

REALLOCATING SPECTRUM : THE INCENTIVE AUCTION

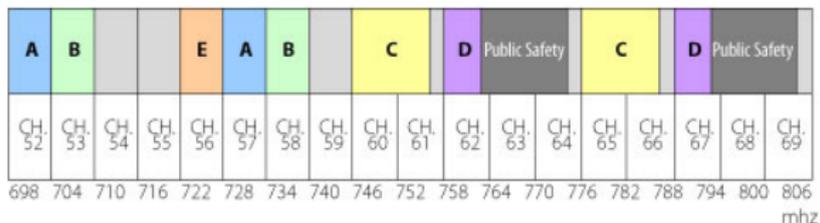
Presented by Alexandre Fréchette

Outline

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 - Motivation
 - Experimenting
 - Risks & Dangers
- 2 Incentive Auction
 - Ambition
 - Proposed Procedure
 - Reverse Auction
- 3 Deferred Acceptance Auction
 - Mechanism
 - Three Interesting Properties
- 4 Conclusion
 - Extensions & Real Life

Spectrum Auctions

Governments **auction off** public electromagnetic spectrum.

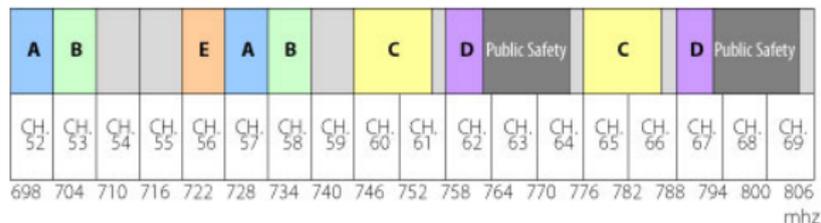


http://wireless.fcc.gov/auctions/default.htm?job=auction_summary&id=73

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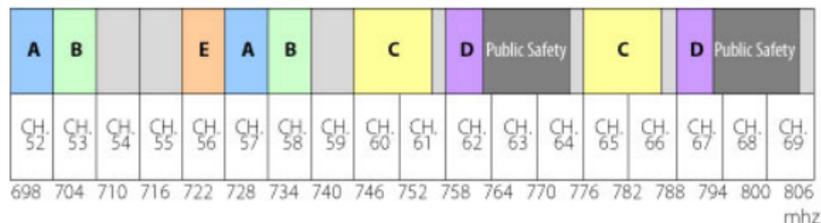


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Spectrum Auctions - *Examples*

Successful applications:

- Since July 1994, the Federal Communications Commission (FCC) has conducted 87 spectrum auctions, which raised over \$60 billion for the U.S. Treasury.
- A UK auction in 2000 generated €38.3 billion in revenue.
- The latest Canadian auction held in February 2014 raised \$5.3 billion.

One of the best test bed for **high-stakes auction design**.

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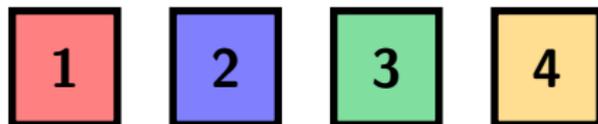
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A Game - *Reenacting the Turkish Auction of 2000* [1]

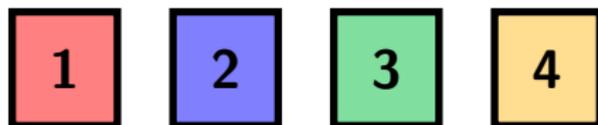
Spectrum Blocks:



- 1 You have your **private value/budget**.
- 2 Auction off **one block at a time**, using **first price auction**.
- 3 **Reserve/starting price** of block i is final price of block $i - 1$.
- 4 Your utility is the **fraction of sold blocks you own**.

