



SPECTRUM MARKETS

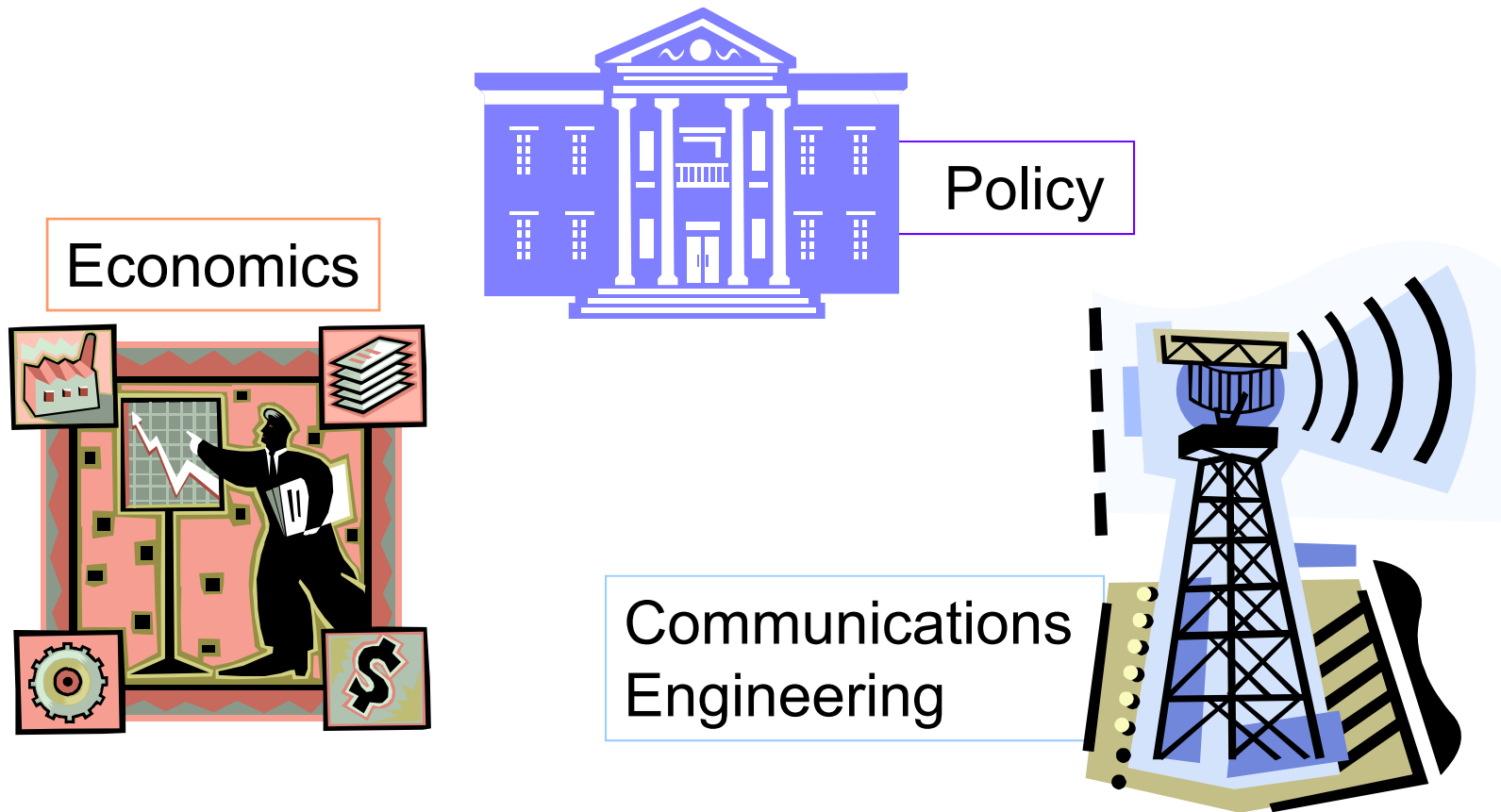
Randall Berry, Michael Honig
Department of EECS
Northwestern University

May 2011

DySPAN Conference, Aachen, Germany

Spectrum Management

2



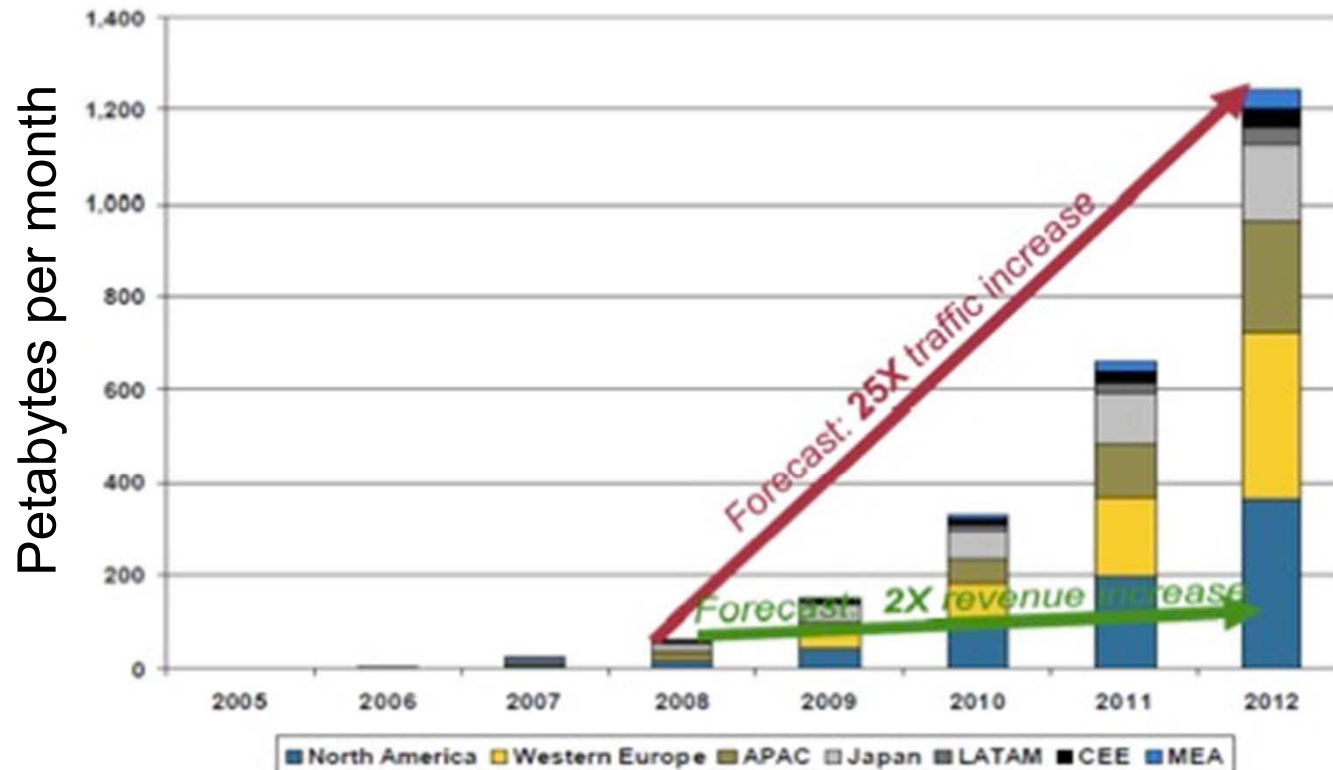
Why This Tutorial?

