

# Market Design: Lecture 6

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# Recap

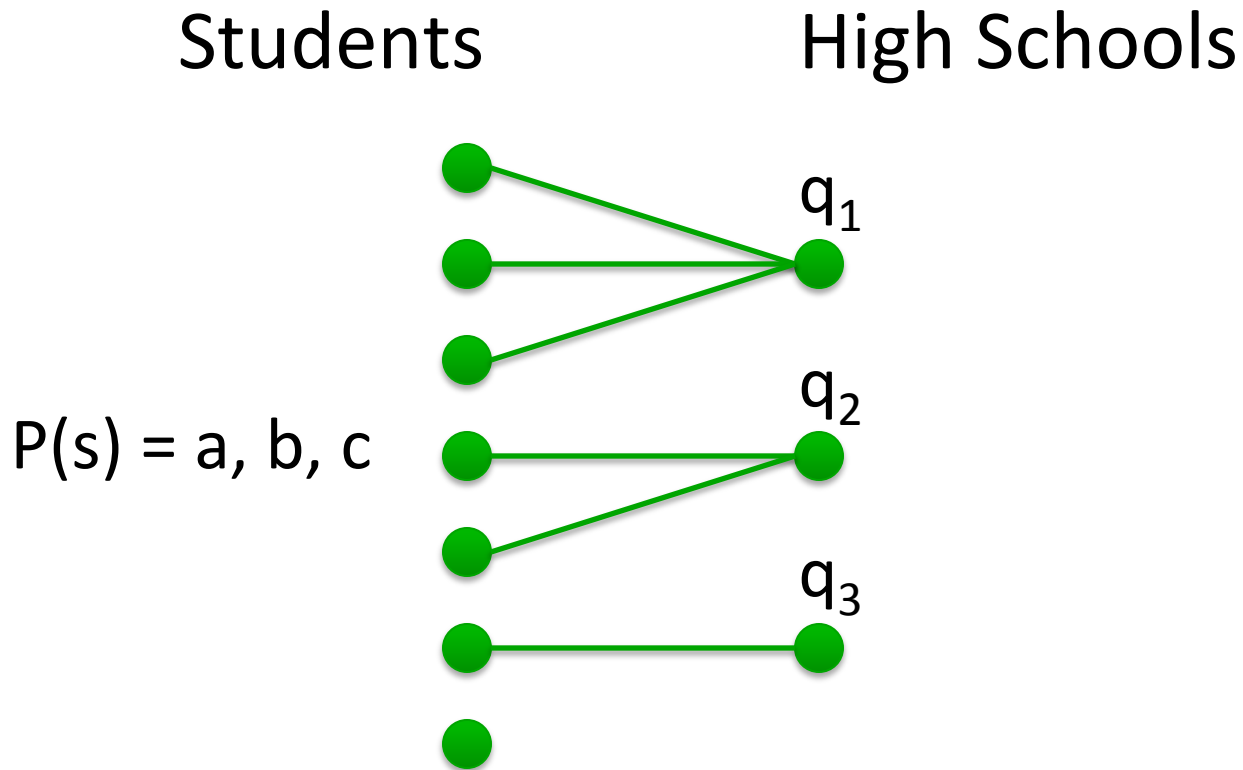
6. b) **Large market results:** incentives, couples

# Outline

- 7. **discrete allocation**: incentives, ordinal efficiency, initial endowments
- 8. **kidney exchange**: implementation, issues

