

Combinatorial Discrepancy

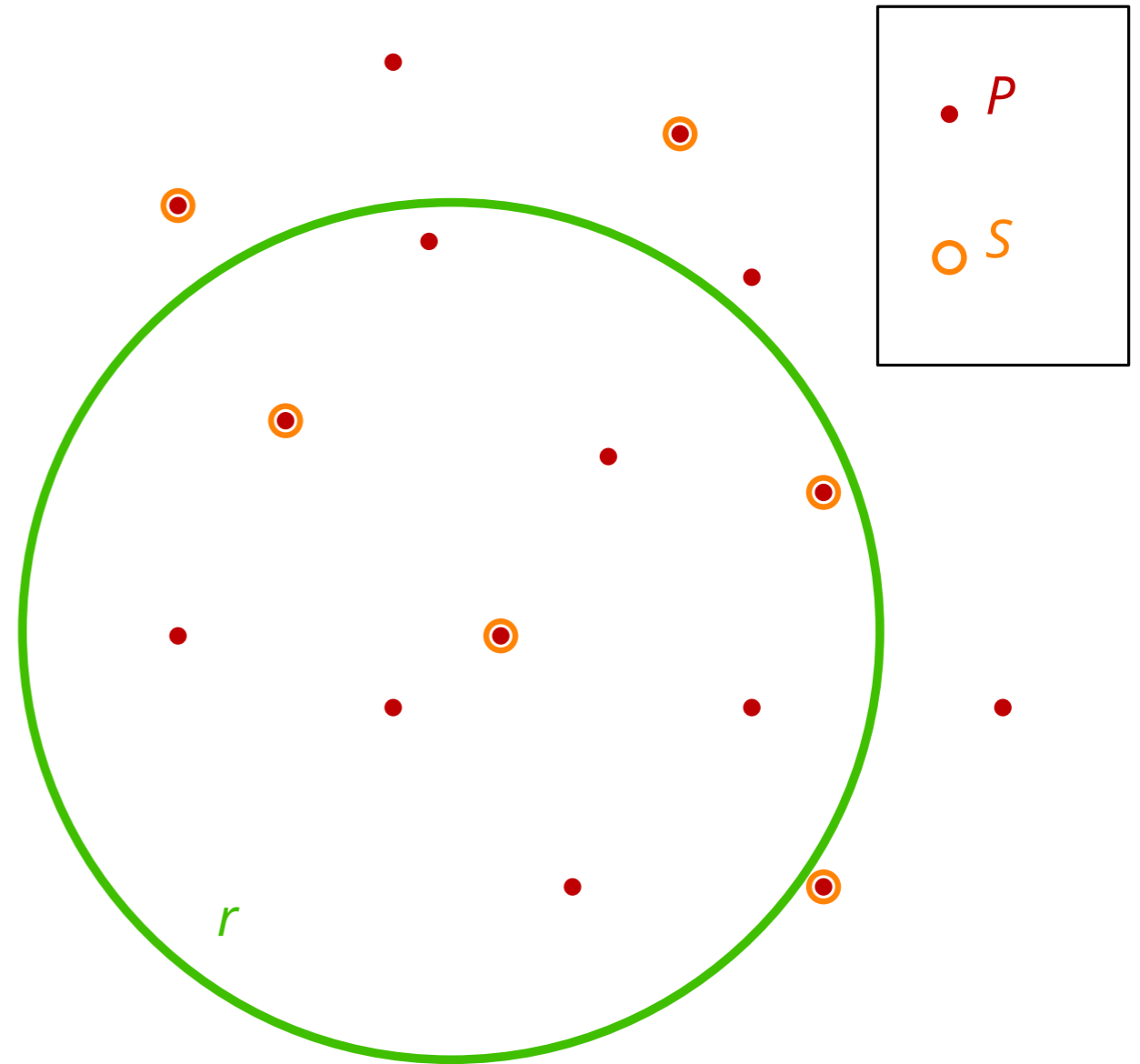
sampling using discrepancy

computing spanning trees with low stabbing number via reweighting

ε -samples

Measure: $\mu(r) = \frac{|r \cap P|}{|P|}$

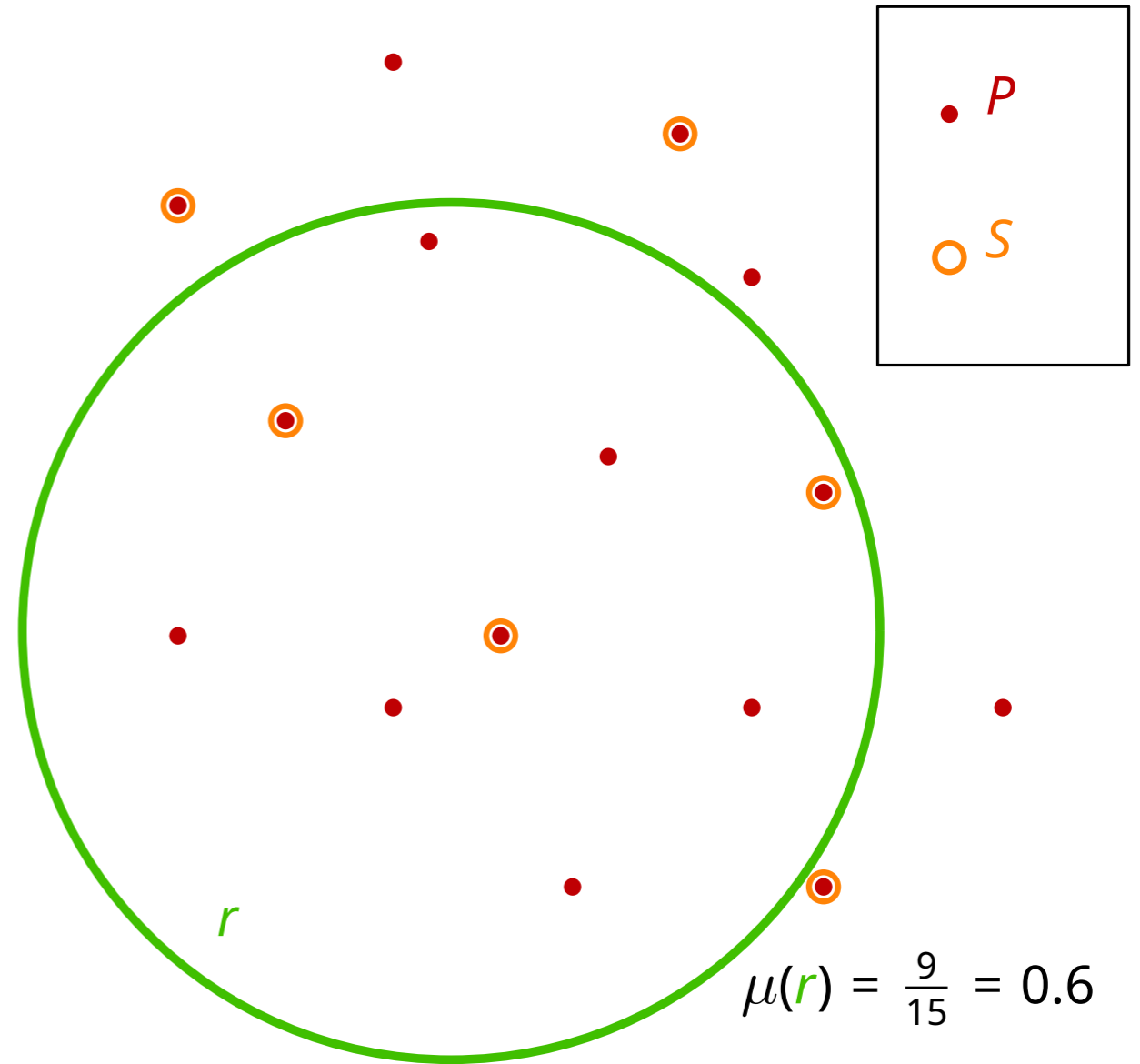
Estimate: $\hat{\mu}(r) = \frac{|r \cap S|}{|S|}$



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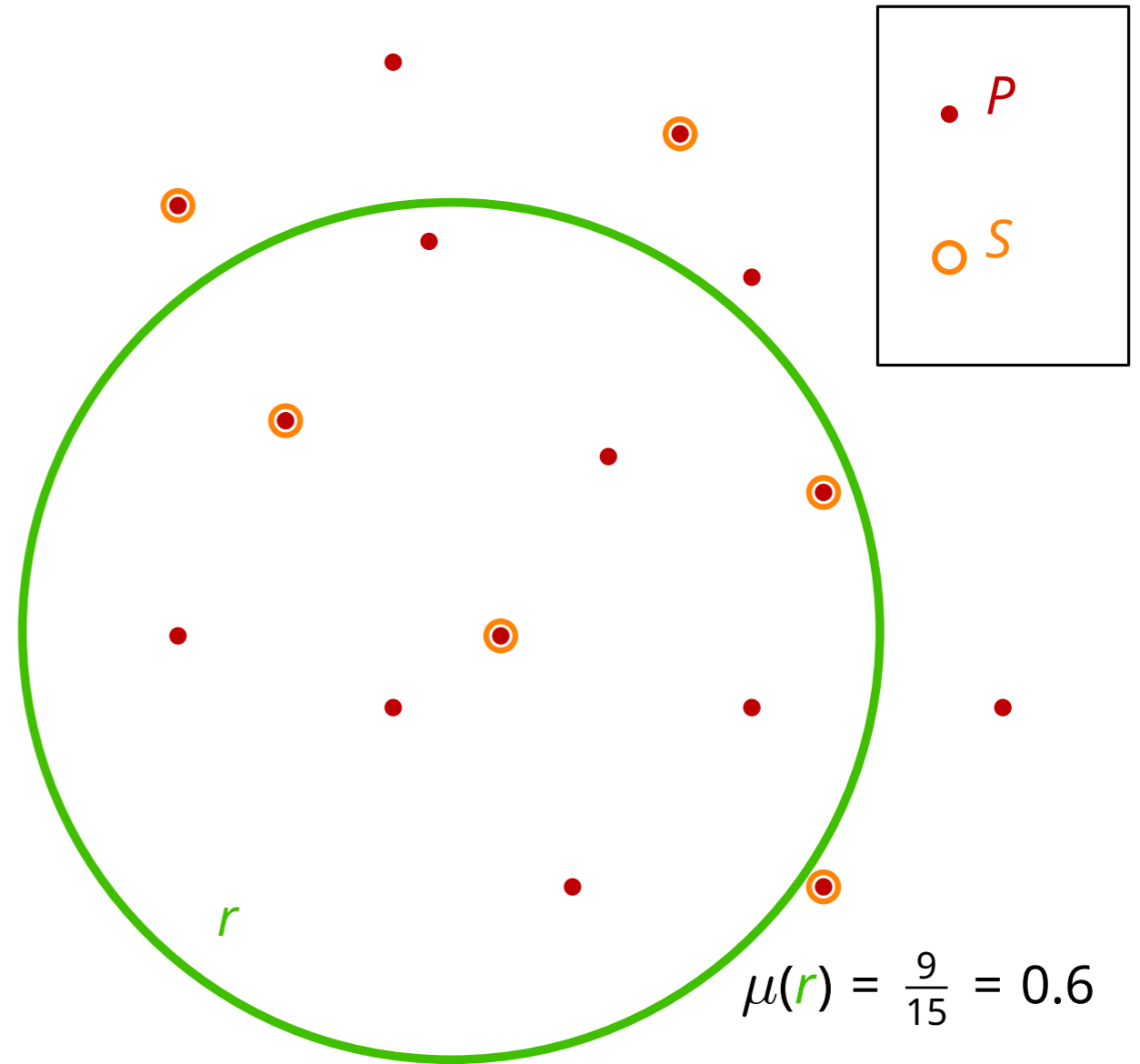
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$$\mu(r) = \frac{9}{15} = 0.6$$

$$\hat{\mu}(r) = \frac{3}{6} = 0.5$$

ε -samples

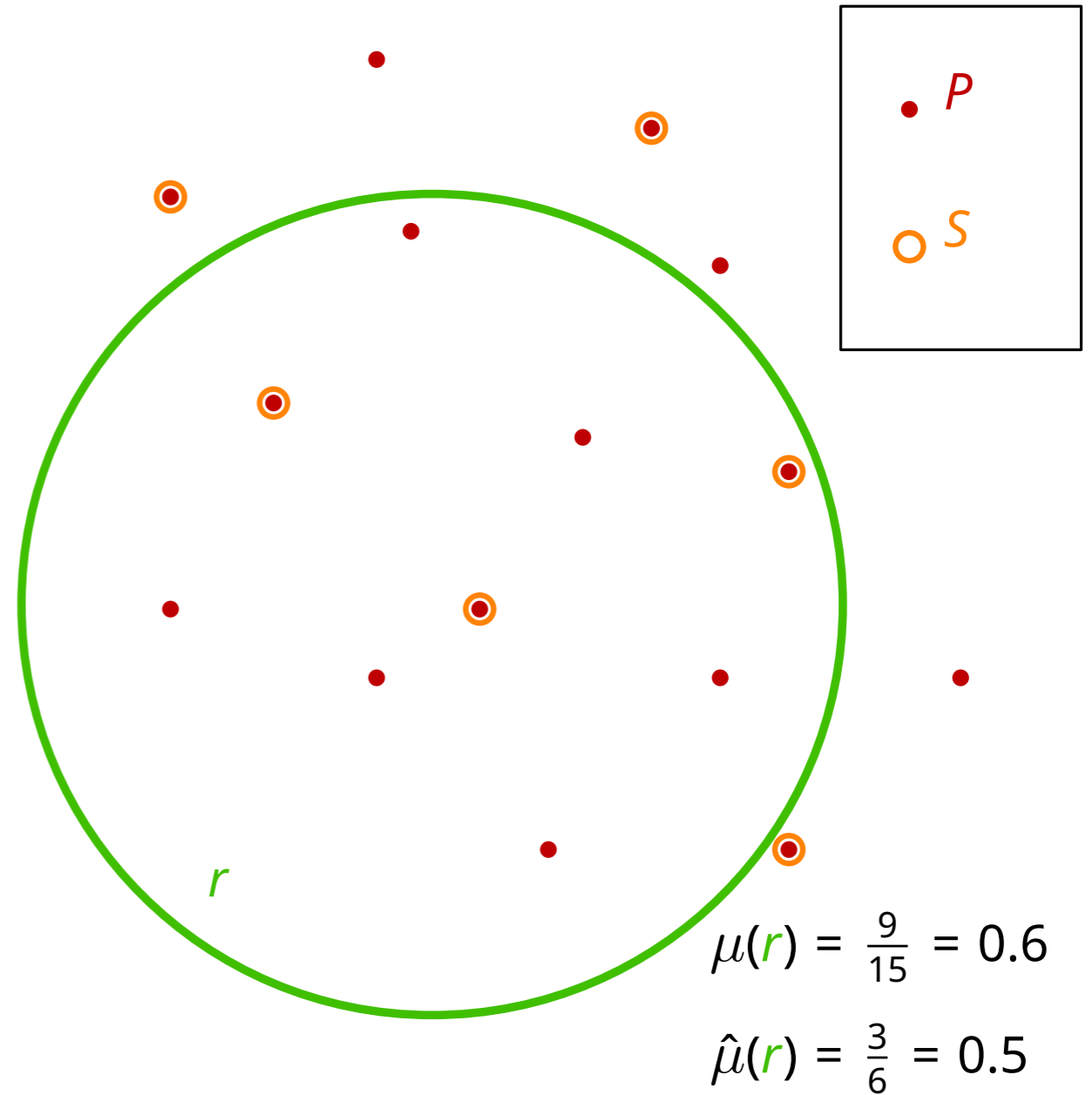
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ε -sample S :

for all $r \in \mathcal{R}$ and any $0 \leq \varepsilon \leq 1$

$$|\mu(r) - \hat{\mu}(r)| \leq \varepsilon$$



ε -samples

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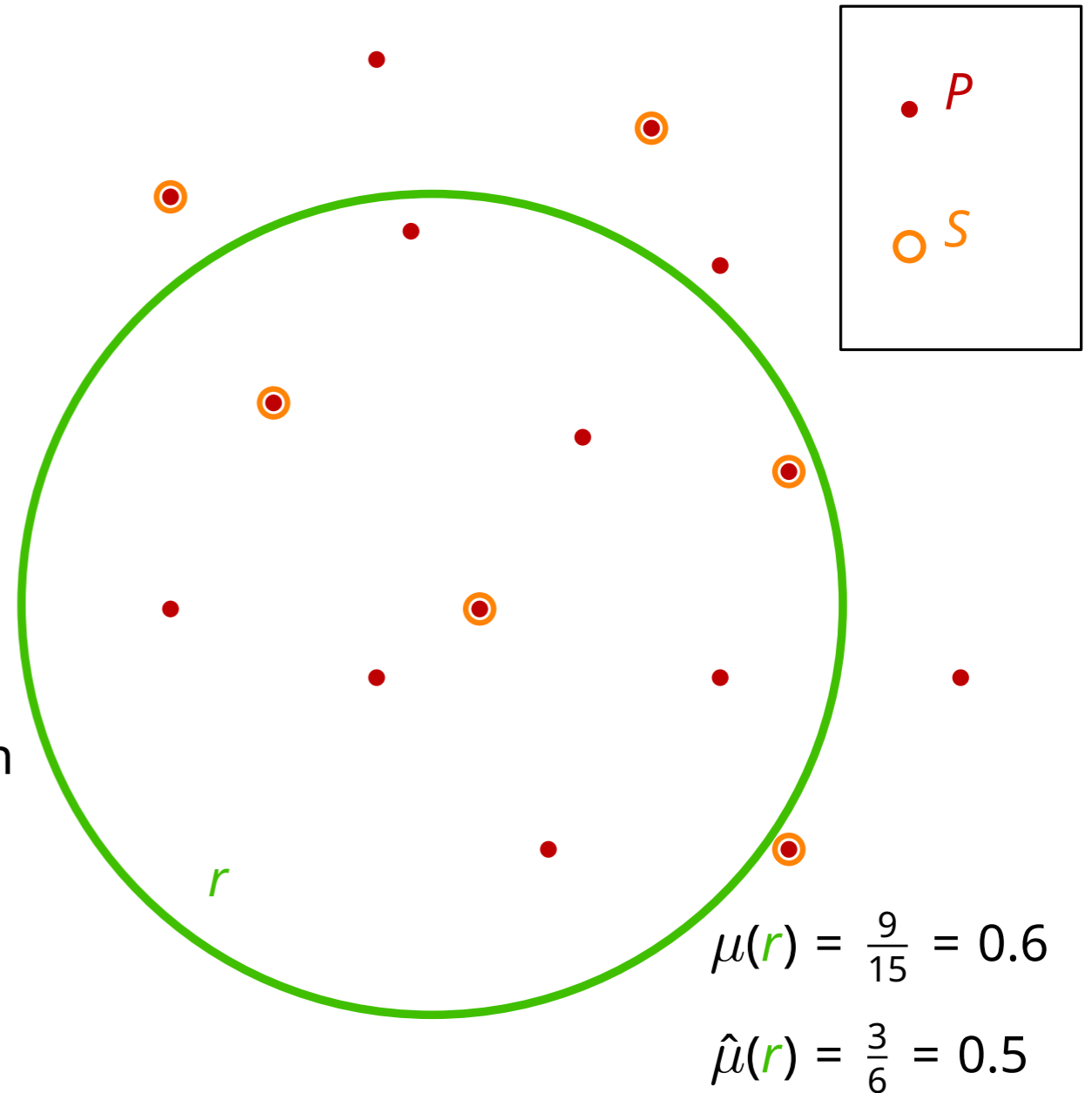
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ε -sample theorem: For constant $p > 0$ and VC-dim. a random sample of size $O(1/\varepsilon^2)$ is an ε -sample with probability p .



ε -samples

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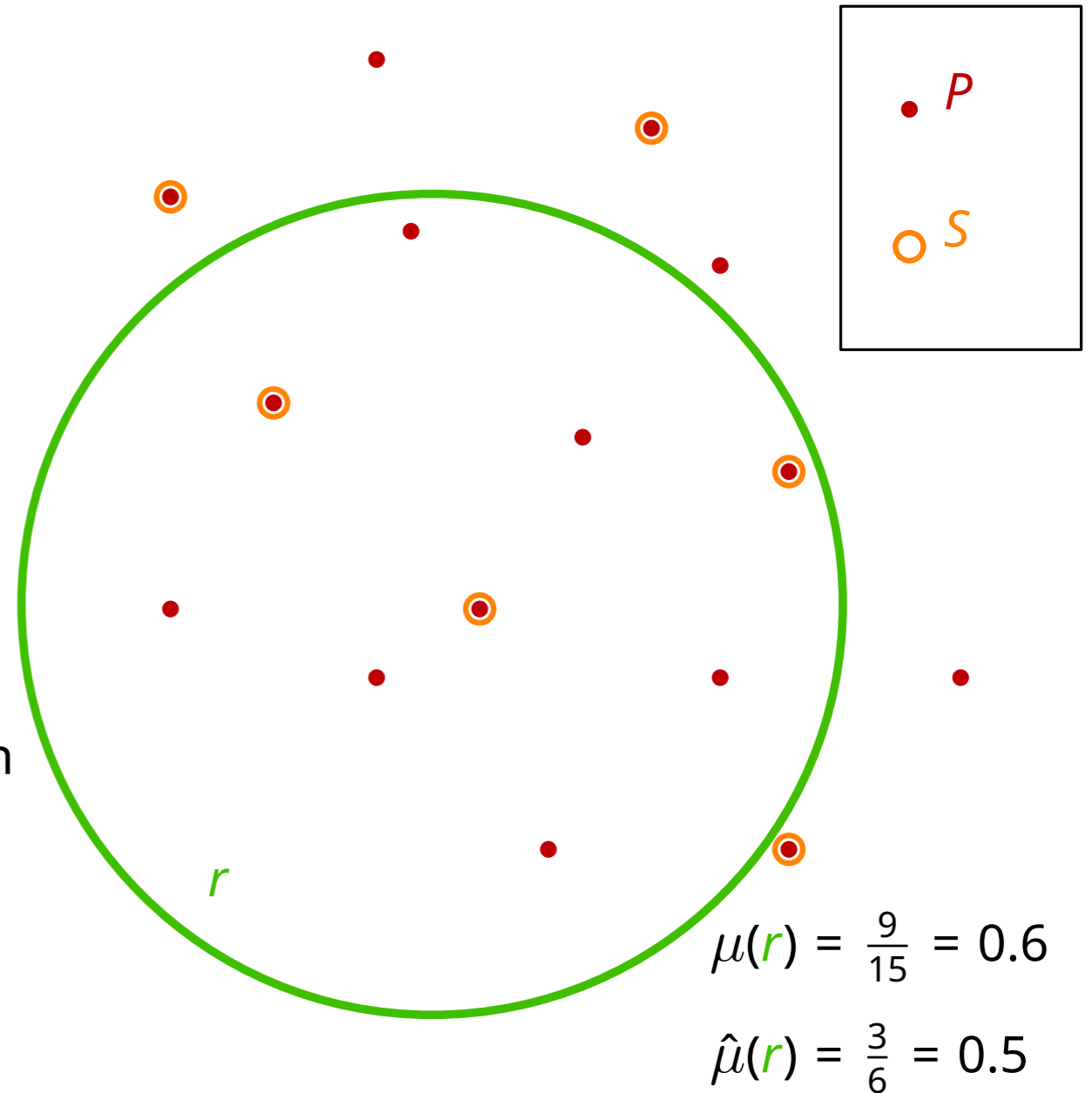
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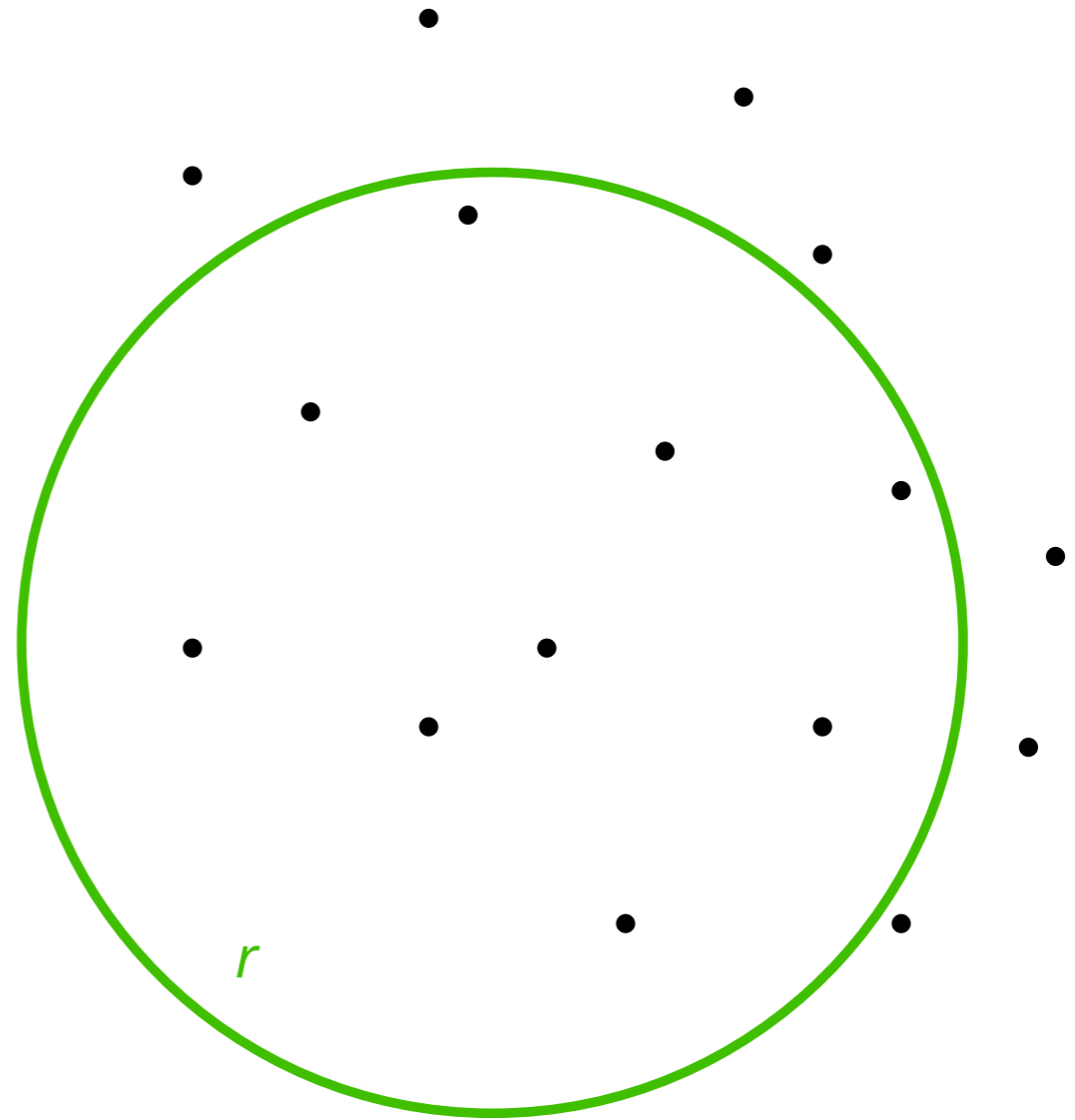
Smaller size? Deterministic construction?

Via **discrepancy!**



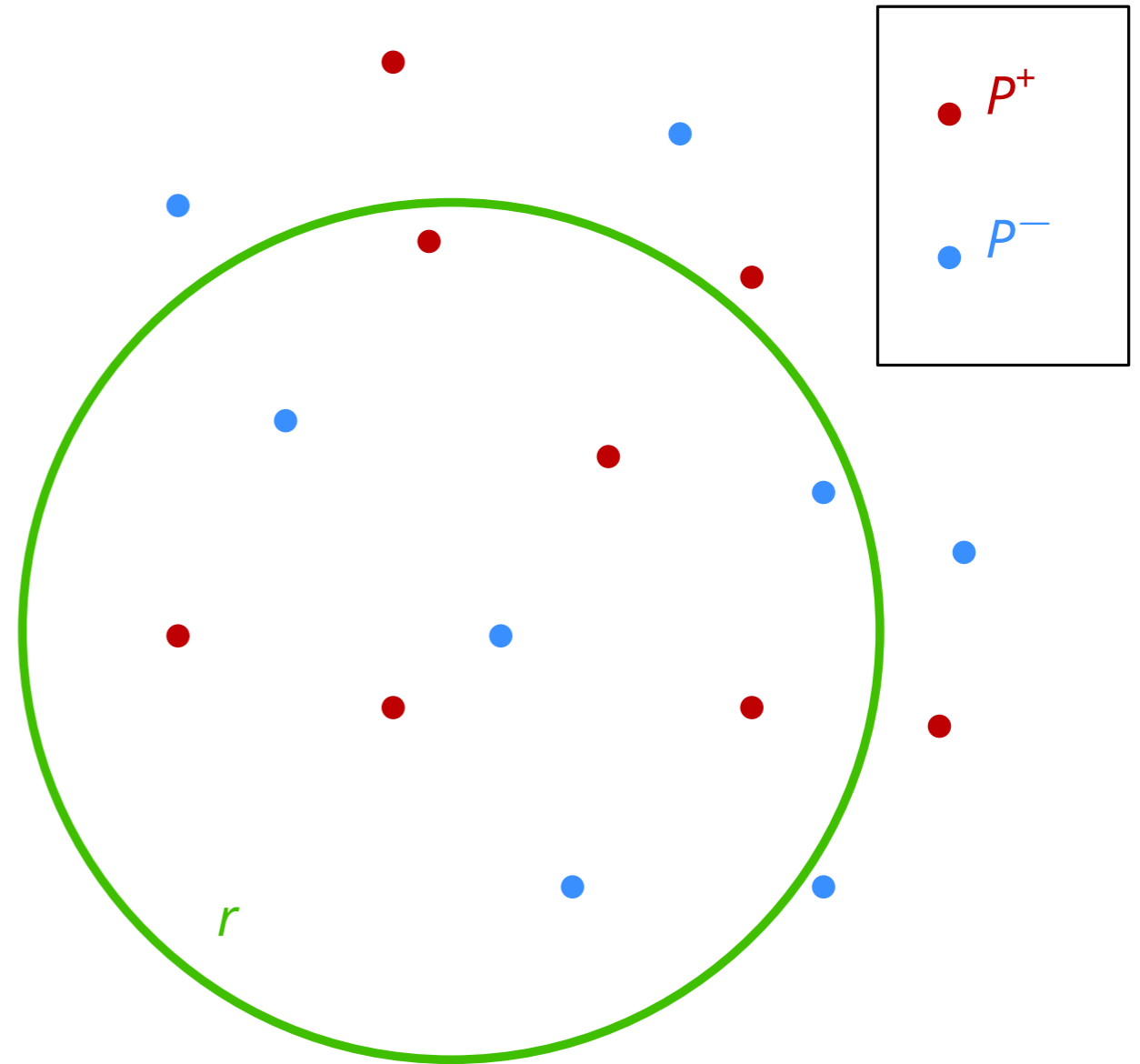
Discrepancy

Color P in two colors: '1' (red) and '-1' (blue)



