Persistent Winners and Reserve Prices in Repeated Auctions

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 - * First- and Second-Price sealed-bid Auctions (FPA/SPA)
 - Advertisers bid through Demand Side Platforms that allow
 - * Management of advertising campaign with a fixed budget
 - * Automatic real-time bidding in multiple auctions
 - 90% transactions use automatic technology

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- What are the implications in dynamic FPA and SPA?
 - Increasing reserve reduces seller's information
 - **Revenue** in SPA > FPA iff incumbent's capacity is low
 - Trade is non-monotonic in capacity

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- Infinite pool of symmetric bidders with value $\theta_i \sim F[0, 1]$, increasing virtual value $\psi(\theta)$
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- Markovian structure with state equal to last winner the incumbent:

1. No winner (
$$\emptyset$$
) in $t \Rightarrow n$ new bidders in $t + 1$ 2. Winner θ in $t \Rightarrow$ in $t + 1$ $\begin{cases} n \text{ new bidders} & \text{prob. } \eta \\ \text{incumbent } \theta \text{ and } n - 1 \text{ new bidders} & \text{prob. } 1 - \eta \end{cases}$

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 - Sufficient weaker form of unsophistication: one-shot myopia
 - Bidders are myopic only the first time they bid in the repeated auctions
 - * Forward myopia only matters in first period
 - * Backward myopia is irrelevant for the incumbent

Outline

1. Static auctions with exogenous incumbent

- Optimal reserve price
- Seller's revenue: FPA vs. SPA

2. Dynamic auctions

- Transition dynamics
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$$\begin{array}{c|c} \textbf{Exclusion} \ (R^F > \theta) & \text{if} & \theta < \underline{\theta}^F \\ \textbf{Tracking} \ (R^F = \theta) & \text{if} & \underline{\theta}^F \leq \theta \leq \overline{\theta}^F \\ \textbf{Tailing} \ (R^F < \theta) & \text{if} & \theta > \overline{\theta}^F \end{array} \right)$$



Tailing in FPA

- Tracking high θ is too costly: excessive reserve if θ leaves
- Tailing reserve solves

$$\psi(\overline{R}^F) = \frac{(1-\eta)(1-(n-1)\log(F(\theta)))}{n\eta f(\overline{R}^F)}$$

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 - Cost of increasing R (risk of no trade if θ leaves) independent of θ
 - Benefit of increasing *R* (higher winning bid if θ stays) *decreases* in θ
 - * Bidders with higher values are less sensitive to *R*:

$$\tfrac{\partial^{2}}{\partial R \partial \theta} b^{F}\left(\cdot\right) < 0$$



Tailing in SPA

- In SPA: exclusion/tracking/tailing but ...
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 - * Bids are independent of R
 - Lower benefit of R than in FPA
 - * Losing incumbent substitutes *R* for high new bidders



Effect of Persistence on Tracking



- Increasing η reduces tracking (since incumbent is less likely to stay)
- More tracking in FPA than SPA (and same reserve in FPA/SPA at $\theta = 1$)

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 - In SPA, **incumbent acts as "reserve"** \Rightarrow high revenue when he loses (regardless of seller's *R*)
 - * Reserve works even if unannounced in SPA, but not in FPA
 - \Rightarrow Seller can tailor R to new bidders





Higher revenue in SPA for high θ (if $\overline{\theta}^S < 1$)

- At $\theta = 1$, same R and revenue in SPA/FPA
 - Highest incumbent never loses (when he stays)
- Marginally reducing θ has first-order effect on FPA (since θ pays his bid)
 - ... but not on SPA (since incumbent's payment is independent of θ)



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Dynamic Auctions



Dynamic Auctions

• Recursive representation with state = incumbent and value function



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Dynamic Auctions



- Reserve also affects the seller's information and hence his continuation value
- Same transition dynamics in FPA and SPA (because same winner given R) Value Function









Dynamic Effect of R



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- R only matters when incumbent leaves and highest new bidder is R
 - $R \uparrow$ reduces seller's information (from to R to \emptyset)
 - Dynamic cost of excluding R is $\beta (V(R) V(\emptyset))$, independent of θ

Dynamic Optimal Reserve Price in FPA

Tracking and Tailing as in static case but

1. Lowest reserve R_{\emptyset} (with no incumbent) is lowest possible winner



 $\beta = 0.6$ $\eta = 0.5$ n = 3

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- 2. Seller never excludes incumbent
 - No incentive to lower reserve to learn information that is not used
- 3. Dynamic cost reduces tailing reserve

▶ R_{\emptyset} Comparative Statics



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- Seller's value V (Ø) depends on stationary distribution of θ
 - Decreasing in η because less persistence \Rightarrow lower incumbents



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- FPA \succ SPA if η is (very) low:
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- $\eta = 1$: symmetric bidders, reserve r^M and revenue equivalence



Trade

• When there is trade, the allocation is efficient

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- Given incumbent *θ*, **trade fails** with probability



Trade: Effect of η

- As η increases
 - $\begin{array}{c} \eta \times F(R\left(\theta\right))^n \\ \uparrow \qquad \downarrow \end{array}$
 - Direct effect: θ leaves more often
 - Seller reduces $R(\theta)$