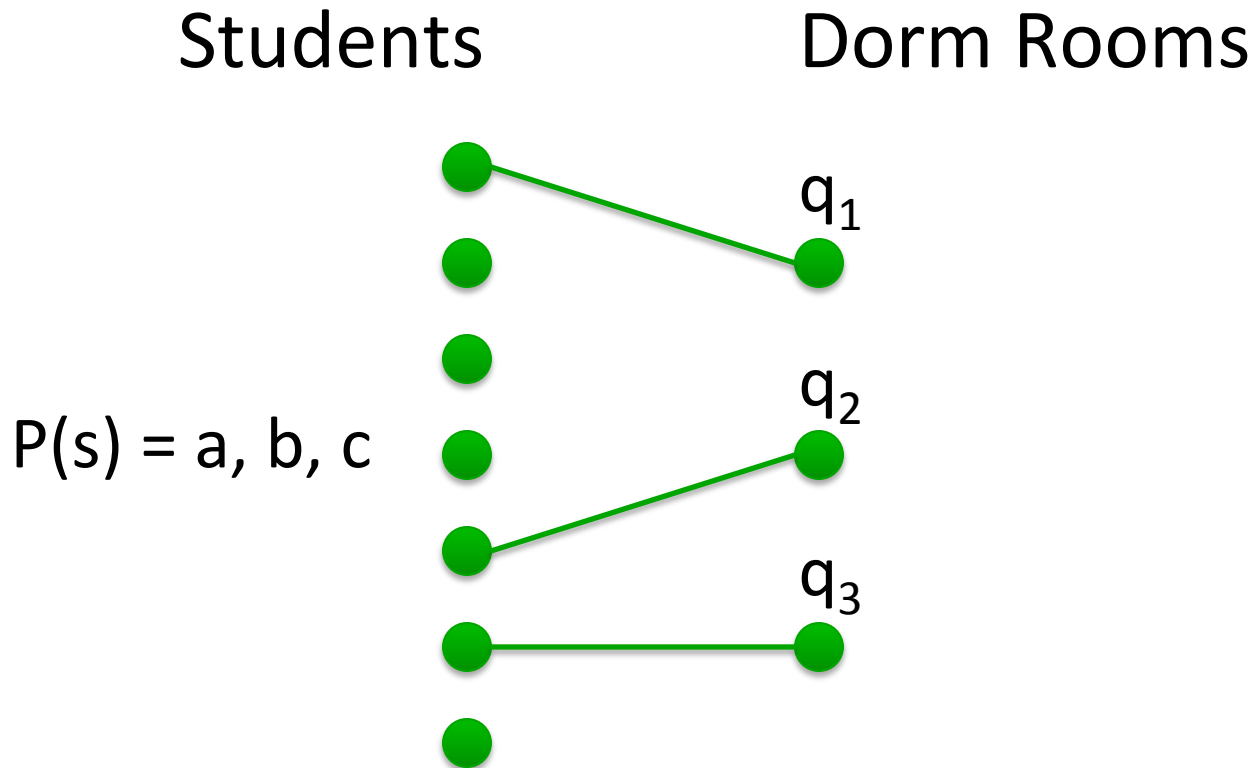
# Part 7: Discrete Allocation.

# Motivation: School Choice



each student has a preference list  $P(\cdot)$  over schools

# Motivation: Housing



each student has a preference list  $P(\cdot)$  over rooms

# Model

Agents

Items

1  
P(i)  
matching  $\mu$  strongly **Pareto efficient** if there is no other matching  $\nu$  such that

- $\nu(i) \geq_i \mu(i)$  for all agents  $i$ ,
- and  $\nu(i) >_i \mu(i)$  for at least one agent  $i$

m

- **market** consists of **agents**, **items**, and **preference list**  $P(i)$  over items for each agent  $i$
- **assignment** is a **matching**  $\mu$  assigning each agent at most one item and each item to at most one agent

# Serial Dictatorship

- Fix priority function  $\pi$  which specifies a permutation of agents.
- For  $i = 1$  to  $n$ , set match of  $\pi(i)$  equal to his favorite remaining item.



# Serial Dictatorship

- agents {1, 2, 3, 4}, items {a, b}
  - agents 1 and 2 prefer a to b
  - agents 3 and 4 prefer b to a
- priority  $\pi(i) = i$ :
  1. agent 1 selects item a, only b remains
  2. agent 2 selects item b, no items remain
  3. agents 3 and 4 are unmatched

# Serial Dictatorship

**Theorem.** Serial dictatorship is truthful and Pareto efficient.

In fact, it is the *only* mechanism that is truthful and satisfies other natural properties

- **neutral**: renaming items doesn't affect match
- **non-bossy**: a manipulating agent can only change the match if his own match changes

# Objection:

Serial dictatorship is not *fair*!

