

Internet Advertising and the Generalized Second-Price Auction: Selling Billions of Dollars Worth of Keywords

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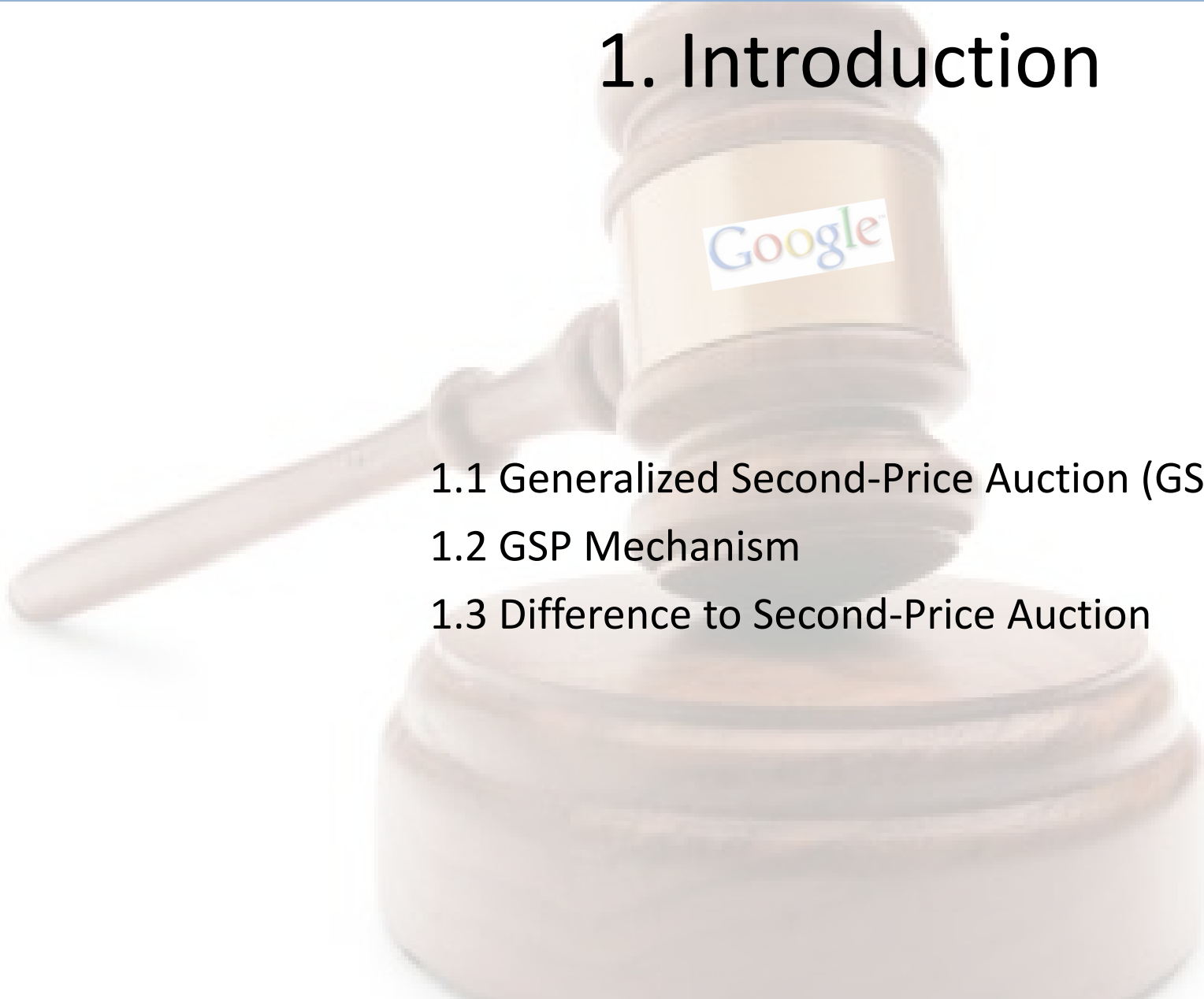
Auction Theory and Mechanism Design

April 18, 2012

Outline

1. Introduction
2. The Structure and Evolution of Sponsored Search Auctions
3. The Rules of GSP
4. GSP and Locally Envy-Free Equilibria
5. Main Result: GSP and Generalized English Auction
6. Discussion

