

# Incentives in Computer Science

One-sided matching  
TTCA  
Kidney exchange

# PARTICIPATION

- Please do it!!!!!!!
- Use the chat feature to either write a question or in the chat box, type “hand” and I will call on you soon thereafter or just shout out!
- Also, I’d love it if you kept your video on so I can see you....

# Today and especially Monday

- Covers some of the major results that resulted in the awarding of the 2012 Nobel Prize in economics to Lloyd Shapley and Al Roth
- *“The Prize concerns a central economic problem: how to match different agents as well as possible. For example, students have to be matched with schools, and donors of human organs with patients in need of a transplant. How can such matching be accomplished as efficiently as possible? What methods are beneficial to what groups? The prize rewards two scholars who answered these questions on a journey from abstract theory on stable allocations to practical design of market institutions.”*

# A basic definition

## MECHANISM

An algorithm whose inputs come from agents with a strategic interest in the output. Each agent's input is their own **private** information. Takes as **input** the reported preferences/data for a set of agents and produces as **output** an outcome, decision or action.

Examples:

auctions

voting

school choice

TODAY: MECHANISMS WITHOUT MONEY

One-sided matching problems

## Office Allocation

- $n$  people,  $n$  offices; each person has private preference order over all offices.
- Mechanism for allocating offices to people?

# Algorithm 1

- People report preferences to algorithm.
- Algorithm visit students in alphabetical order and matches them to their first choice if it's available.
- Then, for all unmatched students, the algorithm visits them in alphabetical order and matches them to their second choice if available.
- And so on until everyone matched.

A	B	C
01	01	02
02	02	03
03	03	01

# Pareto Optimality

- An outcome is **Pareto optimal** if you cannot make anyone better off without also making someone else worse off.

# Lemma: Algorithm 1 is Pareto optimal

Proof

$M'$  any other matching

$S_j$ : set of people who get their  $j^{\text{th}}$  choice

$i$ : lowest index s.t. some person  $p \in S_i$  is strictly happier in  $M'$

$p$  is matched to office allocated to, say  $p'$ , in  $M$ , in round  $S_\ell$   $1 \leq \ell \leq i-1$  or visited earlier in round  $i$ .  
 $p'$  is worse off.

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↓  
 $M$





# Is it truthful?

- That is, is it in each agents to report their preferences truthfully?

Not truthful.

A	B	C
01	01	01
02	02	02
03	03	03

C  
02  
01  
03

# Truthful mechanisms

- A mechanism is **truthful** or **strategyproof** or **dominant strategy incentive-compatible (DSIC)** if honesty is always the best policy.
- That is, no matter what other agents do, lying about your preferences cannot make you better off.

# Algorithm 2: Serial dictatorship

- Pick an arbitrary ordering of the students. *alphabetical.*
- Visit the students in this order and let them pick their favorite available office that has not yet been picked.

A	B	C
01	01	02
02	02	03
03	03	01

- Pareto optimal?
- Truthful?

# Lemma: Serial Dictatorship is Pareto optimal

Pf let  $M'$  be any other allocation.

Consider first person who gets different alloc in  $M$  than in  $M'$

- Pick an arbitrary ordering of the students.
- Visit the students in this order and let them pick their favorite available office that has not yet been picked.



# Lemma: Serial Dictatorship is truthful

Pick person  $p$

Fix reports of  
everyone else.

$p$  has no incentive to lie

→ Pick an arbitrary ordering of the students.

- Visit the students in this order and let them pick their favorite available office that has not yet been picked.

# Why should we care about truthfulness?

- difficult to reason about outcome.
- easier on agents.

# Office allocation

- $n$  people (agents), *each starts with an office*
- Each person has a total order over all the offices.
- How should we reallocate them to get to a better allocation?