# Lottery Mechanisms

Agents

Items

1 ●

● 1

$P(i$

lottery  $\lambda$  **ex-post efficient** if the support of the distribution only contains Pareto efficient matchings  $\mu$ , i.e.  $\lambda_\mu > 0$  only if  $\mu$  Pareto efficient.

m ●

- **assignment** is a **matching**  $\mu$  assigning each agent at most one item and each item to at most one agent
- **lottery** is a **probability distribution**  $\lambda = (\lambda_\mu)$  over matchings  $\mu$  such that  $\sum_\mu \lambda_\mu = 1$

# Random Assignment

$$X = \begin{pmatrix} \sum & \text{M} & \\ \begin{pmatrix} 1/3 & 1/3 & 1/3 \\ 2/3 & 1/6 & 1/6 \\ 0 & 1/2 & 1/2 \end{pmatrix} & = 1 \end{pmatrix}$$

||  
↪

$x_{ij} = \Pr[\text{agent } i \text{ is matched to item } j]$

$X$  is *bi-stochastic*.

# Lotteries as Random Assignments

Lottery  $\lambda$



$$x_{ij} = \sum_{\mu : \mu(i)=j} \lambda_{\mu}$$



Random assignment  $X$

# Random Assignments as Lotteries

Lottery  $\lambda$



Birkoff-von Neumann Theorem



Random assignment  $X$

# Birkoff-von Neumann

**Theorem.** Any bi-stochastic matrix can be written as the convex combination of permutation matrices (i.e., matchings).

$$\begin{pmatrix} 1/2 & 1/2 & 0 \\ 1/2 & 0 & 1/2 \\ 0 & 1/2 & 1/2 \end{pmatrix} = (1/2) \times \begin{pmatrix} 1 & 0 & 0 \\ 0 & 0 & 1 \\ 0 & 1 & 0 \end{pmatrix} + (1/2) \times \begin{pmatrix} 0 & 1 & 0 \\ 1 & 0 & 0 \\ 0 & 0 & 1 \end{pmatrix}$$



# Fair Lottery

**Random Dictatorship:** Run serial dictatorship for random priority ordering.

**Example:** agents {1, 2, 3, 4}, items {a, b}  
preferences  $P(1) = P(2) = a, b$ ;  $P(3) = P(4) = b, a$

Random Dictatorship	Item a	Item b	unmatched
Agents 1, 2	5/12	1/12	1/2
Agents 3, 4	1/12	5/12	1/2

# Properties

- truthful? ✓
- ex-post efficient? ✓
- fair?

**equal treatment of equals:** agents with same preference receive same distribution of items.

# Inefficiency

Random Dictatorship	Item a	Item b	unmatched
Agents 1, 2	5/12	1/12	1/2
Agents 3, 4	1/12	5/12	1/2

recall:  $P(1) = P(2) = a, b$ ;  $P(3) = P(4) = b, a$

Preferred Assignment	Item a	Item b	unmatched
Agents 1, 2	1/2	0	1/2
Agents 3, 4	0	1/2	1/2

# Ordinal Efficiency

**Defn.** Random assignment  $X$  **ordinally dominates** random assignment  $Y$  if for every agent  $i$ ,  $X_i$  stochastically dominates  $Y_i$ :

$$\Pr[i \text{ gets item weakly preferred to } a \text{ in } X] \\ \leq \Pr[i \text{ gets item weakly preferred to } a \text{ in } Y]$$

for all  $i, a$ .

# Eating Mechanism

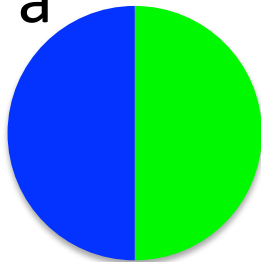
(aka **probabilistic serial**)

- each agent eats favorite pie at constant rate
- eaten fractions form random assignment

