

# CSC304 Lecture 13

Finishing Facility Location:  
Randomized Left-Right-Middle Mechanism

Begin Stable Matching:  
Gale-Shapley Algorithm

# Recap: Facility Location



- Set of agents  $N$
- Each agent  $i$  has a true location  $x_i \in \mathbb{R}$
- Mechanism  $f$  takes as input reported locations  $\tilde{x} = (\tilde{x}_1, \tilde{x}_2, \dots, \tilde{x}_n)$ , and places the facility at  $y \in \mathbb{R}$
- Cost to agent  $i$  :  $c_i(y) = |y - x_i|$

# Recap: Facility Location



- Social cost  $C(y) = \sum_i c_i(y) = \sum_i |y - x_i|$ 
  - Median is strategyproof (SP) and optimal (i.e., provides a 1-approximation)
- Maximum cost  $C(y) = \max_i |y - x_i|$ 
  - Median, Leftmost, Rightmost, Dictatorship, etc are strategyproof and provide a 2-approximation
  - No deterministic SP mechanism can provide  $< 2$  approximation

# Max Cost + Randomized

- **The Left-Right-Middle (LRM) Mechanism**

- Choose  $\min_i x_i$  with probability  $1/4$

- Choose  $\max_i x_i$  with probability  $1/4$

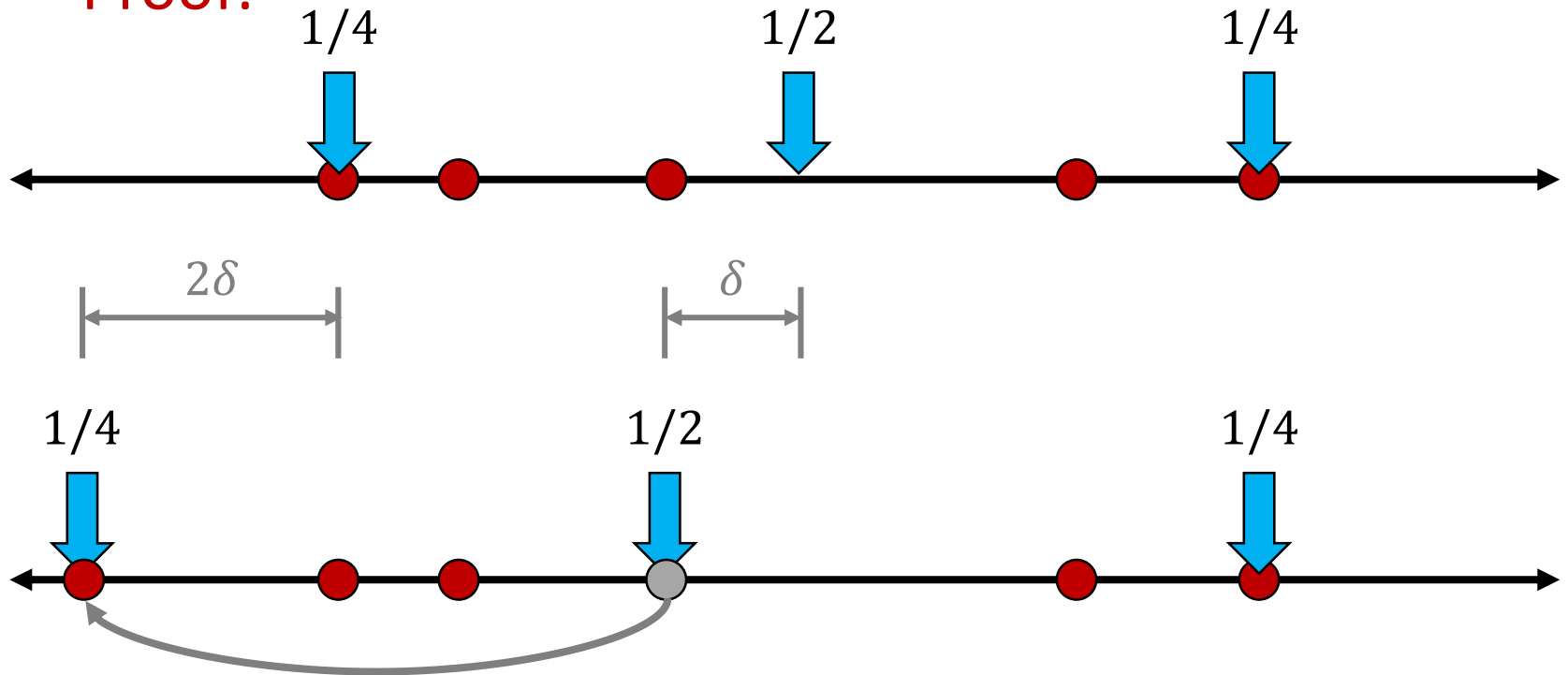
- Choose  $(\min_i x_i + \max_i x_i)/2$  with probability  $1/2$

- **Question:** What is the approximation ratio of LRM for maximum cost?

