

# **Faster minimum $k$ -cut of a simple graph**

**Jason Li**

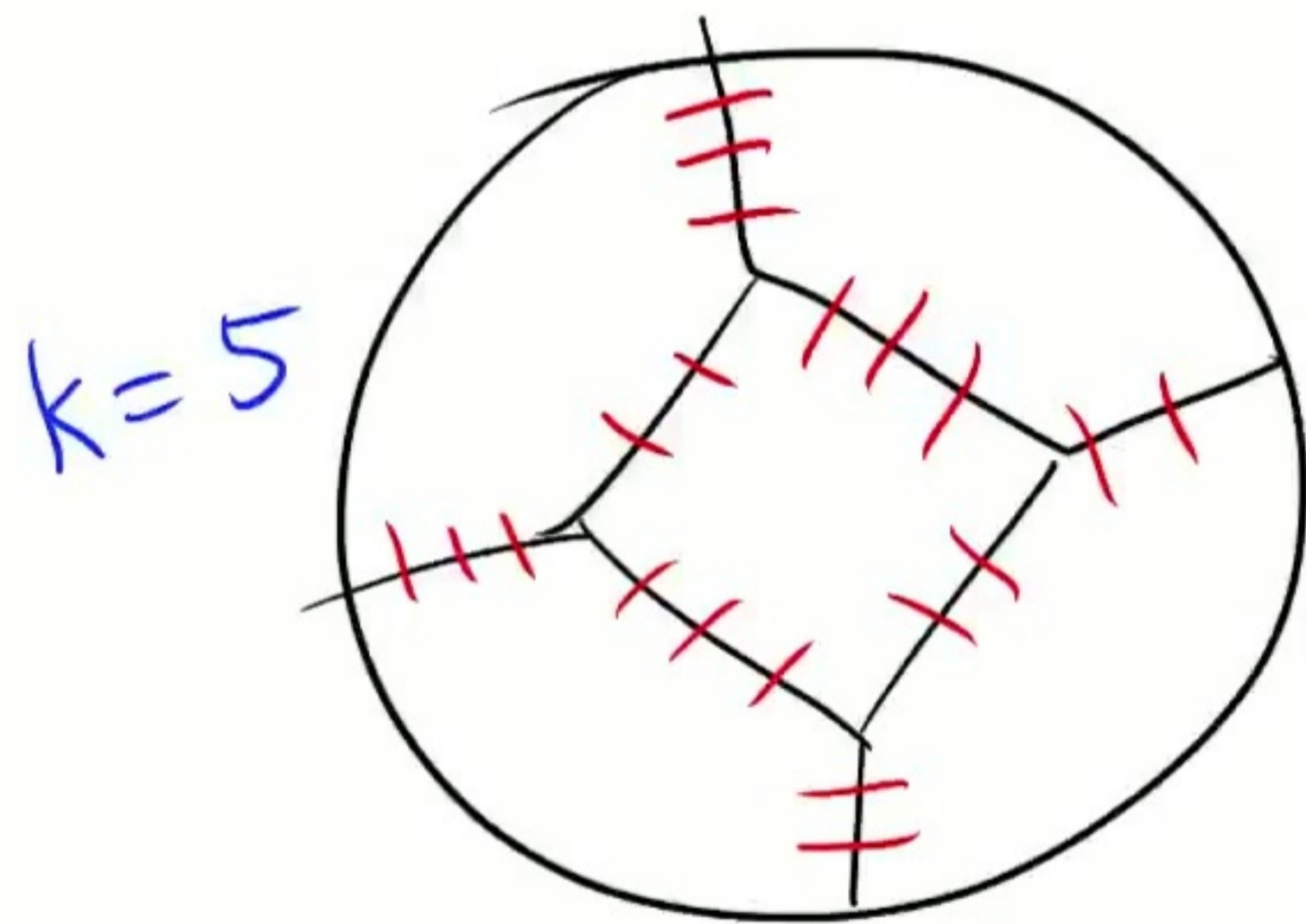
**STOC 2019**

**November 11, 2019**

# Introduction

minimum  $k$ -cut: delete min weight edges to cut graph into  $\geq k$  connected components

Setting: exact algorithm,  $k$  constant



# Prior Work

- Goldschmidt-Hochbaum 1994:  $O(n^{(1/2 - o(1))k^2})$  time deterministic
- Karger-Stein 1994:  $\tilde{O}(n^{2(k-1)})$  time randomized
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- Same authors, 2018:  $O_k(n^{(2w/3 + o(1))k})$  time deterministic,  
integer weights  $\leq n^{o(1)}$
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for simple graphs  
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 $\Omega(n^{(1 - o(1))k})$  time combinatorial

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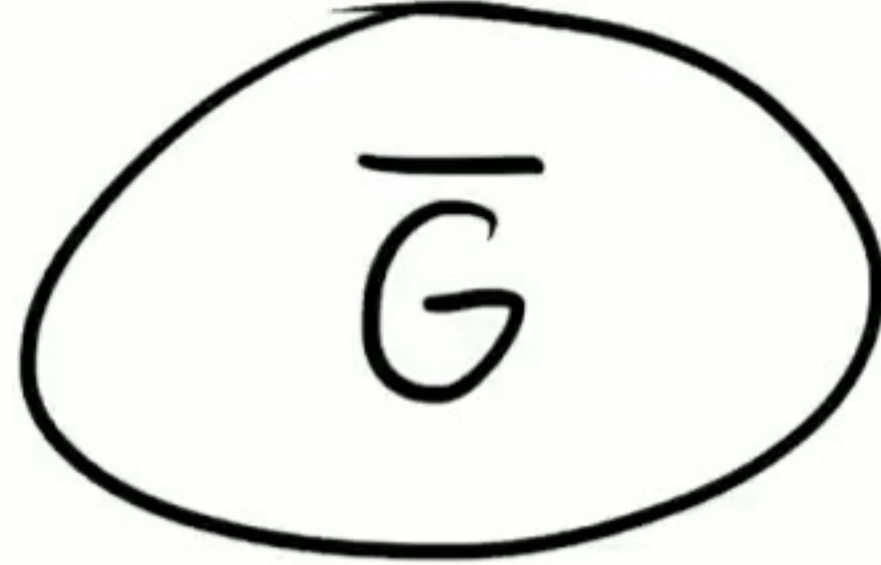
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# Algorithm Outline

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min k-cut =  $\lambda_k$



**Kawarabayashi-Thorup  
Sparsification**

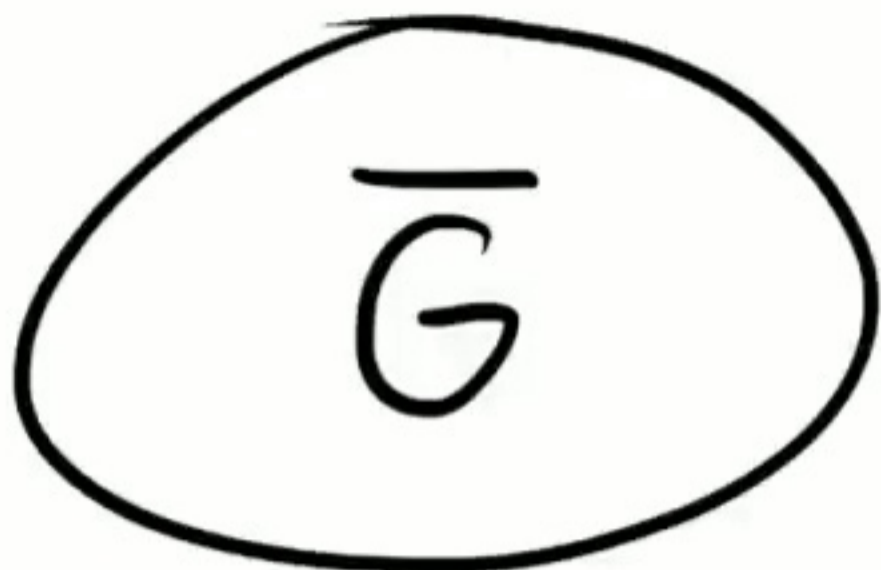
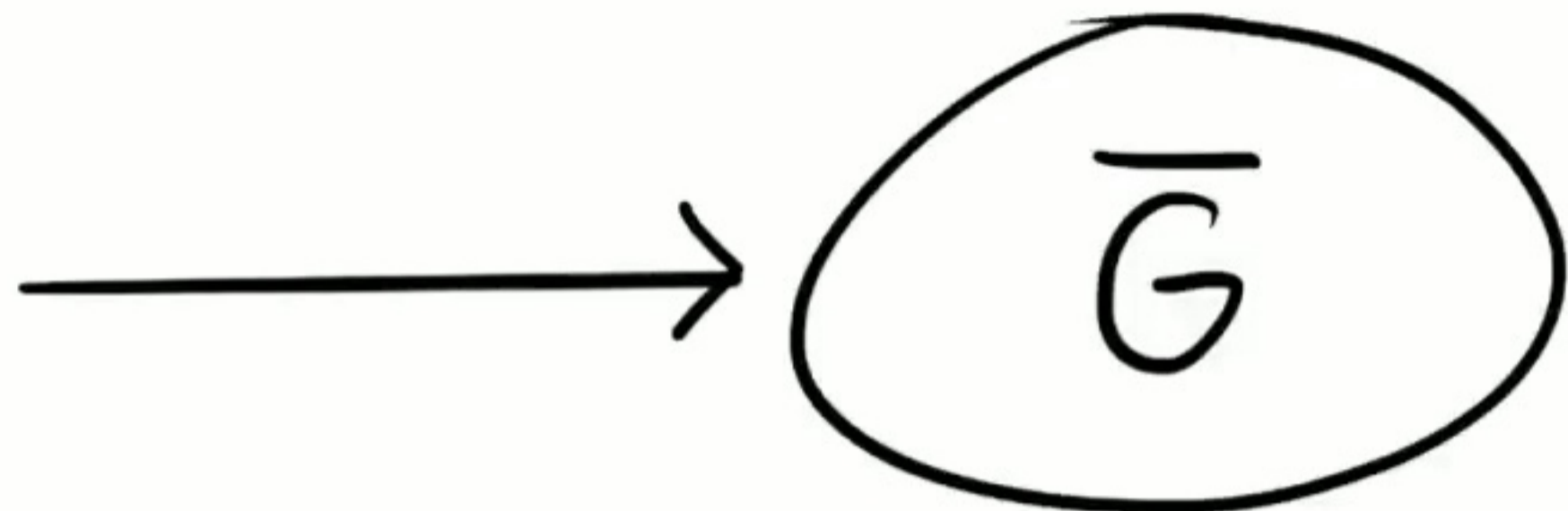
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- **Preserves min k-cut**  
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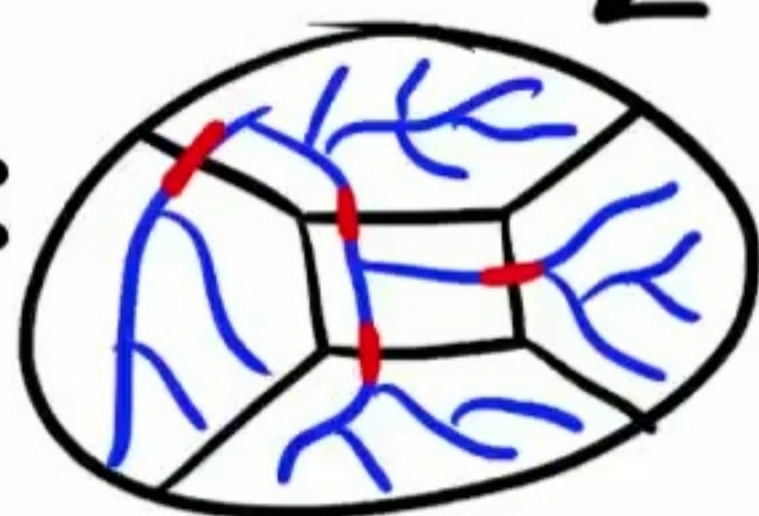
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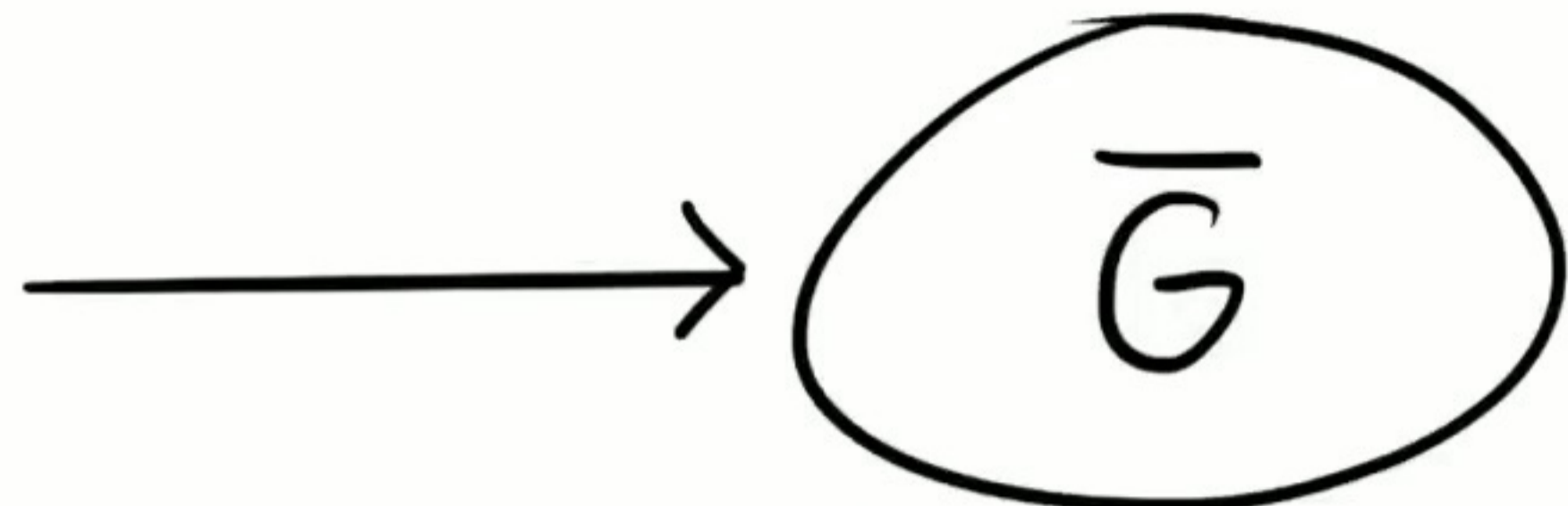
Tree packing:  
 $\bar{n}^k$  trees s.t.  
exists a tree  
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OPT  $k-1$  times



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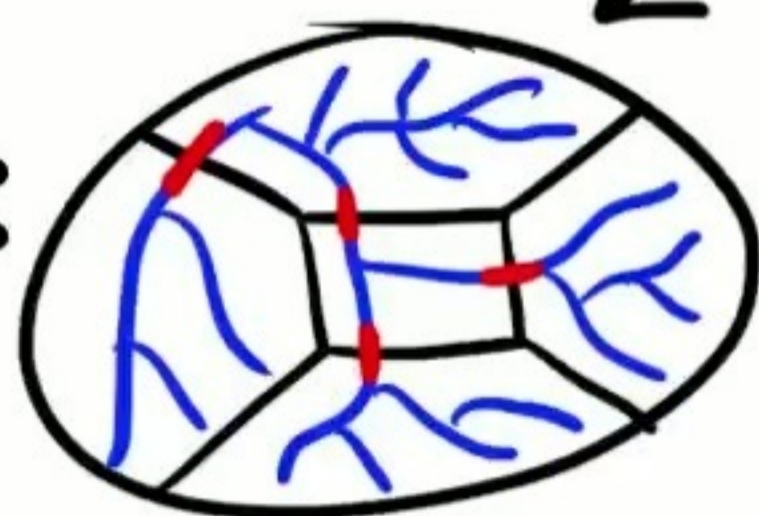
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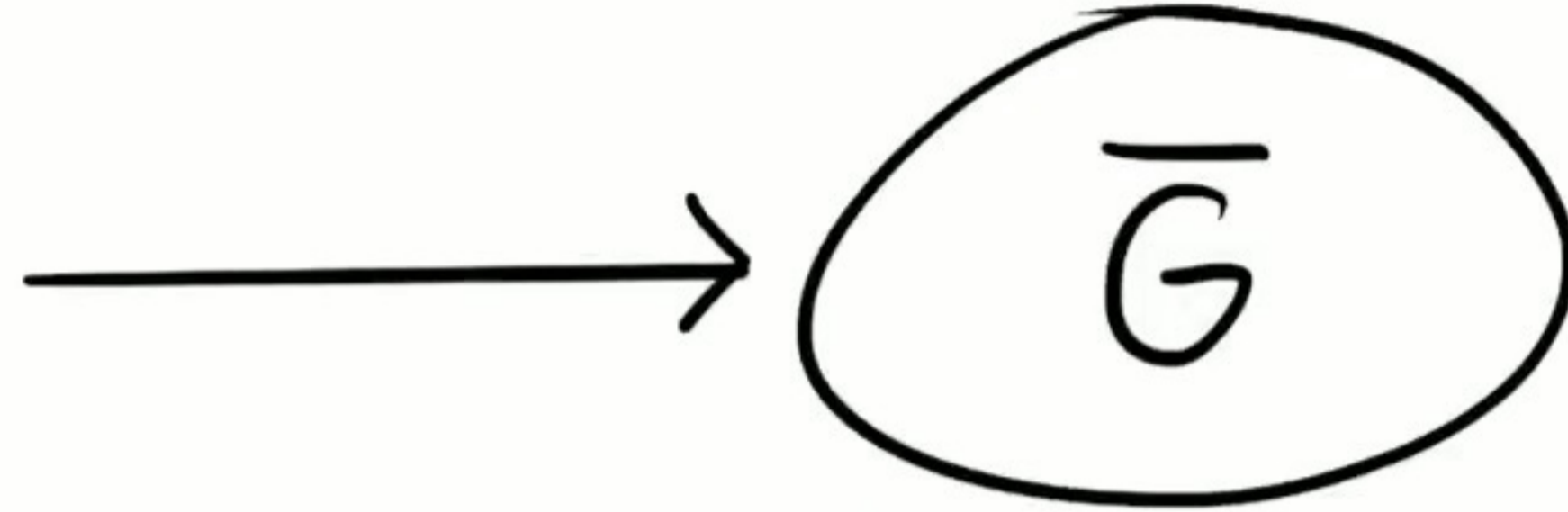
Solve tree problem:  
cut best k-1 edges

- color-coding (this talk)
- heavy-light decomposition
- $\lambda_k^k \bar{n}^{o(k)}$  time

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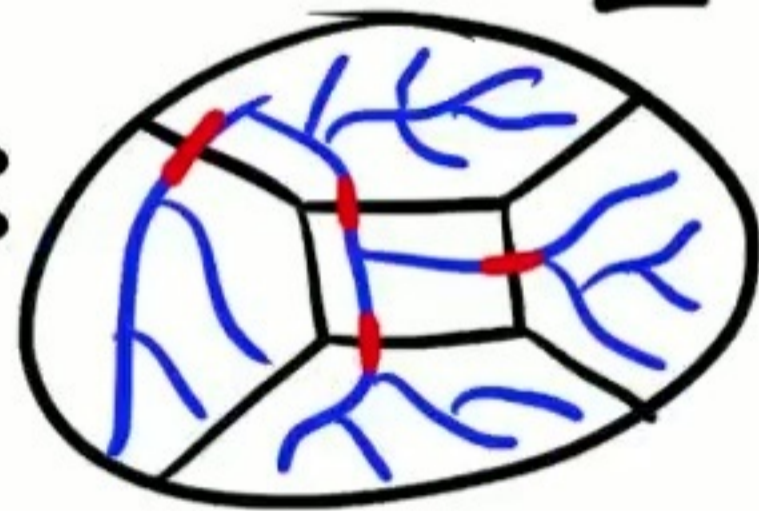
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$$\left(\frac{n}{\lambda_k}\right)^k \lambda_k^k n^{o(k)} = n^{(1+o(1))k} \text{ time}$$

