

## SF2972: Game theory

The 2012 'Nobel prize in economics':  
awarded to Alvin E. Roth and Lloyd S. Shapley for "the theory of stable allocations and the practice of market design"

### Plan

Many methods for finding desirable allocations in matching problems are variants of two algorithms:

- 1 The top trading cycle algorithm
- 2 The deferred acceptance algorithm

For each of the two algorithms, I will do the following:

- State the algorithm.
- State nice properties of outcomes generated by the algorithm.
- Solve an example using the algorithm.
- Describe application(s).
- Give you a homework exercise.



The related branch of game theory is often referred to as **matching theory**, which studies the design and performance of platforms for transactions between agents. Roughly speaking, it studies who interacts with whom, and how: which applicant gets which job, which students go to which universities, which donors give organs to which patients, and so on.

### The top trading cycle (TTC) algorithm: reference

- L.S. Shapley and H. Scarf, 1974, On Cores and Indivisibility. *Journal of Mathematical Economics* 1, 23–37.
- The algorithm is described in section 6, p. 30, and attributed to David Gale.

## The top trading cycle (TTC) algorithm: statement

**Input:** Each of  $n \in \mathbb{N}$  agents owns an indivisible good (a house) and has strict preferences over all houses.

Convention: agent  $i$  initially owns house  $h_i$ .

**Question:** Can the agents benefit from swapping houses?

**TTC algorithm:**

- 1 Each agent  $i$  points to her most preferred house (possibly  $i$ 's own); each house points back to its owner.
  - This creates a directed graph. In this graph, identify cycles.
    - Finite: cycle exists.
    - Strict preferences: each agent is in at most one cycle.
- 2 Give each agent in a cycle the house she points at and remove her from the market with her assigned house.
- 3 If unmatched agents/houses remain, iterate.

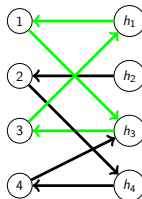
## The top trading cycle (TTC) algorithm: nice properties

- 1 The TTC assignment is such that no subset of owners can make all of its members better off by exchanging the houses they initially own in a different way.
  - In technical lingo: the TTC outcome is a core allocation.
- 2 The TTC assignment is the only such assignment.
  - Unique core allocation.
- 3 It is never advantageous to an agent to lie about preferences if the TTC algorithm is used.
  - The TTC algorithm is strategy-proof.

## The top trading cycle (TTC) algorithm: example

Agents' ranking from best (left) to worst (right):

- 1 :  $(h_3, h_2, h_4, h_1)$
- 2 :  $(h_4, h_1, h_2, h_3)$
- 3 :  $(h_1, h_4, h_3, h_2)$
- 4 :  $(h_3, h_2, h_1, h_4)$

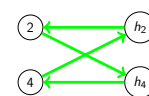


- Cycle:  $(1, h_3, 3, h_1, 1)$ .
- So: 1 get  $h_3$  and 3 gets  $h_1$ . Remove them and iterate.

## The top trading cycle (TTC) algorithm: example

Only agents 2 and 4 left with updated preferences:

- 2 :  $(h_4, h_2)$
- 4 :  $(h_2, h_4)$



- Cycle:  $(2, h_4, 4, h_2, 2)$ .
- So: 2 gets  $h_4$  and 4 gets  $h_2$ . Done!
- Final match:

$(1, h_3), (2, h_4), (3, h_1), (4, h_2)$ .

## The top trading cycle (TTC) algorithm: application 1

- A. Abdulkadiroğlu and T. Sönmez, 2003. School Choice: A Mechanism Design Approach. *American Economic Review* 93, 729–747.
- How to assign children to schools subject to priorities for siblings and distance?

### Input:

- Students submit strict preferences over schools
- Schools submit strict preferences over students based on priority criteria and (if necessary) a random number generator

### Modified TTC algorithm:

- 1 Each remaining student points at her most preferred unfilled school; each unfilled school points at its most preferred remaining student.
- 2 Cycles are identified and students in cycles are matched to the school they point at.
- 3 Remove assigned students and full schools.
- 4 If unmatched students remain, iterate.

