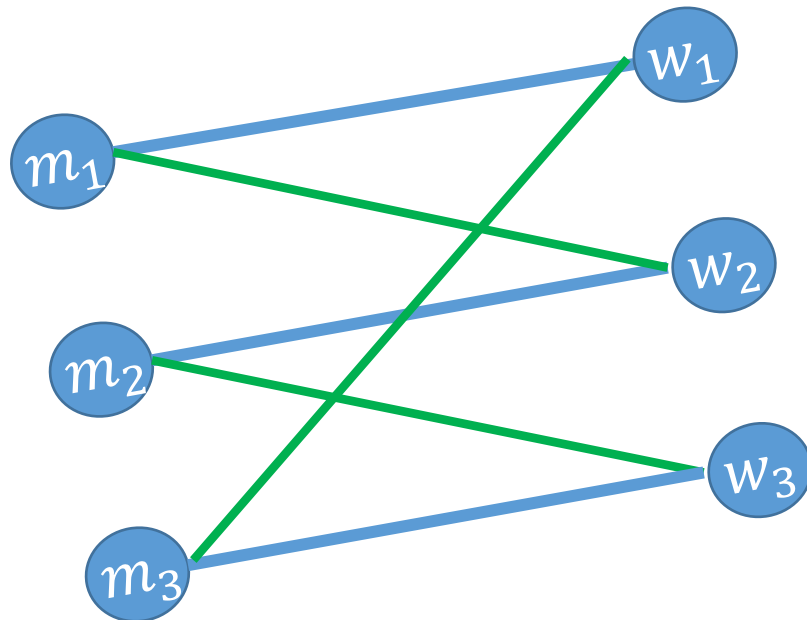


A Simply Exponential Upper Bound on the Maximum Number of Stable Matchings

Robbie Weber

Joint work with Anna Karlin and Shayan Oveis Gharan



Stable Matching Problem

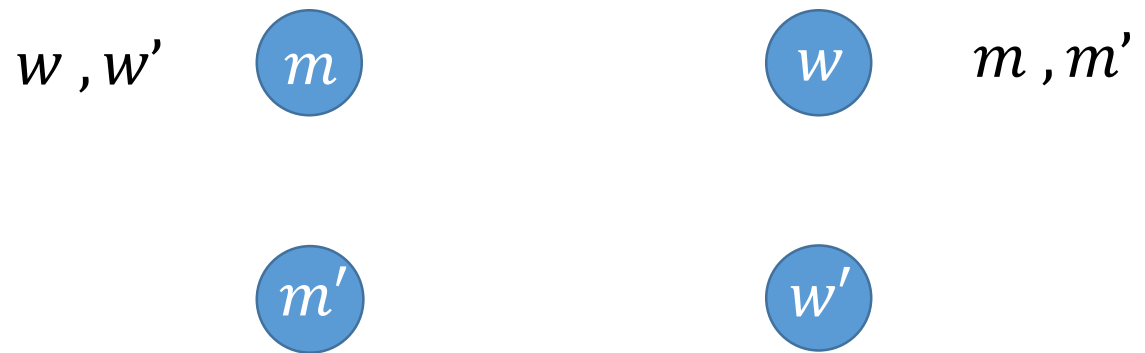
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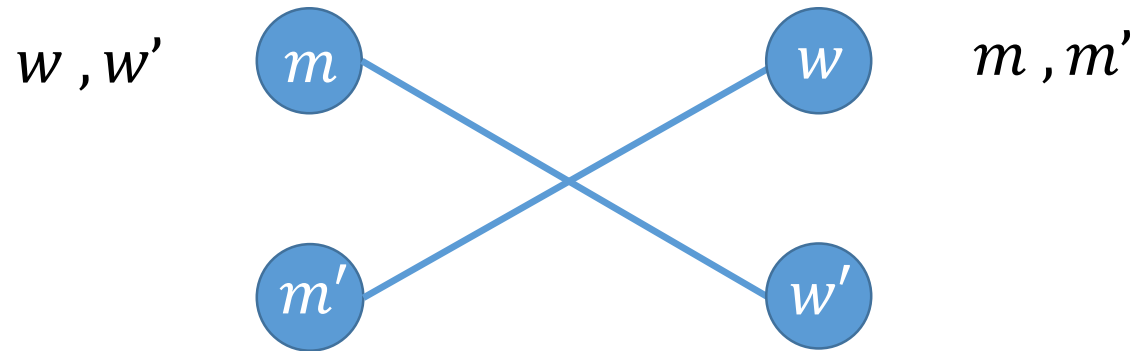


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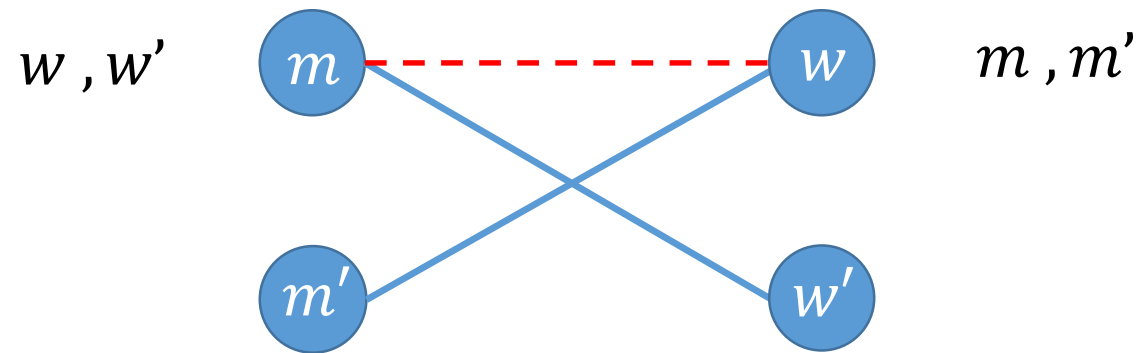


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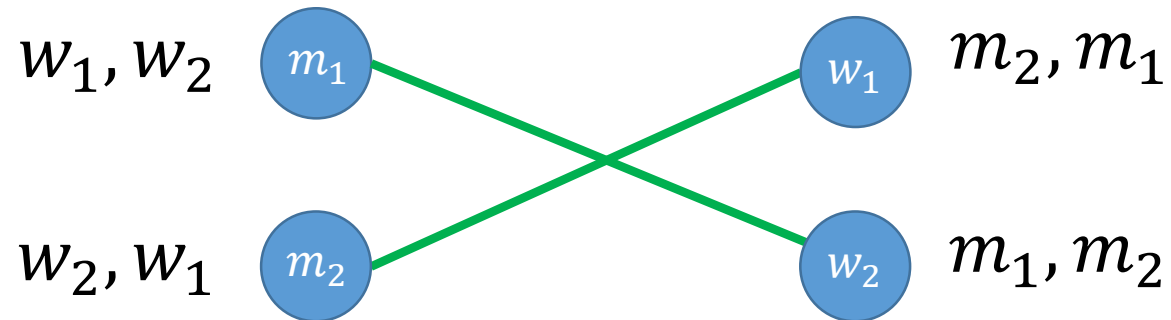
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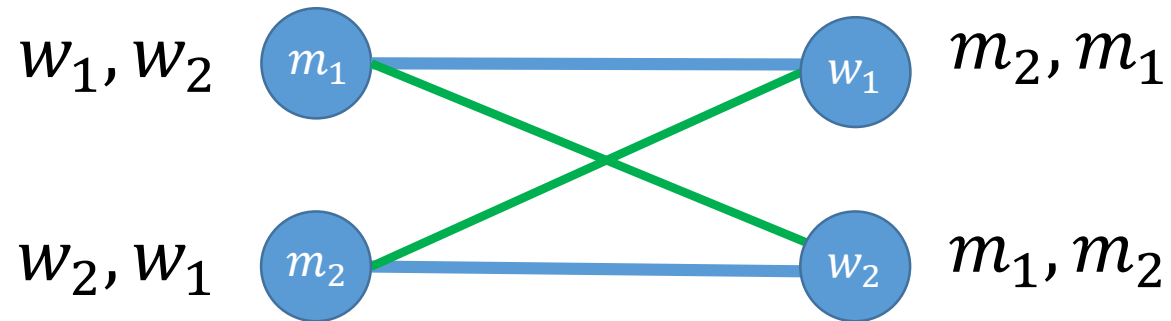
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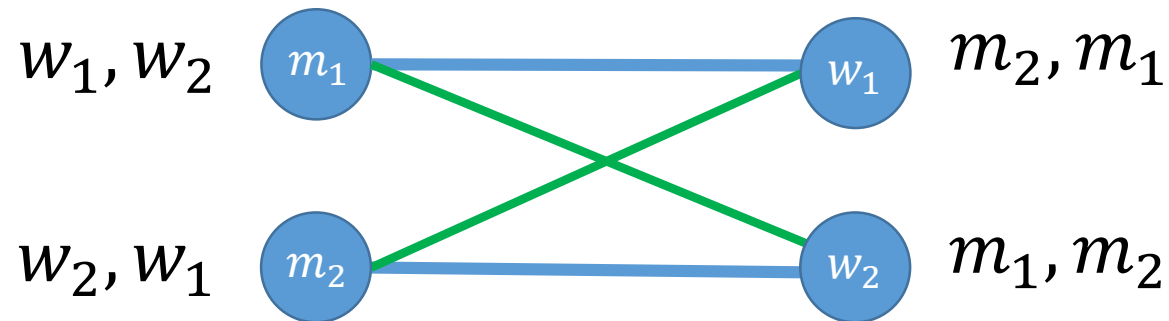
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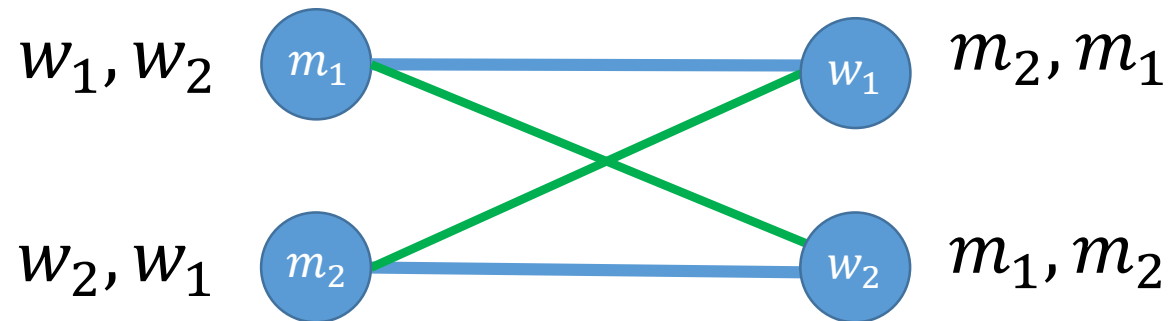
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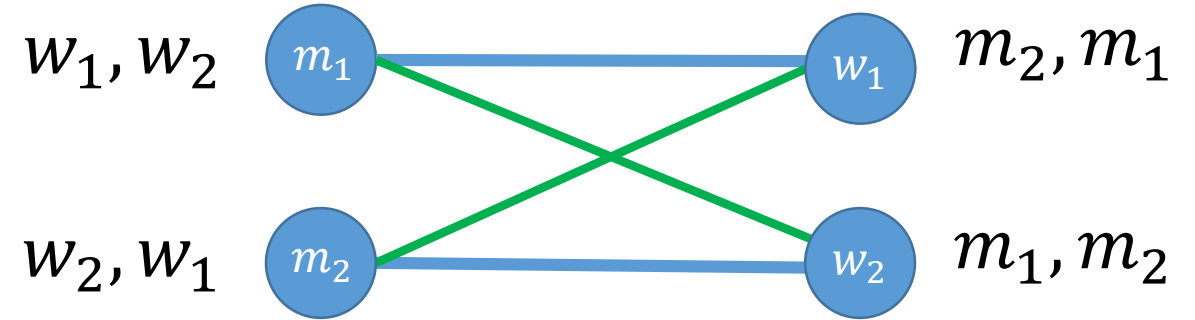
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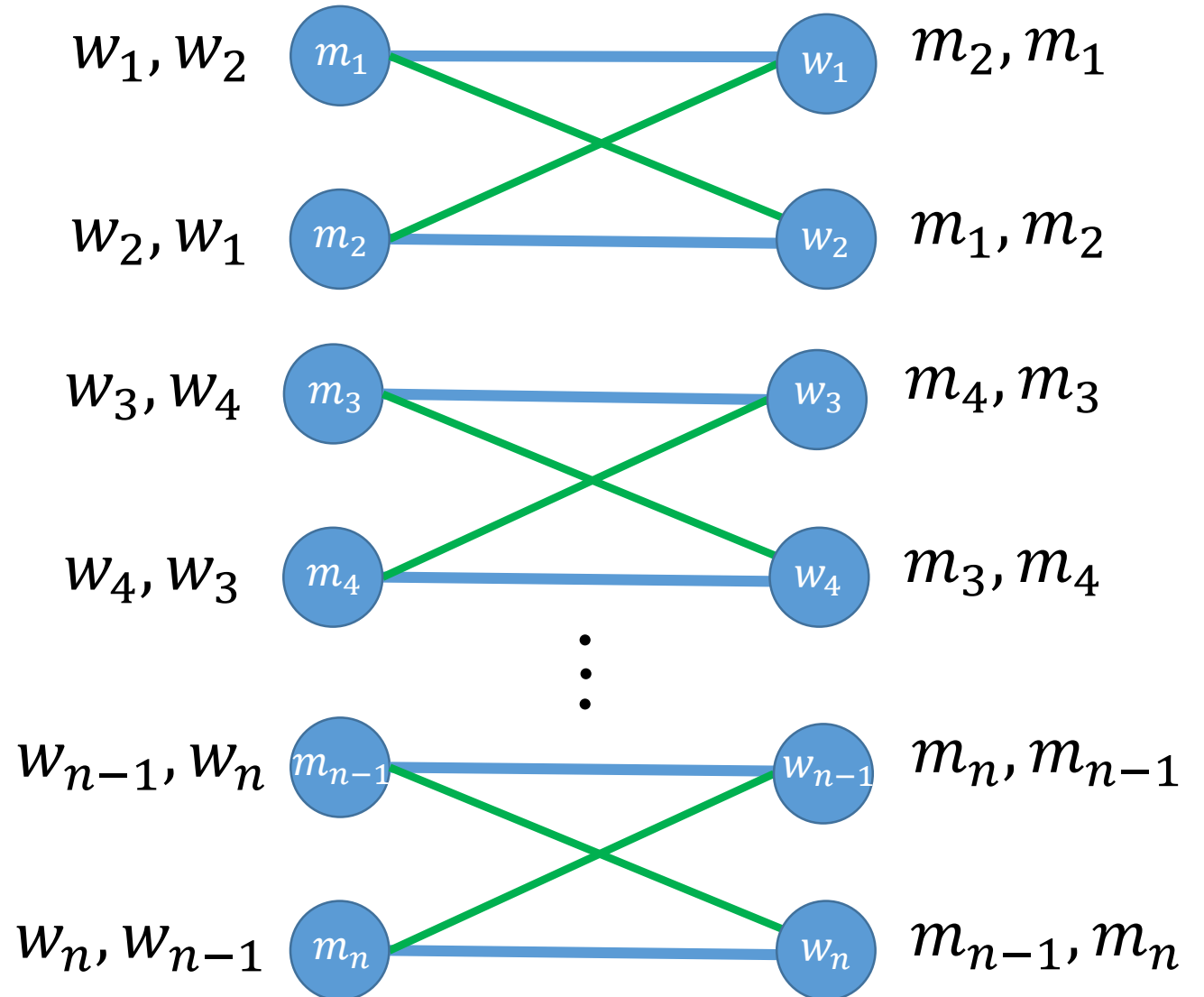
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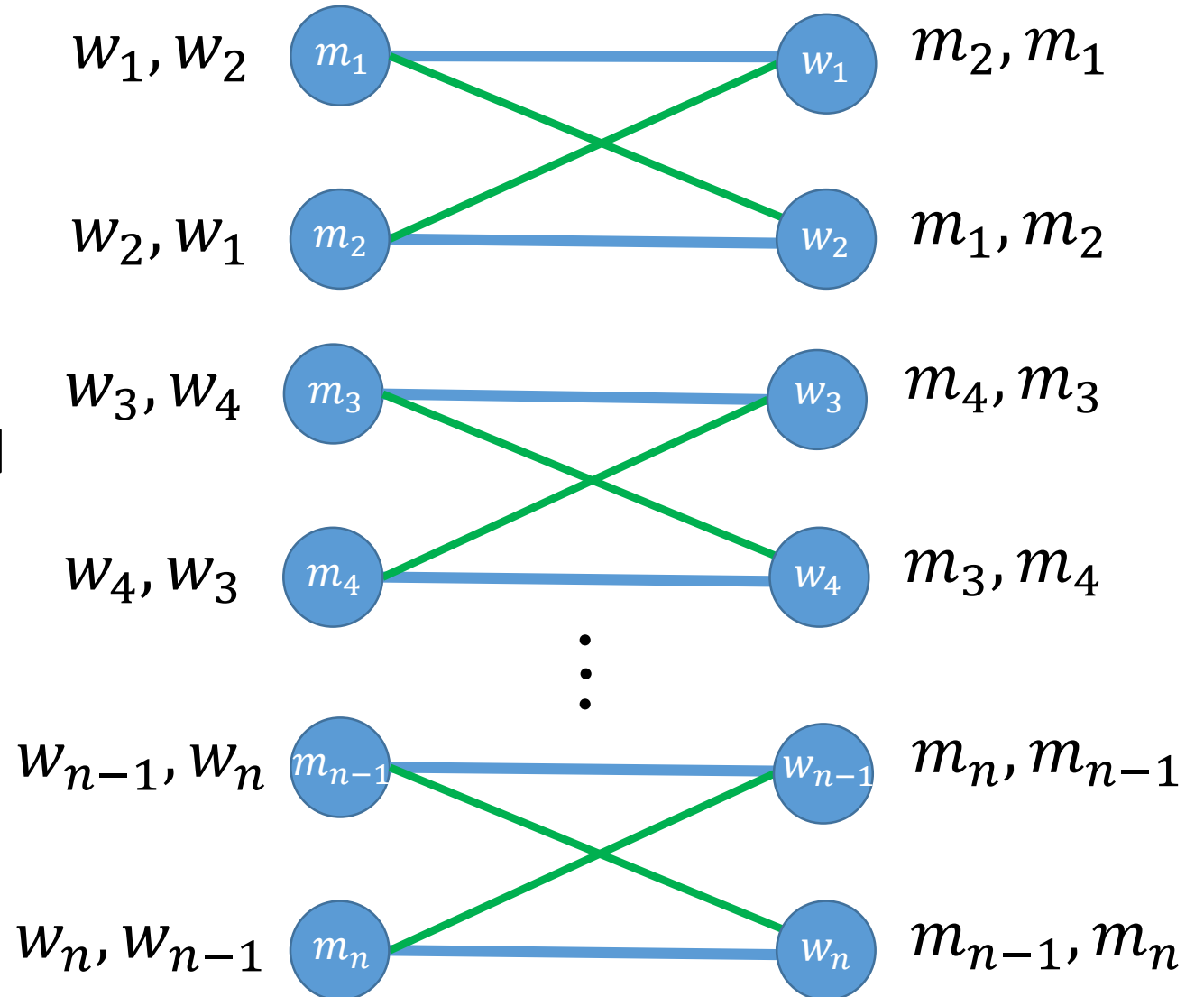


