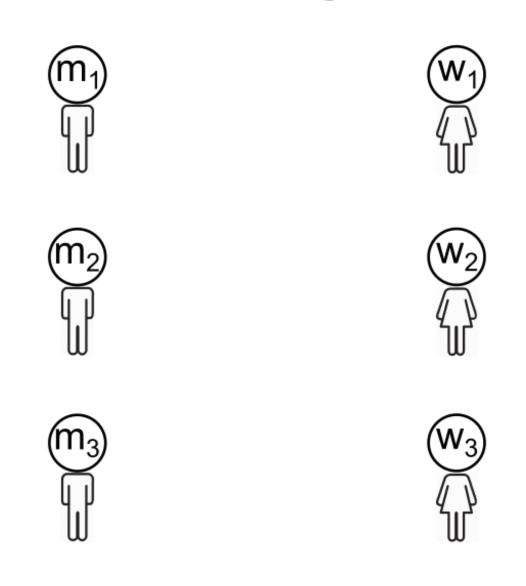
COL749: Computational Social Choice

# Lecture 2

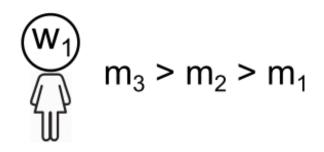
# Structure of Stable Matchings

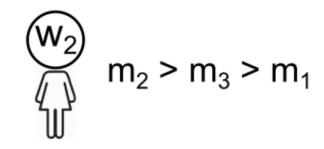


$$w_1 > w_2 > w_3$$

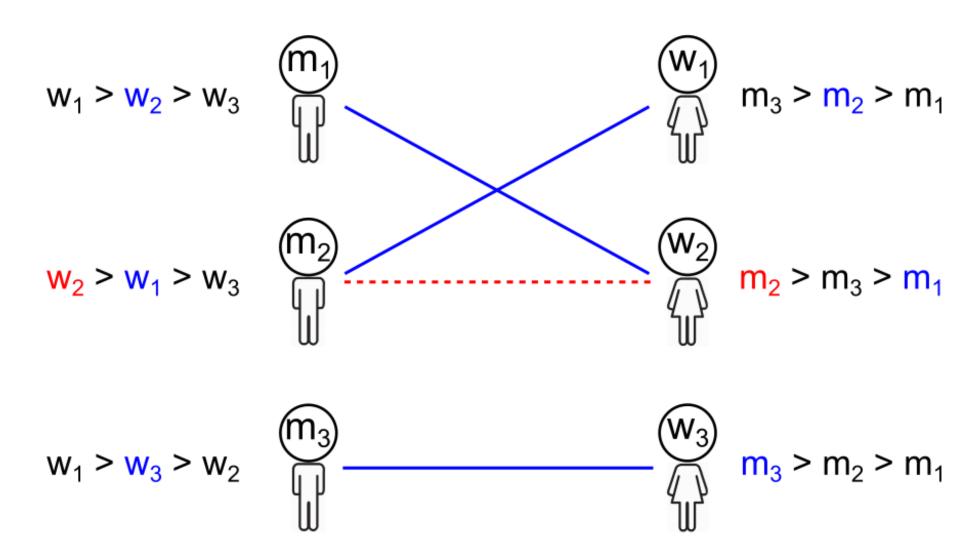
$$w_2 > w_1 > w_3$$

$$w_1 > w_3 > w_2$$
  $m_3$ 





$$m_3 > m_2 > m_1$$



A matching is stable if there is no blocking pair.



#### COLLEGE ADMISSIONS AND THE STABILITY OF MARRIAGE

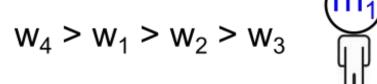
D. GALE\* AND L. S. SHAPLEY, Brown University and the RAND Corporation

Source: The American Mathematical Monthly, Jan., 1962, Vol. 69, No. 1 (Jan., 1962), pp. 9-15



Given any preference profile, a stable matching for that profile always exists and can be computed in polynomial time.

