

Lecture 5

House Allocation and Kidney Exchange

Housing Market

[Shapley and Scarf, *JME* 1974]

Housing Market

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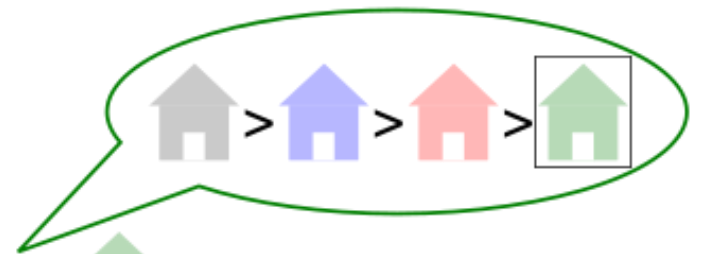
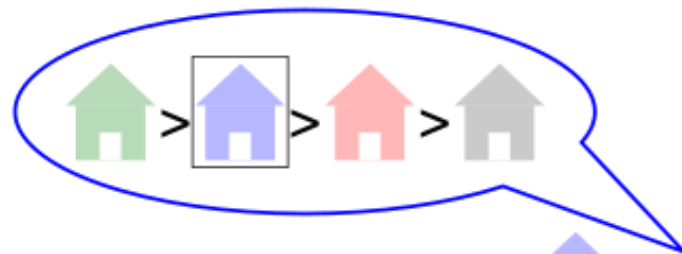
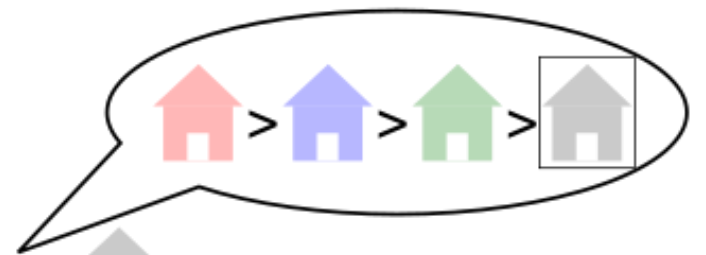
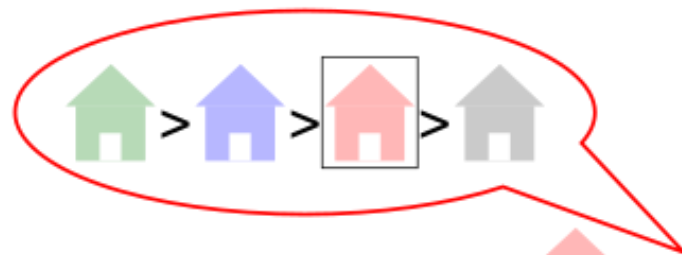
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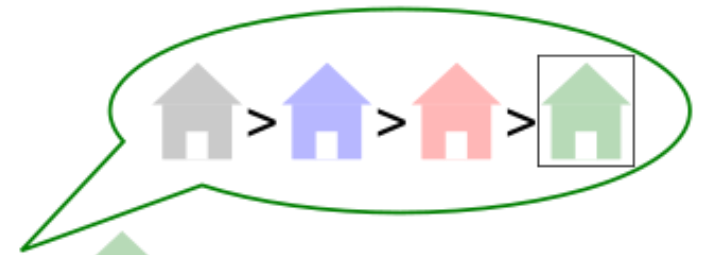
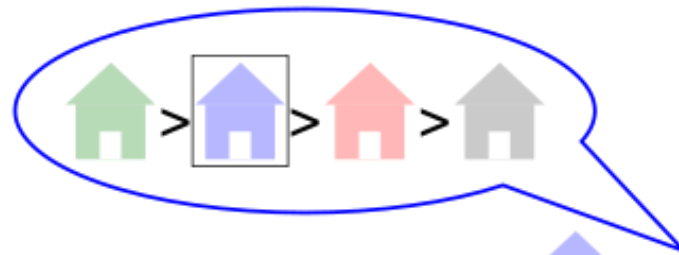
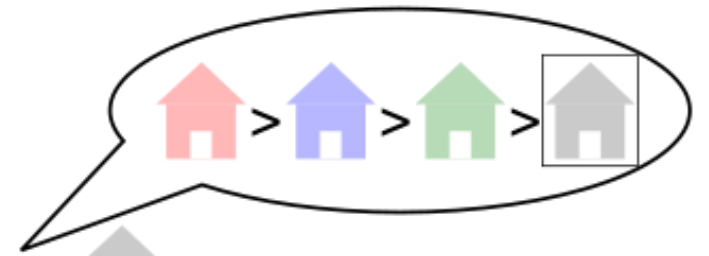
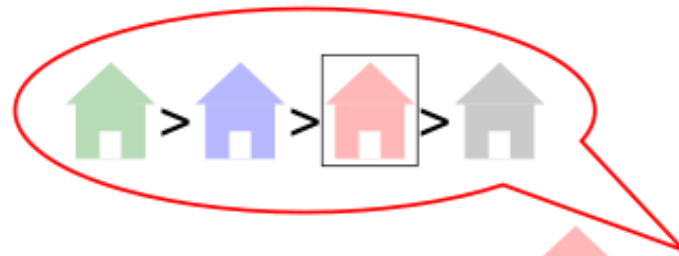
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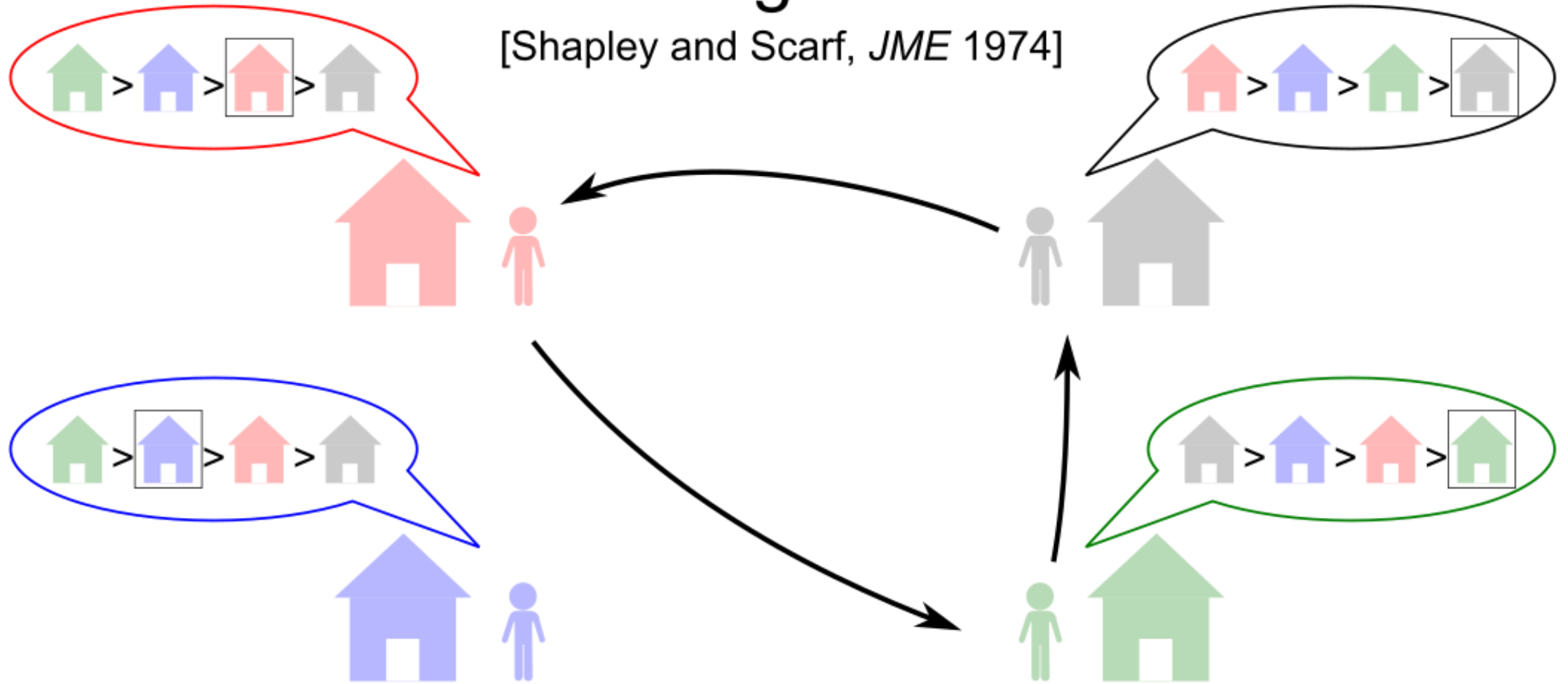
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Can't use money. Only way to make agents happier is via *exchanges*.

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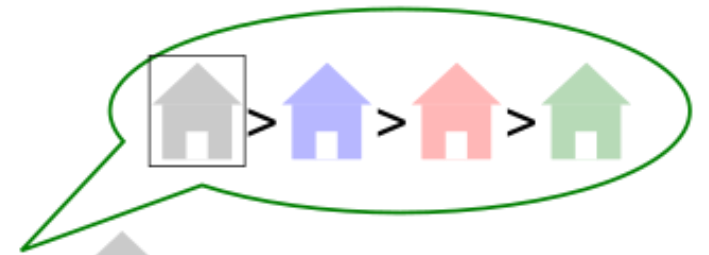
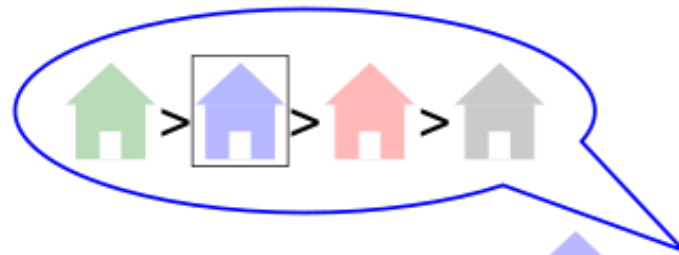
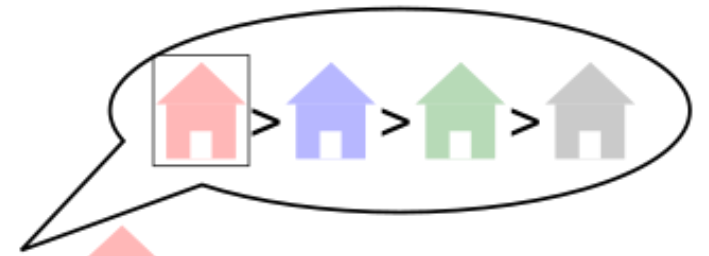
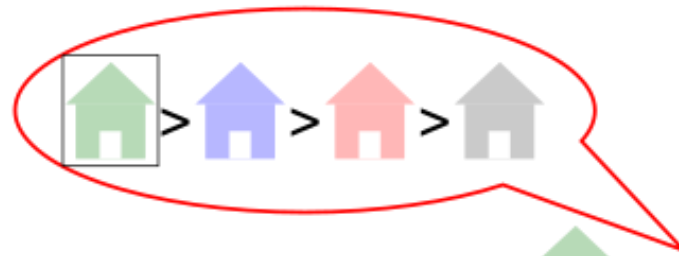
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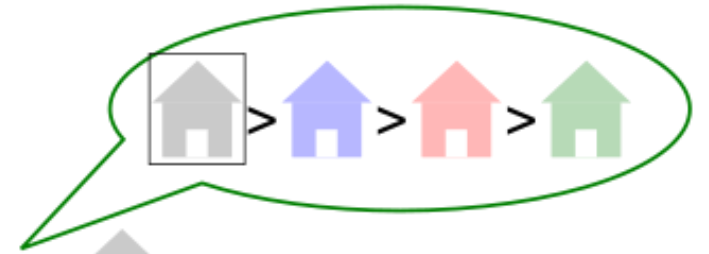
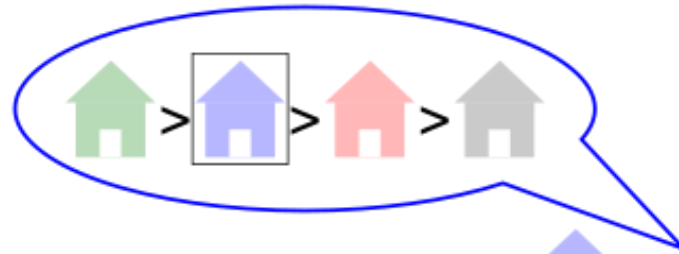
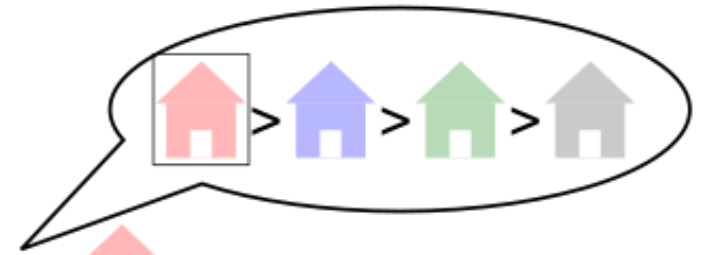
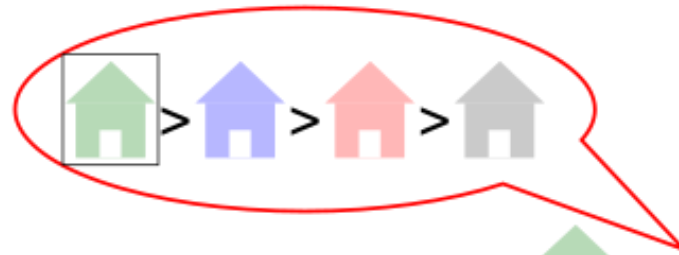
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Housing Market

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Is there a way to exchange houses to make the agents "maximally happy"?

Top-Trading Cycle Algorithm (TTCA)

[Shapley and Scarf, *JME* 1974 (attributed to David Gale)]

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While there is a remaining agent:

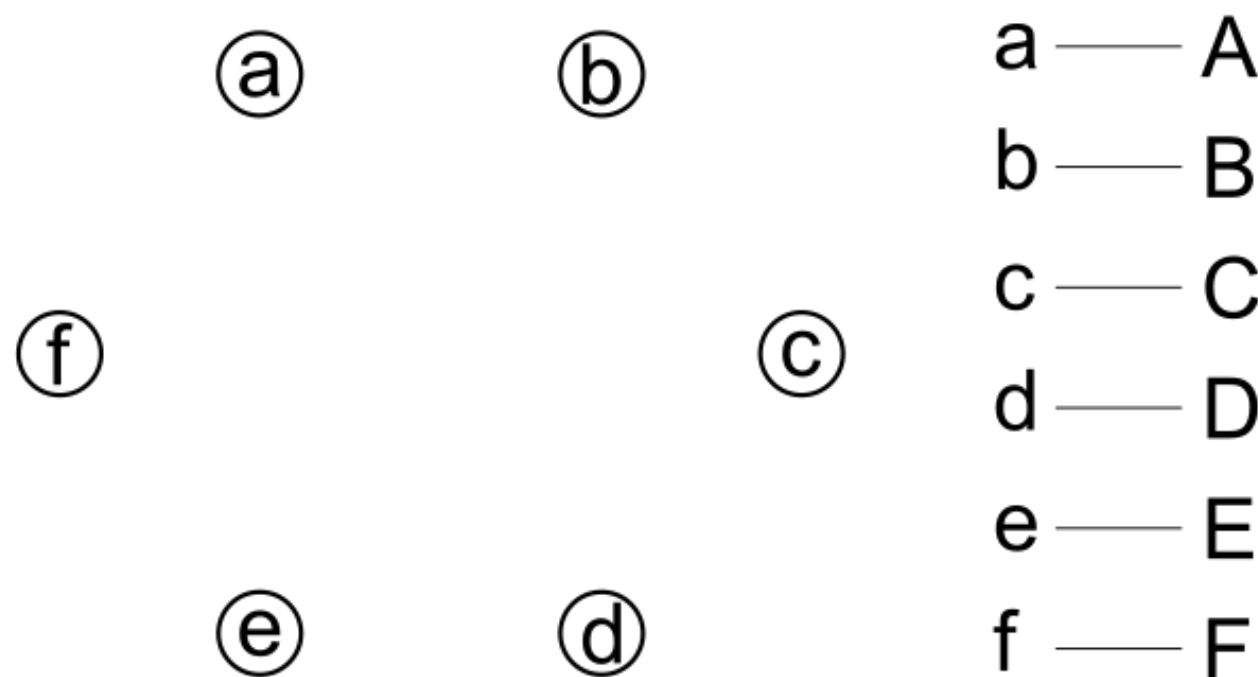
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- There must be a cycle (include self-loops). Do the cyclic exchange.
- Remove the agents and houses involved in the above exchange.

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	a	b	c	d	e	f				
1.	B	F	A	E	C	F	(a)	(b)	a — A	
2.									b — B	
3.				(f)				(c)	c — C	
4.									d — D	
5.									e — E	
6.					(e)			(d)	f — F	

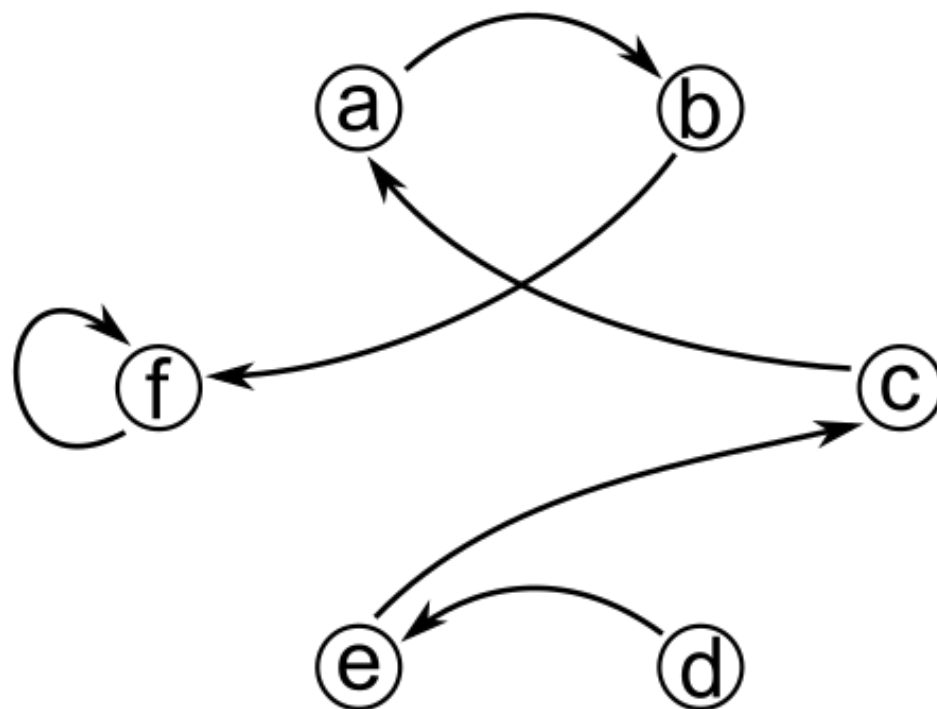
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c	—	C
d	—	D
e	—	E
f	—	F

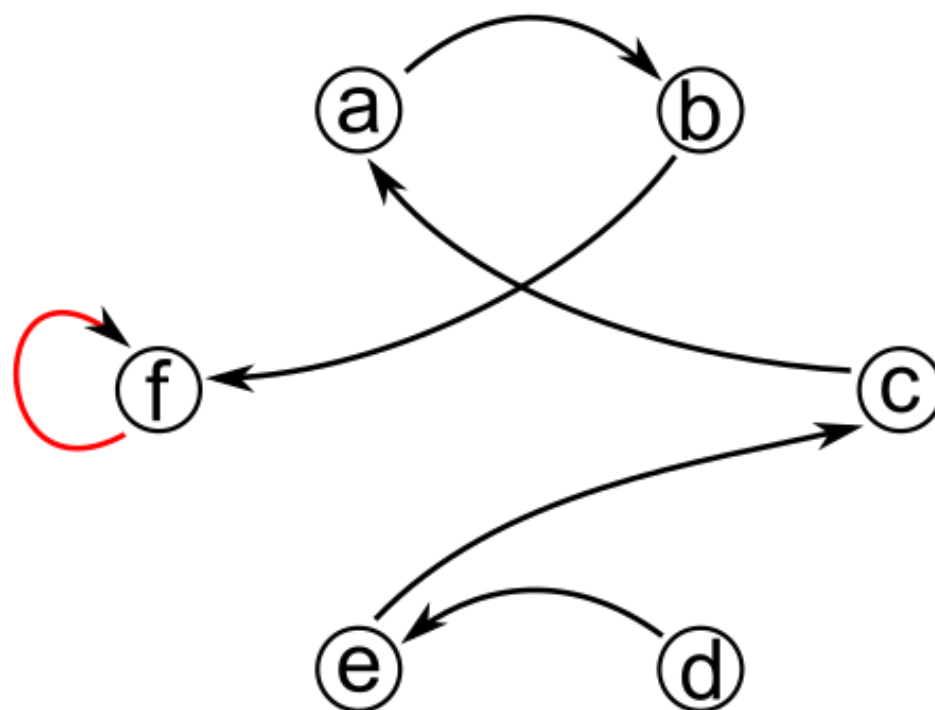
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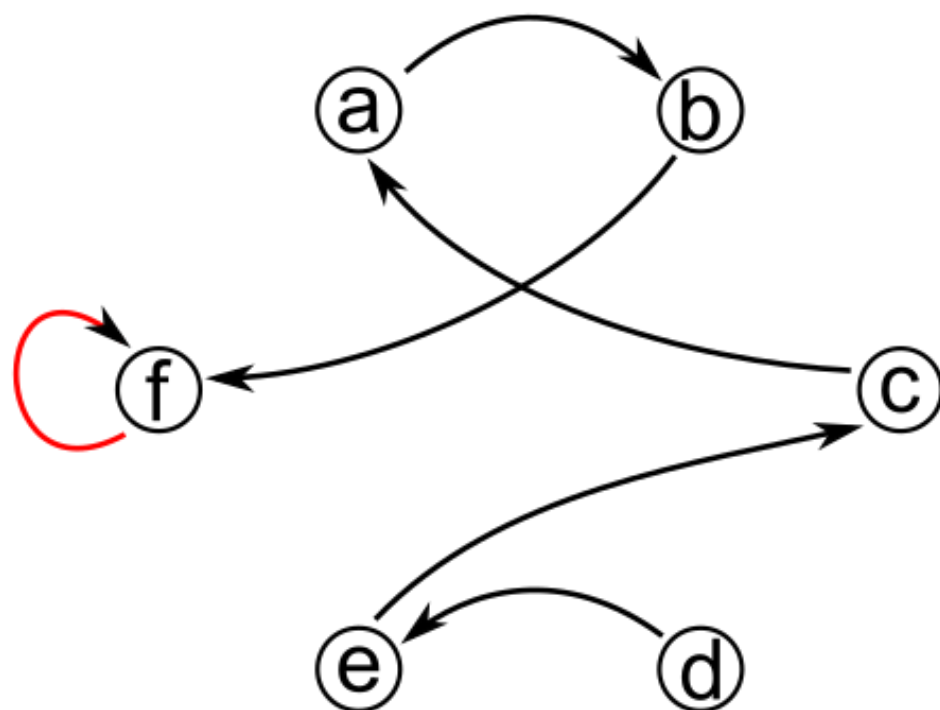
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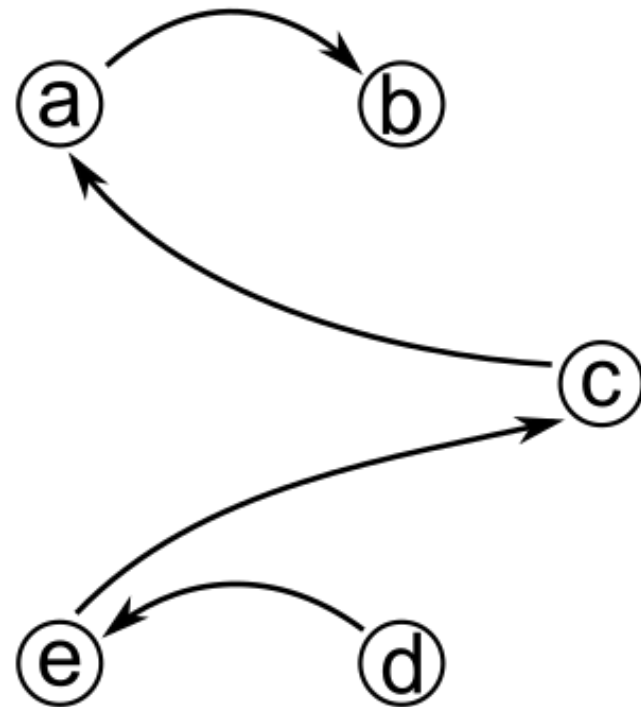
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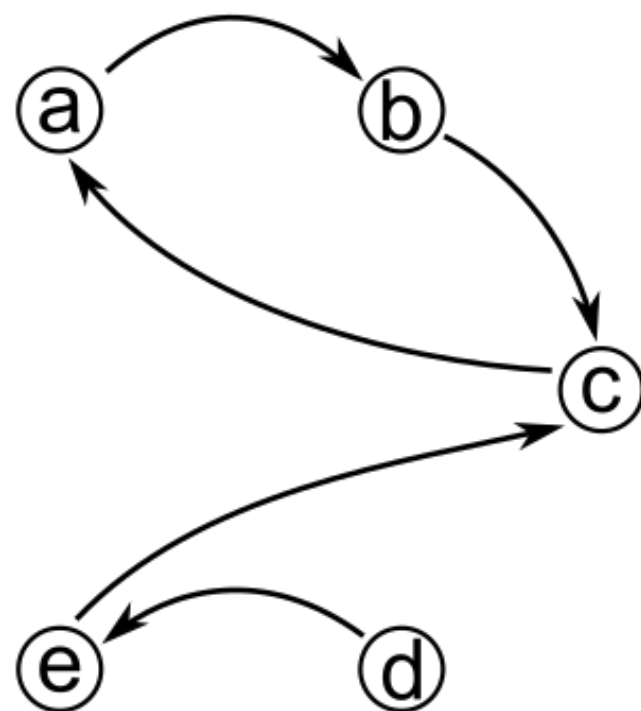
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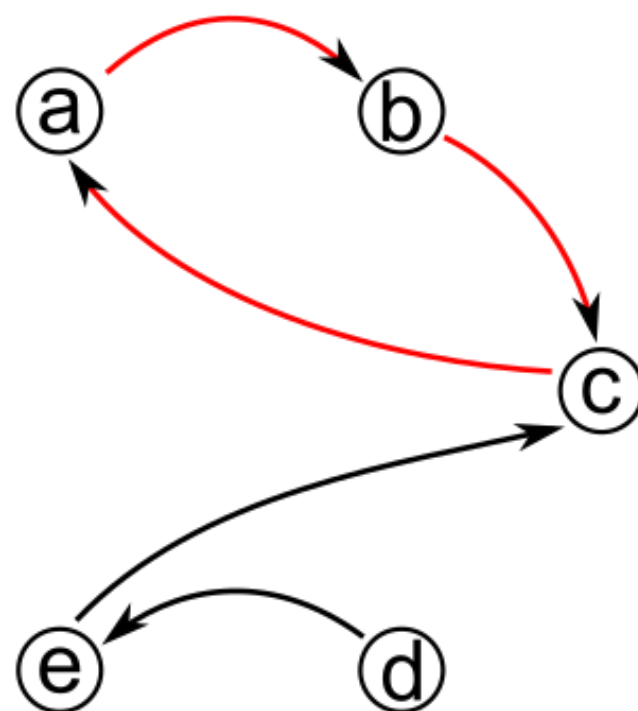
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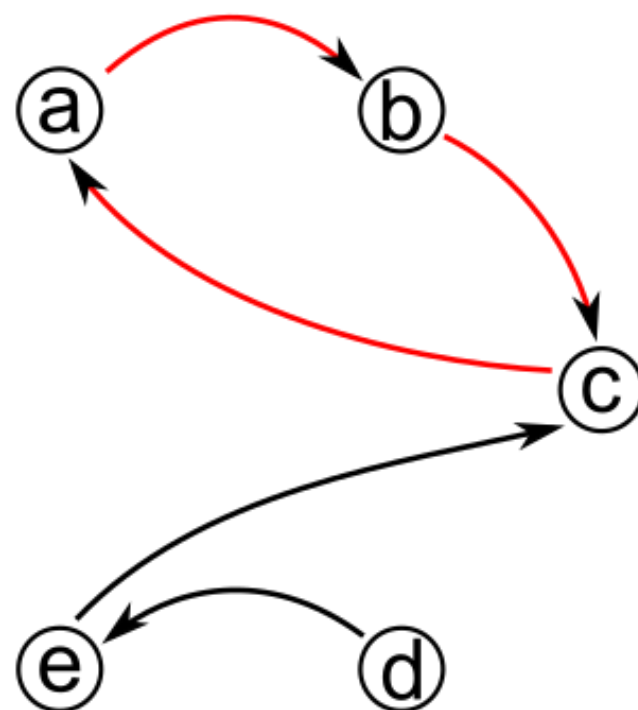
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		d	e
1.	_____	E	
2.			
3.			
4.		D	
5.			
6.		E	

a	—	B
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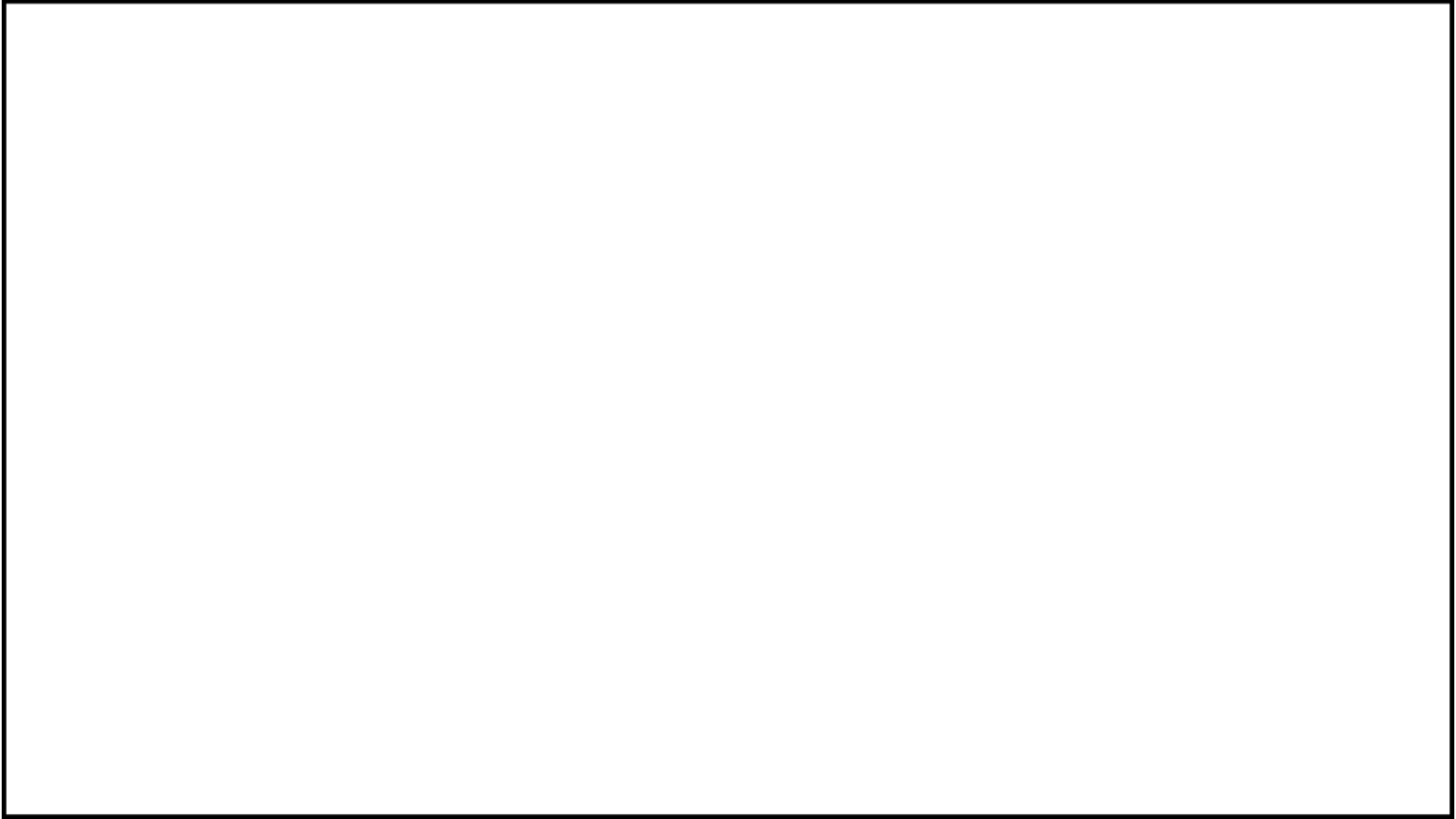
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		d	e
1.	_____	E	
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a	—	B
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Q1. Is a cyclic exchange always possible?