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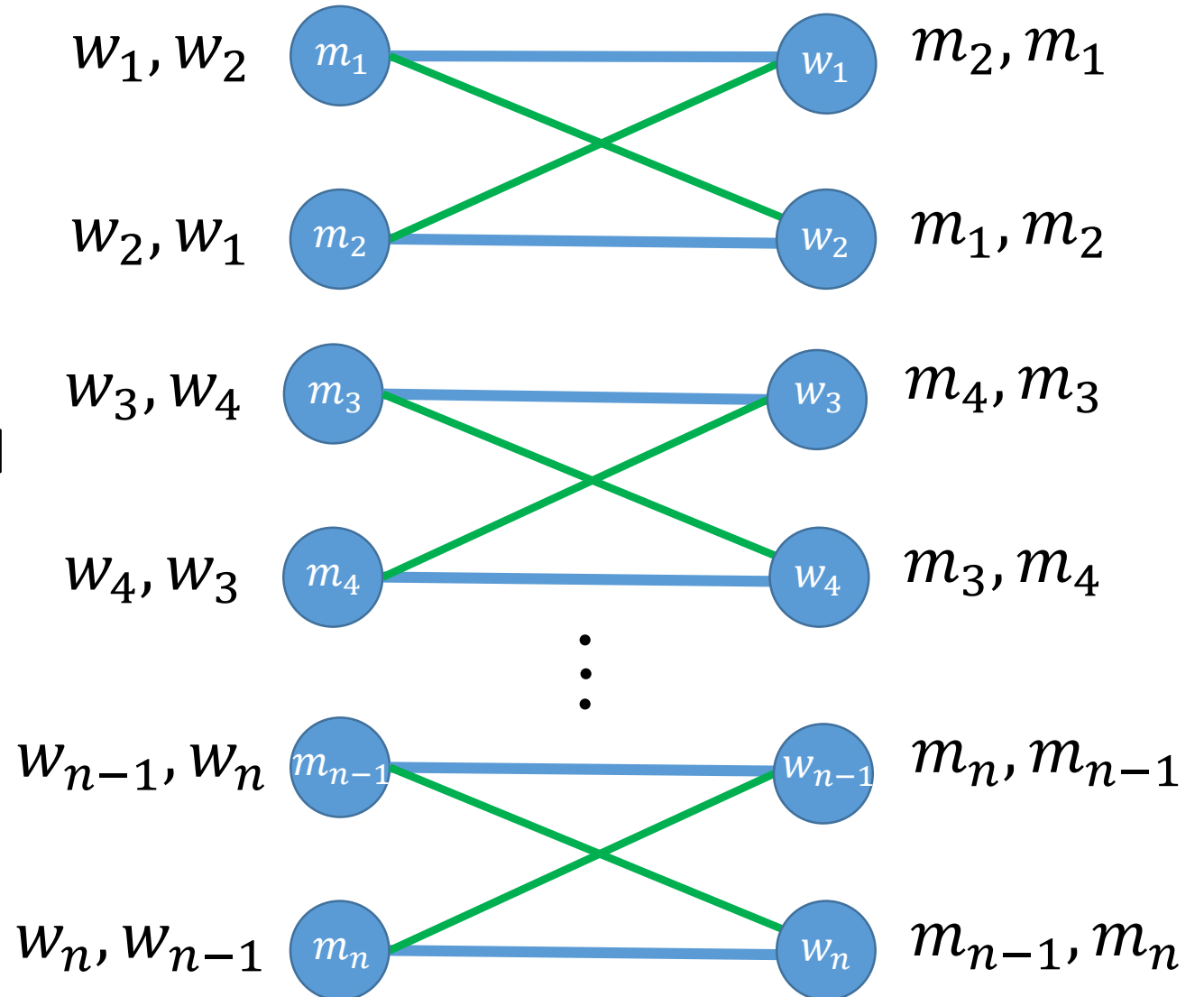
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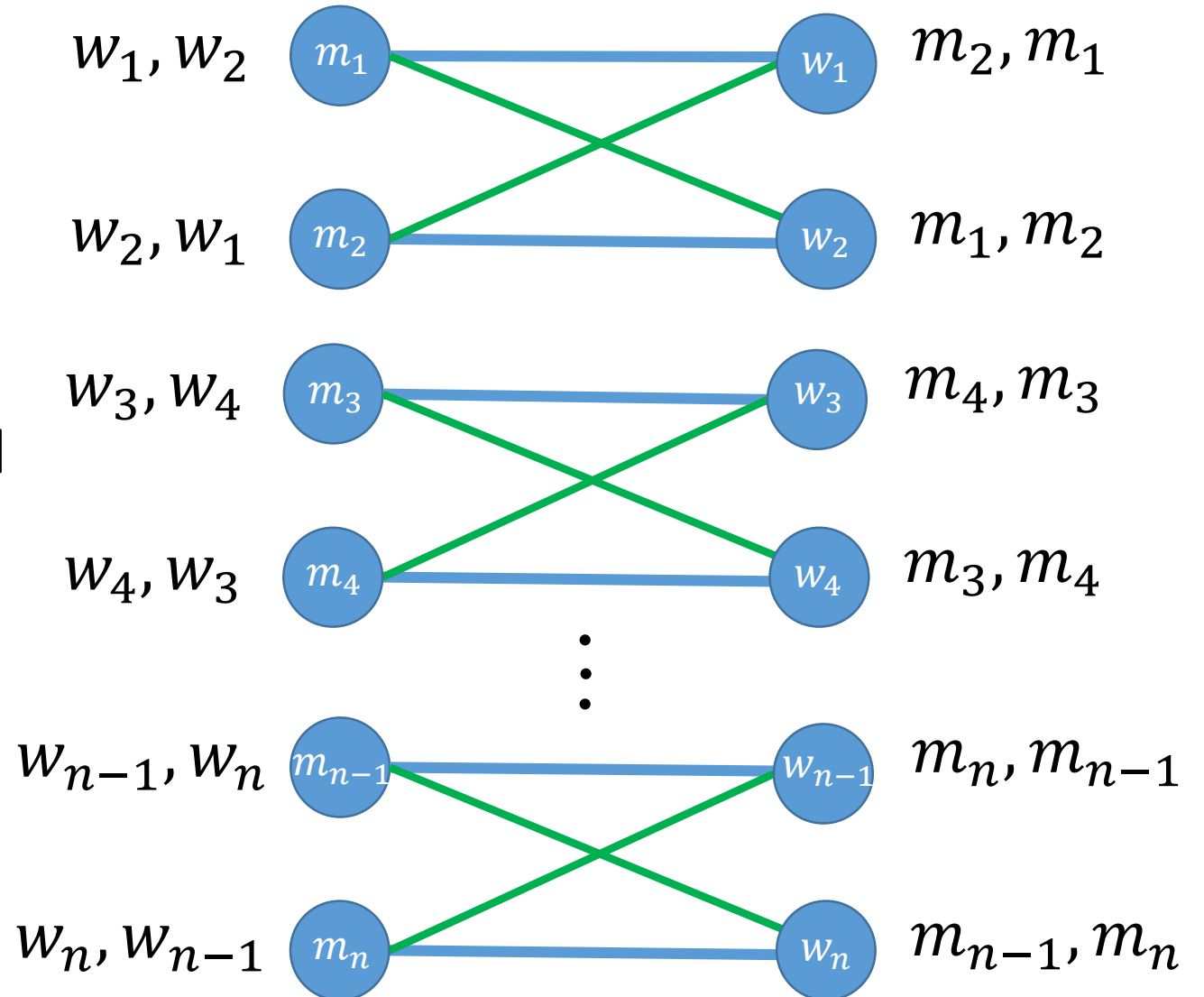
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$\leq n!/c^n$ [Stathopoulos'11]



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.

