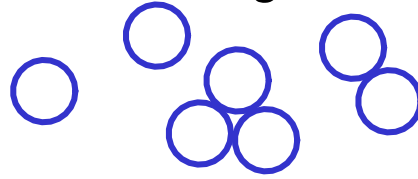


EXAMPLES OF USING THE PROBABILISTIC METHOD

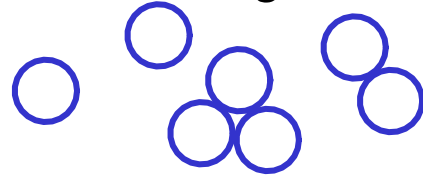
CONTENTS:

- 1) covering points with disks
- 2) Ramsey numbers
- 3) tournaments
- 4) large bipartite subgraphs
- 5) large independent sets
- 6) large dominating sets
- 7) 2-coloring n -uniform hypergraphs

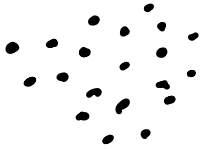
Game: • player 2 has an infinite number of unit-radius coins
that may be placed anywhere in the plane without overlap



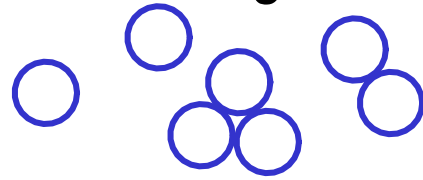
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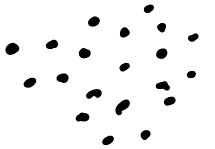
1) player 1 knows the coin size and
can draw K points in the plane



Game: • player 2 has an infinite number of unit-radius coins
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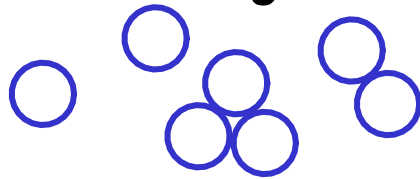


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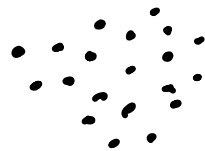


2) player 2 wins by covering all k points with coins.
If not possible, then player 1 wins.

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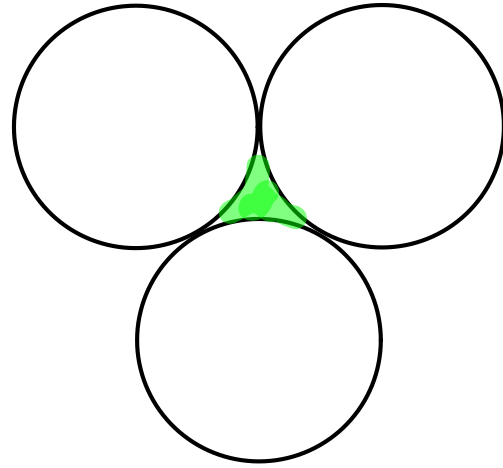


2) player 2 wins by covering all k points with coins.
If not possible, then player 1 wins.

For what k does each player win?

Large k : points can't be covered

↳ Just pack densely



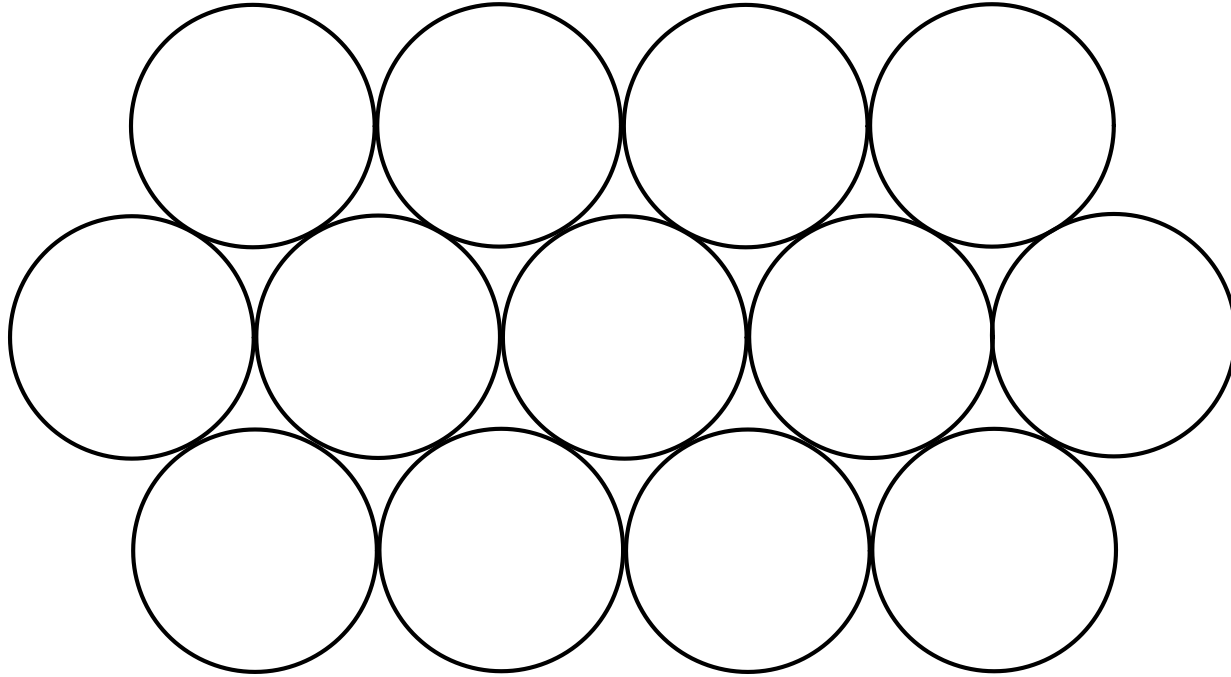
Unavoidable gap

45 points suffice for player 1 to win

Suppose $k=10$. Player 1 gets to place 10 points

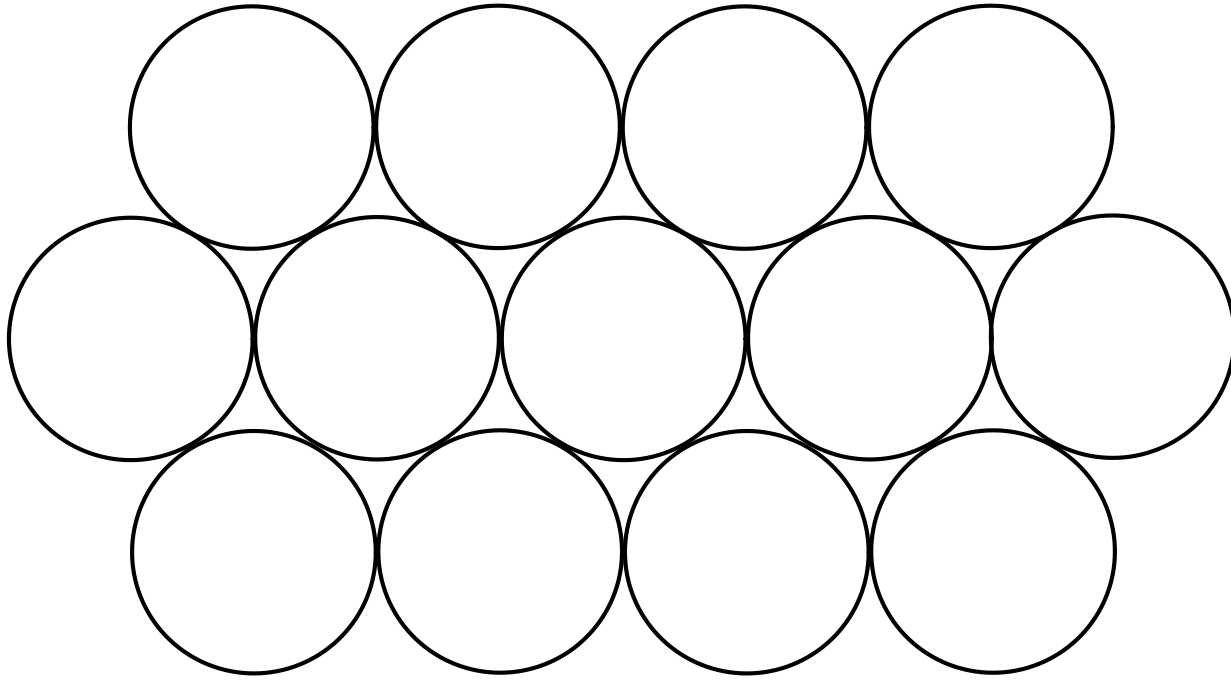
Suppose $k=10$. Player 1 gets to place 10 points

Player 2 strategy: place ∞ coins in packed formation



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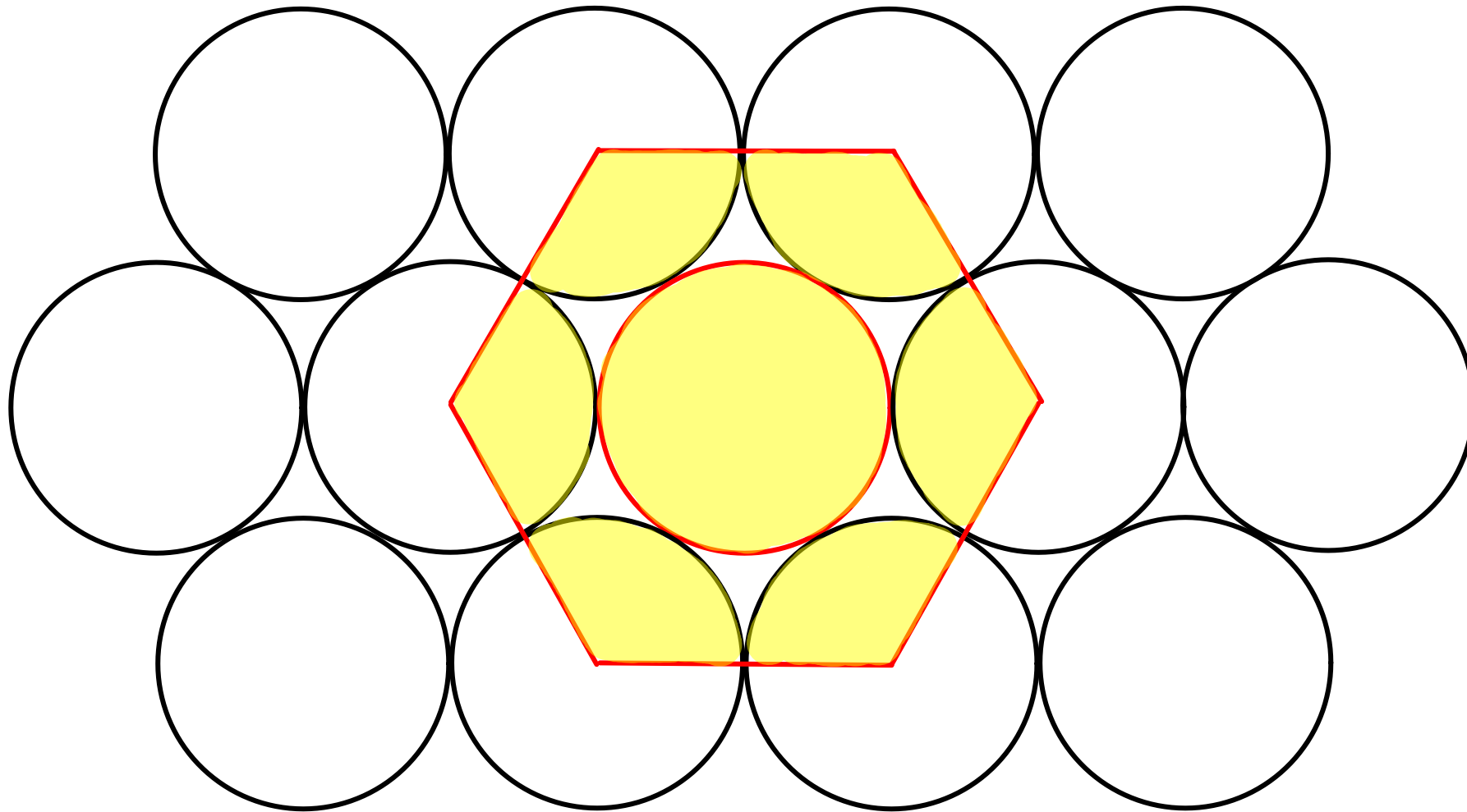
Player 2 strategy: place ∞ coins in packed formation



Claim: some shift of this pattern will cover all points!

→ ≤ 10 coins actually required

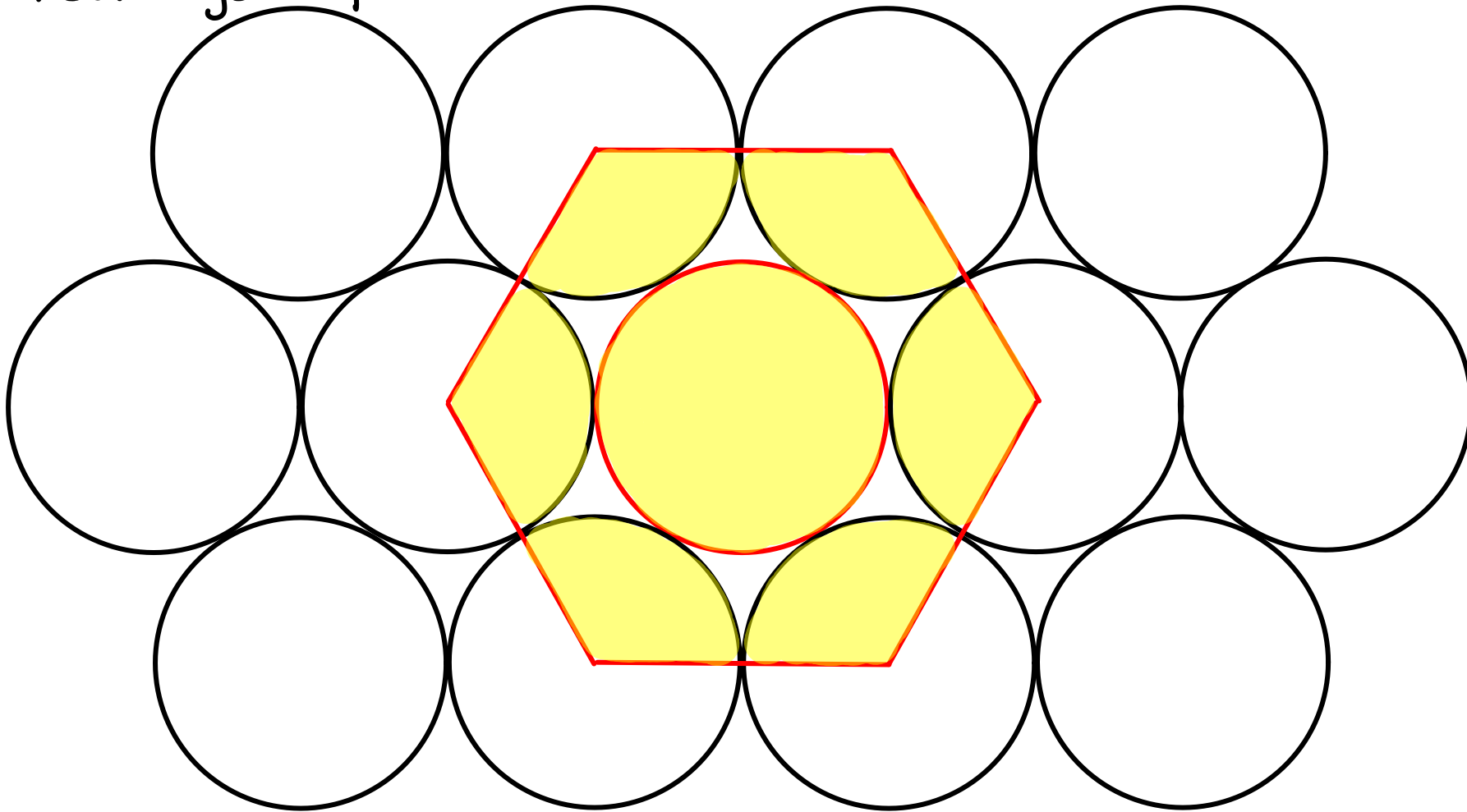
Hexagon tiles the plane.



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Hexagon density ~ 0.9069

↳ coverage of plane

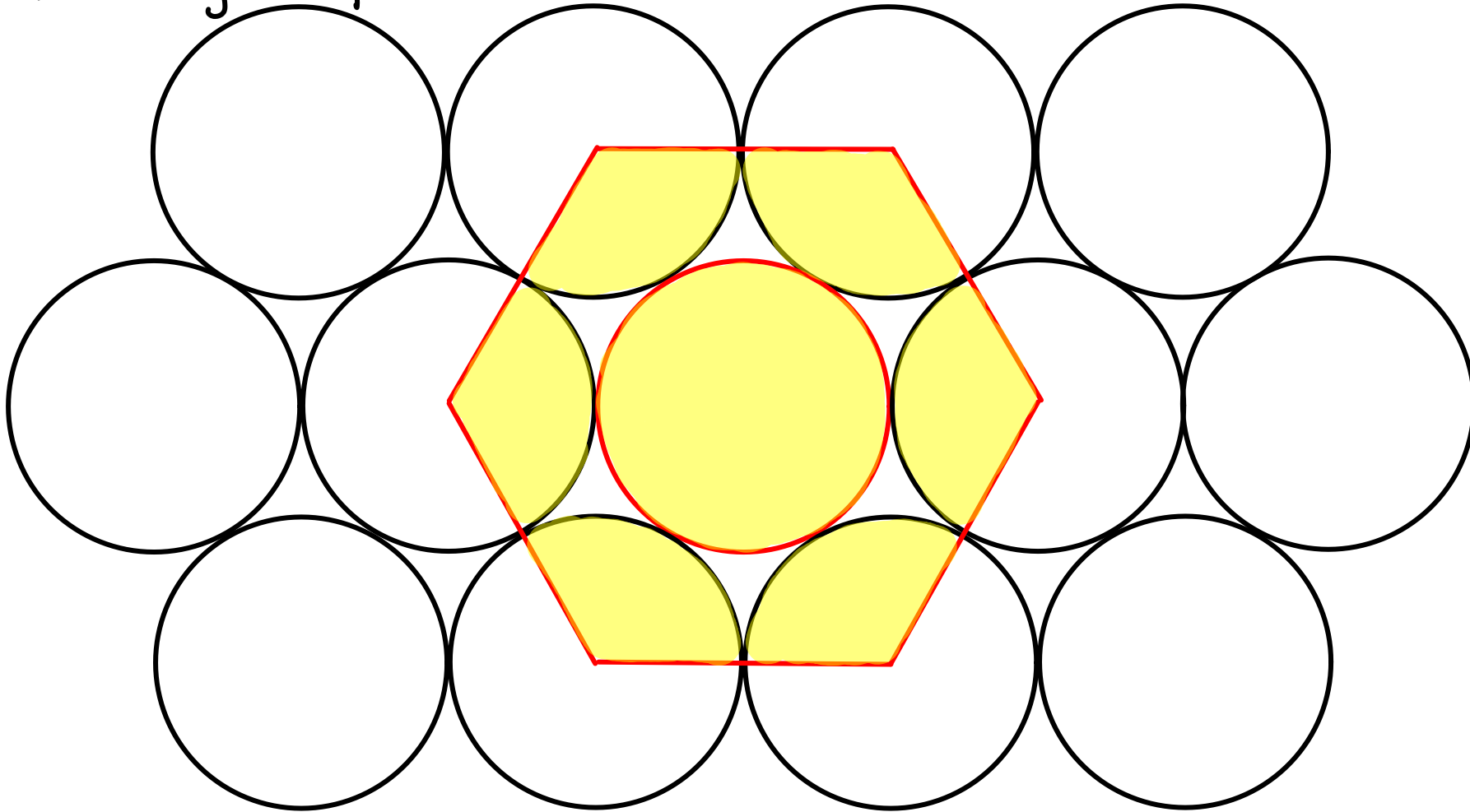


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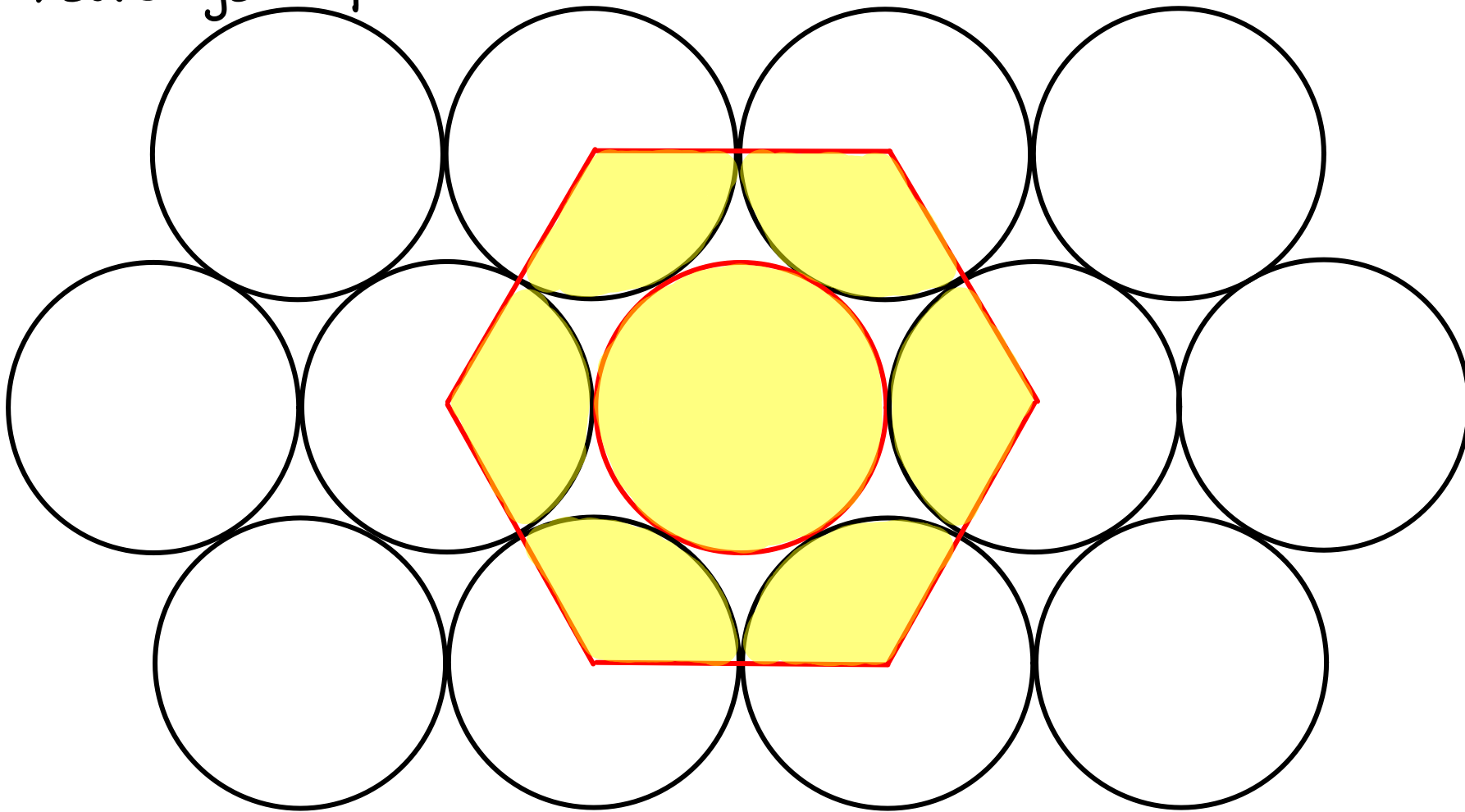
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Every point gets covered with probability > 0.9



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For 10 points, $E[\text{covered points}] > 9$ (IRV)



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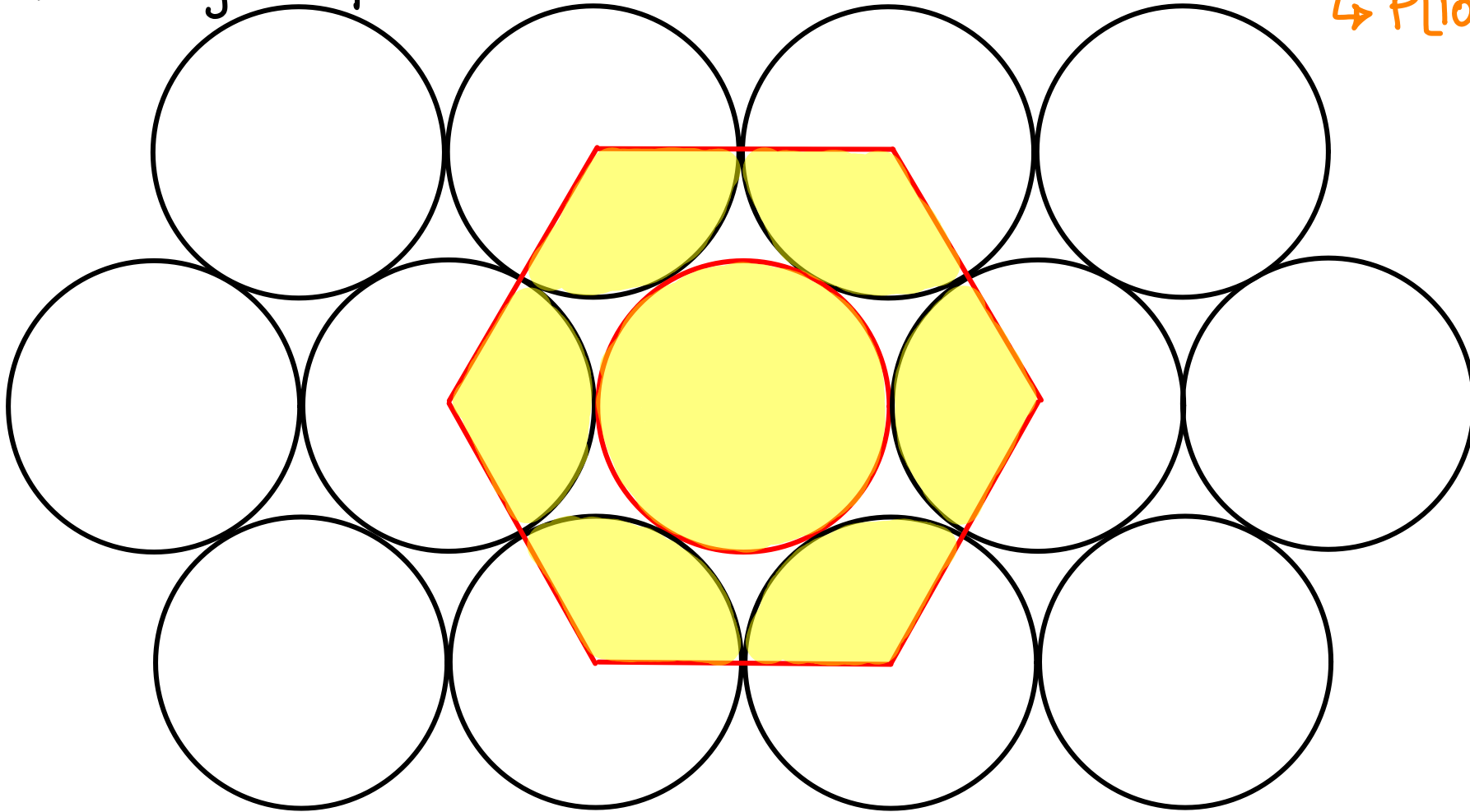
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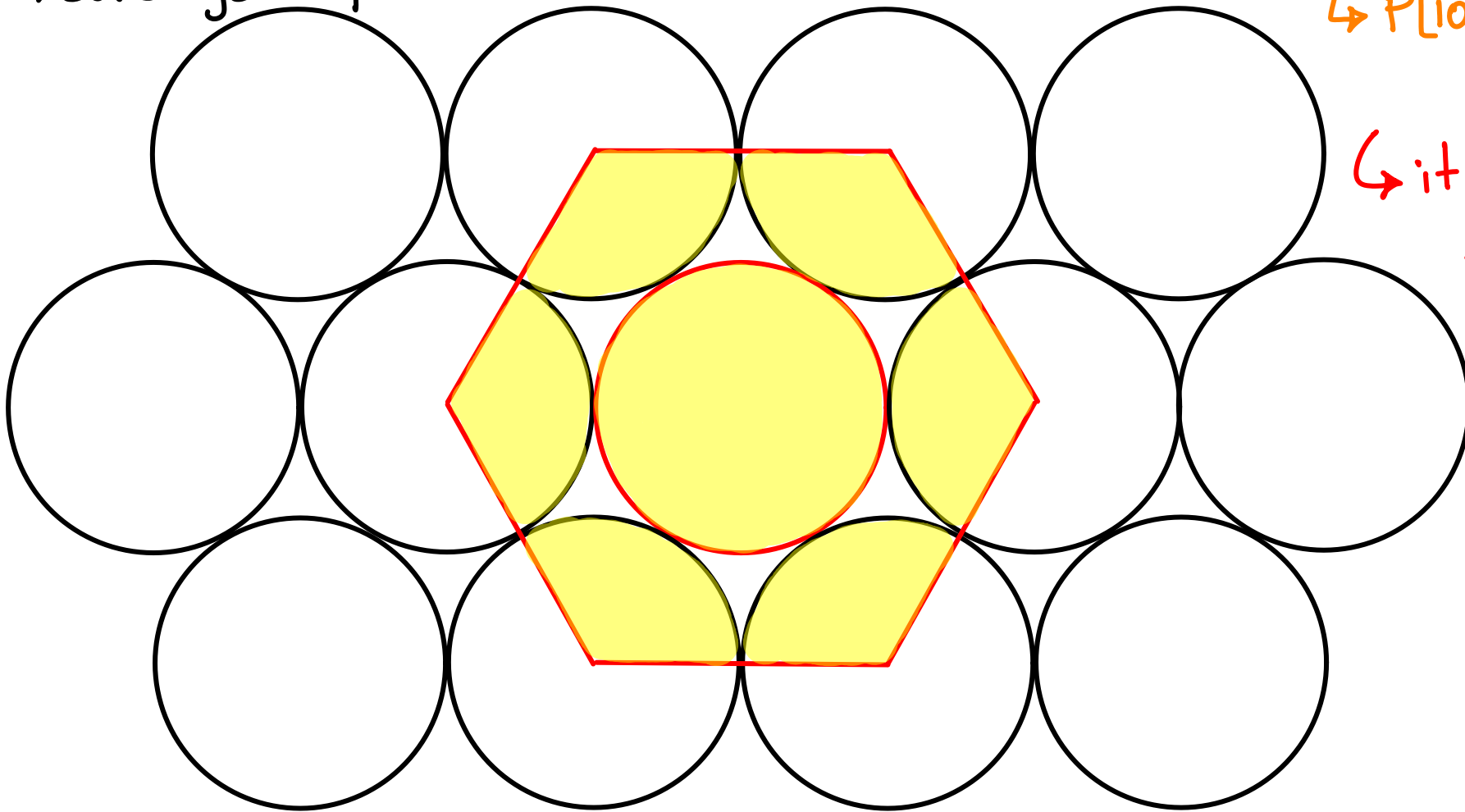