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Imagine a graph where the *vertices* are the (remaining) agents and the *edge* $i \rightarrow j$ means that agent i 's favorite house is owned by agent j .

At each step, each vertex has an outgoing edge.

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Q2. **Does TTCA always terminate?** Yes.

At least one agent kicked out in each round.

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Q3. **Does TTCA terminate in polynomial time?**

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Q3. **Does TTCA terminate in polynomial time?** Yes.

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Let S_k denote the set of agents who are removed in round k of TTCA.

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S_1



S_2



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Each agent in S_1 gets its favorite house and therefore has no incentive to misreport.

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S_2



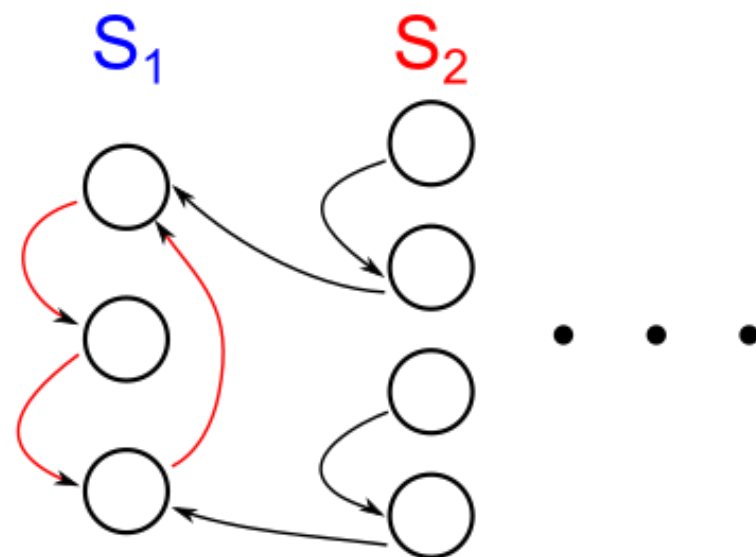
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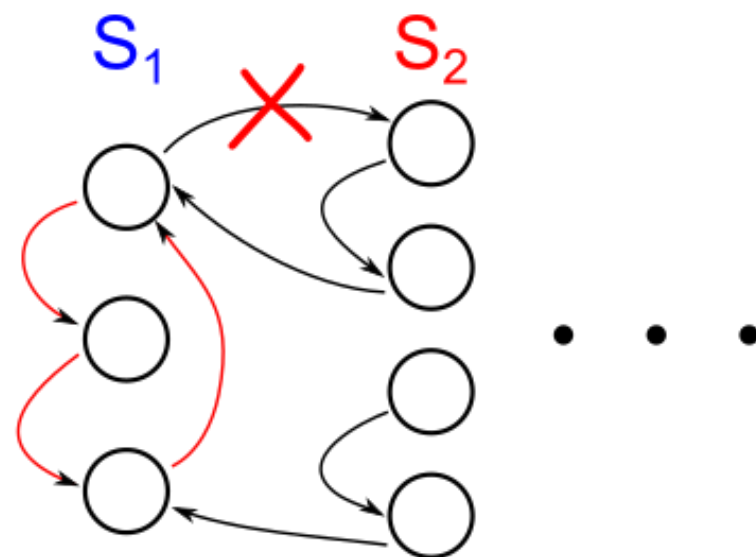
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Subject to that, no agent in S_2 has any incentive to misreport.

- No agent in S_2 can get a house owned by an agent in S_1 since, in round 1, no agent in S_1 points to an agent in S_2 .

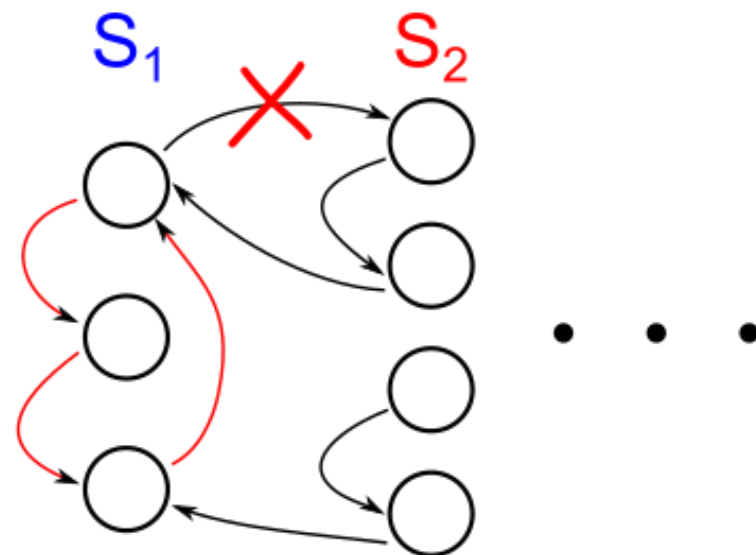


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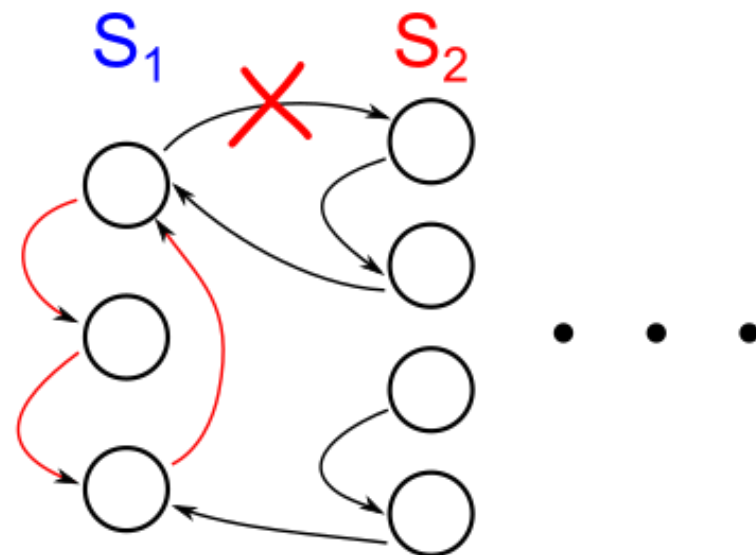
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- So, each agent in S_2 gets its favorite house among the remaining ones.

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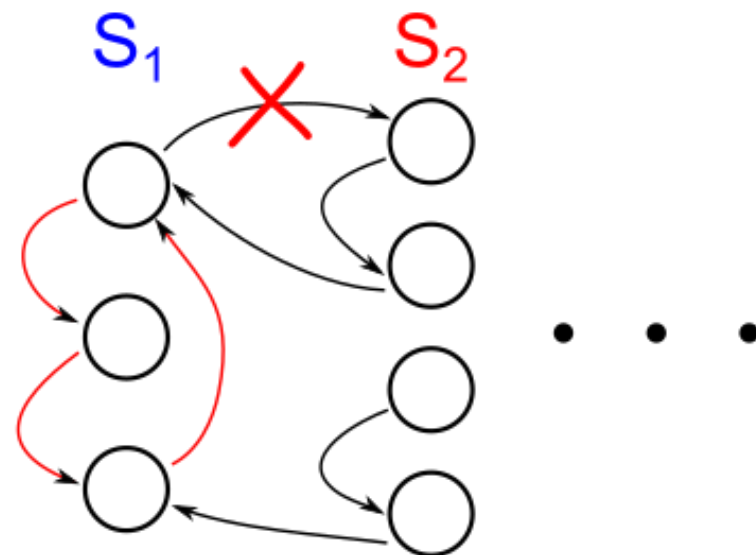
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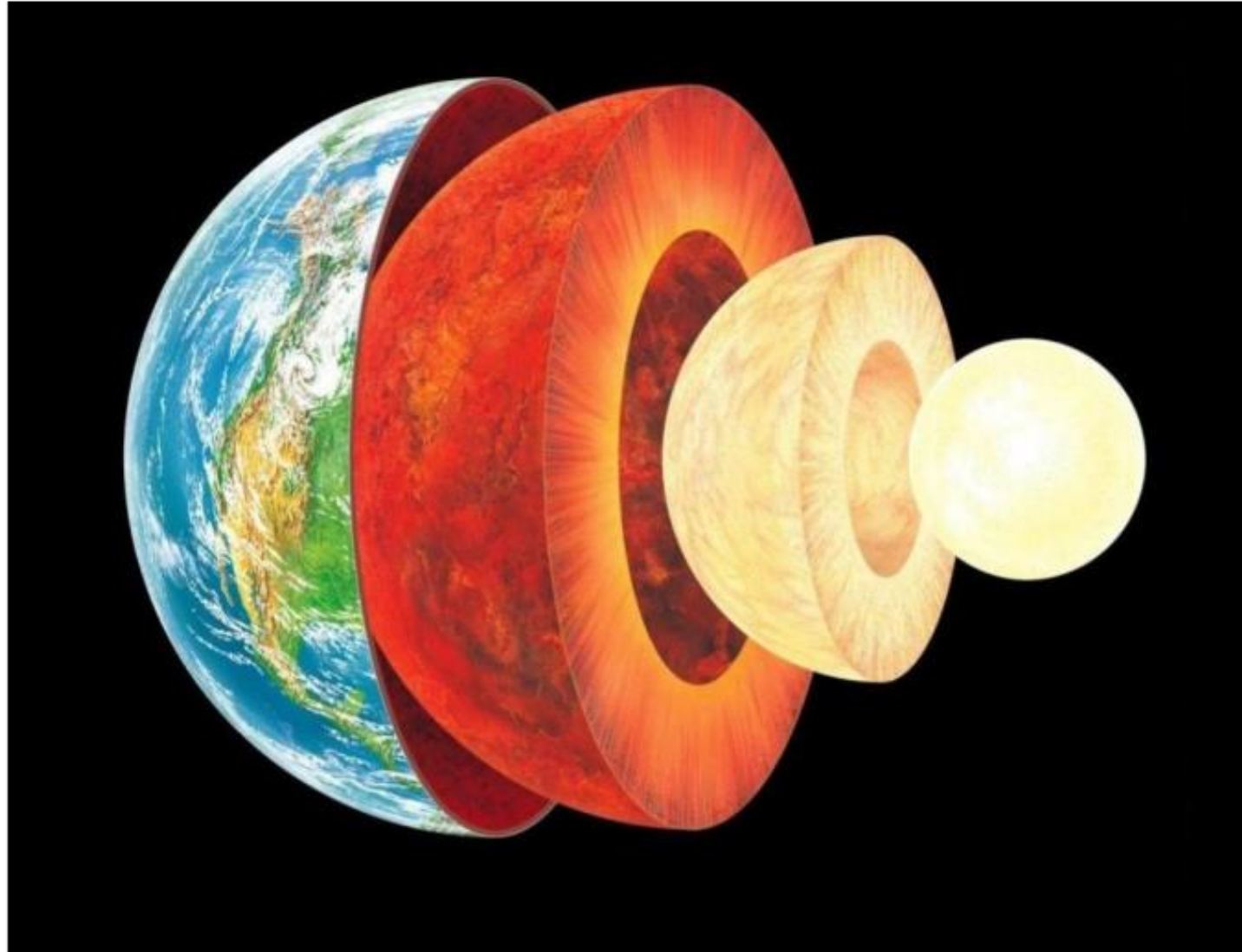


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The Core



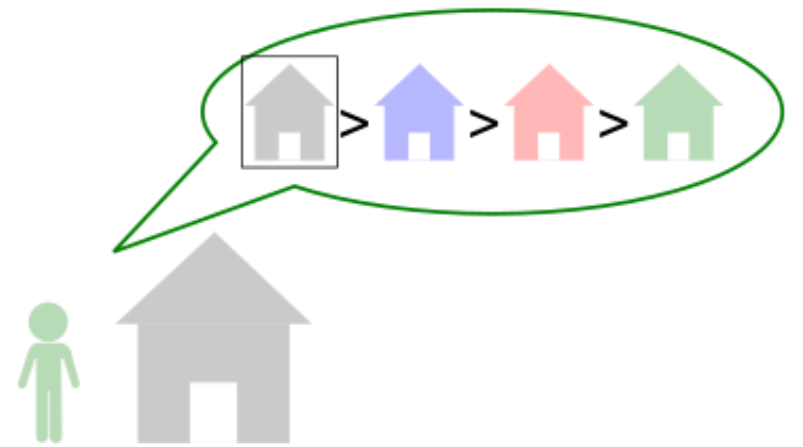
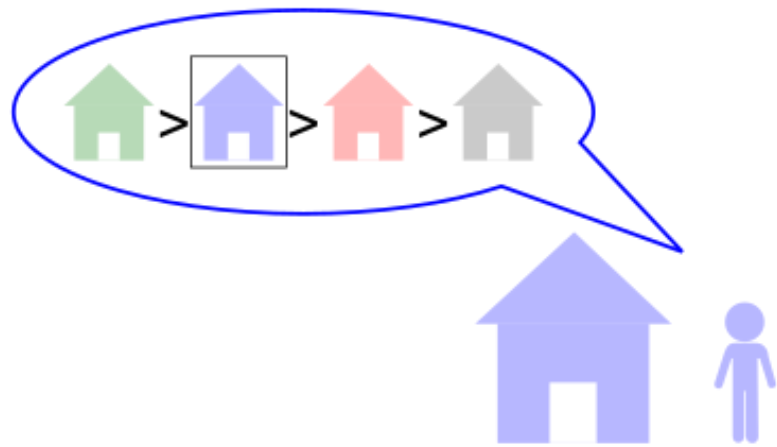
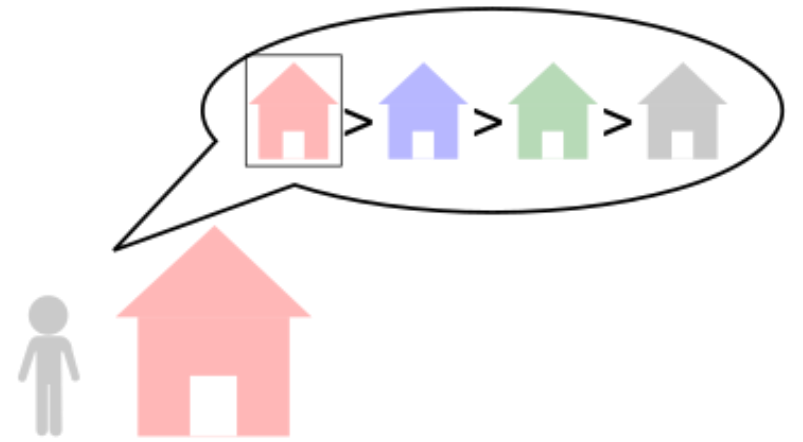
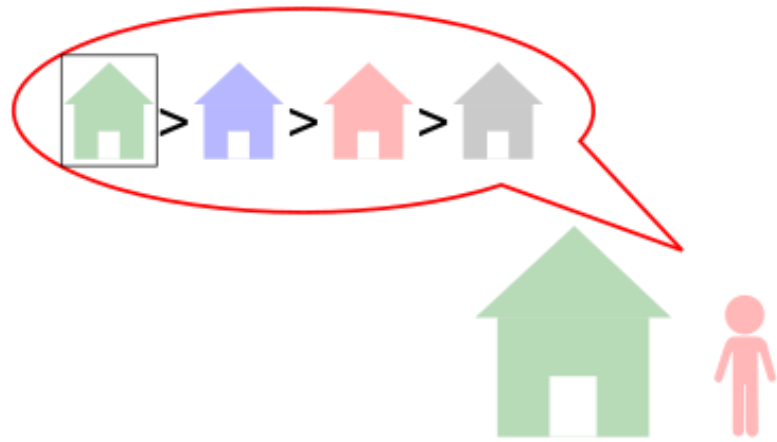
The Core

An allocation is in the **core** if no coalition blocks it.

A coalition of agents **blocks** an allocation **A** if:

- they can redistribute their **endowed houses** among themselves such that, compared to **A**, none of them is worse off and at least one of them is strictly better off (i.e., redistributing endowments is a Pareto improvement over **A**), and
- the coalition is *minimal* (no subset can redistribute and improve)

Example of a Core Allocation



TTCA outcome is in the core.

[Shapley and Scarf, *JME* 1974 (attributed to David Gale)]

TTCA outcome is in the core.

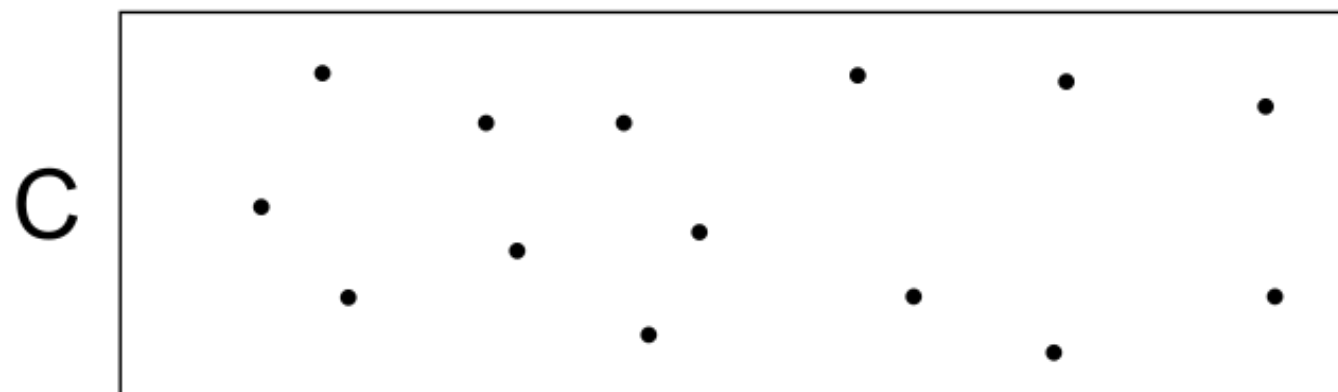
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Suppose not. Then, a coalition C of agents must block the TTCA allocation T . Let R be a redistribution of endowments among agents in C that they find Pareto better than T .

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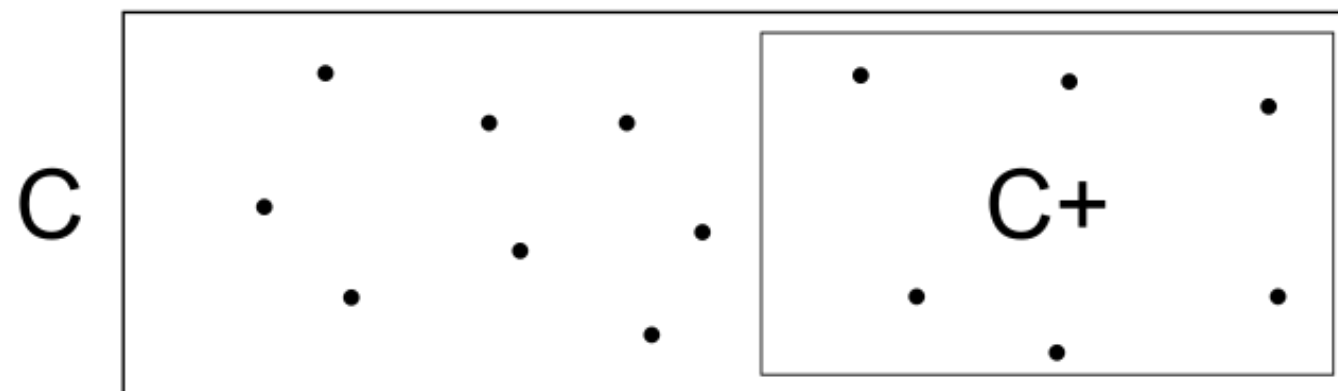


T = TTCA outcome, R = redistribution of endowments within C

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Let $C^+ \subseteq C$ be the agents in C who *strictly prefer* R over T .

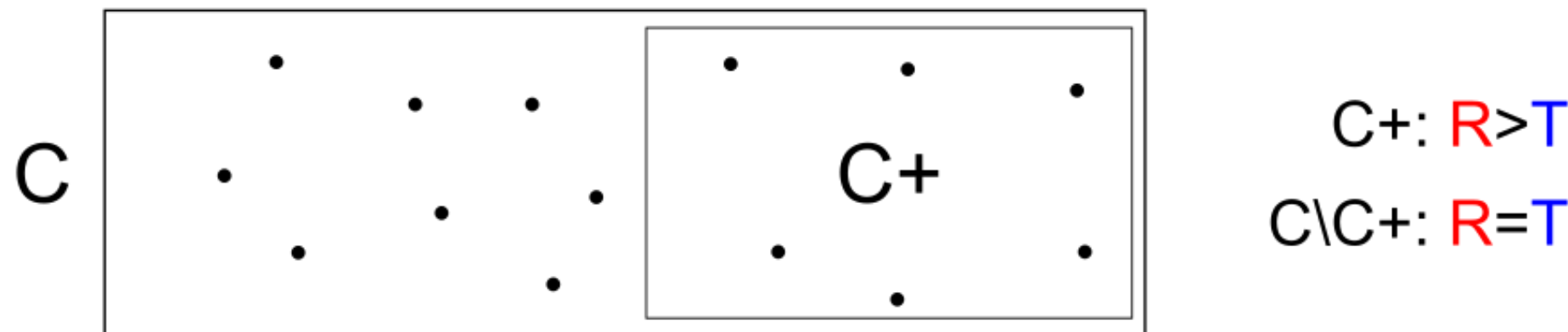


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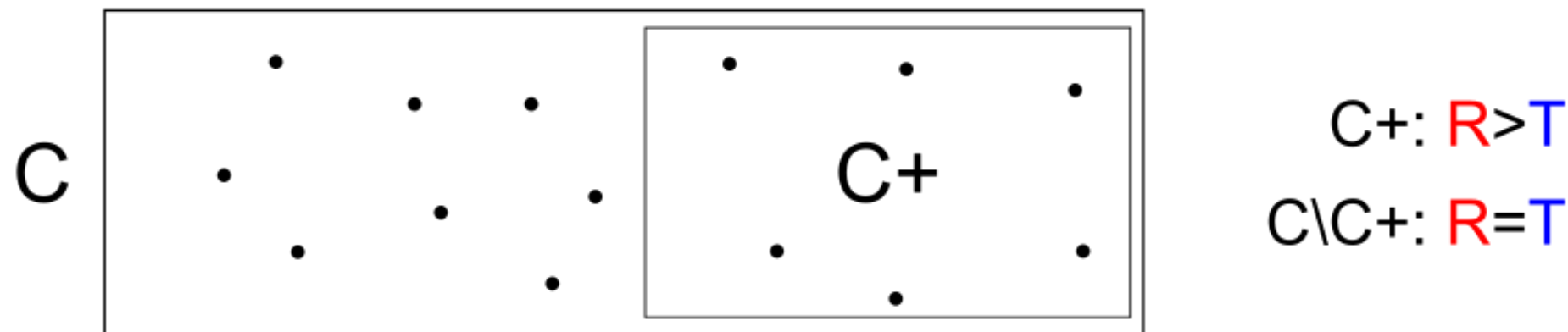


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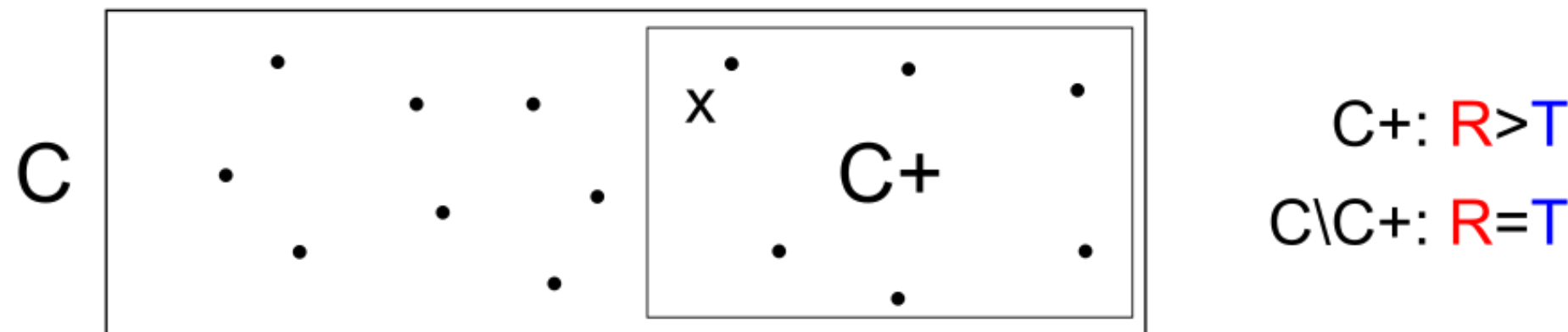


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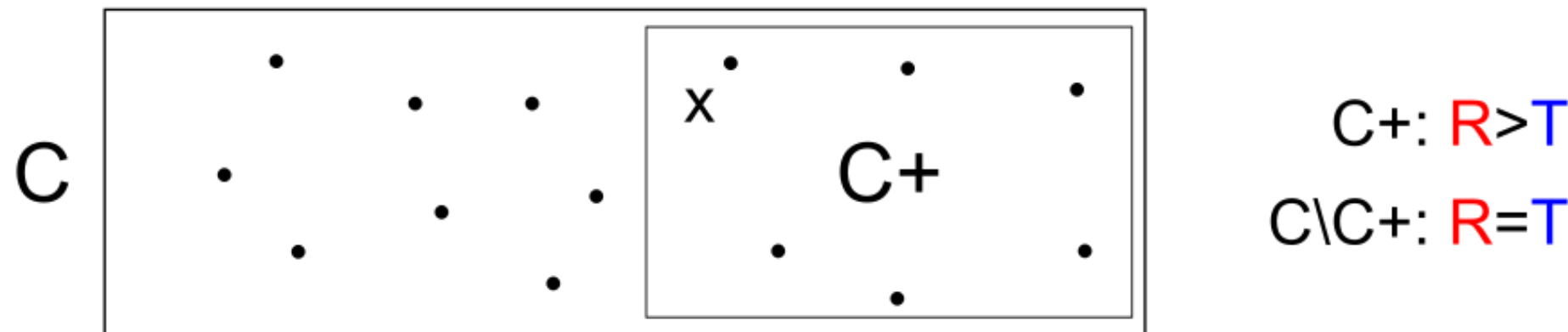


T = TTCA outcome, R = redistribution of endowments within C

TTCA outcome is in the core.