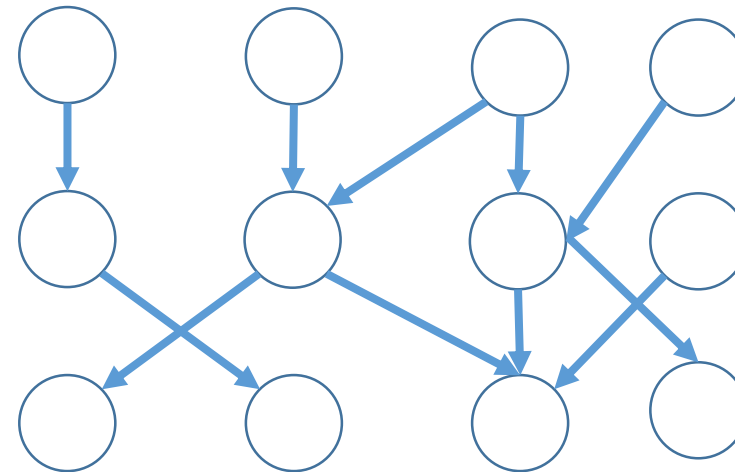
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Step 1 [Irving Leather 86]: The number of stable matchings equals the number of downsets of a certain POSET.

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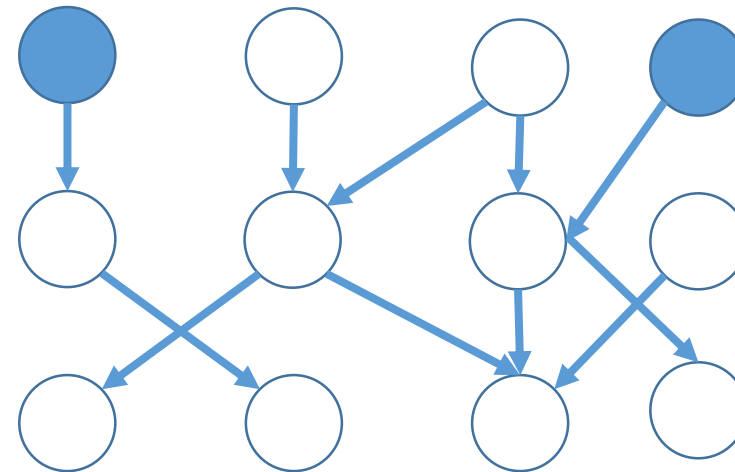
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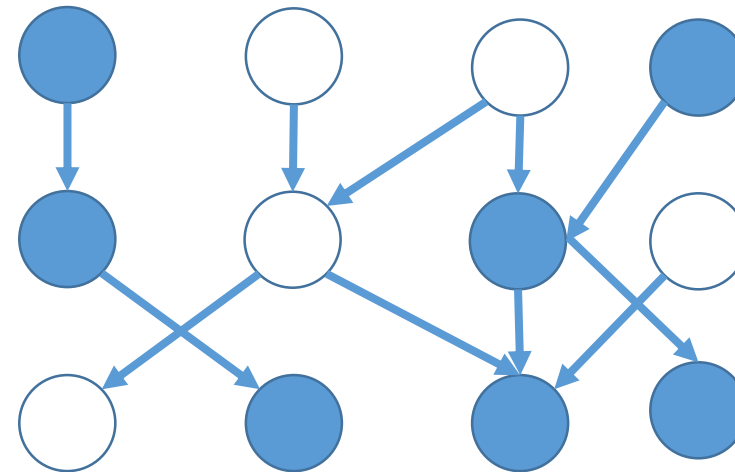
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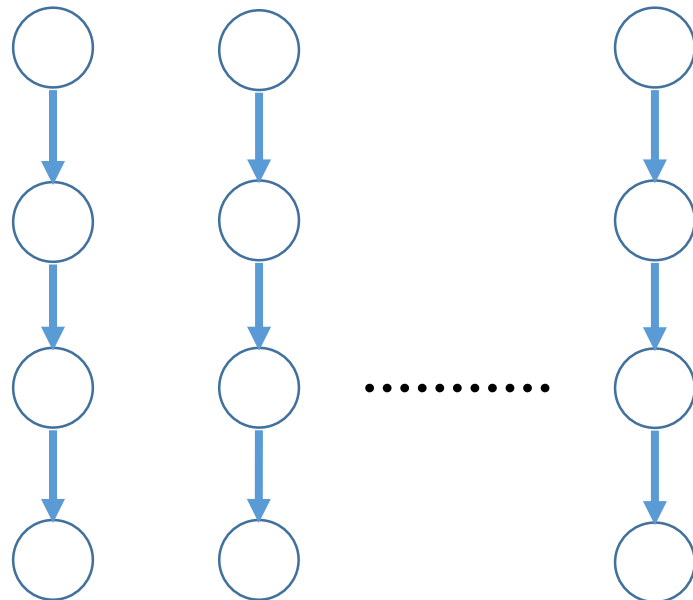
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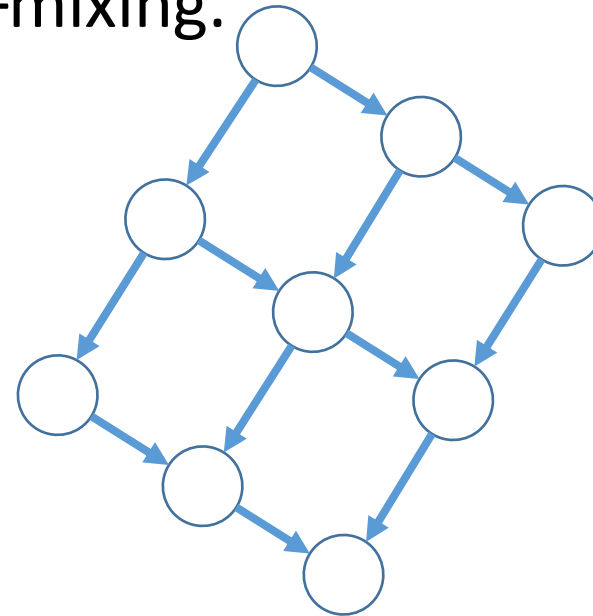
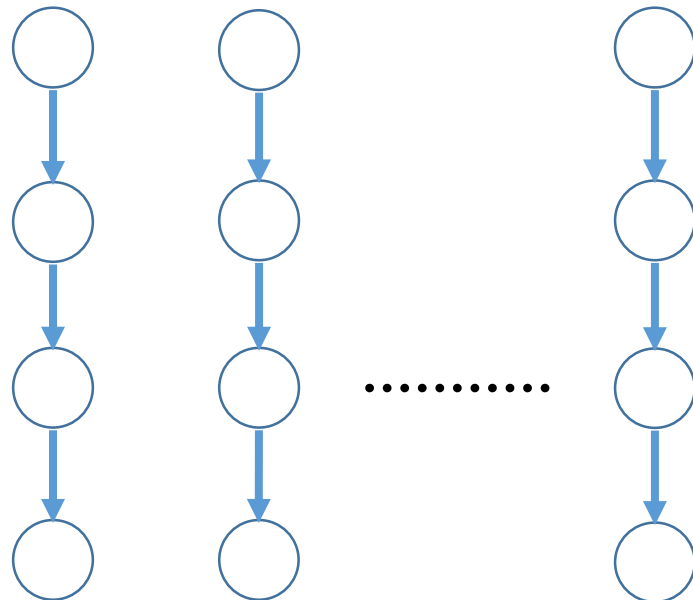
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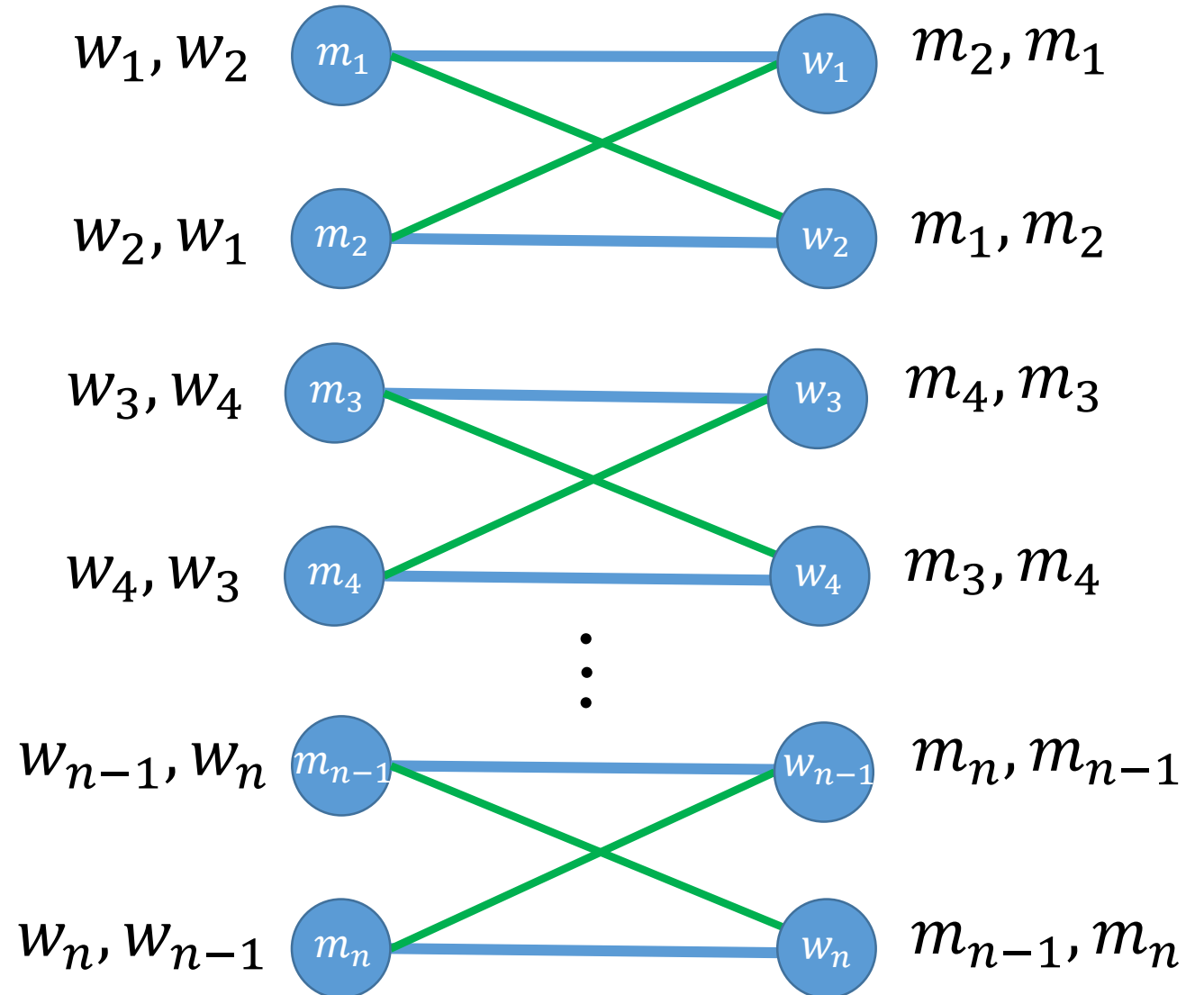
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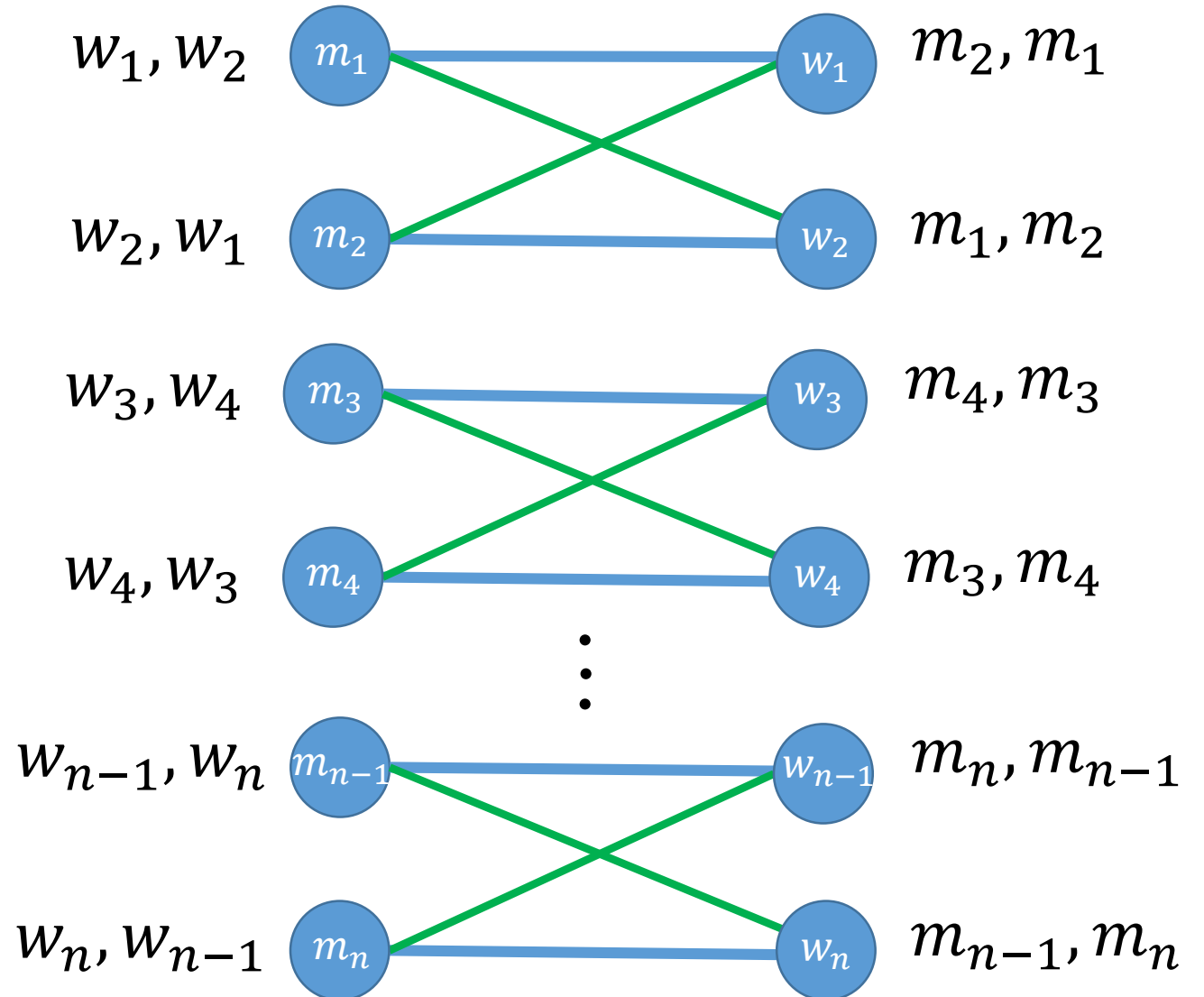
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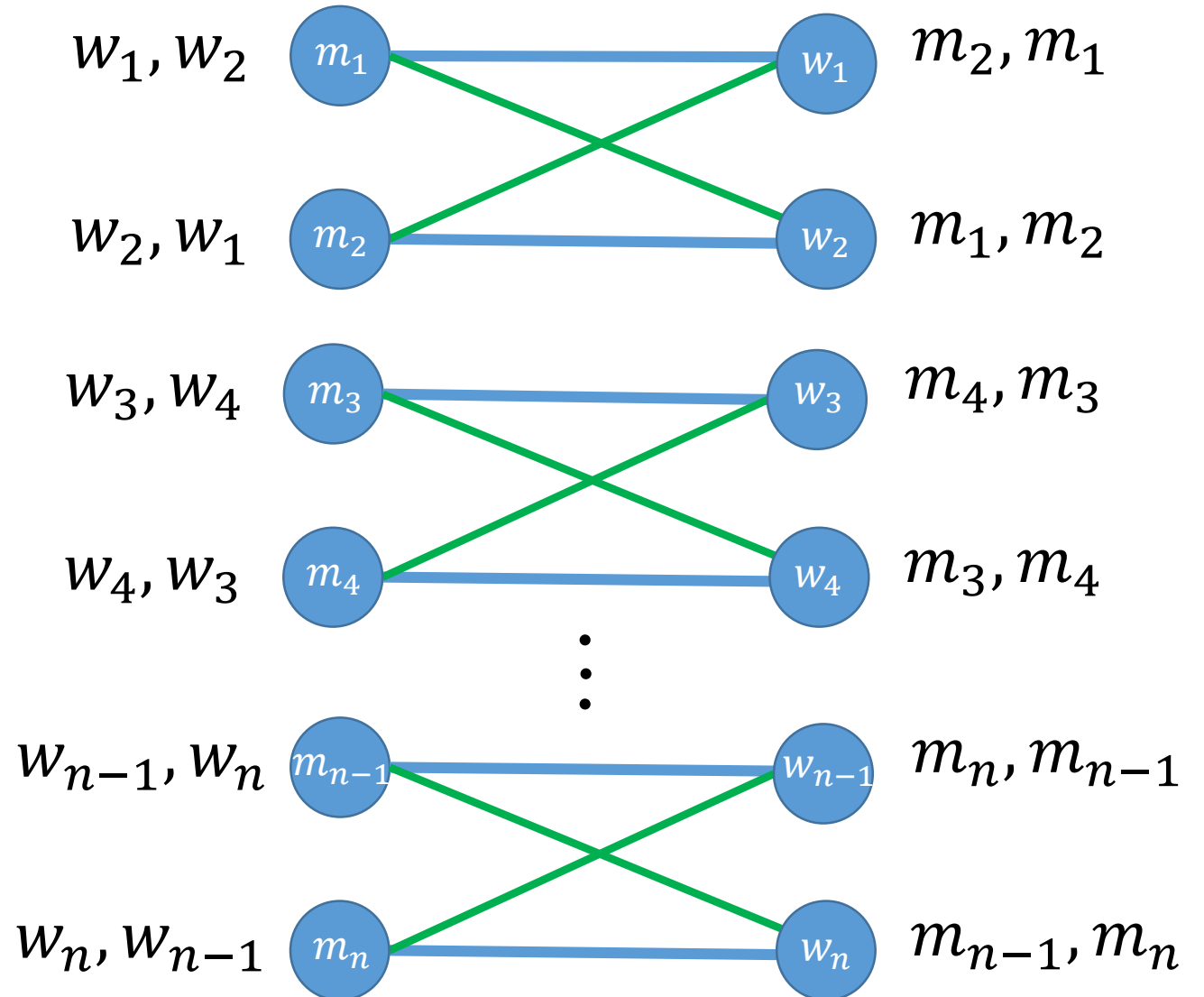
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(Switching from the blue matching to the green matching in some pair)



