

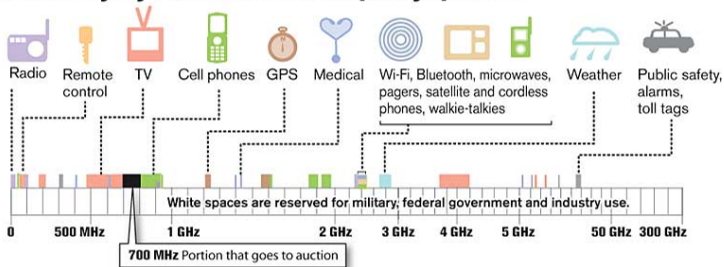
# Truthful Auction for Dynamic Spectrum Acces

December 7, 2011

Precious resource in wireless networks: **Spectrum!**

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### Some everyday uses of the radio frequency spectrum



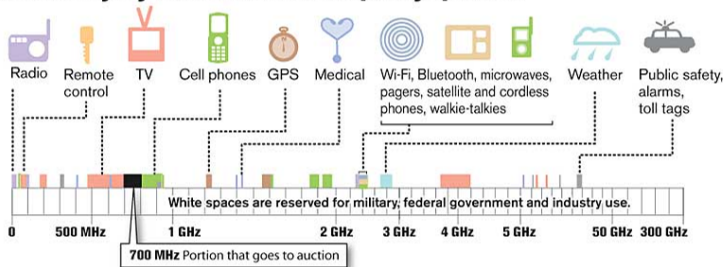
Sources: New America Foundation, FCC

The Boston Globe

Figure: In 2007, **\$19 billion for 700 MHz!**

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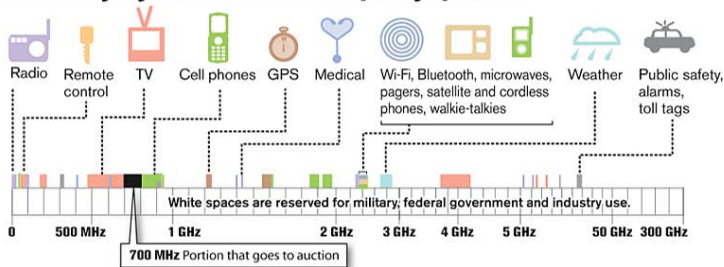
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Figure: In 2007, **\$19 billion for 700 MHz!**

Expensive?

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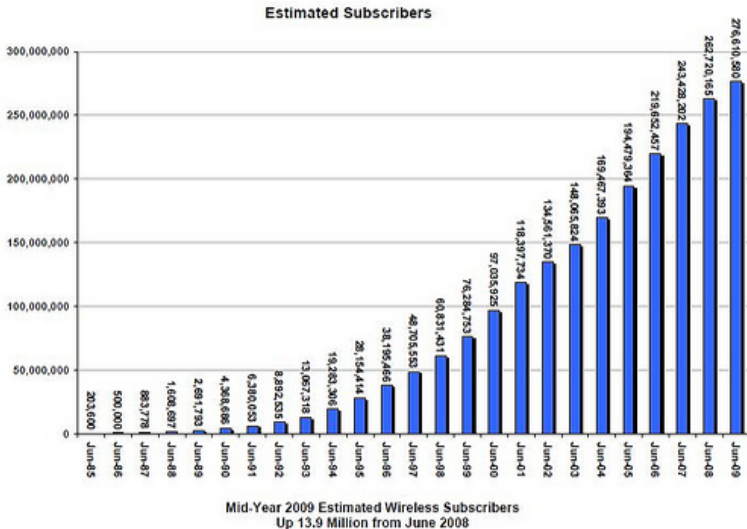
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Figure: In 2007, **\$19 billion for 700 MHz!**

Expensive? Real bargain!