[Shapley and Scarf, *JME* 1974 (attributed to David Gale)]

At the time x is eliminated (round r), all agents in C^+ are still available under TTCA along with their endowed houses.

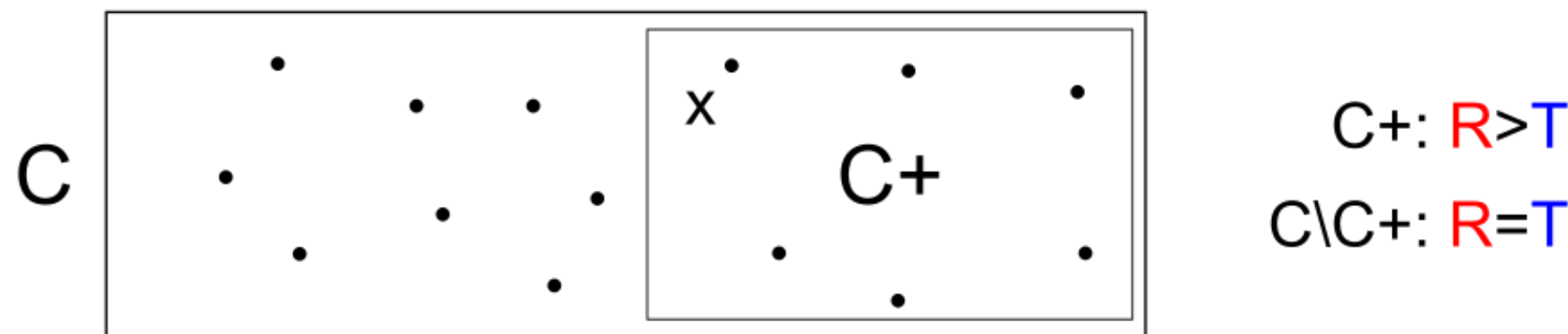


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The house x gets under T is at least as good (according to x 's preference) as the endowed house of any agent in C^+ .

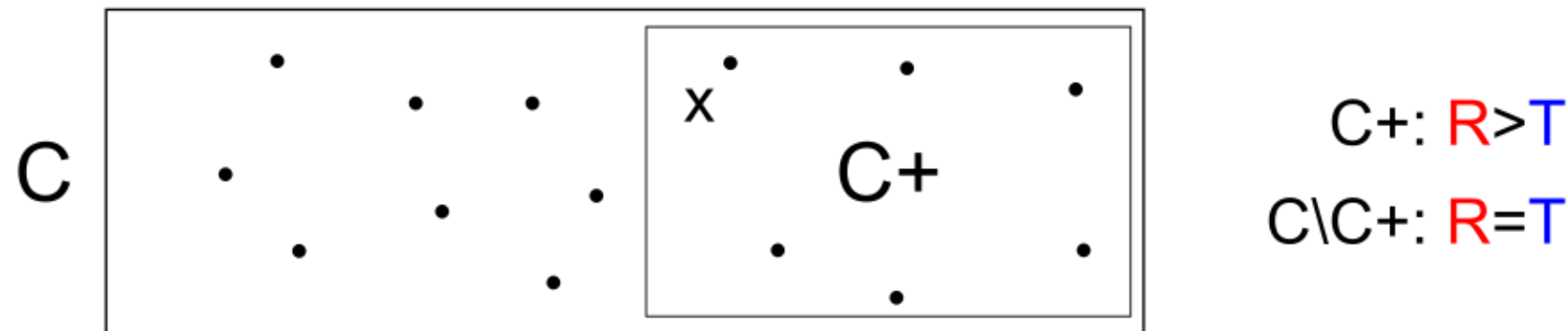


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The house x gets under R is strictly better (according to x 's preference) than the endowed house of any agent in C^+ .

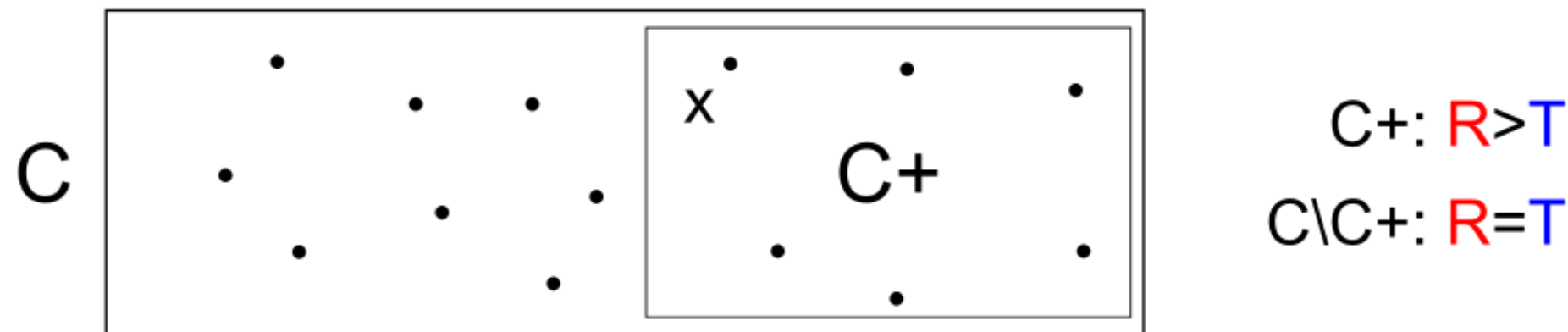


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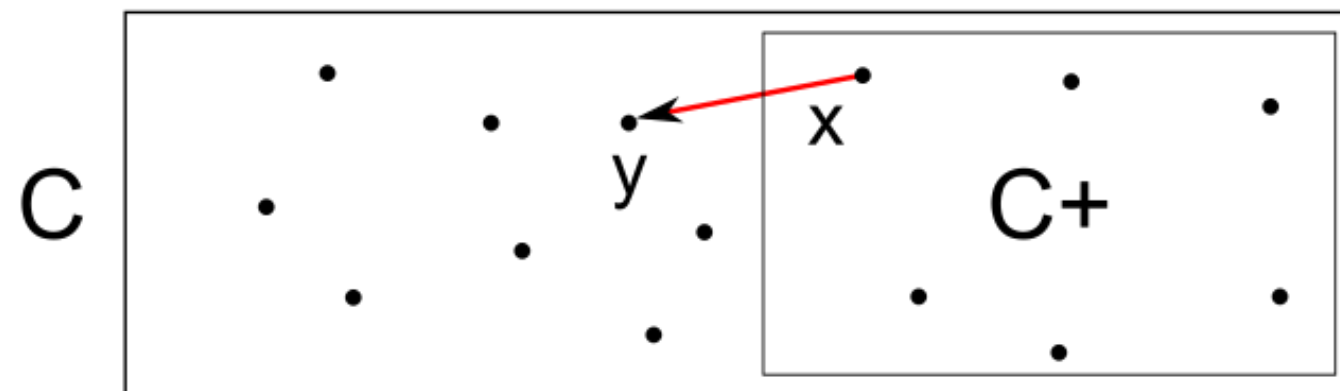


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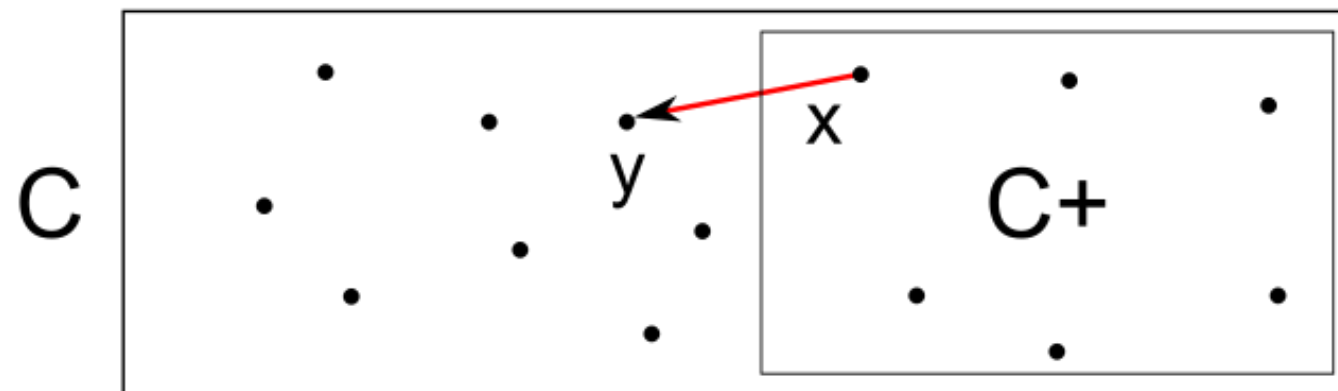
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Then, under TTCA, agent y must have been eliminated in round $r-1$ or earlier (i.e., strictly before x).



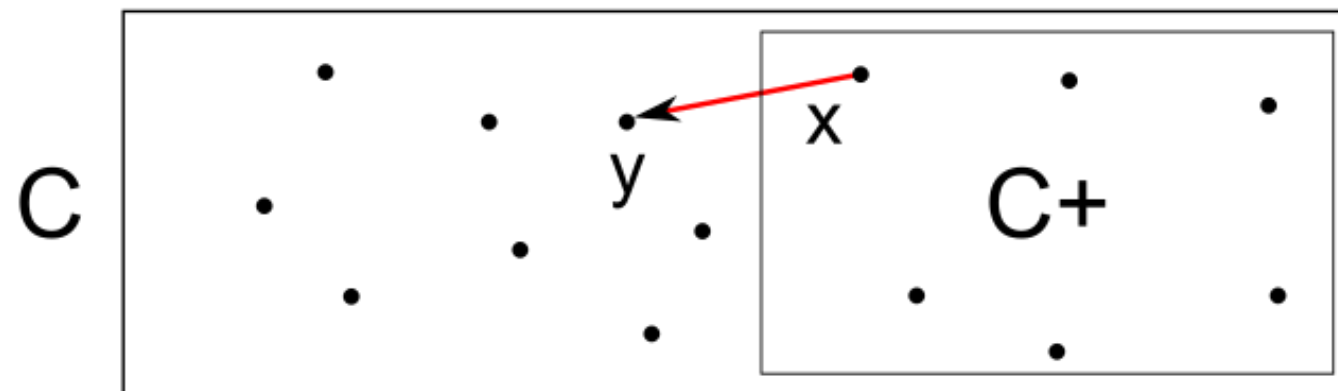
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Agent y cannot get its own endowed house under the TTCA outcome T (due to minimality).



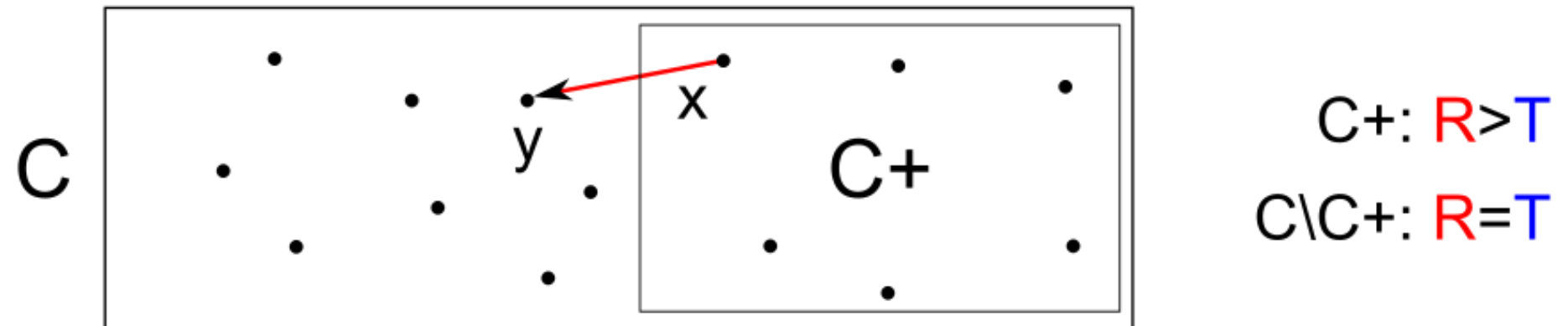
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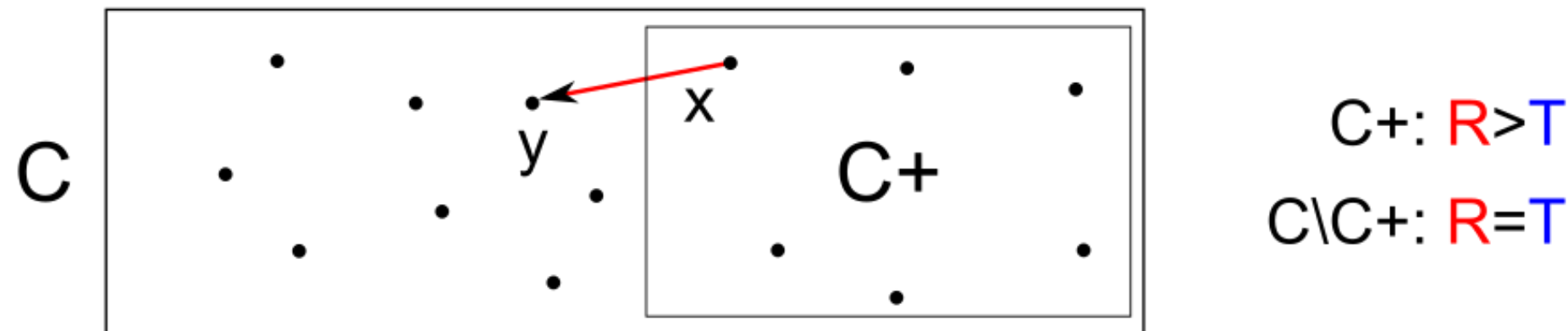
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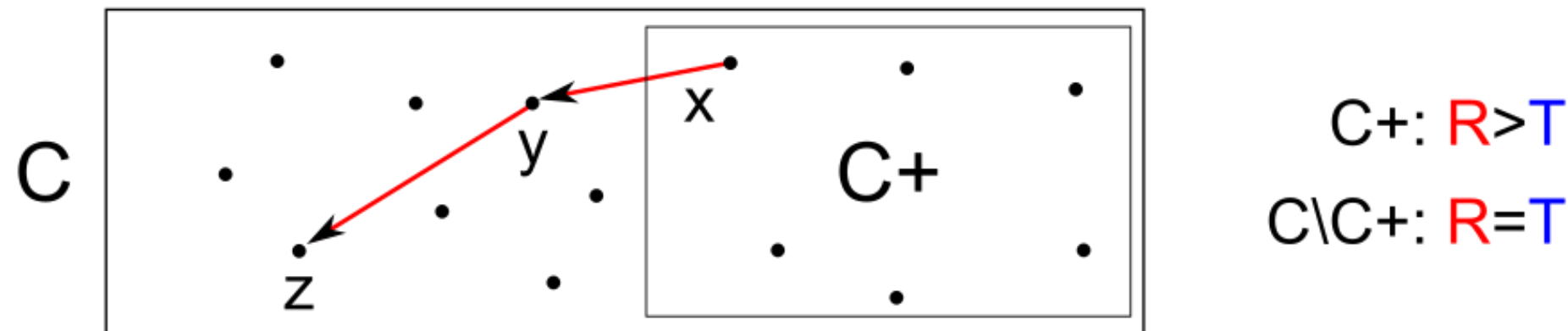
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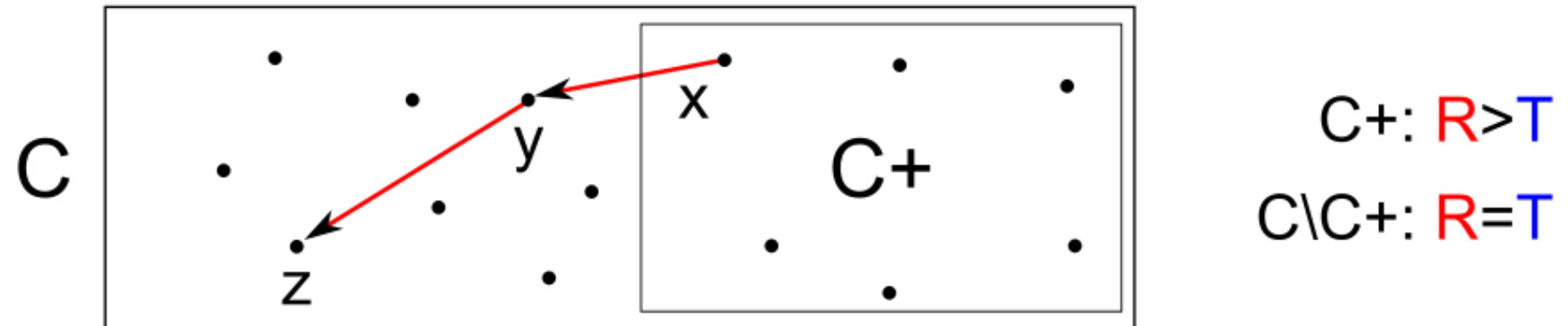


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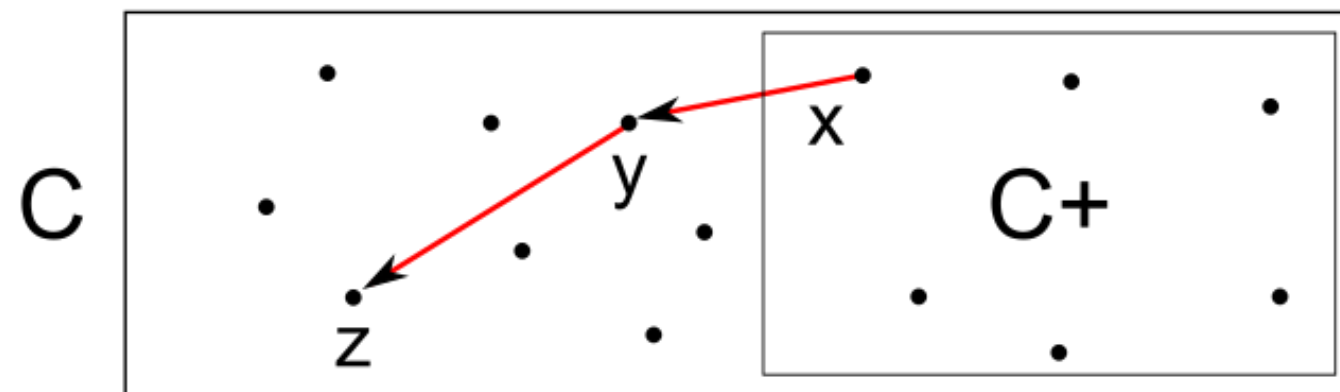
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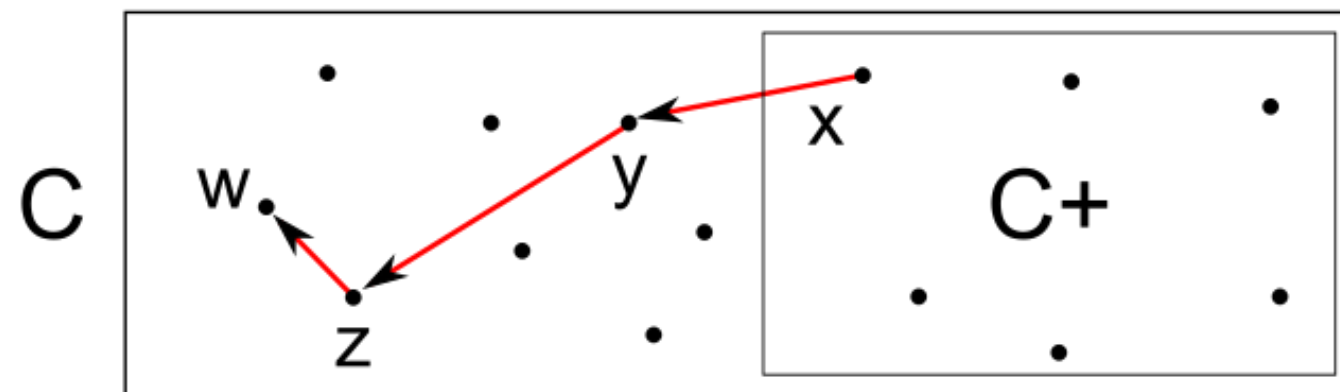
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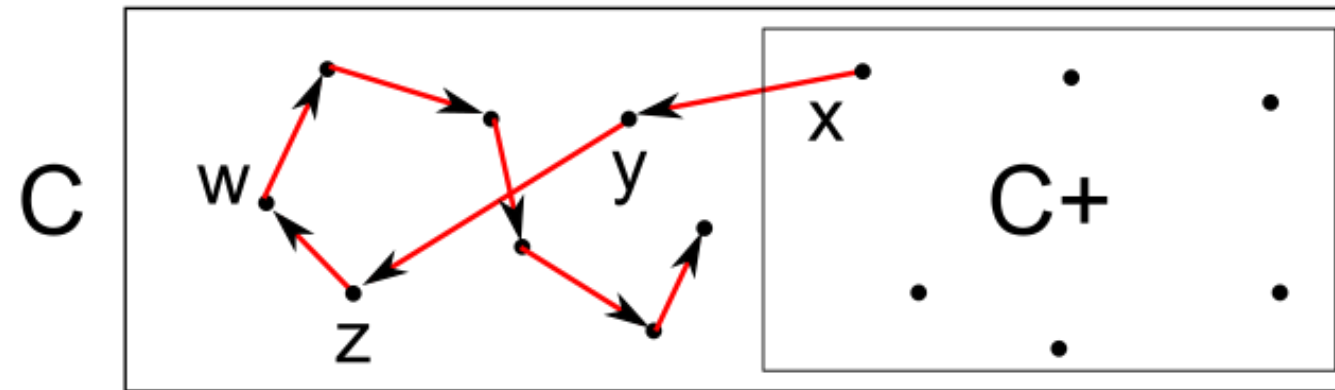
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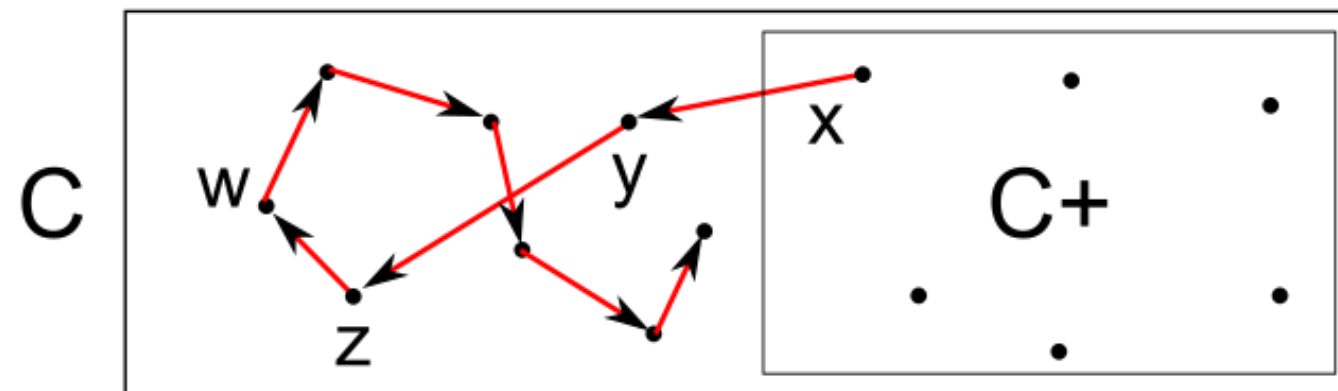
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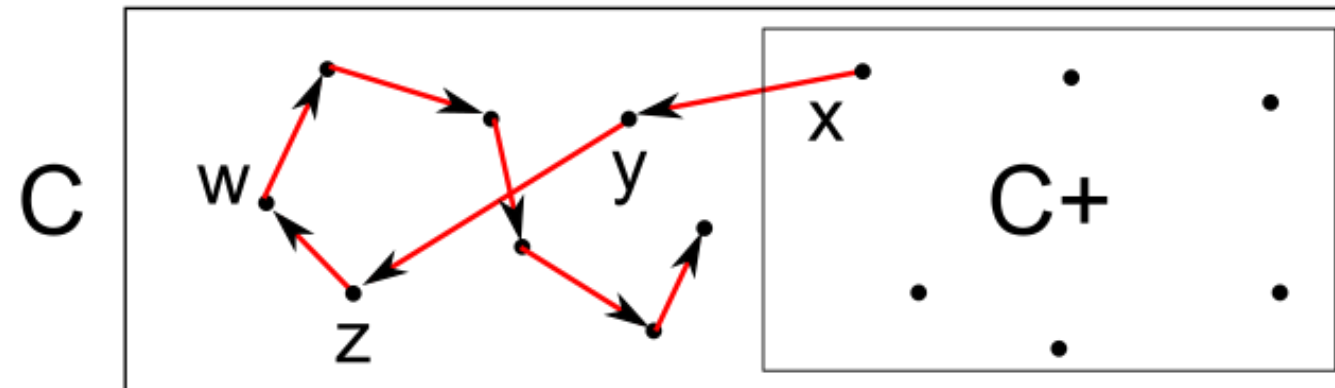
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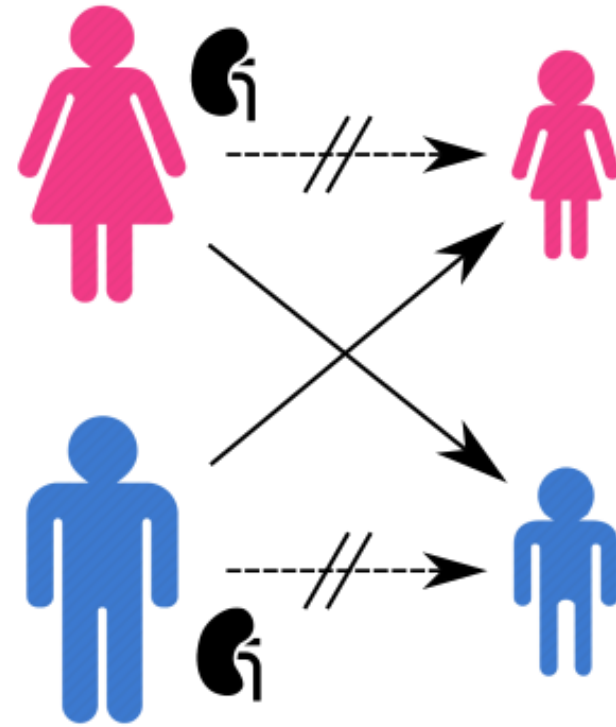
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In fact, TTCA recovers the **unique** core outcome.