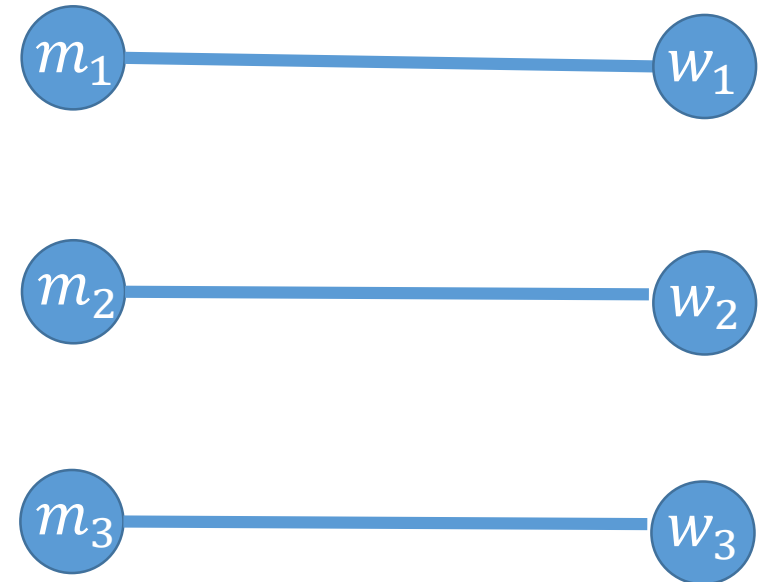
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A rotation is an ordered list of pairs:

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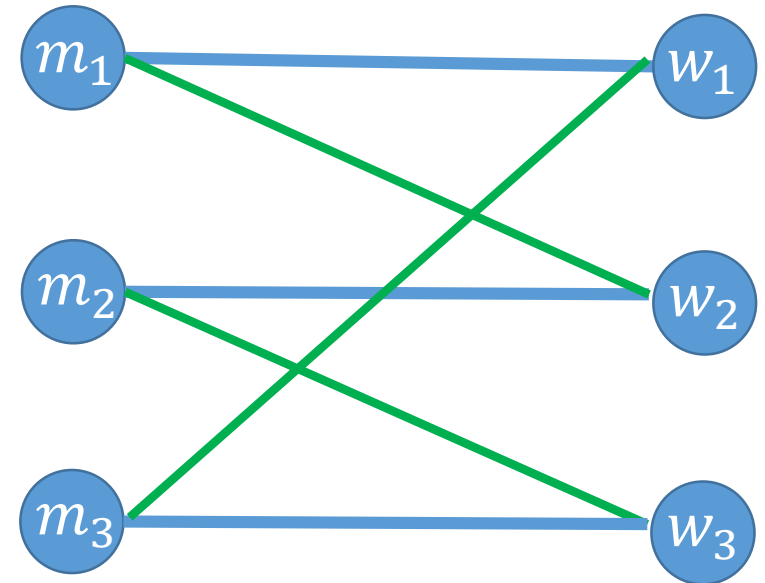
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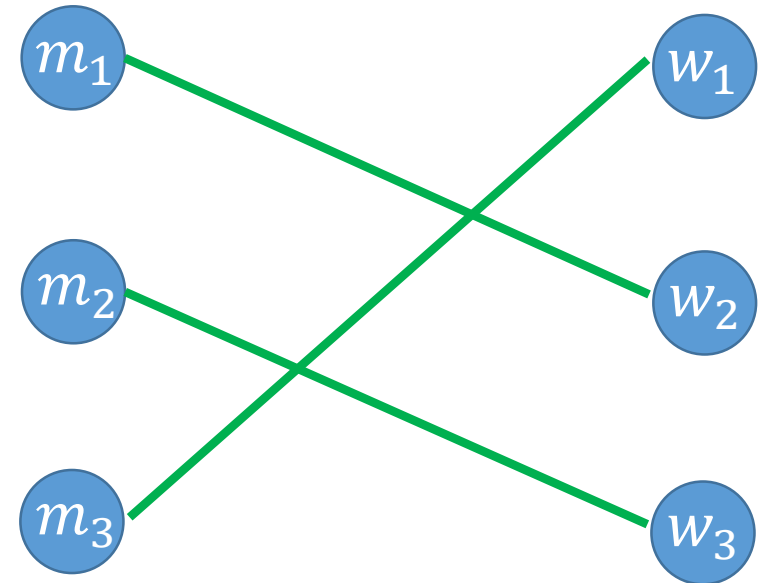
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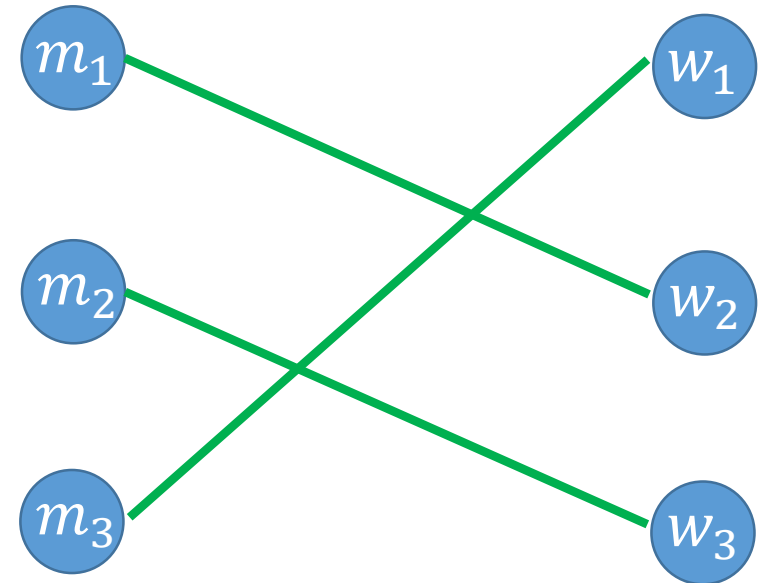
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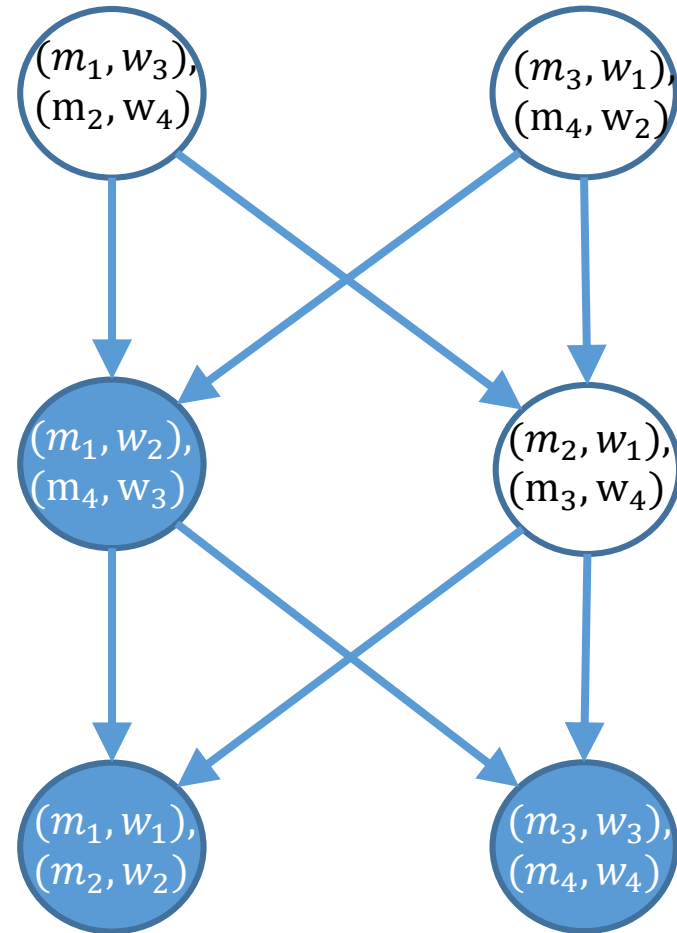
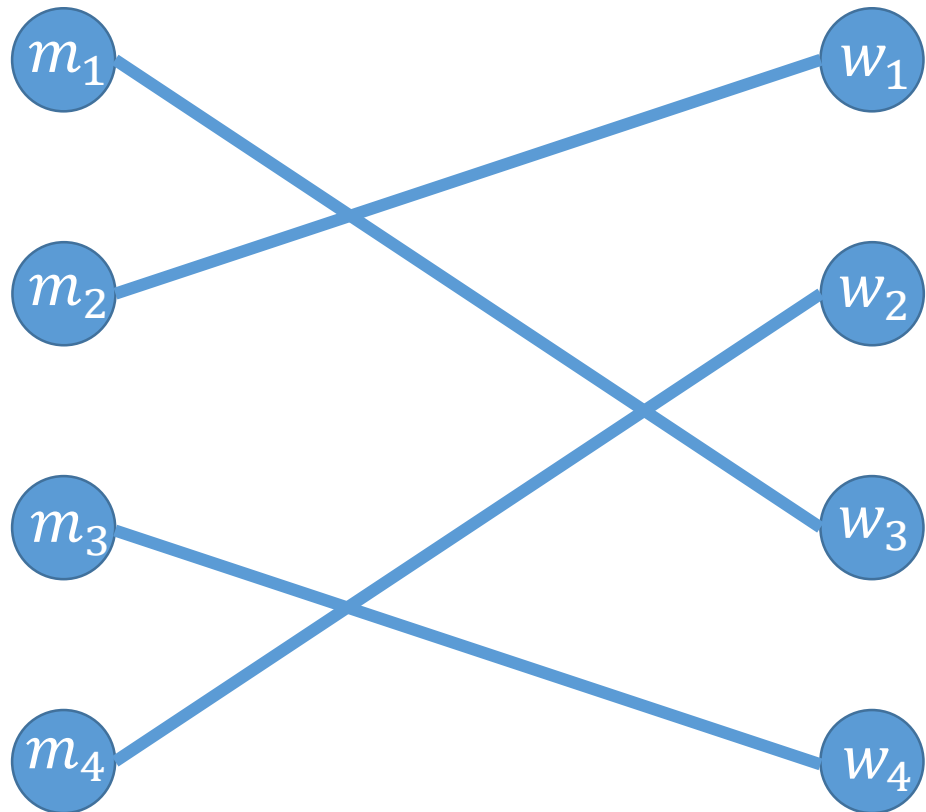
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Observation: All rotations with an agent form a directed path.