Top Trading Cycle Algorithm (TTCA)

while agents remain (initially all)

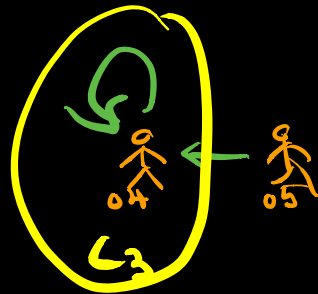
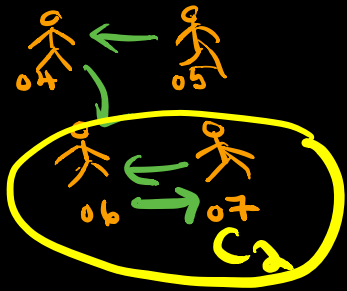
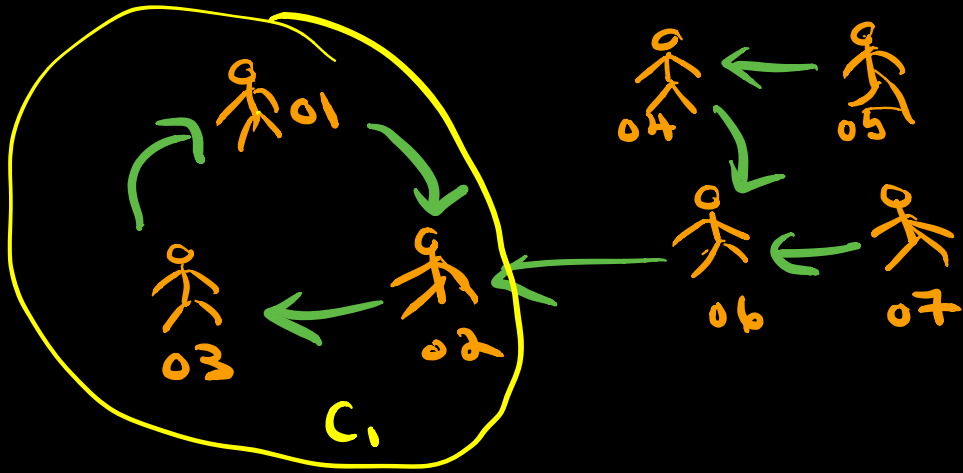
each remaining agent to point to  
their favorite office

Claim:  $\exists$  always cycle in  
resulting directed graph.

reallocate according to that cycle

remove all these agents

repeat till no agents remain





# Theorem: TTCA is a truthful mechanism

PF Fix reports of everyone but  $i$

Suppose that if  $i$  truthful

$C_1, C_2, \dots, C_k$

and  $i$  is allocated in cycle  $C_j$

Claim: all the people in  $C_1, \dots, C_{j-1}$  prefer their allocation to any office in  $C_j, \dots, C_k$

This means that can not be any cycle that contains  $i$  & any agent in  $C_1, \dots, C_{j-1}$

$i$  can only get someone in  $C_j, \dots, C_k$  & getting his favorite by reporting truthfully




# Theorem: The allocation produced by TTCA is **stable**

all do at least as well & at least one strictly better

- The allocation is **stable** if no subset of agents could have **done better** by not participating, but rather just reallocating amongst themselves.

Proof: by  $\rightarrow \leftarrow$

- Suppose there is a subset  $A$  of agents that prefer to go off & reallocate among themselves
- Let  $A' \subseteq A$  be agents in  $A$  that get a different alloc from what they would have gotten
- Let  $C_j$  be first cycle in TTCA containing  $a \in A'$
- $C_1, \dots, C_{j-1}$  get the exact same allocatn.  
So  $a$  has to be doing strictly worse 

# Pareto Optimality

- An outcome is **Pareto optimal** if in any other outcome at least one agent is worse off.
- Is the outcome produced by TTCA Pareto optimal?