## The top trading cycle (TTC) algorithm: application 2

- A.E. Roth, T. Sönmez, M.U. Ünver, 2004. Kidney Exchange. *Quarterly Journal of Economics* 119, 457–488.
- A case with patient-donor pairs: a patient in need of a kidney and a donor (family, friend) who is willing to donate one.
- Complications arise due to incompatibility (blood/tissue) groups, etc.
- So look at trading cycles: patient 1 might get the kidney of donor 2, if patient 1 gets the kidney of donor 1, etc.

## The top trading cycle (TTC) algorithm: homework exercise 6

Apply the TTC algorithm to the following case:

- 1 :  $(h_5, h_2, h_1, h_3, h_4)$
- 2 :  $(h_5, h_4, h_3, h_1, h_2)$
- 3 :  $(h_4, h_2, h_3, h_5, h_1)$
- 4 :  $(h_2, h_1, h_5, h_3, h_4)$
- 5 :  $(h_2, h_4, h_1, h_5, h_3)$

## The deferred acceptance (DA) algorithm: reference

- D. Gale and L.S. Shapley, 1962, College Admissions and the Stability of Marriage. *American Mathematical Monthly* 69, 9–15.
- Only seven pages...
- ...and, yes, stability of marriage!

## The deferred acceptance (DA) algorithm: marriage problem

- Men and women have strict preferences over partners of the opposite sex
  - You may prefer staying single to marrying a certain partner
- A *match* is a set of pairs of the form  $(m, w)$ ,  $(m, m)$ , or  $(w, w)$  such that each person has exactly one partner.
- Person  $i$  is *unmatched* if the match includes  $(i, i)$ .
- $i$  is *acceptable* to  $j$  if  $j$  prefers  $i$  to being unmatched.
- Given a proposed match, a pair  $(m, w)$  is *blocking* if both prefer each other to the person they're matched with.
  - $m$  prefers  $w$  to his match-partner
  - $w$  prefers  $m$  to her match-partner
- A match is *unstable* if someone has an unacceptable partner or if there is a blocking pair. Otherwise, it is *stable*.
- A match is *man-optimal* if it is stable and there is no other stable match that some man prefers. Woman-optimal analogously.

## The deferred acceptance (DA) algorithm: nice properties

- The algorithm ends with a stable match.
  - By construction, no person is matched to an unacceptable candidate.
  - No  $(m, w)$  can be a blocking pair: if  $m$  strictly prefers  $w$  to his current match, he must have proposed to her and been rejected in favor of a candidate that  $w$  liked better. That is,  $w$  finds her match better than  $m$ .
- This match is man-optimal (woman-pessimal).
- Men have no incentives to lie about their preferences, women might.
  - Strategy-proof for men
  - See homework exercise
- There is no mechanism that always ends in a stable match and that is strategy-proof for all participants.

## The deferred acceptance (DA) algorithm: statement

**Input:** A nonempty, finite set  $M$  of men and  $W$  of women. Each man (woman) ranks acceptable women (men) from best to worst.

**DA algorithm, men proposing:**

- Each man proposes to the highest ranked woman on his list.
- Women hold at most one offer (her most preferred acceptable proposer), rejecting all others.
- Each rejected man removes the rejecting woman from his list.
- If there are no new rejections, stop. Otherwise, iterate.
- After stopping, implement proposals that have not been rejected.

**Remarks:**

- DA algorithm, women proposing: switch roles!
- Deferred acceptance: receiving side defers final acceptance of proposals until the very end.

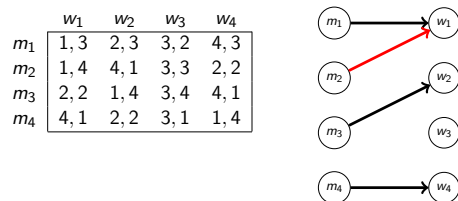
## The deferred acceptance (DA) algorithm: example

- For convenience  $|M| = |W| = 4$ .
- All partners of opposite sex are acceptable.
- Ranking matrix:

	$w_1$	$w_2$	$w_3$	$w_4$
$m_1$	1, 3	2, 3	3, 2	4, 3
$m_2$	1, 4	4, 1	3, 3	2, 2
$m_3$	2, 2	1, 4	3, 4	4, 1
$m_4$	4, 1	2, 2	3, 1	1, 4

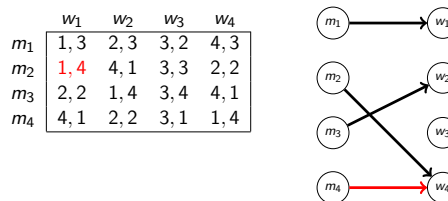
- Interpretation: entry  $(1, 3)$  in the first row and first column indicates that  $m_1$  ranks  $w_1$  first among the women and that  $w_1$  ranks  $m_1$  third among the men.