[Irving-Leather 86]

#Stable Matchings = #Downsets Rotation POSET



Proof Outline

 Step 1 [Irving-Leather 86]: The number of stable matchings equals the number of downsets of a POSET with $\leq n^2$ nodes.

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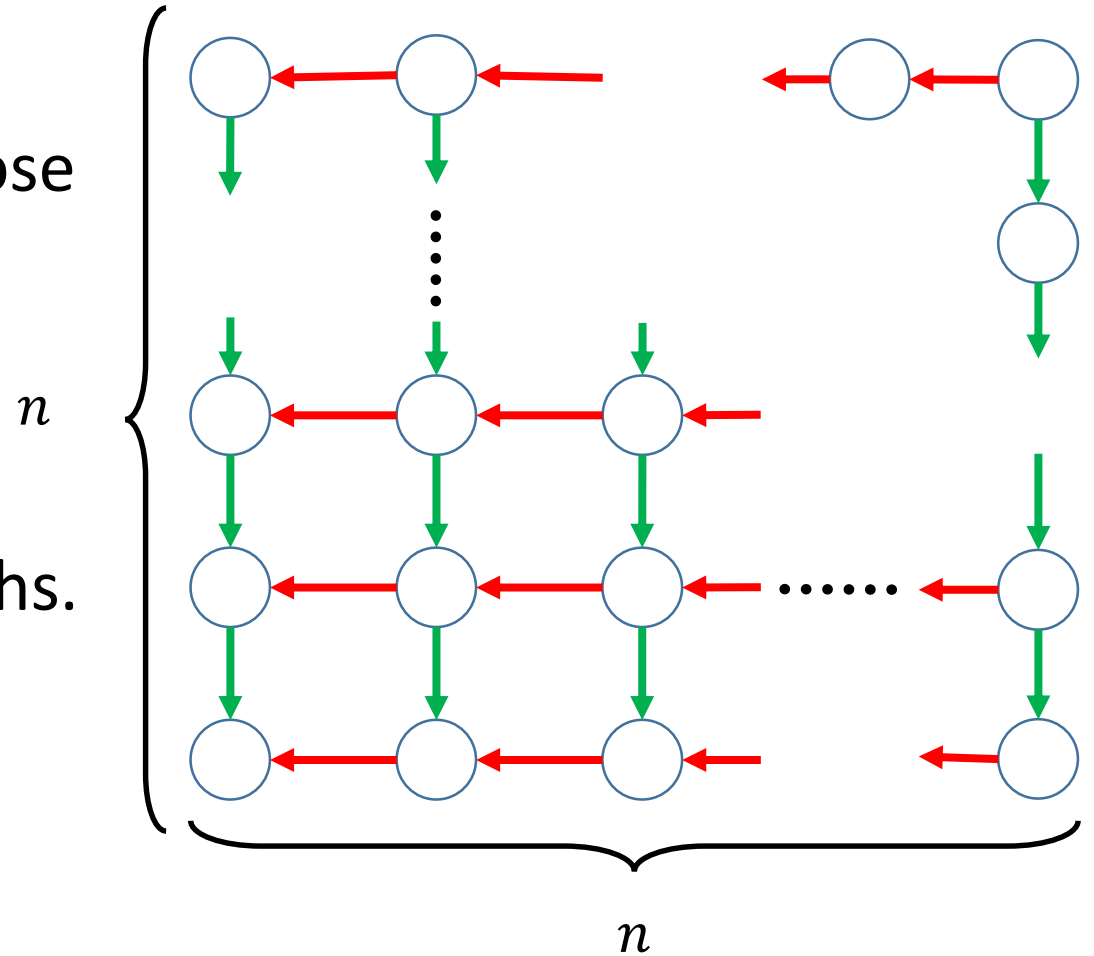
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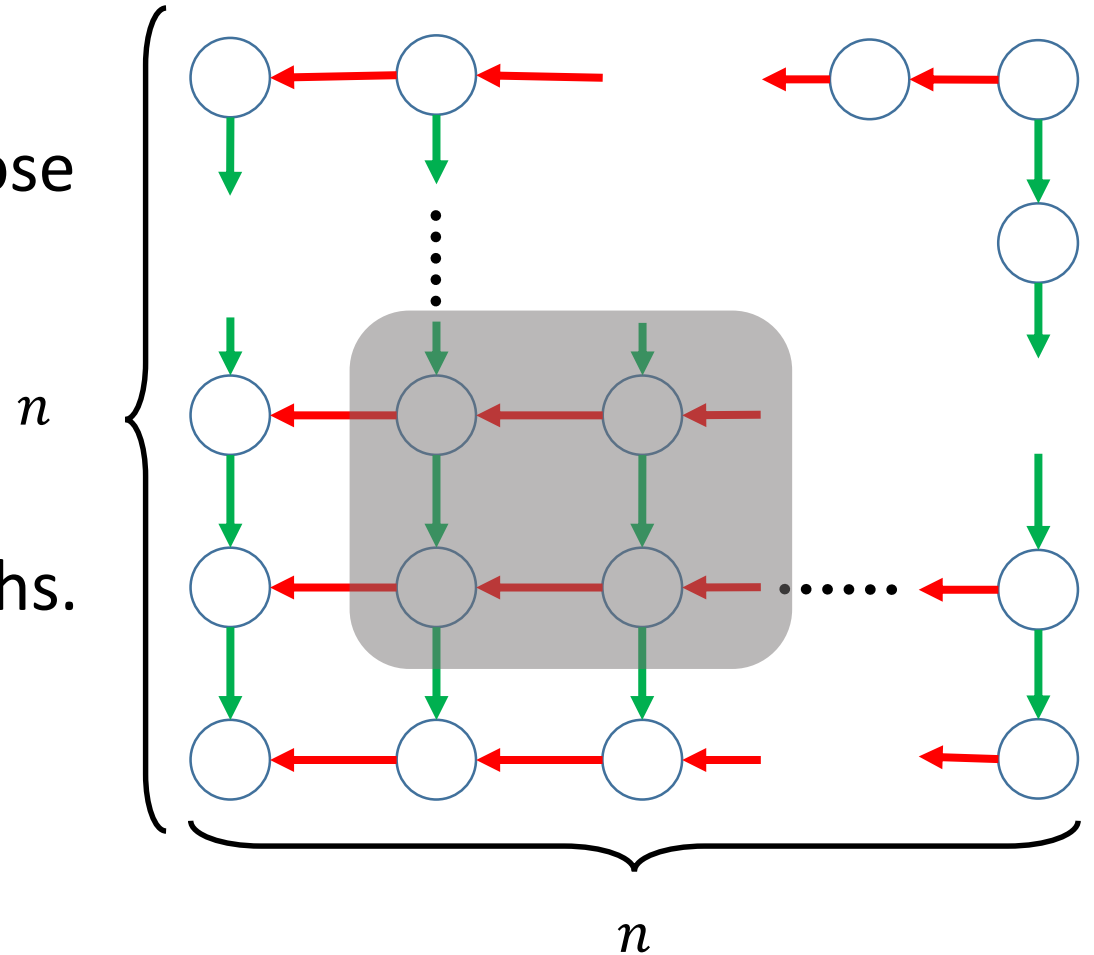
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Each man and each woman have a path P_i with all rotations containing that agent.

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- These paths cover all rotations.
- 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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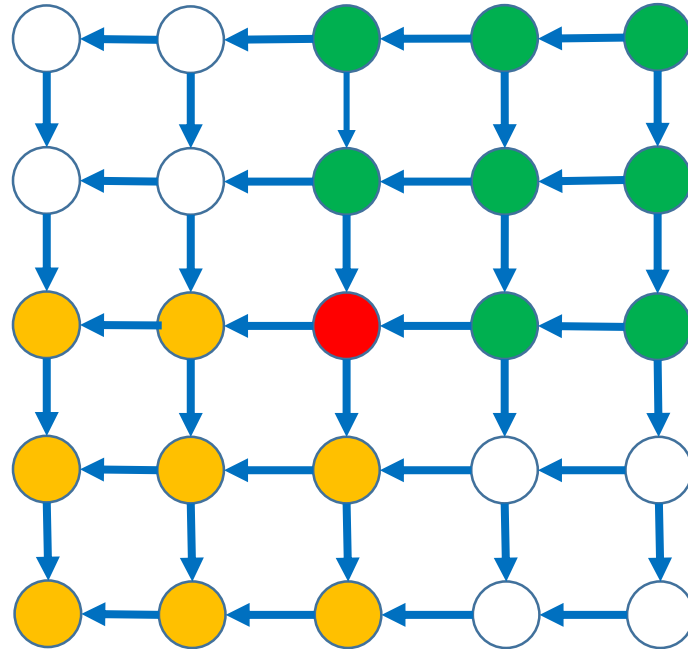
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Main Idea: Critical Nodes

A node is α -critical if it dominates and is dominated by at least α nodes.

