset

(4,328 auctions)

- Time and user of each bid
- Plus all attributes of OUTCOMES dataset



# Mistaken population estimates for fixed-price auctions

**Thought experiment:** True number of players is  $n$  but everyone thinks there are  $n-k$  players

$$b = (v - p)(1 - \lambda) \Rightarrow \lambda = 1 - \frac{b}{v - p}$$

where  $\lambda$  is the **perceived probability** someone places a subsequent bid

## Mistaken players

$$\beta = 1 - (1 - \lambda)^{\frac{1}{n-k-1}}$$

$$\mu = 1 - \left( \frac{b}{v - p} \right)^{\frac{n-1}{n-k-1}}$$

## Omniscient players

$$\beta = 1 - (1 - \mu)^{\frac{1}{n-1}}$$

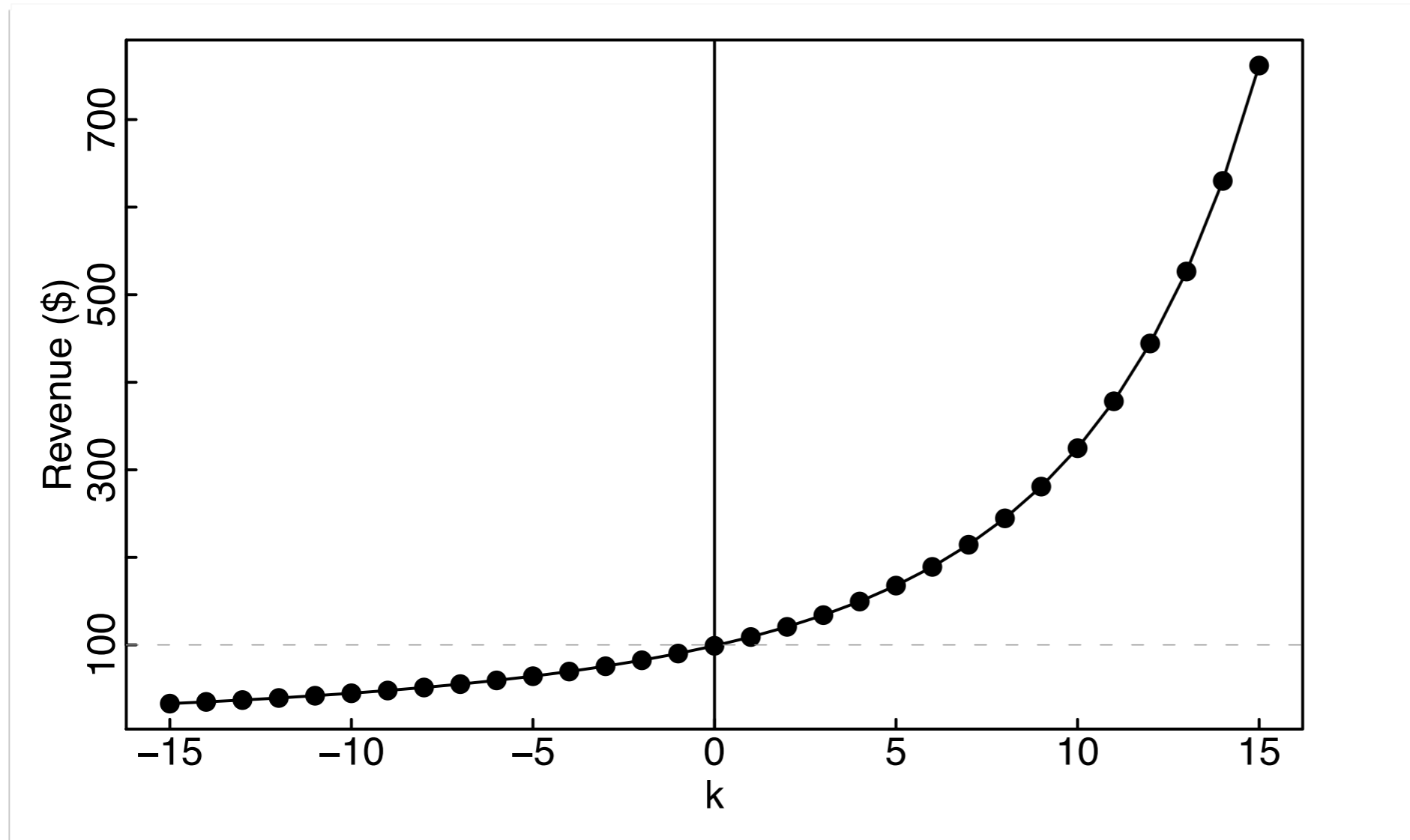
$$\mu = 1 - \frac{b}{v - p}$$

Reminder:  $\beta$  pr. one player bids,  $\mu$  pr. some player bids

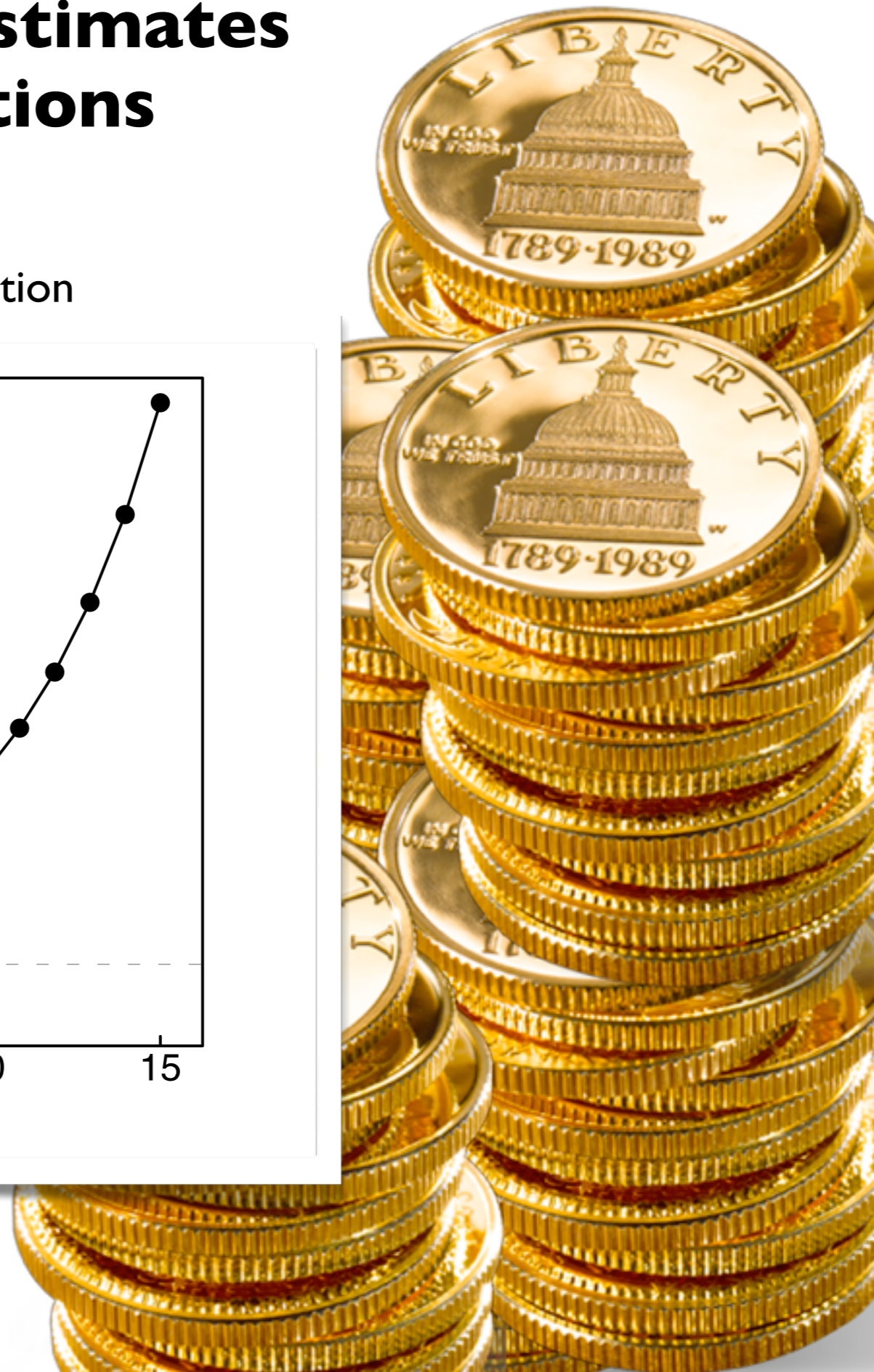
# Mistaken population estimates for fixed-price auctions

