

# Faster Exact and Approximate k-cut

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Thorup's tree packing  
Reduction to  $(k-1)$ -resp.  
 $k$ -clique-like mtx.mult.  
Hardness  $n^{(w/3)k}$

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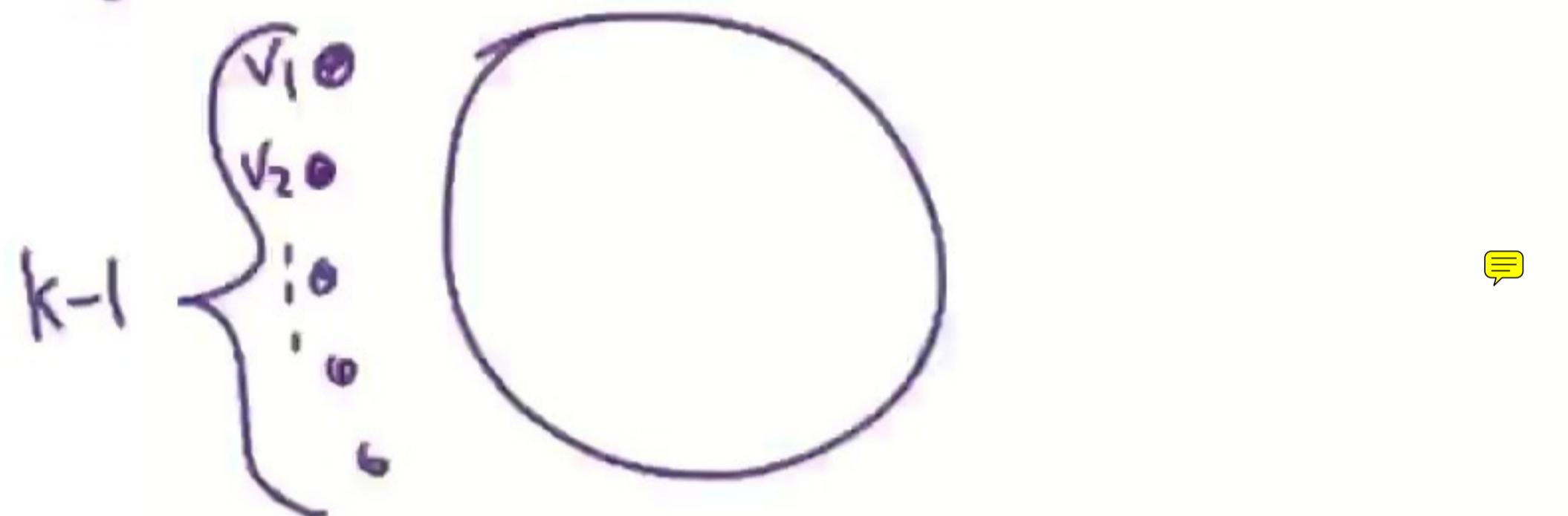
## Hardness from k-clique

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Idea: suppose optimal k-cut is  $(k-1)$   
singletons + rest of graph



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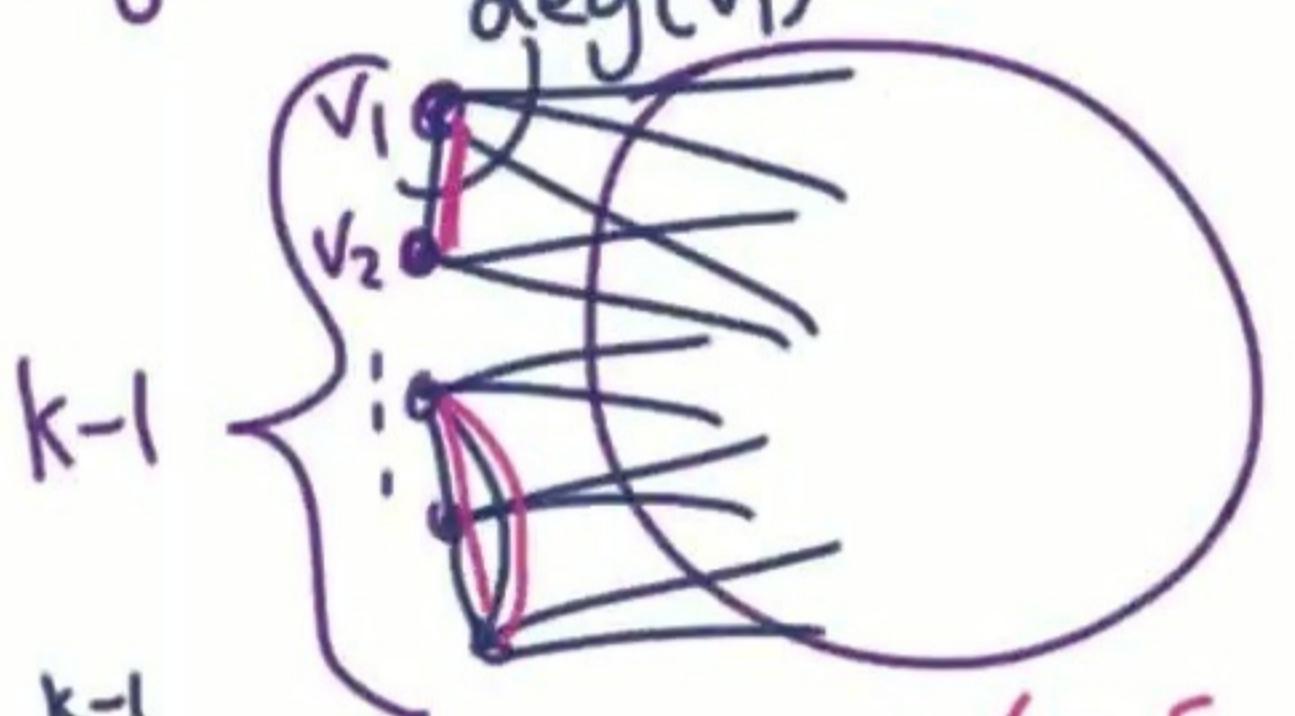


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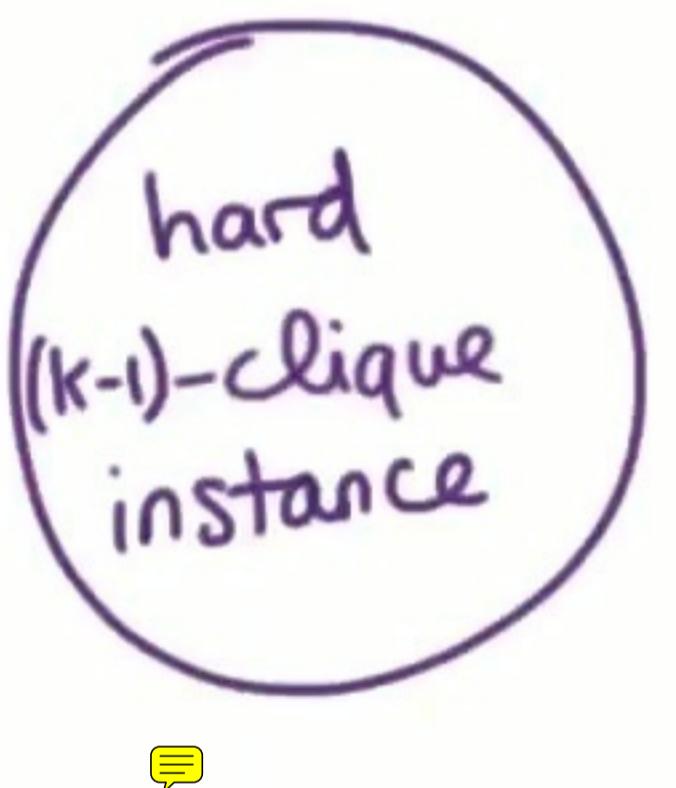
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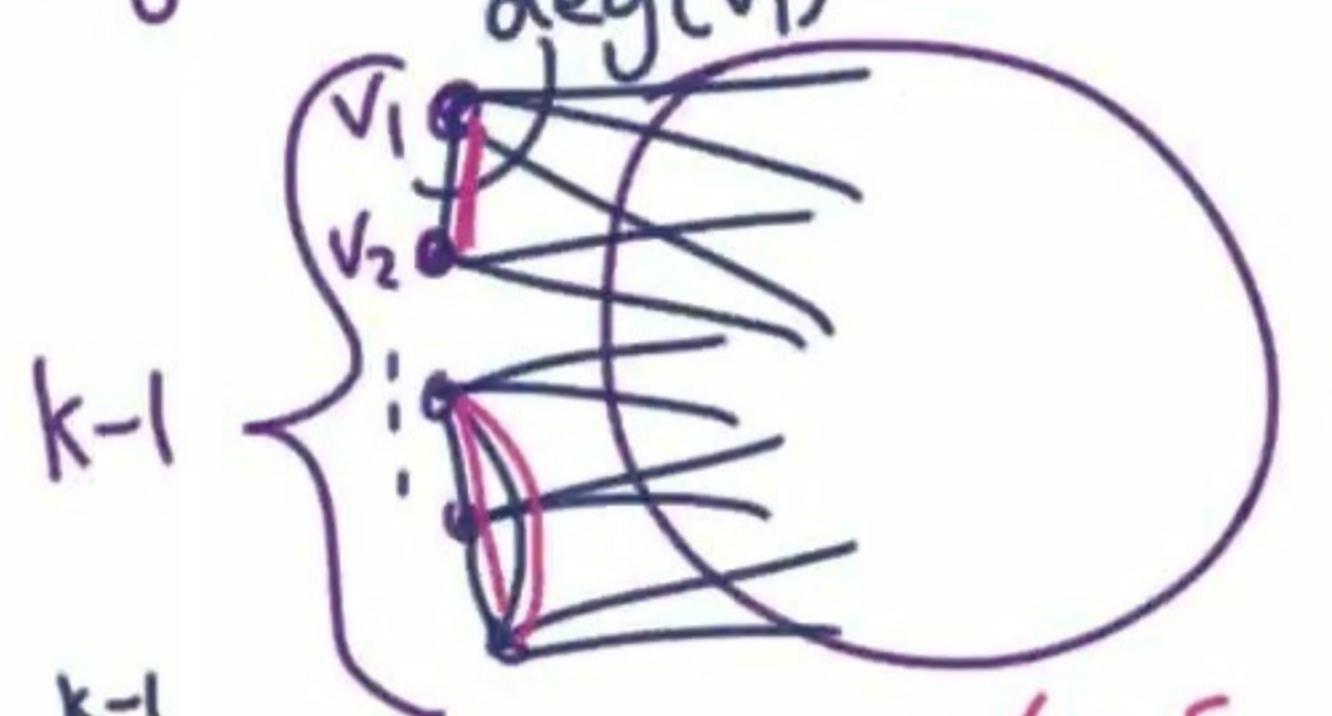
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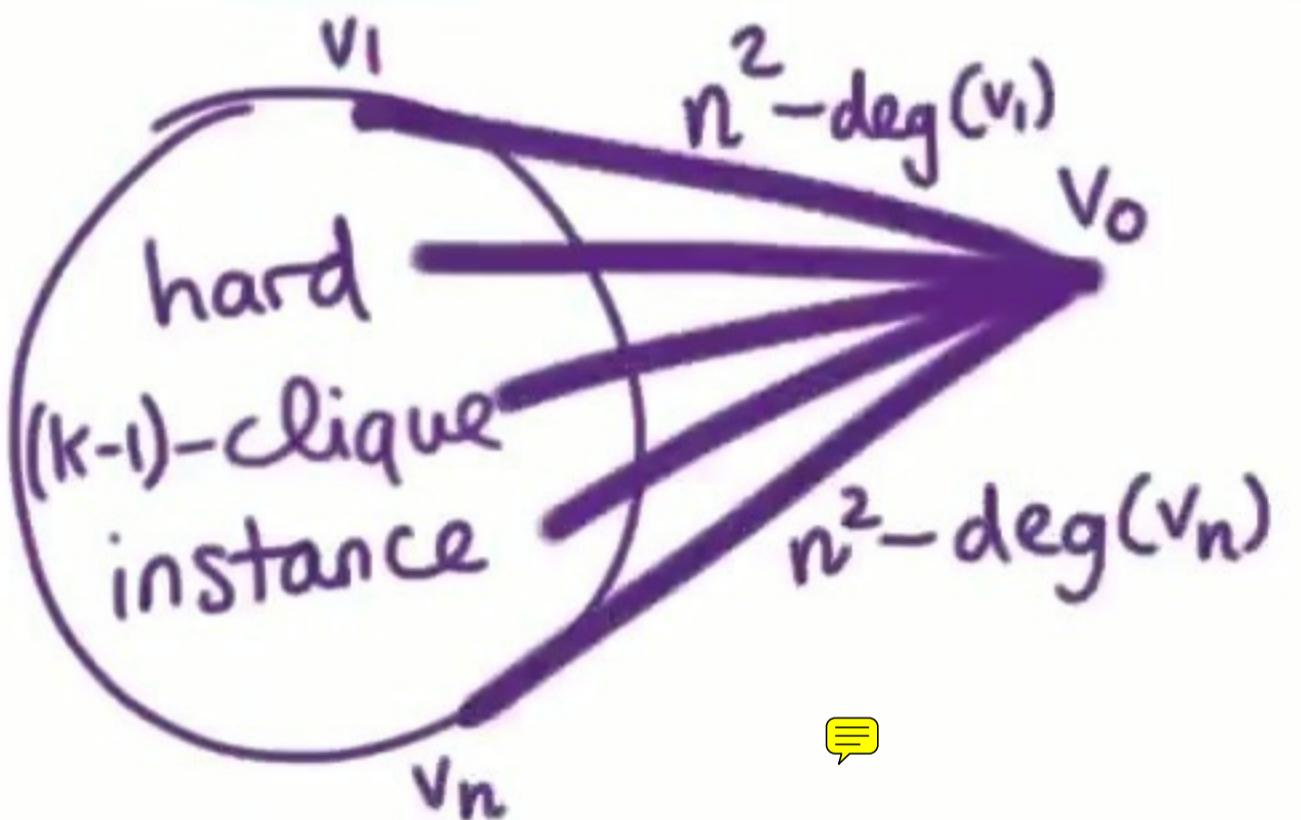
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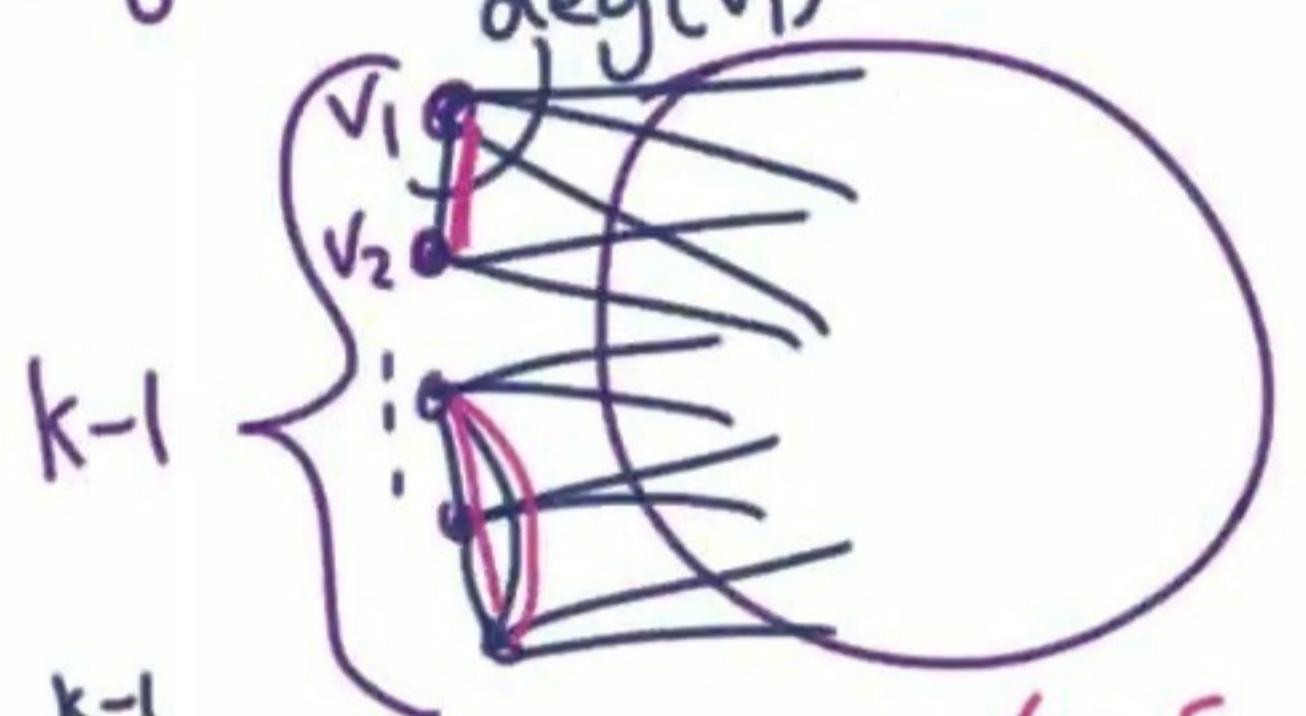
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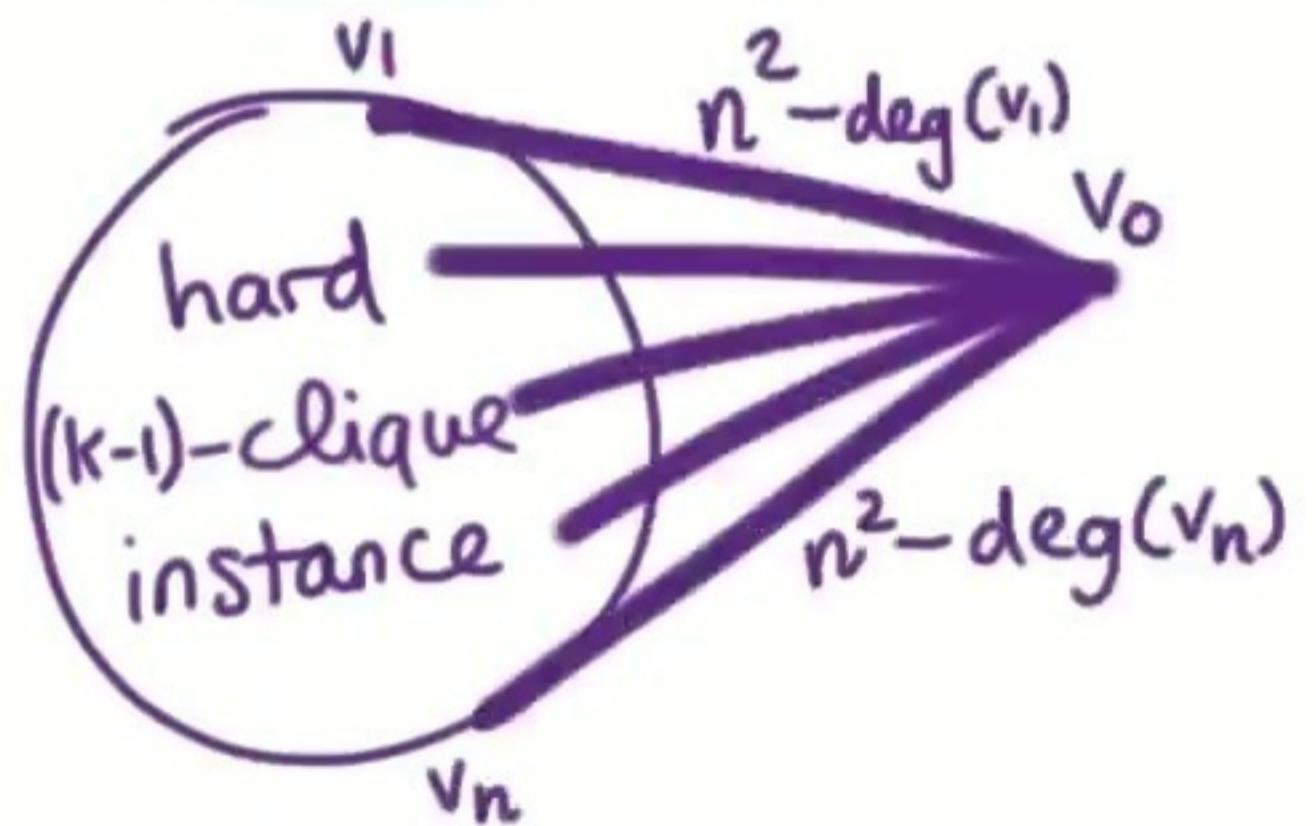