5

- Timely and relevant
 - ▣ New policies are needed for spectrum allocation.
 - ▣ Markets are natural policy candidates.
- Markets for spectrum pose unique challenges/questions.
 - ▣ Definition of property rights, interference externalities
 - ▣ Efficiency, incentives, wireless system design
- Interplay between economics and engineering issues

Spectrum “Crunch”

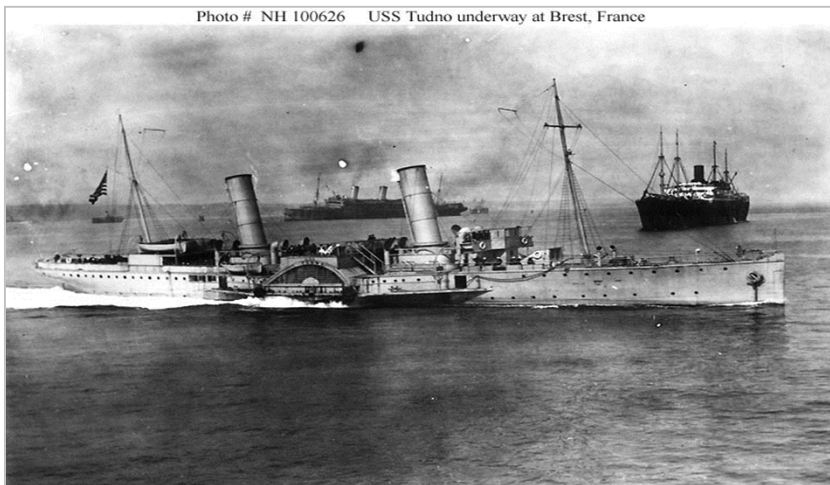
12



Sources: Cisco, from Operators' network data and Analysts, 2008; Informa, 2008; and Pyramid, "Mobile data revenue will double by 2012," Dan Locke, Analyst Insight, 4/2008.

Regulation Prior to 1927: Open to All

13



Earliest uses of wireless for ship-to-ship, ship-to-shore communications.



Broadcast radio begins in 1921.

Licenses issued by the Department of Commerce.

Regulation since 1927: “Command and Control”

17

- Federal Radio Commission (FRC) established in 1927.
- Federal Communications Commission (FCC) established in 1934.
- Maintains authority to
 - ▣ Grant / renew / deny licenses for spectrum use.
 - ▣ Assign applications to particular frequencies.
 - ▣ Police content and use



An Economist's Proposal

25



R. Coase, "The federal communications commission,"
J. Law and Economics, pp. 1–40, 1959.

Introduce spectrum property rights, sell to highest bidders, do not restrict use.

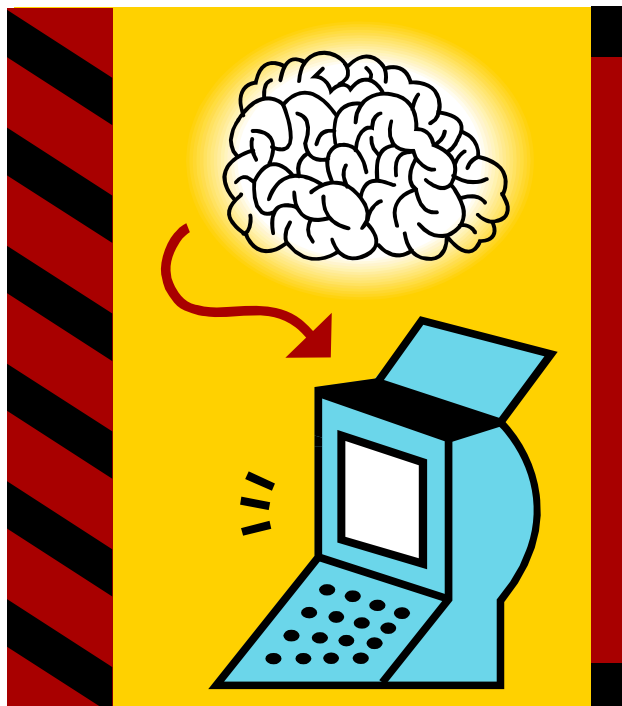
Coase's "Theorem": In the absence of transaction costs, spectrum owners will trade rights so that the outcome allocates spectrum to best use.

Ronald Coase,
1991 Nobel Laureate in Economics

Spectrum auctions finally introduced in the 1990s.
Restrictions on use remain.

Engineering Approach to Spectrum Crunch

27



Cognitive Radio
Mitola and Maguire (1999)

- Add intelligence to mobile devices
 - ▣ Frequency agility
 - ▣ Wideband sensing
 - ▣ Interference avoidance
 - ▣ Adaptive quality of service (context aware)
- Enables **spectrum scavenging**

Spectrum Sharing Models

29

- Exclusive use
- Commons
- Hierarchical

Exclusive Use

31



- Spectrum owned by government
 - ▣ Licensed to particular application, service provider
 - ▣ Rigid use rules
- Spectrum is private property
 - ▣ Applications, technical constraints decided by markets
- “Liberal” licenses
 - ▣ Spectrum publicly owned, but licenses can be transferred, liberal use rules
 - ▣ Secondary markets (2003)

Spectrum Commons

32

- Unlicensed
- Requires etiquette rules for sharing



- State-regulated
 - Spectrum owned by government
 - Etiquette rules part of industry standard (802.11)
- Privately owned
 - Owner sets rules, polices band
 - Revenue from selling approved equipment

Hierarchical

33

- Primary and secondary users
- Secondary users must not disrupt primary users
- Relies on cognitive radio



- State-regulated
 - Spectrum owned by government
 - Use rules for secondary users part of standard (802.22)
- Private contracts with “spectrum scavengers”
 - Interference levels/payments set by mutual agreement

59

Market Design

Asset Design

Market Mechanisms

Examples

Focus

60

- Designing a *dynamic* market for spectrum.
 - “Short-term” allocations done in “real-time”
 - “Small” spatial-scale

- Consider *one entity* responsible for *leasing/selling* spectrum to multiple agents.

Does Market Design Matter?

71

- Coase's theorem states that given no transaction costs and well-defined property rights, owners will bargain and reach an Pareto efficient outcome.
- Do we need to worry about designing a market?