Overestimation

Underestimation



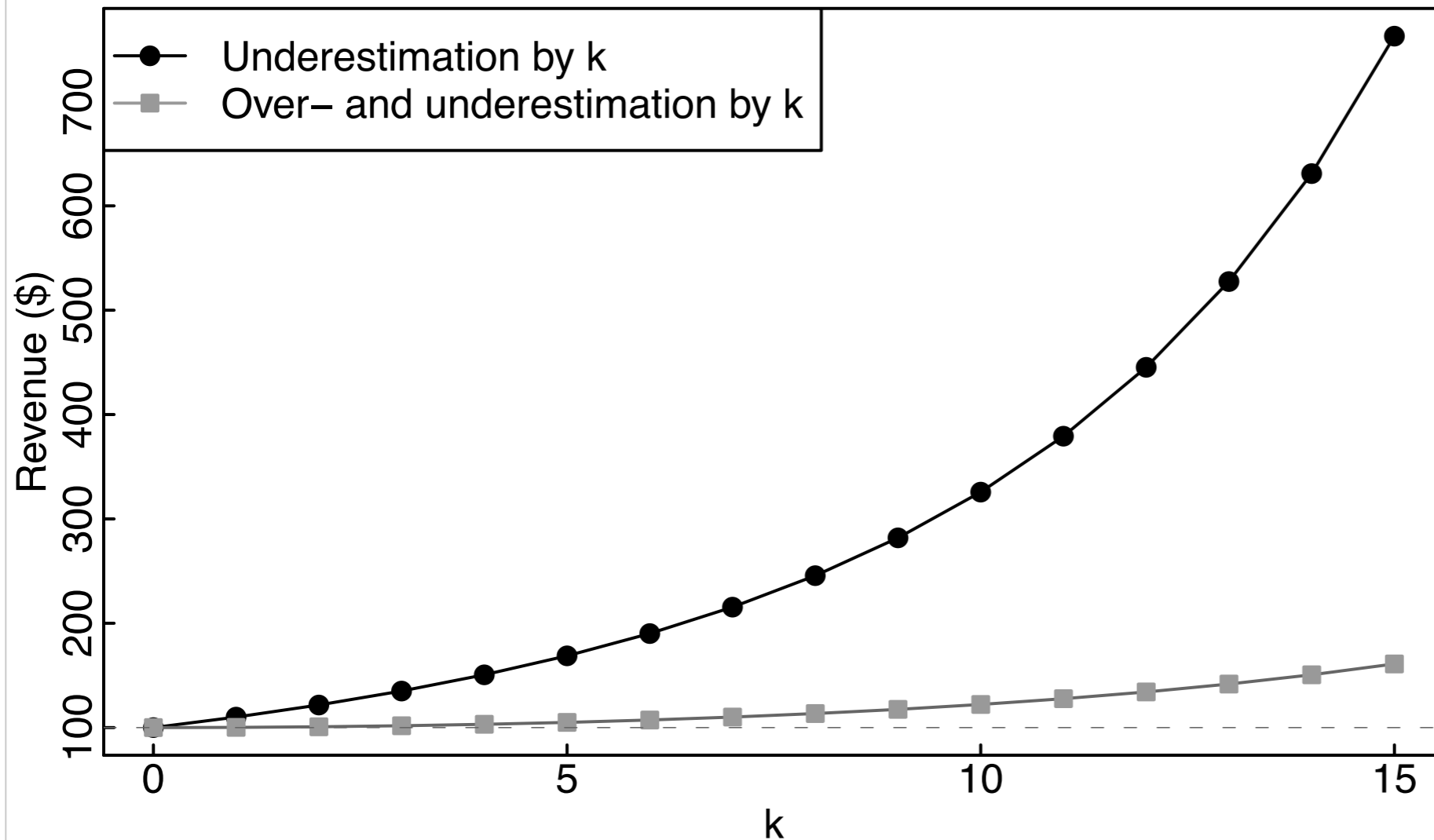
$$n = 50, v = 100, b = 1$$





# Mistaken population estimates for fixed-price auctions

Over and underestimation in equal  
measures: **Swoopo still profits**



$$n = 50, v = 100, b = 1$$



## Mistaken population estimates for fixed-price auctions

- Underestimates of the number of players **increase** Swoopo's profit.
- Overestimates of the number of players **decrease** Swoopo's profit.
- **But not symmetrically!**
- Mixtures of over/underestimates with the right mean will **increase Swoopo's profit!**

# Modeling general asymmetries

Two groups of players, A & B

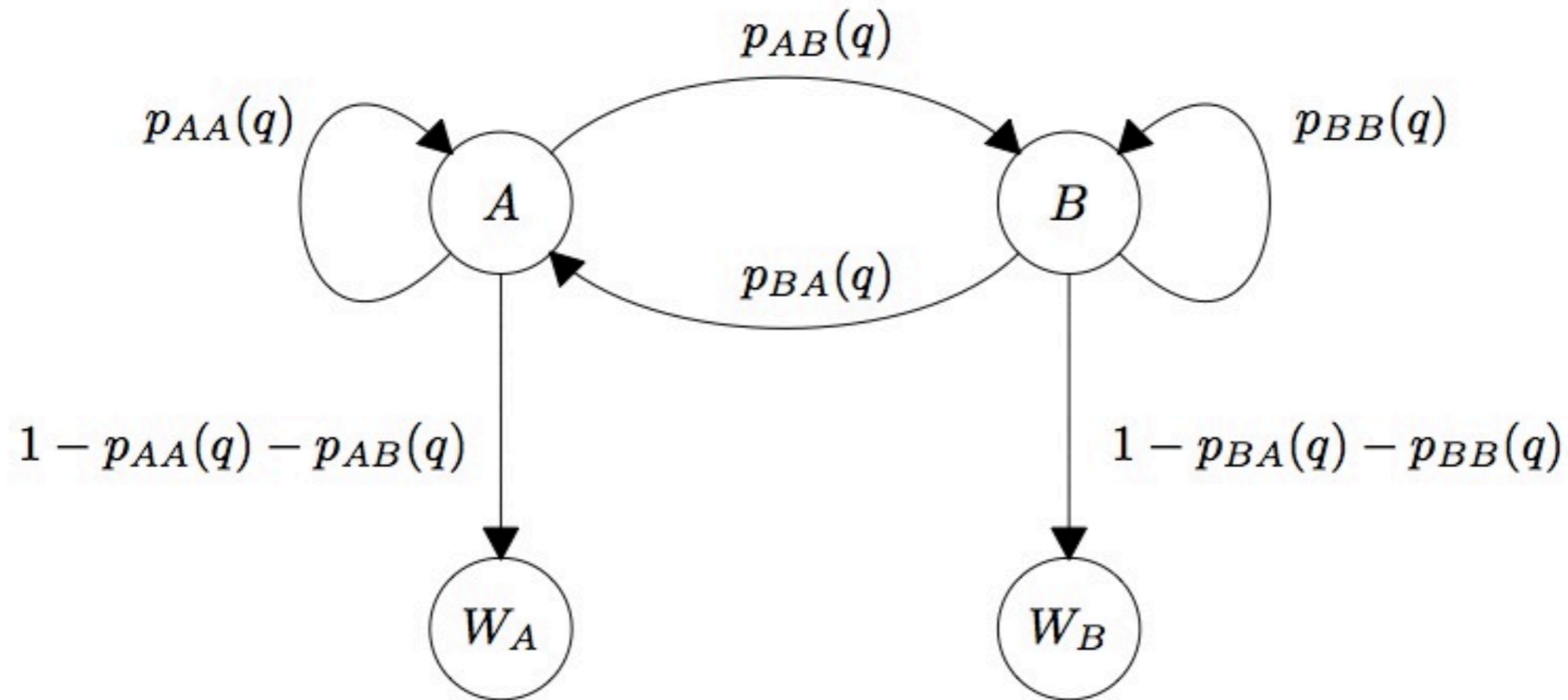
## Group A

- size  $k$
- bid  $b^A$
- value  $v^A$
- population estimate  $n^A$
- aware of B

## Group B

- size  $n-k$
- bid  $b^B$
- value  $v^B$
- population estimate  $n^B$
- unaware of A

# A Markov chain for modeling general asymmetries

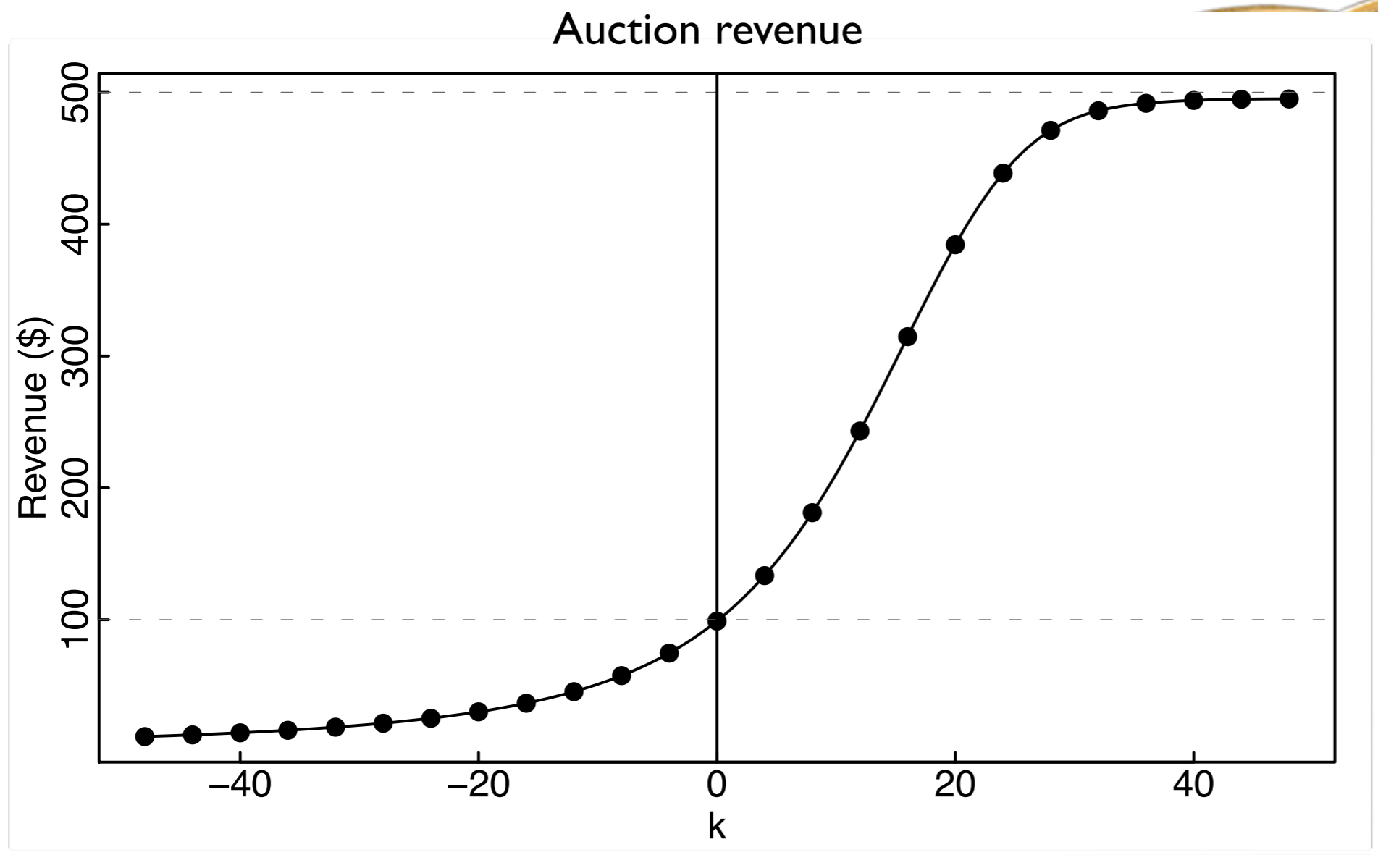


$$P_A(q+1) = P_A(q)p_{AA}(q) + P_B(q)p_{BA}(q)$$

$$P_{W_A}(q+1) = P_A(q)p_{AW_A}(q) + P_{W_A}(q)$$

# Mistaken population estimates for ascending-price auctions

Trivial upper bound:  $(Q + 1)(b + s)$



$n = 50, v = 100, b = 1, s = 0.25$



# Asymmetries in bid fees



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Auctions

## Vouchers

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Live auctions

IMAGE	DESCRIPTION	PRICE	BIDDER	COUNTDOWN
 ZOOM 	<b>300 Bids Voucher</b> Give your account a boost with 300 extra Bids! Use them wisely and you could bag yourself a top bargain on Swoopo. more ... <input checked="" type="checkbox"/> Penny auction	<b>\$0.06</b> (instead of \$180.00)	Perse	<b>00:15:28</b> <a href="#">BID</a>
 ZOOM 	<b>50 Bids Voucher</b> Don't miss out on the next great Swoopo deal. Grab an extra 50 bids to help you on your way. more ... <input checked="" type="checkbox"/> Penny auction	<b>\$0.01</b> (instead of \$30.00)	Mdobby2010	<b>00:45:28</b> <a href="#">BID</a>
 ZOOM 	<b>50 Bids Voucher</b> Don't miss out on the next great Swoopo deal. Grab an extra 50 bids to help you on your way. more ... <input checked="" type="checkbox"/> NailBiter auction <input checked="" type="checkbox"/> Penny auction	<b>\$0.01</b> (instead of \$30.00)	Maguyco	<b>01:45:28</b> <a href="#">BID</a>