### The deferred acceptance (DA) algorithm: example



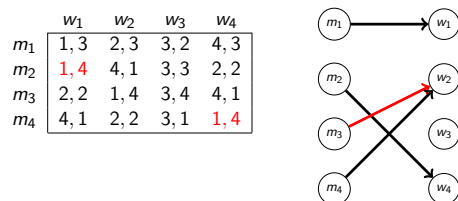
$w_1$  is the only person to receive multiple proposals; she compares  $m_1$  (rank 3) with  $m_2$  (rank 4) and rejects  $m_2$ . Strike this entry from the matrix and iterate.

### The deferred acceptance (DA) algorithm: example



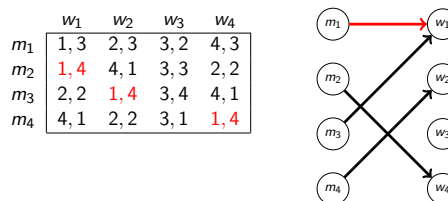
$w_4$  is the only person to receive multiple proposals; she compares  $m_2$  (rank 2) with  $m_4$  (rank 4) and rejects  $m_4$ . Strike this entry from the matrix and iterate.

### The deferred acceptance (DA) algorithm: example



$w_2$  is the only person to receive multiple proposals; she compares  $m_3$  (rank 4) with  $m_4$  (rank 2) and rejects  $m_3$ . Strike this entry from the matrix and iterate.

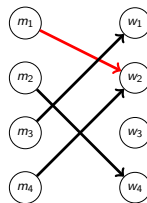
### The deferred acceptance (DA) algorithm: example



$w_1$  is the only person to receive multiple proposals; she compares  $m_1$  (rank 3) with  $m_3$  (rank 2) and rejects  $m_1$ . Strike this entry from the matrix and iterate.

## The deferred acceptance (DA) algorithm: example

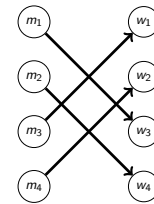
	$w_1$	$w_2$	$w_3$	$w_4$
$m_1$	1, 3	2, 3	3, 2	4, 3
$m_2$	1, 4	4, 1	3, 3	2, 2
$m_3$	2, 2	1, 4	3, 4	4, 1
$m_4$	4, 1	2, 2	3, 1	1, 4



$w_2$  is the only person to receive multiple proposals; she compares  $m_1$  (rank 3) with  $m_4$  (rank 2) and rejects  $m_1$ . Strike this entry from the matrix and iterate.

## The deferred acceptance (DA) algorithm: example

	$w_1$	$w_2$	$w_3$	$w_4$
$m_1$	1, 3	2, 3	3, 2	4, 3
$m_2$	1, 4	4, 1	3, 3	2, 2
$m_3$	2, 2	1, 4	3, 4	4, 1
$m_4$	4, 1	2, 2	3, 1	1, 4



No rejections; the algorithm stops with stable match

$(m_1, w_3), (m_2, w_4), (m_3, w_1), (m_4, w_2)$ .

## The deferred acceptance (DA) algorithm: application

A variant of the marriage problem is the *college admission problem*: each student can be matched to at most one college, but a college can accept many students.

This can be mapped into the marriage problem:

- Students: one side of the marriage problem, e.g.  $M$ .
- Colleges: other side of the marriage problem, e.g.  $W$ . Split college  $c$  with quota  $n$  into  $n$  different women  $c_1, \dots, c_n$ .
- Create artificial preferences by replacing college  $c$  in students' rankings by  $c_1, \dots, c_n$ , in that order.

## The deferred acceptance (DA) algorithm: homework exercise 7

Consider the ranking matrix

	$w_1$	$w_2$
$m_1$	1, 2	2, 1
$m_2$	2, 1	1, 2

- Find a stable matching using the men-proposing DA algorithm.
- Find a stable matching using the women-proposing DA algorithm.
- Suppose that  $w_1$  lies about her preferences and says that she only finds  $m_2$  acceptable. What is the outcome of the men-proposing DA algorithm now? Verify that both women are better off than under (a): it may pay for the women to lie!