

# Data Structures for Temporal Queries on Dynamic Temporal Graphs\*

Davide Bilò



Algorithmic Aspects of Temporal Graphs IX  
Royal Holloway, University of London  
United Kingdom  
July 6th, 2026

\* Based on a joint work with Luciano Gualà, Stefano Leucci, Guido Proietti, and Alessandro Straziota

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- Design a compact **data structure** (a.k.a. **oracle**) that
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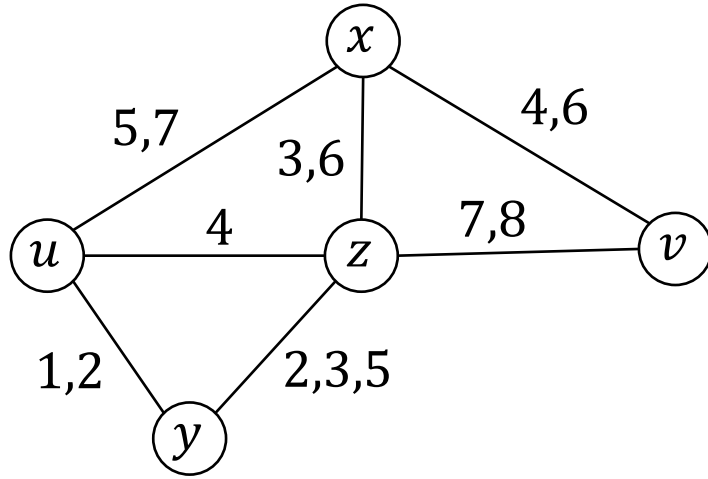
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Design oracles with good tradeoffs among  
size, query time, and update time (only if dynamic)

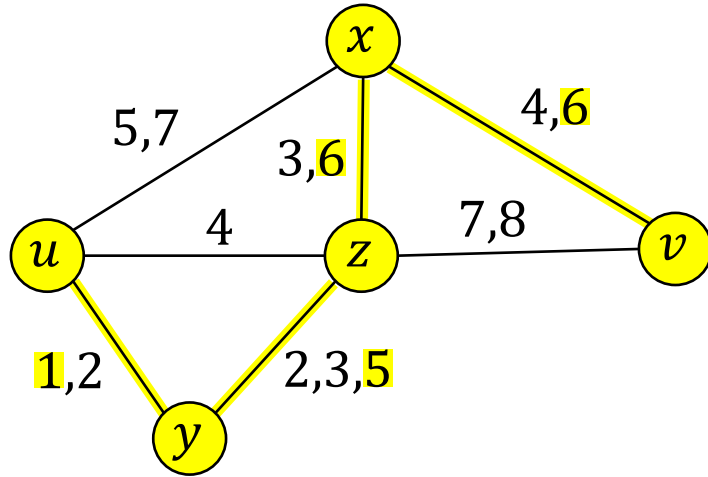
# Temporal graph model



## Temporal graph

- undirected graph
- each edge  $e$  has a set  $\lambda(e)$  of integer time labels

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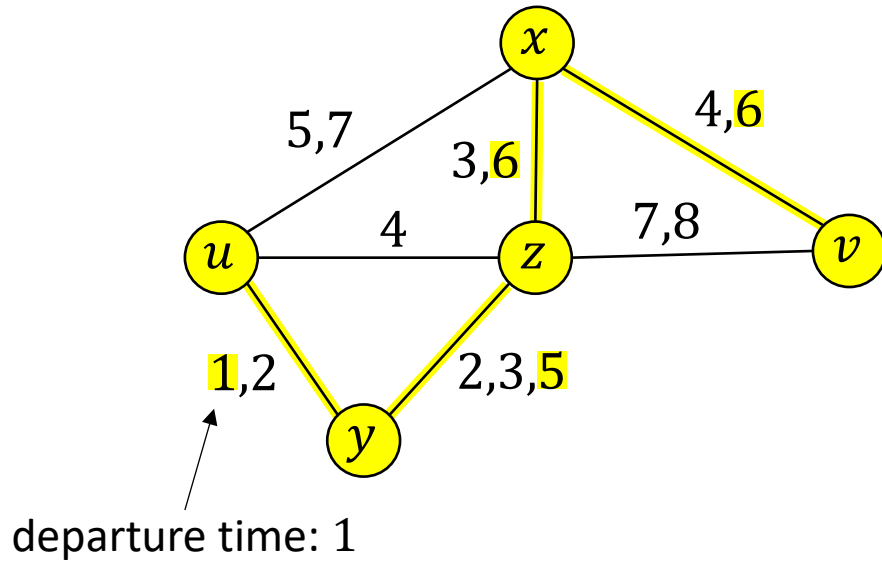
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## non-strict temporal $u - v$ path