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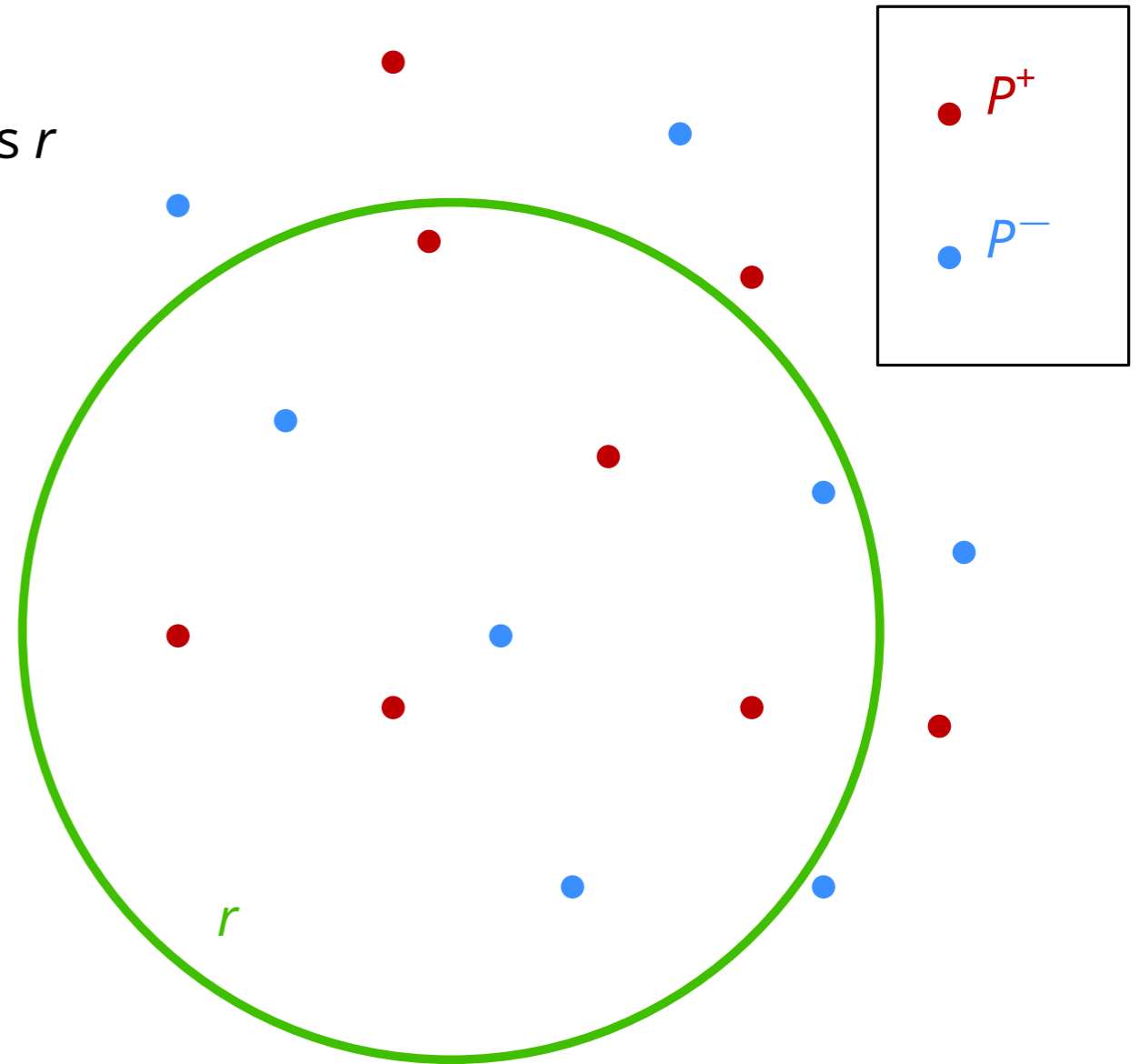
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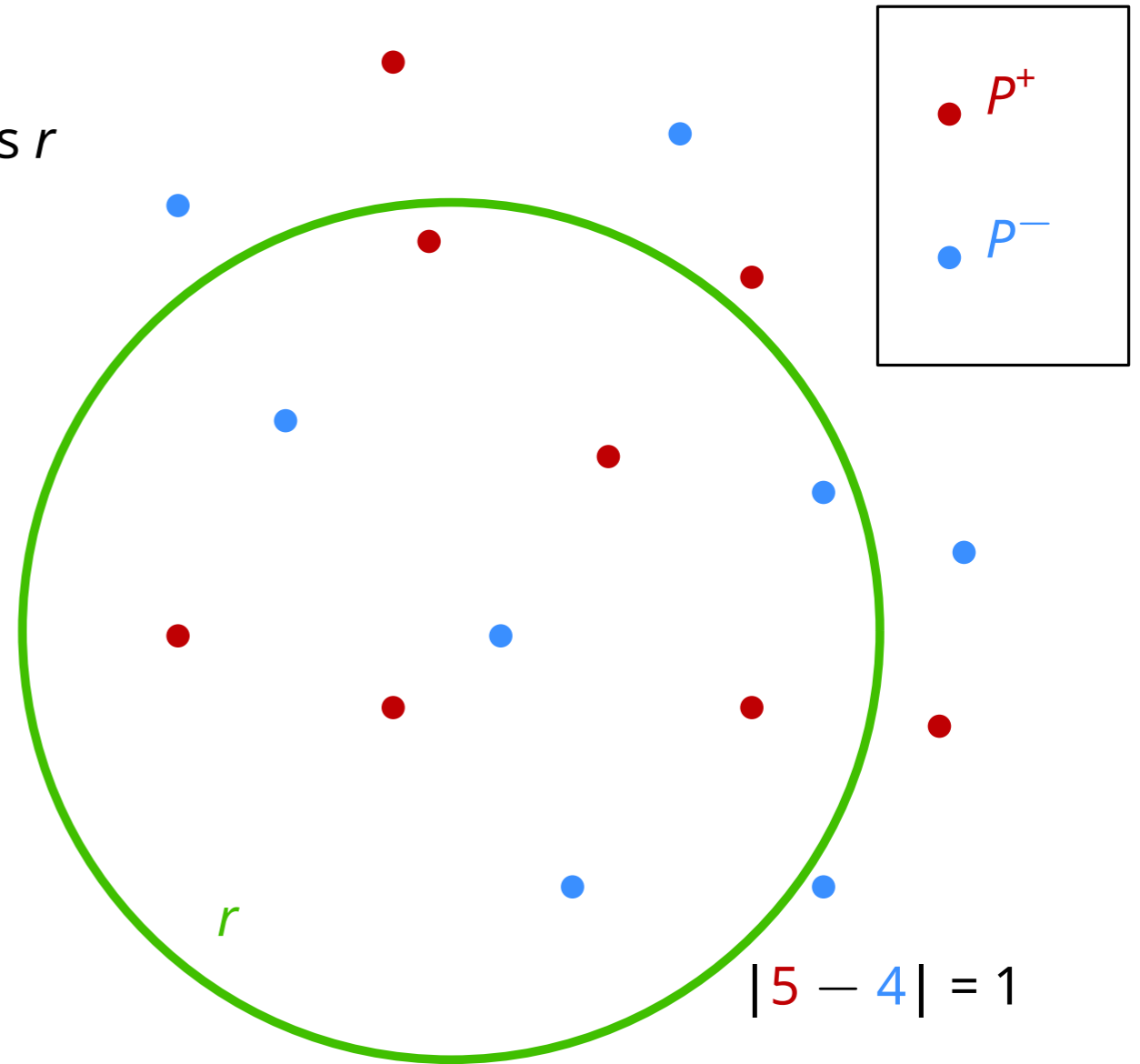
s.t. $|\chi(r)| = |\text{red} - \text{blue}|$ is small for all ranges r



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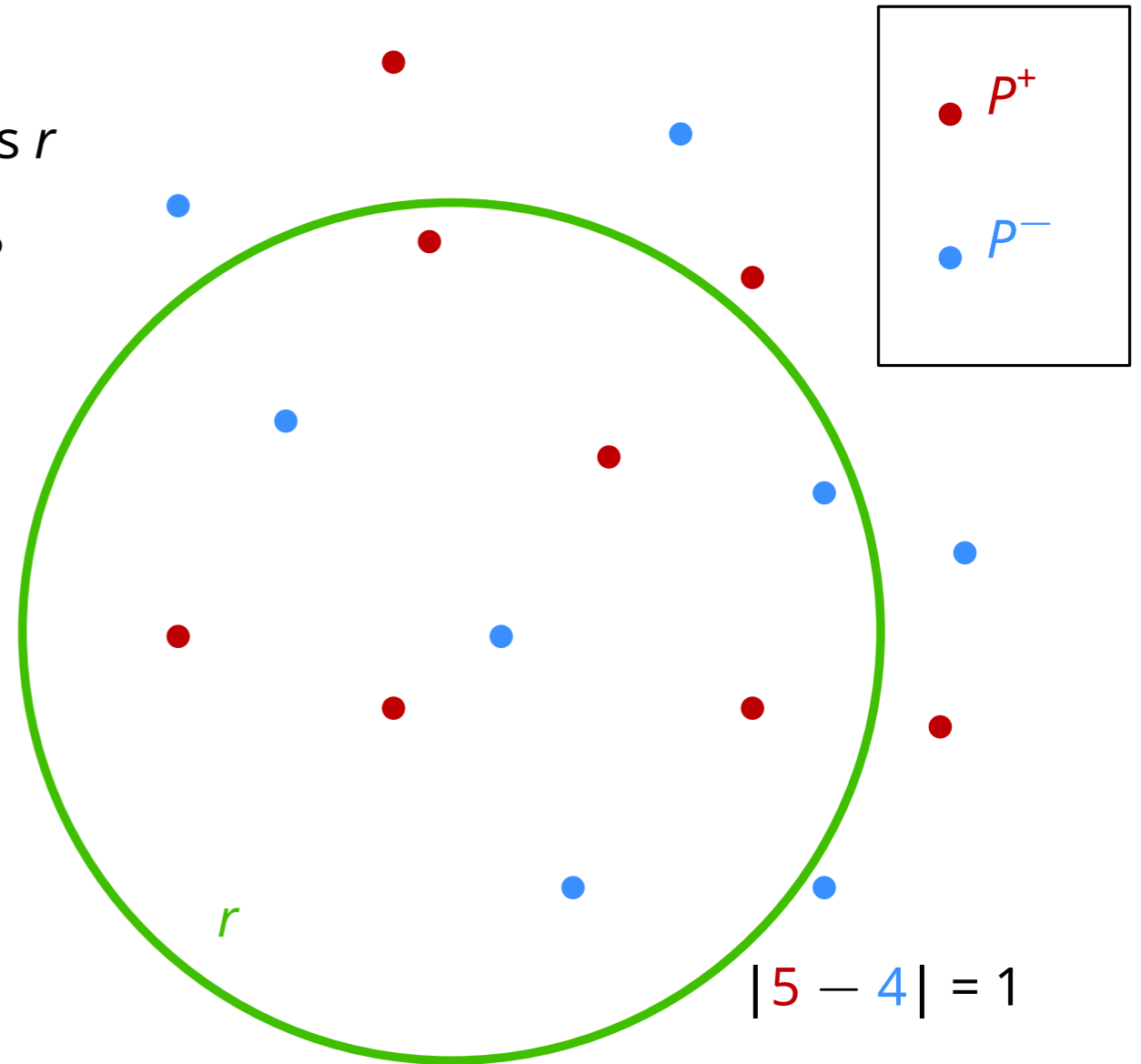
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Quiz What is $\max_{r \in \mathcal{R}} |\chi(r)|$ in this example?

A 2

B 3

C 4



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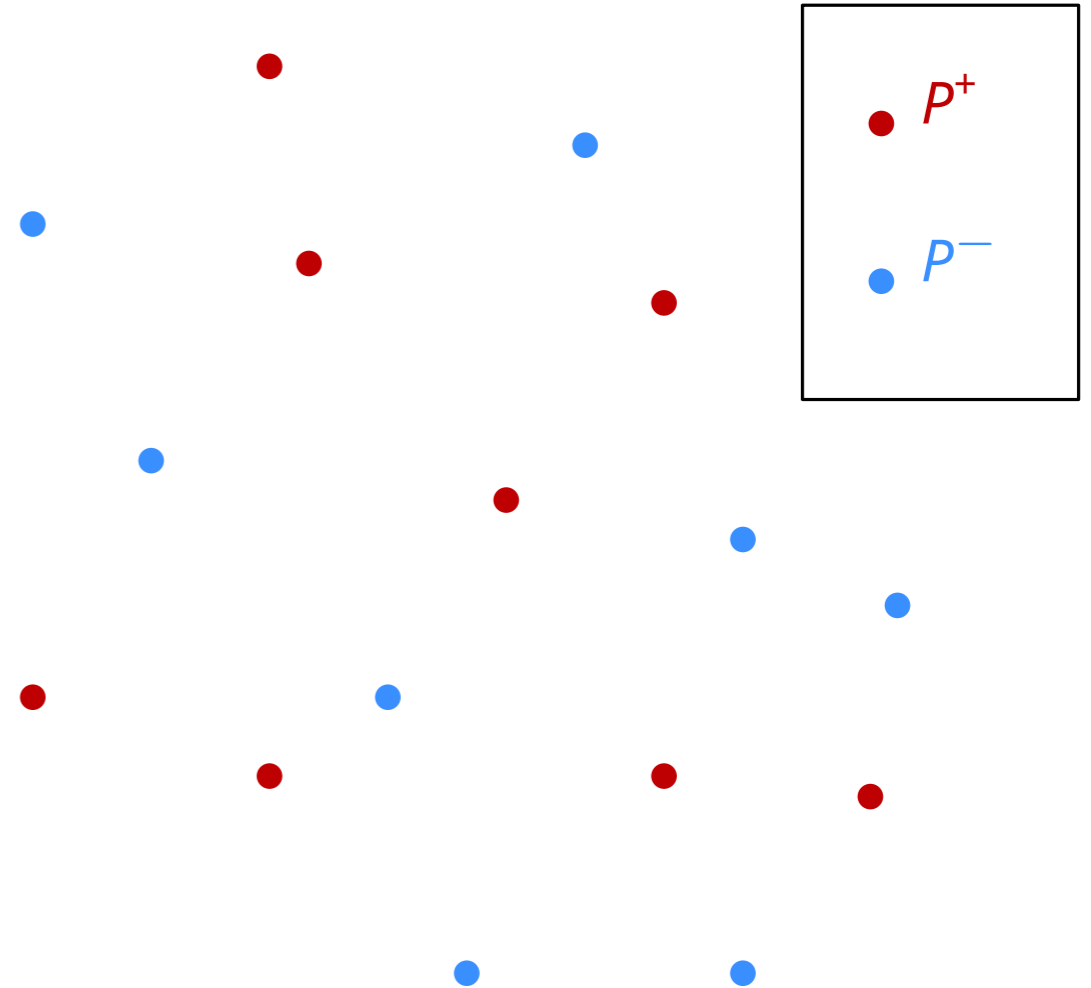
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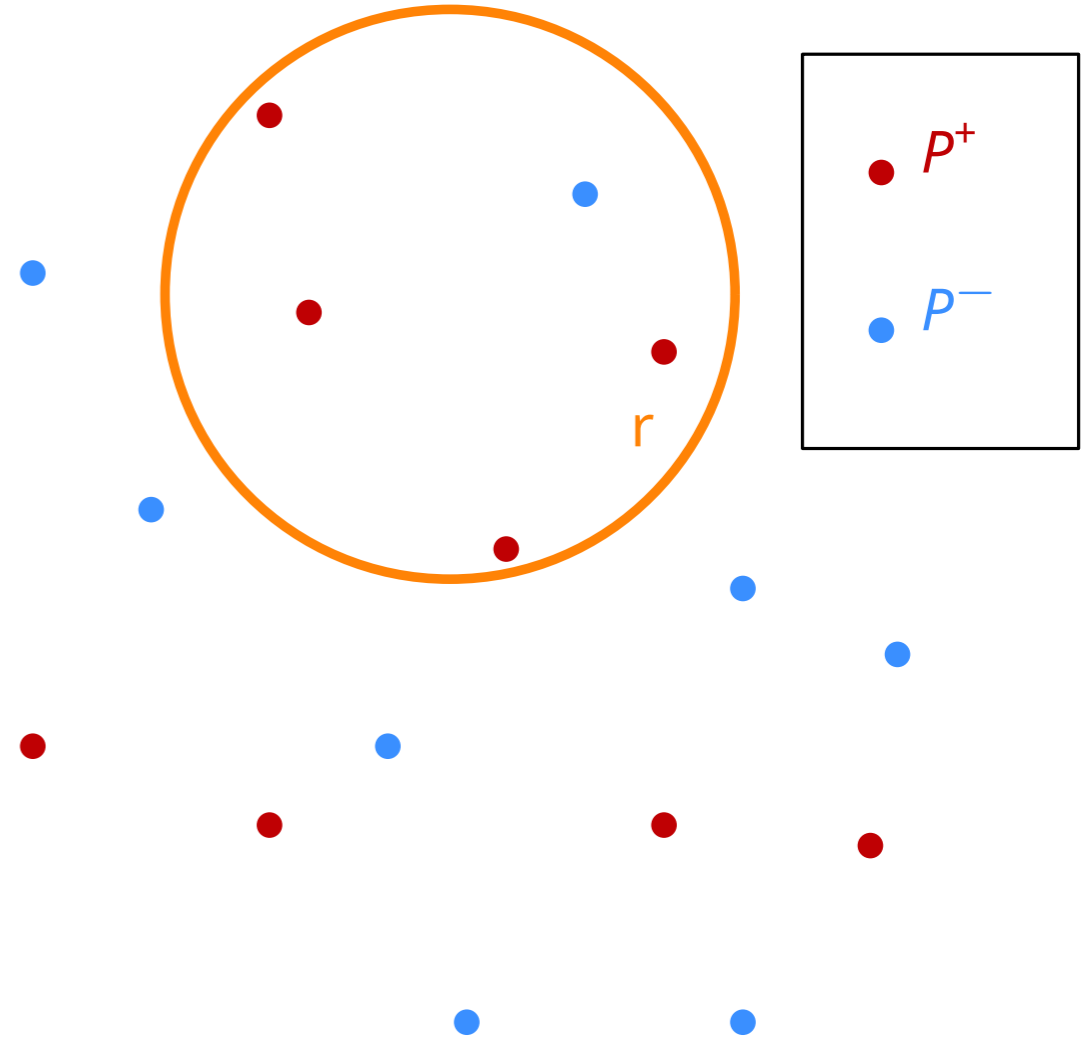
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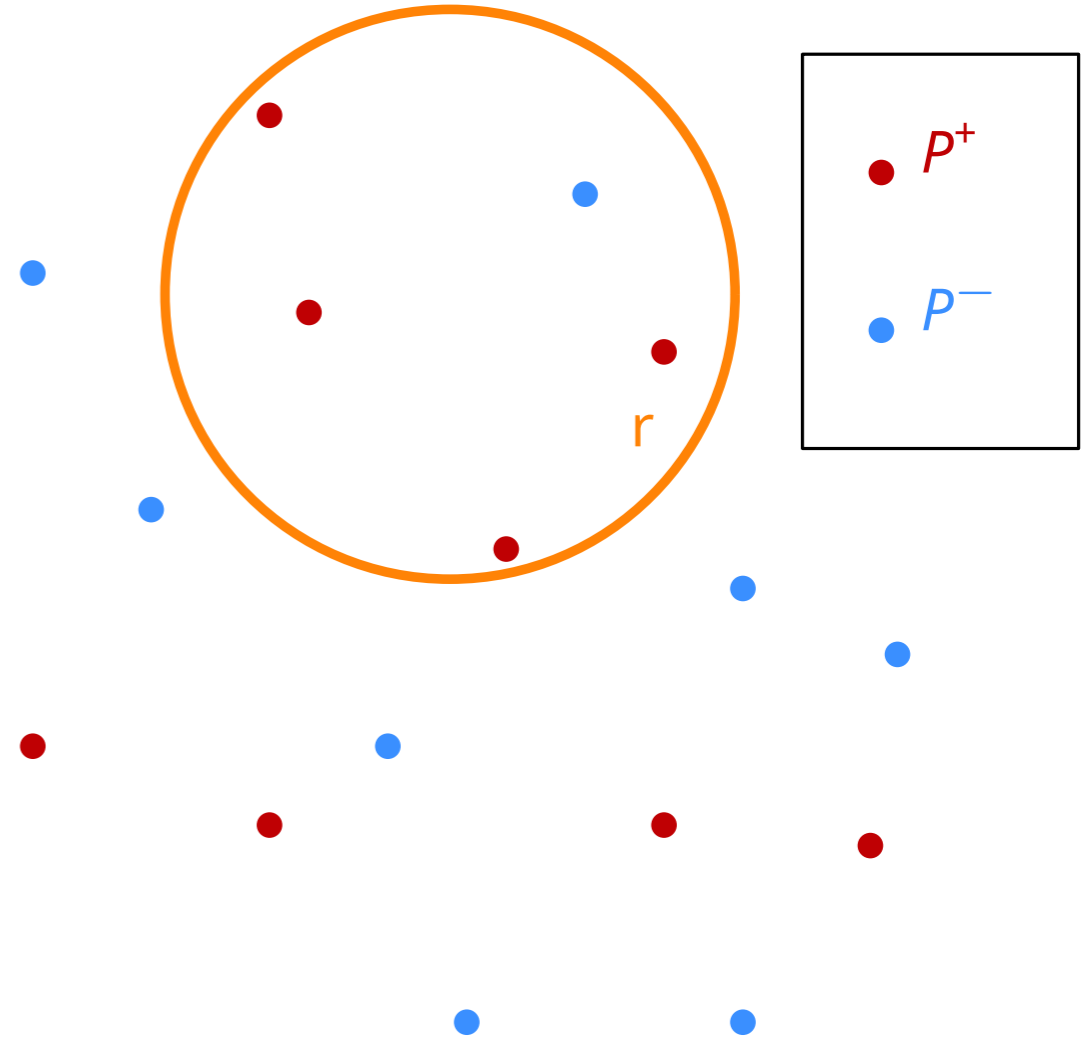
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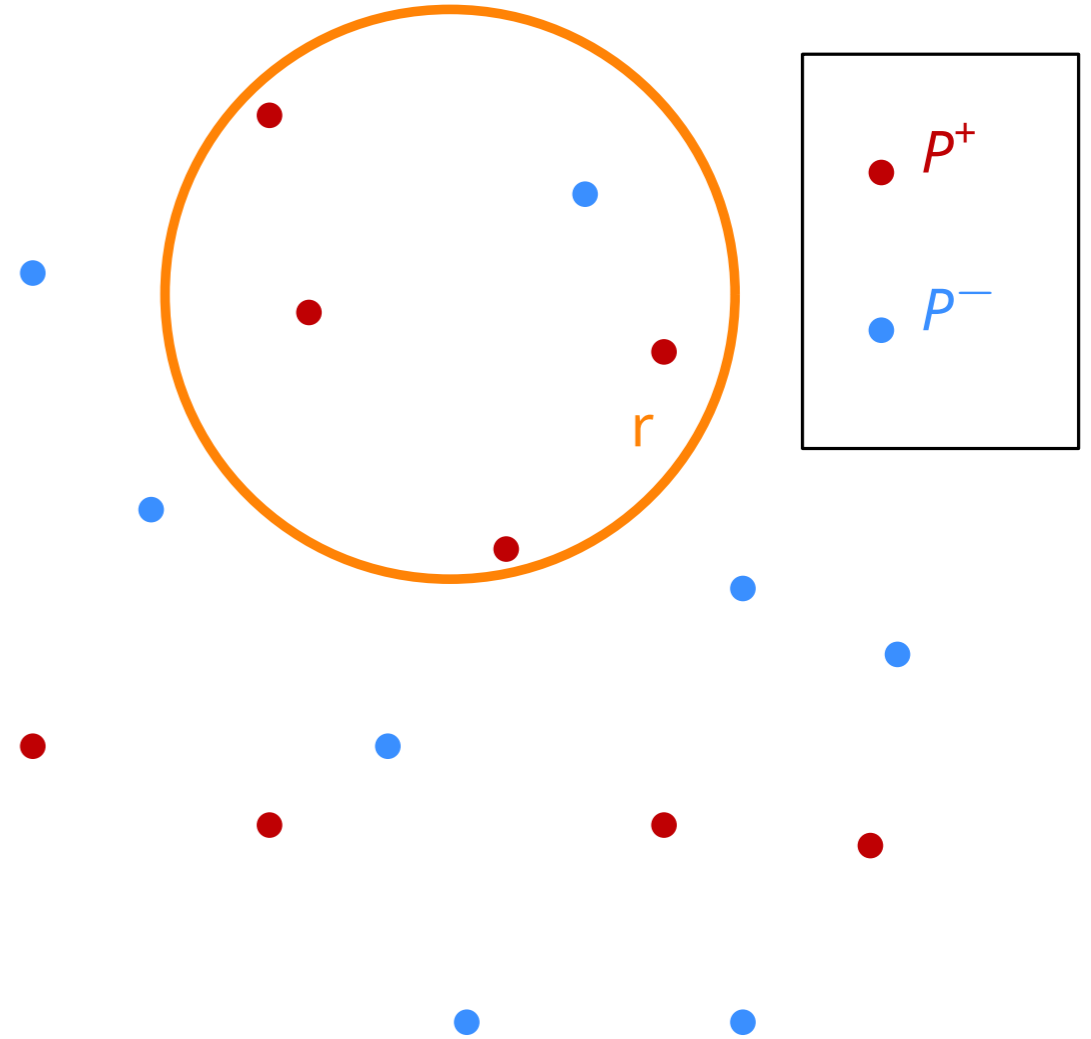
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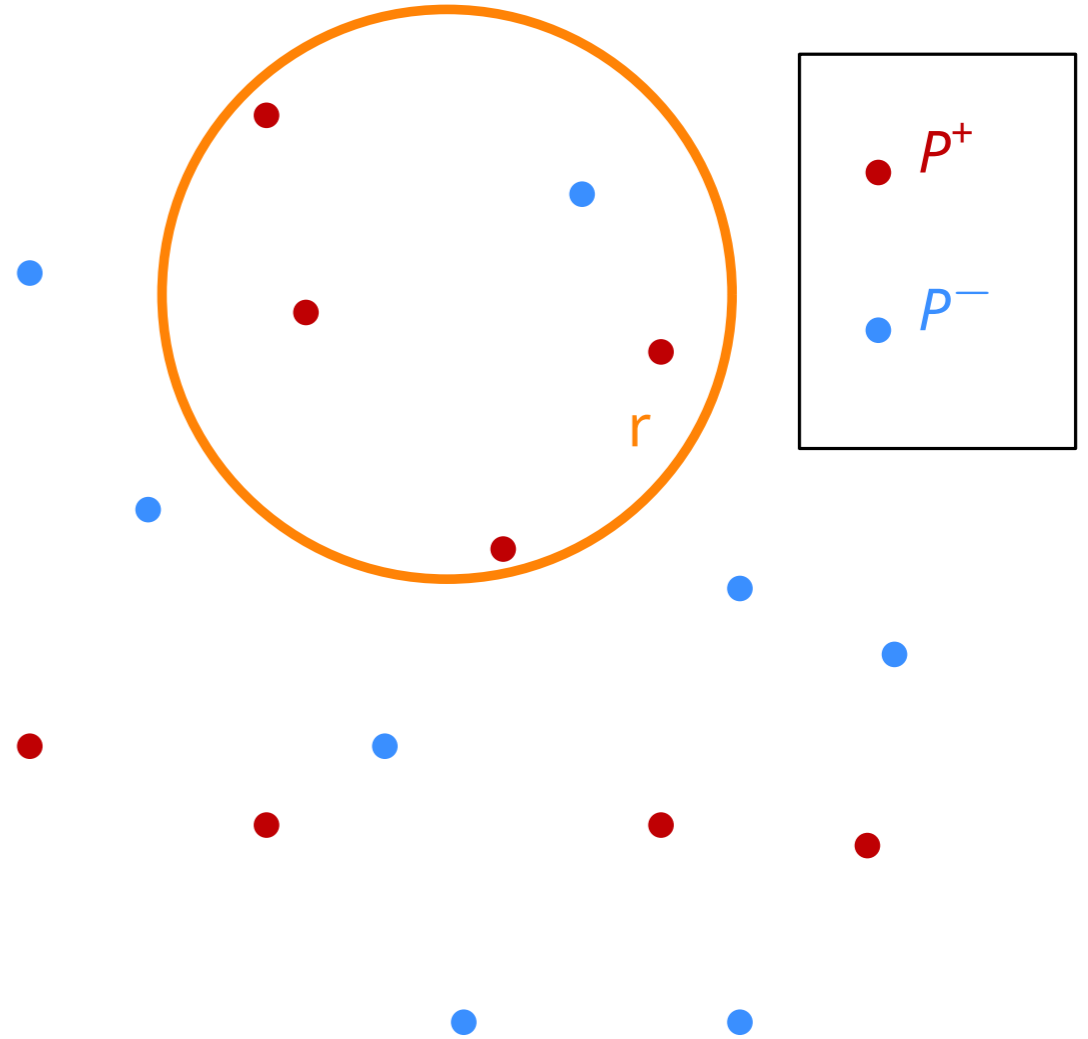
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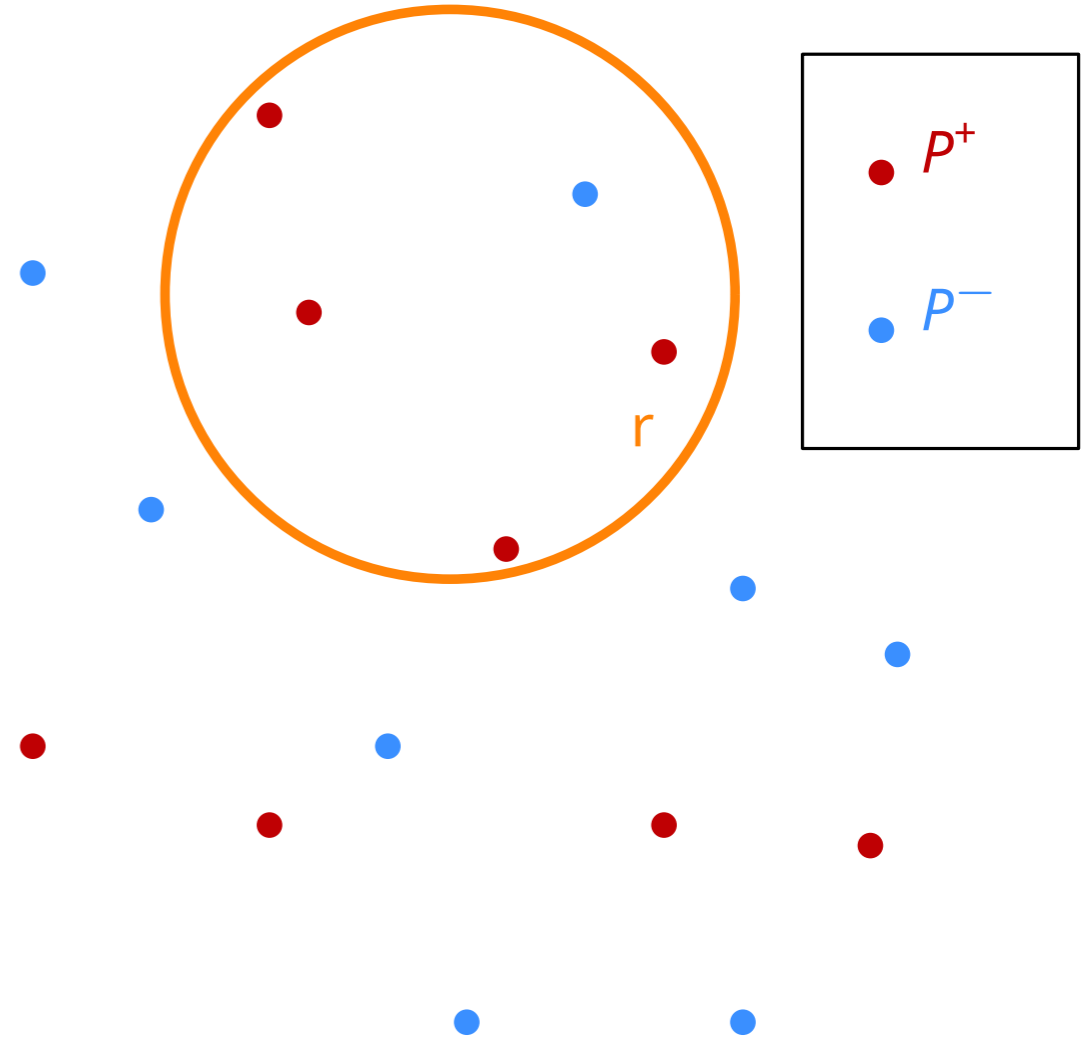
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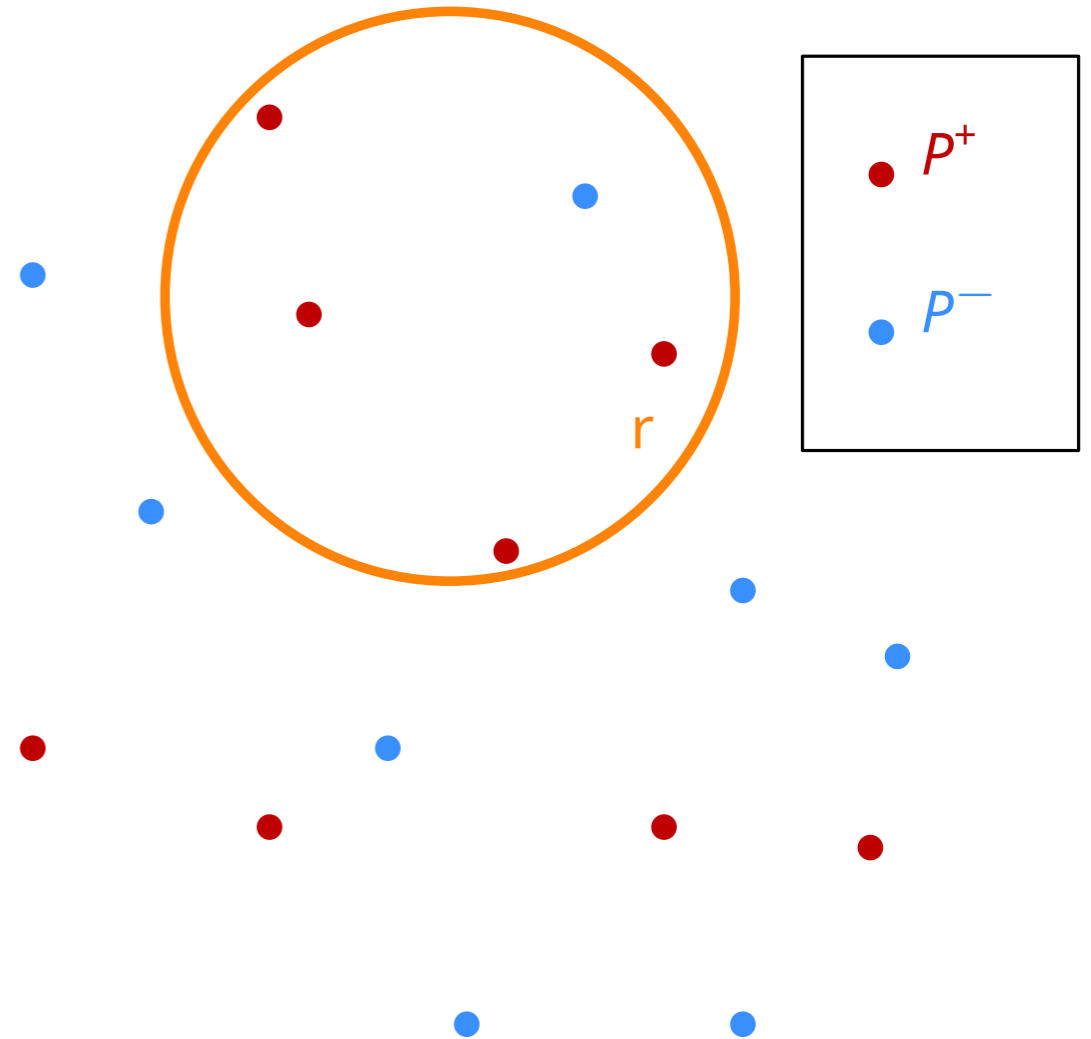
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Our goal: Given S , compute χ with low discrepancy