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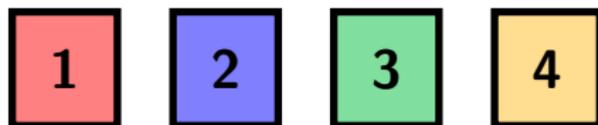
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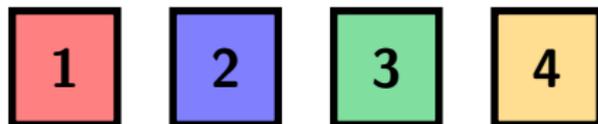
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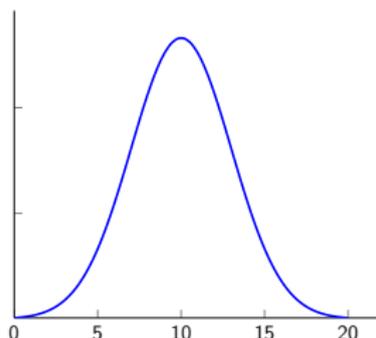
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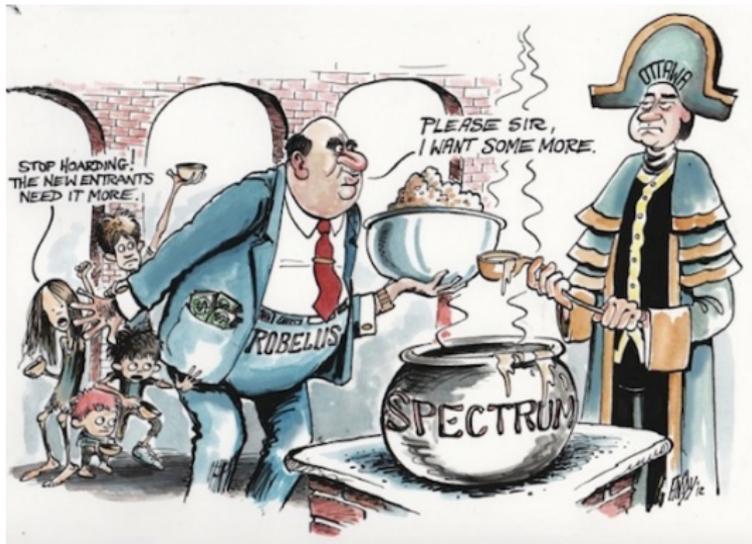
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Value distribution - normal with mean 10 and standard deviation 3.



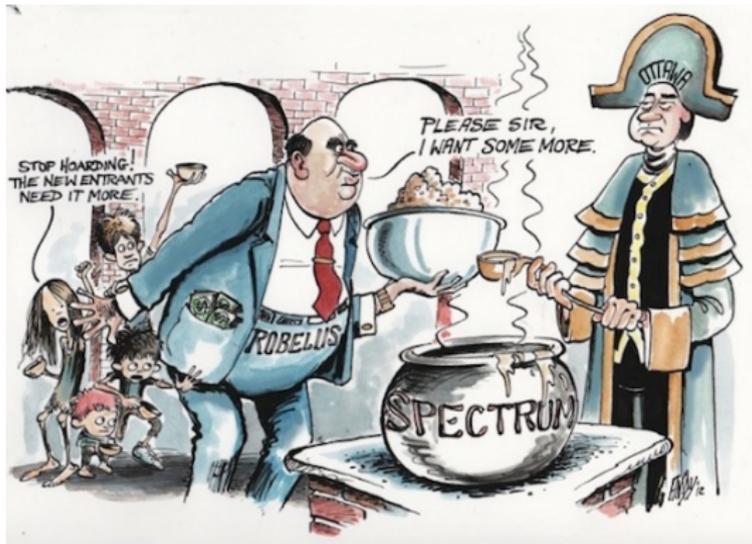
High-Stakes Does Not Guarantee High Quality



CNW Group/Mobility

Spectrum auction design is a **complex** problem, and has serious consequences when done inadequately [2].

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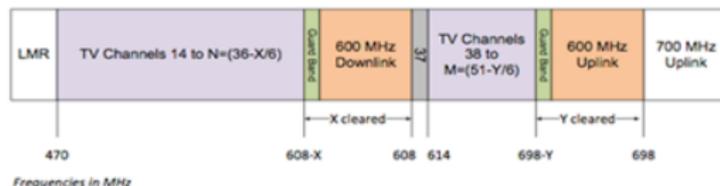
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Incentive Auction

The FCC wants to **provide more spectrum** for mobile companies to fuel the next generation of products by buying some off broadcast television companies, and selling it to telecoms.

Proposed 600 MHz Band Plan



<http://www.hlspectrumreview.com/2012/10/articles/auctions/>

[united-states-rulemaking-for-incentive-auction-of-broadcaster-spectrum/](http://www.fcc.gov/record/2012/10/24/2012-07-0001)

Freeing Up Spectrum

Assume some TV stations agree to **go off air**.

Repack the remaining (on-air) stations on a smaller range of channels **without causing interferences**.

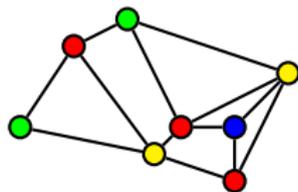
A **graph colouring problem** on a graph with a few thousand vertices and hundred of thousands of edges.

