

# Near-**linear** Time Algorithm for Approximate **Minimum Degree** Spanning Trees

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# Min-deg spanning trees

- Given an undirected graph  $G = (V, E)$   
Find a spanning tree  $T$  minimizing  $\max_{u \in V} \deg_T(u)$
- Generalize Hamiltonian Path, thus NP-hard
- Look for approximations

# History

Reference	Approximation	Time
[Fürer and Raghavachari, 1992]	$O(\Delta^* + \log n)$	Poly( $n$ )
[Fürer and Raghavachari, 1994]	$\Delta^* + 1$	$O(mn)$
<b>New</b>	$(1 + \epsilon)\Delta^* + O(\log n/\epsilon^2)$	$O(m \log^7 n/\epsilon^6)$

$\Delta^*$  denotes the minimum spanning tree degree  
 $m$  and  $n$  denote #edges and #vertices

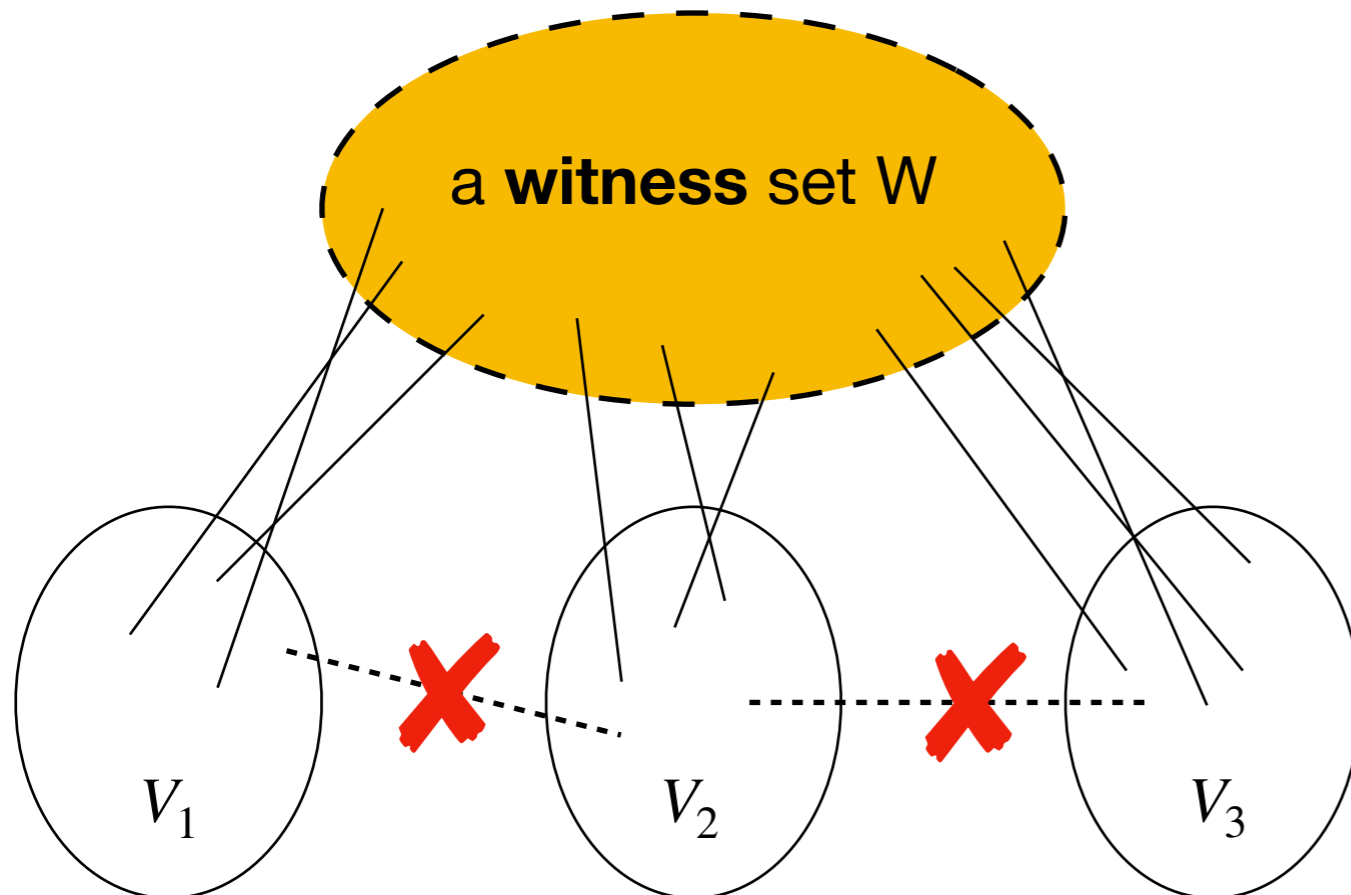
$O(\Delta^* + \log n)$  in Poly( $n$ ) time

[Fürer and Raghavachari, 1992]

# A witness lemma

Lemma: (witness)

If  $V$  is partitioned into  $W, V_1, V_2, \dots, V_l$  such that all inter-component edges touch the **witness set**  $W$ , then a lower bound holds  $\Delta^* \geq (l - 1)/|W|$



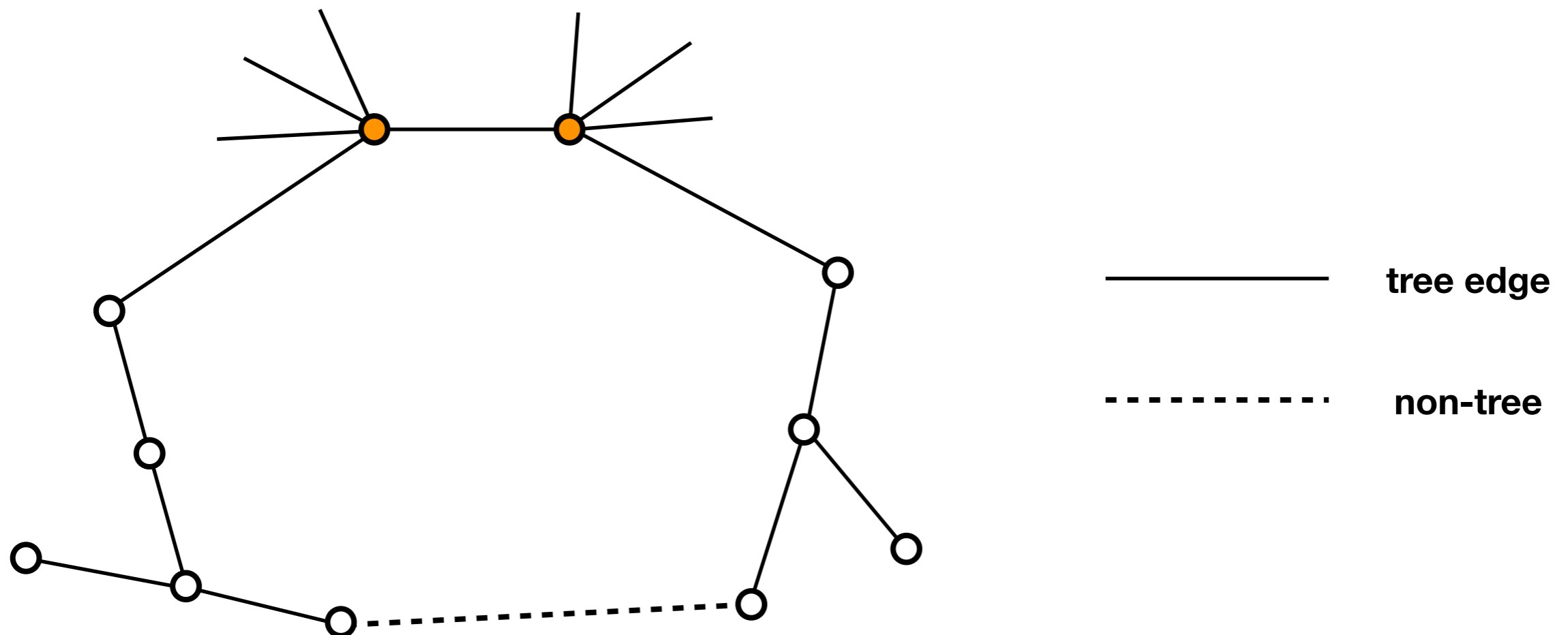
Any spanning tree has at least  $l - 1$  inter-component edges

All these edges are incident on the witness set  $W$

So, at least one vertex in  $W$  has tree degree  $\geq (l - 1)/|W|$

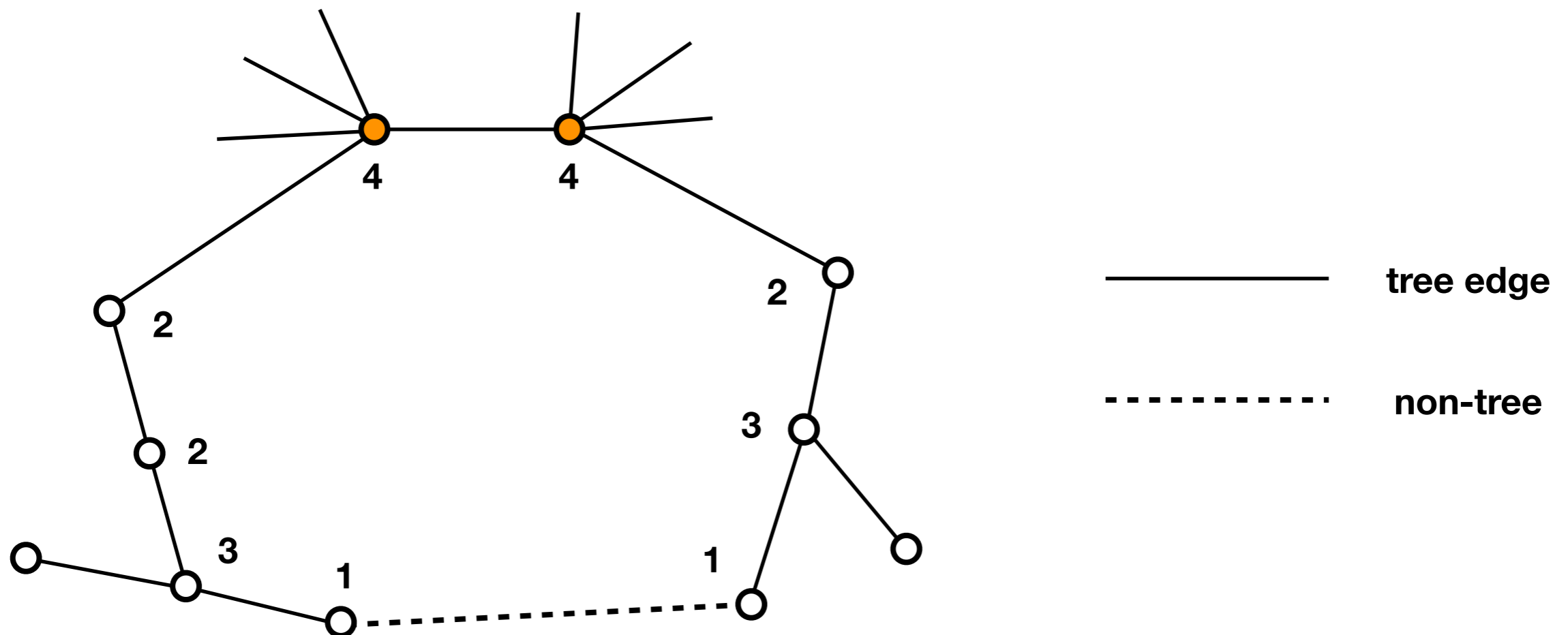
# Local search

- Given a tree  $T$ , try to reduce its vertex degrees
- Find non-tree edge  $(u, v)$ ,  $\deg_T(u), \deg_T(v) \leq d - 2$   
tree path contains a vertex  $w$  with  $\deg_T(w) \geq d$
- Switch non-tree and tree edges



