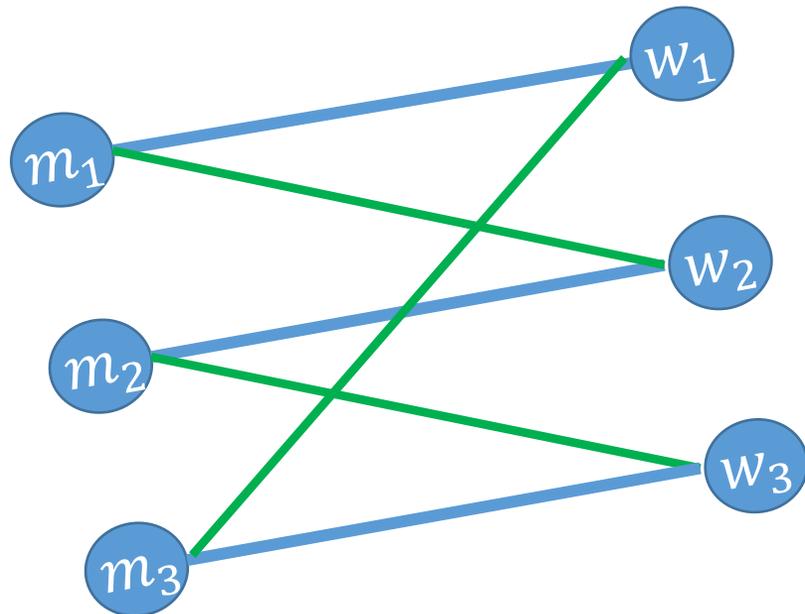


# A Simply Exponential Upper Bound on the Maximum Number of Stable Matchings

Robbie Weber

Joint work with Anna Karlin and Shayan Oveis Gharan



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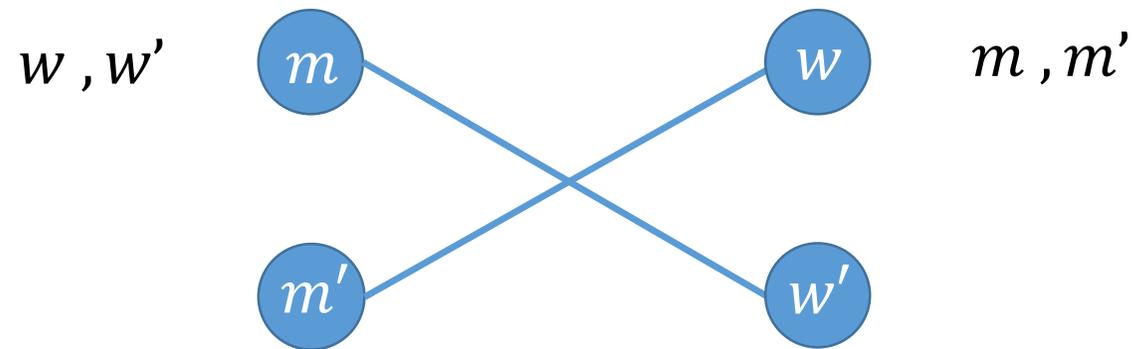


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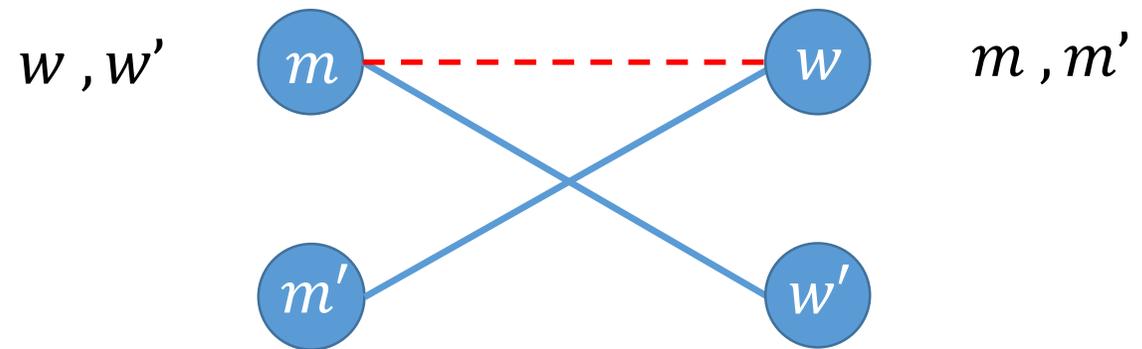


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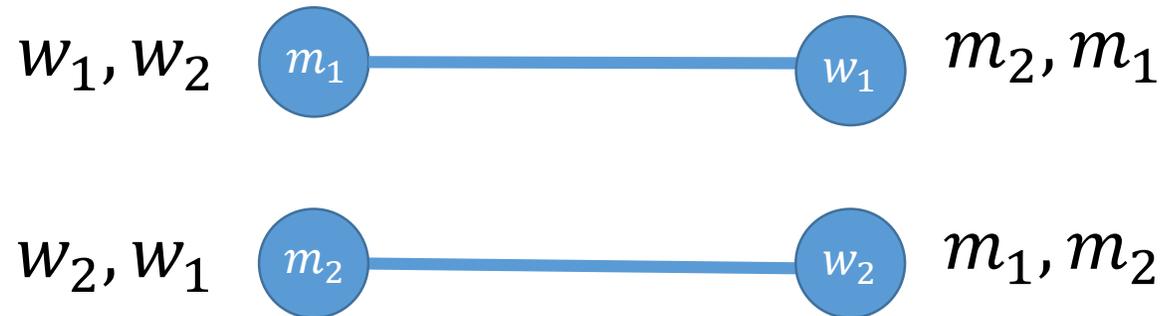
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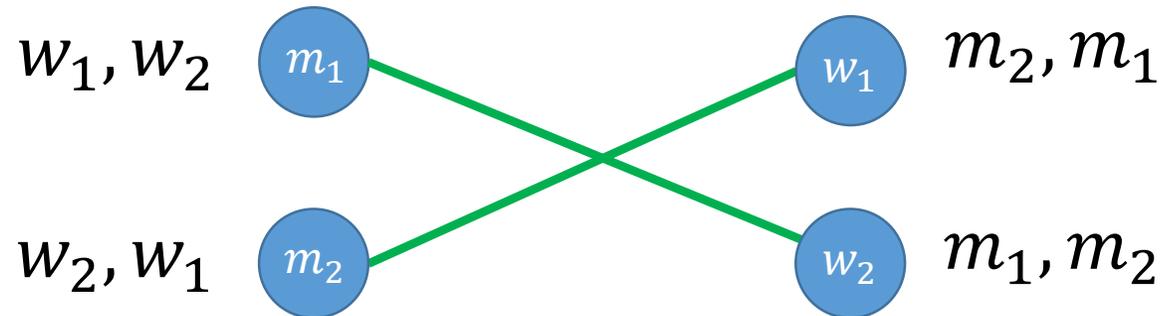
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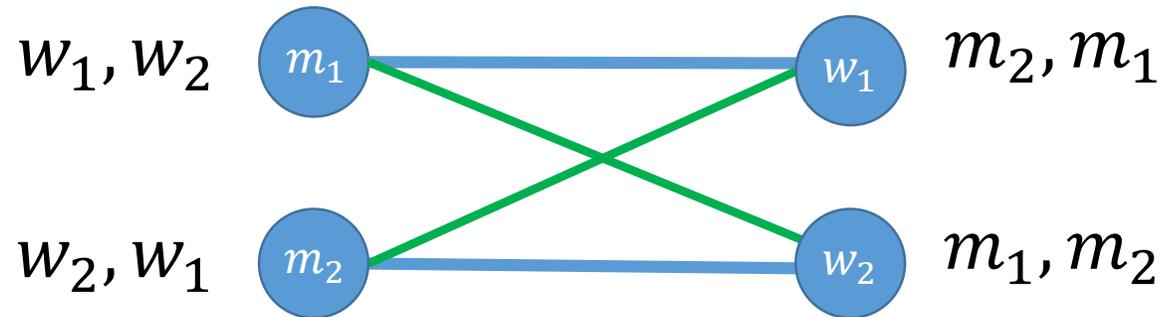
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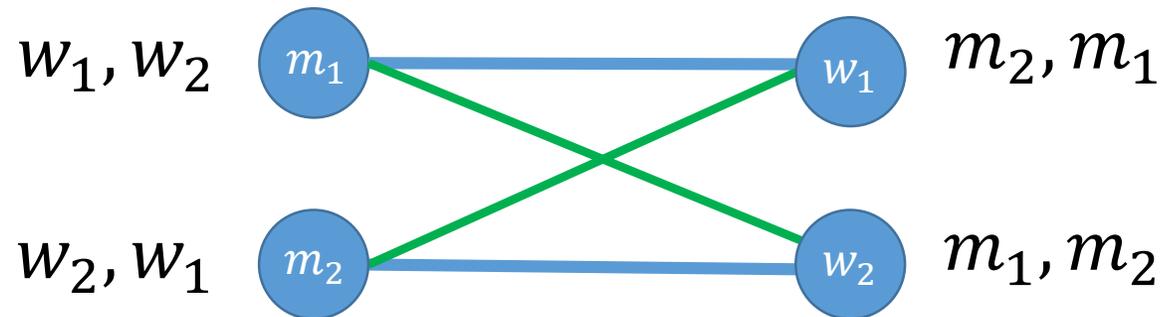
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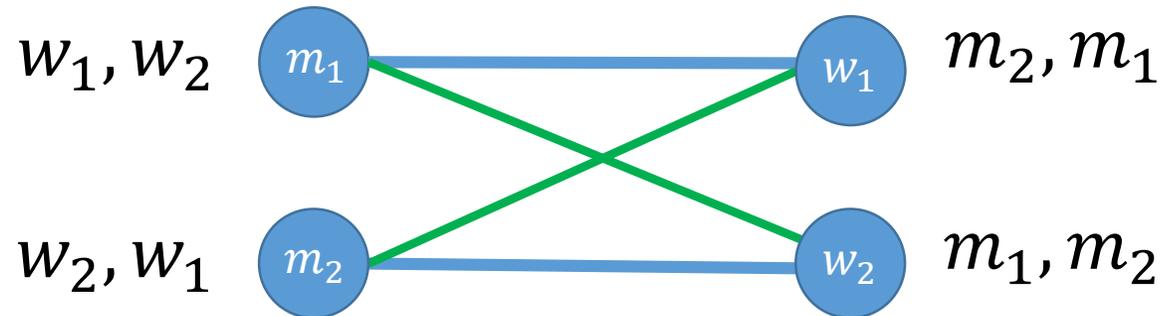
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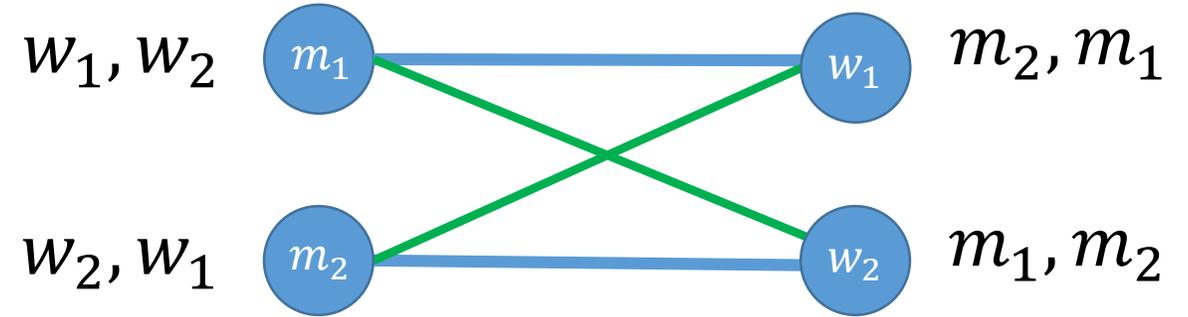
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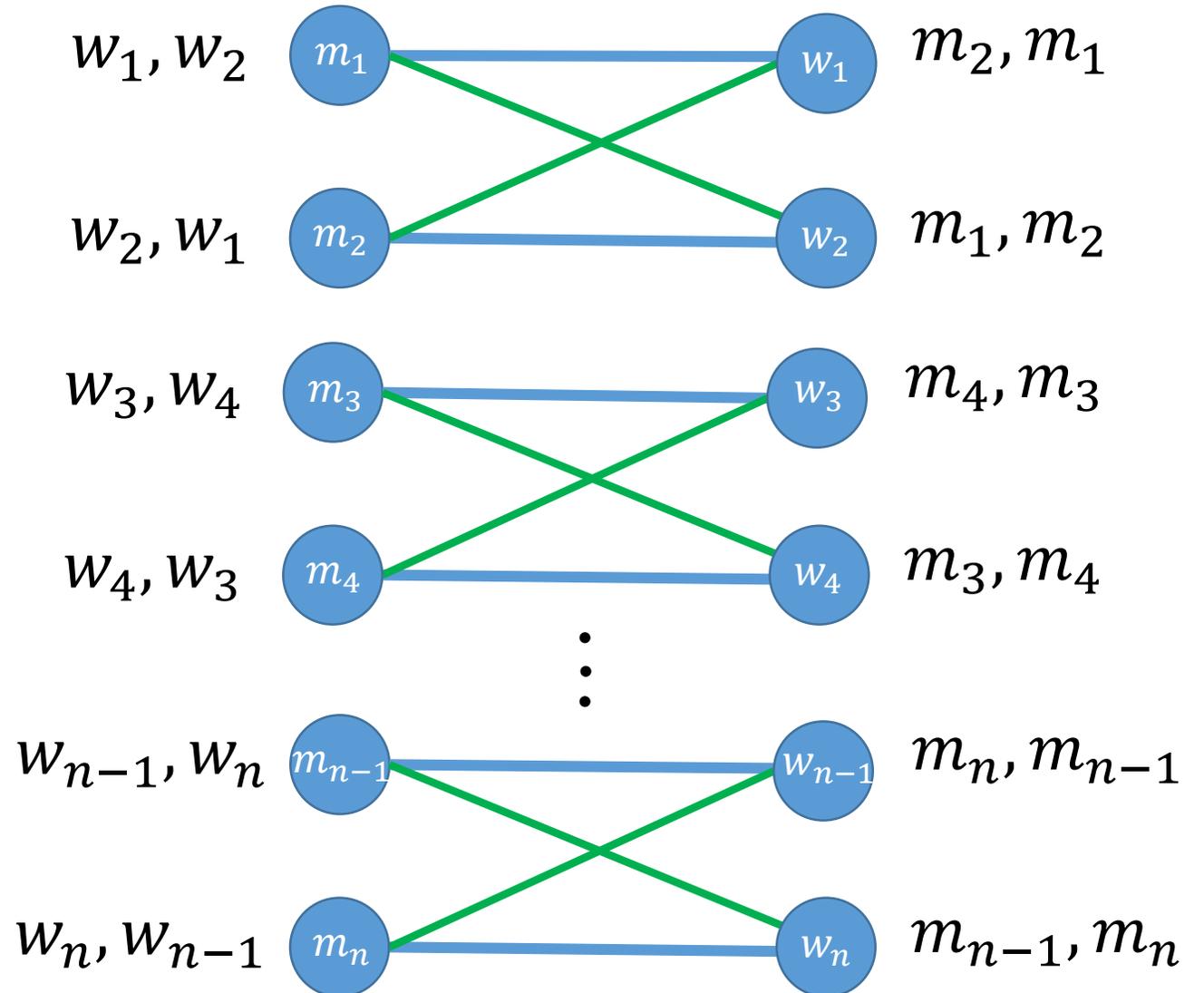
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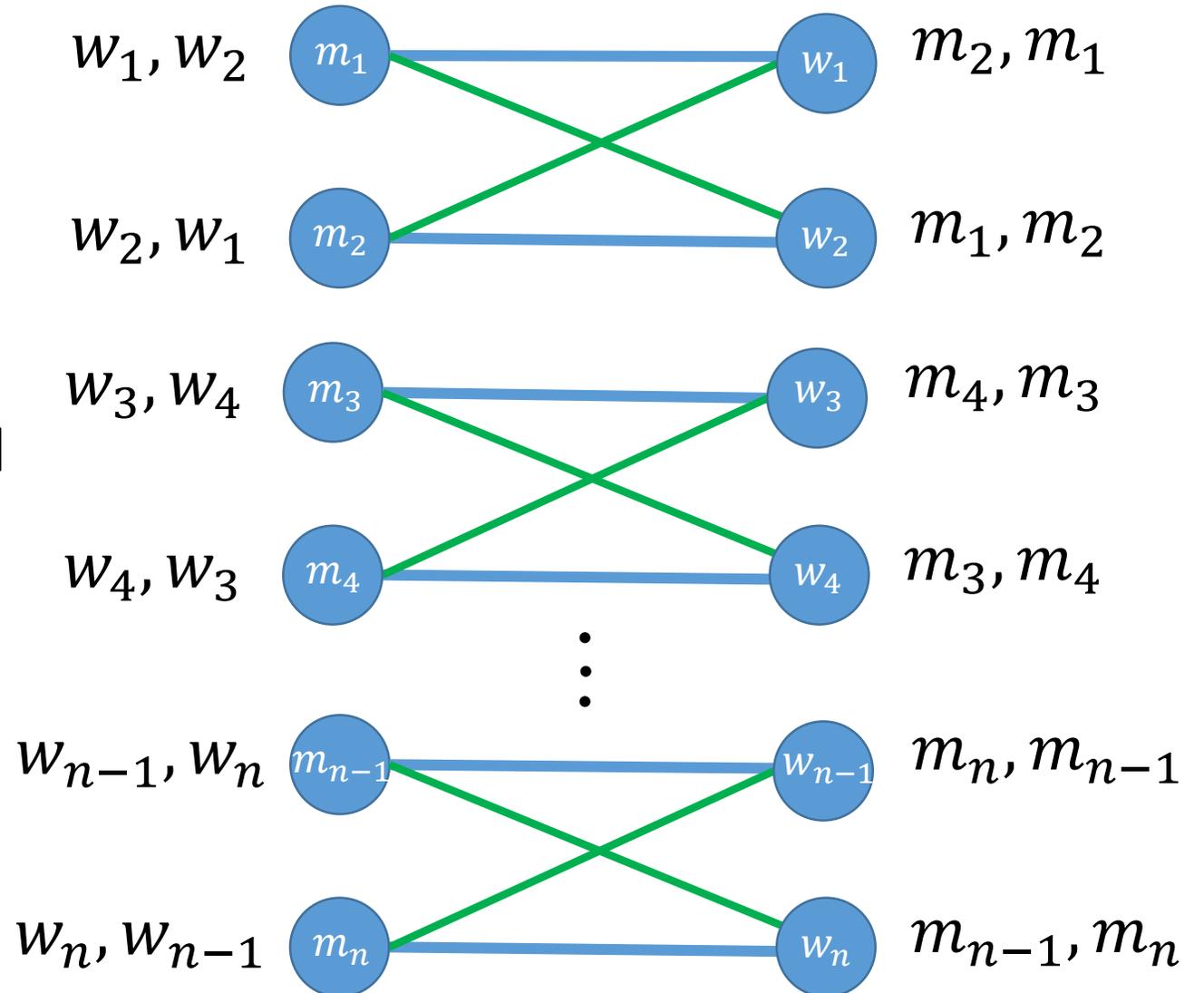