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 - Direct effect: θ leaves more often
 - Seller reduces $R(\theta)$
- Stationary distribution $G\left(\theta\right)$ also depends on η
- Long-run trade is

$$T = 1 - \underbrace{\frac{\int_{R_{\emptyset}}^{1} \eta F(R(\theta'))^{n} \mathrm{d}G(\theta')}{1 - F(R_{\emptyset})^{n}}}_{G(\emptyset)}$$



Trade

 Long-run trade is one minus the stationary distribution of state Ø

 $T = 1 - G\left(\emptyset\right)$

$$-\eta = 0: T = 1$$

 $-\eta = 1$: static auction,

$$T = 1 - F\left(r^M\right)^n$$

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- Repeated auctions with myopic bidders that buy up to capacity
- Optimal **reserve price** solves
 - Static trade-off: track past winner vs. target new bidders
 - Dynamic information acquisition (additional cost of reserve)
 - \Rightarrow Tail high-value winners, with decreasing reserve in FPA
- Low winners' persistence reduces reserve prices (less tracking and lower tailing)
 - May increase trade
 - Higher revenue in SPA than FPA
 - * More aggressive bidding in FPA with tracking (myopia) but
 - * Lower reserve in SPA with tailing (incumbent substitutes reserve)

Static Seller's Revenue

- Let $b(\theta, R, n)$ be the expected payment of type θ conditional on winning a standard auction with n (symmetric) bidders and reserve R
- Static revenue in FPA is

$$\begin{aligned} \pi^{F}\left(\theta,R\right) &= \eta\pi_{n}\left(R\right) + (1-\eta)\pi_{n-1,\theta}^{F}\left(R\right) \\ &= \eta\int_{R}^{1}b\left(x,R,n\right)\mathsf{d}F\left(x\right)^{n} & \text{Incumbent leaves} \\ + (1-\eta)\mathbb{I}\left[R \leq \theta\right]\left(F\left(\theta\right)^{n-1}b\left(\theta,R,n\right) + \int_{\theta}^{1}b\left(x,R,n\right)\mathsf{d}F\left(x\right)^{n-1}\right) & \text{Track or tail incumben} \\ &+ (1-\eta)\mathbb{I}\left[R > \theta\right]\int_{R}^{1}b\left(x,R,n\right)\mathsf{d}F\left(x\right)^{n-1} & \text{Exclude incumbent} \end{aligned}$$

Static revenue in SPA is

$$\begin{aligned} \pi^{S}\left(\theta,R\right) &= \eta \int_{R}^{1} b\left(x,R,n\right) \mathrm{d}F\left(x\right)^{n} & \text{Incum} \\ &+ \left(1-\eta\right) \mathbb{I}\left[R \leq \theta\right] \left(F\left(\theta\right)^{n-1} b\left(\theta,R,n\right) + \int_{\theta}^{1} b\left(x,\theta,n-1\right) \mathrm{d}F\left(x\right)^{n-1}\right) & \text{Track or} \\ &+ \left(1-\eta\right) \mathbb{I}\left[R > \theta\right] \int_{R}^{1} b\left(x,R,n-1\right) \mathrm{d}F\left(x\right)^{n-1} & \text{Exclusion} \end{aligned}$$

Incumbent leaves Track or tail incumbent Exclude incumbent

- Aggressive myopic bidding in FPA (n vs n 1 bidders)
- Losing incumbent substitutes reserve in SPA



Value Function

- Let $b(\theta, R, n)$ be the expected payment of type θ conditional on winning a standard auction with n symmetric bidders and reserve R
- Value functions in auction i = S, F are

$$V_{\emptyset}^{i} = \max_{R} \int_{R}^{1} b\left(x, R, n\right) \mathsf{d}F\left(x\right)^{n} + \beta \left(F\left(R\right)^{n} V_{\emptyset}^{i} + \int_{R}^{1} V^{i}\left(\theta'\right) \mathsf{d}F\left(\theta'\right)^{n}\right)$$

$$\begin{split} V^{i}\left(\theta\right) &= \max_{R} \pi^{i}\left(\theta, R\right) & \text{Static Revenue} \\ &+ \beta \left[\eta \left(F\left(R\right)^{n} V_{\emptyset}^{i} + \int_{R}^{1} V^{i}\left(\theta'\right) \mathsf{d}F\left(\theta'\right)^{n}\right) & \text{Incumbent leaves} \\ &+ (1 - \eta) \mathbb{I}\left[R \leq \theta\right] \left(F\left(\theta\right)^{n-1} V^{i}\left(\theta\right) + \int_{\theta}^{1} V^{i}\left(\theta'\right) \mathsf{d}F\left(\theta'\right)^{n-1}\right) & \text{Track or tail incumbent} \\ &+ (1 - \eta) \mathbb{I}\left[R > \theta\right] \left(F\left(R\right)^{n-1} V_{\emptyset}^{i} + \int_{R}^{1} V^{i}\left(\theta'\right) \mathsf{d}F\left(\theta'\right)^{n-1}\right)\right] & \text{Exclude incumbent} \end{split}$$

Auction formats affects static revenue but not transition dynamics