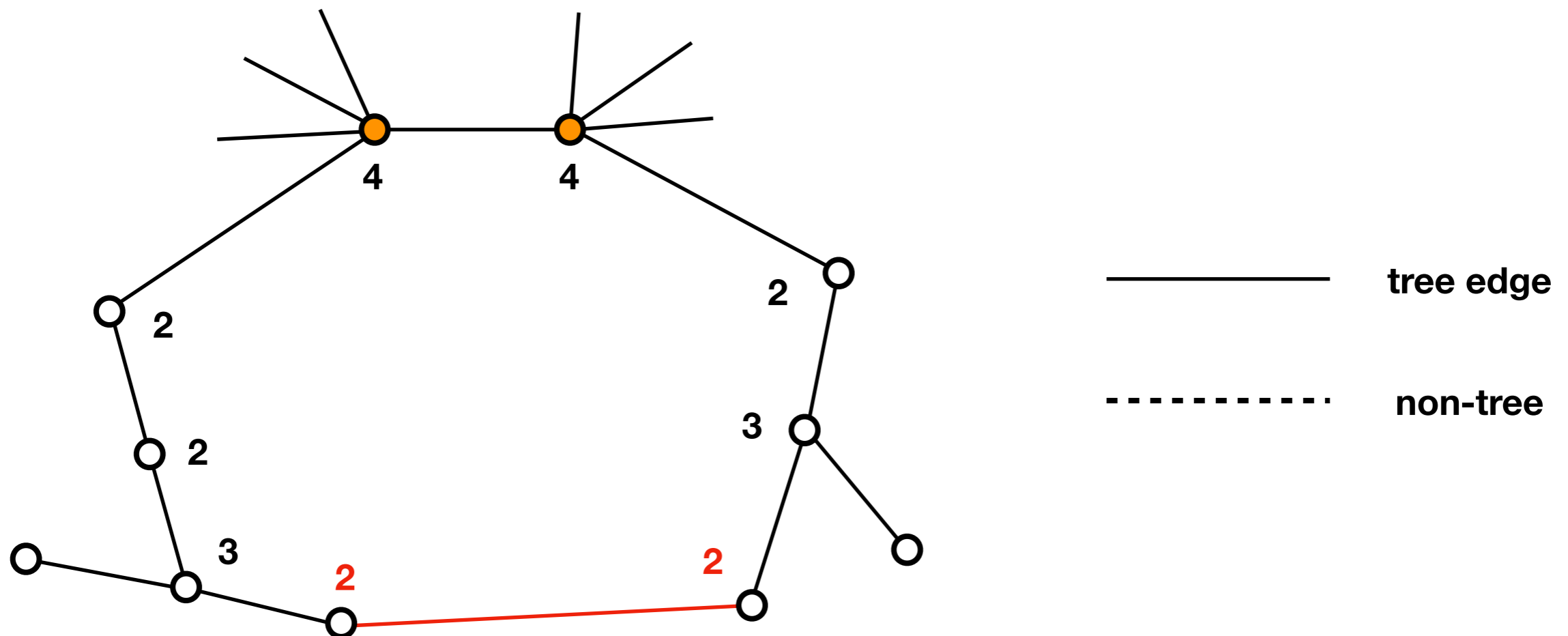
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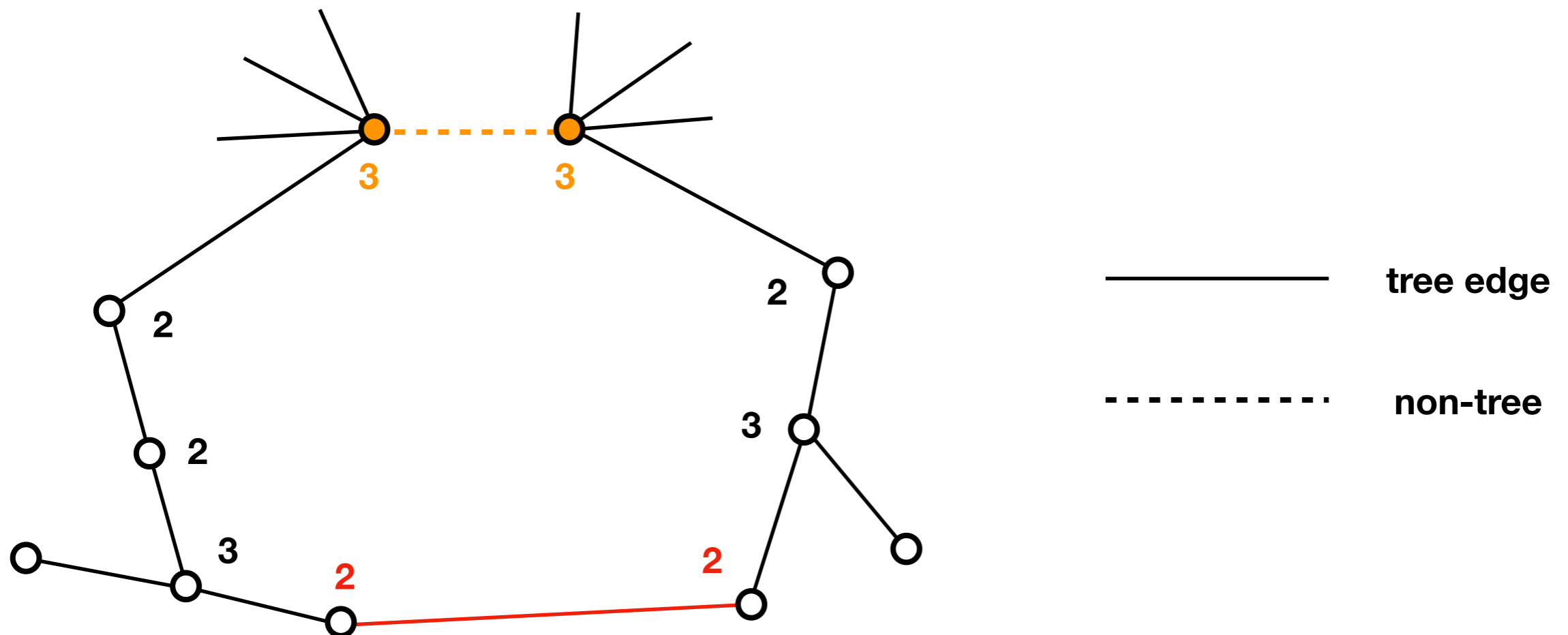
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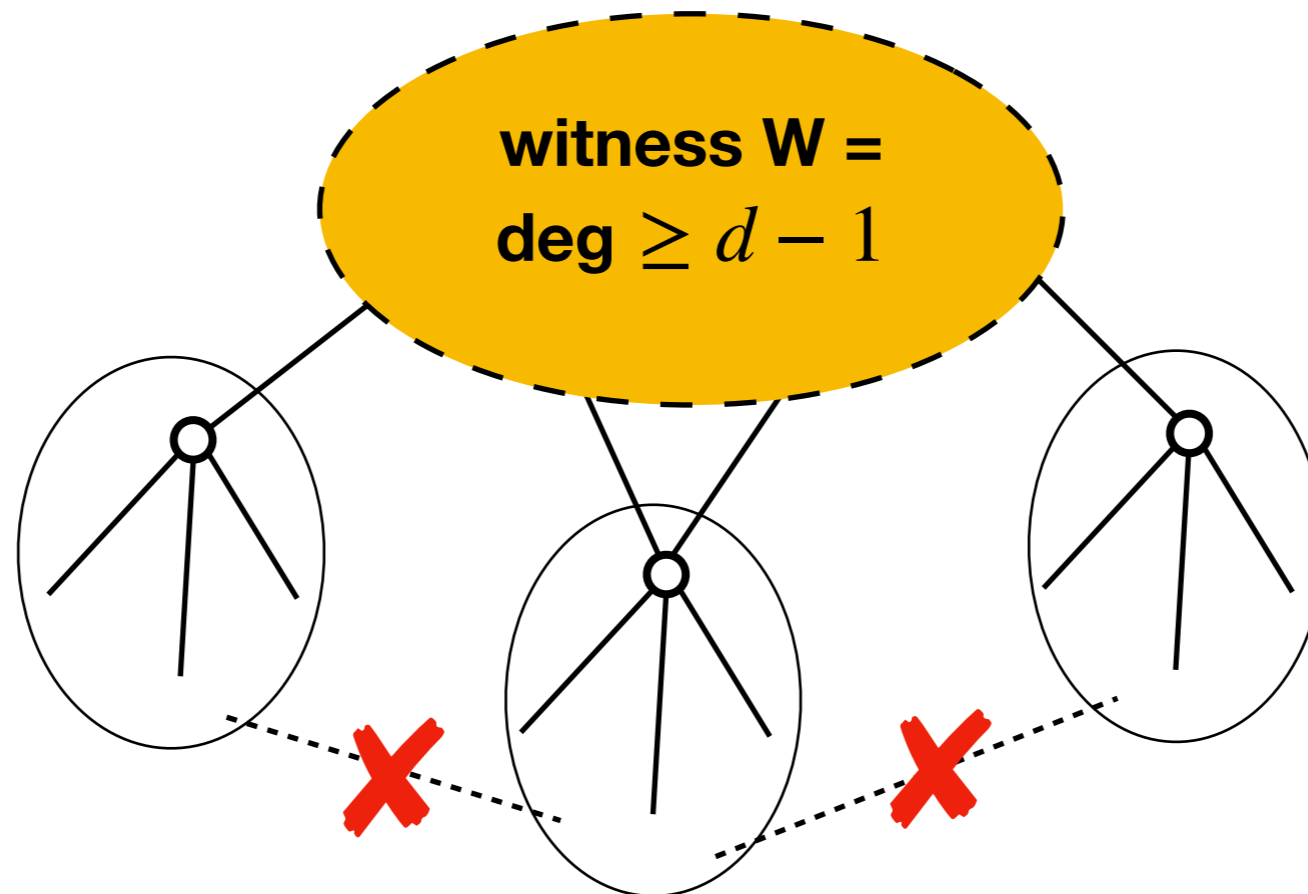
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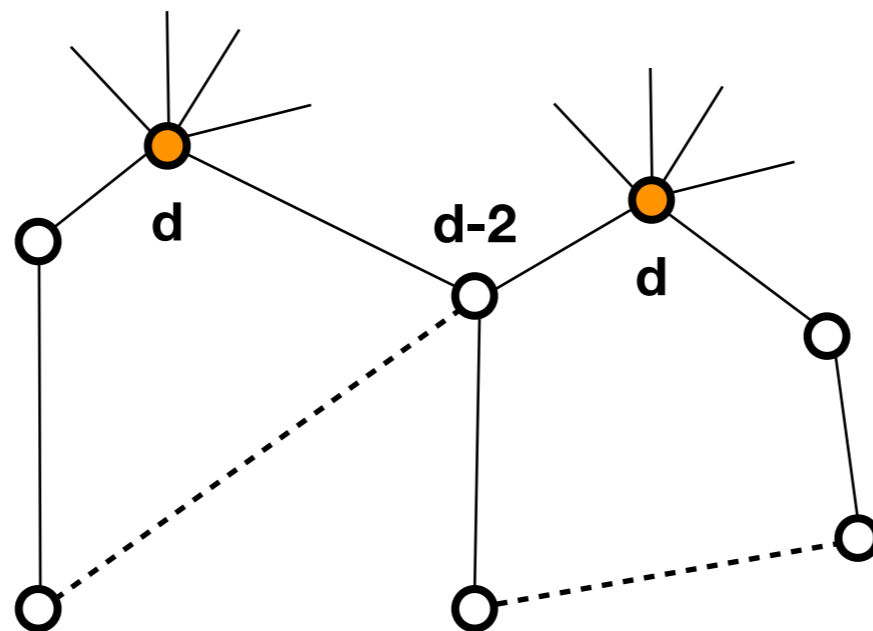
# Local search

- Repeatedly find non-tree/tree edge switches
- **Stopping condition:**  
If no such switches, then **prove**  $\max \{ \deg_T(u) \} = O(\Delta^* + \log n)$



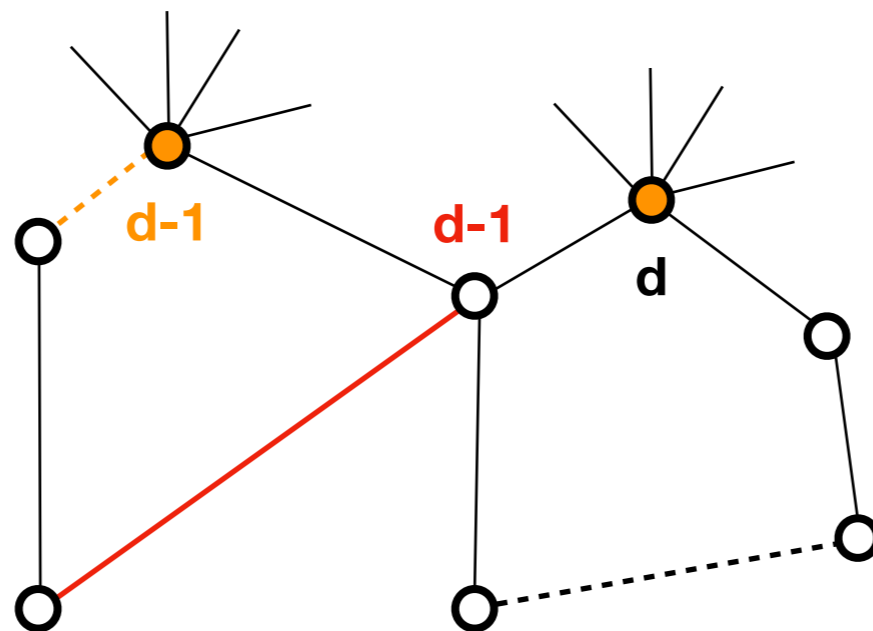
# Running time

- Repeatedly go over all non-tree edges  $(u, v)$ , find  $w$  on the tree path s.t.  $\deg_T(u), \deg_T(v) \leq d - 2, \deg_T(w) \geq d$
- $\deg_T(u)$  could switch between  $d - 1$  and  $\leq d - 2$ , so each edge may need to be **checked multiple times**



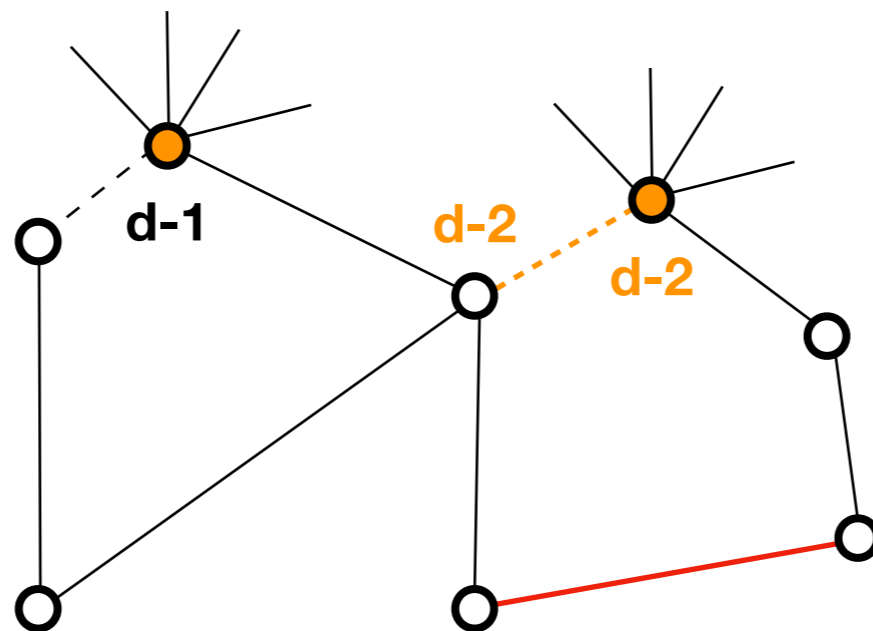
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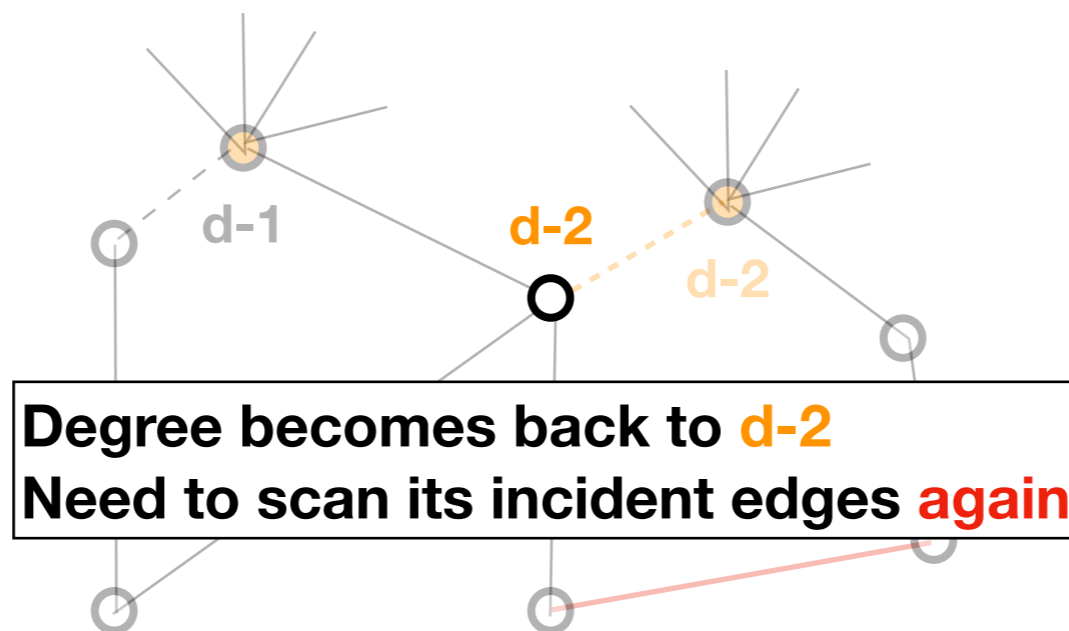
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$O(\Delta^* \log n)$  in  $\tilde{O}(m)$  time