[Discuss on Teams channel or on Piazza]

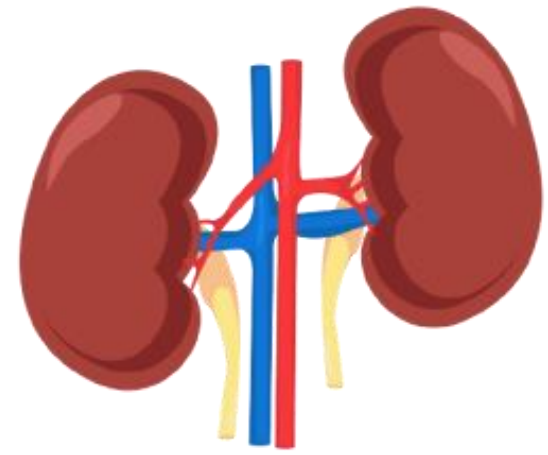
Application of TTCA



Kidney Exchange

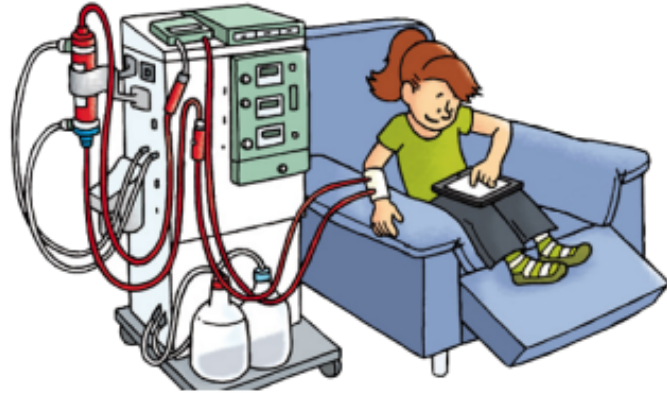
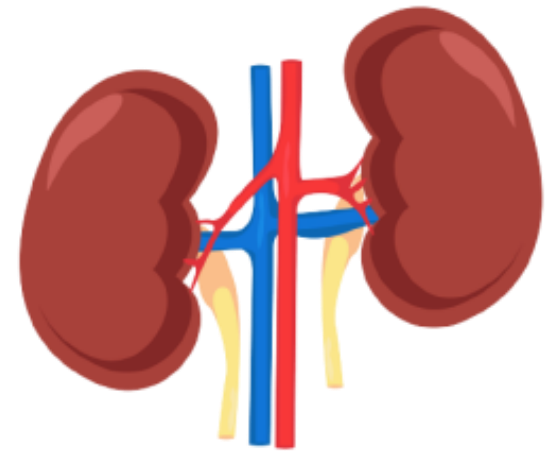
Kidney Exchange

Many people suffer from kidney failure
(waiting list in US: ~90,000; in India: ~200,000).



Kidney Exchange

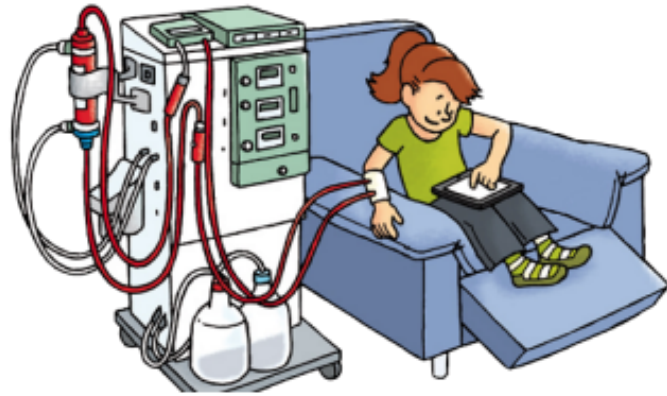
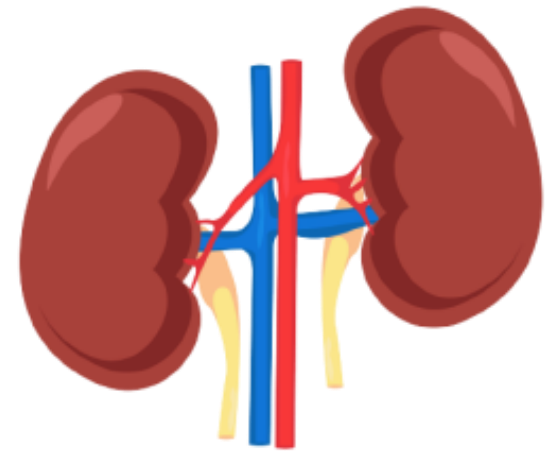
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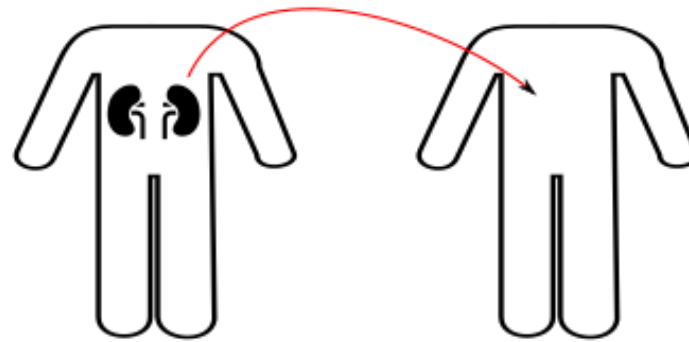
Dialysis

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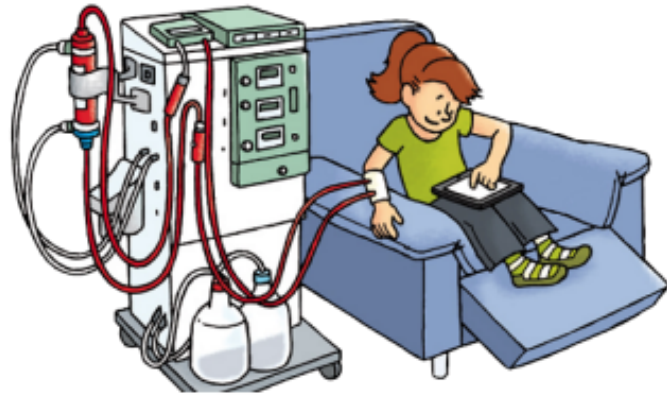
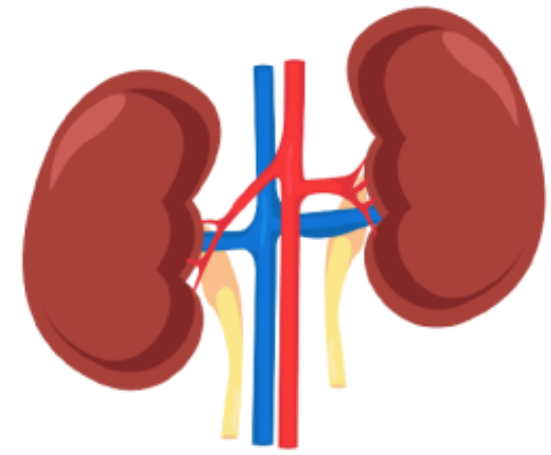
Dialysis



Transplant

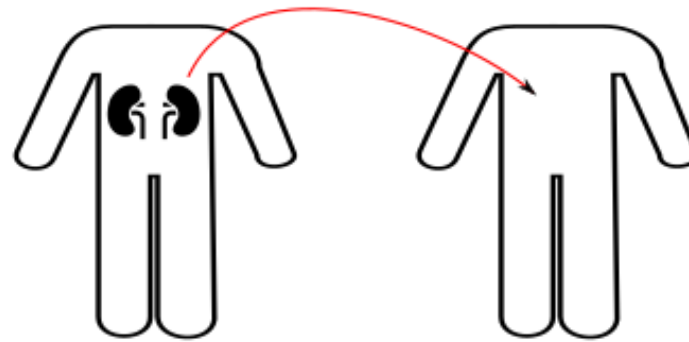
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Dialysis

Poor quality of life
High cost

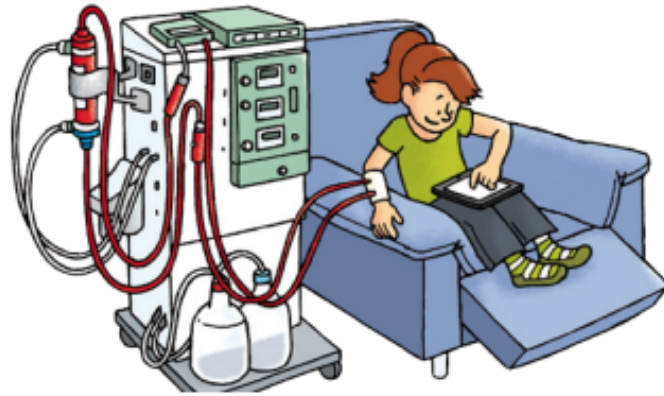
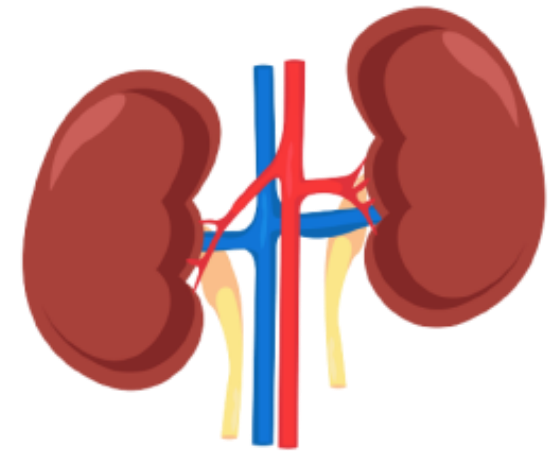


Transplant

Better life quality
Lower cost

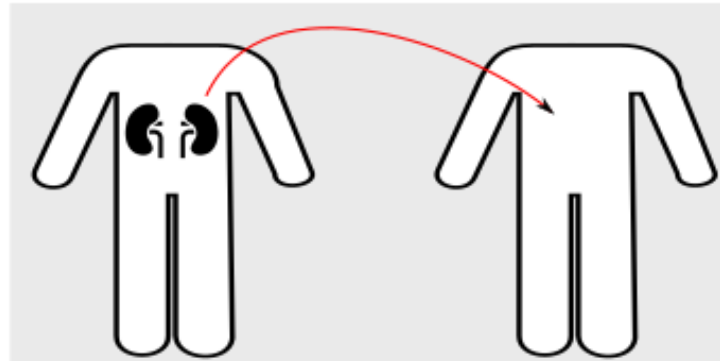
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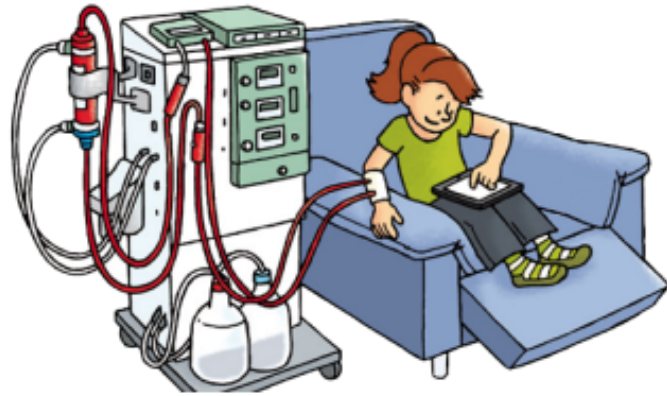
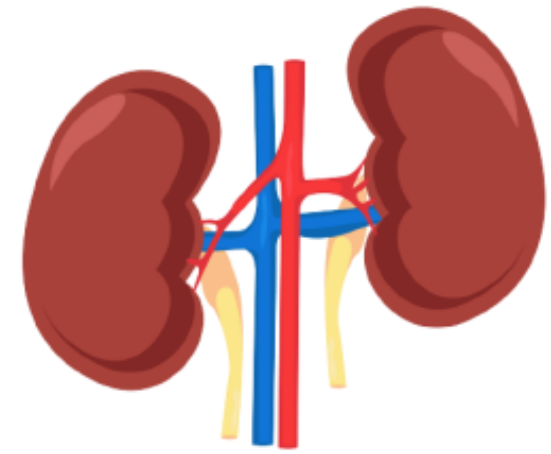
Better life quality
Lower cost

- From a **deceased donor**

- From a **living donor**

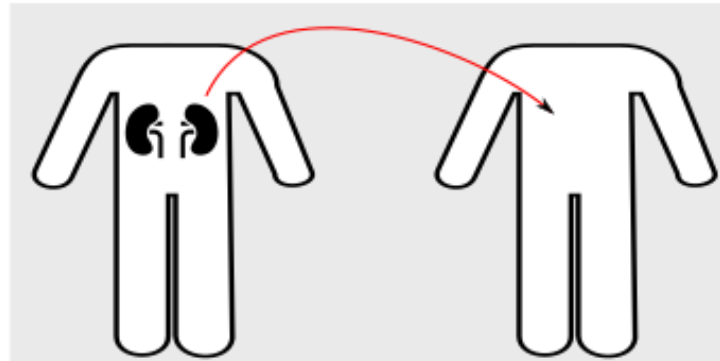
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- From a **living donor**

E.g., first-degree relatives,
spouse etc.

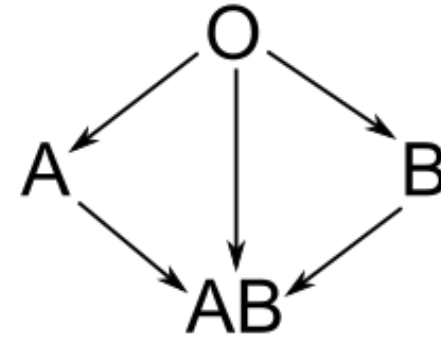
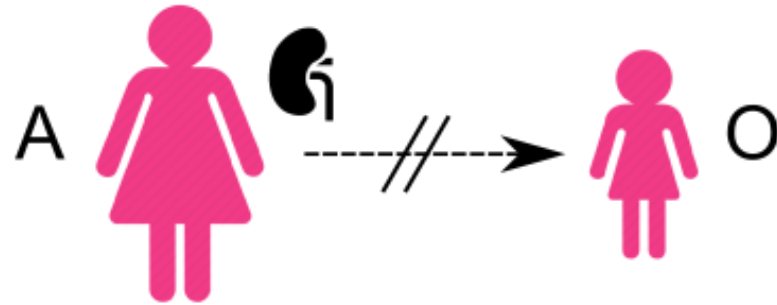
Kidney Exchange

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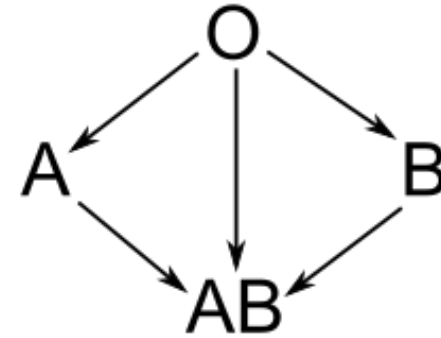
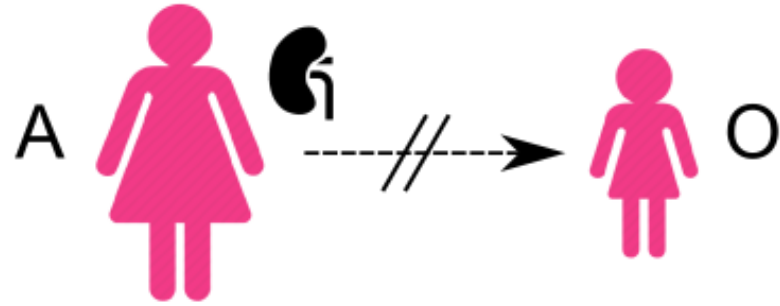
Blood-type incompatibility



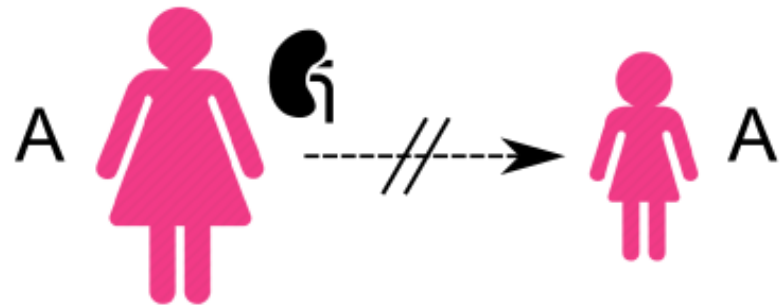
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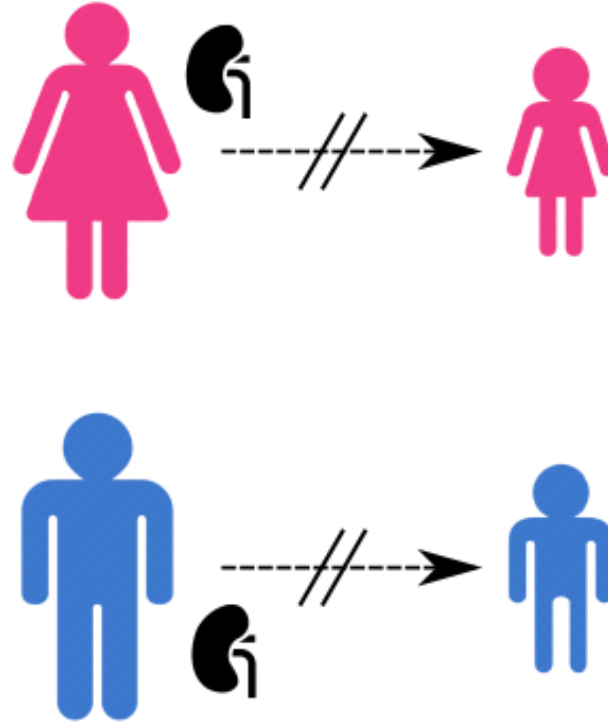
Tissue-type incompatibility



Sensitized patients with antibodies that will attack a foreign tissue (often due to prior exposure during blood transfusion, pregnancy, previous transplants).

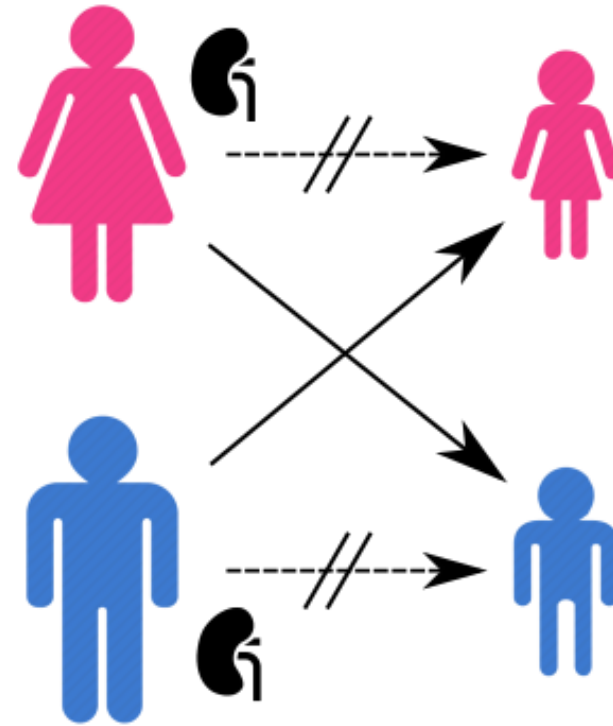
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[Rapaport, *Transpl. Proc.* 1986; Ross et al. *NEJM* 1997]

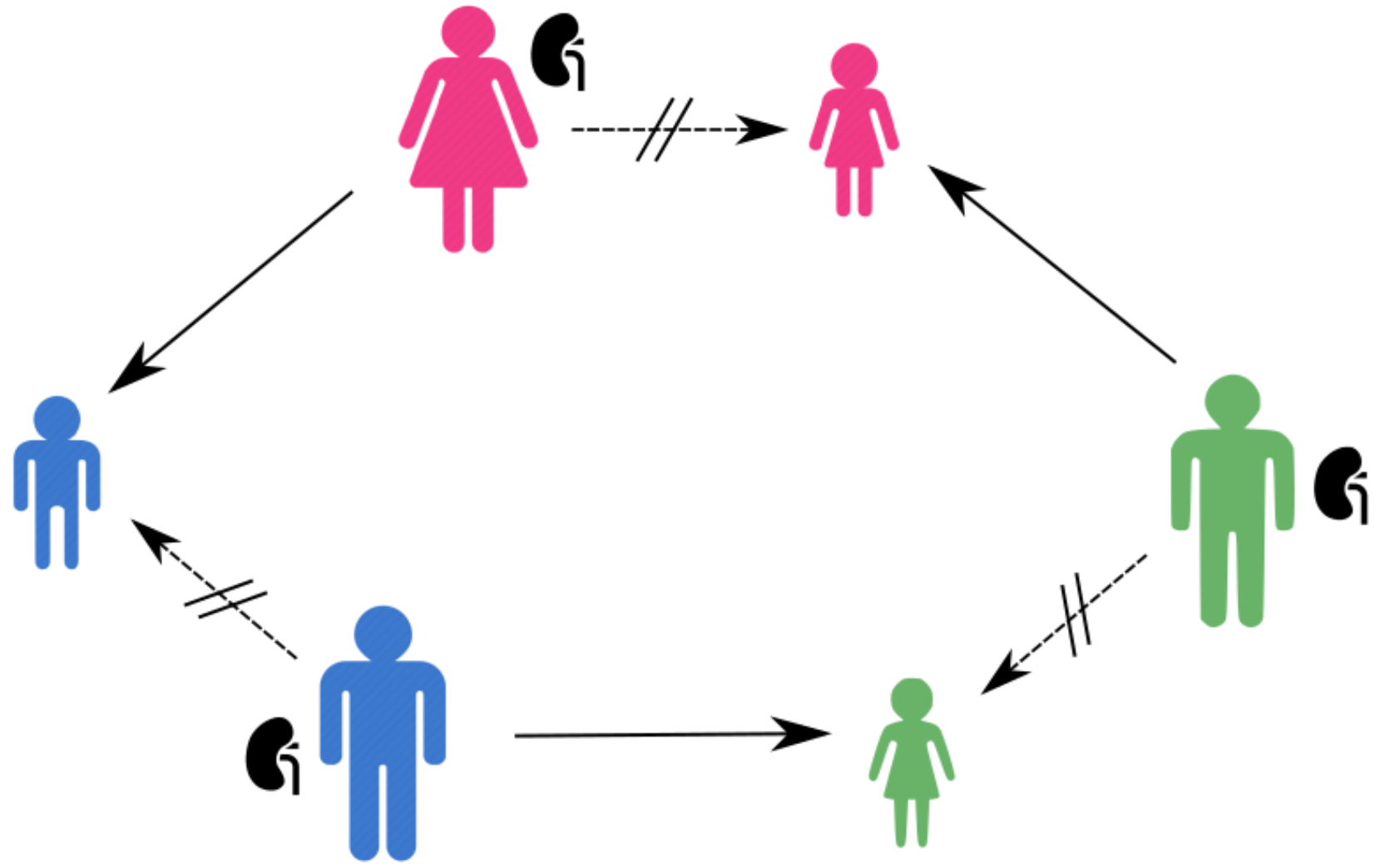


Kidney Exchange

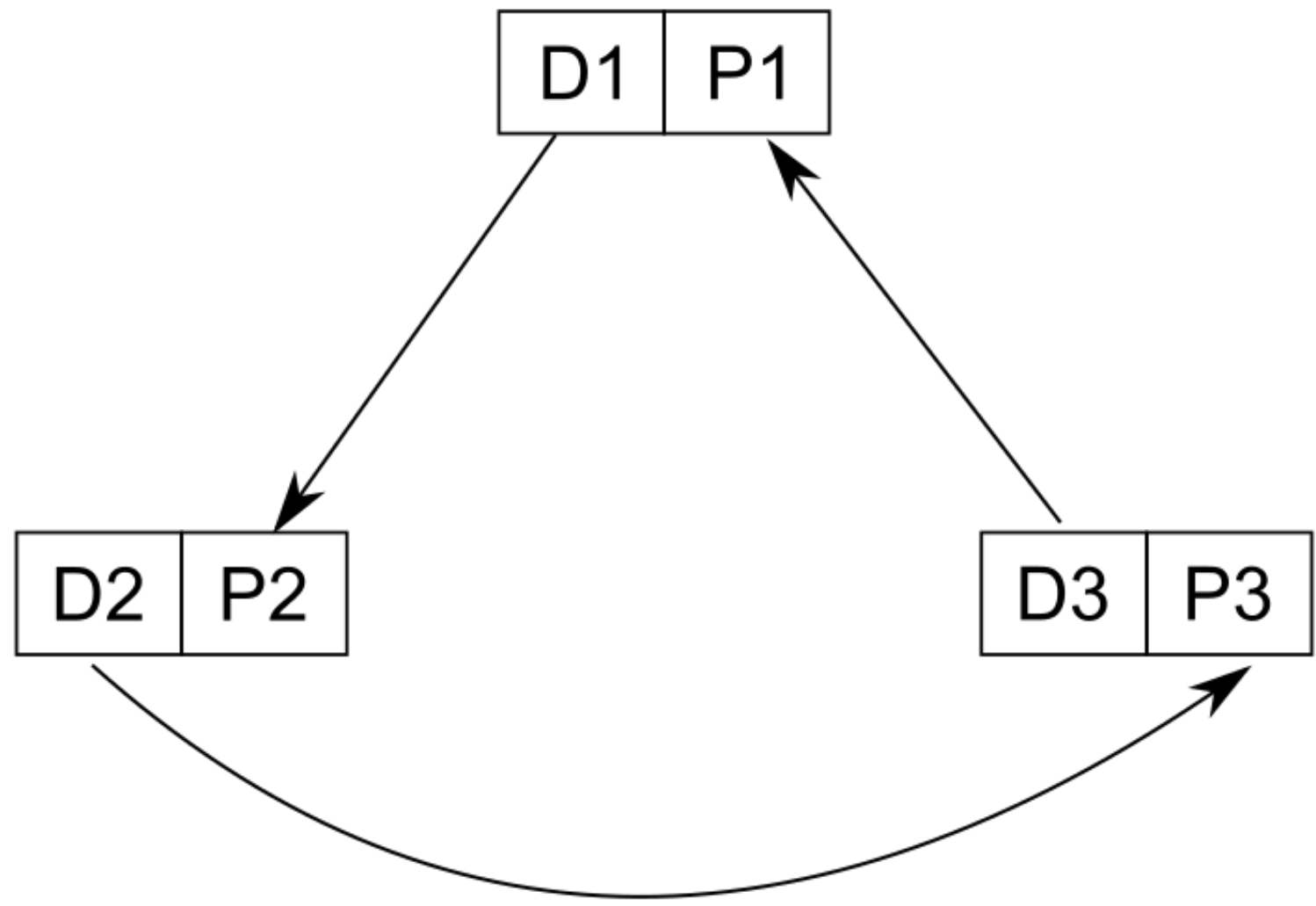
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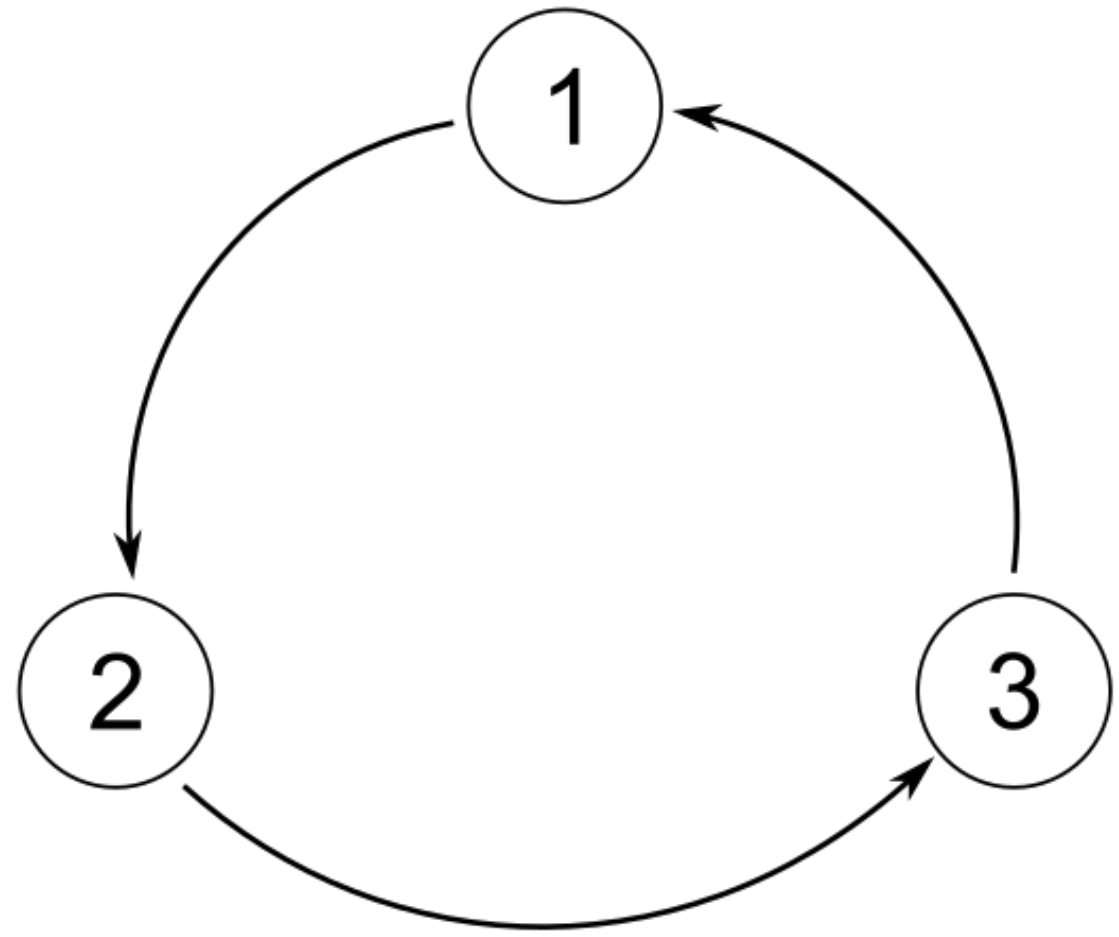
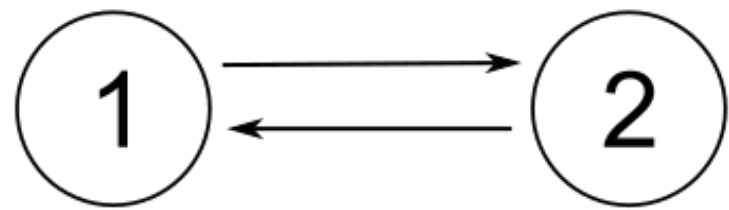
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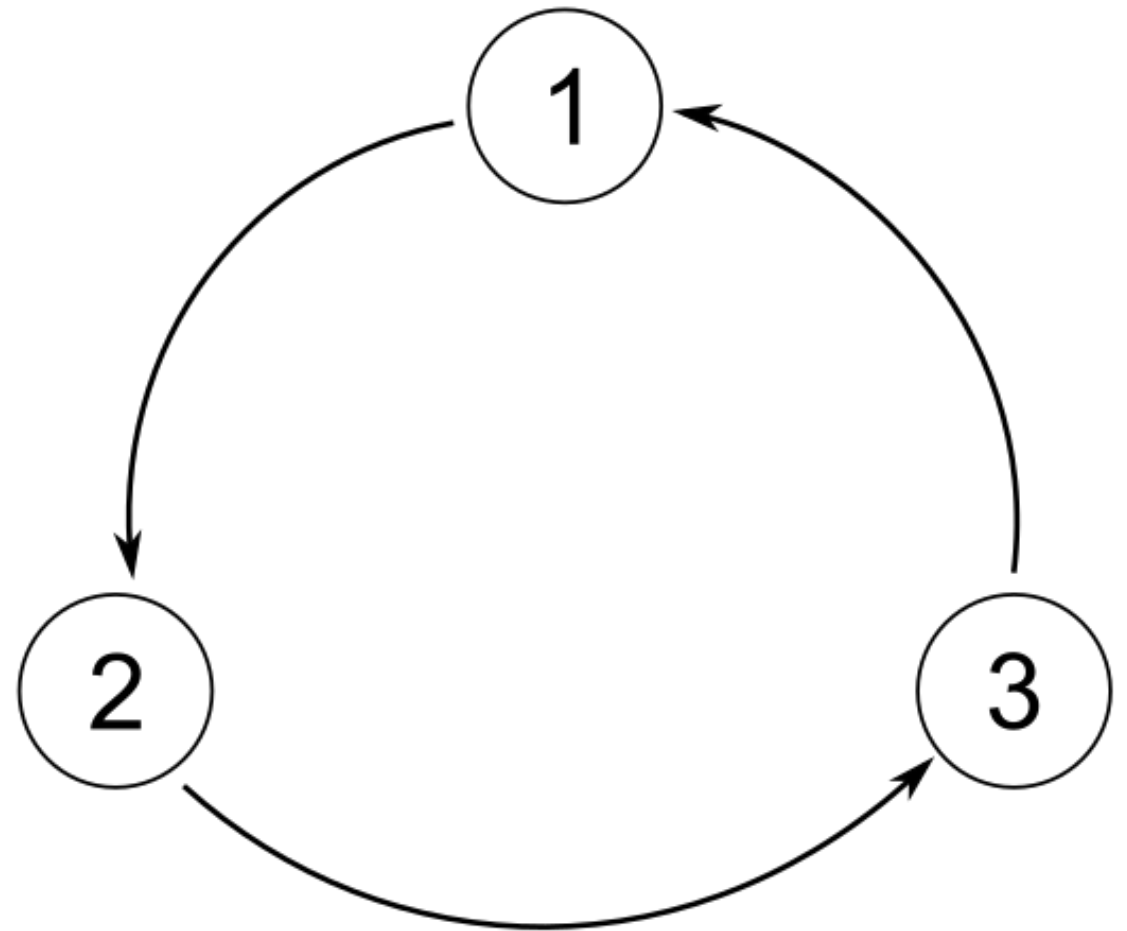
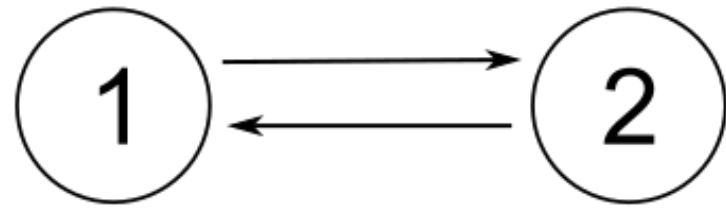
Kidney Exchange