- At most  $\frac{(1/4)*2C + (1/4)*2C + (1/2)*C}{C} = \frac{3}{2}$

# Max Cost + Randomized

- Theorem [Procaccia & Tennenholtz, '09]:  
The LRM mechanism is strategyproof.
- Proof:



# Max Cost + Randomized

- Exercise for you!

Try showing that no randomized SP mechanism can achieve approximation ratio  $< 3/2$

- Suggested outline

- Consider two agents with  $x_1 = 0$  and  $x_2 = 1$
- Show that one of them has expected cost at least  $1/2$
- What happens if that agent moves 1 unit farther from the other agent?

# Stable Matching

- **Recap Graph Theory:**
- In **graph**  $G = (V, E)$ , a **matching**  $M \subseteq E$  is a set of edges with no common vertices
  - That is, each vertex should have at most one incident edge
  - A matching is perfect if no vertex is left unmatched.
- $G$  is a **bipartite graph** if there exist  $V_1, V_2$  such that  $V = V_1 \cup V_2$  and  $E \subseteq V_1 \times V_2$

# Stable Marriage Problem

- Bipartite graph, two sides with equal vertices
  - $n$  men and  $n$  women (old school terminology 😞)
- Each man has a **ranking** over women & vice versa
  - E.g., Eden might prefer Alice  $\succ$  Tina  $\succ$  Maya
  - And Tina might prefer Tony  $\succ$  Alan  $\succ$  Eden
- Want: **a perfect, stable matching**
  - Match each man to a unique woman such that no pair of man  $m$  and woman  $w$  prefer each other to their current matches (such a pair is called a “blocking pair”)



# Example: Preferences

<b>Albert</b>	Diane	Emily	Fergie
<b>Bradley</b>	Emily	Diane	Fergie
<b>Charles</b>	Diane	Emily	Fergie

<b>Diane</b>	Bradley	Albert	Charles
<b>Emily</b>	Albert	Bradley	Charles
<b>Fergie</b>	Albert	Bradley	Charles



# Example: Matching 1

Albert	Diane	Emily	Fergie
Bradley	Emily	Diane	Fergie
Charles	Diane	Emily	Fergie

Diane	Bradley	Albert	Charles
Emily	Albert	Bradley	Charles
Fergie	Albert	Bradley	Charles

Question: Is this a stable matching?

# Example: Matching 1

Albert	Diane	Emily	Fergie
Bradley	Emily	Diane	Fergie
Charles	Diane	Emily	Fergie

Diane	Bradley	Albert	Charles
Emily	Albert	Bradley	Charles
Fergie	Albert	Bradley	Charles

No, Albert and Emily form a **blocking pair**.

# Example: Matching 2

Albert	Diane	Emily	Fergie
Bradley	Emily	Diane	Fergie
Charles	Diane	Emily	Fergie

Diane	Bradley	Albert	Charles
Emily	Albert	Bradley	Charles
Fergie	Albert	Bradley	Charles

Question: What about this matching?

# Example: Matching 2

Albert	Diane	Emily	Fergie
Bradley	Emily	Diane	Fergie
Charles	Diane	Emily	Fergie

Diane	Bradley	Albert	Charles
Emily	Albert	Bradley	Charles
Fergie	Albert	Bradley	Charles

**Yes!** (Charles and Fergie are unhappy, but helpless.)

Does a stable matching always exist in the marriage problem?

Can we compute it in a strategyproof way?

Can we compute it efficiently?

# Gale-Shapley 1962

- Men-Proposing Deferred Acceptance (MPDA):
  1. Initially, no one has proposed, no one is matched.
  2. While some man  $m$  is unmatched:
    - $w \leftarrow m$ 's most preferred woman to whom  $m$  has not proposed yet
    - $m$  proposes to  $w$
    - If  $w$  is unmatched:
      - $m$  and  $w$  are engaged
    - Else if  $w$  prefers  $m$  to her current partner  $m'$ 
      - $m$  and  $w$  are engaged,  $m'$  becomes unengaged
    - Else:  $w$  rejects  $m$
  3. Match all engaged pairs.