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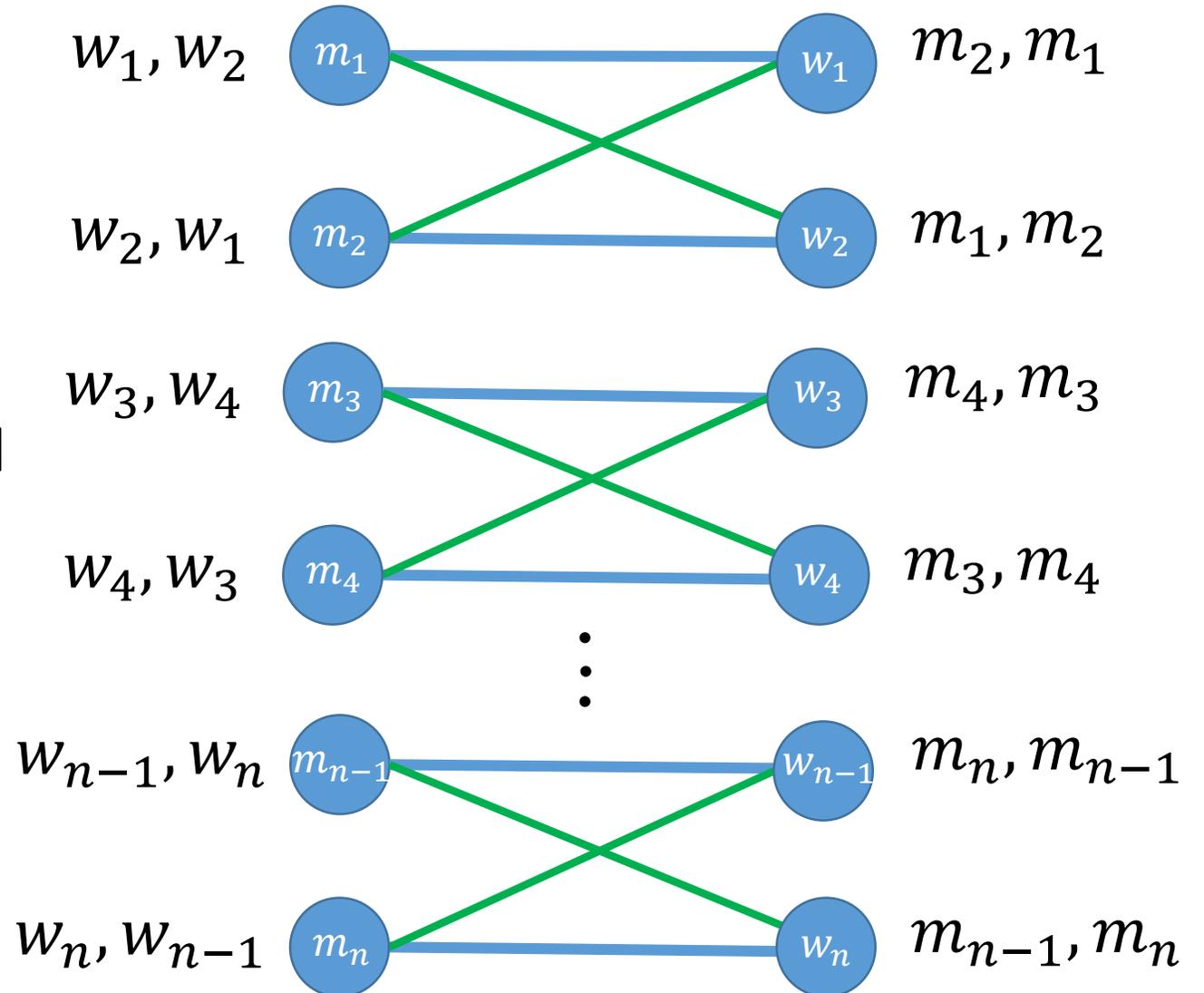
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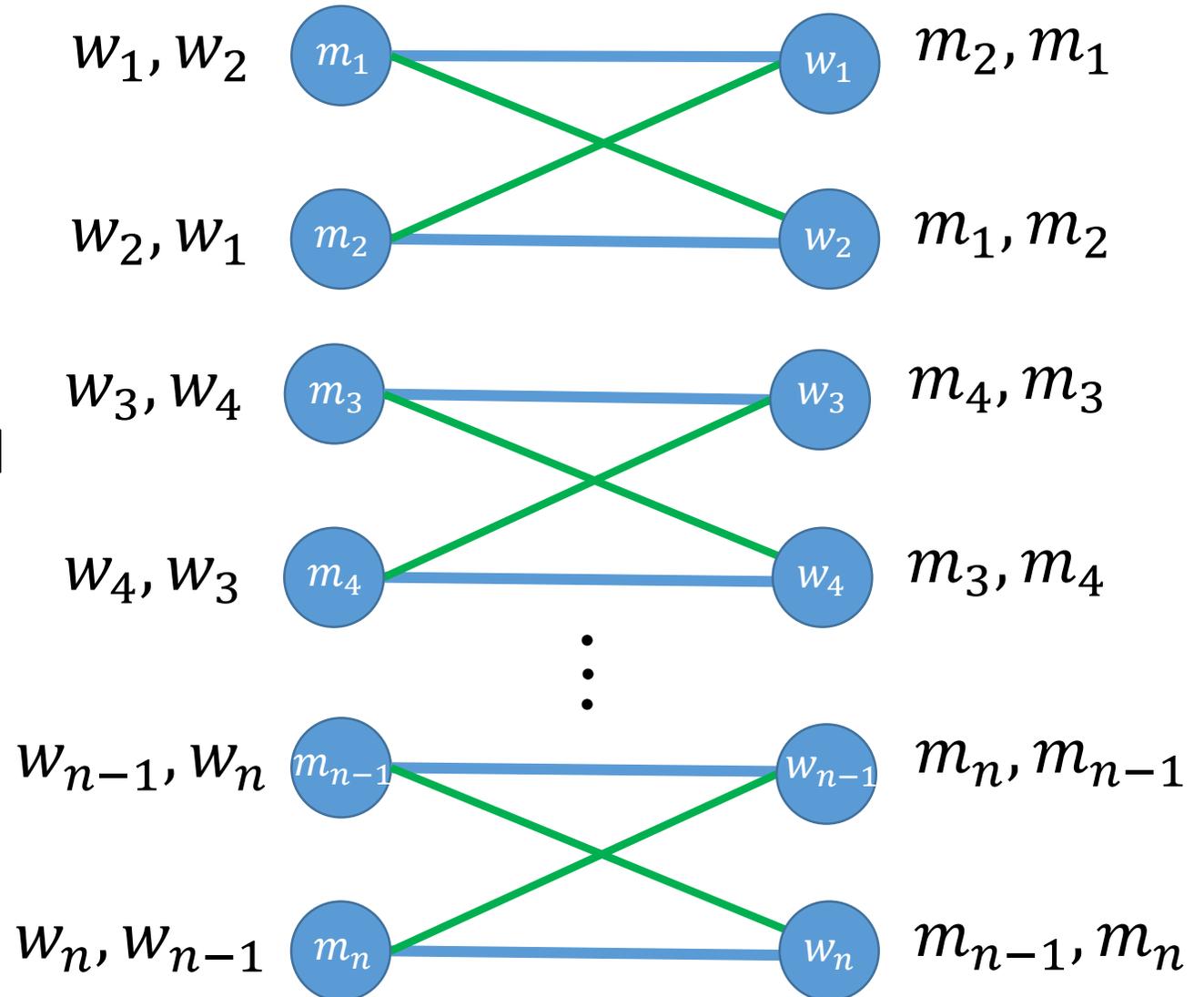
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$\leq n!/c^n$  [Stathopoulos'11]



# Main Result

There is a universal constant  $C$  such that every stable matching instance with  $n$  men and  $n$  women has  $\leq C^n$  stable matchings.