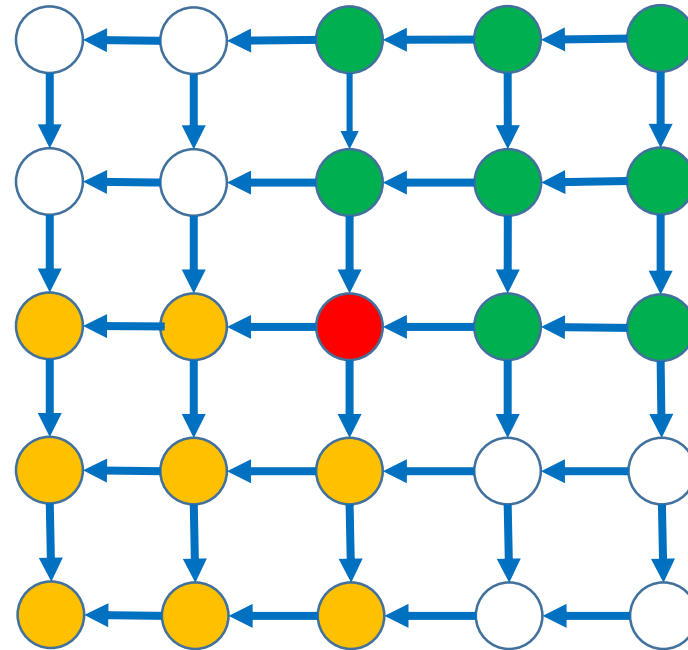
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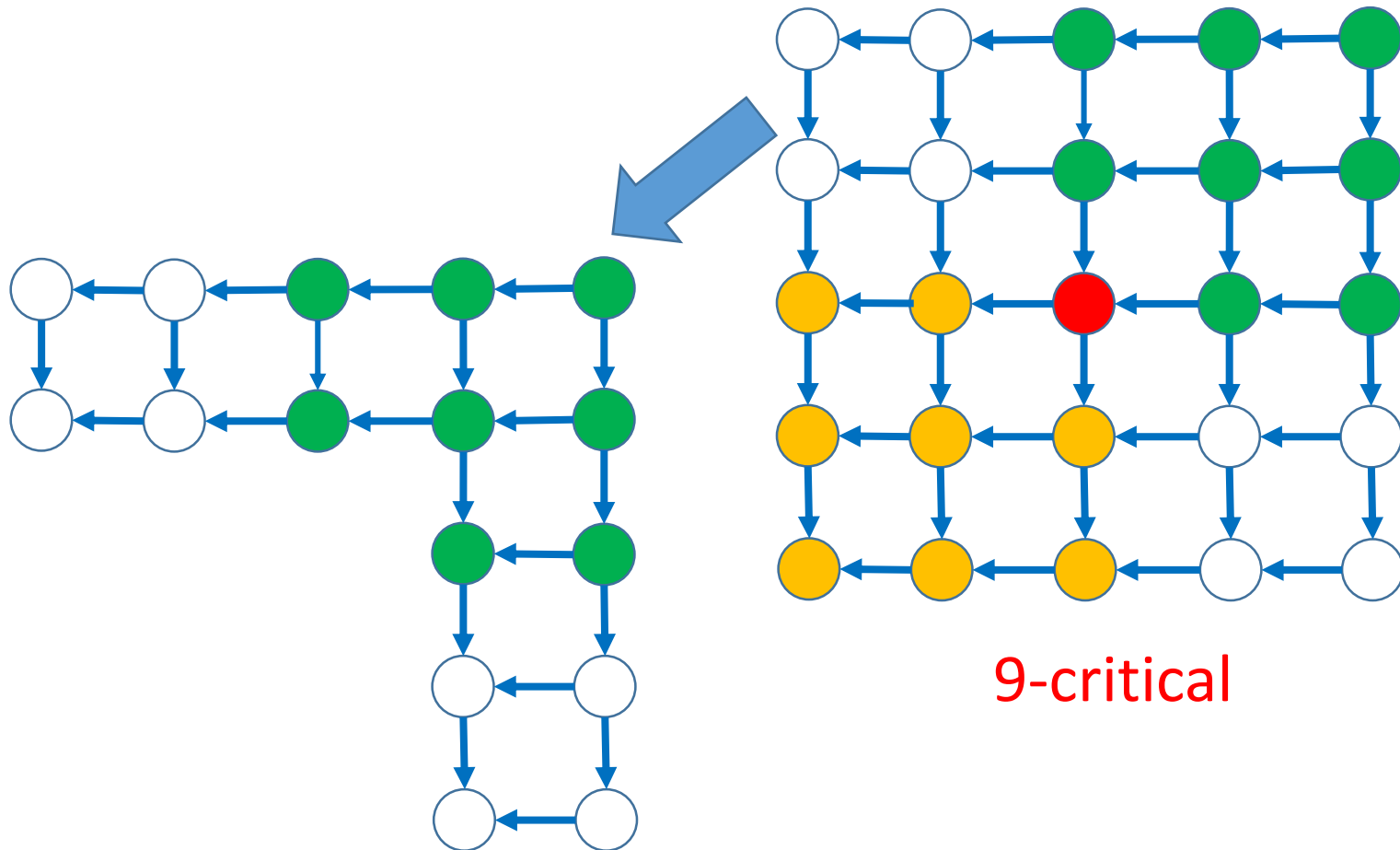


9-critical

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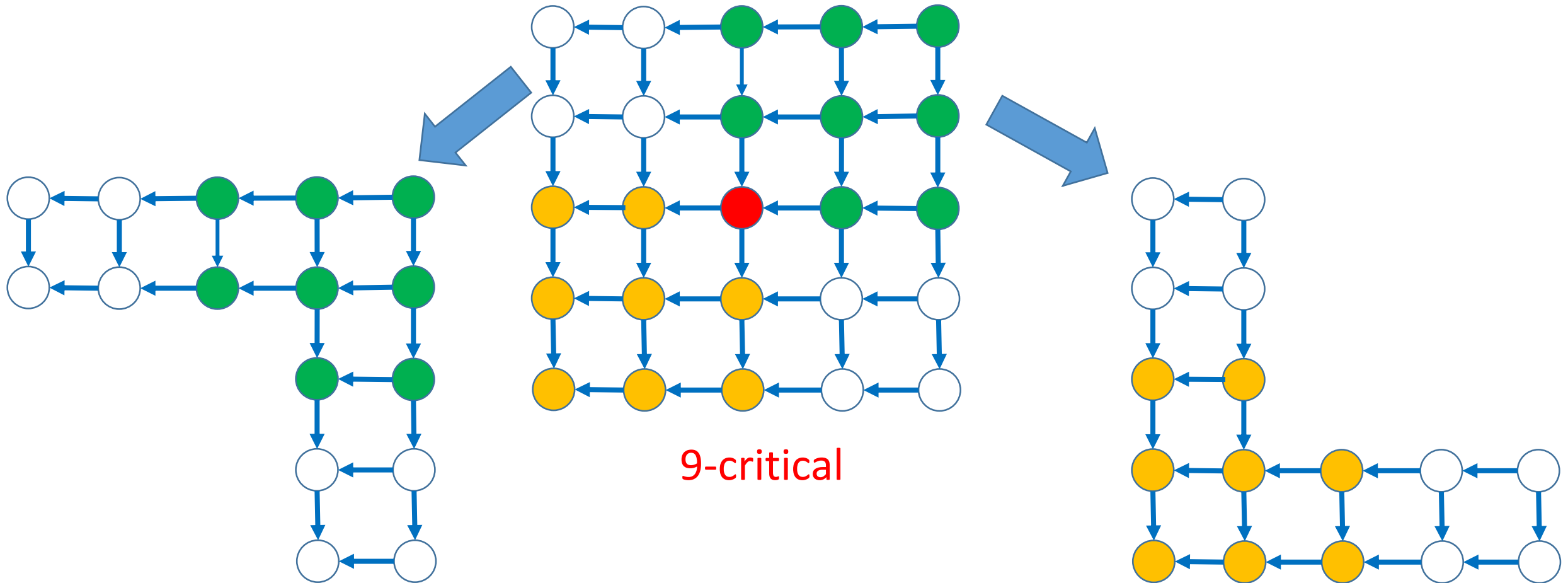
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Critical Nodes \Rightarrow Main Theorem

$$T(|V|) \leq \begin{cases} 2T(|V| - \alpha) & \text{if } |V| > k \\ 2^k & \text{if } |V| \leq k \end{cases}$$

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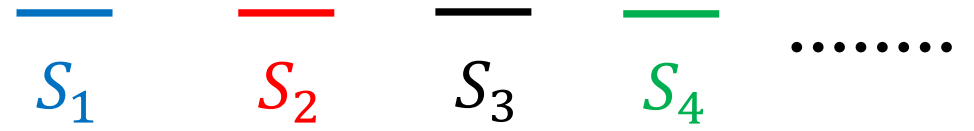
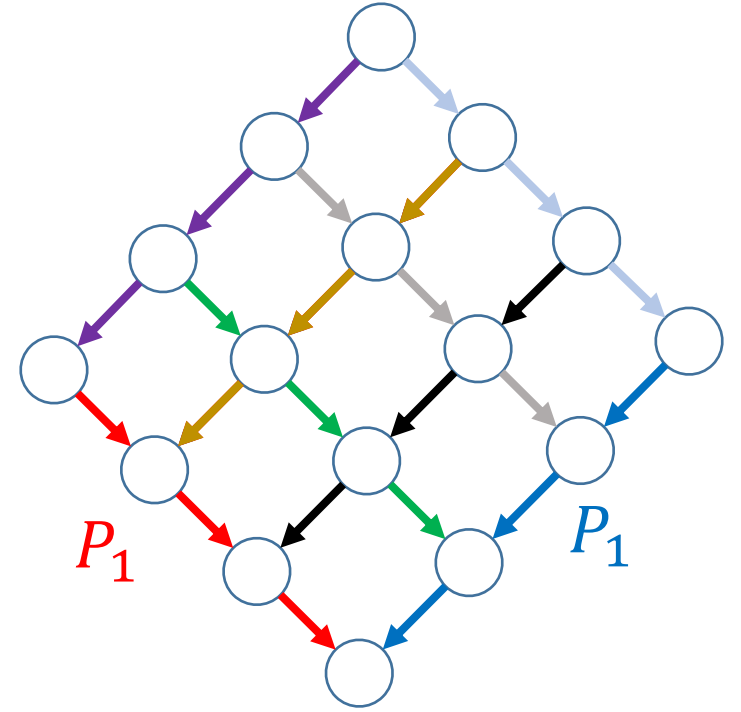
Unfolding the recurrence leads to a geometric series.