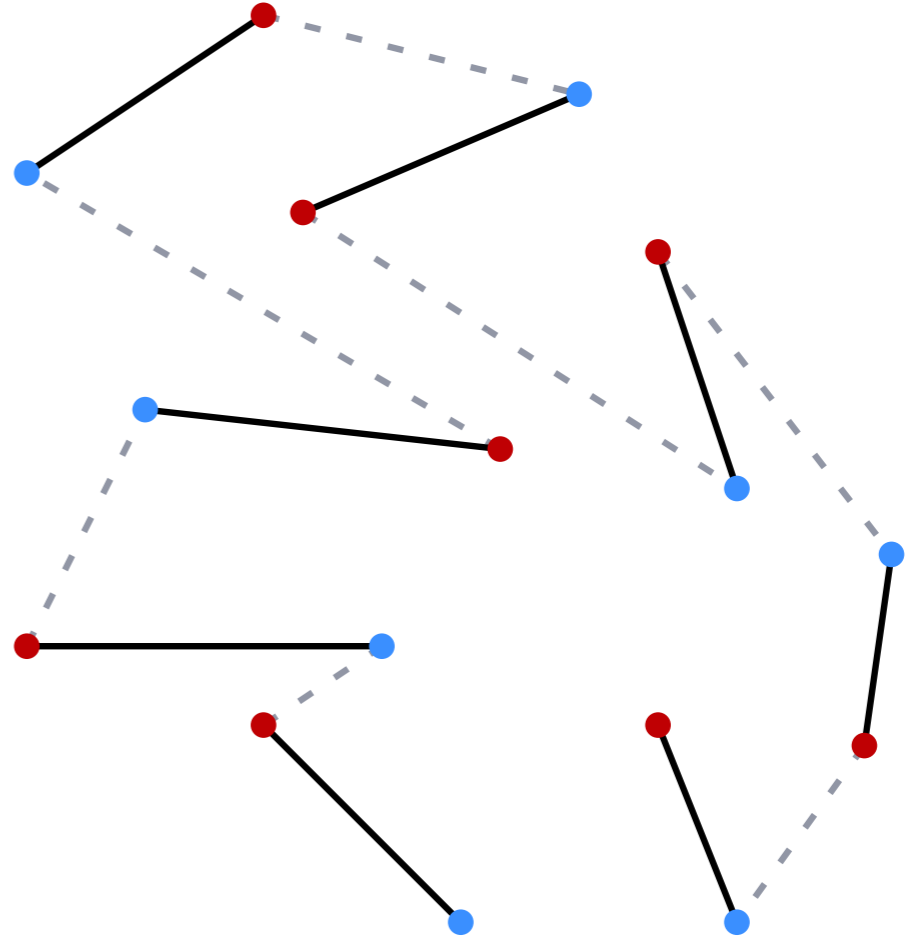
Our plan for today

From low discrepancy to ε -samples

Low-discrepancy colorings via perfect matchings & crossing numbers

Constructing a spanning tree with low crossing number

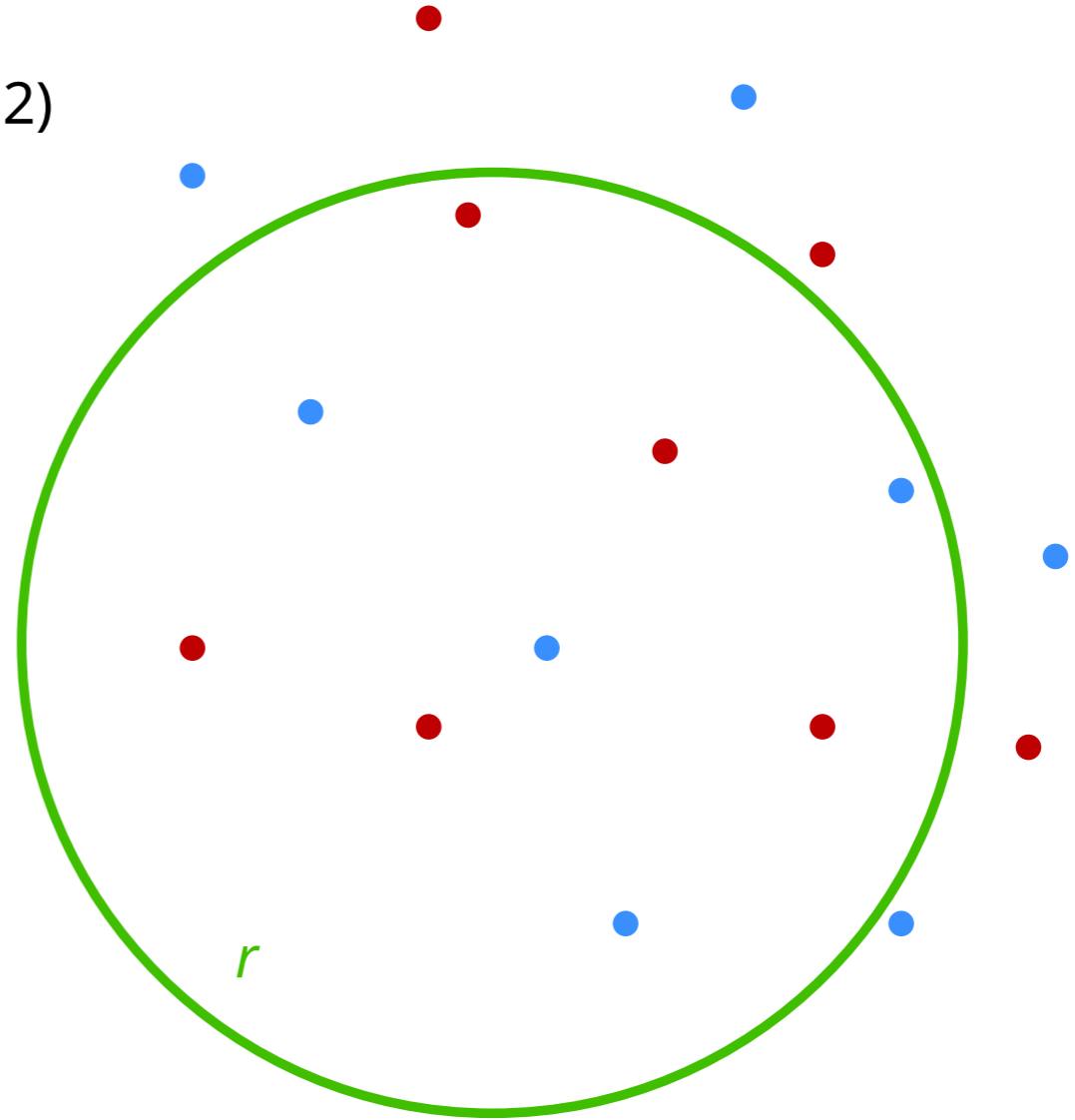
From spanning trees to perfect matchings



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Assumptions:

$|P| = n$ is a power of 2. (correct up to factor 2)

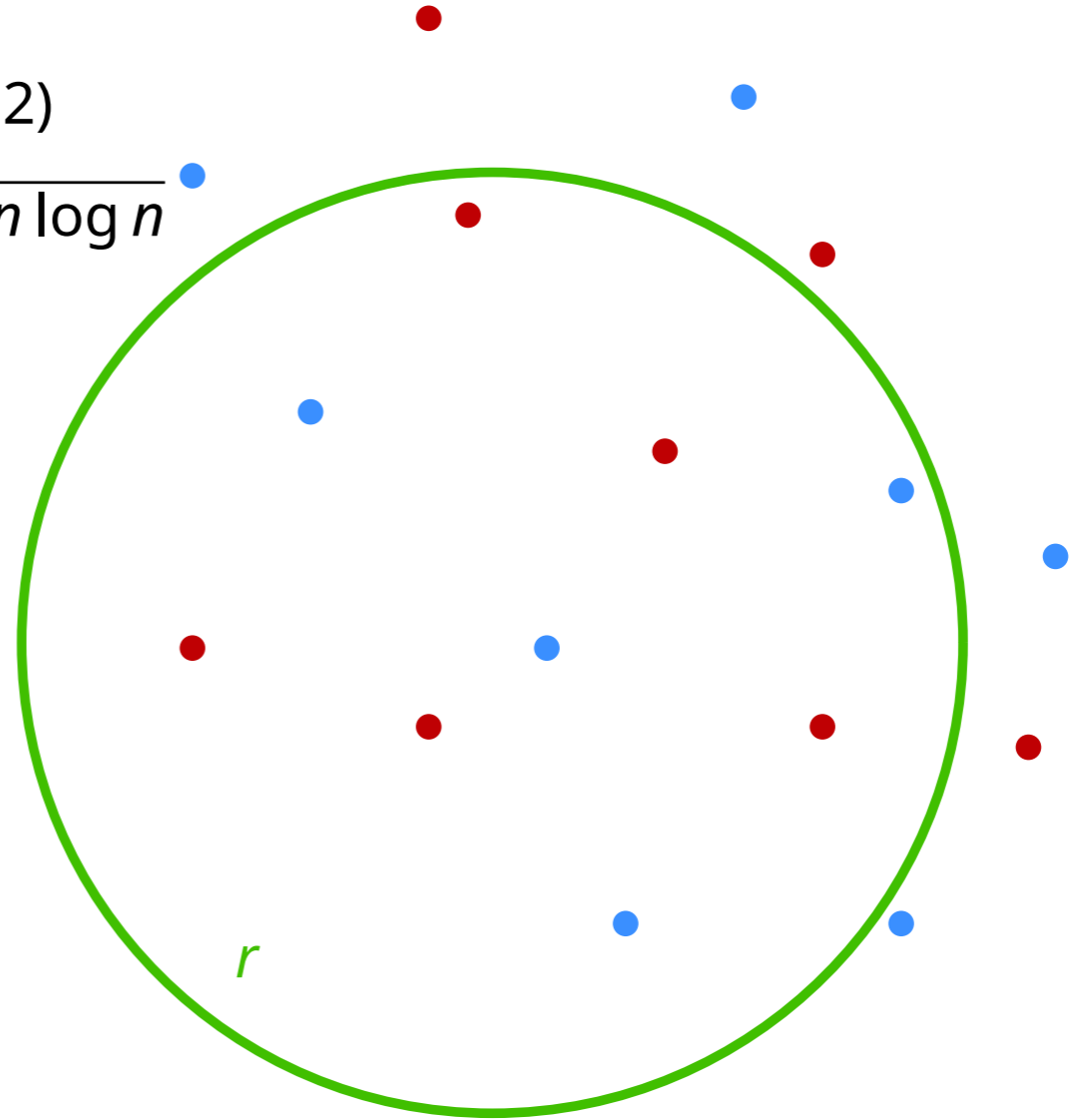


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We can find a coloring χ with $\text{disc}(\chi) \leq c\sqrt{\delta n \log n}$



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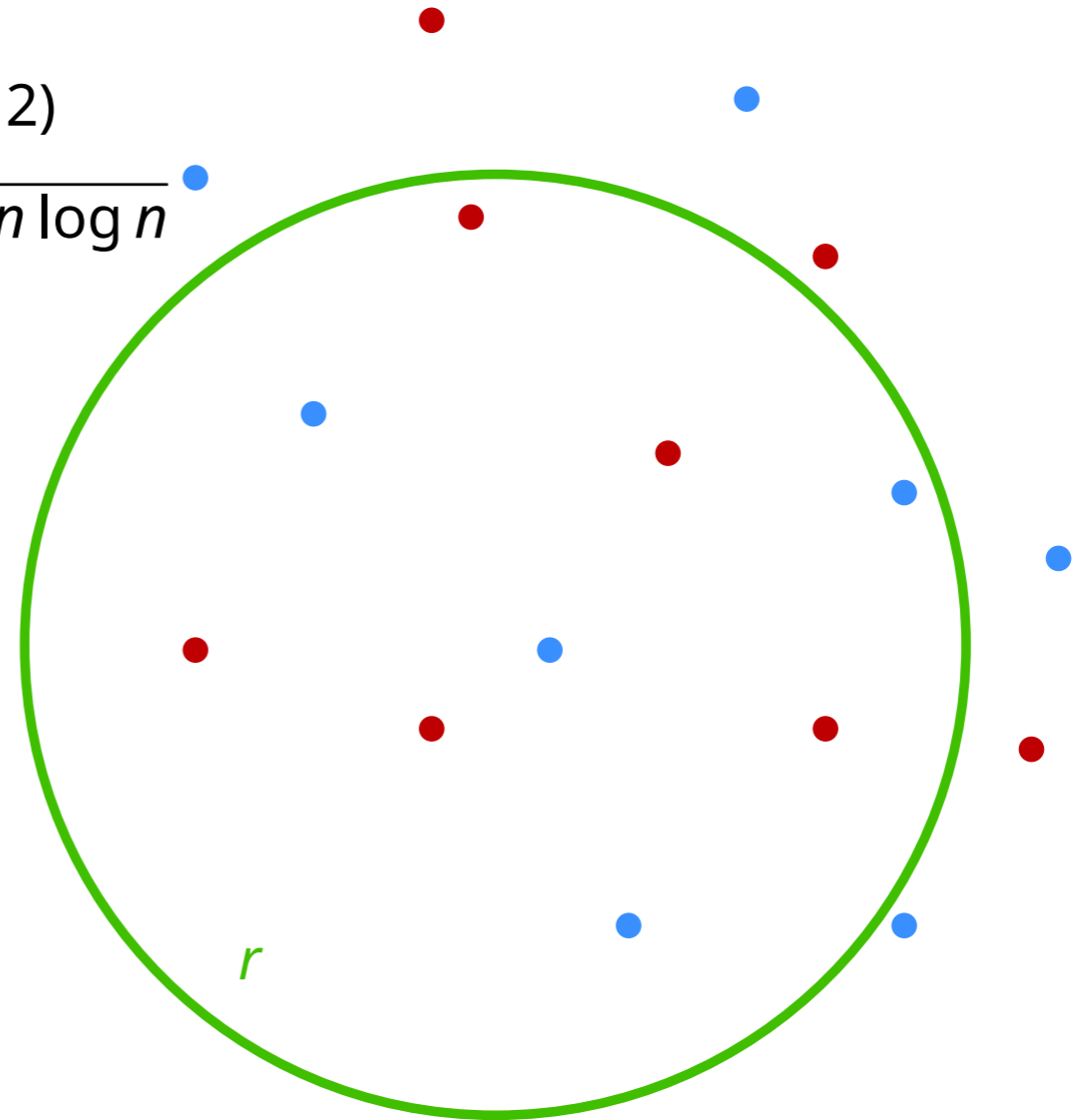
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P_1 : blue points ($\chi(p) = -1$), P'_1 : red points



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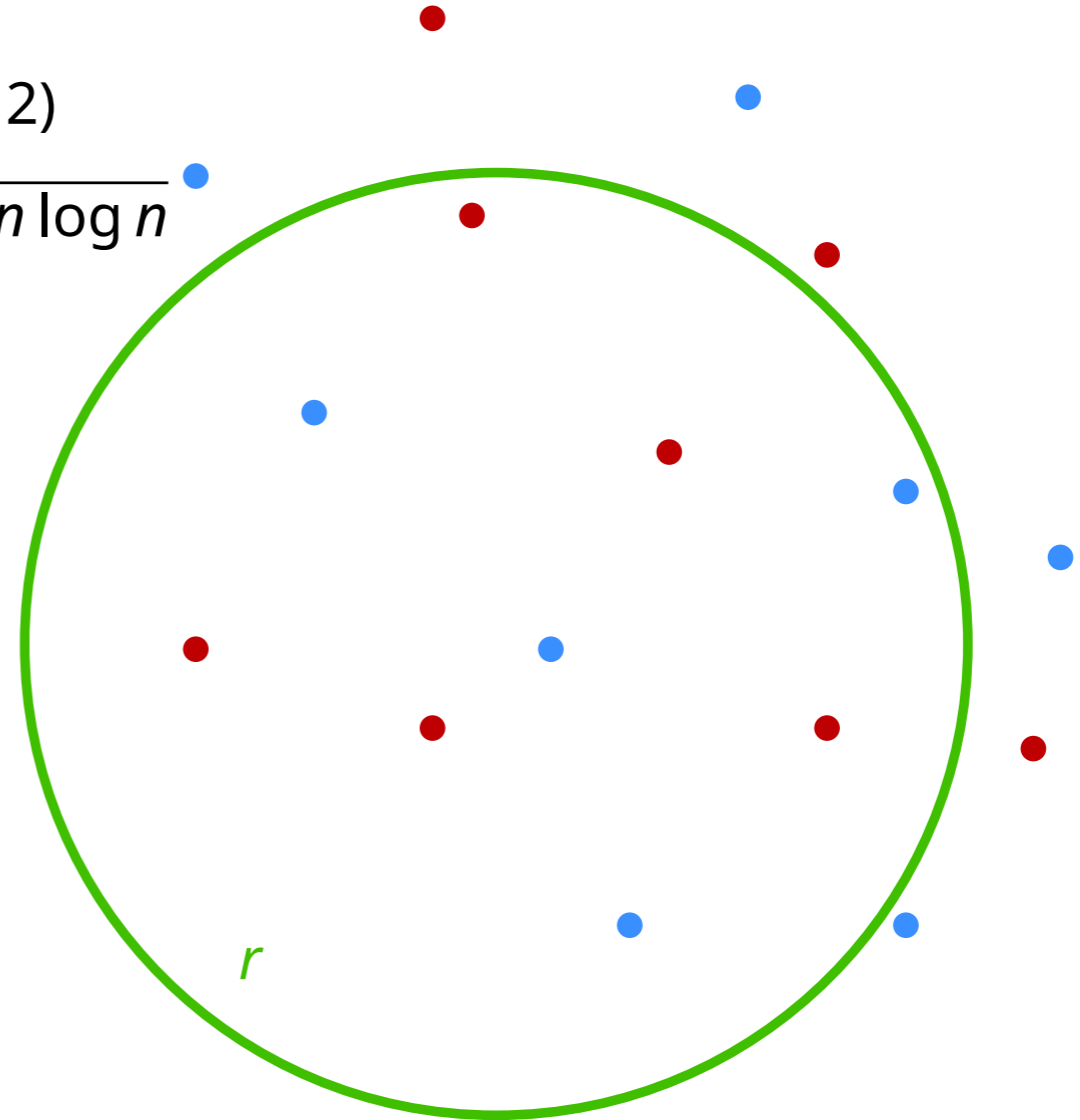
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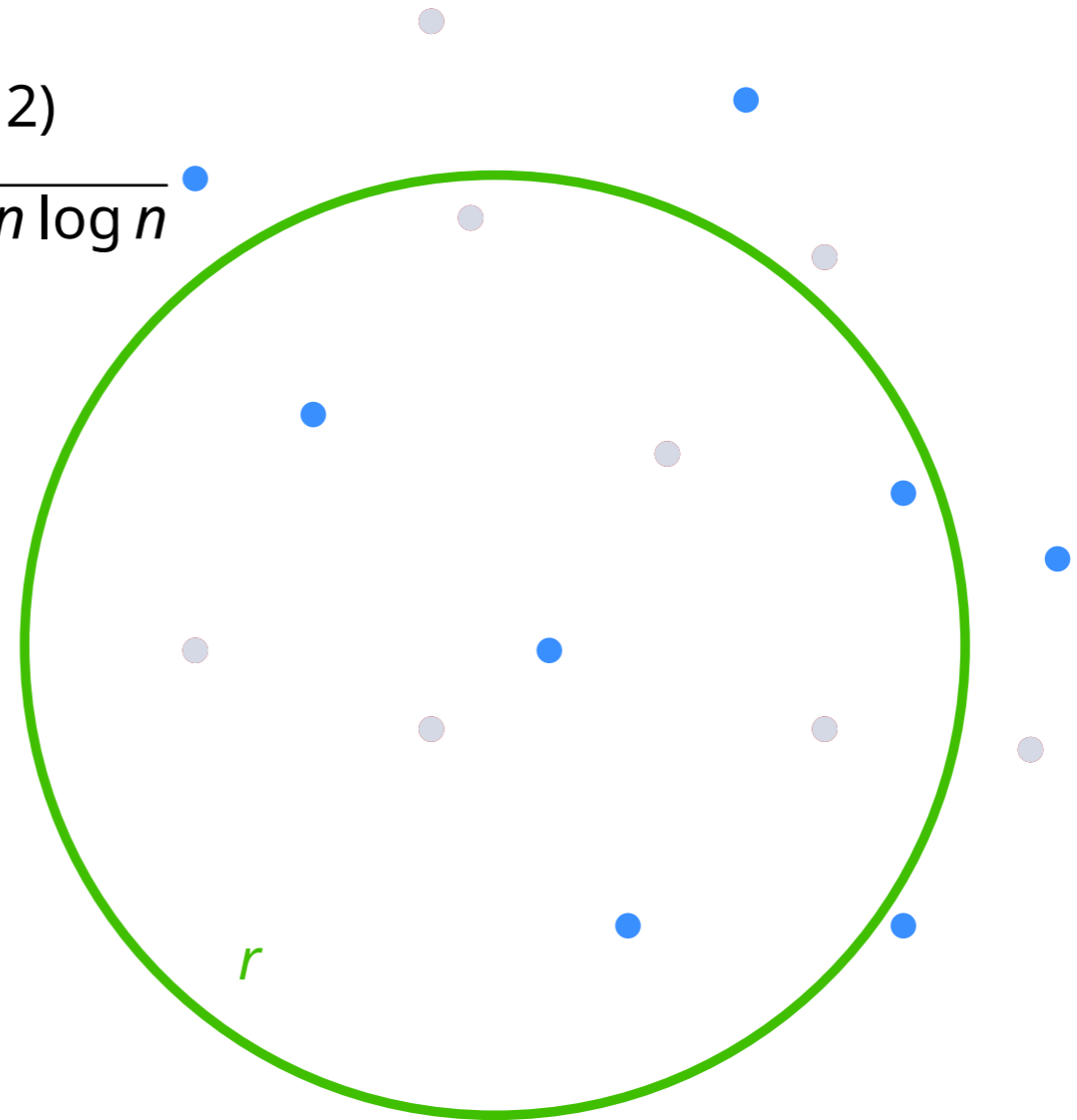
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Iterate:

Compute χ_1 for P_1 with

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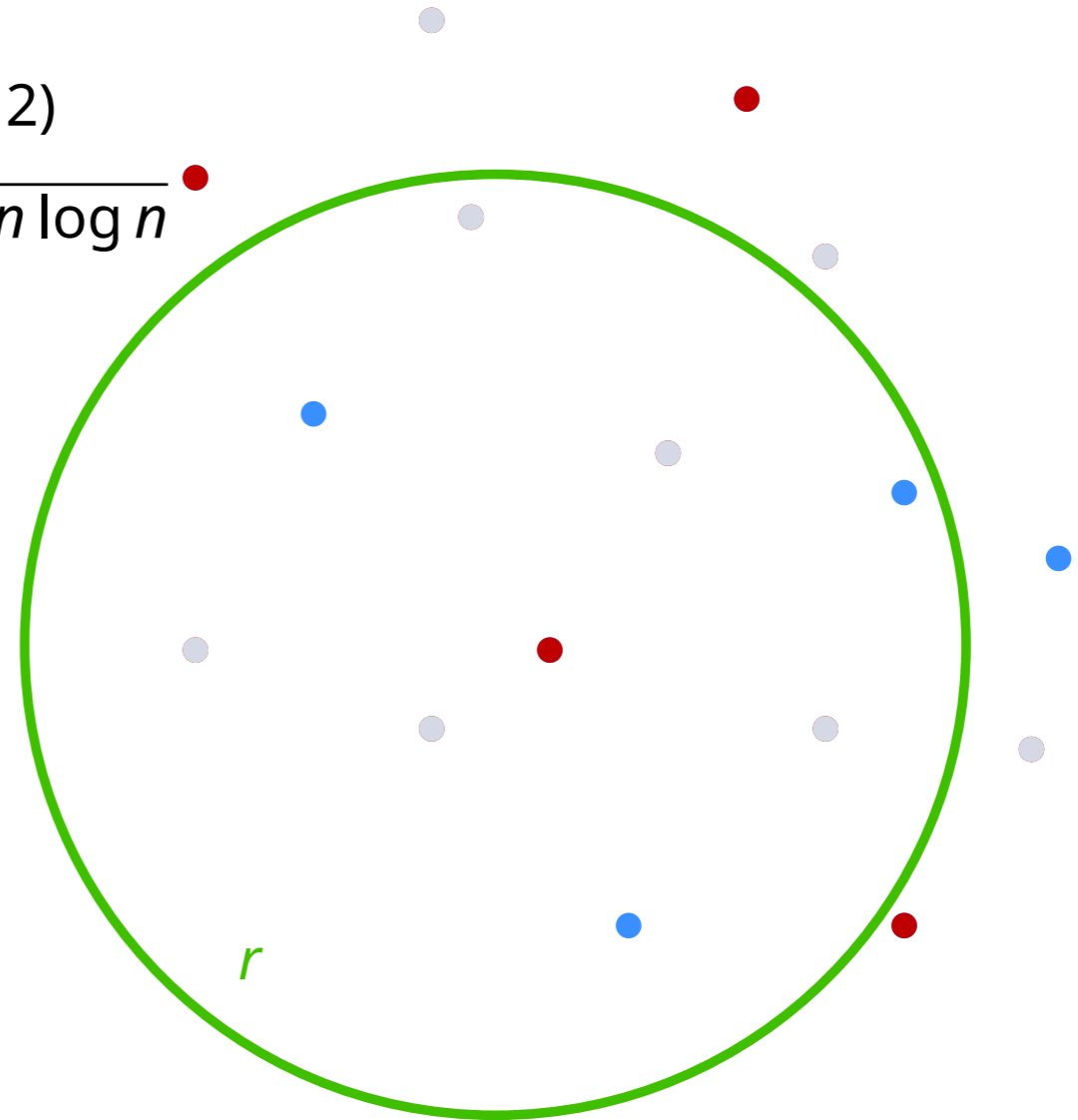
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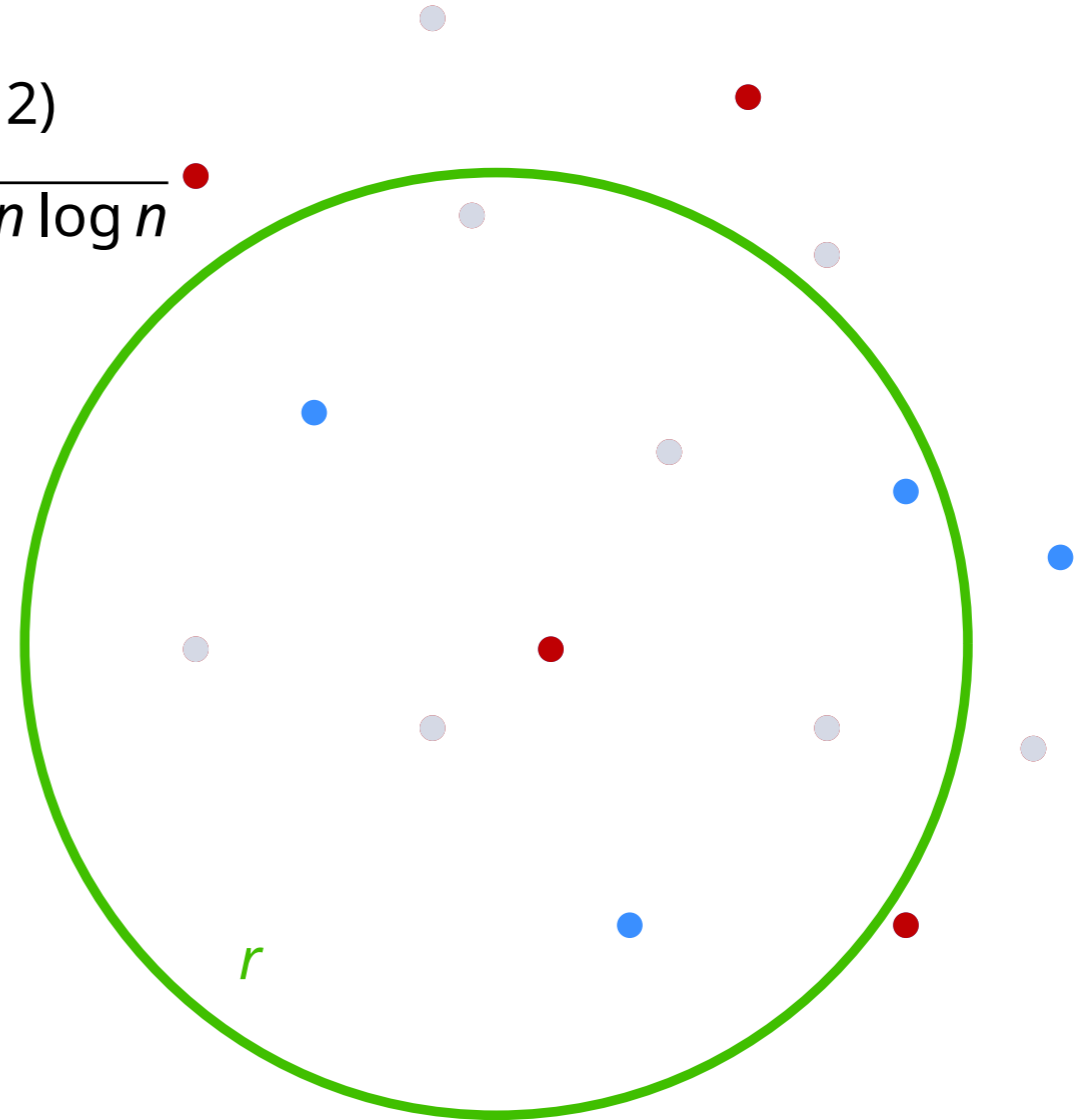
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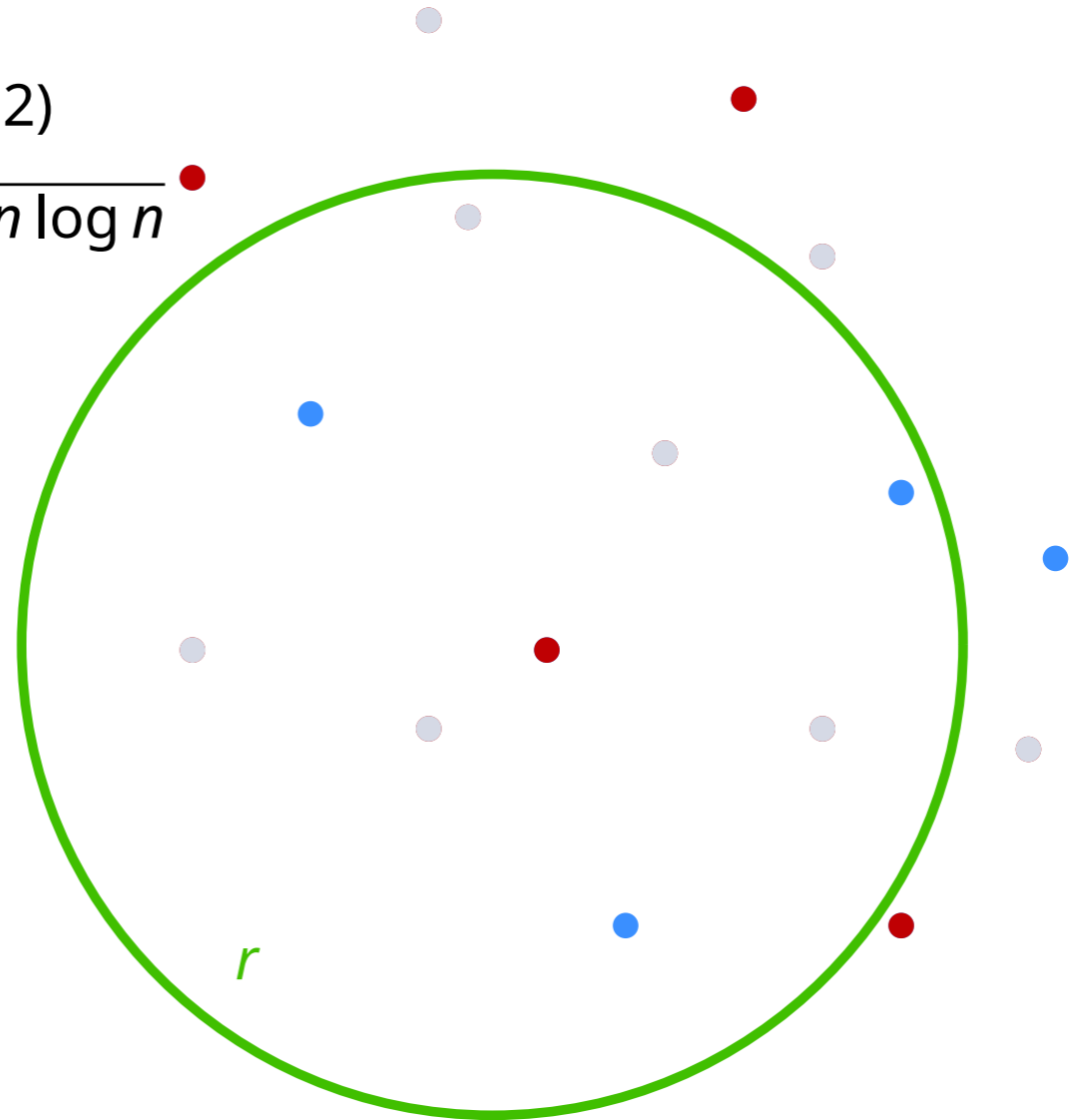
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P_3, P_4, \dots How long can we iterate?