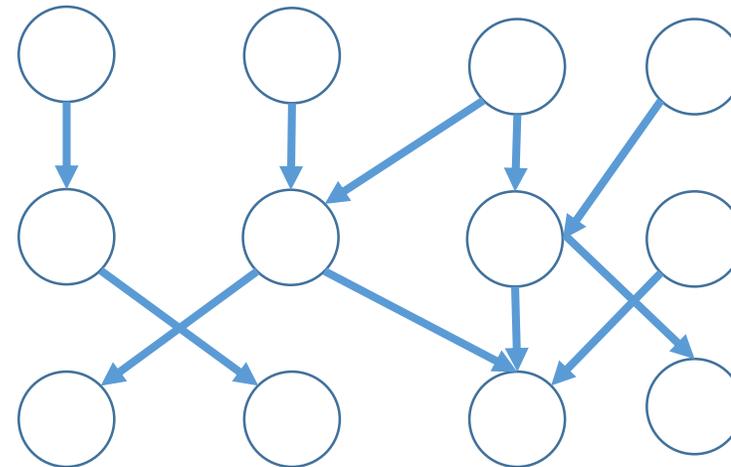
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**Step 1** [Irving Leather 86]: The number of stable matchings equals the number of downsets of a certain POSET.

**POSET:** A set with a transitive antisymmetric relation  $<$ , i.e., a DAG

$u$  dominates  $v$  if  $v < u$ .

**Downset:** a set of elements, and everything they dominate.



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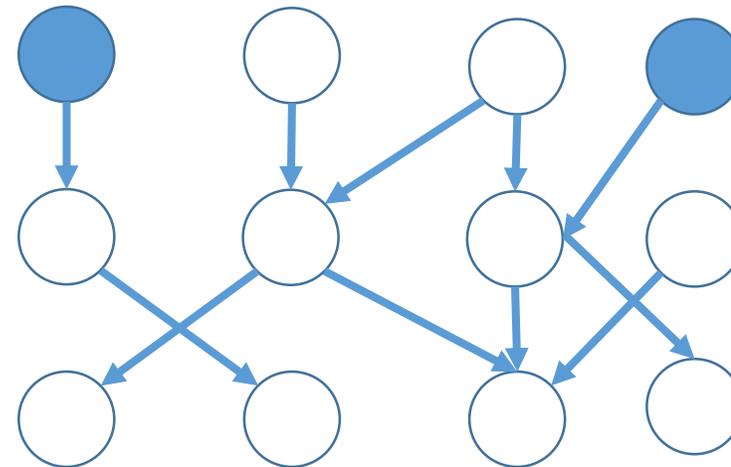
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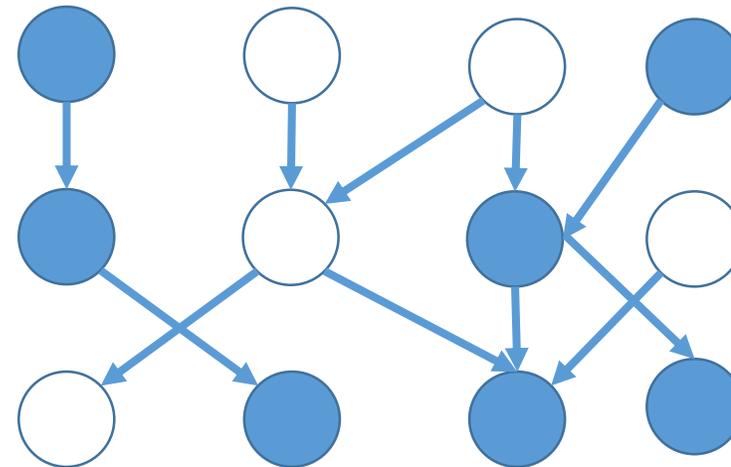
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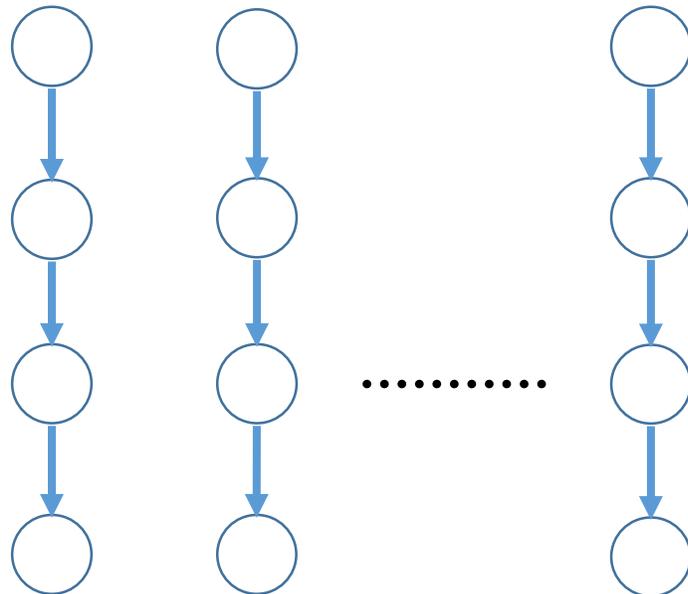
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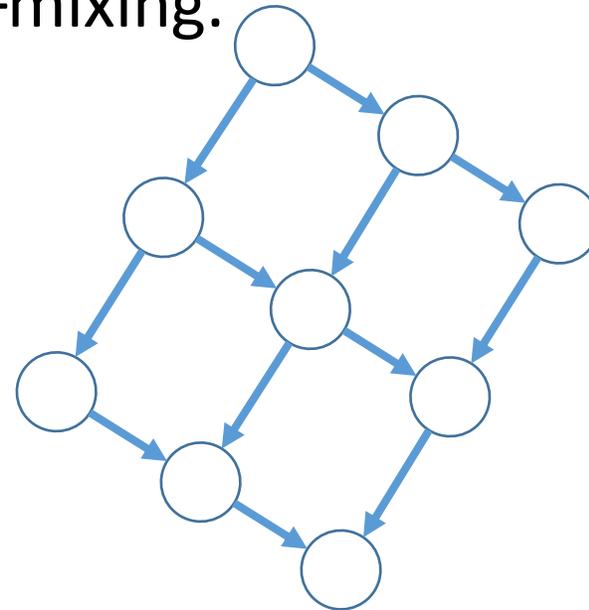
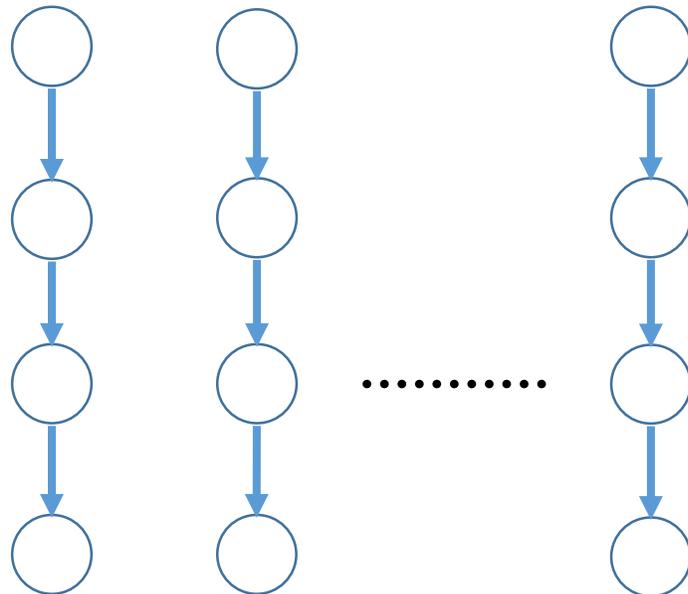
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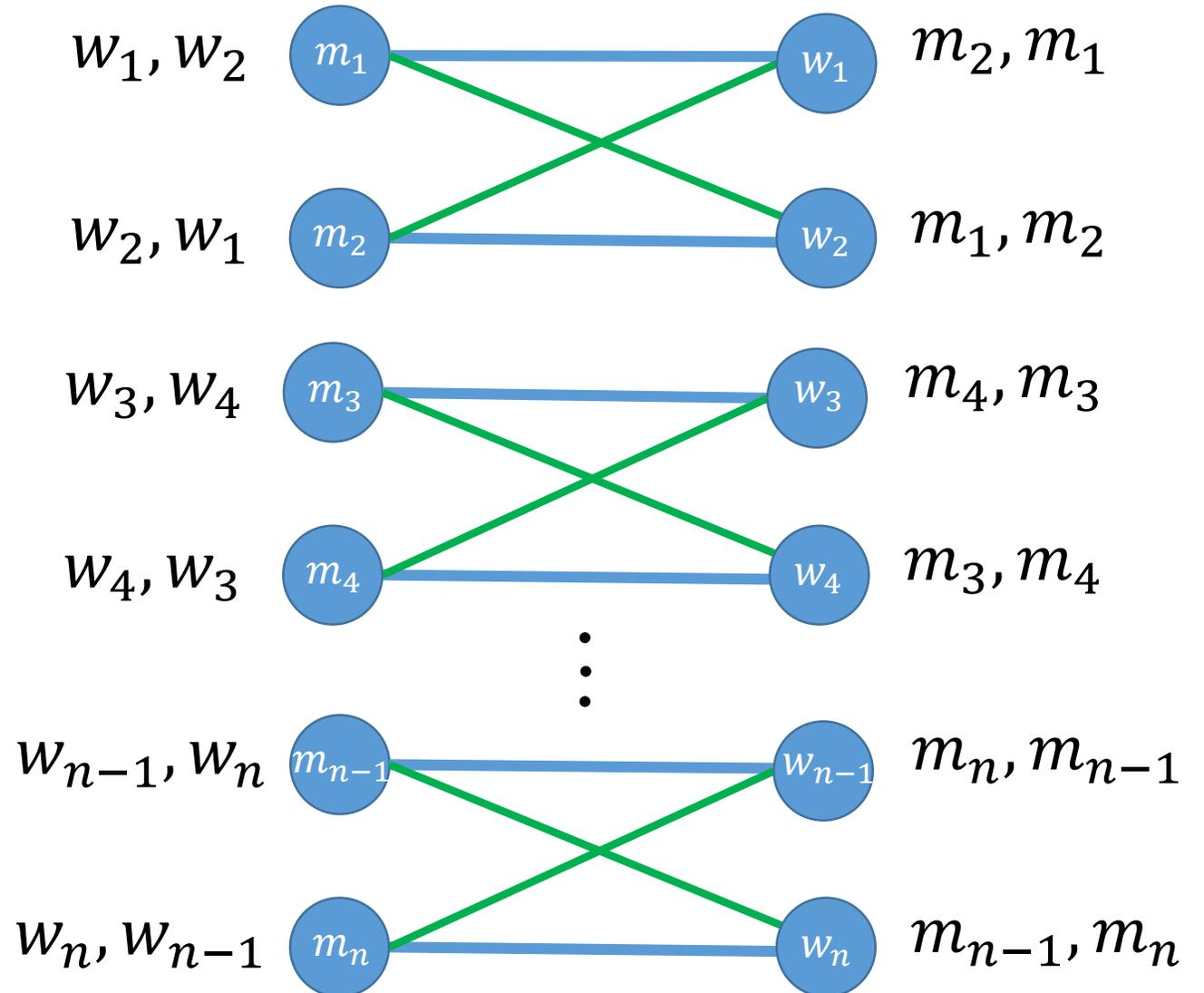
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There can be exponentially many stable matchings

But there are only polynomially many "simple transformations" to jump from one stable matching to another.