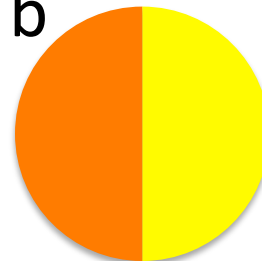
**Example:** agents {**1**, **2**, **3**, **4**}, items {a, b}

preferences  $P(1) = P(2) = a, b$ ;  $P(3) = P(4) = b, a$

Item a



Item b



# Inefficiency

Random Dictatorship	Item a	Item b	unmatched
Agents 1, 2	5/12	1/12	1/2
Agents 3, 4	1/12	5/12	1/2

recall:  $P(1) = P(2) = a, b$ ;  $P(3) = P(4) = b, a$

Eating Mechanism	Item a	Item b	unmatched
Agents 1, 2	1/2	0	1/2
Agents 3, 4	0	1/2	1/2

# Properties

- ordinally efficient? ✓
- fair?

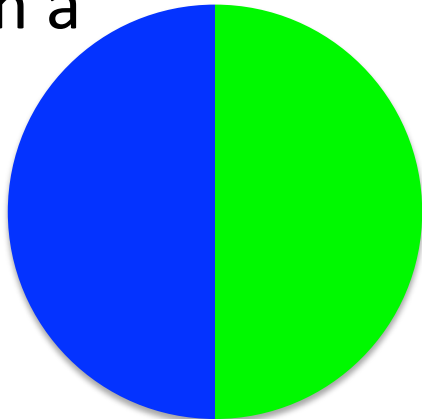
**Envy-free:** everyone likes his/her assignment better than anyone else's.

- truthful? ✗

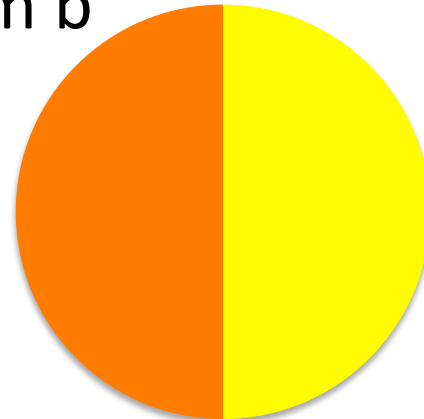
# Eating Mechanism Not Truthful

**Example:** agents {1, 2, 3, 4}, items {a, b}  
preferences  $P(1) = a, b$ ;  $P(2) = a$ ;  $P(3) = P(4) = b$

Item a



Item b



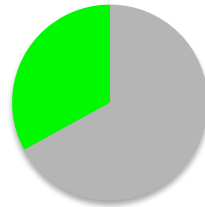


# Eating Mechanism Not Truthful

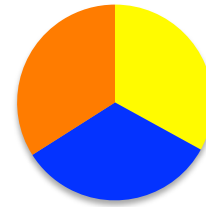
**Example:** agents {1, 2, 3, 4}, items {a, b}  
preferences  $P'(1) = b, a$ ;  $P(2) = a$ ;  $P(3) = P(4) = b$

time  $t = 1/3$ :

Item a



Item b

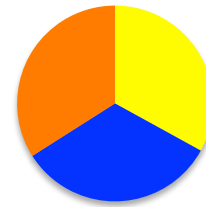


time  $t = 1$ :

Item a



Item a



# Eating Mechanism Not Truthful

True Preferences	Item a	Item b	unmatched
Agents 1	$1/2$	0	$1/2$

deviation beneficial for some cardinal preferences consistent with ordinal ones

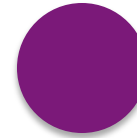
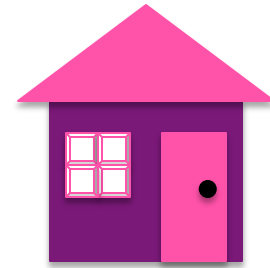
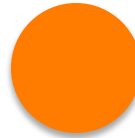
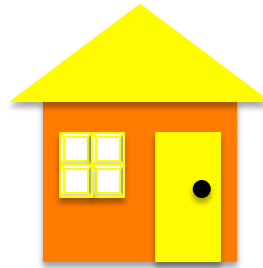
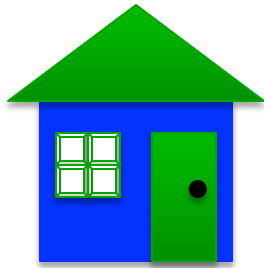
Altered Preferences	Item a	Item b	unmatched
Agents 1	$1/3$	$1/3$	$1/3$

# Ordinal Efficiency and Truthfulness

**Theorem:** There is no mechanism that is ordinally efficient, truthful, and satisfies equal treatment of equals.

**Theorem** [Che-Kojima '09]: As the market “grows,” the random assignment from random dictatorship and eating mechanism converge.