Structure of the Set of Stable Matchings





$$w_3 > w_2 > w_4 > w_1$$



$$w_1 > w_2 > w_3 > w_4$$



$$w_2 > w_1 > w_4 > w_3$$





 $m_2 > m_1 > m_4 > m_3$ 



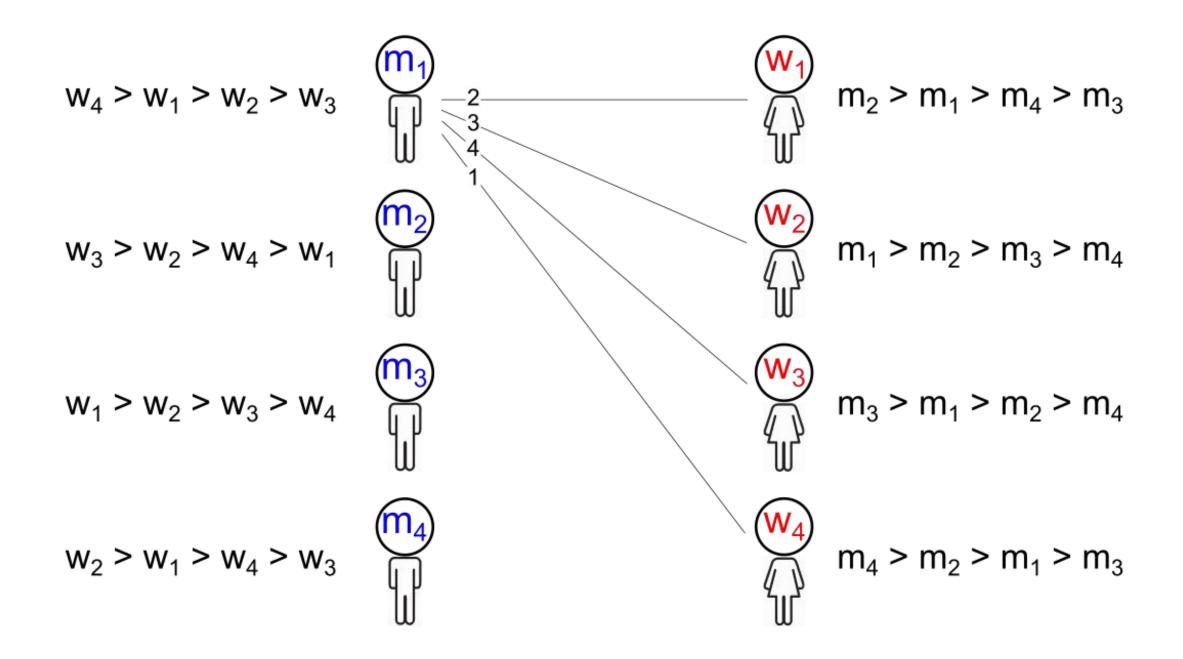
 $m_1 > m_2 > m_3 > m_4$ 

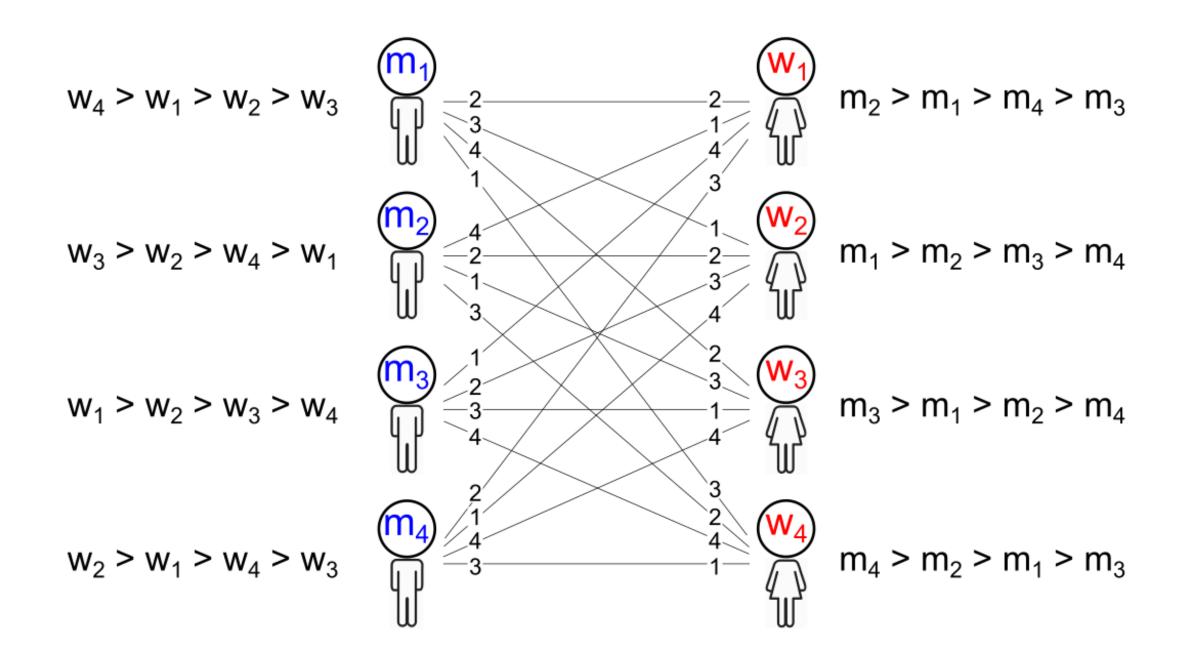


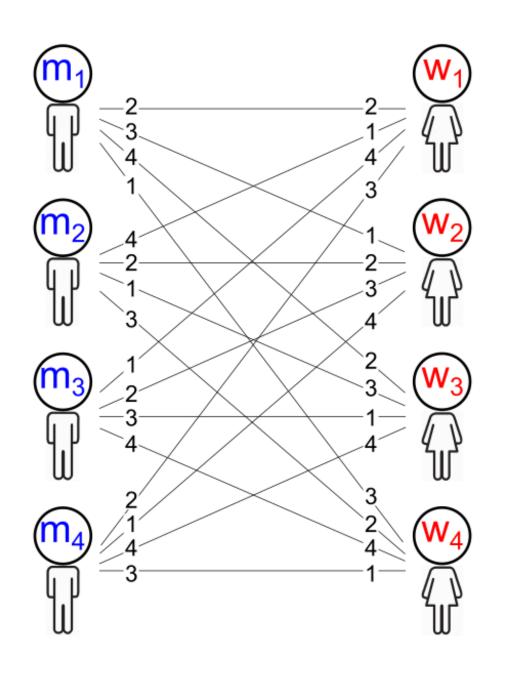
 $m_3 > m_1 > m_2 > m_4$ 

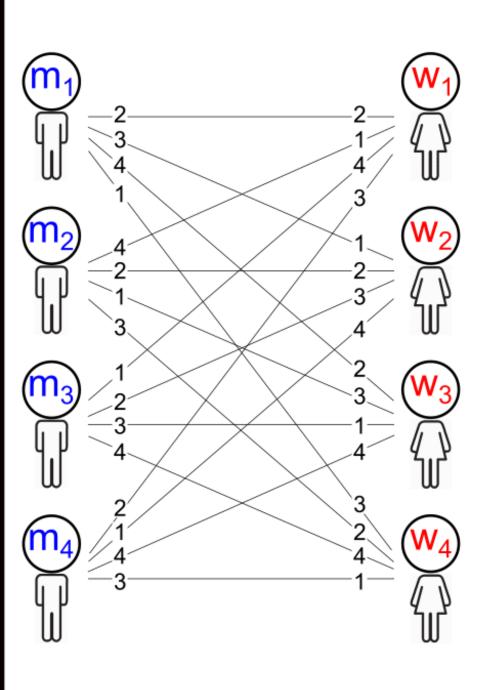