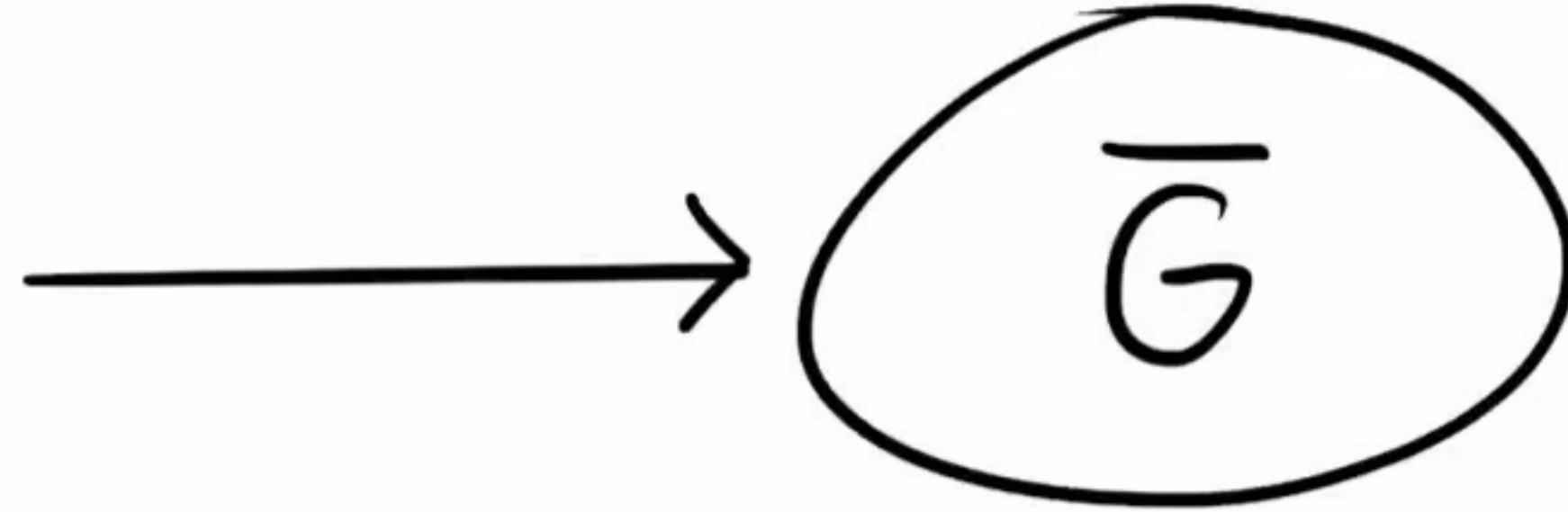
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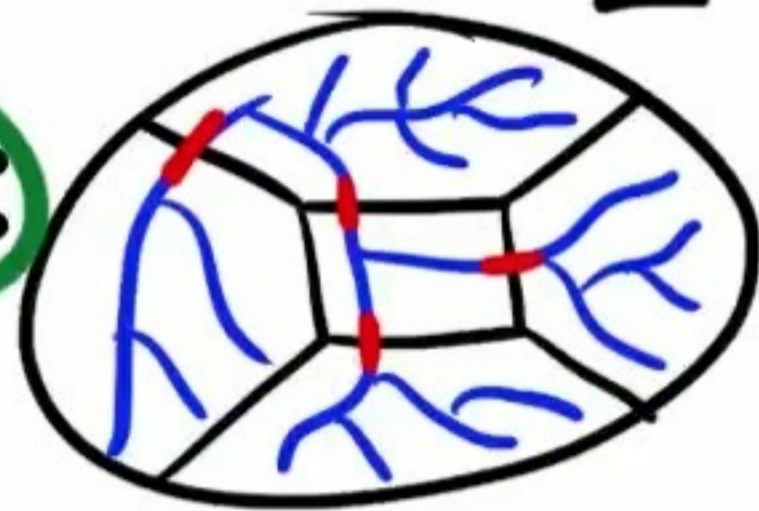
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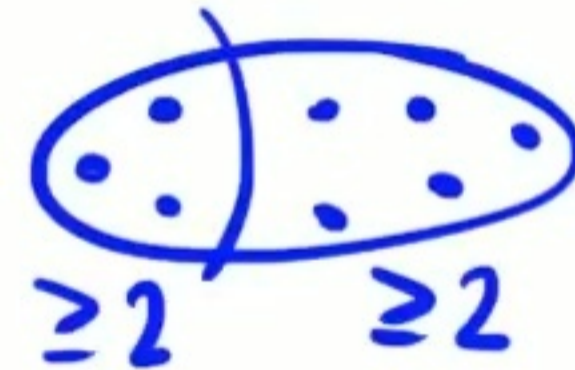
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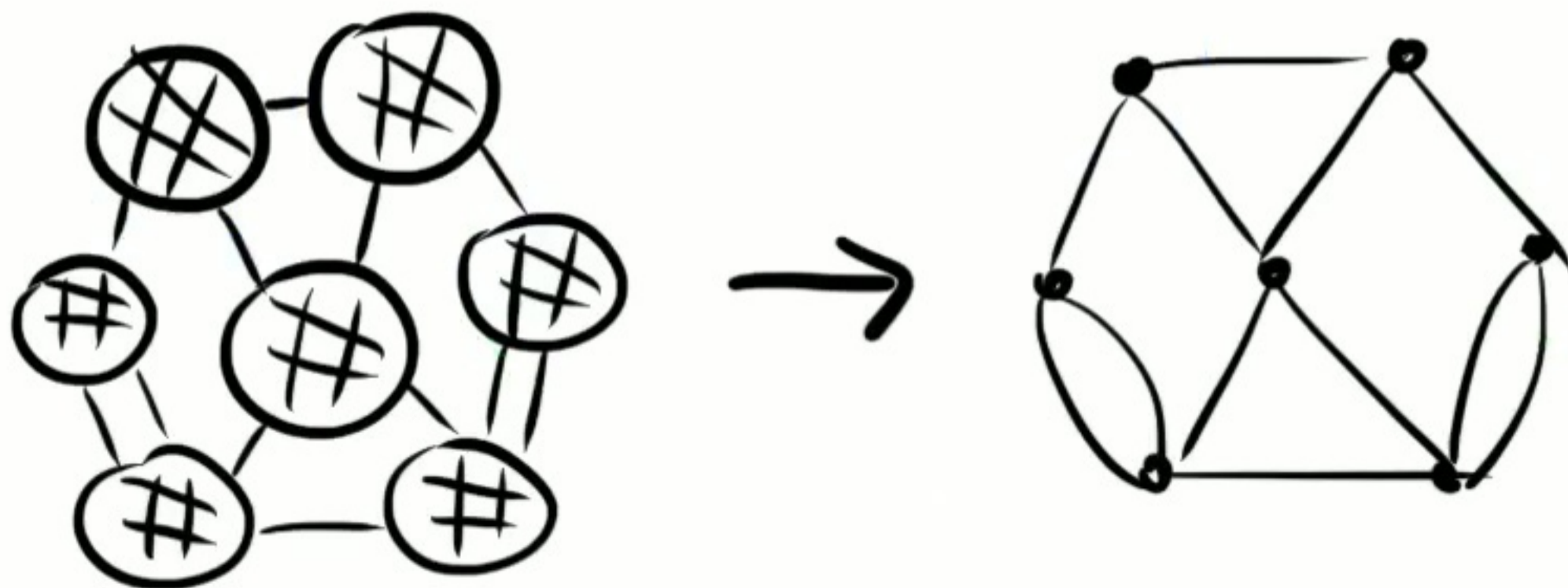
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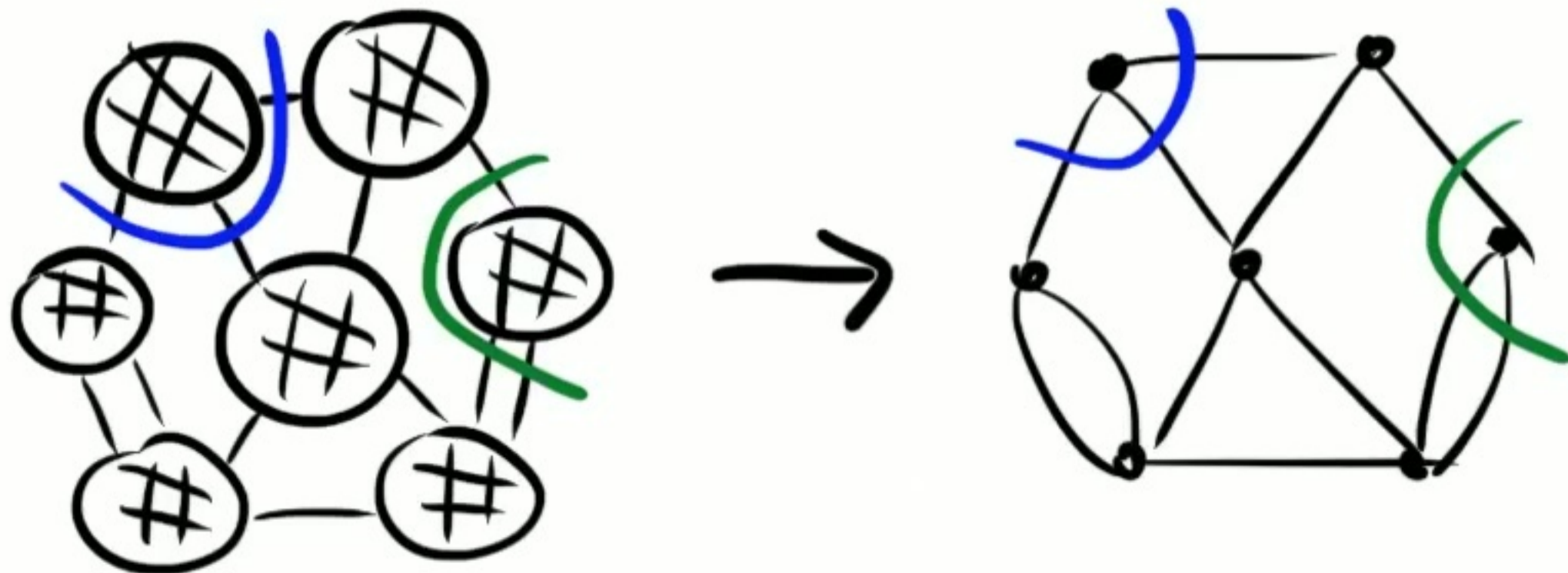
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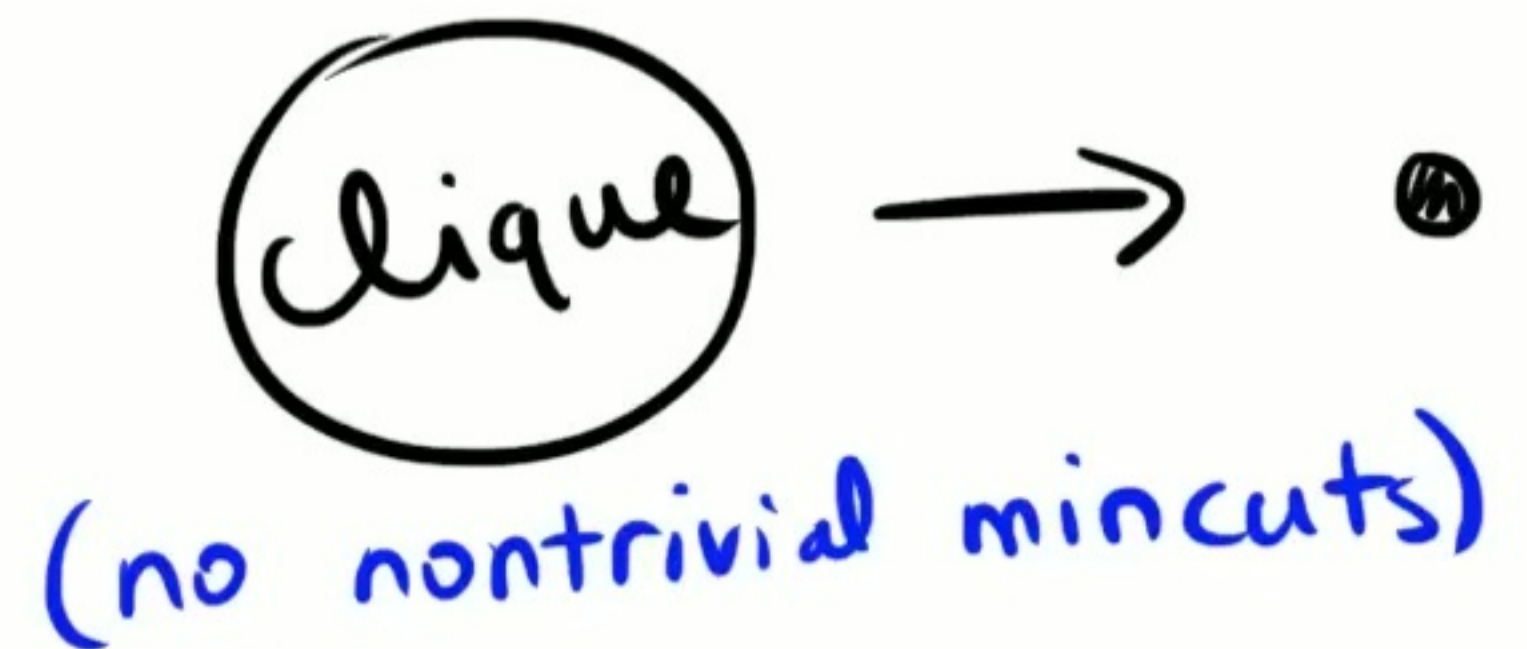
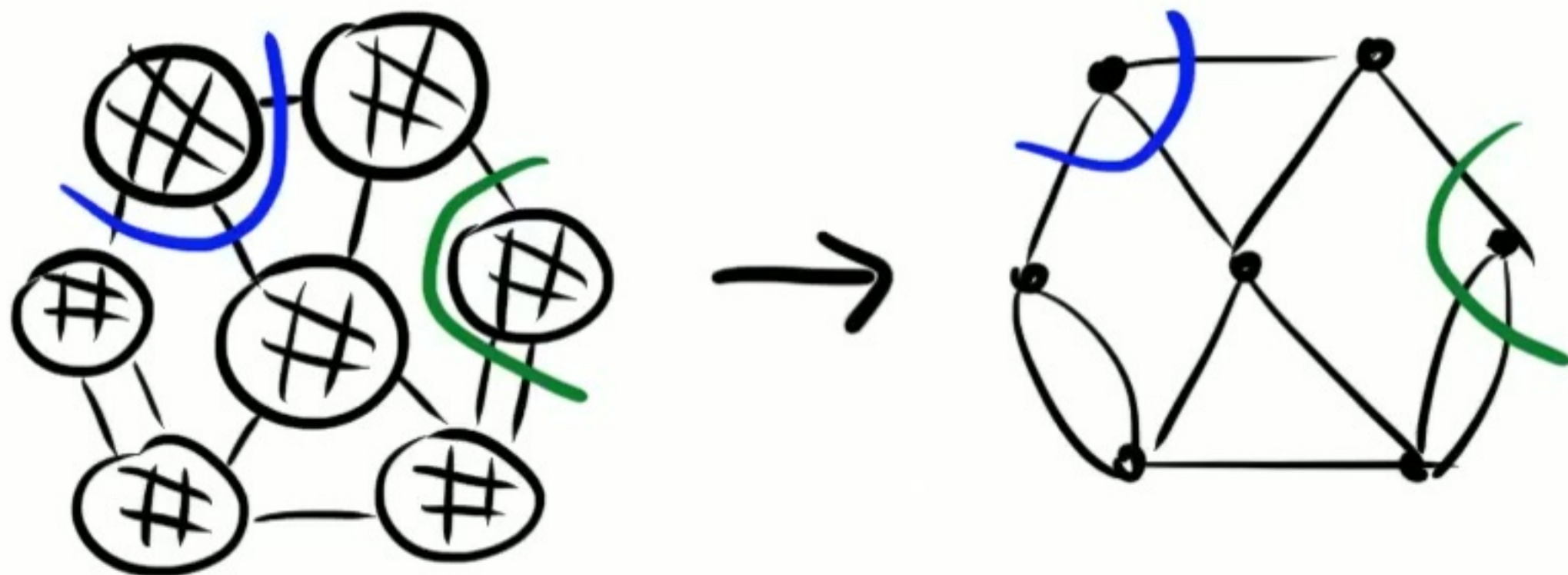
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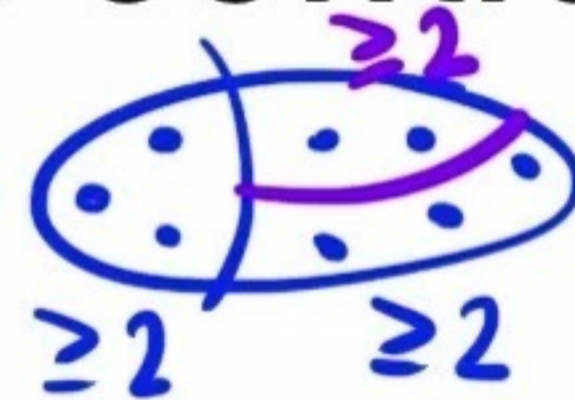
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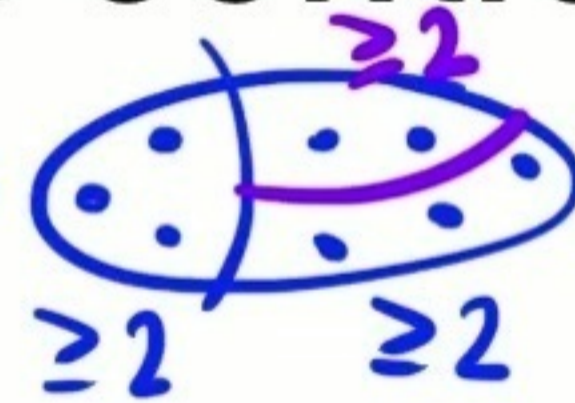
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Trivial min  $k$ -cuts easy (guess one vertex and recurse)

# Solving on Sparsified Graph

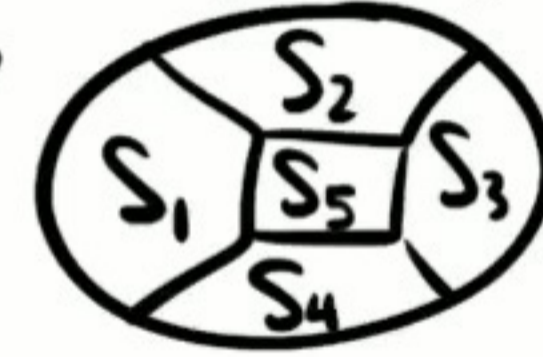
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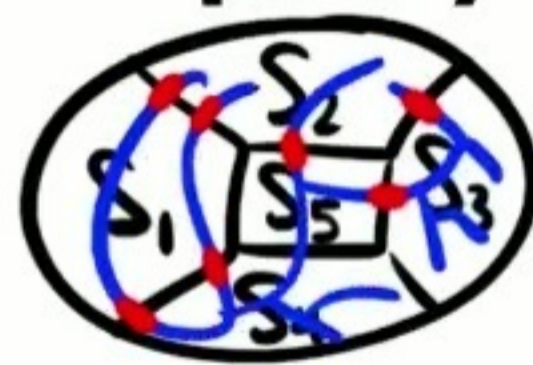


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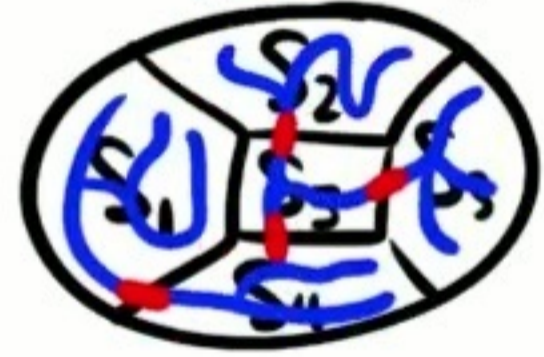


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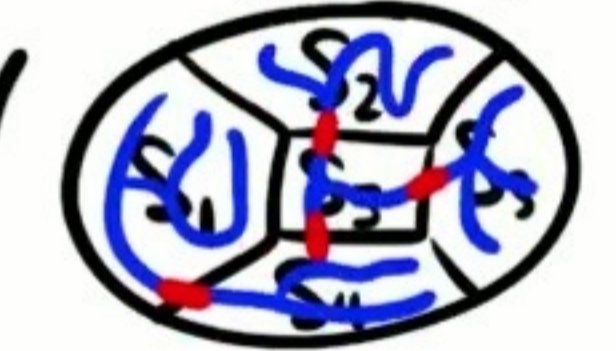