# A lazy approach

- Previous issue:

$\deg_T(u)$  could switch between  $d - 1$  and  $\leq d - 2$ ,  
so each edge may need to be **checked multiple times**

- Idea:

Scan each adjacency list **only once**,  
even if  $\deg_T(u) = d - 1$  drops again



# A lazy approach

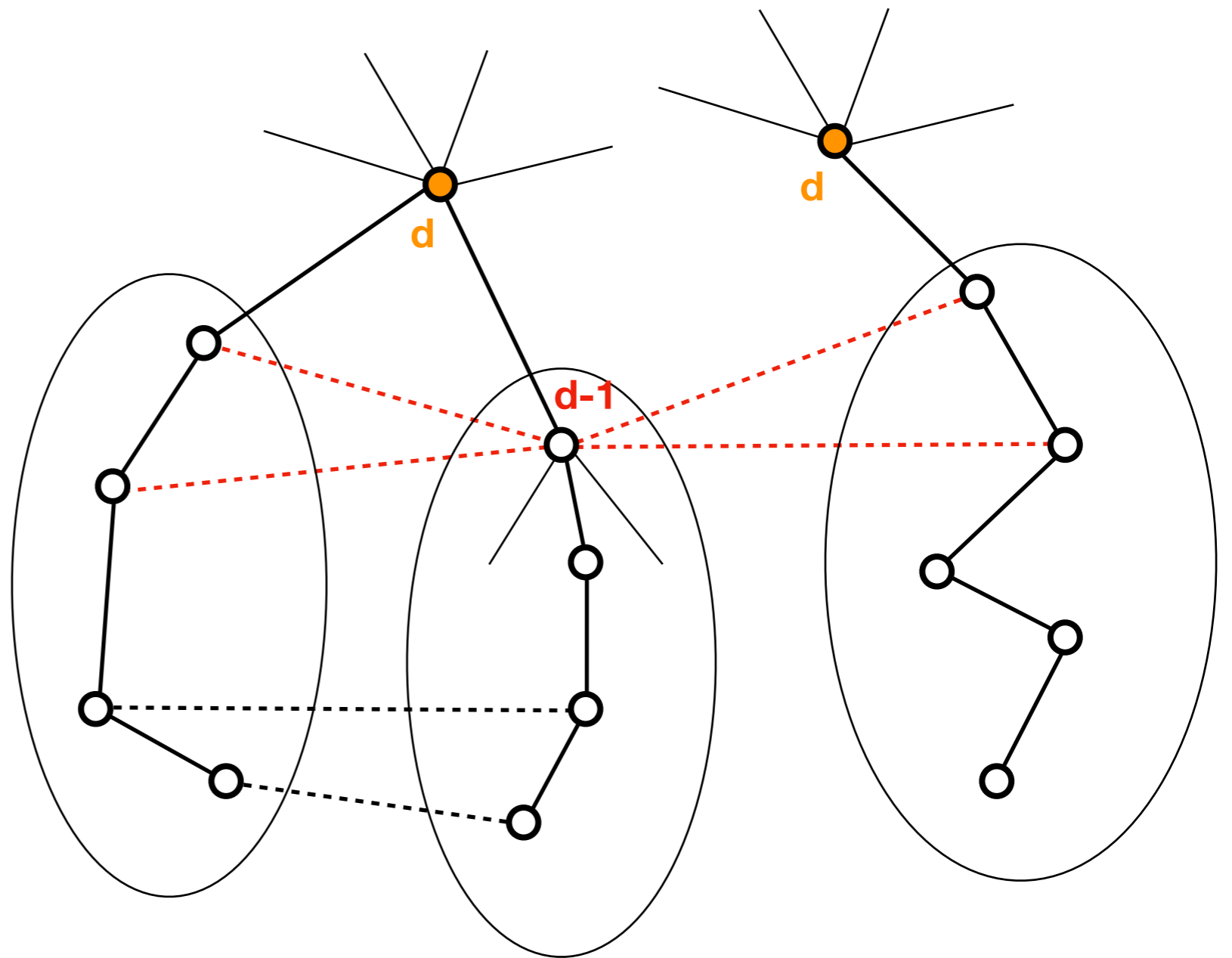
A linear time algorithm

1. Define  $S = \{u \mid \deg_T(u) \geq d\}$
2. Go over all edges  $(u, v)$   
If  $u, v$  are in different component in  $T \setminus S$ ,  
and  $\deg_T(u), \deg_T(v)$  **have never been  $d - 1$** ,  
then switch  $(u, v)$  with an edge on  $S$
3. Each edge is **visited only once**, thus linear time

# A lazy approach

Scan all dotted edges  
to find non-tree/tree  
edge switches

Red dotted edges are  
forbidden at the beginning

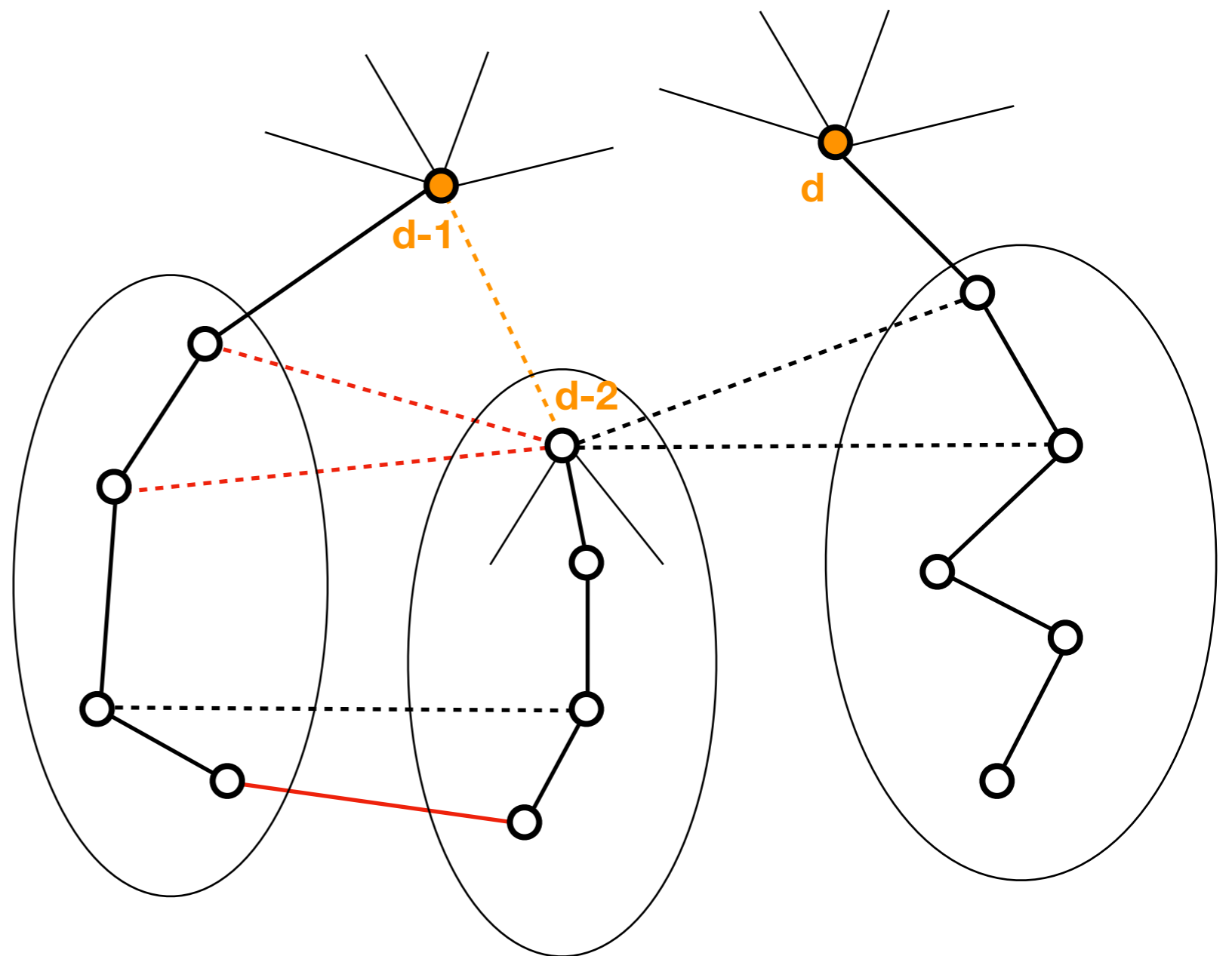


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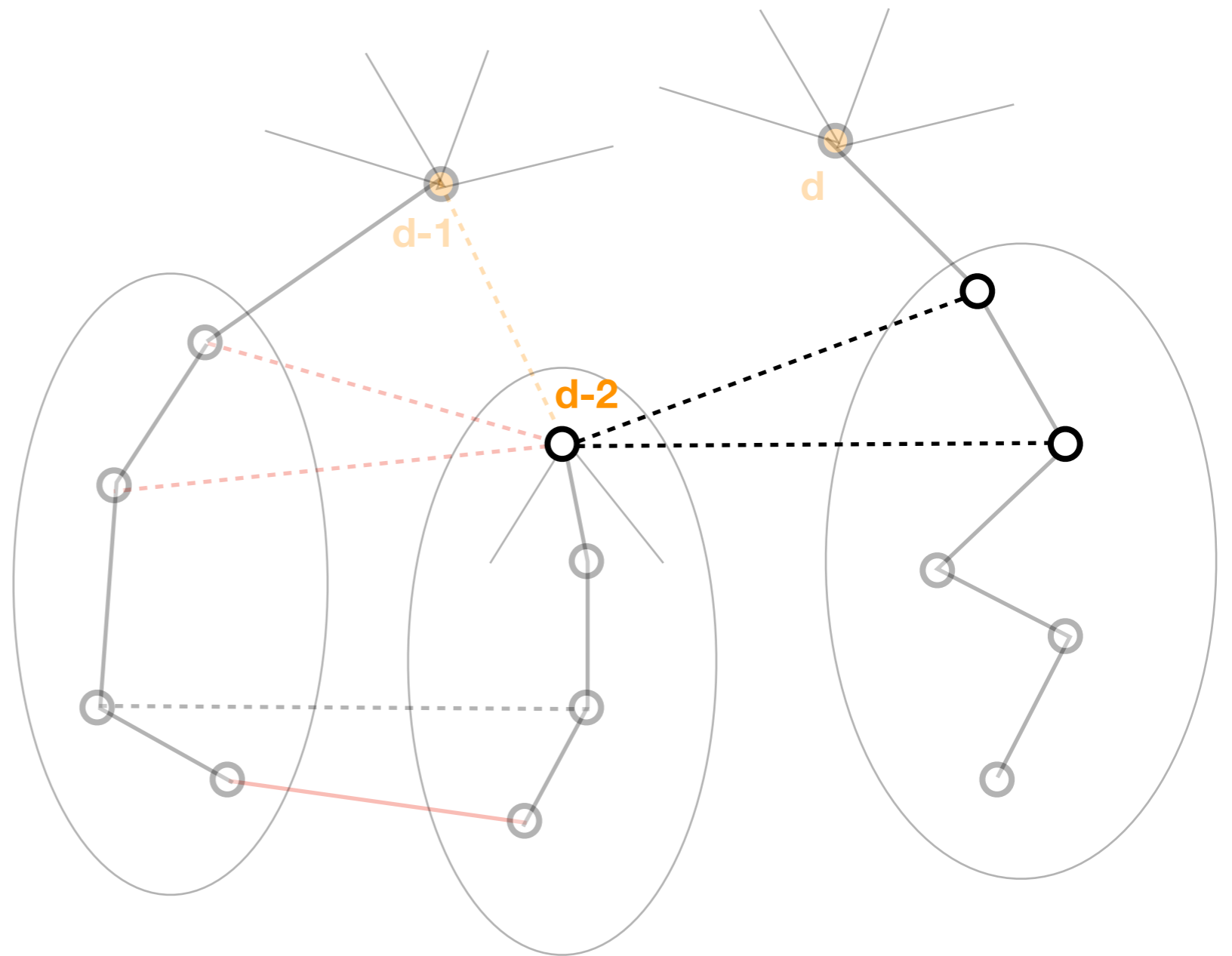
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After a non-tree/tree edge switch, a degree drops below  $d-1$ , introducing more possible edge switches