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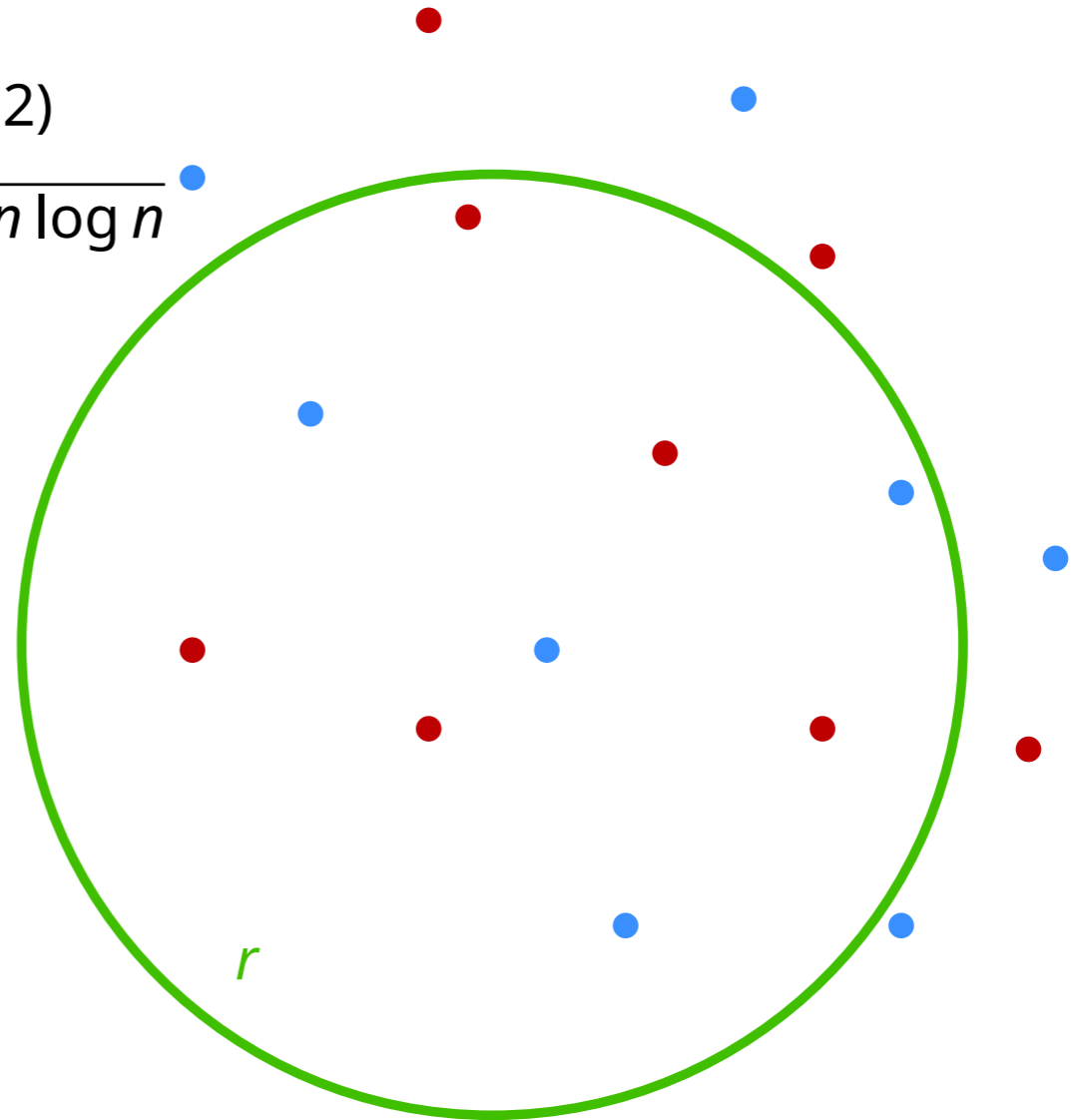
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$$\left| \frac{|r \cap P|}{|P|} - \frac{|r \cap P_1|}{|P_1|} \right| =$$



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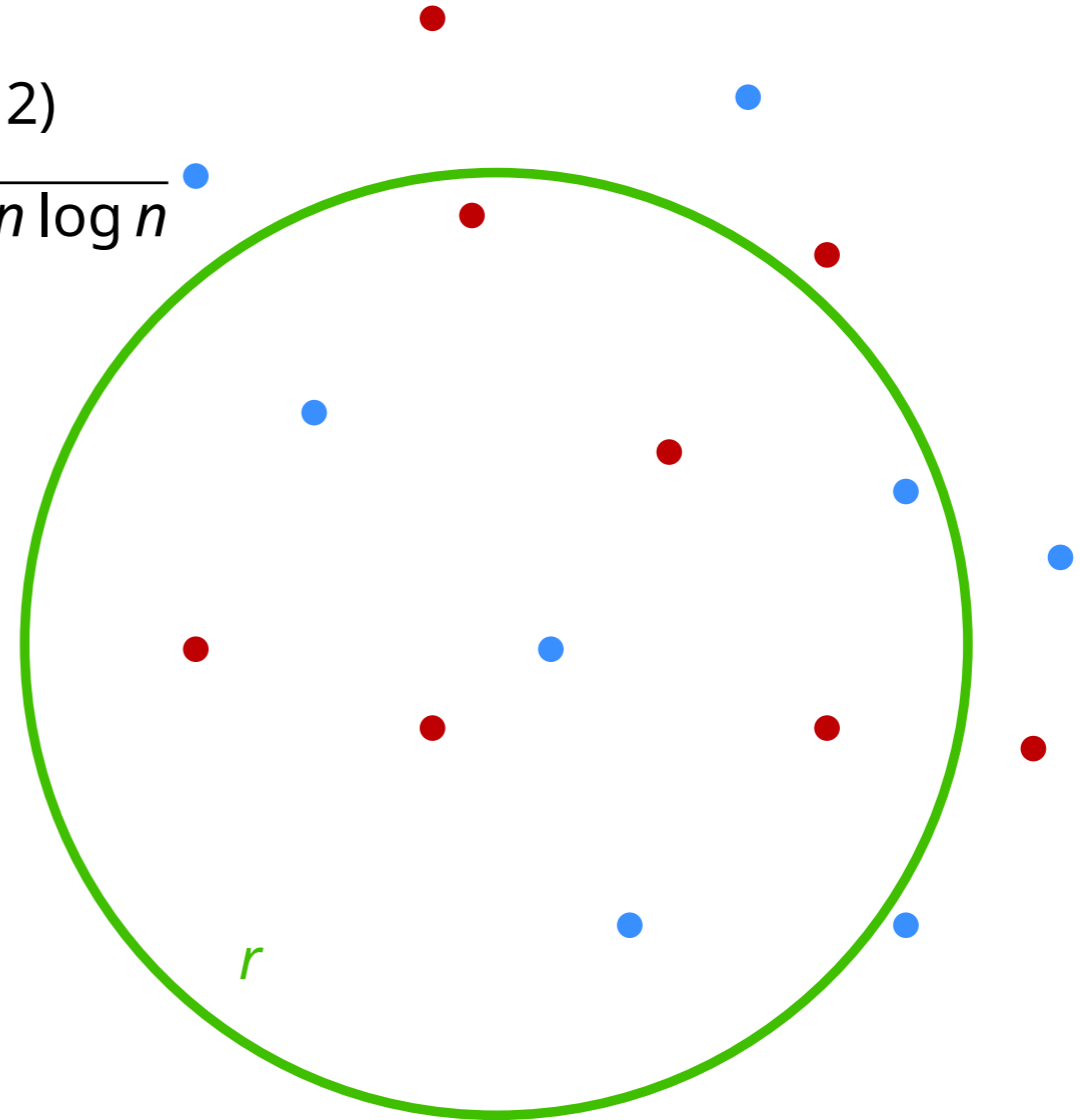
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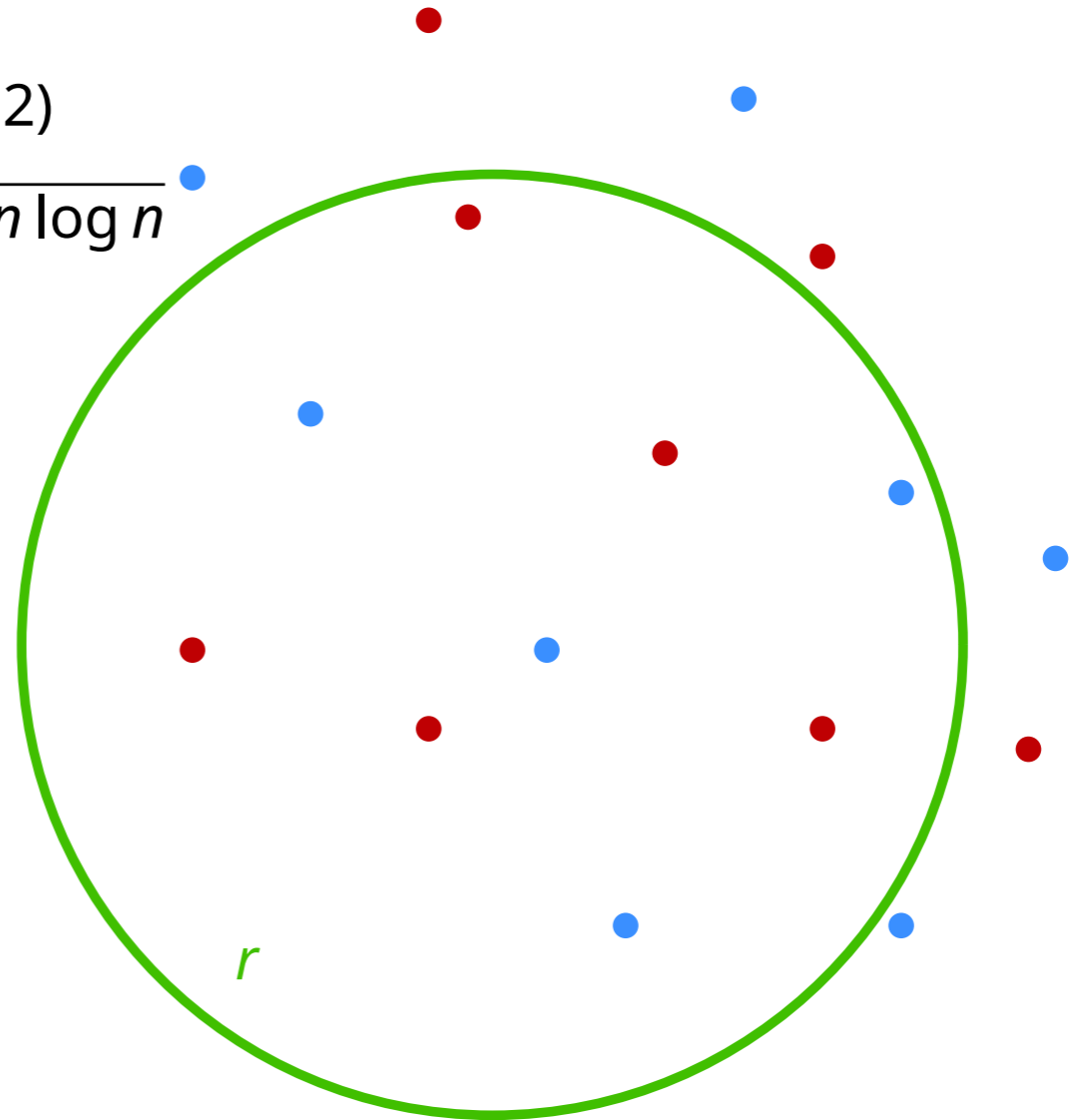
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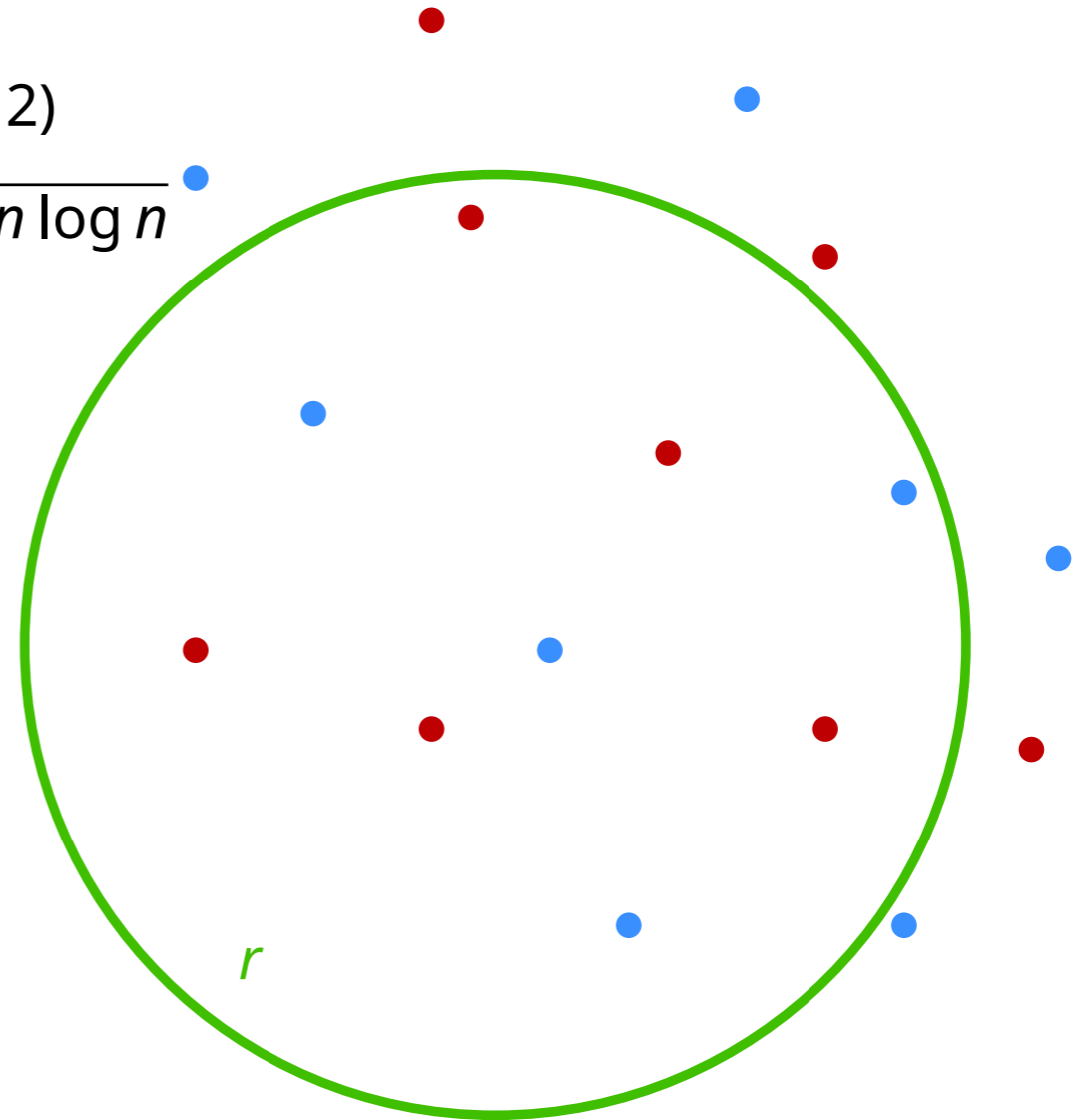
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$$\frac{1}{n} \left| |r \cap P_2| + |r \cap P_1| - 2|r \cap P_1| \right| \leq$$

$$\frac{c\sqrt{\delta n \log n}}{n} = c\sqrt{\frac{\delta \log n}{n}}$$



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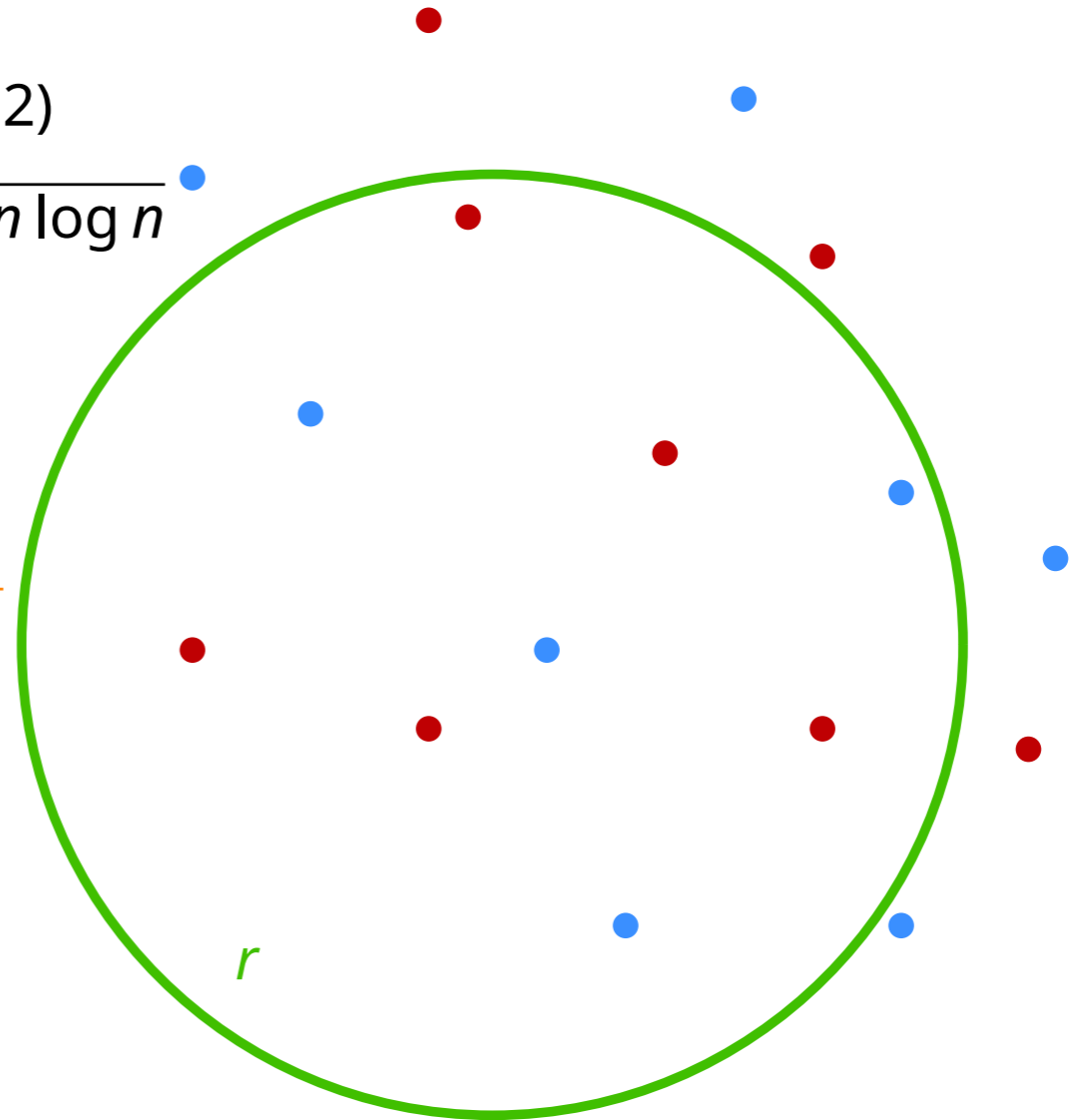
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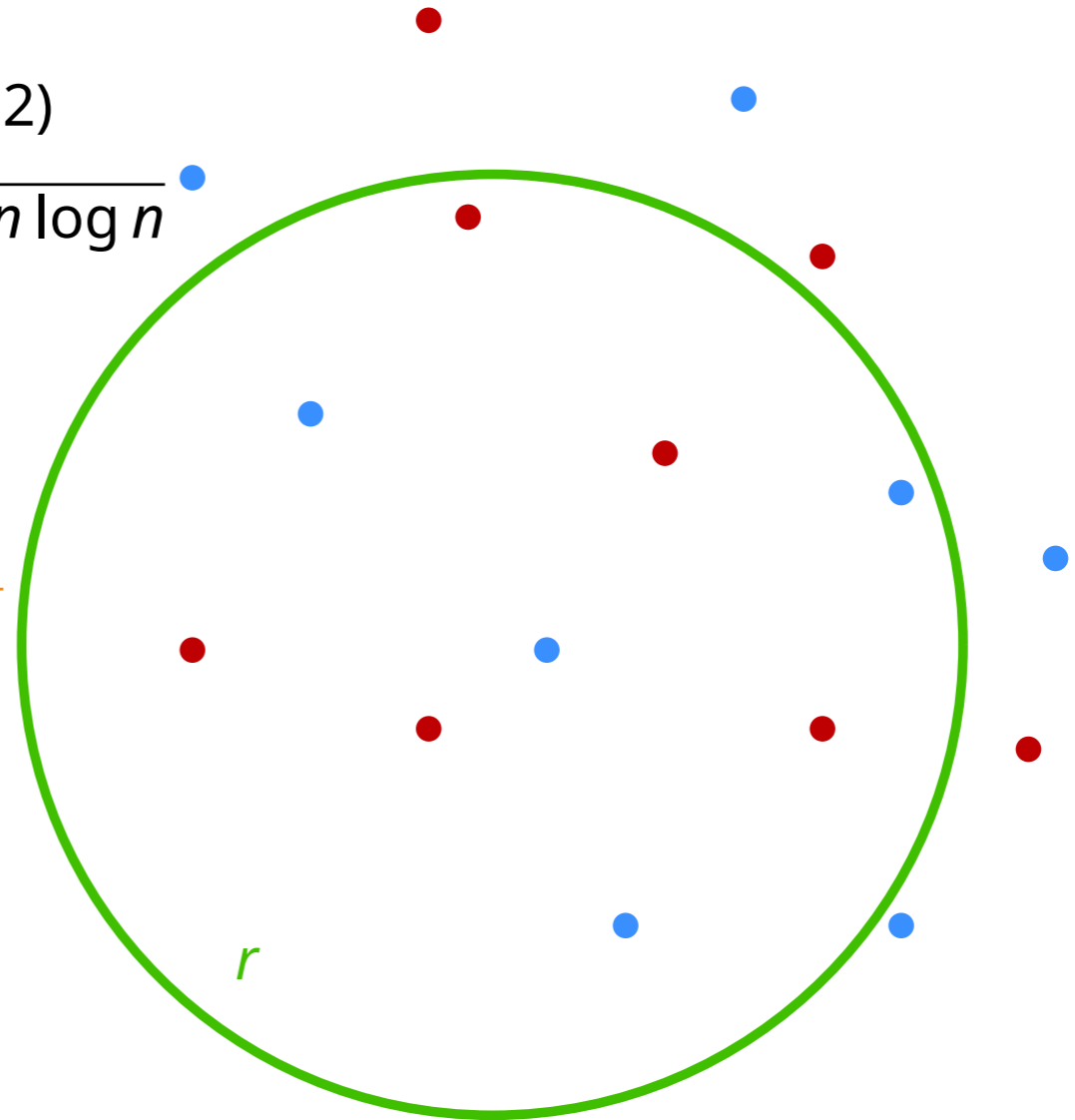
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P_2 is ε' -sample of P_1 with $\varepsilon' = c\sqrt{\delta \frac{\log(n/2)}{n/2}}$



Quiz

If P_1 is an ε_1 -sample of P , and P_2 is an ε_2 -sample of P_1 , then P_2 is an ...-sample of P .

A $\varepsilon_1 + \varepsilon_2$

B $\varepsilon_1 \cdot \varepsilon_2$

C $\max(\varepsilon_1, \varepsilon_2)$

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...

P_k has size $n_k := n/2^k$ and is ε_k -sample with $\varepsilon_k = c \sum_{i=0}^{k-1} \sqrt{\delta \frac{\log(n/2^i)}{(n/2^i)}}$

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Size of iterated construction

Given ε , how often can we iterate to get ε -sample?

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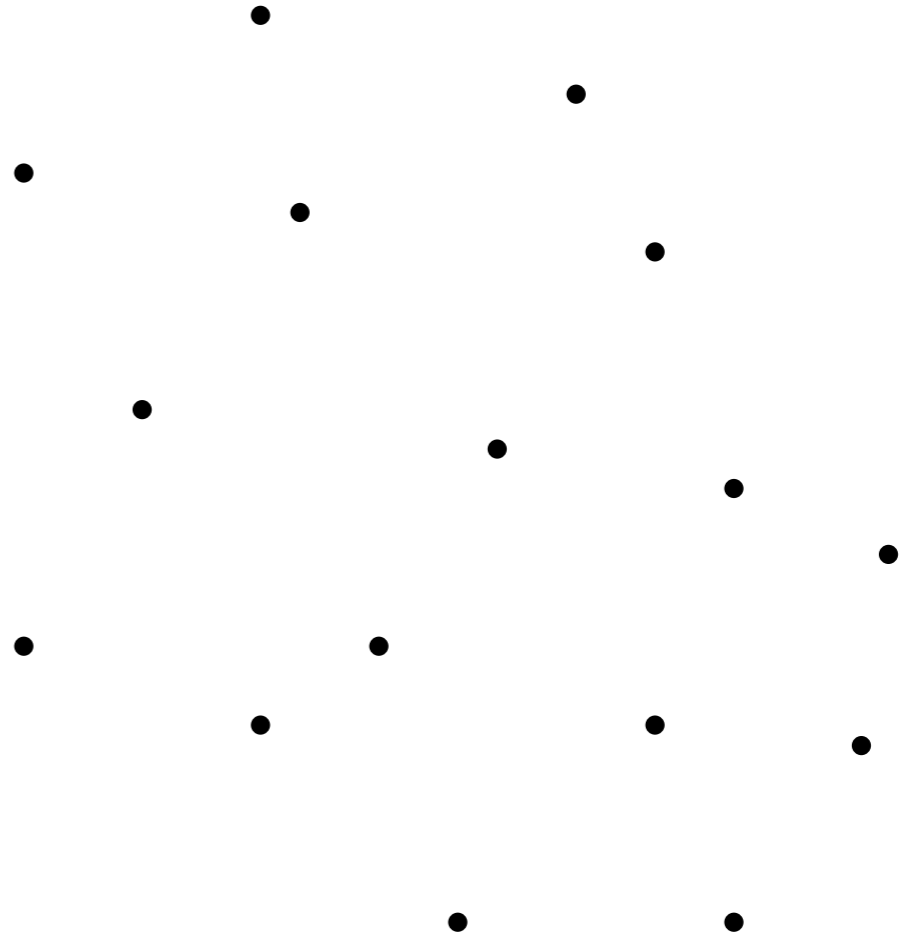
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Gives ε -sample of size $O(\frac{\delta}{\varepsilon^2} \log \frac{\delta}{\varepsilon^2})$ if assumption holds: We can find a coloring χ with $\text{disc}(\chi) \leq c\sqrt{\delta n \log n}$

Low-discrepancy colorings via perfect matchings & crossing numbers

Construction via perfect matchings

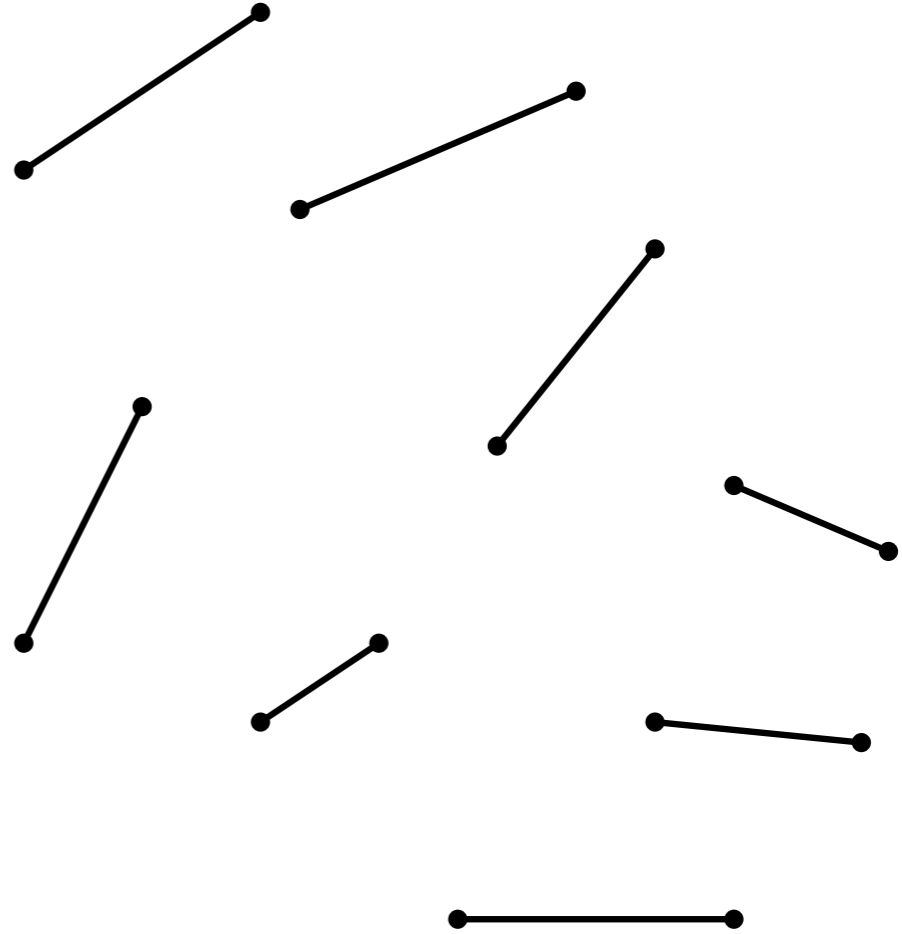
Assumption: $|P| = n$ is even



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Π : perfect matching on P : pairing of points

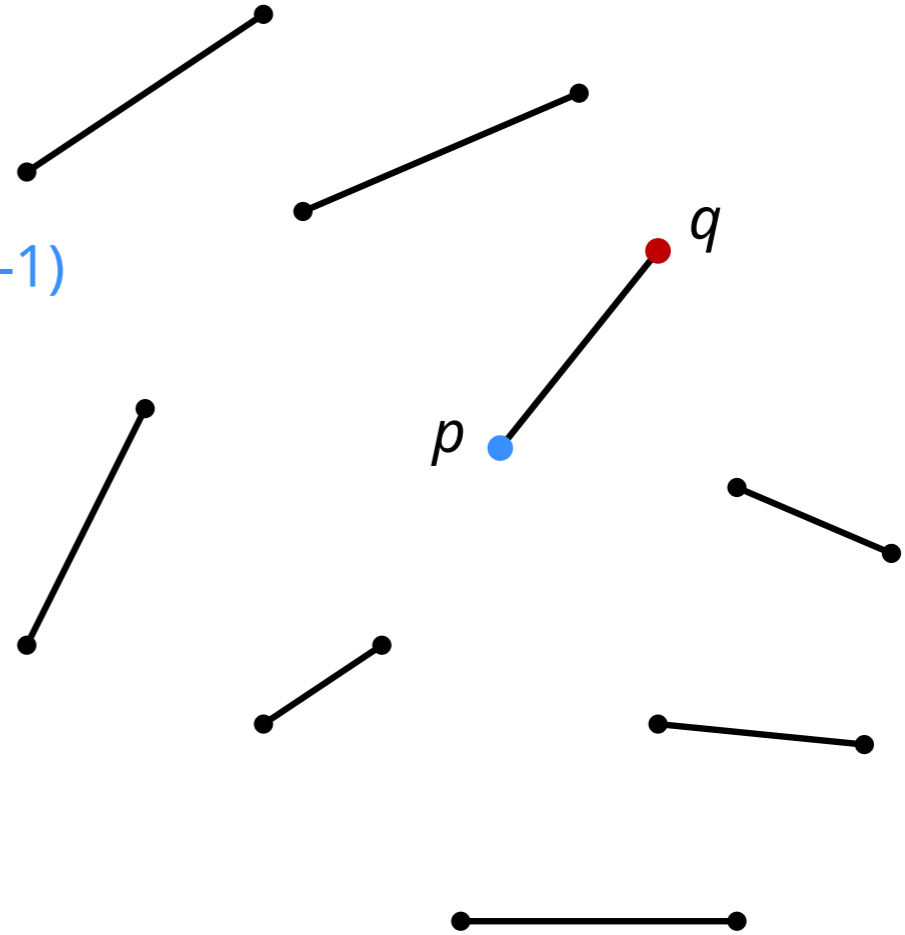


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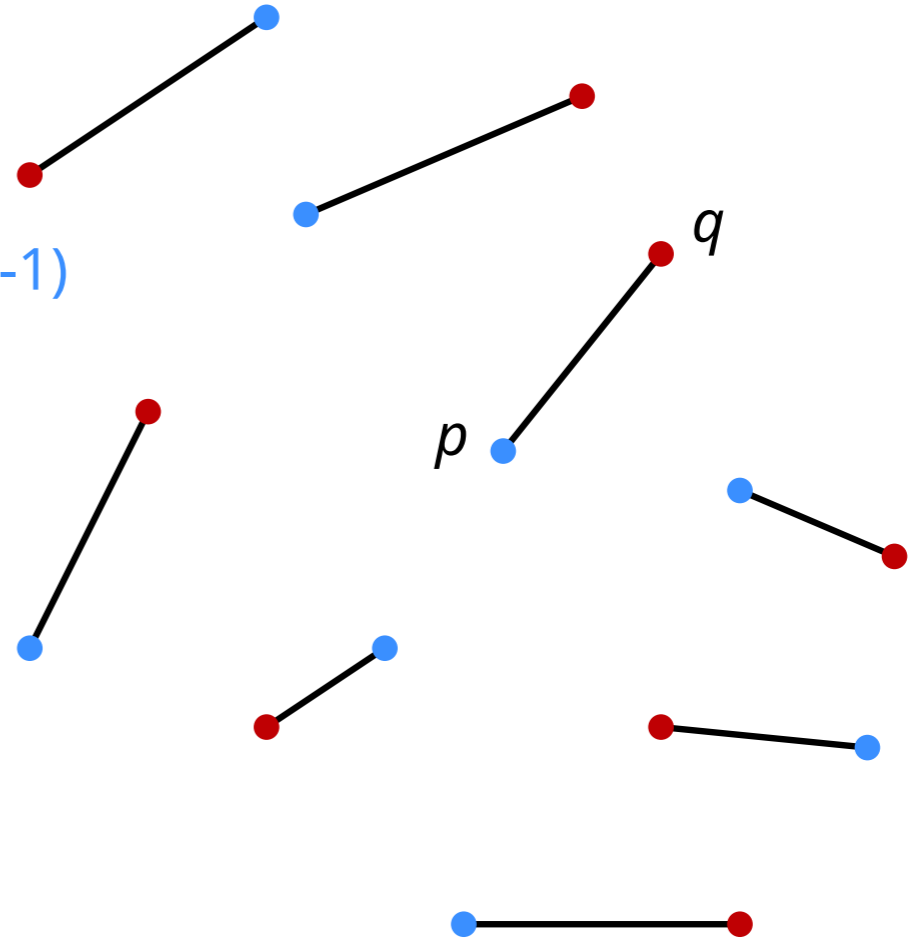