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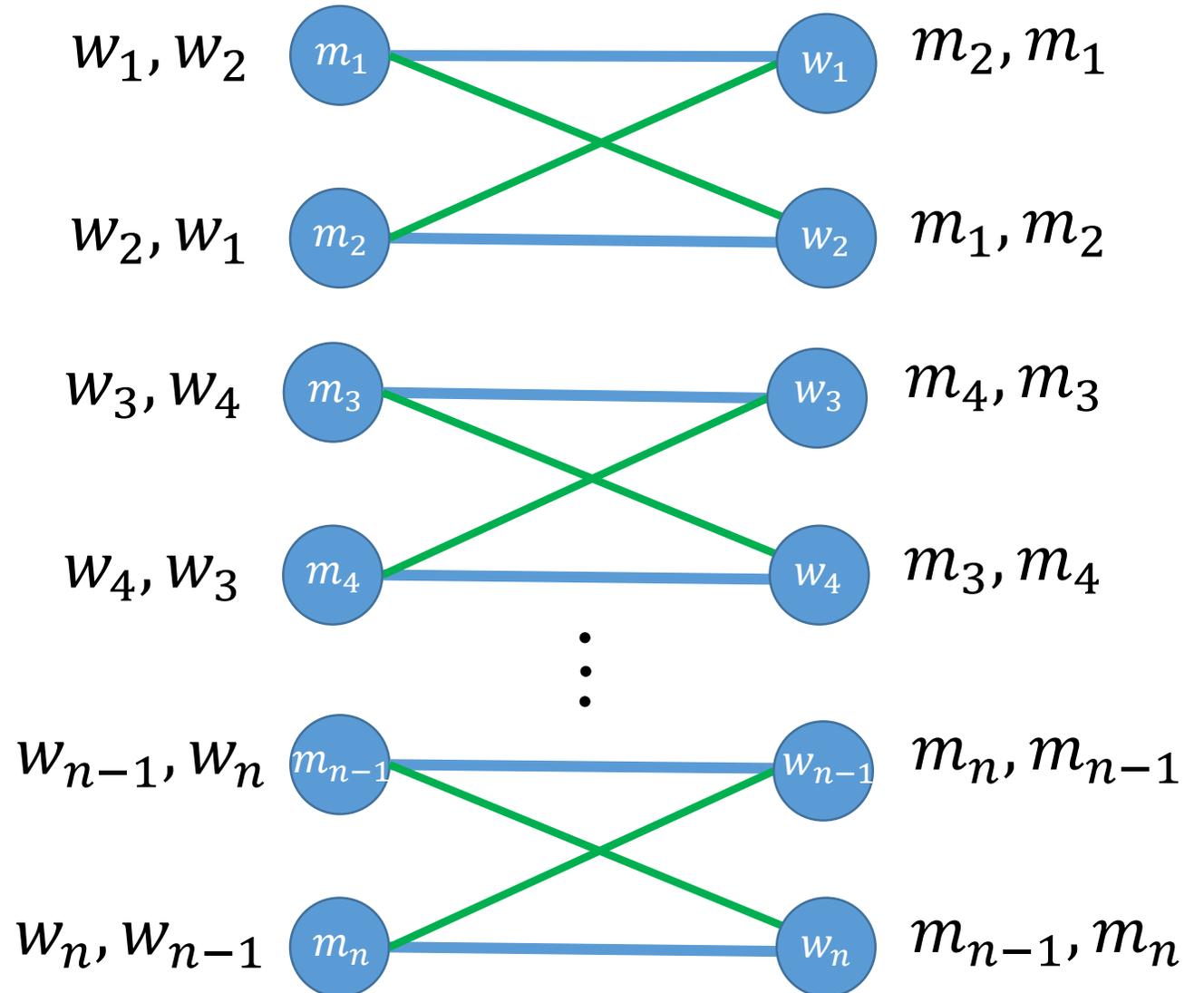
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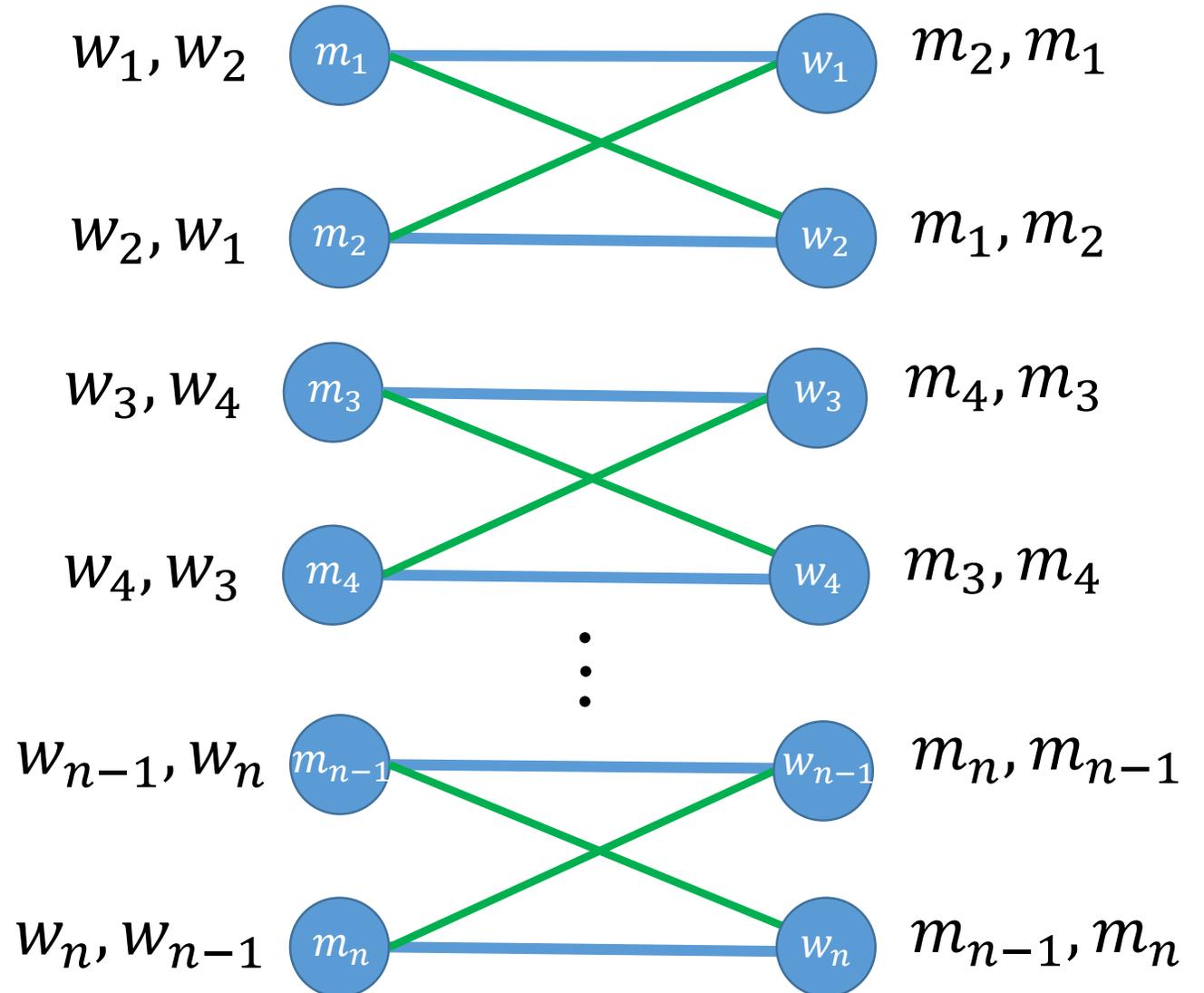
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(Switching from the blue matching to the green matching in some pair)



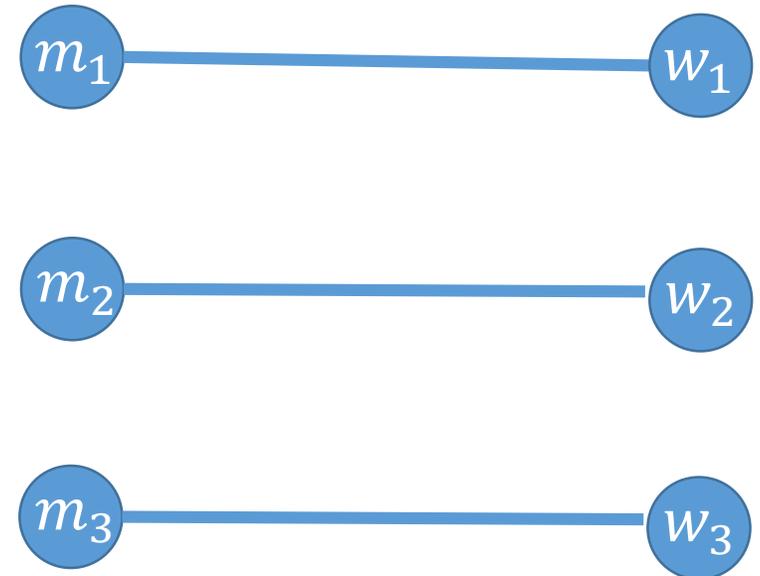
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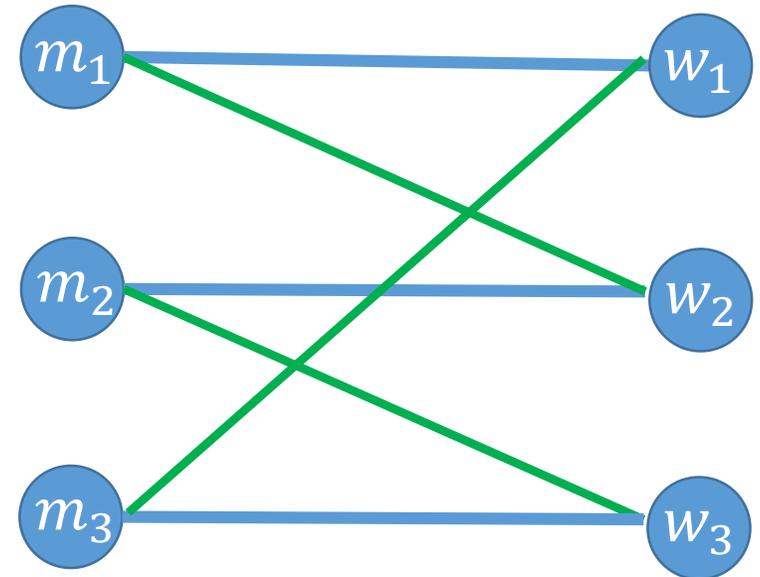
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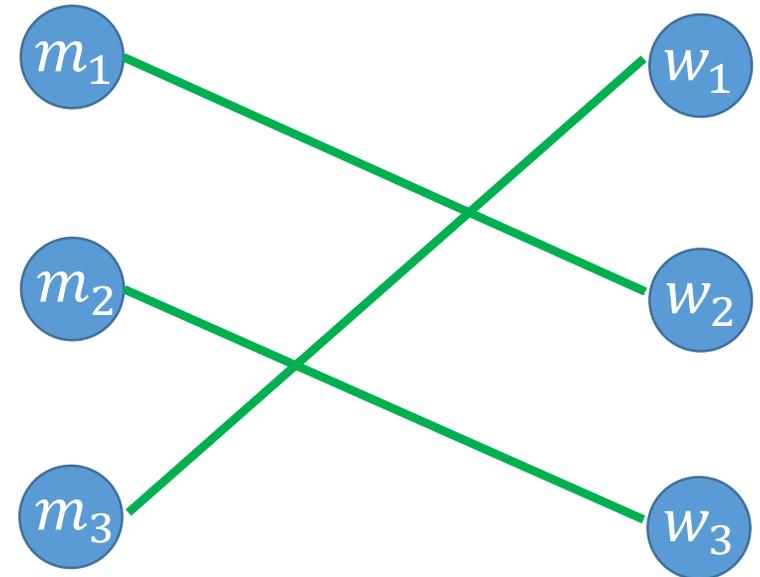
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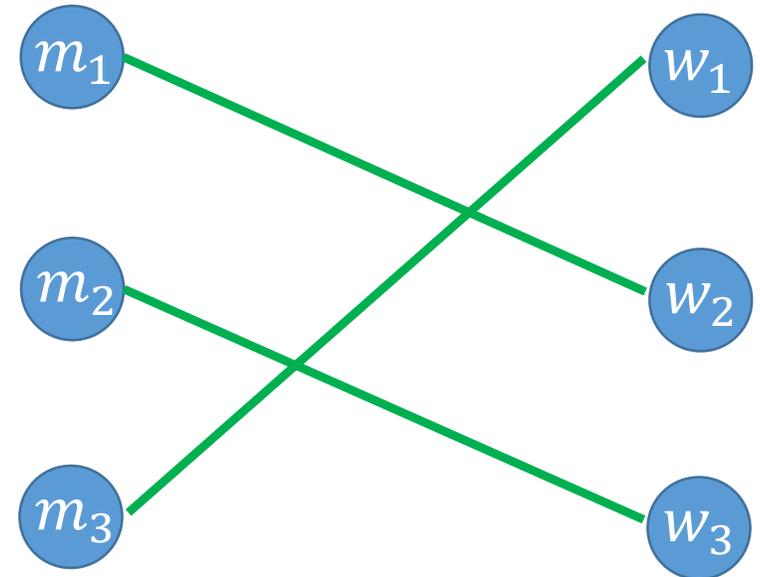
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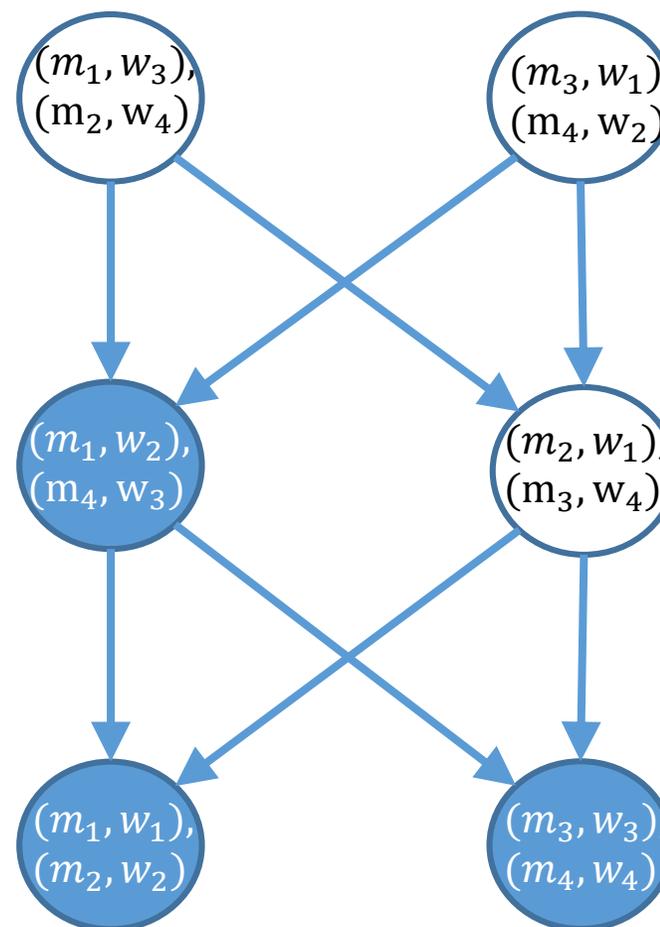
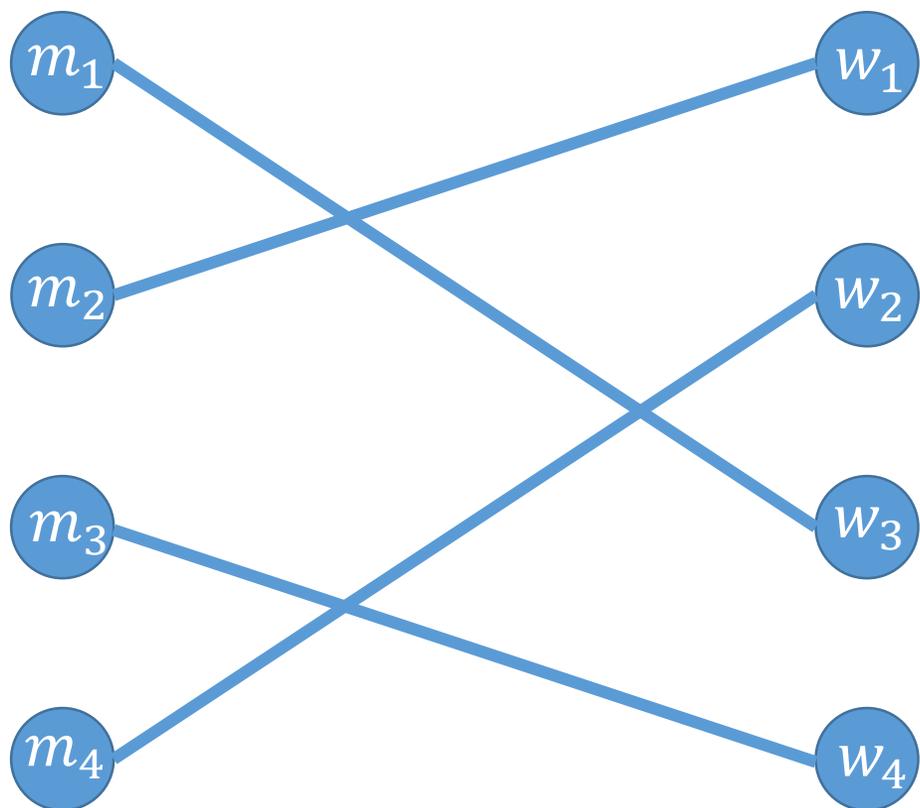
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Observation: All rotations with an agent form a directed path.