# Asymmetries in bid fees



**Our Christmas Gift to You**

**Get a 15% FreeBids Bonus with the purchase**

**VERY LIMITED OFFER**

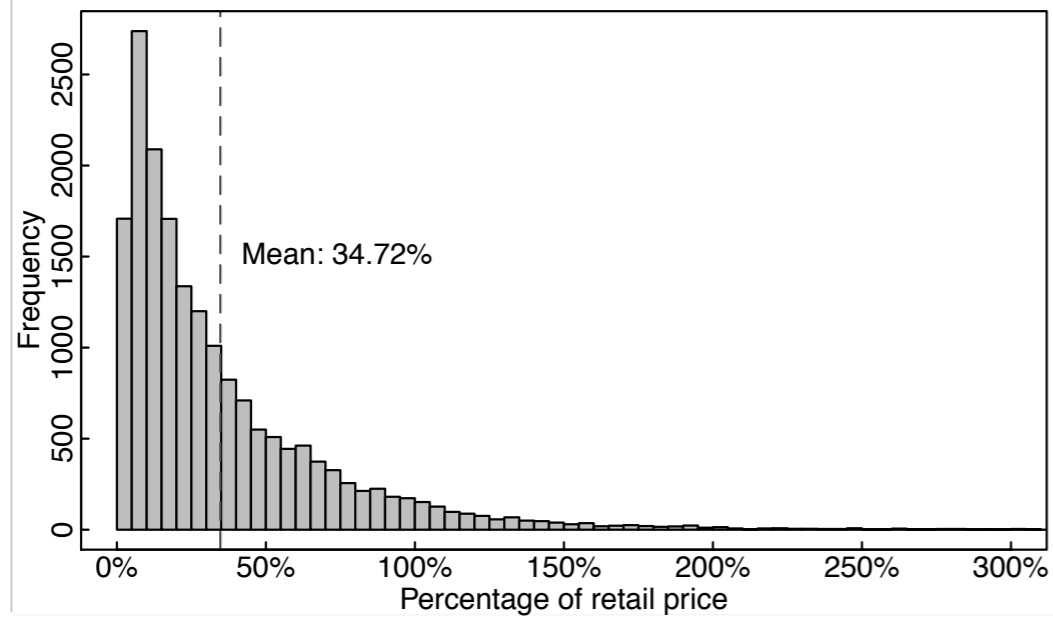
This Offer expires on 12/25/09 midnight PST. [Learn more](#)



Entertainment Shopping Inc. 191 Castro Street, Ste. 200  
Mountain View, CA 94041

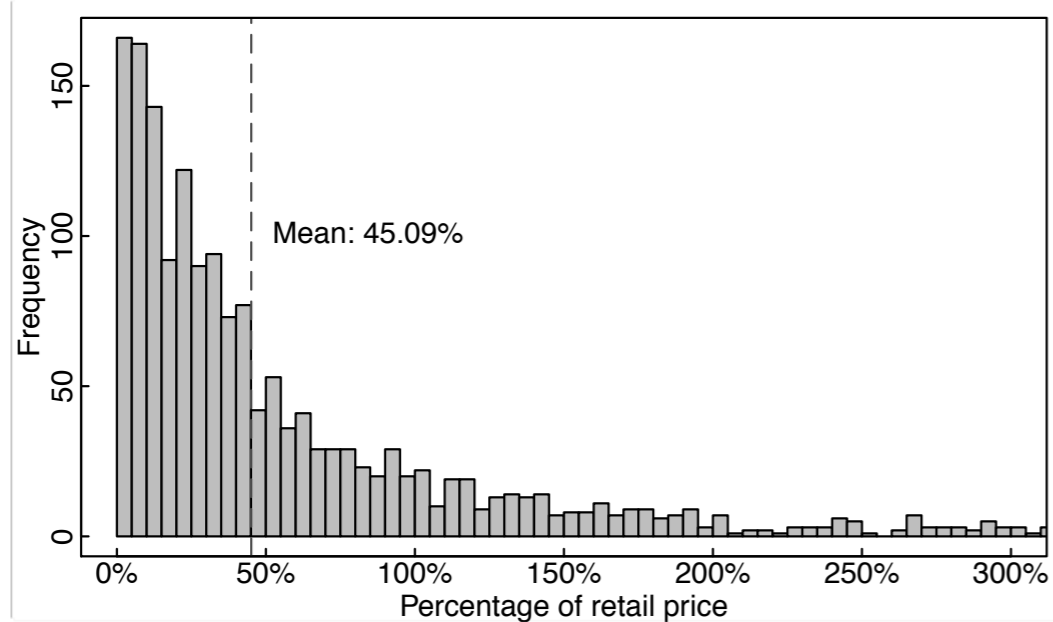
[Unsubscribe](#)

# Asymmetries in bid fees



**65%**

winners' discount



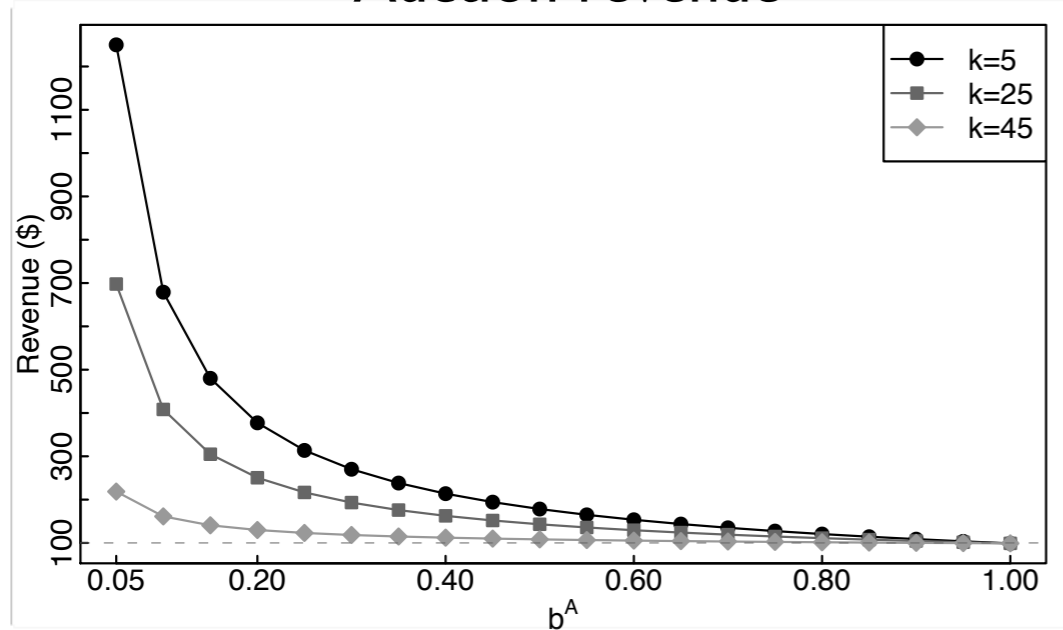
**55%**

winners' discount accounting for  
previously lost auctions



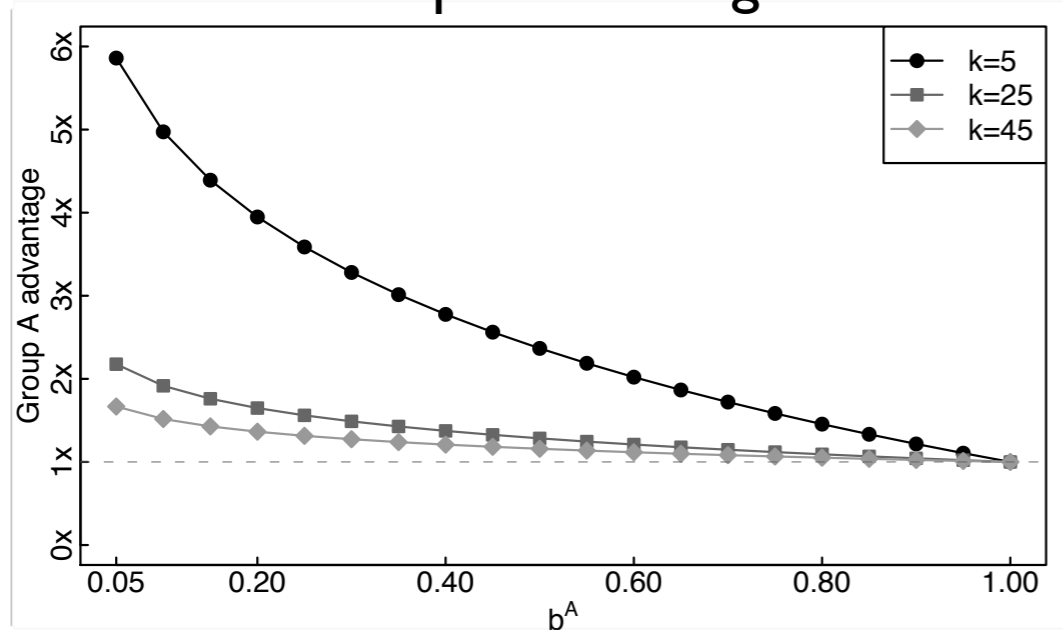
# Asymmetries in bid fees for fixed-price auctions

Auction revenue



- Group A of size  $k$  has a discounted bid and they know it.
- Group B of size  $n-k$  think everyone is paying  $b$ .