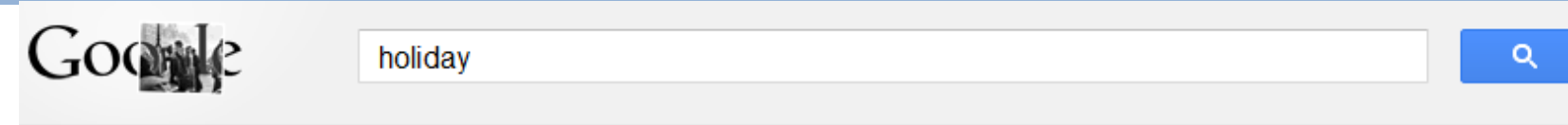
1. Introduction



1.1 Generalized Second-Price Auction (GSP)

1.2 GSP Mechanism

1.3 Difference to Second-Price Auction



Suche

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[Holiday - Wikipedia, the free encyclopedia](#)

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Generalized Second-Price Auction (GSP)

- All new auction mechanism
- Spectacular commercial success of GSP
- Dominant transaction mechanism in a large and rapidly growing industry

GSP Mechanism

- Enter a Keyword
- Auction
- Result Page
- Payoff

The screenshot displays the AutoScout24 website interface. At the top, there are banners for 'AUTO SCOUT 24' and 'GE Money Bank'. A navigation bar includes links for 'Occasionen', 'Neuwagen', 'Teile und Zubehör', 'Magazin', 'Motorräder', and 'Mein AutoScout24'. On the left, a sidebar lists various actions: 'Suche', 'Erweiterte Suche', 'Betriebe suchen', 'Inserieren', 'Preise', 'Merkliste (0)', 'Suchaufträge', and 'Fahrzeugbewertung'. Below this is a link to 'Firmenadressen? Scout24-Branchenbuch'. The main content area features a 'Topangebote' section with five car listings: BMW 320, BMW 330, BMW X5, BMW X5, and BMW 118. Below this is a section for '678 Treffer BMW X5' with a search filter 'Suche anpassen'. The results are shown in a table with columns for 'Ansicht', 'Erweitert', 'Liste', 'Galerie', 'Sortieren nach', and 'wählen'. Two car listings are visible: a BMW X5 4.4i (2004, 97,000 km, CHF 21,900) and a BMW X5 xDrive 35d (2010, 27,800 km, CHF 73,500). Each listing includes a 'TOP' badge, a small image, and a 'Merken' button.

Difference to Second-Price Auction

- Multi-unit Auction
- GSP has no equilibrium in dominant strategies
- Truth-telling is not an equilibrium (bid your value)

2. The Structure and Evolution of Sponsored Search Auction

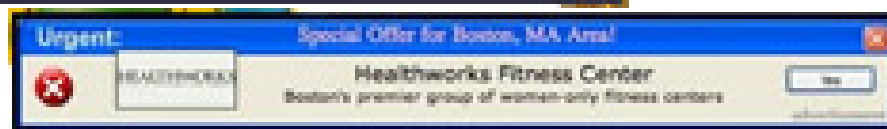
- 2.1 Features of the Market for Internet Advertising
- 2.2 Evolution of the Systems

Features of the Market for Internet Advertising

- Bids can be changed at any time
- Ad services are perishable
- No «unit» of Internet advertisement
- Click-Through Rates (CTR)

Evolution of the Systems

- Early Internet Advertising 1994
- Generalized First-Price Auction 1997
- Generalized Second-Price Auction 2002



3. The Rules of GSP



3.1 The Rules

3.2 Payments under GSP and VCG

3.3 Conclusions of “The Rules of GSP”

The Rules

- N objects (positions)
 - K bidders (advertisers)
 - b_k bid of k
 - α_i number of clicks per period in position i
 - s_k value per click to bidder k
 - $p^{(k)}$ payment of bidder k
- $\left. \begin{array}{l} \alpha_i \text{ number of clicks per period in position } i \\ s_k \text{ value per click to bidder } k \end{array} \right\} \alpha_i s_k - p^{(k)}$
- Risk-Neutrality, positions are labeled in descending order, only one position per bidder
 - $b^{(j)}$ bid of the j -th highest bidder
 - $g(j)$ identity of the j -th highest bidder
- $\left. \begin{array}{l} b^{(j)} \text{ bid of the } j\text{-th highest bidder} \\ g(j) \text{ identity of the } j\text{-th highest bidder} \end{array} \right\} \begin{array}{l} \text{e.g. Top position goes to bidder } g(1) \\ \text{with highest bid } b^{(1)} \end{array}$



Payments under GSP and VCG

- Generalized Second-Price (GSP) Auction

$$p^{(i)} = \alpha_i b^{(i+1)} \text{ for } i \in \{1, \dots, \min\{N, K\}\}$$

$$p^{(K)} = 0 \text{ for } N \geq K$$

- Vickrey-Clarke-Groves (VCG) Mechanism

$$p^{v,(i)} = (\alpha_i - \alpha_{i+1}) b^{(i+1)} + p^{v,(i+1)} \text{ for } i < \min\{N, K\}$$

$$p^{(K)} = 0 \text{ for } N \geq K, \alpha_N b^{(N+1)} \text{ otherwise}$$

Conclusions of “The Rules of GSP”

- "If all advertisers were to bid the same amounts under the two mechanisms, then each advertiser's payment would be at least as large under GSP as under VCG."