In 2010, **\$120 billion for 300 MHz!**

# Why is spectrum so precious?

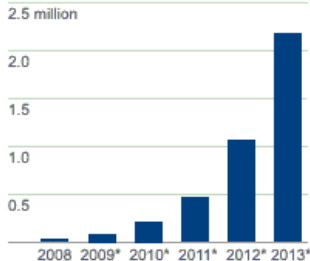


## Why is spectrum so precious? (Cont.)

### On the move

Mobile data traffic, measured in terabytes per month, will keep growing.

#### MOBILE TRAFFIC GROWTH (terabytes/month)



\*FORECAST  
SOURCE: CISCO

# Static spectrum allocation



Seller:





# Static spectrum allocation



Seller:



Buyer:

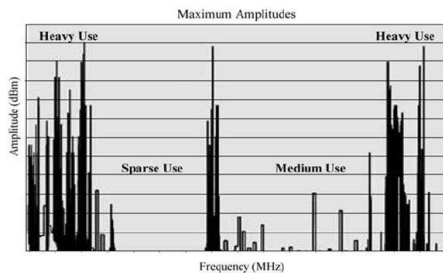


at&t



vodafone





**Figure:** Under-utilized spectrum of licensed users.

Current status: static spectrum allocation into two types,

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**Congested!**

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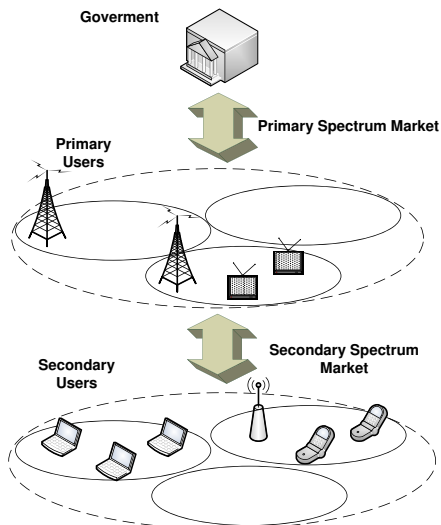
- Let the secondary (unlicensed) user to get the licensed spectrum when the primary (licensed) users are idle;
- Increase the efficiency of spectrum.

Two types of dynamic spectrum access:

- Opportunistic access: spectrum sensing;

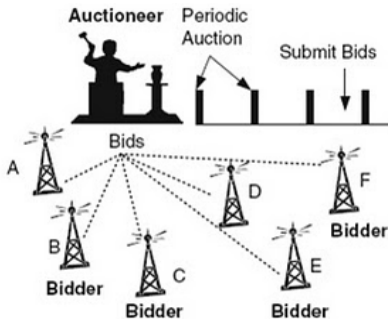
Two types of dynamic spectrum access:

- Opportunistic access: spectrum sensing;
- Negotiated access: *e.g.*, auction-based.



**Figure:** Spectrum Market Structure.

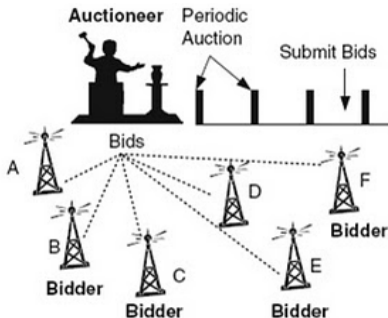
# Spectrum auction



Spectrum auction:

- Incentives for primary users to share idle spectrum resource;

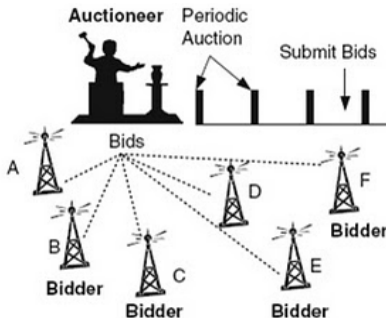
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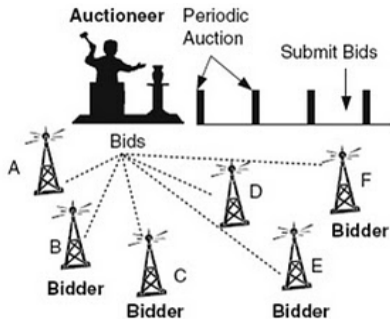