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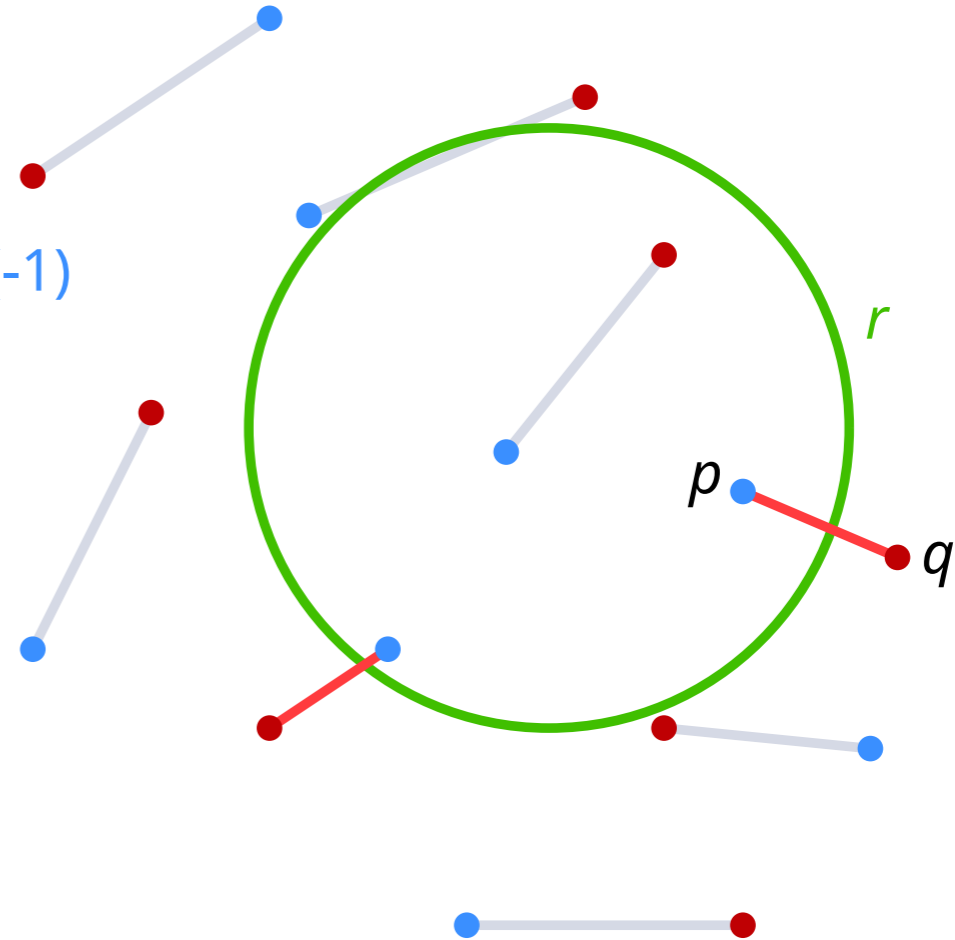
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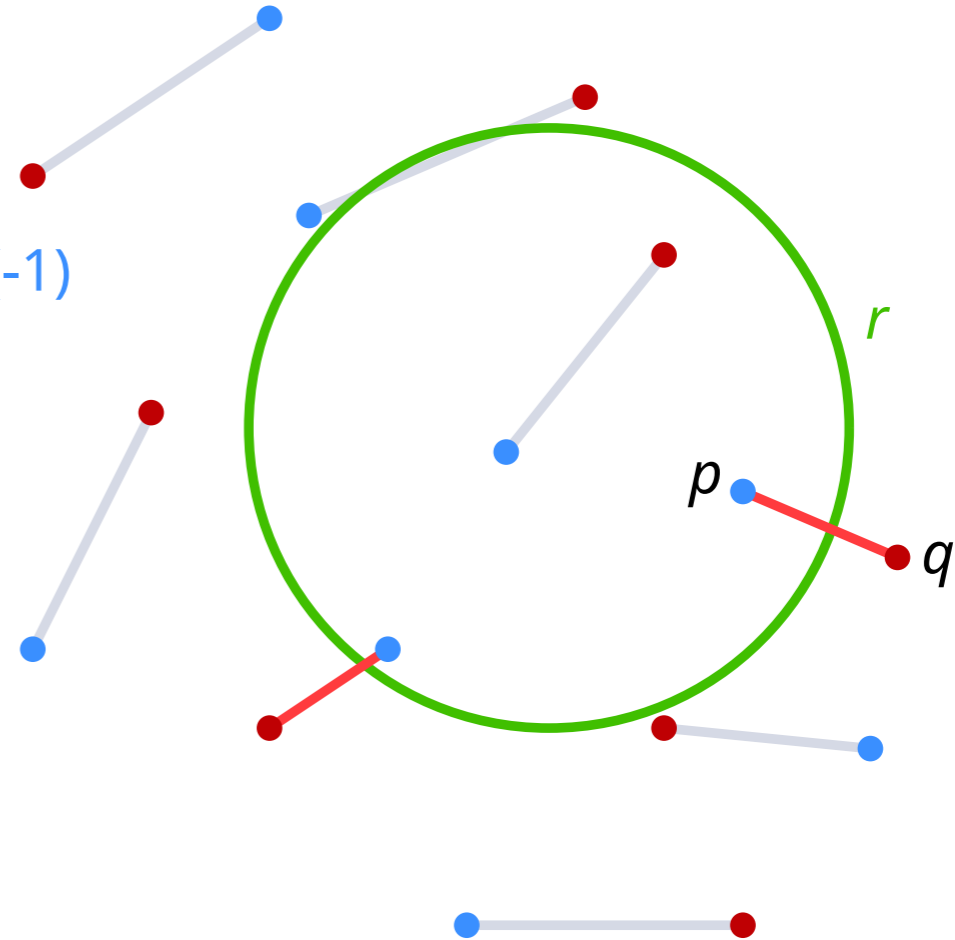
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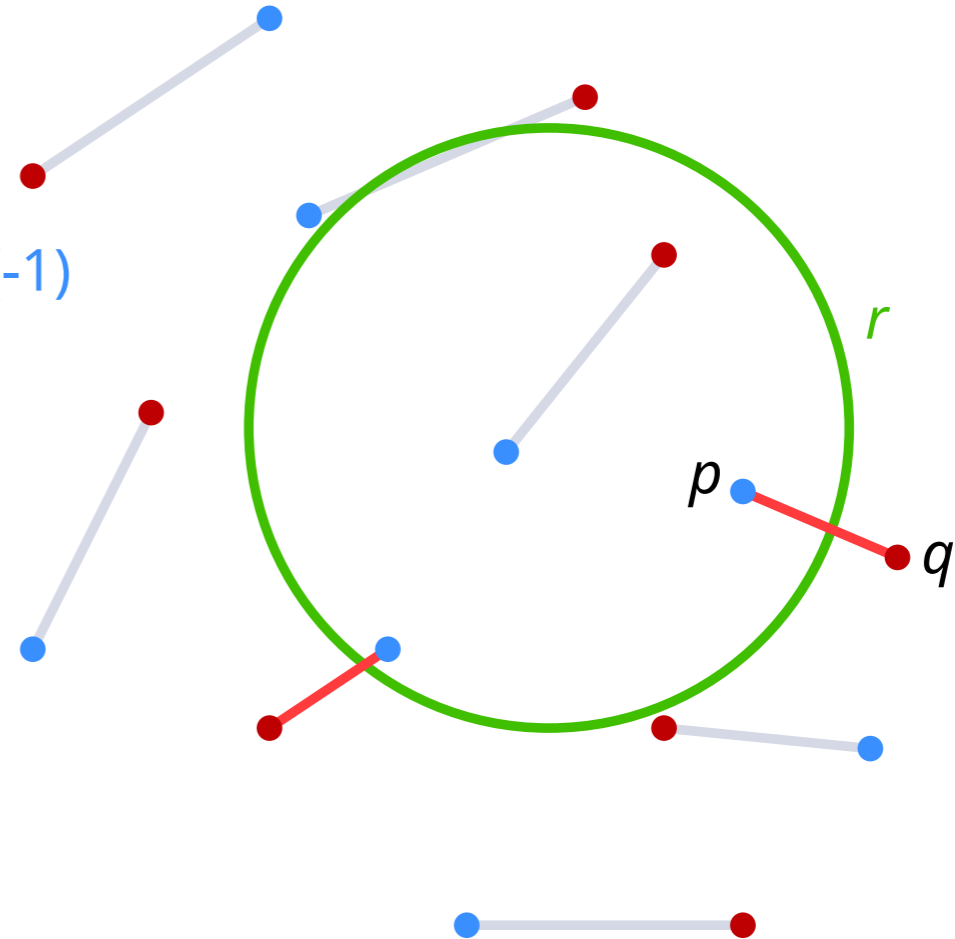
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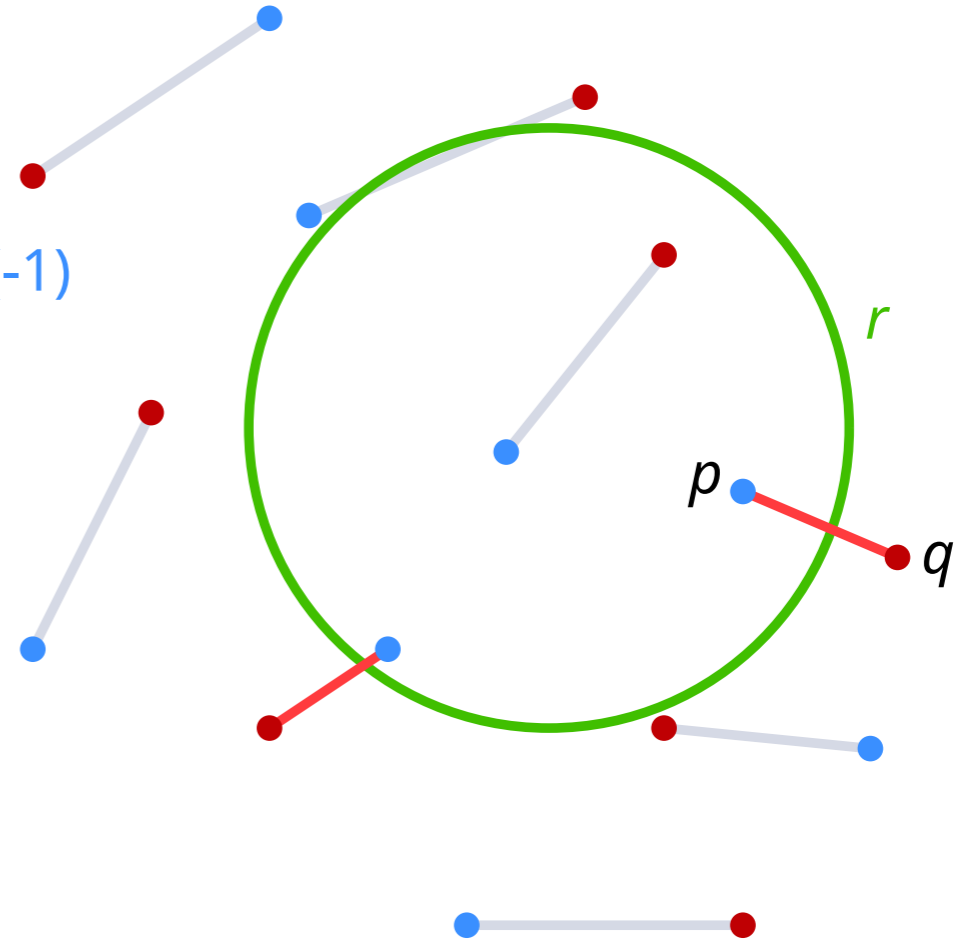
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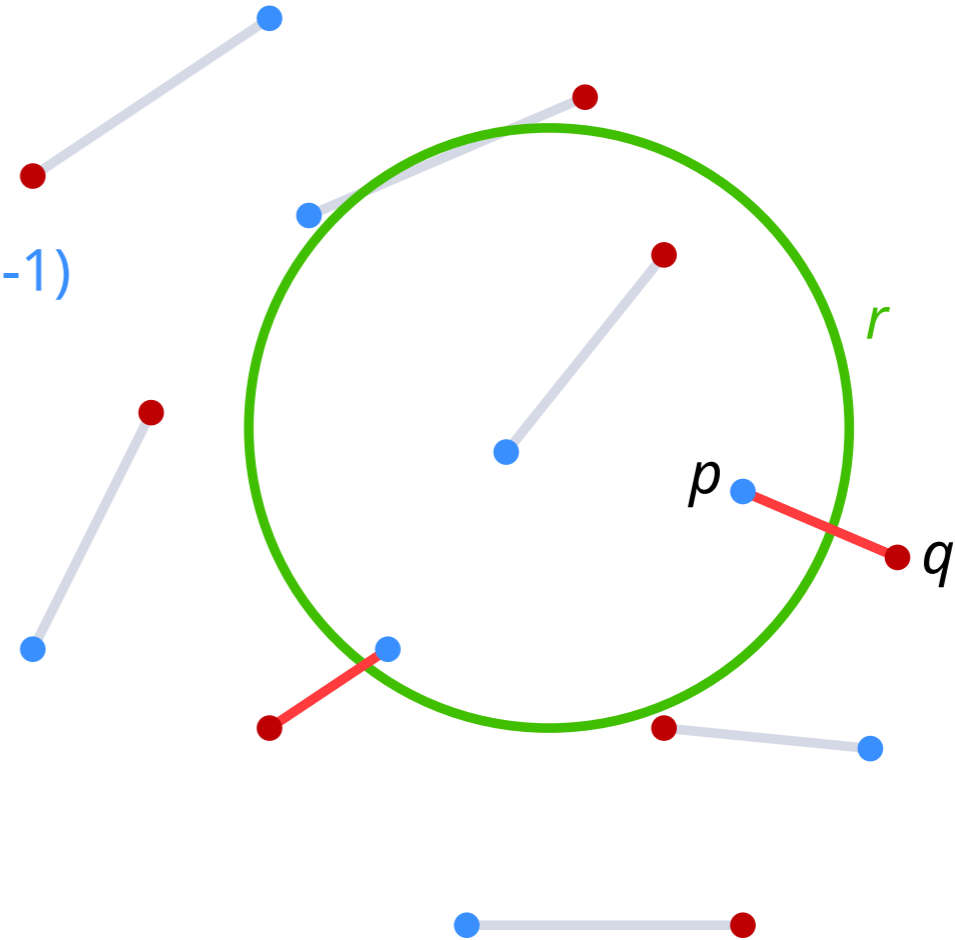
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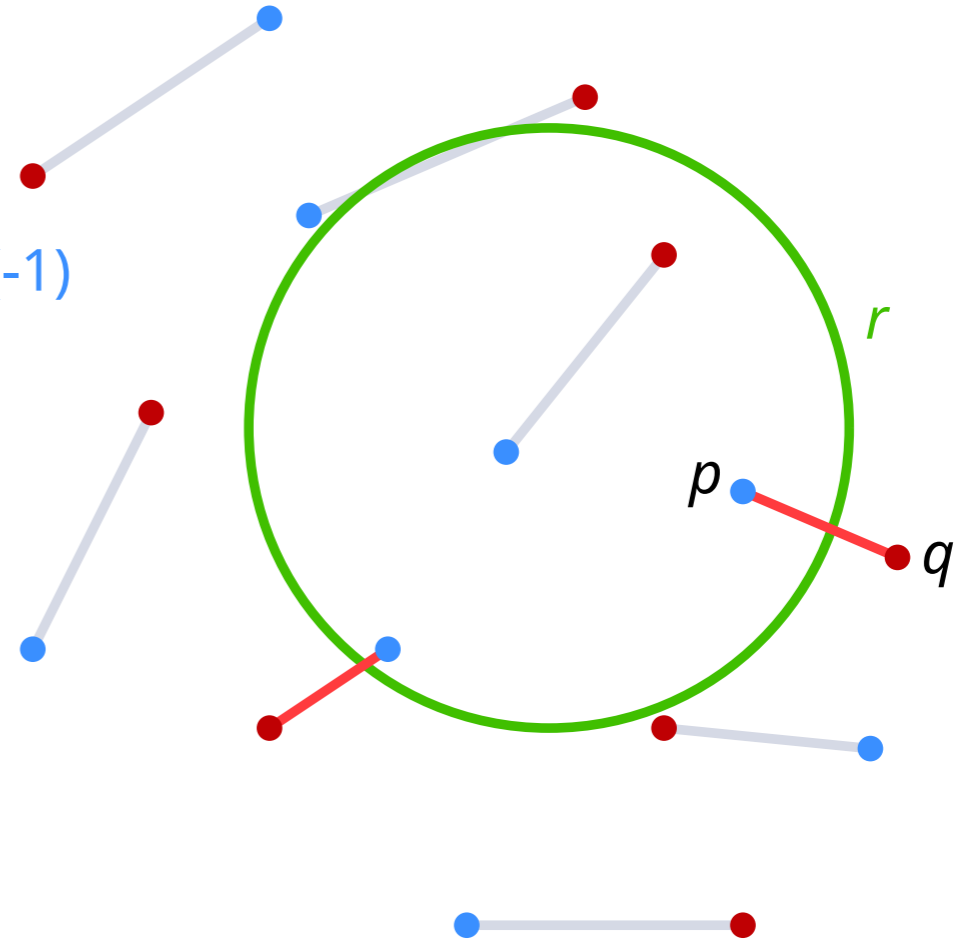
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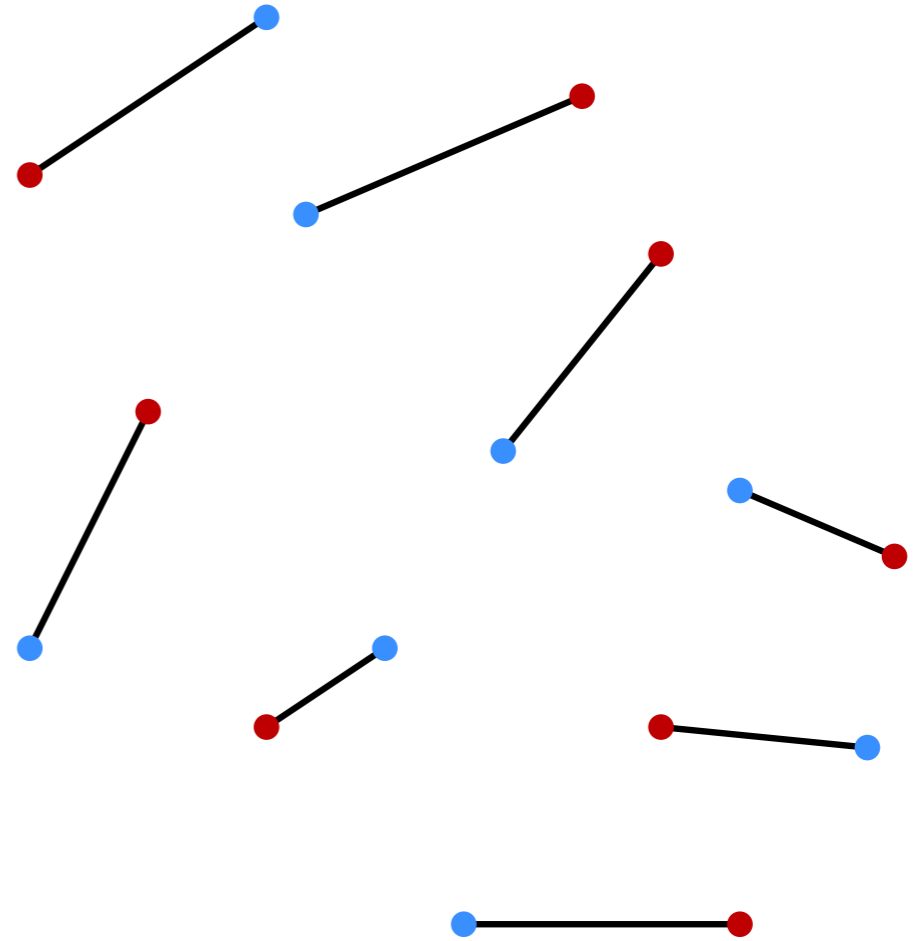
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$\Delta_r = O(\sqrt{\delta n \log n})$ for shattering dim. δ since $\#_r \leq n/2$



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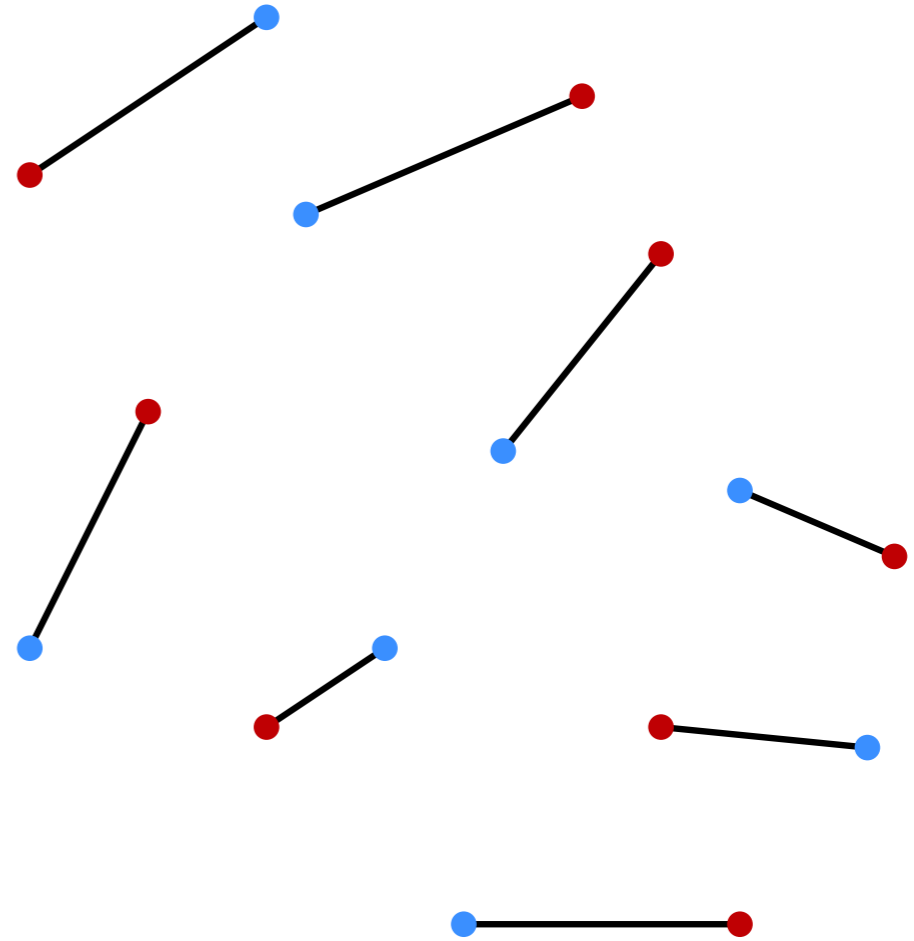
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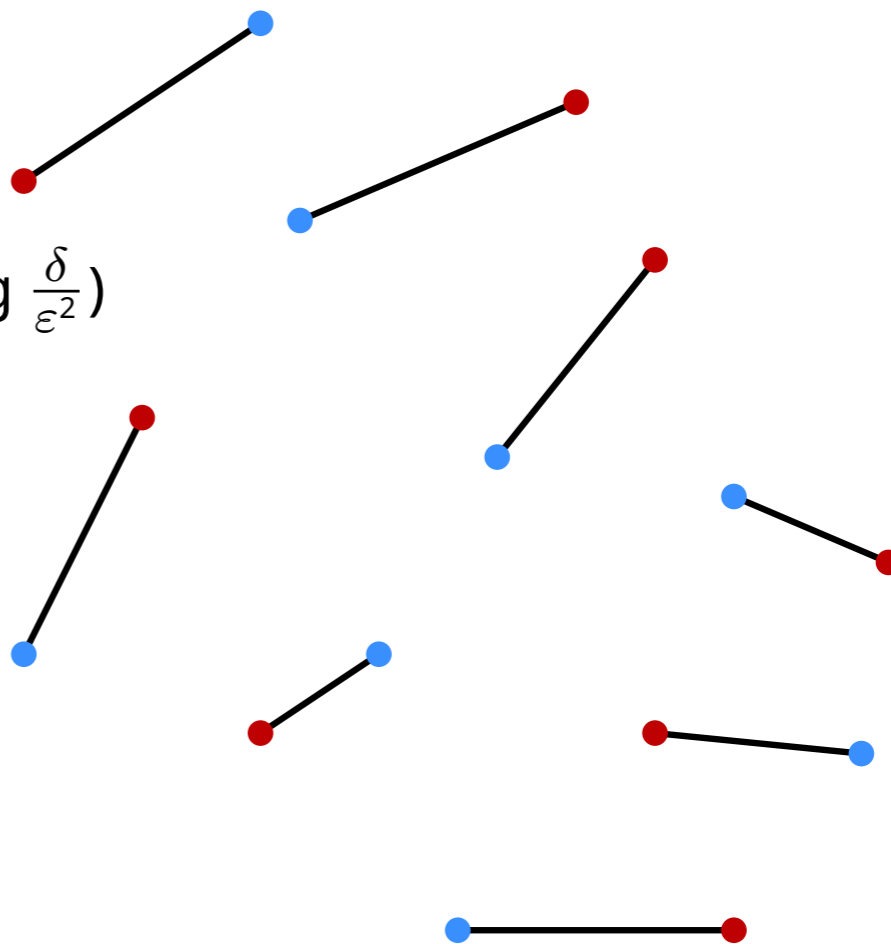


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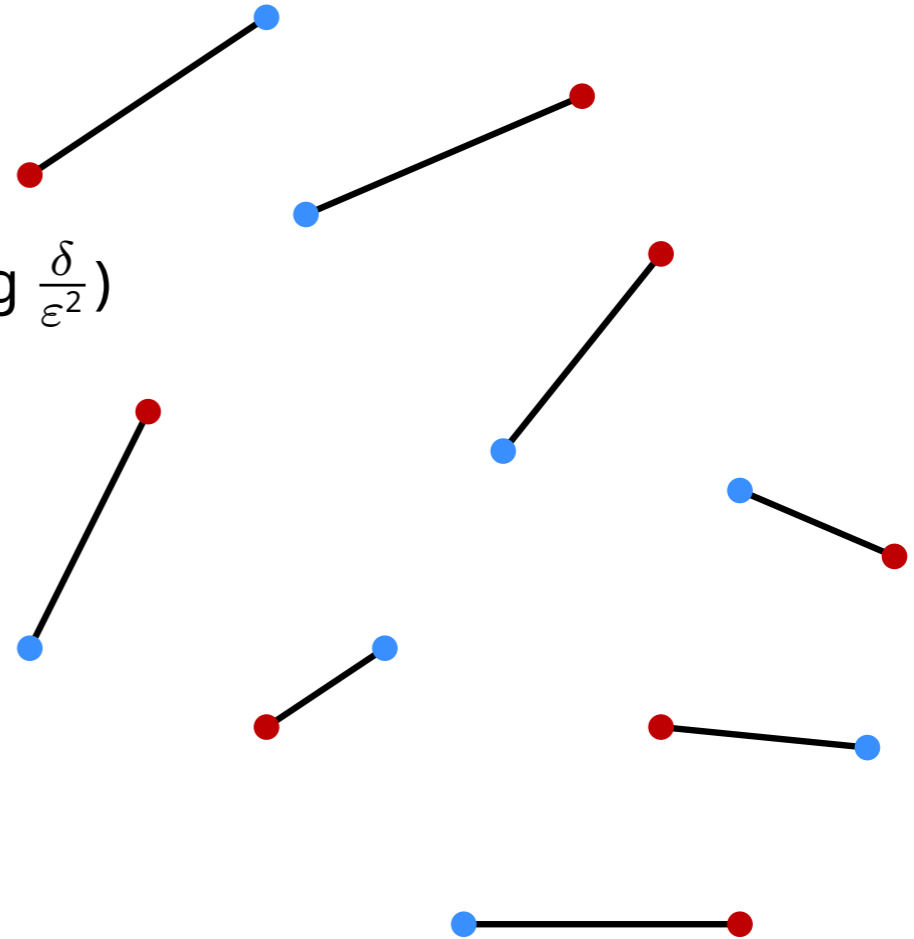
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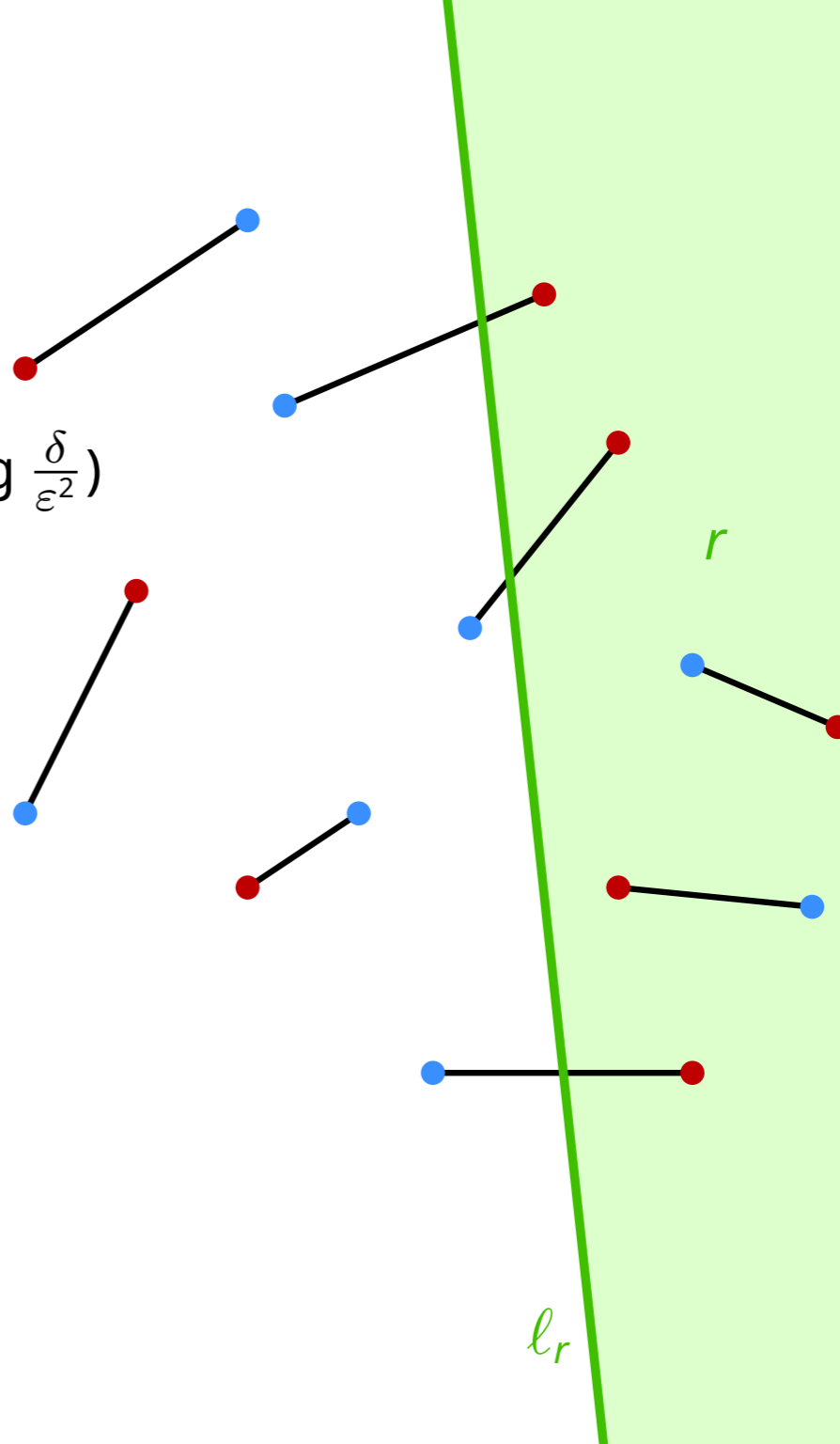
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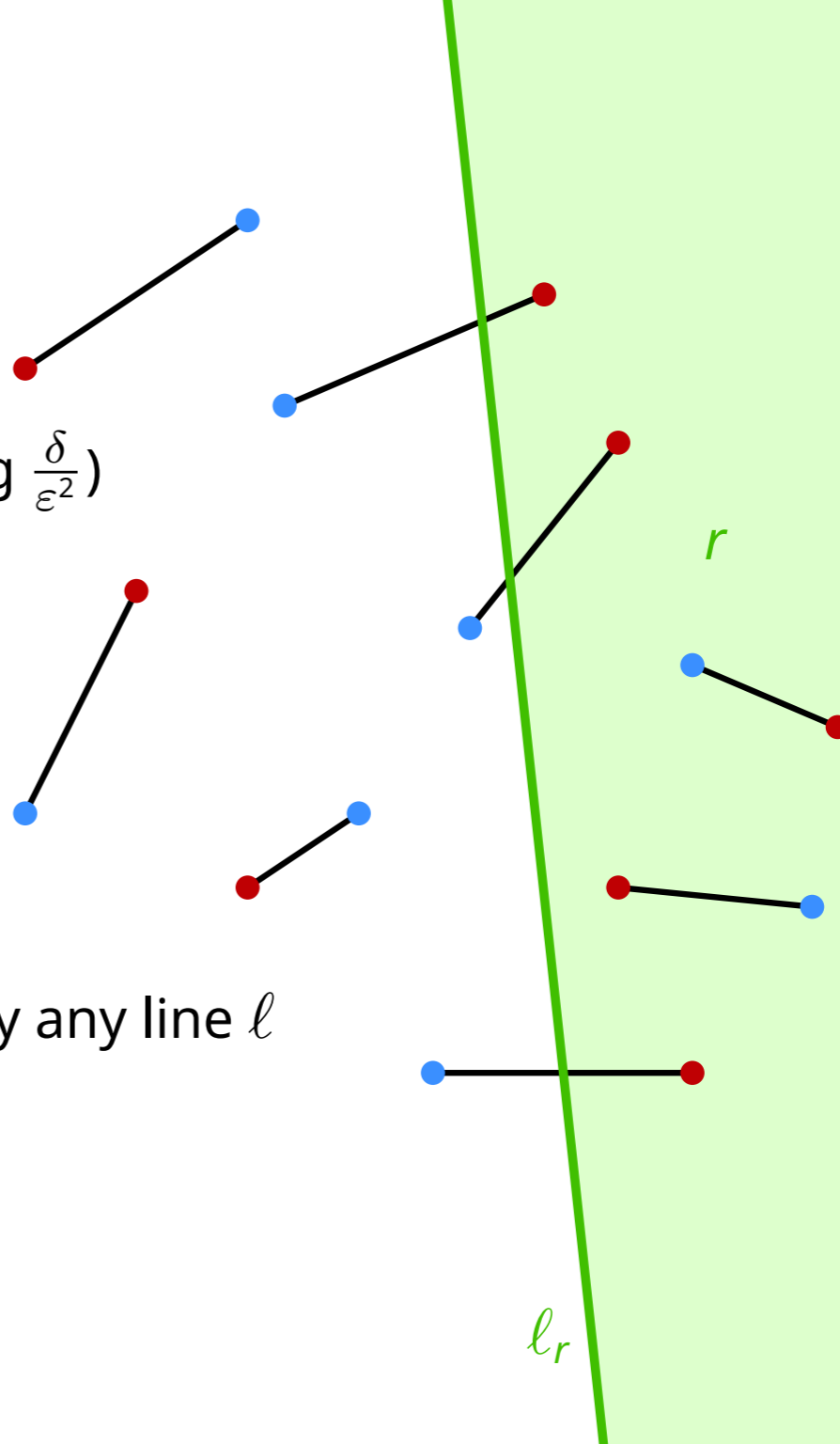
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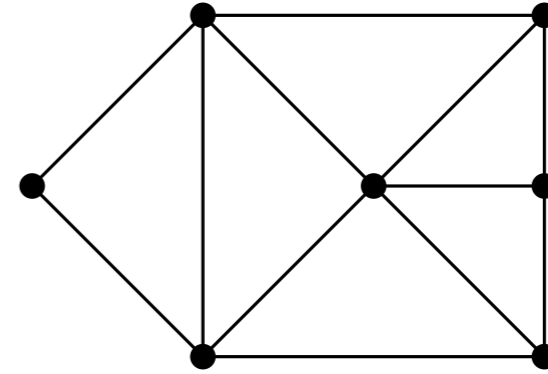
$\max_{r \in \mathcal{R}} \#_r$ = maximum number of edges crossed by any line ℓ



Computing **spanning trees with low crossing number**

Spanning Tree in General

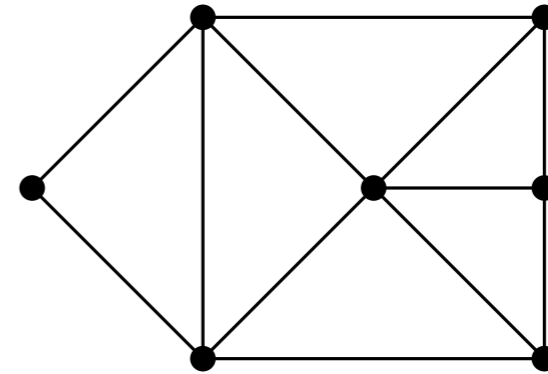
Connected graph $G = (V, E)$



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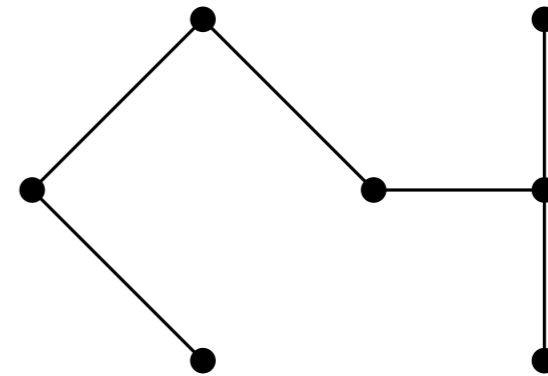
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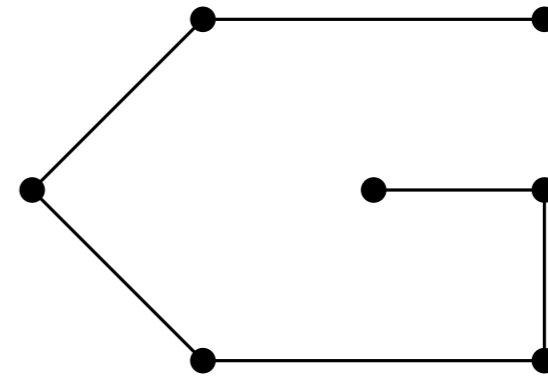
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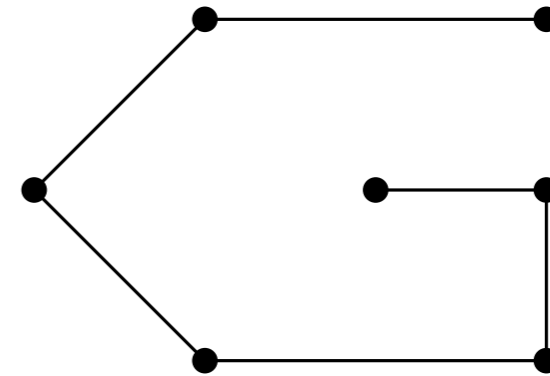


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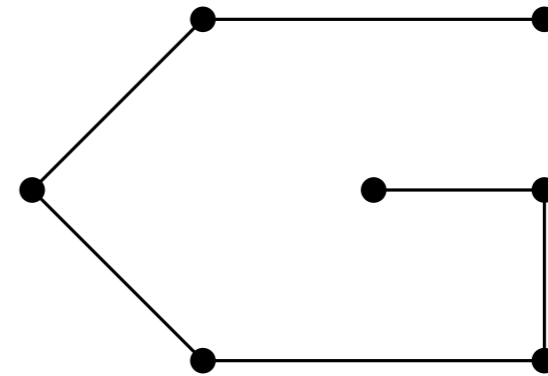
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Given edge weights $c : E \rightarrow \mathbb{R}_{\geq 0}$

What is the minimum weight spanning tree?