[Irving-Leather 86]

#Stable Matchings = #Downsets Rotation POSET



# Proof Outline

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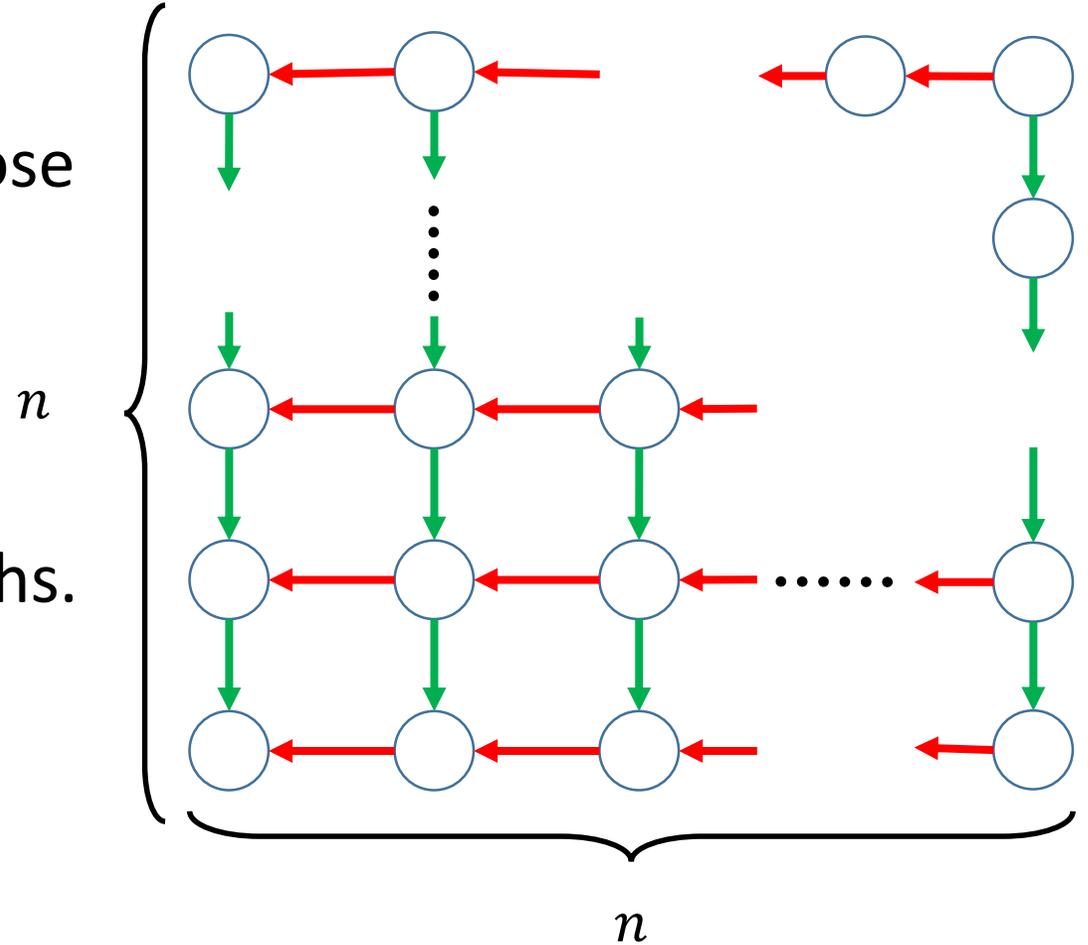
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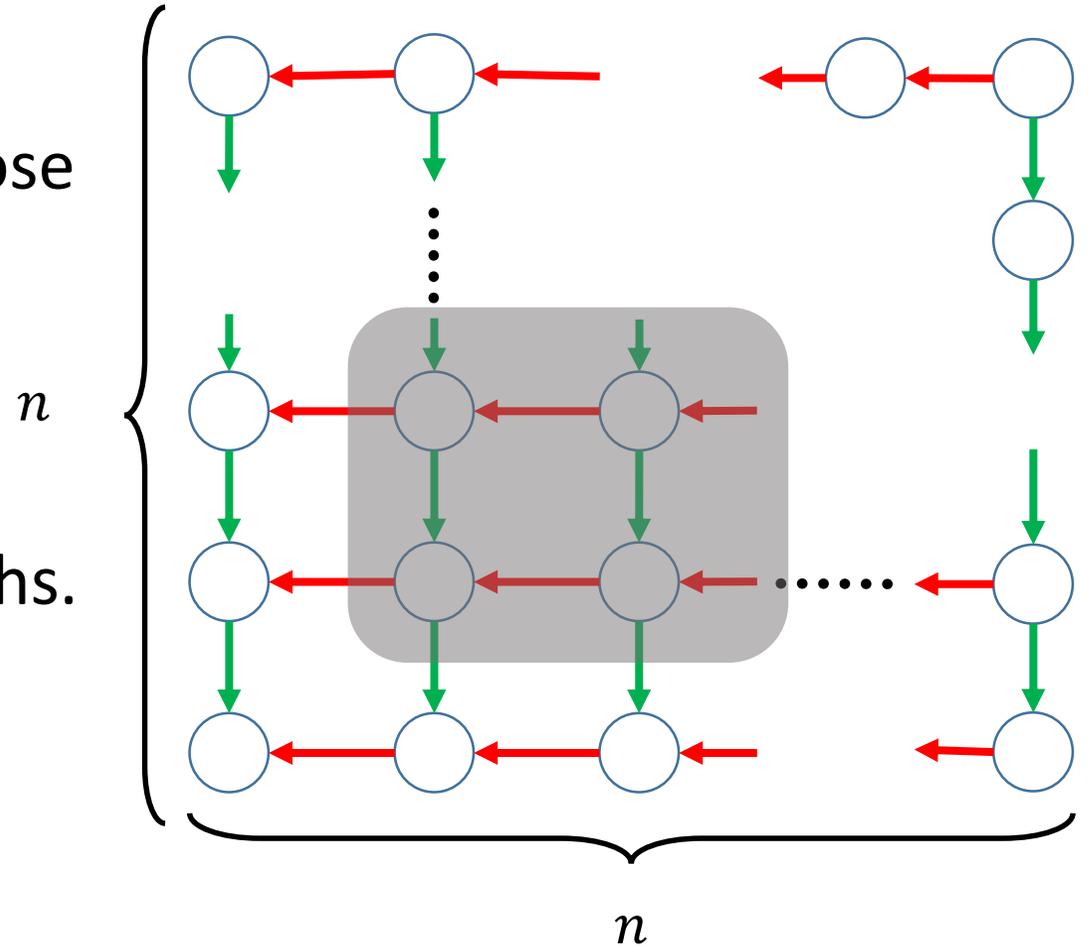
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- They mix!
  - 1) Every rotation contains a new (man, woman) pair.
  - 2) We need at least  $\sqrt{r}$  men and or women to make  $r$  new pairs.  
Thus  $r$  rotations must intersect at least  $\sqrt{r}$  paths.