Kidney Exchange



Kidney Exchange



Intuitively, having more and more of such willing-but-incompatible pairs will create more opportunities for an exchange.

History [\[edit \]](#)

Year	Event
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1991	First KPD program started in South Korea by Dr. Park ^[8]
1999	First European KPD transplants performed in Switzerland ^[8]
2000	First KPD transplants performed in USA at the Rhode Island Hospital ^[8]
2001	Hopkins completes KPD transplants and begins first KPD program in USA ^[15]
2004	Dutch established first national KPD program ^[8]
2007	NEAD chain started by APD utilizing first bridge donor ^[16]
2007	Charlie Norwood Living Organ Donation Act clarifies legality of KPD in USA ^[17]
2008	National Kidney Registry organizes its first transplants on Valentine's Day ^[18]
2009	Hopkins leads first 16 patient multicenter Domino Chain ^{[19][20]}
2010	UNOS organizes its first KPD transplants ^[8]
2012	National Kidney Registry completes largest chain involving 60 participants ^[6]
2014	National Kidney Registry sets new record with 70 participant chain ^[7]
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Early Proposals for Kidney Exchange

Proposal 1

Using TTCA



Proposal 2

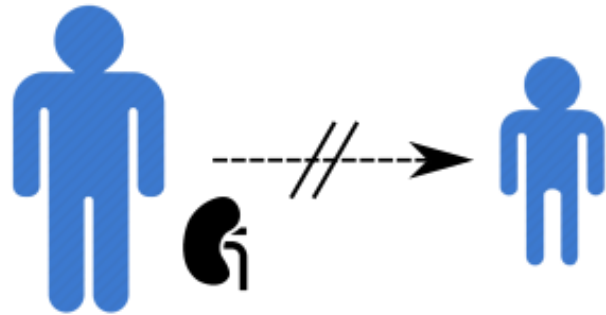
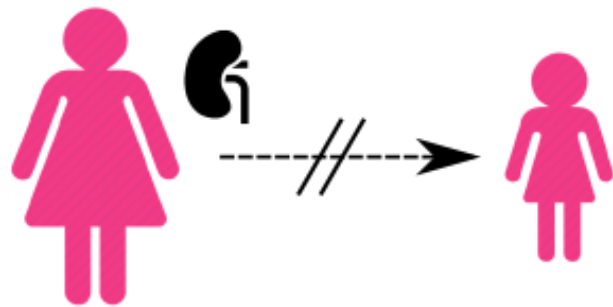


Proposal 1: Kidney Exchange using TTCA

[Roth, Sönmez, and Ünver, *QJE* 2004]

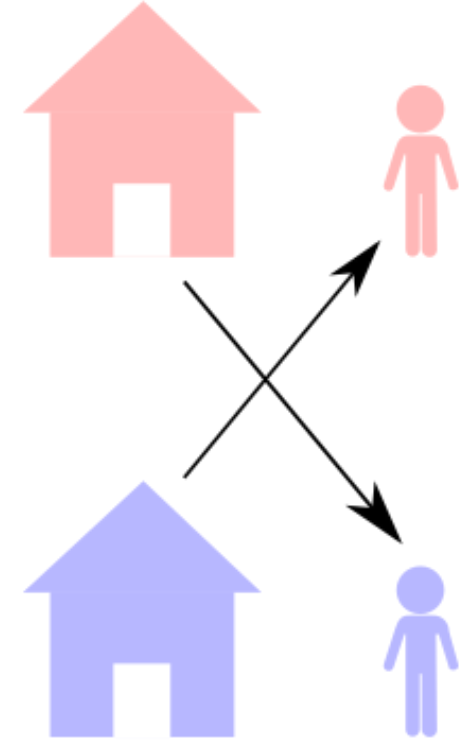
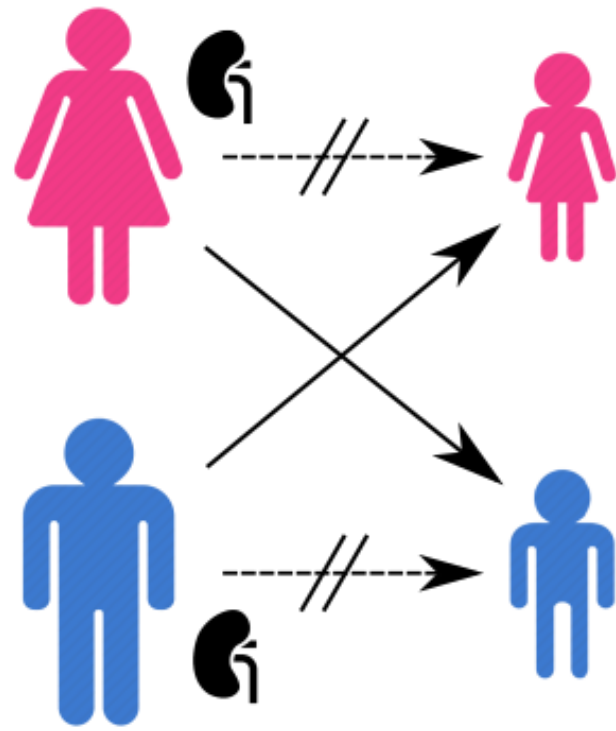
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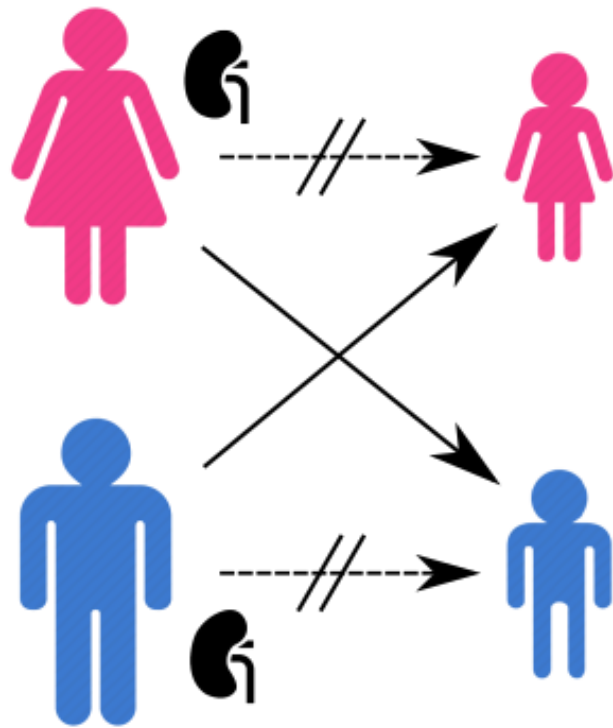
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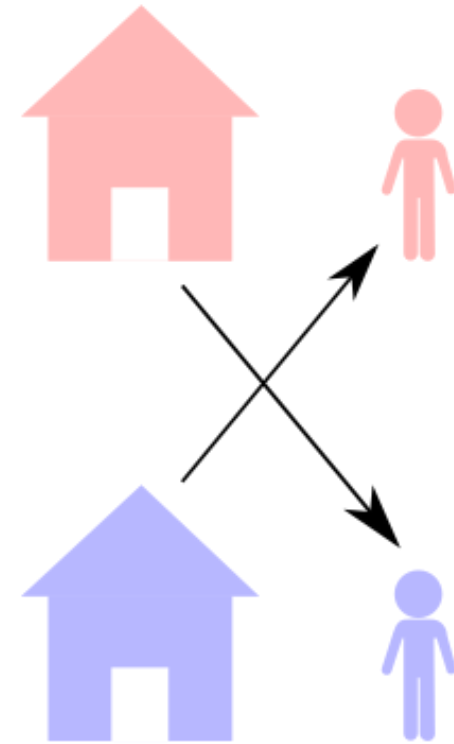


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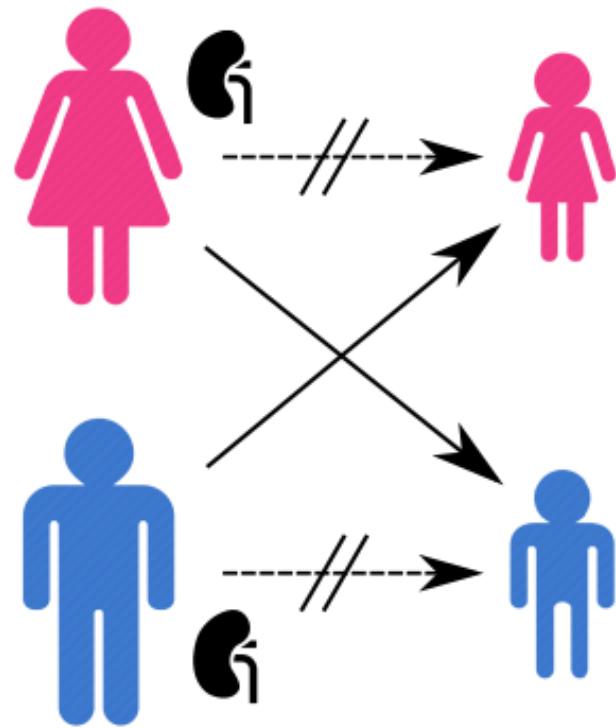
Each patient has a strict ranking of donors.



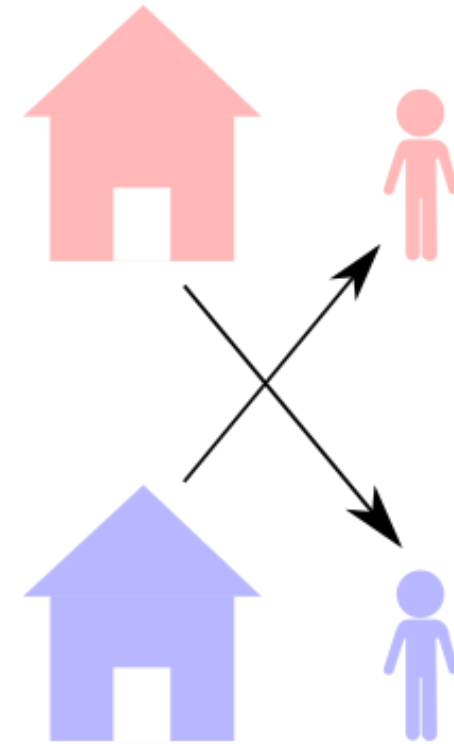
Each agent has a strict ranking of houses.

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[Roth, Sönmez, and Ünver, *QJE* 2004]



Each patient has a
strict ranking of donors.
(medically determined)



Each agent has a
strict ranking of houses.
(idiosyncratic)

Advantages of Kidney Exchange using TTCA

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No group of patients can strictly improve by reallocating donors among themselves.



Every patient is (weakly) better off than before.



Polynomial time.

Limitations of Kidney Exchange using TTCA

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In practice, there may be:



- patients without a donor ("agents without a house")
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3

4



2



1

5



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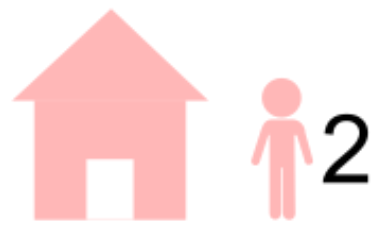
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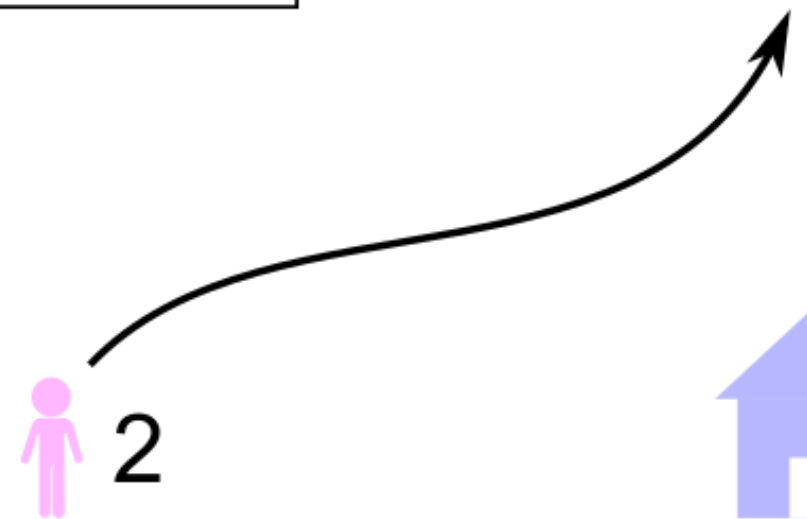
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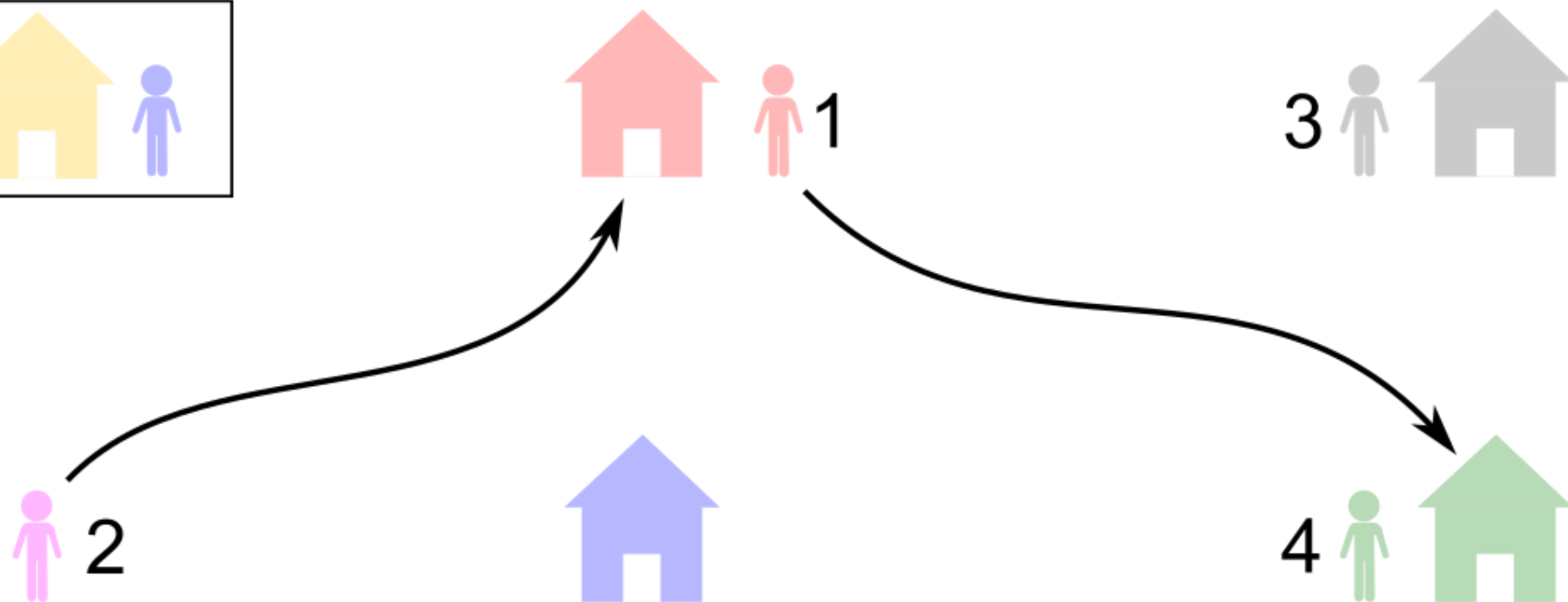
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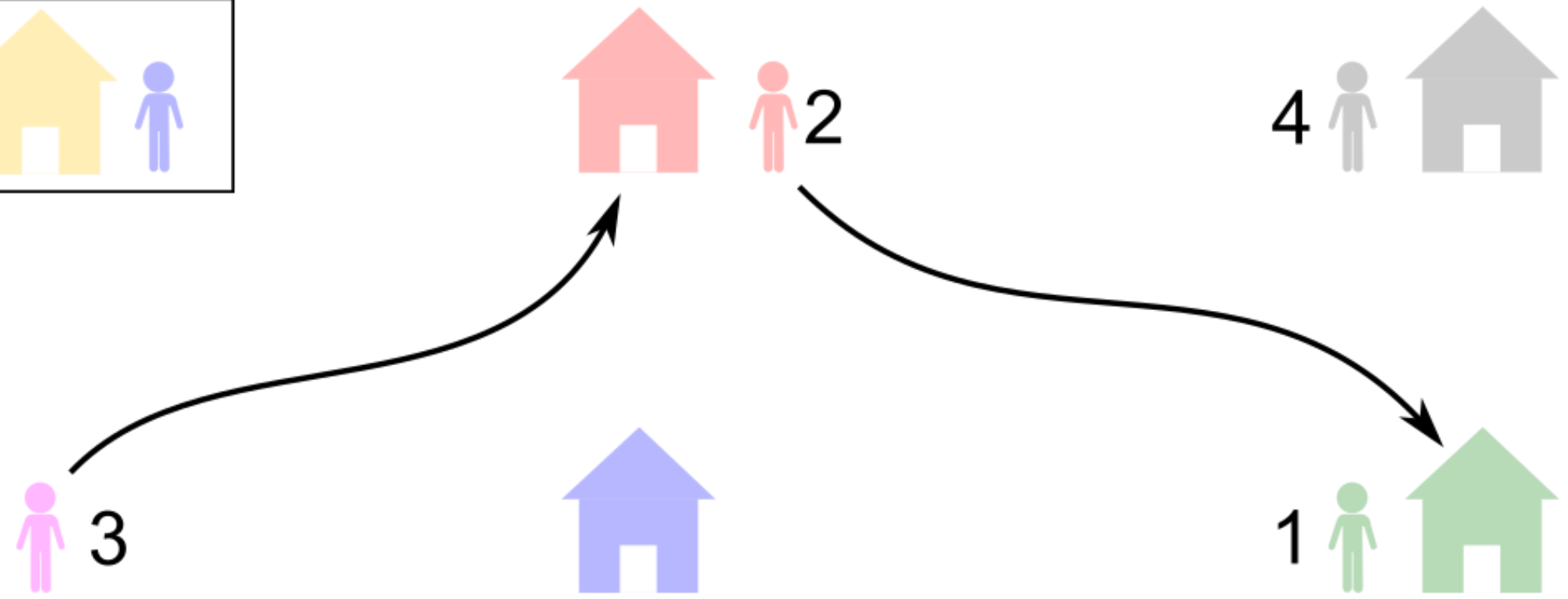
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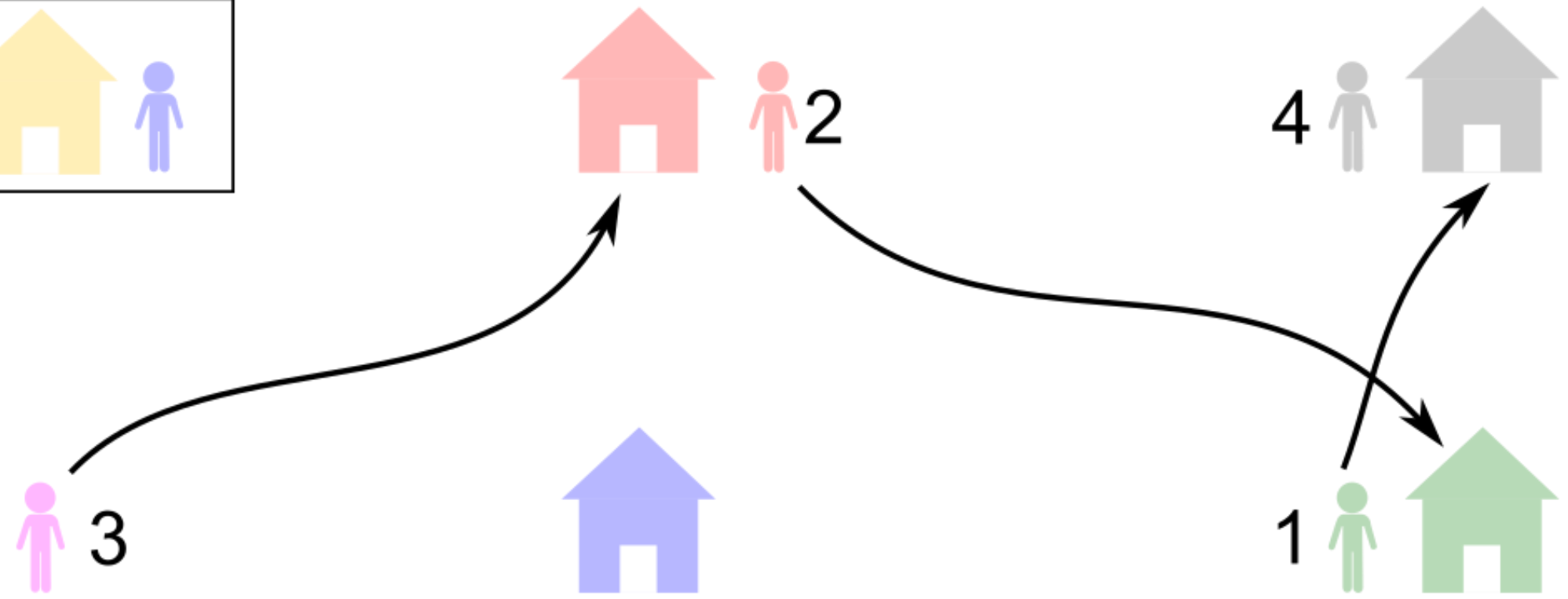
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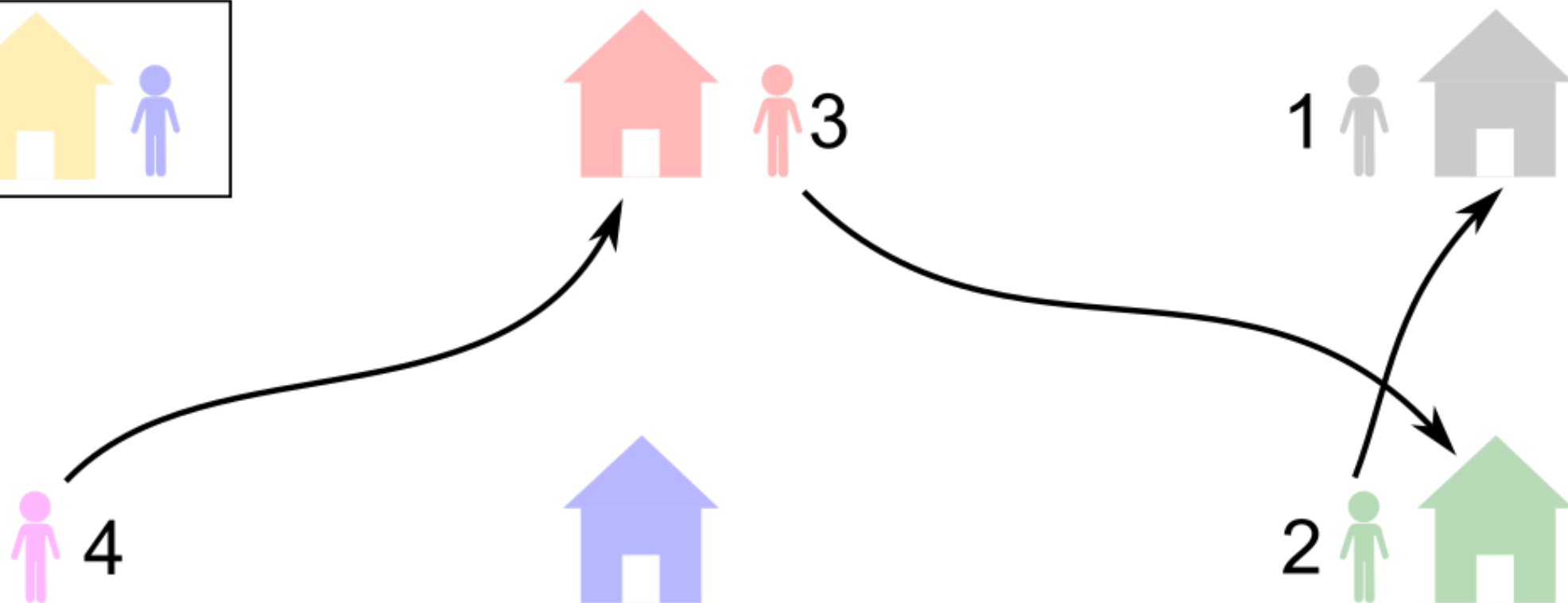
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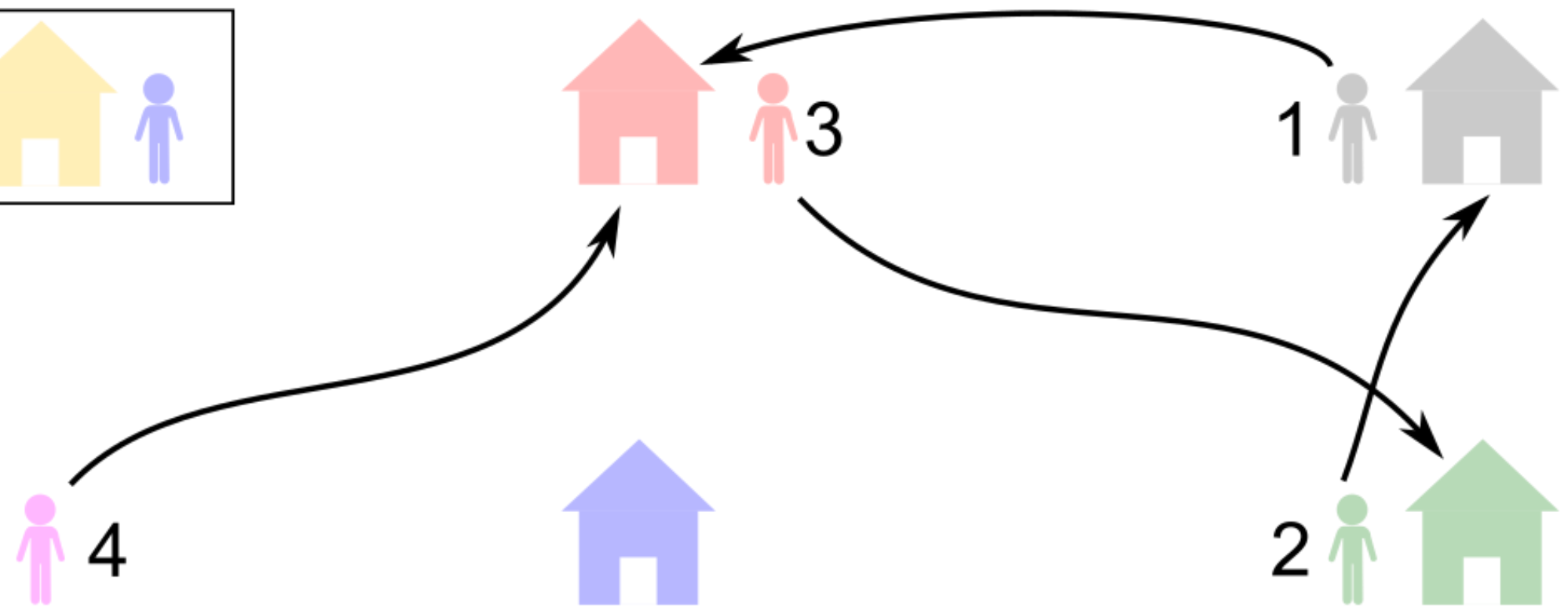
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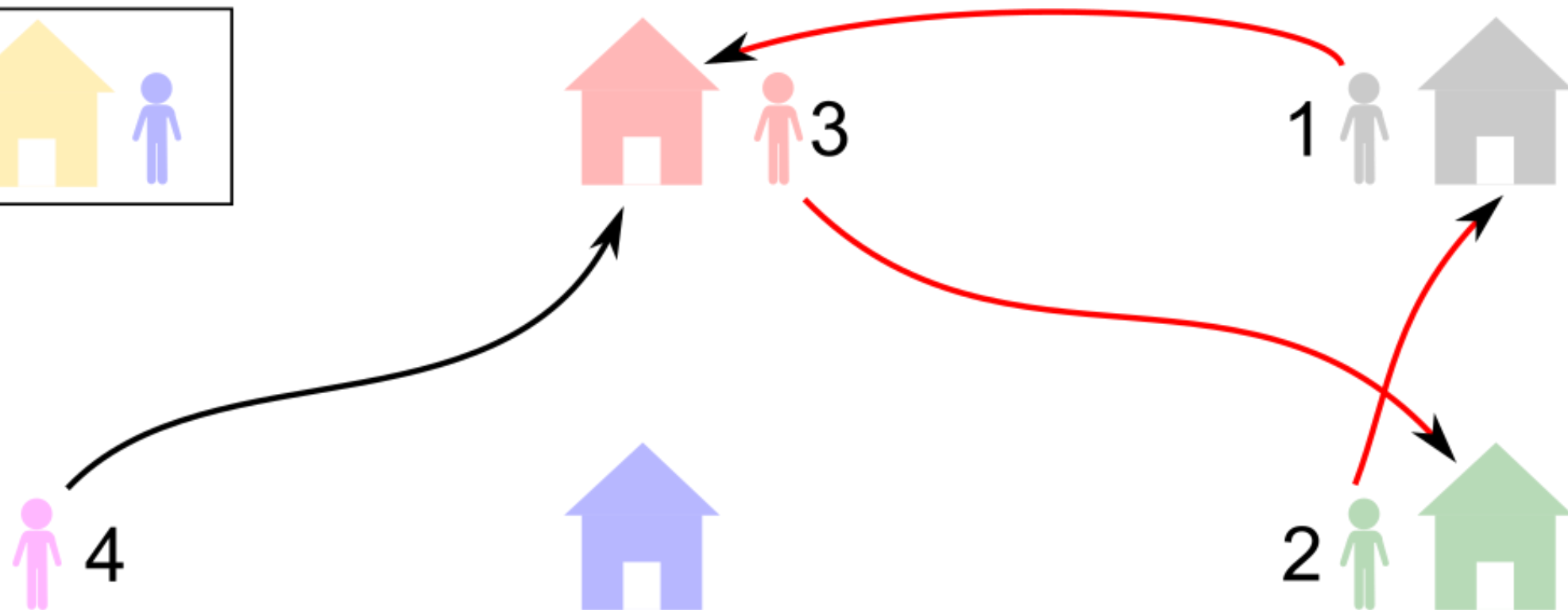
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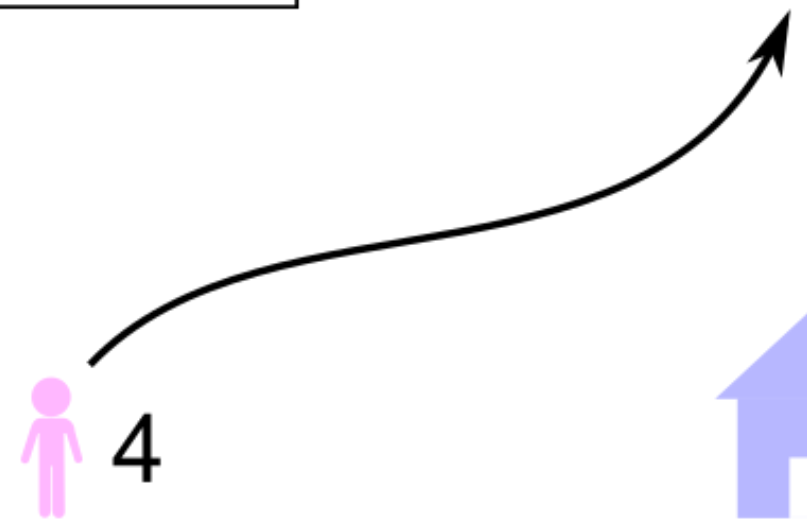
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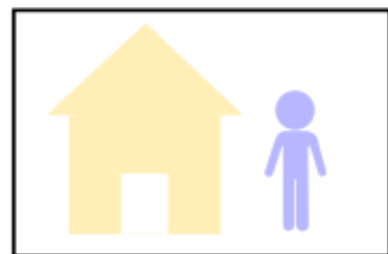
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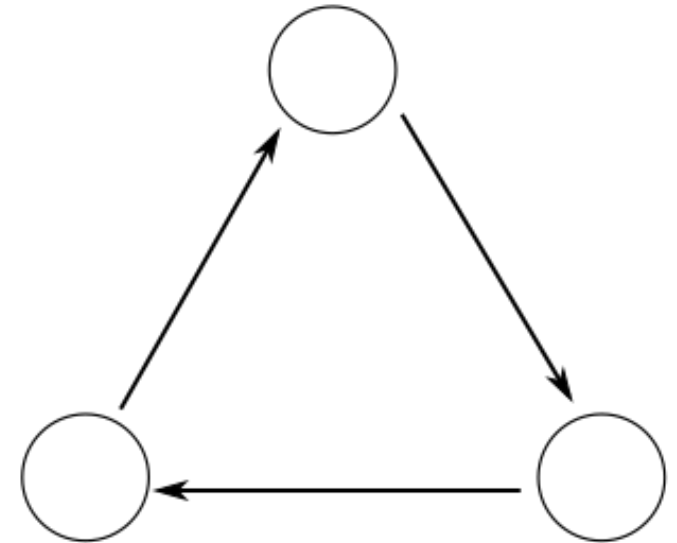
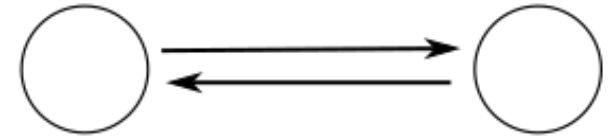
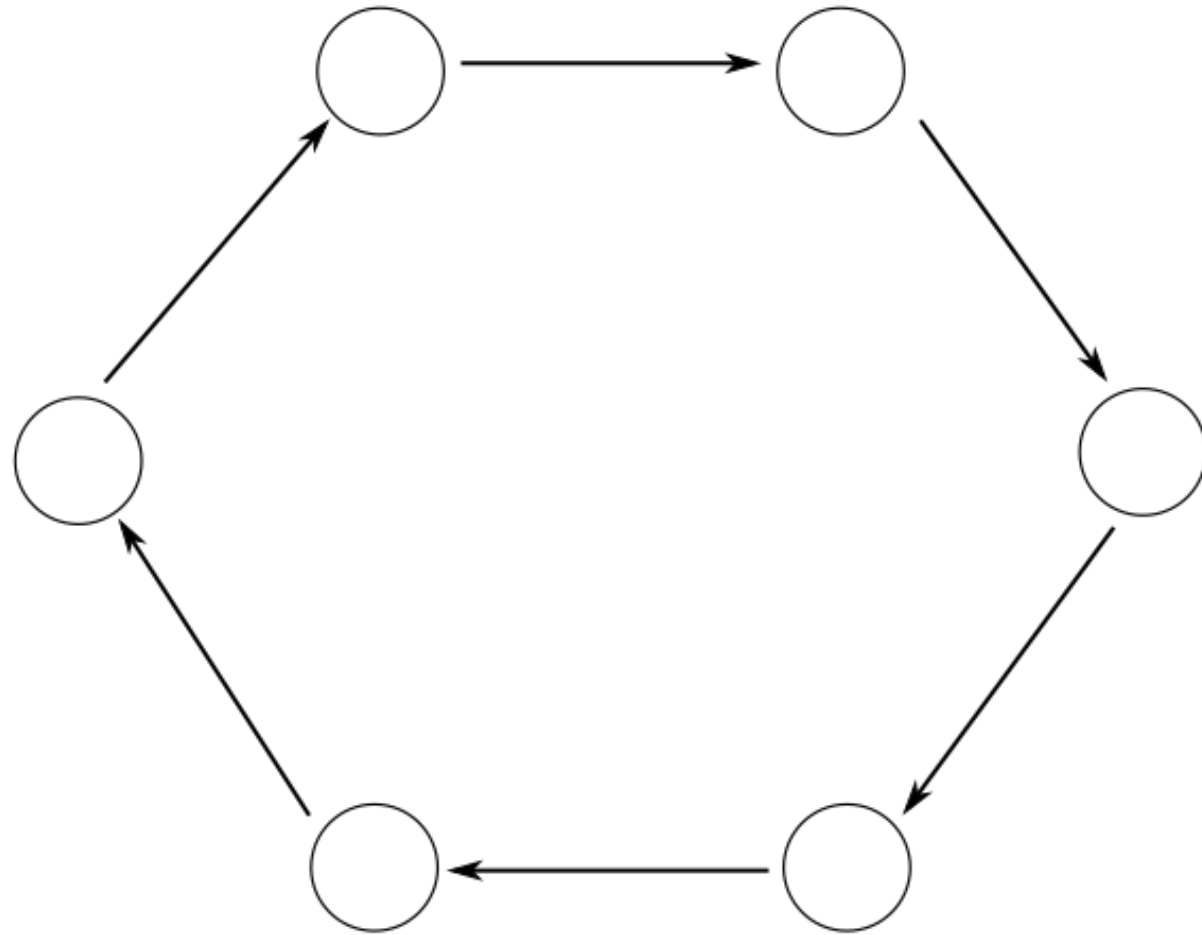