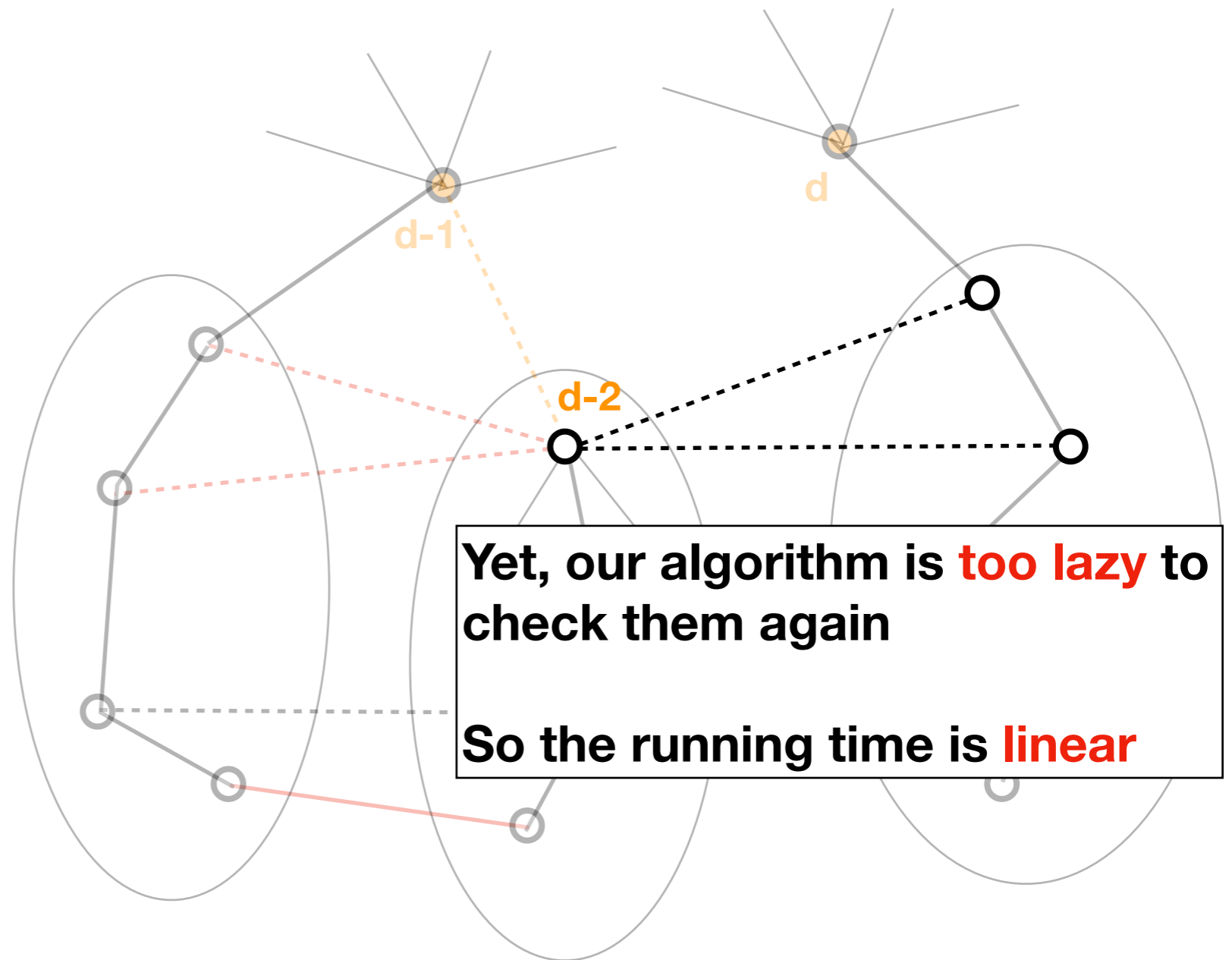
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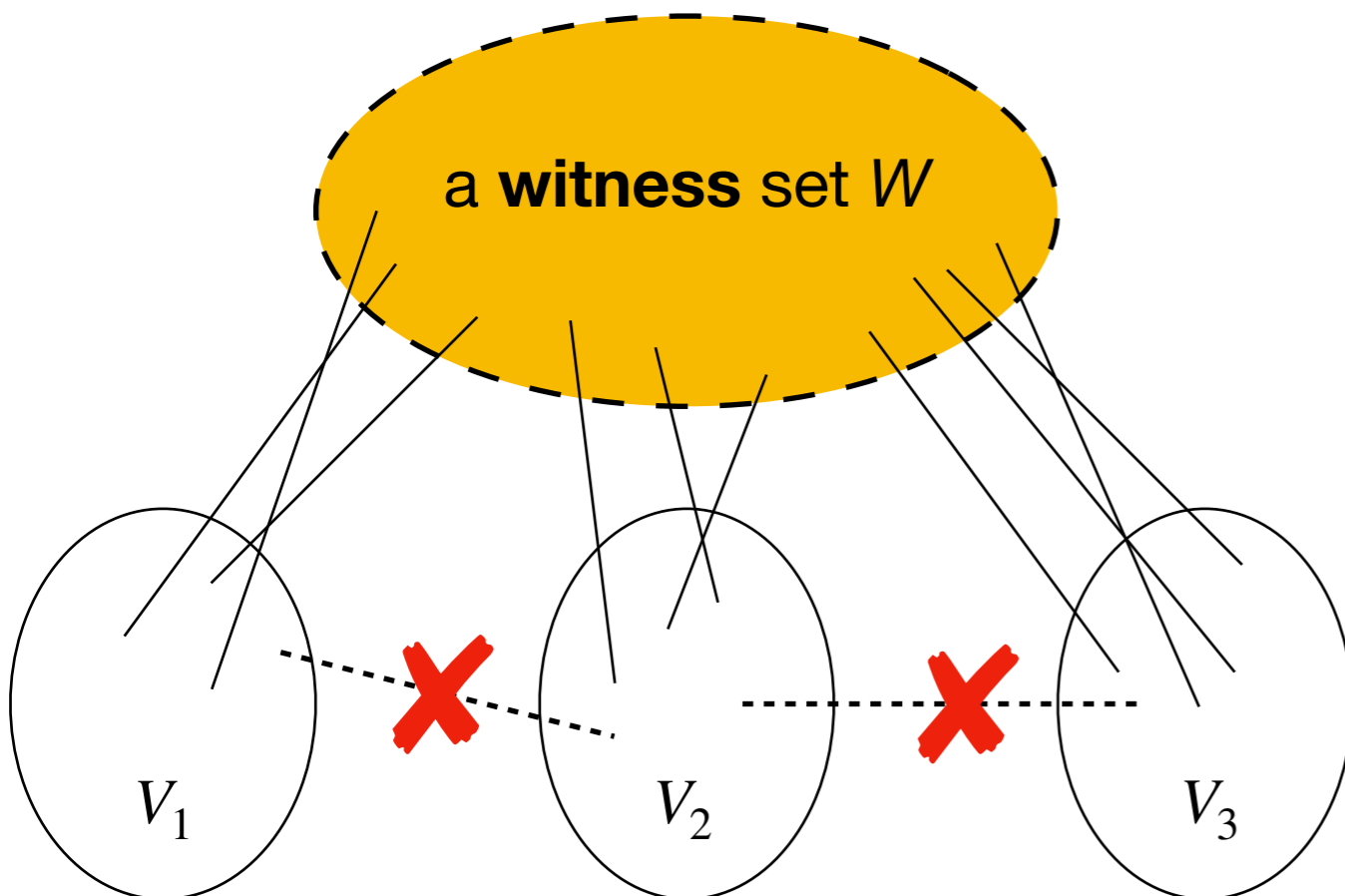
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# A lazy approach

## Problems with applying the witness lemma

- Take witness set  $W = \{ u \mid \deg_T(u) \text{ was once } \geq d - 1 \}$



By the witness lemma,

$$\Delta^* \geq (l - 1) / |W|$$

$W$  could contain too many vertices with low tree degrees, which leads to

$$l \ll d|W|, \Delta^* \ll d$$

**Not a good stopping condition**

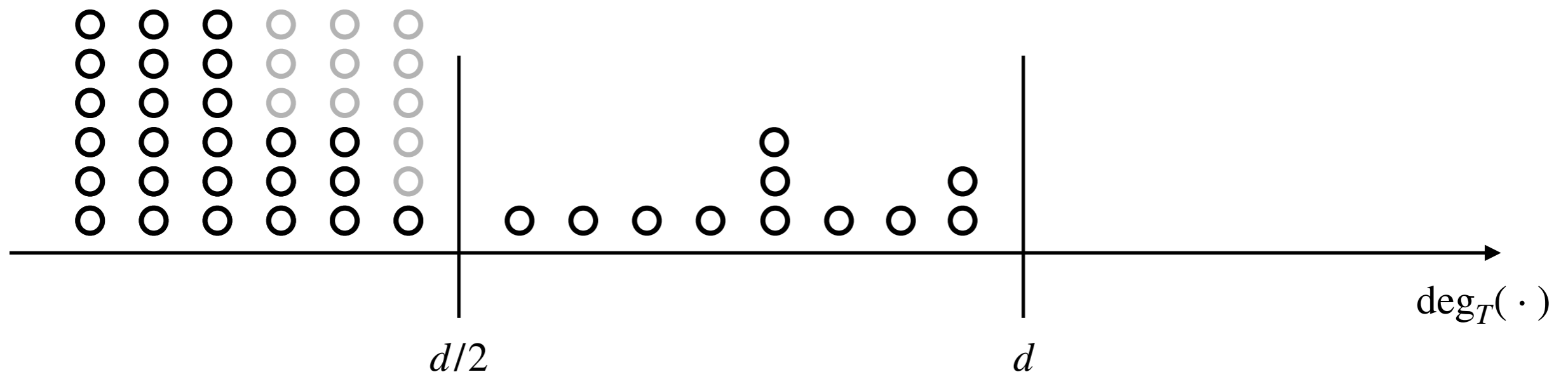
# A key observation

- **Ideally**, for vertices with a low tree degree ( $< d/2$ ) at the beginning, most of them may never reach  $d - 1$
- Hopefully,  $W$  mostly consists of high-deg vertices



