

# Stable Matching Problem

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- ▶ Maximize number of first choices.
- ▶ Minimize difference between preference ranks.



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**Definition:** A **matching** is disjoint set of  $n$  job-candidate pairs.

**Definition:** A **rogue couple**  $j, c^*$  for a pairing  $S$ :  
 $j$  and  $c^*$  prefer each other to their partners in  $S$

# A stable matching??

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# A stable matching??

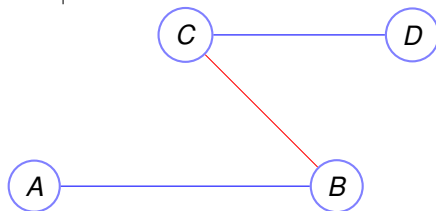
Given a set of preferences.

Is there a stable matching?

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Consider a single type version: stable roommates.

A	B	C	D
B	C	A	D
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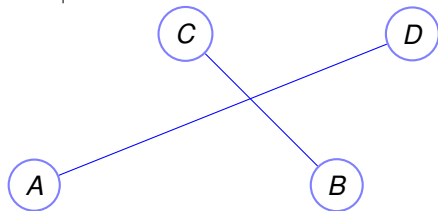
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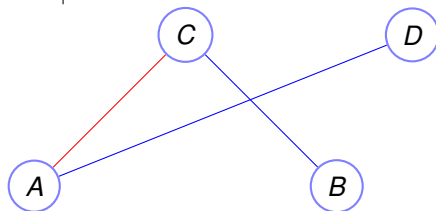
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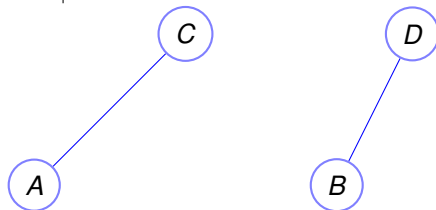
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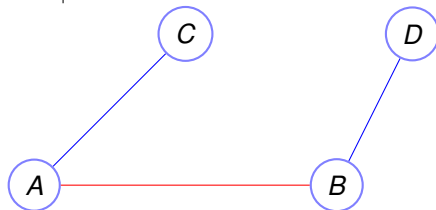
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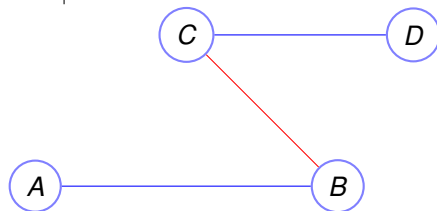
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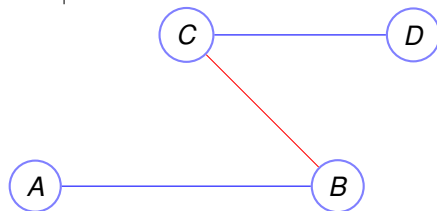
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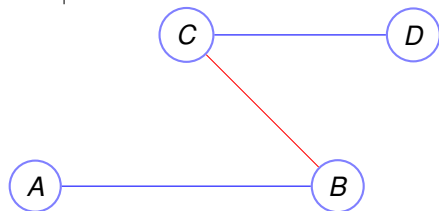
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	Candidates		
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## Example.

	Jobs				Candidates		
A	1	2	3	1	C	A	B
B	1	2	3	2	A	B	C
C	2	1	3	3	A	C	B

	Day 1	Day 2	Day 3	Day 4	Day 5
1					
2					
3					

## Example.

Jobs				Candidates			
A	1	2	3	1	C	A	B
B	1	2	3	2	A	B	C
C	2	1	3	3	A	C	B

	Day 1	Day 2	Day 3	Day 4	Day 5
1	A, B				
2	C				
3					



## Example.

Jobs				Candidates			
A	1	2	3	1	C	A	B
B	X	2	3	2	A	B	C
C	2	1	3	3	A	C	B

	Day 1	Day 2	Day 3	Day 4	Day 5
1	A, <del>B</del>				
2	C				
3					

## Example.

Jobs				Candidates			
A	1	2	3	1	C	A	B
B	X	2	3	2	A	B	C
C	2	1	3	3	A	C	B

	Day 1	Day 2	Day 3	Day 4	Day 5
1	A, <del>B</del>	A			
2	C	B, C			
3					

# Example.

Jobs				Candidates			
A	1	2	3	1	C	A	B
B	<del>X</del>	2	3	2	A	B	C
C	<del>X</del>	1	3	3	A	C	B

	Day 1	Day 2	Day 3	Day 4	Day 5
1	A, <del>B</del>	A			
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3					

## Example.

Jobs				Candidates			
A	1	2	3	1	C	A	B
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	Day 1	Day 2	Day 3	Day 4	Day 5
1	A, <del>B</del>	A	A, C		
2	C	B, <del>C</del>	B		
3					

# Example.

Jobs				Candidates			
A	<del>X</del>	2	3	1	C	A	B
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1	A, <del>B</del>	A	<del>X</del> , C		
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3					

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Jobs				Candidates			
A	<del>X</del>	2	3	1	C	A	B
B	<del>X</del>	<del>X</del>	3	2	A	B	C
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3					

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Terminates in  $\leq n^2$  steps!

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$c$  - '1',  $j$  - 'C',  $j'$  - 'A',  $t = 5$ ,  $t' = 7$ .

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Improvement Lemma says 1 prefers 'A'.

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**Proof Idea:**

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**Proof Idea:** Candidate can always keep the previous job on the string.

## It gets better every day for candidates.

### **Improvement Lemma: It just gets better for candidates**

If on day  $t$  a candidate  $c$  has a job  $j$  on a string, any job,  $j'$ , on candidate  $c$ 's string for any day  $t' > t$  is at least as good as  $j$ .

Example: Candidate "1" has job "C" on string on day 5.

1 has job "A" on string on day 7.

Does 1 prefer "C" or "A"?

$c = '1', j = 'C', j' = 'A', t = 5, t' = 7.$

Improvement Lemma says 1 prefers 'A'.

Day 10: Can 1 have "A" on a string? Yes.

1 prefers day 10 job as much as day 7 job. Here,  $j = j'$ .

Why is lemma true?

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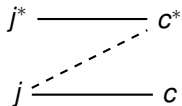
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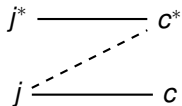


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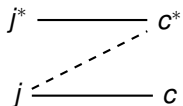
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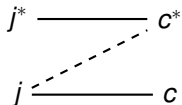
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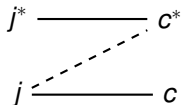


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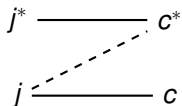
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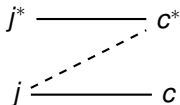
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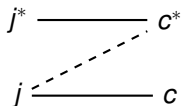
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..and so on for job pessimal, candidate optimal, candidate pessimal.

**Claim:** The optimal partner for a job must be first in its preference list.

True / False? False!

Subtlety here: Best partner in any **stable** matching.

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A: 1,2      1: A,B

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Pairing  $S$ :  $(A, 1), (B, 2)$ .    Stable? Yes.

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Pessimality?

# Job Propose and Candidate Reject is optimal!

For jobs?

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$T$  – pairing produced by JPR.

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Proofs carefully use definition:

Stability:

Improvement Lemma plus every day the job gets to choose.

Optimality proof:

Job Optimality:

contradiction of the existence of a better *stable* pairing.

that is, no rogue couple by improvement, job choice, and well ordering principle. Candidate Pessimality:

contradiction plus job optimality implies better pairing.