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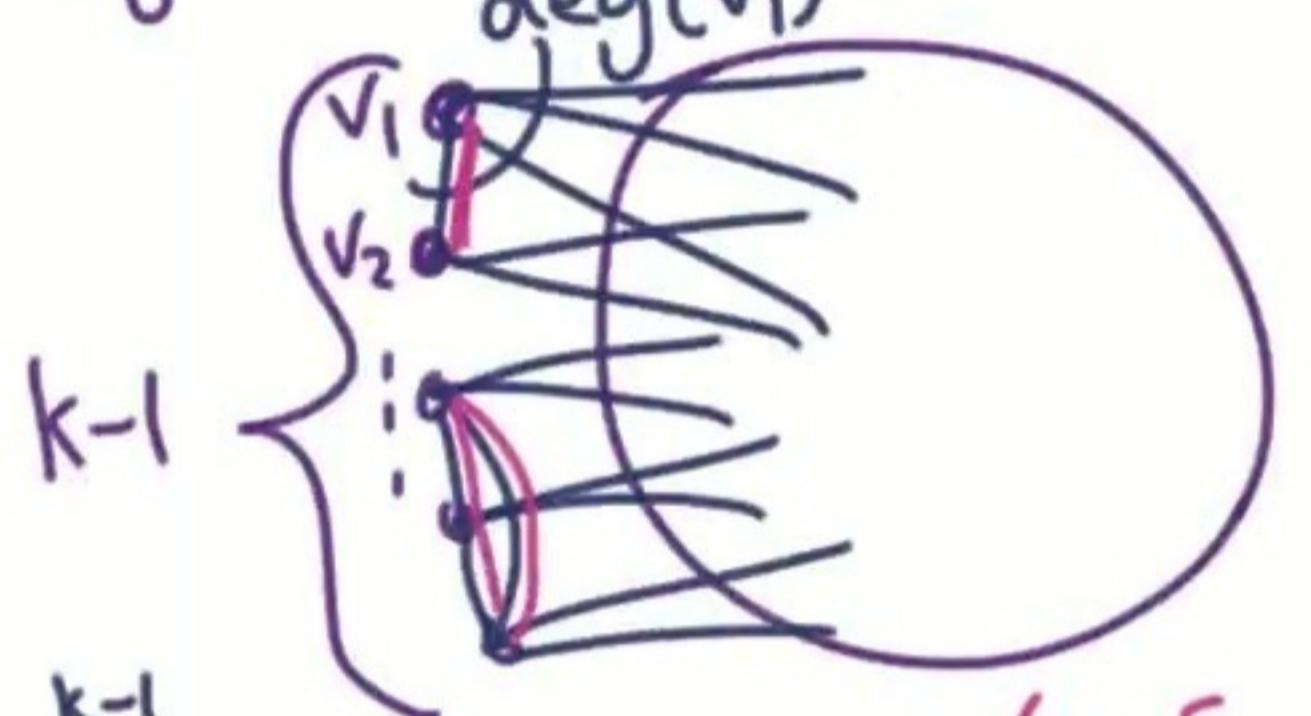
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- min k-cut should only cut k-1 heavy edges  $((k-1)n^2)$

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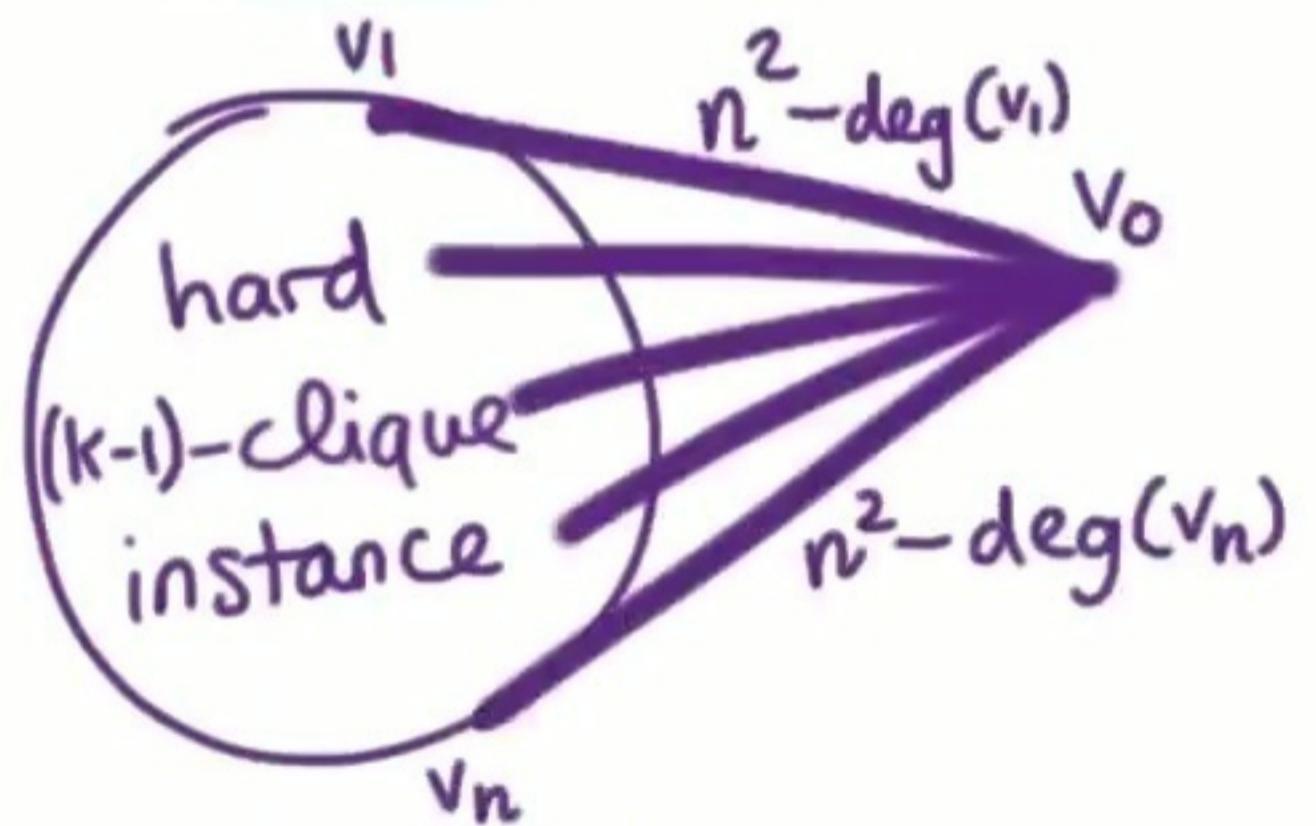


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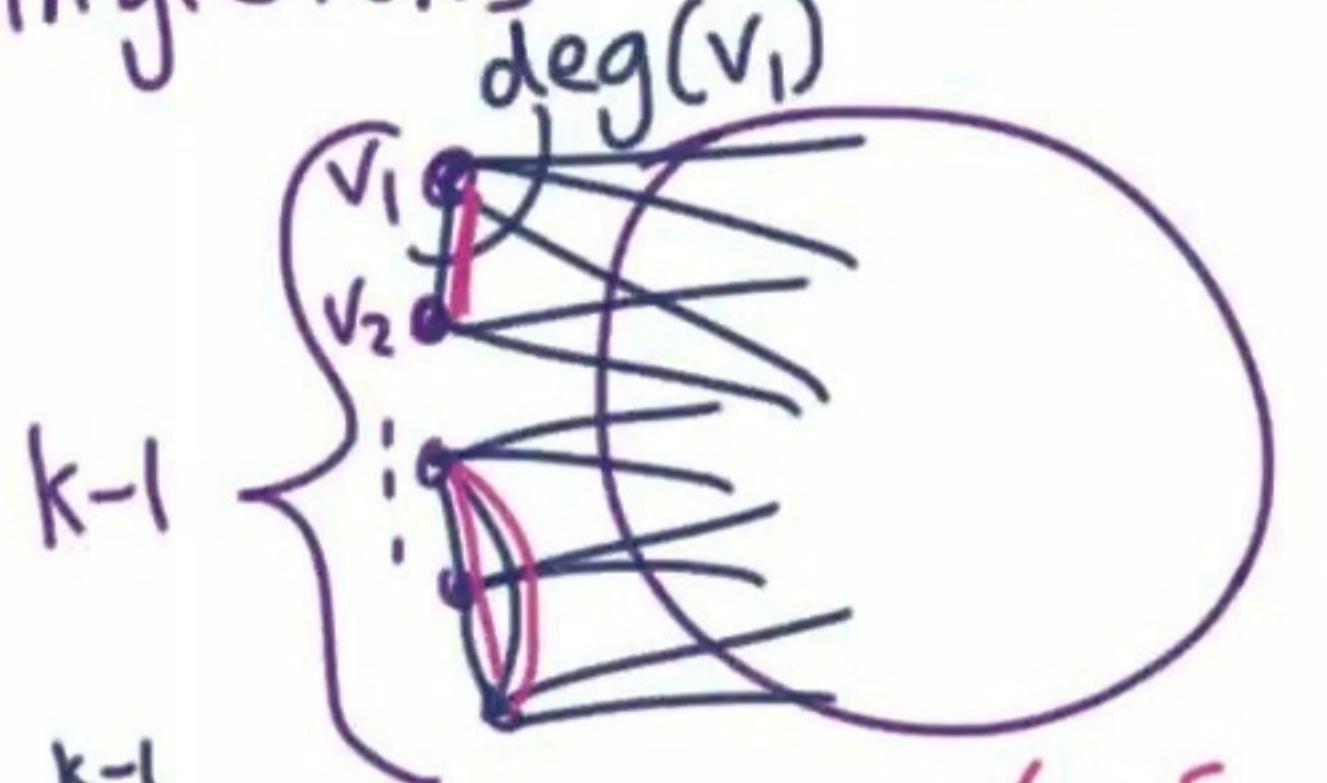
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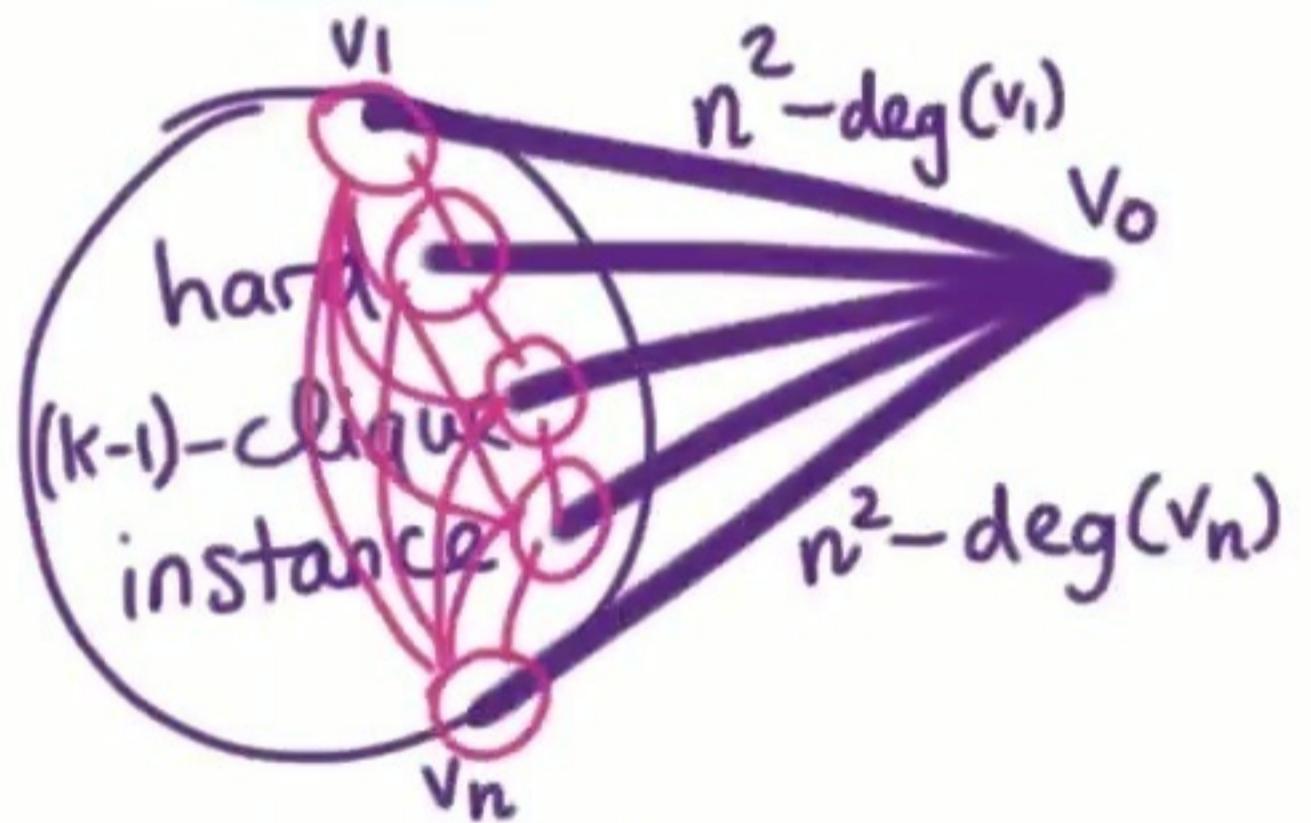
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- $(k-1)$ -clique  $\Leftrightarrow$  min k-cut is  $(k-1)n^2 - \binom{k}{2}$

## Thorup's Tree Packing

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## Thorup's Tree Packing

- Thm [Thorup'08]: Can find  $\text{poly}(n)$  spanning trees of  $G$  with the following property:

For any min  $k$ -cut,  $\exists$  tree s.t. the  $k$ -cut cuts  $\leq 2k-2$  edges of the tree:  $|E_T[v_1^*, \dots, v_k^*]| \leq 2k-2$