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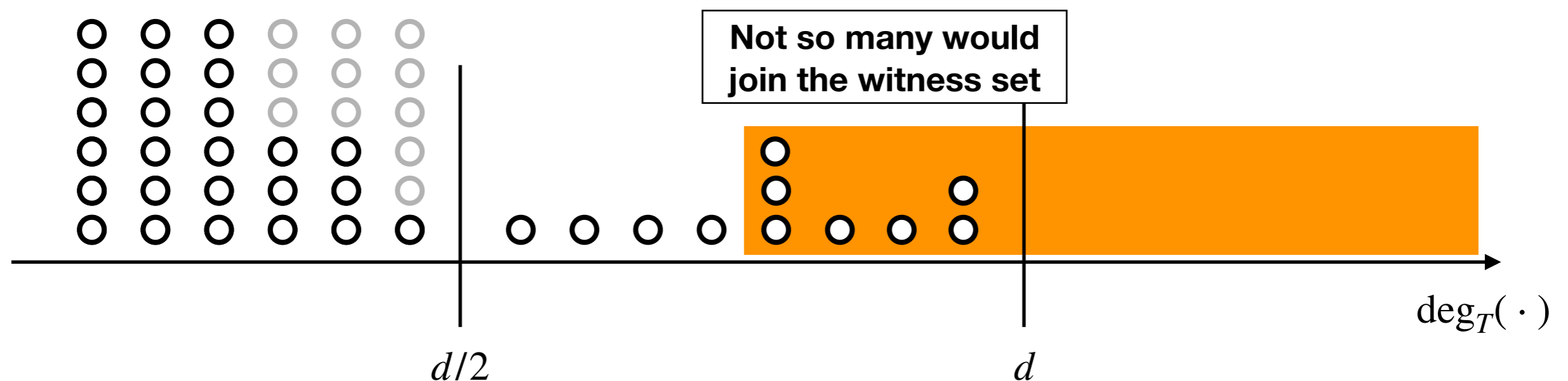
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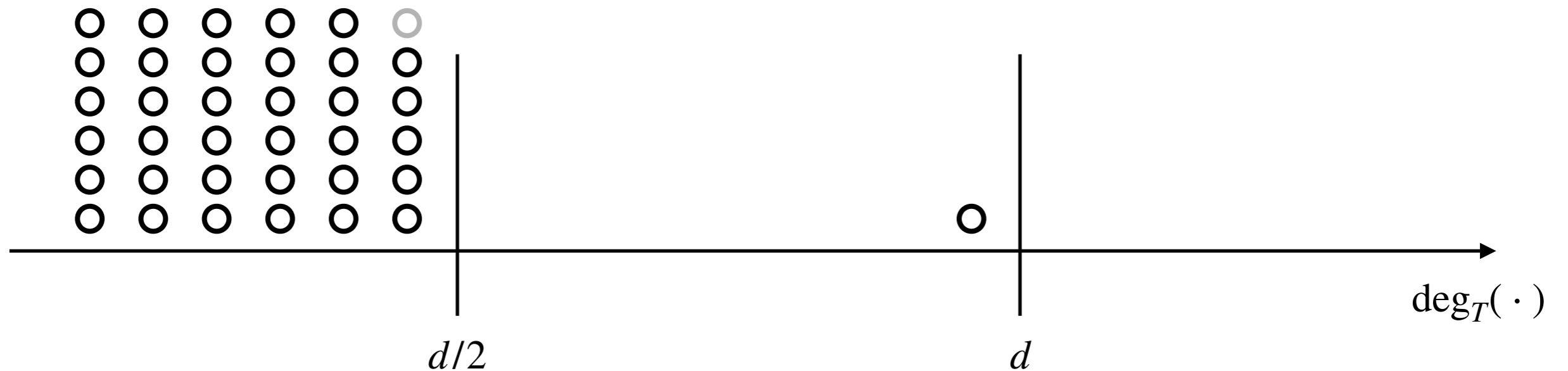
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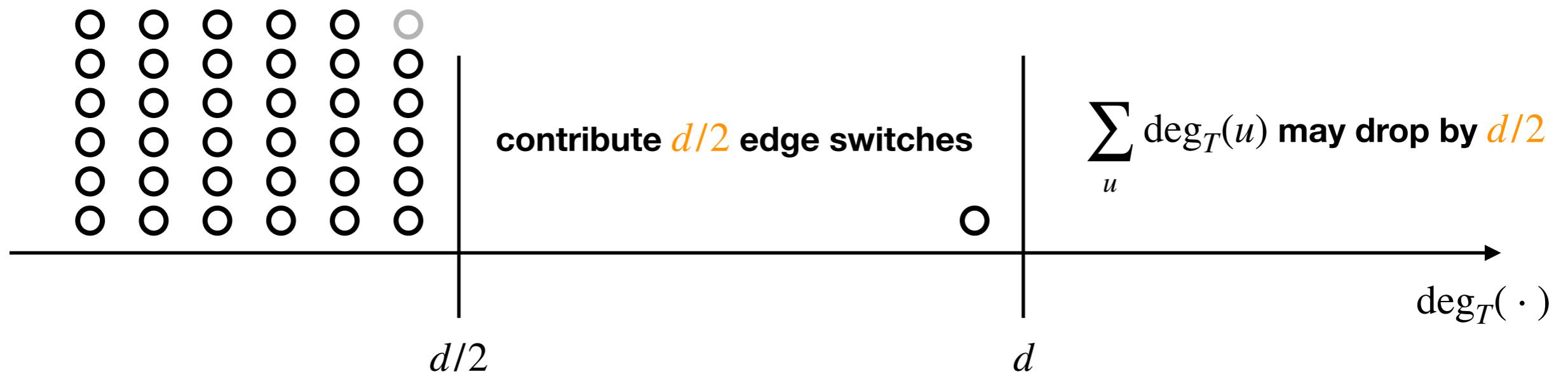
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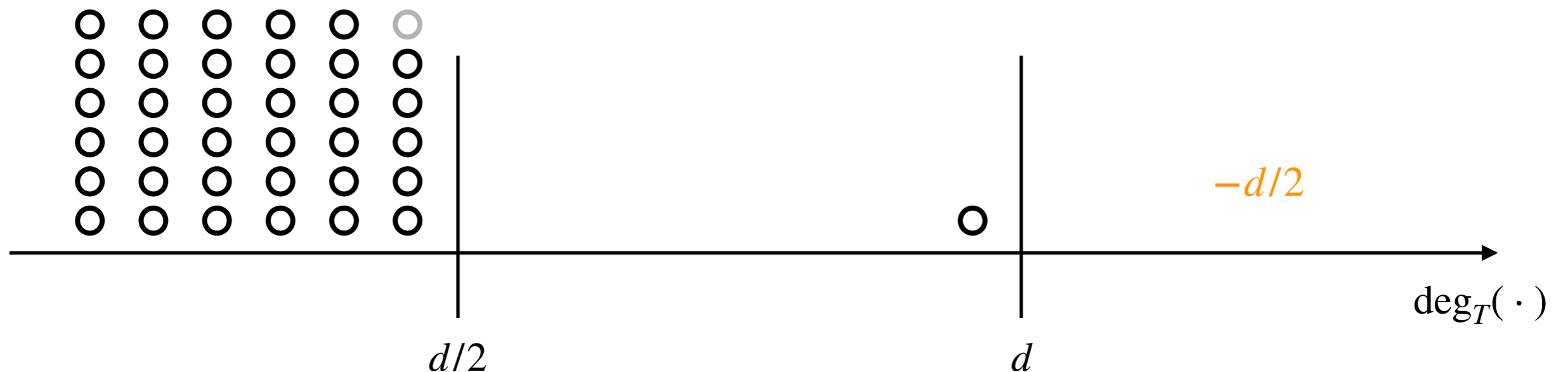
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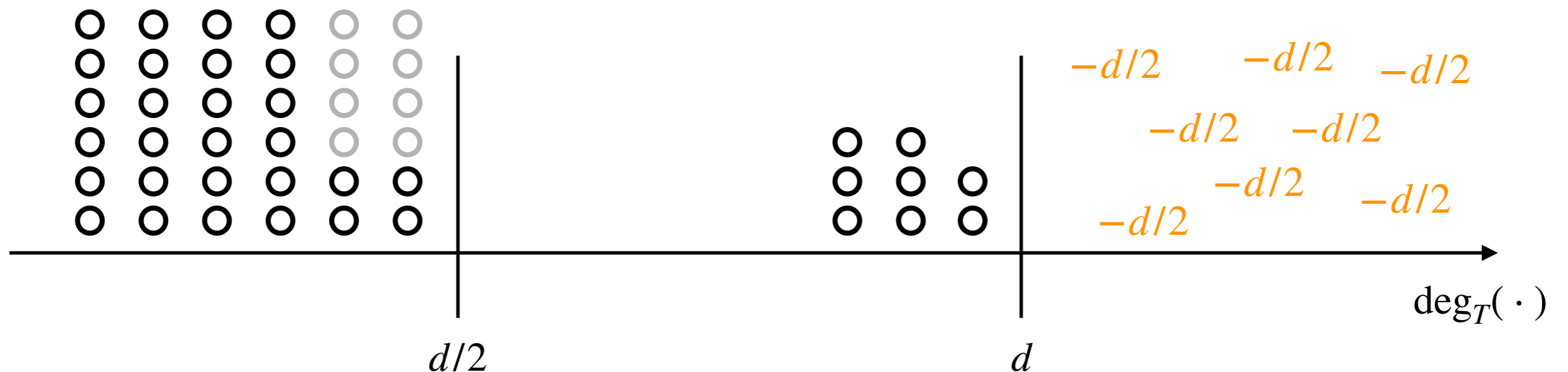
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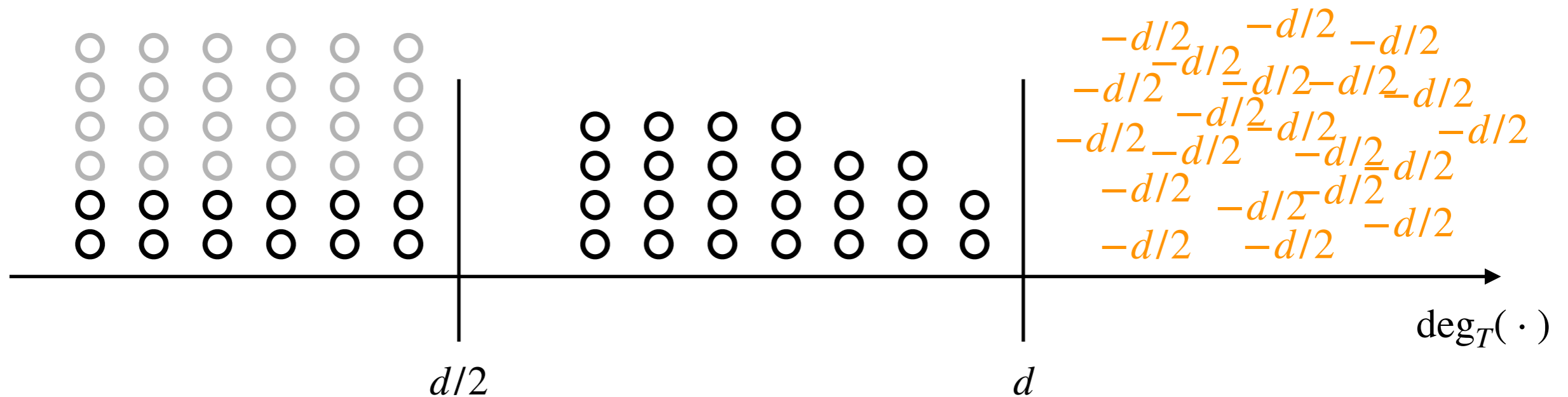
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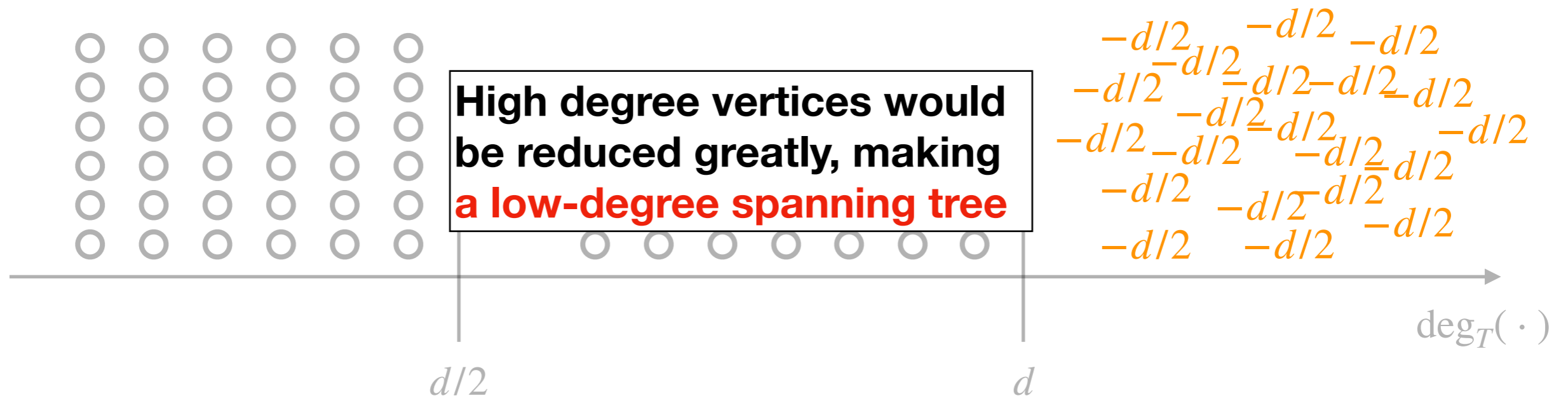
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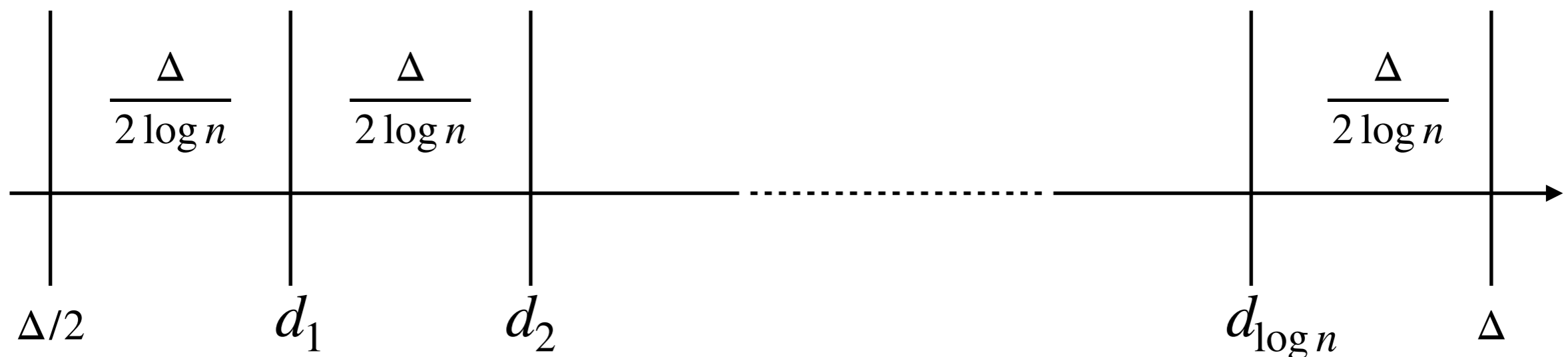
# A remaining issue

- **Ideally**, for vertices with a low tree degree ( $< d/2$ ) at the beginning, most of them may never reach  $d - 1$
- What happens to vertices with **medium degree**  $\in [d/2, d - 1)$

- Try  **$O(\log n)$  different choices** of  $d$ , make sure that  $\#\{ u \mid \deg_T(u) \geq d/2 \} \leq \mathbf{2} * \#\{ u \mid \deg_T(u) \geq d - 1 \}$
- Overall, the witness set won't be blown up too much

# A remaining issue

- Try  $O(\log n)$  **different choices** of  $d$ ; make sure that  $\#\{u \mid \deg_T(u) \geq d/2\} \leq 2 * \#\{u \mid \deg_T(u) \geq d - 1\}$
- Overall, the witness set won't be blown up too much
- Apply our lazy local-search on  $d_i$  for  $i = 1, 2, \dots$   
Can prove  $\Delta = \max \deg_T(\cdot)$  will be reduced multiplicatively