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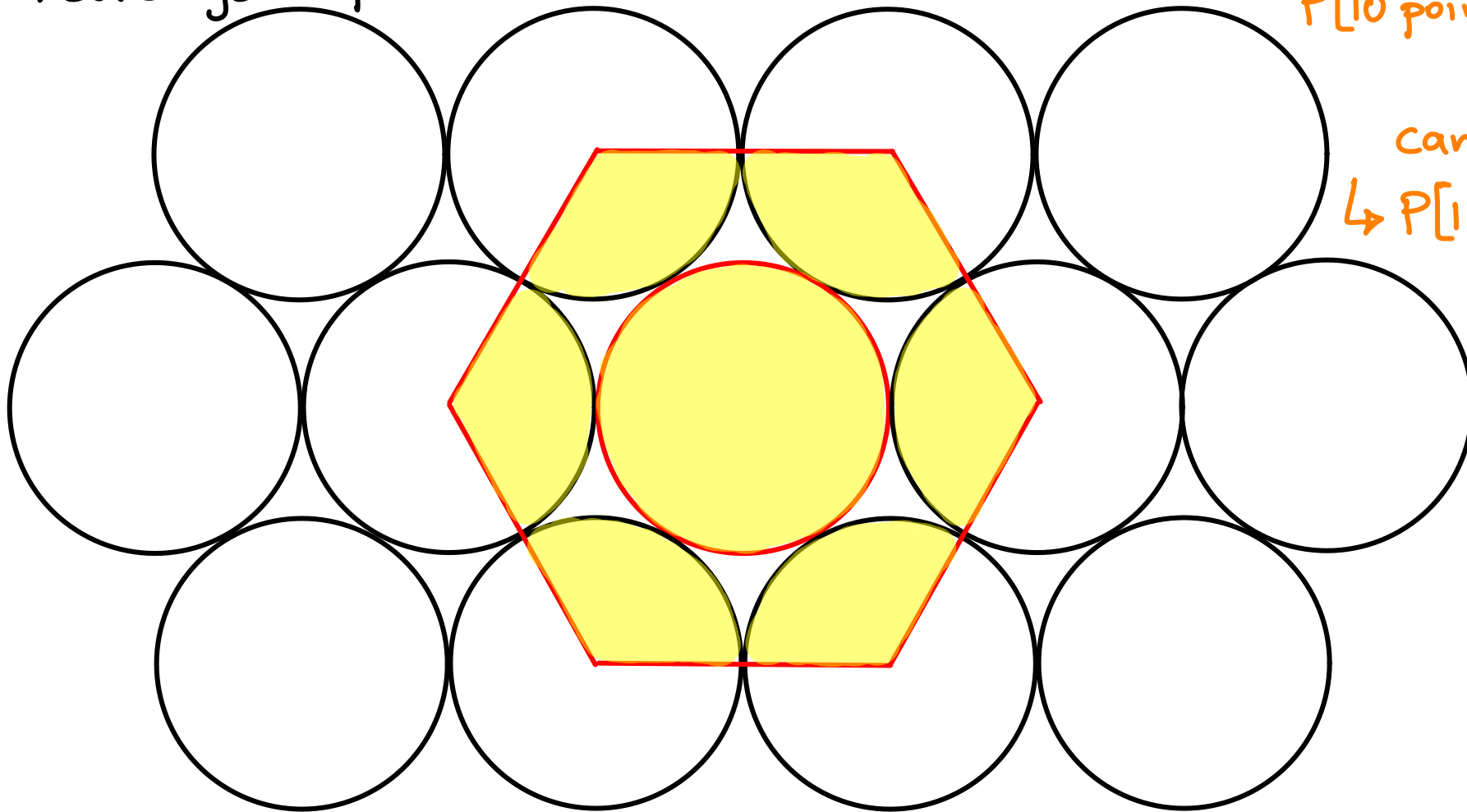
↳ it is always possible to cover all 10 !



Hexagon tiles the plane.
Hexagon density ~ 0.9069
↳ coverage of plane

Every point gets covered with probability > 0.9
For 11 points, $E[\text{covered pts}] > 0.9069 \cdot 11 \approx 9.98$

$P[10 \text{ points are covered}] > 0$
but
cannot conclude
↳ $P[11 \text{ points are covered}] > 0$



Given $c \geq 3$, how large must n be so that every graph with n vertices contains a clique of size c or an independent set of size c ?



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Equivalent: how large must n be so that for every 2-coloring of the edges of K_n there is a monochromatic K_c ?

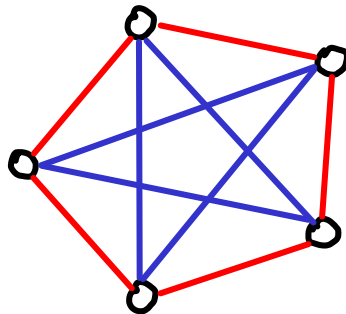
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→ color every edge red or blue → creates a red K_c or a blue K_c

e.g.: $c=3$



$\Rightarrow n \geq 5$

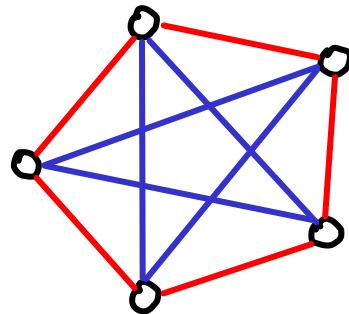
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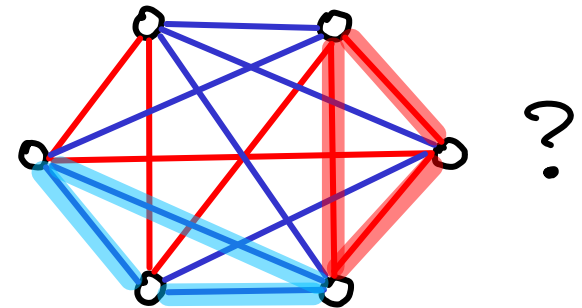
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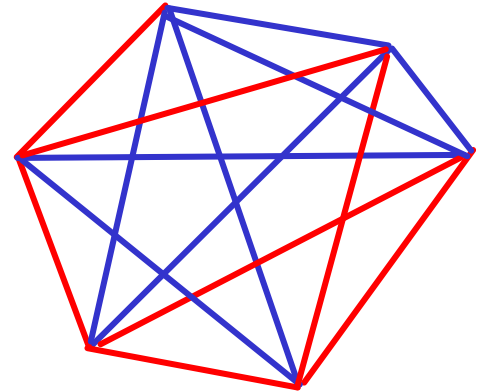
$$\# \text{ c-cliques in } K_n = \binom{n}{c}$$

$$\# \text{ edges in c-clique} = \binom{c}{2}$$

c -cliques in $K_n = \binom{n}{c}$

#edges in c -clique = $\binom{c}{2}$

Color every edge of K_n randomly: $P(\text{red}) = P(\text{blue}) = \frac{1}{2}$



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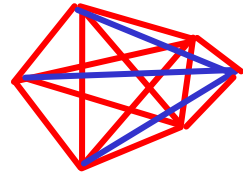
Given any K_c , $P(K_c = \text{all red}) = P(K_c = \text{all blue}) = ?$

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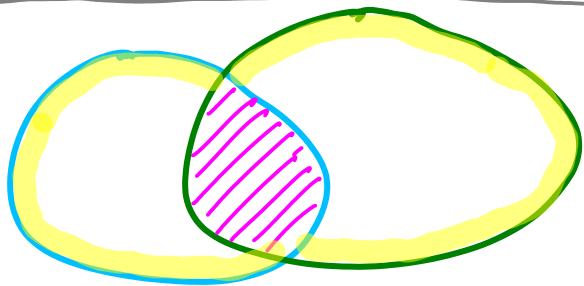
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$$\rightarrow P(A \vee B) \leq P(A) + P(B)$$

$$P(A \vee B) = P(A) + P(B) - P(A \cap B)$$

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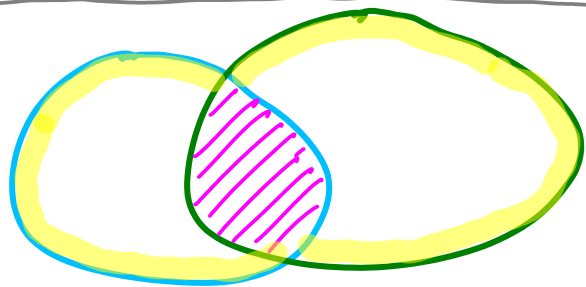
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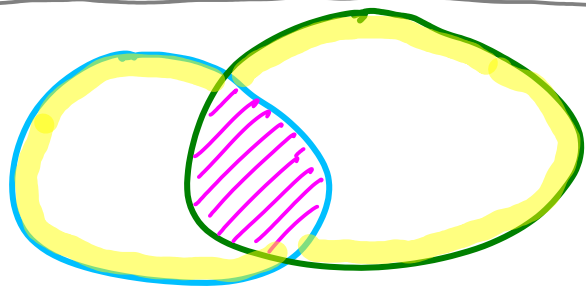
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...

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$$\underbrace{\binom{n}{c}}_{\text{pink}} \cdot 2 \cdot \left(\frac{1}{2}\right)^{\binom{c}{2}} = 2 \cdot \underbrace{\frac{n!}{c!(n-c)!}}_{\text{pink}} \cdot \left(\frac{1}{2}\right)^{\frac{c \cdot (c-1)}{2}}$$

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$$< \underbrace{2 \cdot \frac{n^c}{c!}}_{\text{orange}} \cdot \underbrace{\left(\frac{1}{2}\right)^{\frac{c^2}{2}} \cdot 2^{c/2}}_{\text{pink}}$$

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if we set $n = 2^{c/2}$

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if we set $n = 2^{c/2}$

So if $n \leq 2^{c/2}$, $\exists$ graph without monochromatic K_c

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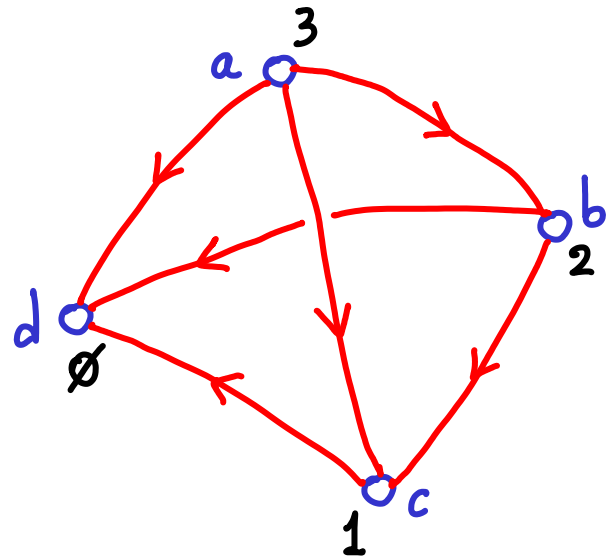
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So if $n \leq 2^{c/2}$, $\exists$ graph without monochromatic K_c

We need $n > 2^{c/2}$ to hope for guaranteed c -clique // certain if $n < \binom{2^c - 2}{c-1} = O(4^c)$

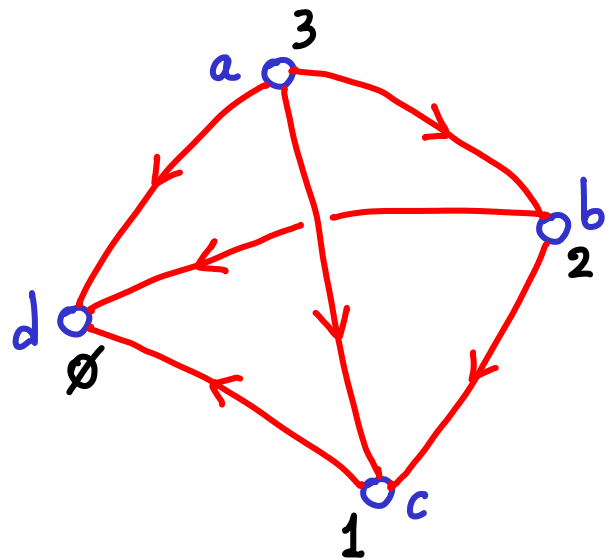
TOURNAMENTS

n players, everybody plays against everybody
(vertices)
(directed edge $\vec{xy}$: x beat y)



TOURNAMENTS

n players, everybody plays against everybody
(vertices) (directed edge $\vec{xy}$: x beat y)



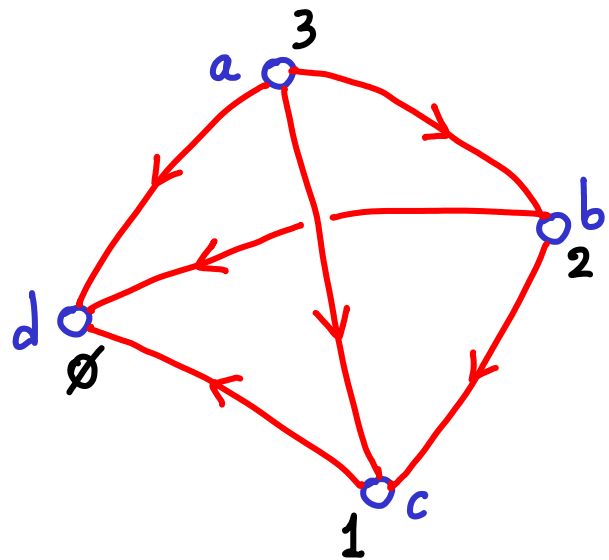
Wiki :

"many of the important properties of tournaments were first investigated... in order to model

...

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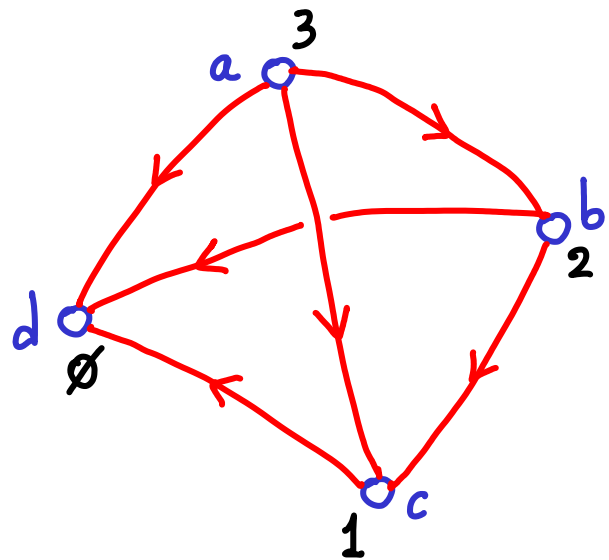


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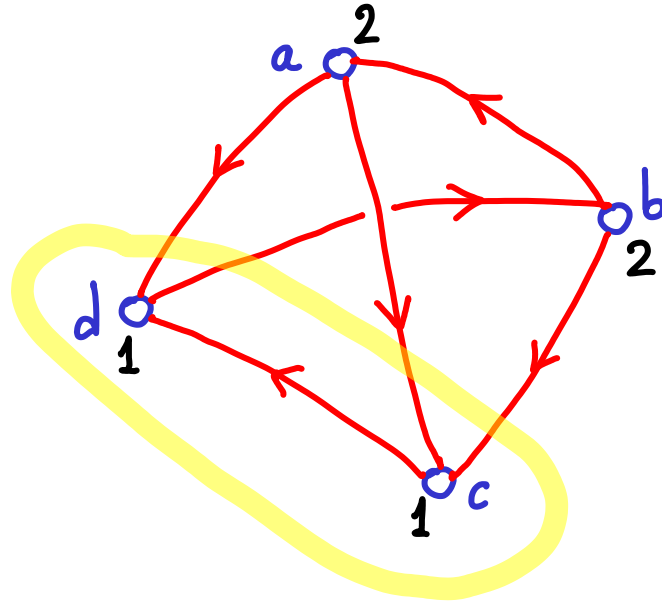
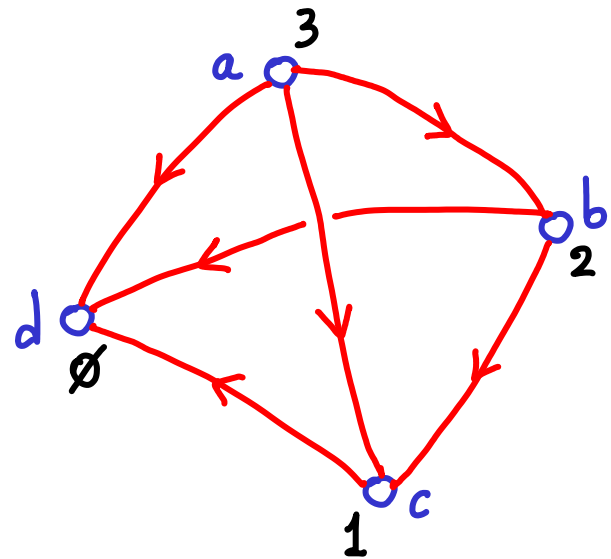
Wiki :

"many of the important properties of tournaments were first investigated... in order to model dominance relations in flocks of chickens"

perhaps more interesting: voting theory

TOURNAMENTS

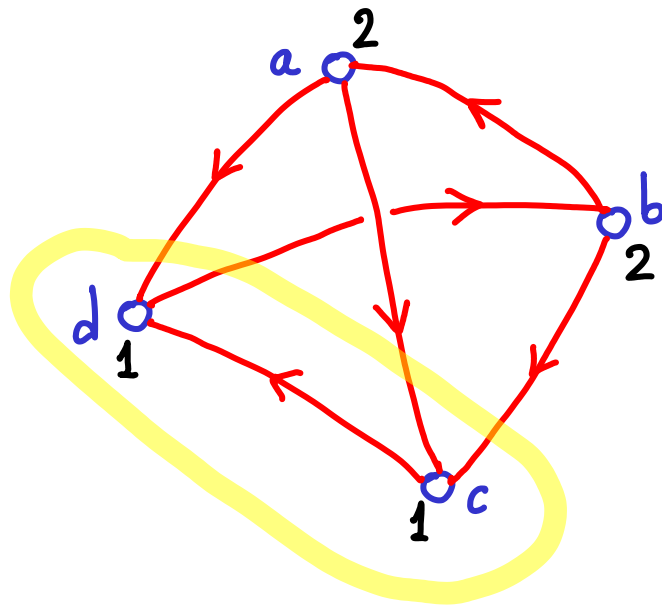
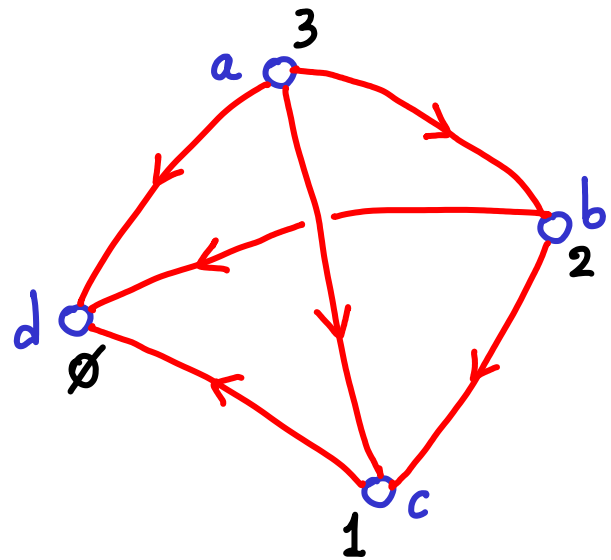
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c & d both lost to a

TOURNAMENTS

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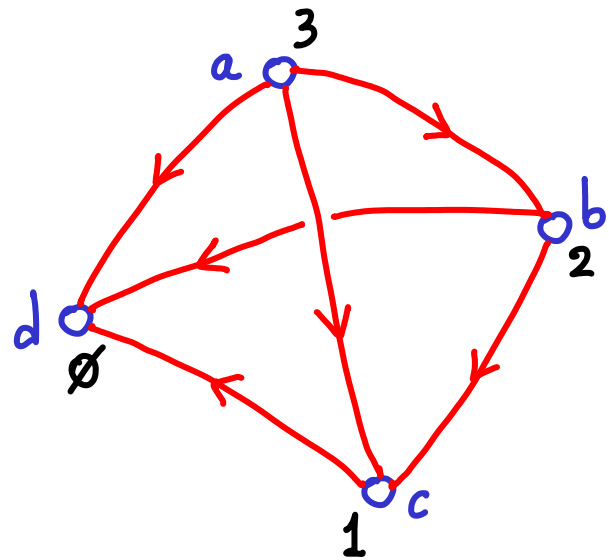


Is it possible for every pair of players to lose to a common opponent?

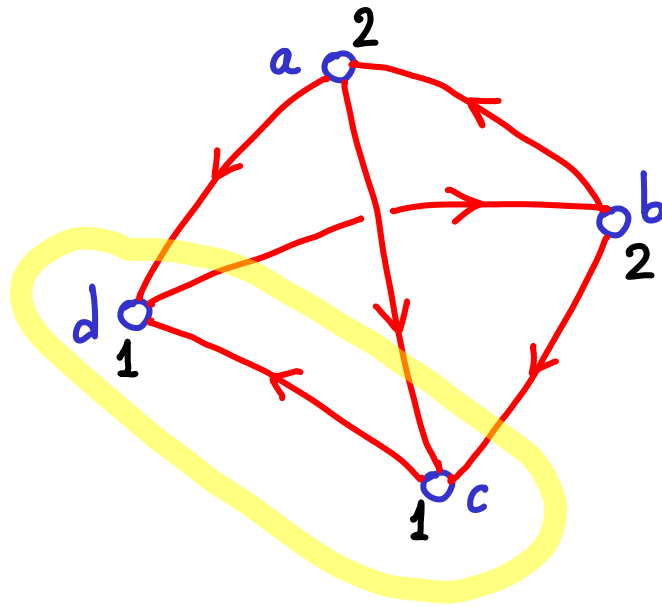
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TOURNAMENTS

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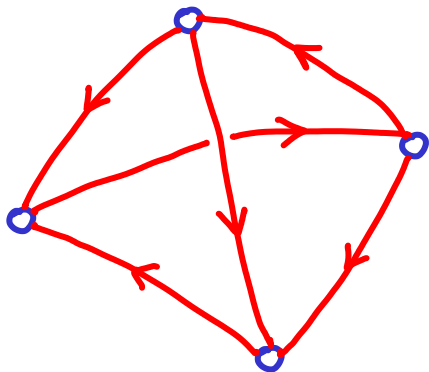
Is it possible for every pair of players to lose to a common opponent?

Can we assign directed edges s.t. for every $x, y \exists z$ s.t. $\overrightarrow{zx}$ & $\overrightarrow{zy}$?

paradoxical tournament

$$n=4$$

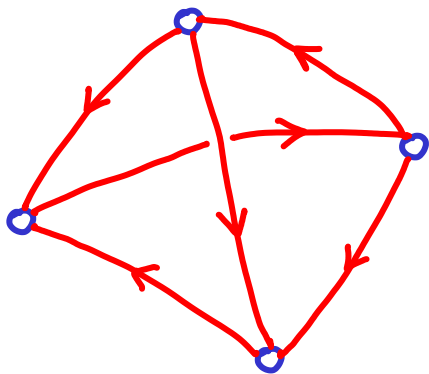
$\binom{n}{2} = 6$ edges : average #incoming edges per vertex = 1.5



$$n=4$$

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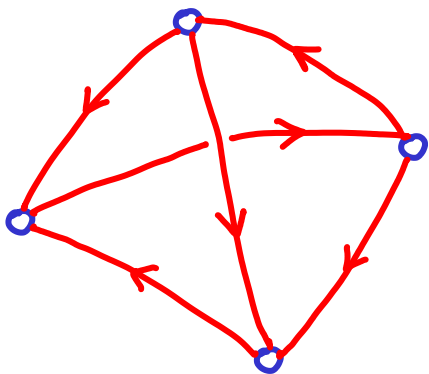
↳ $\exists$ vertex with ≤ 1 incoming edge



$$n=4$$

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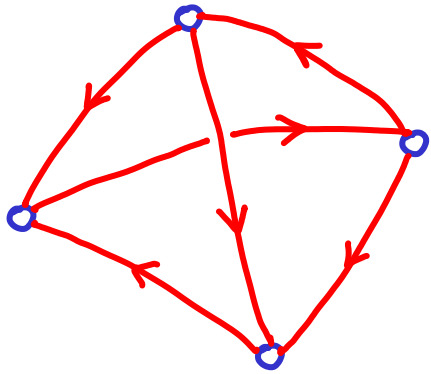
↳ $\exists$ vertex with ≤ 1 incoming edge



If only A beats B, then A must beat B, C & B, D
So A beats everyone : no paradoxical tournament

$n=4$

$\binom{n}{2} = 6$ edges : average #incoming edges per vertex = 1.5

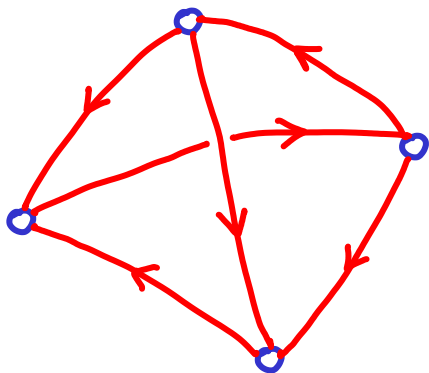


$\hookrightarrow \exists$ vertex with ≤ 1 incoming edge $\Rightarrow$ impossible
(for any n)

$n=4$

$\binom{n}{2} = 6$ edges : average #incoming edges per vertex = 1.5

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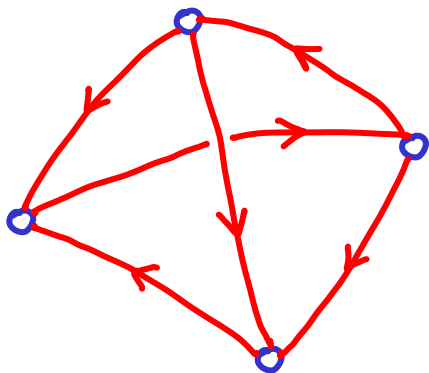


$n=5$, 10 edges, average 2 incoming/vertex.