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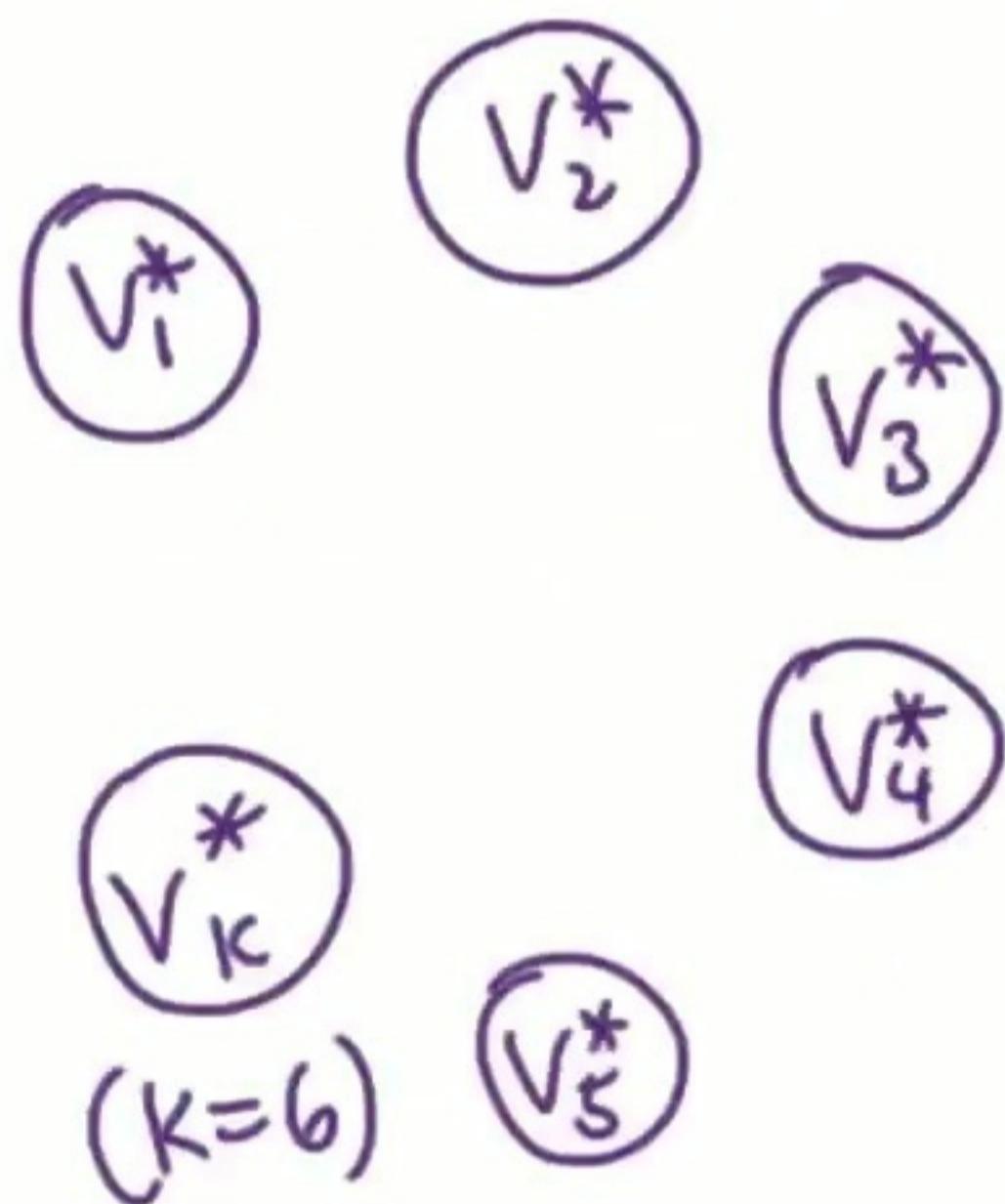
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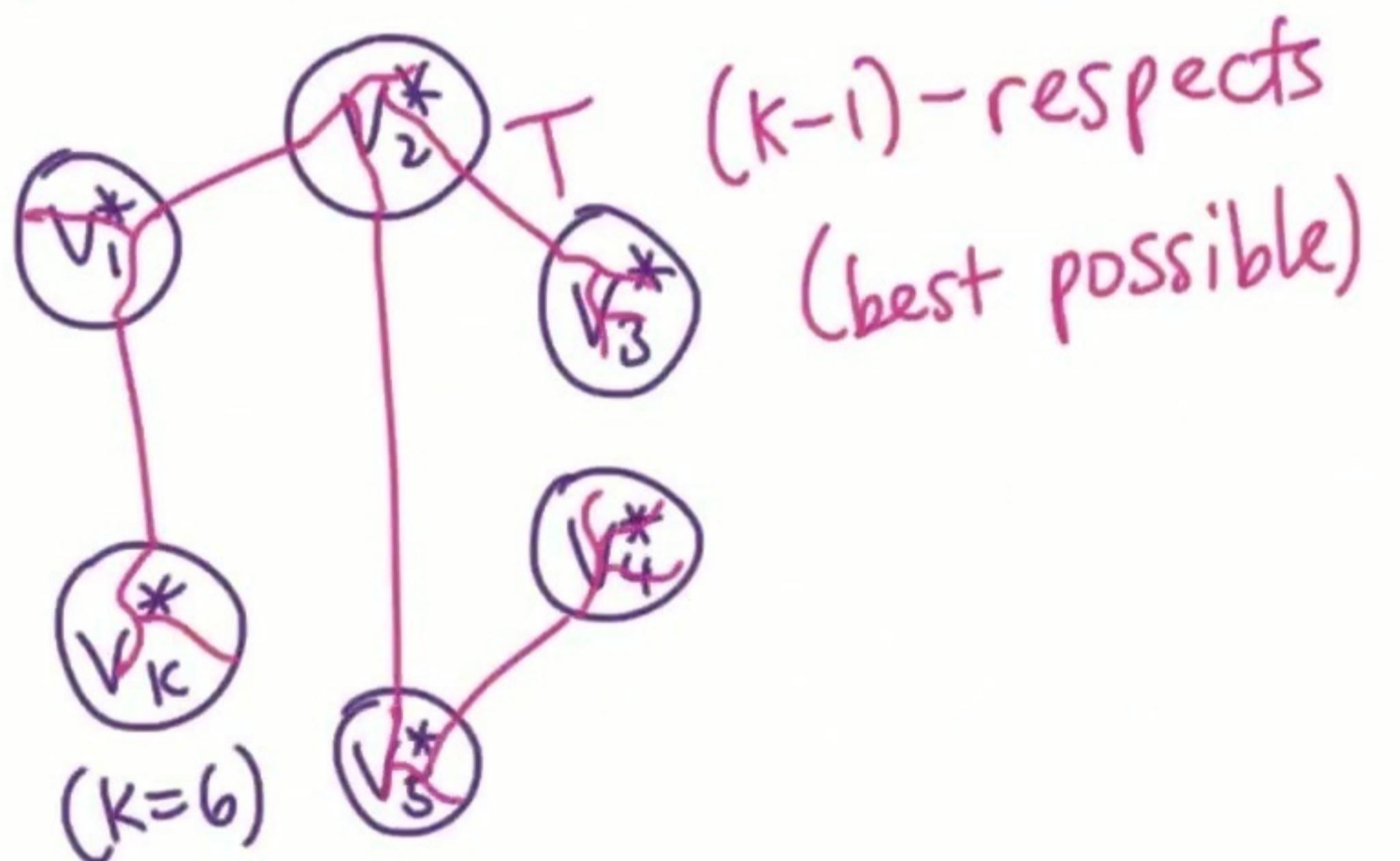
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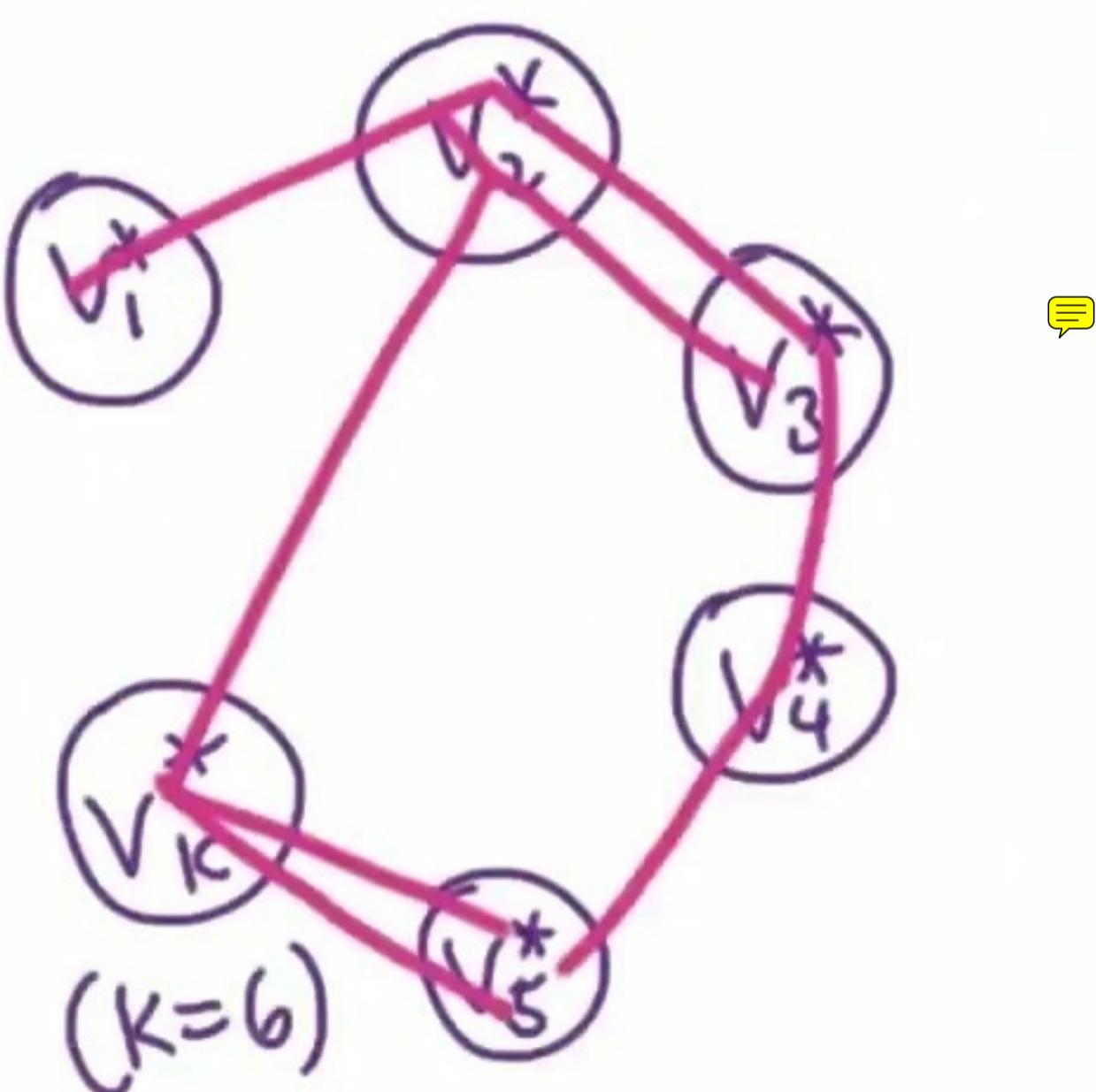
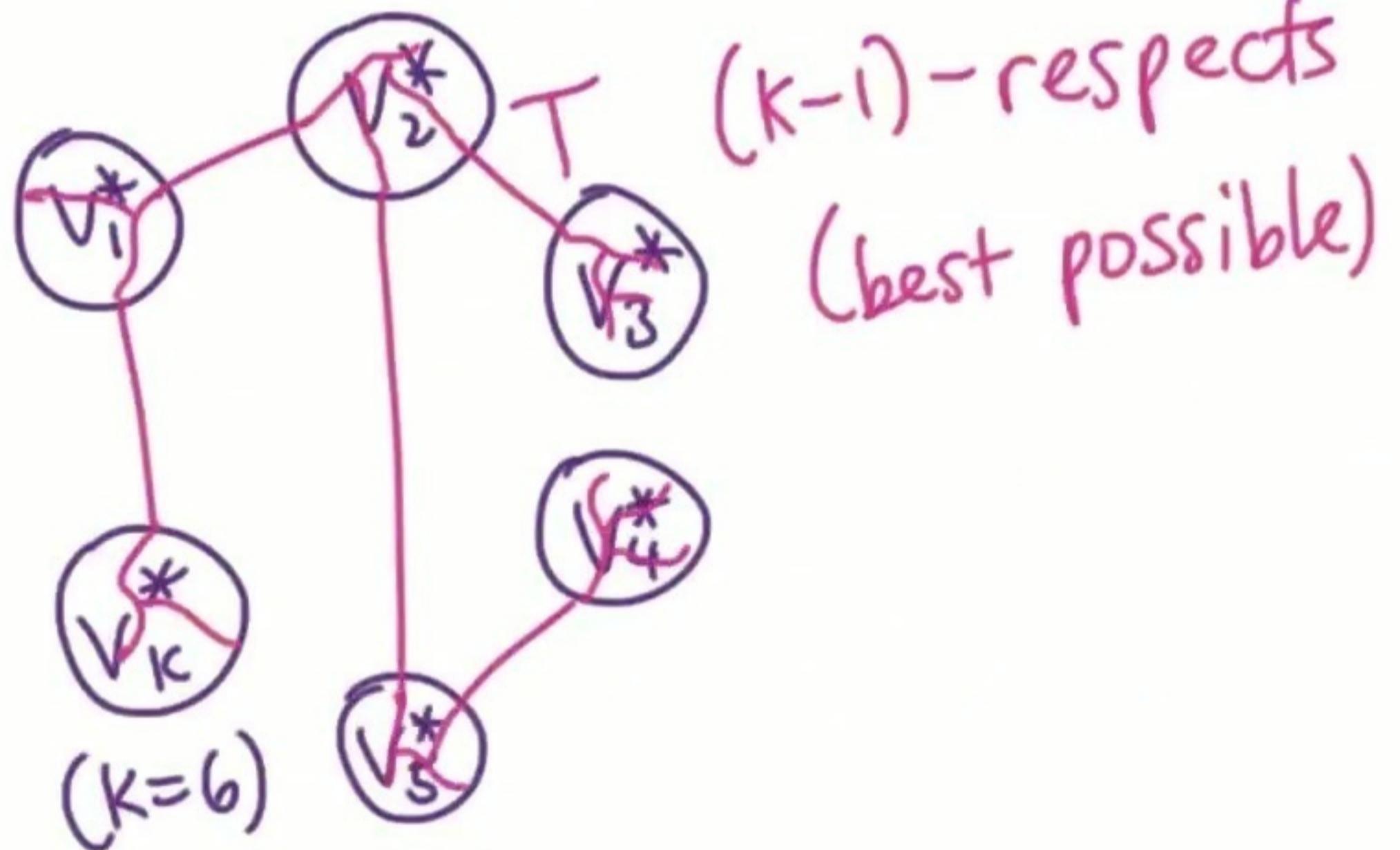
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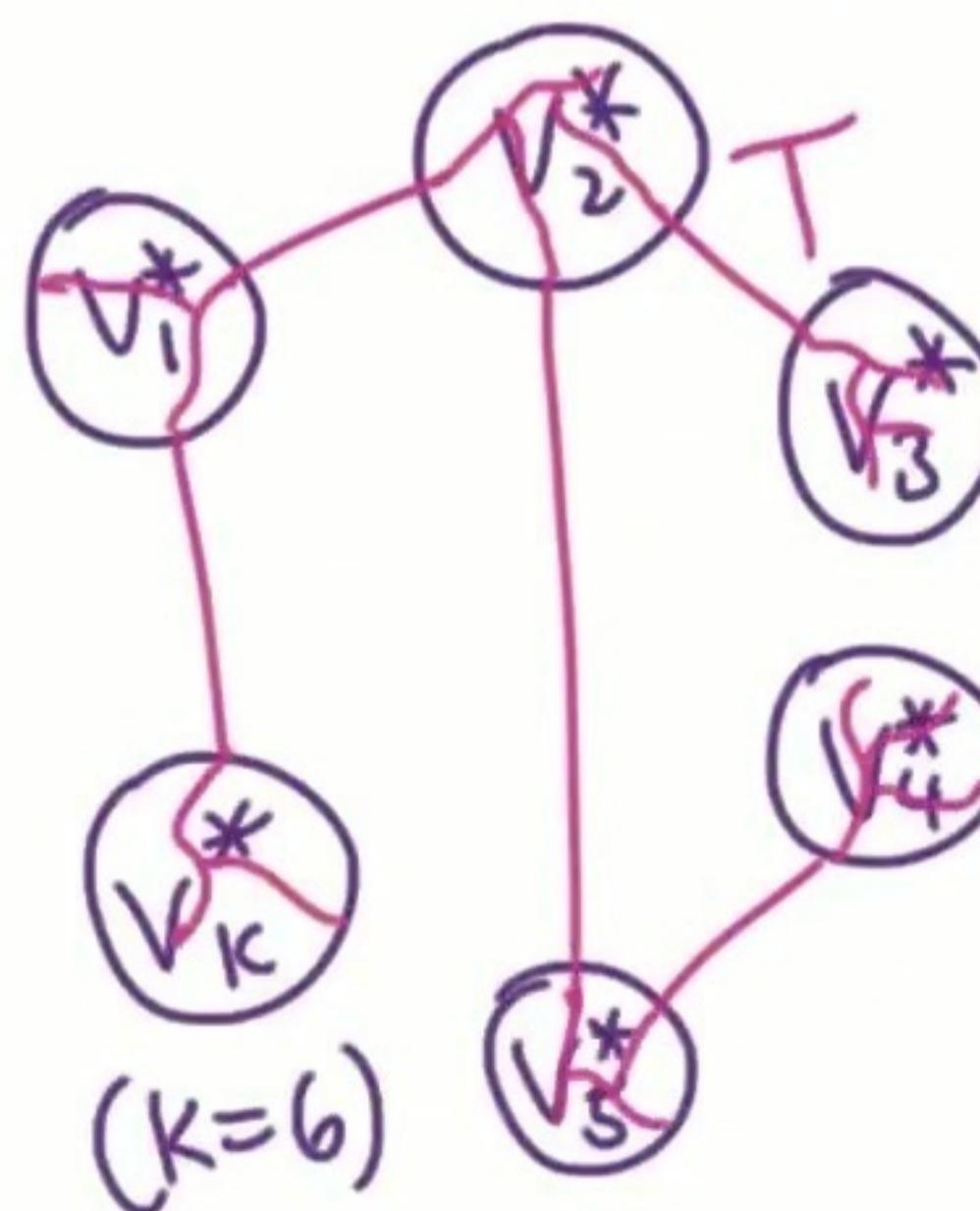


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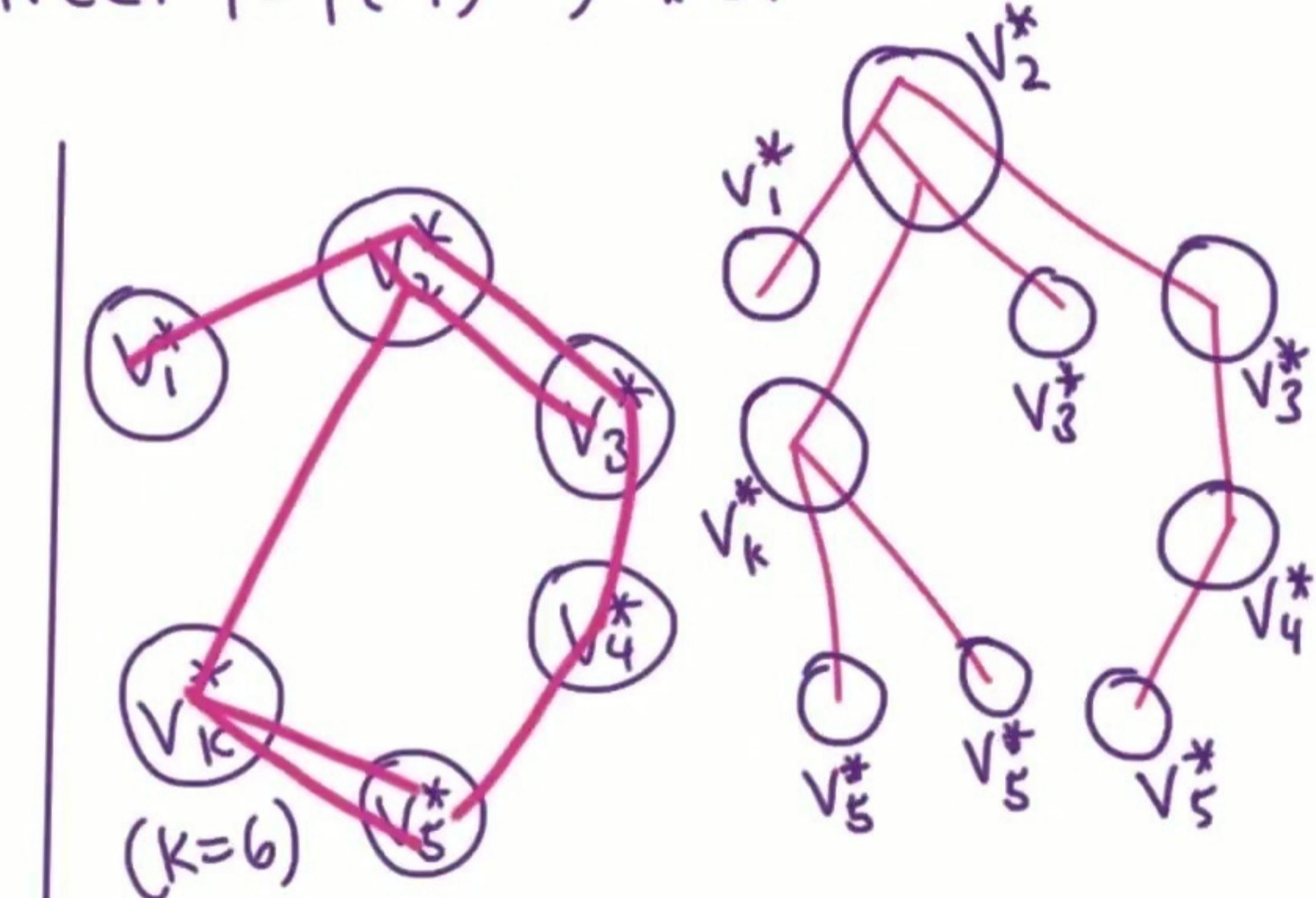
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(k-1)-respects  
(best possible)