Group A advantage

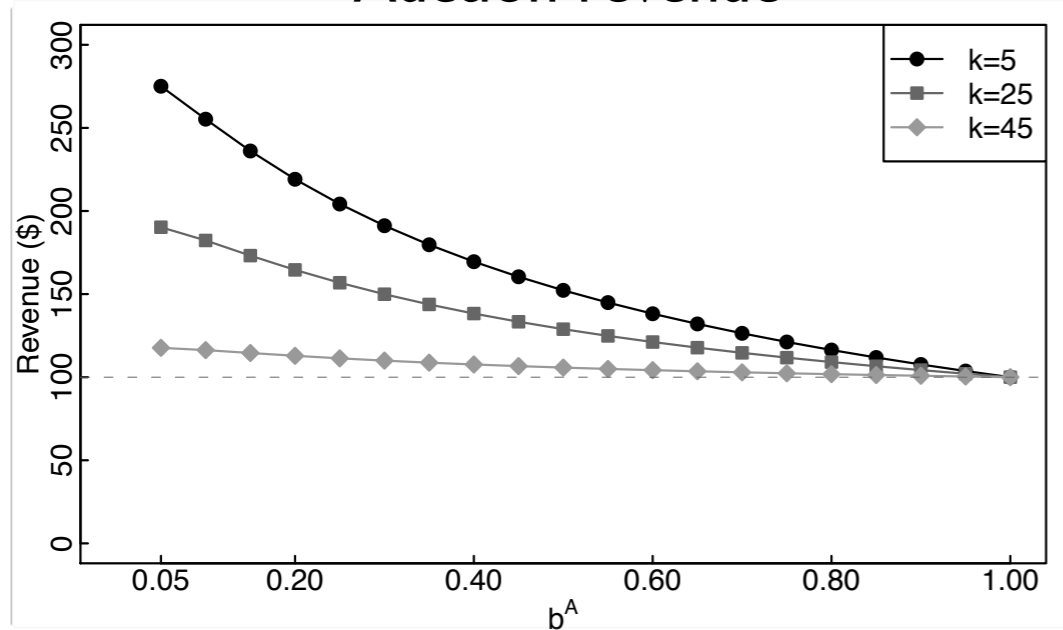


$$n = 50, v = 100, b^B = 1$$

**Synergy!**

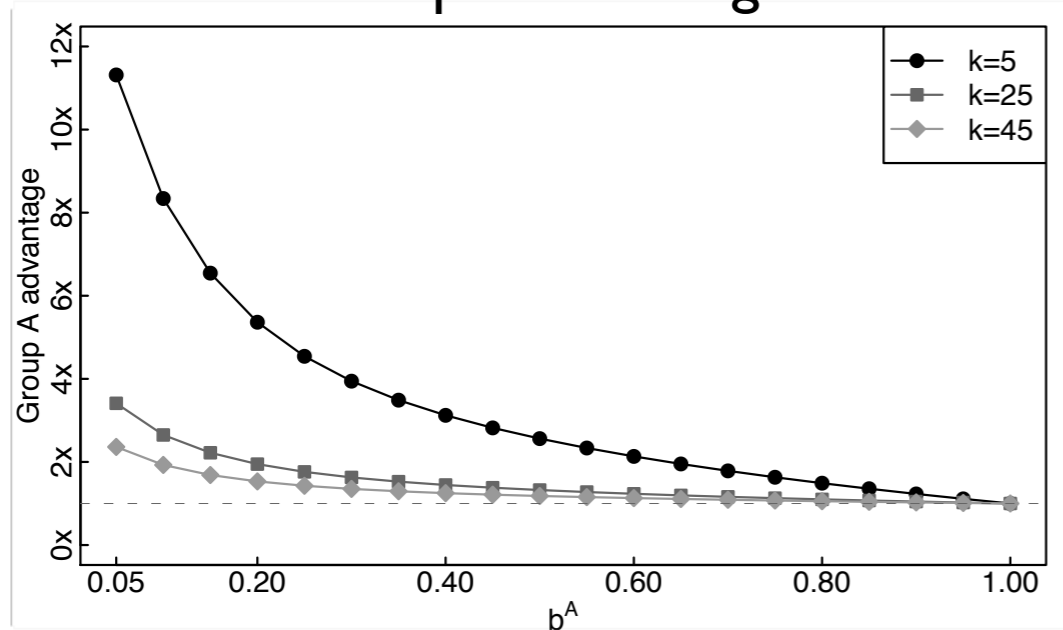
# Asymmetries in bid fees for ascending-price auctions

Auction revenue



- Group A of size  $k$  has a discounted bid and they know it.
- Group B of size  $n-k$  think everyone is paying  $b$ .

Group A advantage



$$n = 50, v = 100, b^B = 1, s = 0.25$$

# Varying object valuations

Auction ID: 261695

[Add auction to watchlist](#)

Sony Bravia KDL-40XBR9 40" 1080p 240Hz LCD TV *NEW ON SWOOP*



Experience powerful performance and superior design with the premium Sony BRAVIA XBR9 HDTV



Recently sold for \$32.23



NO IMAGE AVAILABLE

NO IMAGE AVAILABLE

NO IMAGE AVAILABLE

Click on an image to enlarge it

[>> Product details](#)

Auction Price:

**\$33.03**

All prices are in US Dollars

Bidder:

**Udonator**



**00:05:39**

**BID**

Each bid raises the auction price by \$0.01.

Worth up to: \$1,599.00

Auction Price: \$33.03

Savings: **\$1,565.97**

BIDDING HISTORY

Statistics

Bidders in the last 15 minutes: **15**

\$33.03	Udonator	Single bid
\$33.02	Prince1109	Single bid
\$33.01	Kranman052	Single bid
\$33.00	Mrr17	BidButler
\$32.99	Caferico	BidButler
\$32.98	Mrr17	BidButler
\$32.97	Caferico	BidButler
\$32.96	Mrr17	BidButler
\$32.95	Caferico	BidButler



**"Can you say excited?  
I told a couple of close  
friends immediately ..."**

Marvin W. - Wake, NC

**REGISTER**

Buy this product now:

Worth up to: **\$1,599.00**

Bid Rebate: **-\$0.00**

Purchase price: **\$1,599.00**

All prices are in US Dollars

**BUY**



**Swoop it Now**

Now you can buy this  
item at the discounted  
price. Bid to win.  
Bid to save.

Notice that you get a discount equal to  
the amount of bids you've placed.

[>> more info](#)

# Varying object valuations

Auktionsnummer: 261695

[Auktion in Mein Swoopo beobachten](#)

**Sony KDL-40Z5500** NEU BEI SWOPO



Scharfe Bilder, fließende Bewegungen und ein attraktives Design. Sony LCD-TV KDL-40Z5500 mit 40 Zoll (102cm) Bilddiagonale, Motionflow 200Hz, 1920 x 1080 Pixel Full HD Auflösung, 4x HDMI, 2x SCART, DLNA Ethernet, USB 2.0 und DVB-T/-C-Tuner.



Auktionspreis:

**33,03 €**

inkl. MwSt, zzgl. Versandkosten

Bleter:

**Udonator**

10 **00:05:29**

**BIETEN**

Jedes Bid erhöht den Auktionspreis um 0,01 €.

Vergleichspreis\*: 1.348,95 €

Auktionspreis: 33,03 €

Ersparnis: **1.315,92 €**

GEBOTS-HISTORIE

Statistik

Bietler in den letzten 15 Minuten: **14**

Preis	Bietlername	Typ
33,03 €	Udonator	Einzelgebot
33,02 €	Prince1109	Einzelgebot
33,01 €	Kranman052	Einzelgebot
33,00 €	Mrr17	BietButler
32,99 €	Caferico	BietButler
32,98 €	Mrr17	BietButler
32,97 €	Caferico	BietButler
32,96 €	Mrr17	BietButler
32,95 €	Caferico	BietButler



"... zum richtigen Zeitpunkt geklickt und schon war es meins."

Magdalene M. - Dortmund

**ANMELDEN**

**Produkt direkt kaufen:**

Vergleichspreis\*: 1.348,95 €

Bid Rabatt: -0,00 €

**Kaufpreis: 1.348,95 €**

inkl. MwSt, zzgl. Versandkosten

**KAUFEN**



**Direktkauf**

Jedes eigene Bid reduziert Ihren persönlichen Kaufpreis.

**Der Direktkauf beendet die Auktion nicht!**

[>> Mehr zum Direktkauf](#)



KEIN BILD VERFÜGBAR

KEIN BILD VERFÜGBAR

Klicken Sie auf das jeweilige Bild für eine Großdarstellung

[>> Produktbeschreibung](#)

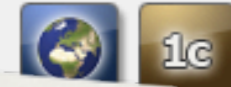
Same auction id...

Auktionsnummer: 261695

Auktion in Mein Swoopo beobachten

Sony KDL-40Z5500 **NEU BEI SWOPO**

Scharfe Bilder, fließende Bewegungen und ein attraktives Design. Sony LCD-TV KDL-40Z5500 mit 40 Zoll (102cm) Bilddiagonale, Full HD Auflösung, 4x HDMI, 2x SCART, DLNA Ethernet, USB 2.0 und DVB-T/-C-Tuner.



Same players...

Different currency!

**33,03 €**

inkl. MwSt, zzgl. Versandkosten

Bietler:

**Udonator**

**10 00:05:29**

**BIETEN**

Jedes Bid erhöht den Auktionspreis um 0,01 €.

Vergleichspreis\*: 1.348,95 €

Auktionspreis: 33,03 €

Ersparnis: **1.315,92 €**

GEBOTS-HISTORIE

Statistik

Bietler in den letzten 15 Minuten: **14**

33,03 €	Udonator	Einzelgebot
33,02 €	Prince1109	Einzelgebot
33,01 €	Kranman052	Einzelgebot
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32,99 €	Caferico	BietButler
32,98 €	Mrr17	BietButler
32,97 €	Caferico	BietButler
32,96 €	Mrr17	BietButler
32,95 €	Caferico	BietButler



"... zum richtigen Zeitpunkt geklickt und schon war es meins."

Magdalene M. - Dortmund

**ANMELDEN**

Different value!

**Kaufpreis: 1.348,95 €**

inkl. MwSt, zzgl. Versandkosten

**KAUFEN**

**Direktkauf**

Jedes eigene Bid reduziert Ihren persönlichen Kaufpreis.



**Der Direktkauf beendet die Auktion nicht!**

**>> Mehr zum Direktkauf**



KEIN BILD VERFÜGBAR

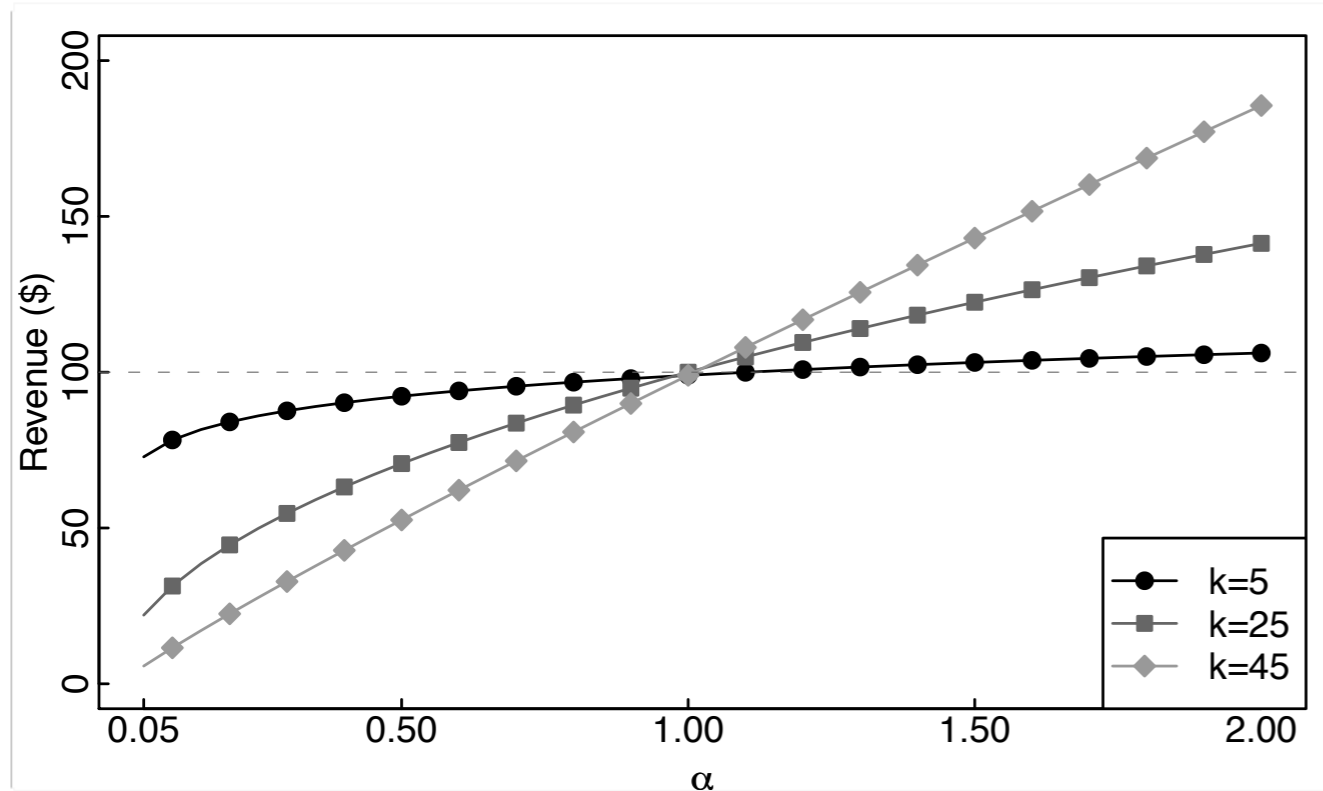
KEIN BILD VERFÜGBAR

Klicken Sie auf das jeweilige Bild für eine Großdarstellung

**>> Produktbeschreibung**

# Varying object valuations for fixed-price auctions

Auction revenue



$$n = 50, v = 100, b^B = 1$$

- Revenue is naturally bounded by maximum valuation
- The more players overestimate the item the better for Swoopo