# Example: MPDA

<b>Albert</b>	Diane	Emily	Fergie
<b>Bradley</b>	Emily	Diane	Fergie
<b>Charles</b>	Diane	Emily	Fergie

<b>Diane</b>	Bradley	Albert	Charles
<b>Emily</b>	Albert	Bradley	Charles
<b>Fergie</b>	Albert	Bradley	Charles

 = proposed

 = engaged

 = rejected



# Running Time

- Theorem: DA terminates in polynomial time (at most  $n^2$  iterations of the outer loop)
- Proof:
  - In each iteration, a man proposes to someone to whom he has never proposed before.
  - $n$  men,  $n$  women  $\rightarrow n \times n$  possible proposals
  - Can actually tighten a bit to  $n(n - 1) + 1$  iterations
- At termination, it must return a perfect matching.

# Stable Matching

- Theorem: DA always returns a stable matching.
- Proof by contradiction:
  - Assume  $(m, w)$  is a blocking pair.
  - Case 1:  $m$  never proposed to  $w$ 
    - GS:  $m$  cannot be unmatched o/w algorithm would not terminate.
    - GS: Men propose in the order of preference.
    - Hence,  $m$  must be matched with a woman he prefers to  $w$
    - $(m, w)$  is not a blocking pair

# Stable Matching

- Theorem: DA always returns a stable matching.
- Proof by contradiction:
  - Assume  $(m, w)$  is a blocking pair.
  - Case 2:  $m$  proposed to  $w$ 
    - $w$  must have rejected  $m$  at some point
    - GS: Women only reject to get better partners
    - $w$  must be matched at the end, with a partner she prefers to  $m$
    - $(m, w)$  is not a blocking pair

# Men-Optimal Stable Matching

- The stable matching found by MPDA is special.
- **Valid partner:** For a man  $m$ , call a woman  $w$  a valid partner if  $(m, w)$  is in *some* stable matching.
- **Best valid partner:** For a man  $m$ , a woman  $w$  is the best valid partner if she is a valid partner, and  $m$  prefers her to every other valid partner.
  - Denote the best valid partner of  $m$  by  $best(m)$ .

# Men-Optimal Stable Matching

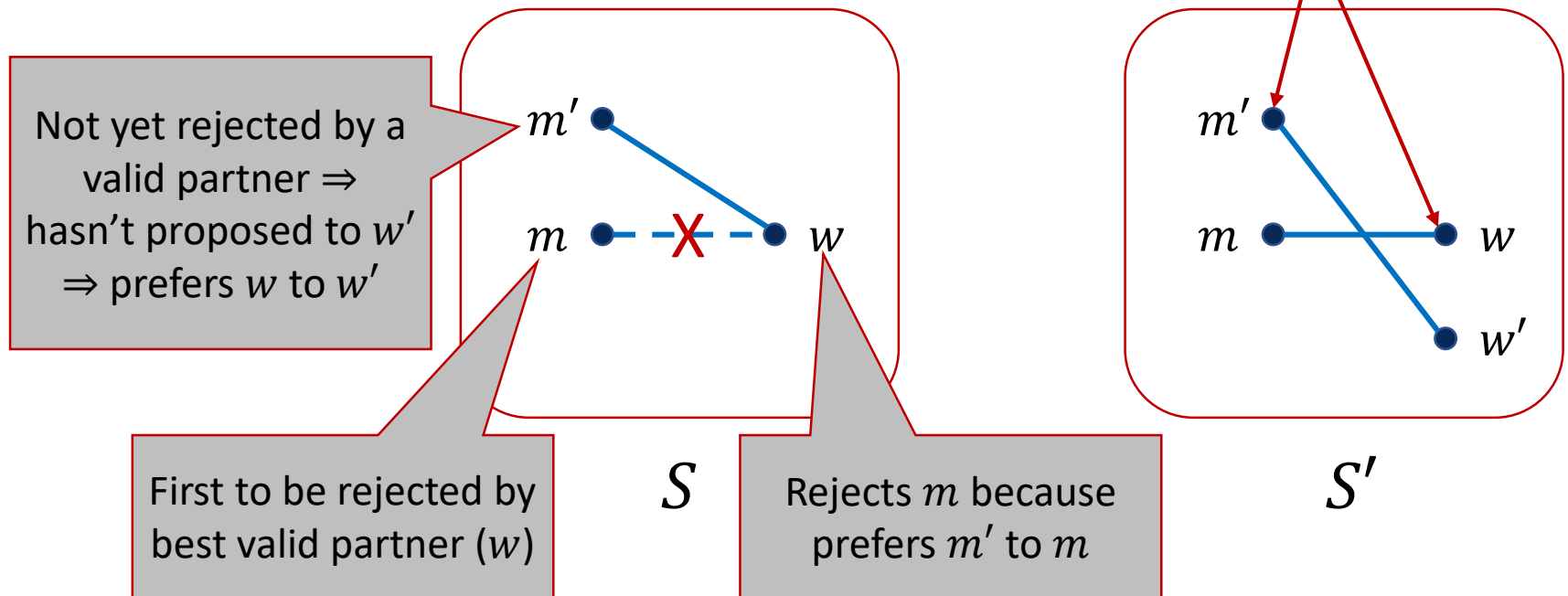
- **Theorem:** Every execution of MPDA returns the men-optimal stable matching in which every man is matched to his **best** valid partner  $best(m)$ .
  - Surprising that this is even a matching. E.g., why can't two men have the same best valid partner?
  - Every man is simultaneously matched with his best possible partner across all stable matchings
- **Theorem:** Every execution of MPDA produces the women-pessimal stable matching in which every woman is matched to her **worst** valid partner.