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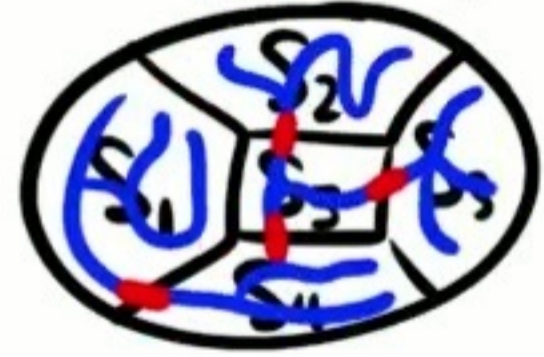
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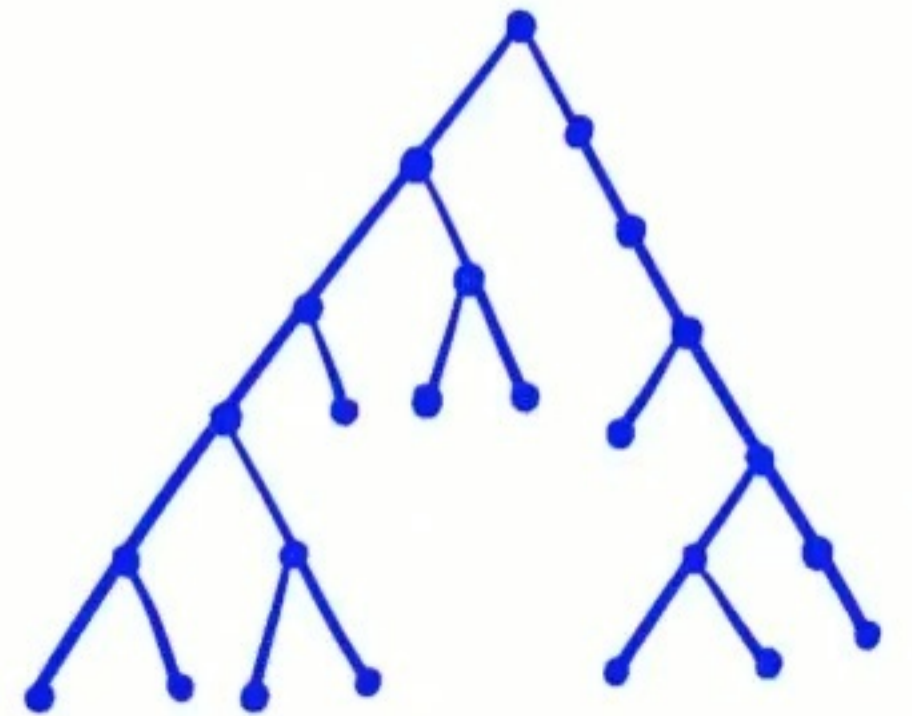
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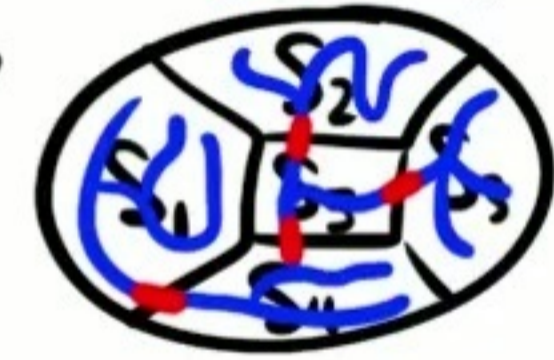


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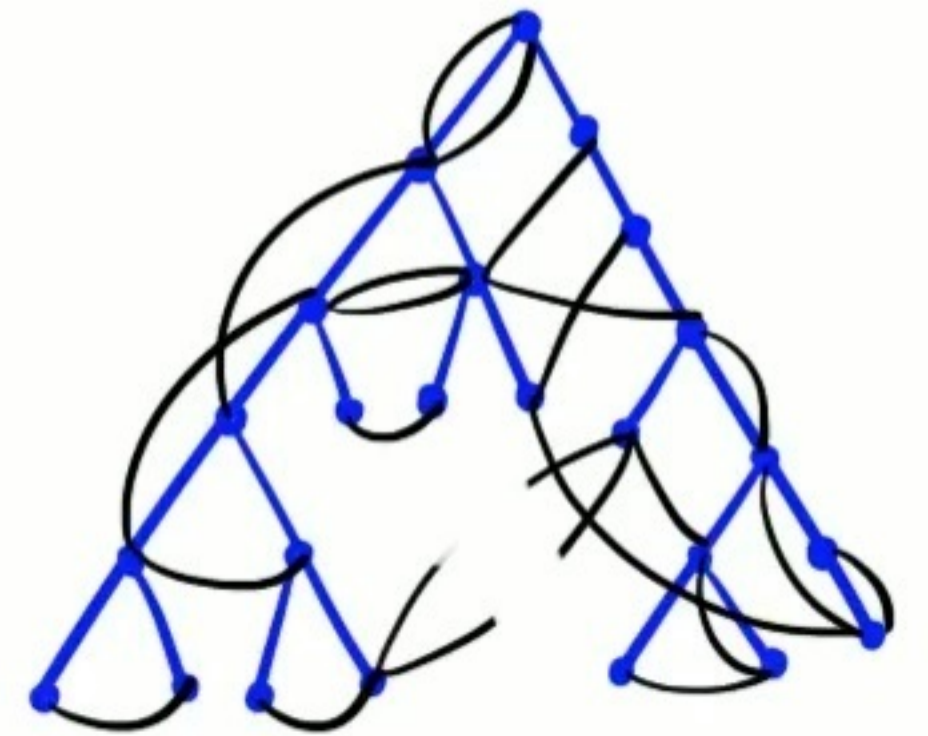
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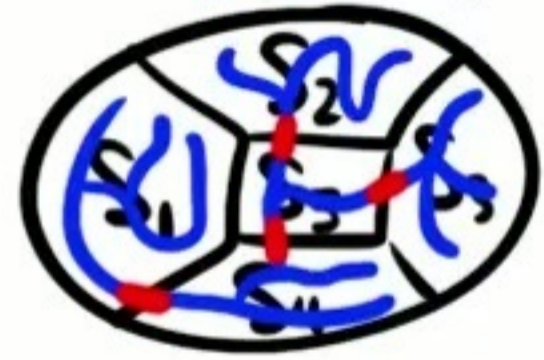


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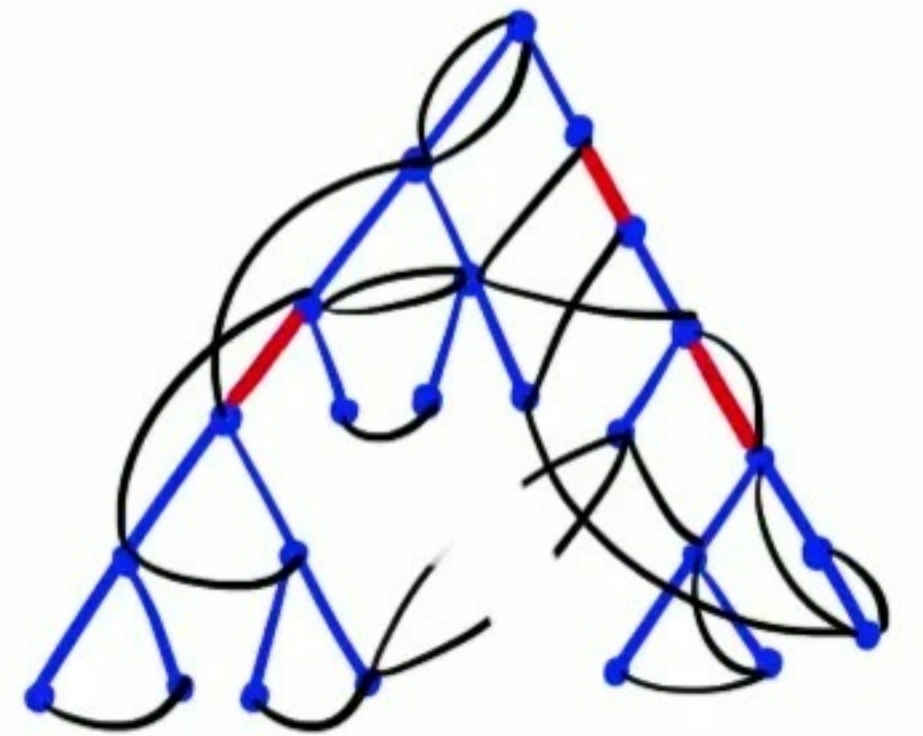
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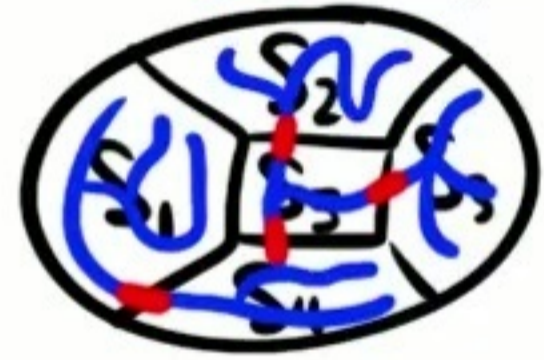


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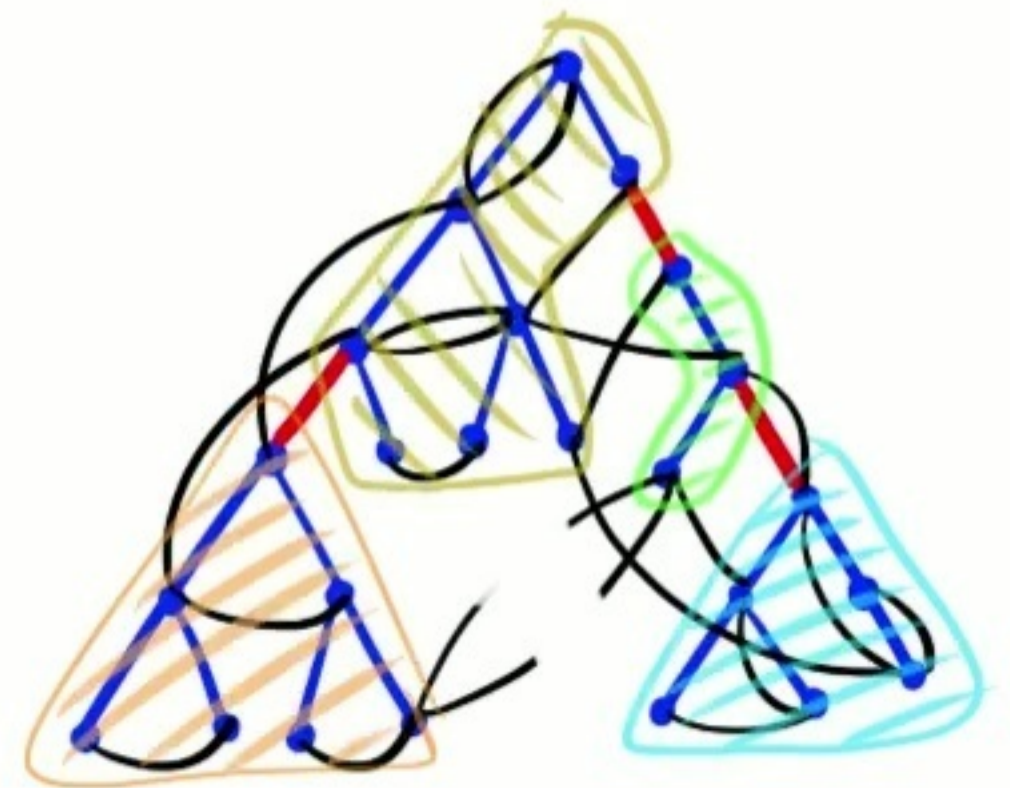
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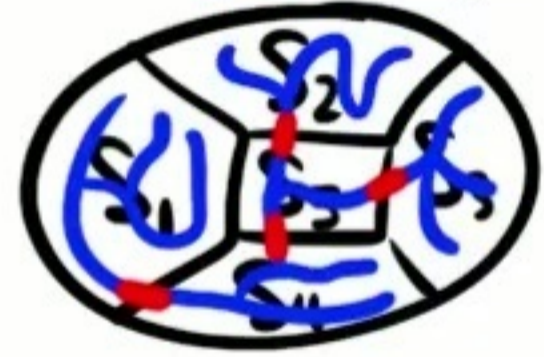


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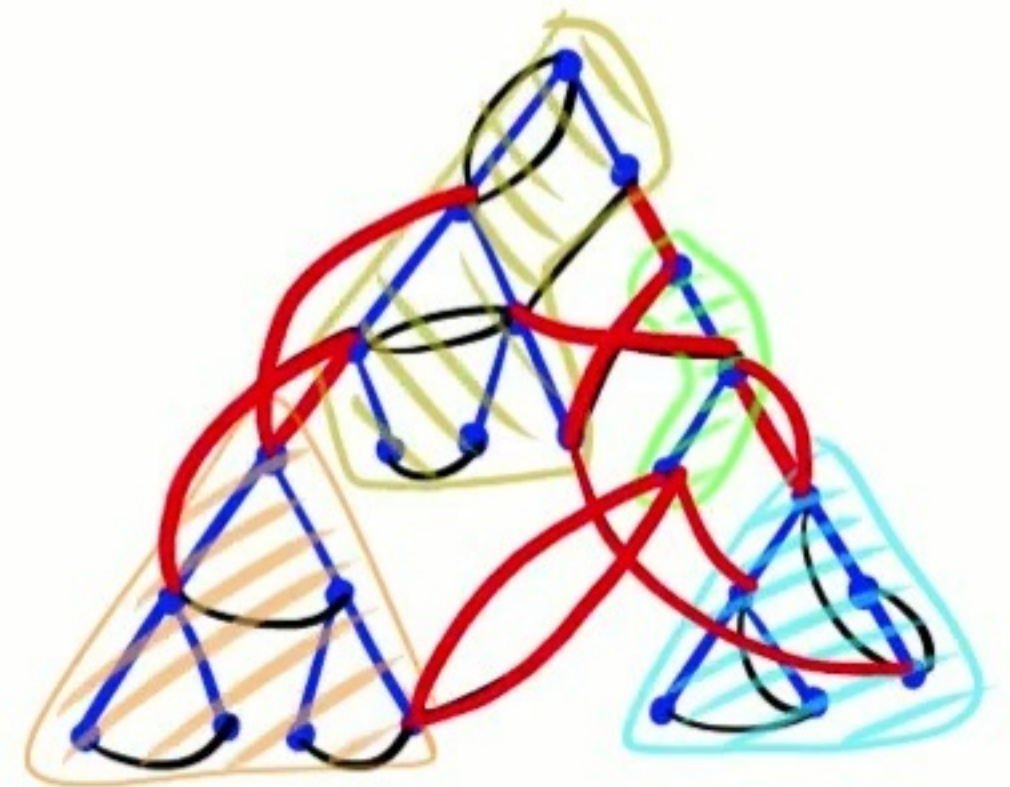
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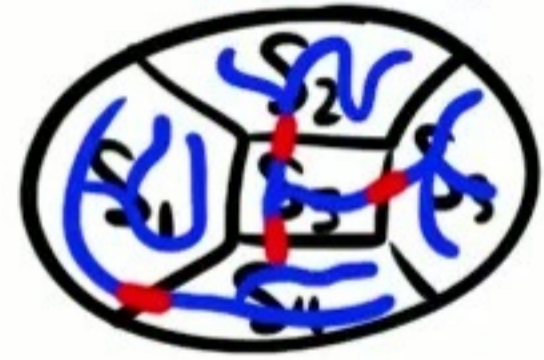


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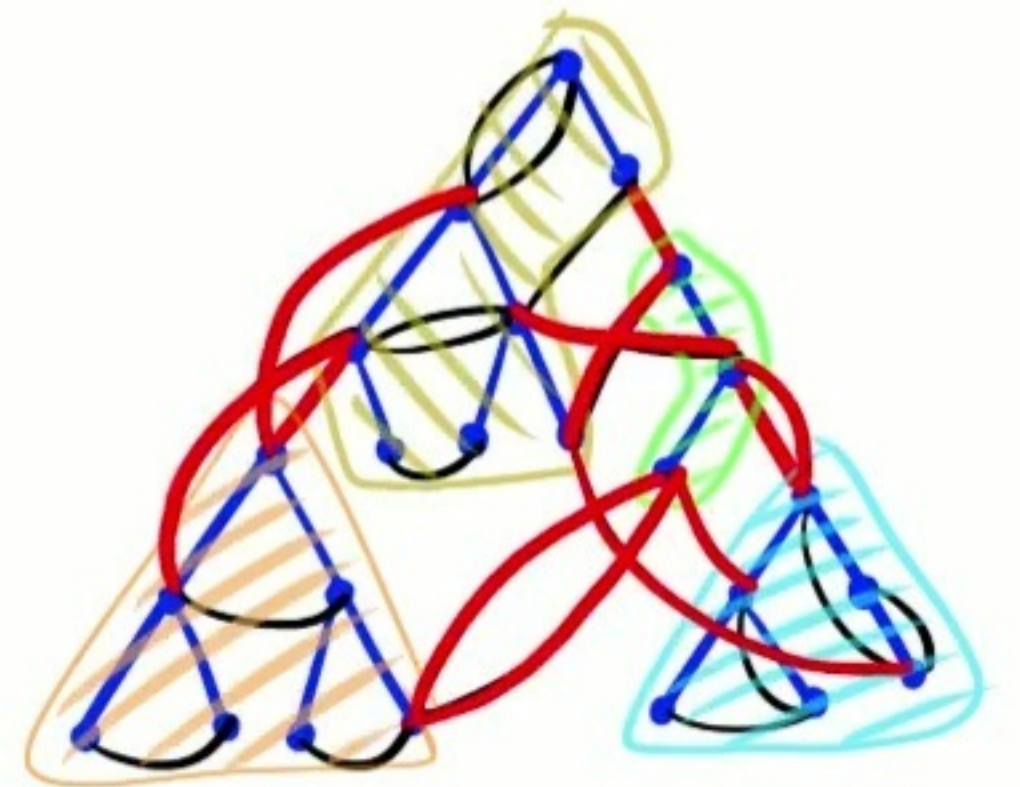
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Time  $\tilde{O}(\lambda_k^k n^{o(k)})$



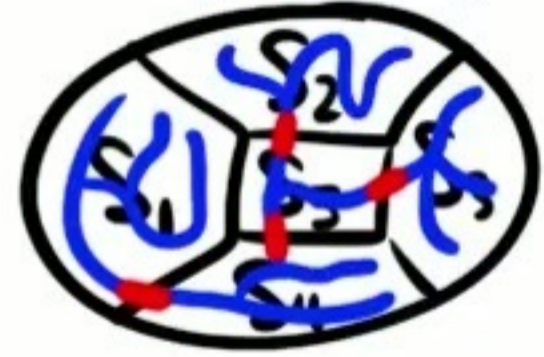


# Solving on Sparsified Graph

Goal: solve in time  $\lambda^k n^{k+o(k)}$

Tree Packing [Thorup]: [GLL'18]:

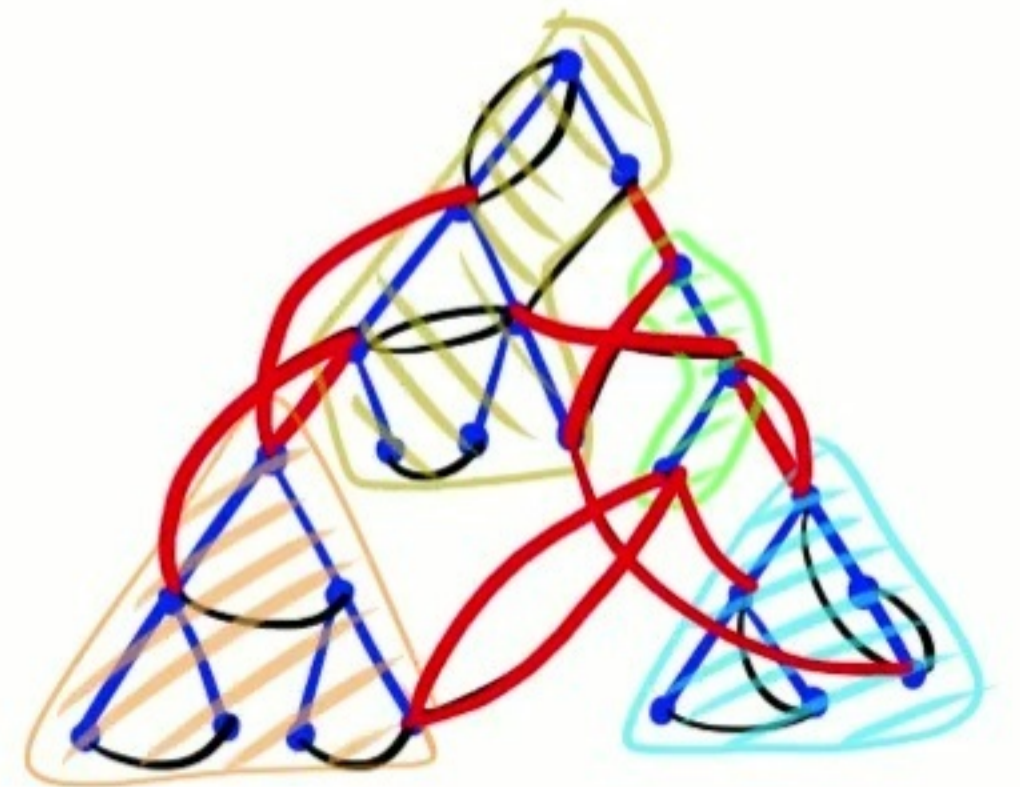
Given weighted graph, exists collection  $\mathcal{T}$  of  $\text{poly}(n)$  spanning trees of  $G$  s.t. for any min  $k$ -cut  $S_1, S_2, \dots, S_k \subseteq V$  exists tree  $T \in \mathcal{T}$  s.t.  $|E_T[S_1, S_2, \dots, S_k]| \leq \frac{2k-2}{k-1}$



Suffices to solve problem: given (tight) tree  $T$ , delete best  $k-1$  edges to form smallest  $k$ -cut

Time  $\tilde{O}(\lambda_k^k n^{o(k)})$

$\lambda_k^k$  is FPT in  $\lambda_k$  and  $k$ ,  
but particular dependency matters!