$n=4$

$\binom{n}{2} = 6$ edges : average #incoming edges per vertex = 1.5

↳ $\exists$ vertex with ≤ 1 incoming edge $\Rightarrow$ impossible



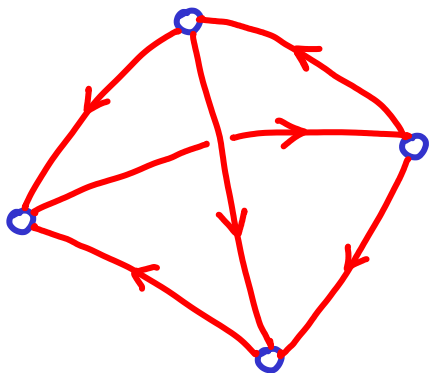
$n=5$, 10 edges, average 2 incoming/vertex.

we know: exactly 2 incoming/vertex
otherwise $\exists$ vertex w/ 1 incoming

$n=4$

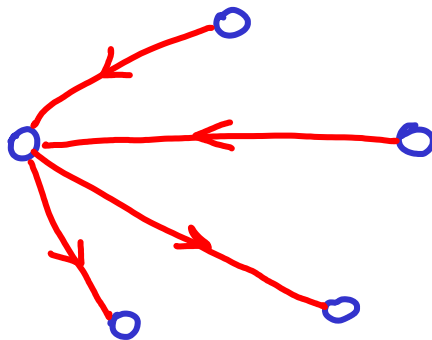
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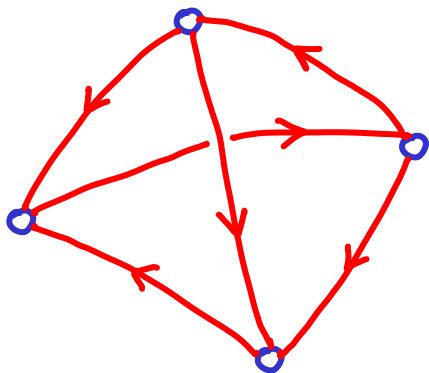
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$n=4$

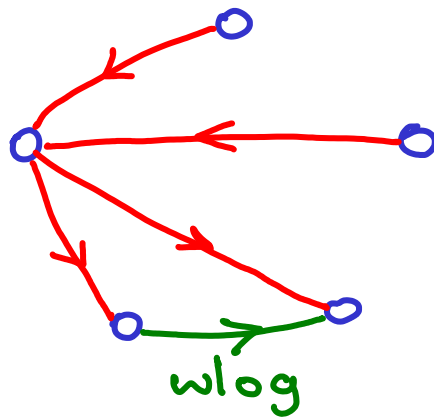
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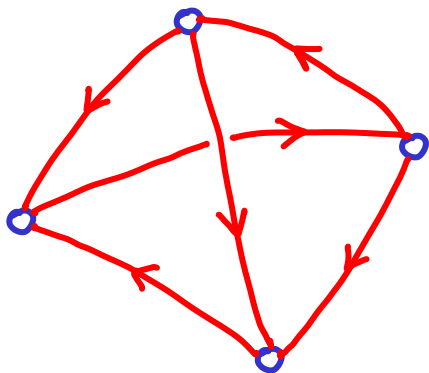
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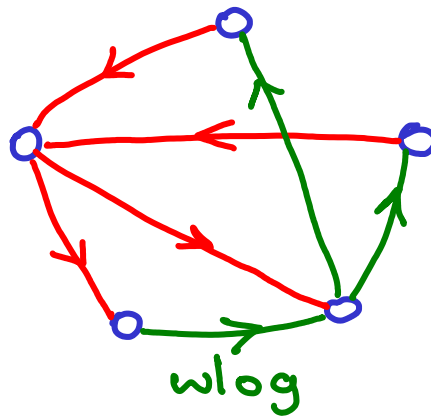
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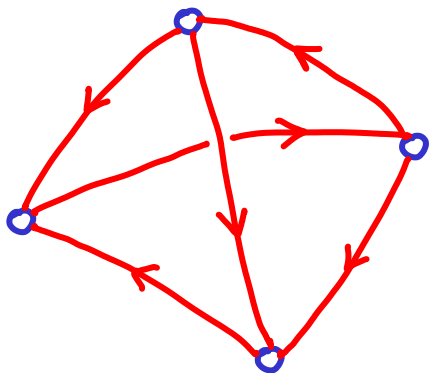
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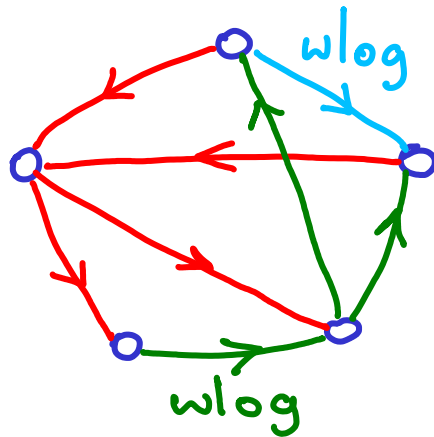
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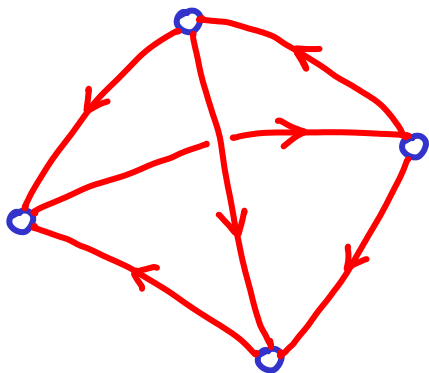
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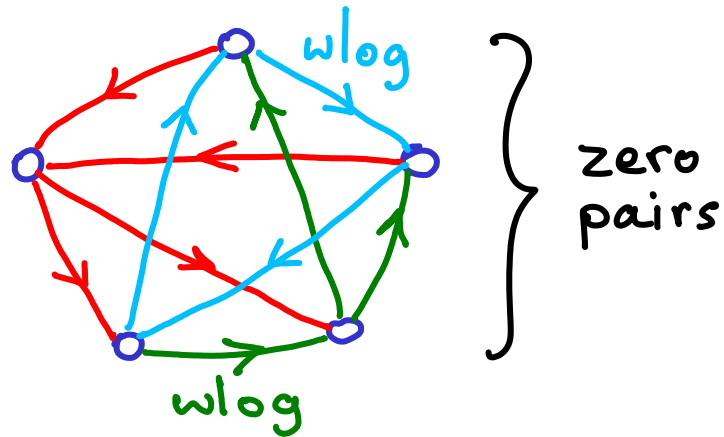
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$n=4$
 $n=5$ } impossible

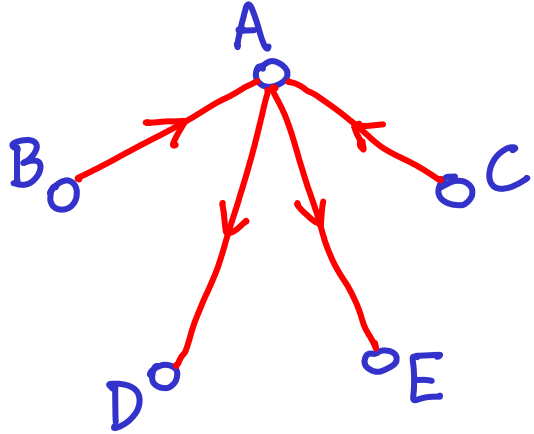
Alternate proof for $n=5$

Can we ever have a vertex with only 2 incoming?

$n=4$
 $n=5$ } impossible

Alternate proof for $n=5$

Can we ever have a vertex with only 2 incoming?

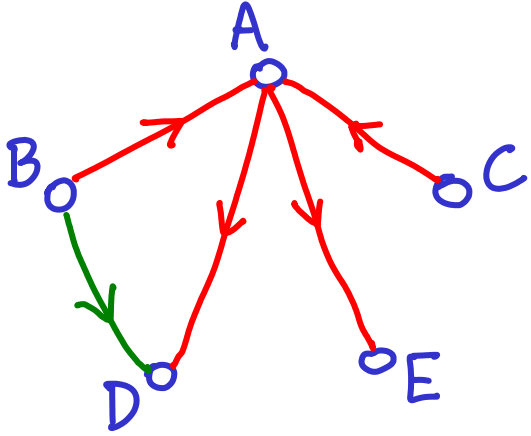


- If A loses only to B & C then ?

$n=4$
 $n=5$ } impossible

Alternate proof for $n=5$

Can we ever have a vertex with only 2 incoming?

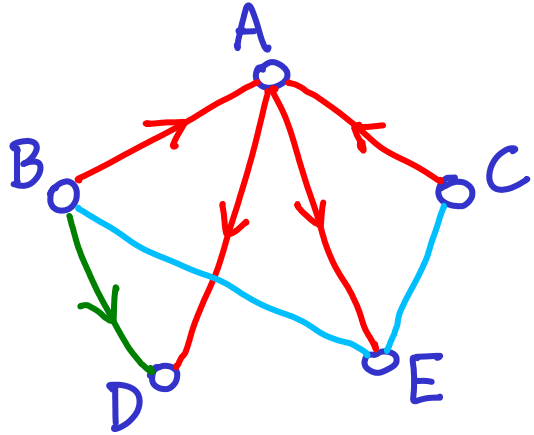


- If A loses only to B & C
- then B or C must beat A, D

$n=4$
 $n=5$ } impossible

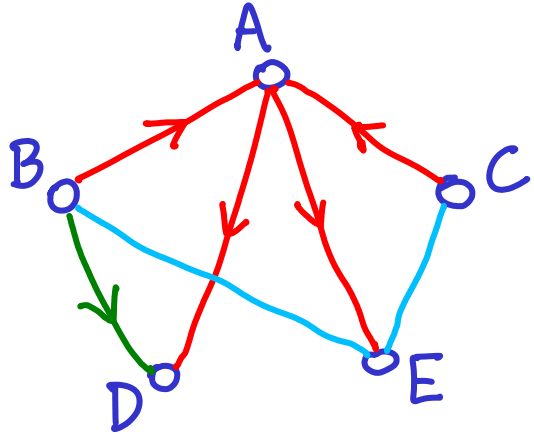
Alternate proof for $n=5$

Can we ever have a vertex with only 2 incoming?



- If A loses only to B & C
- then B or C must beat A, D & same for A, E

$n=4$
 $n=5$ } impossible



Alternate proof for $n=5$

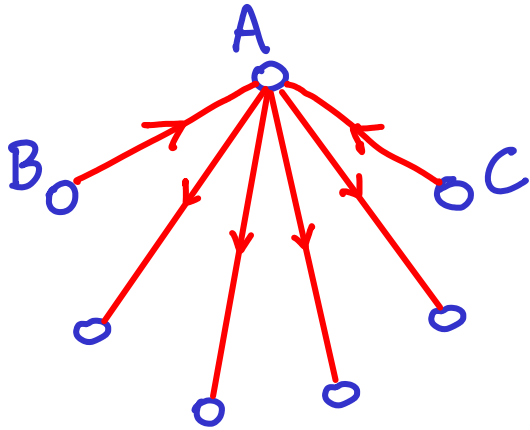
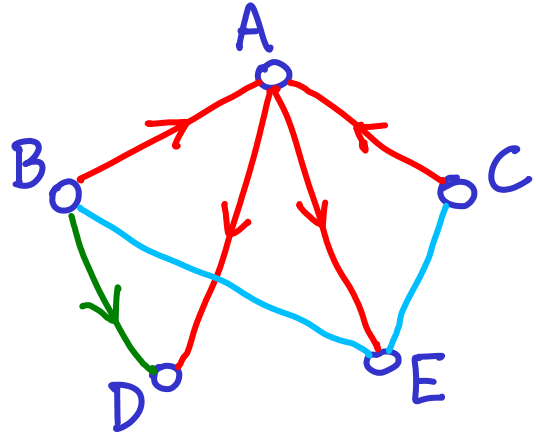
Can we ever have a vertex with only 2 incoming?

- If A loses only to B & C
- then B or C must beat A, D & same for A, E

Thus there is no vertex to beat B & C

NO

$n=4$
 $n=5$ } impossible



Alternate proof for $n=5$

Can we ever have a vertex with only 2 incoming?

- If A loses only to B & C
- then B or C must beat A, D & same for A, E

Thus there is no vertex to beat B & C

NO

Holds for any n : Every vertex must lose to B or C

Thus there is no vertex to beat B & C

$n=6 \dots ?$

$\binom{6}{2} = 15$ edges , 2.5 incoming per vertex

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↳ $\exists$ vertex with ≤ 2 incoming $\Rightarrow$ no 2-paradoxical tournament

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$n=7 \dots ?$

$\binom{7}{2} = 21$ edges , 3 incoming per vertex

$n=6 \dots ?$

$\binom{6}{2} = 15$ edges , 2.5 incoming per vertex

↳ $\exists$ vertex with ≤ 2 incoming $\Rightarrow$ no 2-paradoxical tournament

$n=7 \dots ?$

$\binom{7}{2} = 21$ edges , 3 incoming per vertex

Inconclusive

Will it work for 7

or is there a more refined observation to show it's not possible?