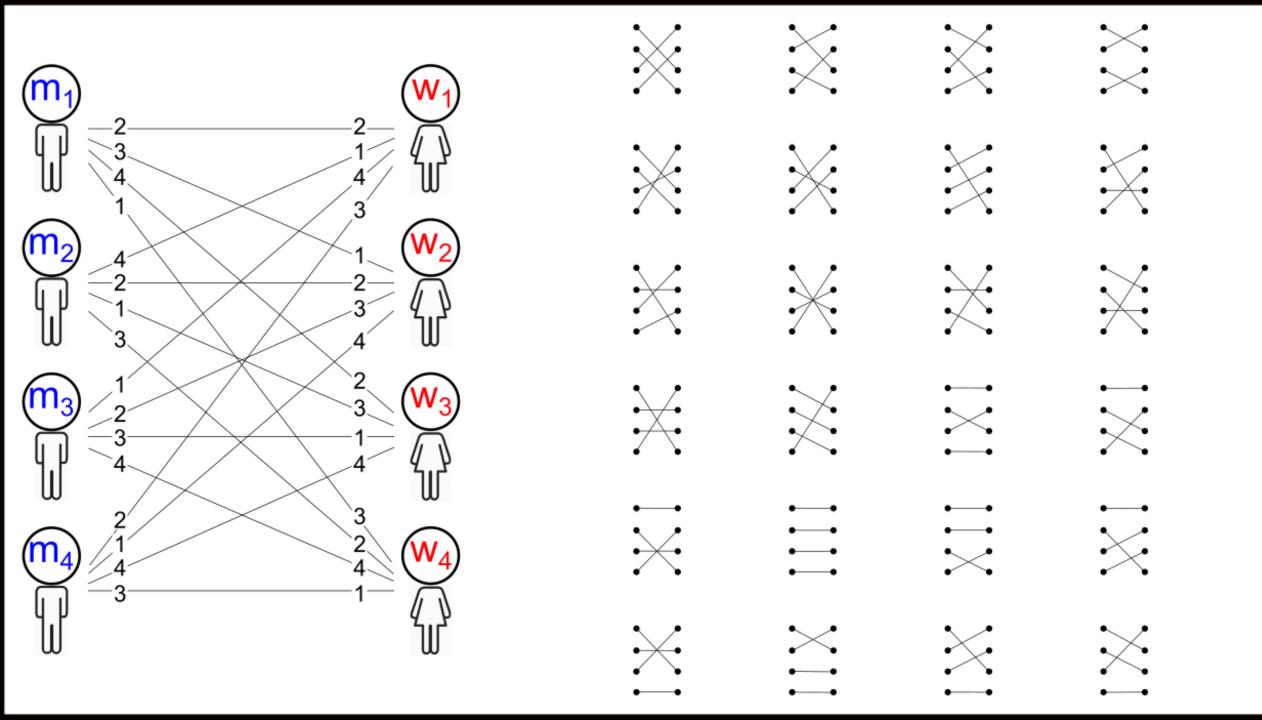
$$m_4 > m_2 > m_1 > m_3$$

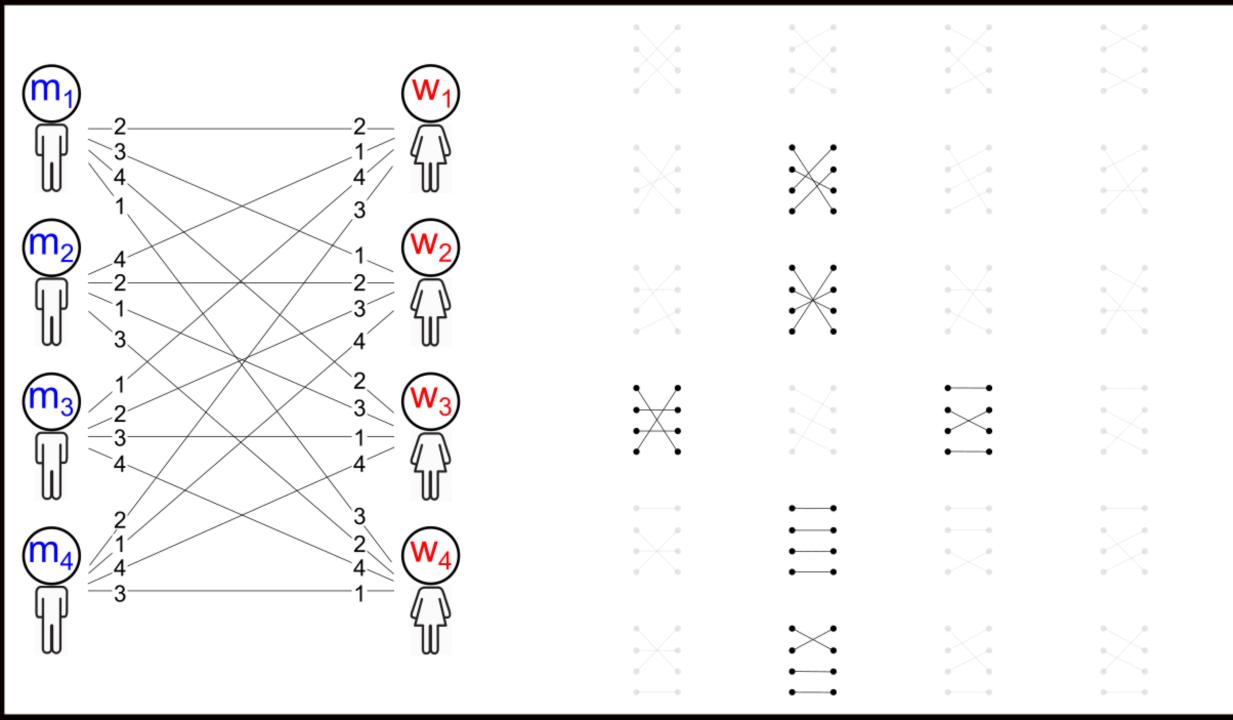


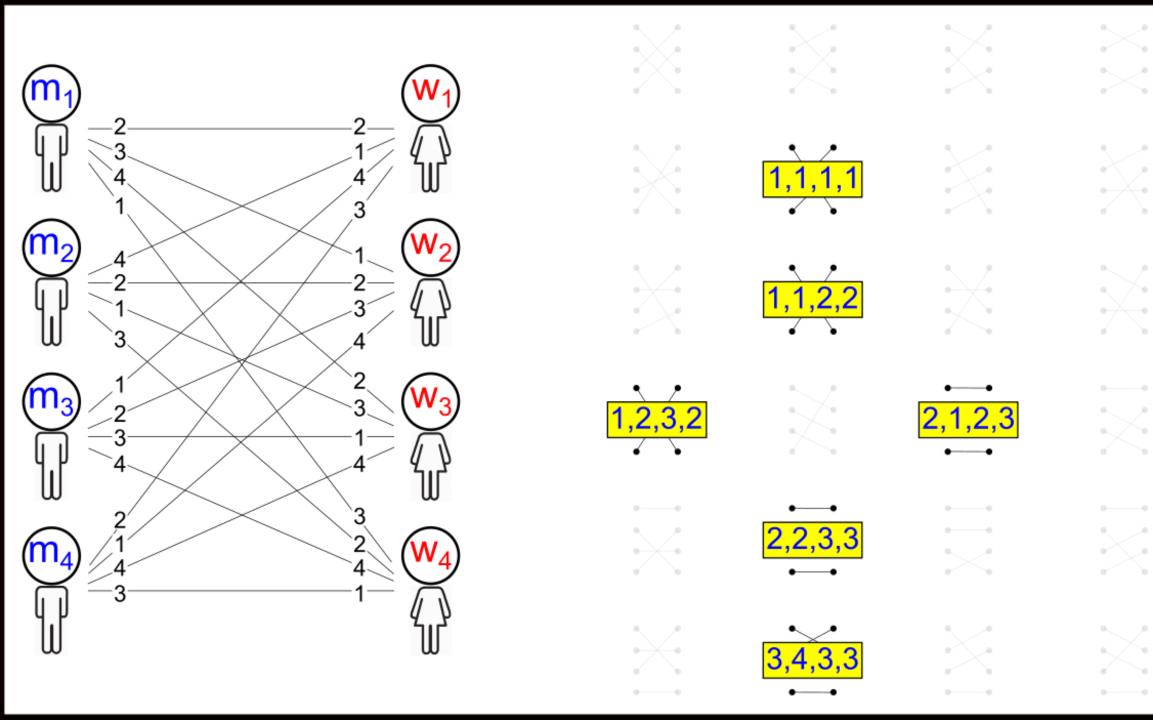


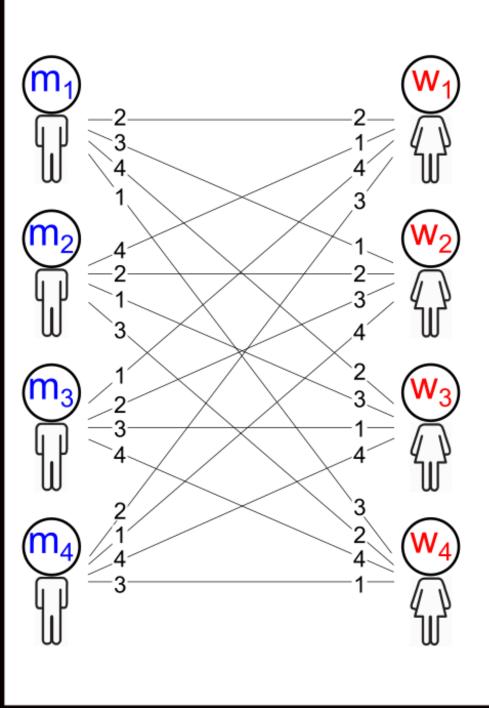












1,1,1,1

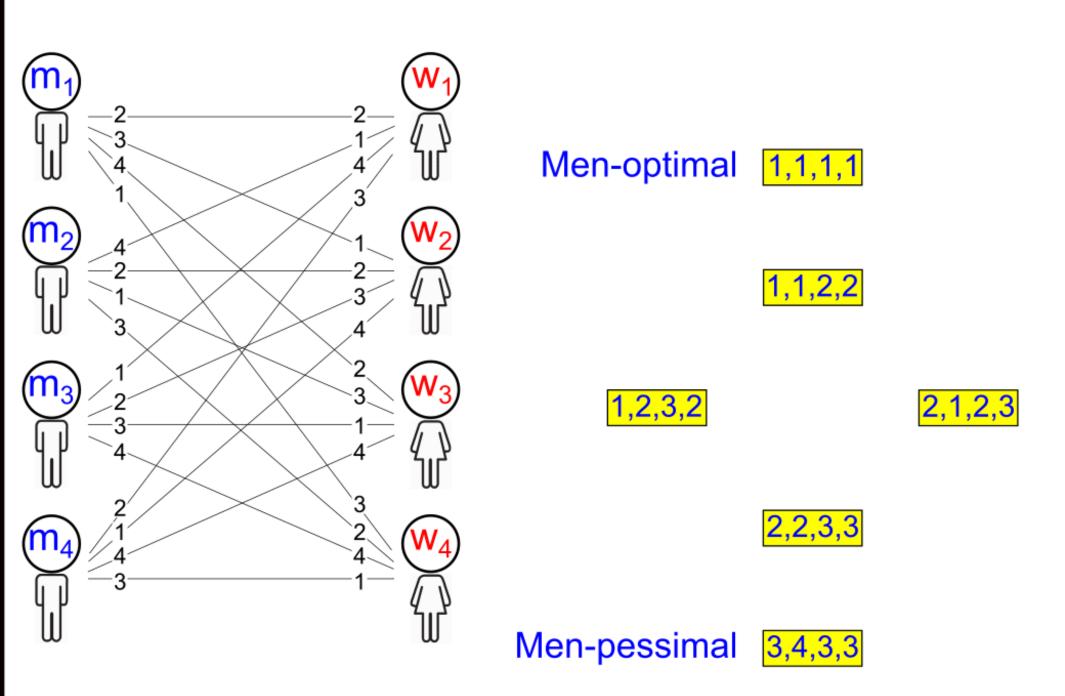
1,1,2,2

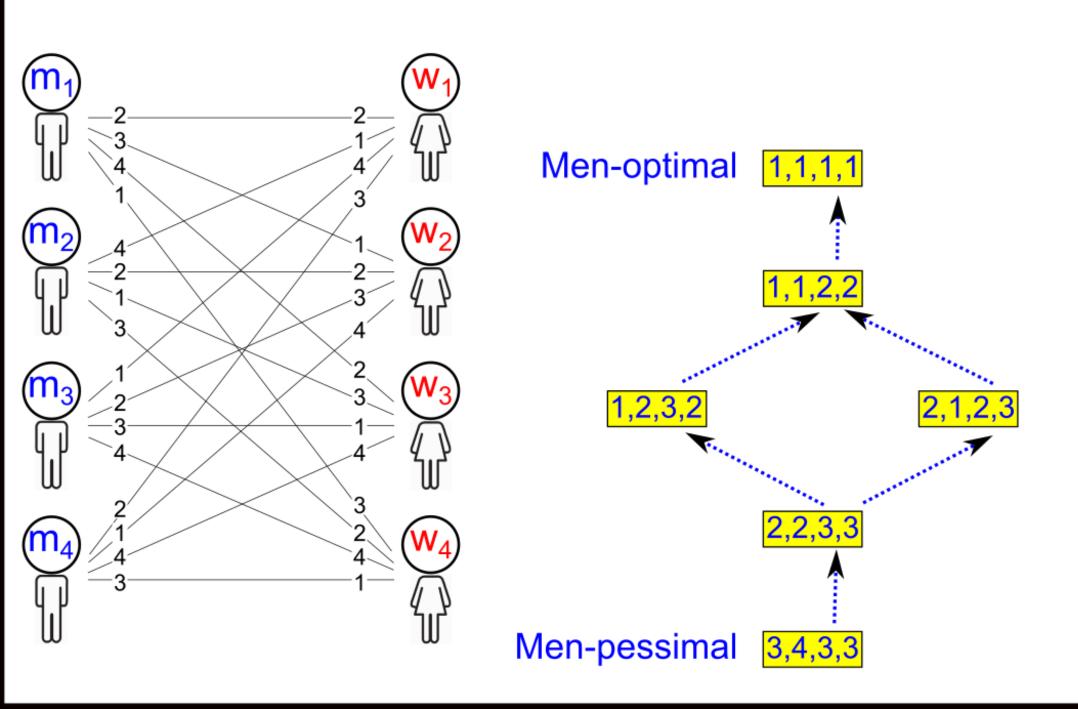
1,2,3,2

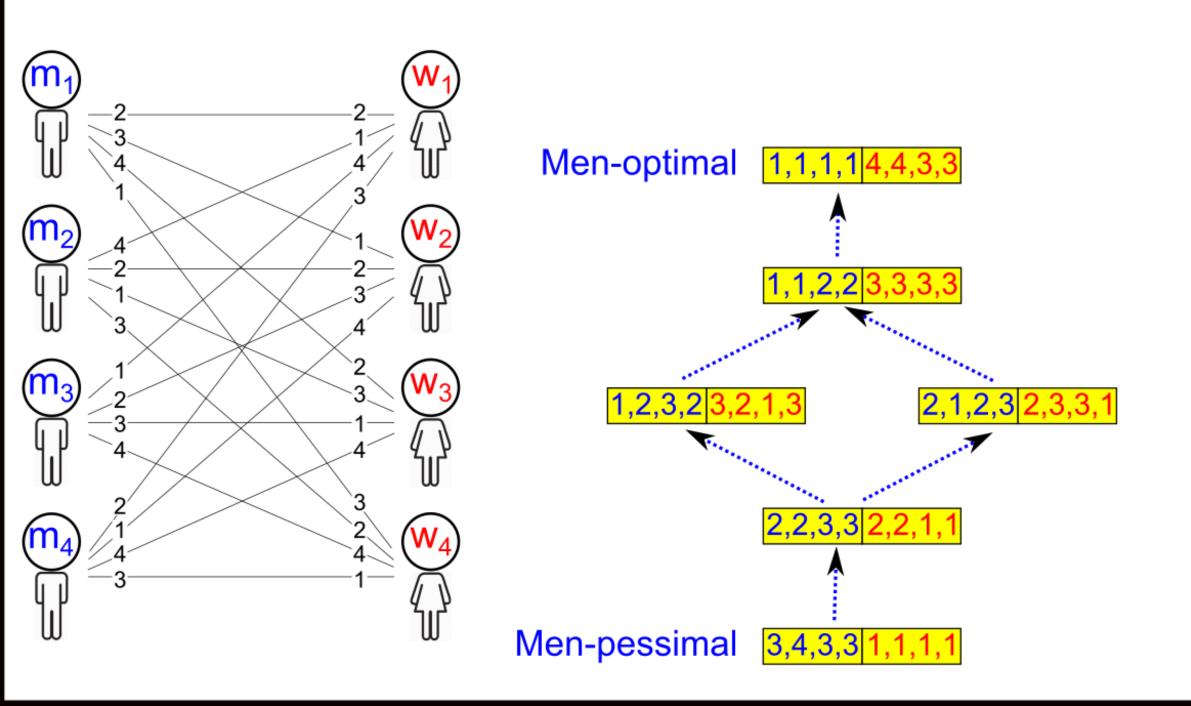
2,1,2,3

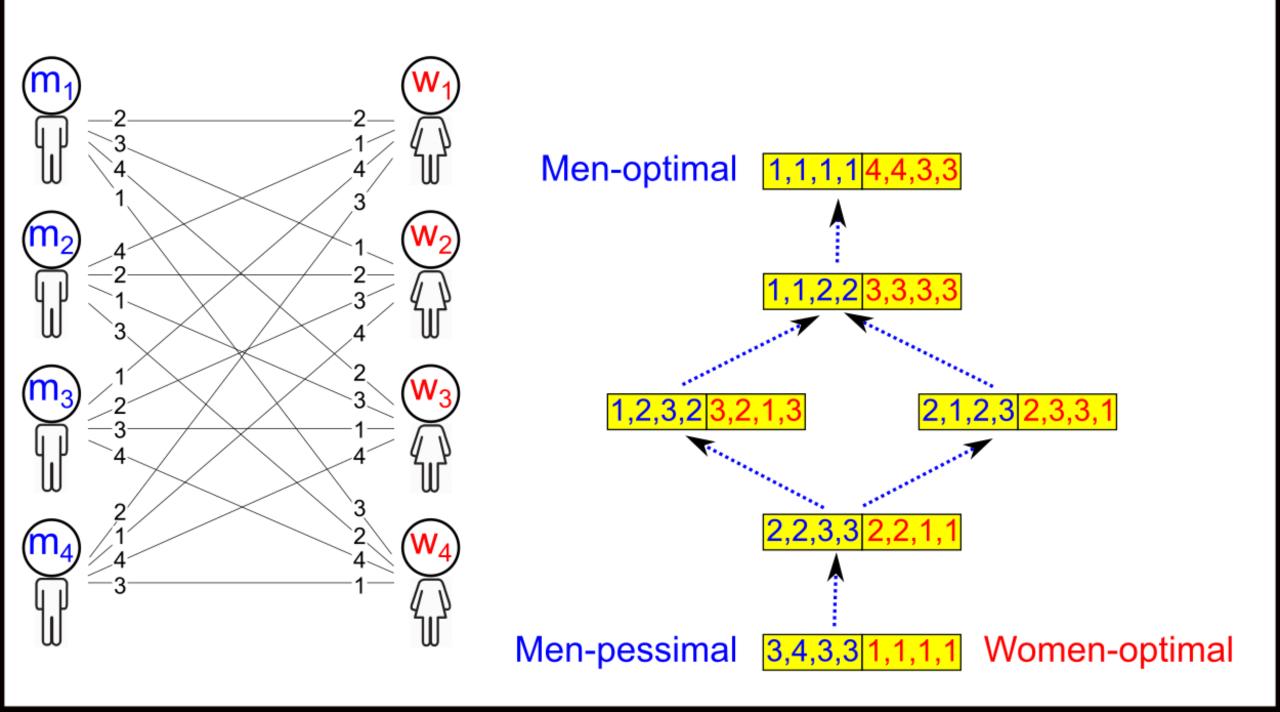
2,2,3,3