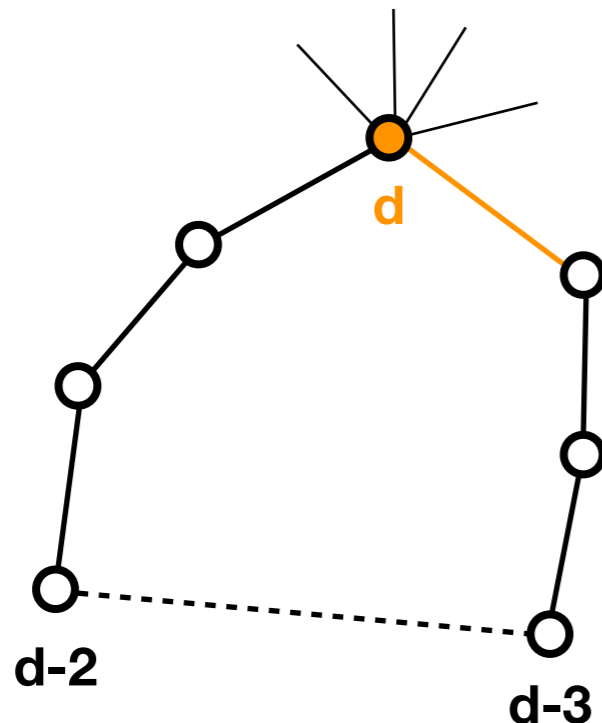
$(1 + \epsilon)\Delta^*$  in  $\tilde{O}(m)$  time

high-level overview

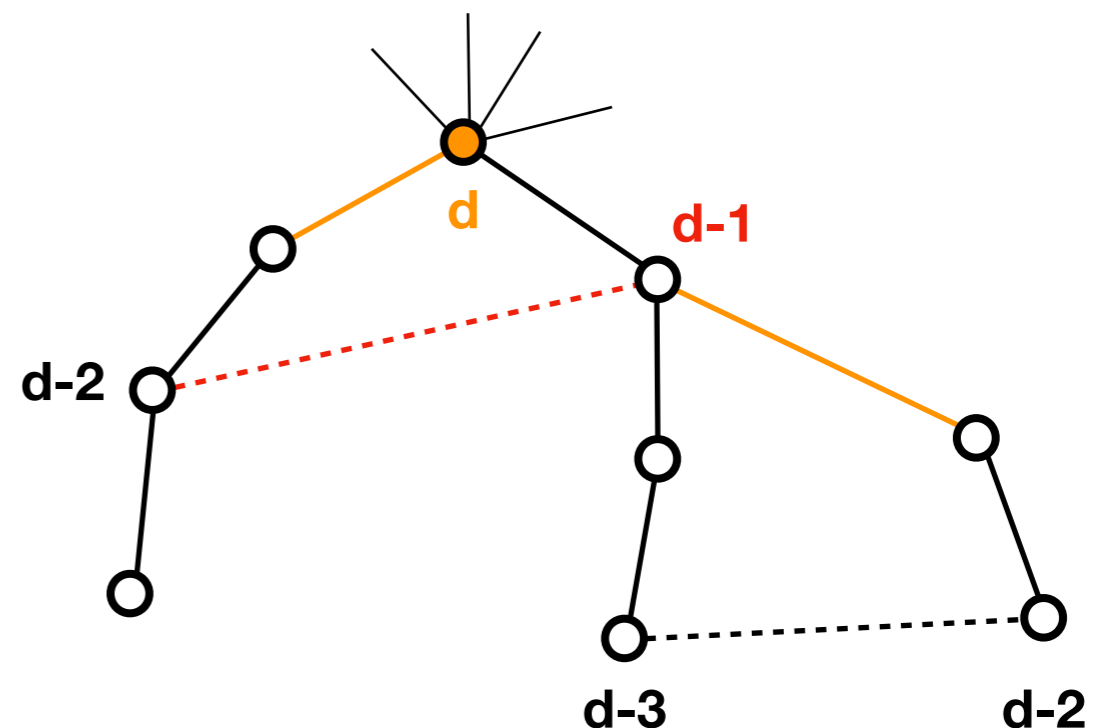
# Multi-hop switches

- Generalize the concept of non-tree/tree edge switches
- Reduce  $O(\Delta^* \log n)$  to  $(1 + \epsilon)\Delta^* + O(\log n/\epsilon)$
- Run  $\tilde{O}(m)$  time using the lazy approach as well

1-hop non-tree/tree switch



2-hop non-tree/tree switch

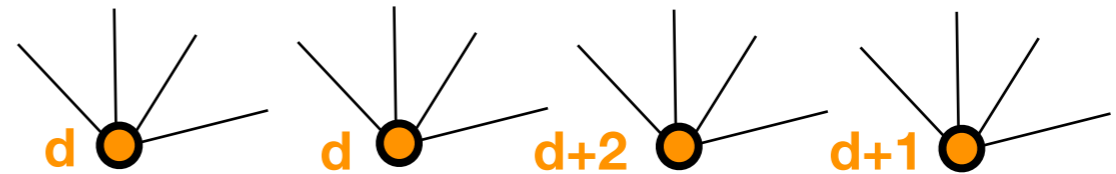


# Multi-hop switches

- Similar to **the blocking-flow** algorithm for max-flow
  - Search for **longer & longer** hop non-tree/tree switches
- 
- Assume we do not have switches with  $<k$  hops
  - To find  $k$ -hop switches, **partition** into  $k$  layers
  - Use a **depth-first search** to find  $k$ -hop switches

# Multi-hop switches

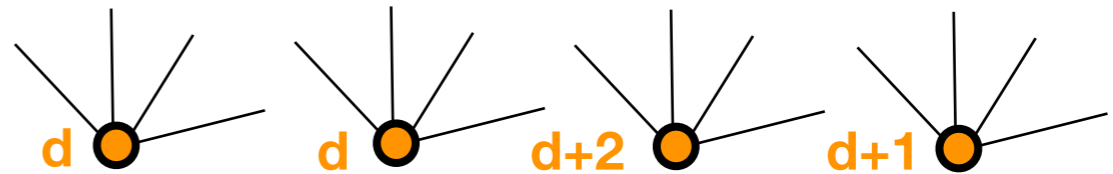
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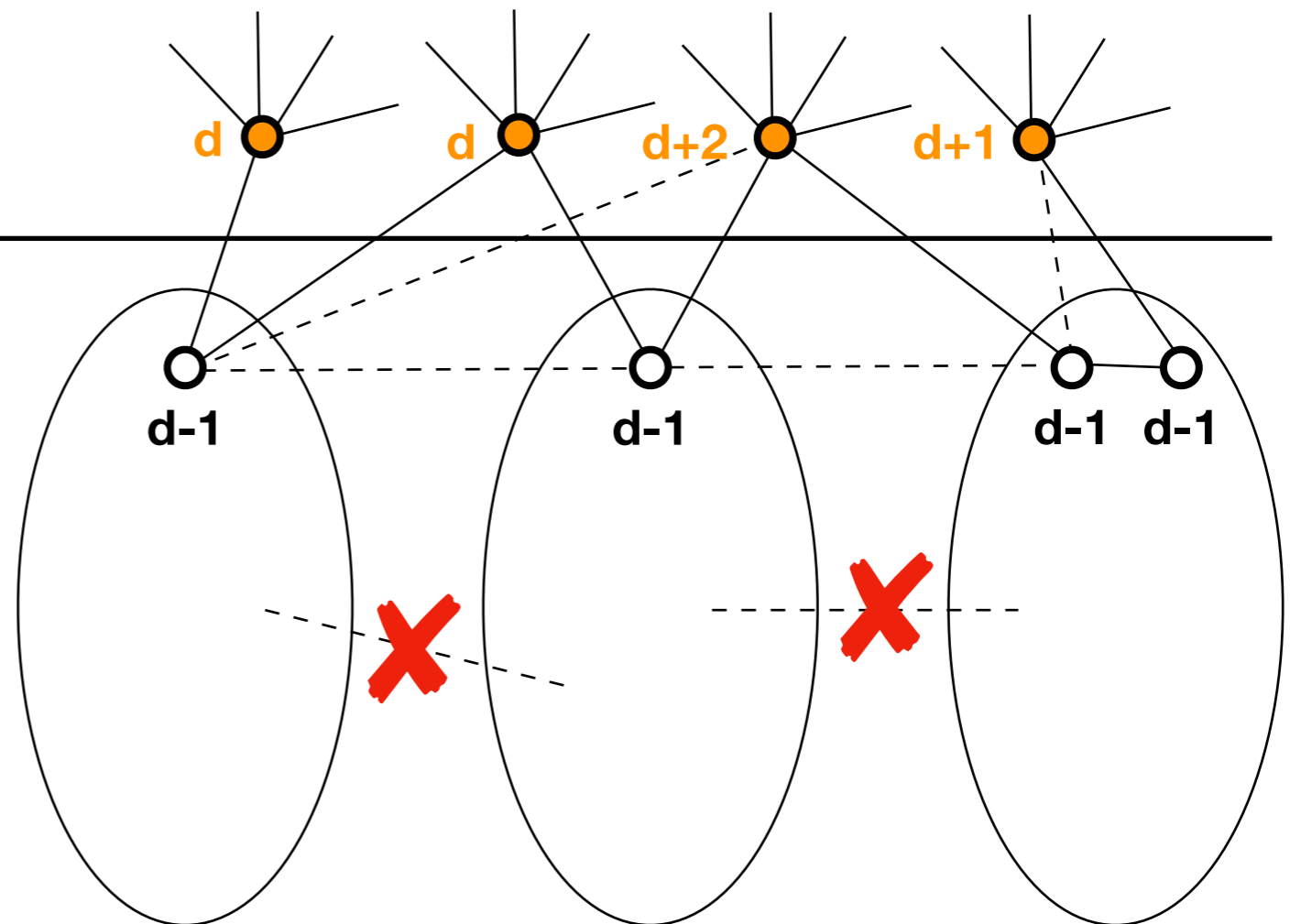
**layer-1** : tree degree  $\geq d$



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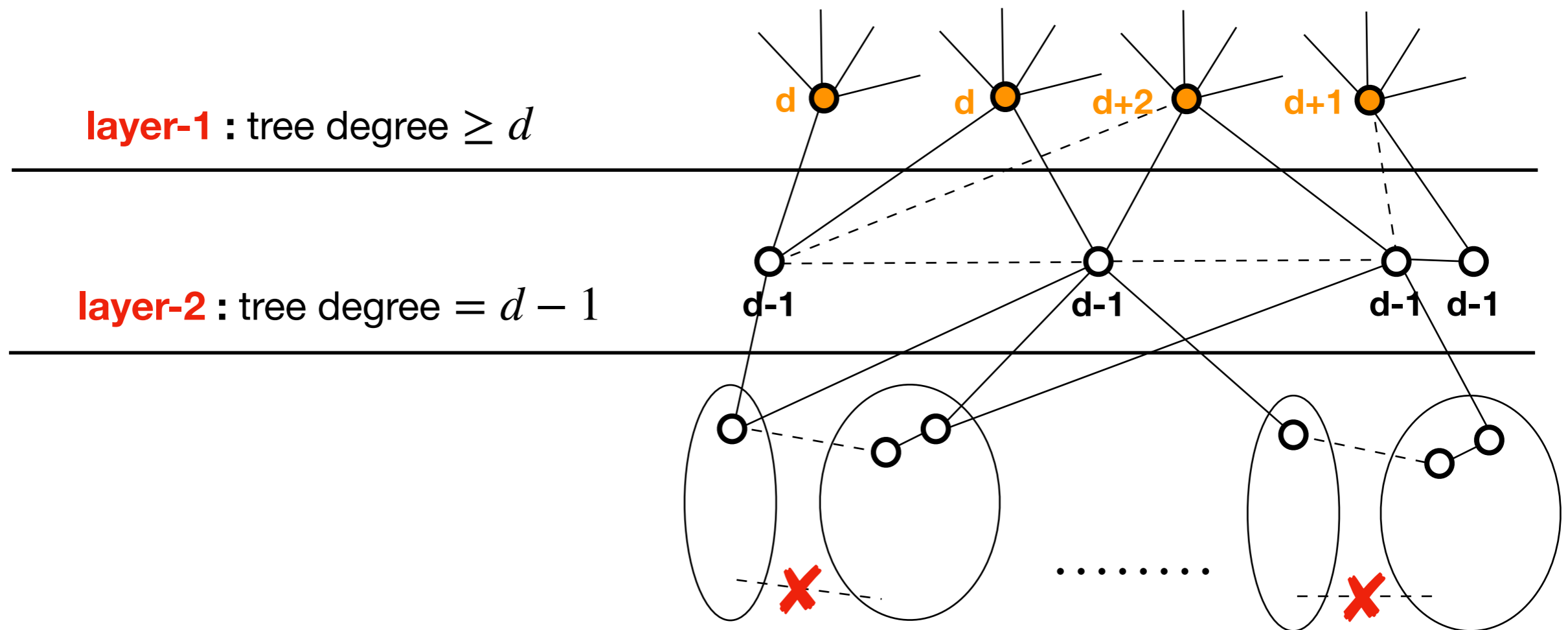
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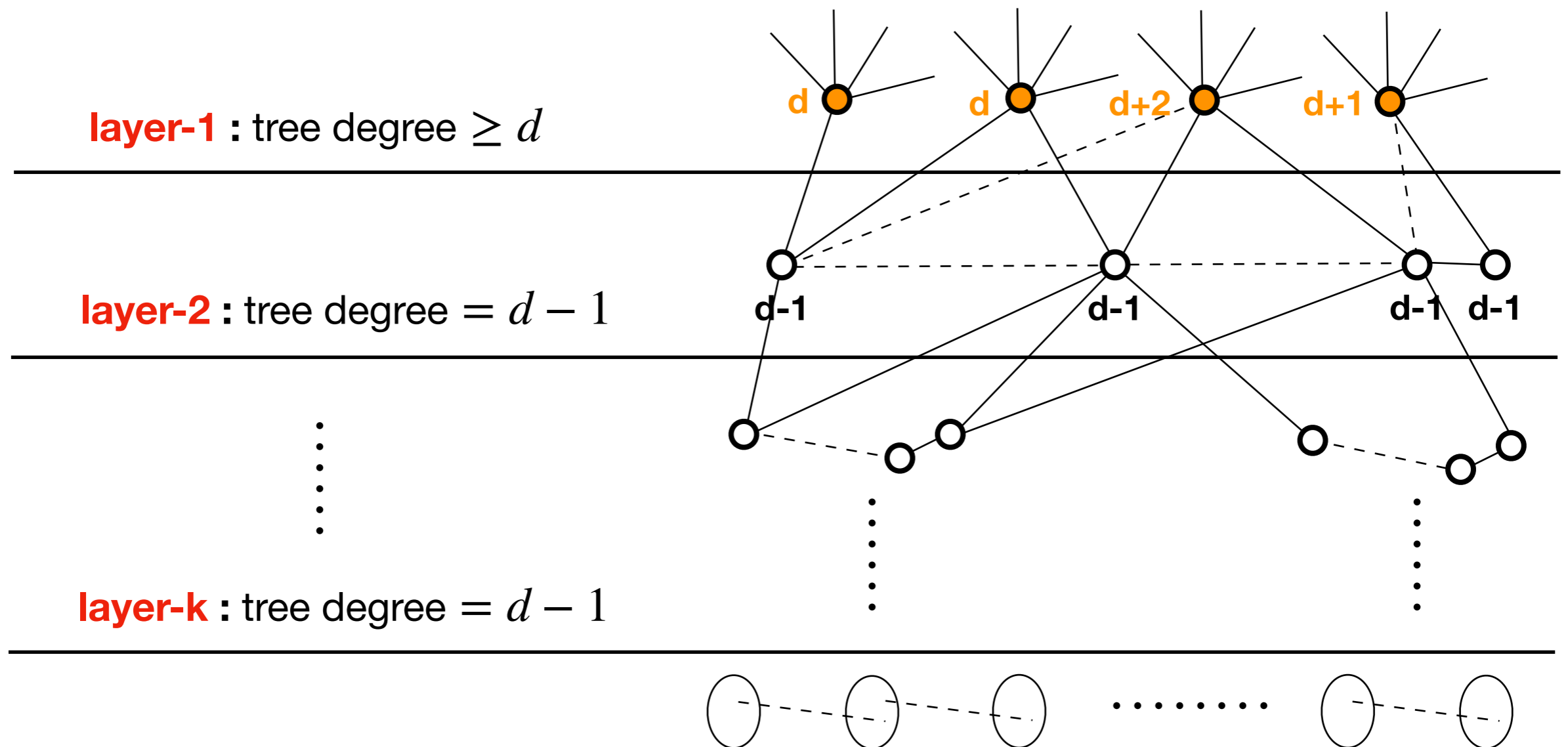
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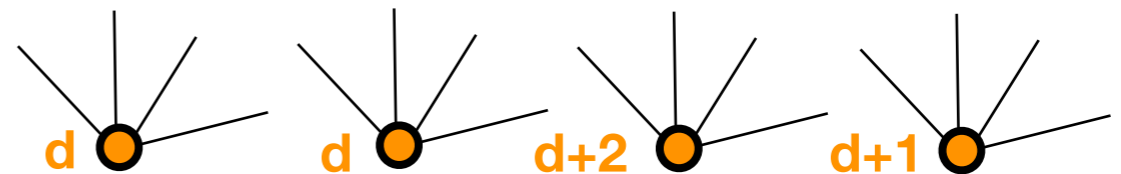
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layer-1 : tree degree  $\geq d$