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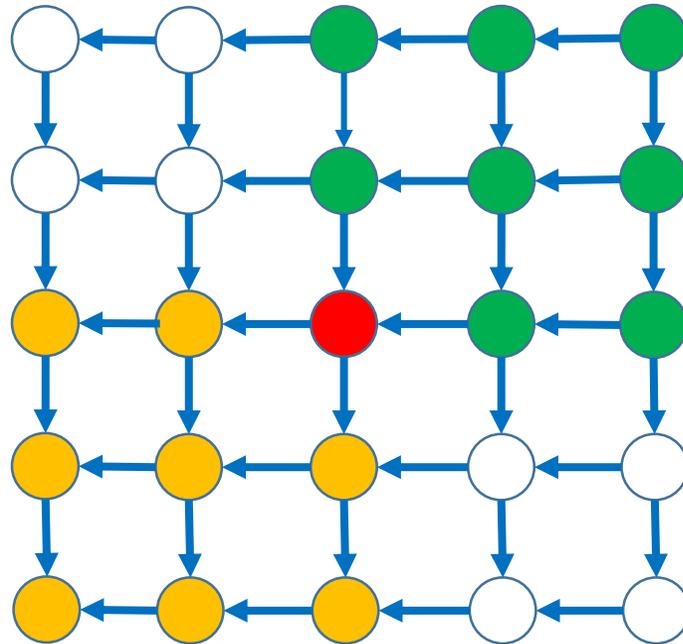
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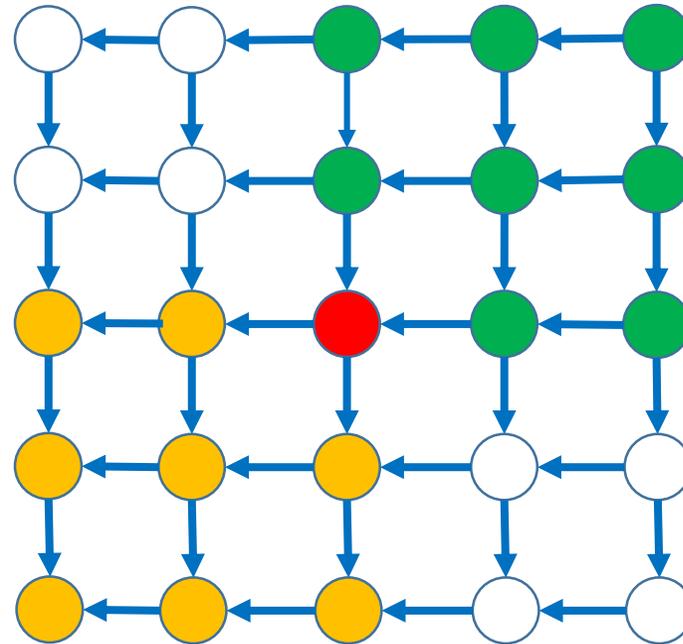
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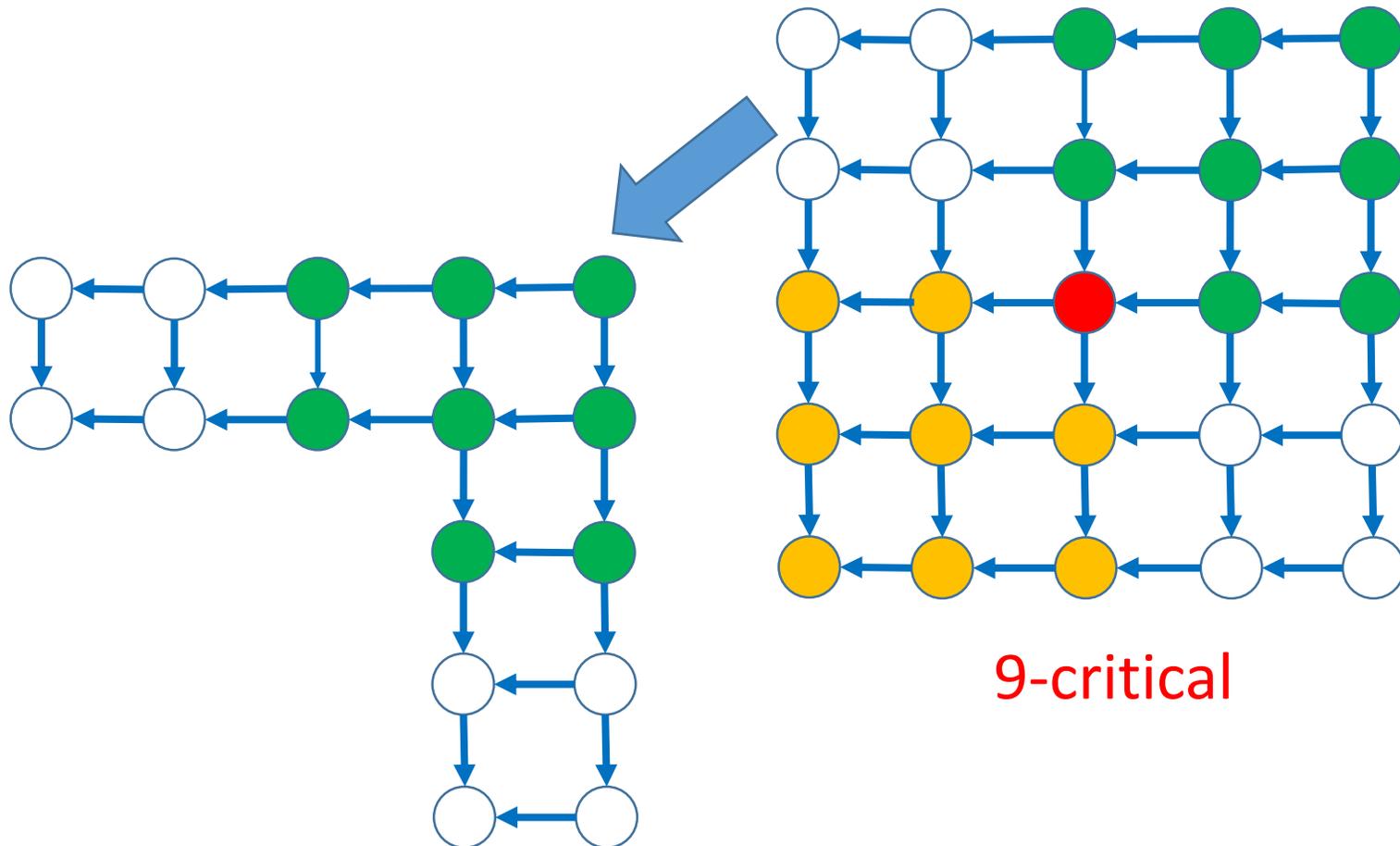


9-critical

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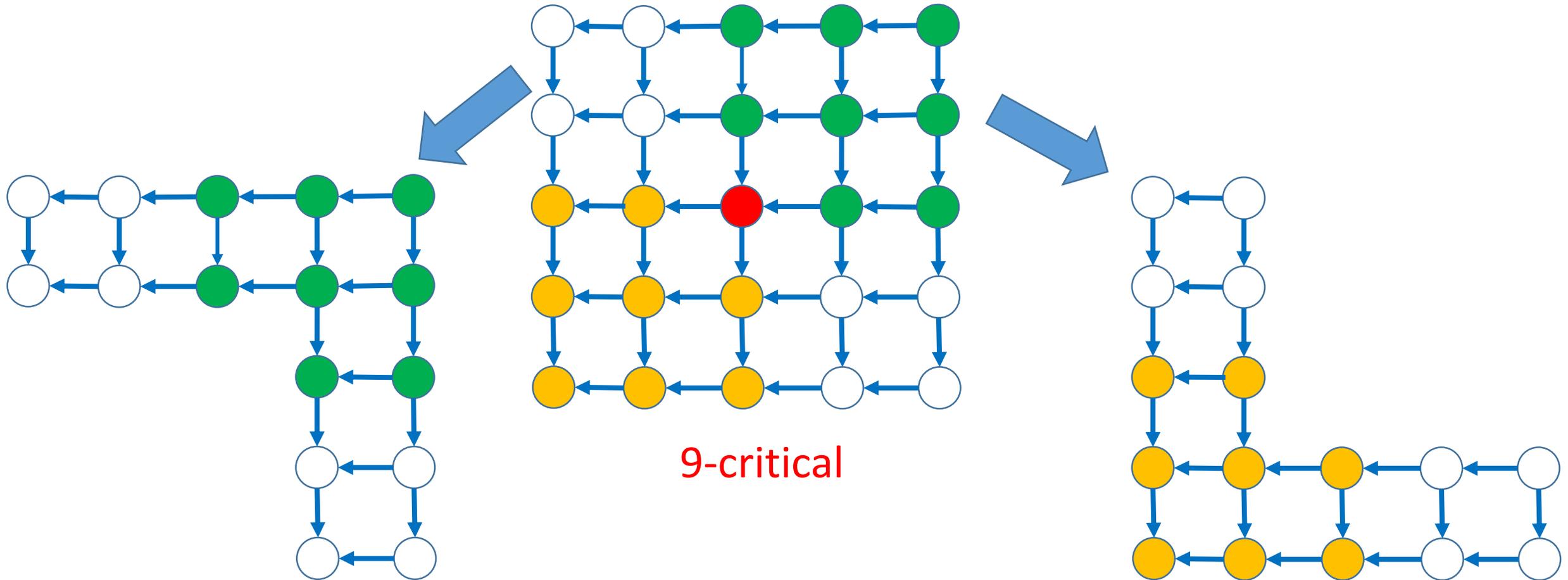
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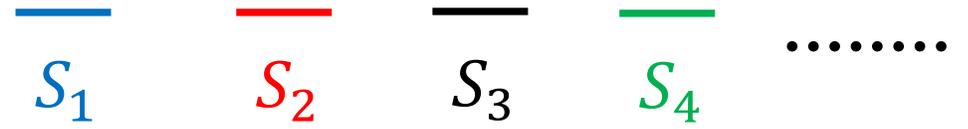
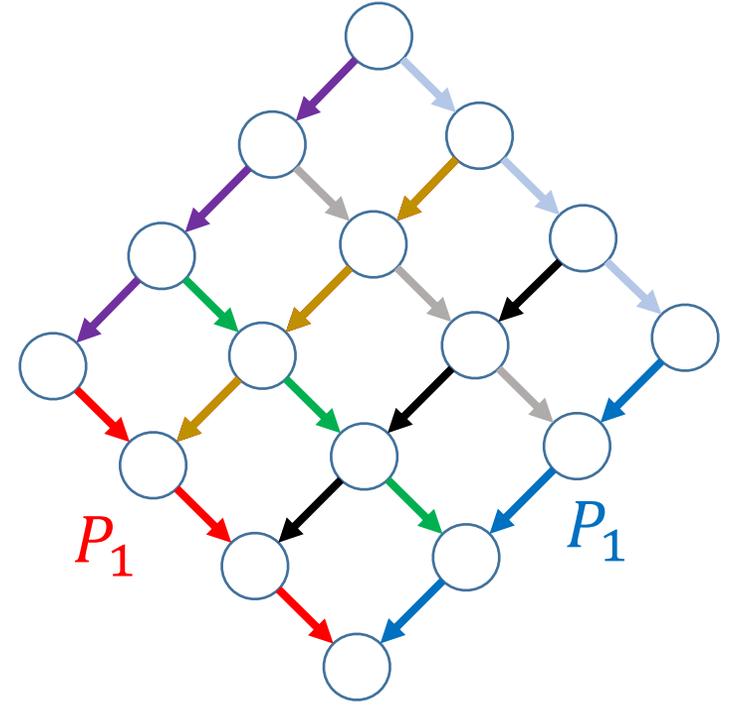
Unfolding the recurrence leads to a geometric series.

Which gives  $T(|V|) \leq C^{|V|}$ .

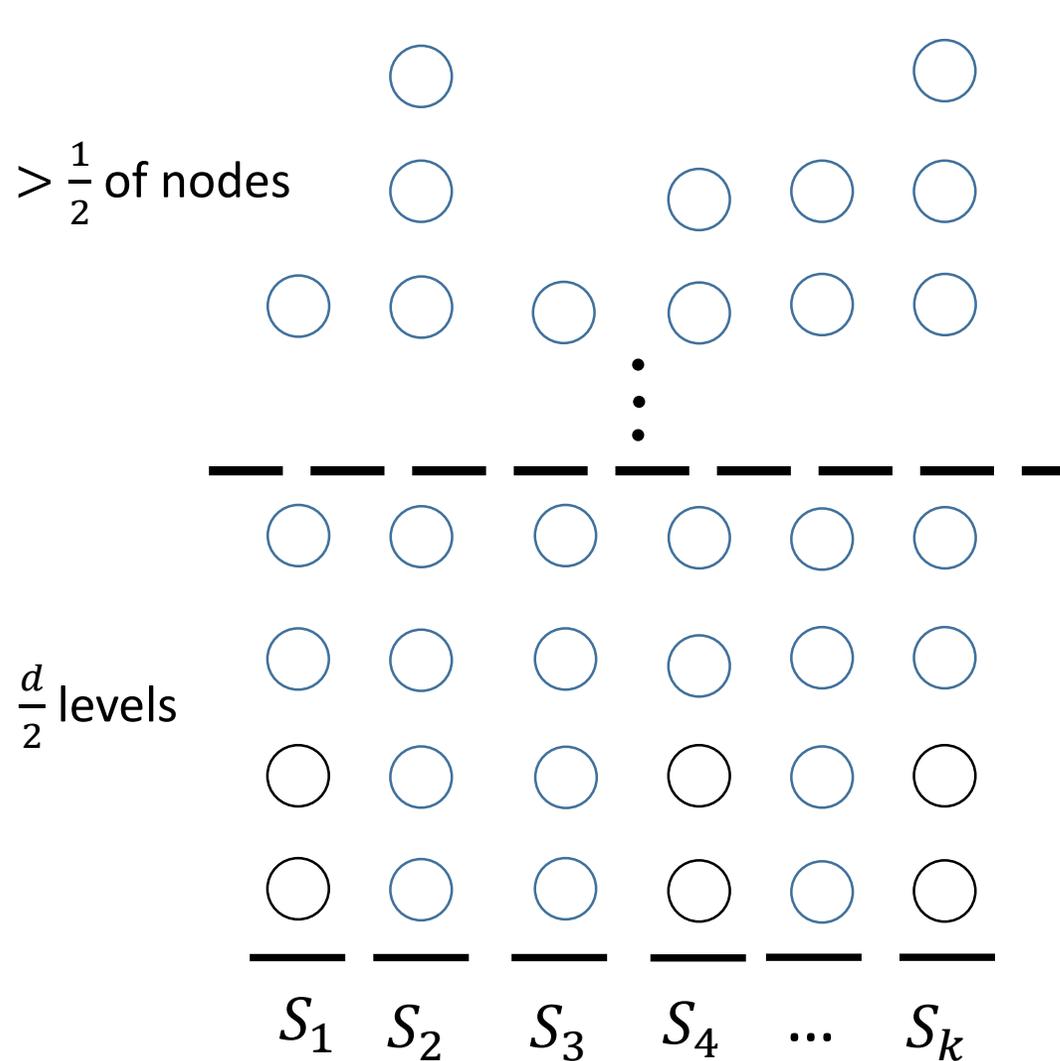
# Constructing Disjoint Subpaths

We construct a partition into subpaths  $S_1, \dots, S_k$  s.t.,

- Each  $S_i \subseteq P_i$ .
- If a node  $v$  dominates  $m$  nodes in its subpath  $S_i$  then it dominates  $m$  nodes in all  $S_j$  where  $v \in P_j$ .