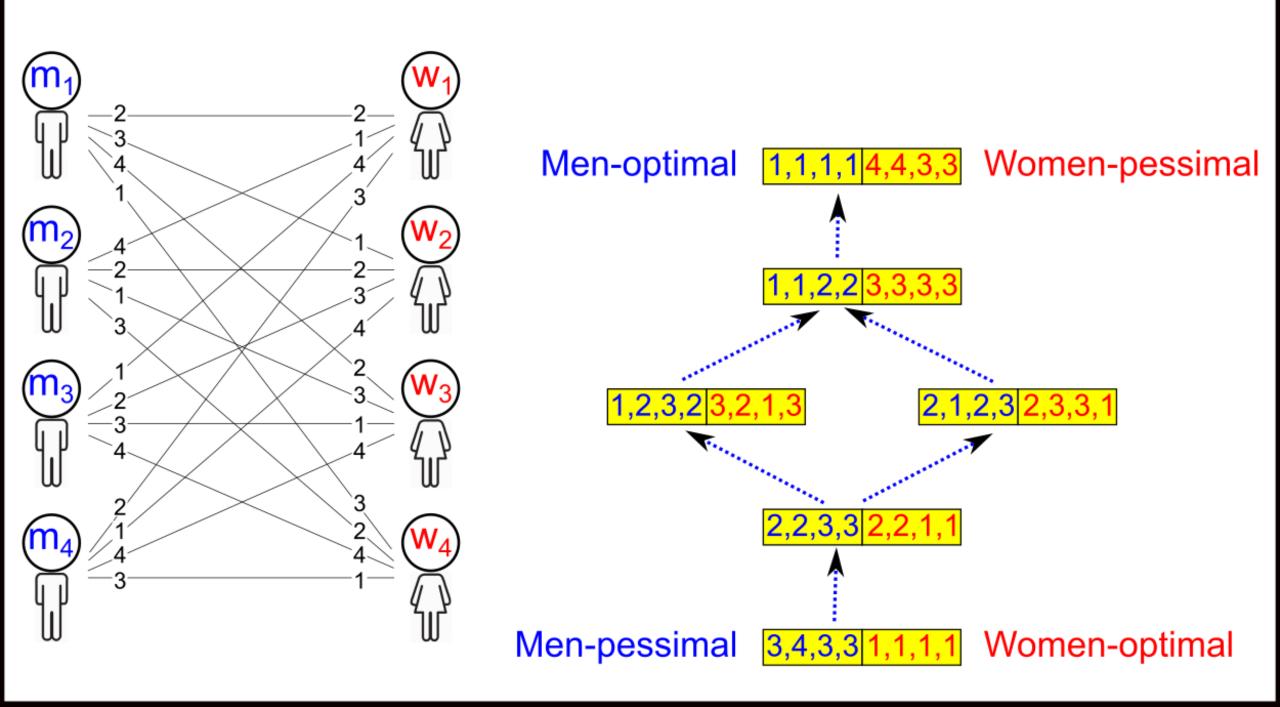
3,4,3,3

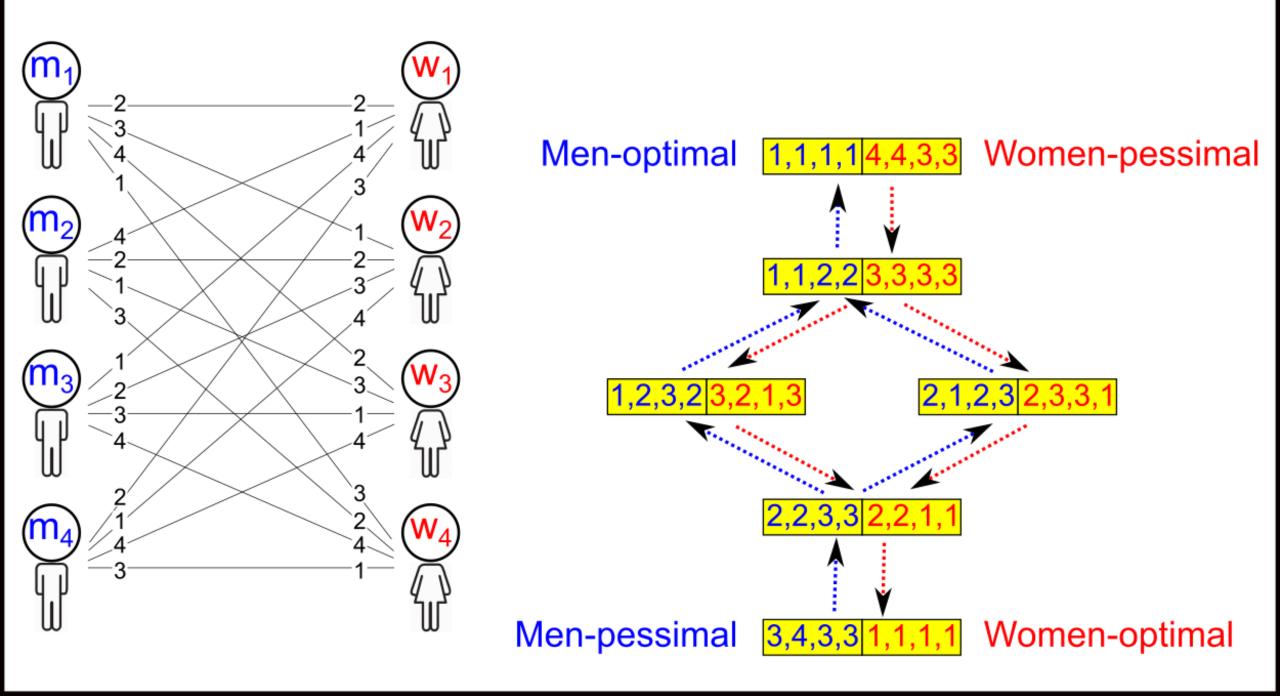


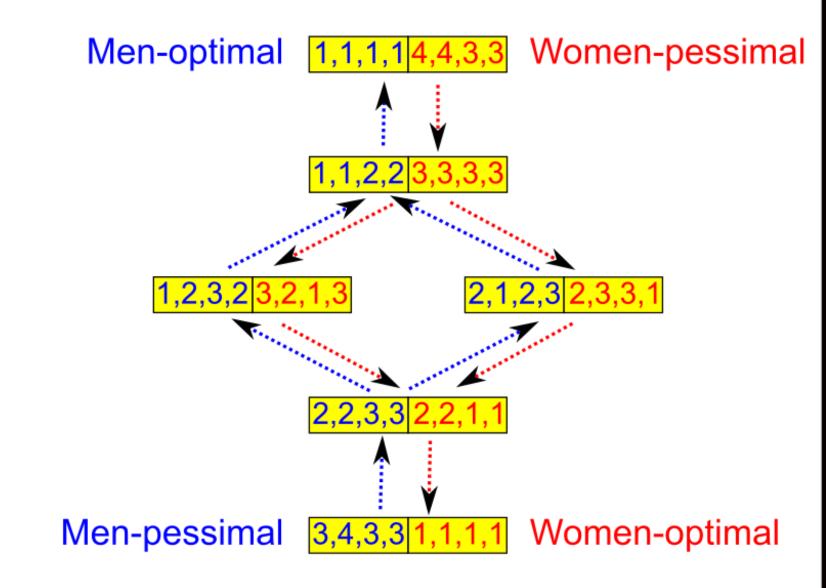


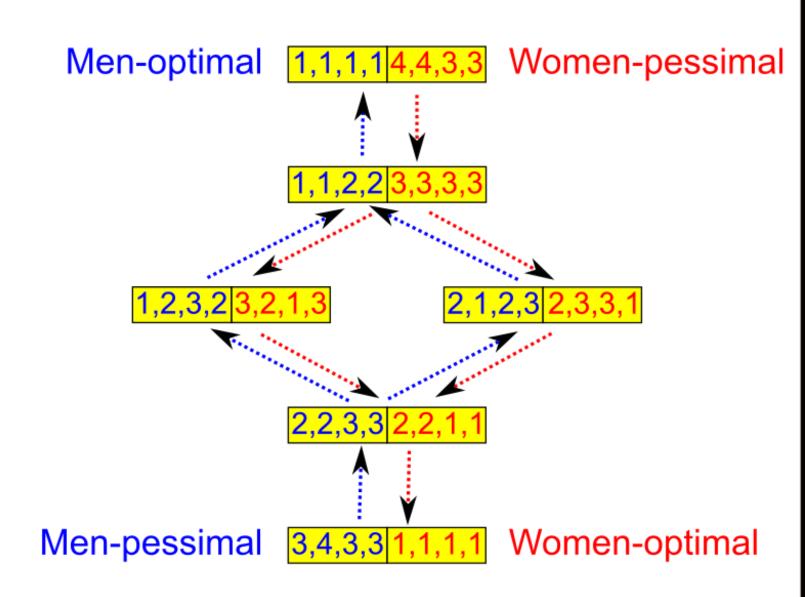


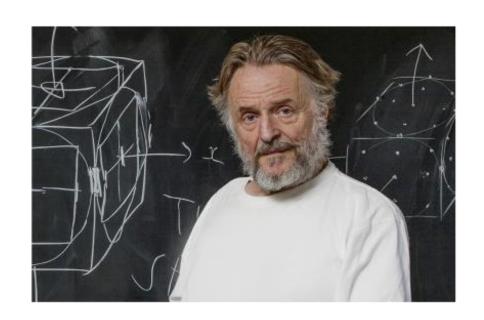


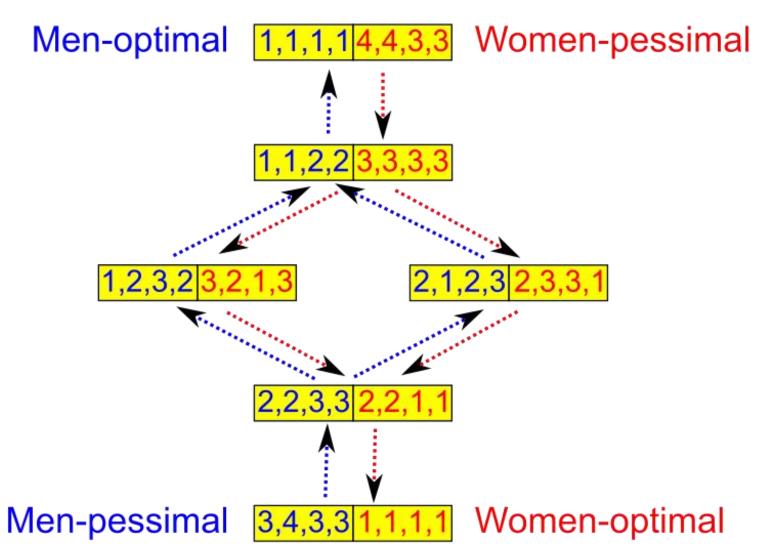


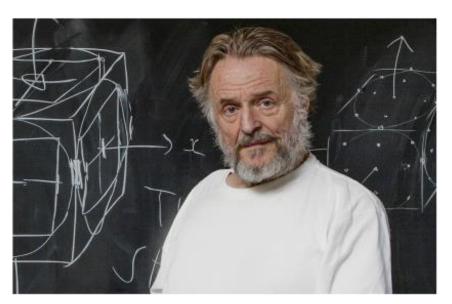




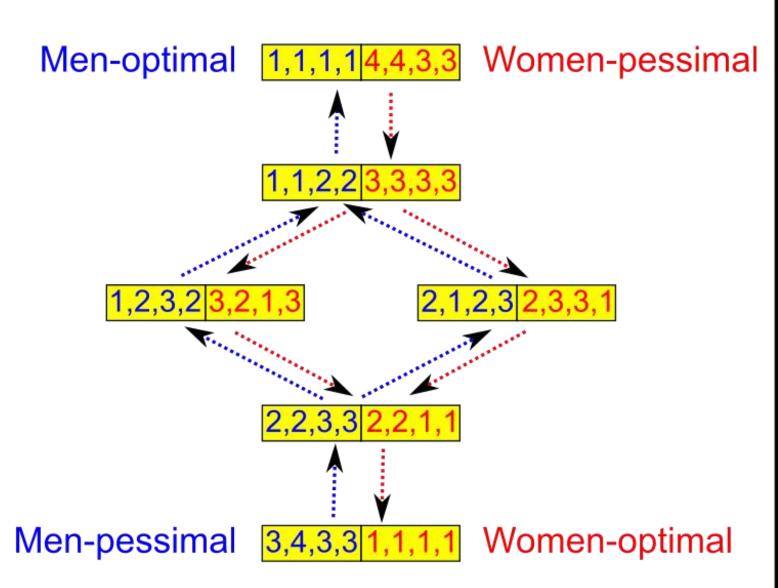


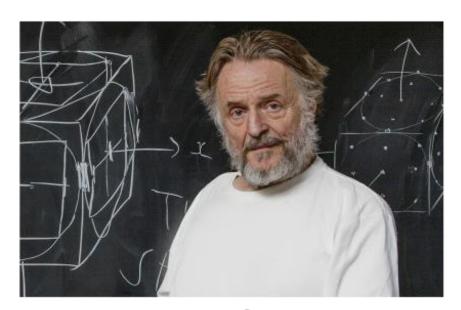