# Collusion & shill bidding:

The role of hidden information



# Collusion

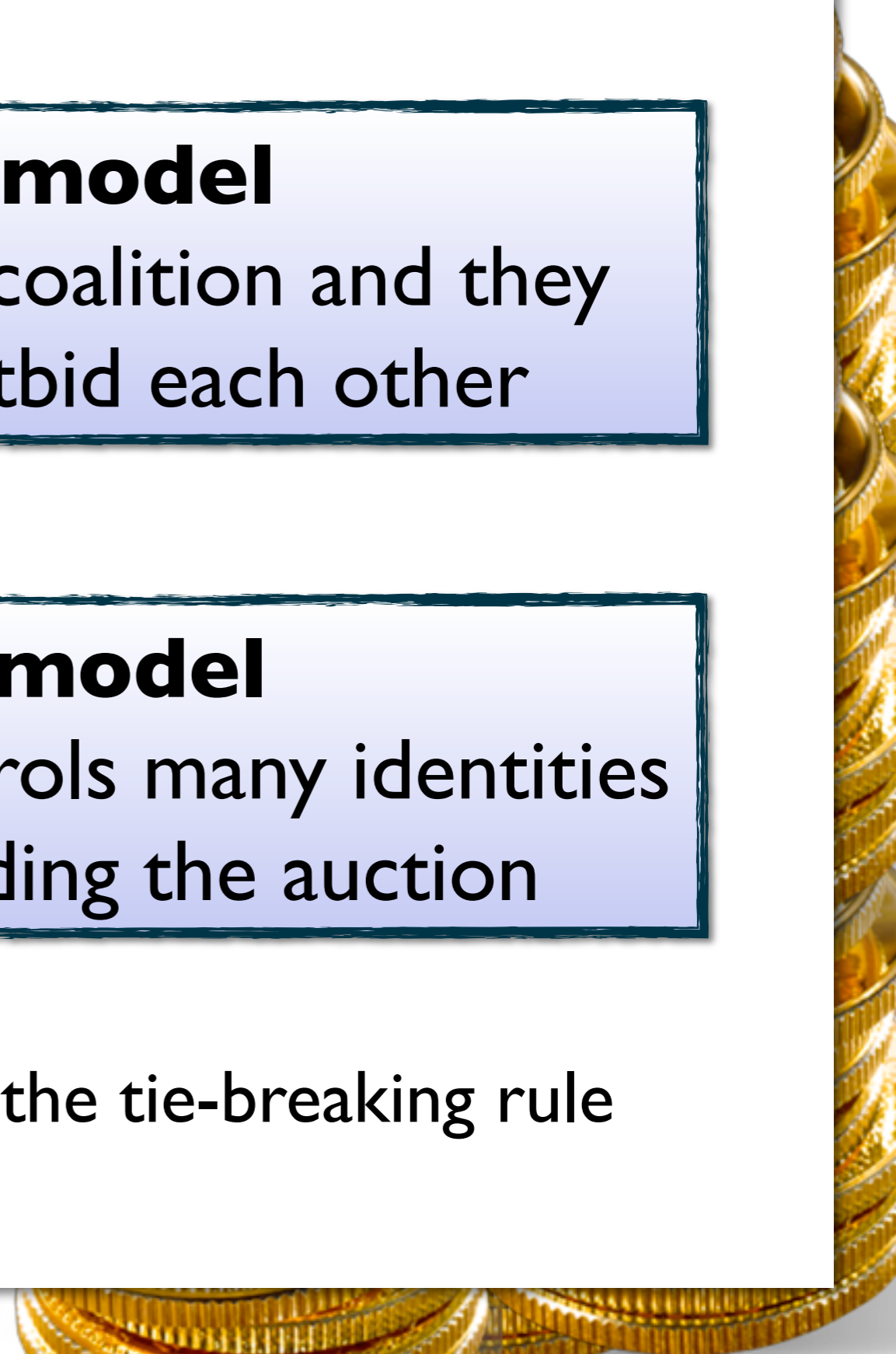
## **Many players model**

A group of players form a coalition and they secretly agree not to outbid each other

## **Single player model**

A single player secretly controls many identities and never bids when leading the auction

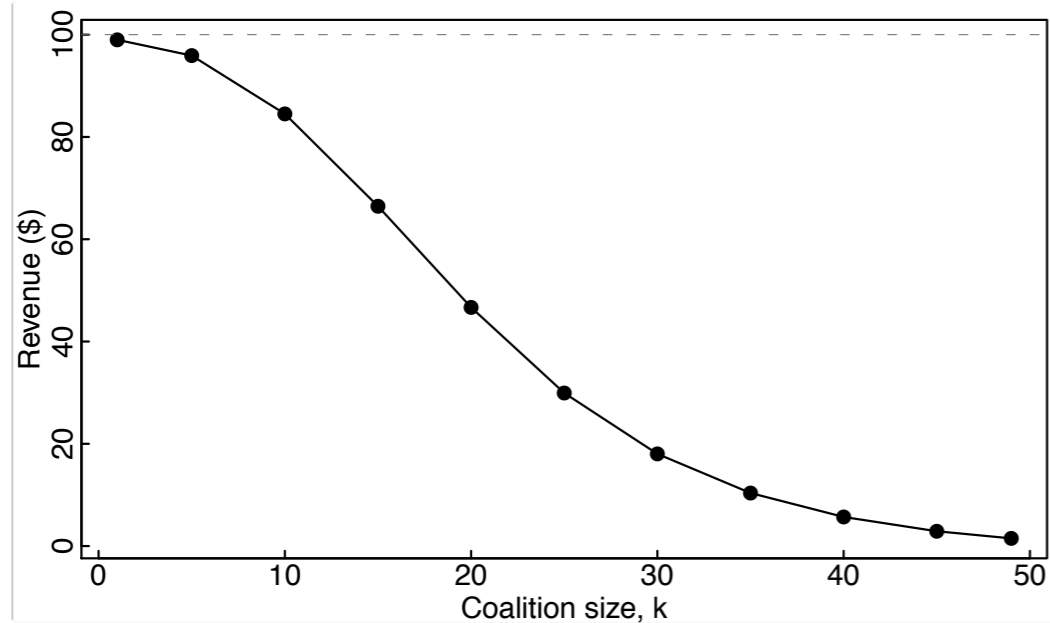
Difference between two models is the tie-breaking rule



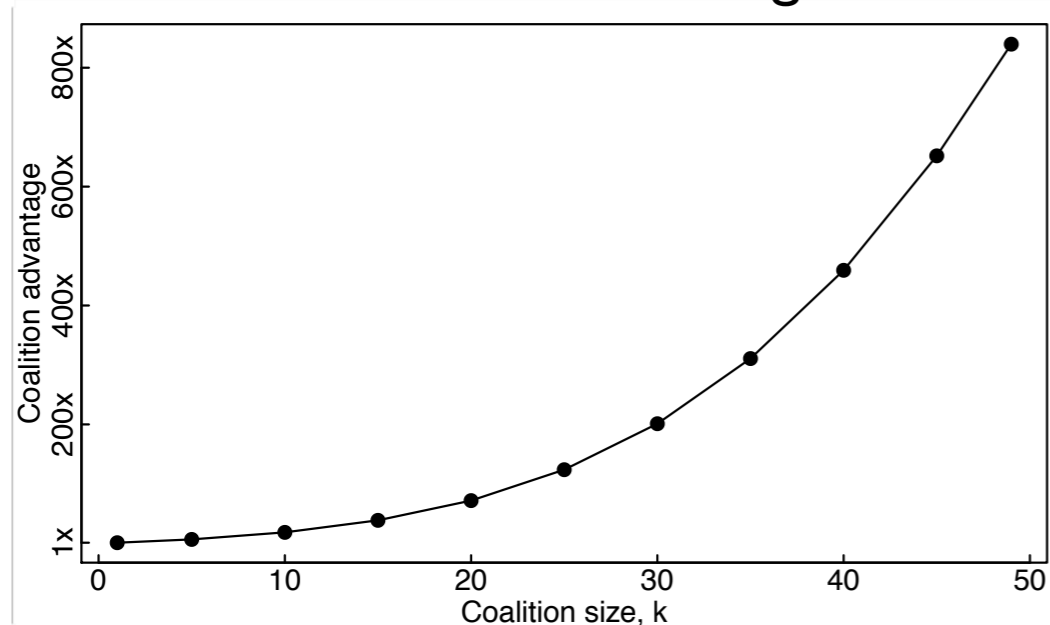


# Collusion: Ascending-price auctions, many-players model

Auction revenue



Coalition advantage

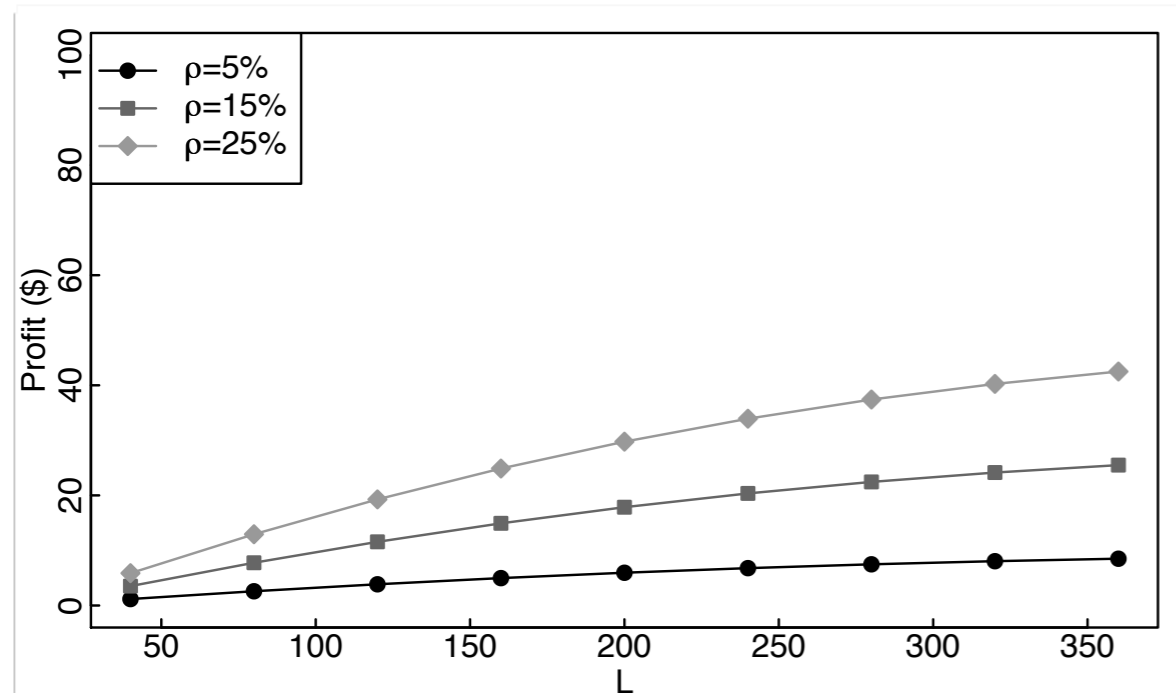


$$n = 50, v = 100, b = 1, s = 0.25$$

- A coalition of size  $k$  is playing against  $n-k$  players
- Swoopo's revenues shrink as the coalition size grows
- The coalition gains an advantage exponential to its size in winning the auction

# Shill bidding: Ascending-price auctions, many-players model

Auction profit




$$n = 50, v = 100, b = 1, s = 0.25$$

- A  $(\rho, L)$ -shill enters the auction with probability  $\rho$  and bids until  $L$  bids have been made
- A shill produces no revenue for the auctioneer
- If the shill wins all revenue is profit (no item is shipped)

# Swoop it Now

Buy the item at a discount equal to your bid fees

A woman with long brown hair, wearing a black top and blue jeans, is smiling and holding a white gift bag with colorful polka dots. She is leaning forward, looking towards the camera.