## Restricted Problem to Solve

given (tight) tree  $T$ , delete best  $k-1$  edges to form smallest  $k$ -cut

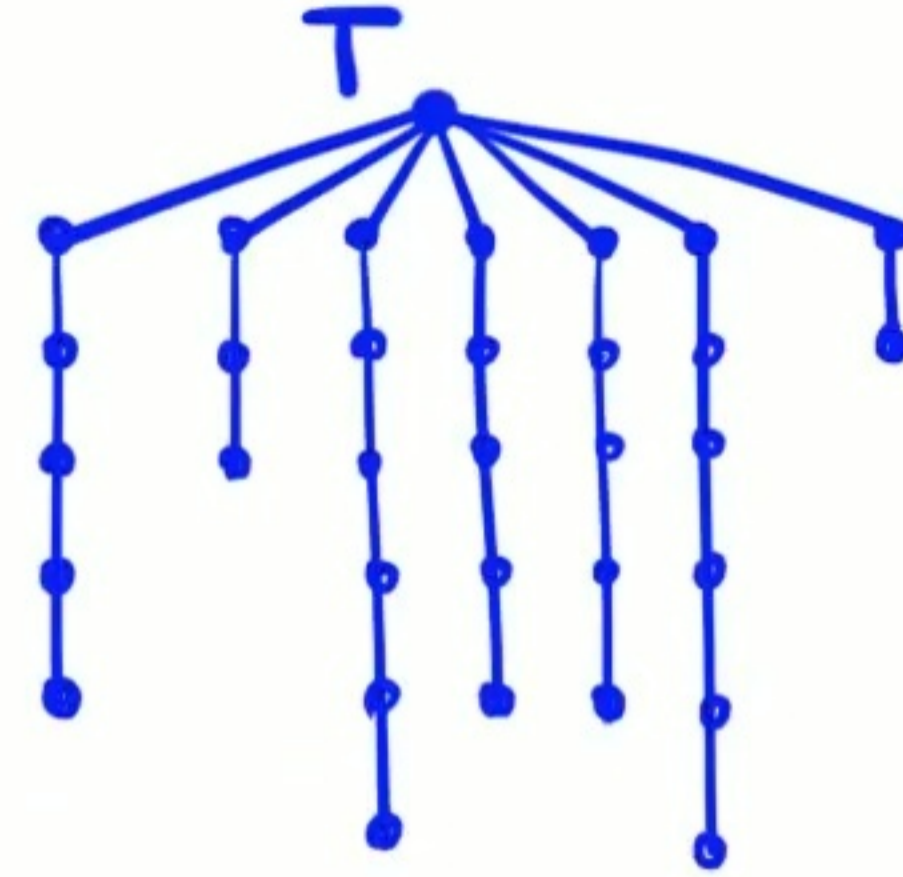
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This talk: when  $T$  is a "spider"



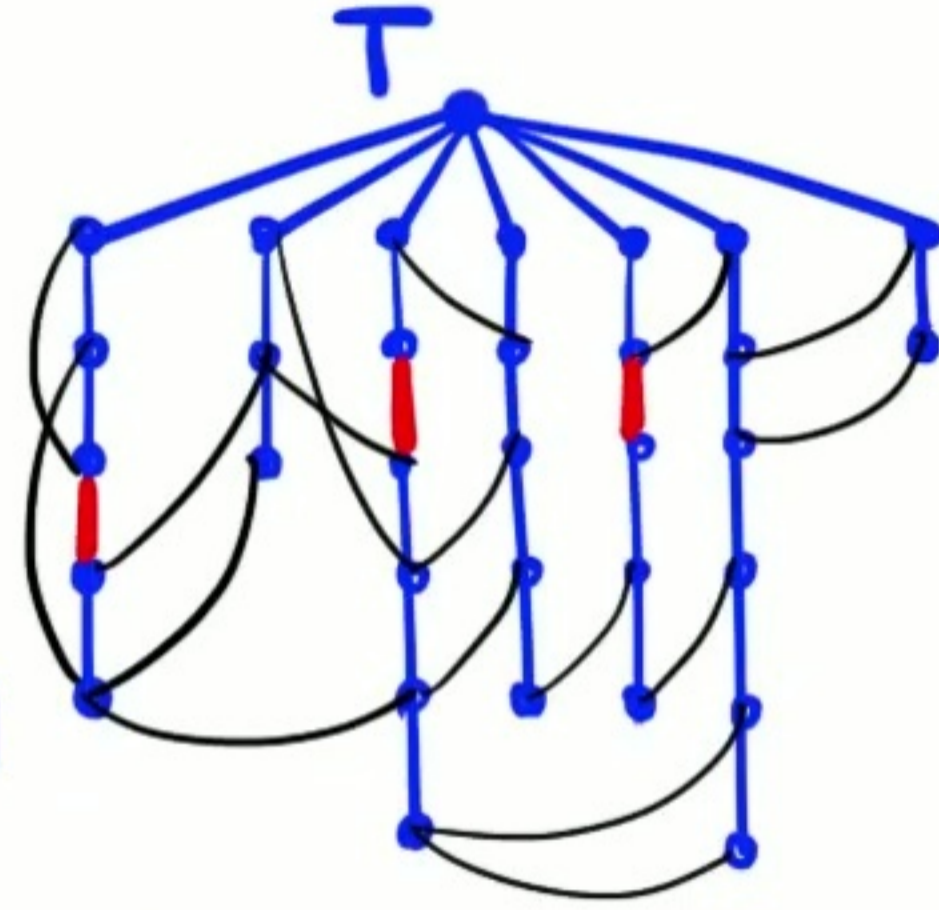
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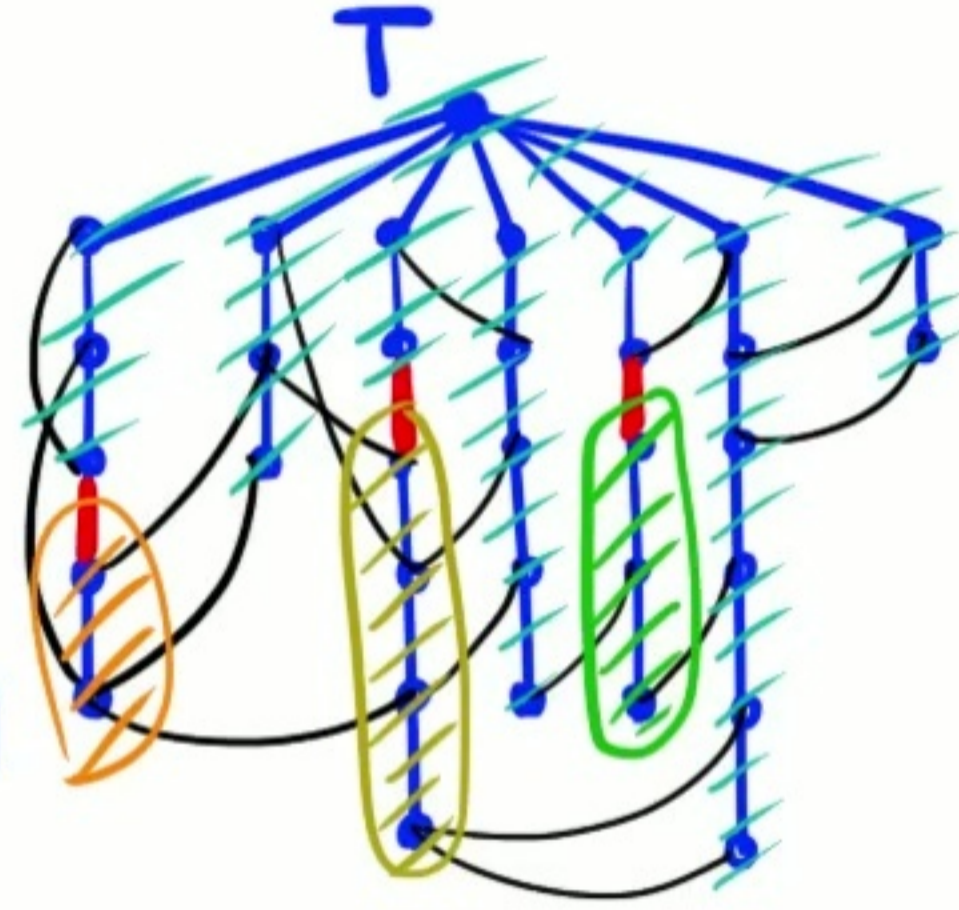
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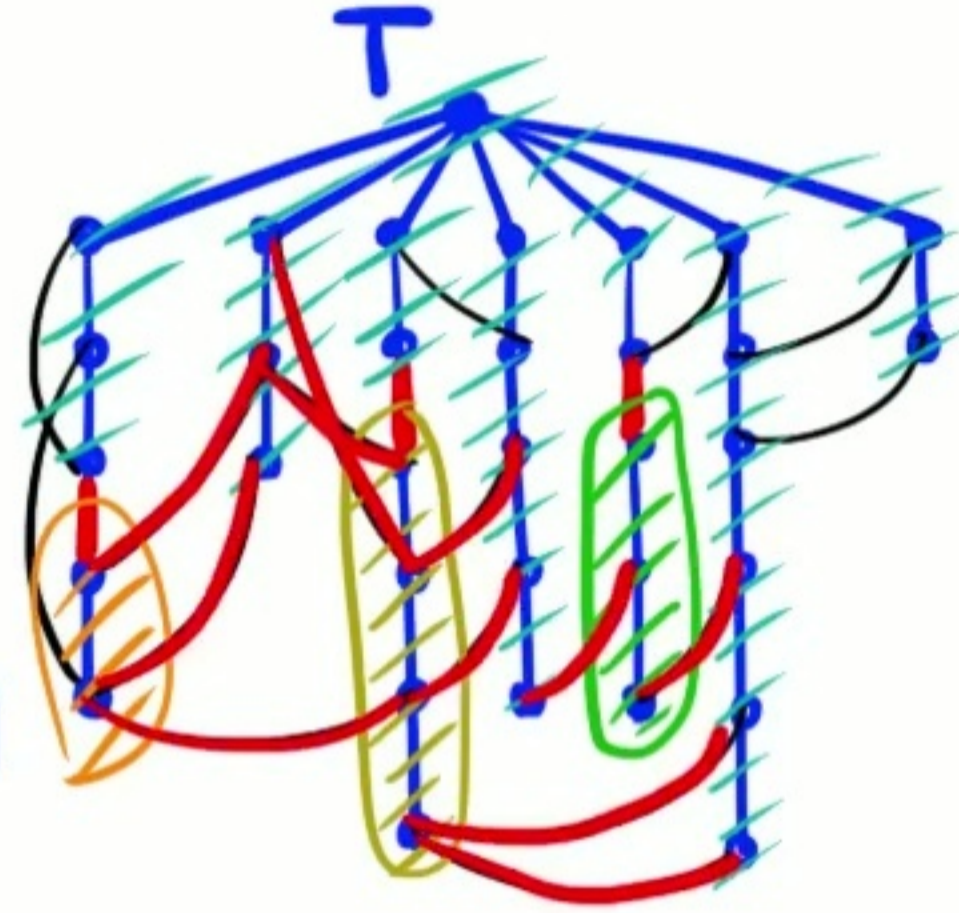
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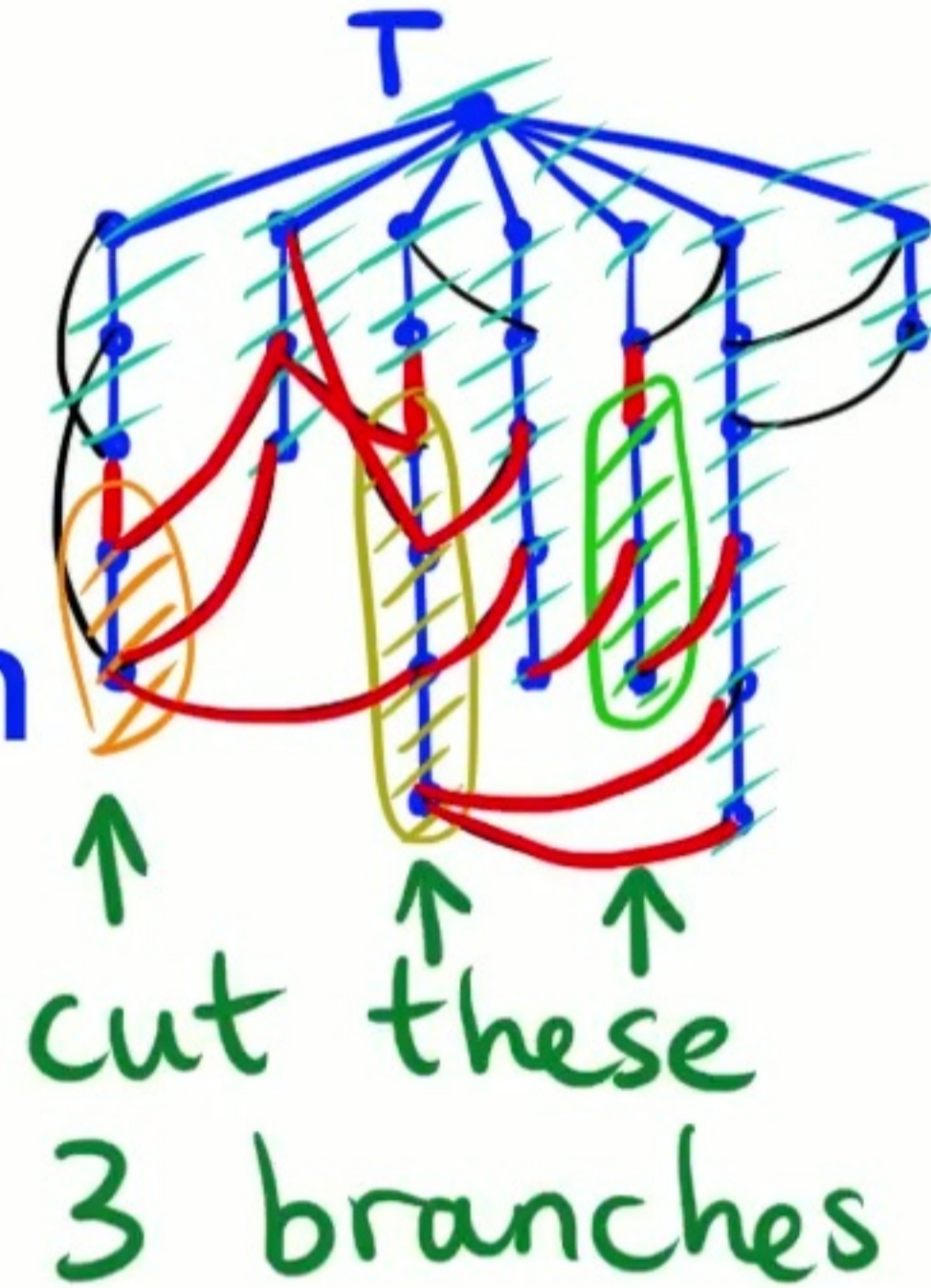
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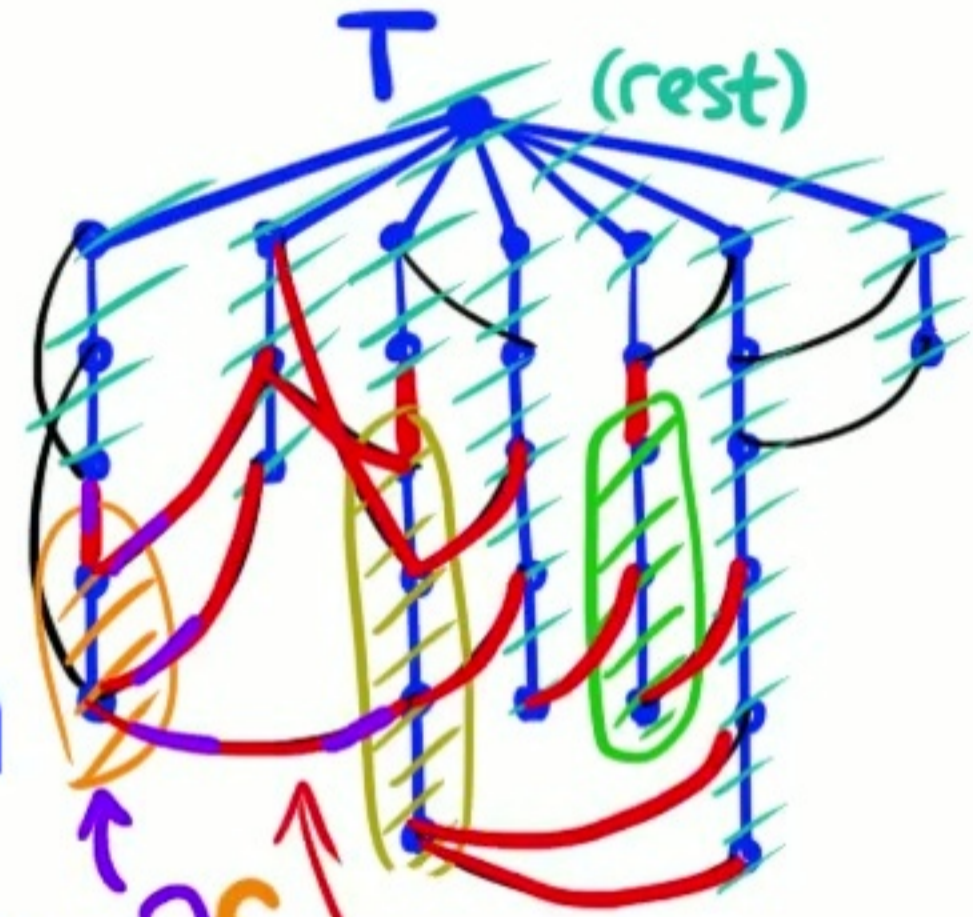
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② Deal with double-counting