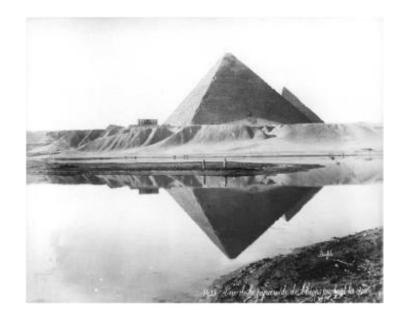


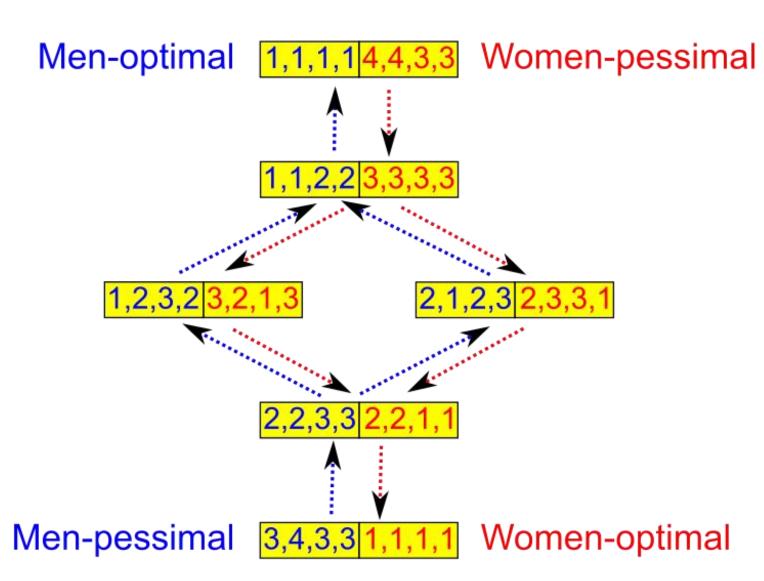
John H. Conway

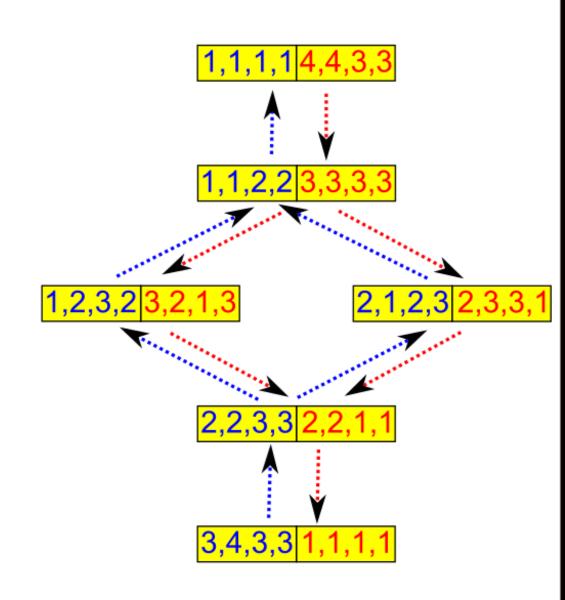




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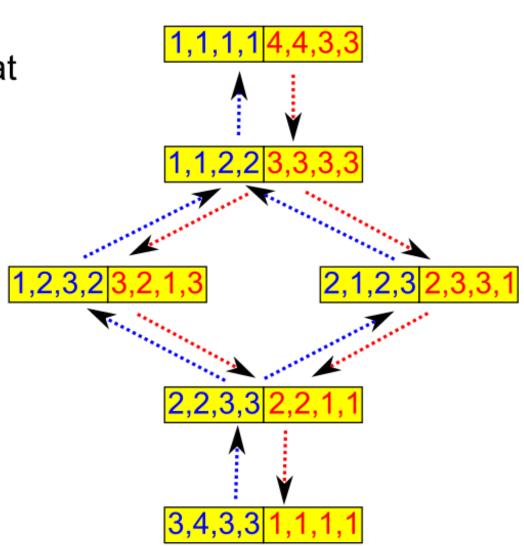




### Consensus

There is a stable matching that all men find at least as good as any other stable matching, and one that they find at least as bad.

(Analogously for the women.)