# Kidney Exchange



Next set of slides created by Jason Hartline and Nicole Immorlica

# Kidney failure

Dehydration

Diabetes

Sepsis


**Without a transplant,  
they will die.**

Hypovolemia

High blood pressure

Rhabdomyolysis

# Kidney supply

 I wish to donate my organs and tissues. I wish to give:

Any needed organs and tissues

Only the following organs and tissues: \_\_\_\_\_

Donor: John Doe

Witness: Jane Doe (sister)

Witness: Rose Doe (mom)

Date: 10/23/03 Signature: [Signature]

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My medical background

Injured Hernia (1965)

Broken Left Forearm (1972)

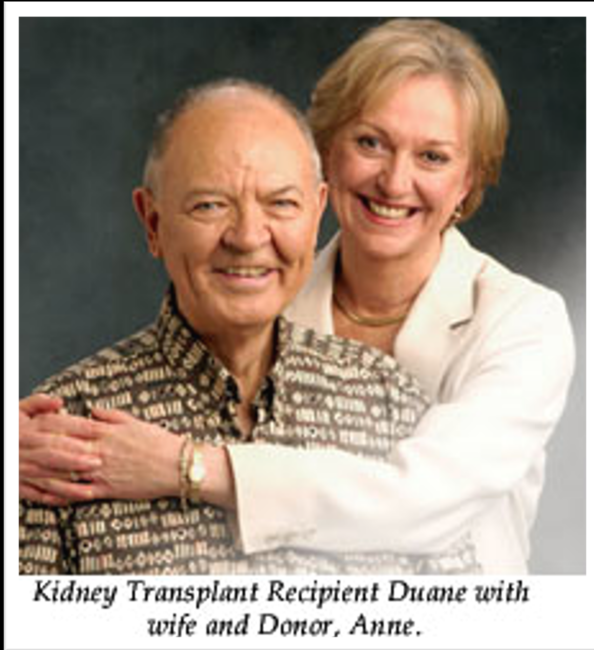
Blood Group B

Rhous Factor +

Relationship	Rose Doe	NOTIFY
Address	1567 bd A street 01234 A town A state	E-mail
Phone	+1-800-555-0123 +1-415-867-5309	john.doe@internet montvandt@dieget@earth.org

# 1. Cadavers

# Kidney supply



*Kidney Transplant Recipient Duane with wife and Donor, Anne.*

## 2. Live donors

In 2008,

**10,526** patients

received **cadaver kidneys**.

**4,857** patients

received **live donor kidneys**.



# Kidney demand

There are currently

**93,000 people**

waiting for a kidney transplant in the US.