## Spectrum auction:

- Incentives for primary users to share idle spectrum resource;
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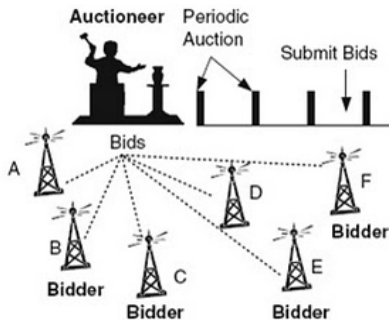


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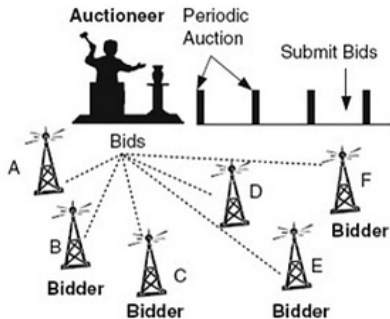
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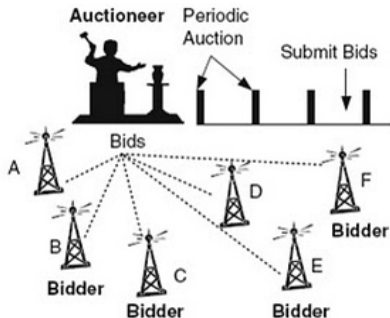
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- Channel request  $d_i$

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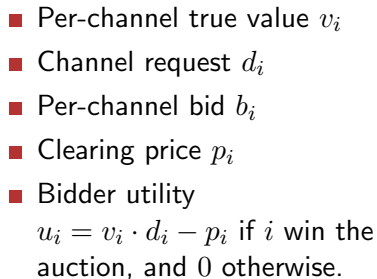


- Per-channel true value  $v_i$
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- Per-channel bid  $b_i$

# Spectrum auction



- Per-channel true value  $v_i$
- Channel request  $d_i$
- Per-channel bid  $b_i$
- Clearing price  $p_i$



## Definition (Truthful Auction)

A truthful auction is one in which no bidder  $i$  can obtain higher utility  $u_i$  by setting  $b_i \neq v_i$ .

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- To bidder:
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- To auctioneer:
  - Encourage bidders to reveal their true values;
  - Increase its revenue by assigning spectrum to bidders valuing it most.



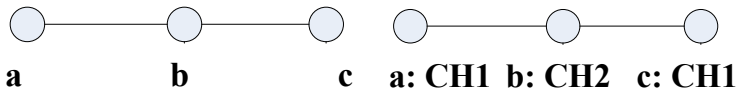
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Reason: unlike good (e.g., paintings, bonds, electricity), spectrum is **reusable** among non-conflicting bidders. Optimal channel allocation is a maximum-weighted independent set problem (NP-hard).



**Figure:** Example on spectrum allocations. (Left) The conflict graph with 3 bidders; (Right) The optimal spectrum allocation with 2 channels.

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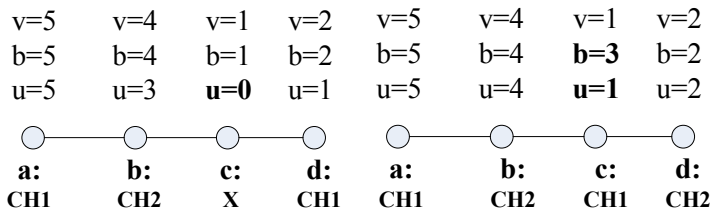
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- Pricing for winner  $i$ : the highest price of its unallocated conflicting neighbors. 0 if there is no such neighbor.