Long cycles can lead to **logistical problems**.

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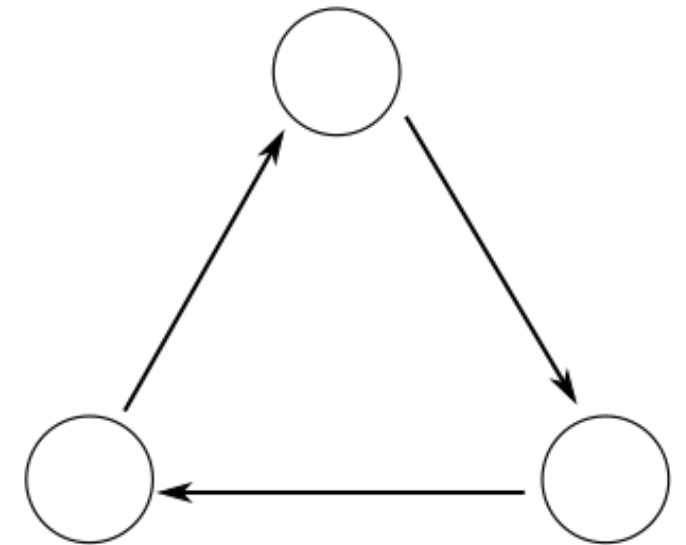
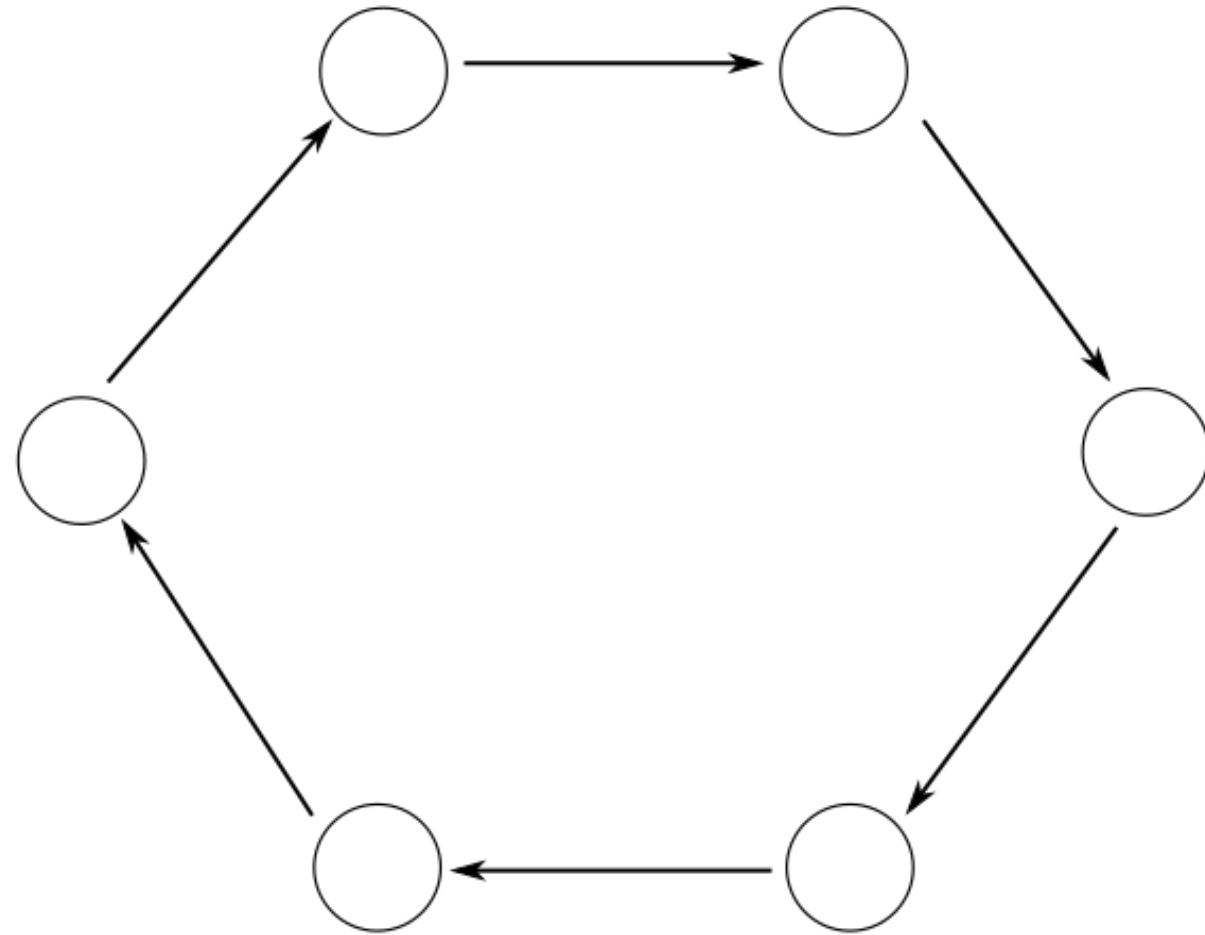
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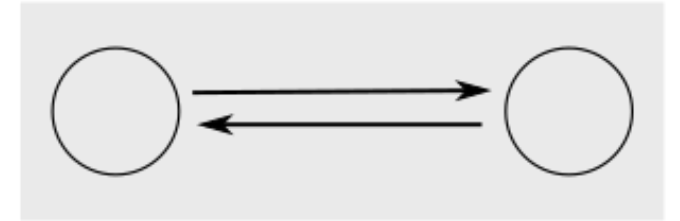
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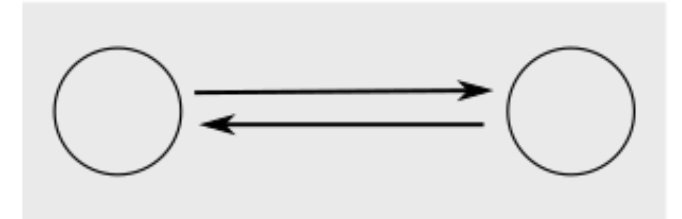
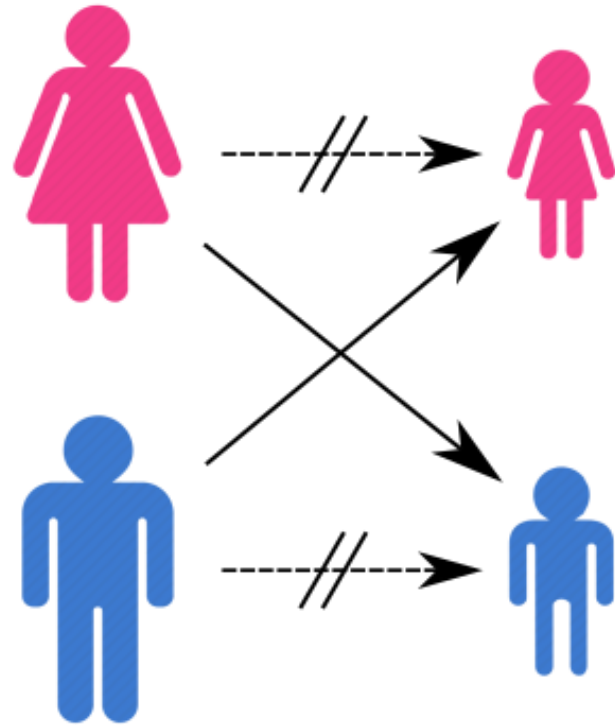
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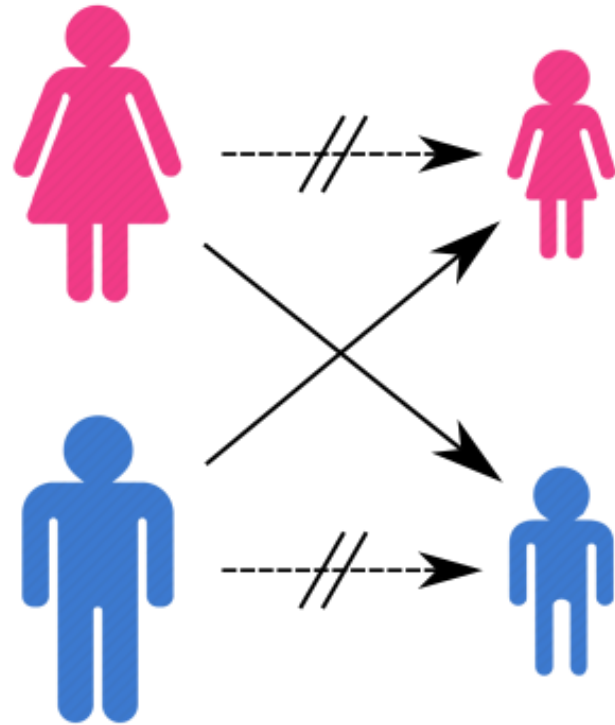
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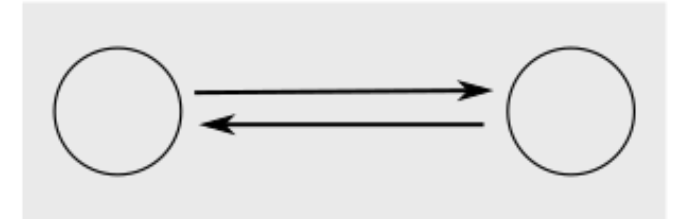
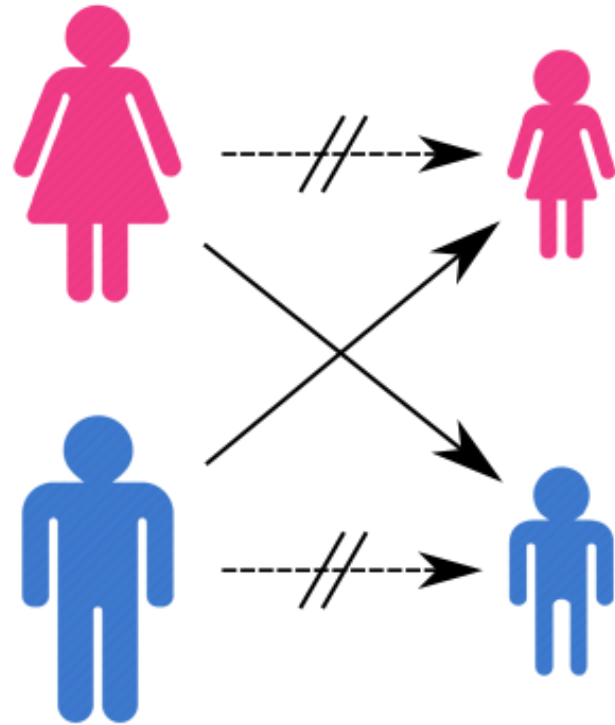


Four surgeries

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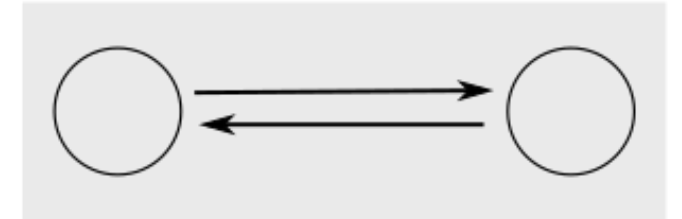
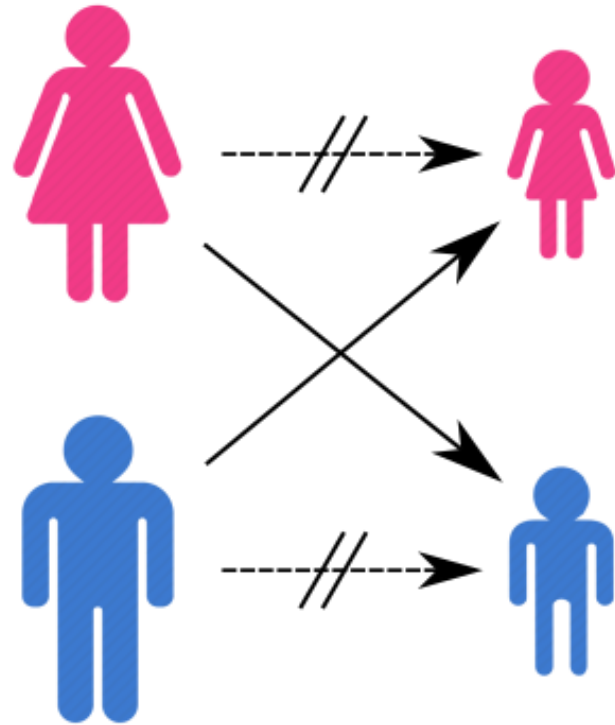


Four **simultaneous** surgeries

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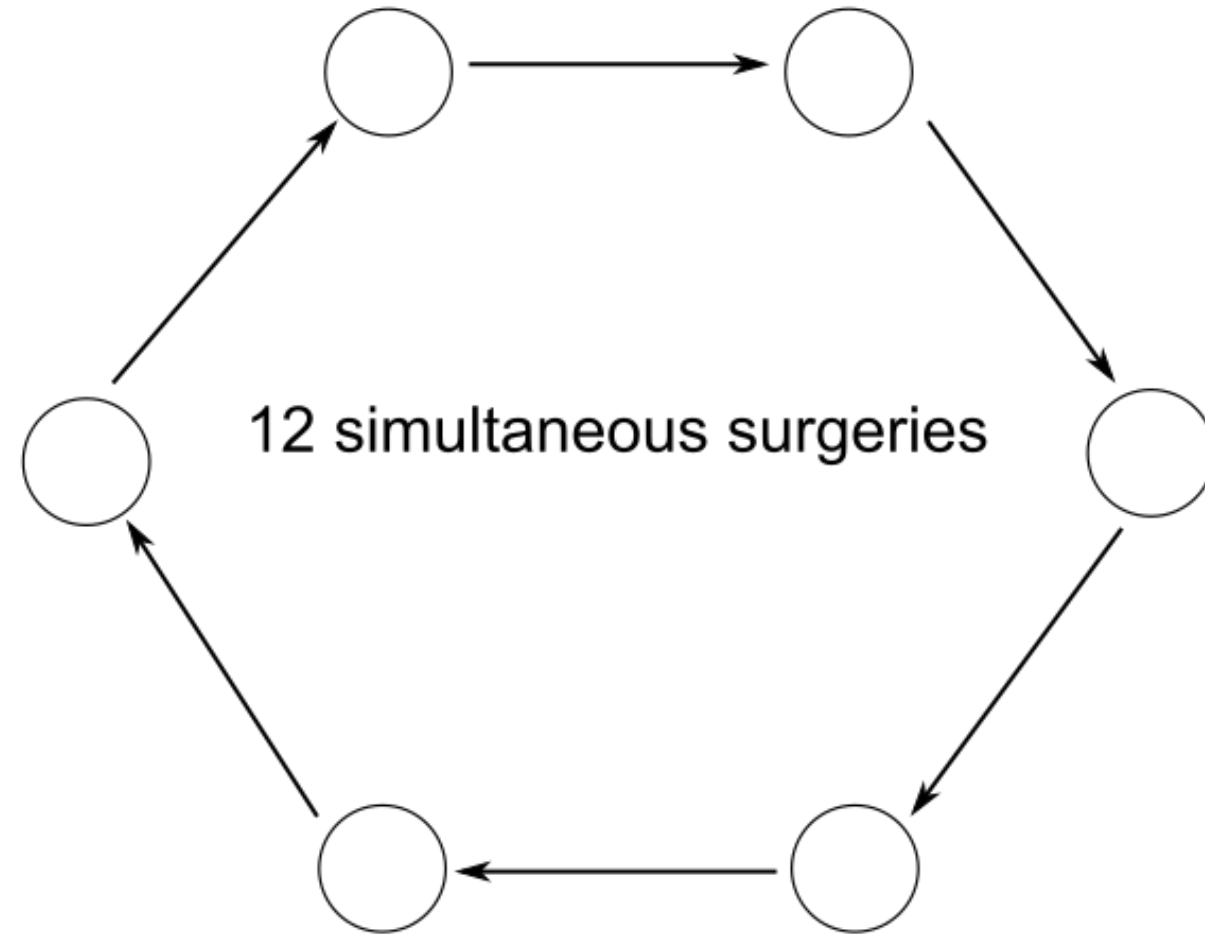
Cannot risk doing