sum  $\partial S$  for each part  $S$ ?  
double-count



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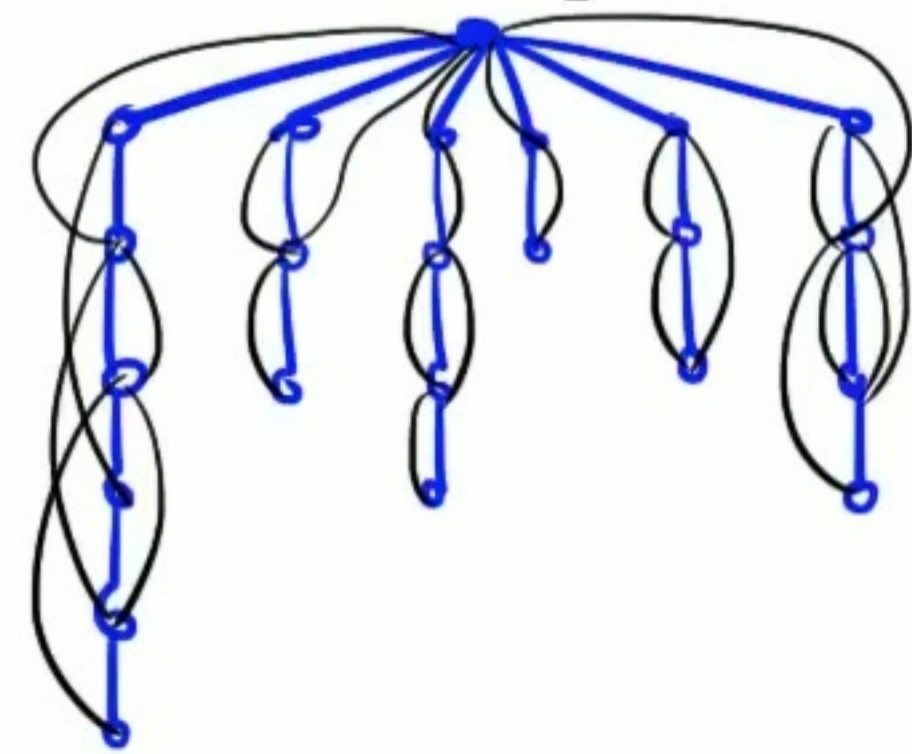
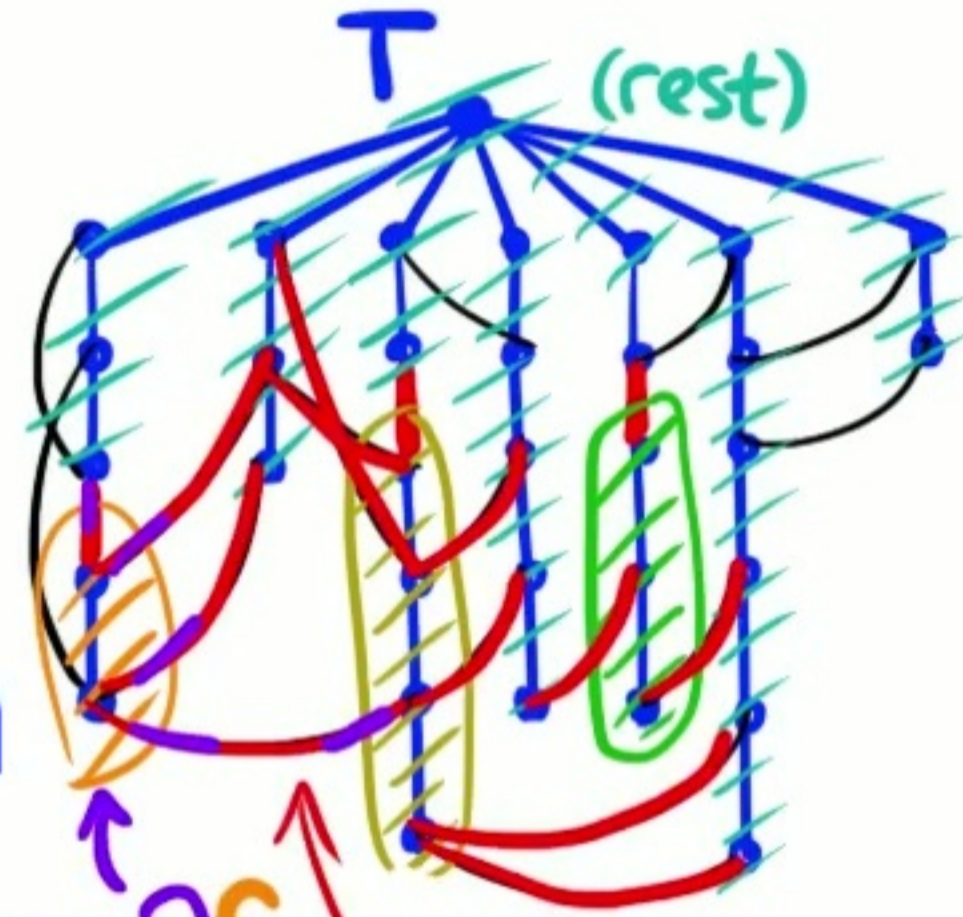
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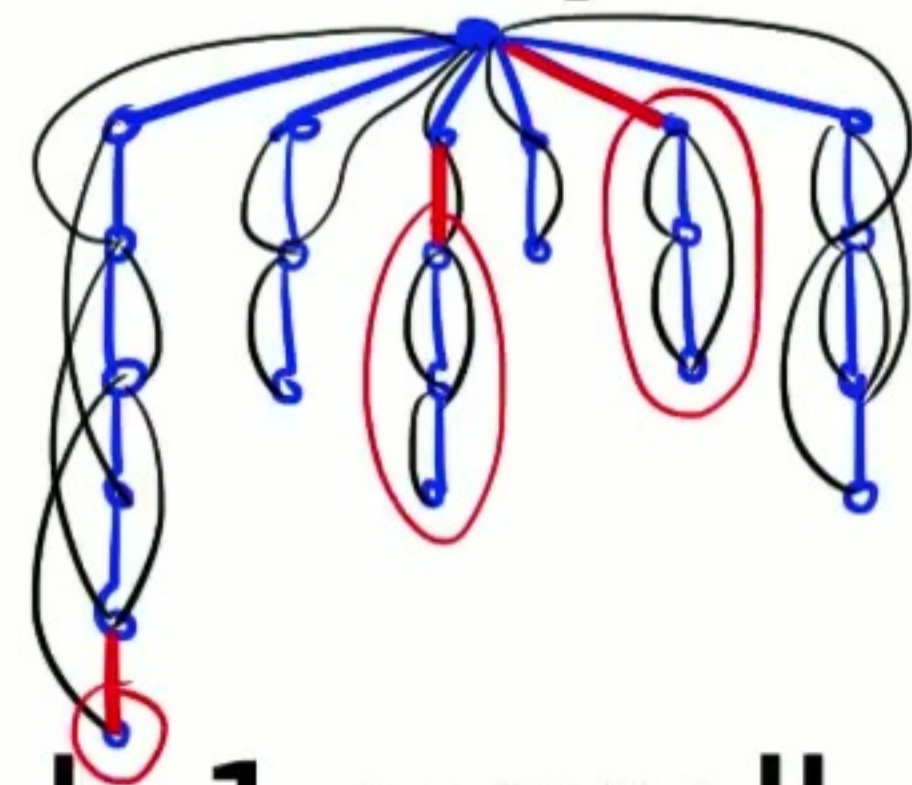
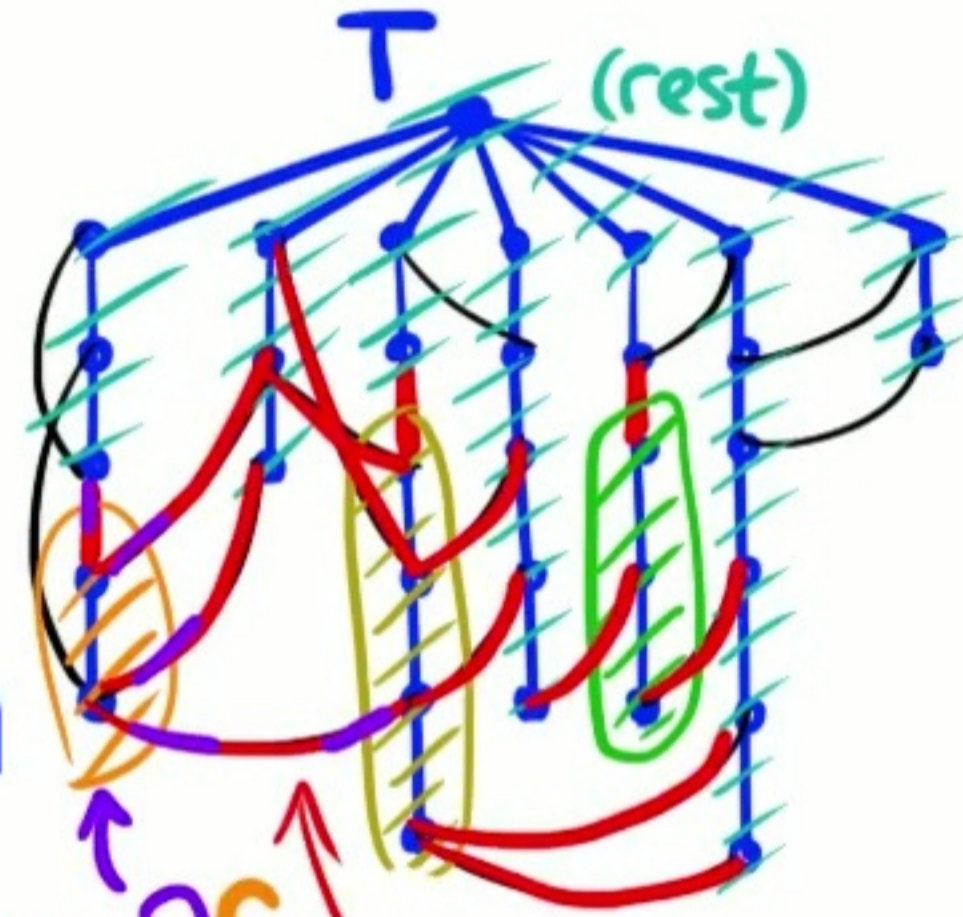
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② Extreme case: no edges between different branches

For each branch, take best cut; take best  $k-1$  overall



# Identifying the Branches

**Other extreme: suppose many edges between OPT's branches**

# Identifying the Branches

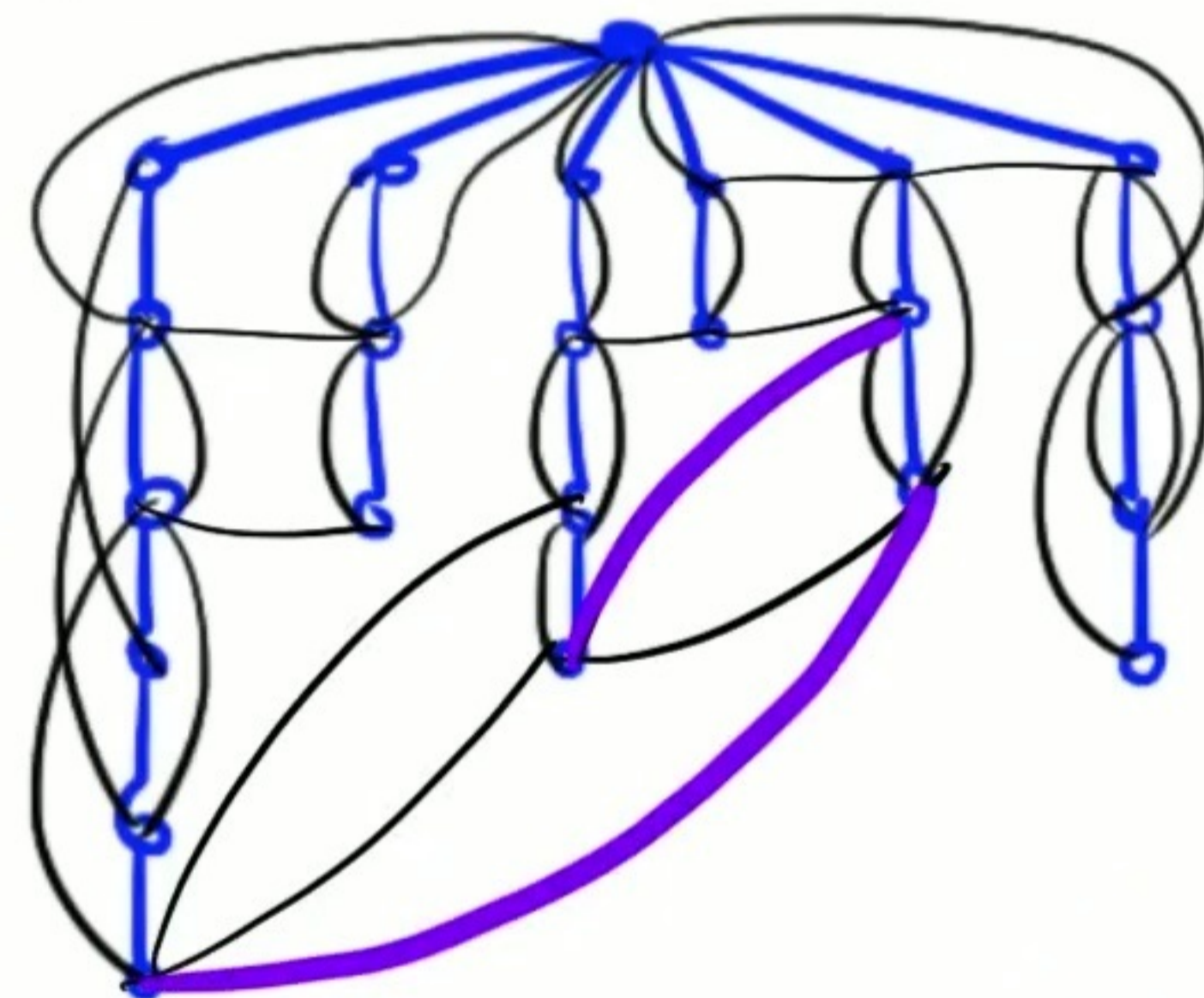
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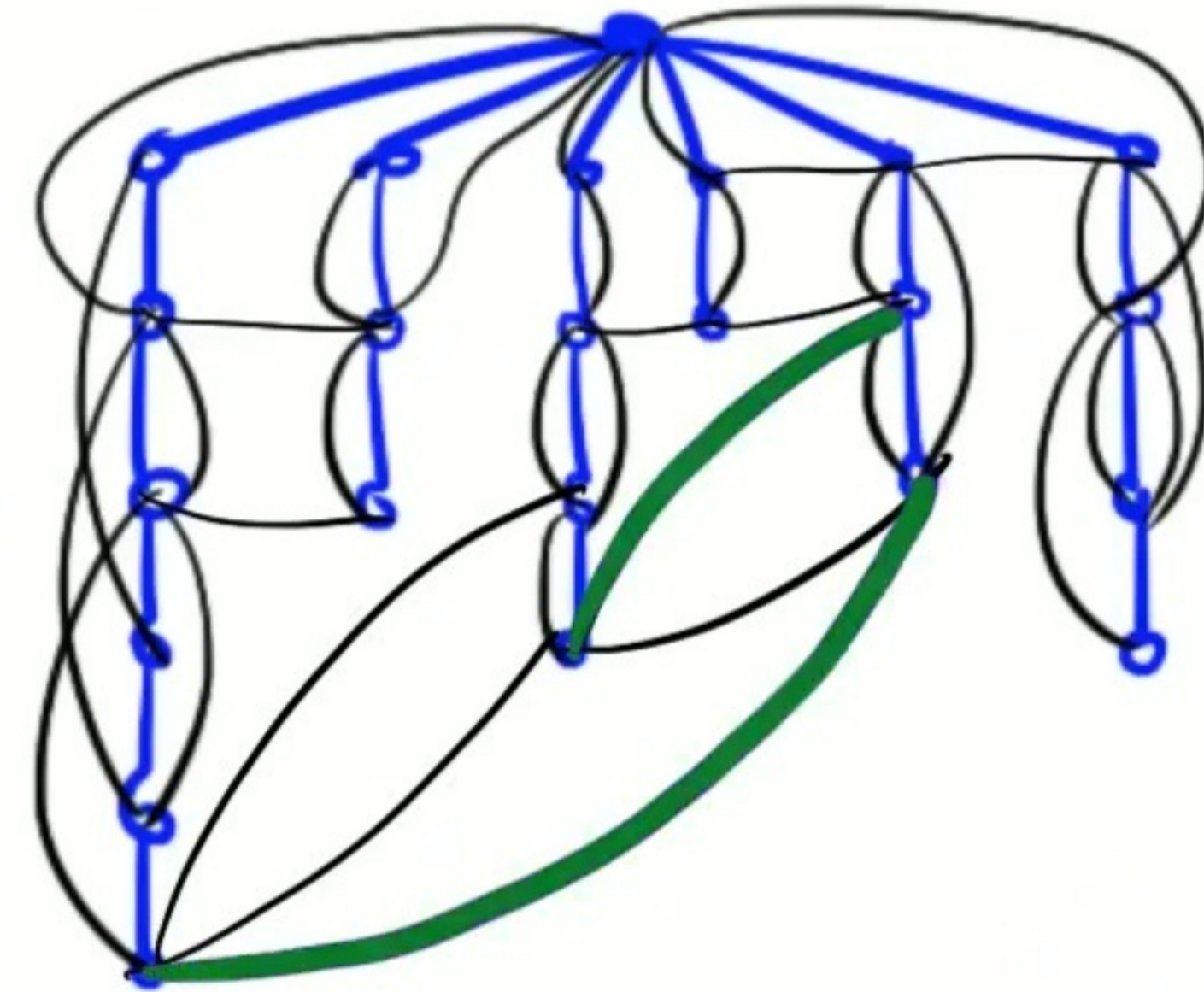
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Want: **fixed** spanning tree all **green**