$n=7$

a
 $\circ$

$\circ g$

Need exactly 3 incoming
per vertex

b
 $\circ$

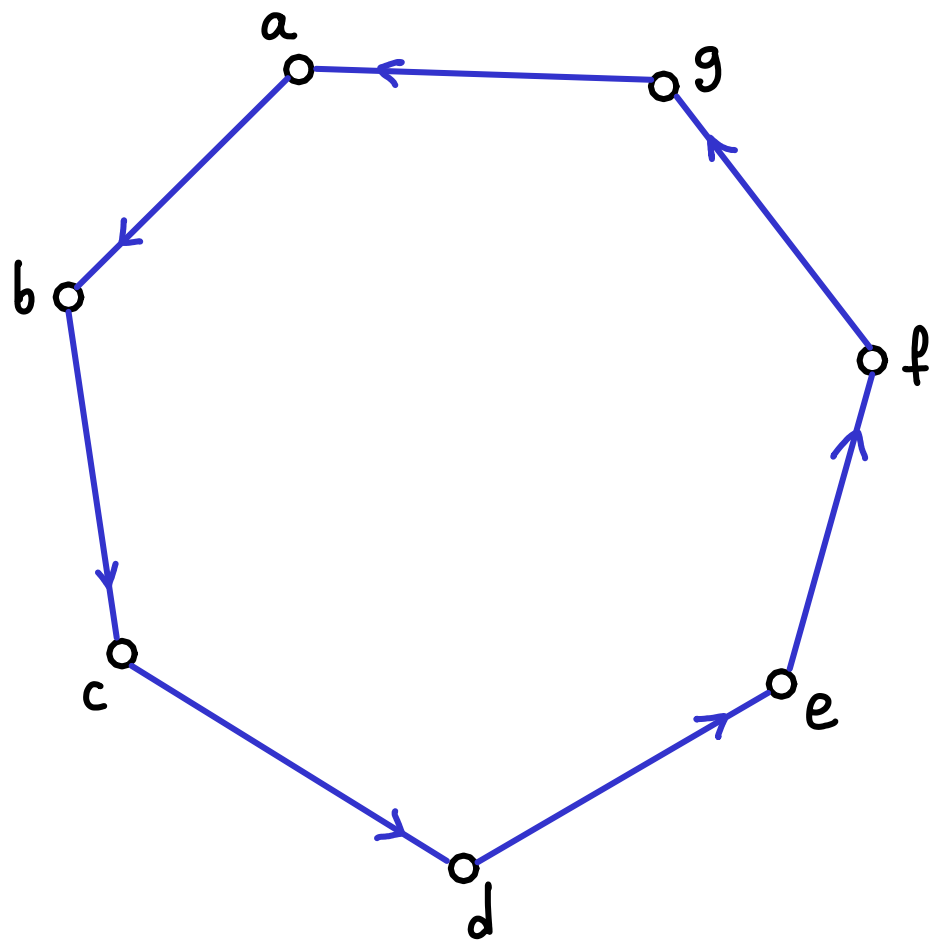
$\circ f$

c
 $\circ$

$\circ e$

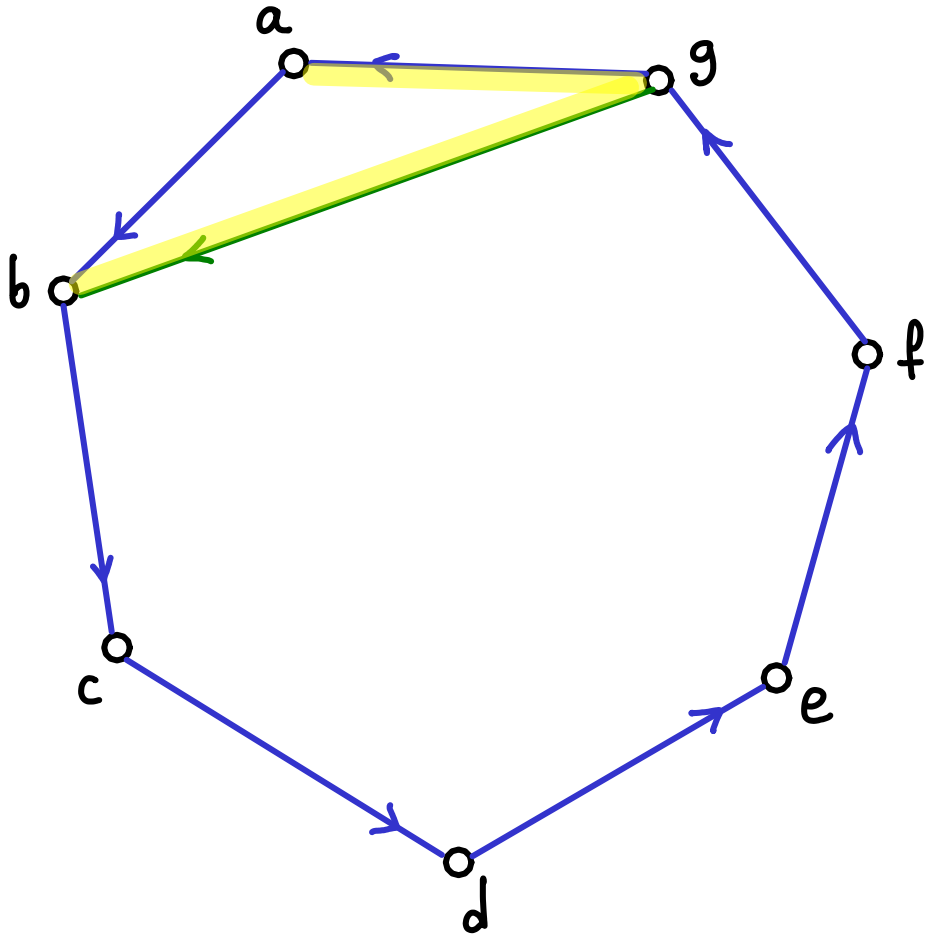
$\circ$
 d

$n=7$



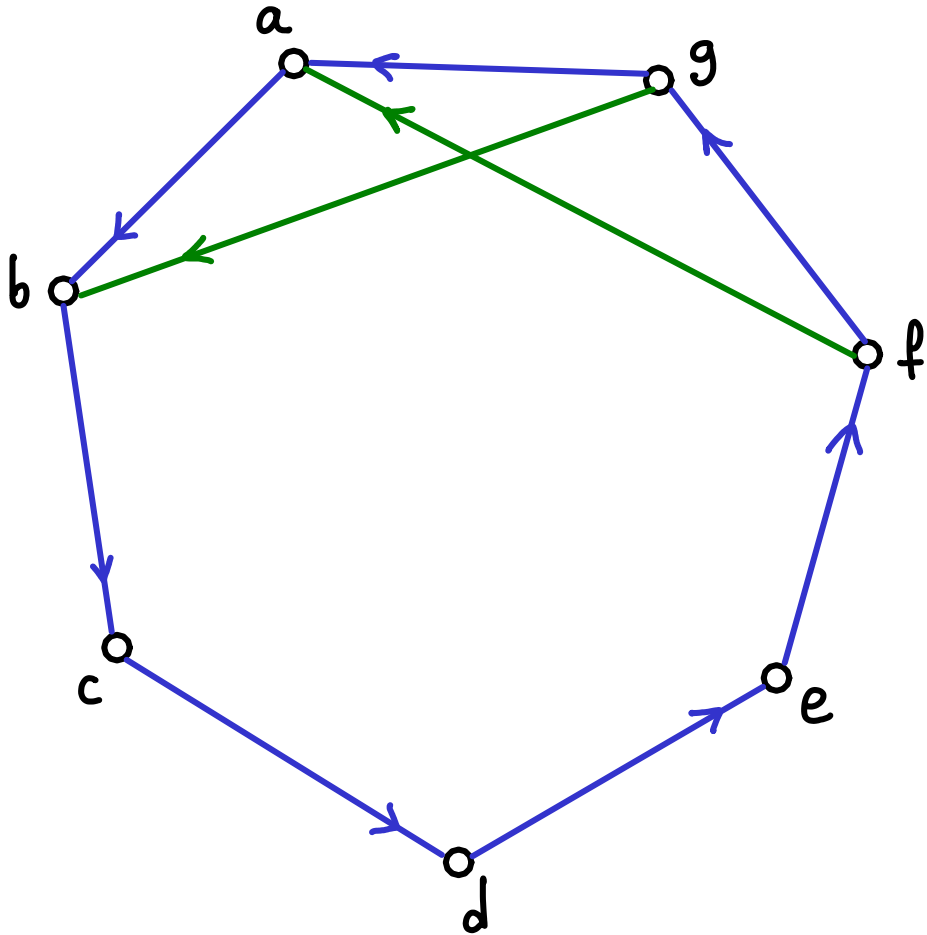
$$a, b \leftarrow g$$

$$n=7$$



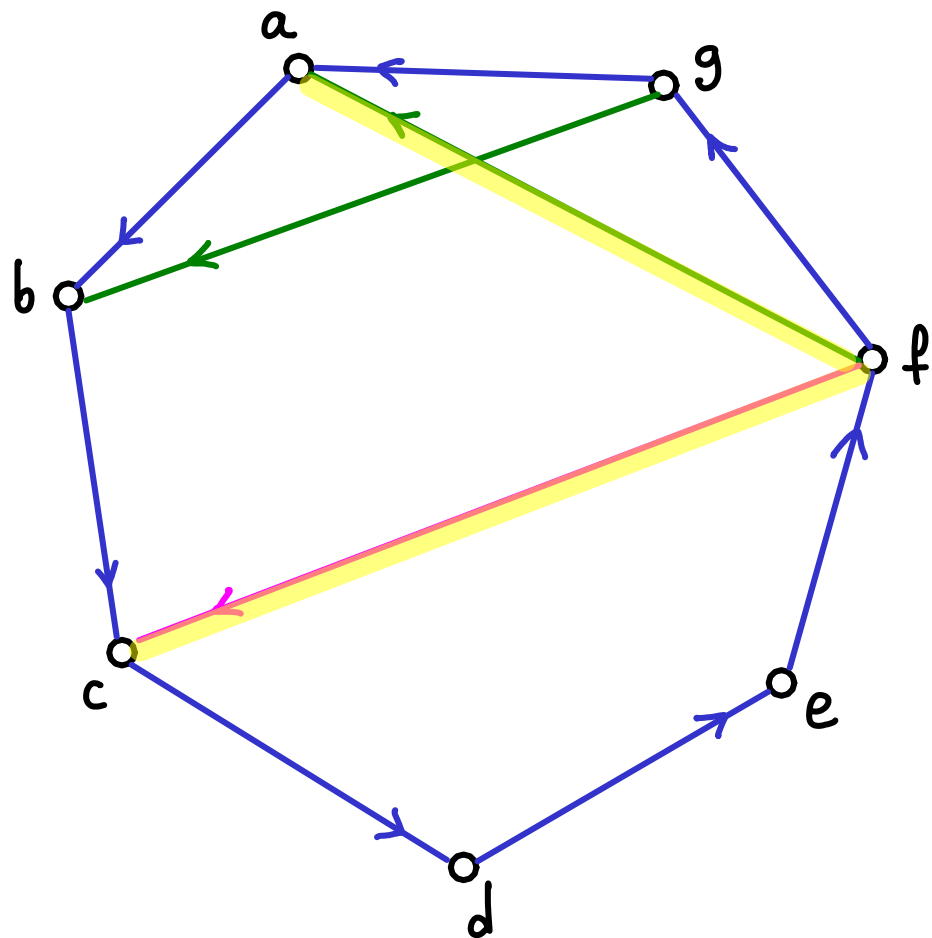
$$a, b \leftarrow g$$

$n=7$



skip 1

$n=7$

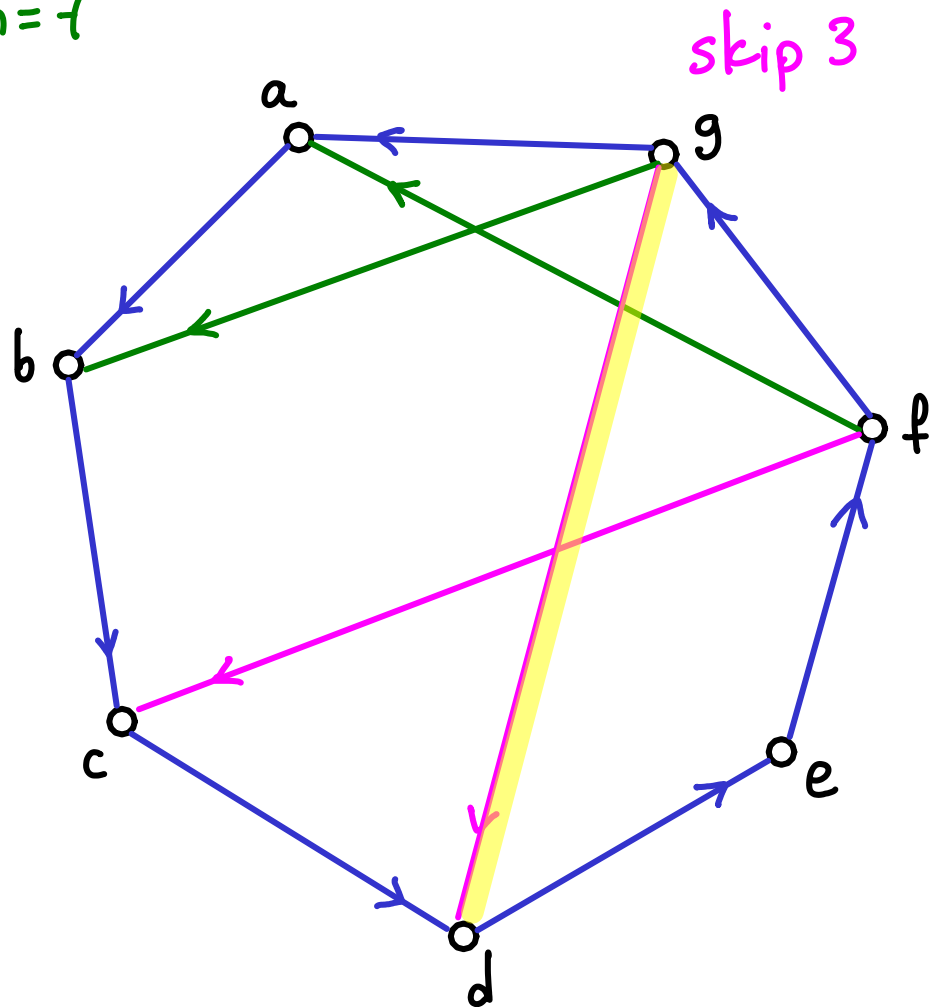


skip 3

$a, b \leftarrow g$

$a, c \leftarrow f$

$n=7$

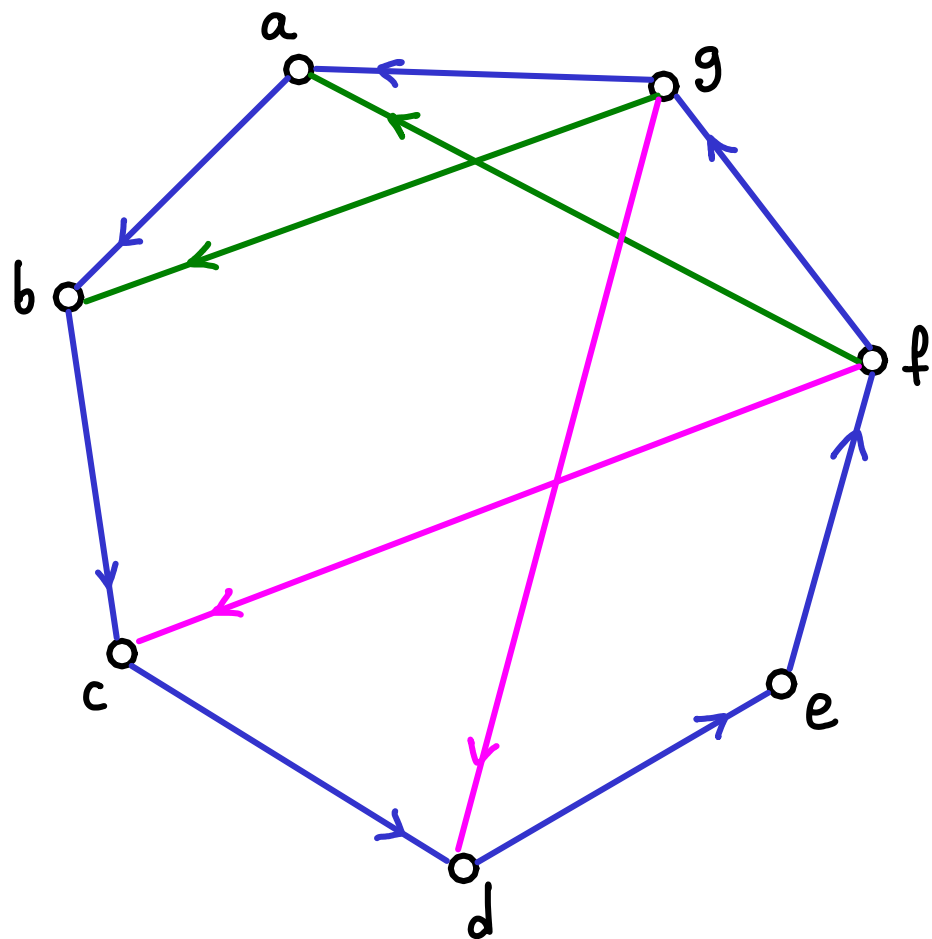


$a, b \leftarrow g$

$a, c \leftarrow f$

$a, d \leftarrow g$

$n=7$



$a, b \leftarrow g$

$a, c \leftarrow f$

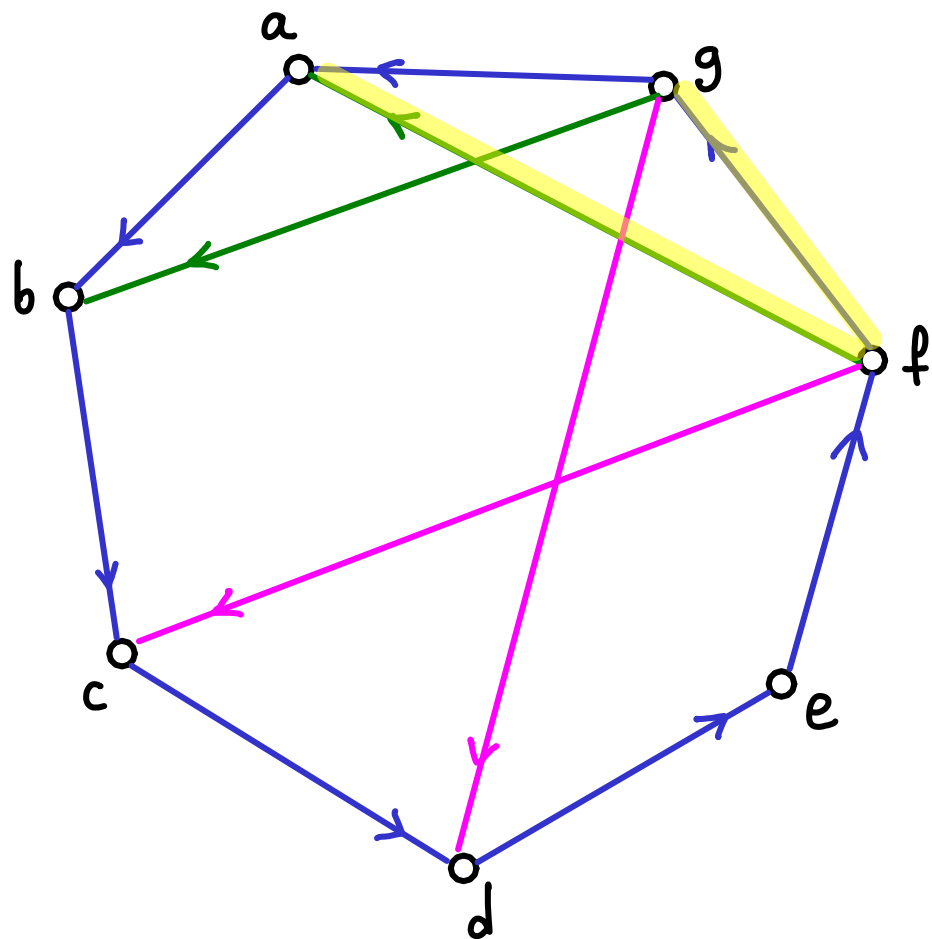
$a, d \leftarrow g$

a, e ?

a, f ?

● a, g ?

$n=7$



$a, b \leftarrow g$

$a, c \leftarrow f$

$a, d \leftarrow g$

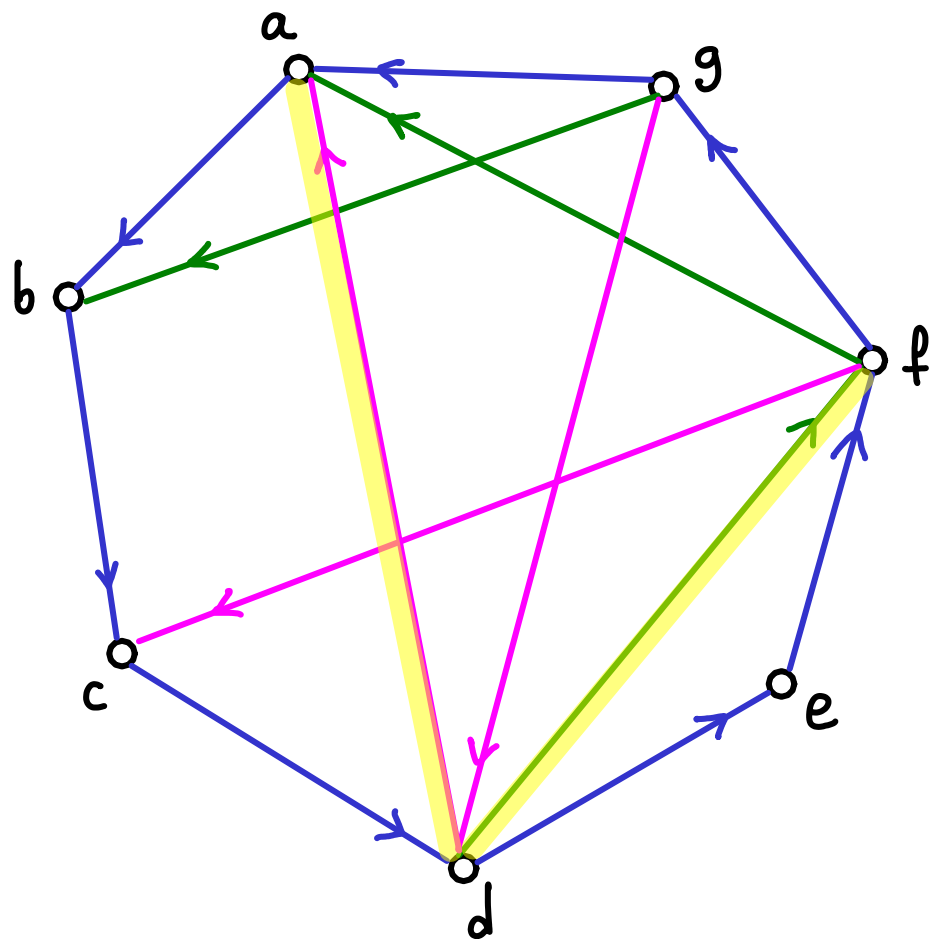
a, e

a, f

$a, g = g, a \leftarrow f$

symmetric

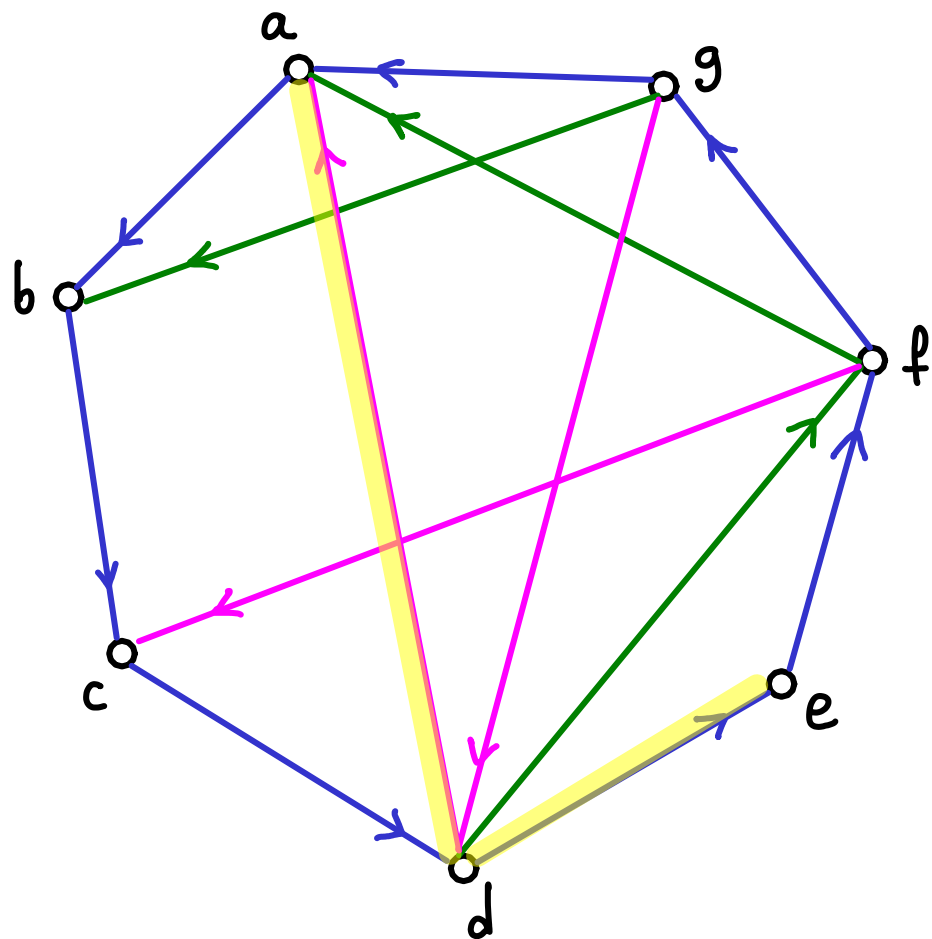
$n=7$



$a, b \leftarrow g$
 $a, c \leftarrow f$
 $a, d \leftarrow g$
 a, e
● $a, f = f, a$
 $a, g = g, a$

symmetric

$n=7$



$a, b \leftarrow g$

$a, c \leftarrow f$

$a, d \leftarrow g$

$a, e = e, a$

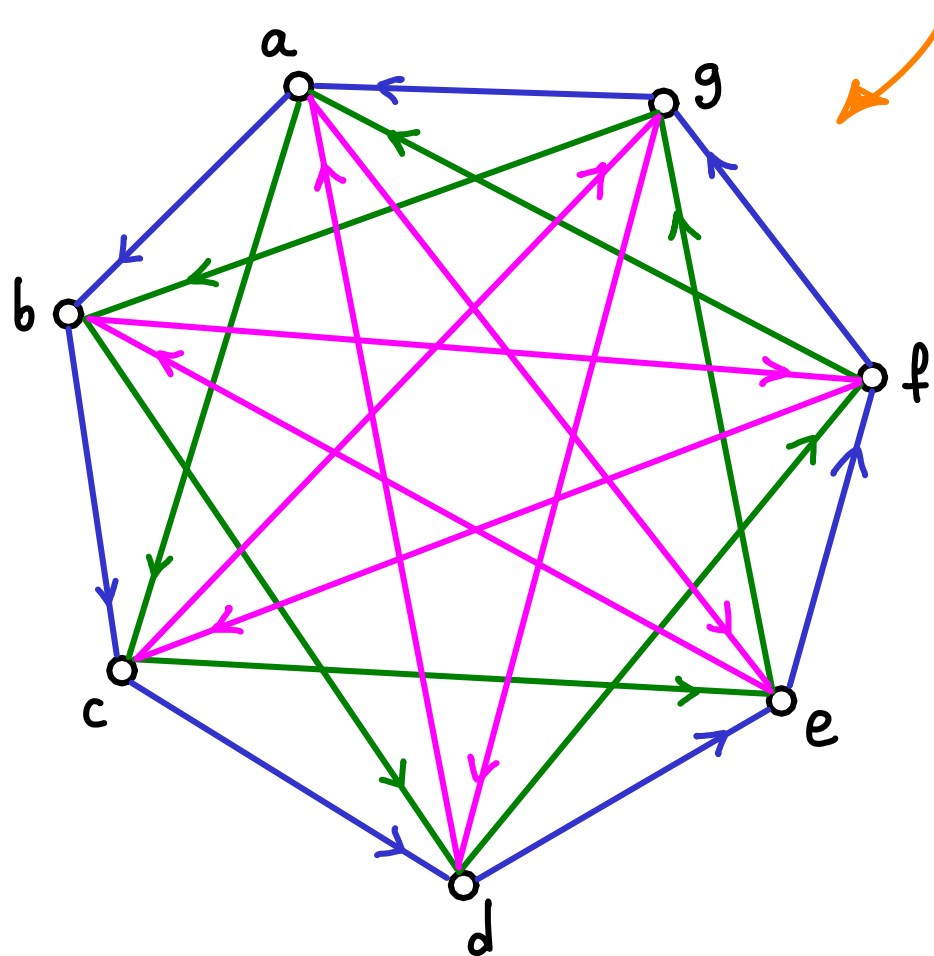
$a, f = f, a$

$a, g = g, a$

symmetric

$n=7$

$\exists$ 2-paradoxical tournament



$$a, b \leftarrow g$$

$$a, c \leftarrow f$$

$$a, d \leftarrow g$$

$$a, e = e, a$$

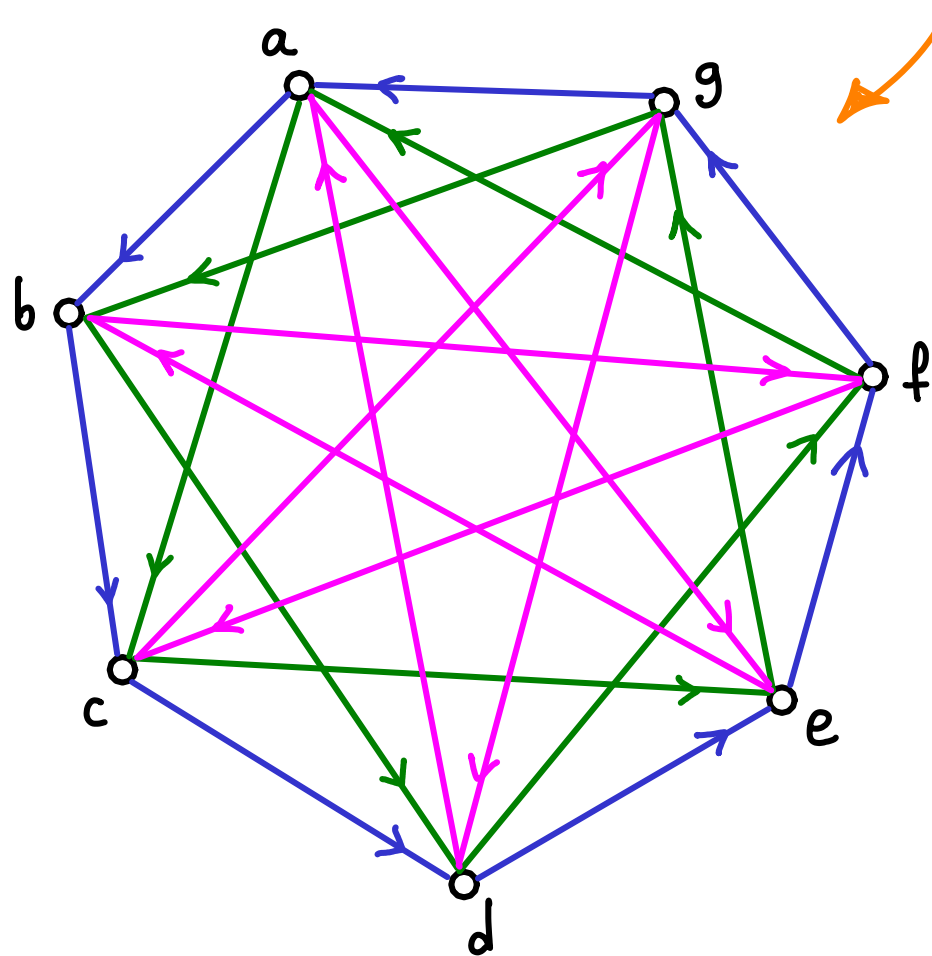
$$a, f = f, a$$

$$a, g = g, a$$

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$n=7$

$\exists$ 2-paradoxical tournament



$$a, b \leftarrow g$$

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$$a, e = e, a$$

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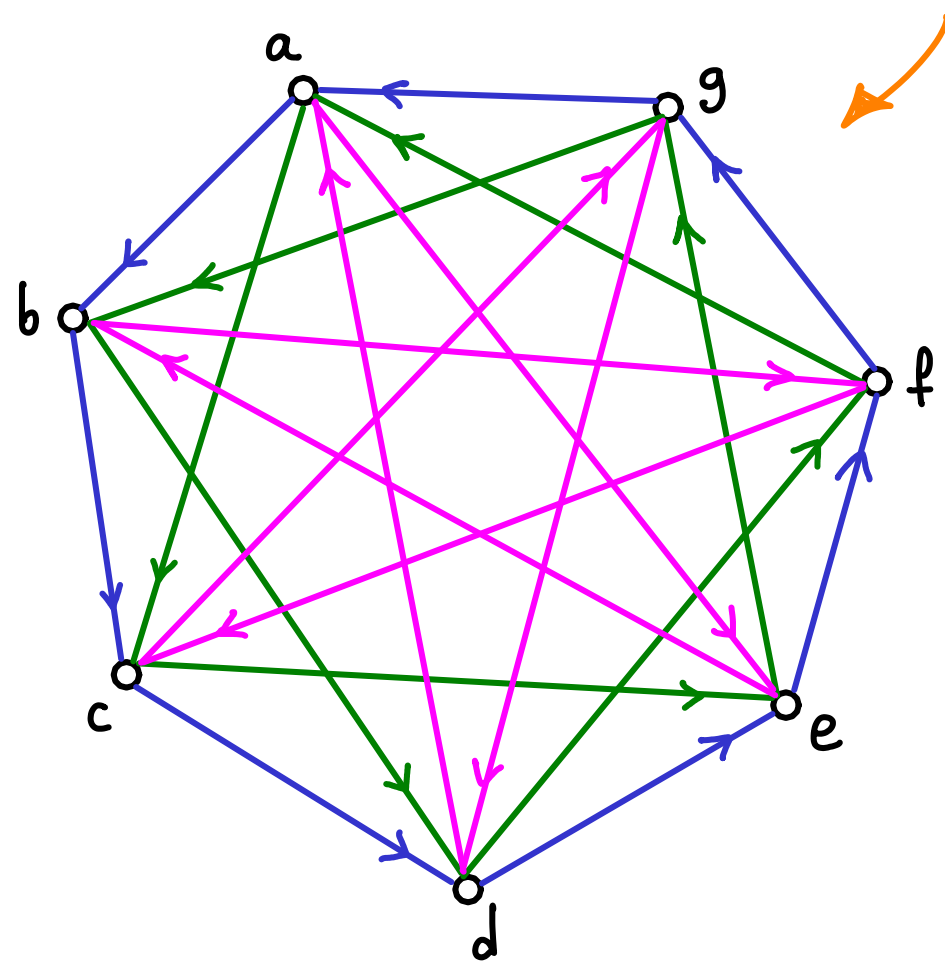
$$a, g = g, a$$

symmetric

$n > 7$?

$n=7$

$\exists$ 2-paradoxical tournament



$$a, b \leftarrow g$$

$$a, c \leftarrow f$$

$$a, d \leftarrow g$$

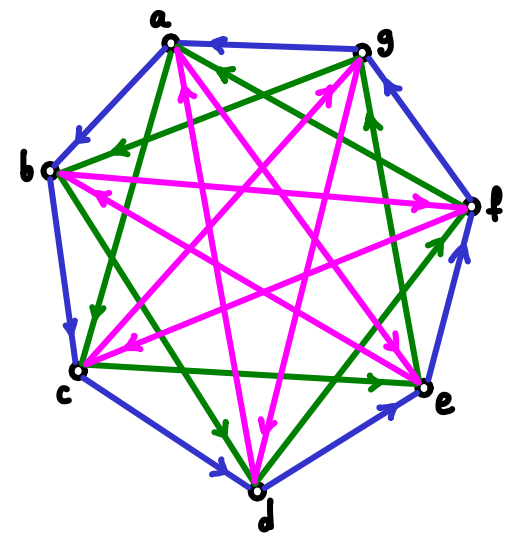
$$a, e = e, a$$

$$a, f = f, a$$

$$a, g = g, a$$

symmetric

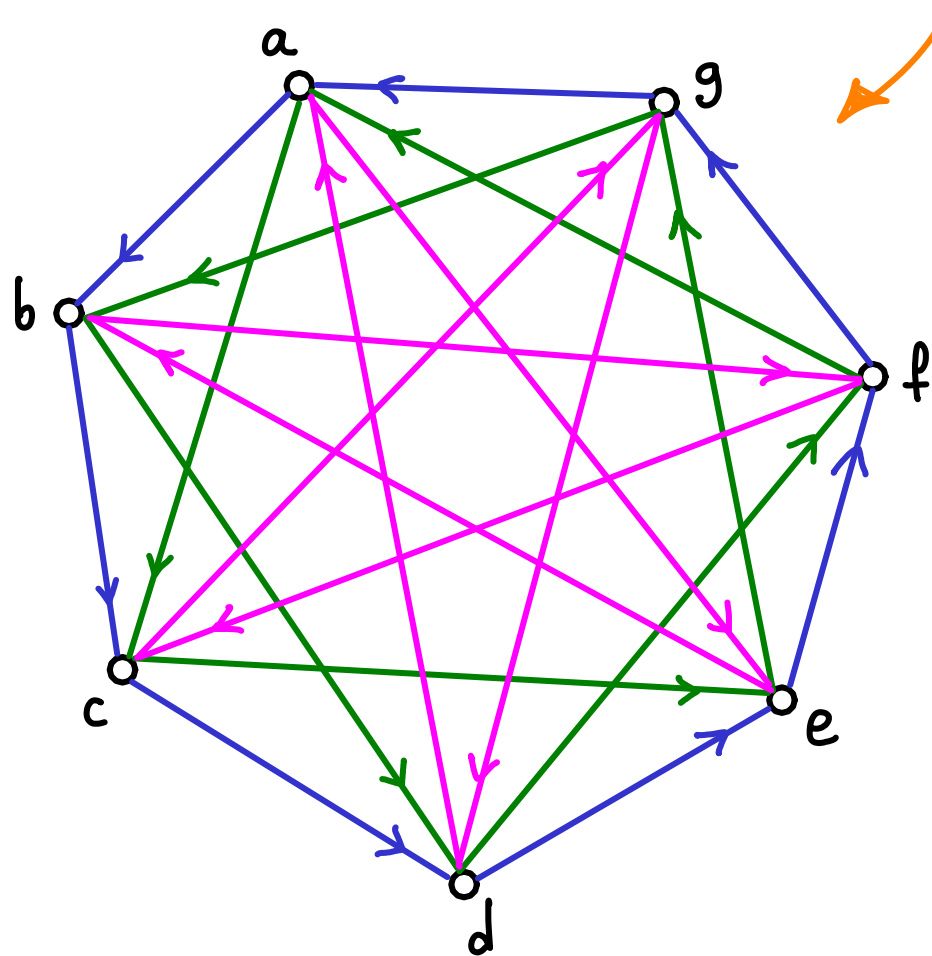
$n > 7$?



o_h

$n=7$

$\exists$ 2-paradoxical tournament



$$a, b \leftarrow g$$

$$a, c \leftarrow f$$

$$a, d \leftarrow g$$

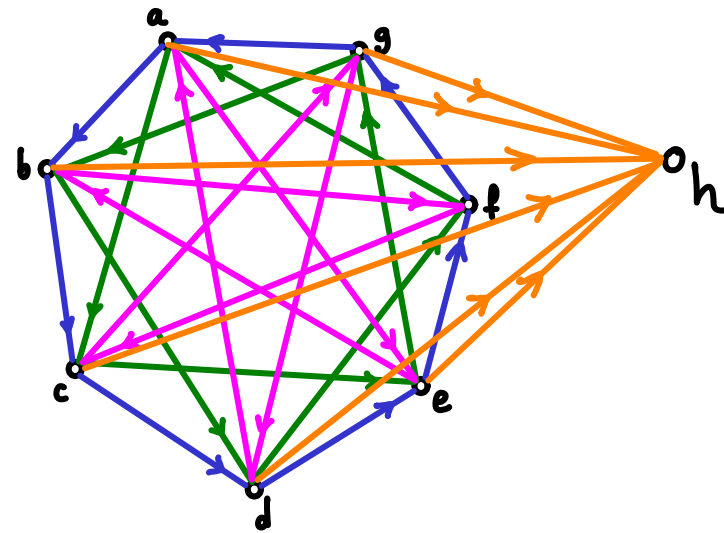
$$a, e = e, a$$

$$a, f = f, a$$

$$a, g = g, a$$

symmetric

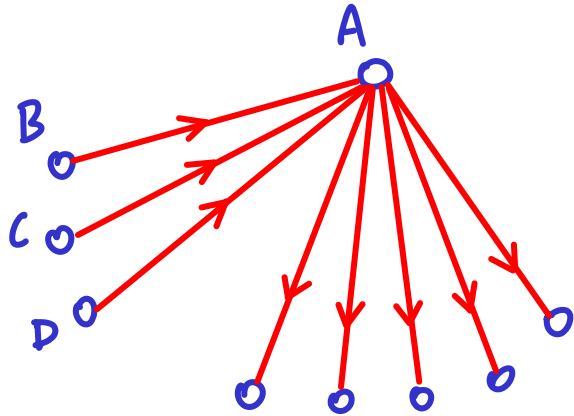
$n > 7$?



3-paradoxical
TOURNAMENTS
with n players

Is it possible for every triple of players
to lose to a common opponent?

3-paradoxical TOURNAMENTS with n players



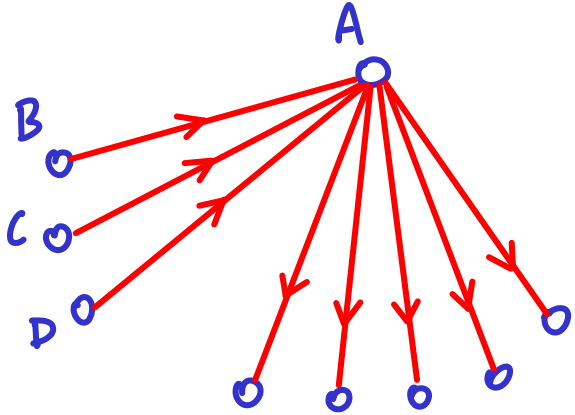
Is it possible for every triple of players
to lose to a common opponent?

