# Multi-unit Auctions 

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- There are $n$ bidders
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- For each bidder, total demand by other bidders (at price 0 ) exceeds $k$


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- Uniform-price auction
- Vickrey auction


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Discriminatory Each winning bid pays bid amount
Uniform-price Each winning bid pays highest losing bid
Vickrey
Winning bidders pays highest losing bids of other bidders

Auction Rules - example
$k=3, n=3$ and bids submitted are: Bidder 1: (10, 8, 6)
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Multi-unit auctions, single-unit demand
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Uniform-price auction (\& Vickrey auction): $b_{u}(x)=w(x, y)$
Discriminatory auction: $b_{d}(x)=\int_{0}^{x} w(y, y) d L(y \mid x)$,
where $L(y \mid x)=\exp \left(-\int_{y}^{x} \frac{g(t \mid t)}{G(t \mid t)} d t\right)$ and
$g(y \mid x)$ is the density and $G(y \mid x)$ is the cdf of $Y_{k}=y$ given $X_{1}=x$.

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With single-crossing, these auctions are efficient

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For simplicity, assume that $v_{i 1} \geq v_{i 2}$ for all $i$
Bids submitted: $\left(b_{i 1}, b_{i 2}\right)$
The auction selects either two bidders who get one unit each or one bidder who gets two units.

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The Vickrey auction is efficient. It is a dominant strategy for bidders to bid truthfully - that is, bid their valuations.

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when he bid $\left(b_{11}, b_{12}\right)=\left(v_{11}, v_{12}\right)$ or he forgoes a positive payoff or makes a negative payoff.

## Efficiency in multi-unit auctions

Highest bids win. $k=2$ objects, $n \geq 2$ bidders, $v_{i 1} \geq v_{i 2}$.
Let bid strategies be $b_{i 1}\left(v_{i 1}, v_{i 2}\right), b_{i 2}\left(v_{i 1}, v_{i 2}\right)$.

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\text { if } v_{i 1} \lessgtr v_{j 2} \Longleftrightarrow b_{i 1}\left(v_{i 1}, v_{i 2}\right) \lessgtr b_{j 2}\left(v_{j 1}, v_{j 2}\right)
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Conclusion: The Vickrey auction is efficient.

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If two multi-unit auctions have the same allocation rule and the bidder with the lowest valuation has the same expected payoff in both auctions, then the expected revenue is the same in the two auctions.

## Books

(1) Auction Theory by Vijay Krishna, Academic Press.
(2) Putting Auction Theory to Work by Paul Milgrom, Cambridge Univerity Press.
(3) Introduction to Auction Theory by Flavio Menezes and Paulo Monteiro, Oxford University Press.
(9) Auctions: Theory and Practice by Paul Klemperer, Princeton University Press.