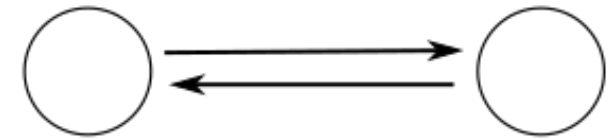
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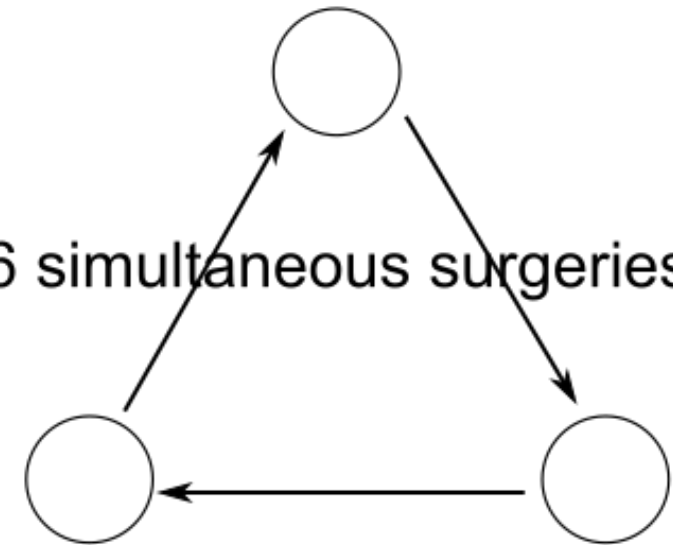
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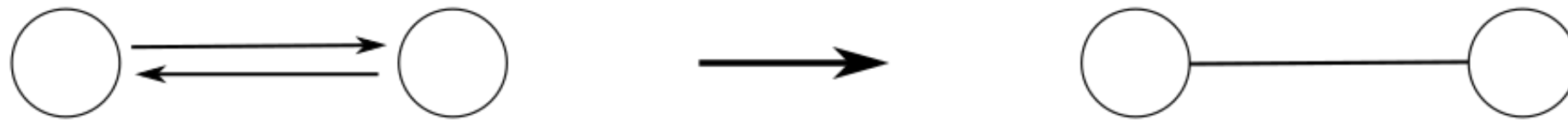
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Early Proposals for Kidney Exchange

Proposal 1

Using TTCA



Proposal 2



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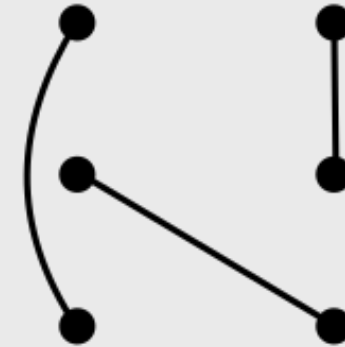
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Proposal 2

Using Matchings

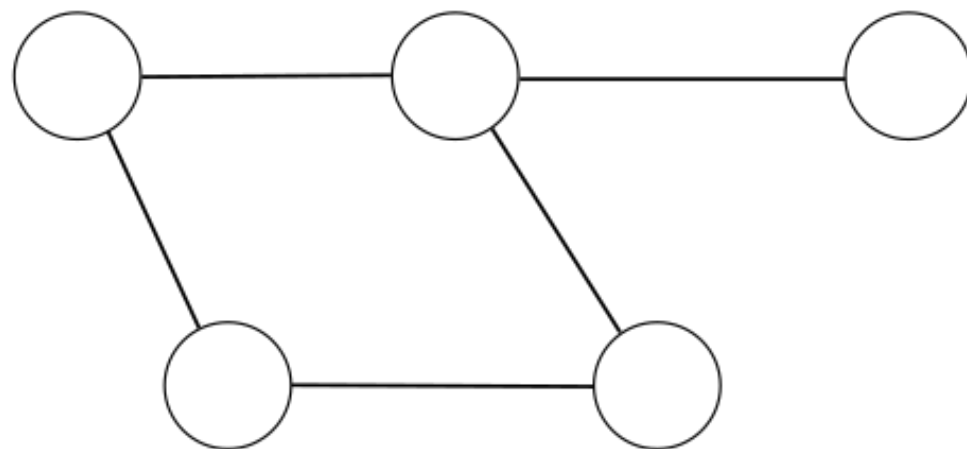


Proposal 2: Kidney Exchange using Matchings

[Roth, Sönmez, and Ünver, *JET* 2005]

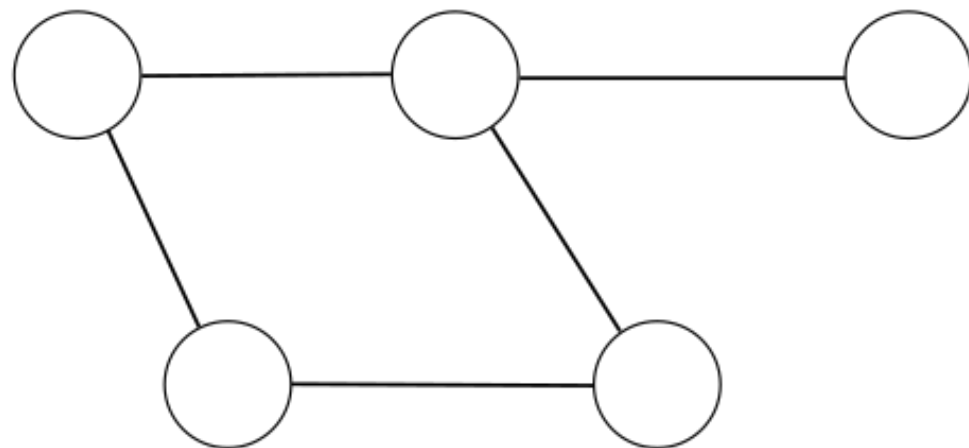
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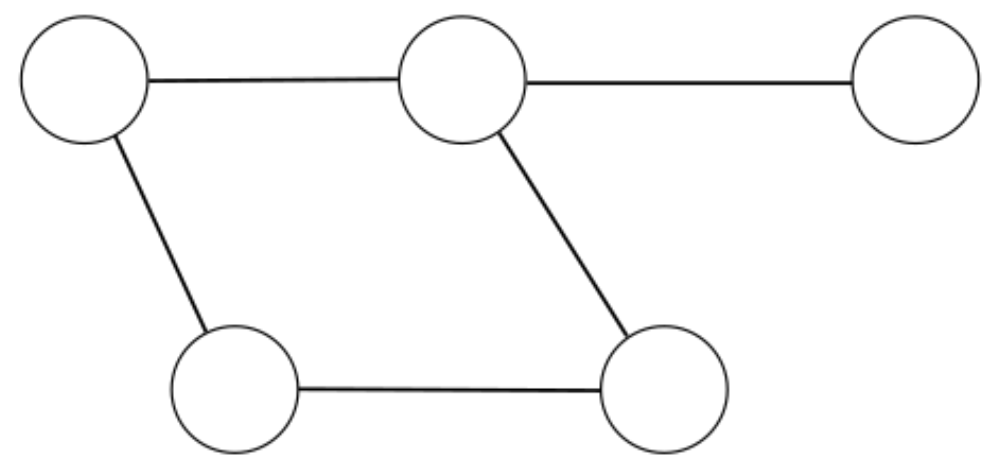
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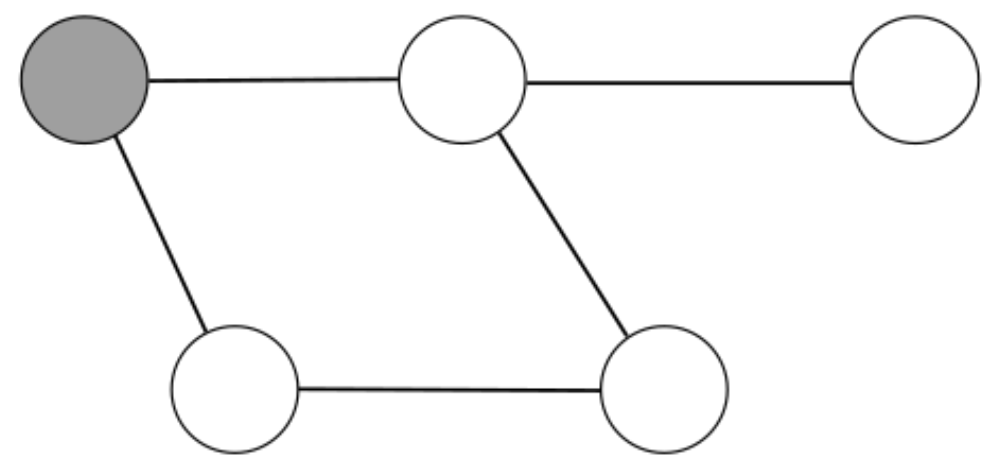


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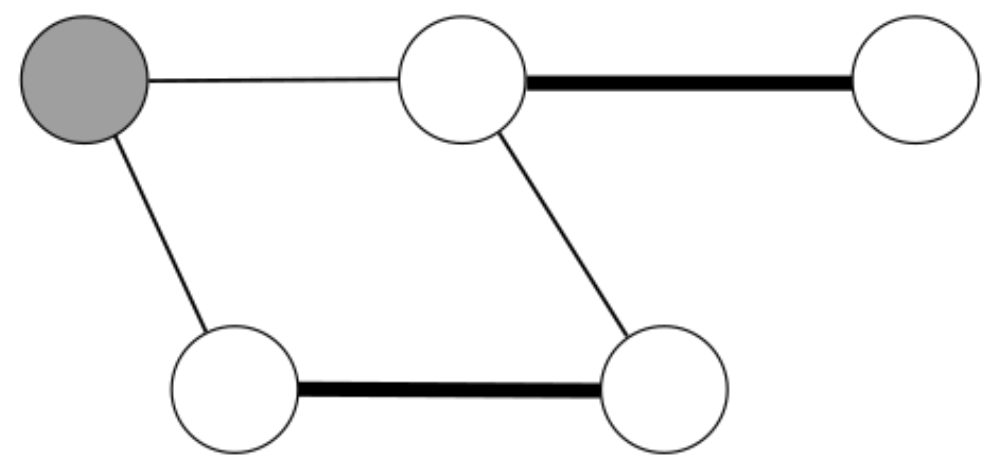


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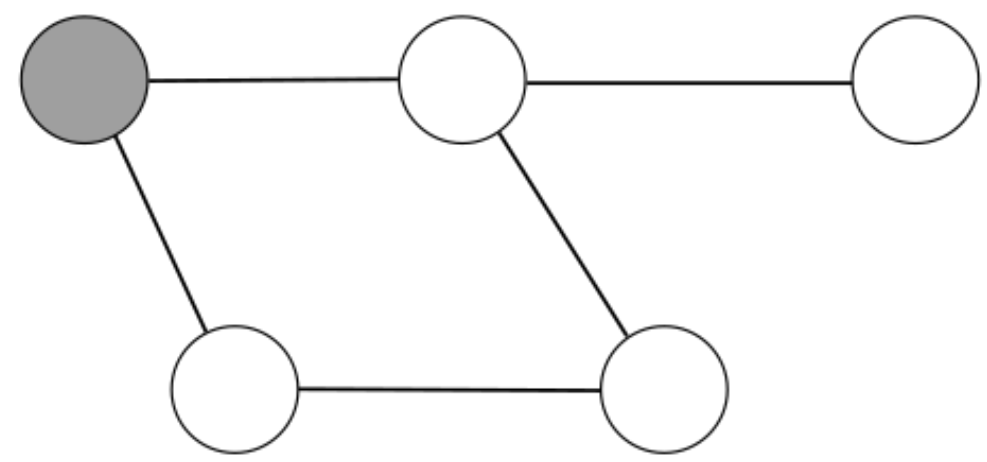


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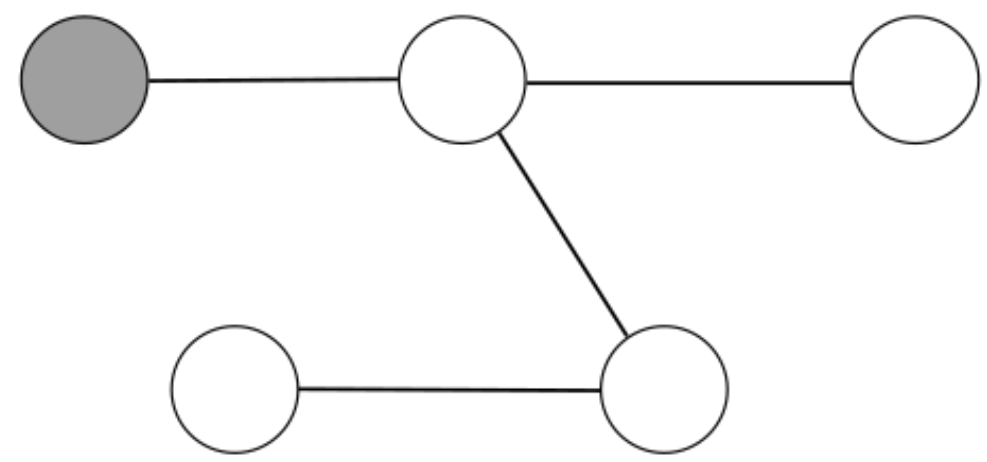


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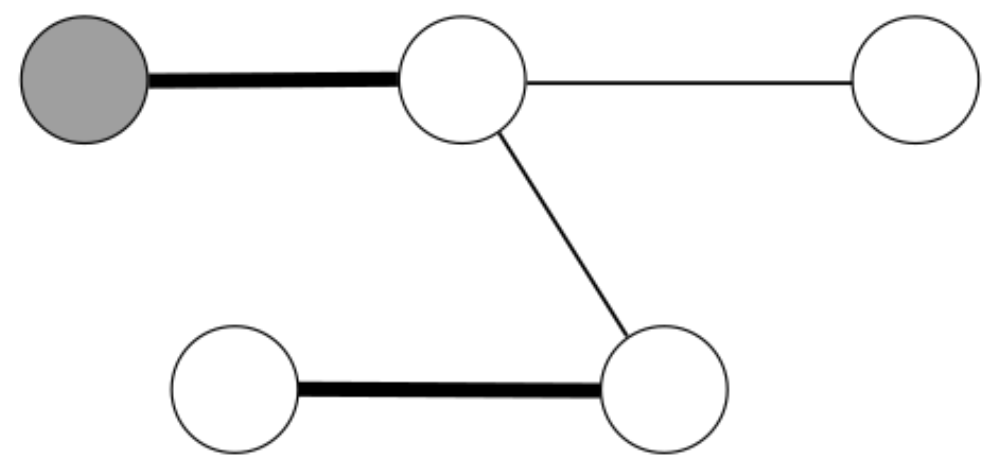


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Polynomial time
(uses Edmonds-Gallai decomposition from Graph Theory)

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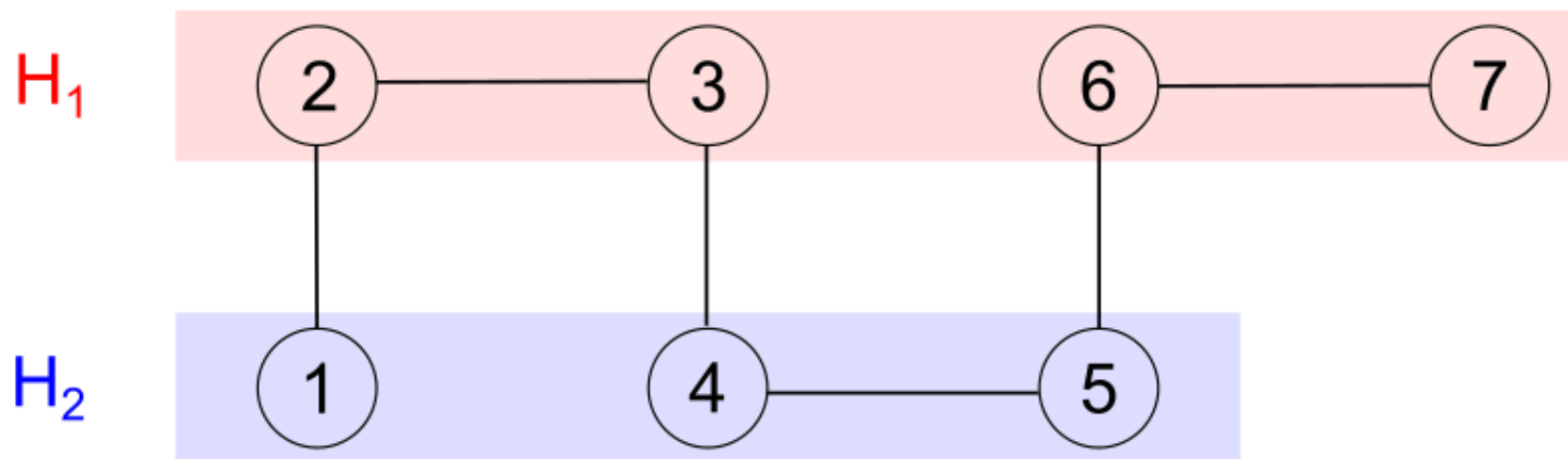
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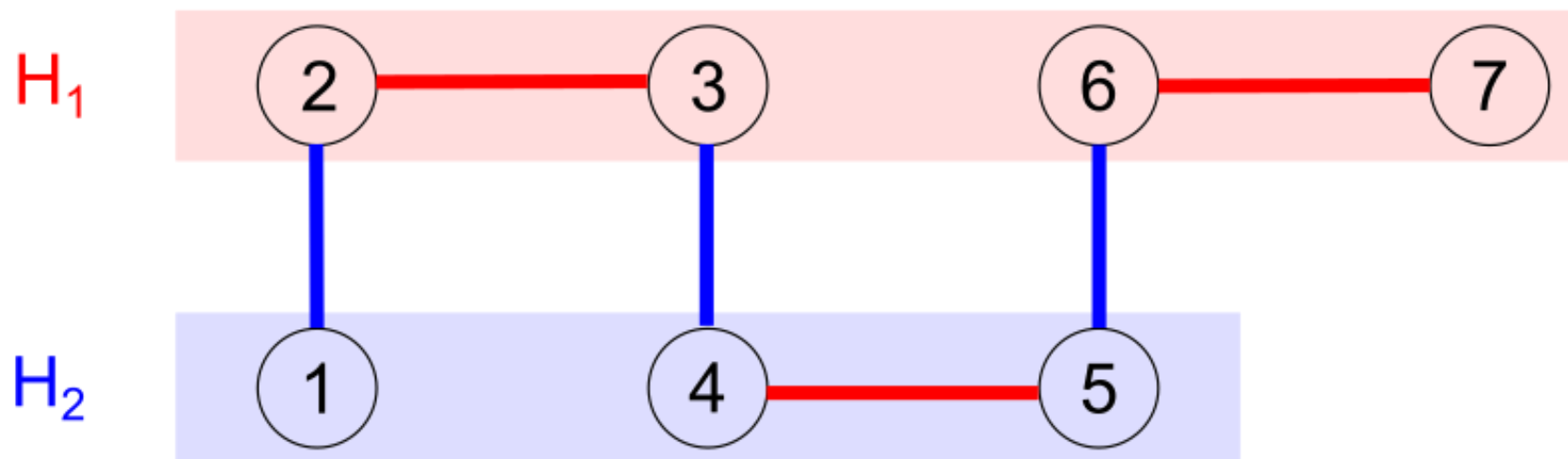
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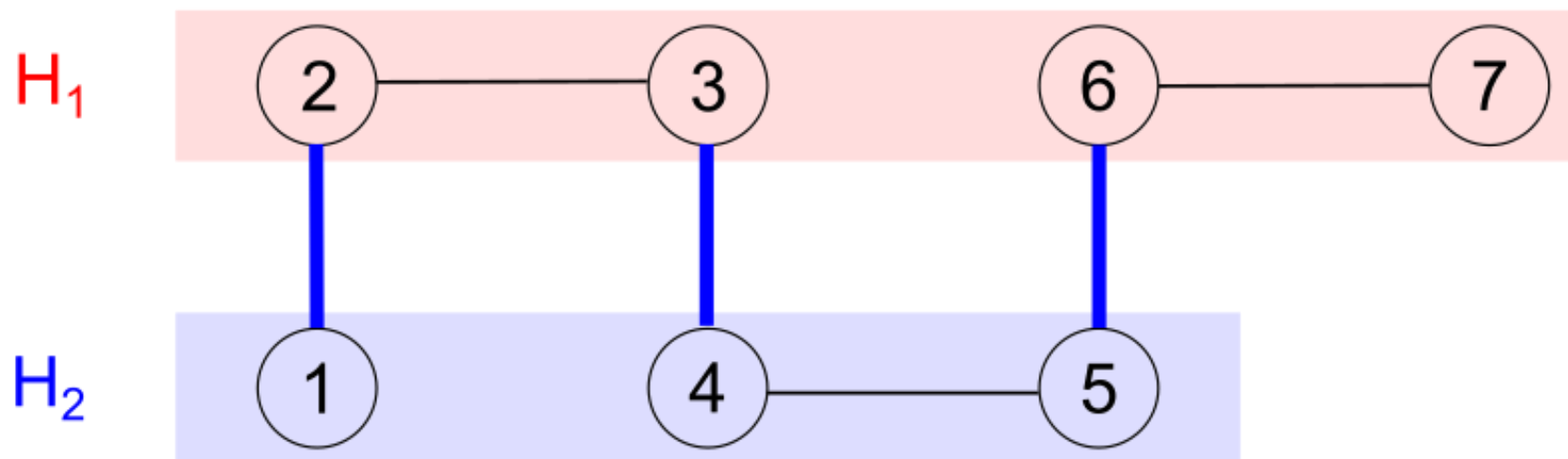
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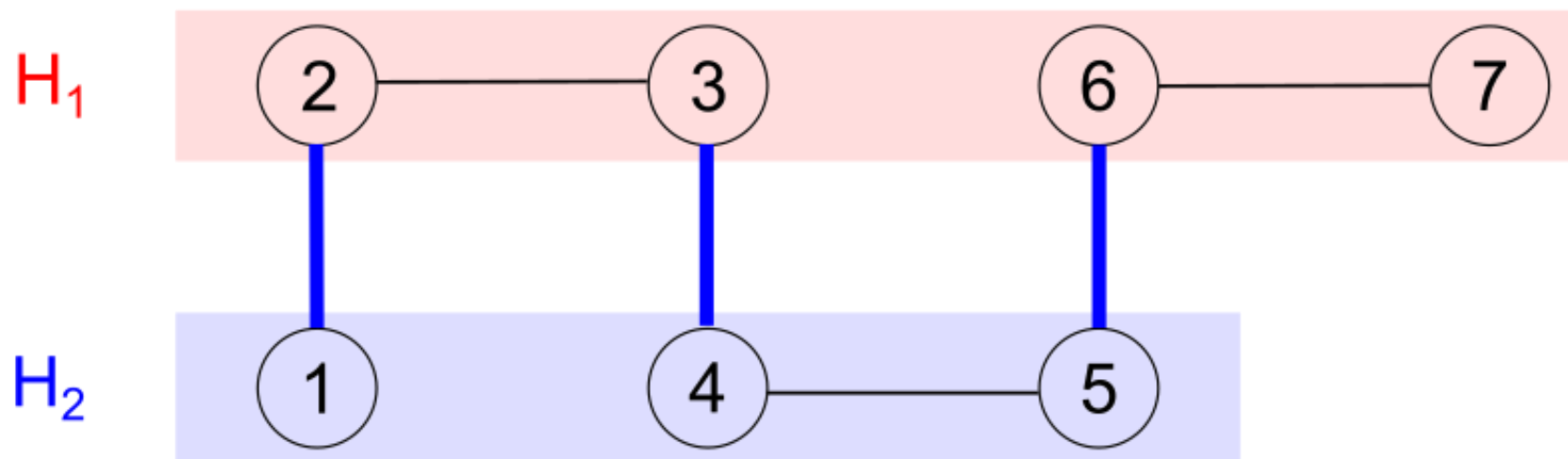
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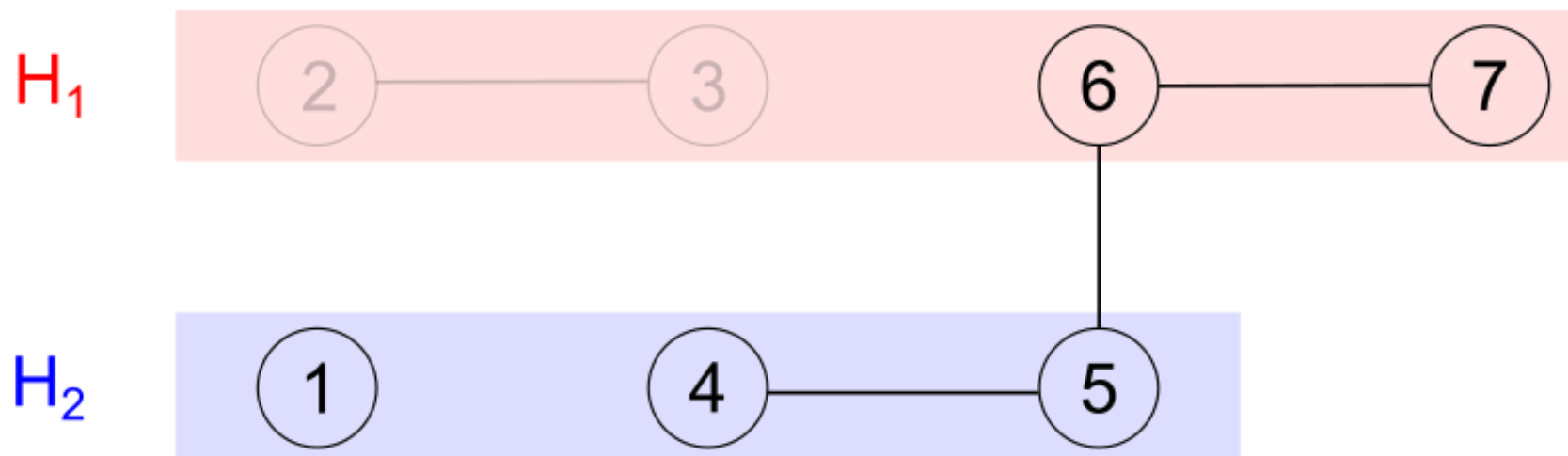


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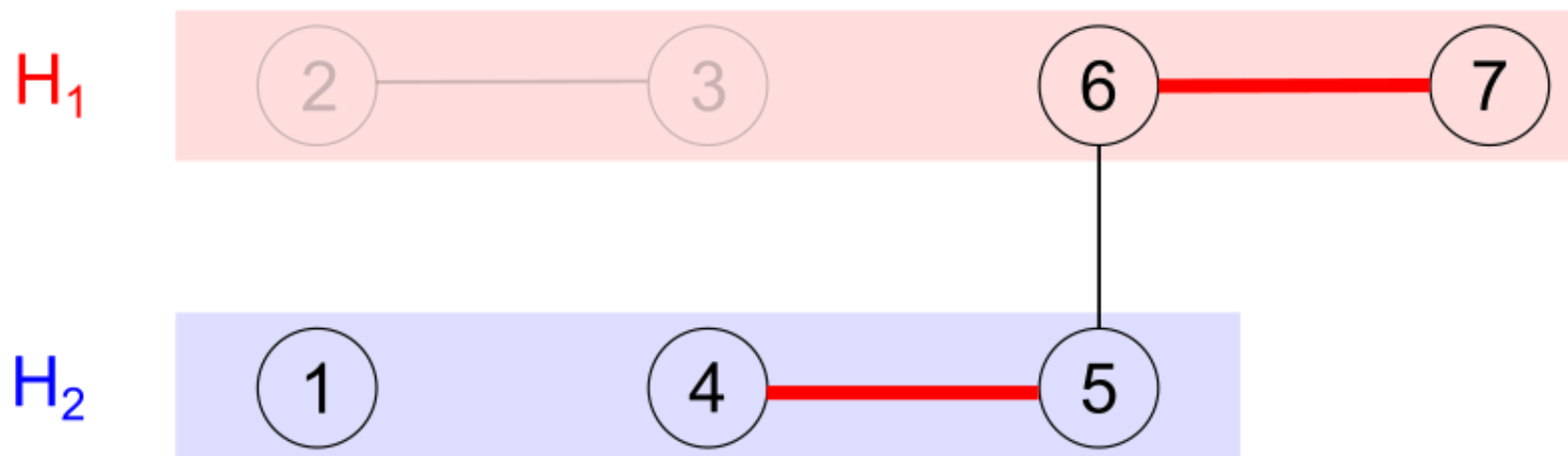