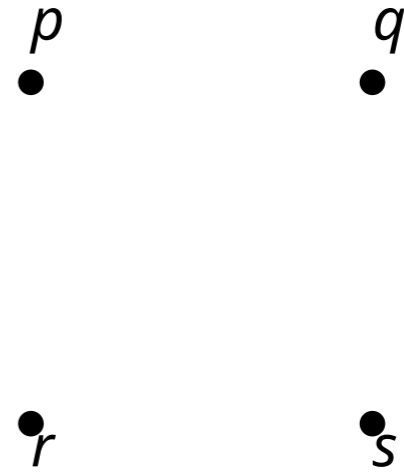


Spanning Tree in the Plane

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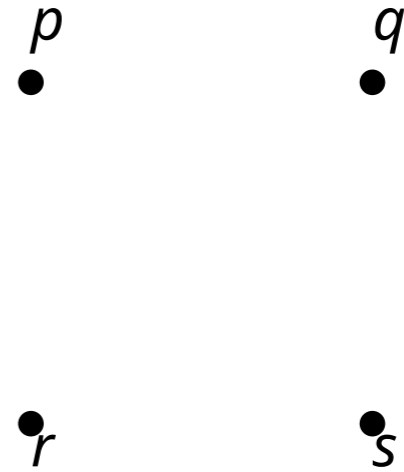
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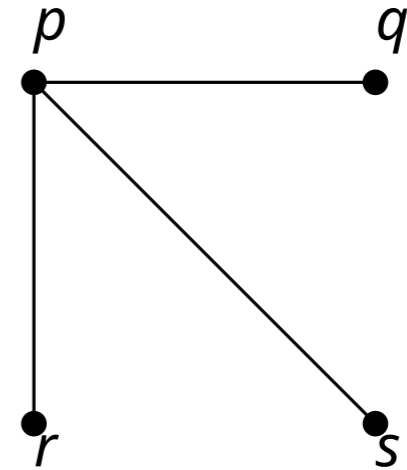


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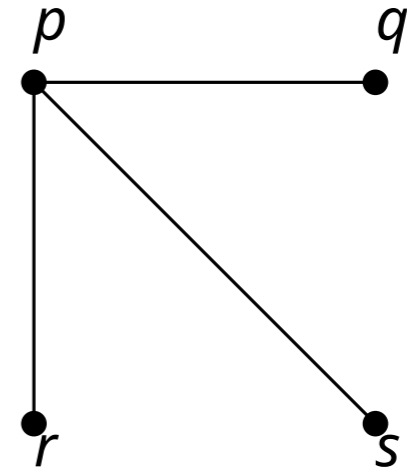
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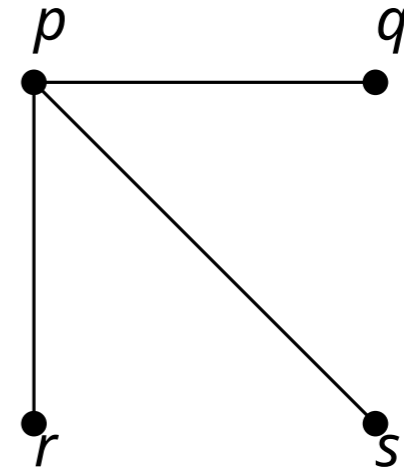
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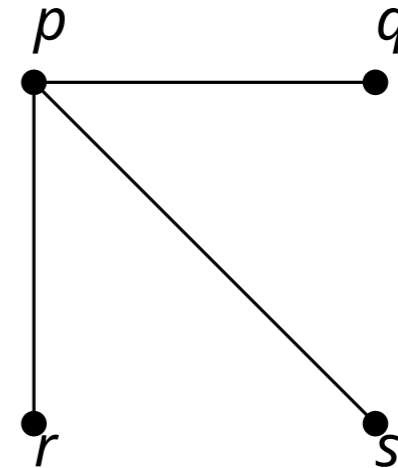
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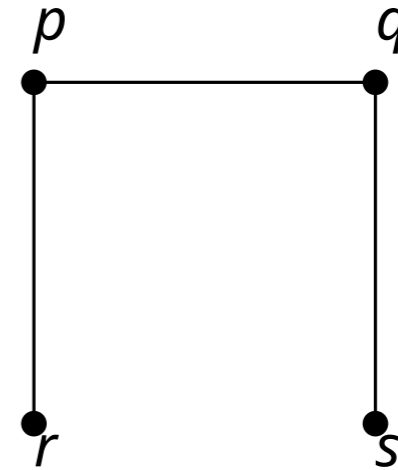
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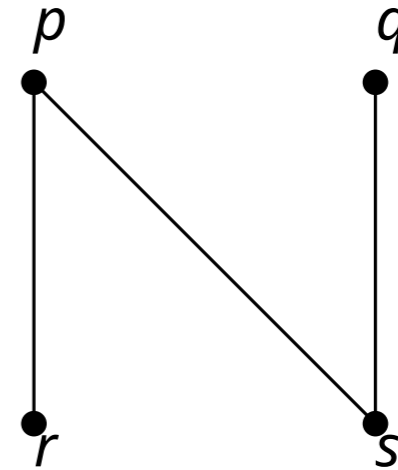
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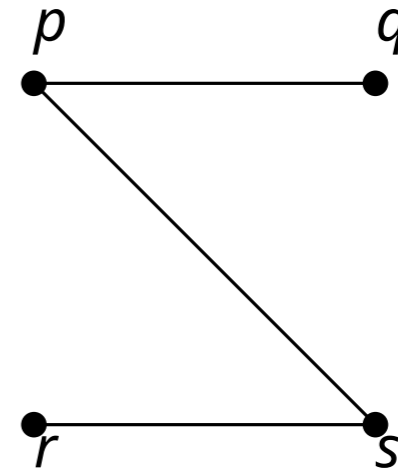
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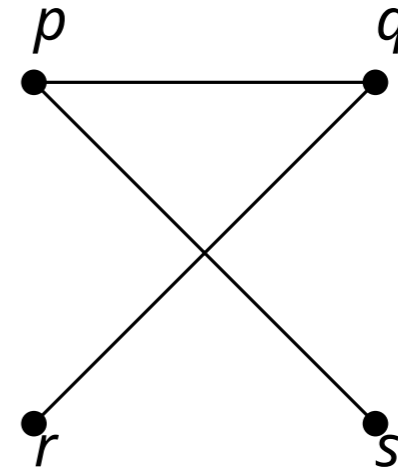
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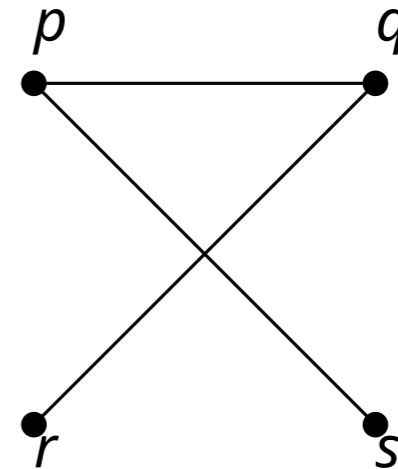
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Cayley's Formula: n^{n-2} trees



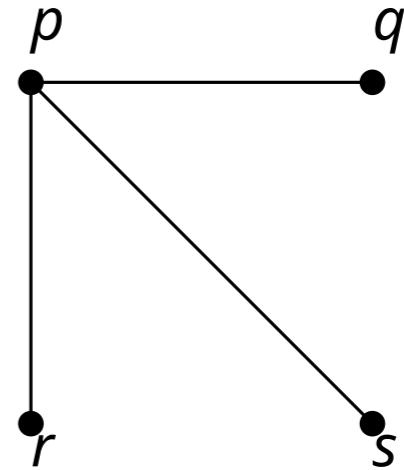
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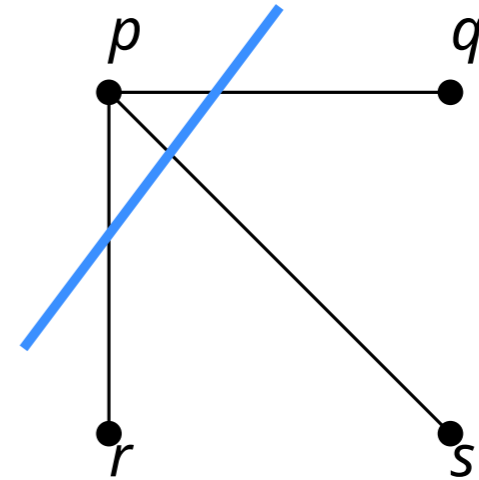


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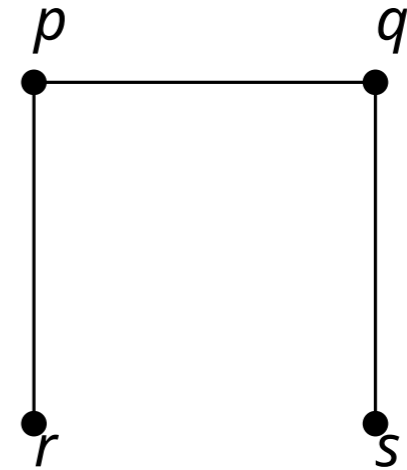
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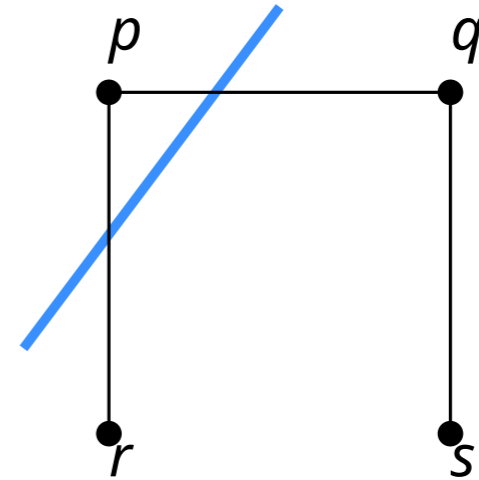
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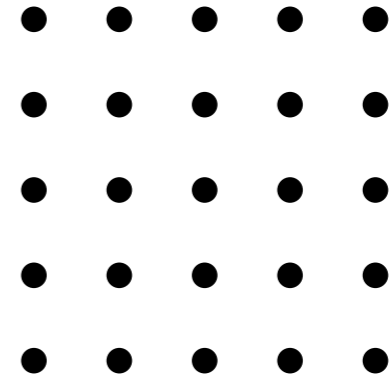
Stabbing number is 2



Stabbing Number

Stabbing number of \mathcal{T} is the maximum number of times any line in the plane intersects \mathcal{T}

Given n points on $\sqrt{n} \times \sqrt{n}$ grid

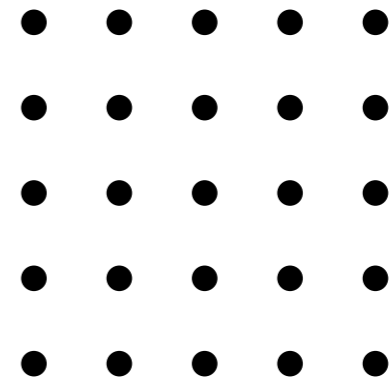


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Max stabbing number using only the grid for \mathcal{T} ?



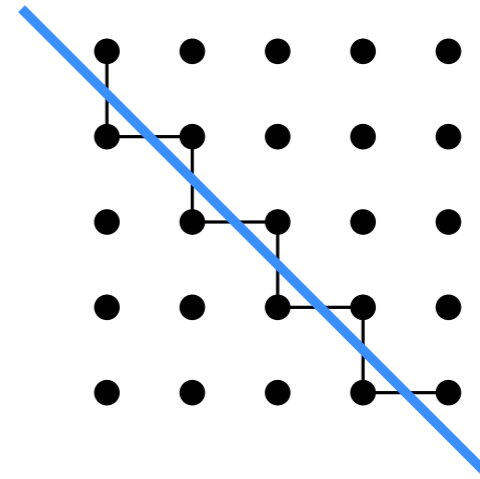
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$$2 \cdot (\sqrt{n} - 1)$$



Stabbing Number

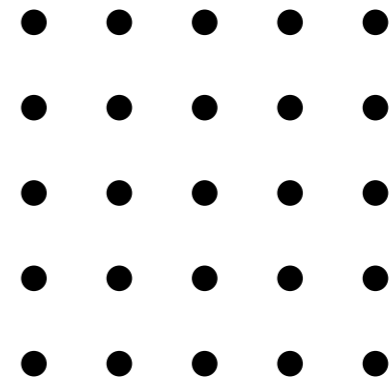
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Lower bound (Ω)?



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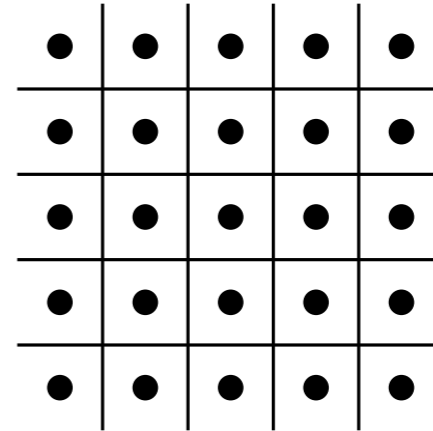
$$2 \cdot (\sqrt{n} - 1)$$

Lower bound (Ω)?

Draw $2 \cdot (\sqrt{n} - 1)$ lines

Each line segment crosses at least one line

For at least one line $\frac{n-1}{2 \cdot (\sqrt{n}-1)} = \Omega(\sqrt{n})$ line segment crossings ([pigeonhole principle](#))



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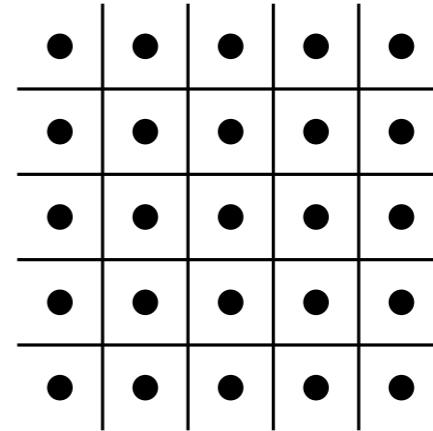
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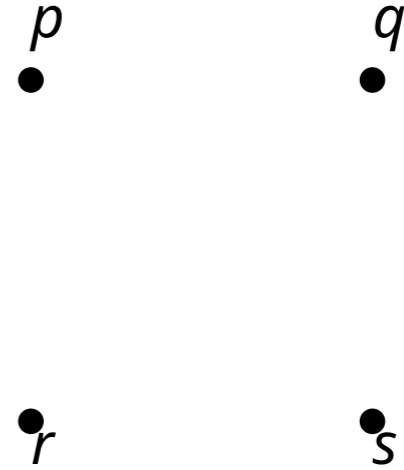
For at least one line $\frac{n-1}{2 \cdot (\sqrt{n}-1)} = \Omega(\sqrt{n})$ line segment crossings ([pigeonhole principle](#))

Theorem. We can always find \mathcal{T} with stabbing number $O(\sqrt{n})$ in polynomial time (1992 Welzl)



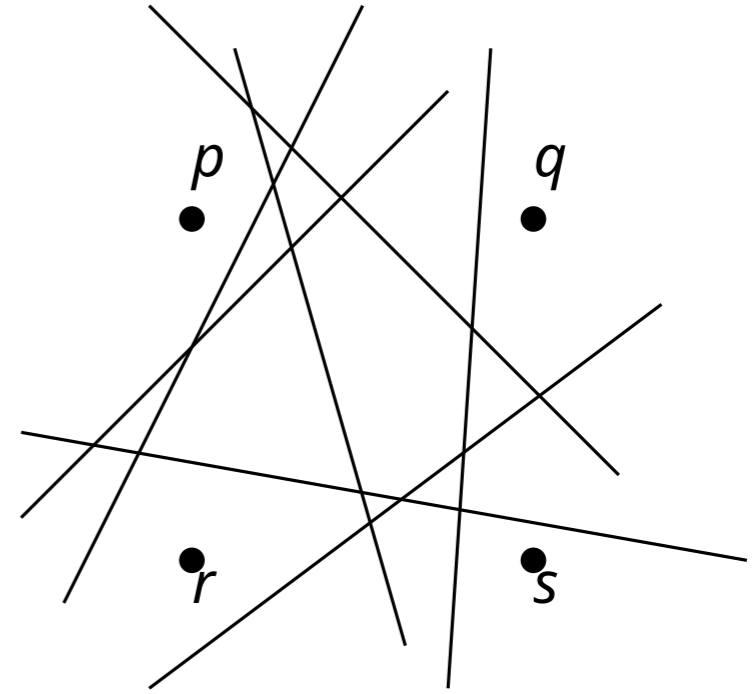
The Algorithm

Consider all separating lines \hat{L} of P



The Algorithm

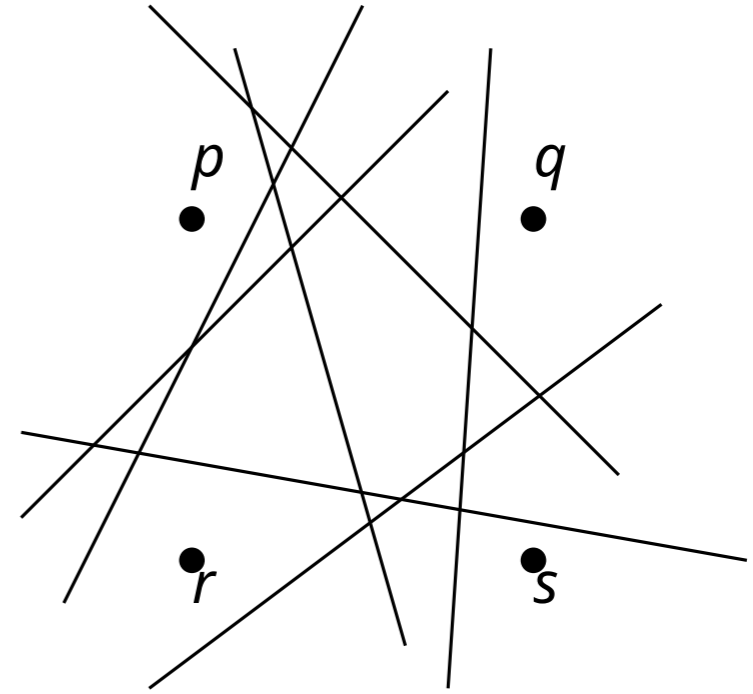
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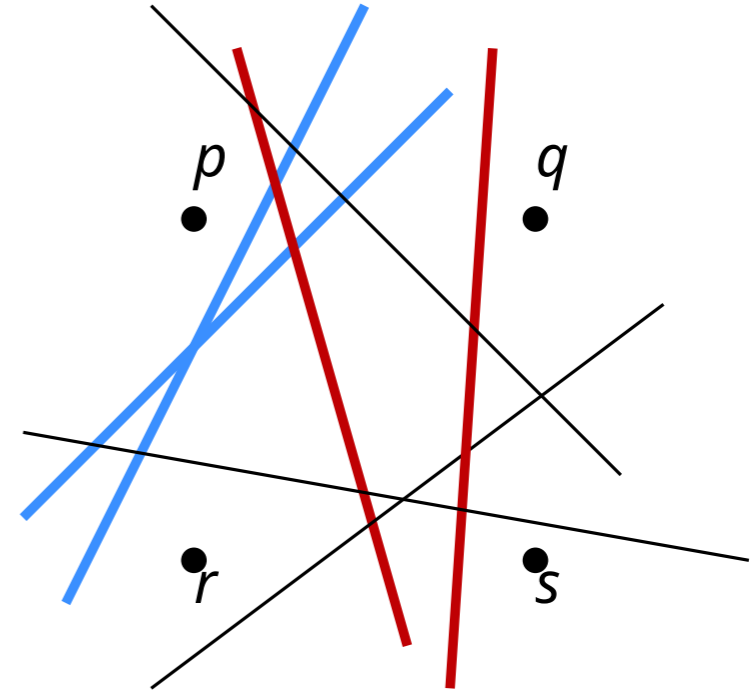
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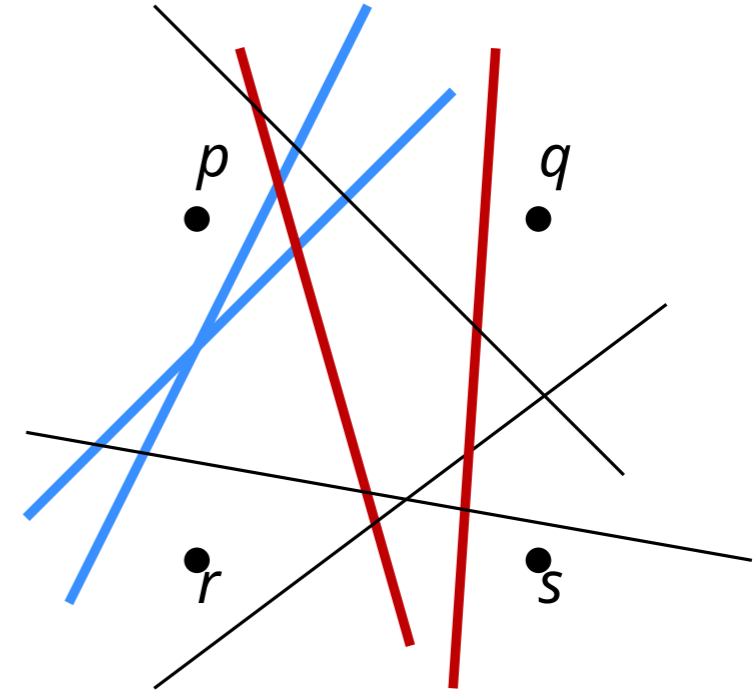
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Let two lines $l, l' \in \hat{L}$ be equivalent if l and l' separate the same sets of points

Pick one for each equivalent class of \hat{L}

Let this be set L



The Algorithm

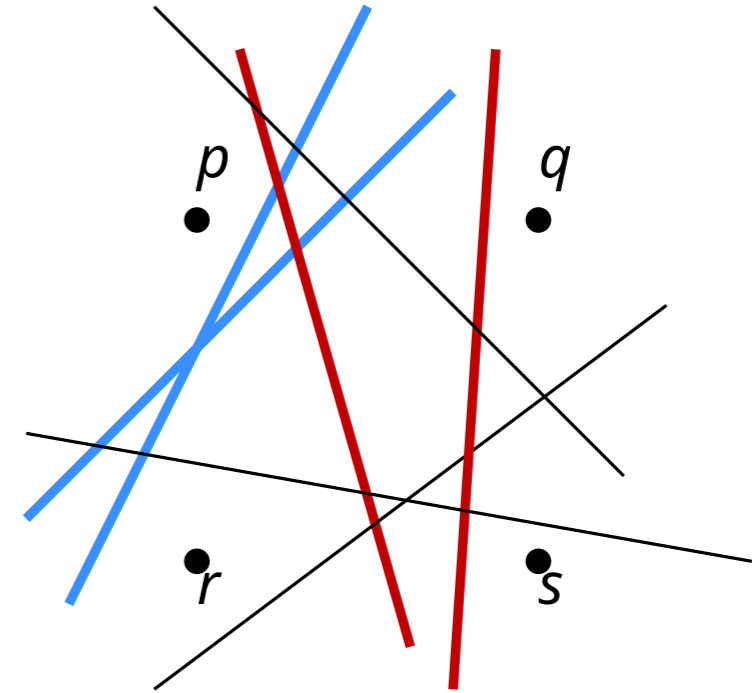
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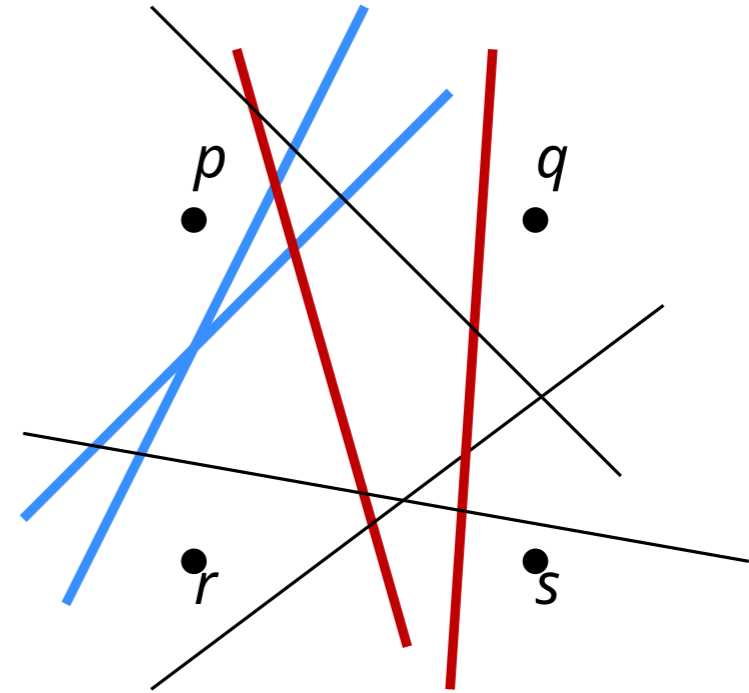
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What is at most the size of L ?

$|L| \leq 4 \binom{n}{2}$, rotate every line until it goes through two points

The two points are the same for at most 4 lines ((above, above), (above, below), ...).



