

# **Forward-looking bidding in online auctions**

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## Let's buy a digital camera on eBay...



**Canon S30, 15 mins left**

**Canon S40, 33 mins left**

**Olympus D40, 45 mins left**

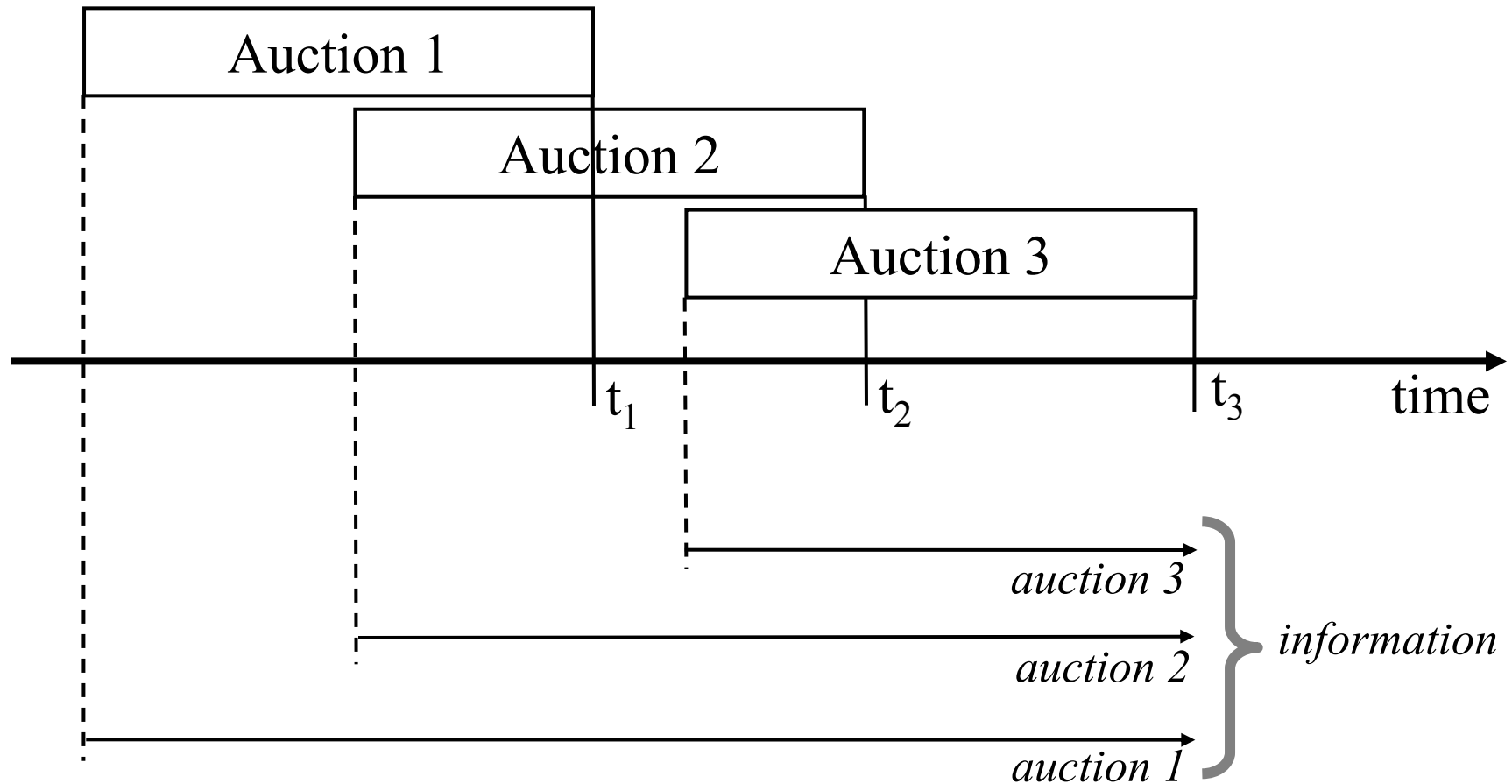
**Canon S30, 47 mins left**

**Olympus D40, 53 mins left**



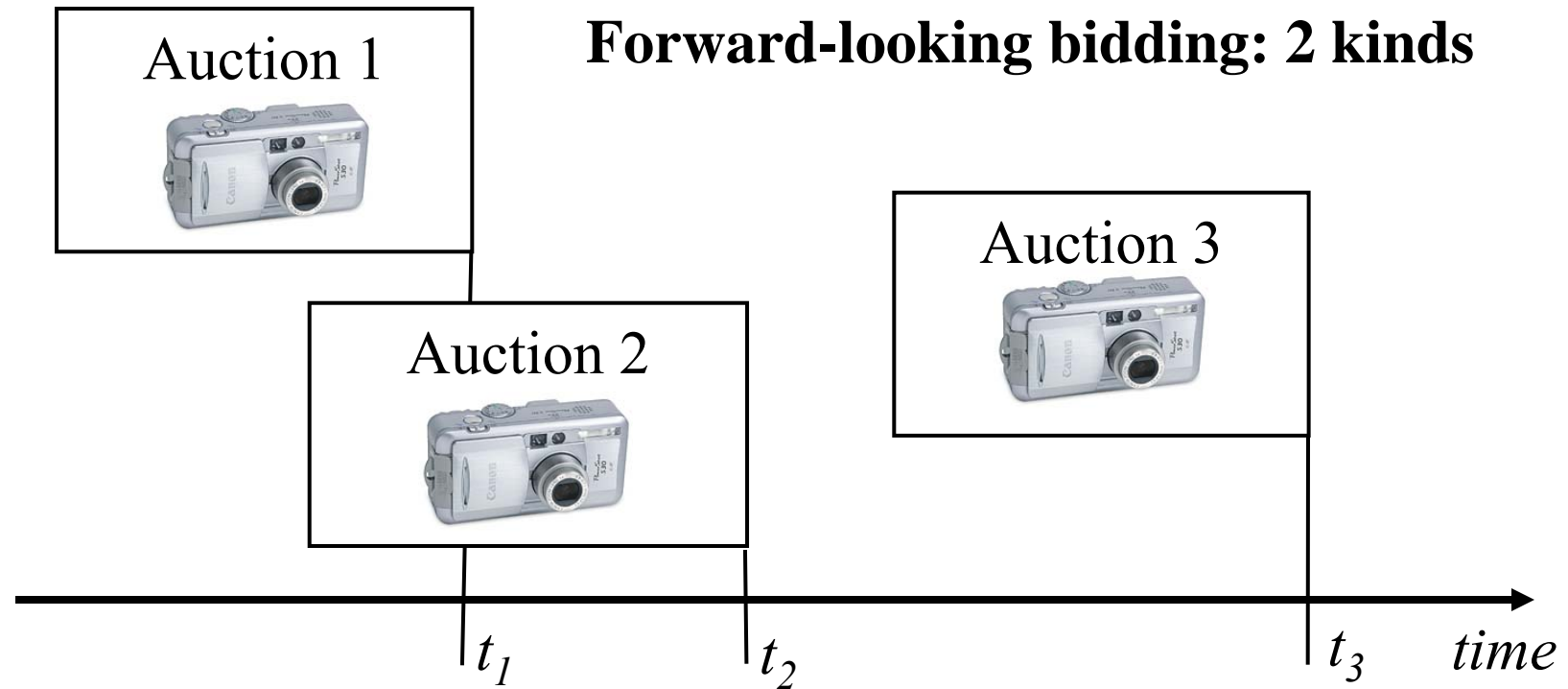
- Electronics, movies, computers ... each buyer only wants one unit
- Population heterogeneity in preferences (I am shopping for Canon S30)
- Simultaneous? No, sequential, implicitly organized by end time
- Interlaced sequences of auctions for essentially identical objects

# eBay: sequential auctions with overlapping information



## Research questions:

- 1) How to bid while incorporating the available information?
- 2) Do eBay bidders bid consistently with the theory?



unit-demand → **option-value of losing** → bid-shading (below isolated auction)

How to bid in auction 1?