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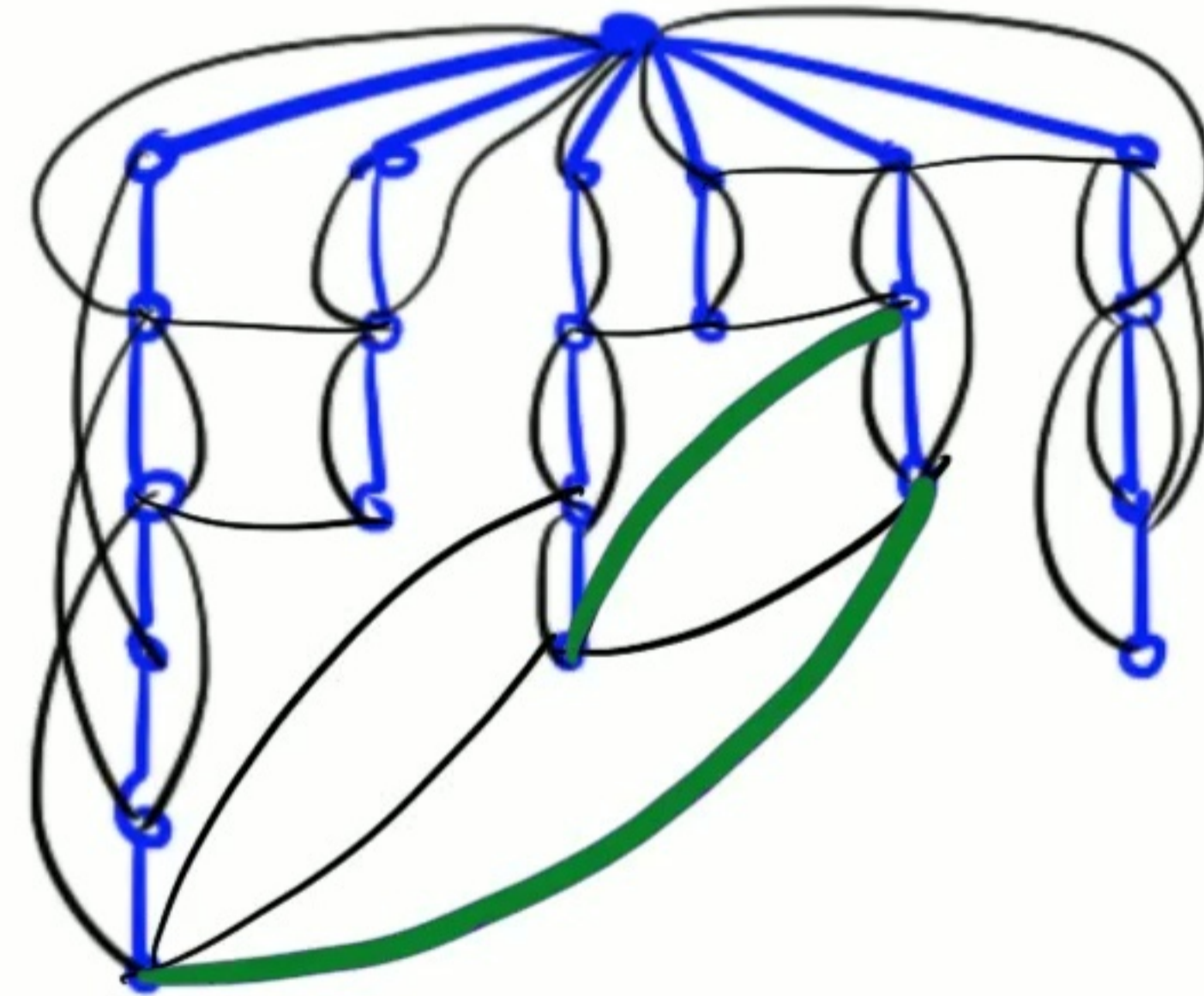
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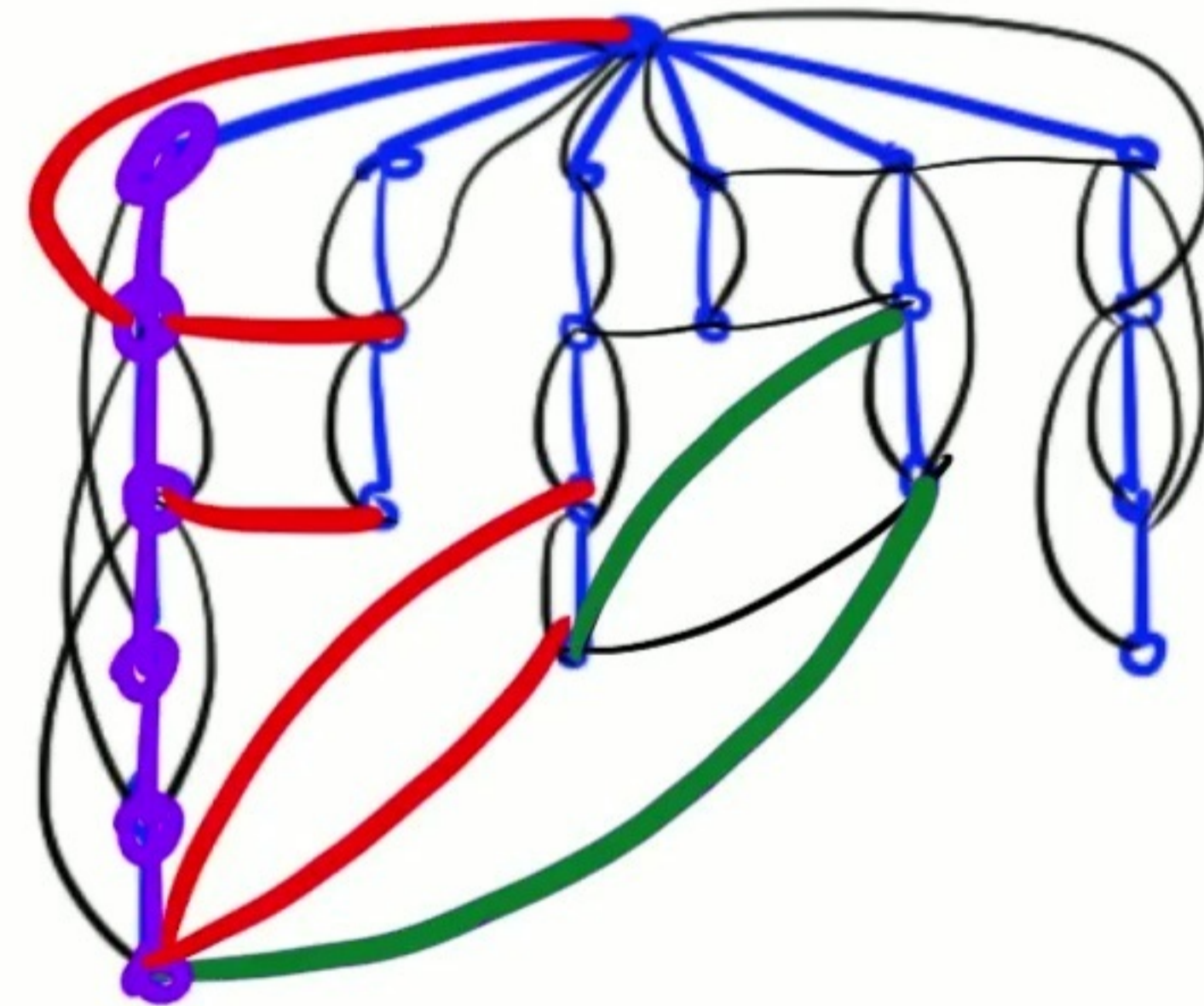
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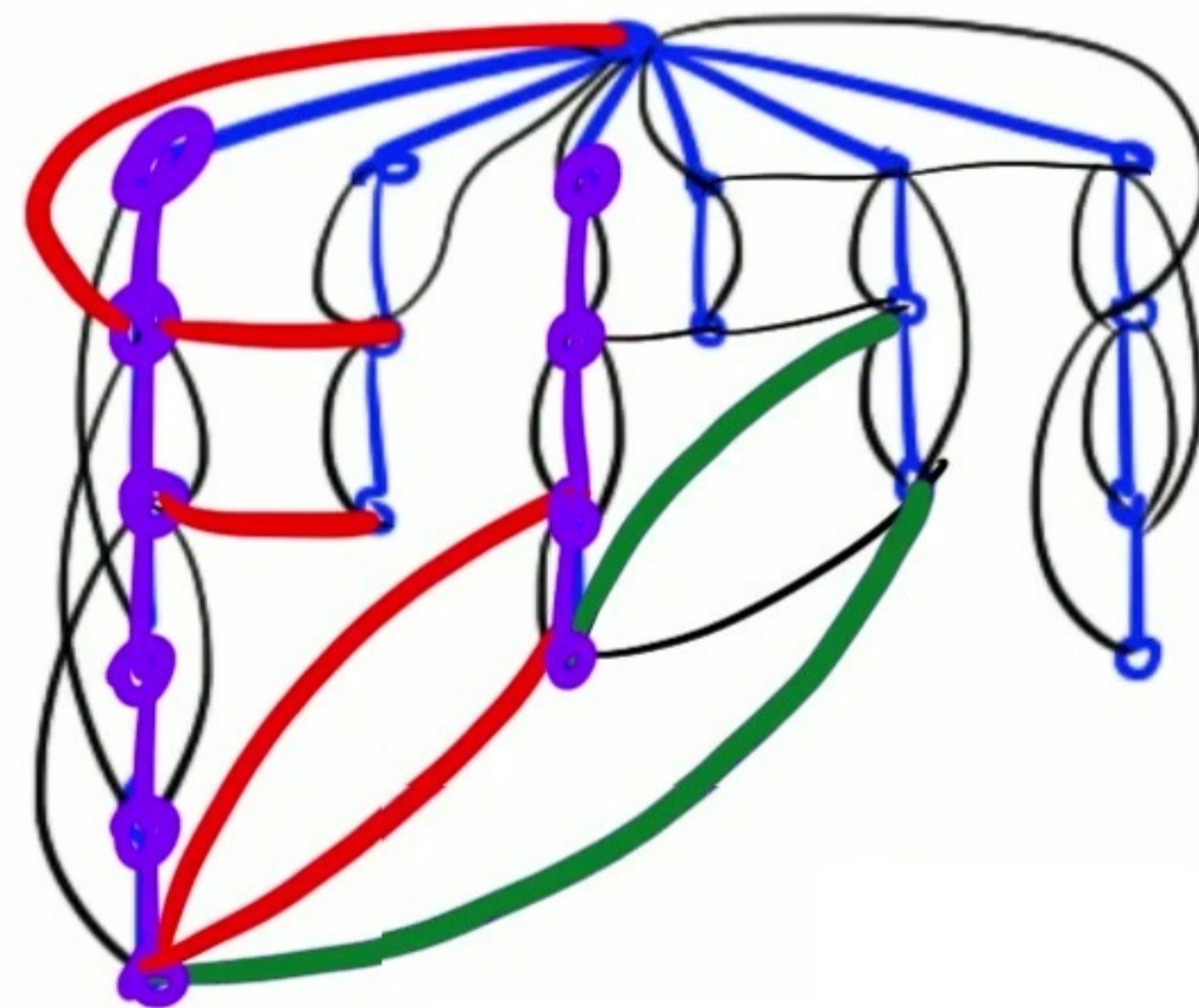
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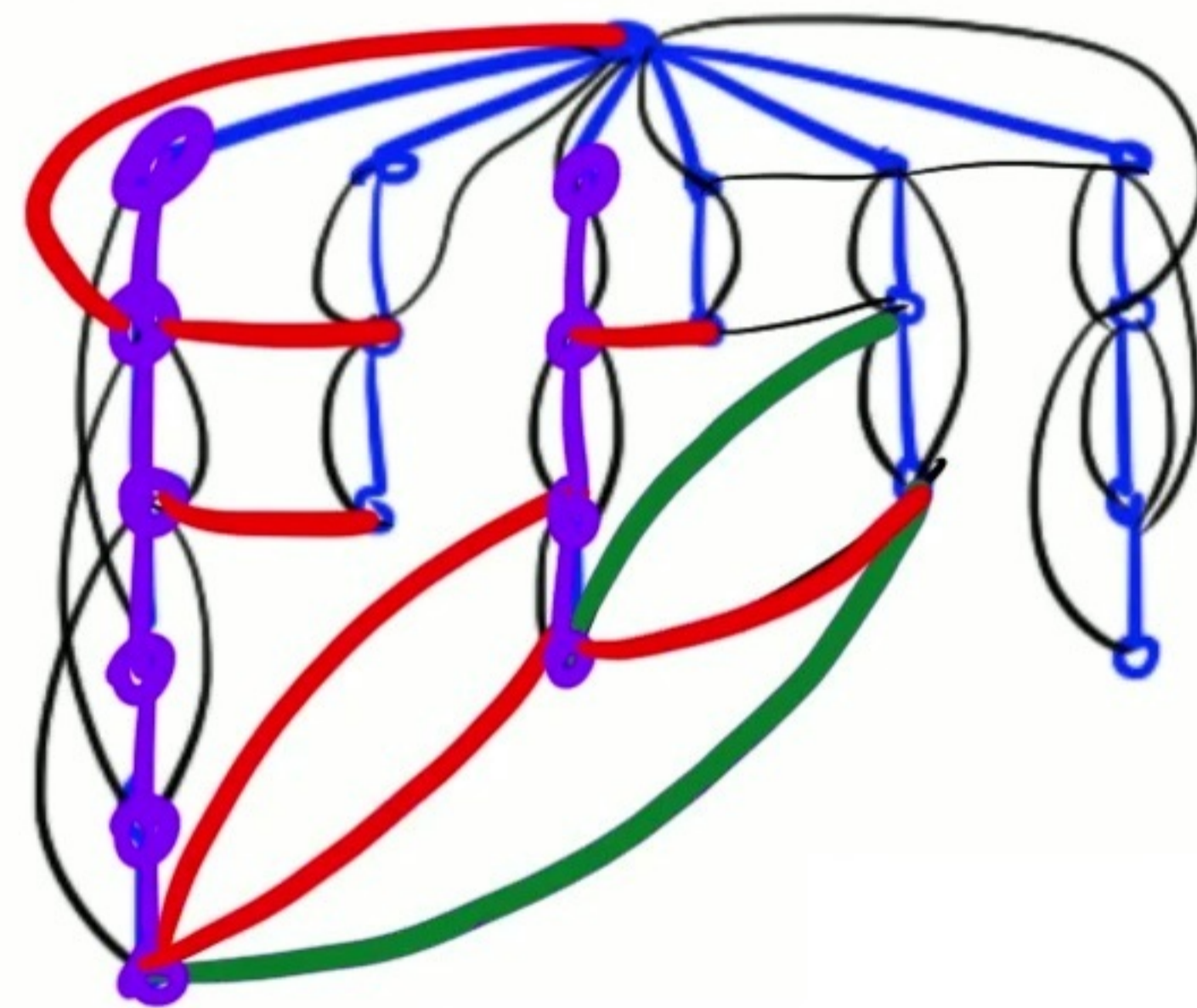
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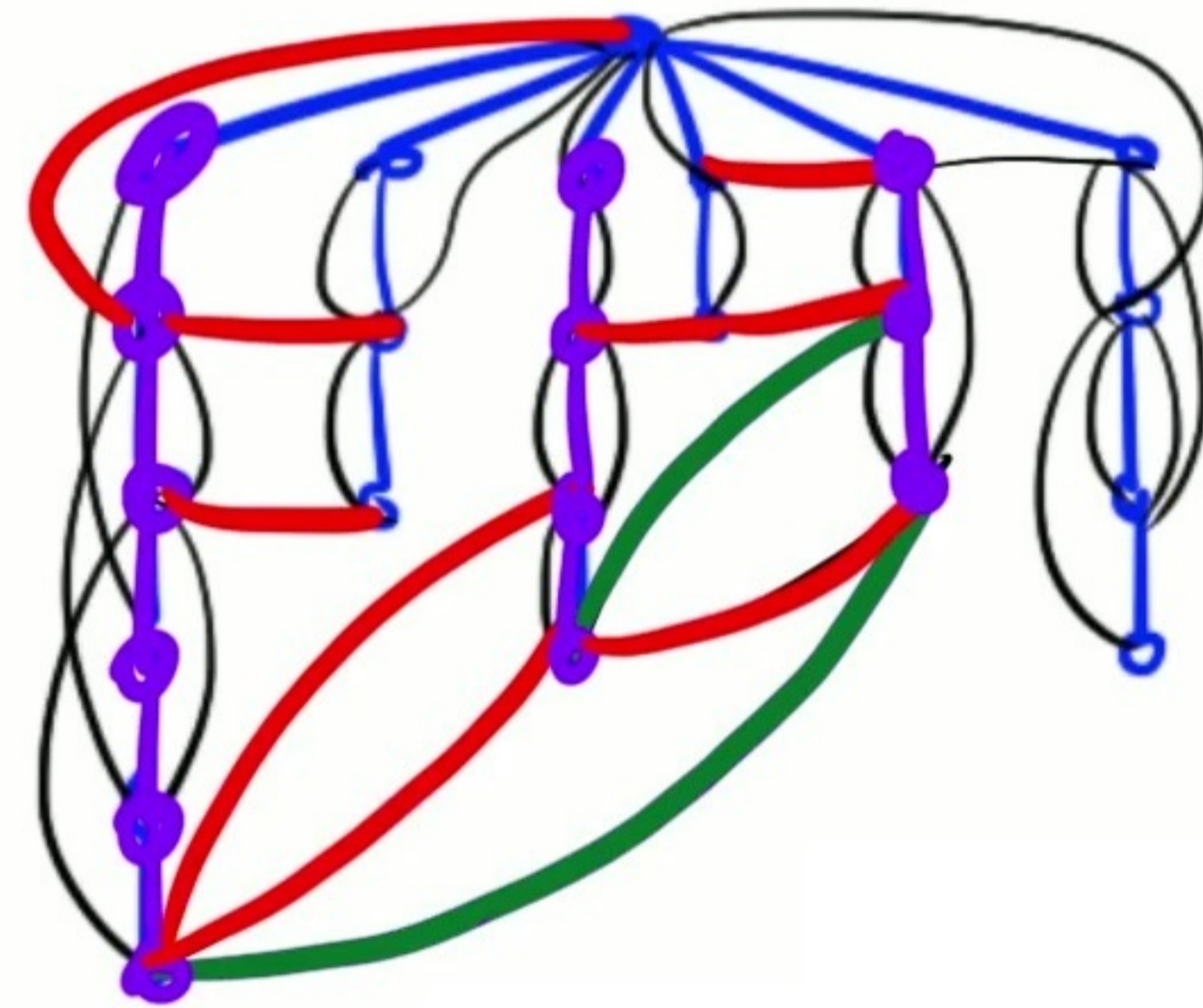
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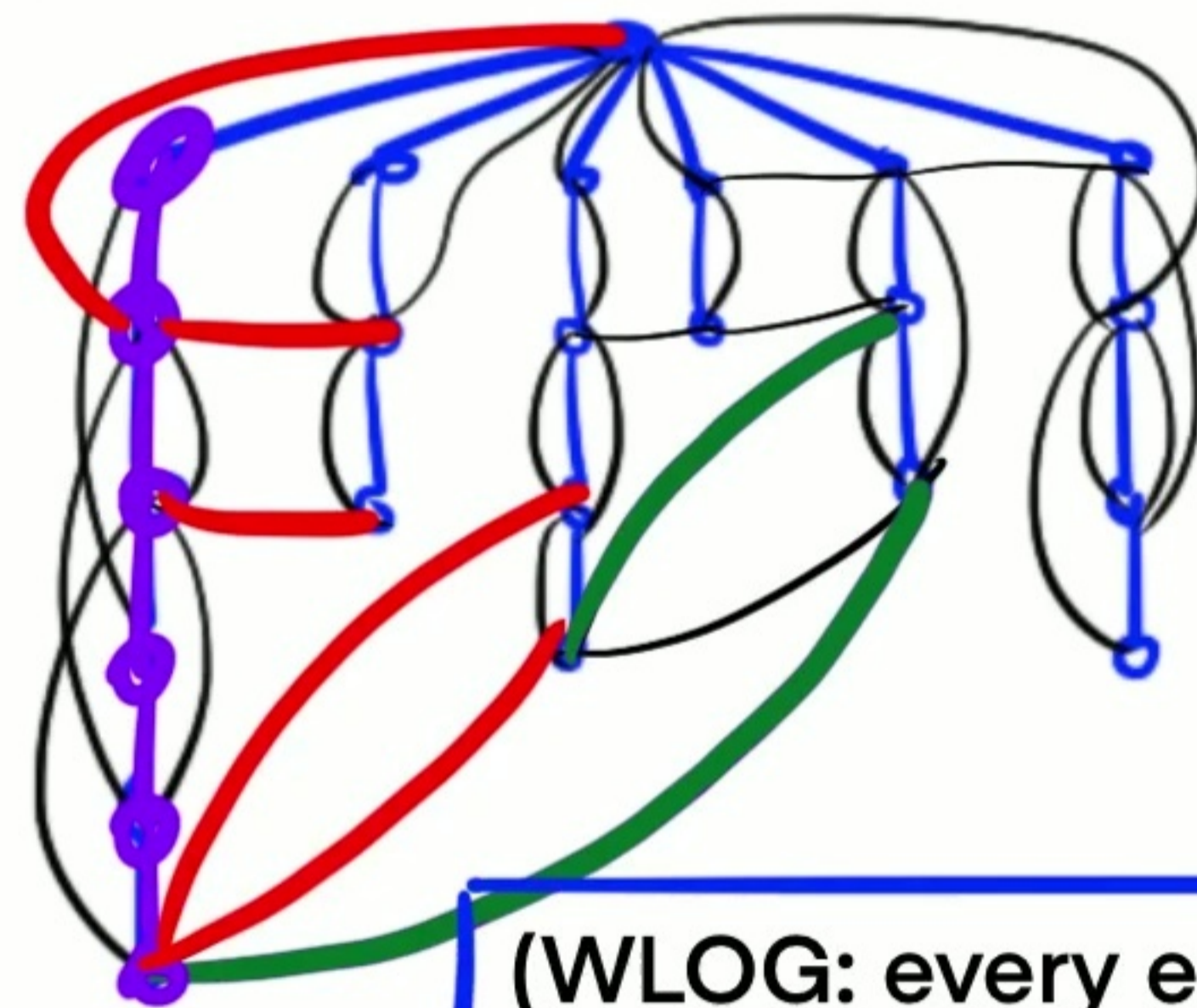
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For each of OPT's branches, remaining boundary edges **red**  $\leq \lambda_k$  per branch  $\Rightarrow \leq k \lambda_k$  total



(WLOG: every edge cut  $\leq \lambda_k$   
Otherwise OPT can't pick that edge, so contract)