The Algorithm

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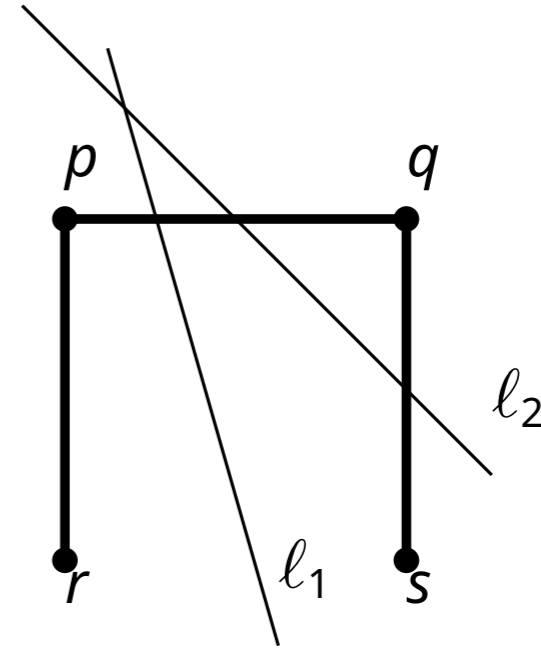
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$w(l_1) = 2, w(l_2) = 4$



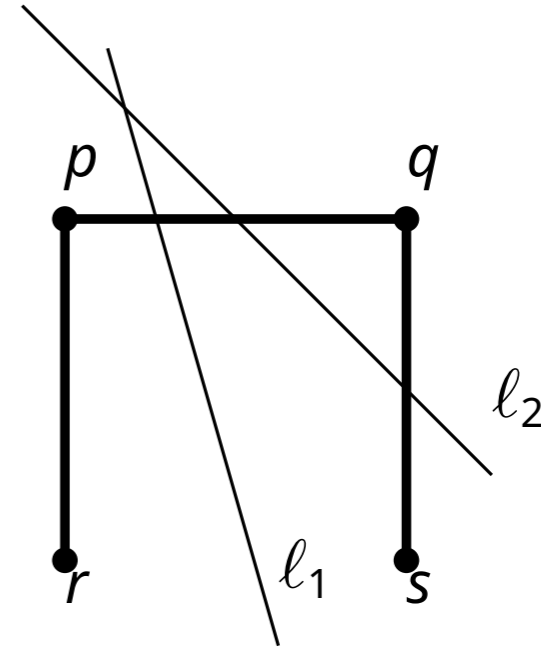
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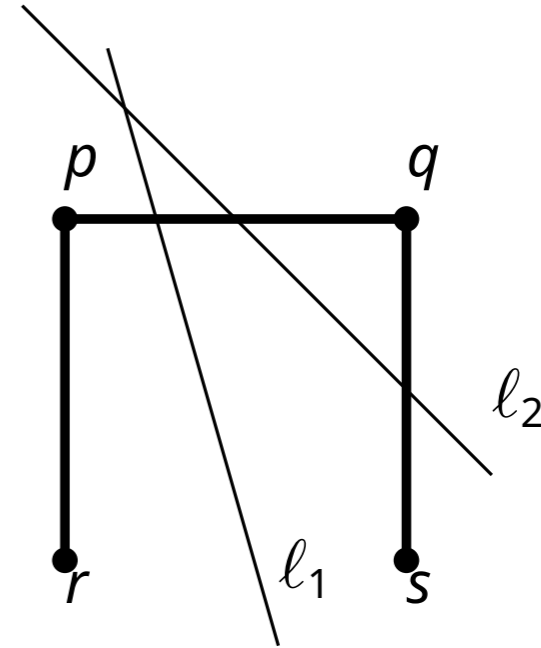
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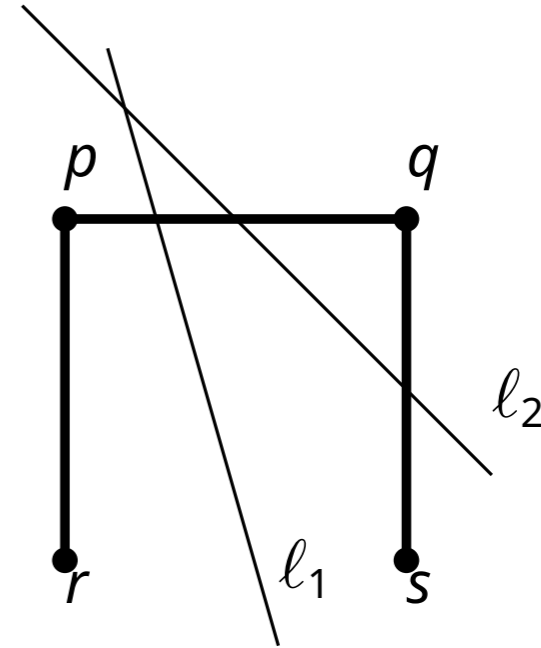
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While $|P| > 1$

1. Calculate the weights of L
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4. Remove a from P



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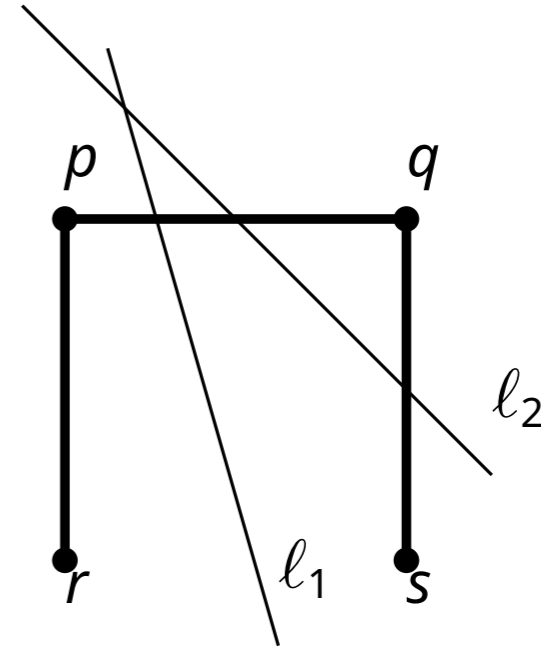
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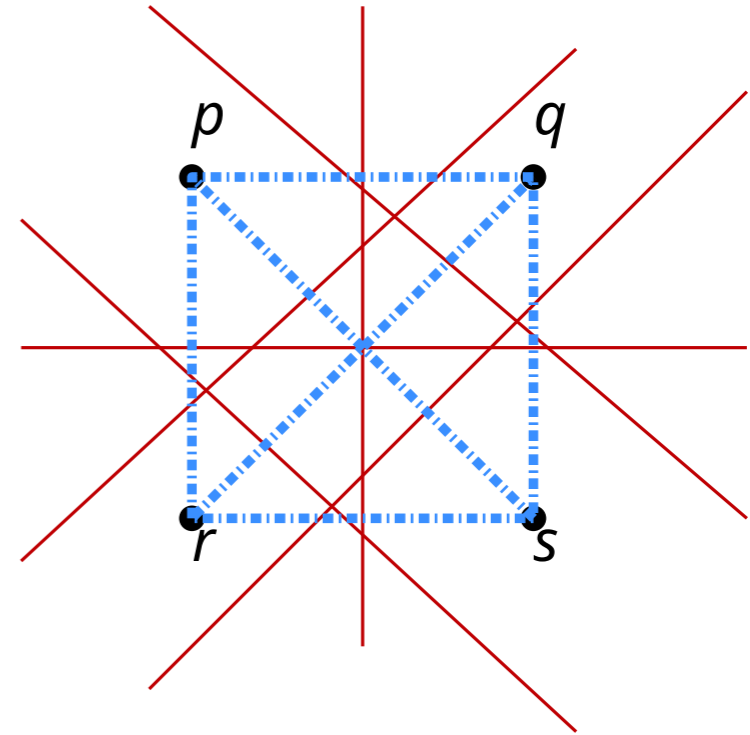
The running time is polynomial in n



The Algorithm

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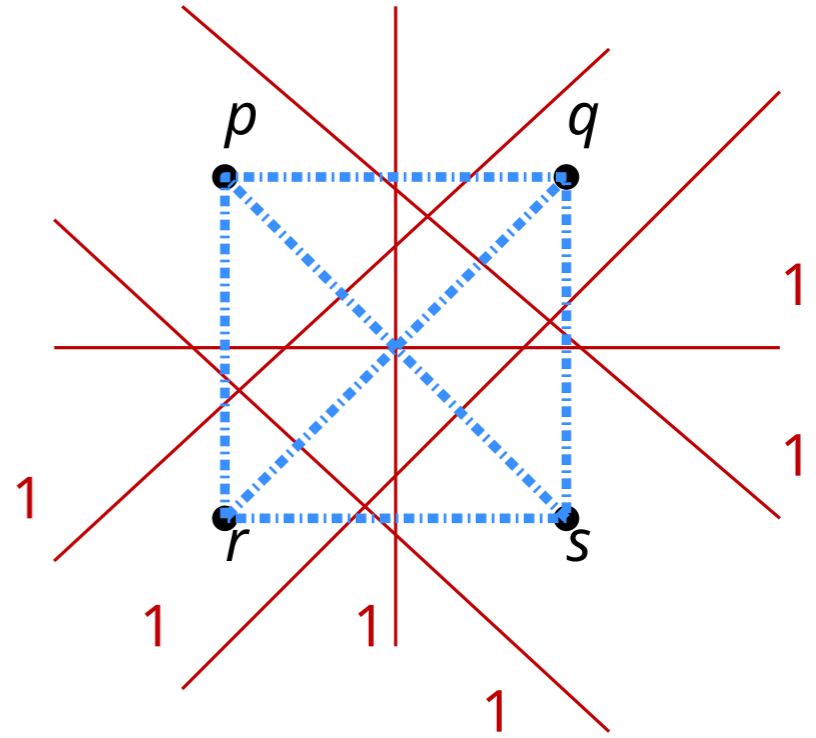
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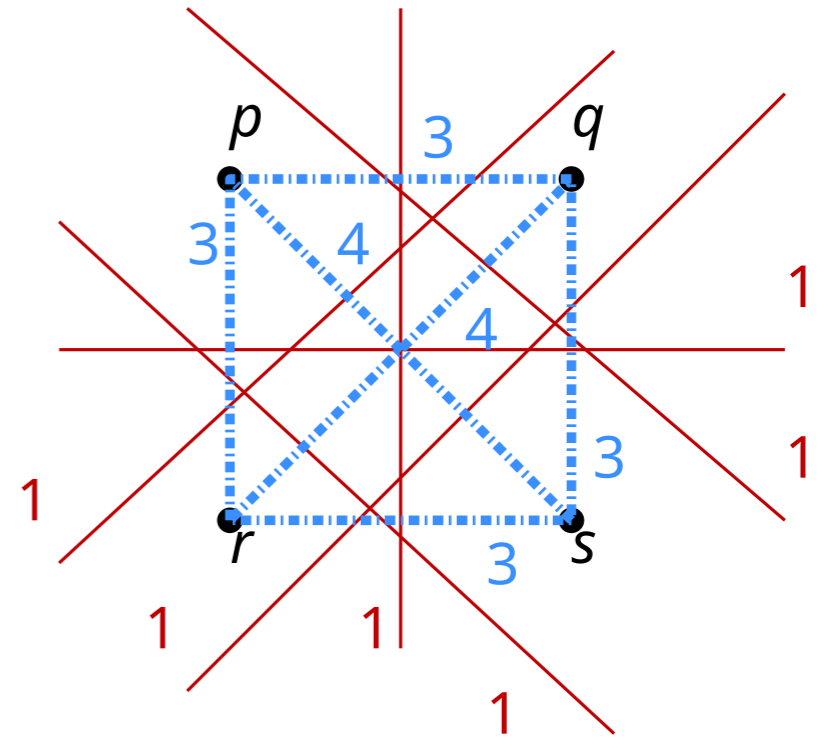
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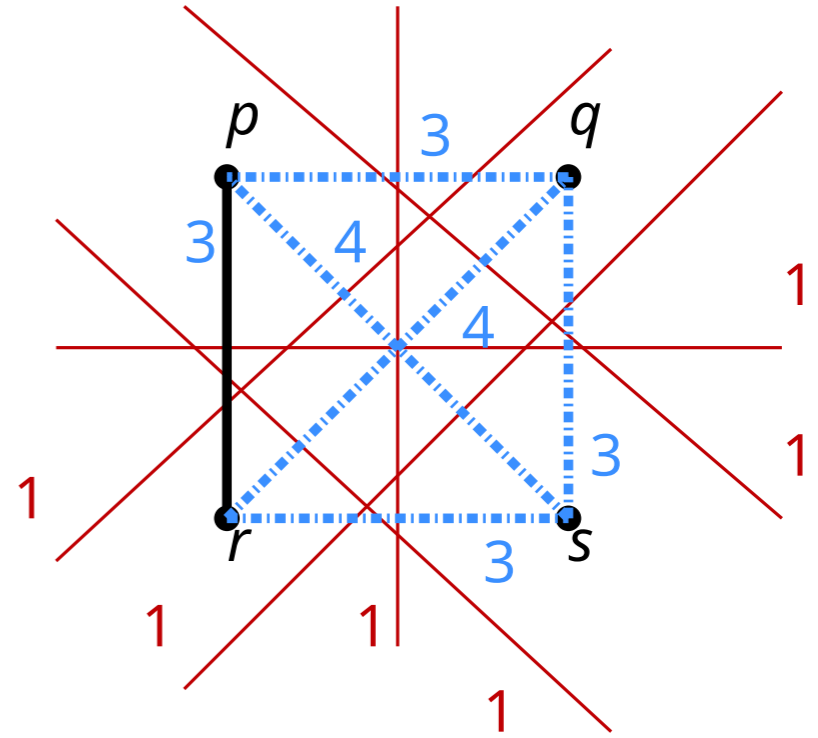
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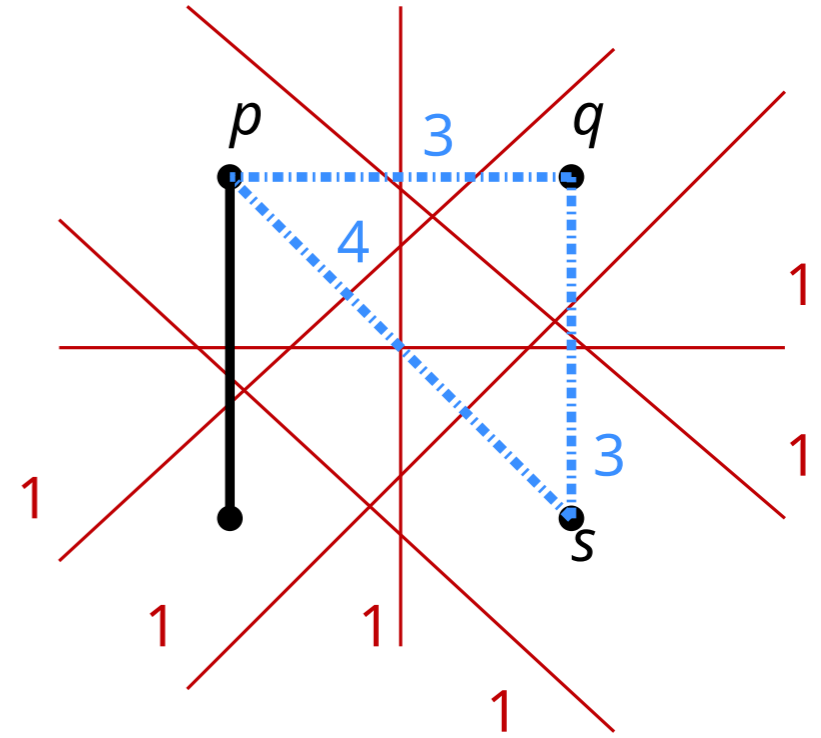
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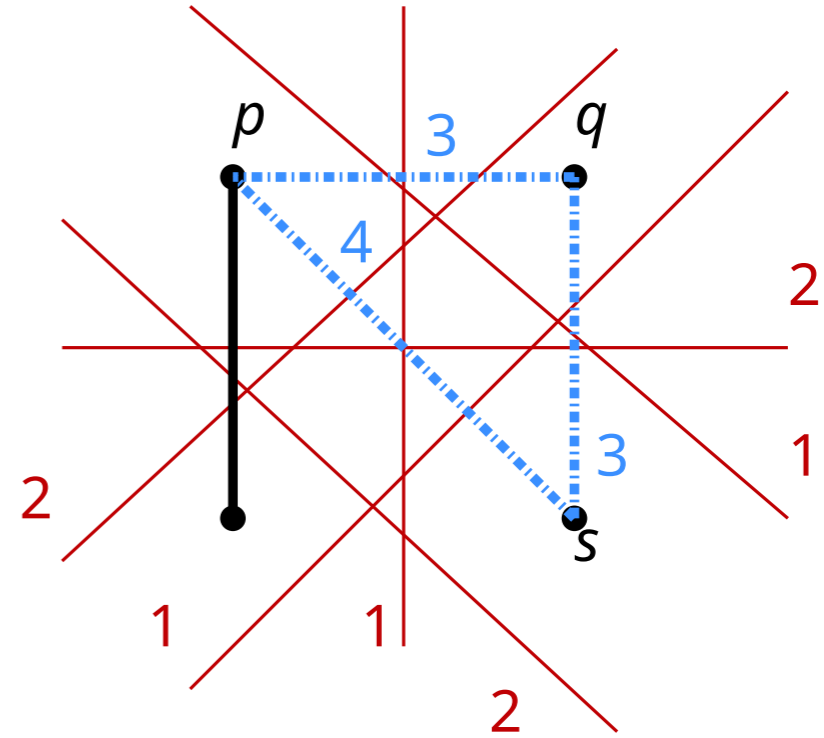
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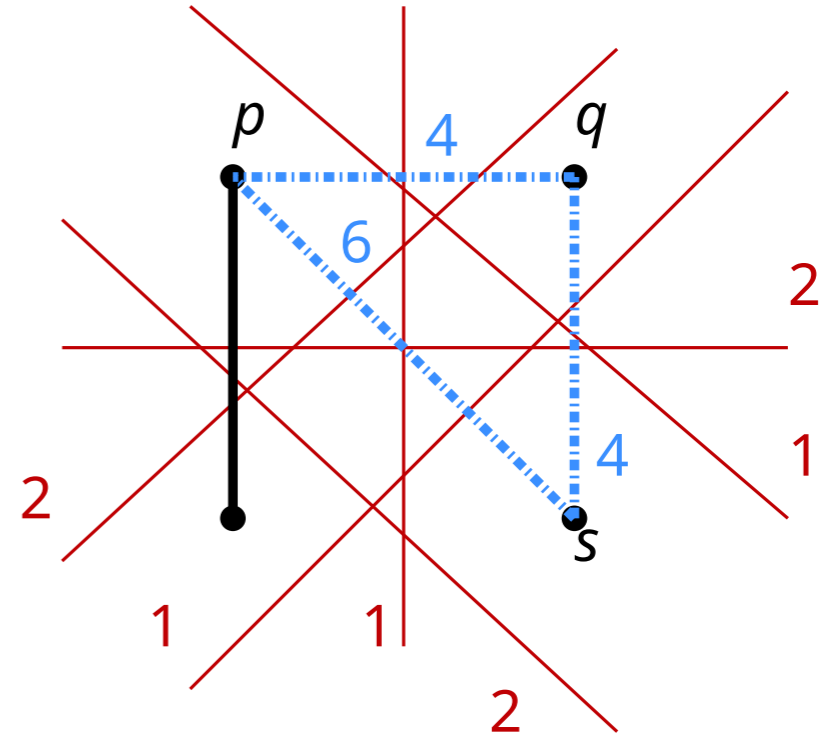
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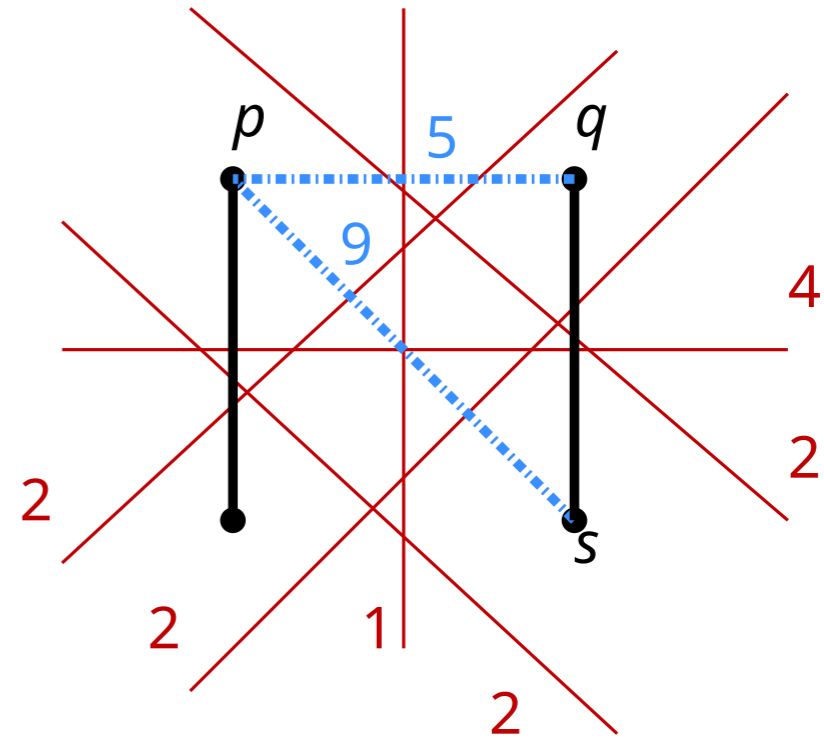
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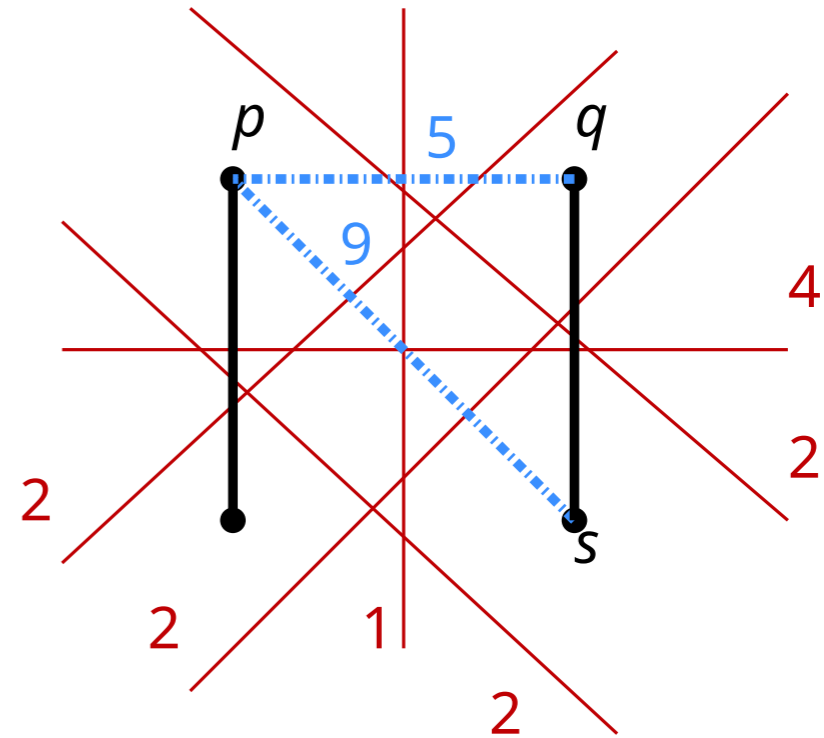
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Removing s leads to stabbing number 2

Removing q leads to stabbing number 3

Asymptotically it does not matter



Proof

Given $P \subseteq \mathbb{R}^2$ and lines L in the plane

$d_{\times}(p, q)$ is the crossing distance for $p, q \in P$

Number of lines of L that pq crosses

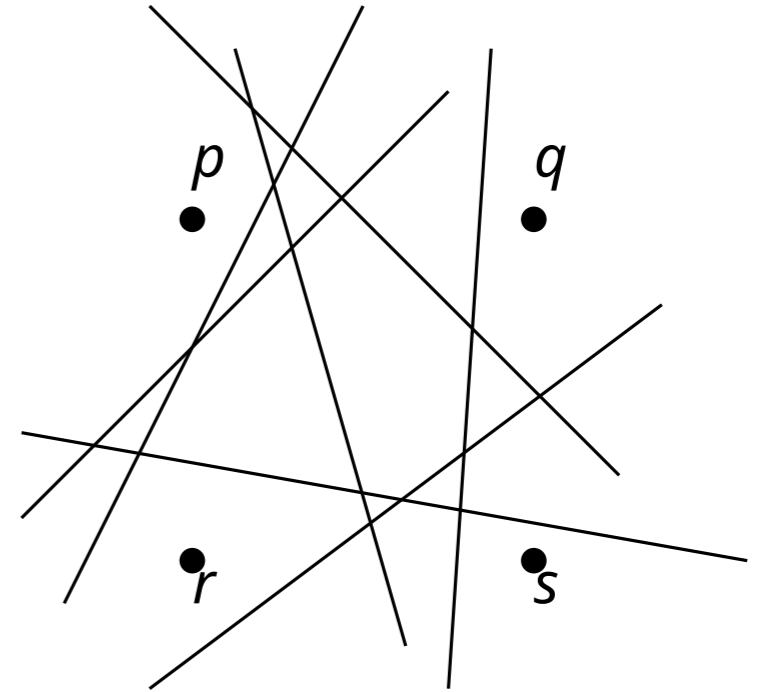
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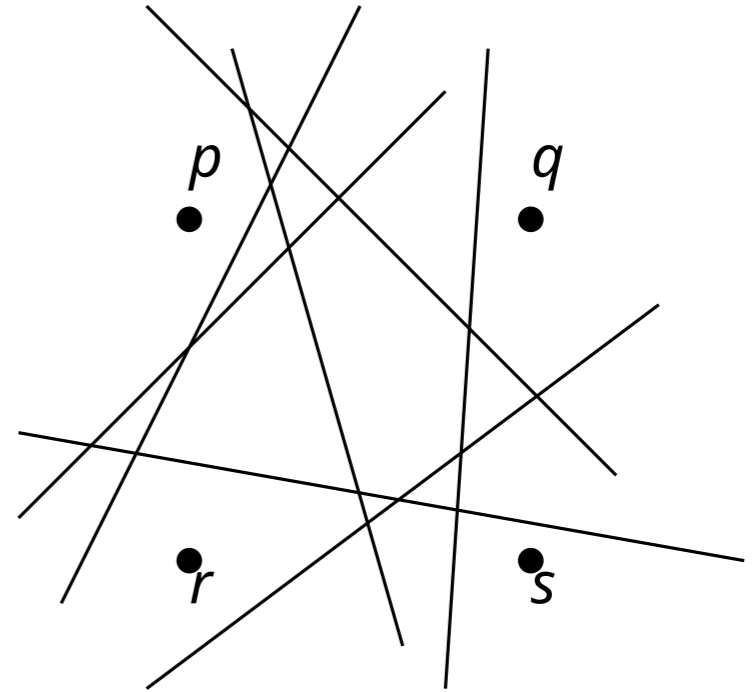
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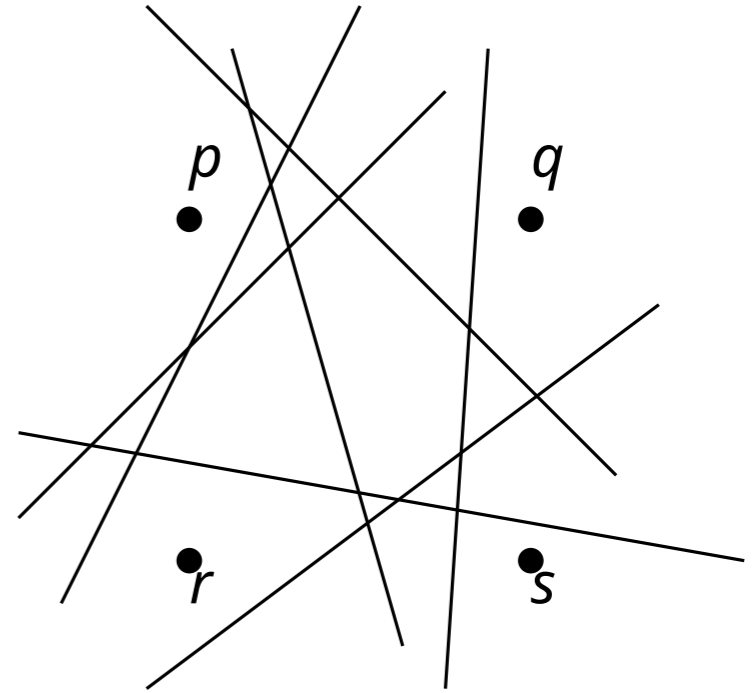
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The triangle inequality holds

$$d_{\times}(p, q) \leq d_{\times}(p, r) + d_{\times}(r, q)$$



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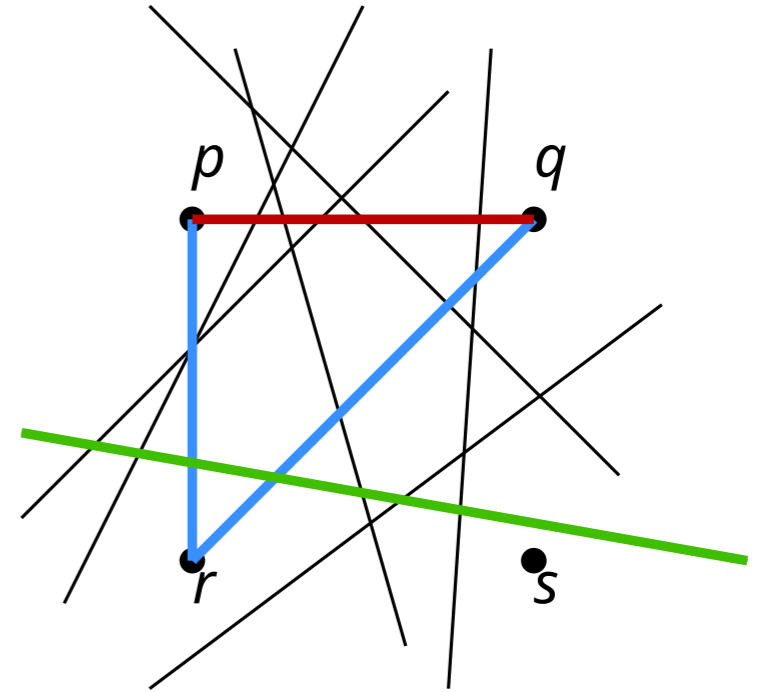
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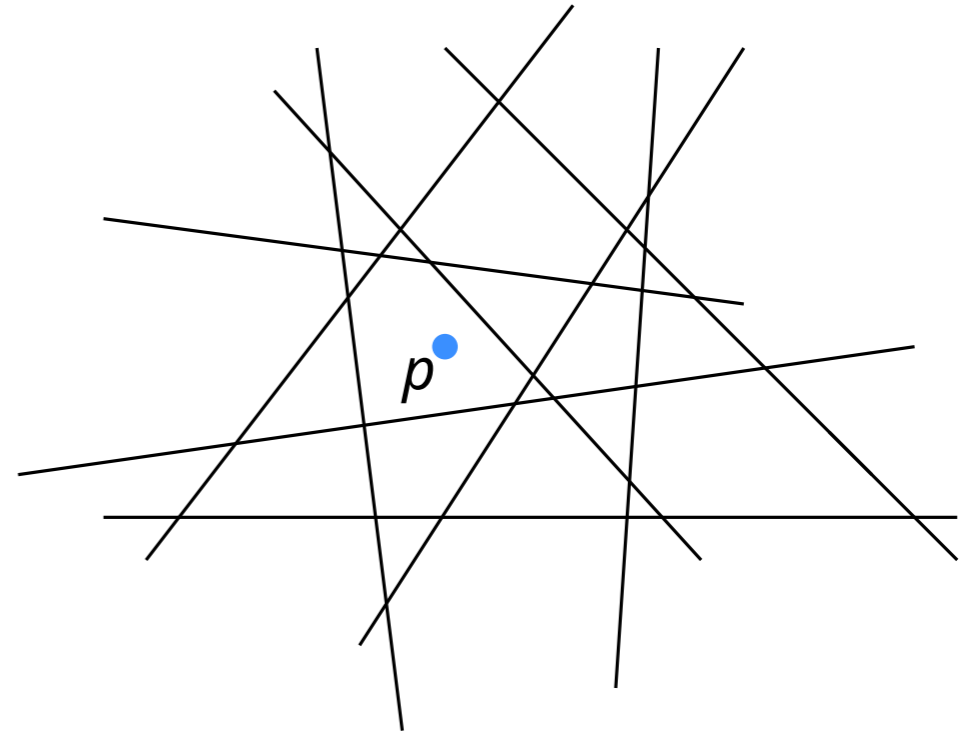
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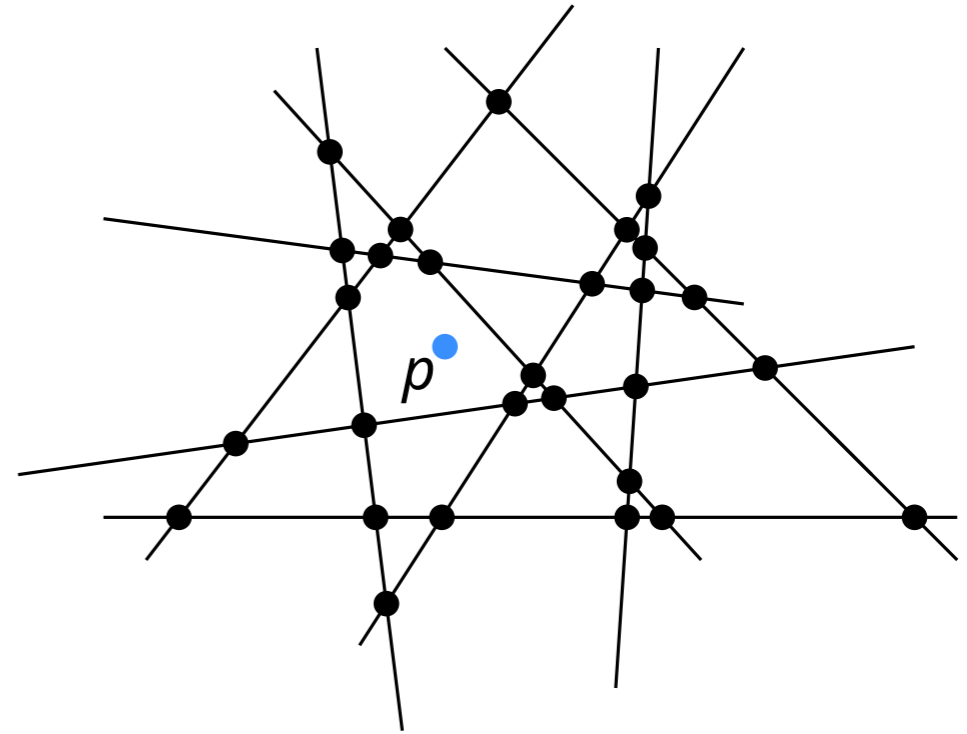
Given $P \subseteq \mathbb{R}^2$ and lines L in the plane



Proof

Given $P \subseteq \mathbb{R}^2$ and lines L in the plane

Consider the arrangement $\mathcal{A}(L)$

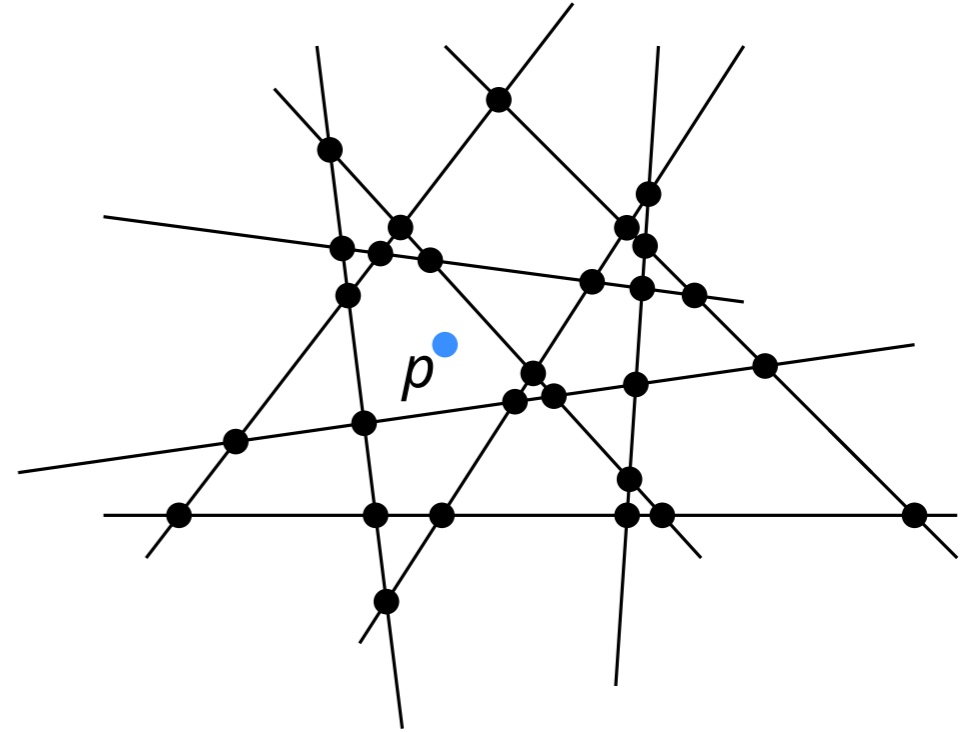


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Given $P \subseteq \mathbb{R}^2$ and lines L in the plane

Consider the arrangement $\mathcal{A}(L)$

Let $b_{\leq r}(p, r)$ denote all intersections $q \in \mathcal{A}(L)$ for which $d_{\infty}(p, q) \leq r$