# Endowments



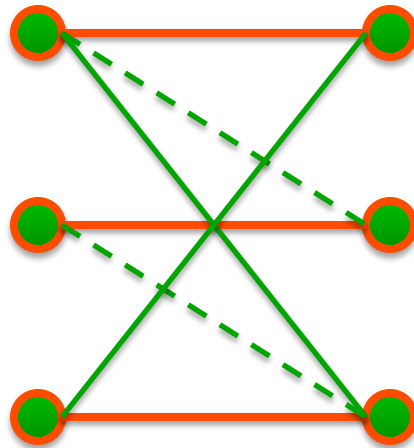
## Housing market:

- agents  $A = \{a_1, \dots, a_n\}$ , houses  $H = \{h_1, \dots, h_n\}$   
(agent  $a_i$  owns house  $h_i$ )
- set of preferences  $P(a_i)$  of agents over houses

# Motivation: Kidney Exchange

Patients

Donors



each patient has a (strict) preference list  $P(\cdot)$  over kidneys

# Stability Concept

**Defn.** A matching  $\mu$  is in the **core** if no group of agents can profitably deviate, i.e., there is no matching  $\nu$  and coalition  $B$  s.t. for every  $a$  in  $B$

- $\nu(a)$  initially owned by some  $a'$  in  $B$
- $\nu(a) \geq_a \mu(a)$  and for some  $a$  in  $B$ ,  $\nu(a) >_a \mu(a)$

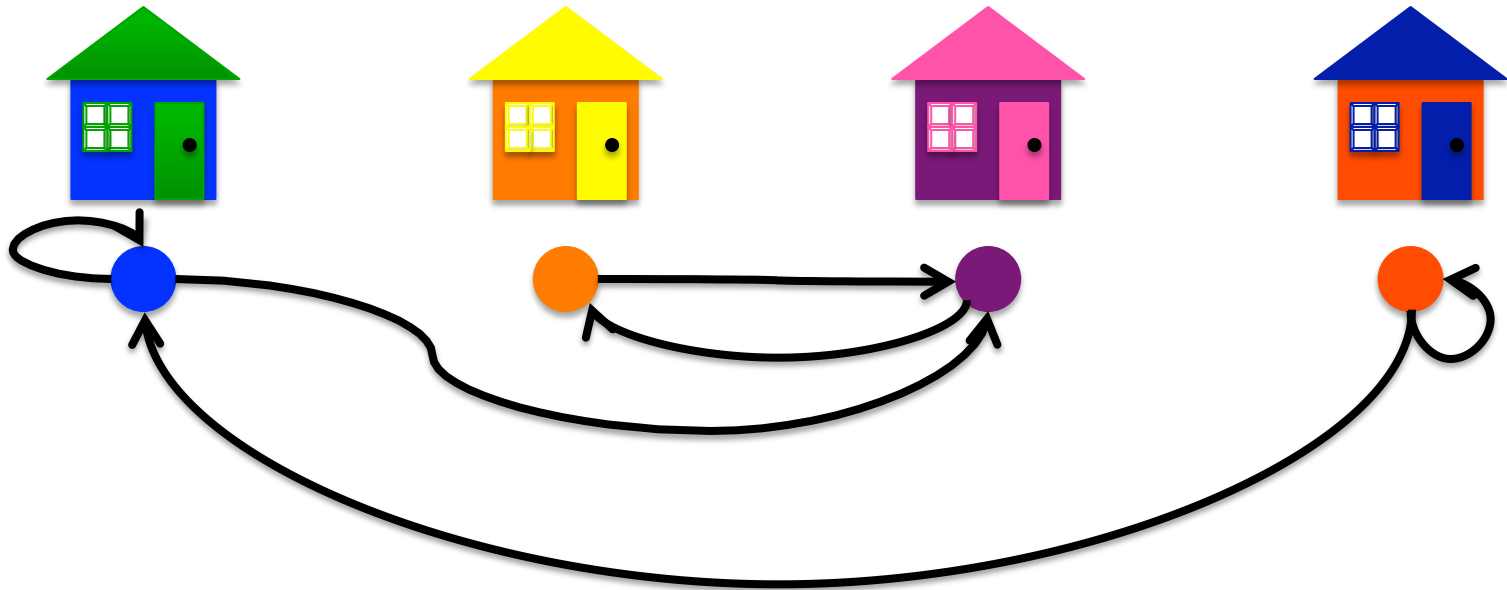
Compare to Pareto-efficiency.