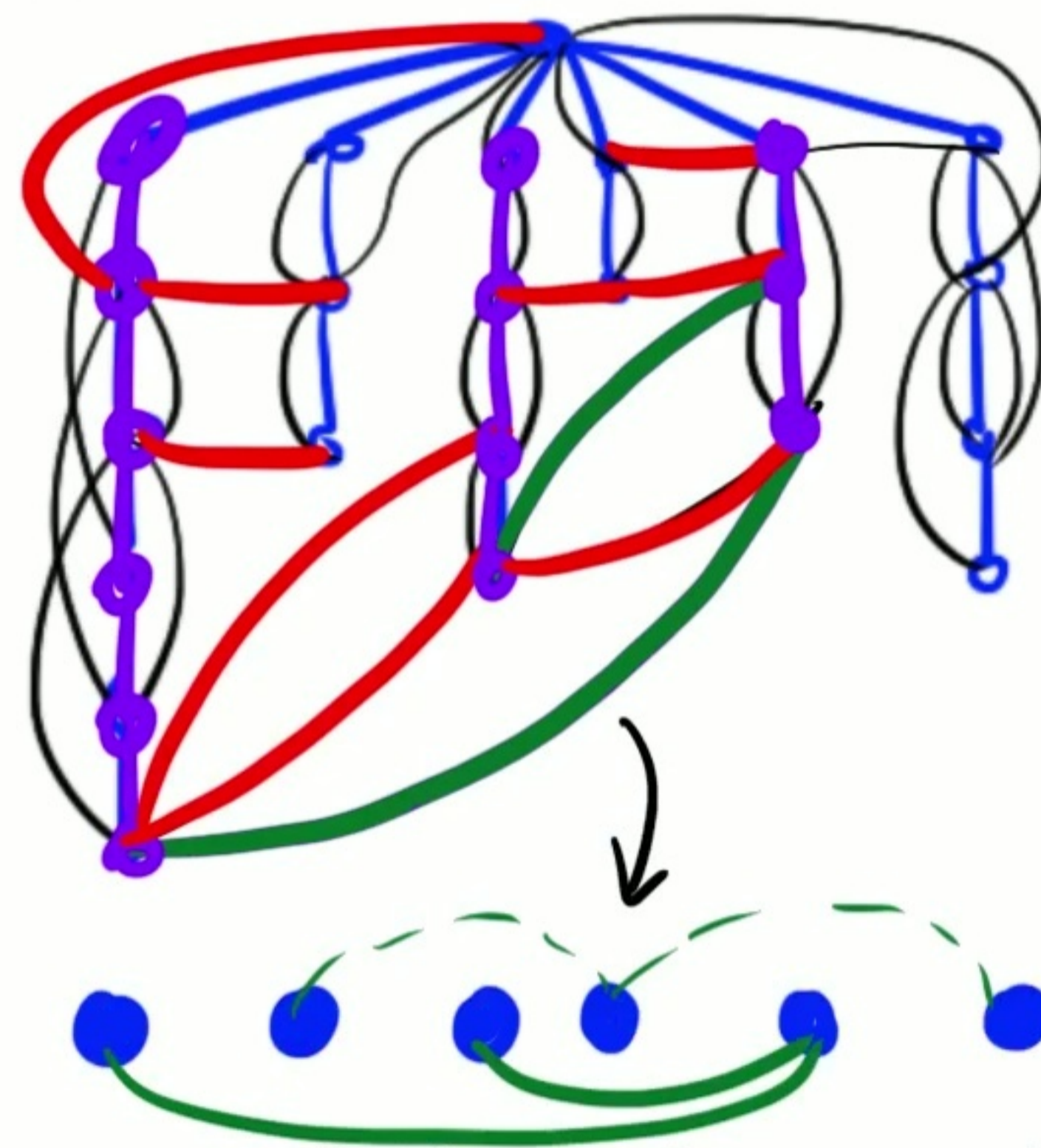
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Contract each branch; OPT's branches is one connected component

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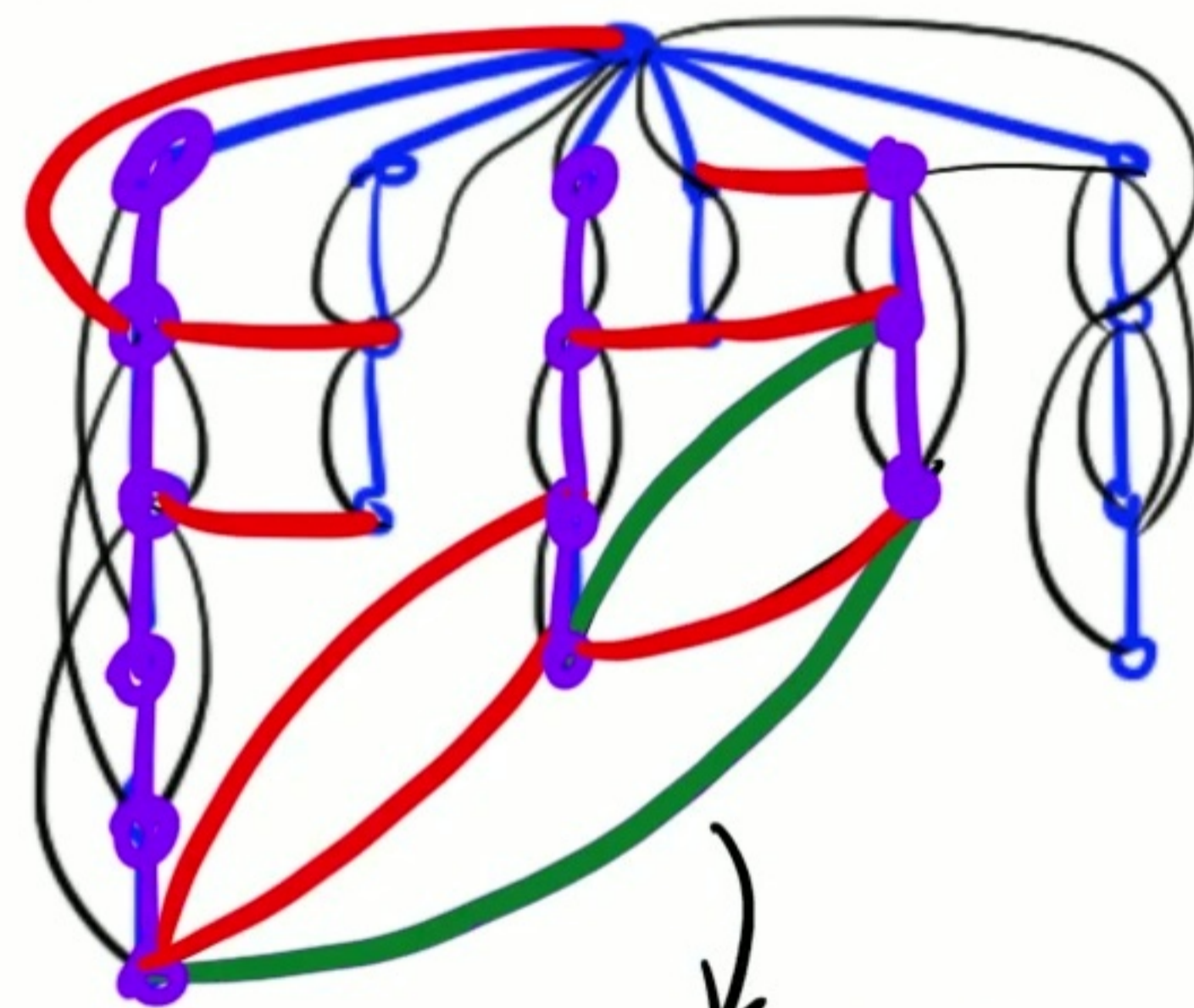
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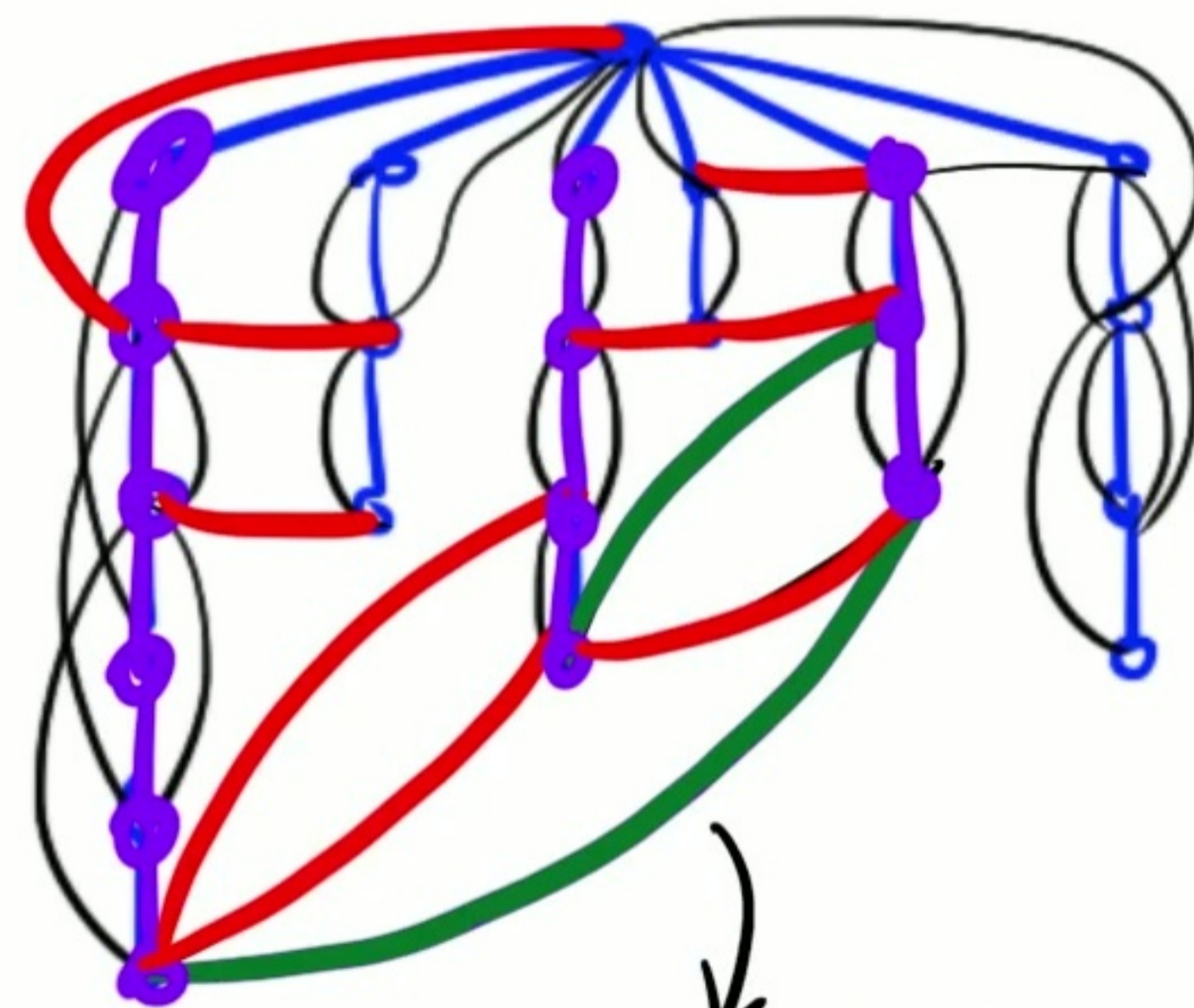
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 $\frac{1}{\lambda_k^k} e^{-k}$

# Identifying the Branches

Other extremes: suppress many edges between OPT's

branches

Idea

contract

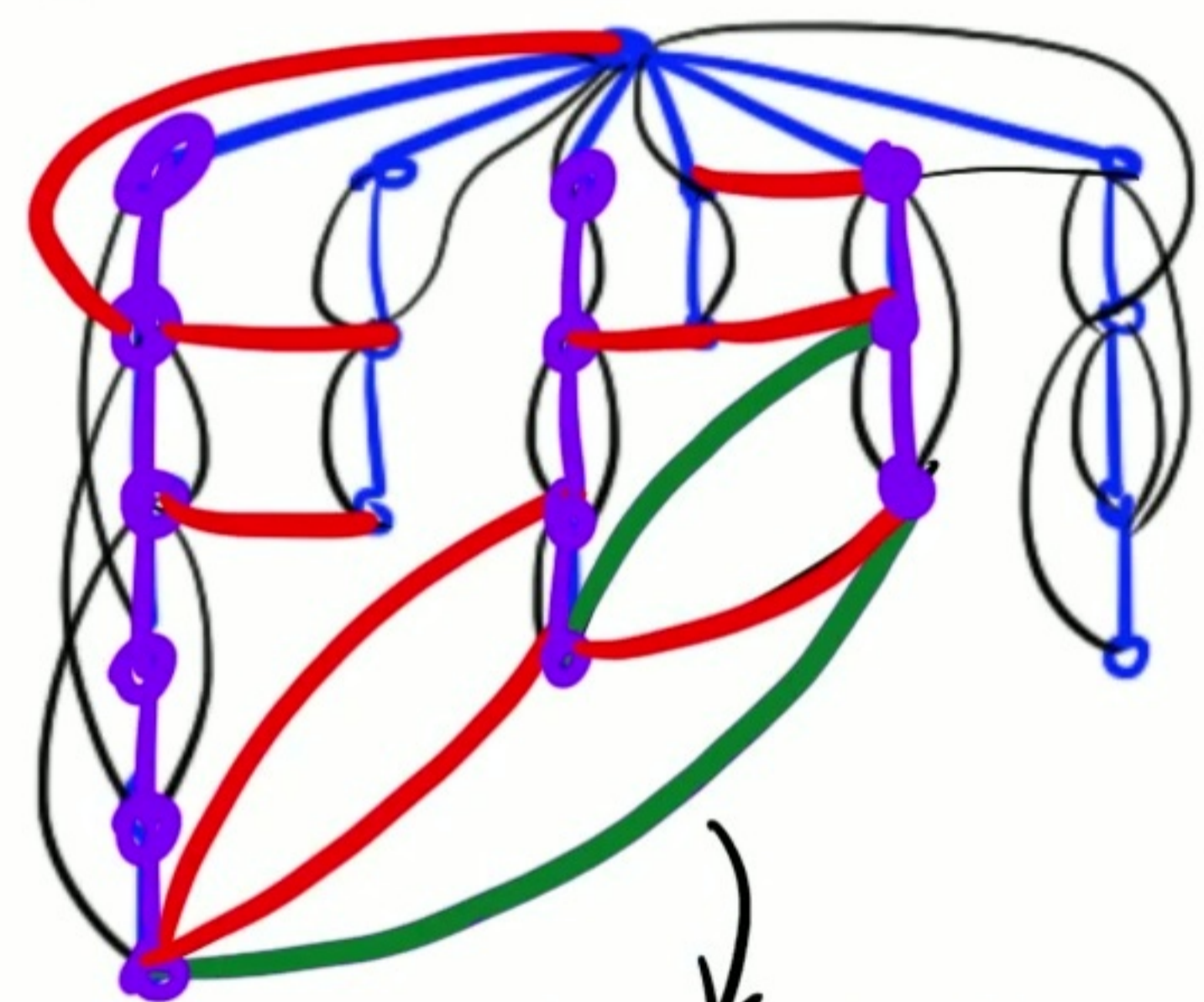
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Contract each branch; OPT's branches is one connected component

Highlight small (size  $k$ ) structure



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# General Trees

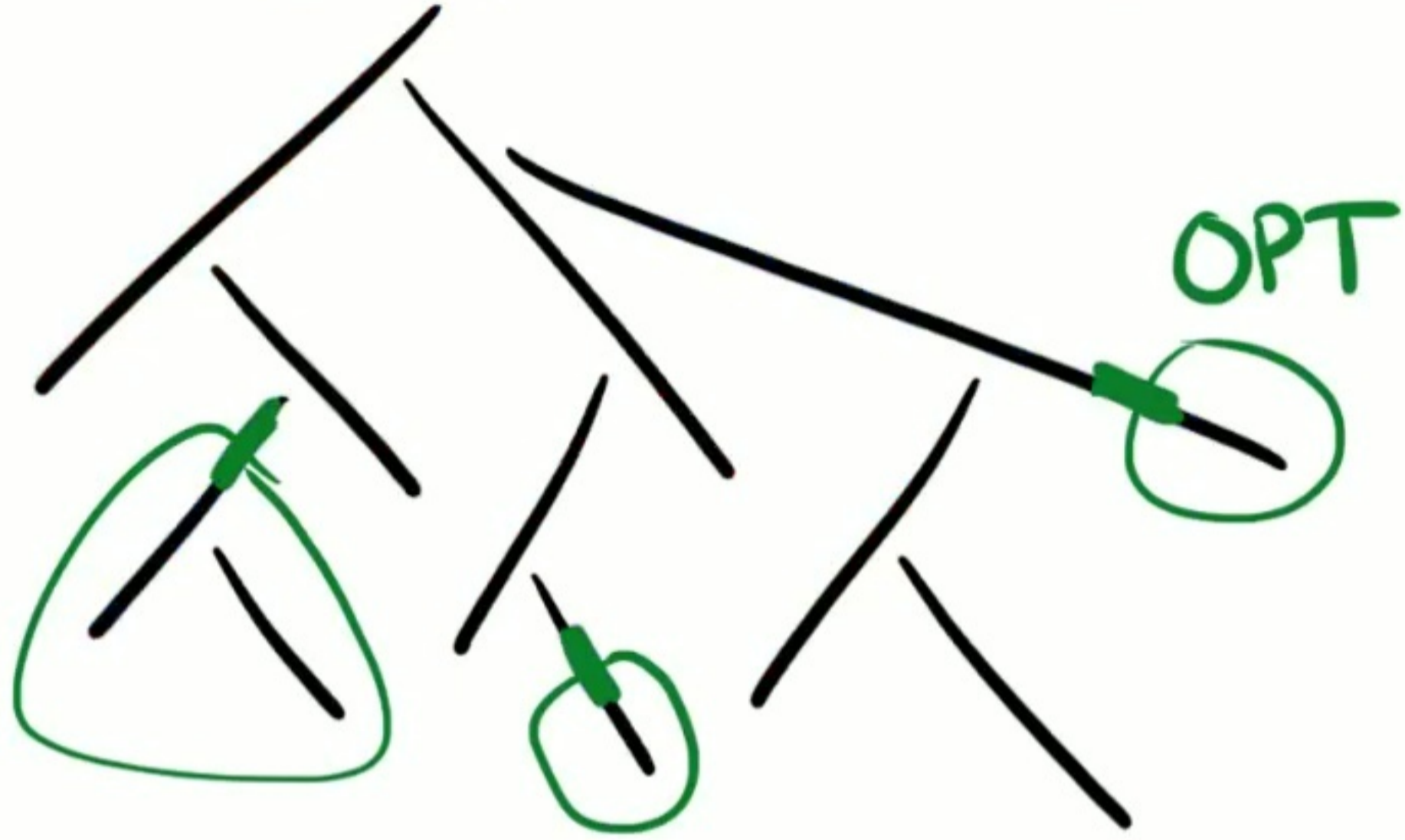
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Heavy-light decomposition into branches, color-code red/blue