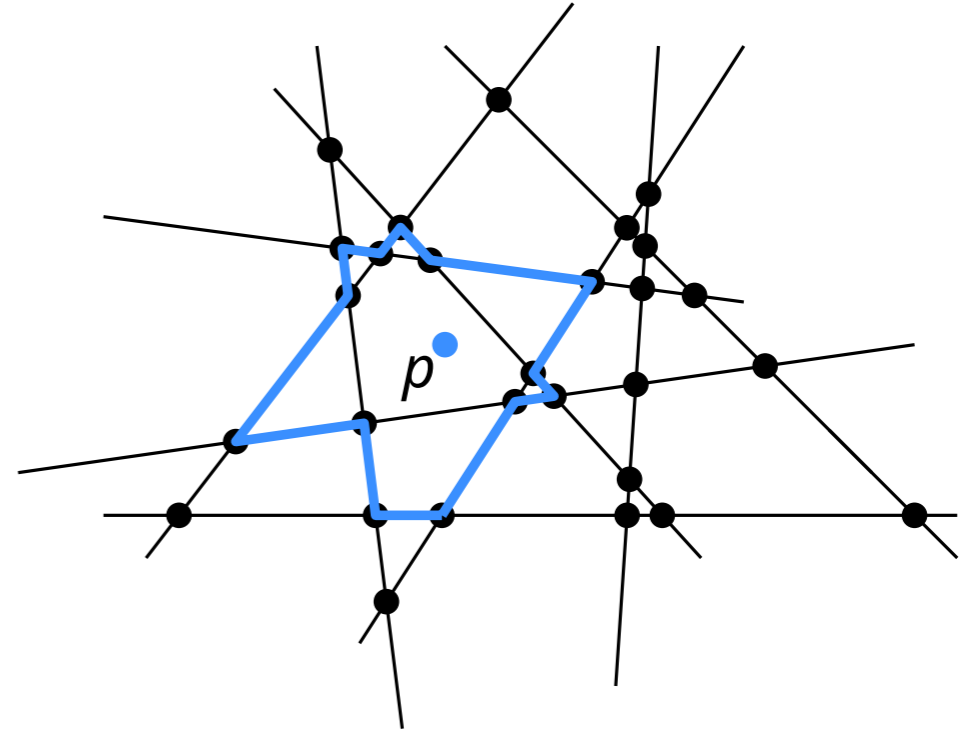
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Example $b_{\leq 3}(p, 3)$



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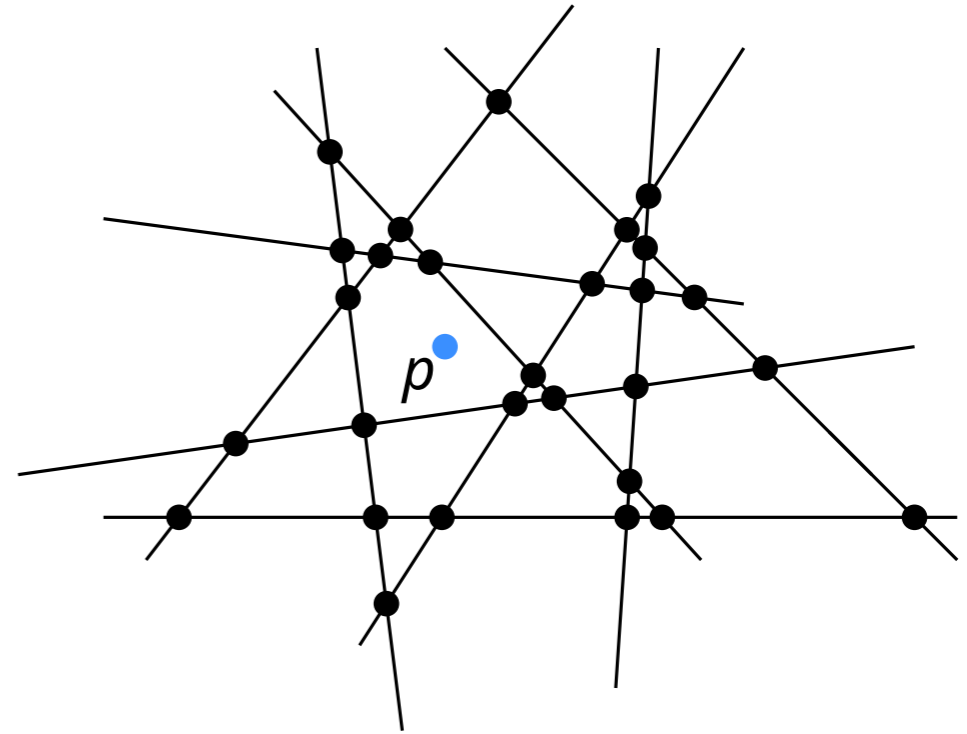
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Lemma. For any $r \leq \frac{|L|}{2}$ we have that $|b_{\leq r}(p, r)| \geq \frac{r^2}{8}$



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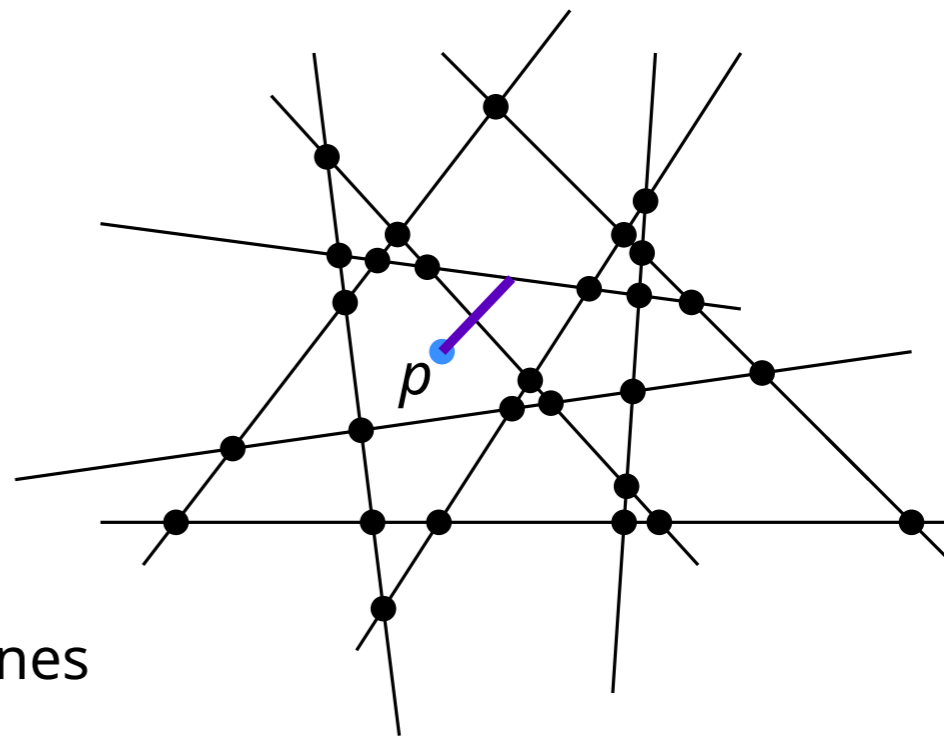
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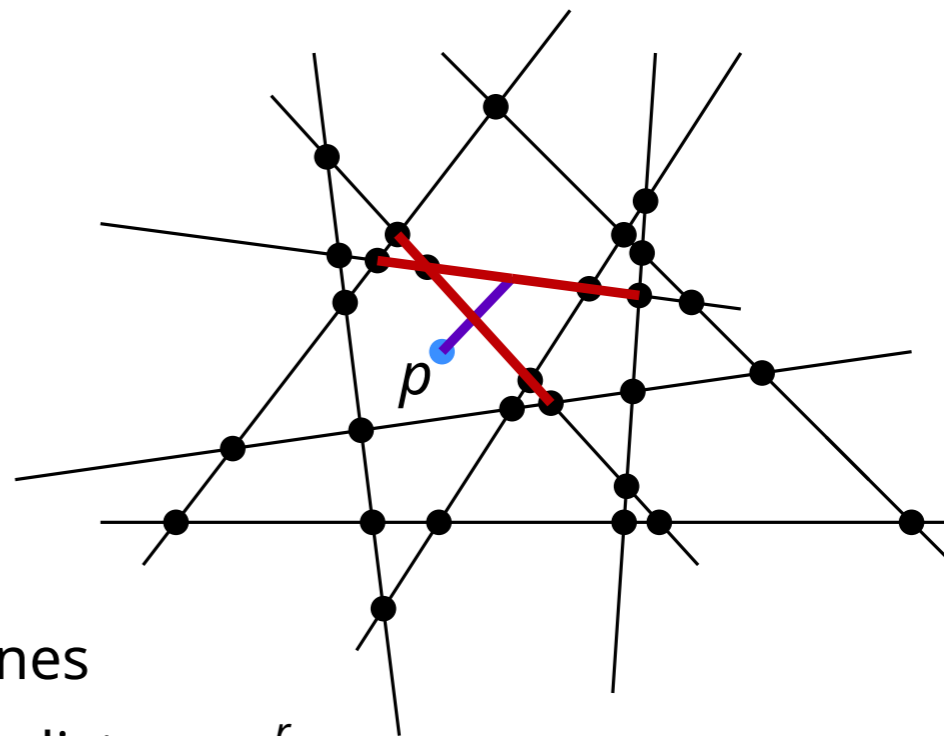
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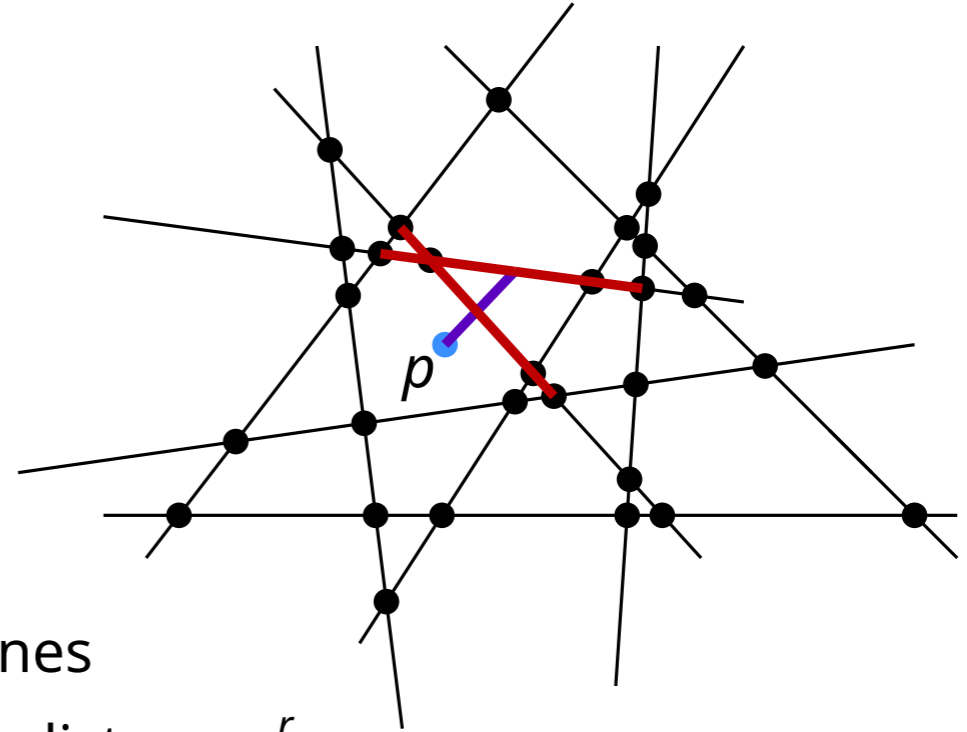
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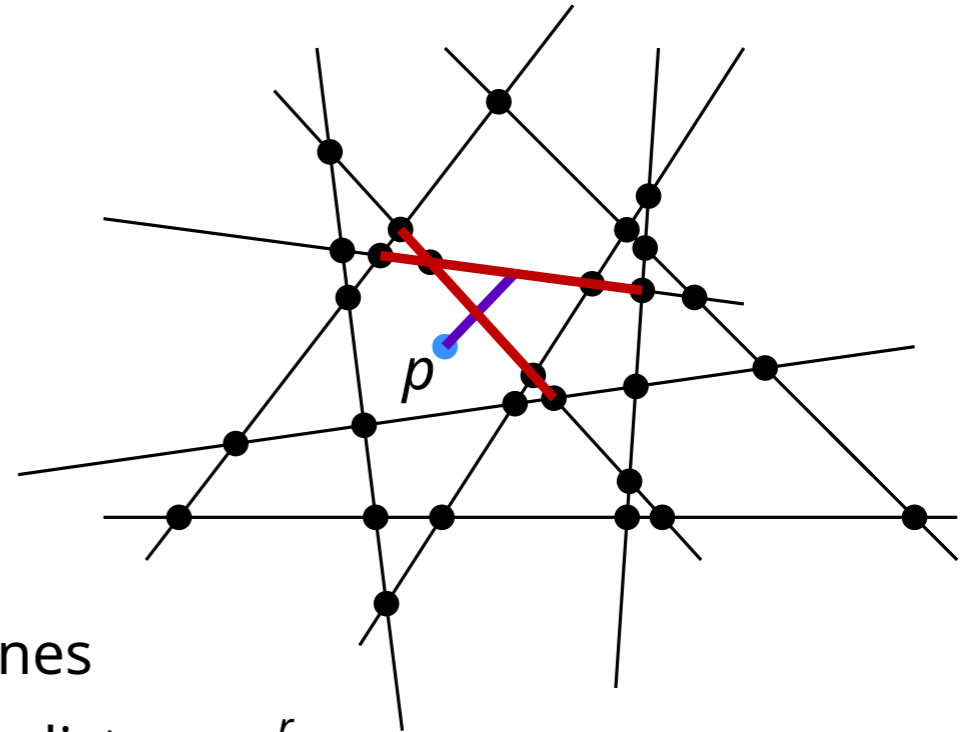
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At least $\frac{r}{2}$ are marked per line and each can be marked at most twice

$$|b_{\infty}(p, r)| \geq \frac{r}{2} \cdot \frac{r}{2} \cdot \frac{1}{2} = \frac{r^2}{8}$$



Proof

Given $P \subseteq \mathbb{R}^2$ and lines L in the plane with total weight W

Lemma. You can always find pq with $p, q \in P$ for which $w(pq) \leq \frac{cW}{\sqrt{n}}$

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Weights are integers, for all $\ell \in L$ replace it by $w(\ell)$ non-parallel lines

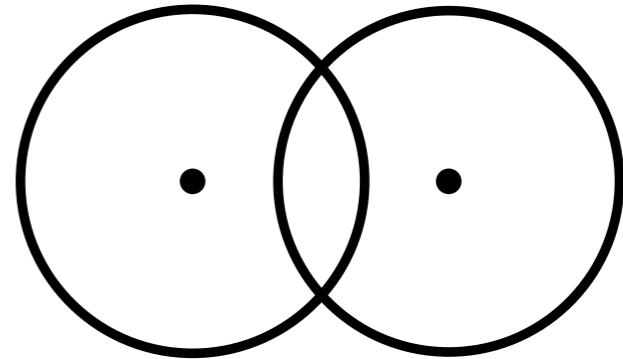
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Consider $X(r) = \bigcup_{p \in P} b_{\infty}(p, r)$



Proof

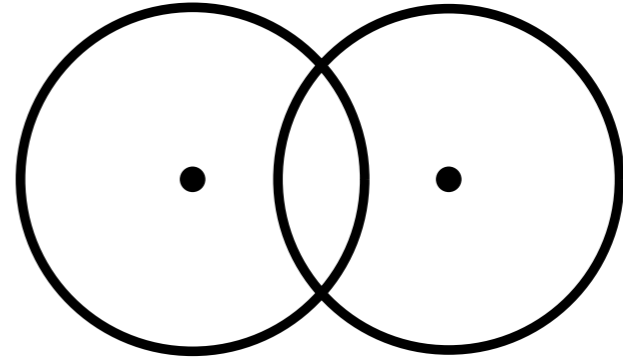
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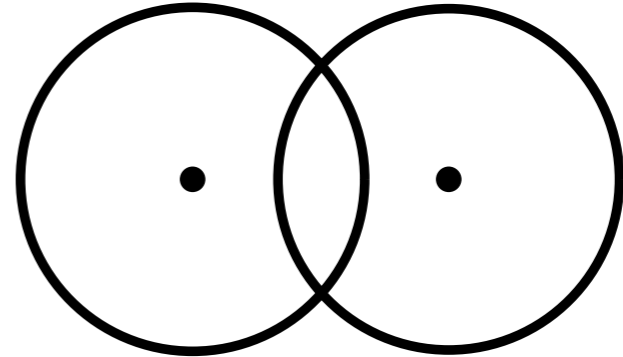
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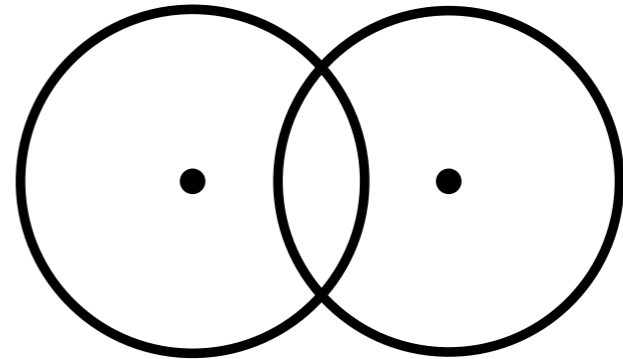
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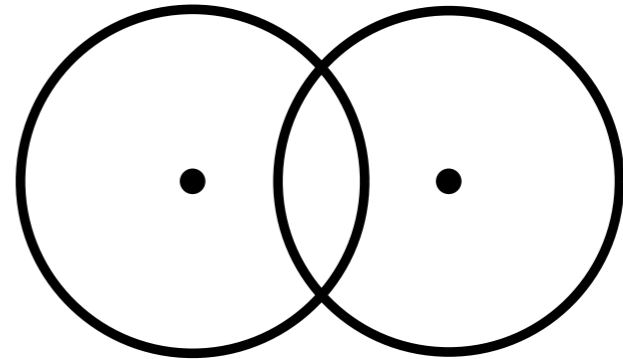
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Then exists $t \in \mathcal{A}(L)$ and two points $p, q \in P$ for which

$$d_{\infty}(p, q) \leq d_{\infty}(p, t) + d_{\infty}(t, q) \leq 2r \leq \frac{4W}{\sqrt{n}} + 3$$



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Hence $\#_{\prec}(l) = O(\sqrt{n})$

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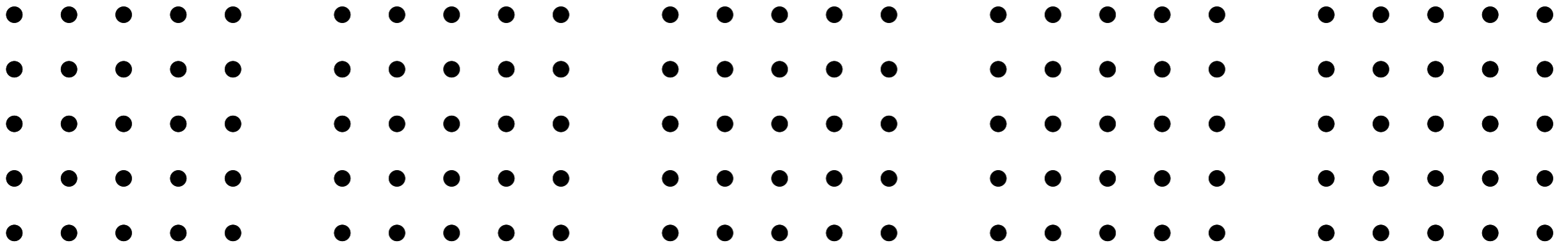
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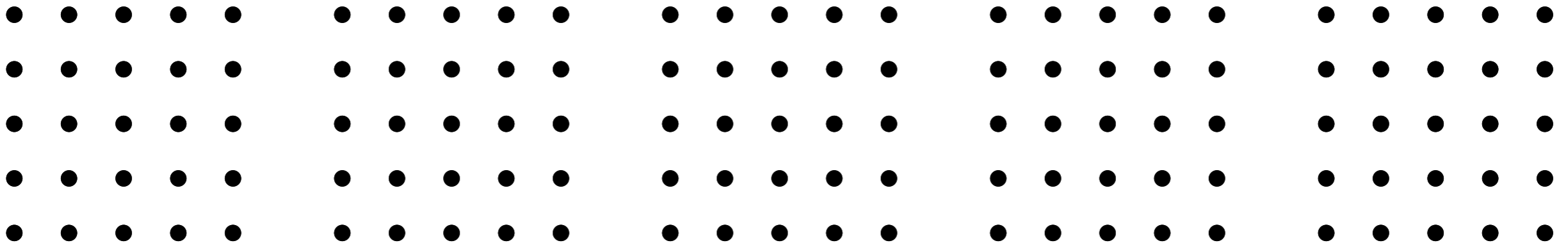
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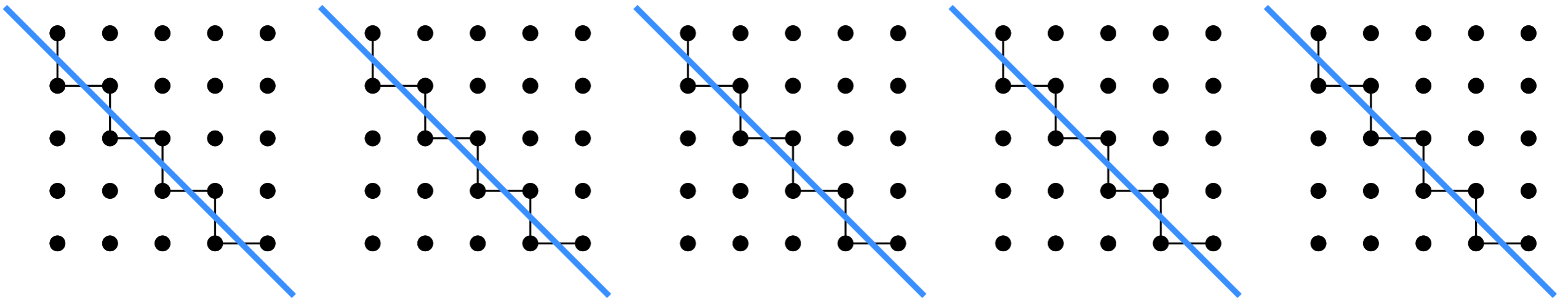
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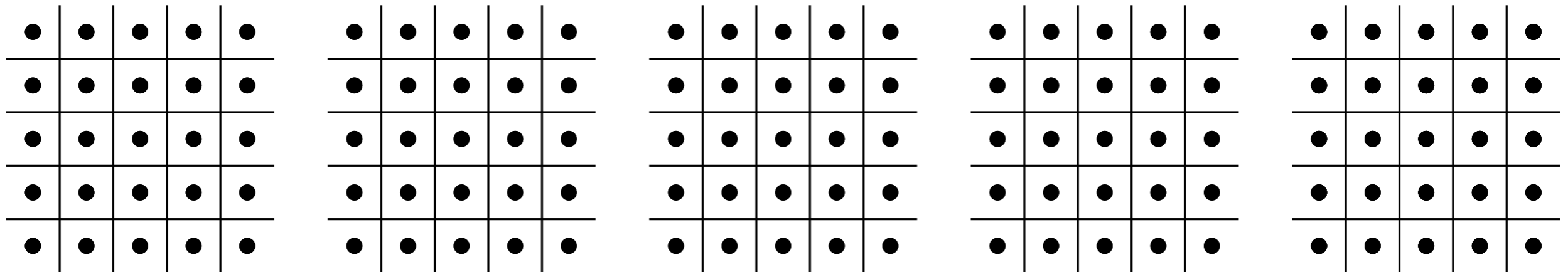
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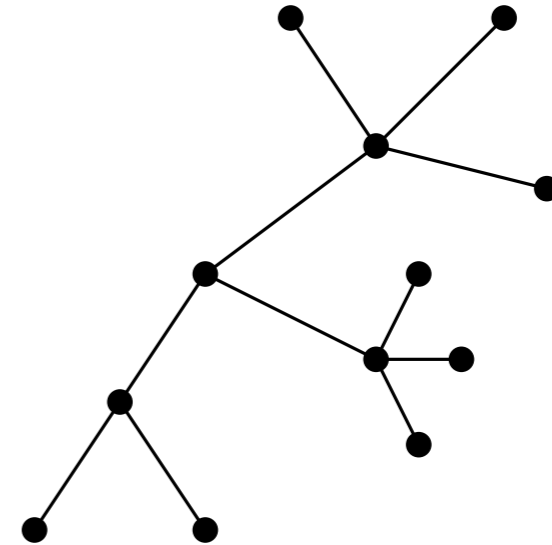
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back to perfect matchings, discrepancy, and ε -samples

Perfect Matching with Low Stabbing Number

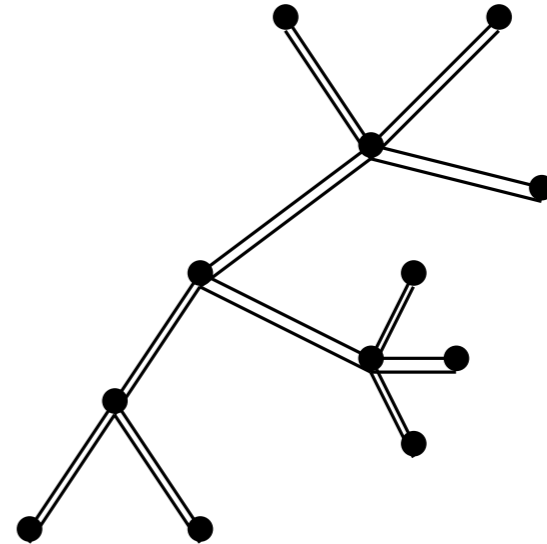
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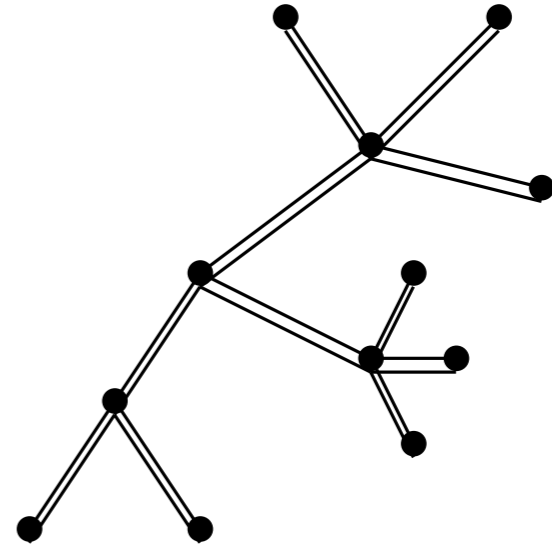


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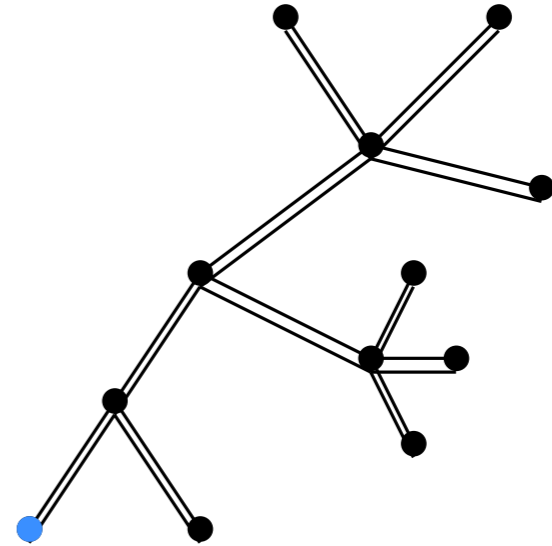


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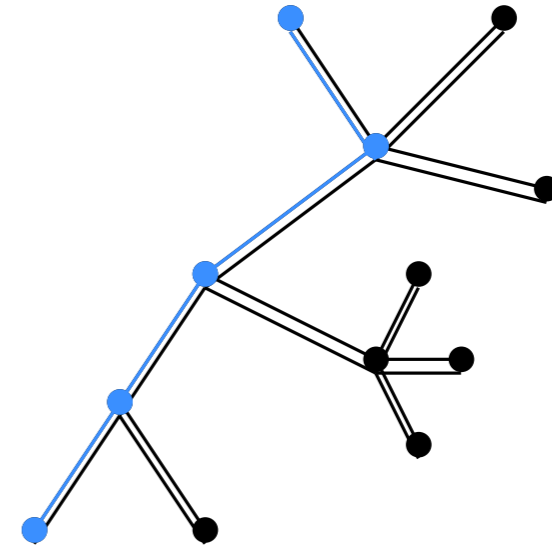


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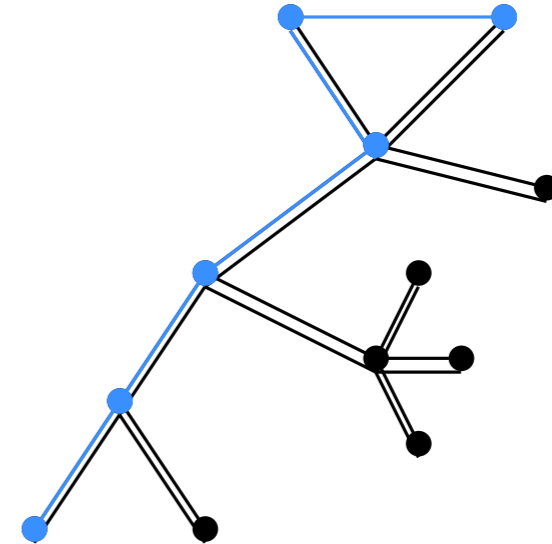


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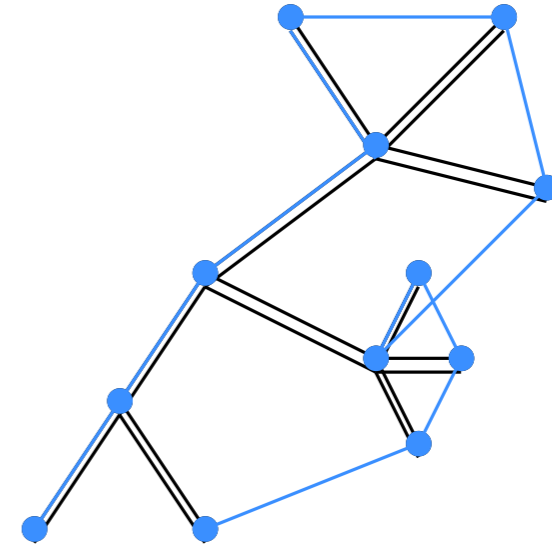


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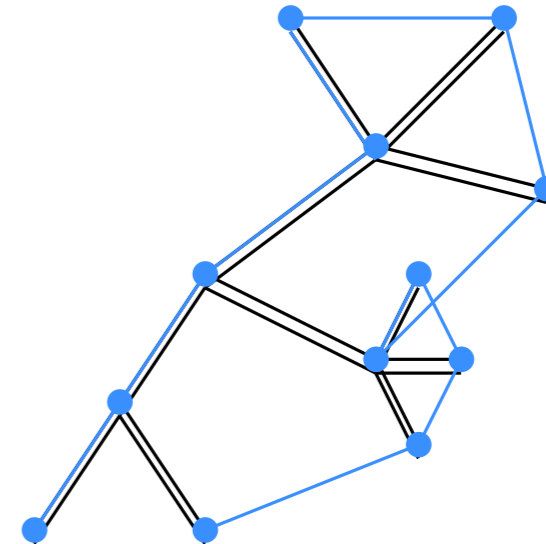
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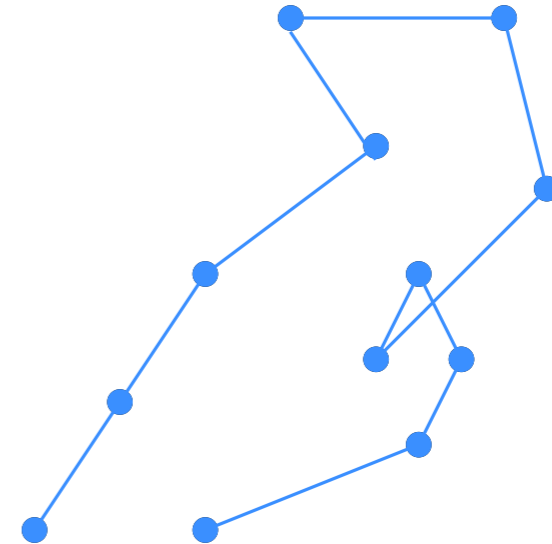
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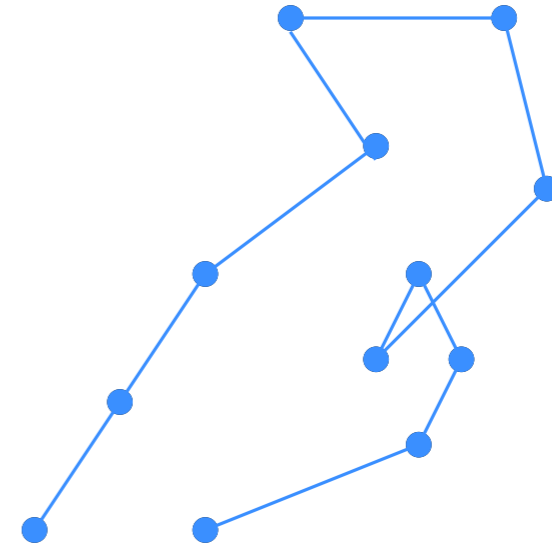


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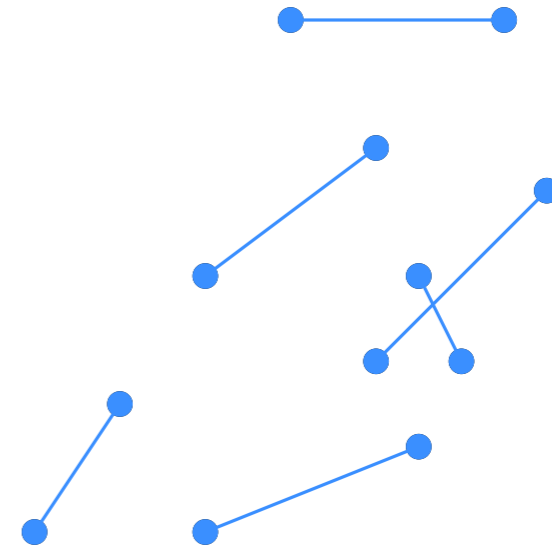
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This is smaller than our previous $O(1/\varepsilon^2)$!

Summary

We have seen

[discrepancy](#) (and there would be so much more too be said about discrepancy)

[\$\epsilon\$ -samples via discrepancy](#) (and we didn't even discuss how to use this for deterministic construction and/or ϵ -nets)

[low-discrepancy colorings via perfect matchings](#) (with low crossing number)

[spanning trees with low crossing number](#) (and therefore perfect matchings)

second application of [reweighing](#)

This was the last lecture about sampling.