The bidder who gets the last position pays in both cases the same.

For all others $i < \min\{N, K\}$:

$$p^{V,i(i)} - p^{V,i(i+1)} = (\alpha_i - \alpha_{i+1})b^{(i+1)} \leq \alpha_i b^{(i+1)} - \alpha_{i+1} b^{(i+2)} = p^{(i)} - p^{(i+1)}$$

- "Truth-telling is a dominant strategy under VCG."

Property of VCG mechanism.

Conclusions of “The Rules of GSP”

- "Truth-telling is not a dominant strategy under GSP."

Counter-example:

three bidders with values \$10, \$4, \$2

two positions with 200, 199 clicks per hour

advertisers bid truthfully

→ bidder 1's payoff: $(\$10 - \$4) * 200 = \$1'200$

if he bids only \$3 → second position

→ bidder 1's payoff: $(\$10 - \$2) * 199 = \$1'592$

4. GSP and Locally Envy-Free Equilibria

- 4.1 Assumptions and Restrictions
- 4.2 Locally Envy-Free equilibrium
- 4.3 First Theorem

Assumptions and Restrictions

- Sponsored search auctions as continuous time or infinitely repeated games.
- Focus on simple strategies and rest points.
- Therefore impose three assumptions and restrictions
 - All values are common knowledge
 - Stable bids must be best responses to each other
 - Consider simple strategies beyond simple best responses
 - e.g. Forcing out the advertiser with position immediately above