Caveats

72

- Non-zero transaction costs
- Multilateral externalities
- **Private information**

Private Information

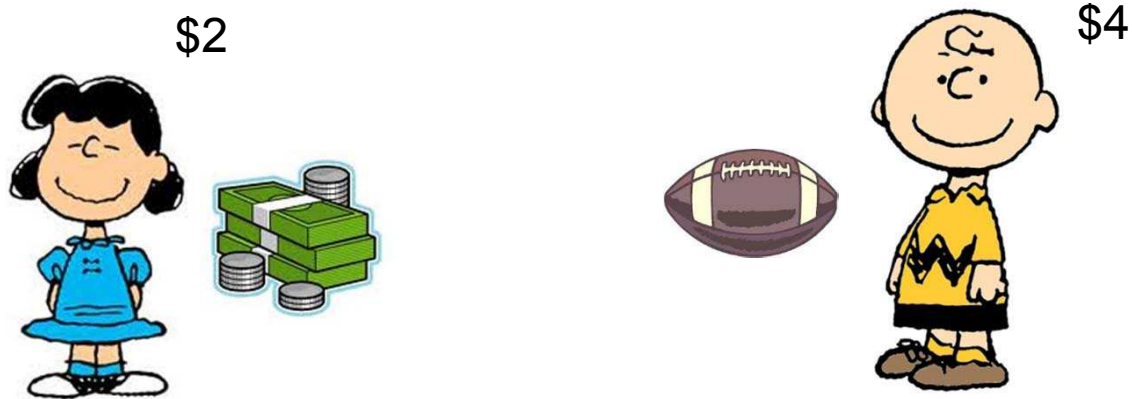
73



- If Lucy knows Charlie's value \Rightarrow can make an offer to sell at $\$4 - \epsilon$.

Private Information

74



- If Lucy knows Charlie's value \Rightarrow can make an offer to sell at $\$4 - \epsilon$.
- Efficient outcome.

Private Information

75



- Suppose Lucy only knows that Charlie's value is uniformly distributed on $[0, 10]$.
- Then she would expect to get \$5 from any transaction \Rightarrow no trade.

Pathological Example?

76

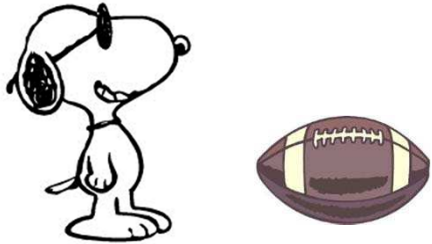
- No.
- **Myerson-Satterthwaite theorem** shows that with private information, under very general conditions there is no way for two parties to trade that is *efficient* and *individually rational*.
- Suggests market design matters.

Markets

77

- Market design has a long history in economics.
 - ▣ Intellectual foundations are **mechanism design/game theory**.

Mechanisms



Mechanism Design Problem

79

- Need to design
 1. Rules for soliciting information
 2. Allocation/payment rule

- Objectives:
 - ▣ Social welfare
 - ▣ Revenue

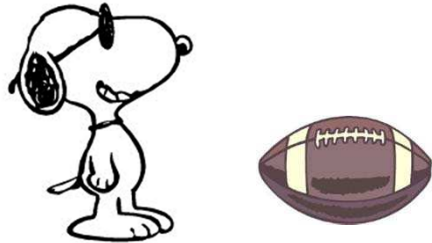
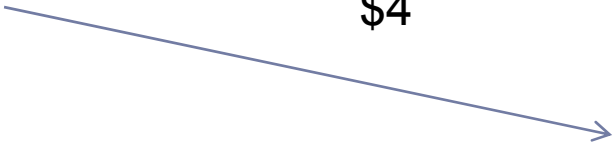
Example: 2nd Price Auction

80

- Mechanism:
 - ▣ User's submit bids.
 - ▣ Mechanism allocates good to highest bidder
 - ▣ User's pay 2nd highest bid.

- User's can be viewed as playing a non-cooperative game.
 - ▣ Use equilibrium concepts from game theory to study performance.

Optimal Bids?



2nd Price Auction



Weakly dominant strategy.

Outcome

82



Pays \$2



2nd Price
Auction

\$2



Pays nothing

Multiple Goods

85

- For a single indivisible good, 2nd price auction gives efficient outcome.
- Unless we are allocating all spectrum to one user, we need to deal with **multiple goods**.

Vickrey-Clarke-Groves (VCG)

86

- VCG mechanisms generalize 2nd price auction to arbitrary “goods.”

Incentive compatible, direct revelation mechanism with the efficient outcome.

VCG Mechanism

87

- Let A = set of alternative allocations.
- Each agent i submits valuation $v_i(a)$ for each $a \in A$.
- Mechanism chooses alternative to maximize $\sum v_i(a)$.
- Charge user i the **marginal cost** they impose on other players:

$$\max_b \sum_{j \neq i} (v_j(b) - v_j(a))$$

Can modify payments by adding terms that only depend on other player's valuations.

Issues with VCG

88

- **Complexity:** VCG requires solving $N+1$ optimization problems for allocating goods to N agents.
- **Overhead:** Required bids may have a high communication costs.
- Requires agents to know values for all alternatives.
- May be susceptible to collusion.

90

Market Design

Asset Design

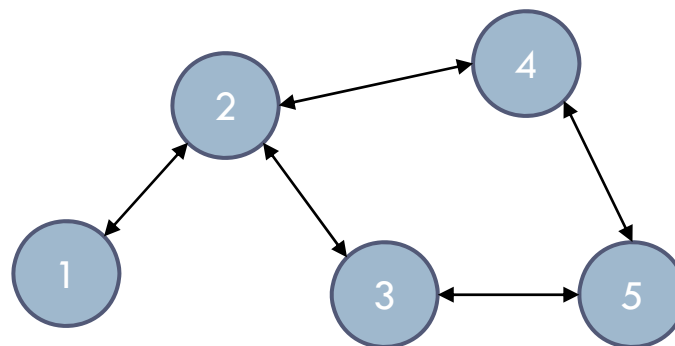
Market Mechanisms

Examples

Basic Model

91

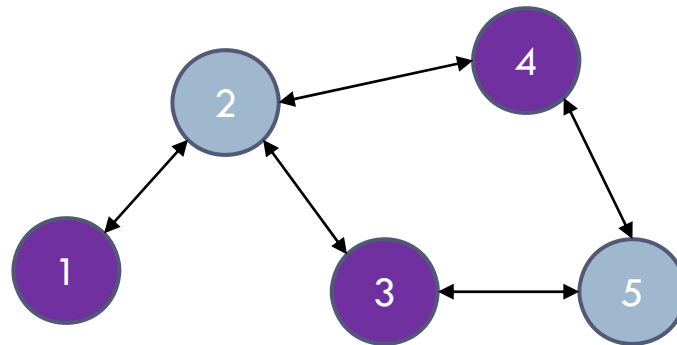
- Consider the allocation of **C** *spectrum assets* to **A** *agents*.
 - ▣ Each asset is right to transmit in given spatial region over a given frequency band for fixed time period.
 - ▣ Model Interference among assets via an *interference graph*.