# Finding a half-Critical Node



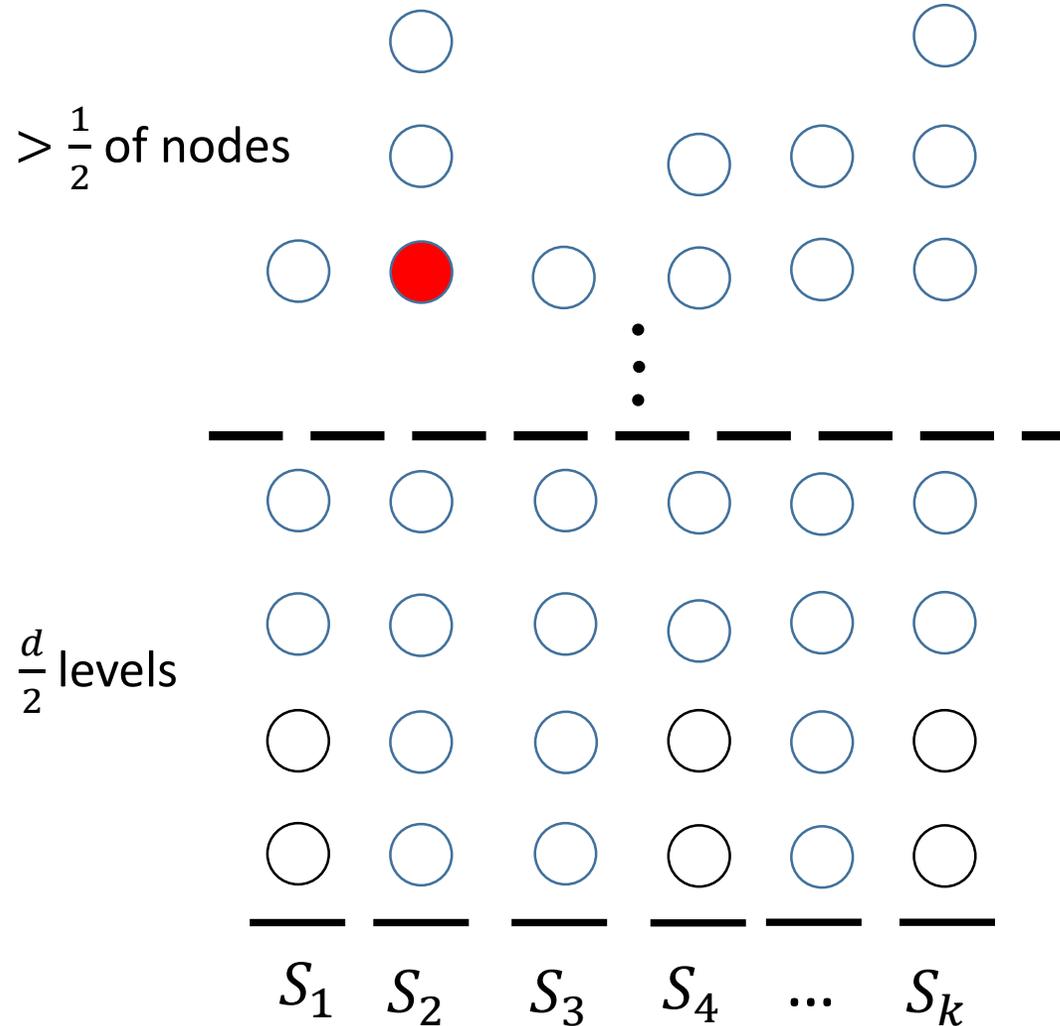
**k-mixing:** Every set  $U$  intersects  $\sqrt{|U|}$  of paths  $P_1, \dots, P_k$

**Partition:** Define subpaths  $S_1, S_2, \dots, S_k$  such that:

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**Claim:** Most nodes dominates  $\Omega(d^{3/2})$  nodes.

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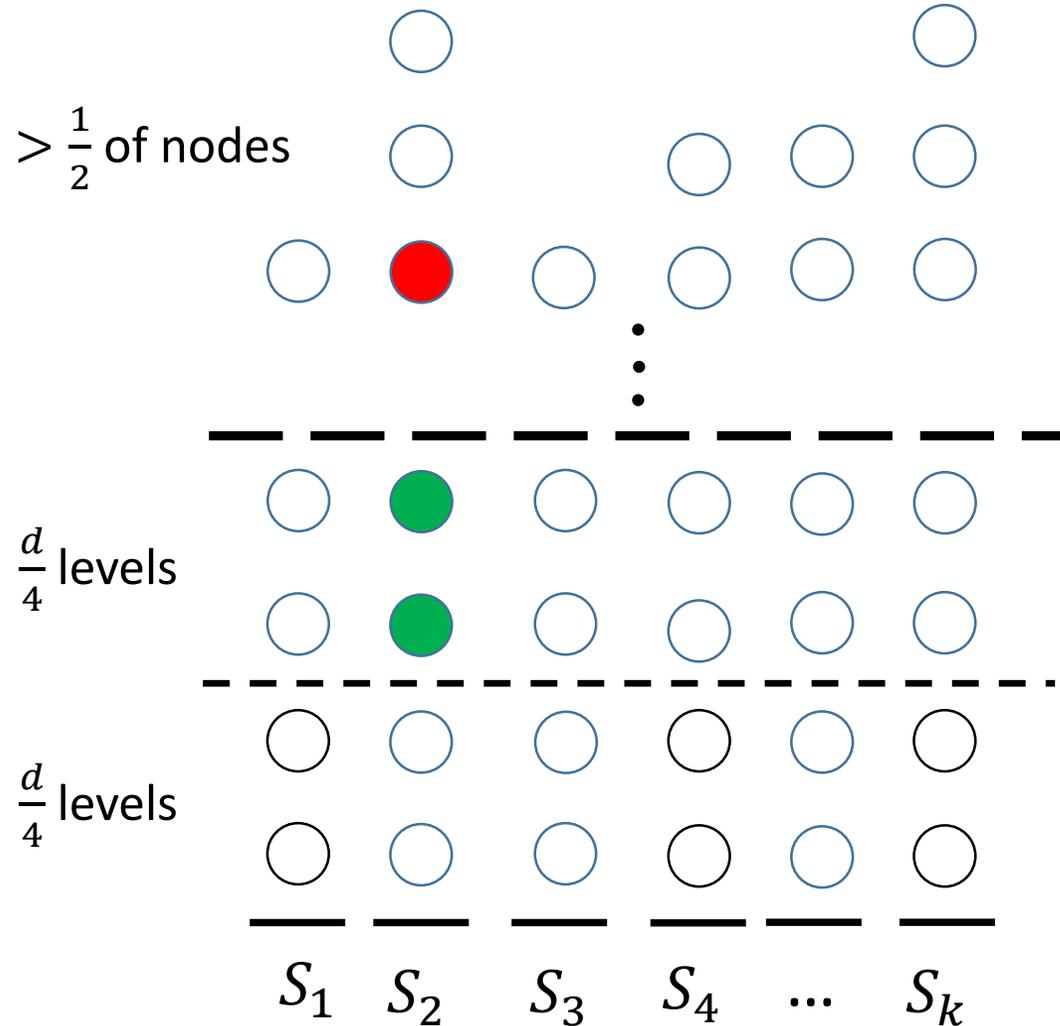
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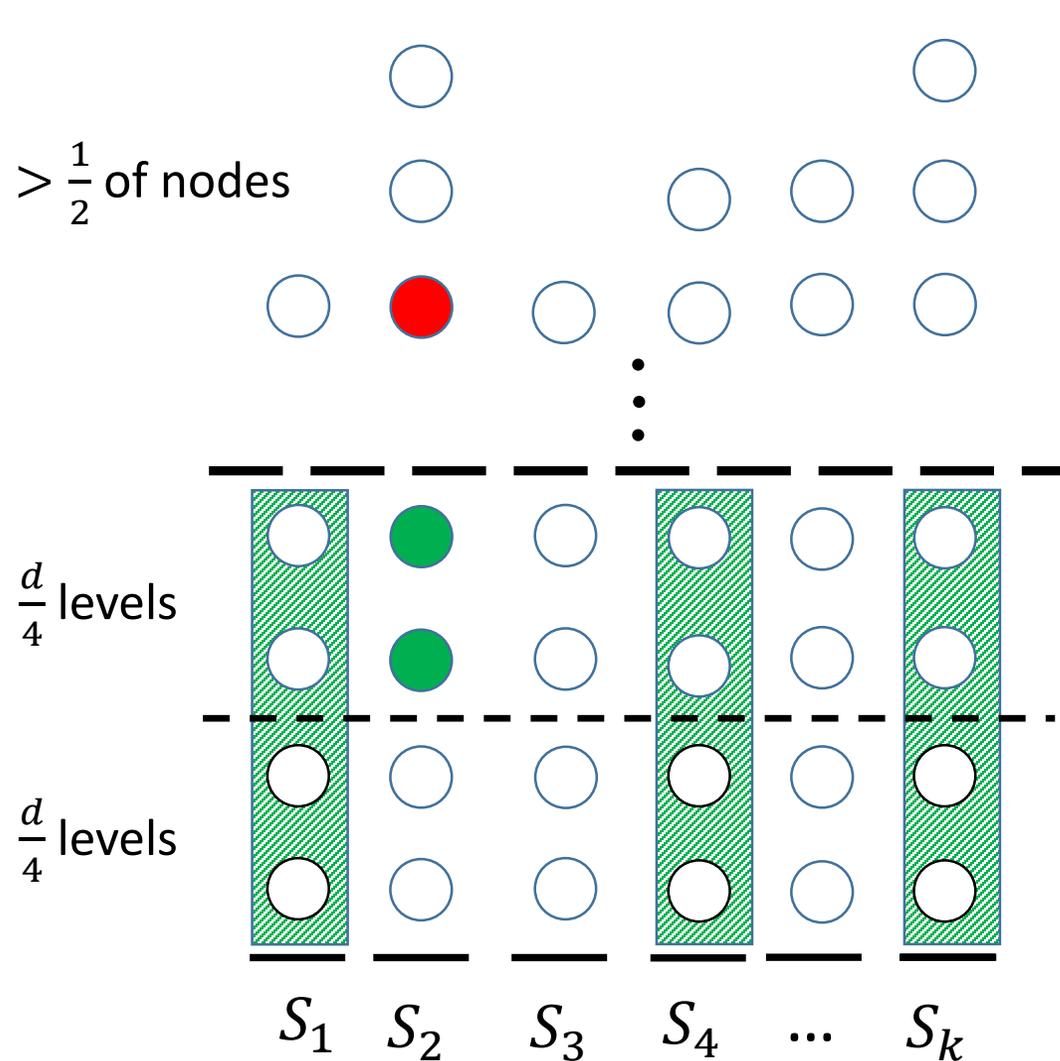
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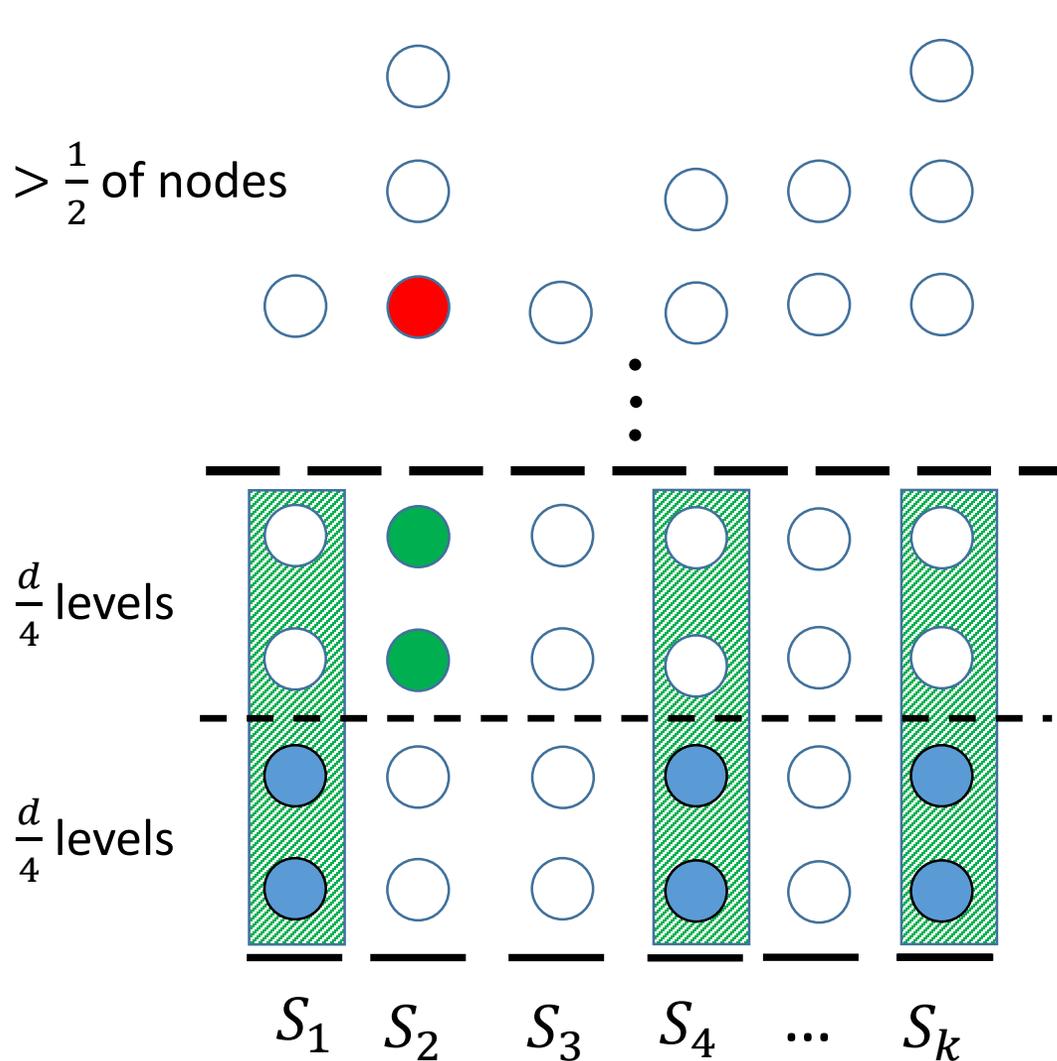
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**Claim:** Most nodes dominates  $\Omega(d^{3/2})$  nodes.