layer-2 : tree degree =  $d - 1$

⋮

layer-k : tree degree =  $d - 1$



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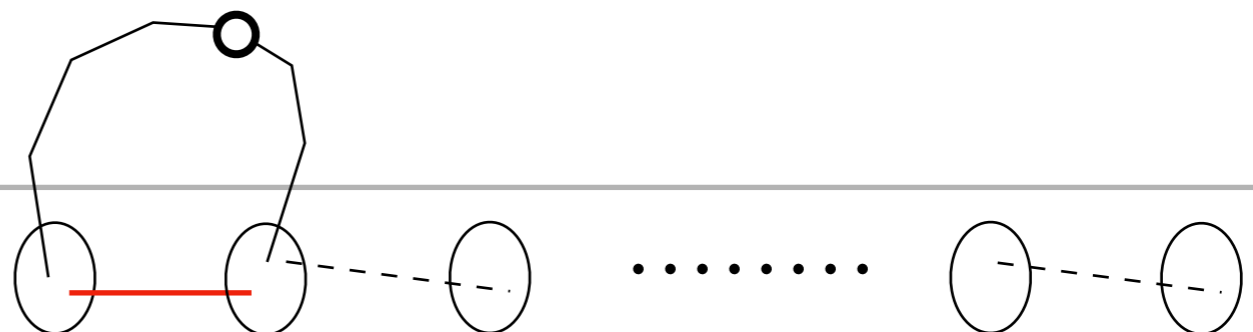
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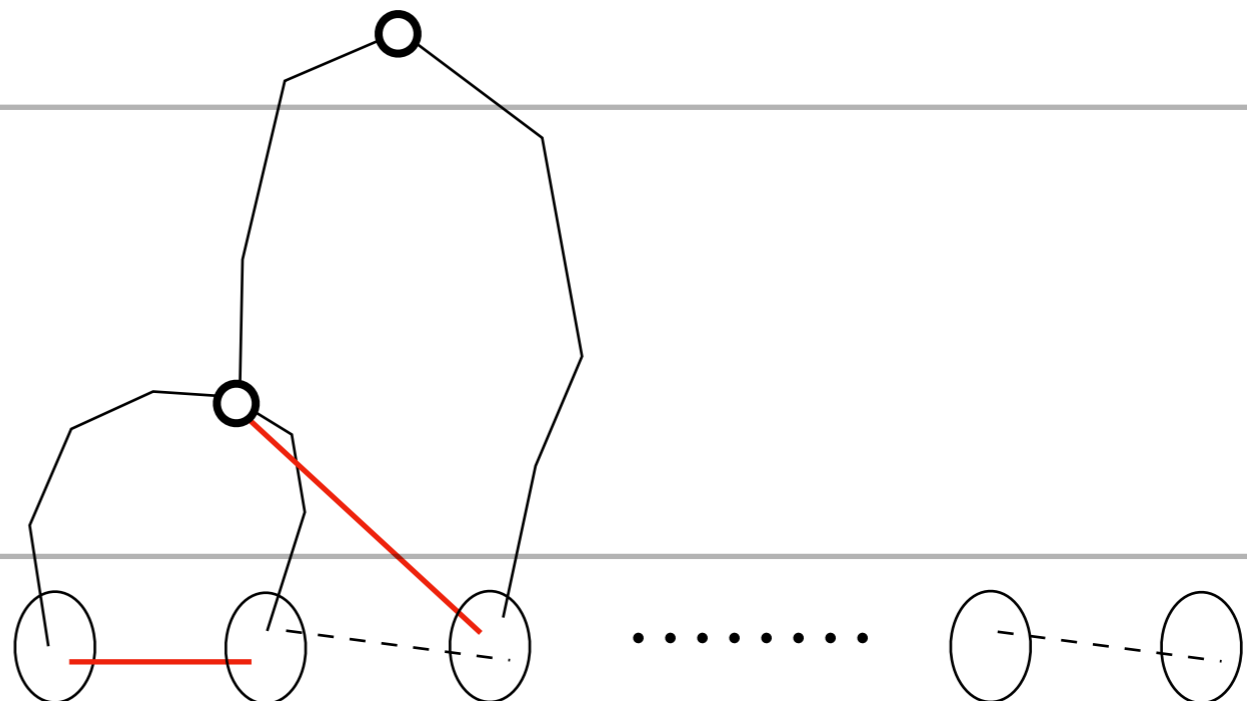
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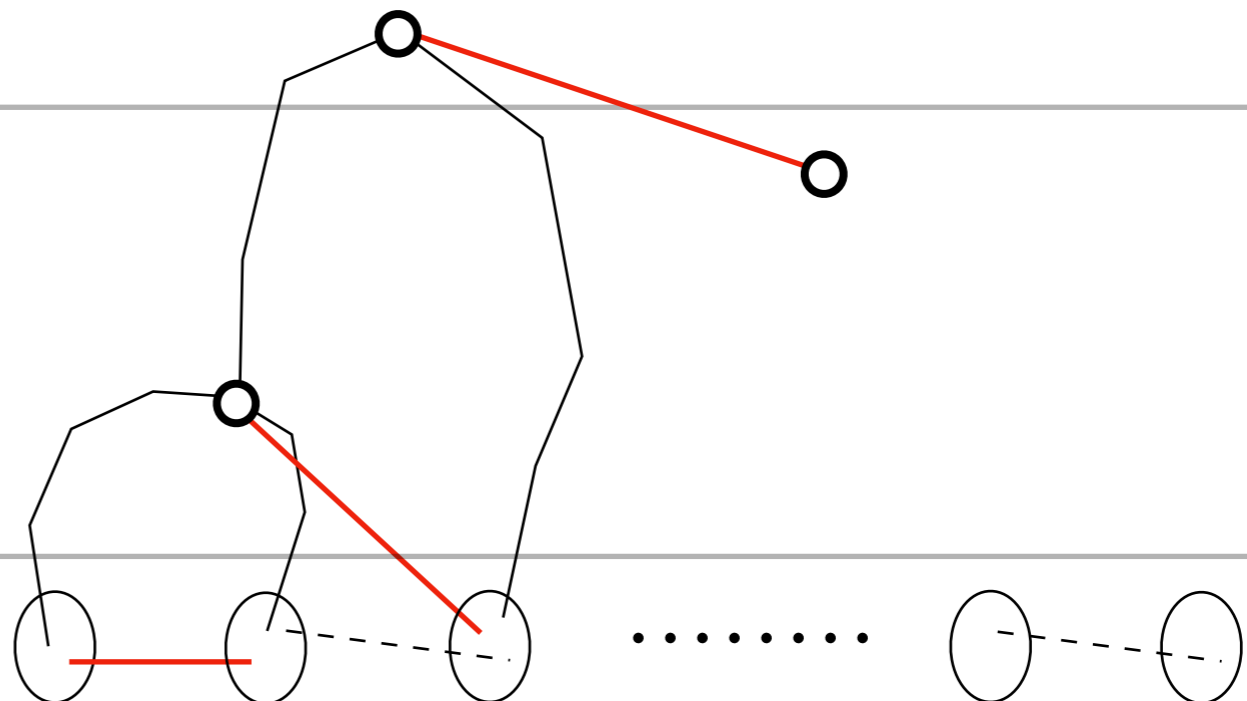
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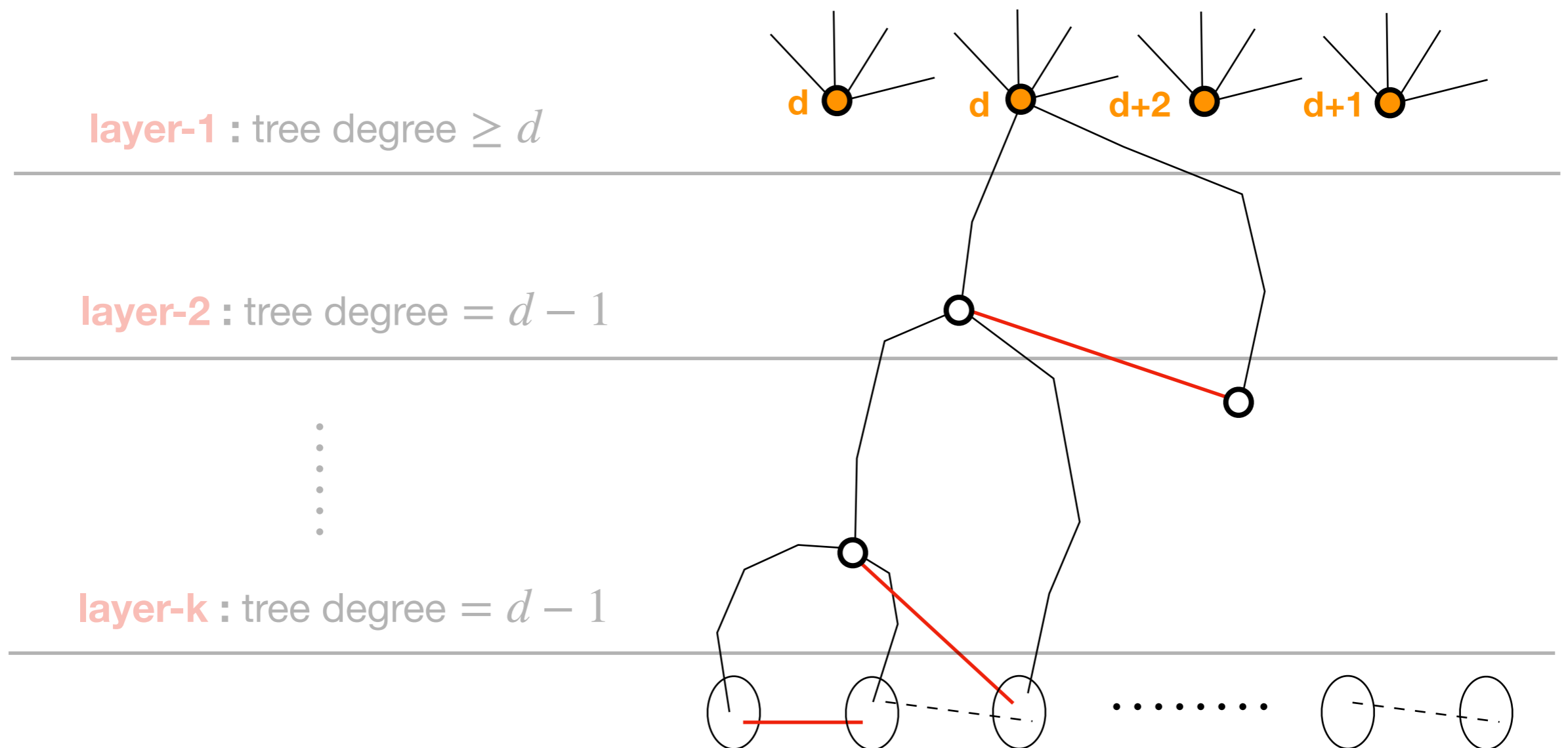
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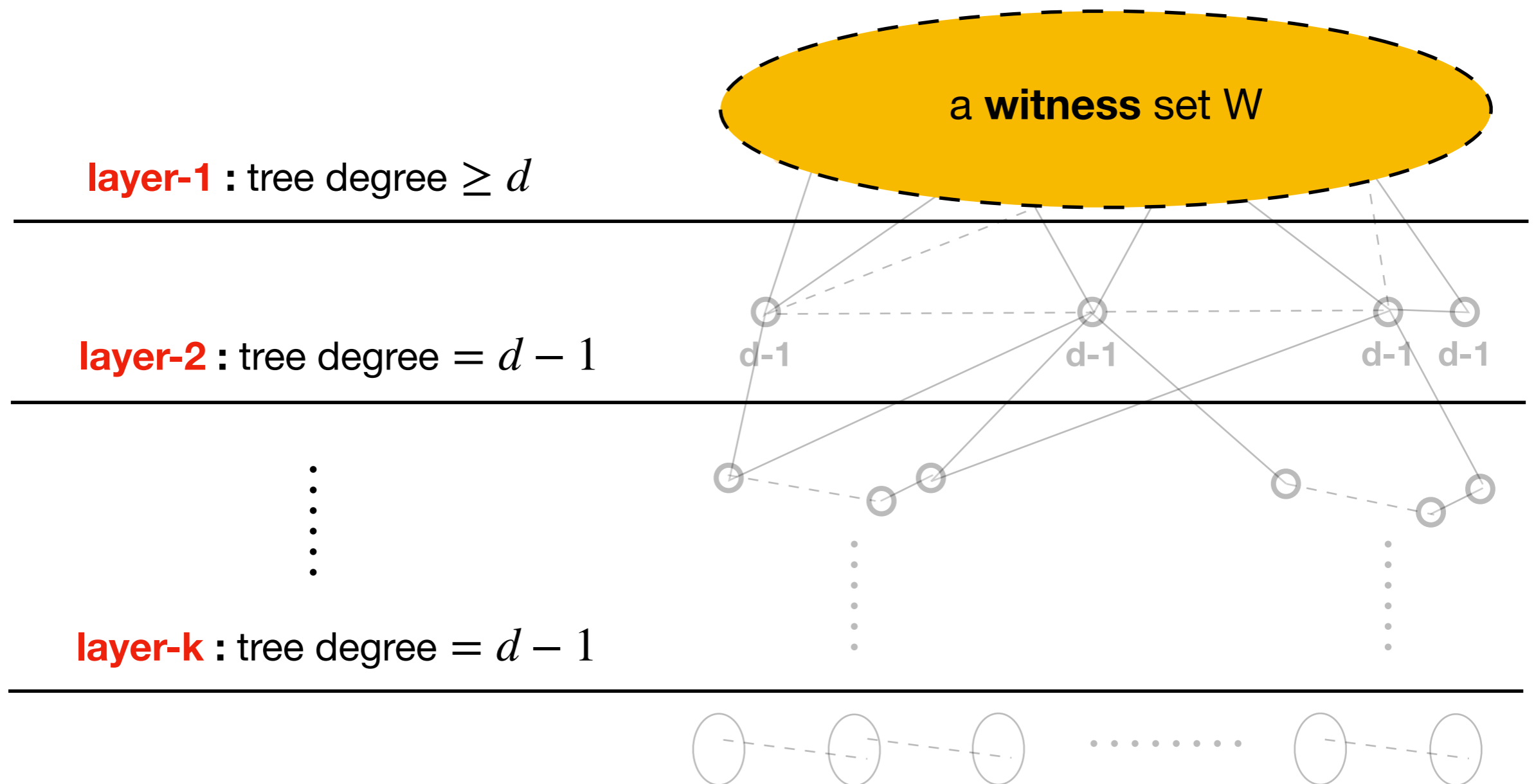
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# Multi-hop switches