If $\exists$ vertex A with only 3 incoming ($B, C, D \rightarrow A$)

then B or C or D must beat all A, x, y

so B, C, D can't all lose to one vertex

3-paradoxical TOURNAMENTS with n players



Is it possible for every triple of players
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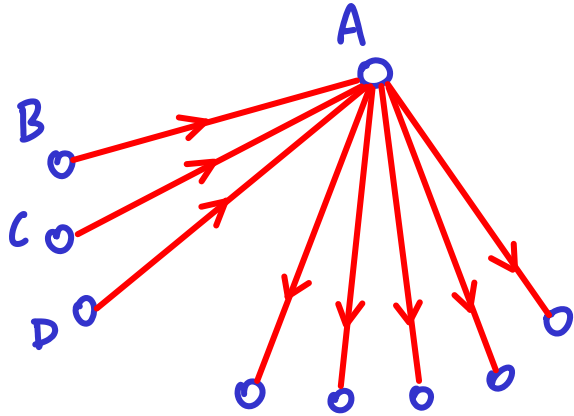
If $\exists$ vertex A with only 3 incoming ($B, C, D \rightarrow A$)

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$\hookrightarrow \binom{8}{2} = 28$ edges, average $< 4 \rightarrow$ impossible
Need ≥ 9 vertices

3-paradoxical TOURNAMENTS with n players



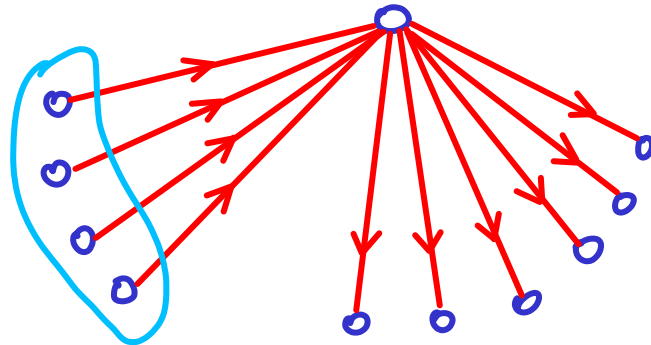
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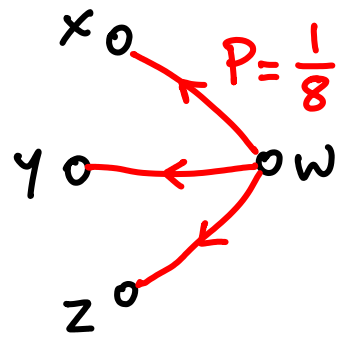
Extend ???

3-paradoxical
TOURNAMENTS
with n players

Is it possible for every triple of players
to lose to a common opponent?

Let each edge be directed randomly

3-paradoxical
TOURNAMENTS
with n players

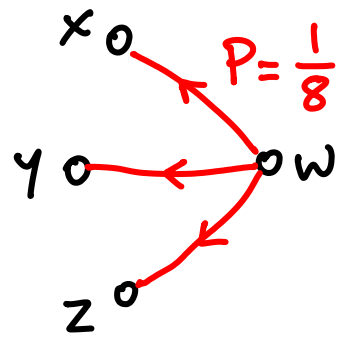


Is it possible for every triple of players
to lose to a common opponent?

Let each edge be directed randomly

For any x, y, z : $P(x, y, z \text{ all lose to specific opponent } w) = \frac{1}{8}$

3-paradoxical TOURNAMENTS with n players

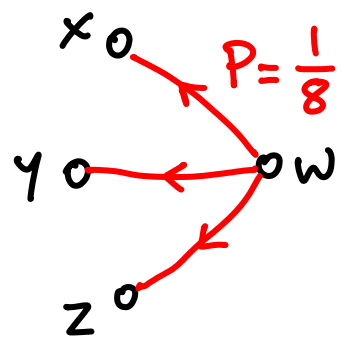


Is it possible for every triple of players
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Let each edge be directed randomly

For any x, y, z : $P(x, y, z \text{ all lose to specific opponent } w) = \frac{1}{8}$
 $\rightarrow P(w \text{ loses to at least one of } x, y, z) = \frac{7}{8}$

3-paradoxical TOURNAMENTS with n players



Is it possible for every triple of players
to lose to a common opponent?

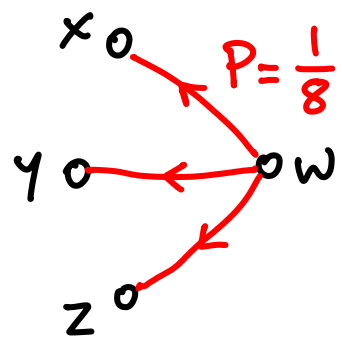
Let each edge be directed randomly

For any x, y, z : $P(x, y, z \text{ all lose to specific opponent } w) = \frac{1}{8}$

$\rightarrow P(w \text{ loses to at least one of } x, y, z) = \frac{7}{8}$

$\rightarrow P(\text{every } w \neq x, y, z \text{ fails to beat } x, y, z) = ?$

3-paradoxical TOURNAMENTS with n players



Is it possible for every triple of players
to lose to a common opponent?

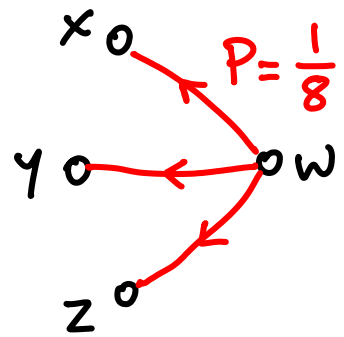
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For any x, y, z : $P(x, y, z \text{ all lose to specific opponent } w) = \frac{1}{8}$

$\rightarrow P(w \text{ loses to at least one of } x, y, z) = \frac{7}{8}$

$\rightarrow P(\text{every } w \neq x, y, z \text{ fails to beat } x, y, z) = \left(\frac{7}{8}\right)^{n-3}$ // independent w 's

3-paradoxical TOURNAMENTS with n players



Is it possible for every triple of players
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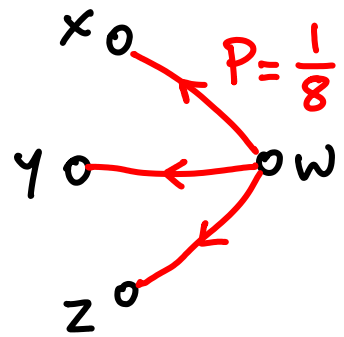
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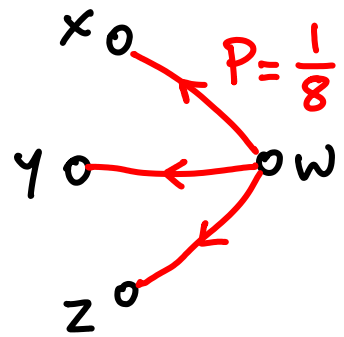
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3-paradoxical TOURNAMENTS with n players



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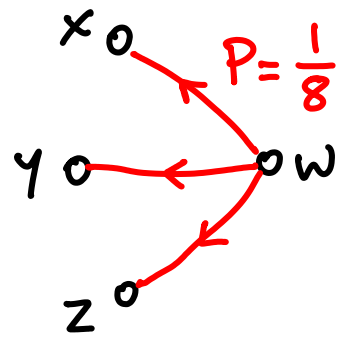
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// $P(A \cup B) \leq P(A) + P(B)$

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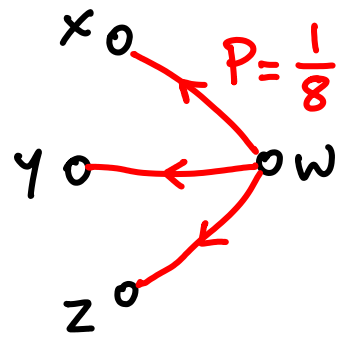
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3-paradoxical TOURNAMENTS with n players



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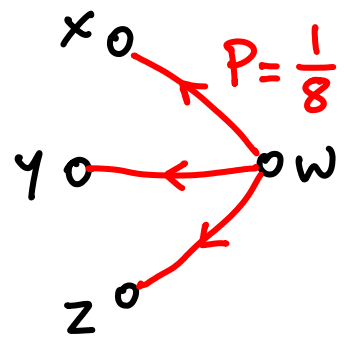
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3-paradoxical TOURNAMENTS with n players



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} Yes, if 91 players,
 $\exists$ 3-paradoxical tournament

k -paradoxical
TOURNAMENTS
with n players

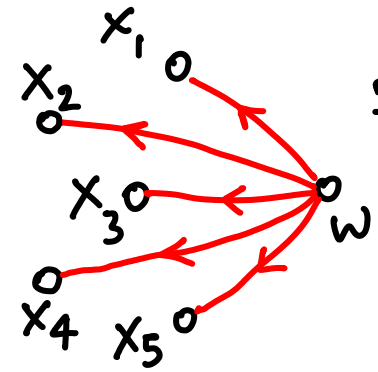
For what k is it possible for every subset of k players
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k-paradoxical
TOURNAMENTS
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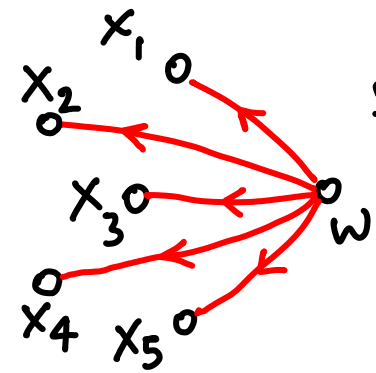
For any $x_1, \dots, x_k$: $P(x_1, \dots, x_k \text{ all lose to specific opponent } w) = \frac{1}{2^k}$



k-paradoxical
TOURNAMENTS
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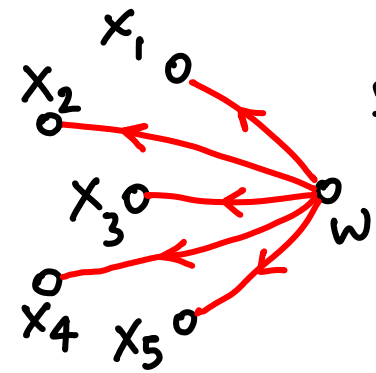
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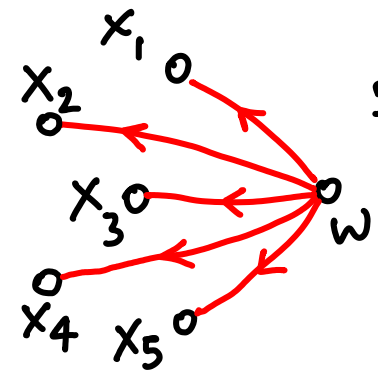
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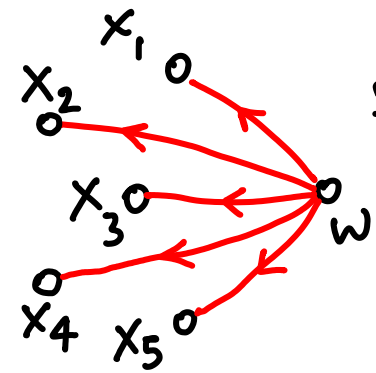
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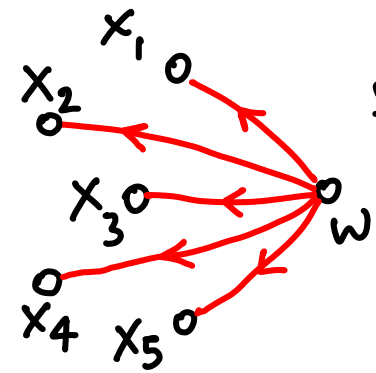
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 $= P(\text{no } k\text{-paradox})$

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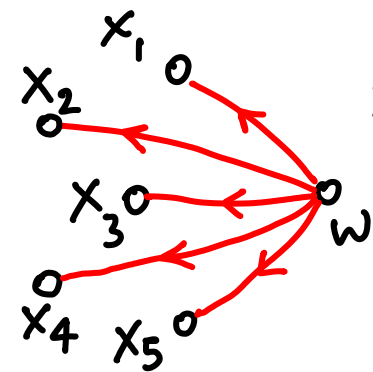
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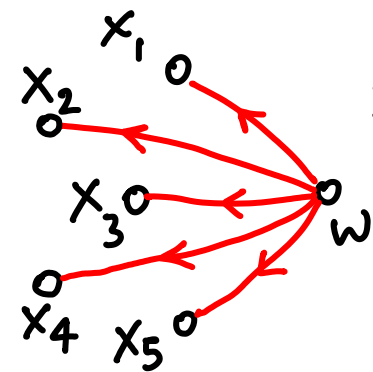
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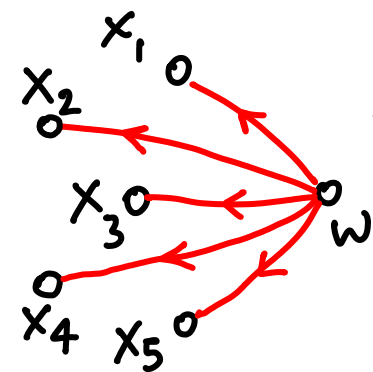
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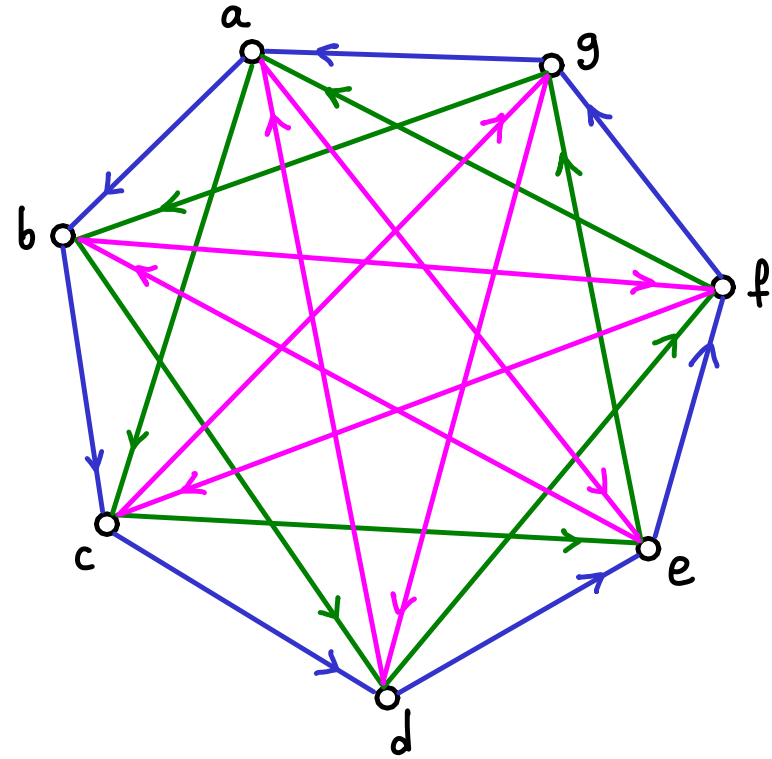
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 also known: if $n < c \cdot k^2 \cdot 2^k$, no k -paradoxical

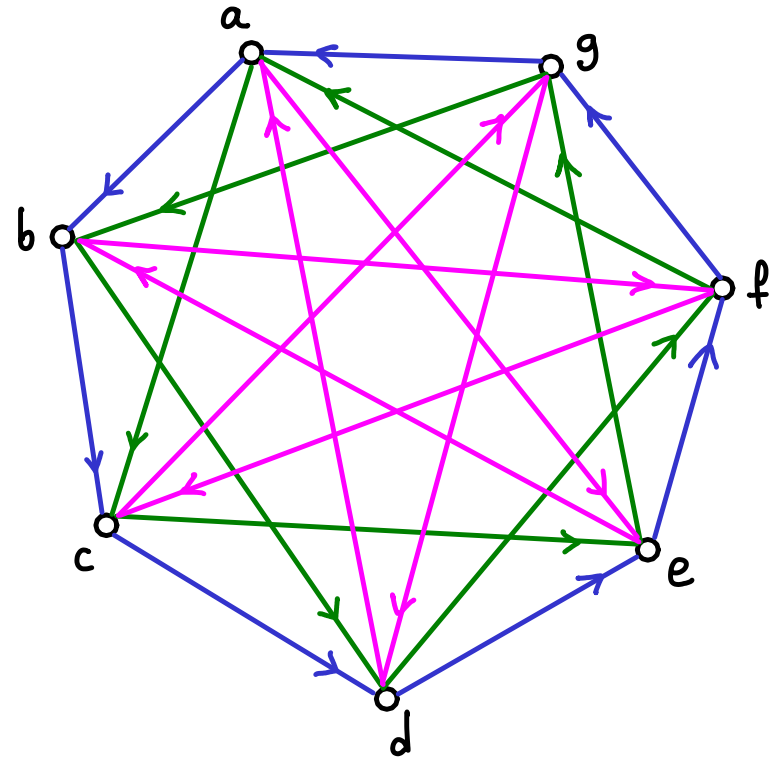
How many Hamiltonian paths could we get in a tournament (graph)?



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Consider any permutation π of vertices

$$P(\pi \text{ is a H-path}) = ?$$

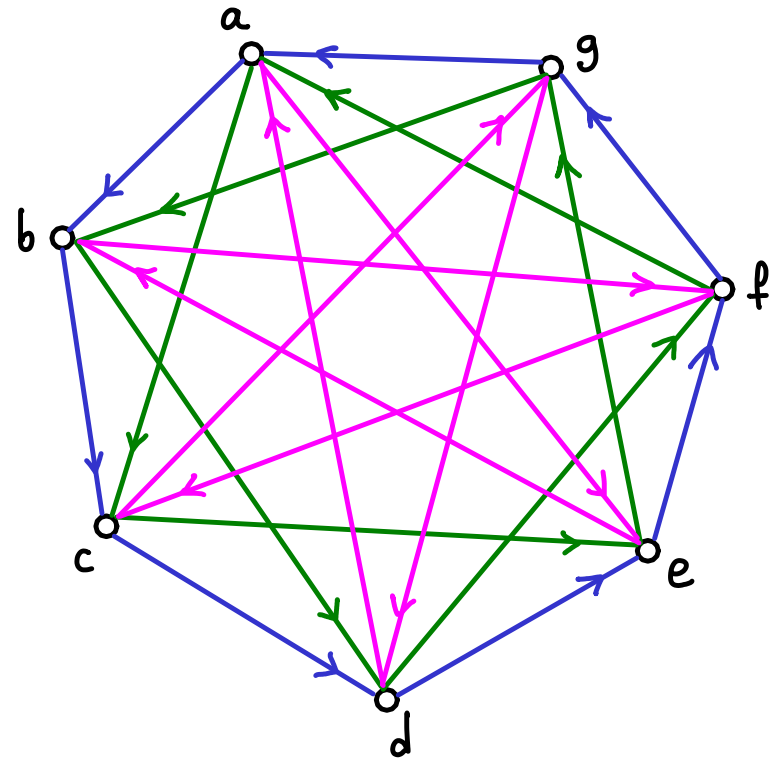


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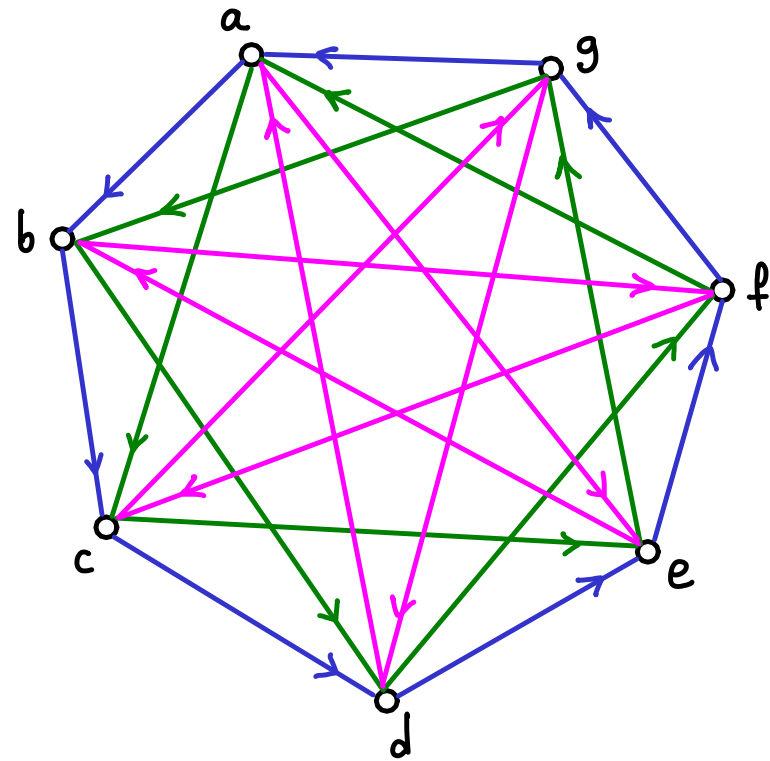
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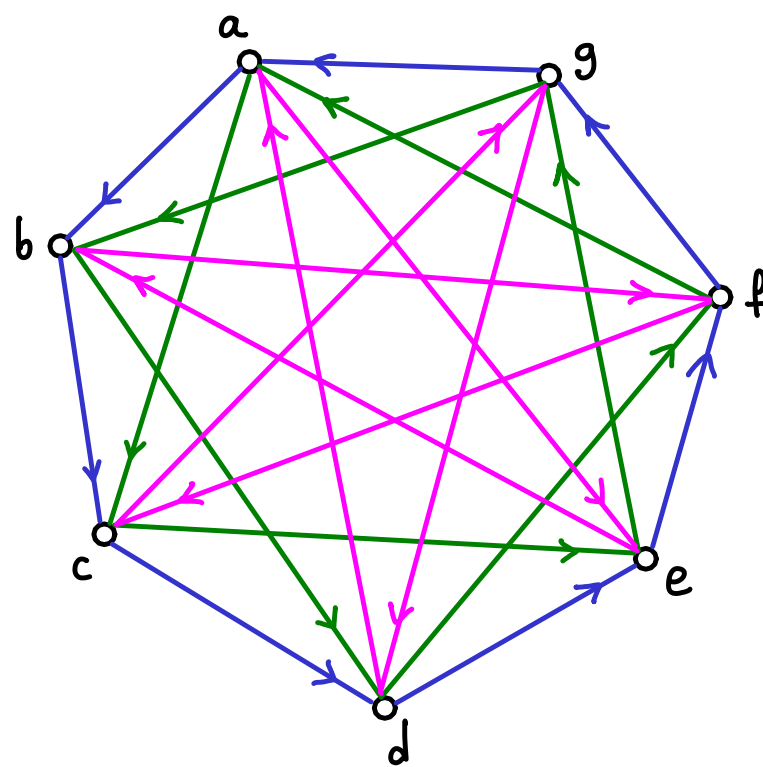
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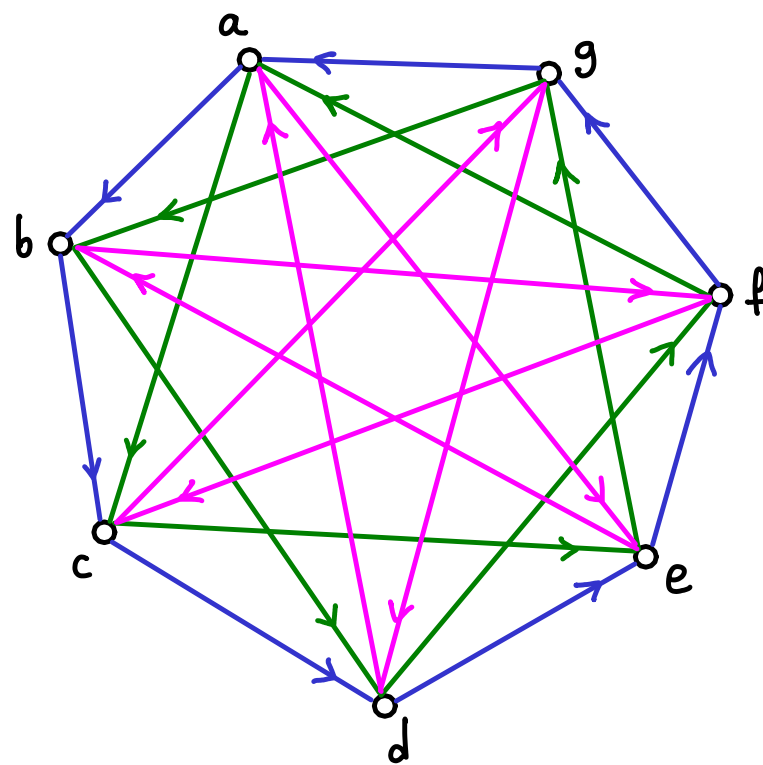
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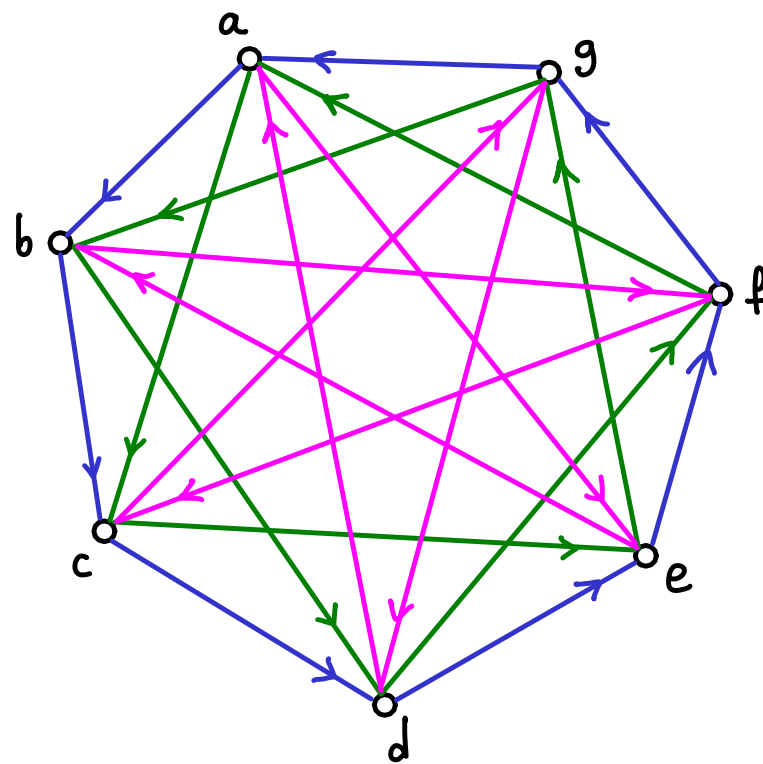
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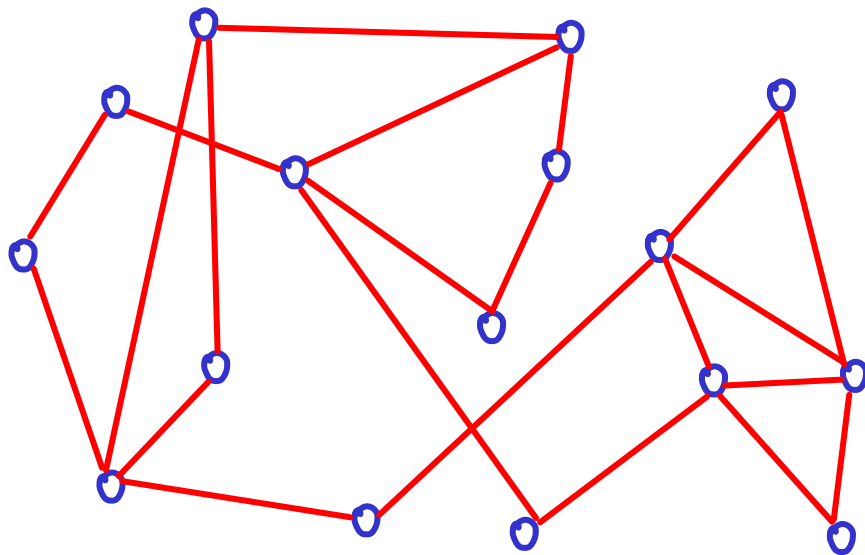
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$\exists$ tournament with $\geq \frac{n!}{2^{n-1}}$ Hamiltonian paths



