On the Complexity of Equilibrium Computation in First-Price Auctions

From the following two works:

F., Giannakopoulos, Hollender, Lazos, and Poças. *On the Complexity of Equilibrium Computation in First-Price Auctions*. EC 2021, SICOMP 2023.

F., Giannakopoulos, Hollender, and Kokkalis. On the Computation of Equilibria in Discrete First-Price Auctions. EC 2024.



Houses are sold via sealed-bid First-Price auctions.



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How much am I willing to spend?









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- The winner is the bidder with the highest bid (breaking ties uniformly at random).
- The winner pays her bid, the other bidders pay zero.

First Price Auctions in practice





Google's First-Price Auction Switch Is Making Header Bidding Partners Win More

by Sarah Sluis // Thursday, September 5th, 2019 - 6:00 am



NEWS >

Google outlines move to first-price auction for Ad Manager

By Andrew Blustein - 10 May 2019 20:04pm



Who else is interested?

Houses are sold via sealed-bid First-Price auctions.























































I have incentives to underbid, but I also don't want to lose the house, or at least not with high probability.









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- **Ex-post utility:** $\tilde{u}_i(\mathbf{b}; v_i) := \begin{cases} \frac{1}{|W(\mathbf{b})|} (v_i b_i), & \text{if } i \in W(\mathbf{b}), \\ 0, & \text{otherwise,} \end{cases}$

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where
$$W(\mathbf{b}) = \operatorname{argmax}_{j \in N} b_j$$

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- Expected utility of bidder i: $u_i(b, \beta_{-i}; v_i) := \mathbb{E}_{\mathbf{v}_{-i} \sim \mathbf{F}_{-i}}[\tilde{u}_i(b, \beta_{-i}(\mathbf{v}_{-i}); v_i)]$
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This is called a Bayes-Nash Equilibrium.

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Bayes-Nash Equilibrium

- A strategy profile $\beta = (\beta_1, \dots, \beta_n)$ is an ε -approximate pure Bayes-Nash Equilibrium if for any bidder $i \in N$, any value $v_i \in V$, and any bid $b \in B$: $u_i(\beta_i(v_i), \beta_{-\mathbf{i}}; v_i) \ge u_i(b, \beta_{-\mathbf{i}}; v_i) - \varepsilon$
- We refer to a 0-approximate PBNE as an *exact* PBNE

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- 2. What is the computational complexity of *finding pure equilibria* (for continuous priors) and of *deciding their existence* (for <u>discrete priors</u>)?

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- and of *deciding their existence* (for discrete priors)?

- Existence of pure equilibria in first-price auctions with continuous priors was shown in

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2. What is the computational complexity of *finding pure equilibria* (for continuous priors)



Continuous Priors

Discrete Priors

Continuous Priors

Theorem [FGHLP23]: Computing an ε-PBNE with subjective priors is PPAD-complete.

Discrete Priors

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 - e.g., at least as hard as finding mixed Nash equilibria in normal form games, market equilibria in exchange markets, etc.

continuous priors

iid

IPV

subjective priors

continuous priors

iid

PBNE: PPAD-complete [FGHLP23]

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PBNE (trilateral tie-breaking): PPAD-complete [CP23]

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PPAD-completeness

- PPAD-membership: New proof of existence via Brouwer's fixed point theorem. Brouwer function is polynomially continuous.
- PPAD-hardness: Reduction from *ɛ*-Generalized Circuit, a known PPADcomplete problem [Chen, Deng, and Teng 2009, Rubinstein 2018].
 - In fact we first show that *ɛ*-Generalized Circuit is still PPAD-complete, even when restricted to a very small set of gates.

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PBNE: NP-complete [FGHK24]

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- NP-hardness: Reduce from the CIRCUIT-SAT problem.

• NP-membership: Compute a bidder's expected utility given a strategy

- Mixed strategy: $\beta_i : V \to \Delta(B)$ (distribution over bids)

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- Mixed strategies restore continuity \Rightarrow existence of a MBNE
- Computing an ε-MBNE in a DFPA is a total search problem.

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Complexity Landscape

discrete priors

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PBNE: NP-complete [FGHK24]

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subjective priors

Complexity Landscape

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MBNE: PPAD-complete [FGHK24] PBNE: NP-complete [FGHK24]

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DFPA, $\delta \in (0,1)$

Continuous





Continuous

Figure 1: Discrete \rightarrow Continuous





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Figure 1: Discrete \rightarrow Continuous



Continuous

Discrete

Continuous

CFPA, $\delta \in (0,1)$

Discrete



Figure 2: Continuous \rightarrow Discrete

Discrete



Figure 2: Continuous \rightarrow Discrete





Figure 2: Continuous \rightarrow Discrete









 $(\varepsilon + \delta)$ -PBNE







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- PPAD-hardness: Reduction from the PPAD-complete problem PURE-CIRCUIT [DFHM22].

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- Solution concept: symmetric ε-MBNE

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- Solution concept: symmetric ε-MBNE
- Polynomial Time Approximation Scheme (PTAS): An algorithm that the inputs, but possibly exponential in $1/\epsilon$.

computes an ε -approximate solution to a problem in time polynomial to

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Theorem [FGHK24]: Computing an ε-MBNE with subjective priors is **PPAD-complete.**

Theorem [FGHK24]: The problem of computing an ε -MBNE with iid priors admits a PTAS.



Proof Sketch

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- 3. Round the solution achieved in Step 2 so that it corresponds to a feasible set of strategies, provide a bound on the approximation factor of the MBNE.

discrete priors

iid

MBNE: PPAD-complete [FGHK24] PBNE: NP-complete [FGHK24]

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subjective priors

MBNE: PTAS [FGHK24]

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PBNE (trilateral tie-breaking): **PPAD-complete** [CP23]

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e for other class	PPAD-complete