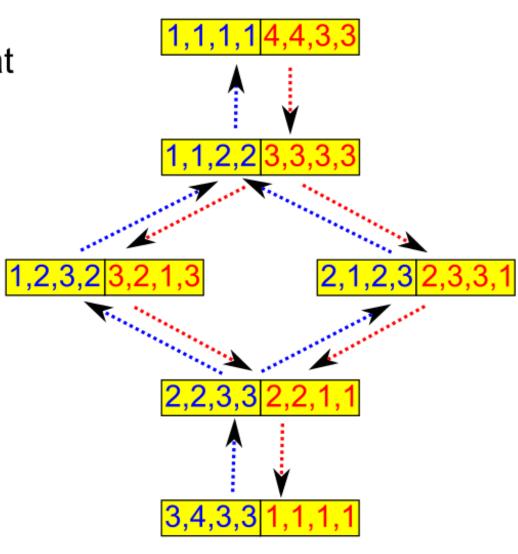
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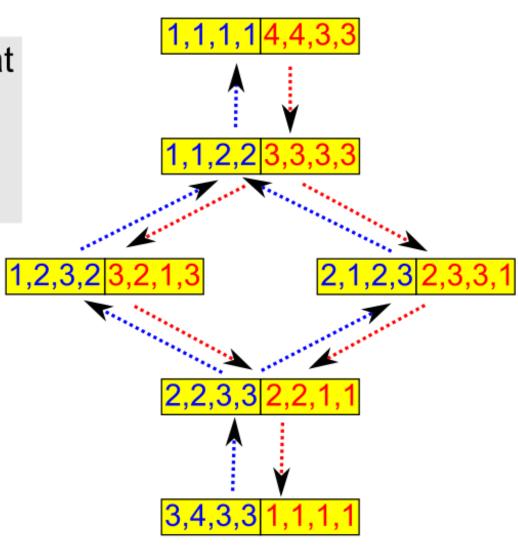
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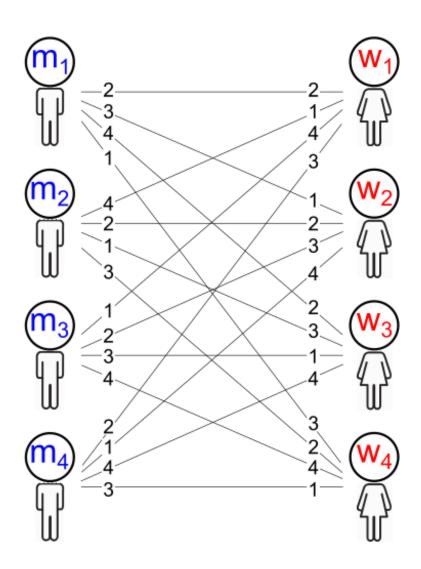
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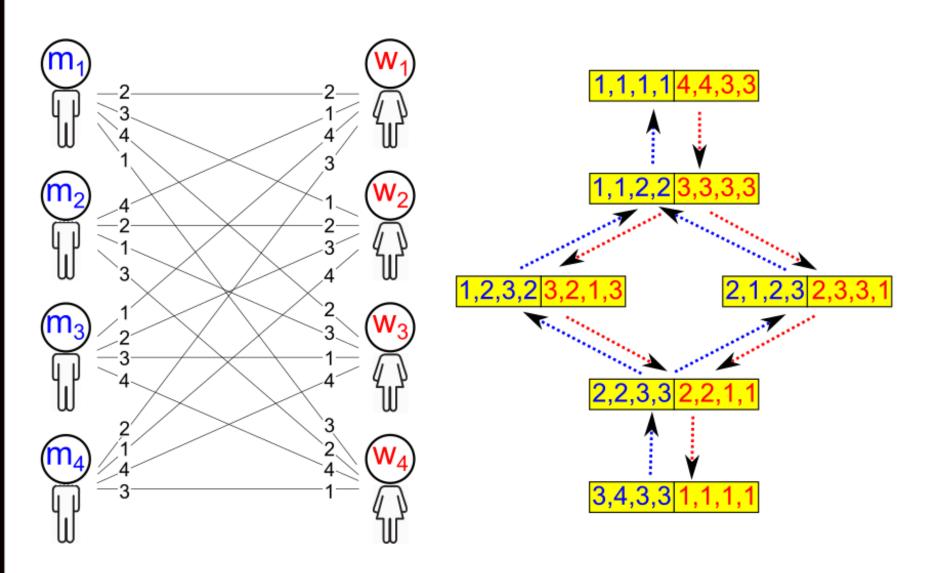
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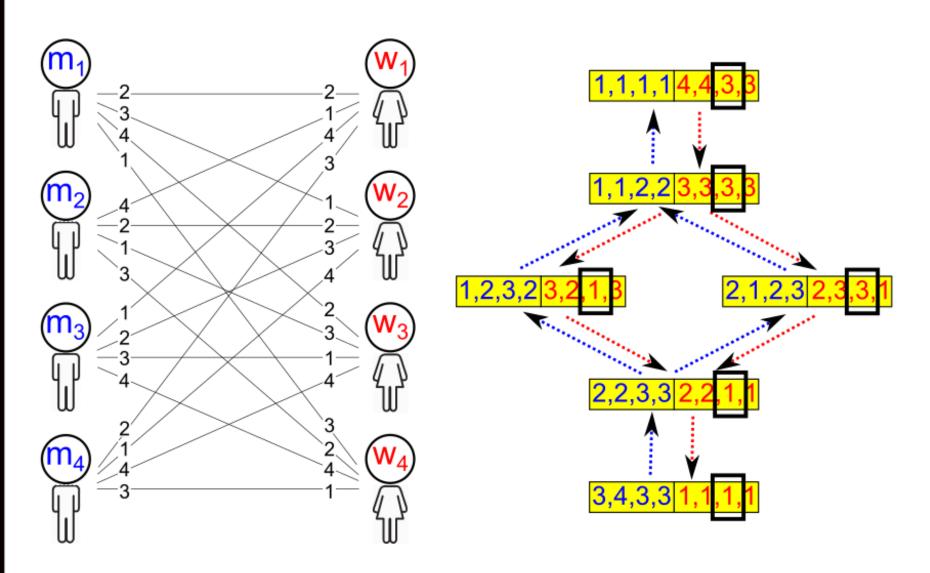
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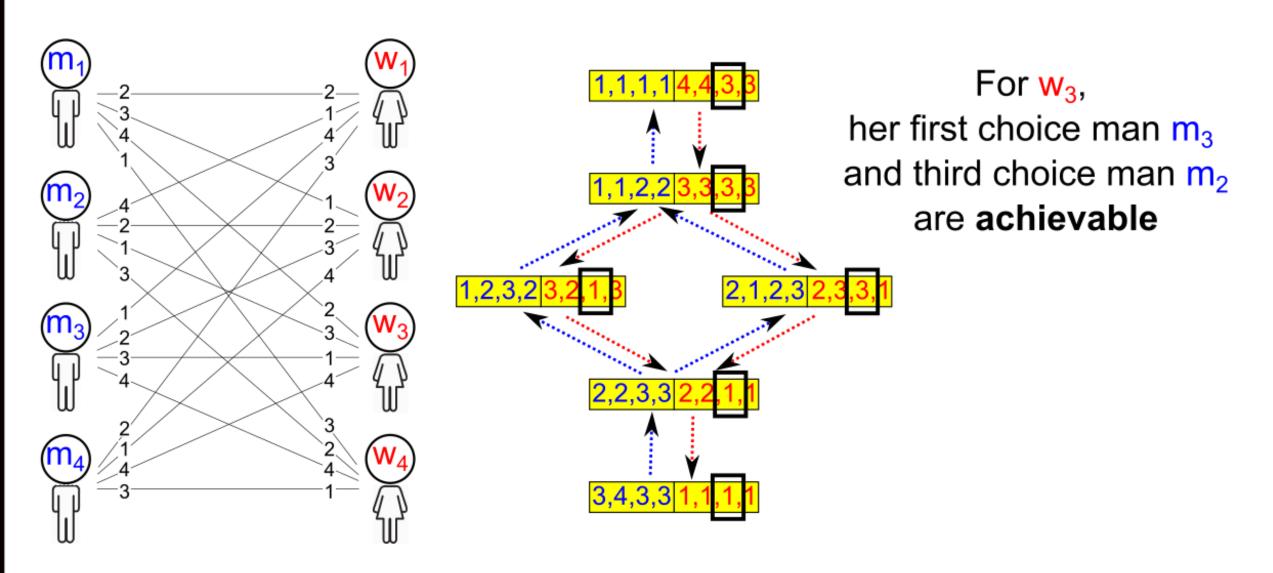
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Strict preferences ⇒

Each man/woman has exactly one favorite achievable woman/man

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### Define:

Men-optimal mapping: Each man points to his favorite achievable woman Women-optimal mapping: Each woman points to her favorite achievable man

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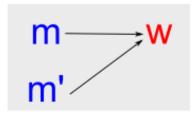
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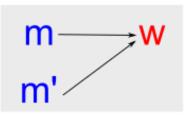
We will show that men/women-optimal mappings are one-to-one.

Suppose not. Then two men m and m' must map to the same woman w.

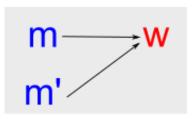


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Suppose w prefers m over m'.



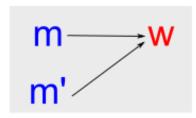
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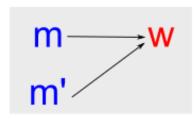


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In P, m must be matched to a woman he likes *less* than w (because w is m's favorite achievable woman).

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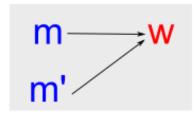
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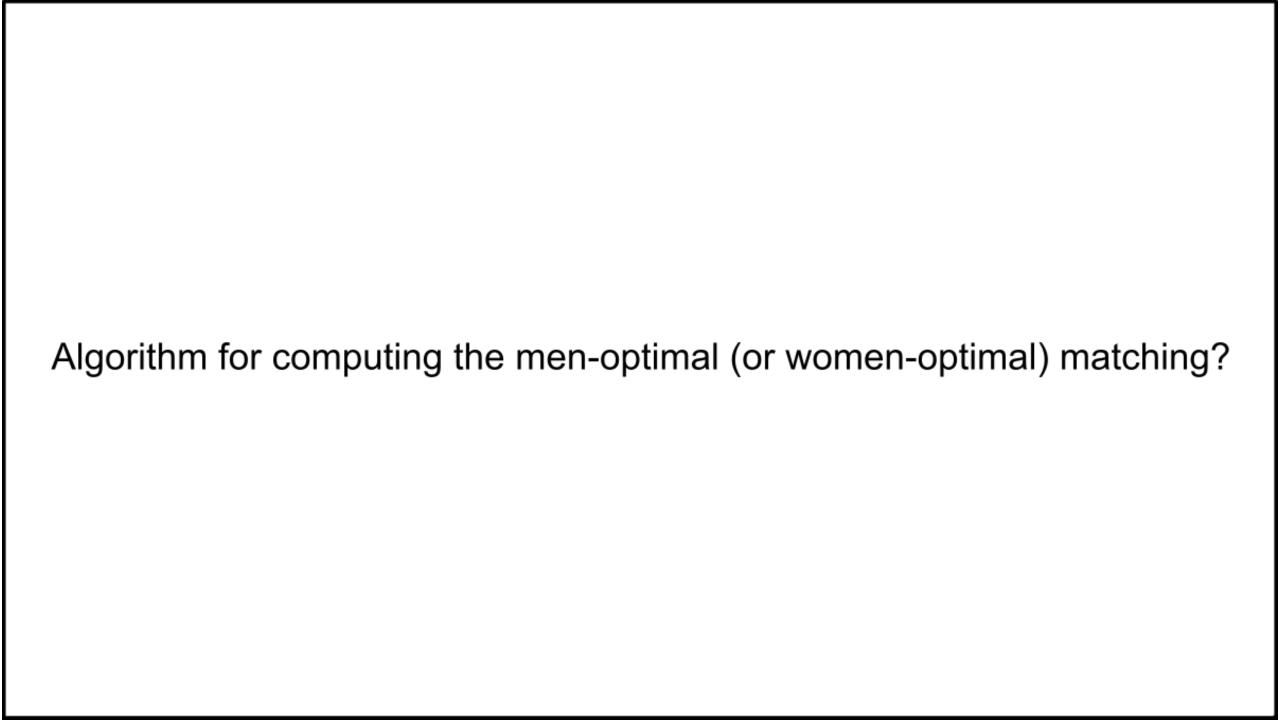


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Then, w must have received a better proposal from some other man m'.