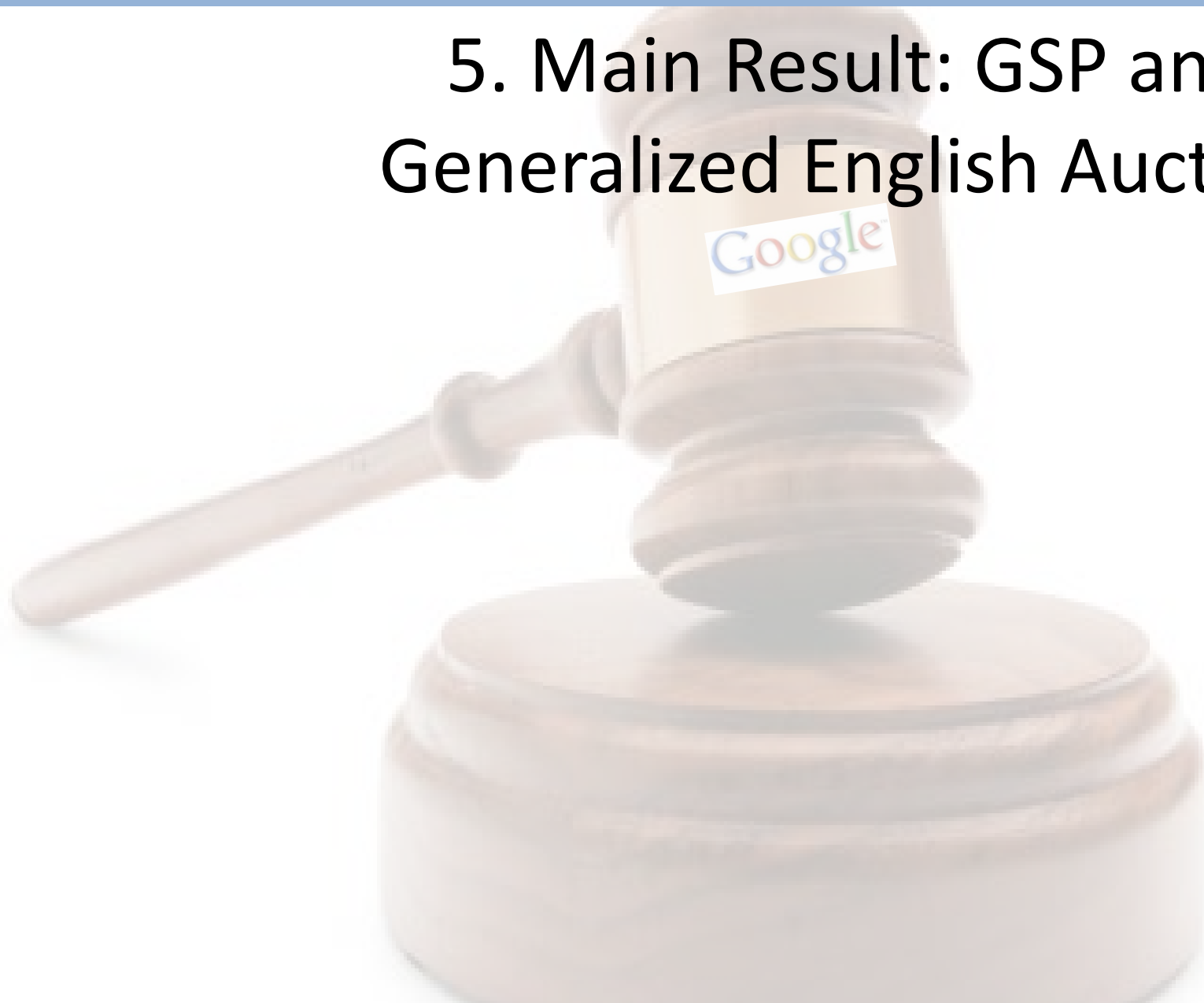
Locally Envy-Free Equilibrium

- "in a locally envy-free equilibrium, for any $i \leq \min\{N+1, K\}$,
$$\alpha_i s_{g(i)} - p^{(i)} \geq \alpha_{i-1} s_{g(i)} - p^{(i-1)}."$$
- "The outcome of any locally envy-free equilibrium of auction Γ is a stable assignment."
- "If the number of advertisers is greater than the number of available positions, then any stable assignment is an outcome of a locally envy-free equilibrium of auction Γ ."

First Theorem

- Construct a locally envy-free equilibrium of game Γ with following properties $\left(p^{(i-1)} \geq (\alpha_{i-1} - \alpha_i) s_{g(i)} + p^{(i)} \geq (\alpha_{i-1} - \alpha_i) s_{g(i)} + p^{v,(i)} = p^{v,(i-1)} \right)$
 - Payments are the same as in the dominant-strategy equilibrium of VCG
 - Worst for search engine and best for advertisers $\left(p^{(i-1)} = p^{v,(i-1)} \right)$
- "Strategy profile B^* is a locally envy-free equilibrium of game Γ . In this equilibrium, each advertiser's position and payment are equal to those in the dominant-strategy equilibrium of the game induced by VCG. In any other locally envy-free equilibrium of game Γ , the total revenue of the seller is at least as high as in B^* ."

5. Main Result: GSP and Generalized English Auction



GSP and Generalized English Auction

- A clock showing the current price: 1¢, 2¢, 3¢...
- A bid is the price at the time of dropping out
- Payments computed according to GSP rules (pay price where last advertiser dropped out: second price!)
- Private information of bidders private value
- # of slots: $N \geq 2$
- # of advertisers $K \geq N+1$



GSP and Generalized English Auction

Generalized English Auction with GSP rules: Example

- 2 slots, 3 players (valuations: \$10, \$4, \$2)
- Clock starts: 1¢, 2¢, 3¢...
- Player 3 drops out at \$2 – gets no slot, pays nothing!
- Player 2 has α_1 : 200 clicks in slot 1, α_2 : 100 clicks in slot 2. If he drops out now (at $\geq \$2.01$), he gets 100 clicks at \$2 (profit: $(\$4 - \$2) * 100 = \$200$).
- If player 1 drops out before him, player 2 would get position 1 at that price.
- Player 2 stays till he is indifferent between both positions 1 and 2:
- $(4 - p) * 200 \geq \$200 \rightarrow$ drop out at \$3 (bid \neq valuation)!
- Players don't need to know others valuation – see only earlier drop out!



GSP and Generalized English Auction

THEOREM 2: In the unique perfect Bayesian equilibrium...

$$p_k(i, h, s_k) = s_k - \frac{\alpha_i}{\alpha_{i-1}} (s_k - b_{i+1})$$

p_k : Moment of dropping out of player k dependent on

i : # of remaining advertisers (= position of slot),

h : the history of the game

s_k : valuation for one click for player k

α_i : expected number of clicks in position i

α_{i-1} : expected # of clicks in position $i-1$, i.e. if he stays in the game for the next position above

b_{i+1} : the last bid in the history where somebody else dropped out and got position $i+1$

→ position and payoff equals VCG-equilibrium (ex post)

GSP and Generalized English Auction

THEOREM 2: In the unique perfect Bayesian equilibrium...

$$p_k(i, h, s_k) = s_k - \frac{\alpha_i}{\alpha_{i-1}} (s_k - b_{i+1})$$

In our Example: $3 = 4 - \frac{100}{200} (\$4 - \$2)$

➔ position and payoff equals VCG-equilibrium (ex post)

Main Result: GSP and Generalized English Auction

English auction that corresponds to GSP has

- unique (ex post) equilibrium
- same payoffs to all players as the dominant strategy equilibrium of VCG

6. Discussion