- Red node dominates  $d/4$  green nodes
- Green nodes mix, so belong to  $\Omega(\sqrt{d})$  paths.

# Finding a half-Critical Node



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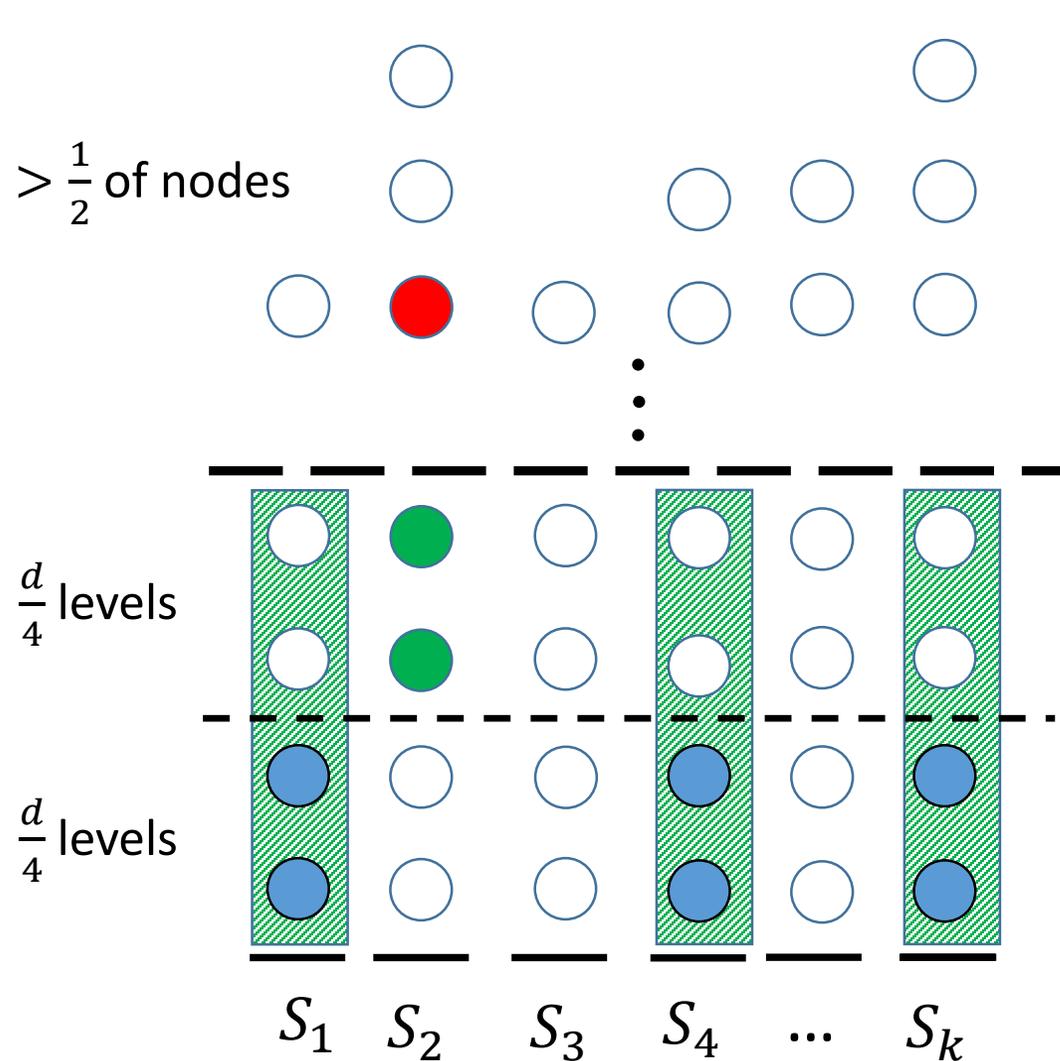
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**Claim:** Most nodes dominates  $\Omega(d^{3/2})$  nodes.

- Red node dominates  $d/4$  green nodes
- Green nodes mix, so belong to  $\Omega(\sqrt{d})$  paths.
- Every green node dominates at least  $d/4$  in every path that it appears.

# Finding a half-Critical Node



**k-mixing:** Every set  $U$  intersects  $\sqrt{|U|}$  of paths  $P_1, \dots, P_k$

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**Claim:** Most nodes dominates  $\Omega(d^{3/2})$  nodes.

- Red node dominates  $d/4$  green nodes
- Green nodes mix, so belong to  $\Omega(\sqrt{d})$  paths.
- Every green node dominates at least  $d/4$  in every path that it appears.
- The red node dominates  $\Omega(d^{3/2})$  blue nodes.

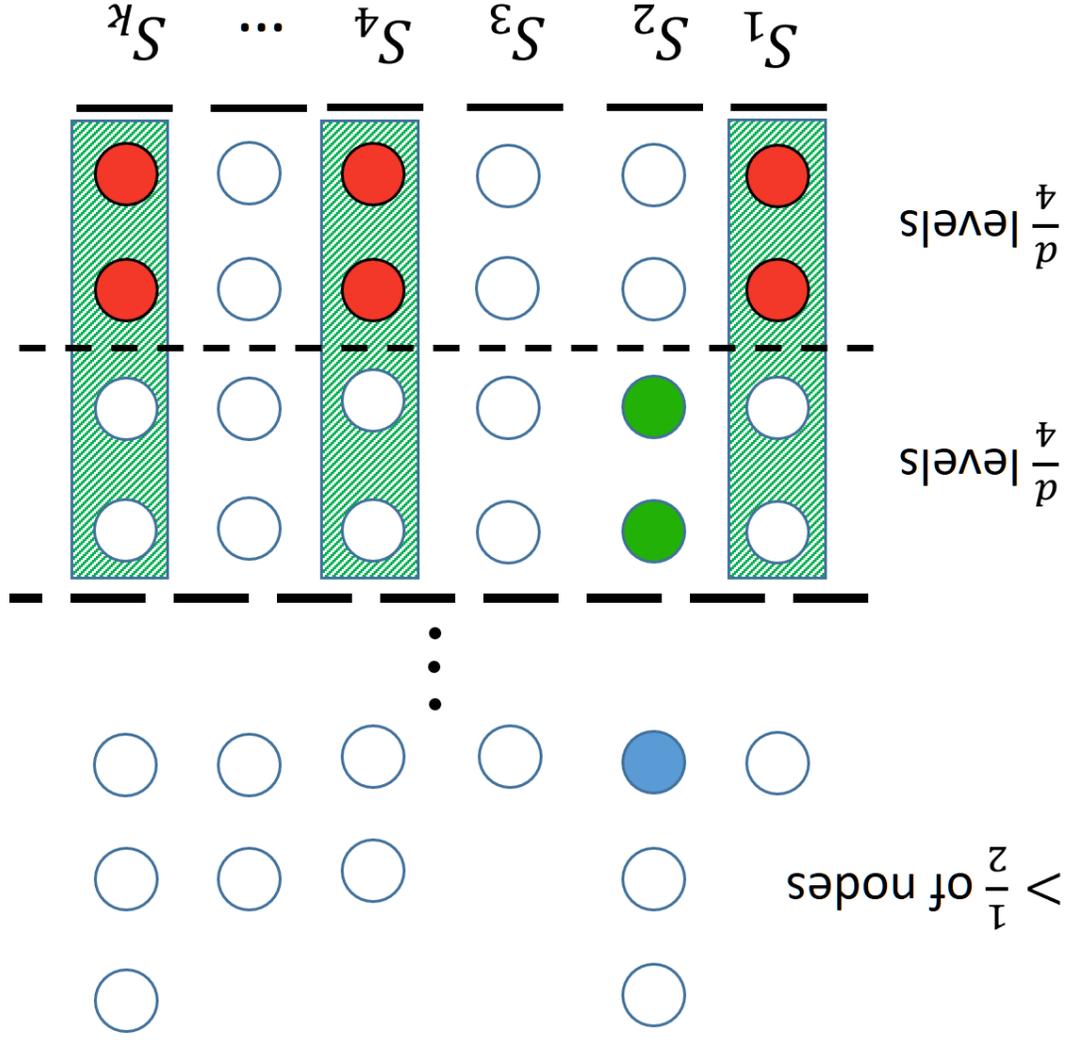
# Finding a half-Critical Node

**K-mixing:** Every set  $U$  intersects  $\sqrt{|U|}$  of paths  $P_1, \dots, P_k$   
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**Claim:** Most nodes dominates  $\Omega(d^{3/2})$  nodes.

- Blue node dominates  $d/4$  green nodes
- Green nodes mix, so belong to  $\Omega(\sqrt{d})$  paths.
- Every green node dominates at least  $d/8$  in every path that it appears.
- The blue node dominates  $\Omega(d^{3/2})$  red nodes.



# Existence of a Critical Node

**Main Lem:** Every  $k$ -mixing POSET with paths has a  $\Omega(d^{3/2})$ -critical element, where  $d$  is "average" length of a path.

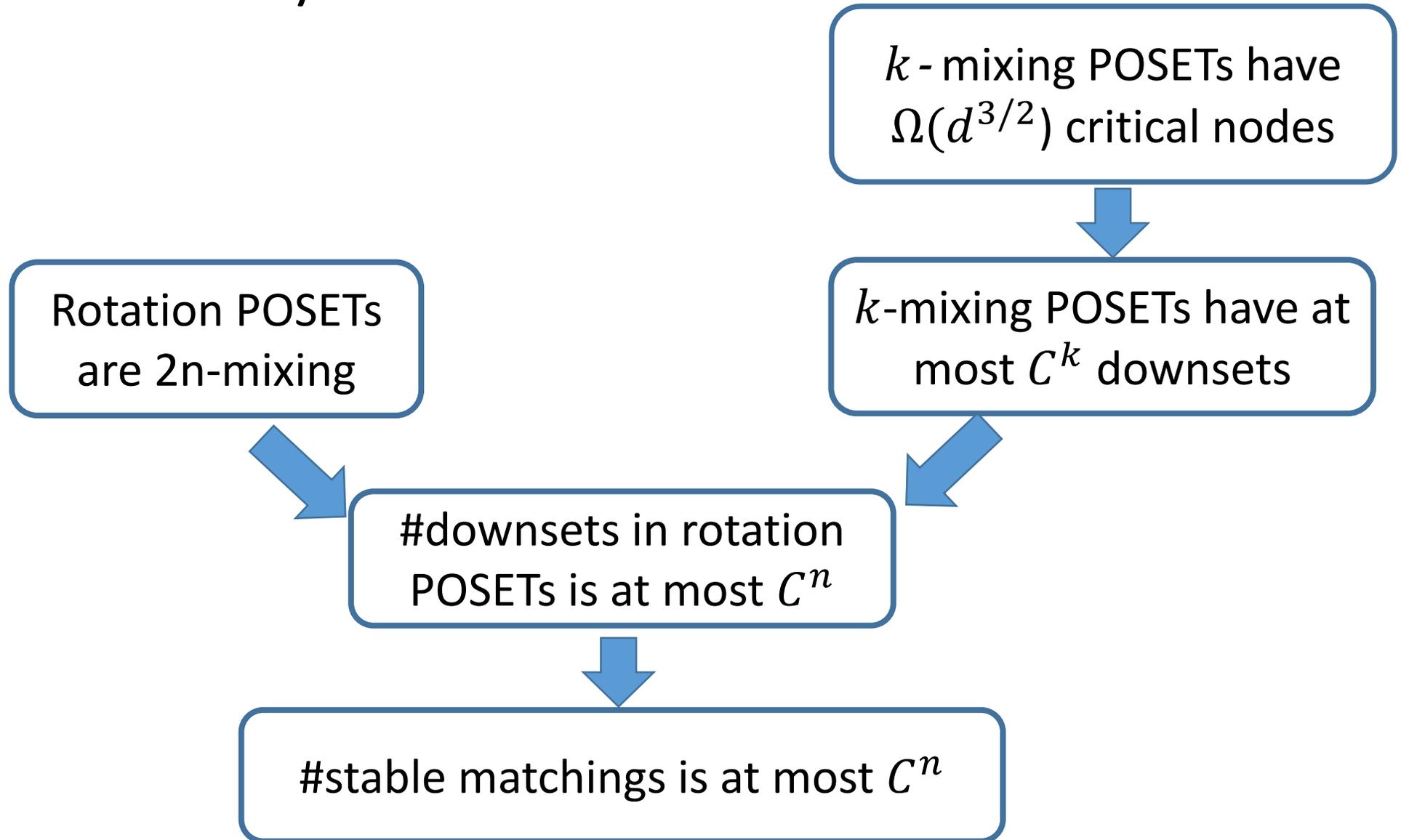
Most nodes dominate  $\Omega(d^{3/2})$  nodes.

Most nodes are dominated by  $\Omega(d^{3/2})$  nodes.

Therefore, there is an  $\Omega(d^{3/2})$ -critical node.



# Proof Summary



# Future directions

- Getting close to the  $2.28^n$  lower bound?
  - Our current bound is about  $2^{17n}$
- Counting algorithms for estimating
  - #Stable Matchings [Dyer-Goldberg-Greenhill-Jerrum'04,Chebolu-Goldberg-Martin'12]
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Any questions?