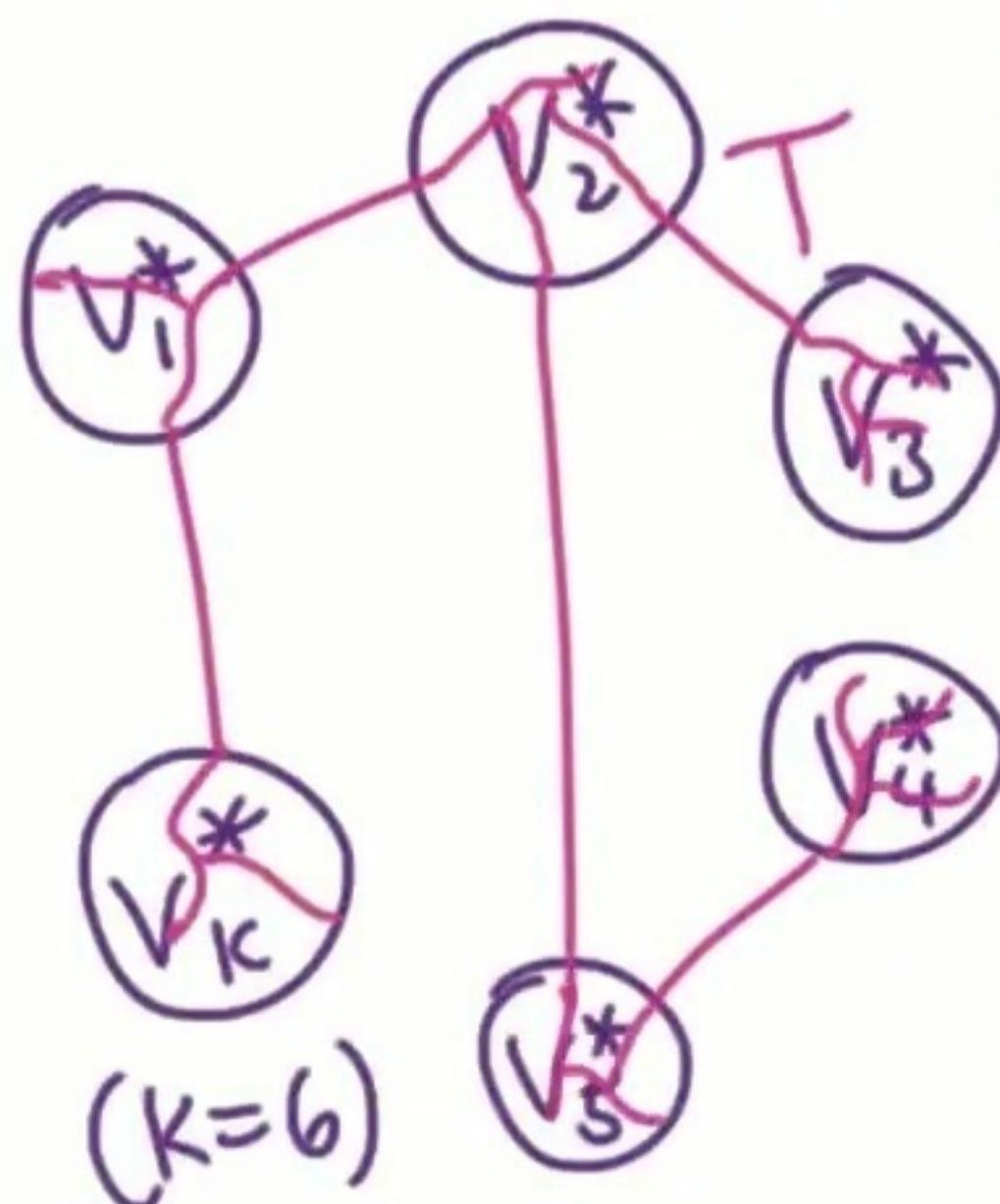


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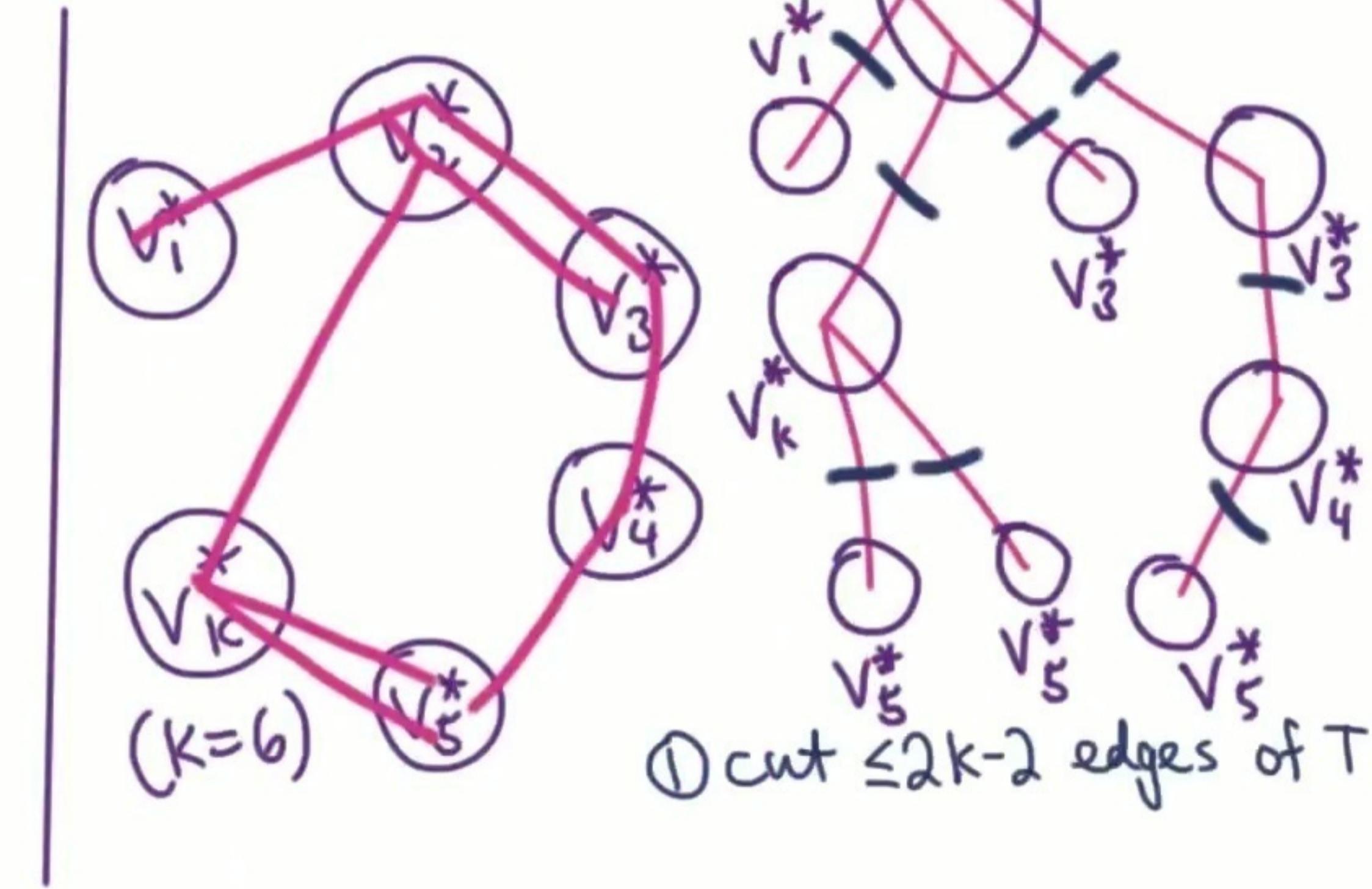
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( $k-1$ )-respects  
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( $k=6$ )



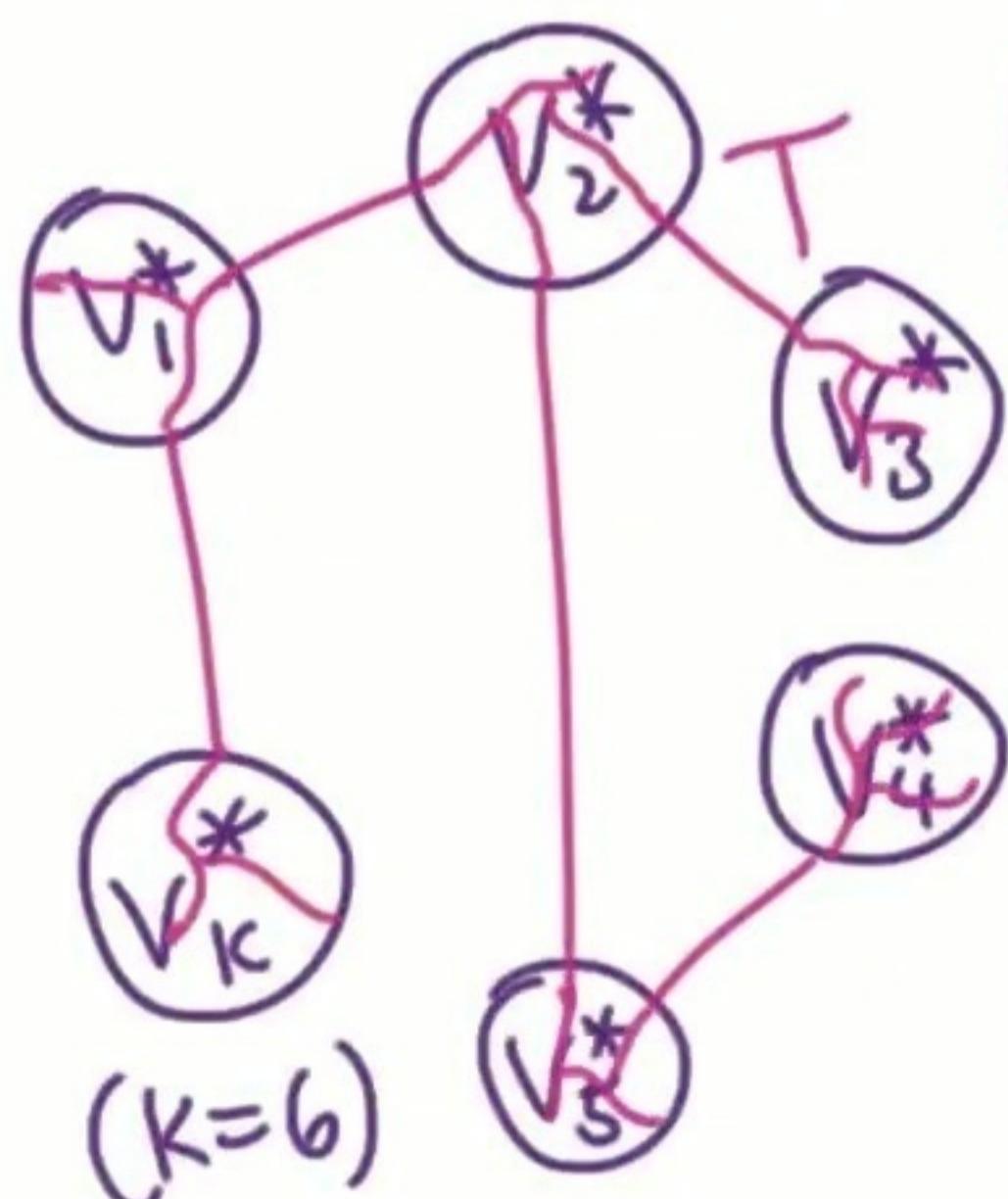
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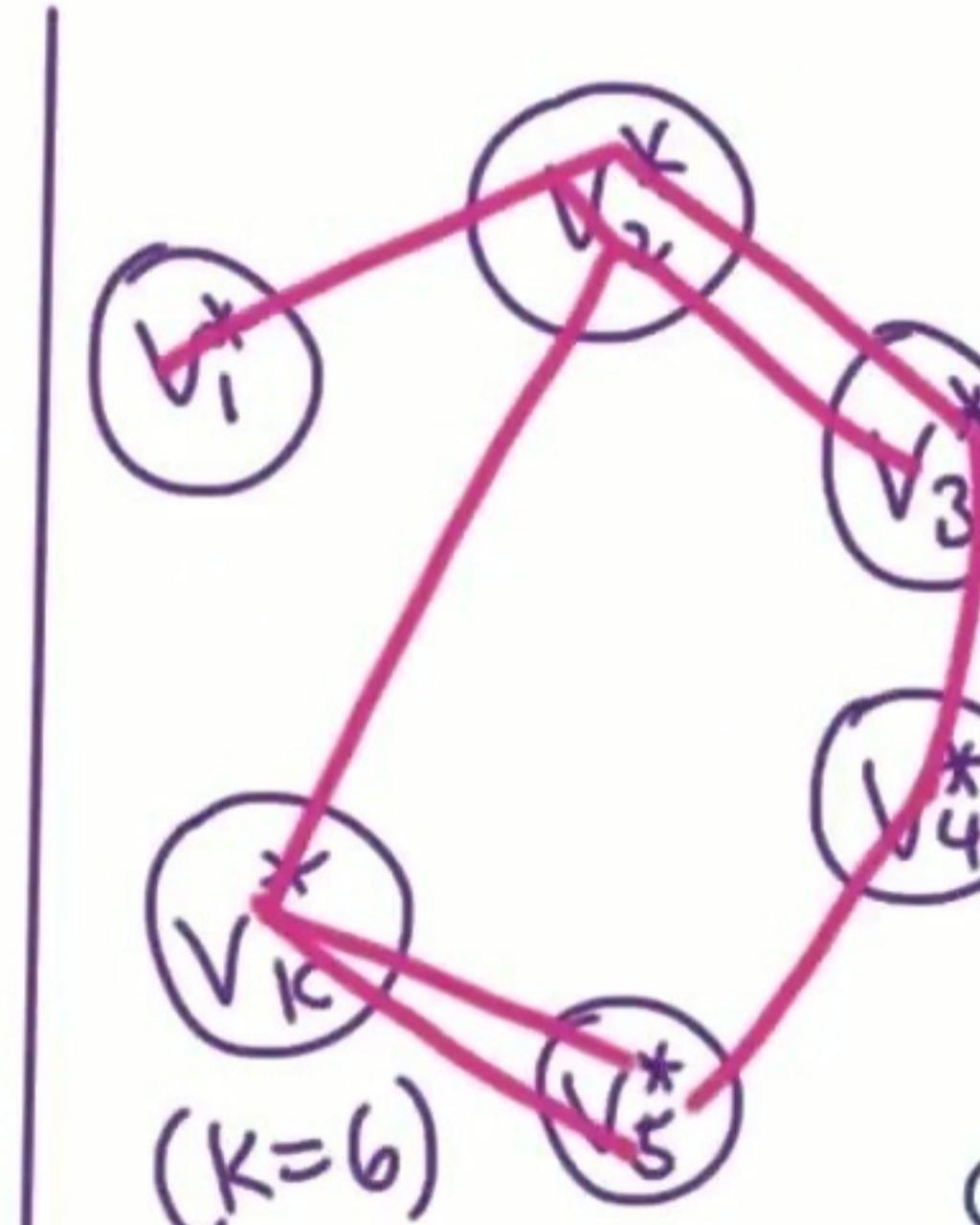
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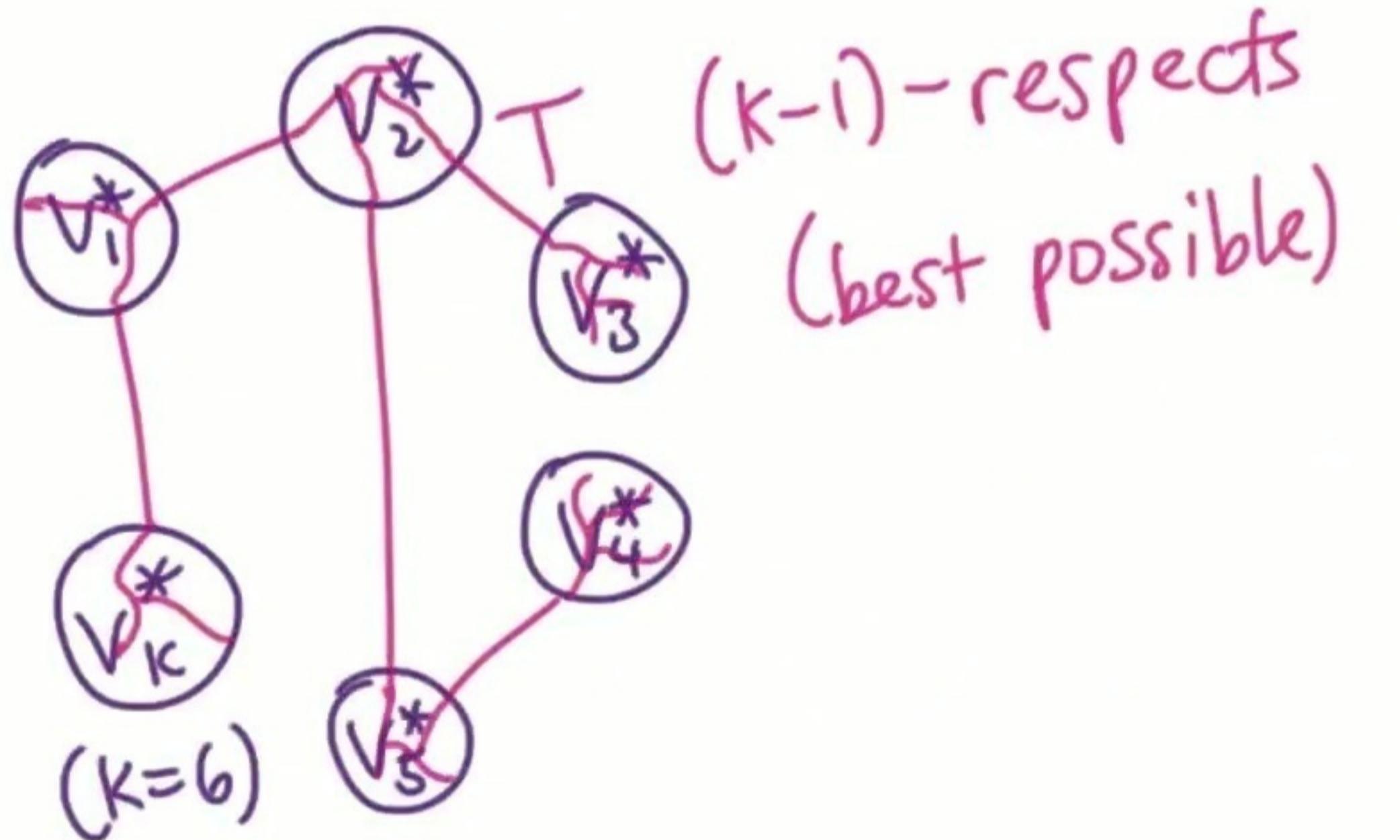
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- ② merge comps