**Swoop it Now** - Bid to save

**Place a bid to win or cash out and save.**

You will be able to buy the item at a discount equal to the amount of bids you've placed. Now you will never leave empty handed.

The auction will continue as usual, so other bidders can battle it out.

**Committed player:** someone who is willing to bid up to a certain price and then exercise the Swoop it Now option

# Swoop it Now

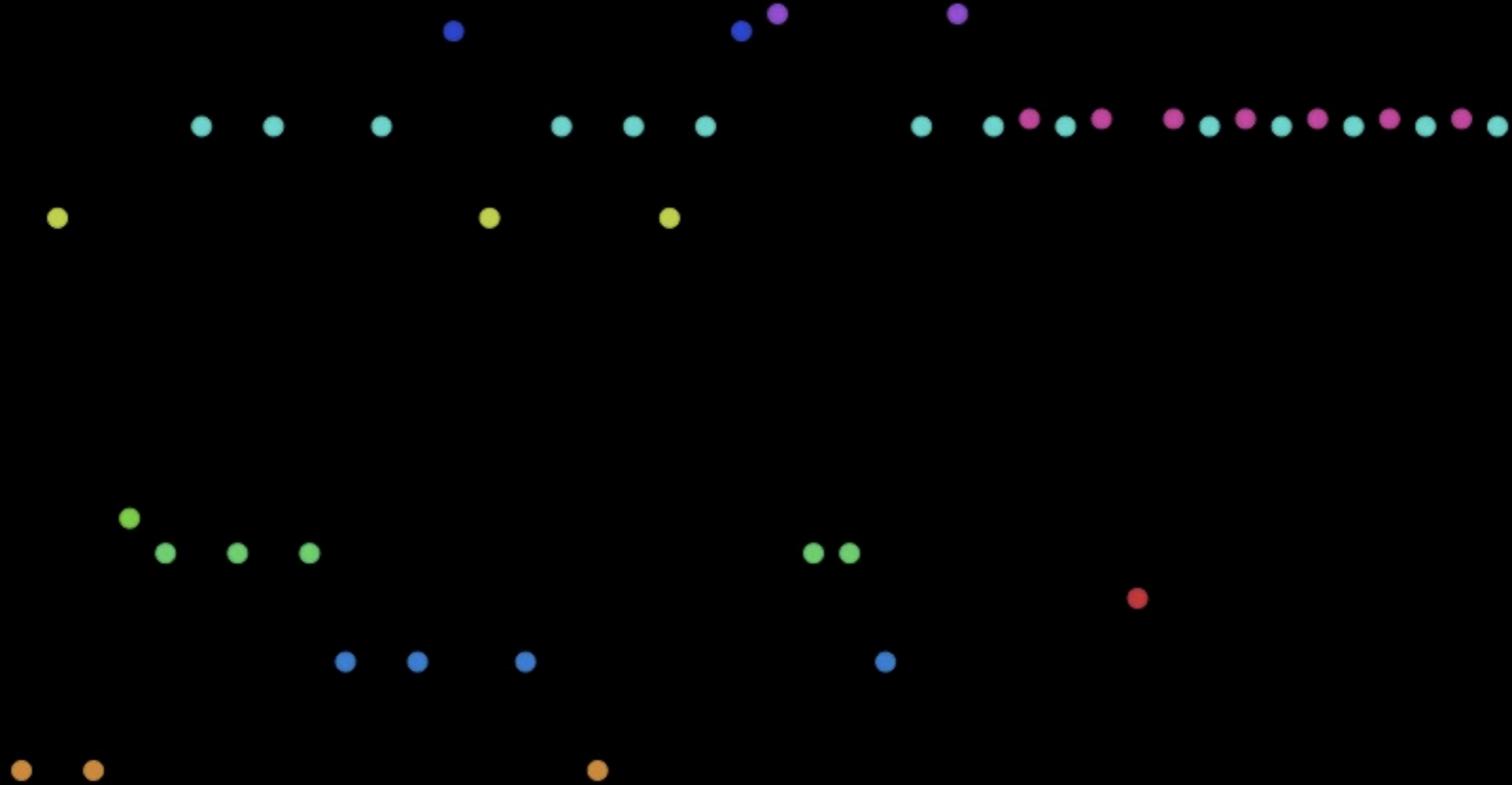
- In the presence of many committed players the resulting game is a **game of chicken**.
- Assuming a common valuation of  $v$  and a retail price of  $r$  the **maximum loss is bounded by  $v-r$** .

	Quit	Play Till End
Quit	Both lose bidding fees	Lose bidding fees/ Get discount
Play Till End	Get discount/ Lose bidding fees	Both lose $v-r$

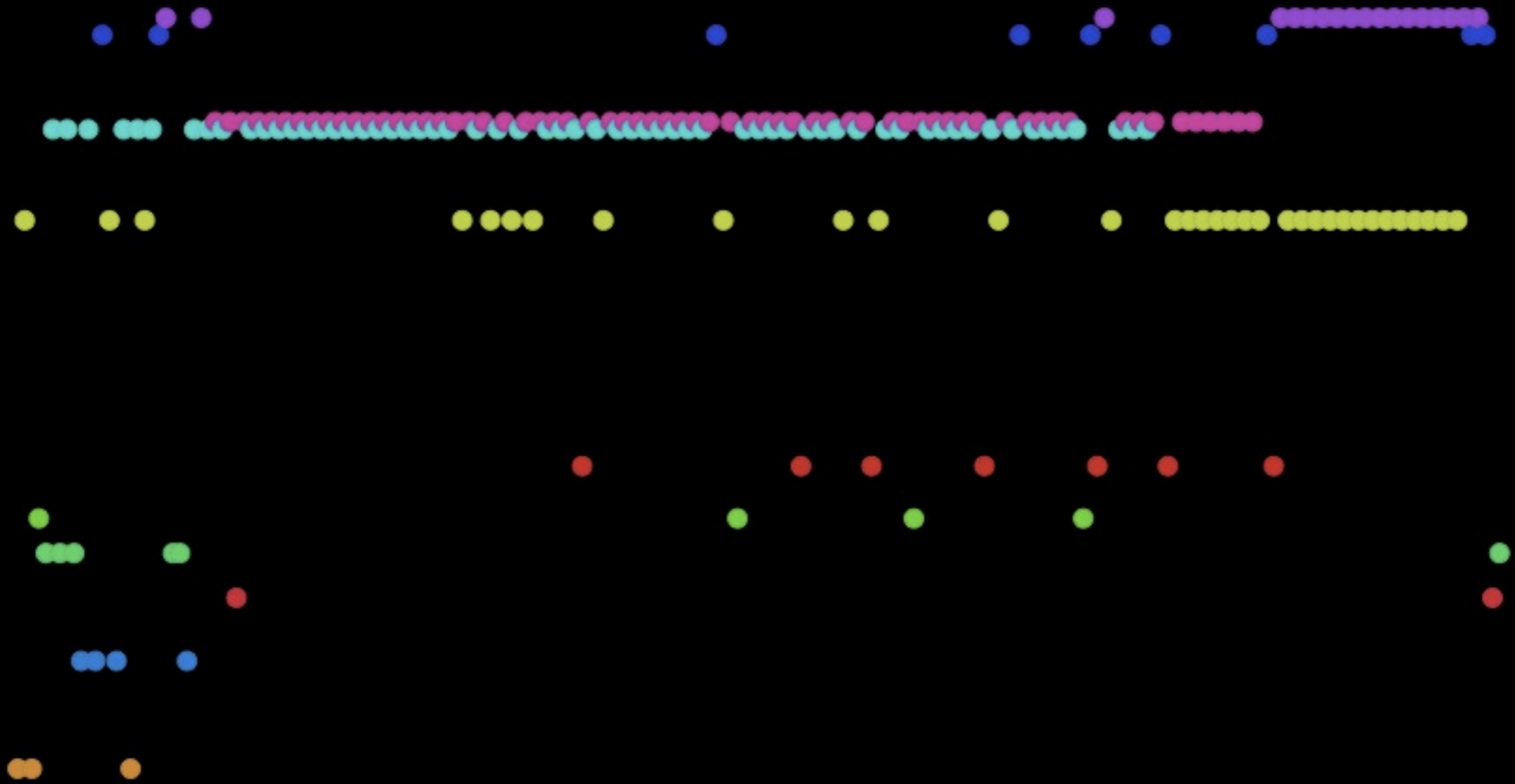
## **Is there evidence of chicken?**

Look for **duels** - auctions culminating in long bidding sequences by two players