# Men-Optimal Stable Matching

- **Theorem:** Every execution of MPDA returns the men-optimal stable matching.
- Proof by contradiction:
  - Let  $S$  = matching returned by MPDA.
  - $m \leftarrow$  first man rejected by  $best(m) = w$
  - $m' \leftarrow$  the more preferred man due to which  $w$  rejected  $m$
  - $w$  is valid for  $m$ , so  $(m, w)$  part of stable matching  $S'$
  - $w' \leftarrow$  woman  $m'$  is matched to in  $S'$
  - We show that  $S'$  cannot be stable because  $(m', w)$  is a blocking pair.

# Men-Optimal Stable Matching

- **Theorem:** Every execution of MPDA returns the men-optimal stable matching.
- Proof by contradiction:



# Strategyproofness

- **Theorem:** MPDA is strategyproof for men, i.e., reporting the true ranking is a weakly dominant strategy for every man.
  - We'll skip the proof of this.
  - Actually, it is group-strategyproof.
- But the women might want to misreport.
- **Theorem:** No algorithm for the stable matching problem is strategyproof for both men and women.



# Women-Proposing Version

- Women-Proposing Deferred Acceptance (WPDA)
  - Just flip the roles of men and women
  - Strategyproof for women, not strategyproof for men
  - Returns the women-optimal and men-pessimal stable matching

# Extensions

- Unacceptable matches
  - Allow every agent to report a partial ranking
  - If woman  $w$  does not include man  $m$  in her preference list, it means she would rather be unmatched than matched with  $m$ . And vice versa.
  - $(m, w)$  is blocking if each prefers the other over their current state (matched with another partner or unmatched)
  - Just  $m$  (or just  $w$ ) can also be blocking if they prefer being unmatched than be matched to their current partner
- Magically, DA still produces a stable matching.

# Extensions

- Resident Matching (or College Admission)
  - Men → residents (or students)
  - Women → hospitals (or colleges)
  - Each side has a ranked preference over the other side
  - But each hospital (or college)  $q$  can accept  $c_q > 1$  residents (or students)
  - Many-to-one matching
- An extension of Deferred Acceptance works
  - Resident-proposing (resp. hospital-proposing) results in resident-optimal (resp. hospital-optimal) stable matching

# Extensions

- For ~20 years, most people thought that these problems are very similar to the stable marriage problem
- Roth [1985] shows:
  - No stable matching algorithm exists such that truth-telling is a weakly dominant strategy for hospitals (or colleges).

# Extensions

- Roommate Matching
  - Still one-to-one matching
  - But no partition into men and women
    - “Generalizing from bipartite graphs to general graphs”
  - Each of  $n$  agents submits a ranking over the other  $n - 1$  agents
- Unfortunately, there are instances where no stable matching exist.
  - A variant of DA can still find a stable matching *if* it exists.
  - Due to Irving [1985]

# NRMP: Matching in Practice

- 1940s: Decentralized resident-hospital matching
  - Markets “unralveled”, offers came earlier and earlier, quality of matches decreased
- 1950s: NRMP introduces centralized “clearinghouse”
- 1960s: Gale-Shapley introduce DA
- 1984: Al Roth studies NRMP algorithm, finds it is really a version of DA!
- 1970s: Couples increasingly don’t use NRMP
- 1998: NRMP implements matching with couple constraints (stable matchings may not exist anymore...)
- More recently, DA applied to college admissions