Static Interference Free Allocation

92

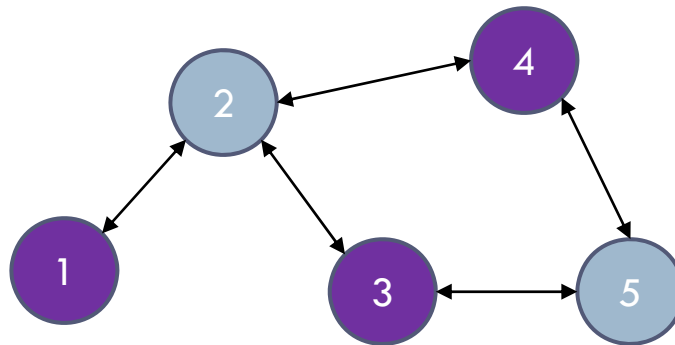
- ▣ Pick a fixed set of *non-interfering* assets.
 - Only allocate these.
- ▣ If agents valuations of different assets are additive \Rightarrow can allocate each using second price auctions.



Static Interference Free Allocation

93

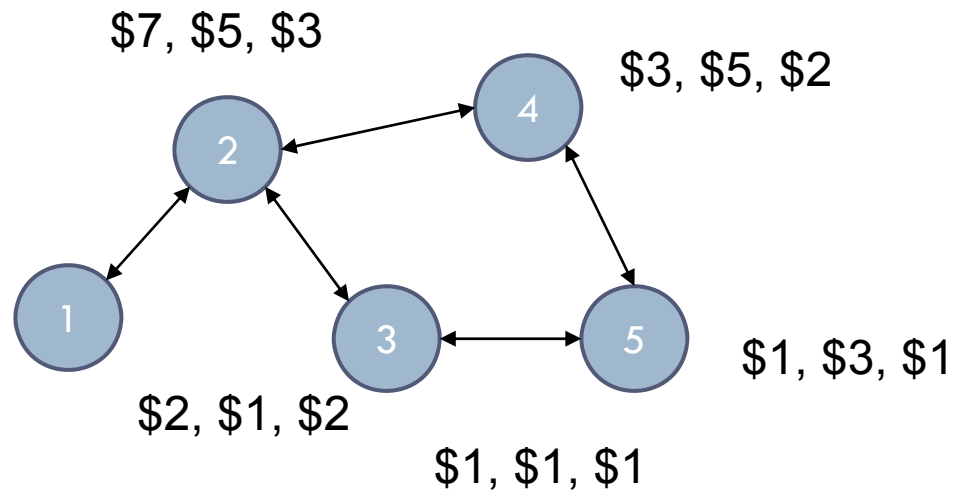
- ▣ Overhead: linear in number of assets.
- ▣ Complexity: $O(CA \log(A))$
- ▣ Issues?



Dynamic Interference Free Allocation

94

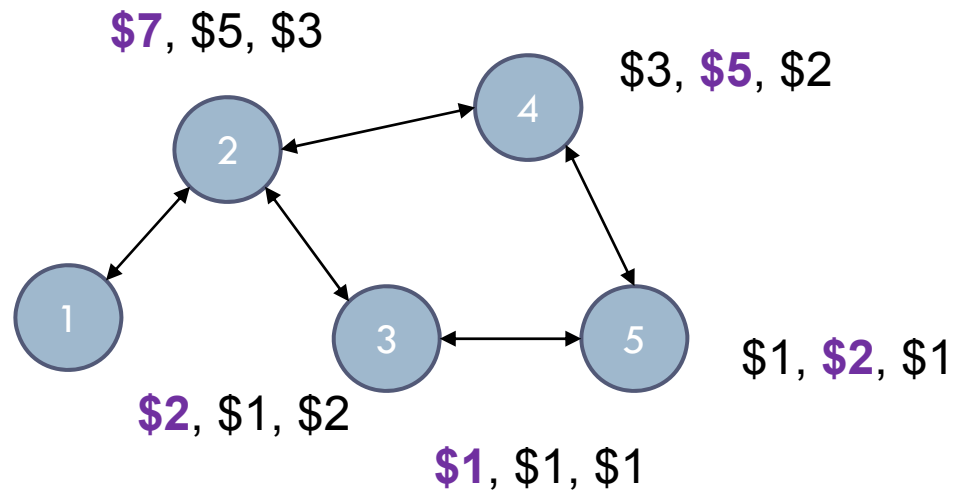
- Let agents bid on *every* asset.
- Allocate an interference free set of assets with the highest bids.



Dynamic Interference Free Allocation

95

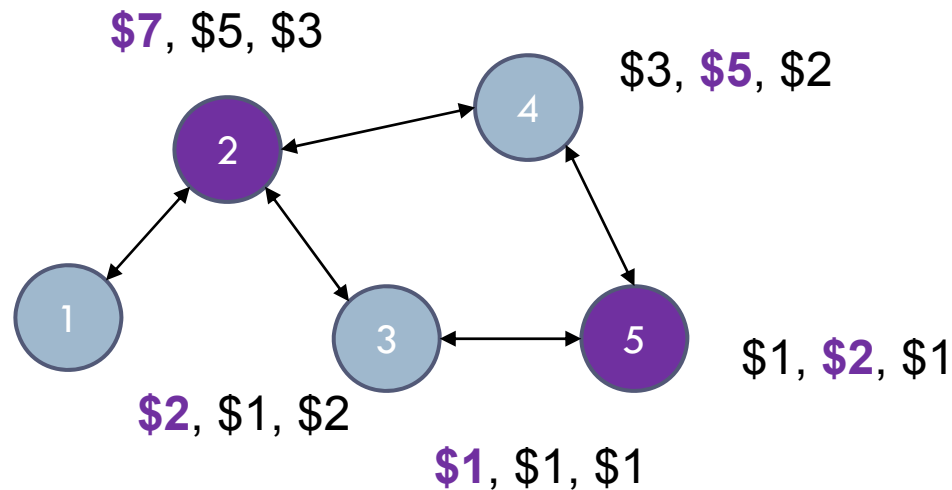
- Let agents bid on *every* asset.
- Allocate an interference free set of assets with the highest bids.