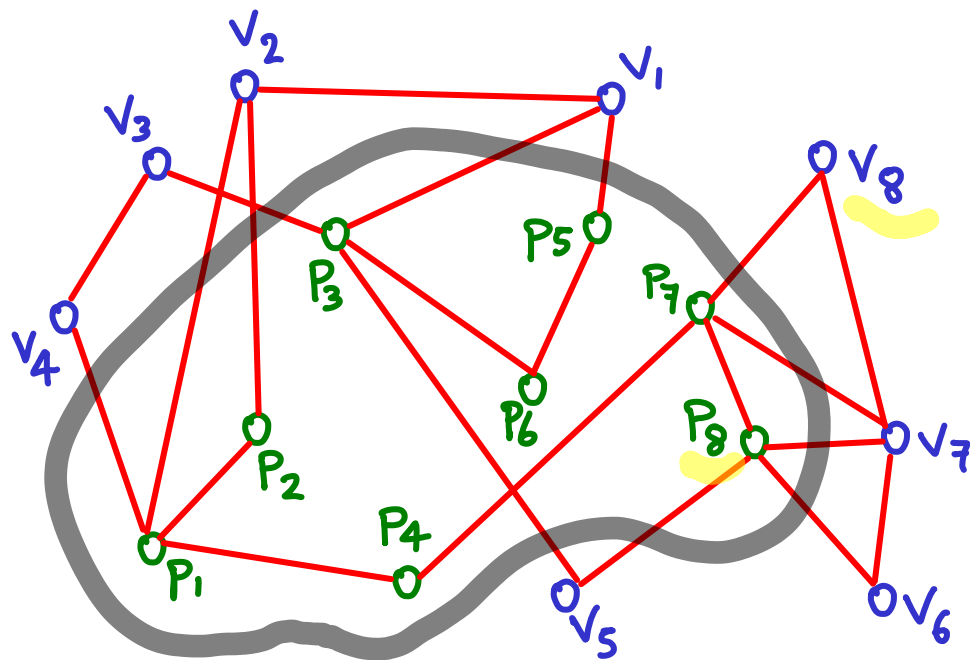
$$|V| = 16$$

$$|E| = 22$$



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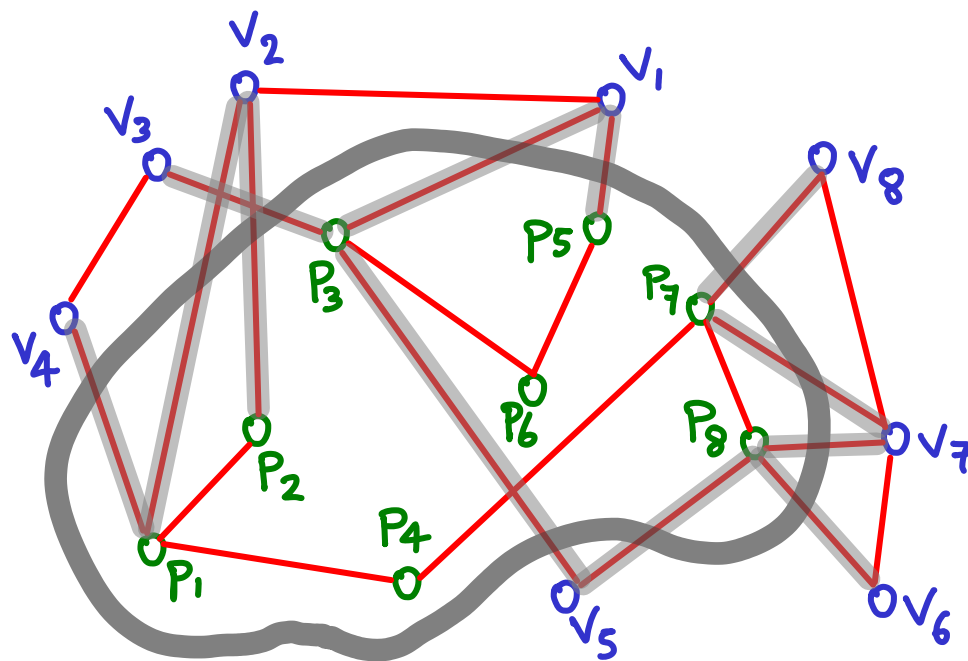
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12 edges cross
this cut

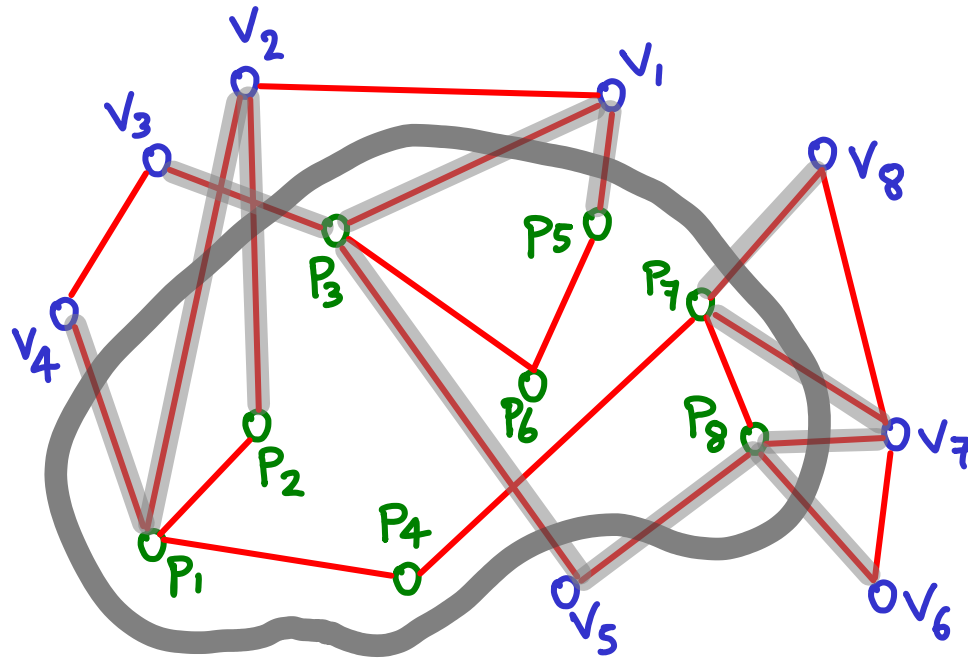


Claim: every $G = \{V, E\}$ ($V = 2n$) admits a cut
such that the cut partitions V into two
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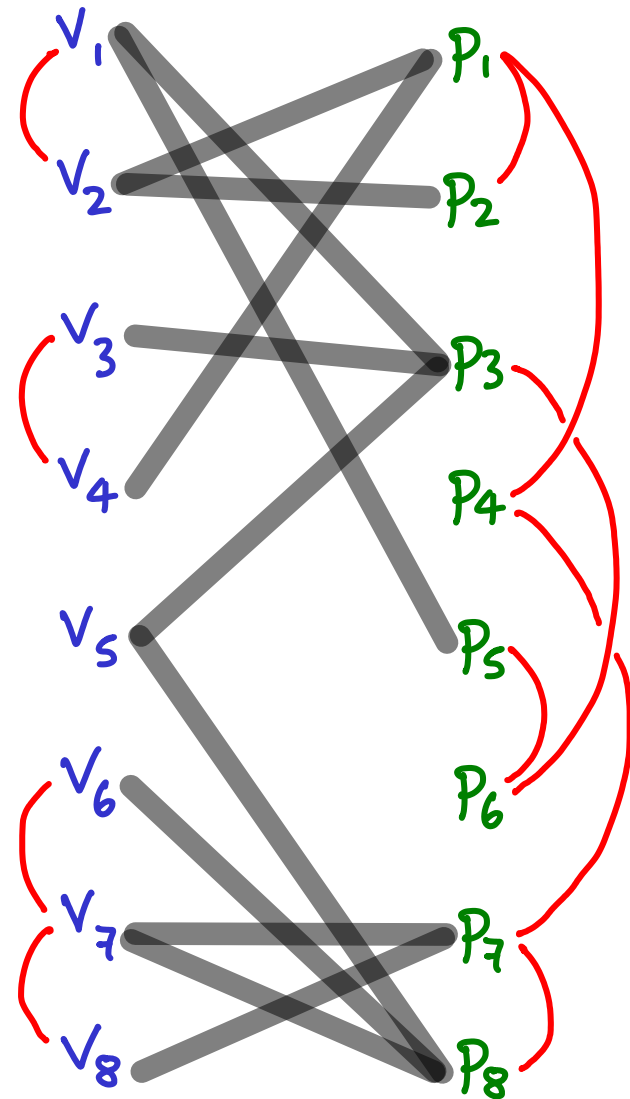
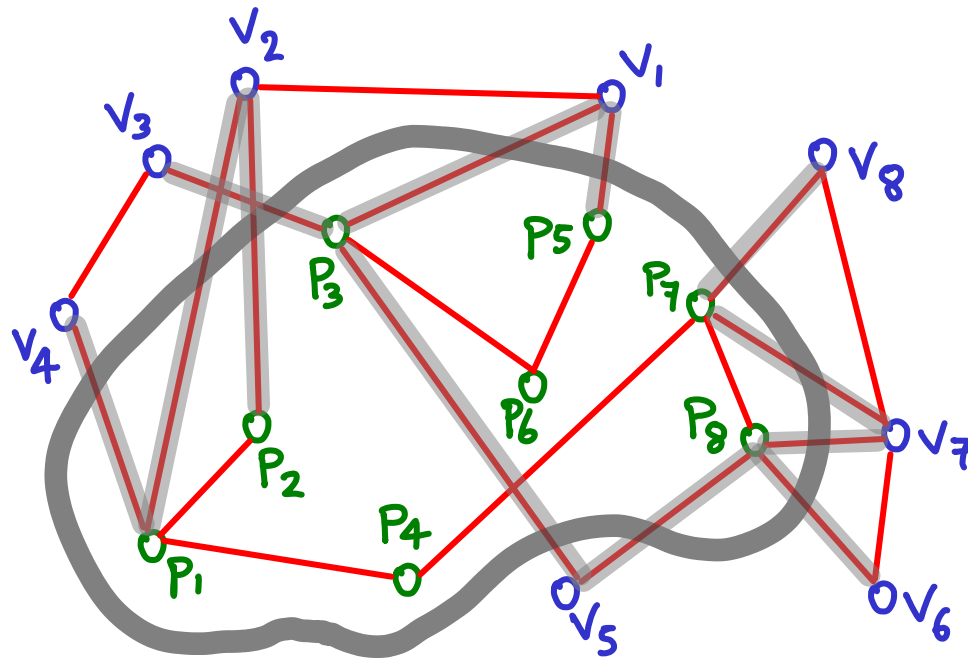
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Every graph contains a large bipartite subgraph

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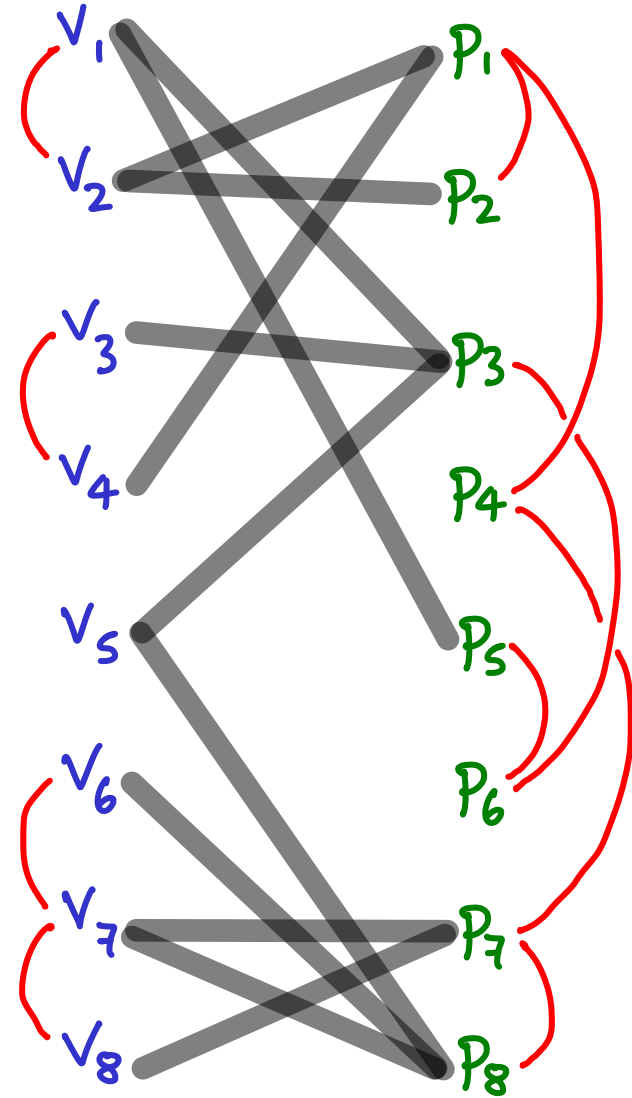
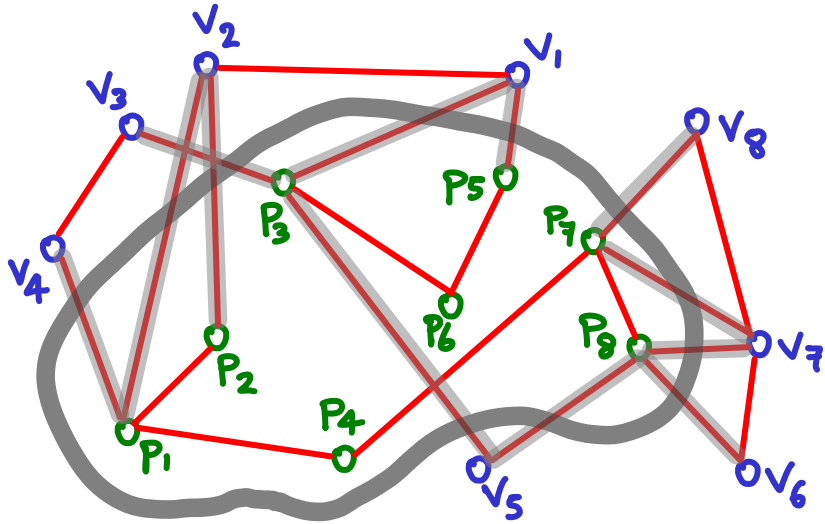
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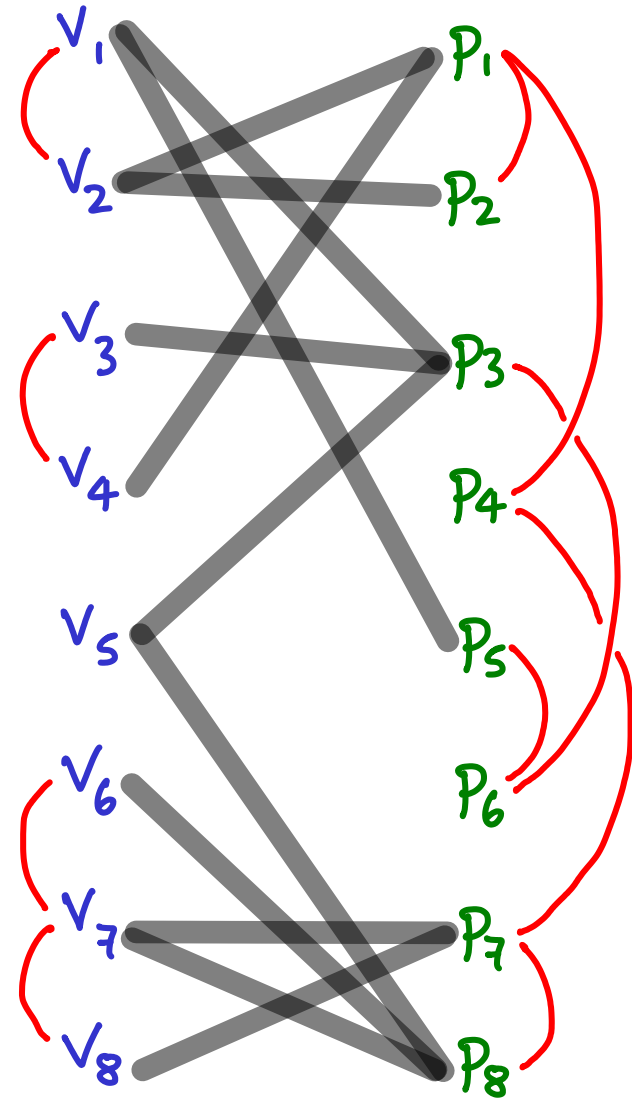
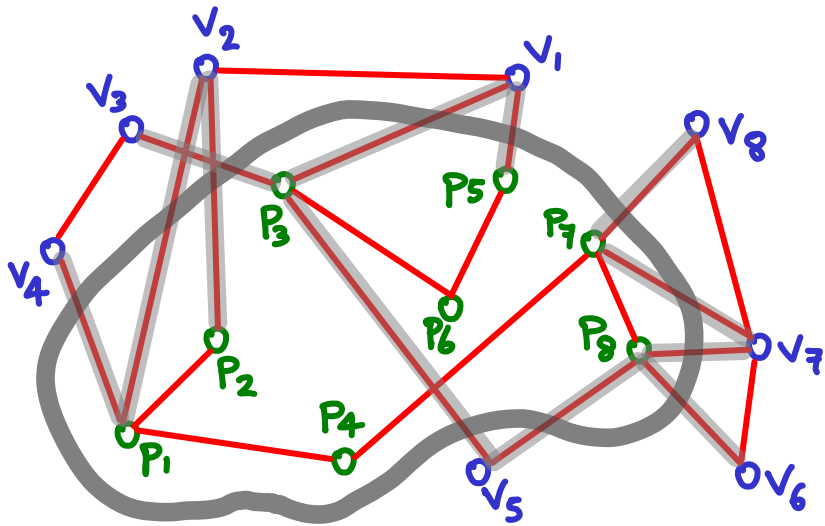
$$X = \sum X_e$$



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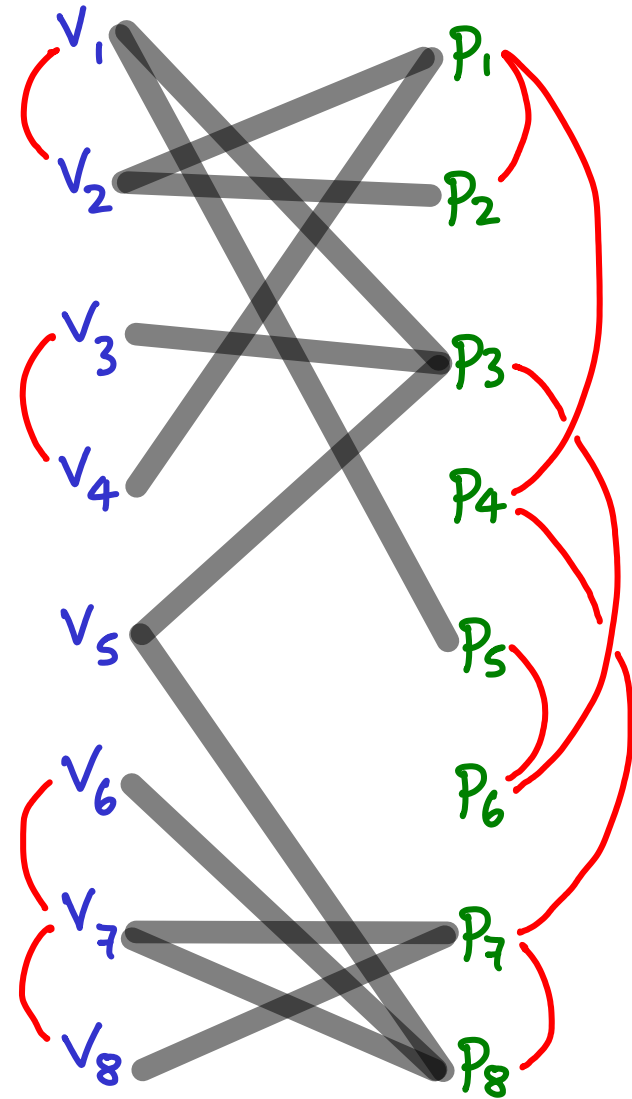
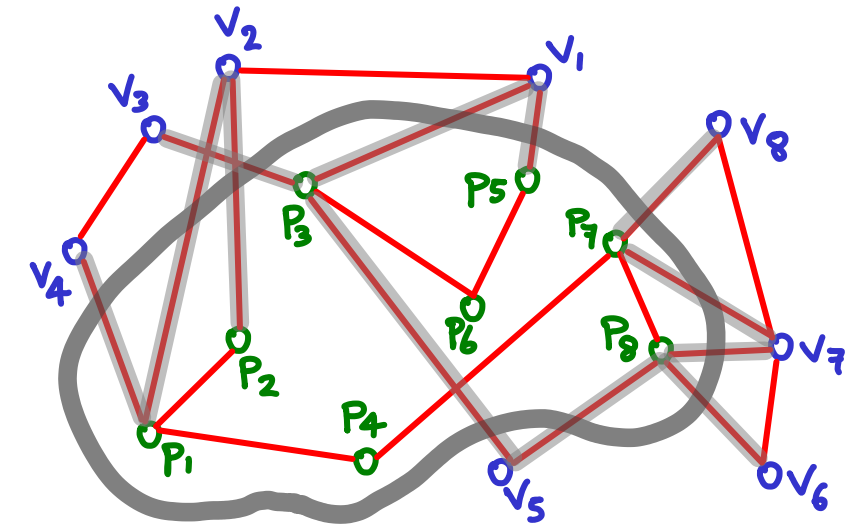
$$E[X] = E[\sum X_e] = \sum E[X_e]$$



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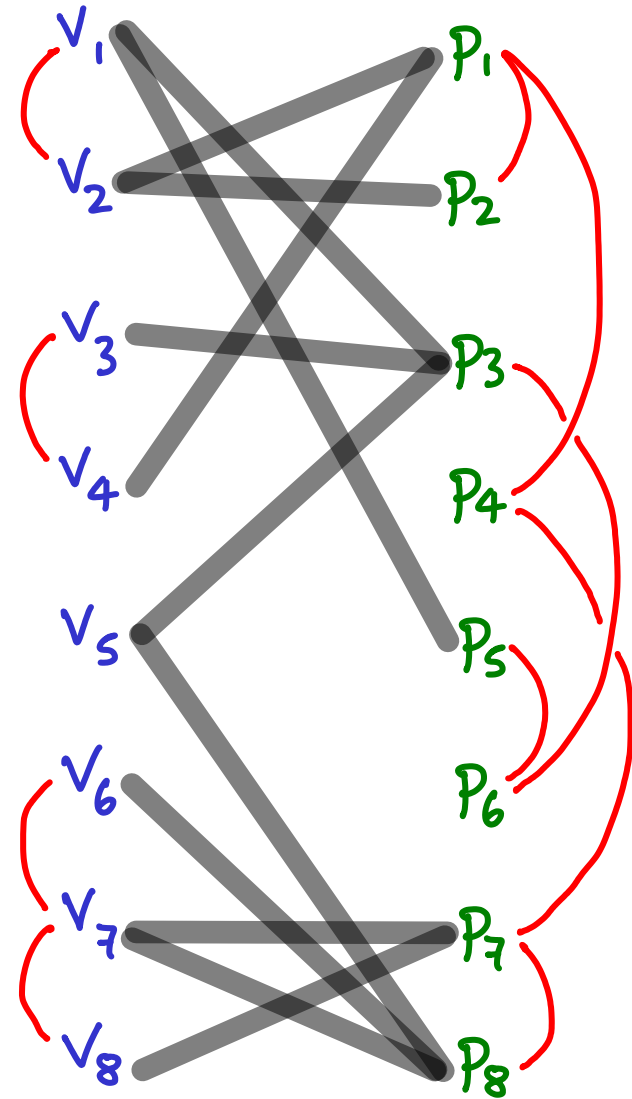
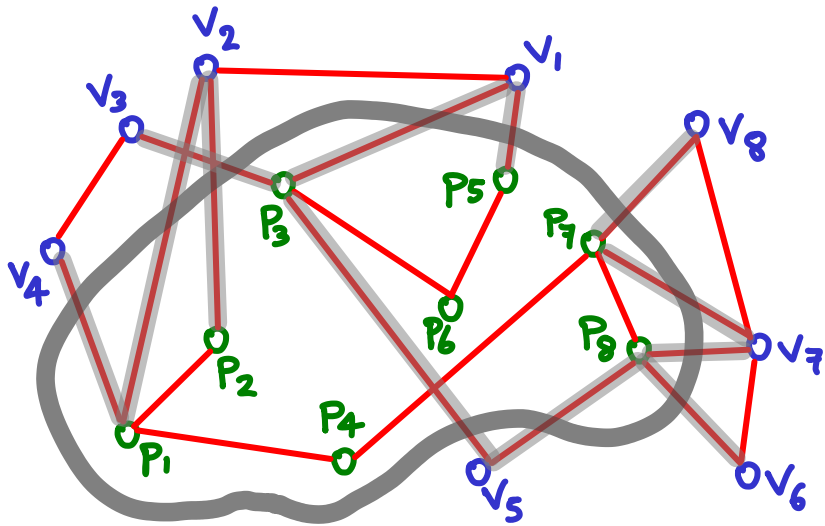


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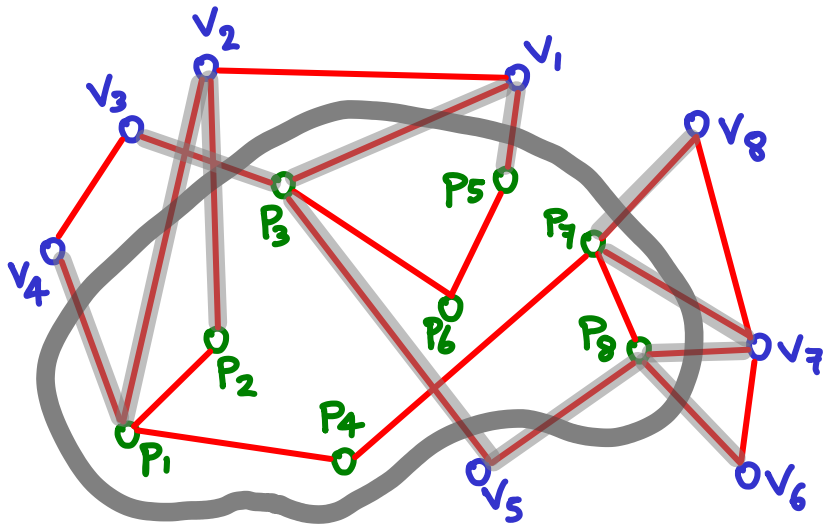


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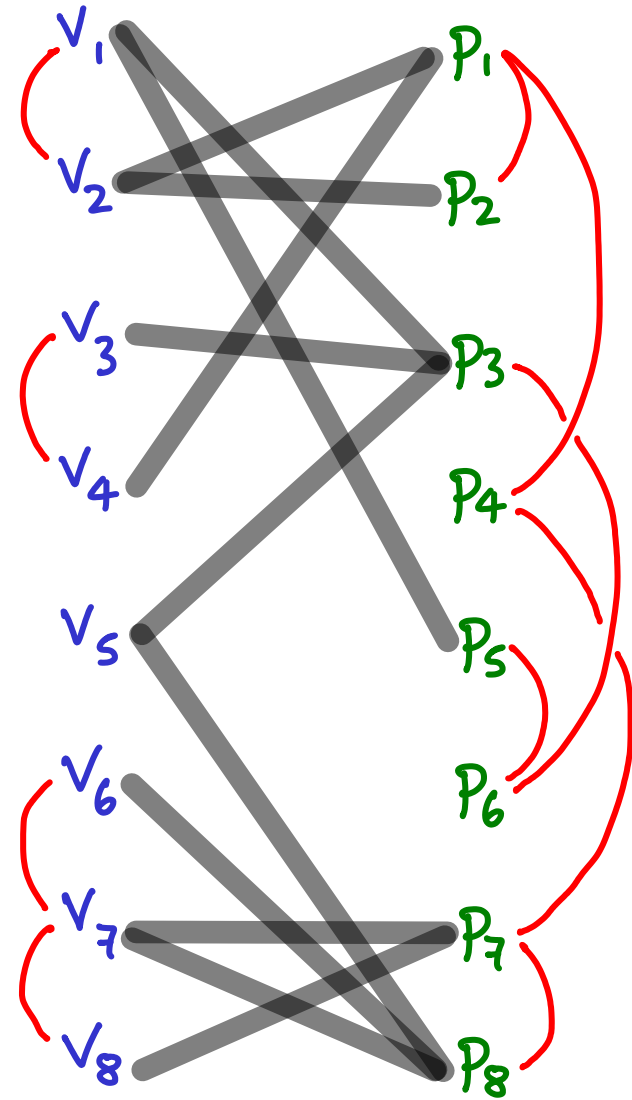
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$\text{Max}\{\text{all possible } X\} \geq E[X] \Rightarrow \exists \text{ cut crossing at least half}$