<http://optn.transplant.hrsa.gov>

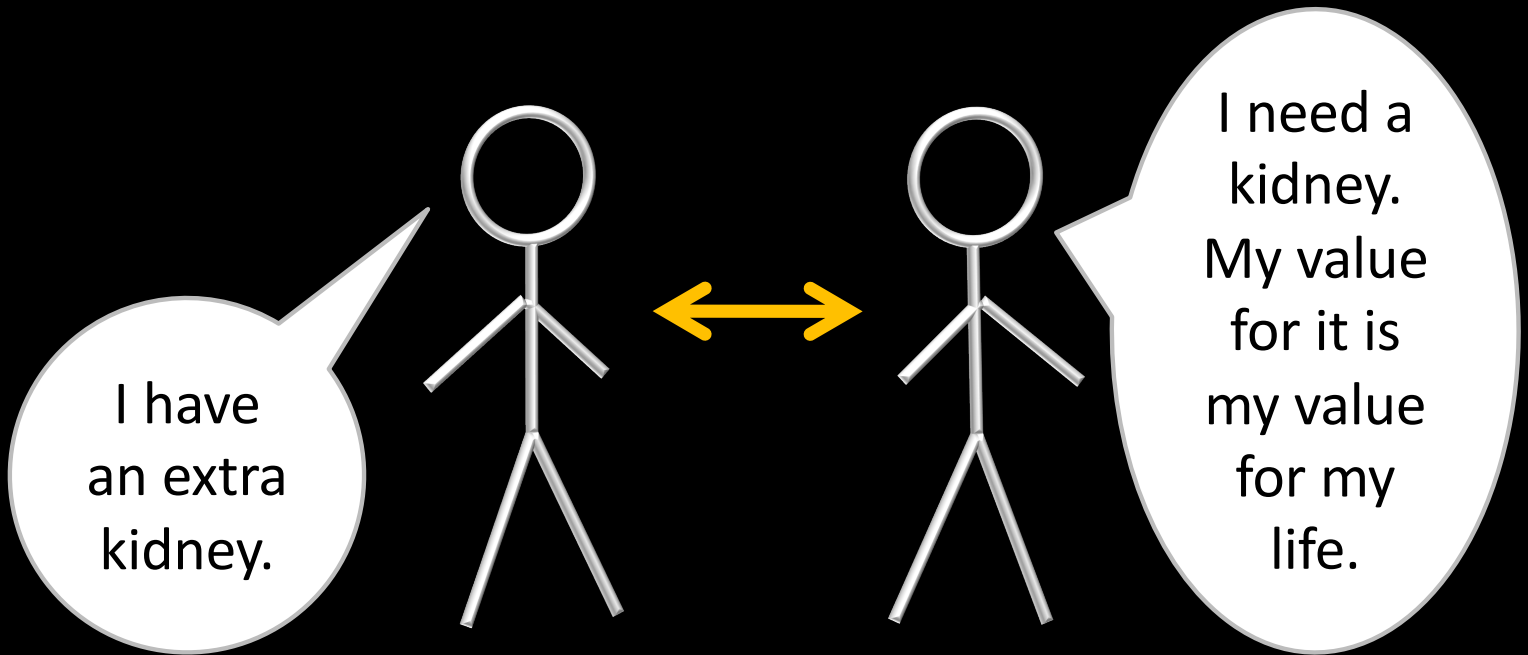
In 2014,

**Over 8,000** patients died

waiting or became too sick for a transplant.

# Making supply meet demand

The economic approach 101: **Buying kidneys.**



# Repugnance

Often  $x + \$$  is repugnant, even when  $x$  alone is not.

Interest on loans

Prostitution

Organ donation



“We didn’t have time to pick up a bottle of wine, but this is what we would have spent.”

# Legality

Section 301 of the National Organ Transplant Act, “Prohibition of organ purchases” imposes criminal penalties on any person who

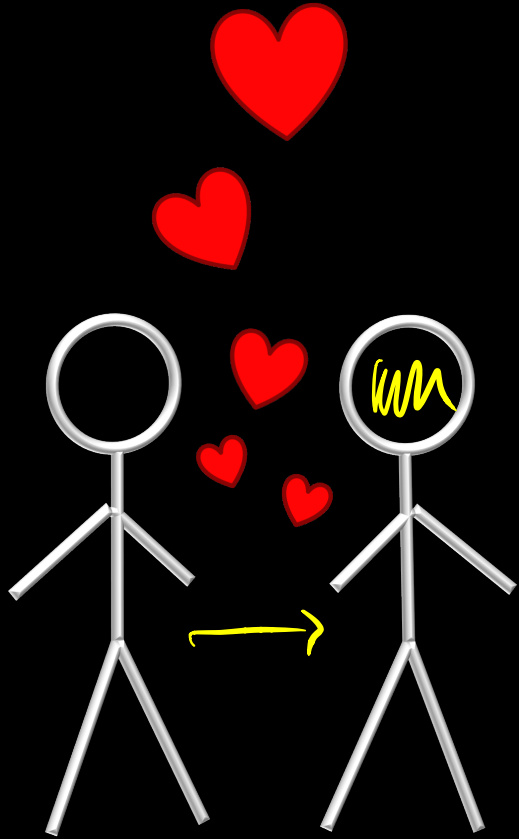
“knowingly acquire[s], receive[s], or otherwise transfer[s] any human organ for valuable consideration for use in human transplantation”

# Making supply meet demand

Take two:

**Kidney exchange.**

# Compatibility



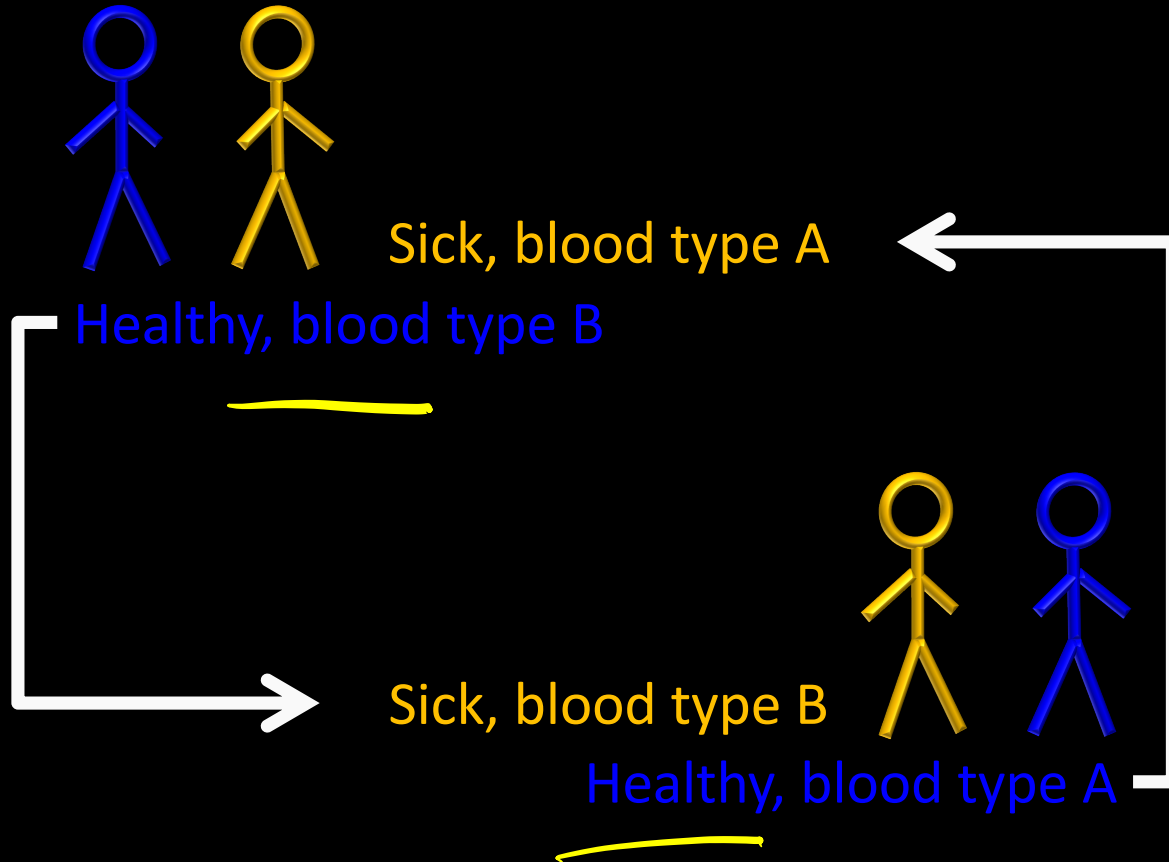
Blood  
"O", "A", "B", "AB"



Tissue  
(crossmatch test)