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

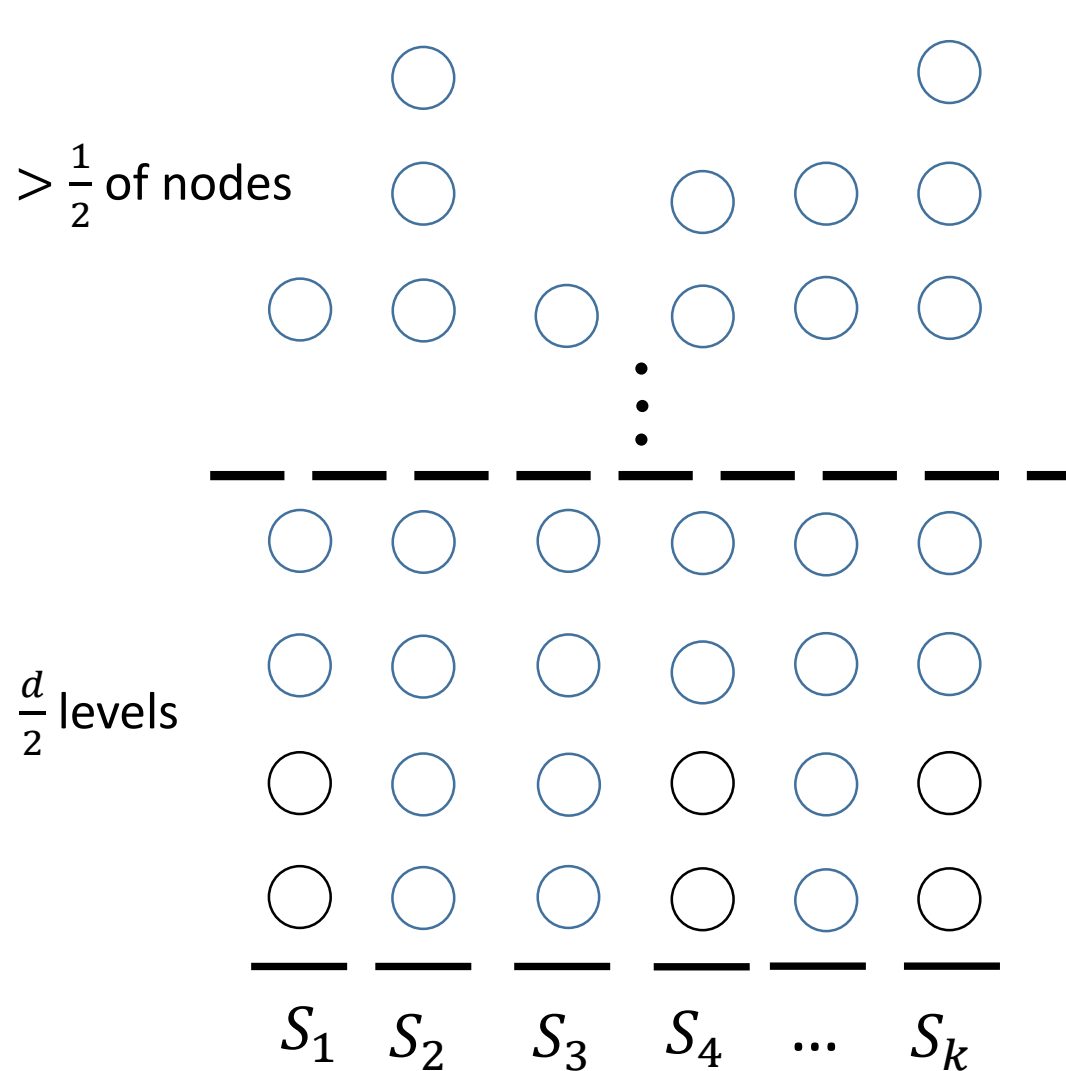
Constructing Disjoint Subpaths

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



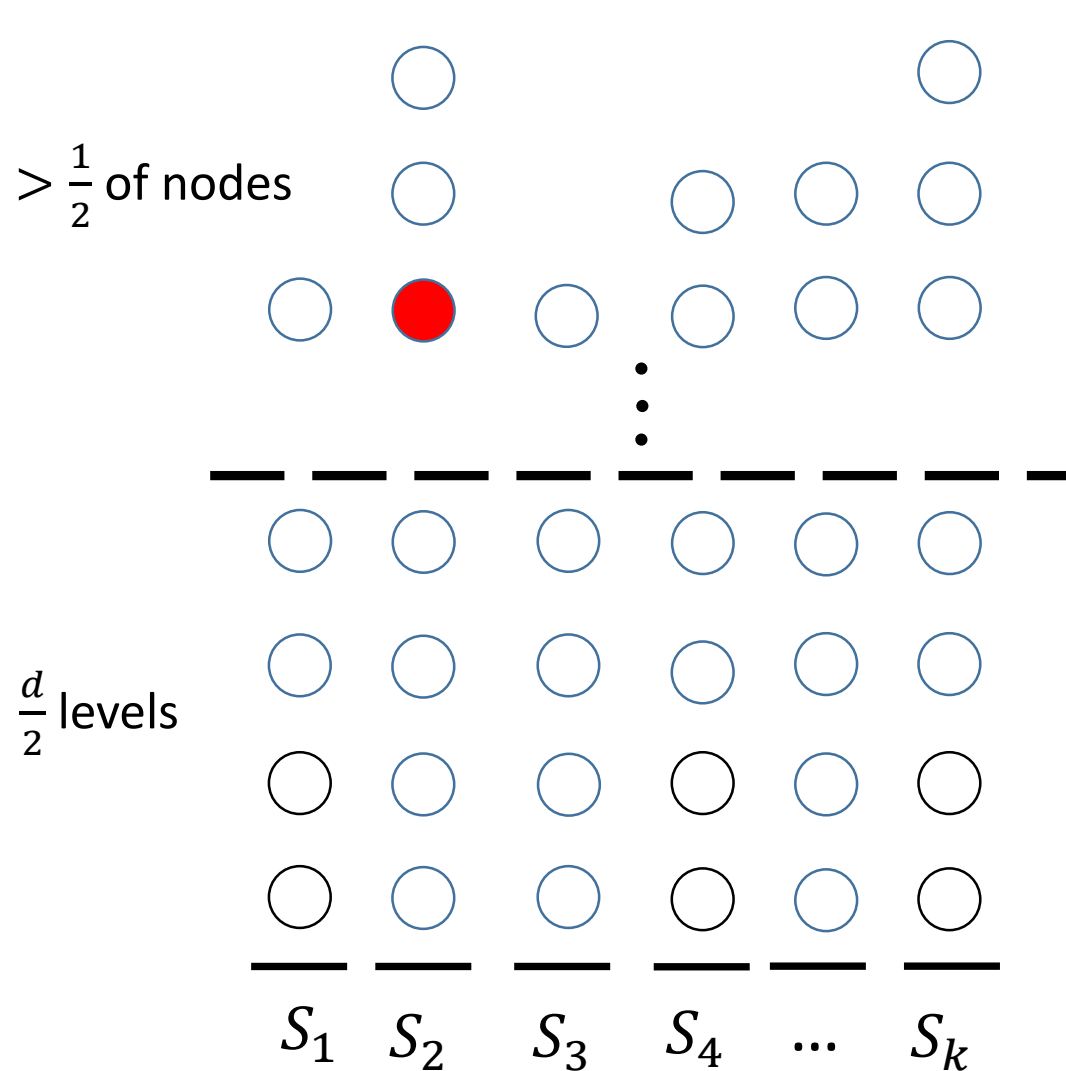
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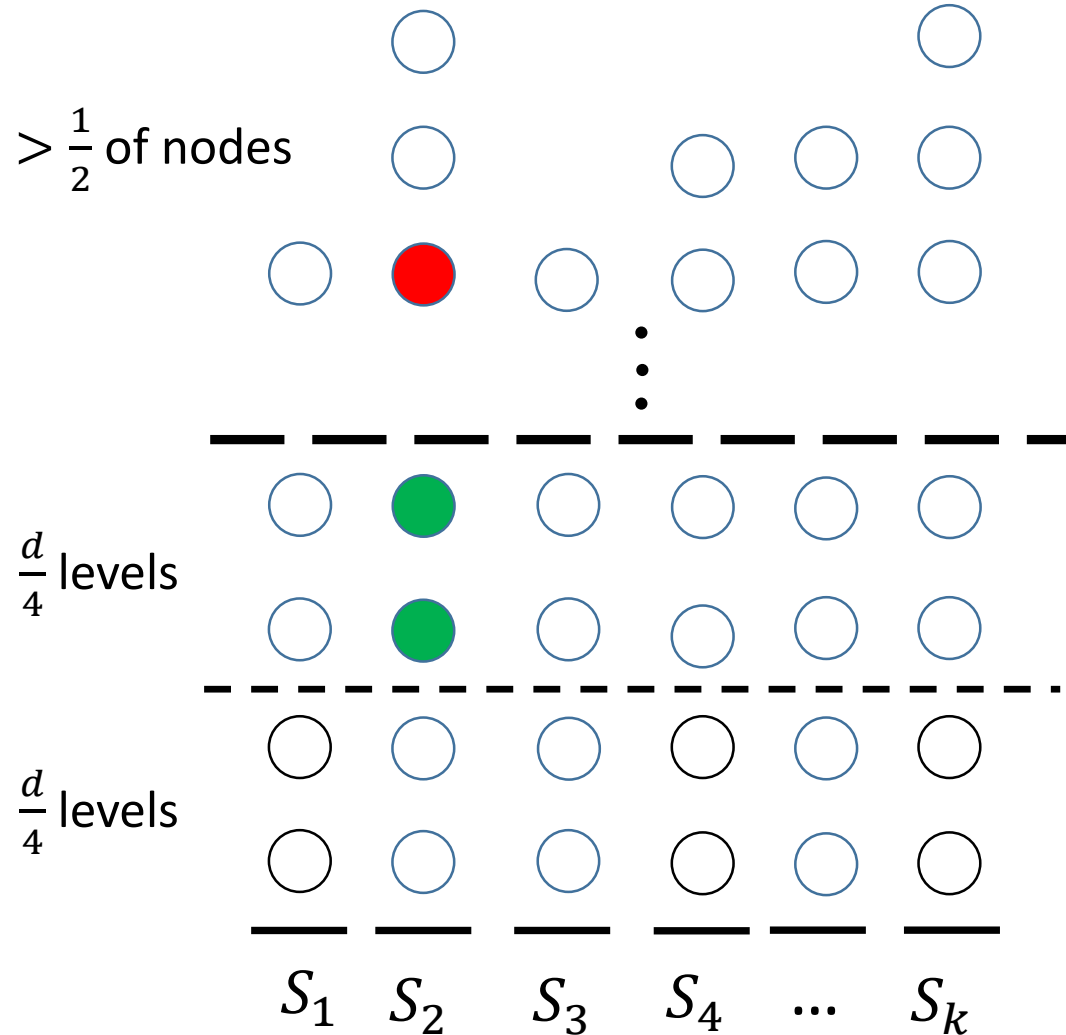
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Finding a half-Critical Node



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

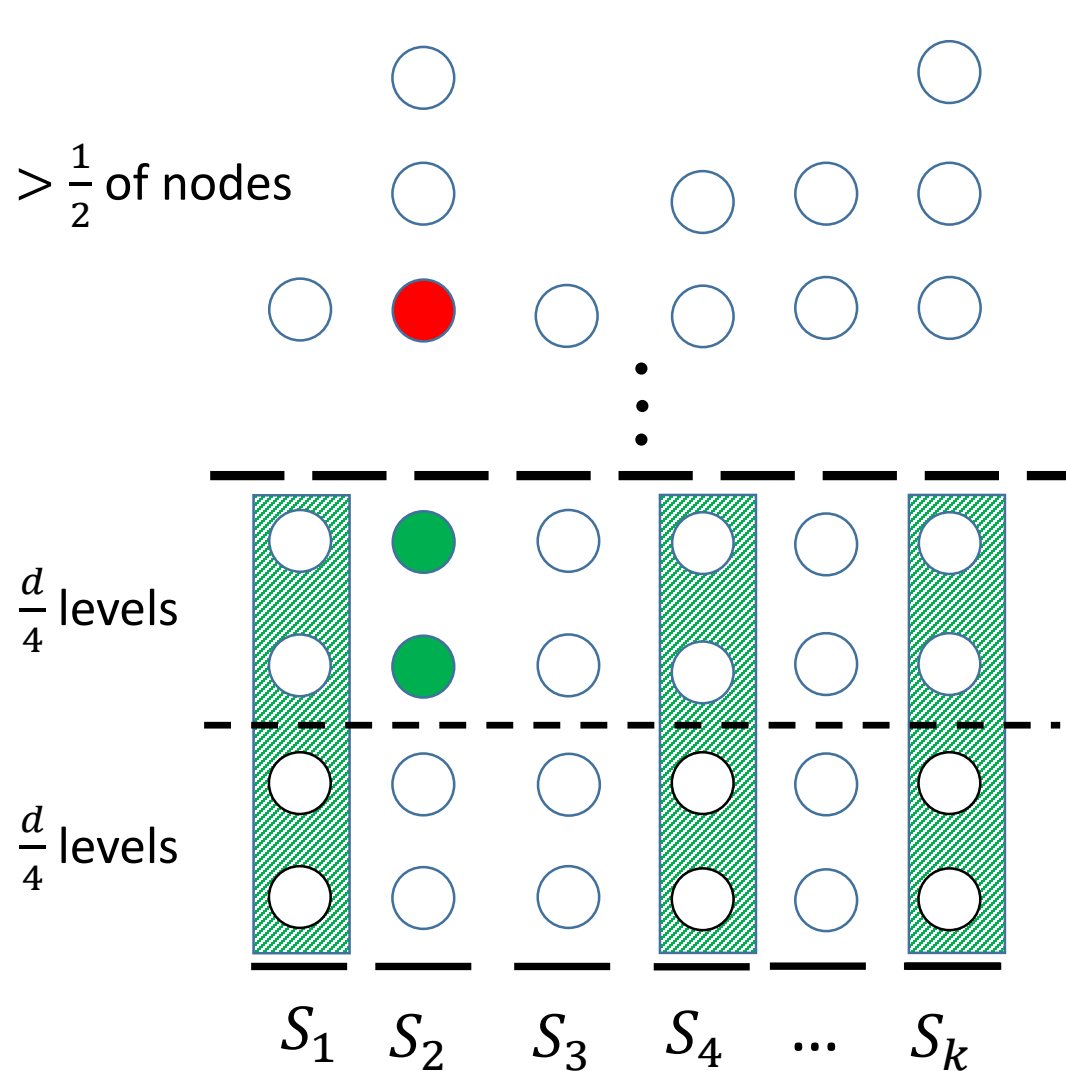
Partition: Define subpaths S_1, S_2, \dots, S_k such that:

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

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

- Red node dominates $d/4$ green nodes

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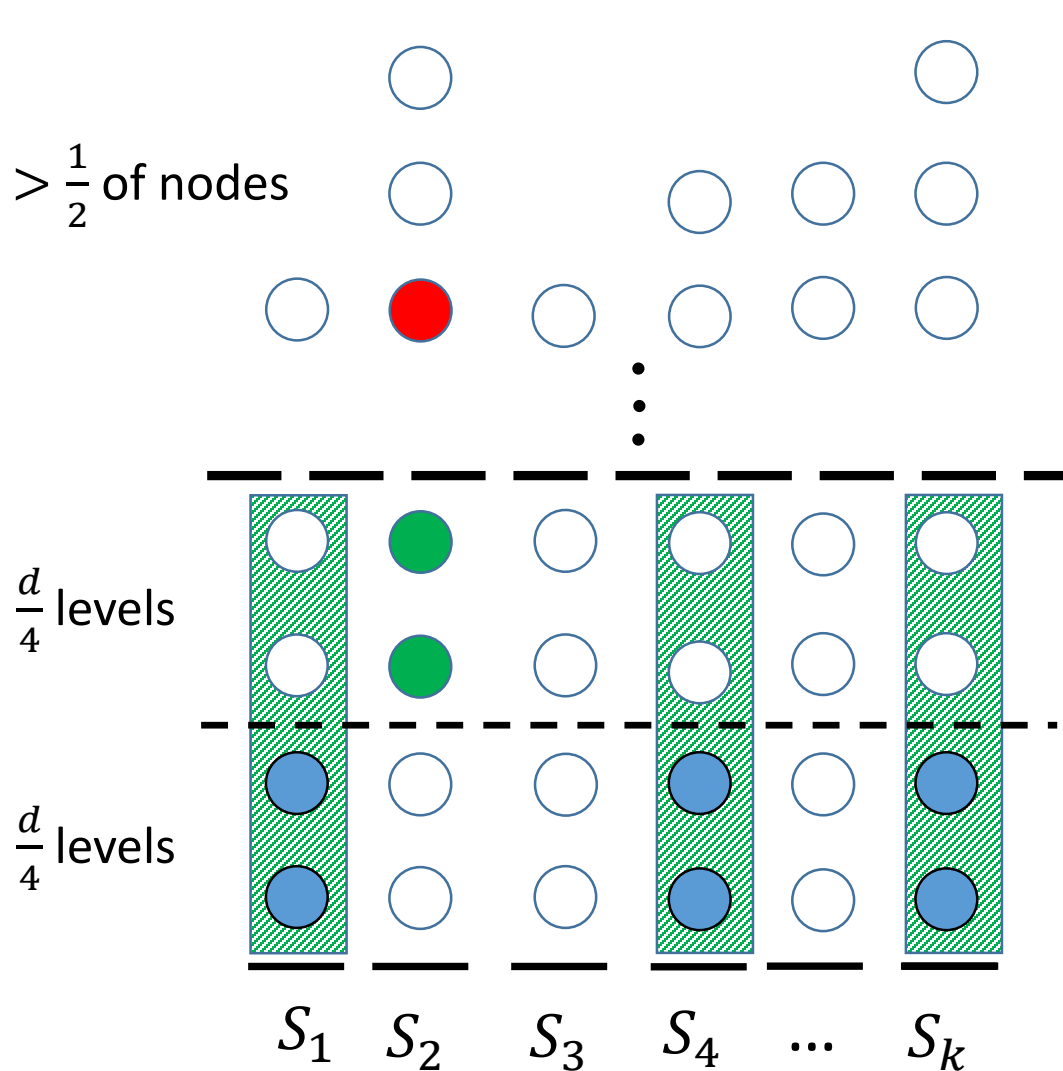
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- Red node dominates $d/4$ green nodes
- Green nodes mix, so belong to $\Omega(\sqrt{d})$ paths.