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When m' proposes to w, his past rejections (if any) must all have been from women that are *unachievable* for him.

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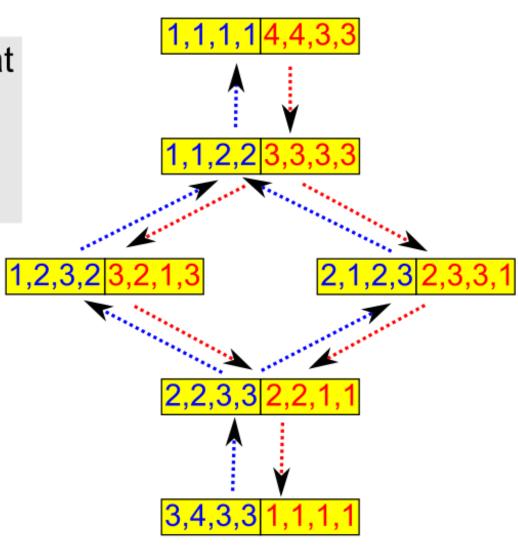
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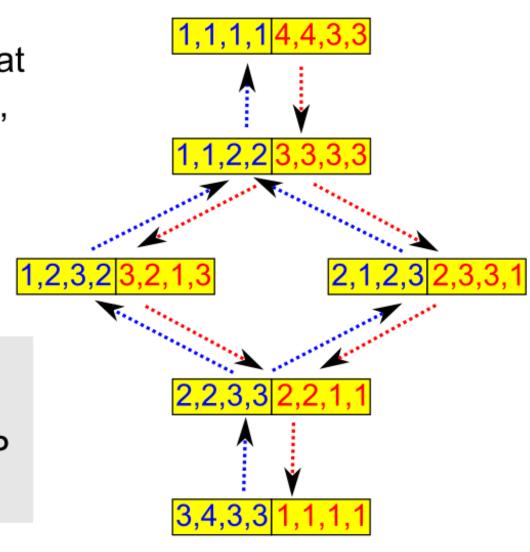
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[Knuth, 1975 (Lectures) → 1976 (French) → 1997 (English)]

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### As a consequence:

The men-optimal stable matching is the worst stable matching for all women. The women-optimal stable matching is the worst stable matching for all men.

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Then, m prefers w over w', and w prefers m over her Q-partner.

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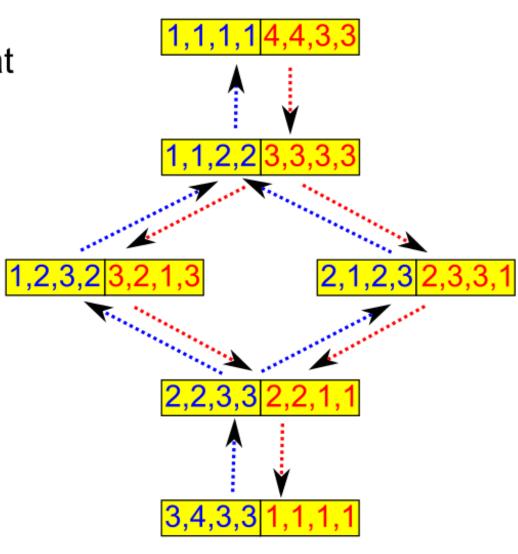
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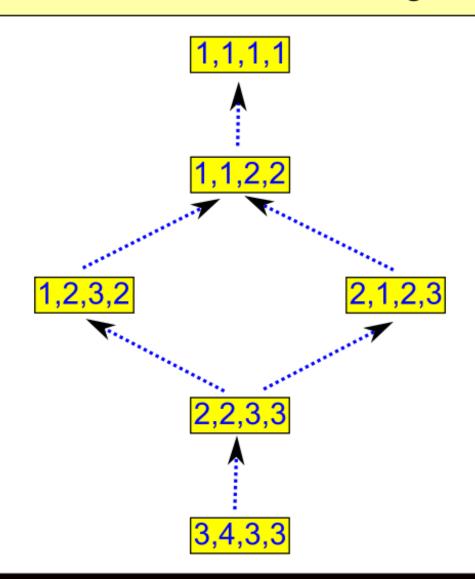


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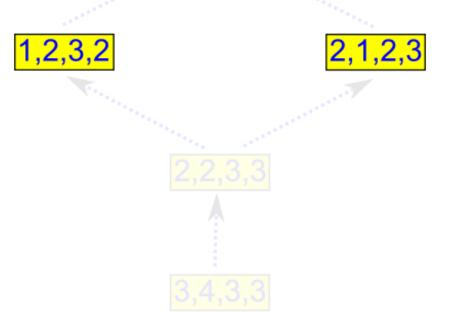


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1,1,1,1

When there isn't a consensus among men/women w.r.t. two matchings, can we still say something useful?



Recall that when each man points to his favorite achievable woman, we get the men-optimal matching.

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Let's generalize this idea to arbitrary pairs of stable matchings.

Let P and Q be any pair of stable matchings (not necessarily distinct).

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$$\max_{P,Q}(m) = \begin{bmatrix} P(m) \text{ if } m \text{ prefers } P(m) \text{ over } Q(m) \\ Q(m) \text{ otherwise} \end{bmatrix}$$

$$\max_{P,Q}(w) = \begin{bmatrix} Q(w) \text{ if } w \text{ prefers } P(w) \text{ over } Q(w) \\ P(w) \text{ otherwise} \end{bmatrix}$$

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P: **m**----w

Q: m----\

m' / W'

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From "⇒" direction, if a man points to a woman, she points back at him. Therefore, each man must point to a **unique** woman (who must point back at him).

Proof follows by observing that there are an equal number of men and women.

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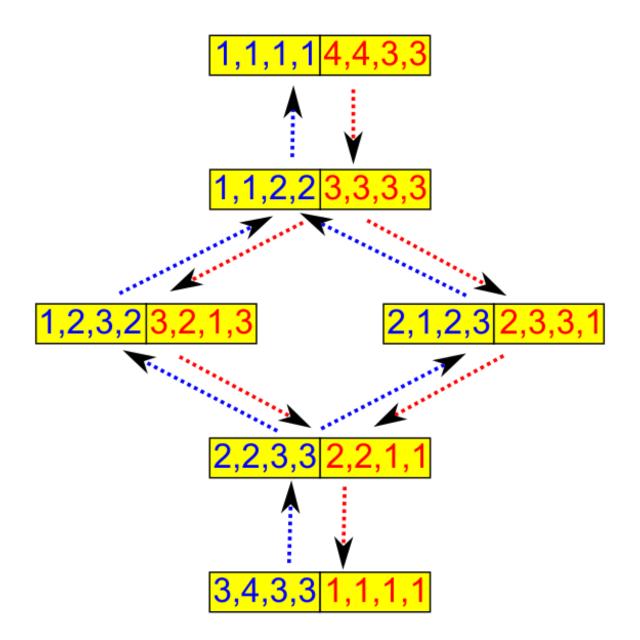
# Define a *mapping* min<sub>P,Q</sub> that maps:

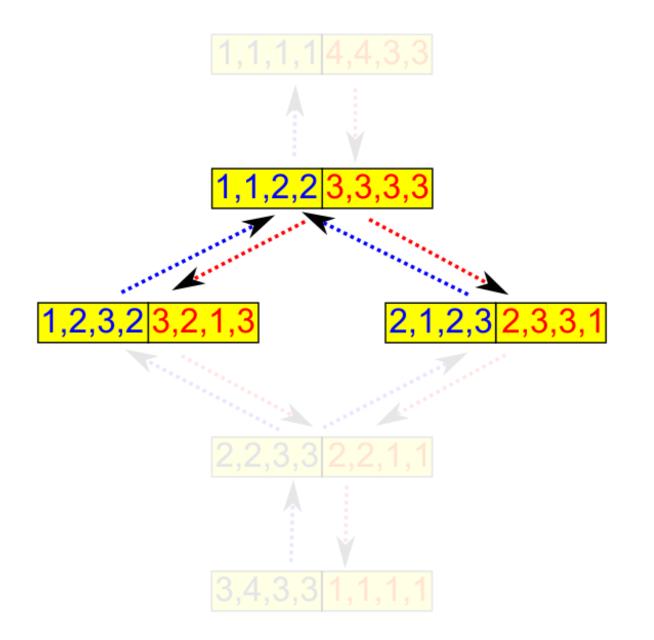
- (a) each man to his less preferred partner between P and Q
- (b) each woman to her more preferred partner between P and Q