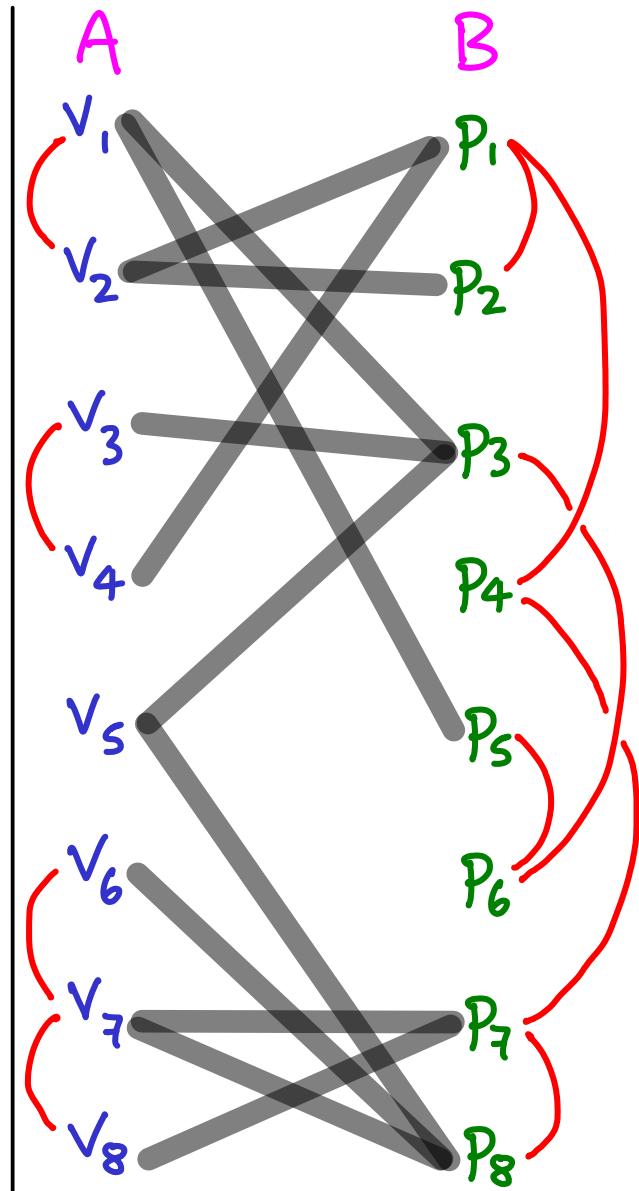


Matousek - Vondrak



$X = \# \text{edges that cross a random cut}$ $V \rightarrow A, B$

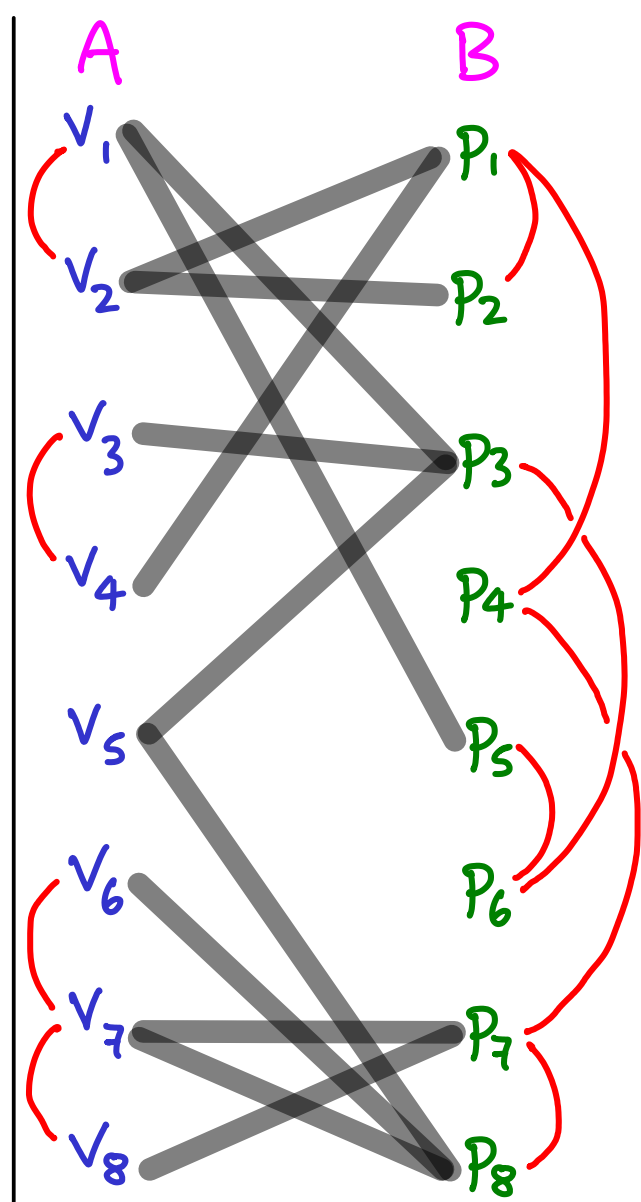
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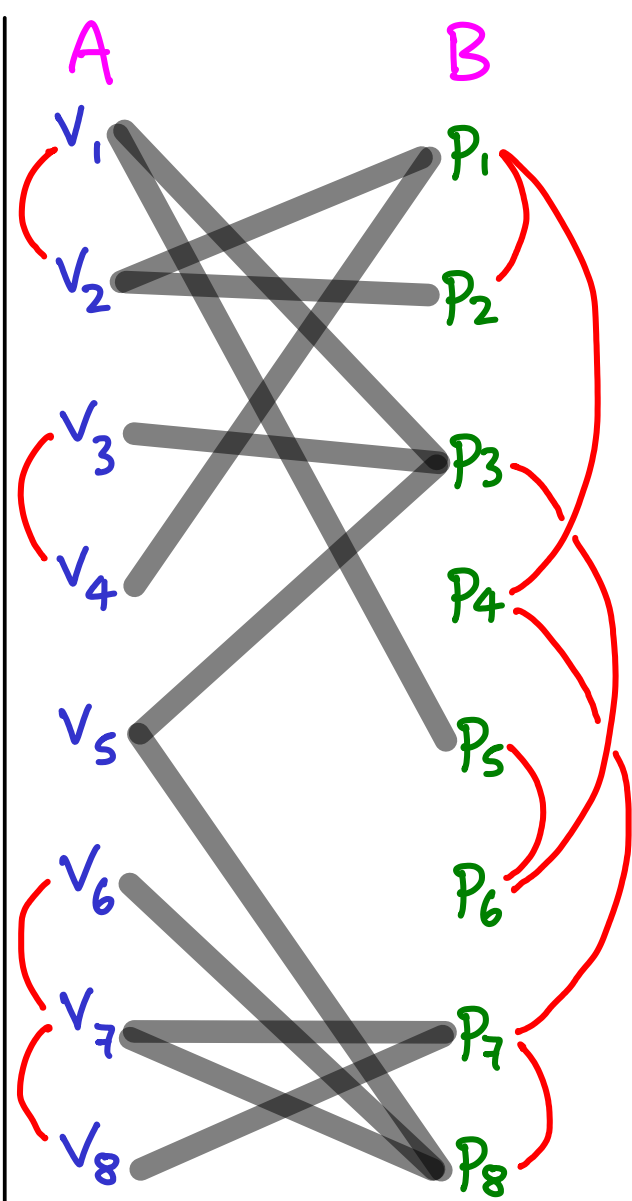


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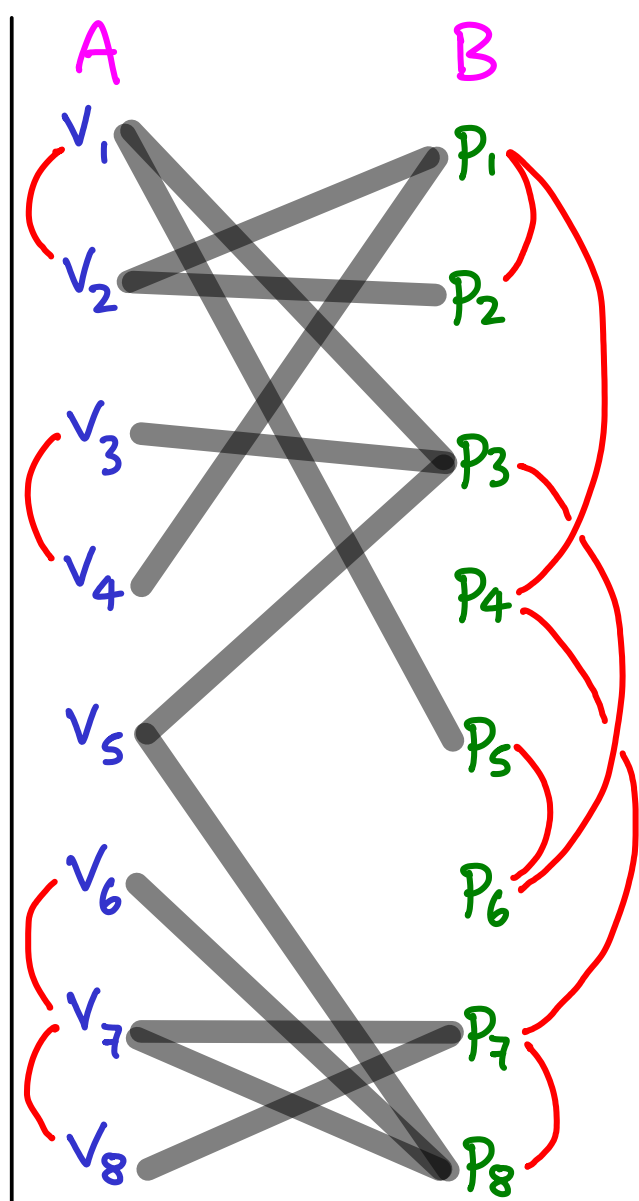
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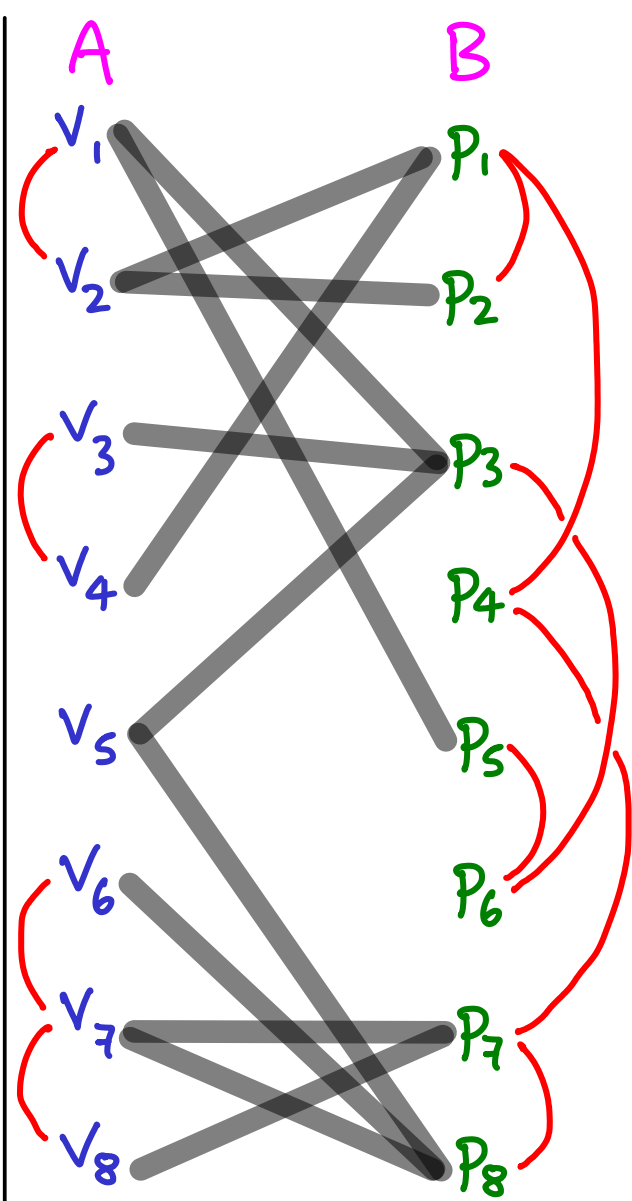
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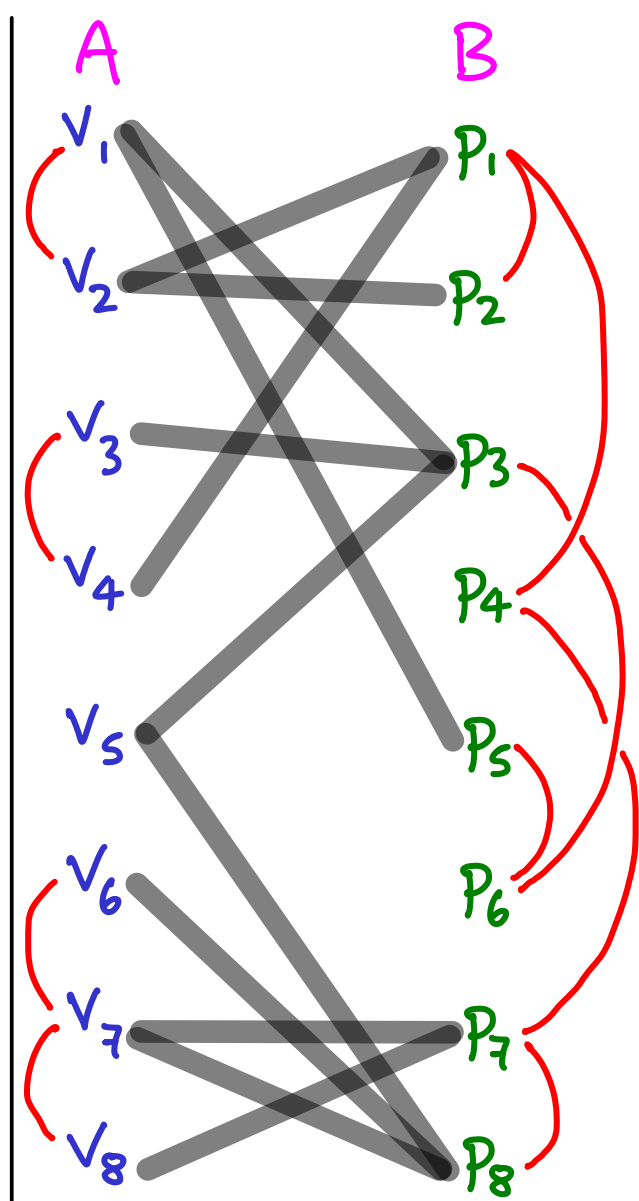
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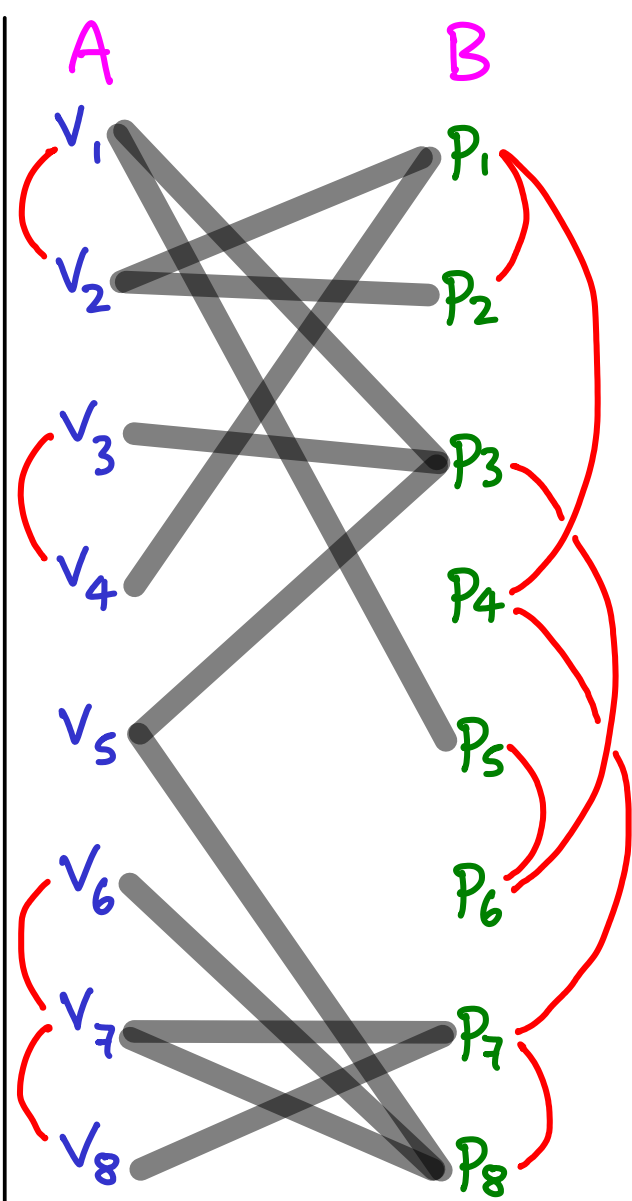
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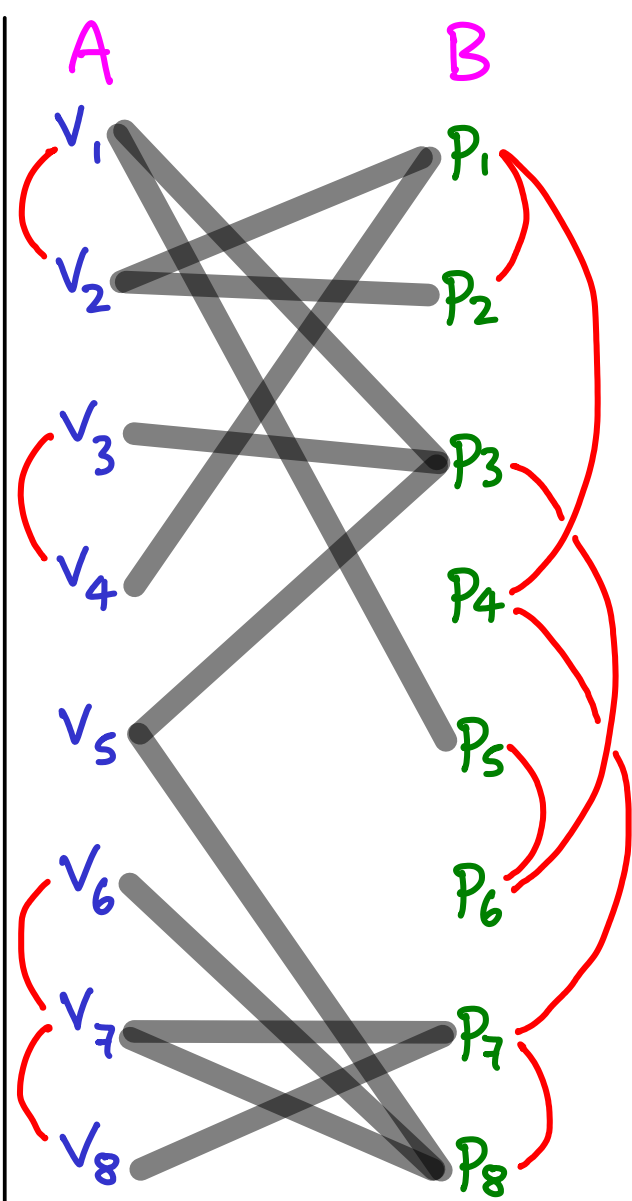
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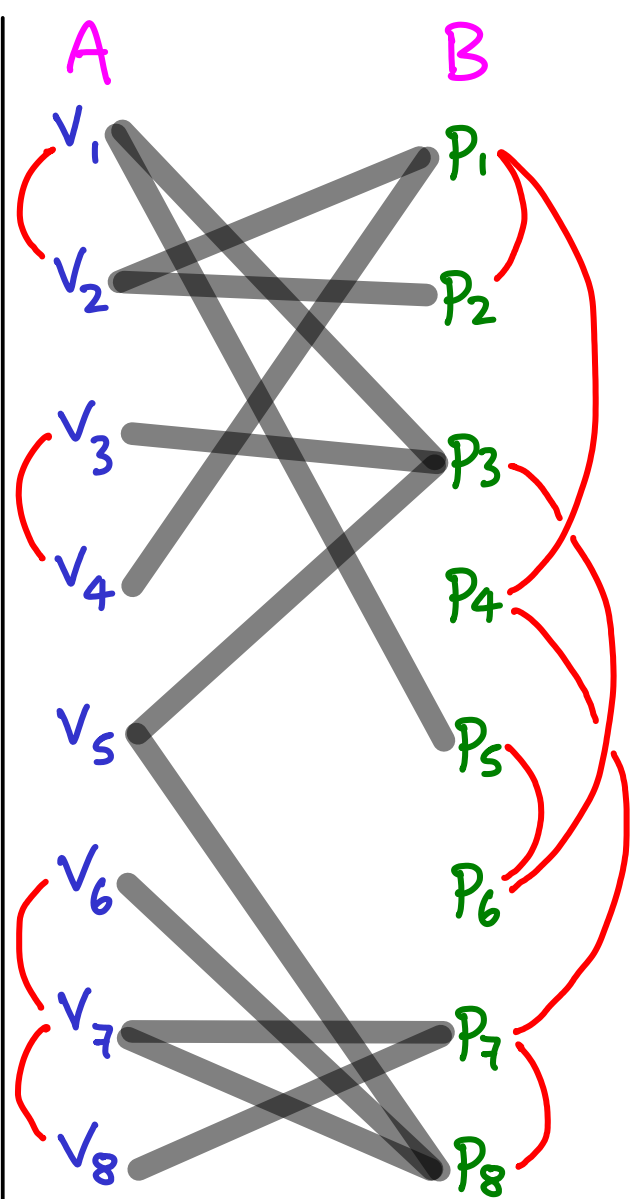
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slightly stronger

Matousek-Nesetril



A weak Turán theorem

For $G = \{n, e\}$, if the average degree $d = \frac{2e}{n} \geq 1$

then the largest independent set has at least $\frac{n}{2d}$ vertices

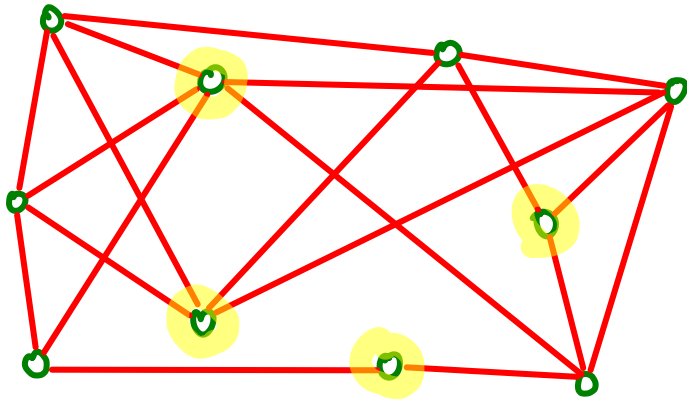
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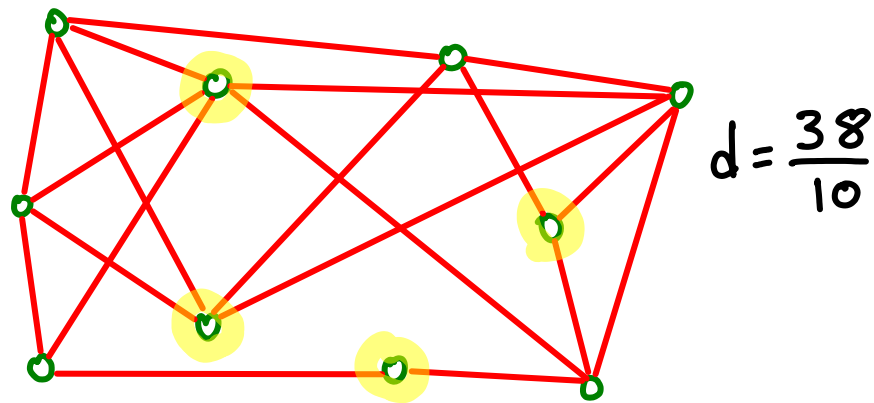


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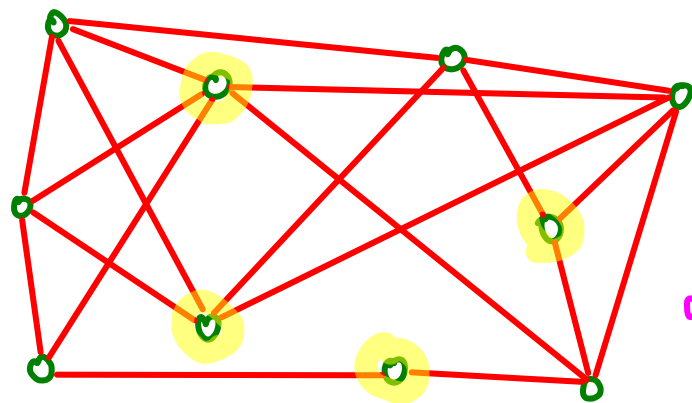
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$$d = \frac{38}{10}$$

$$\alpha \geq \frac{10}{2 \cdot 3.8} > 1 \quad \therefore$$

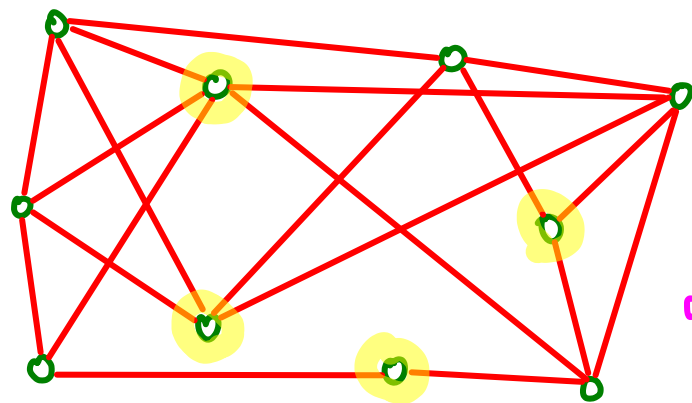
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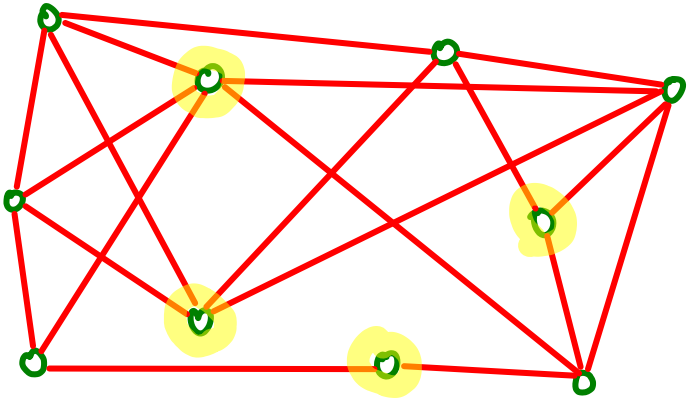
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$$\nearrow \frac{10}{4 \cdot 8} > 2$$

(actual) Turán theorem gives $\geq \frac{n}{d+1}$: in fact $\exists$ graphs matching this