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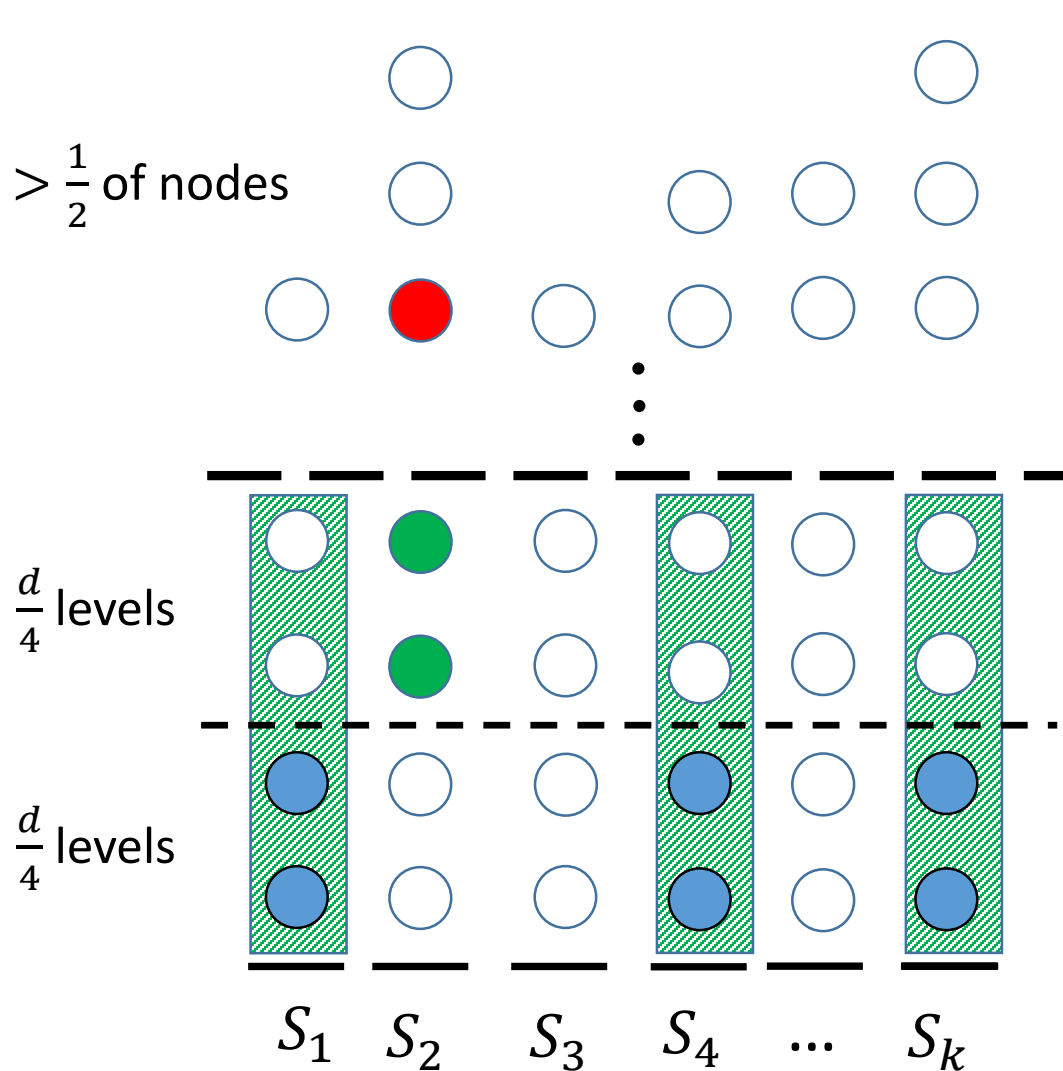
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Claim: Most nodes dominates $\Omega(d^{3/2})$ nodes.

- 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.

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- 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.

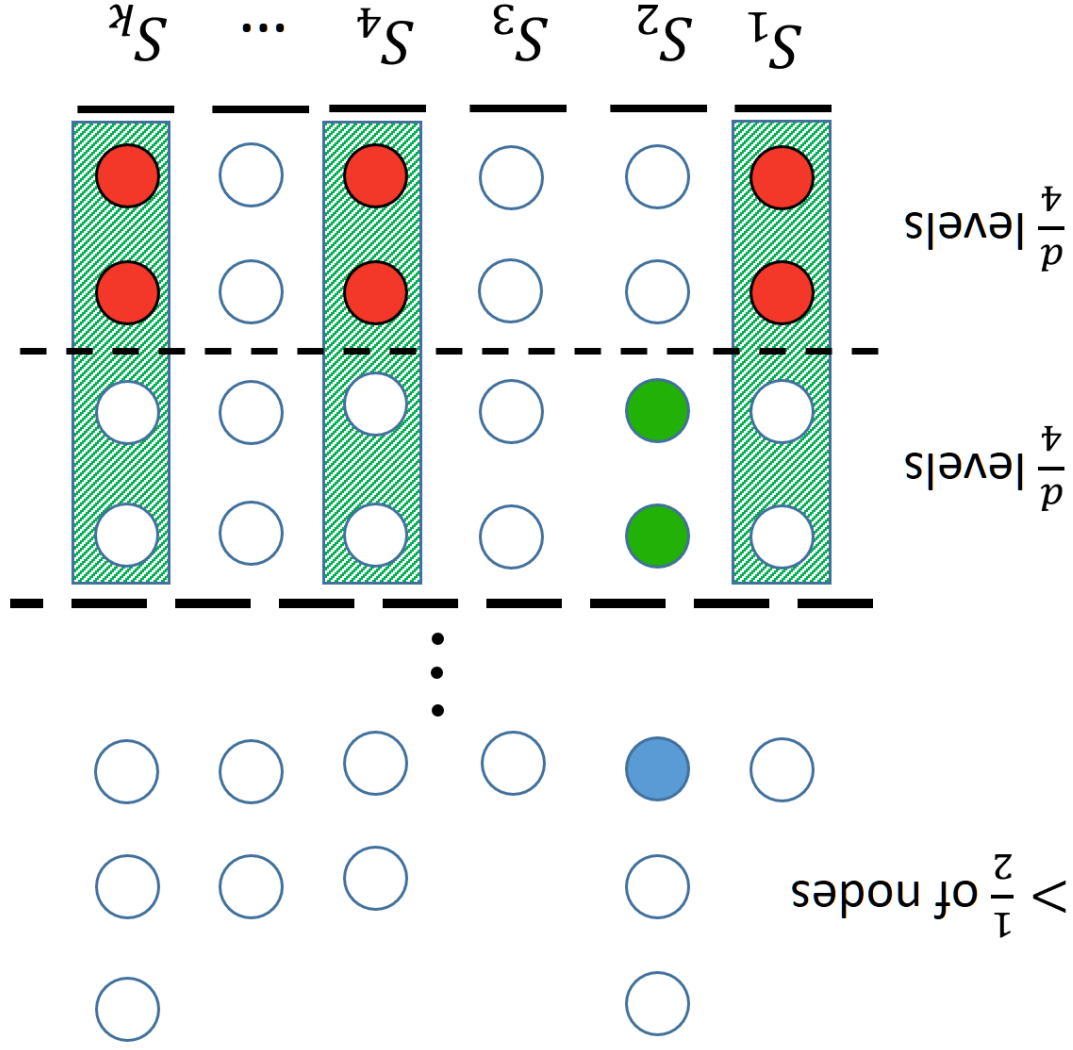
Finding a half-Critical Node

K-mixing: Every set U intersects $\sqrt{|U|}$ of paths P_1, \dots, P_k
 Define subchains S_1, S_2, \dots, S_k such that:

- Each $S_i \subseteq P_i$.
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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.

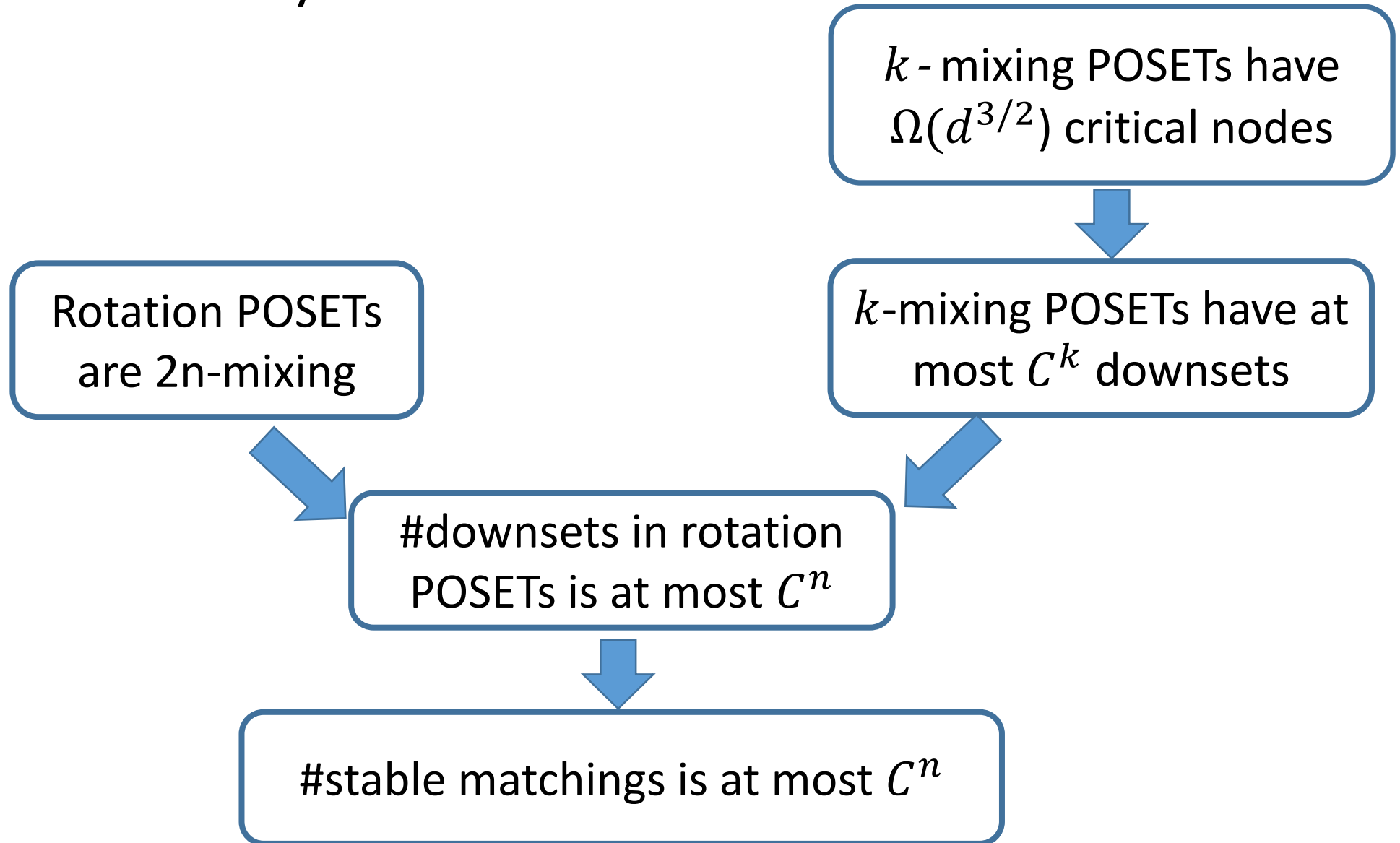
Most nodes dominate $\Omega(d^{3/2})$ nodes.

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]
 - General case equivalent to
 - #Downsets of a POSET
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Any questions?