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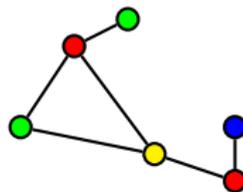
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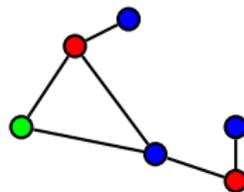
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2. Stations Go Off Air



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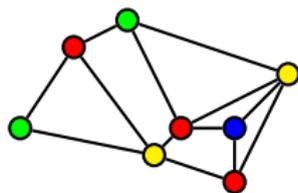
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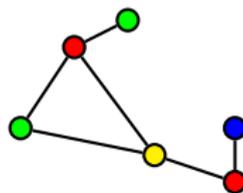
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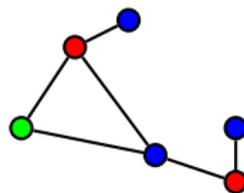
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Nick Arnosti, Auctionomics

Incentive Auction [4]

Three components acting in unison:

- (1) **Reverse auction** to buy spectrum off TV stations, and meet a clearing target.
- (2) **Forward (ascending prices) auction** to sell cleared spectrum to mobile companies;
A slight adaptation of the successful clock auction previously used.
- (3) Coordination mechanism to direct reallocation goals;
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Reverse Auction

Which stations should we compensate, and **how much** should we give them? *“That’s easy, just use VCG!”*

Let N be the **set of stations**, let $\mathcal{F} \subseteq 2^N$ be the collection of subsets of stations that can **feasibly be repacked**.

Then given bids $\hat{b} \in \mathbb{R}^N$,

$$x^{\text{VCG}}(\hat{b}) = \arg \min_{S \in \mathcal{F}} \sum_{i \in S} \hat{b}_i.$$

This is the **MINIMUM WEIGHT GRAPH COLOURING PROBLEM** on a very large graph, an **NP-complete** optimization problem that is **very hard to solve in practice**.

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Deferred Acceptance Auction

Alternate mechanism for the reverse auction [4, 3].

“Deferred-acceptance (DA) auctions choose allocations by an **iterative process of rejecting the least attractive bid.**”

Heavily inspired from the **Gale-Shapley deferred acceptance algorithm** for stable matchings.

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Allocation Rule

At each step t of the DA auction, we have a set $A_t \subseteq N$ of **active bidders**.

The DA auction is specified by **scoring functions** for any active set $A \subseteq N$ and station $i \in A$

$$s_i^A : B_i \times B^{M \setminus A} \rightarrow \mathbb{R}^+,$$

where B_i is the “bid space” of station i . Scoring functions must be **non-decreasing in their first argument**.

Then at each step the DA auction **removes from its active set the bidders with highest non-zero bid scores**, and otherwise returns $\chi^{\text{DA}}(\hat{b}_t) = A_t$ if all scores are zero.

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Simplest DA Algorithm for the Reverse Auction

For the reverse auction, A can be thought of as the “packable” stations. Then a simple scoring function give **non-zero score only to repackable bidders**:

$$s_i^A(\hat{b}) = \begin{cases} 0 & \text{if } N \setminus A \cup \{i\} \notin \mathcal{F} \\ \hat{b}_i & \text{otherwise} \end{cases}$$

This only requires to **check feasibility**, instead of actually optimizing over feasible sets of stations. Still **NP**-complete, but empirically easier.

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Payment Rules

Pay-as-bid / first-price payments:

$$\varphi_i^{\text{FP}}(\hat{b}) = \begin{cases} \hat{b}_i & \text{if } i \in A \\ 0 & \text{otherwise} \end{cases}$$

Threshold price - highest bid without changing outcome:

$$\varphi_i^{\text{TP}}(\hat{b}) = \max\{b \in B_i : i \in \chi^{\text{DA}}(b, \hat{b}_{-i})\}.$$

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Dominant Strategy Incentive Compatibility

Proposition

A threshold price, deferred acceptance auction $(N, B, \chi^{\text{DA}}, \wp^{\text{TP}})$ is dominant strategy incentive compatible.

Flexibility with Scoring Rules

Added resilience through **various scoring rules**:

- use **imperfect feasibility checking**,
- impose **auction budget constraints**, or
- bound **efficiency** with interference graph specific scoring rules.

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Conclusion

The **nature of the reverse auction** and **intractability of standard techniques** required the design of novel deferred acceptance auction.

This is an ongoing FCC auction design project, with still much to address:

- Generalize to **more than two outcomes**;
e.g. possibility of going to lower quality spectrum instead of just off-air.
- Refine mechanism to get **better efficiency and revenue guarantees**;

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