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 $\rightarrow$  Thorup's tree packing  
 Reduction to  $(k-1)$ -resp.  
 $k$ -clique-like mix. mult.  
 Hardness  $n^{(\omega/3)k}$

# Matrix Multiplication

Easy case: ①  $(k-1)$ -respects tree

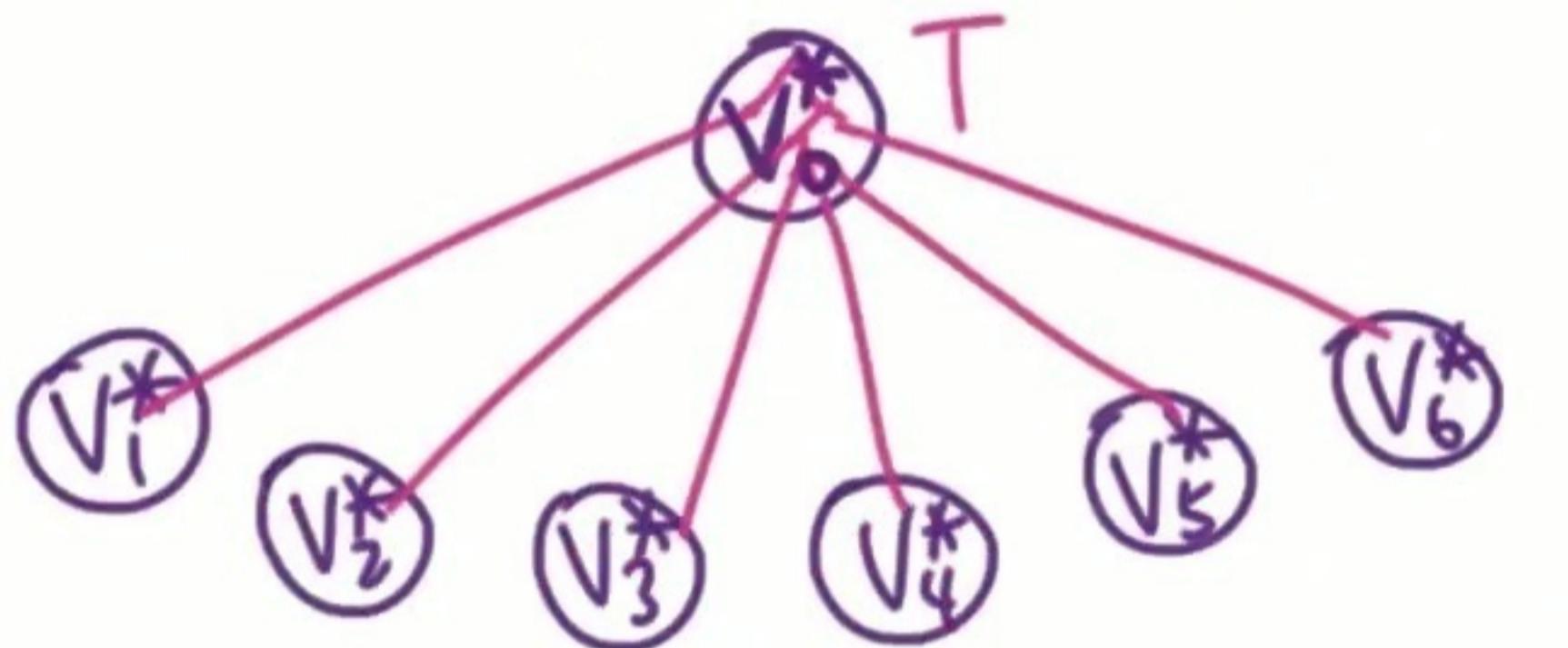
Exact  $n^{(1+w/3)k}$   
Thorup's tree packing  
Reduction to  $(k-1)$ -resp.  
 $\rightarrow$  k-clique-like mtx.mult.  
Hardness  $n^{(w/3)k}$



# Matrix Multiplication

Easy case:

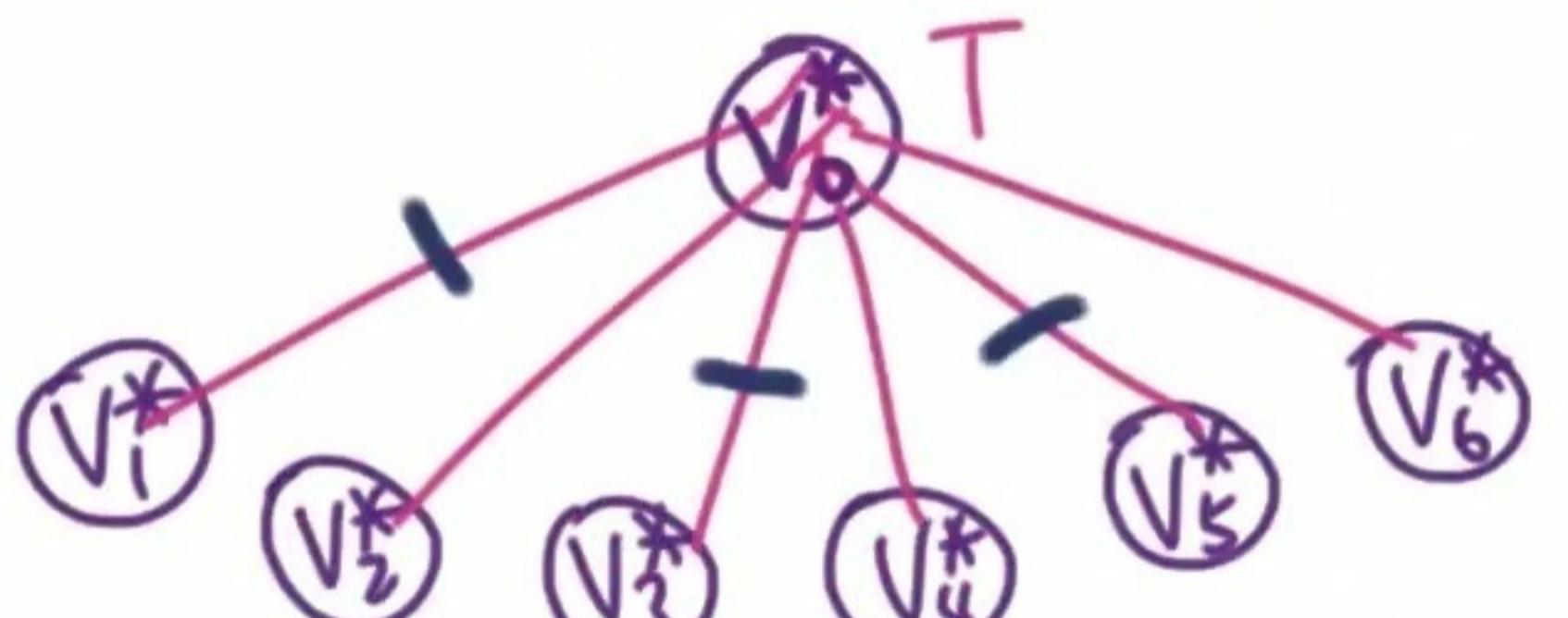
- ①  $(k-1)$ -respects tree
- ②  $T$  connects  $V_i^*$  in a star



Exact  $n^{(l+w/3)k}$   
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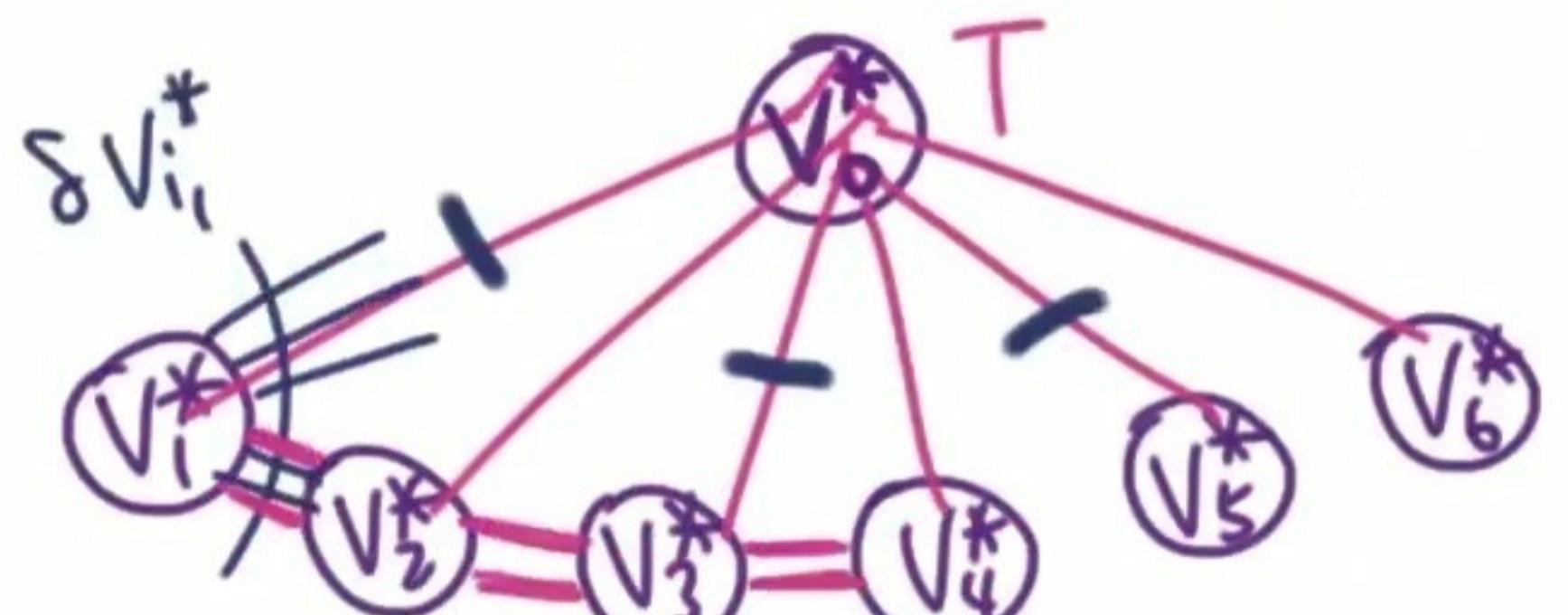


$k$ -cut: isolate  $(k-1)$  components  $V_i^*$  to minimize  $k$ -cut between  
 $V_{i_1}^*, V_{i_2}^*, \dots, V_{i_{k-1}}^*$  and  $\overline{V_{i_1}^* \cup \dots \cup V_{i_{k-1}}^*}$

Exact  $n^{(1+w/3)k}$   
Thorup's tree packing  
Reduction to  $(k-1)$ -resp.  
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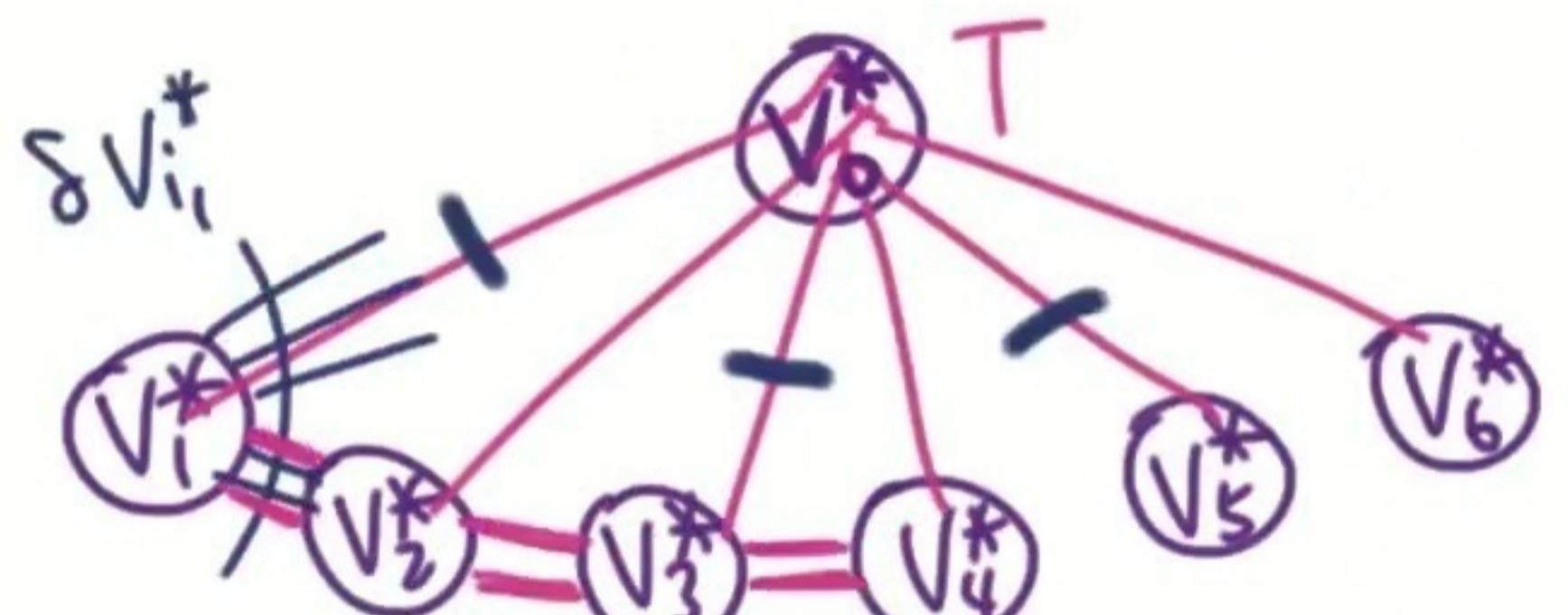
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 $V_{i,1}^*, V_{i,2}^*, \dots, V_{i,k-1}^*$  and  $\overline{V_{i,1}^* \cup \dots \cup V_{i,k-1}^*}$   
 $= \sum w(\delta V_{i,j}^*) - w(E[V_{i,1}^*, \dots, V_{i,k-1}^*])$

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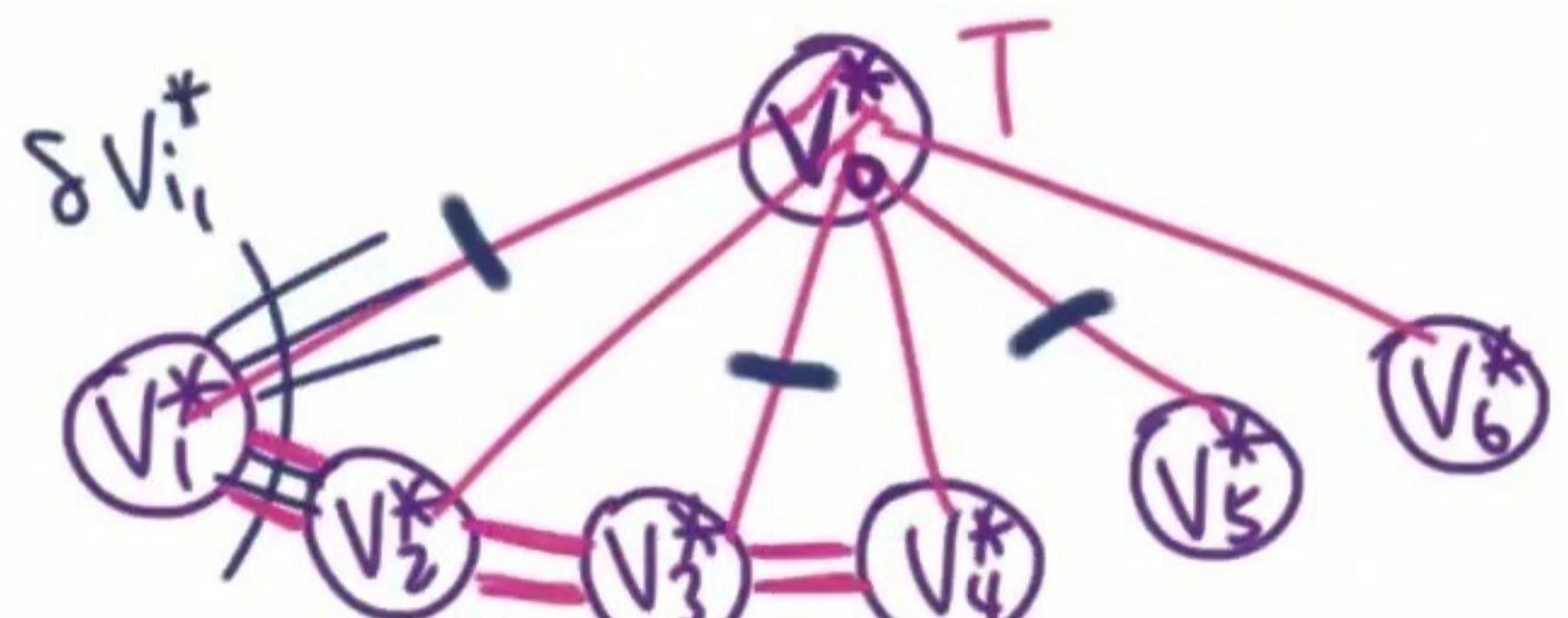
$$= \underbrace{\sum w(\delta V_{i,j}^*)}_{\text{node weights}} - \underbrace{w(E[V_{i,1}^*, \dots, V_{i,k-1}^*])}_{\text{"weight" of a certain } k\text{-clique (negative)}}$$