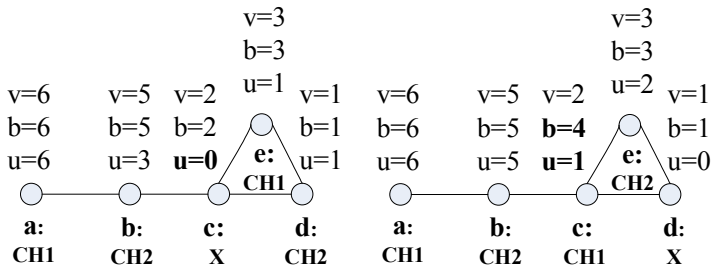
**Figure:** Example with secondary pricing. (Left) All bidders truthfully bid; (Right) Bidder  $c$  improves its utility by bidding higher than its true value.

VCG-style spectrum auction:

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- Pricing for winner  $i$ : the bid of its first rejected neighbor who would have been allocated if  $i$  were absent from the auction.  
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**Figure:** Example with VCG. (Left) All bidders truthfully bid; (Right) Bidder  $c$  improves its utility by bidding higher than its true value.

VERITAS <sup>1</sup>

## ■ Allocation:

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## Definition (Critical Neighbor)

Given  $\{B/b_i\}^2$ , a critical neighbor  $C(i)$  of bidder  $i$  is a bidder in  $N(i)$  where if  $i$  bids lower than  $C(i)$ ,  $i$  will not be allocated, and if  $i$  bids higher than  $C(i)$ ,  $i$  will be allocated.

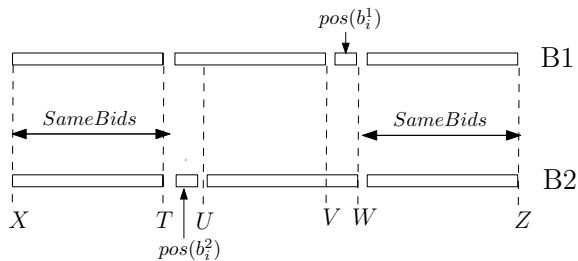
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<sup>2</sup> $B = \{b_1, \dots, b_n\}$  is the set of all bids.



## Lemma (Monotonic Allocation 1)

*If any bidder  $i$  is allocated by bidding  $b_i^1$ , it will also be allocated if it bids  $b_i^2$ , where  $b_i^2 > b_i^1$  (provided all the other bids and channel demands remain the same).*



## Lemma (Monotonic Allocation 2)

*If any bidder  $i$  is rejected by bidding  $b_i^2$ , it will also be rejected if it bids  $b_i^1$ , where  $b_i^2 > b_i^1$  (provided all the other bids and channel demands remain the same).*

### Lemma (Critical Neighbor/Value)

*For any bidder  $i$ , if  $i$  would be rejected by bidding some value, then there exists a unique position in the sorted bid list, such that if  $i$ 's bid is placed before that position  $i$  will win, and if  $i$ 's bid is placed after that position it will lose. Moreover, that position is occupied by one of  $i$ 's neighbors in  $N(i)$ <sup>3</sup>.*

---

<sup>3</sup> $N(i)$  is the neighbor of  $i$  in the conflict graph

## Lemma

*For each winner  $i$  in VERITAS, its clearing price is less than (or equal to) its submitted bid  $b_i$  multiplied by the number of requested channels  $d_i$ .*

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Proof by two cases:

- $i$  always win: charged by 0;
- Otherwise: charged by critical value,  $\leq b_i$ .

## Theorem (Truthfulness)

*VERITAS spectrum auction is truthful.*

Proof.

Cases	1	2	3	4
$i$ bids $b_i$	X	X	✓	✓
$i$ bids $v_i$	X	✓	X	✓

Table: Four possible allocation results.

If  $b_i > v_i$ :

If  $b_i < v_i$ :



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# Summary

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# Thank You!

Q&A