Dynamic Interference Free Allocation

96

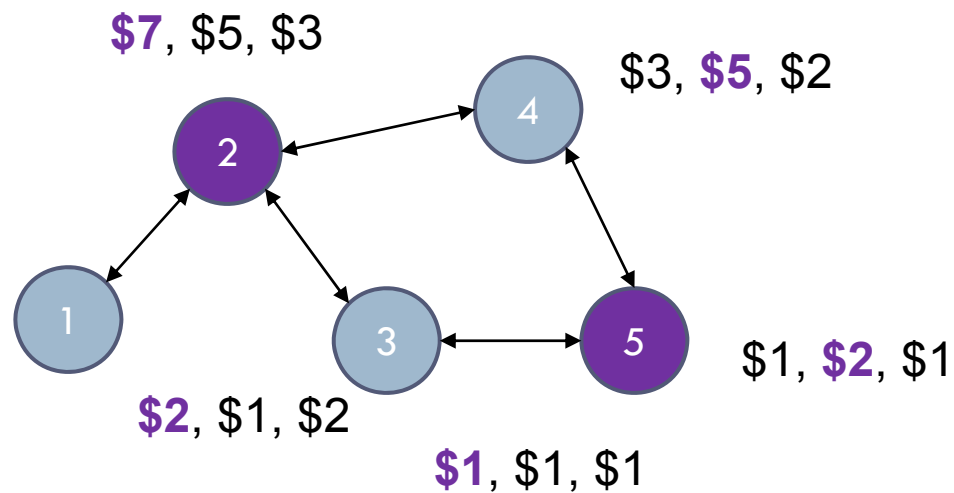
- Let agents bid on *every* asset.
- Allocate an interference free set of assets with the highest bids.
⇒ Maximum weight independent set.



VCG payments

97

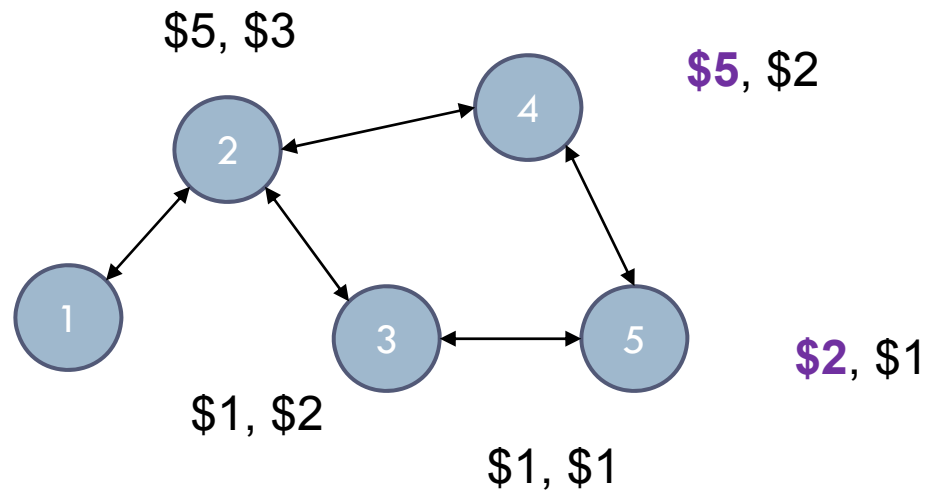
- Consider Agent 1?



VCG Payments

98

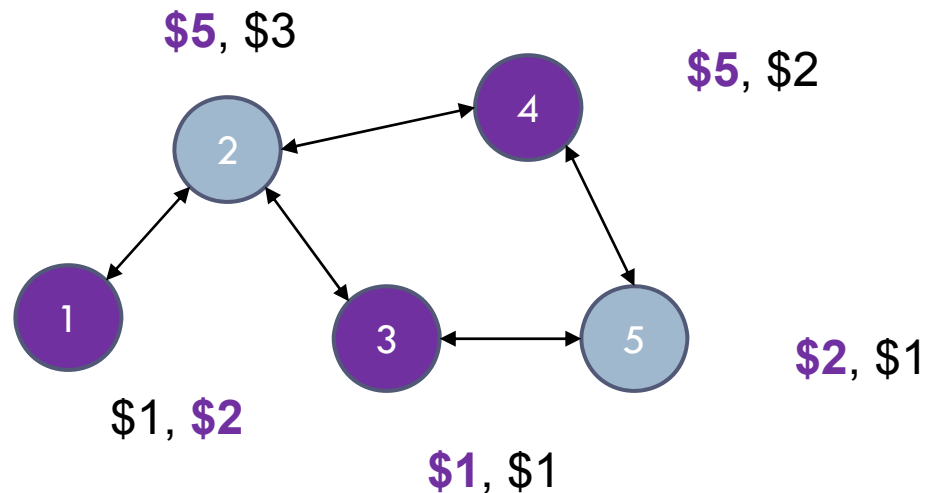
- Consider Agent 1
- Remove Agent's bids



VCG Payments

99

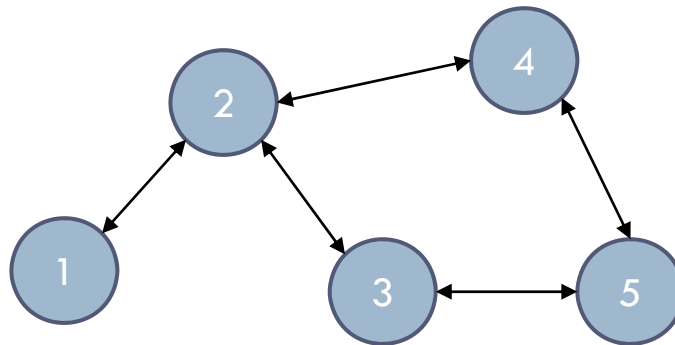
- Consider Agent 1
 - ▣ Remove Agent 1's bids
 - ▣ Re-calculate allocation
 - ▣ Payment = $(6-2) + (2-0) = \$6$



Dynamic Interference Free Allocation

100

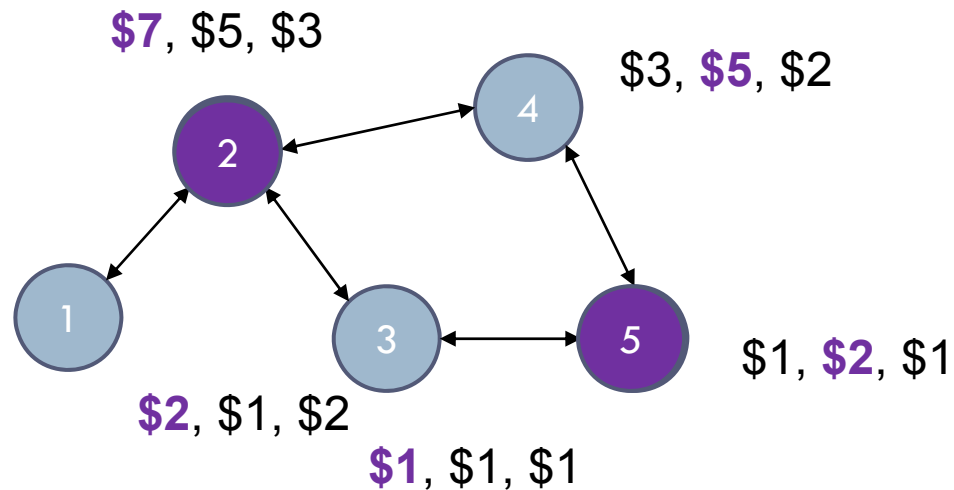
- ❑ Overhead: linear in number of assets.
- ❑ Complexity: NP-hard!
 - Need to find multiple maximum weight independent sets.