Exact  $n^{(1+w/3)k}$   
 Thorup's tree packing  
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$$= \sum w(\delta V_{i_j}^*) - w(E[V_{i_1}^*, \dots, V_{i_{k-1}}^*])$$

node weights

"weight" of a certain  $k$ -clique (negative)

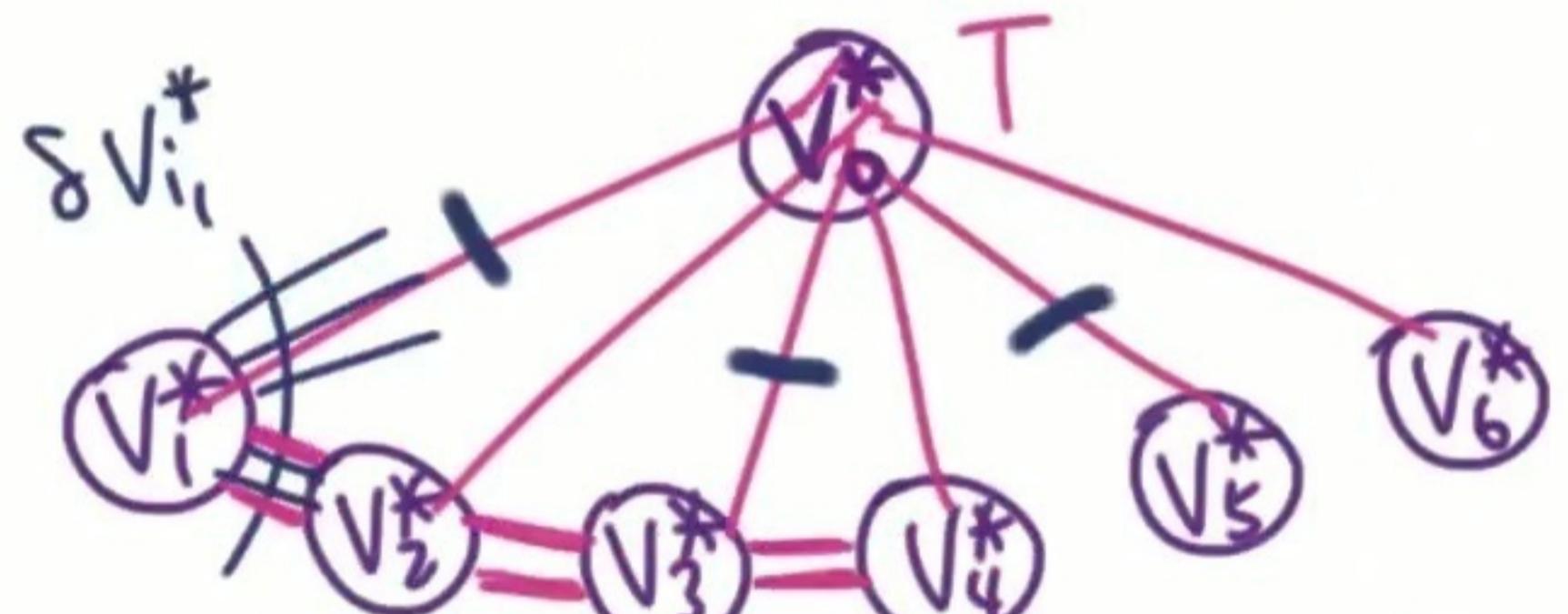
- Unweighted graph: node weights  $w(\delta V_i^*) \in [n^2]$ , edge weights  $-w(E[V_i^*, V_j^*]) \in [-n^2]$

Exact  $n^{(1+w/3)k}$   
 Thorup's tree packing  
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$$= \sum w(\delta V_{i,j}) - w(E[V_{i,1}^*, \dots, V_{i,k-1}^*])$$

node weights

"weight" of a certain  $k$ -clique (negative)

- Unweighted graph: node weights  $w(\delta V_i^*) \in [n^2]$ , edge weights  $-w(E[V_i^*, V_j^*]) \in [-n^2]$
- Can solve node+edge weighted  $k$ -clique, integer weights in  $[-W, W]$ , in  $O(W \cdot n^{(w/3)k})$

Exact  $n^{(l+w/3)k}$   
 Thorup's tree packing  
 Reduction to  $(k-1)$ -resp.  
 →  $k$ -clique-like mtx.mult.  
 Hardness  $n^{(w/3)k}$

## (k-1)-respecting tree

Medium case:

- (k-1)-respects tree, still want  $n^{(w/3)k}$

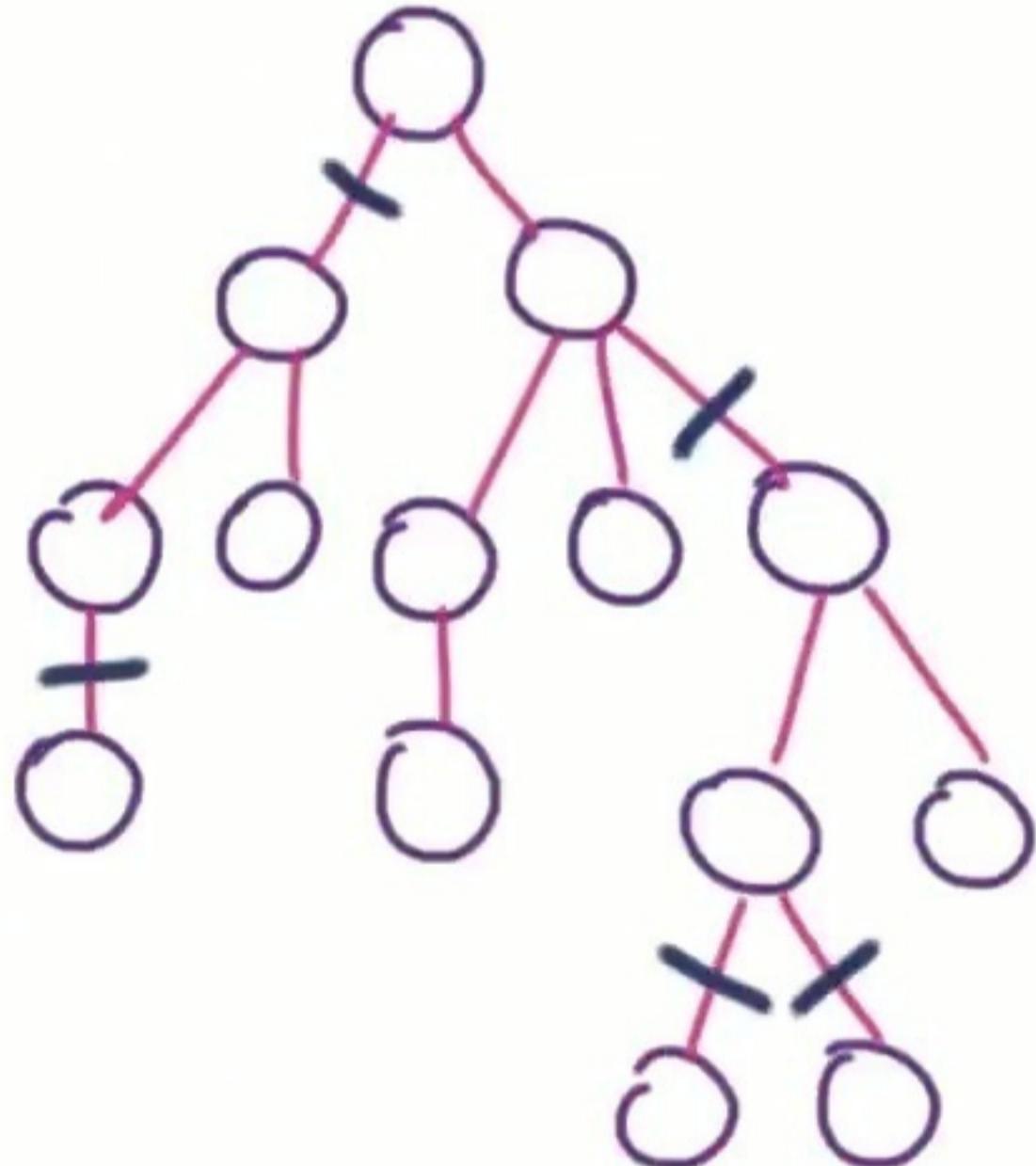
Exact  $n^{(1+w/3)k}$   
Thorup's tree packing  
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## (k-1)-respecting tree

- Medium case: • (k-1)-respects tree, still want  $n^{(w/3)k}$
- k-cut: cut (k-1) edges of tree to minimize k-cut in G  
of the k connected components

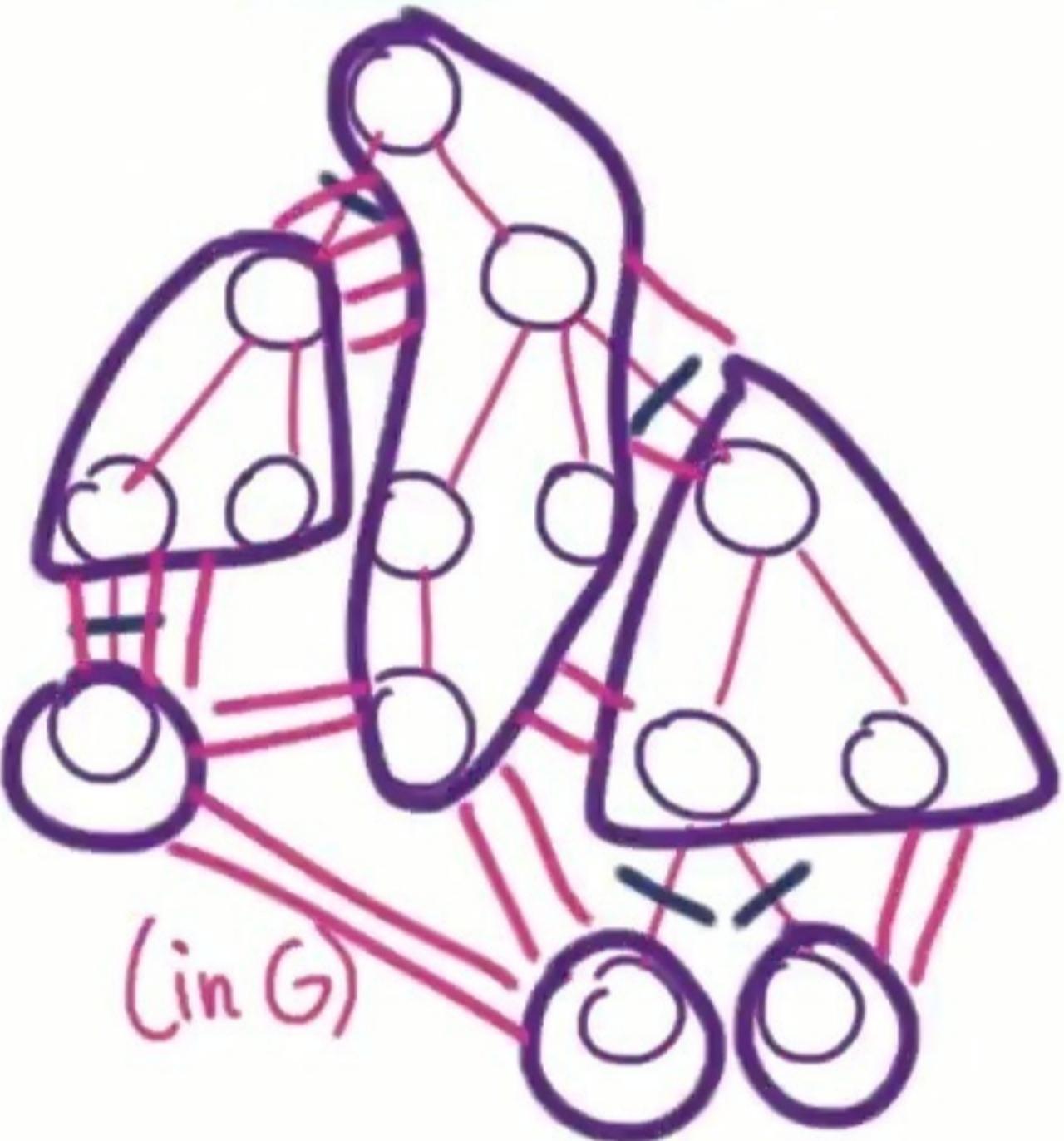
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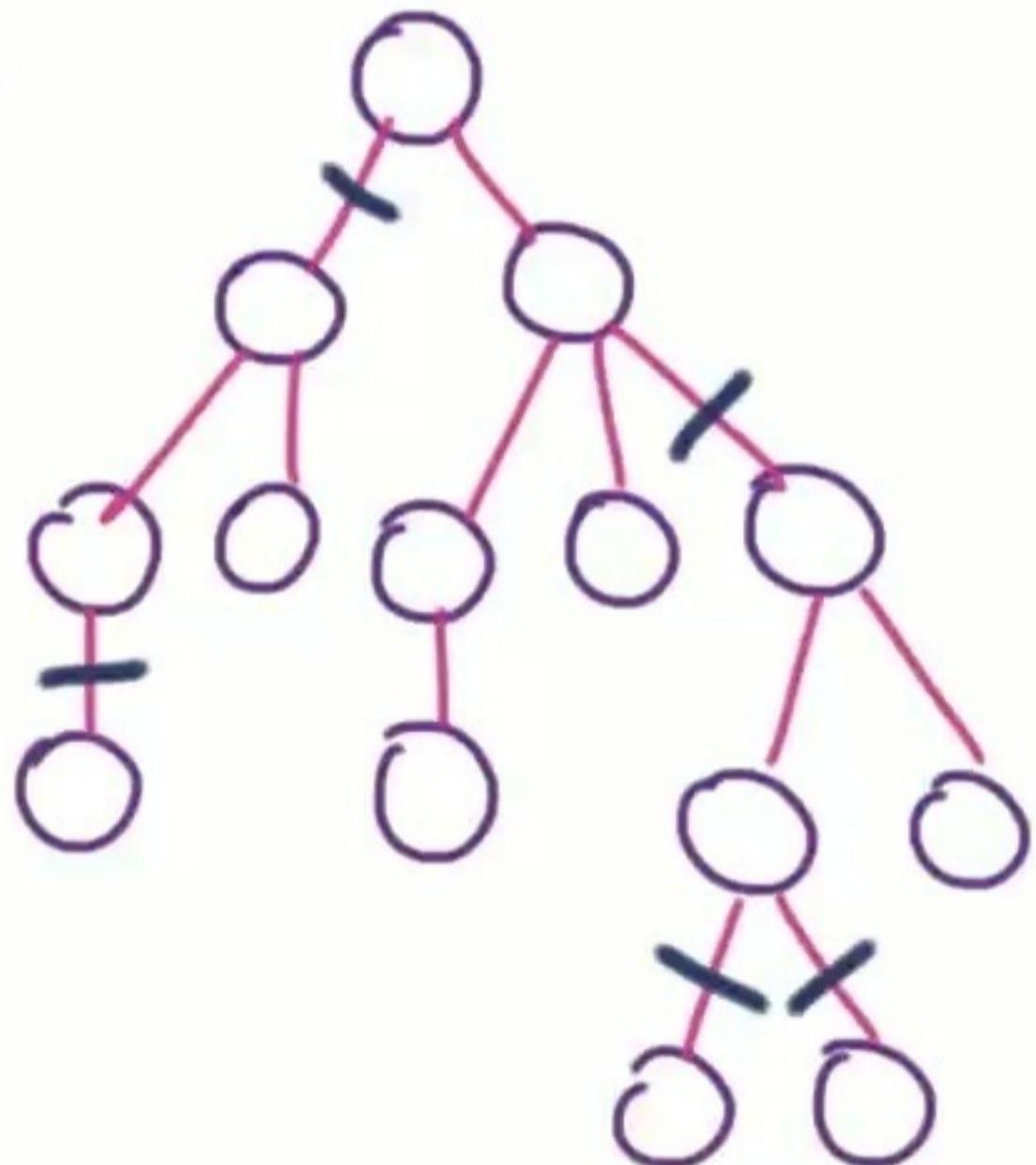