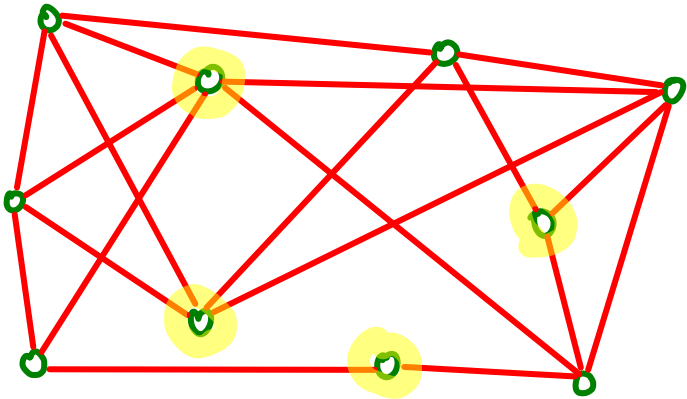
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Proof:

- keep each vertex with probability p
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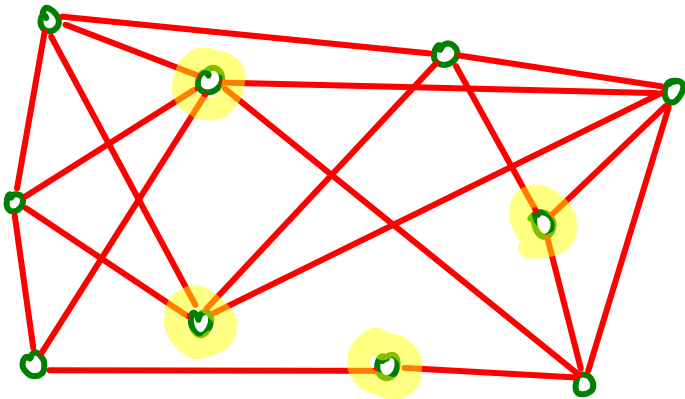


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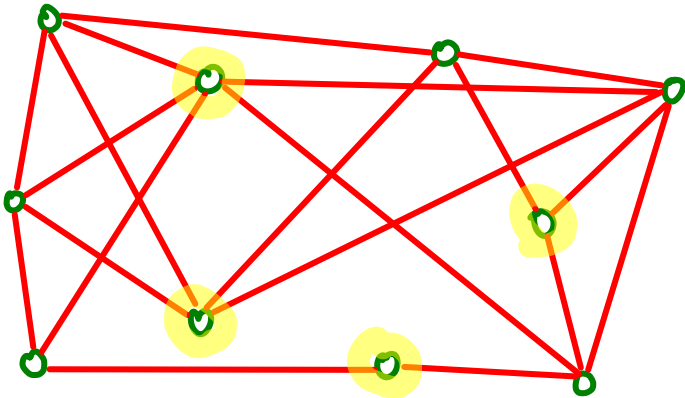
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$$E[X] = ?$$

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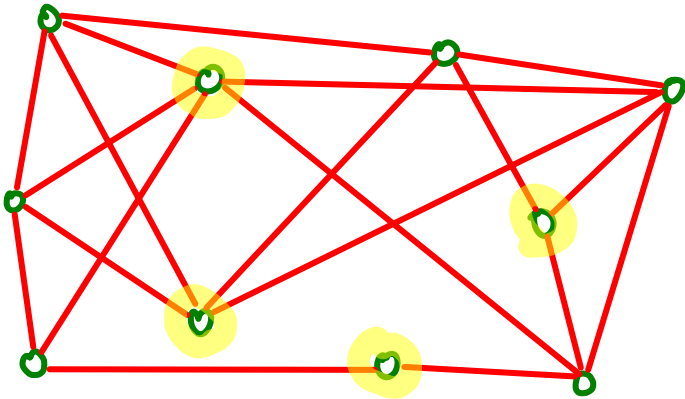
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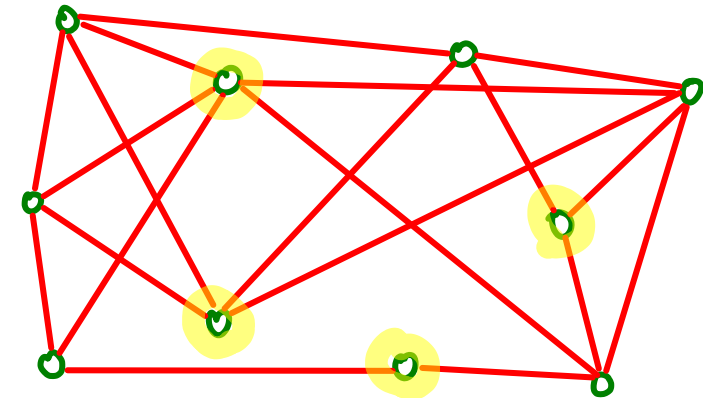
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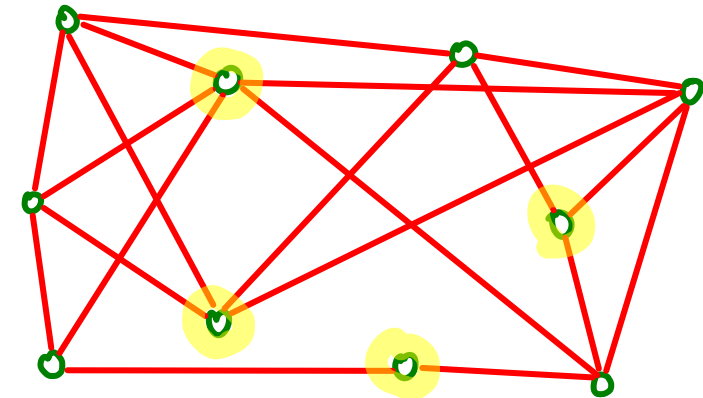
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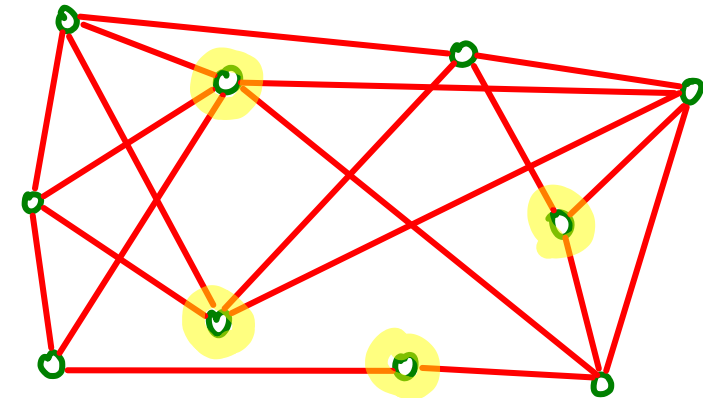
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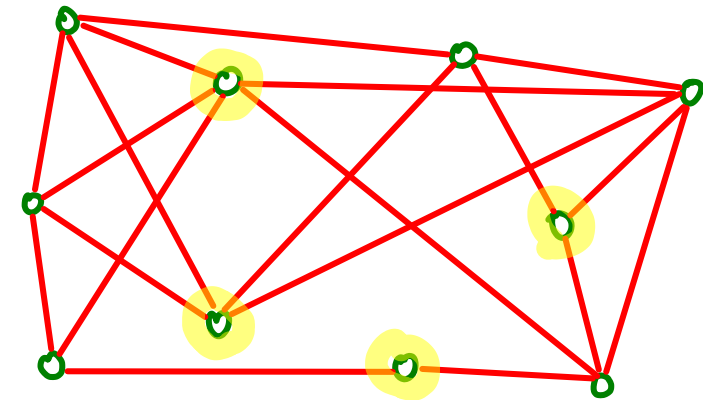
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(induced subgraph, according to our rules)



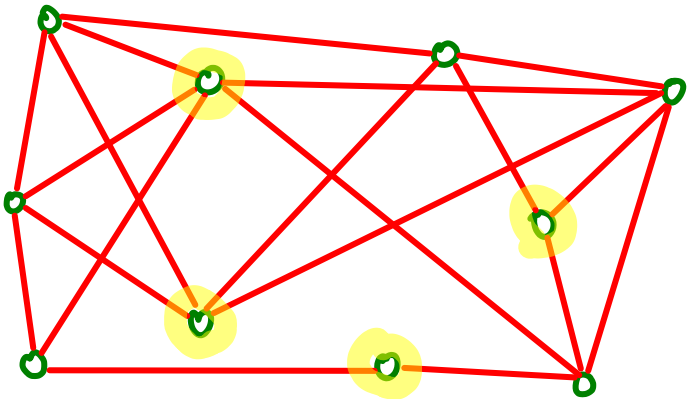
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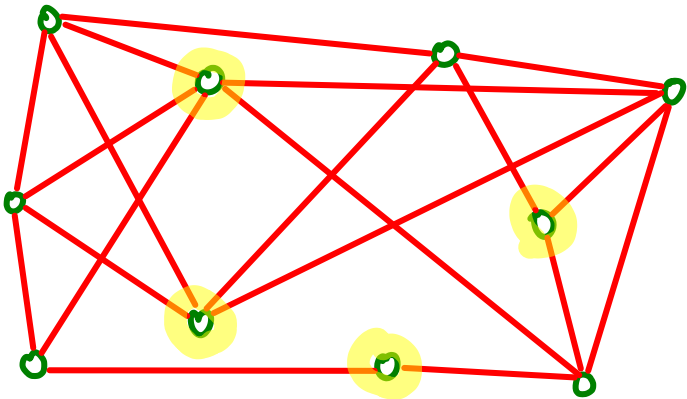


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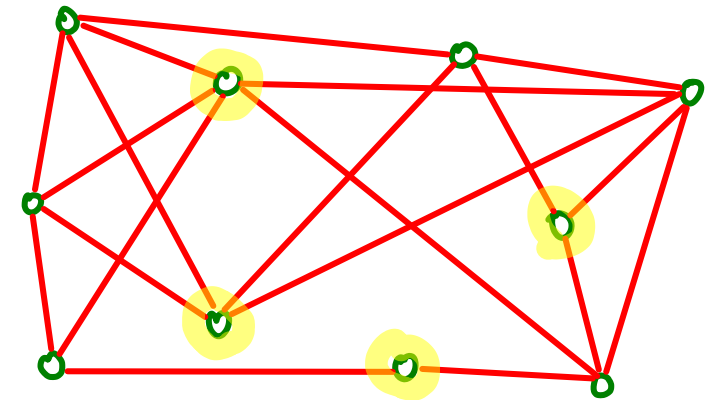
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For every edge in S , discard one vertex.

Why?

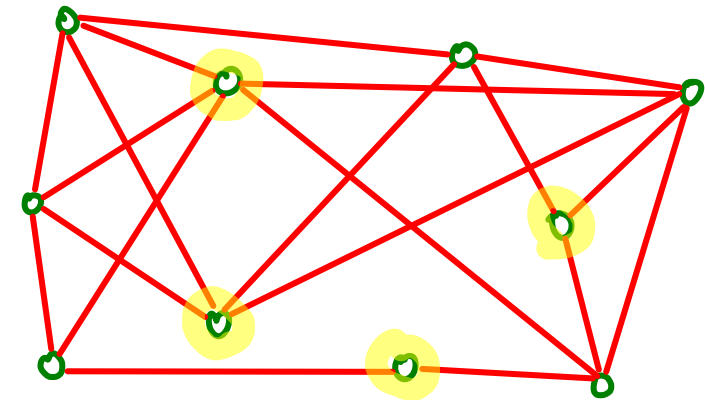
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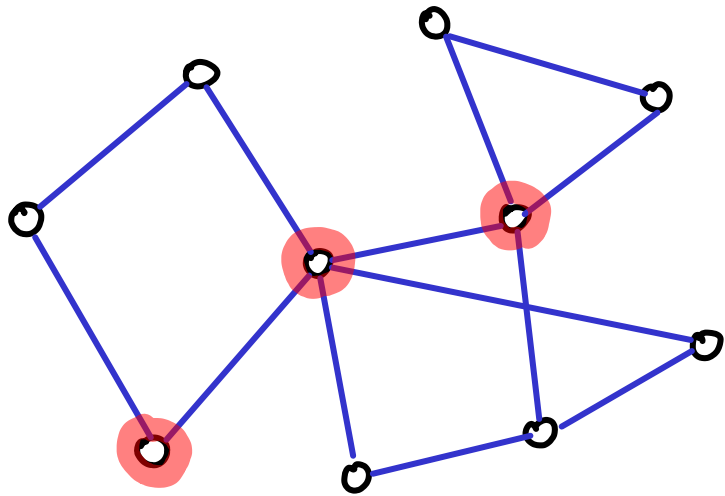
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discard $\leq Y$ vertices $\Rightarrow X - Y$ remain.

They form an independent set. $\square$

DOMINATING SET

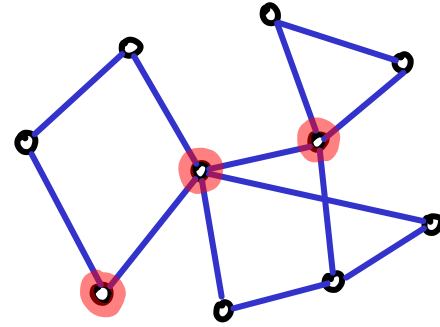
$S \subseteq V$ s.t. every $v \in V$ is either in S or adjacent to a vertex in S



Which towns should get a hospital so every town is adjacent to a hospital?

↳ how many hospitals needed?

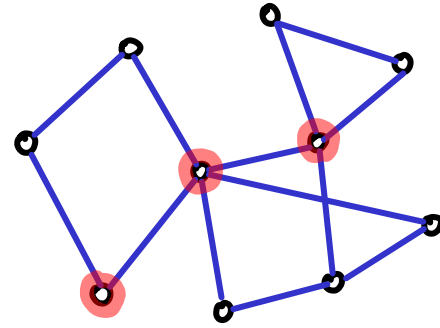
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$|V| = n$. Suppose min-degree = $\delta > 1$

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Proof: let every vertex survive with probability $p \dots$

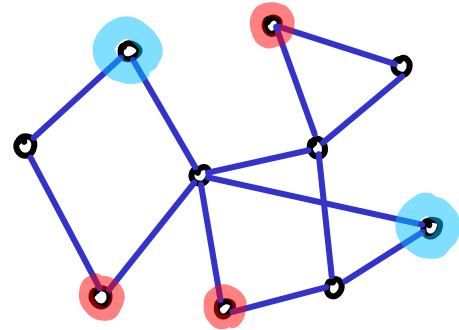
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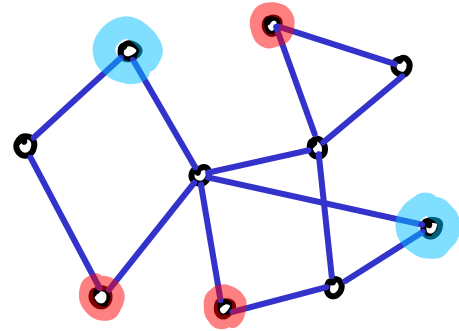
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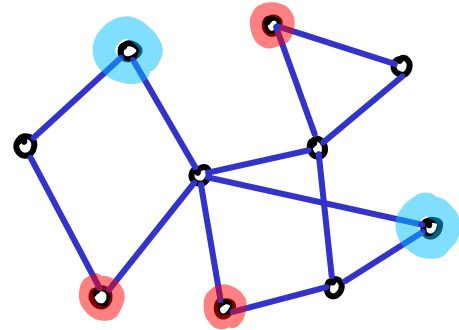
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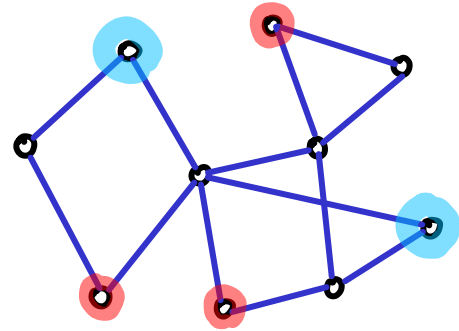
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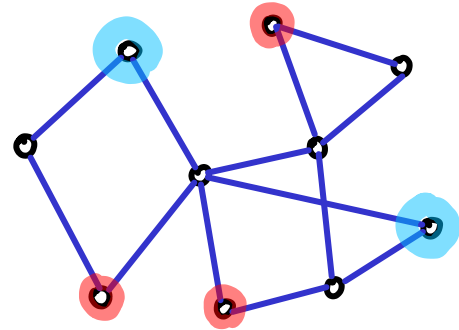
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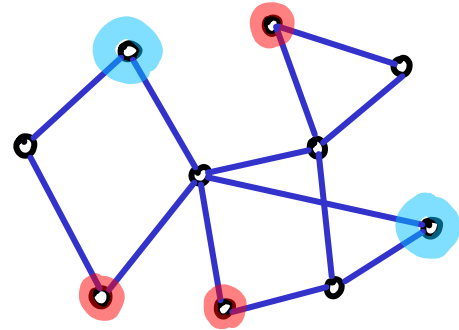
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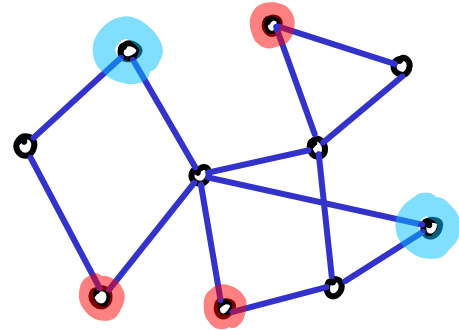
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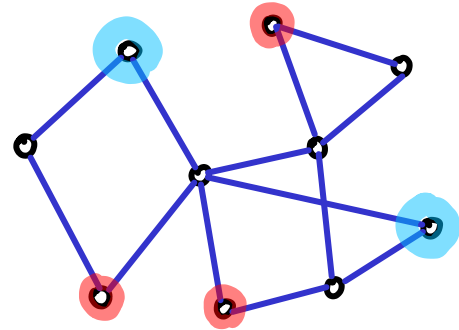
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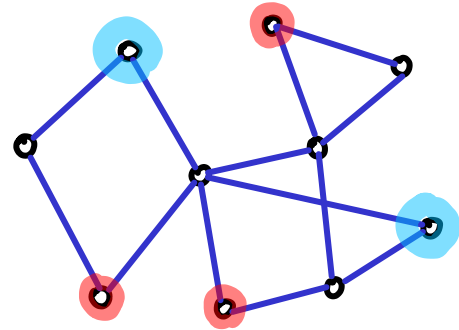
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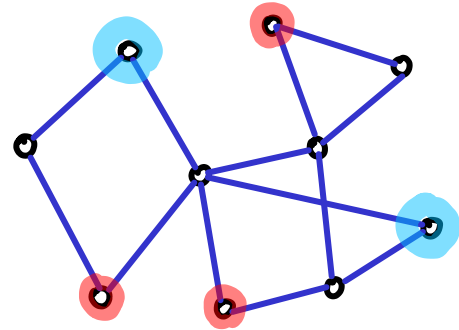
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(for $p \geq 0$)
 $1-p \leq e^{-p} \Rightarrow$

$$\leq n \cdot p + n \underline{e^{-p(1+\delta)}}$$

$$\text{Taylor: } e^x = 1 + x + \frac{x^2}{2} + \frac{x^3}{6} + \dots + \frac{x^k}{k!} + \dots$$

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$$\text{e.g. } \delta = 9 \Rightarrow \text{dominating set} \leq \frac{n}{3}$$

$$\sim n \cdot \frac{1+2.3}{10}$$

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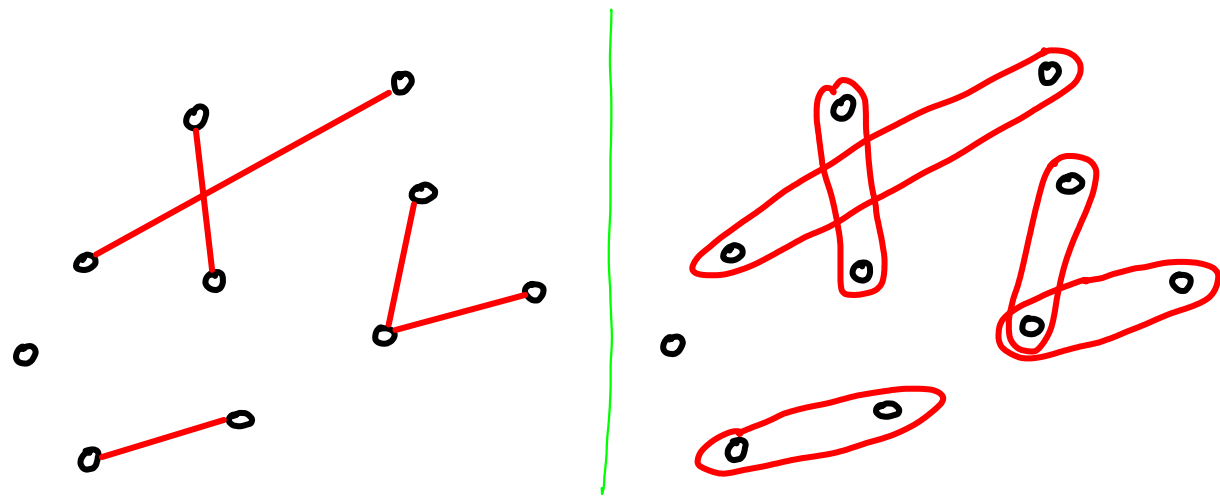
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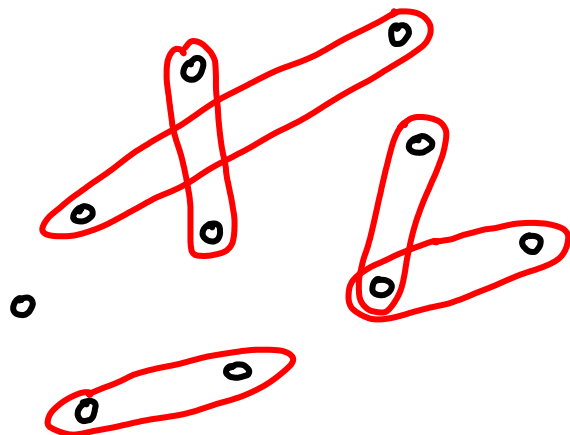
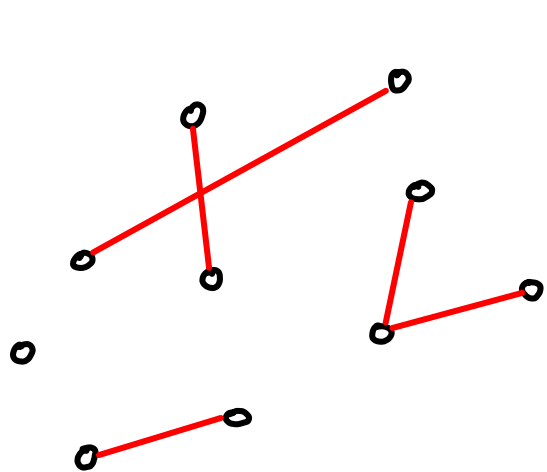
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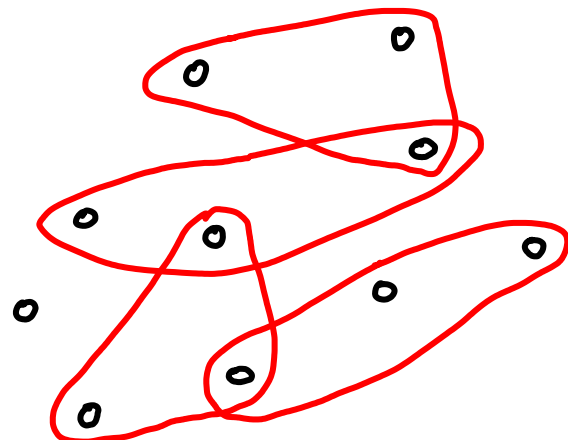
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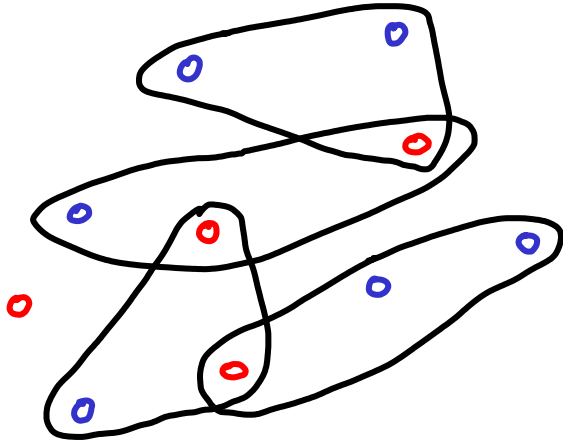


n -uniform hypergraph:
every edge has n vertices

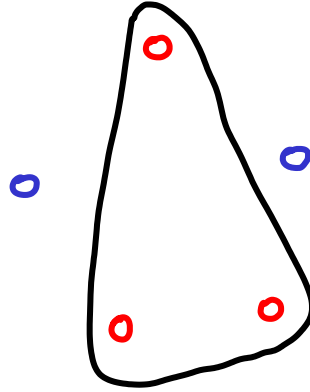
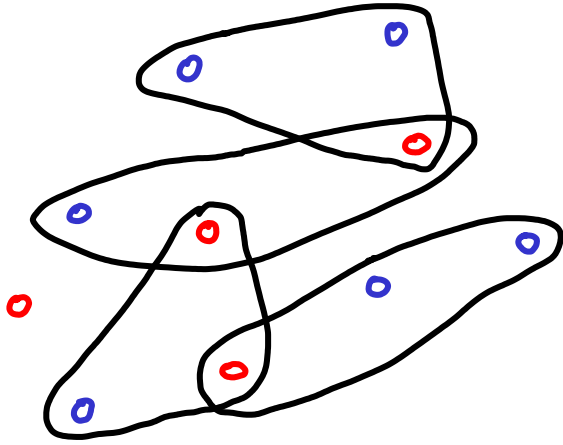
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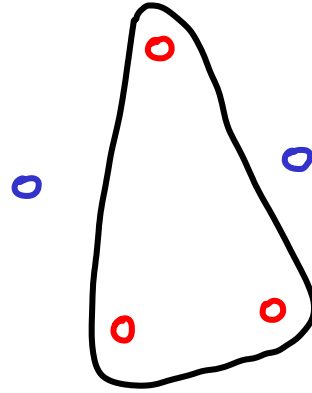
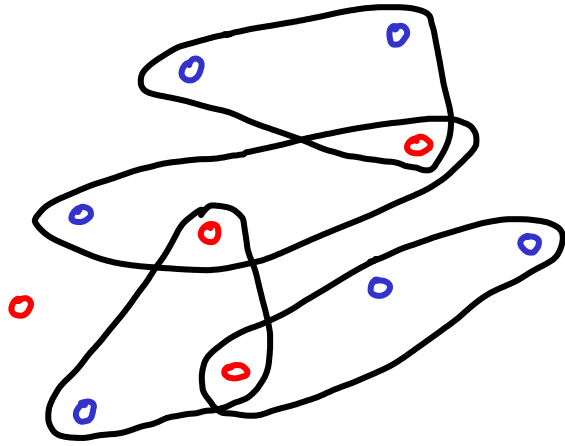


$V=5$

Complete 3-uniform

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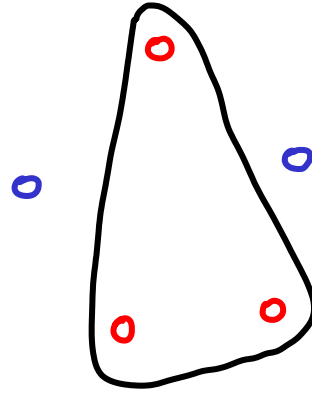
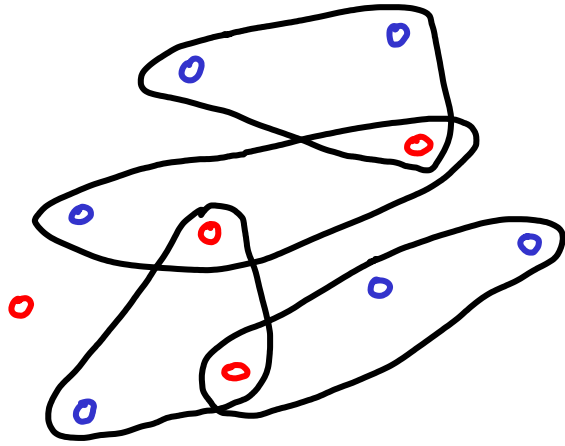
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Claim: if n -uniform with $< 2^{n-1}$ edges, then 2-colorable

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This is a lower bound on #edges required
to get a non-2-colorable n -uniform hypergraph

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See Alon-Spencer, p.7 for upper bound & more refined lower bound