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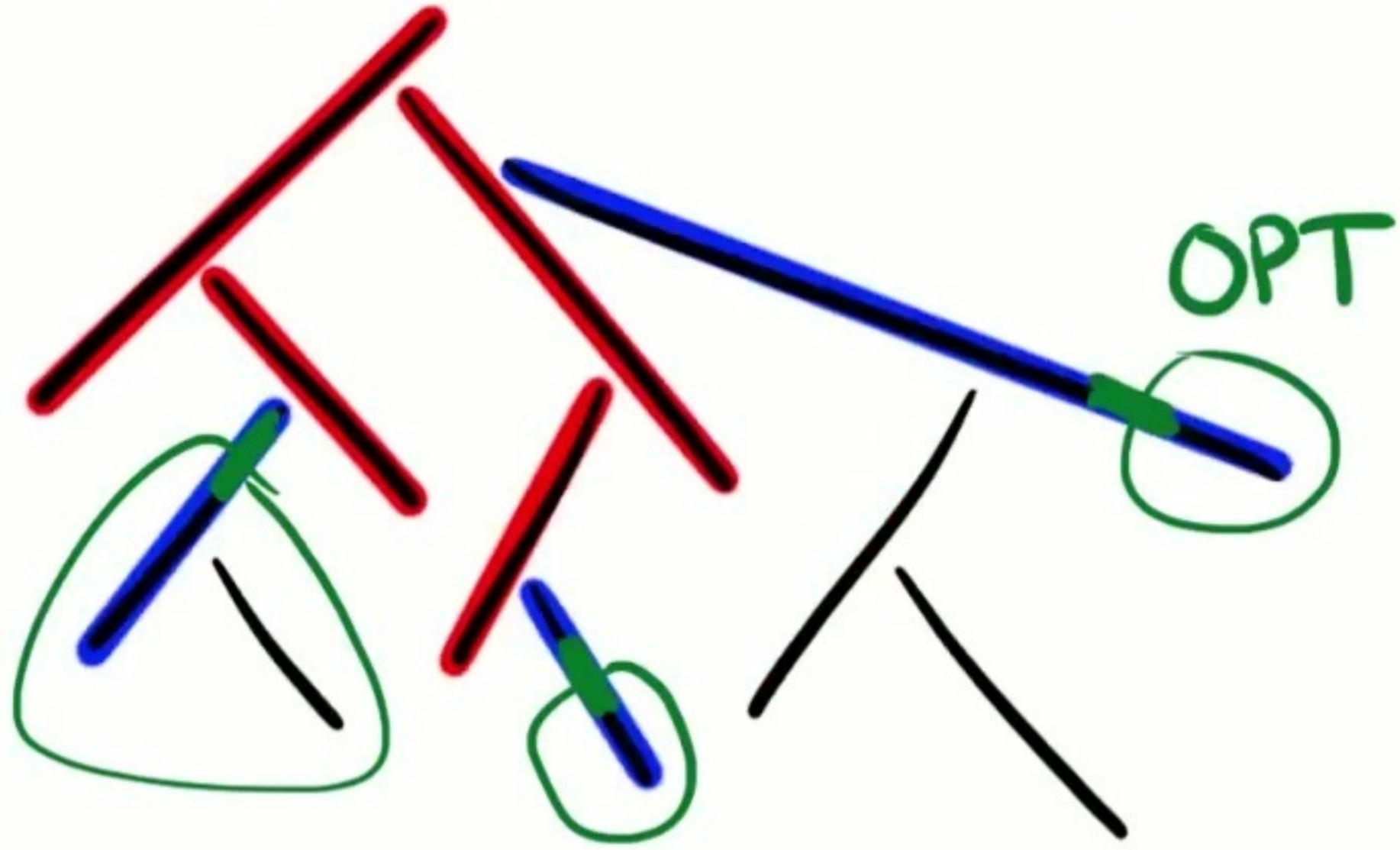
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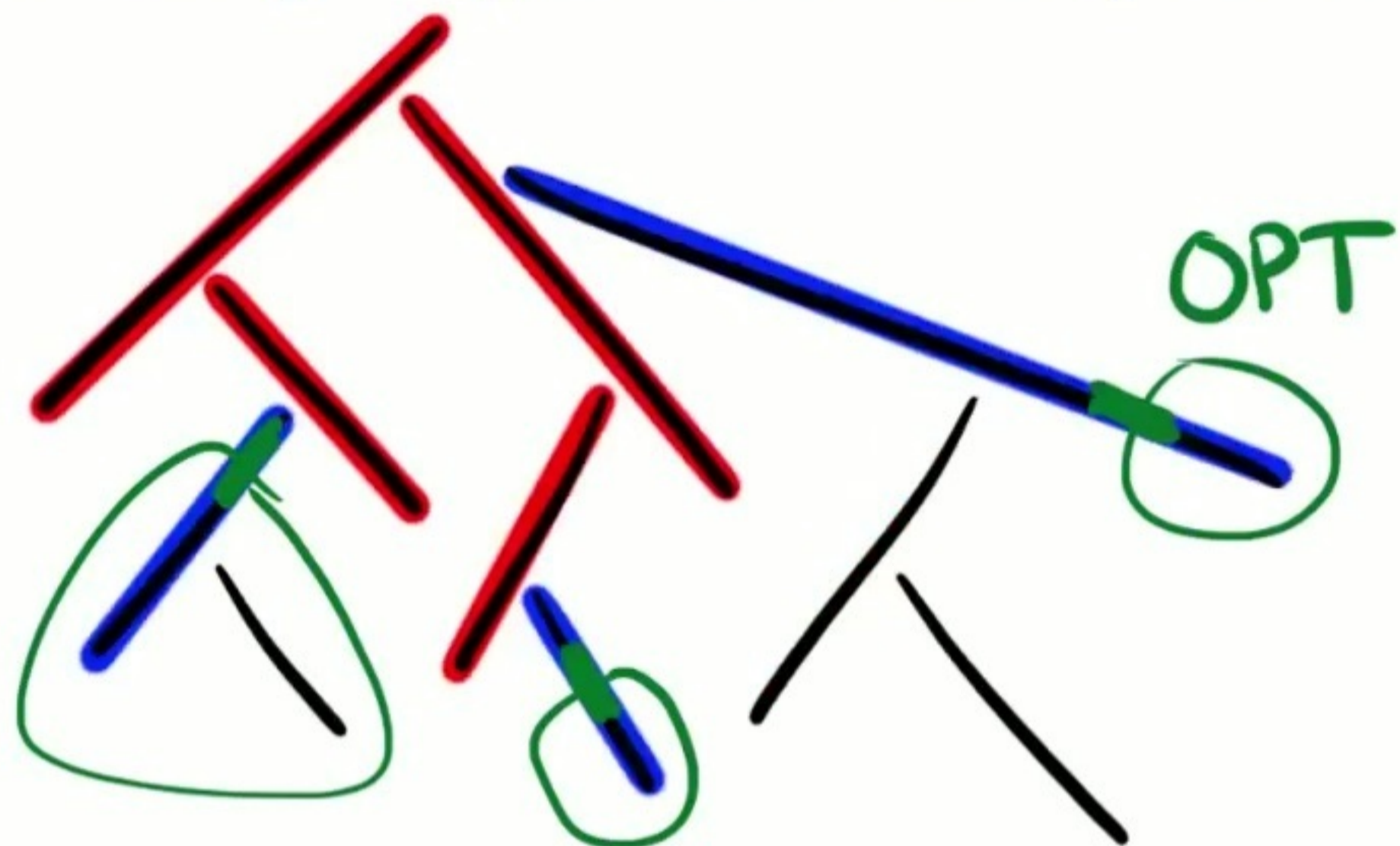
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(by HLD)

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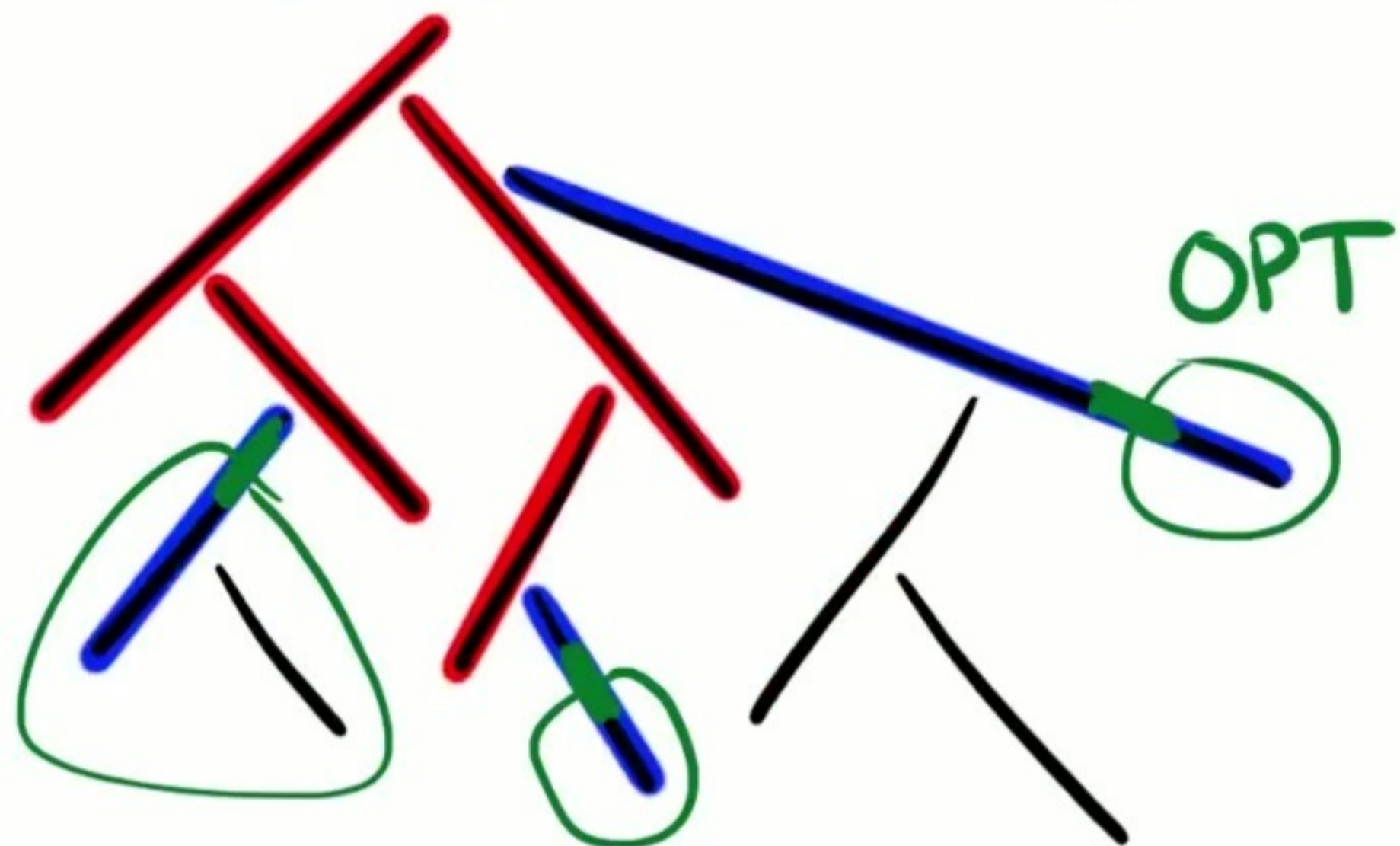


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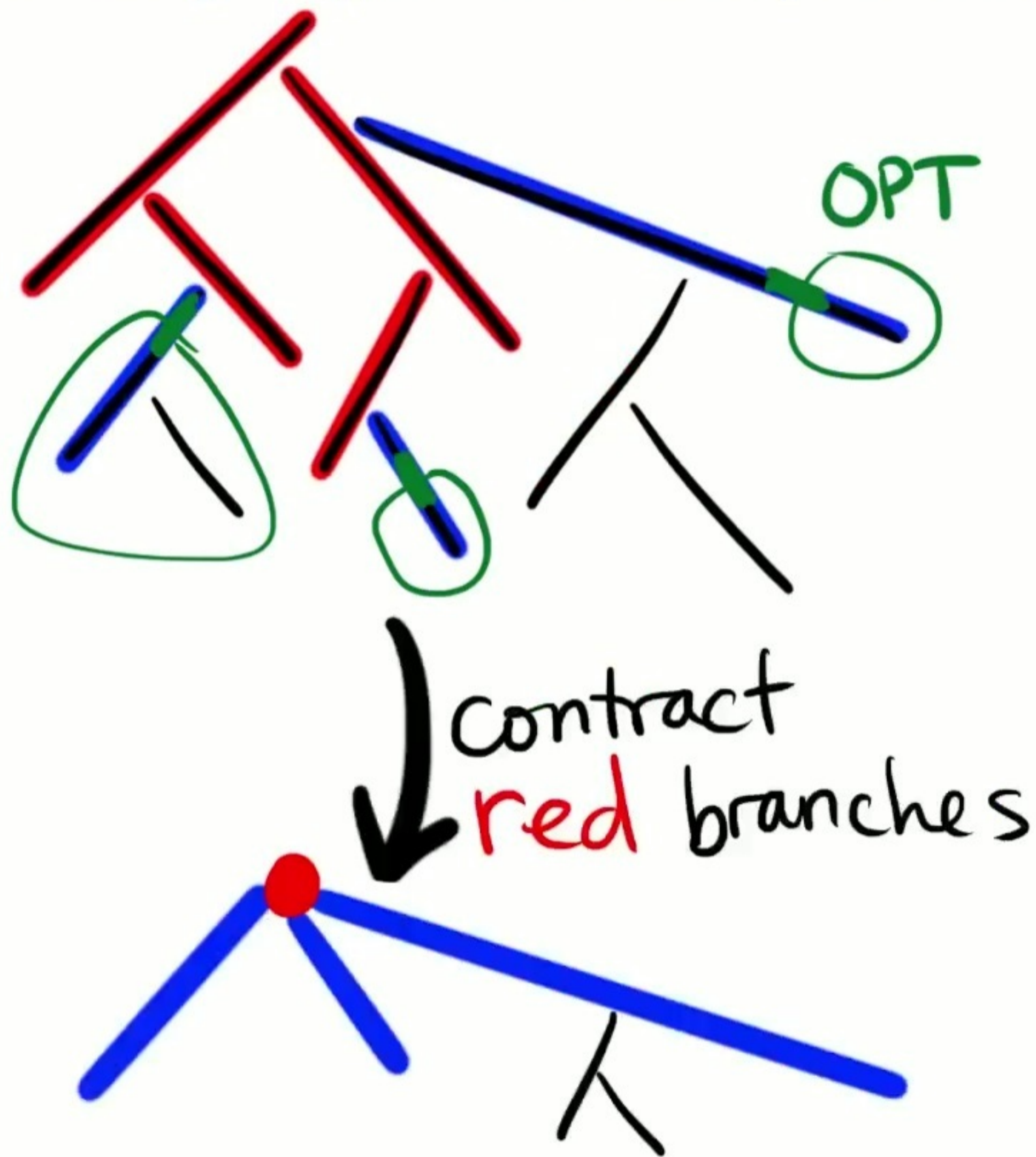


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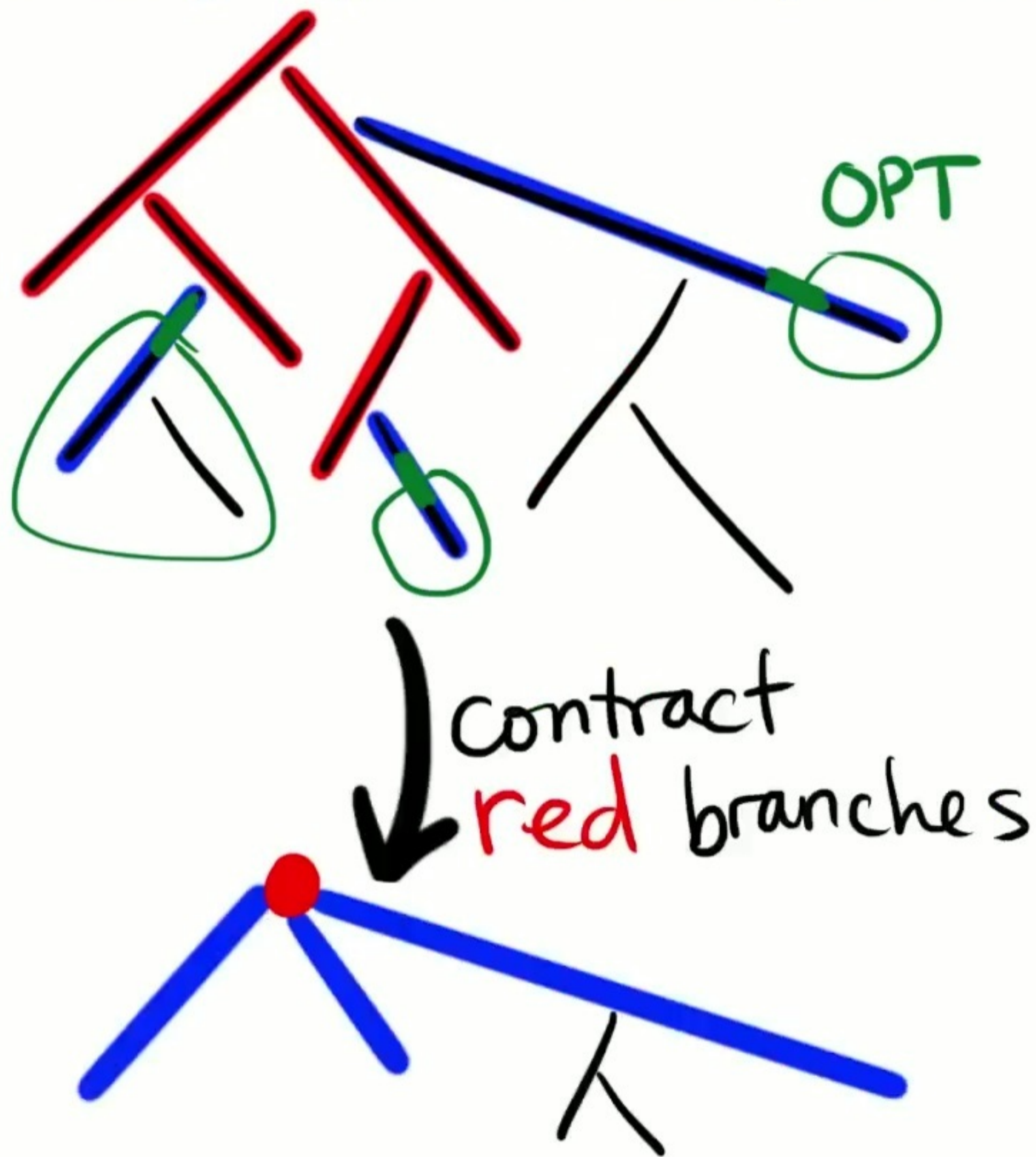


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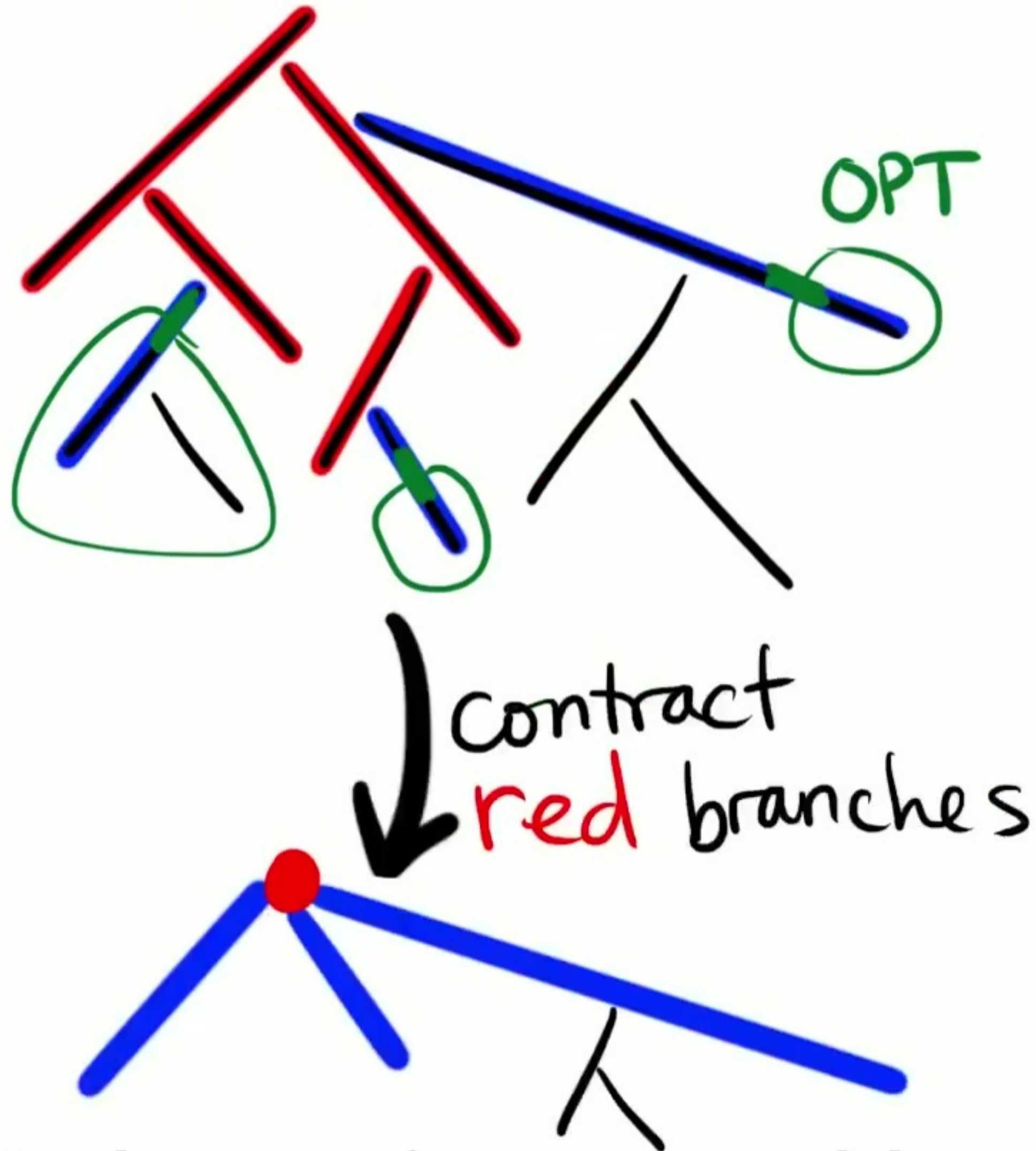
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Reduce to incomparable: Dynamic program on subtrees [GLL18]



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**Faster min  $k$ -cut on a weighted graph?**

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[Gupta Lee **L**] min k-cut in time  $n^k 2^{O(\log \log n)^2}$

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[Improve from  $n^{-2k}$ ]

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Deterministic  $n^k$  time?