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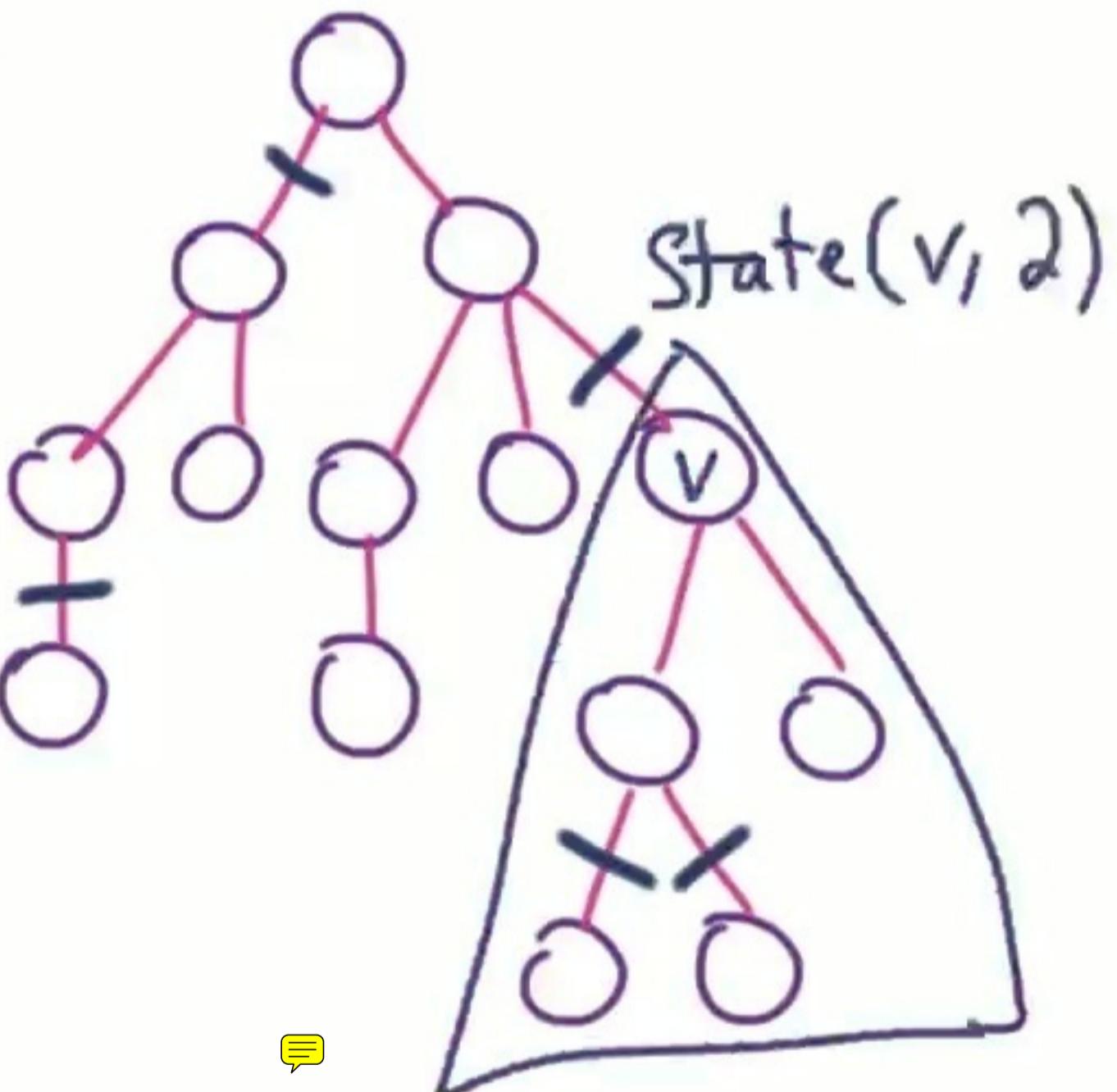


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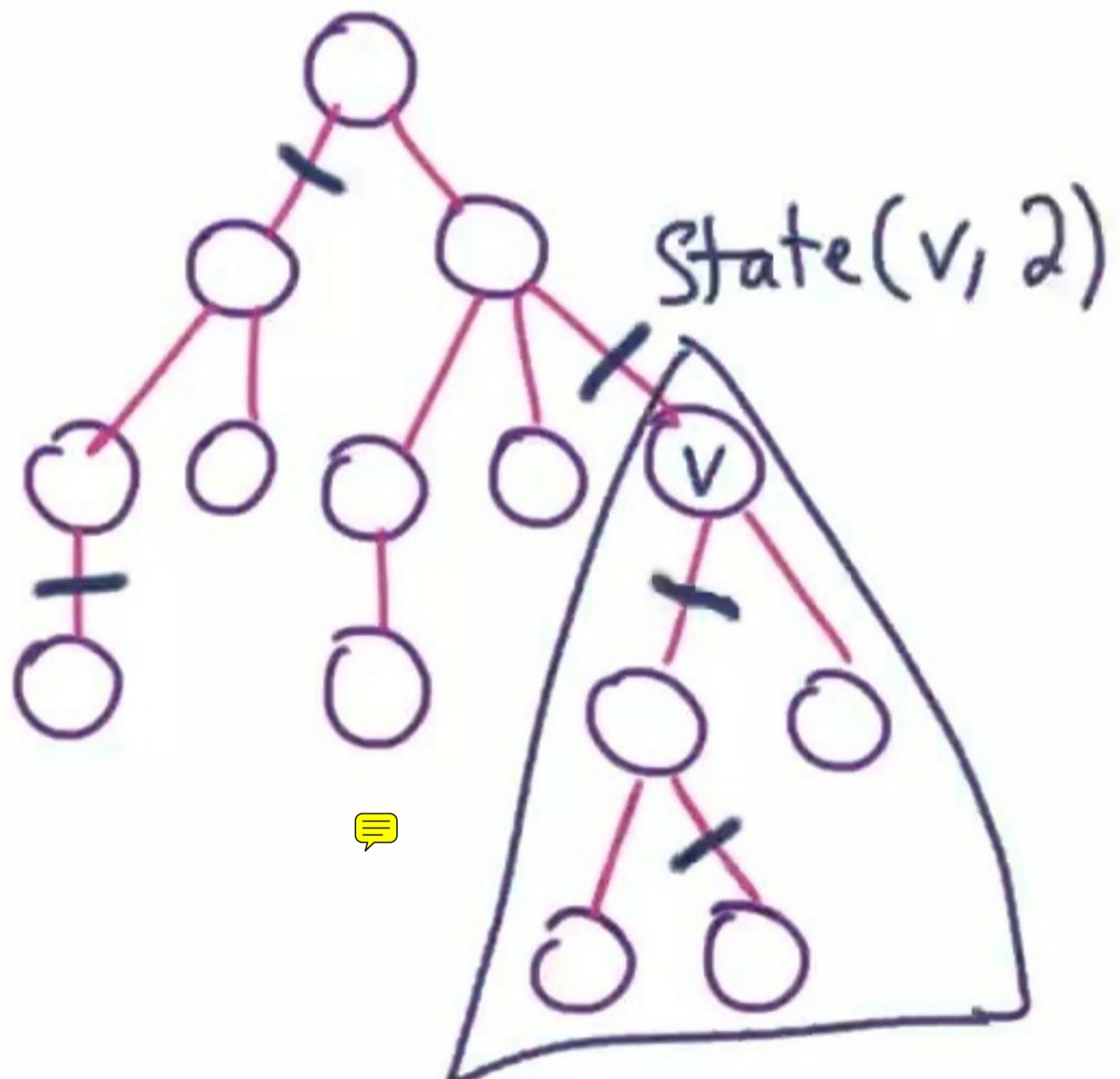


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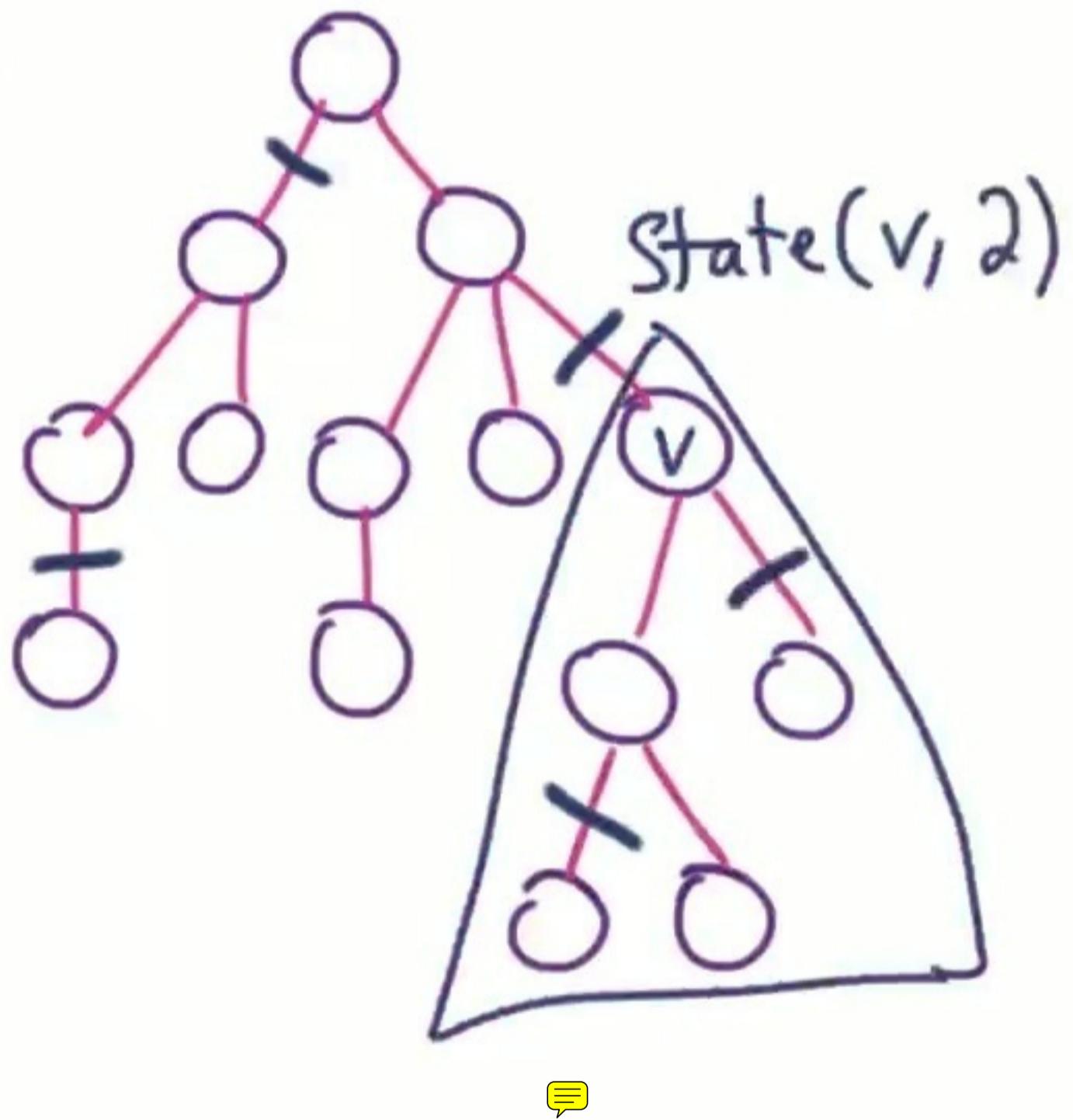


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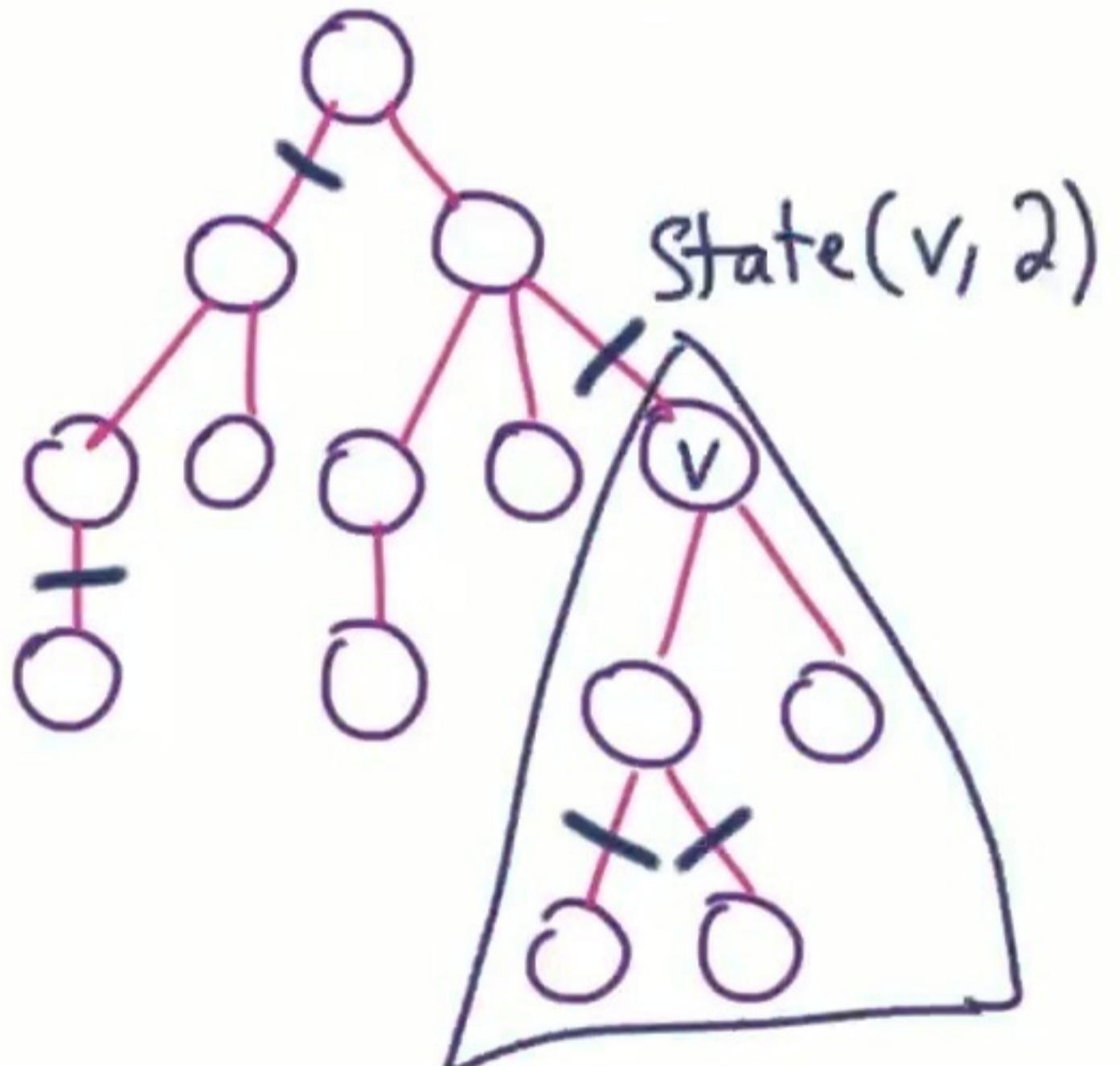
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Intuition: if delete  $v$ 's parent, then  
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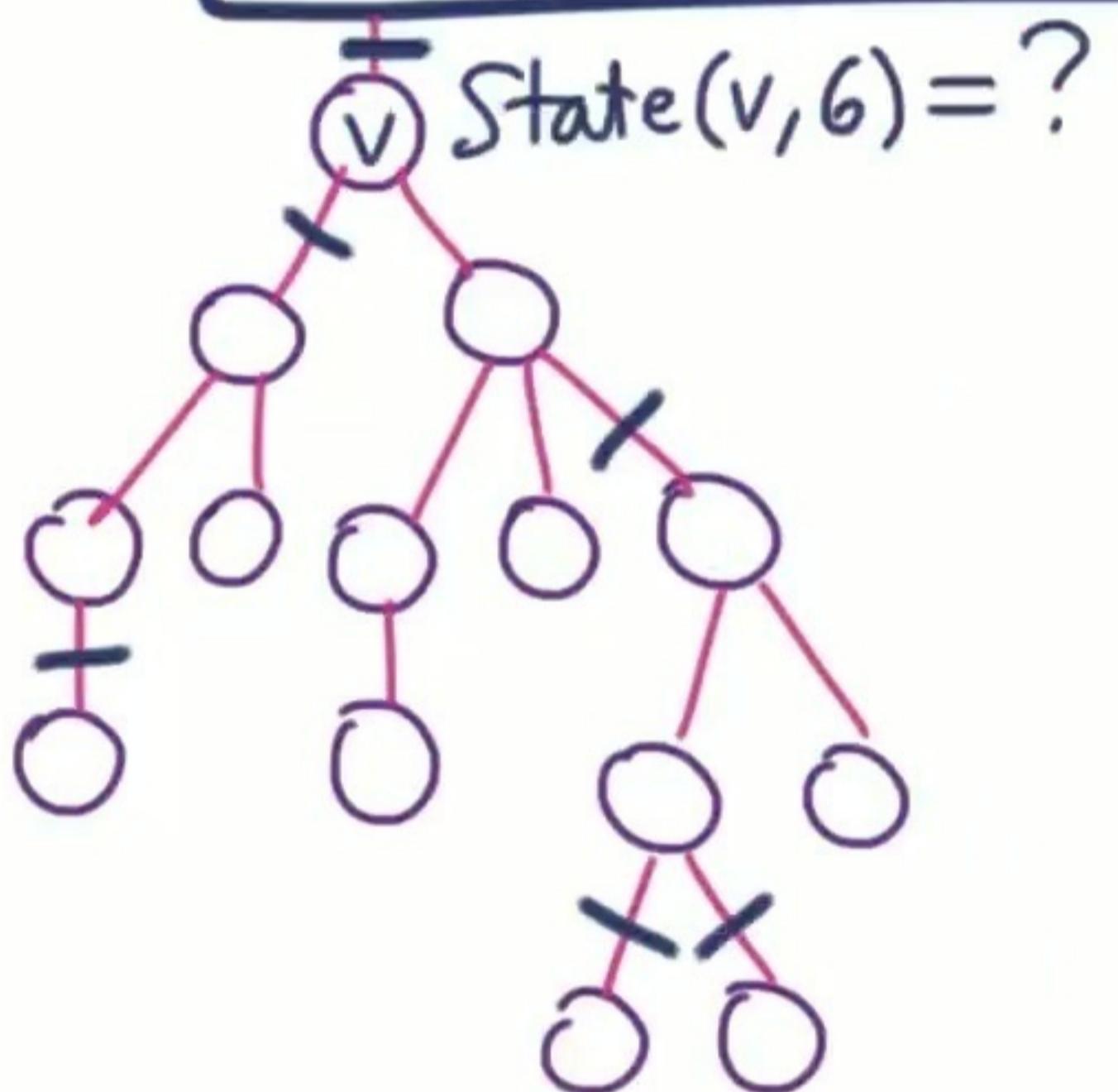
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of the k connected components

DP:  $\text{State}(v, s)$ : best way to delete parent edge  
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v's subtree ( $s \leq k-1$ )

Intuition: if delete v's parent, then  
v's subtree is independent instance

Computing  $\text{State}(v, s)$ :