Approximations

102

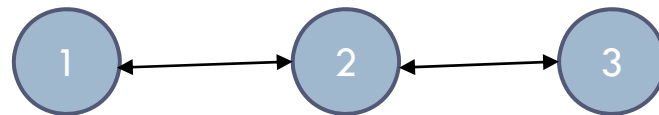
- Consider a greedy approximation:
 - ▣ Order assets by bids and assign from highest to lowest if possible.



Greedy Approximation

103

- No longer Truthful!
 - ▣ Truthful bids \Rightarrow Agent 1 gets Assets 2
 - ▣ Suppose Agent 2 increases bid on 1 to \$4
 - Agent 2 gets Assets 1 and 3 and pays \$3
 - Pay-off = \$4- \$3.



True values	\$1, \$2	\$3 , \$1	\$1, \$2
New bids	\$1, \$4	\$3 , \$1	\$1, \$2

127

Market Organization

Market structures

Competitive Behavior

Owning vs Leasing

136

Owned spectrum asset has unlimited time duration; traded as property (e.g., land).

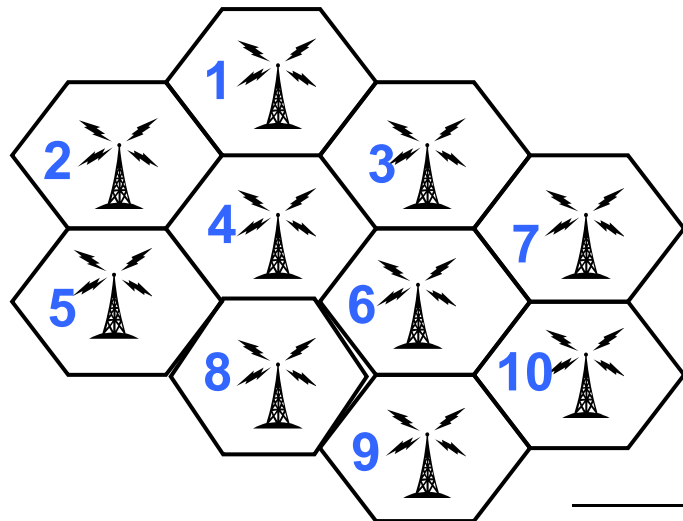
Leased spectrum asset has limited time duration; available through local spot market



Owners can deploy services or rent / lease spectrum assets.
→ **Service providers need not be spectrum owners!**

Two-Tier Spectrum Market

137



	band		
location	3.5 GHz	3.6 GHz	3.7 GHz
cell 1	Owner A	Owner B	Owner A
cell 2	Owner A	Owner B	Owner A
cell 3	Owner A	Owner C	Owner C

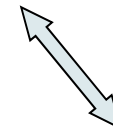
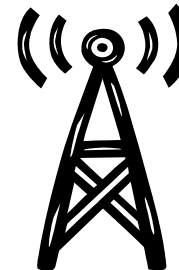
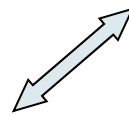


Service requests



Service providers
(Acme Wireless)