# Properties of Core

- **Individually rational** (every agent receives house at least as good as initial house):  
consider coalition of single agent
- **Pareto optimal**: consider coalition of all agents

**Theorem.** Core exists for every housing market.

# Top Trading Cycles



1. ask each agent to point to favorite house
2. choose cycle, perform trades, remove match
3. repeat



# Properties

- truthful? ✓
- in the core? ✓

**Theorem.** TTC produces unique point in core!

**Theorem.** Mechanism is truthful, IR, Pareto-efficient iff it is TTC.

# House Allocation with Tenants

Generalize house allocation and house market

- Agents: existing tenants or newcomers
- Houses: currently owned or vacant

Used for dorm assignment at CMU, Duke, etc.:

- Existing tenants choose to participate or not
- Serial dictatorship run on all participants

# Desirable Properties

- Pareto efficiency
- Strategy-proofness
- Individual rationality

All jointly achieved by

- Serial dictatorship (in house allocation)
- Top trading cycles (in house market)

# Proposed Mechanism

You-Get-My-House, I-Get-Your-Turn:

- Fix ordering (can be chosen randomly)
- Let agents select favorite houses in order until someone asks for a house with existing tenant
- If existing tenant already got a house, proceed
- Else insert tenant at top of priority order
- Clear cycles as they form

# Example

- Tenants  $a_1, \dots, a_9$  occupying houses  $h_1, \dots, h_9$
- Newcomers  $a_{10}, \dots, a_{16}$ , vacancies  $h_{10}, \dots, h_{16}$
- Preferences:

$a_1$	$a_2$	$a_3$	$a_4$	$a_5$	$a_6$	$a_7$	$a_8$	$a_9$
$h_{15}$	$h_3$	$h_1$	$h_2$	$h_9$	$h_6$	$h_6$	$h_6$	$h_{11}$
	$h_4$	$h_3$				$h_7$	$h_{12}$	

$a_{10}$	$a_{11}$	$a_{12}$	$a_{13}$	$a_{14}$	$a_{15}$	$a_{16}$
$h_7$	$h_2$	$h_4$	$h_6$	$h_8$	$h_1$	$h_5$
$h_3$	$h_4$	$h_{14}$	$h_{13}$			
$h_{12}$	$h_{16}$					
$h_{10}$						

- Priority ordering:

$a_{13}, a_{15}, a_{11}, a_{14}, a_{12}, a_{16}, a_{10}, a_1, a_2, a_3, a_4, a_5, a_6, a_7, a_8, a_9$

# Properties

**Theorem.** Mechanism is individually rational, strategy-proof, and Pareto efficient.

**Theorem.** It is only IR, strategy-proof, PE, neutral and consistent mechanism.

(consistent: alloc. same when run on submarket)

## Part 8: Kidney Exchange.

# Kidney Transplant

Transplant as treatment of kidney disease:

- Over 70000 patients are on waiting lists for kidney in the U.S.
- In 2006, there were
  - 10659 transplants from diseased donors,
  - 6428 transplants from living donors, while
  - 3875 patients died while on the waiting list.



# Kidney Sales

See YouTube video.

# Kidney Donation

- Buying /selling kidneys is illegal in the U.S.