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2000	First KPD transplants performed in USA at the Rhode Island Hospital ^[8]
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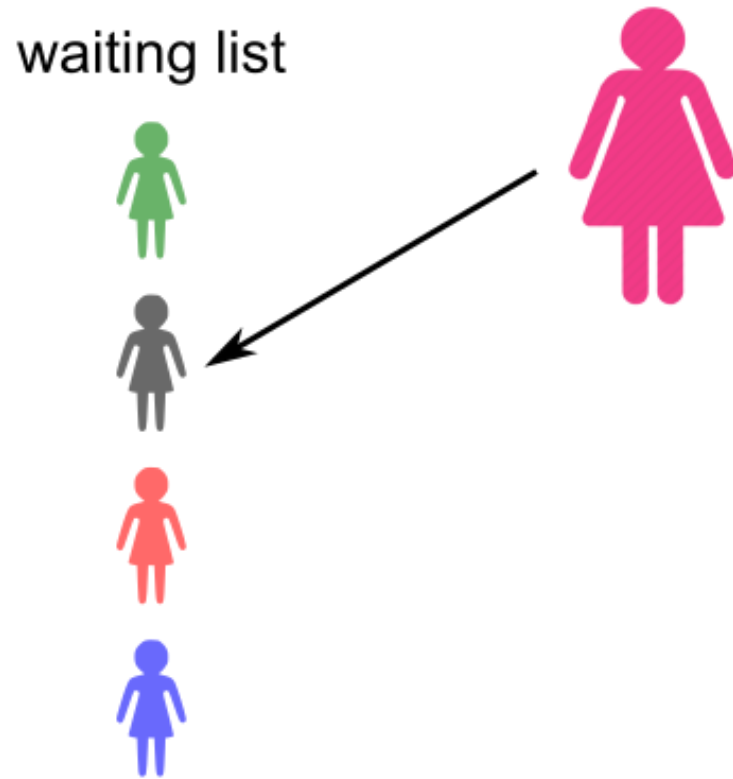
Altruistic Donors and Chains

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Donors who want to donate an organ without a designated recipient
(also known as a *non-directed* or *Good Samaritan* donor)

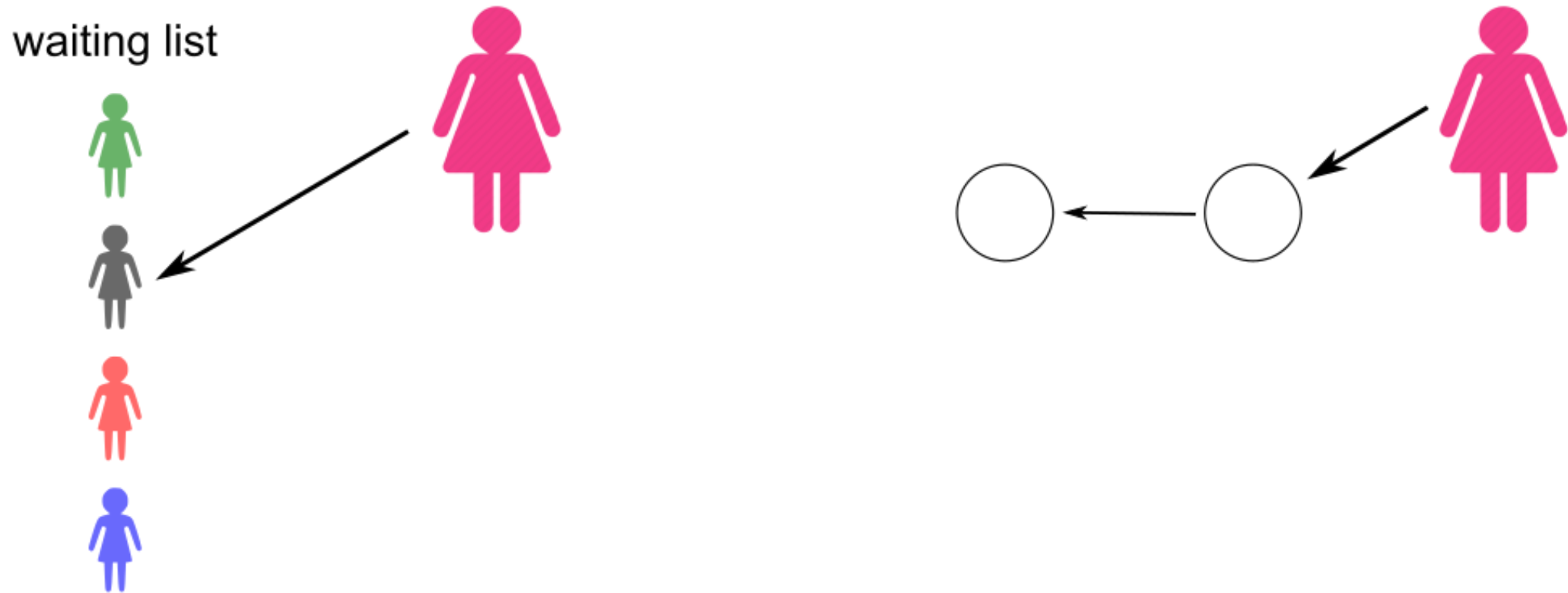
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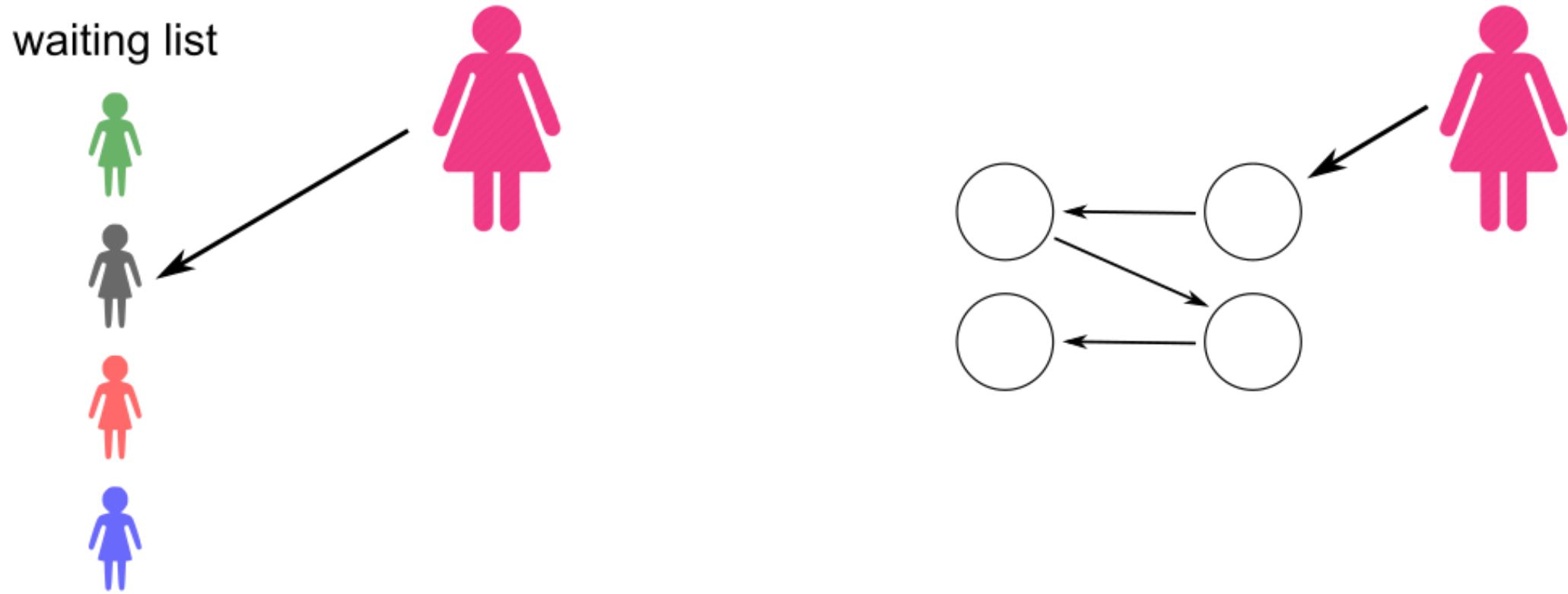
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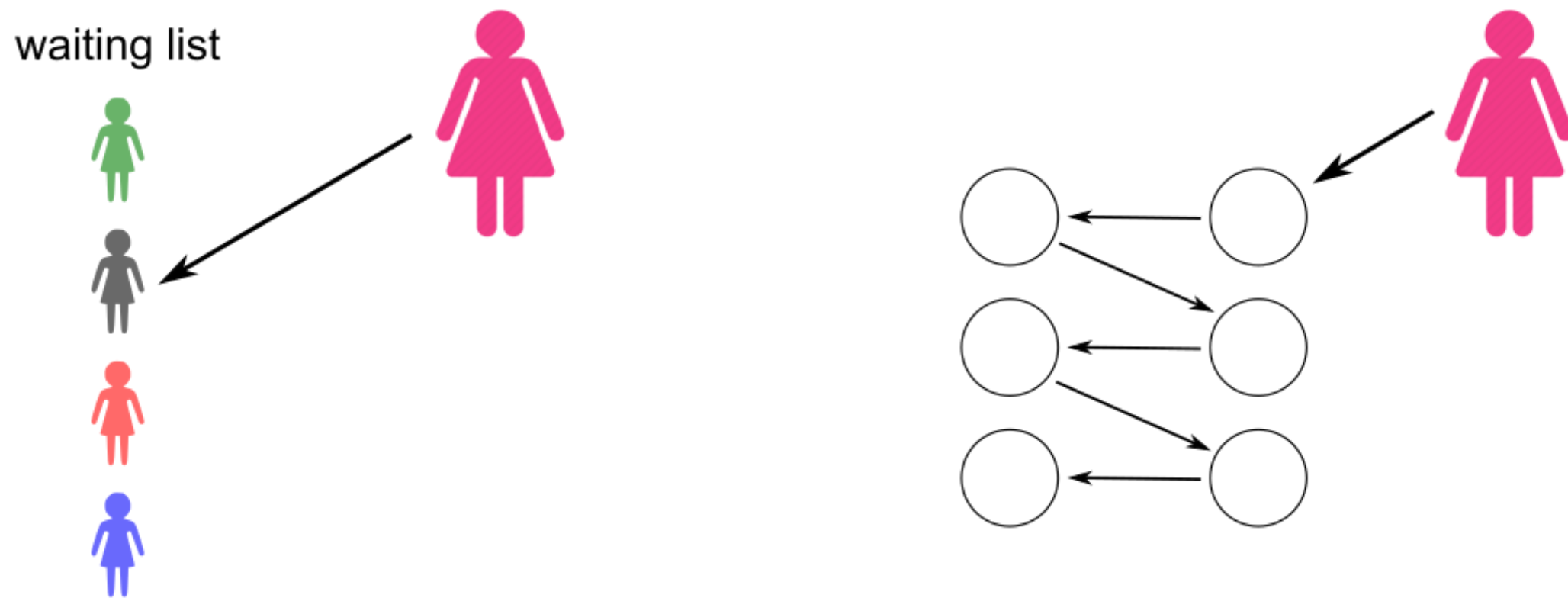
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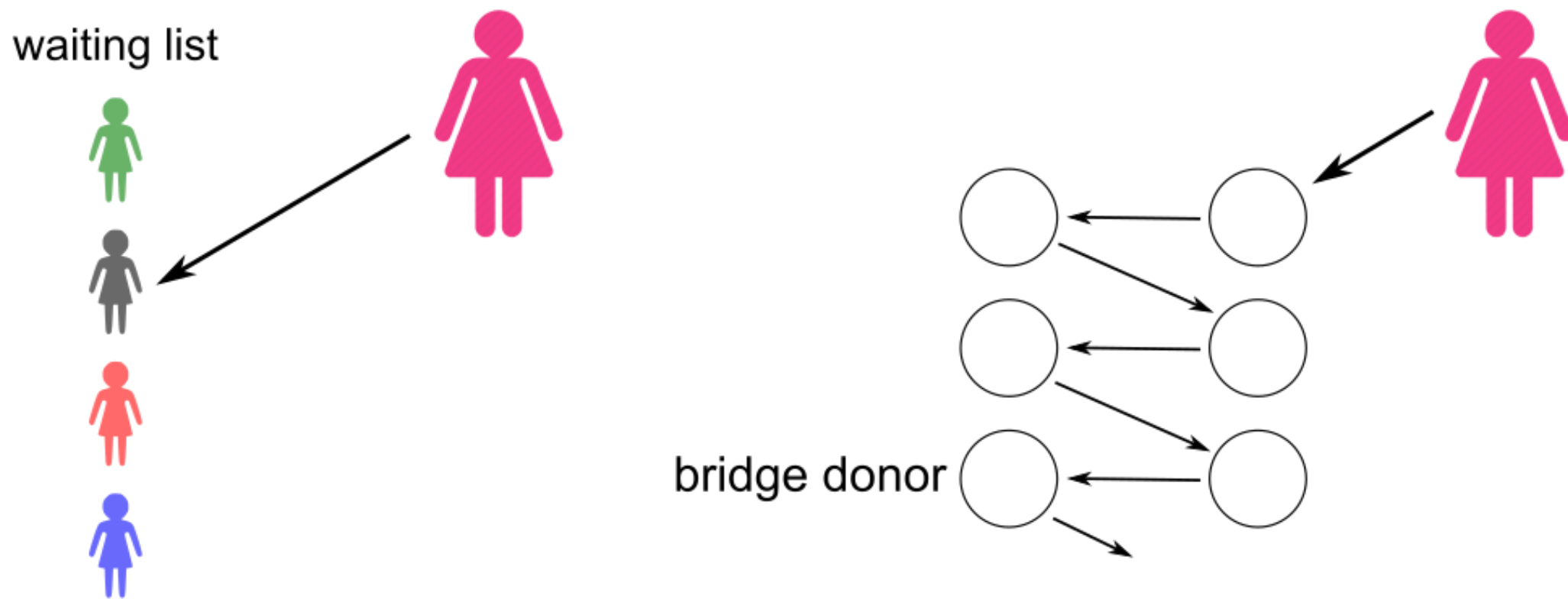
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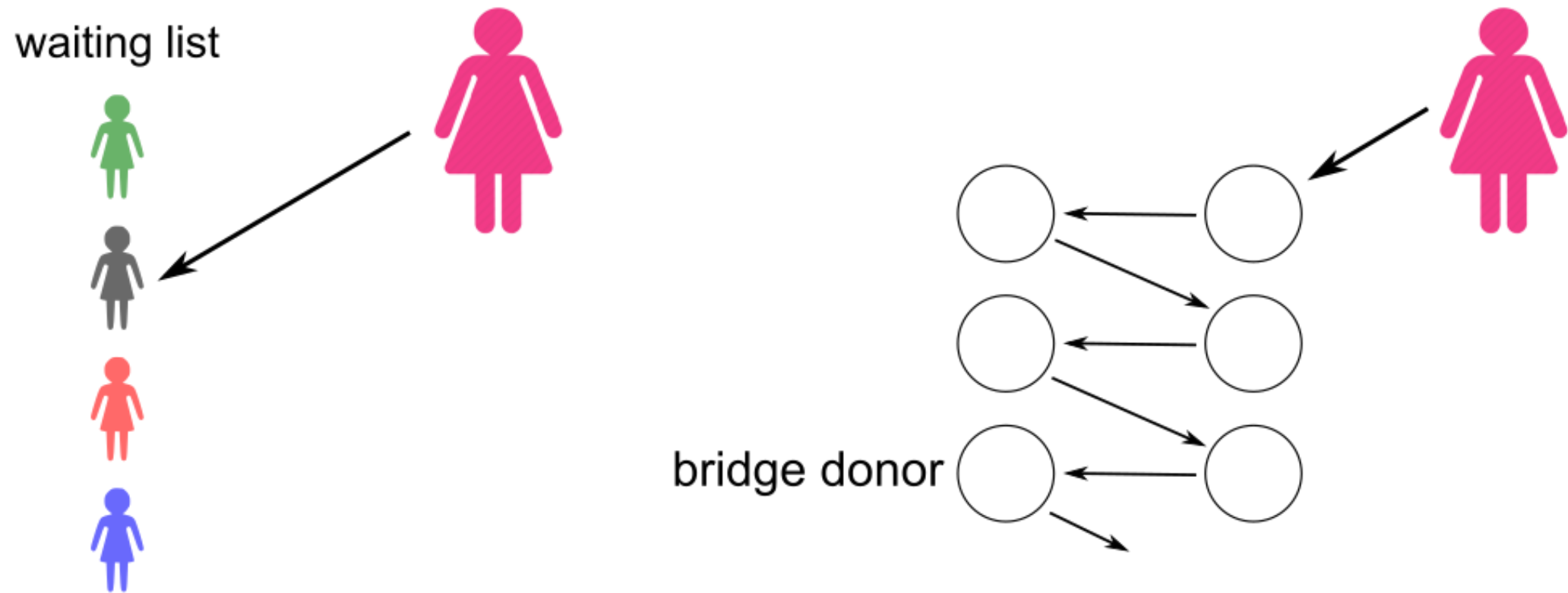
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Altruistic Donors and Chains

Donors who want to donate an organ without a designated recipient
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Transplants in an altruistic donor chain can be done **non-simultaneously**.

THE KIDNEY CHAIN

How a single organ donation changed 20 lives and created the longest-running transplant chain



MATT JONES, 30
Petoskey, Mich.
First donor

donated to



BARBARA BUNNELL, 56
Phoenix

married to



RON BUNNELL, 56
Phoenix

donated to



ANGELA HECKMAN, 34
Toledo, Ohio

daughter of



LAURIE SARVO, 54
Toledo, Ohio

donated to



REYNALDO ESPINOZA, 59
Germantown, Md.

donated to



CLAUDIA ALAS, 32
Germantown, Md.

daughter of



JEAN STAYLOR, 53
Charleston, S.C.

donated to



RAYMOND STAYLOR, 53
Charleston, S.C.

married to



AVA ROBY, 54
Marysville, Ohio

donated to



GEORGE LEONER, 51
Chillicothe, Ohio

brother of



LINDA JANISIESKI, 42
Miamisburg, Ohio

donated to



CECILIA JANISIESKI, 71
Huber Heights, Ohio

mother of



ANONYMOUS RECIPIENT

married to



ANONYMOUS DONOR

donated to



BILL CORAM, 55
Lincolnton, N.C.

friend of



TIM SHAIN, 43
Lincolnton, N.C.

donated to



LINLEY BLENKENSOPP, 51
Patchogue, N.Y.

brother of



KURT BLENKENSOPP, 41
Patchogue, N.Y.

donated to



KATHERINE MCKINNEY, 62
Toledo, Ohio

mother of



HELEENA MCKINNEY, 29
Cincinnati
Donor-in-waiting

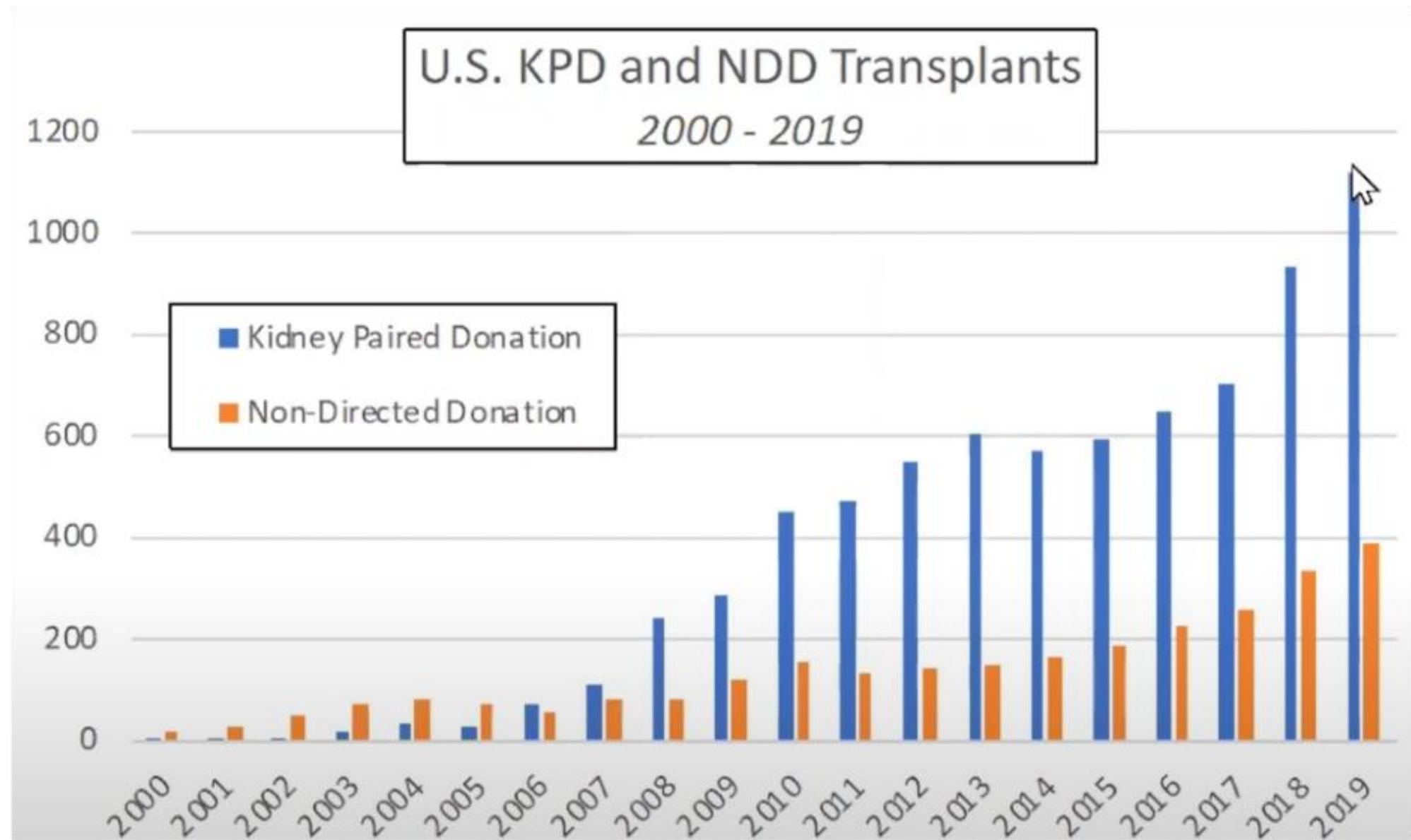


Figure source: Talk by Alvin Roth on "*Kidney Exchange: An Operations Perspective*" hosted by INFORMS Health Applications Society; June 2021

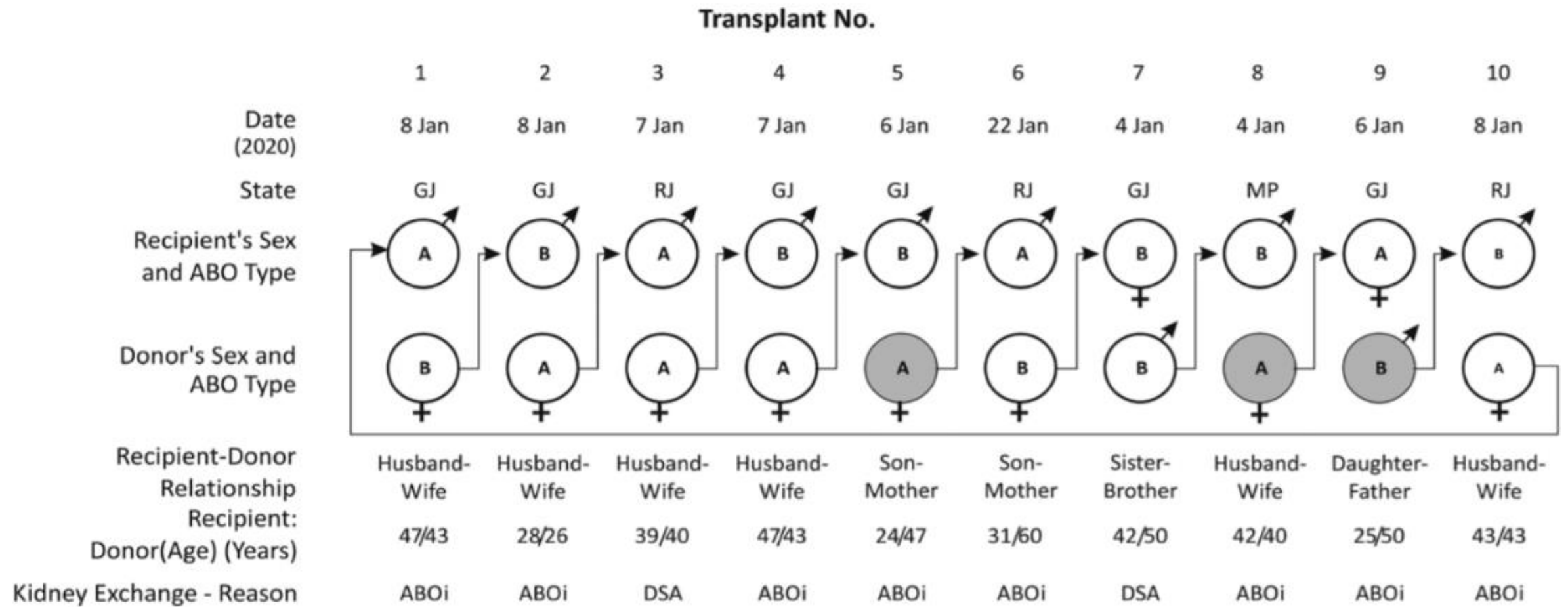
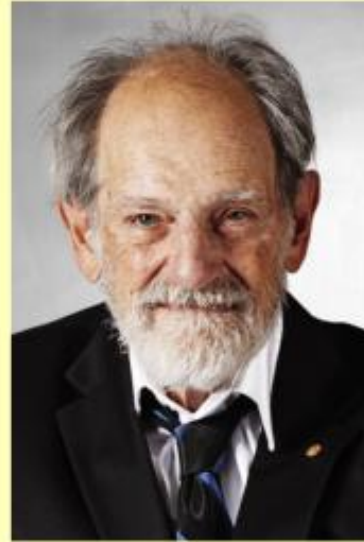


FIGURE 1. A nonsimultaneous 10-way kidney exchange cycle. GJ, Gujarat; MP, Madhya Pradesh; RJ, Rajasthan.

Sveriges Riksbank Prize in Economic Sciences in Memory of Alfred Nobel 2012



Alvin E. Roth



Lloyd S. Shapley

*"for the theory of stable allocations
and the practice of market design."*

Challenges in Kidney Exchange

Economic: Incentives of hospitals vs maximizing overall welfare.

Computational: Finding a maximum matching using 3-cycles is NP-hard.

Informational: Patients and donors arrive sequentially.

Logistical: Long cycles require many simultaneous surgeries.

Legal: Many countries do not permit altruistic donation.

Ethical: Is it OK to buy and sell kidneys?

Reminders

Assignment 1: Due by Friday (Aug 26)

Project groups: Due by Wednesday (Aug 31)

Next Time

Cake cutting



References

- Housing markets and TTCA

Lloyd Shapley and Herbert Scarf

“On Cores and Indivisibility”

Journal of Mathematical Economics, 1(1), 1974 pg 23-37

<https://www.sciencedirect.com/science/article/pii/0304406874900330>

- Truthfulness under TTCA

Alvin E. Roth

“Incentive Compatibility in a Market with Indivisible Goods”

Economics Letters, 9(2), 1982, pg 127-132

<https://www.sciencedirect.com/science/article/pii/0165176582900039>

References

- The presentation is heavily inspired from Tim Roughgarden's lectures in the course on Algorithmic Game Theory (Fall 2013); see Lec 9 and 10.
<https://timroughgarden.org/f13/f13.html>
- Data about waiting list for organs in the US:
<https://optn.transplant.hrsa.gov/data/>
- Data about waiting list for kidneys in India (April 2019):
<https://www.narayanahealth.org/blog/kidney-transplants-in-india/>
- Wikipedia article on “Kidney Paired Donation”:
https://en.wikipedia.org/wiki/Kidney_paired_donation

References

- Proposal 1: Kidney exchange using top-trading cycles and chains

Alvin E. Roth, Tayfun Sönmez, and Utku Ünver
“Kidney Exchange”

The Quarterly Journal of Economics, 119(2), 2004 pg 457-488

<https://academic.oup.com/qje/article/119/2/457/1894508>

- Proposal 2: Kidney exchange using matchings

Alvin E. Roth, Tayfun Sönmez, and Utku Ünver
“Pairwise Kidney Exchange”

Journal of Economic Theory, 125(2), 2005 pg 151-188

<https://www.sciencedirect.com/science/article/pii/S0022053105001055>

References

- The “*You request my house, I get your turn*” extension of TTCA was originally proposed in the context of dormitory assignment:

Atila Abdulkadiroğlu and Tayfun Sönmez

“*House Allocation with Existing Tenants*”

Journal of Economic Theory, 88(2), 1999 pg 233-260

<https://www.sciencedirect.com/science/article/pii/S002205319992553X#>

- Altruistic donor chains:

Rees et al.

“*A Non-Simultaneous, Extended, Altruistic Donor Chain*”

The New England Journal of Medicine, 360(11), 2009 pg 1096-1101

<https://www.nejm.org/doi/full/10.1056/NEJMoa0803645>

References

- Videos, podcasts, and blogs:

<https://freakonomics.com/podcast/make-me-a-match/>
<https://www.donordiaries.com/>

https://www.youtube.com/watch?v=D3_0Bc7gbGA
<https://www.youtube.com/watch?v=exB1O3pTf7E>
<https://www.youtube.com/watch?v=4NbJTcfN6UA>
<https://www.donordiaries.com/episodes>

<http://marketdesigner.blogspot.com/search/label/kidney%20exchange>