# Kidney exchange



Have bunch of patient-donor pairs  $P_1-D_1, P_2-D_2, \dots, P_n-D_n$

Idea #1 Use TTCA

agent w/  
office



patient  
w/ donor

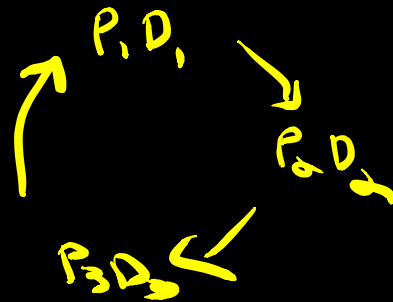
total ordering  
on offices



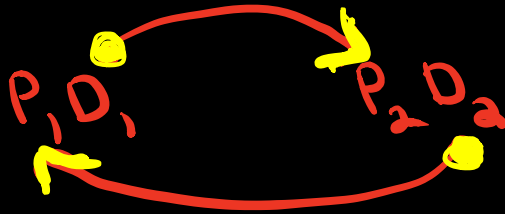
each  $P_i$  having total  
over all donor kidney  
↓ order of prob  
of transplant success

To run TTCA

can extend TTCA  
to deal patients w/ donor,  
donors w/ patient



# Issue #1



4 surgeries

issue of doing sequentially.

$D_1 \rightarrow P_1$  first

$D_2$  can now renege.

can't legally coerce  $D_2$  to follow thru.

$\Rightarrow$  always done simultaneously

$\Rightarrow$  don't want to do long cycles

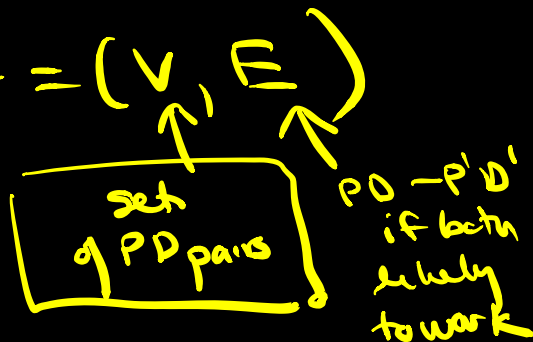
Issue #2 model is overkill.

- Q: is it highly likely to work or not.  
transplant

- input to problem:  $G = (V, E)$

- objective:

max cardinality  
matching

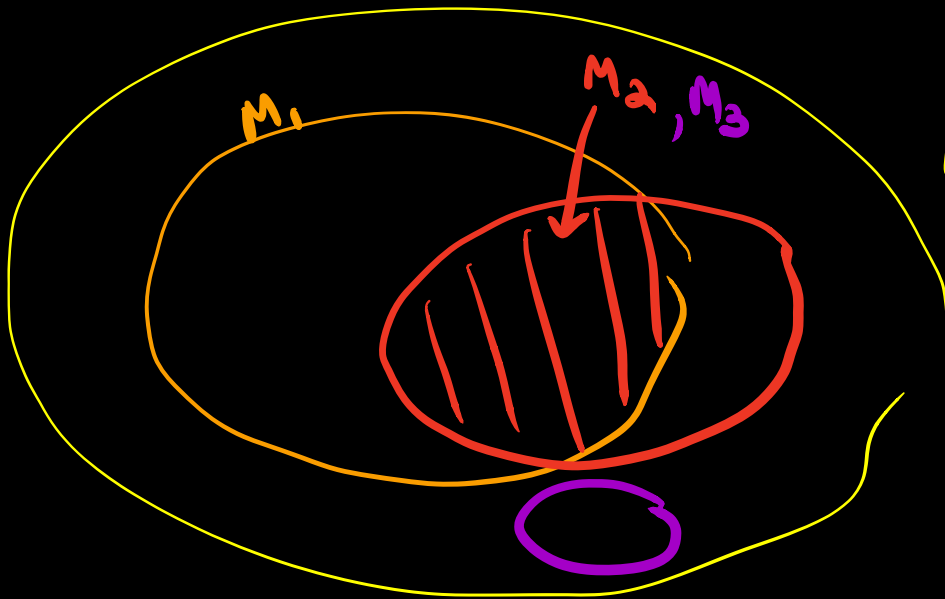


Input reported to National Kidney exchange  
patients/doctor.

want to be sure incentivized to report  
all edges



Essential requirement: alg has to ensure that  
no patient can switch from matched  
to unmatched when they report  
additional edges



Matching

Fix order  
an order  
on patients