Exact  $n^{(1+w/3)k}$   
Thorup's tree packing  
Reduction to (k-1)-resp.  
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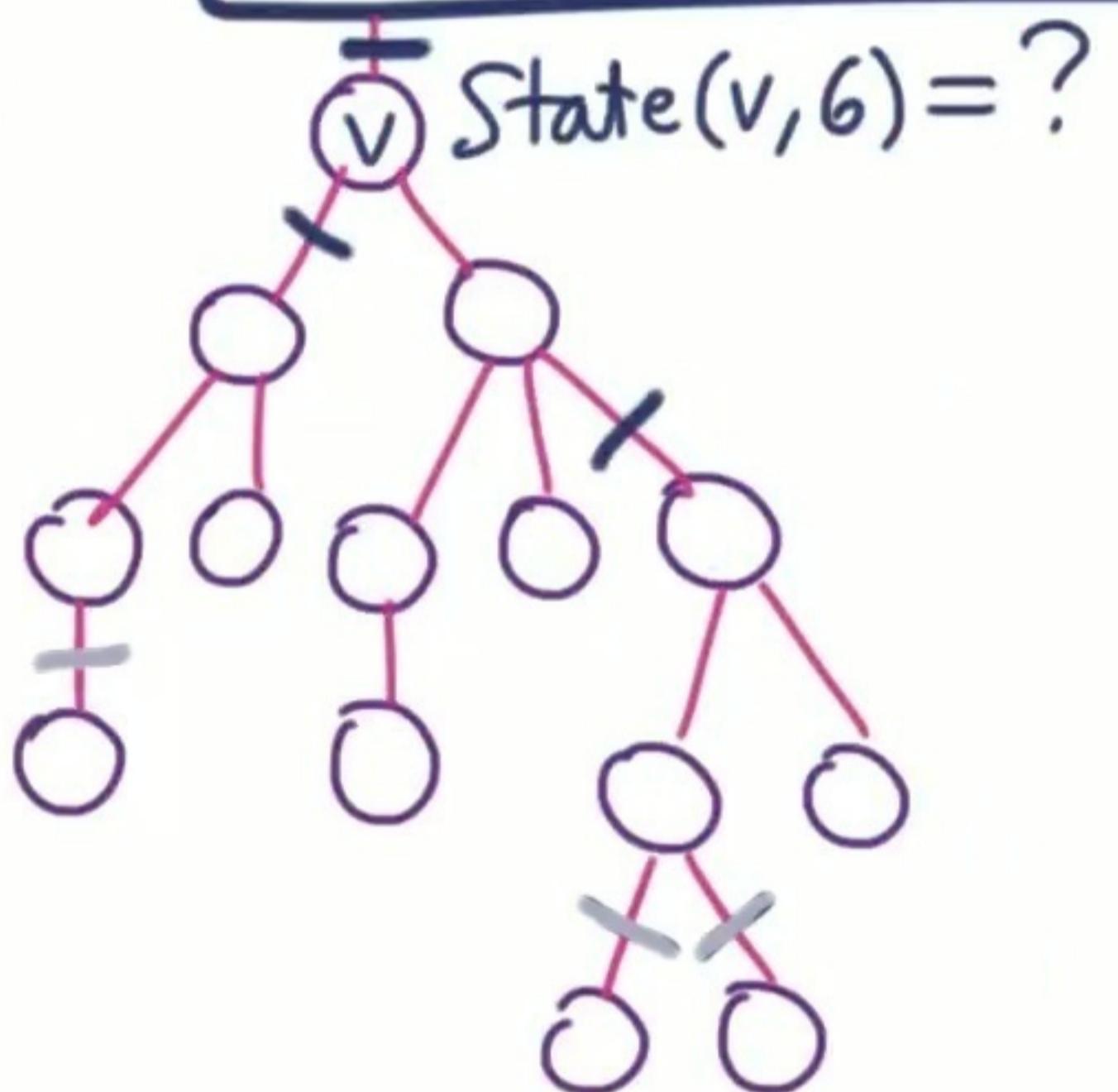
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• focus on "maximal" edges

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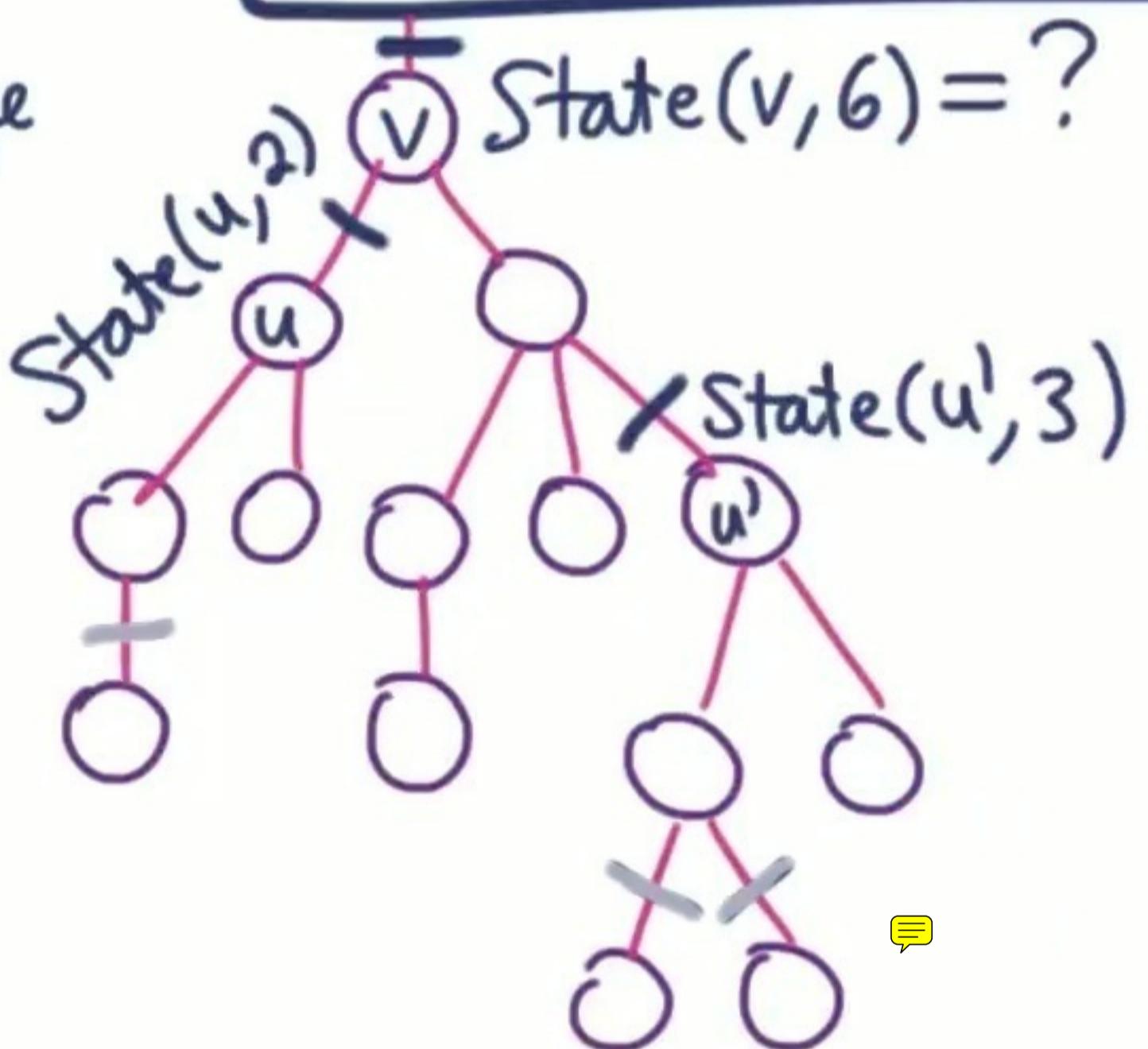
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Computing  $\text{State}(v, s)$ :

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- for each  $u, l$ : node  $(u, l)$  with node weight  $\text{State}(u, l)$

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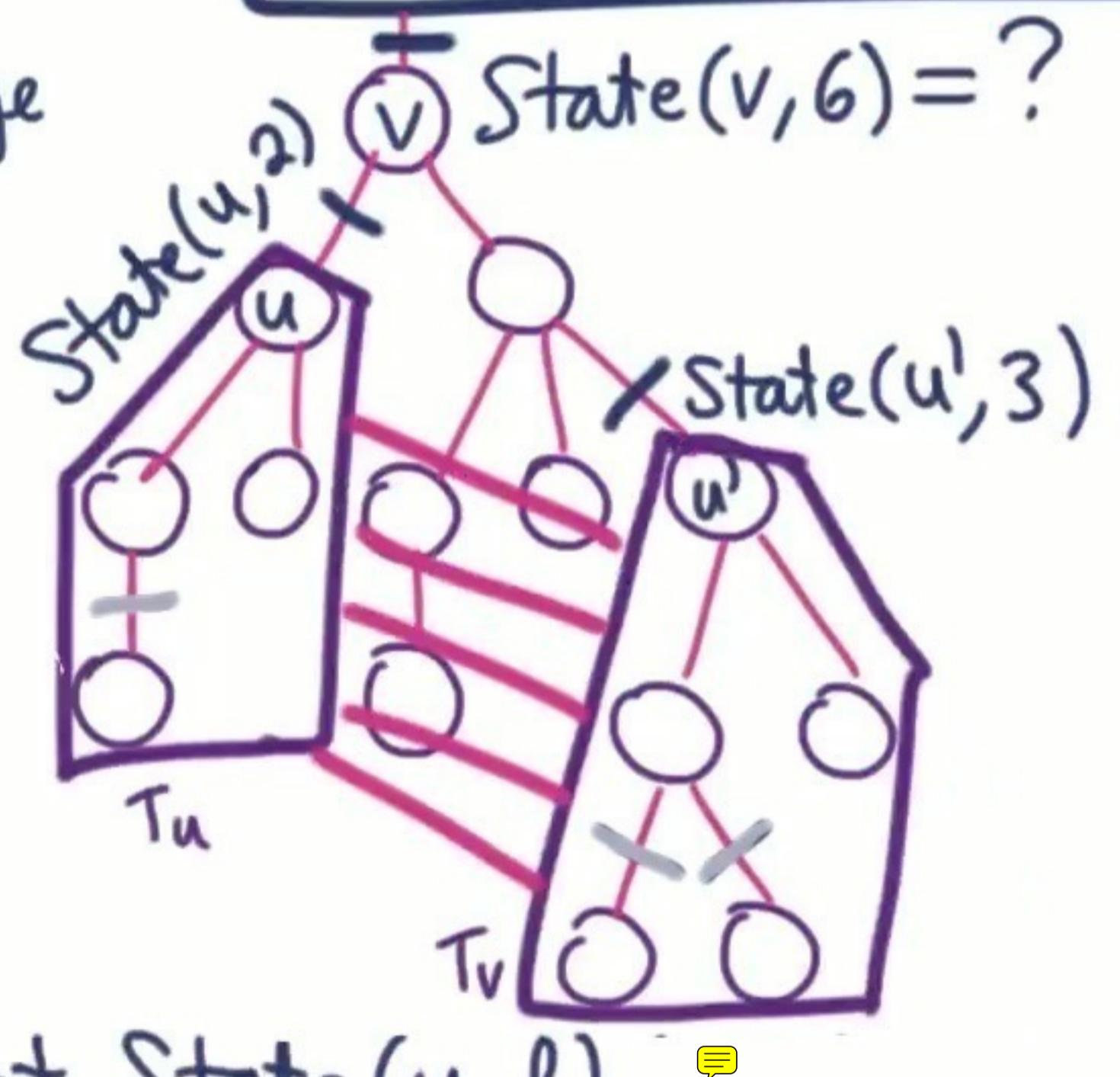
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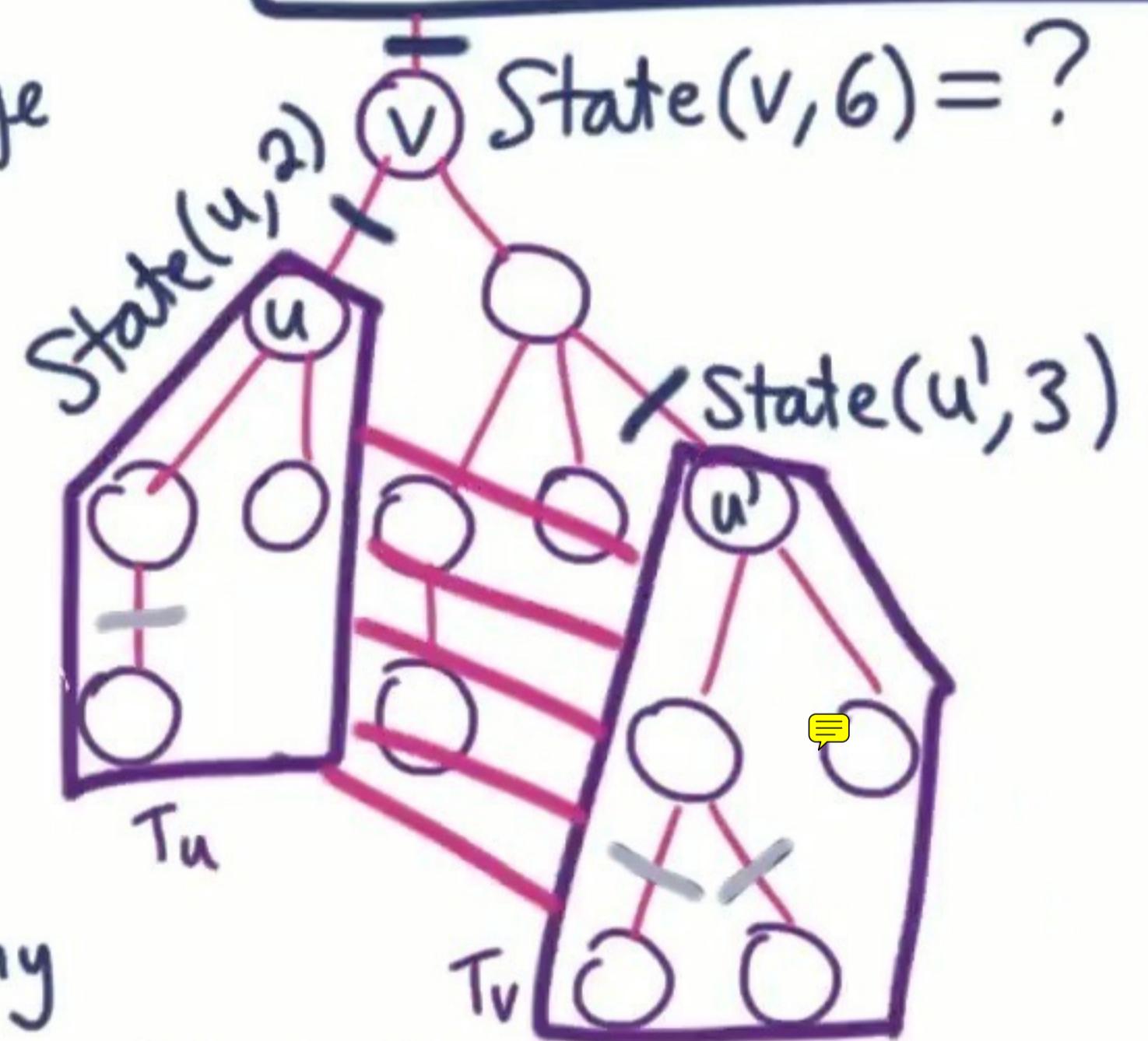
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 v's subtree is independent instance

Computing  $\text{State}(v, s)$ :

- focus on "maximal" edges, suppose  $r$  many
- for each  $u, l$ : node  $(u, l)$  with node weight  $\text{State}(u, l)$
- for each  $u, l$ ,  $v, l'$ :  $-w(E[T_u, T_v])$
- Edge weight between  $(u, l), (v, l')$ :  $-w(E[T_u, T_v])$
- Find min node+edge weight r-clique  $(u_1, l_1) \dots (u_r, l_r)$  s.t.  $\sum l_i = s-1$



Exact  $n^{(l+w/3)k}$   
 Thorup's tree packing  
 Reduction to (k-1)-resp.  
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## $2k-2 \rightarrow (k-1)$ -respecting

Thm: Given a  $(2k-2)$ -respecting tree, can compute  $f(k)n^k$  many trees s.t. one of them is  $1$ -respecting, w.h.p.

Exact  $n^{(1+\omega/3)k}$   
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•  $\Rightarrow f(k)n^{k+O(1)}$  trees, one of which is  $(k-1)$ -resp.

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 $\Rightarrow f(k)n^{k+O(1)}$  trees, one of which is  $(k-1)$ -resp.
- $n^{(w/3)k}$  time per tree,  $f(k)n^{(1+w/3)k+O(1)}$  total

Exact  $n^{(1+w/3)k}$   
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 $k$ -clique-like mtx.mult.  
Hardness  $n^{(w/3)k}$

## $(1+\varepsilon)$ -approx k-cut

Thm: Given  $(k-1)$ -respecting tree, can find  
 $(1+\varepsilon)$ -apx k-cut in  $f(k, \varepsilon) \text{poly}(n)$  (FPT)  
time

Exact  $n^{(1+w/3)k}$   
Thorup's tree packing  
Reduction to  $(k-1)$ -resp.  
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• Exact is impossible in FPT ( $\text{W}[1]$ -hard)

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time

- Exact is impossible in FPT ( $\text{W}[1]$ -hard)
- Uses approximation algo techniques ( $\varepsilon$ -nets) combined with FPT techniques (color-coding)

Apply thm on each of  $f(k)n^{k+O(1)}$  trees  
 $\Rightarrow (1+\varepsilon)$ -apx in  $f(k, \varepsilon) n^{k+O(1)}$  time

Exact  $n^{(1+w/3)k}$   
Thorup's tree packing  
Reduction to  $(k-1)$ -resp.  
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## Open problems

Exact  $n^{(1+\omega/3)k}$   
Thorup's tree packing  
Reduction to  $(k-1)$ -resp.  
 $k$ -clique-like mtx.mult.  
Hardness  $n^{(\omega/3)k}$

## Open problems

- Faster exact algo?  $\begin{cases} \text{upper bound } n^{(2\omega/3)k} \\ \text{lower bound } n^{(\omega/3)k} \end{cases}$   
"fine-grained complexity" of k-cut?

Exact  $n^{(1+\omega/3)k}$   
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Reduction to  $(k-1)$ -resp.  
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- Faster exact algo? { upper bound  $n^{(2\omega/3)k}$   
  { lower bound  $n^{(\omega/3)k}$   
    "fine-grained complexity" of k-cut?
- Faster combinatorial exact algo?

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Reduction to  $(k-1)$ -resp.  
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# Open problems

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{ lower bound  $n^{(w/3)k}$   
"fine-grained complexity" of  $k$ -cut?
- Faster combinatorial exact algo?
  - [GLL'18, unpublished]  $f(k) n^{1.99k}$  time  
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  - Lower bound  $n^k$  (combinatorial  $k$ -clique)
- Better approximation?
  - $(1+\varepsilon)$ -apx in  $f(k, \varepsilon) \text{poly}(n)$  time?

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Thorup's tree packing  
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 $k$ -clique-like mtx.mult.  
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