“it shall be unlawful for any person to knowingly acquire, receive or otherwise transfer any human organ for valuable consideration for use in human transplantation.”

Section 301 of the National Organ Transplant Act

- Donation is most important source of kidneys.

# Donation Sources

There are two sources of donation:

- Deceased donors: A centralized mechanism has been used for allocation of deceased donor kidneys.
- Living donors: Living donors usually come from friends or relatives of a patient (because the monetary transaction is prohibited). Live donation has been increasing recently.

Donor Types	2008	1998	1988
All donors	10,920	9,761	5,693
Deceased	5,992	5,339	3,876
Live	4,928	4,422	1,817

# Donor Compatibility

Donor/patient must be compatible:

- Blood type: O, A, B, AB.
  - O type patients can receive kidneys from O type
  - A type patients can receive kidneys from O or A type
  - B type patients can receive kidneys from O or B type
  - AB type patients can receive kidneys from any type
- HLA tissue compatibility (blood proteins)

# Increasing Successful Transplants

- Paired exchange: incompatible patient/donor pairs can swap donors
- List exchange: match one incompatible patient/donor pair and deceased donor list

# Kidney Exchange Clearinghouse

- Renal Transplant Oversight Committee of New England approved establishment of clearinghouse for kidney exchange (2004)
- Economists (Roth, Sonmez, Unver) as well as doctors designed the clearinghouse.
- Potential issues include
  - Efficiency (Pareto efficiency; maximizing number of transplantation)
  - Incentives (Strategy-proofness)
  - Fairness

# Incentives in Kidney Market

A news report by Reuters (2003-7-29)

Three Chicago hospitals were accused of fraud by prosecutors on Monday for manipulating diagnoses of transplant patients to get them new livers. Two of the institutions paid fines to settle the charges. “By falsely diagnosing patients and placing them in intensive care to make them appear more sick than they were, these three highly regarded medical centers made patients eligible for liver transplants ahead of others who were waiting for organs in the transplant region,” said Patrick Fitzgerald, the U.S. attorney for the Northern District of Illinois.

# Kidney Exchange Model

- A set of donor-patient pairs  $\{(k_1, t_1), \dots, (k_n, t_n)\}$
- A preference over  $\{k_1, \dots, k_n\} \cup \{w\}$  for each  $t_i$  (where  $w$  is priority in waitlist)
- Matching: match patients to kidneys; any number of patients to waitlist
- Mechanism: procedure to select matching



# Design 1

Roth, Somnez, Unver (2004)

- No limit on # pairs in one exchange
- Preferences are strict

**Solution:** use house allocation with tenants

- (tenant, house) = (patient, donor)
- Good Samaritan donors = vacant houses
- Patients w/out donor = newcomers

# Design 1

Dealing with waitlist w:

- Top trading cycles, point to kidney or waitlist
- At any step, there's either a cycle or a chain
- Remove cycle if exists

How to choose chains?

- Min/max/priority-based
- Leave agents present/remove them

# Example

$t_1: k_9, k_{10}, k_1$	$t_7: k_6, k_1, k_3, k_9, k_{10}, w$
$t_2: k_{11}, k_3, k_5, k_6, k_2$	$t_8: k_6, k_4, k_{11}, k_2, k_3, k_8$
$t_3: k_2, k_4, k_5, k_6, k_7, k_8, w$	$t_9: k_3, k_{11}, w$
$t_4: k_5, k_9, k_1, k_8, k_{10}, k_3, w$	$t_{10}: k_{11}, k_1, k_4, k_5, k_6, k_7, w$
$t_5: k_3, k_7, k_{11}, k_4, k_5$	$t_{11}: k_3, k_6, k_5, k_{11}$
$t_6: k_3, k_5, k_8, k_6$	$t_{12}: k_{11}, k_3, k_5, k_9, k_8, k_{10}, k_{12}$

Run with longest-chain selection rule.

**Incentives:** Suppose  $t_4$  promotes  $k_1$  to 2<sup>nd</sup> place.

# Design 1

- Pareto-efficient if “keep” chains until end.
- Strategy-proof if choose minimal or based on priority of head of list.