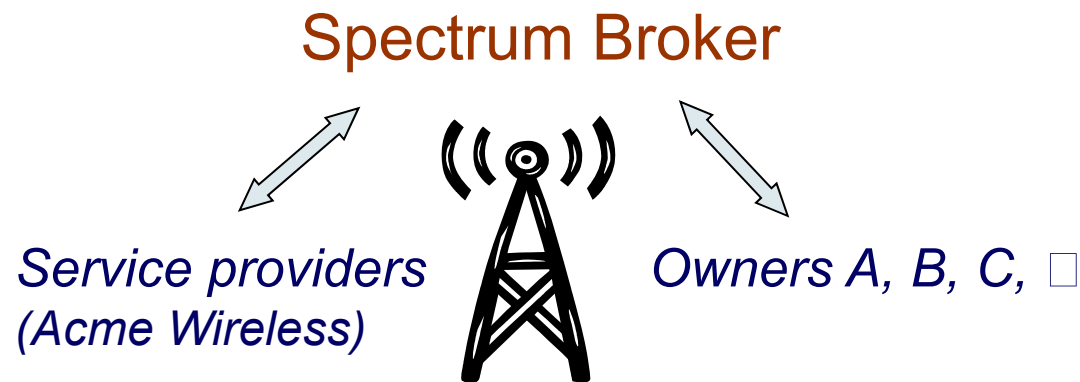
Spectrum Broker



Owners A, B, C, □

Lower-Tier Spot Market

138

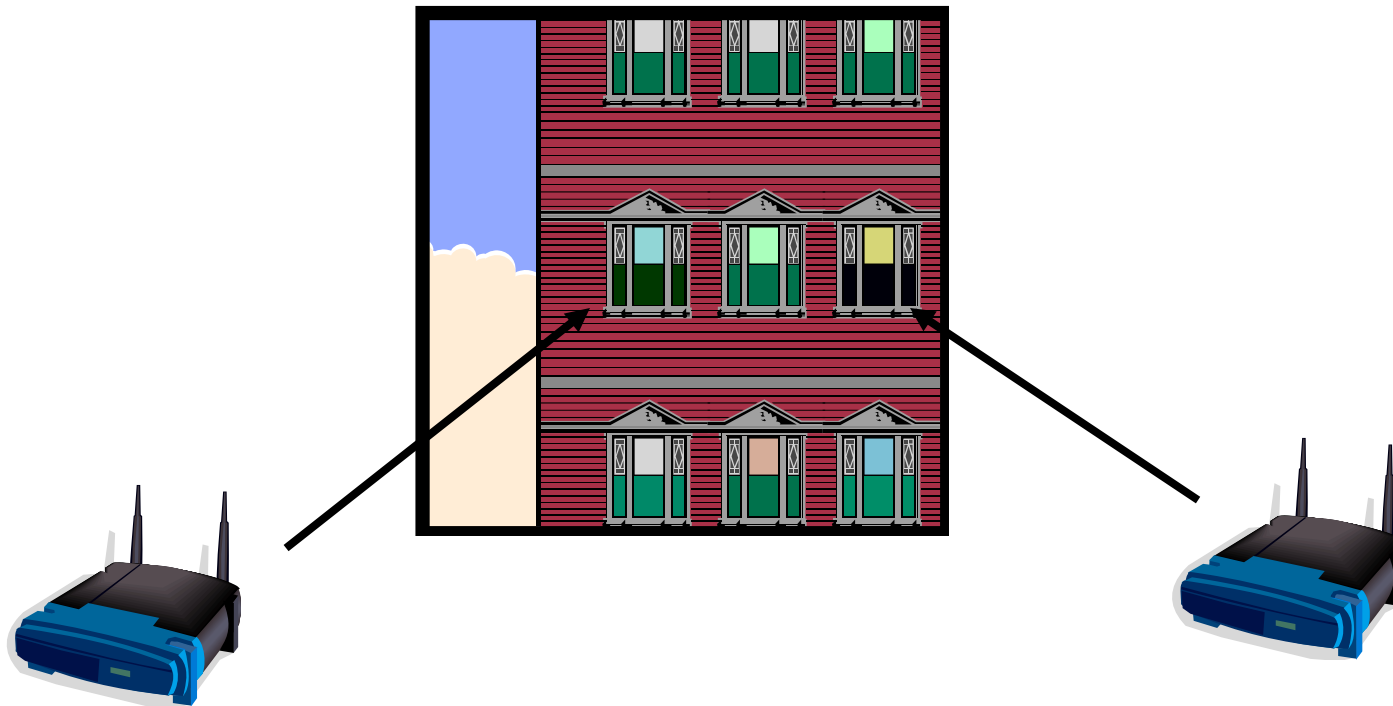


Managed by spectrum broker

- ▣ Sets prices, attempts to clear market
- ▣ Auction mechanism: collects bids; determines allocation
- ▣ Can be automated (“spectrum server”)