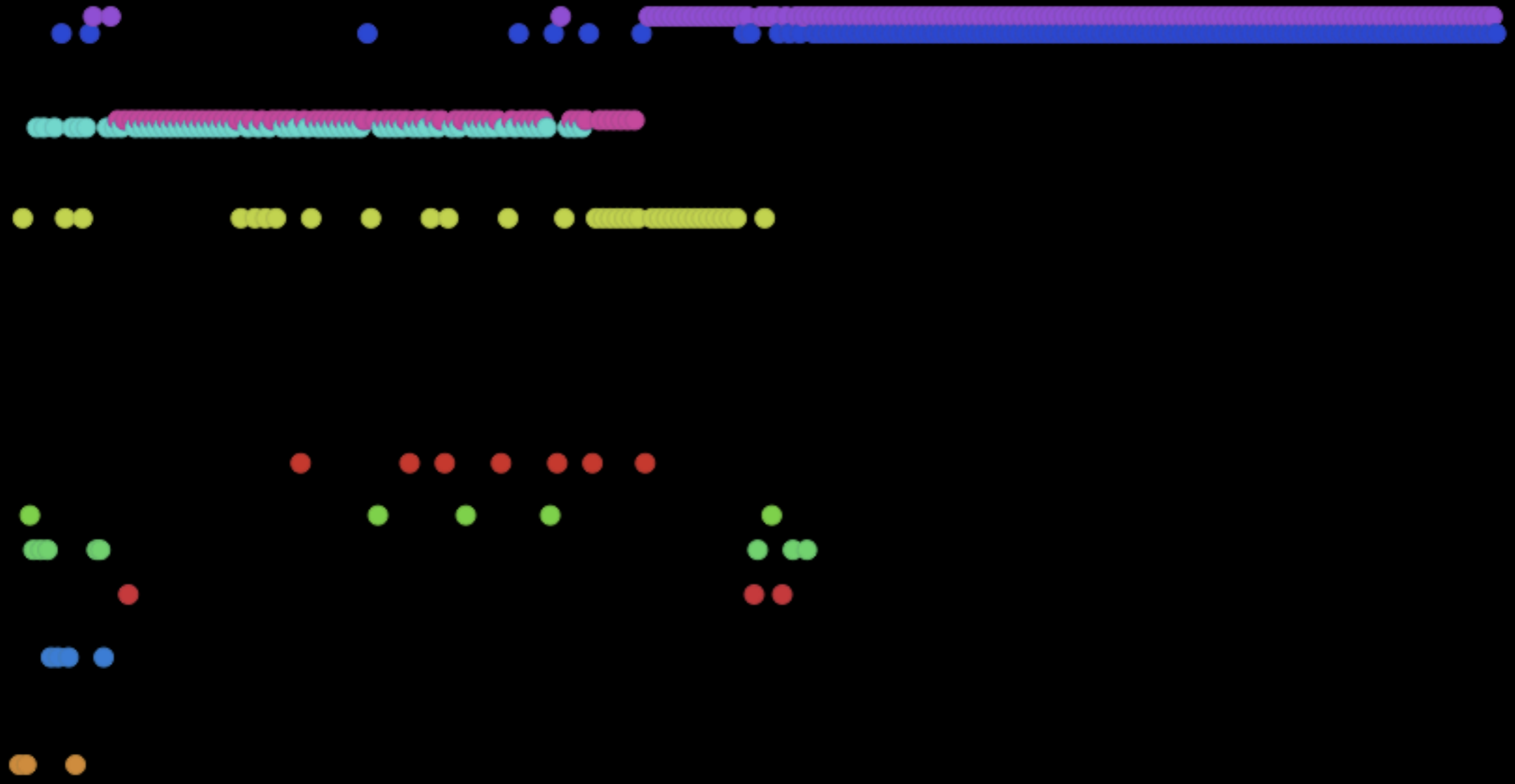
# The Scrum



# The Mêlée

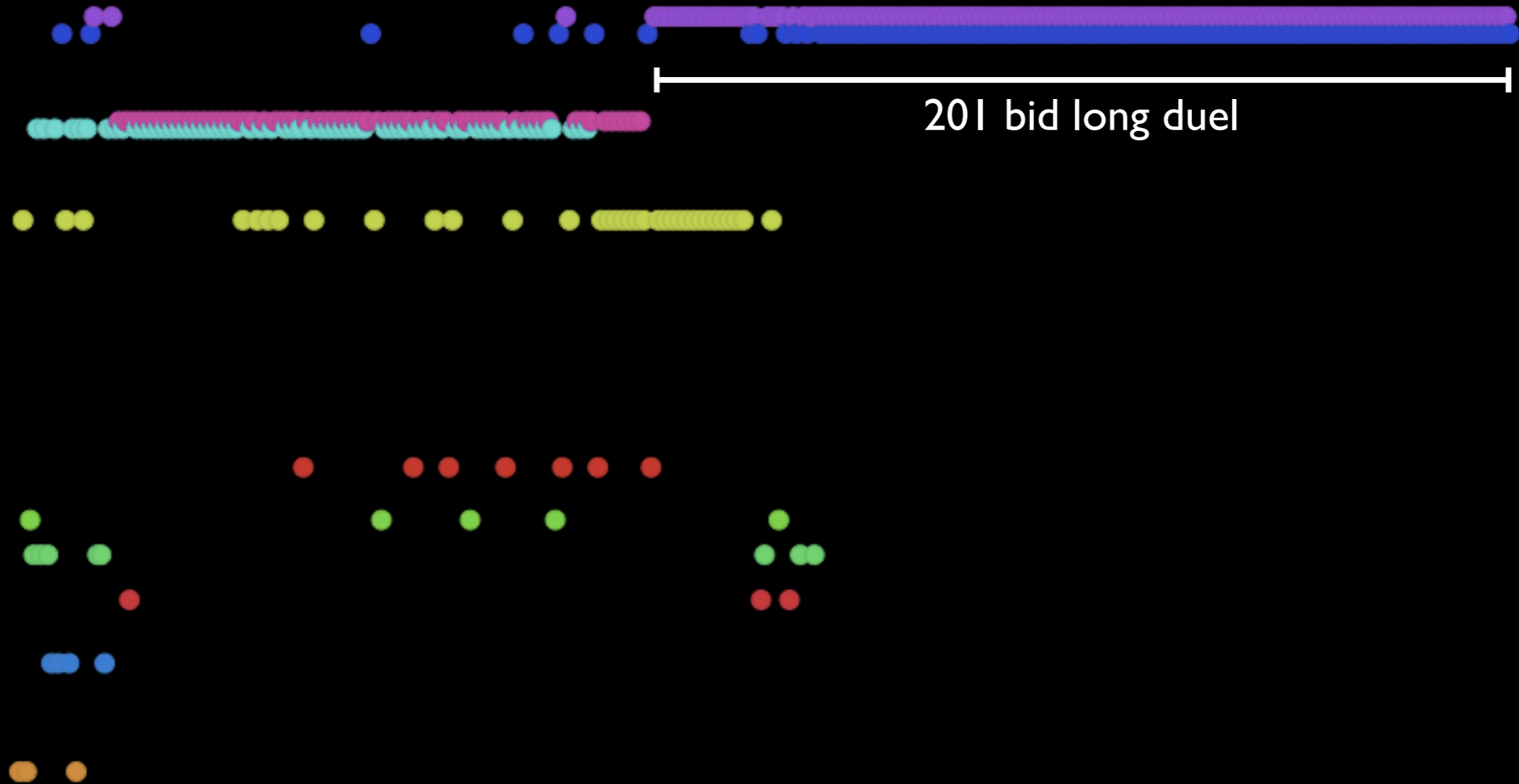


# The Duel

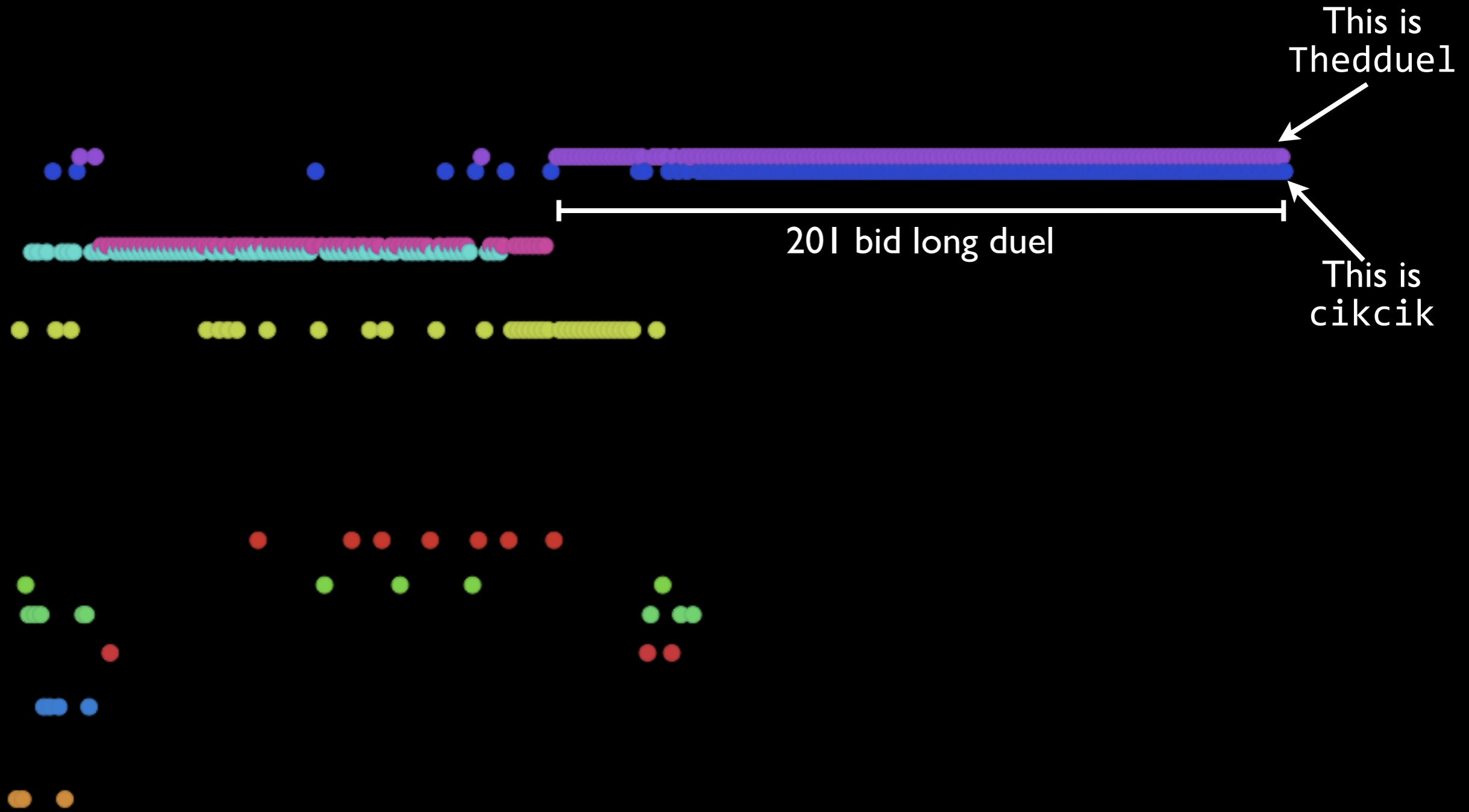




# The Duel

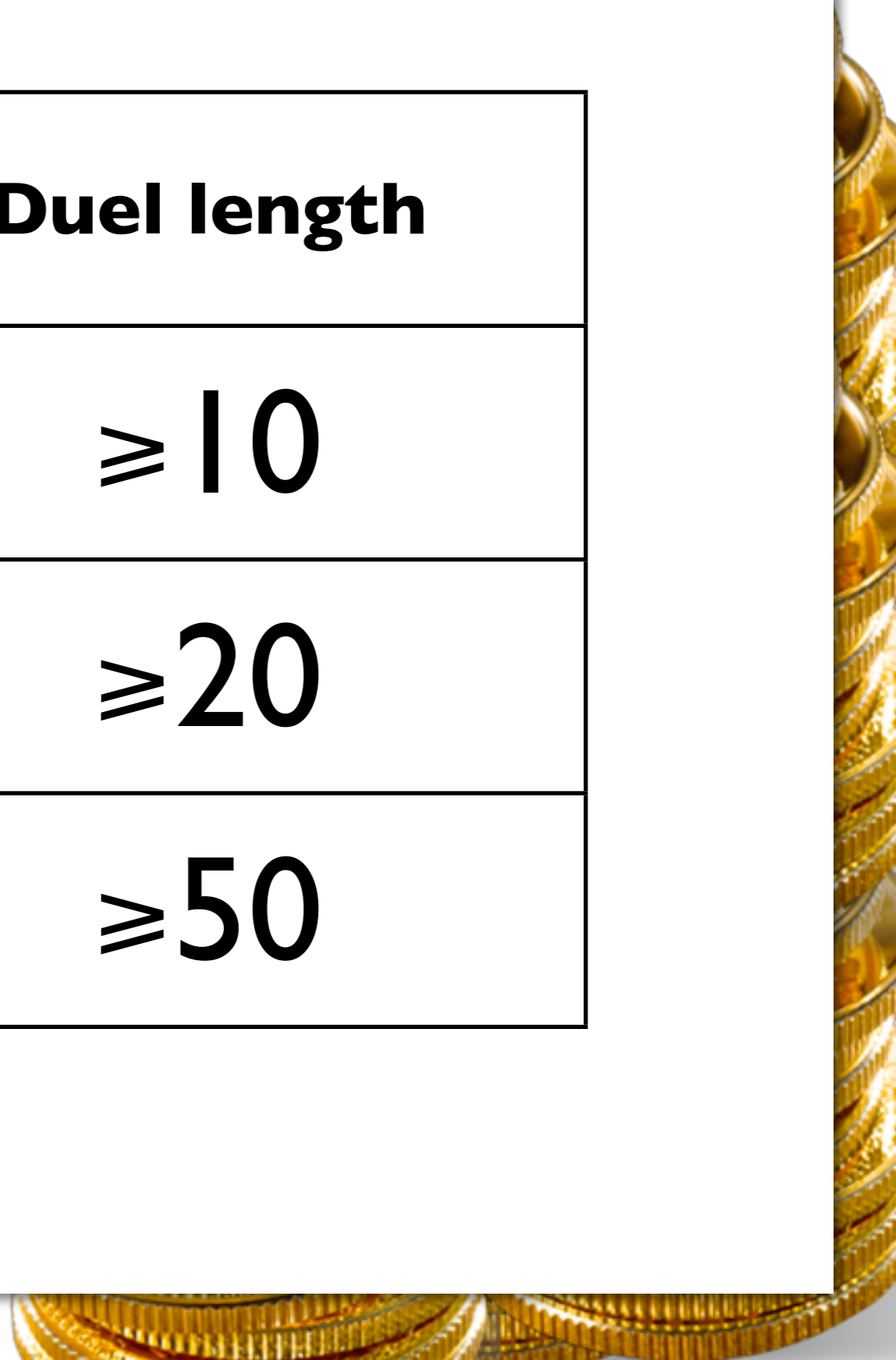


# The Duel



# Evidence of chicken

<b>% of auctions</b>	<b>Duel length</b>
<b>9%</b>	<b><math>\geq 10</math></b>
<b>5%</b>	<b><math>\geq 20</math></b>
<b>1%</b>	<b><math>\geq 50</math></b>



# Signaling intention: Aggressive bidding

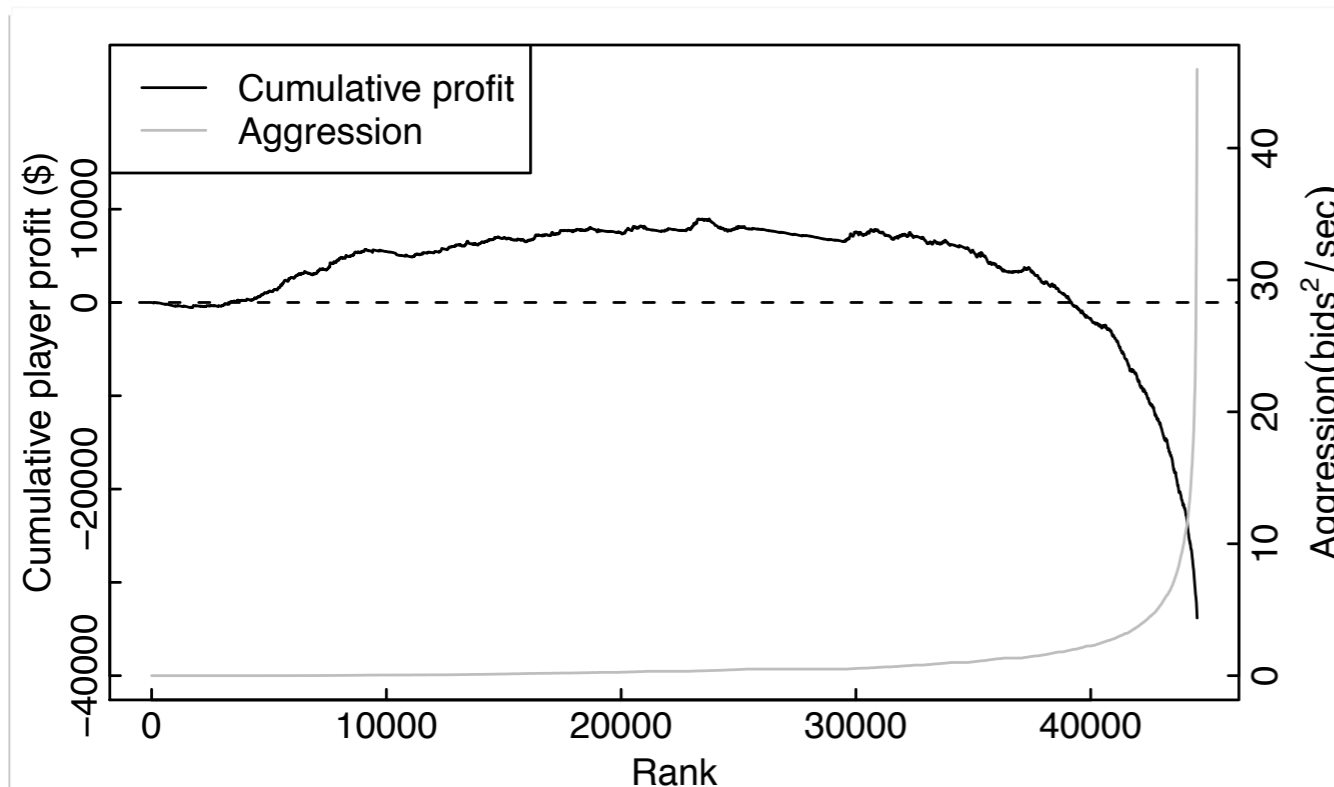
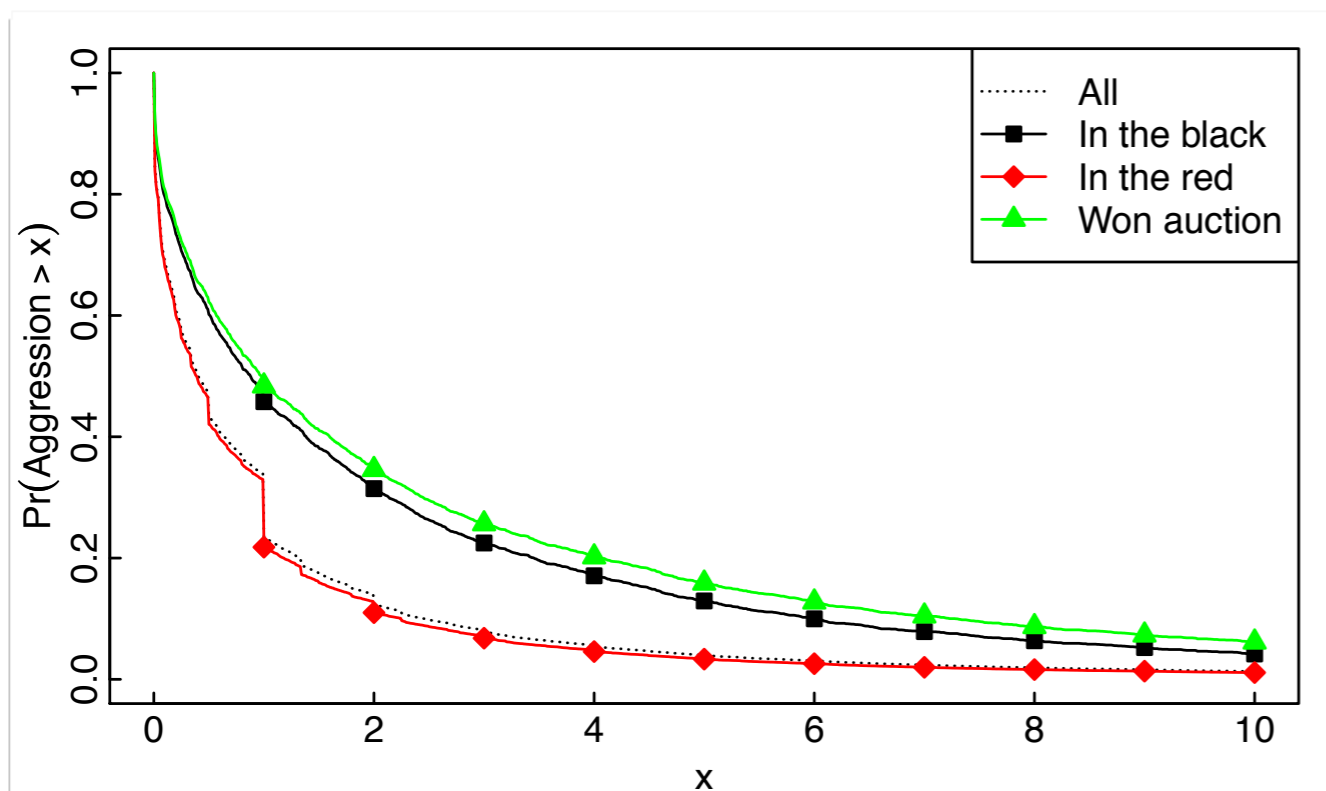
Players willing to playing chicken need a way to announce it

A natural way is to be aggressive by placing many bids in rapid succession

$$\text{Aggression} = \frac{\text{Number of bids}}{\text{Average response time}} \quad (\text{bids}^2 / \text{sec})$$

Aggressive bidders	Number of auctions	Auction revenue (as % of retail price)	Mean winner profit margin
0	1,699	62%	77%
1	493	135%	51%
$\geq 2$	834	246%	26%

# Signaling intention: Aggressive bidding



- Highly skewed aggression distribution
- Winners most aggressive, but profitable winners less so
- Those who lost demonstrate about average aggression
- Successful strategies are mostly concentrated at aggression ranks lower than average
- The highly aggressive players are responsible for most of Swoopo's profits

# Conclusions and Remarks

- **Information asymmetry** can have **powerful effects** in pay-per-bid and similar auctions.
- Is this understanding useful? What is the **value of the missing information** in this setting?
- Swoopo operates in the grey area between **gambling** and “**entertainment shopping.**”
- Is this a **fad** or the **future**?



**Thank you.**

**Any questions?**