A  $u - v$  path  $P$ , with a selected  $t_e \in \lambda(e)$  for each edge  $e$  in  $P$ , s.t. the sequence of traversed  $t_e$ 's is monotonically non-decreasing



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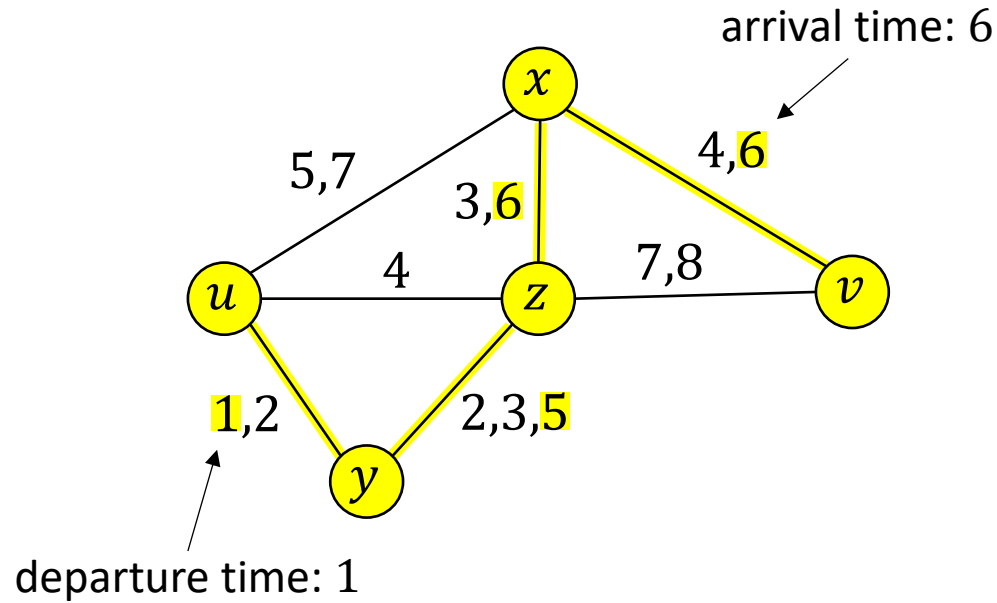
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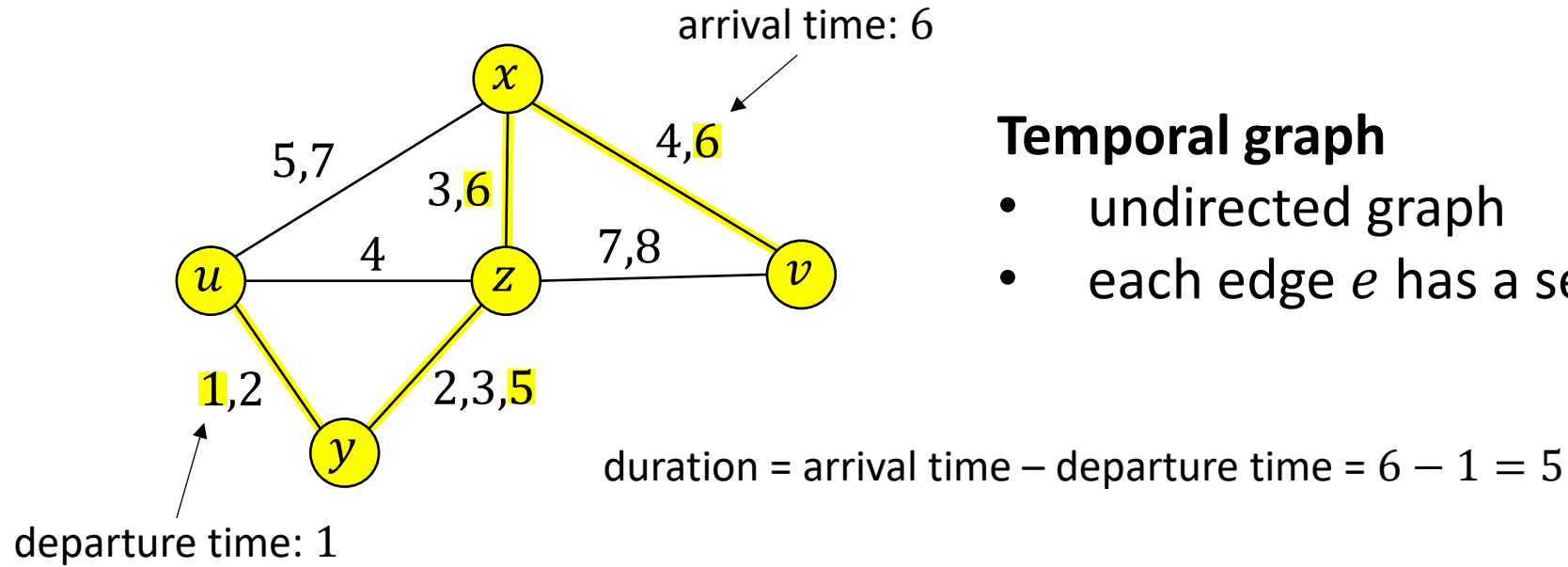
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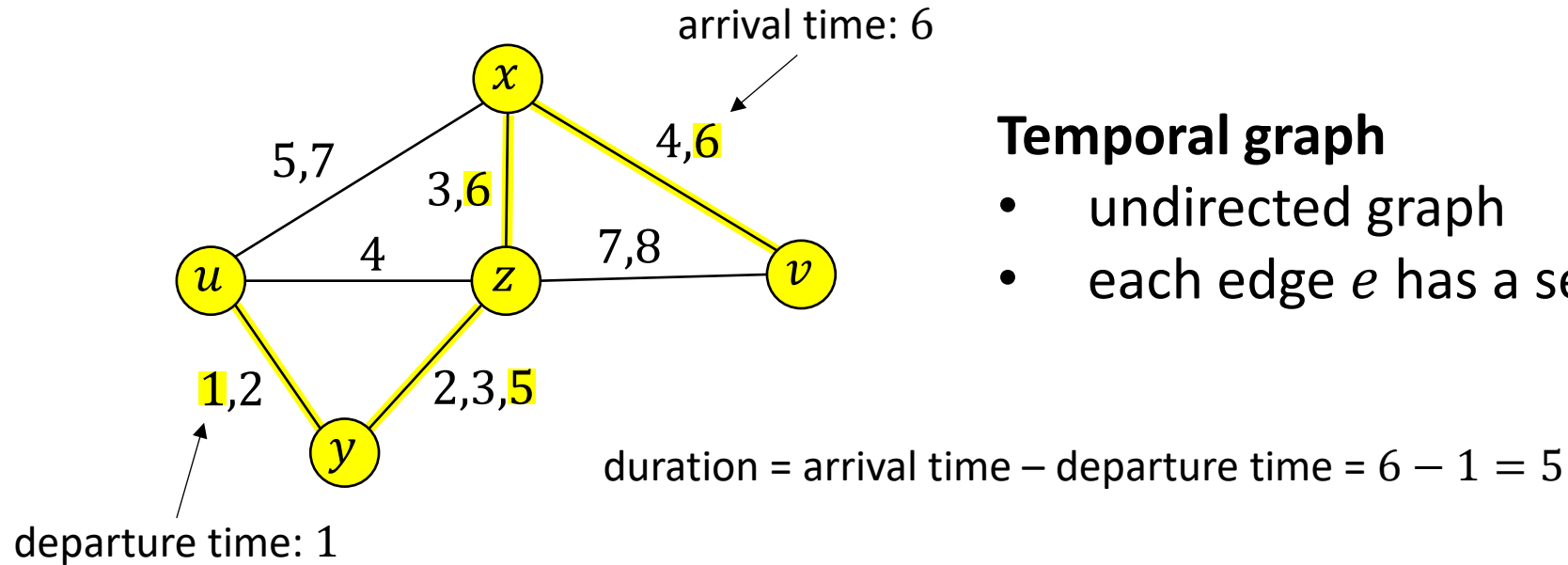