- given the known (“**forward-seen**”) auction 2
- given a potential (“yet unseen”) auction 3 (Jofre-Bonet & Pesendorfer 03)

## Some related work (all unit-demand bidders)

- **Milgrom & Weber (82b,99)** :
  - finite sequences , identical units
  - no use for information about future auctions (all the same)
  - finite  $\rightarrow$  no bidder-replacement needed  $\rightarrow$  elegant solution
- **Engelbrecht-Wiggans (94) , Jofre-Bonet & Pesendorfer (03)** :
  - finite sequences, stochastically equivalent units (different but *iid* units)
  - no information about future auctions  $\rightarrow$  symmetric and independent future
- **Gale & Hausch (94)** :
  - two auctions, different and potentially correlated units
  - $(v_1, v_2) \sim$  continuous  $F$ , both  $(v_1, v_2)$  known at the start
  - units not necessarily identical  $\rightarrow$  disposal issues
  - very hard to extend to many auctions
  - Contrast: I will only allow  $v_i \in \{v, 0\} \approx \{"desired", "other"\}$

# Model: One-period look-ahead, 2-type example

Infinite sequence of second-price, sealed-bid auctions

- varying waiting-times  $\omega$  between individual auctions
- each auction sells one unit of a type- $k$  good,  $k: \{1,2\}$ ,  $\Pr(k=1) = \frac{1}{2}$
- no reserve

$N_k$  bidders present in every period, live until win or exit (  $\Pr(exit)=\lambda$  per hour)

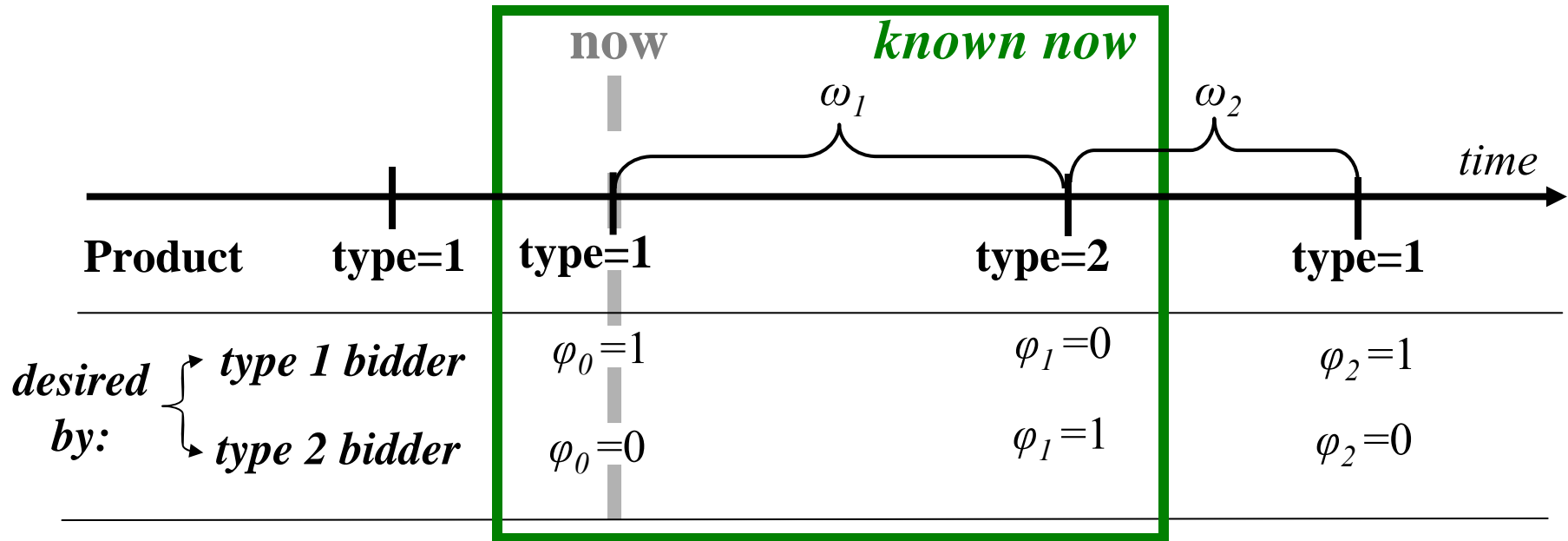
- unit-demand for only one type of good (“desired” type)
- IPV single-unit valuation of desired type,  $v \sim F$  continuous
- **Info**: binary desirability of current unit  $\varphi_0$  and next unit  $\varphi_1$ , waiting-time  $\omega_1$

Everyone discounts future  $\delta$  per hour, no memory

## Discussion of the assumptions

- Interlaced sequences of identical-goods auctions with non-overlapping pop.
- Some bidder-replacement essential (otherwise steady-state survivors  $v=0$ )
- Innovation: bids depend on forward-seen information  $(\omega_1, \varphi_1)$