Local Transactions

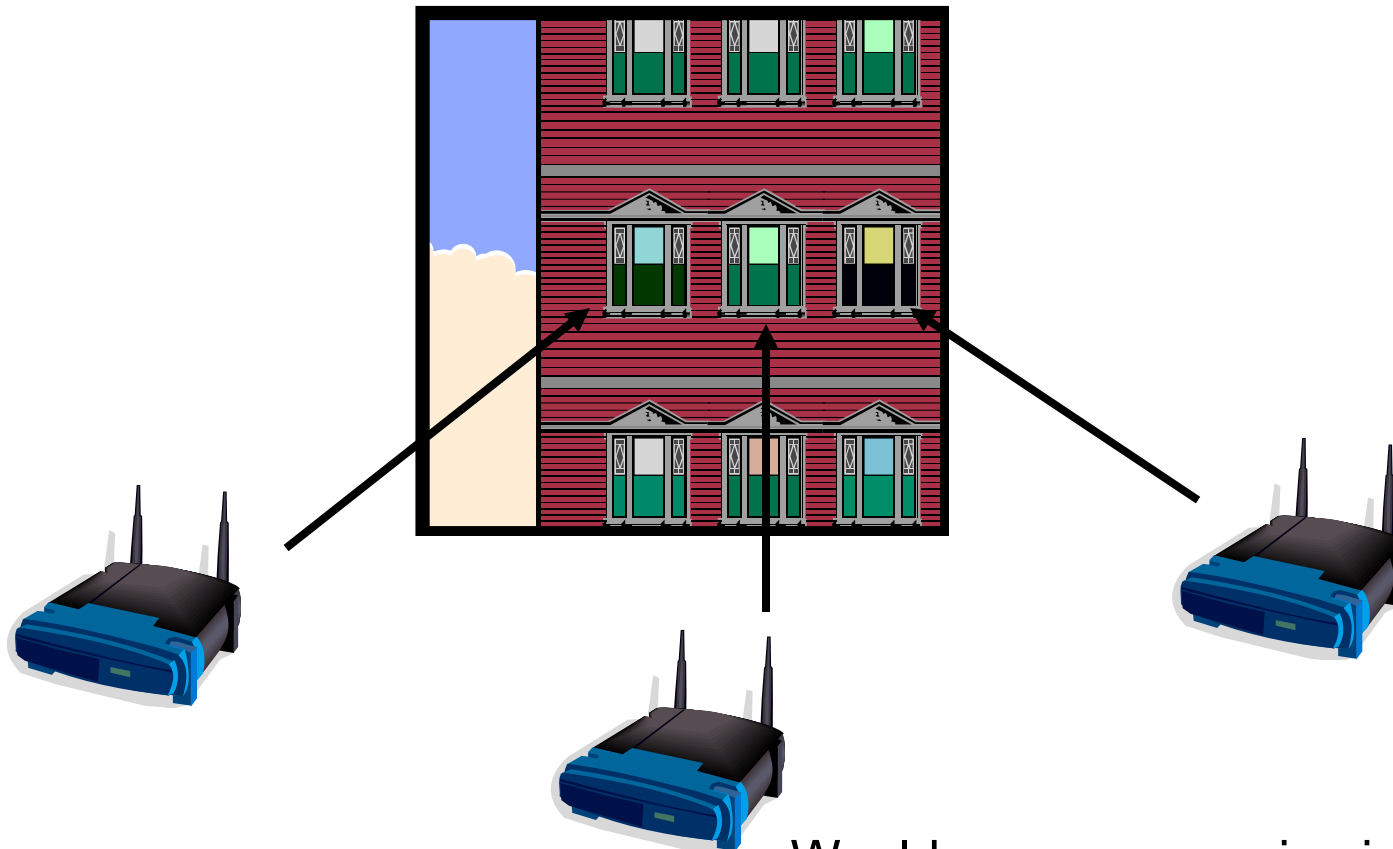
147



Routers use the same channel, cause little interference

Local Transactions

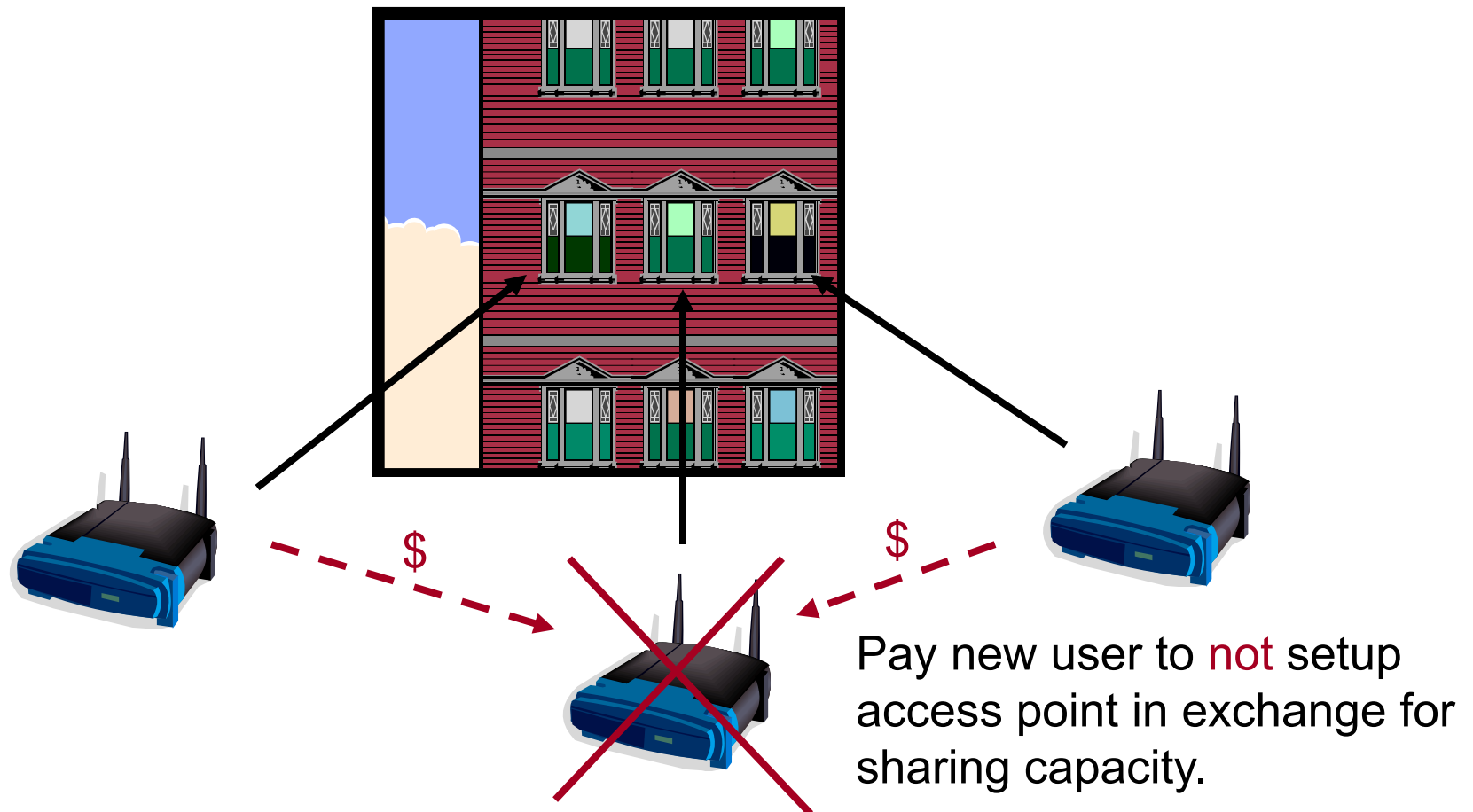
148



Would cause excessive interference.

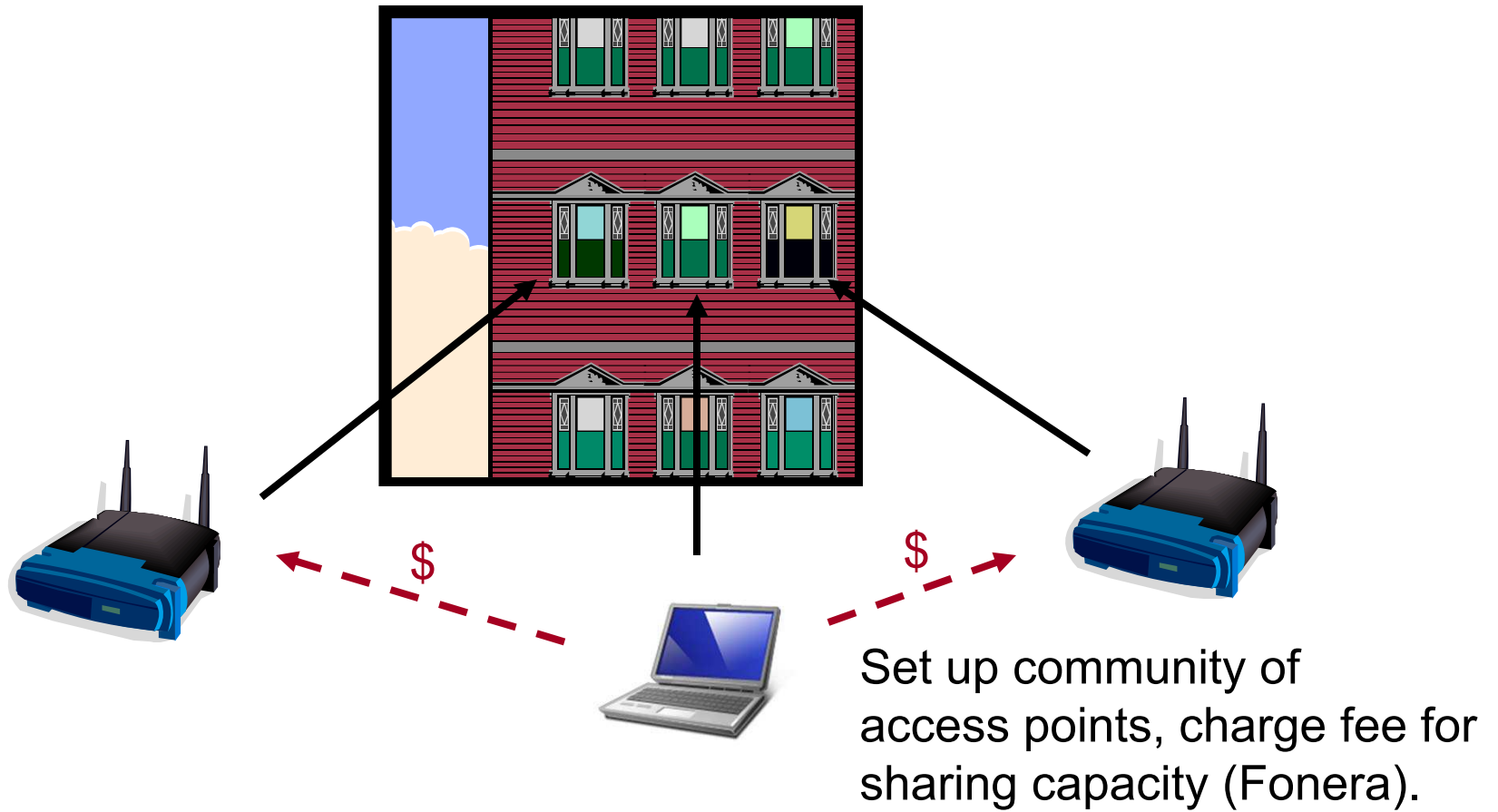
Deterrence Price

149



Usage Price

150



Pricing and Efficiency

151



- **Deployment game:** each user decides whether or not to setup an access point given a fixed deterrence price from neighbors.
- Deterrence pricing can substantially increase efficiency, mitigate interference [Bae et al, DySPAN '09] .