- If  $k > \log_{1+\epsilon} n$ , either tree degree is reduced multiplicatively,
- or try the witness lemma **at each layer**, proving  $\Delta^* \geq (1 - \epsilon)d - O(\log n)$



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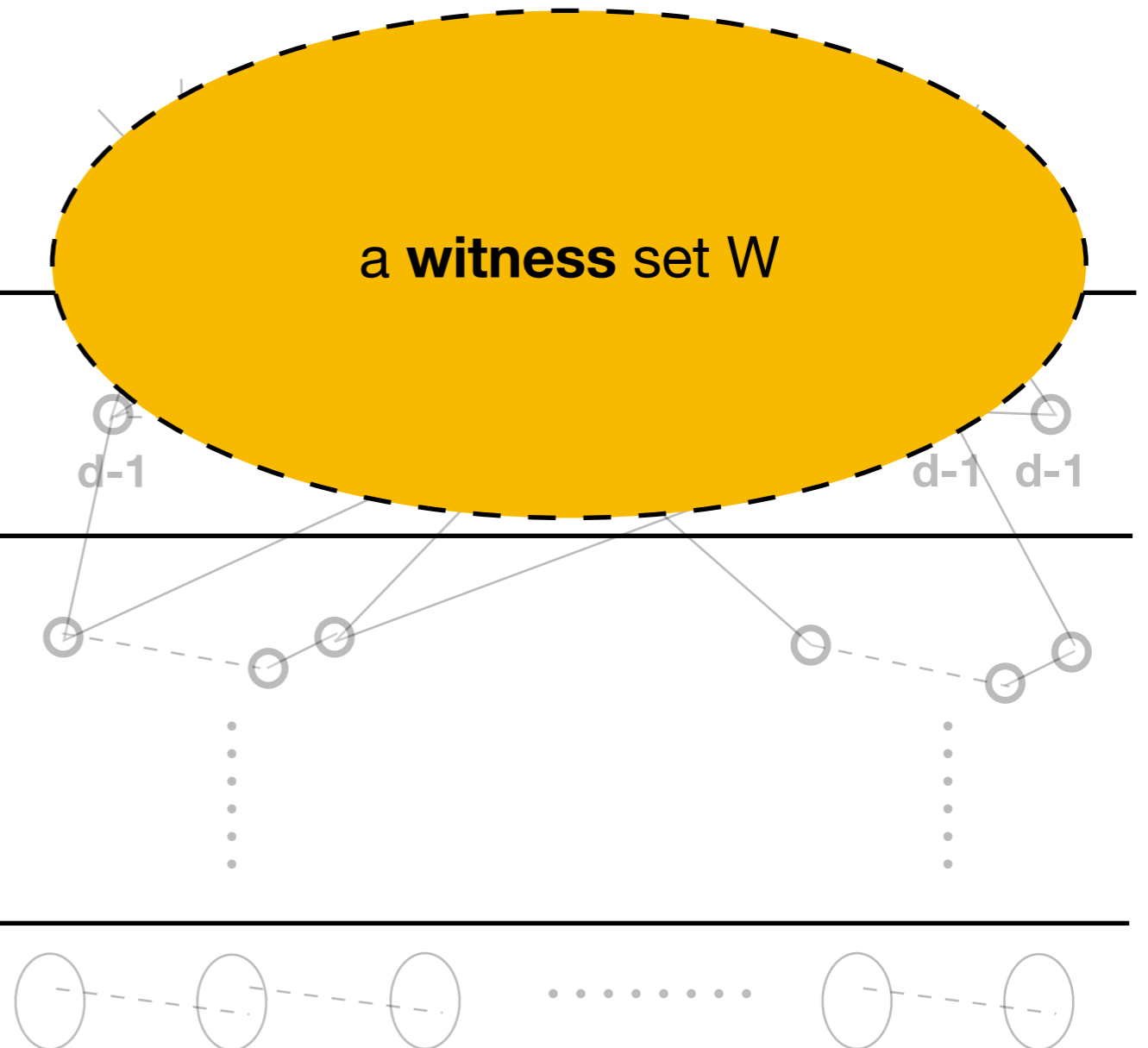
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a witness set  $W$

**layer-2** : tree degree =  $d - 1$

⋮

**layer-k** : tree degree =  $d - 1$



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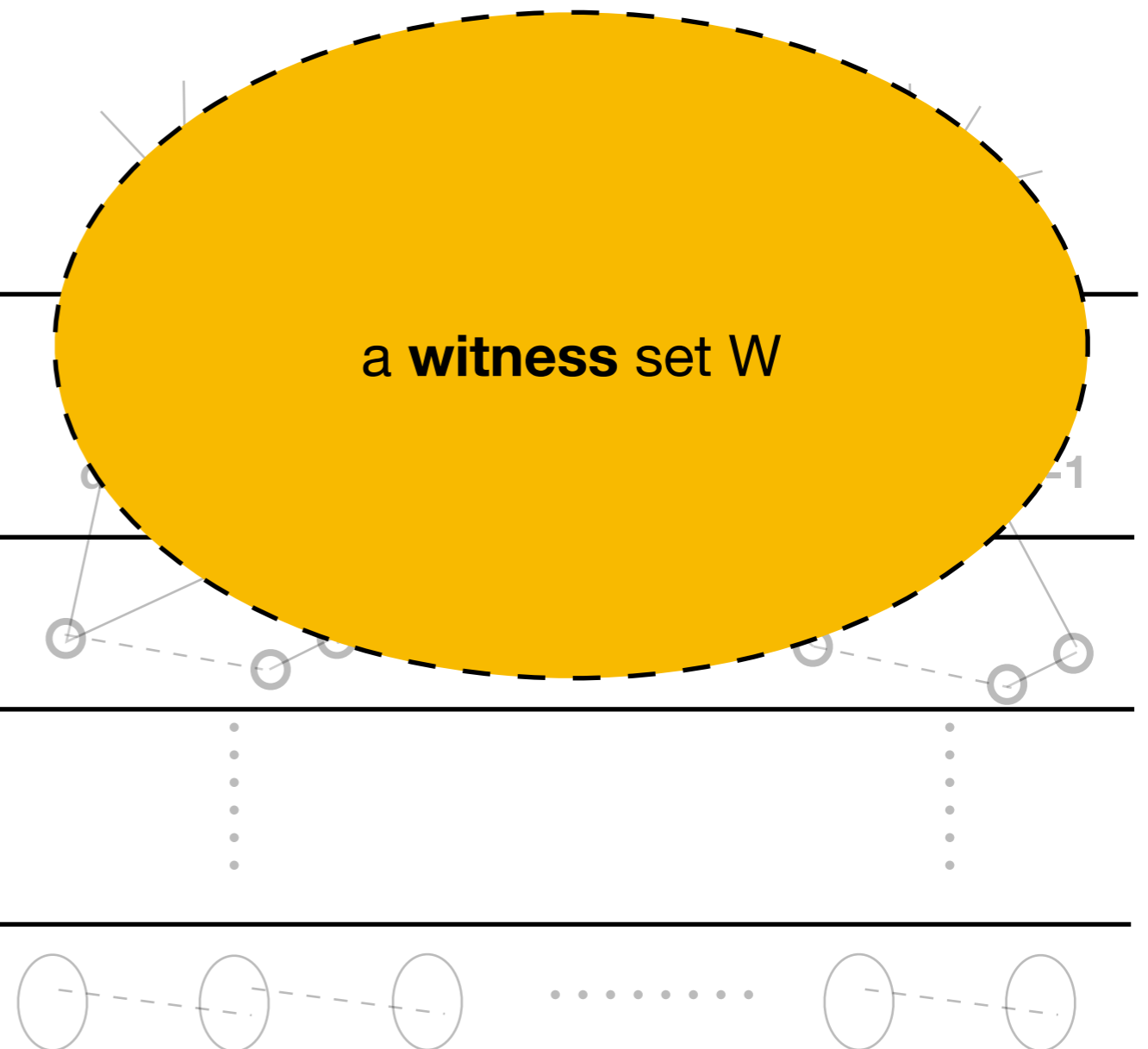
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⋮

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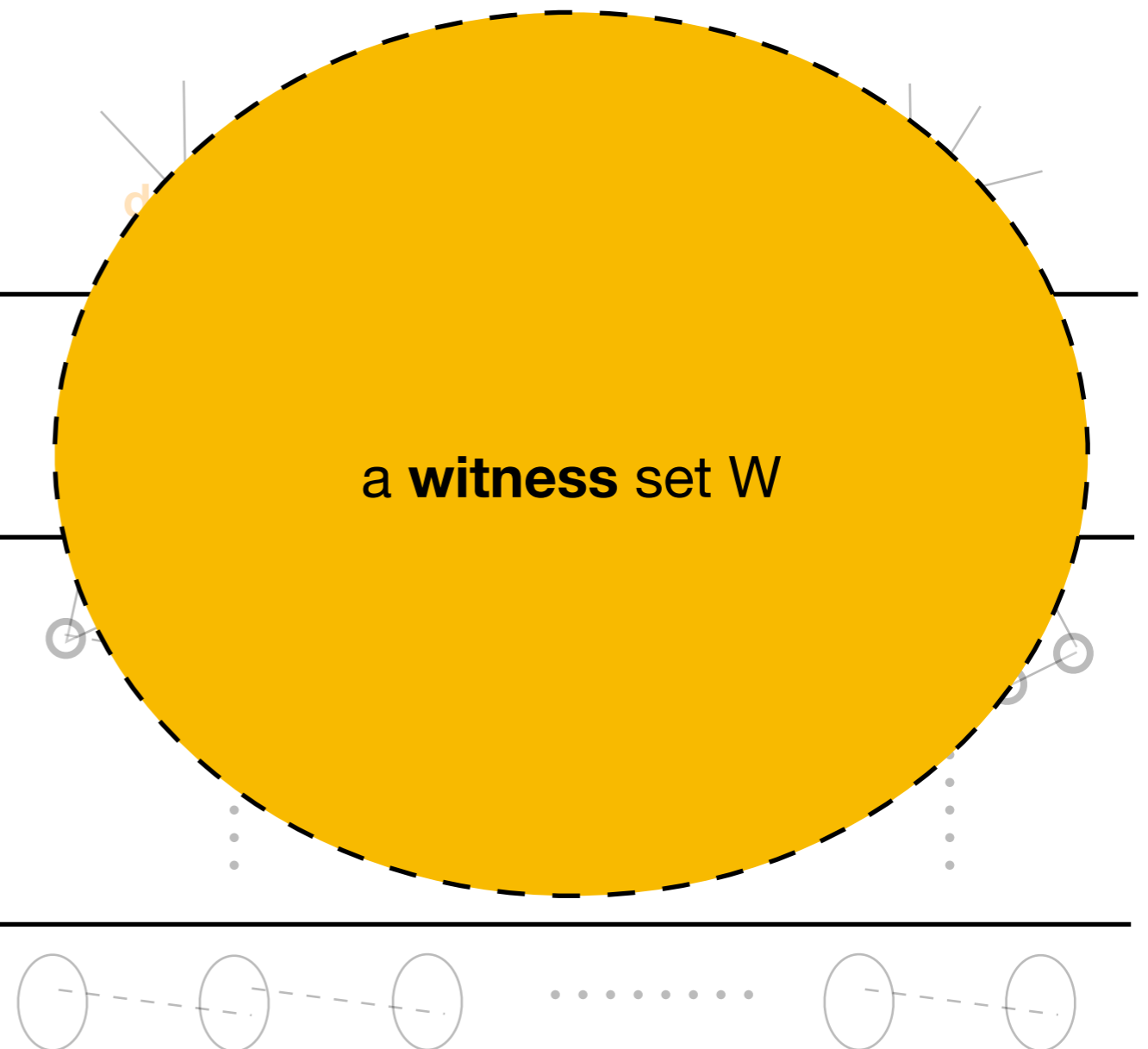
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**Thank you!**