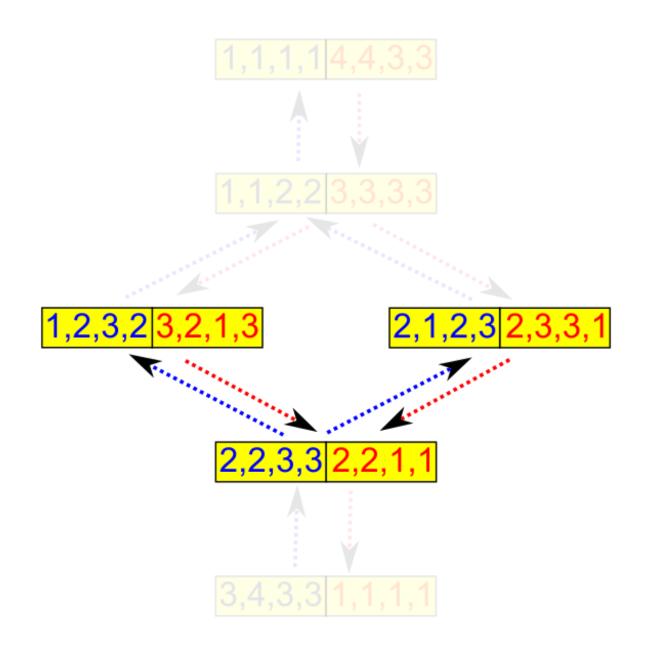
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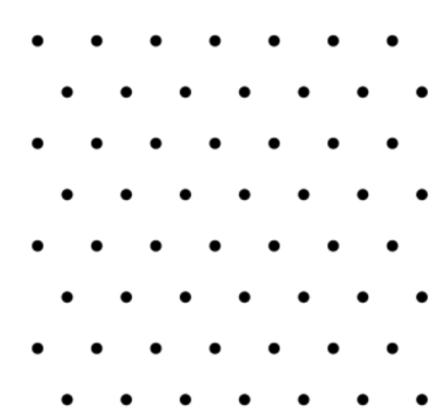




The mappings  $\max_{P,Q}$  and  $\min_{P,Q}$  induce stable matchings.

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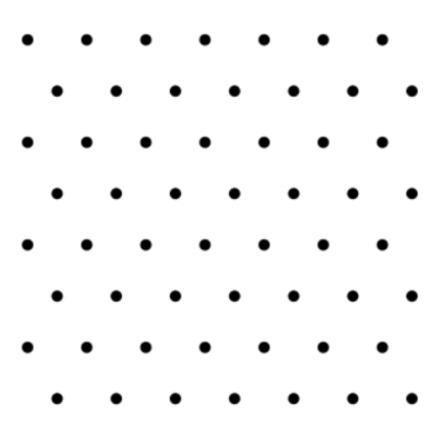
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### Consequences:

 Existence of men/women-optimal and men/women-pessimal matchings.

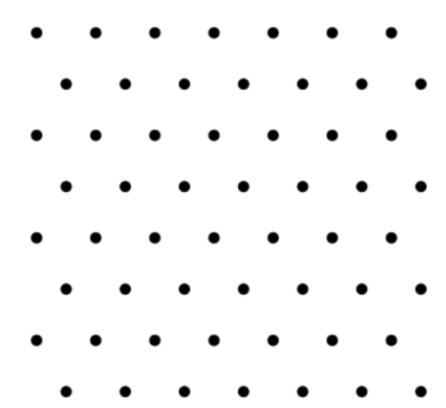


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 For a model with "unacceptable" pairs, the set of matched agents is the same in all stable matchings.



#### The Lattice Theorem

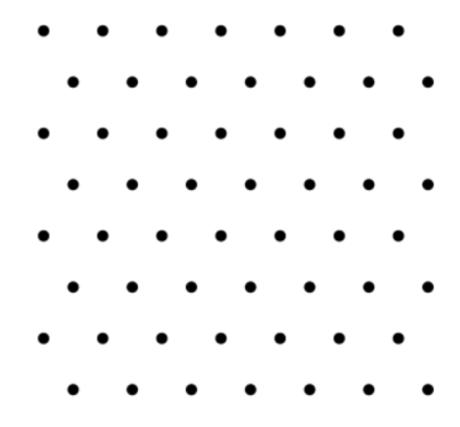
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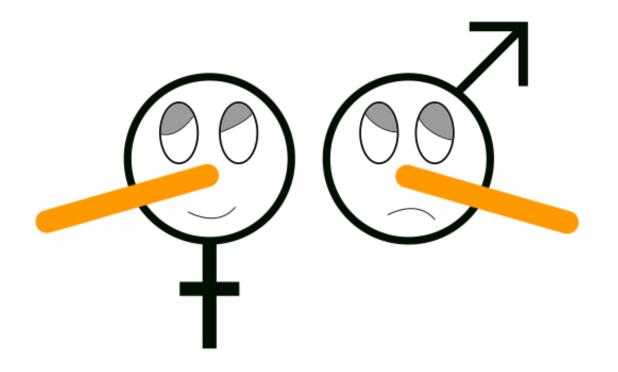
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The Rural Hospitals Theorem



### **Next Time**

Incentives in the Stable Matching Problem





## Quiz

Prove that an instance has a unique stable matching if and only if the men-optimal and women-optimal matchings are the same.

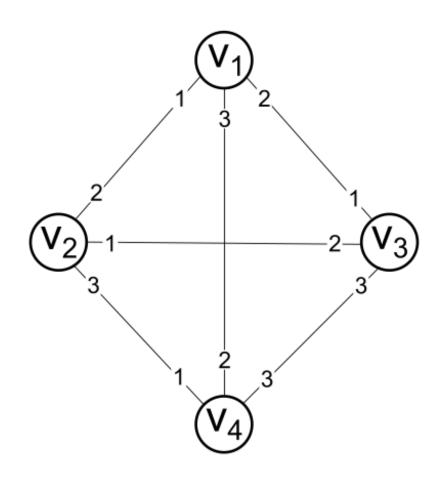
### References

Structure of the Set of Stable Matchings

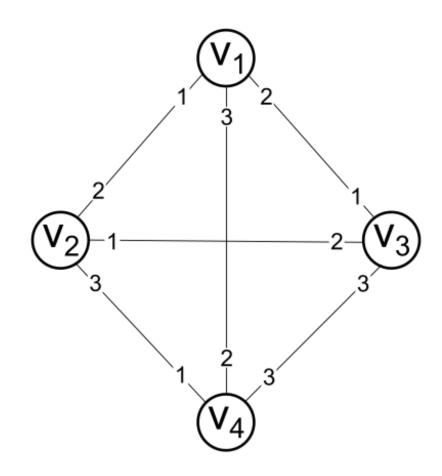
Alvin Roth and Marilda Sotomayor "Two-Sided Matching: A Study in Game-Theoretic Modeling and Analysis" Econometric Society Monograph Series, 1990

[Gale and Shapley, 1962]

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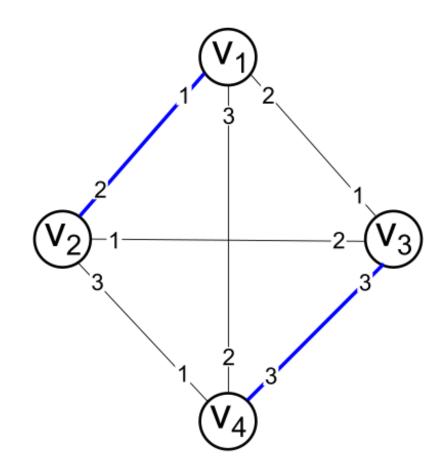


[Gale and Shapley, 1962]



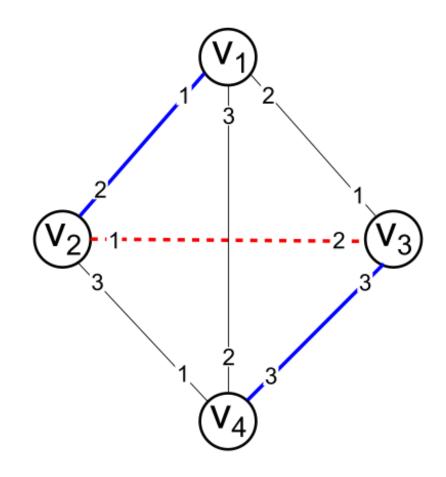
A matching is stable is there is no blocking pair of vertices that prefer each other over their assigned partners ("self-partnered" if unmatched).

[Gale and Shapley, 1962]



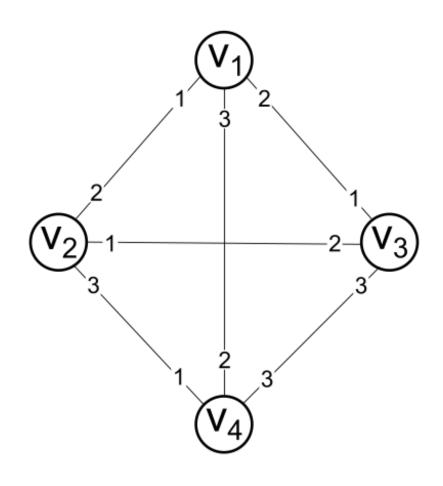
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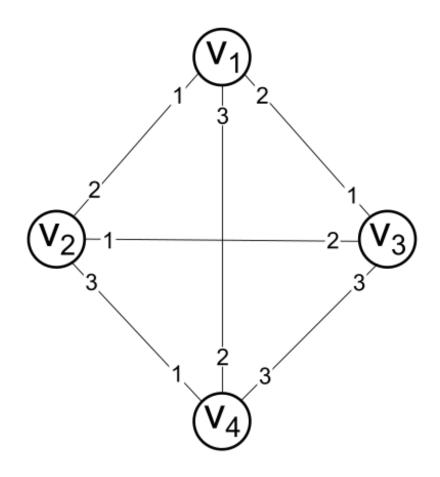


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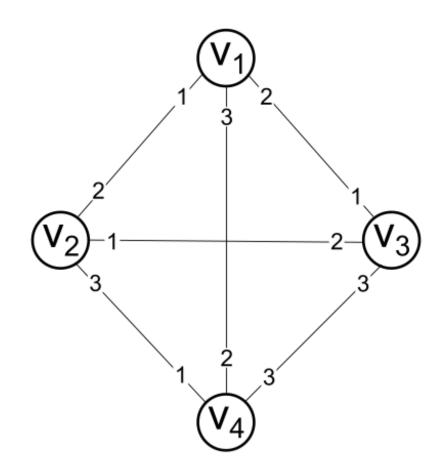


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There is no stable matching in the above instance.

[Gale and Shapley, 1962]



There is no stable matching in the above instance. Whoever is matched with  $v_4$  will block with one of the other two agents.