# Model: One-period look-ahead, 2-type example



$S(\varphi_0, \varphi_1, \omega_1, v_i | c_0)$ : expected surplus given loss to current competitive bid  $c_0 \sim G$

$$b(\varphi_0, \varphi_1, \omega_1, v) = \arg \max_{\beta} \underbrace{\int_{\beta}^{\beta} (\varphi_0 v - c_0) dG(c_0)}_{\text{surplus if win now \& pay } c_0} + (\delta \lambda)^{\omega_1} \underbrace{\int_{\beta}^{\beta} S(\varphi_0, \varphi_1, \omega_1, v | c_0) dG(c_0)}_{\text{surplus if lose now to a bid } c_0}$$

1(current desired) →  
 1(next desired) →  
 time till next →  
 valuation of desired →

key tradeoff

# Optimal Forward-Seeing Bidding

$$b(\varphi_0, \varphi_1, \omega_1, v) = \arg \max_{\beta \geq 0} \int_0^{\beta} (\varphi_0 v - c_0) dG(c_0) + (\delta \lambda)^{\omega_1} \int_{\beta} S(\varphi_0, \varphi_1, \omega_1, v | c_0) dG(c_0)$$

$$\text{FOC: } b(1, \varphi_1, \omega_1, v) = v - (\delta \lambda)^{\omega_1} S(1, \varphi_1, \omega_1, v | c_0 = b(1, \varphi_1, \omega_1, v)) < v$$
$$b(0, \varphi_1, \omega_1, v) = 0$$

$$\text{SOC: } \frac{\partial S(1, \varphi_1, \omega_1, v | c_0)}{\partial c_0} > -\frac{1}{(\lambda \delta)^{\omega_1}}$$

## Properties:

- can show FOC has a unique solution, and that SOC satisfied
- bid-shading (a benefit to losing compared to isolated 2PSB)
- “pivotal thinking” : bid as if about to lose in a tie to a bidder like you

# Equilibrium

Bellman condition: In a symmetric pure-strategy Markov-Perfect equilibrium, the expected surplus function must be “correct”:

$$S(\varphi_{0,1}, \omega_1, v | c_0) = E_{\varphi_2, \omega_2} \left[ \int_{b(\varphi_{1,2}, \omega_2, v)}^{b(\varphi_{1,2}, \omega_2, v)} (v - c_1) dG(c_1 | c_0, \varphi_{0,1,2}, \omega_{1,2}) + (\delta\lambda)^{\omega_2} \int_{b(\varphi_{1,2}, \omega_2, v)} S(\varphi_{1,2}, \omega_2, v | c_1) dG(c_1 | c_0, \varphi_{0,1,2}, \omega_{1,2}) \right]$$

$S$  exists when  $F$  has a continuous density on a compact interval.

For a given  $F$ ,  $S$  can be obtained by value-function iteration.

Could this be a basis for a structural approach?

Bidders are not price-takers, take into account evolution of the pool of competitors.



# Reduced-form test of model predictions

- 1)  $K+1$  types, multi-period look-ahead with timing (**type-independent**) information  $\Omega$  and product (**type-specific**) information  $\Phi$ 
  - eBay bidders usually see about a week ahead, could be many periods
  - $\Omega$  : auctions ending within the next hour marked in **red**, easy to see
- 2) Focus on a particular subset  $x$  of the state-variables  $(\Omega, \Phi)$  and integrate out the rest of the state, i.e. generate “on average” predictions given  $x$ :  
$$\bar{b}(x, v) = E[b(1, \Phi, \Omega, v) | x]$$
 (example:  $x = \#$  auctions ending within next hour)
- 3) If something is true for every valuation  $v$ , it will be true for the order-statistics of the valuations within each auction (keeping  $N$  constant)
- 4) Note that the first and second highest bids are observed in eBay data. => Regress bid order-statistics  $b_{(j)}(x)$  on  $x$  (control for varying  $N$ )





## **Preliminary evidence for predicted behavior**

- Most eventual winners won only one unit within the data-period (93% in MP3-players and 87% in movies).
- A substantial number of bidders participated in more than one auction (43% in MP3-players and 33% in movies) and those who did mostly stuck to bidding on one product-type.
- It does not seem that the multi-auction bidders simply submitted a very low bid initially to learn about the auction process or their true valuation, and only later raised their bid to their “full” willingness to pay. (Of the multi-bidders, 49% in movies and 59% in MP3 players submitted a higher second bid).