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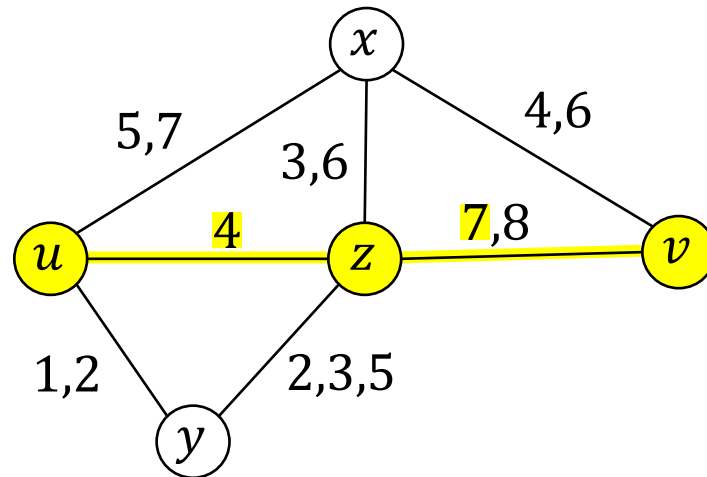
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All the results we will see can be adapted to strict temporal paths

# Queries

**Temporal Reachability**  $TR(u, v, [d, a])$

Existence of a temporal  $u - v$  path restricted to the time interval  $[d, a]$



$$TR(u, v, [3,7]) = TRUE$$

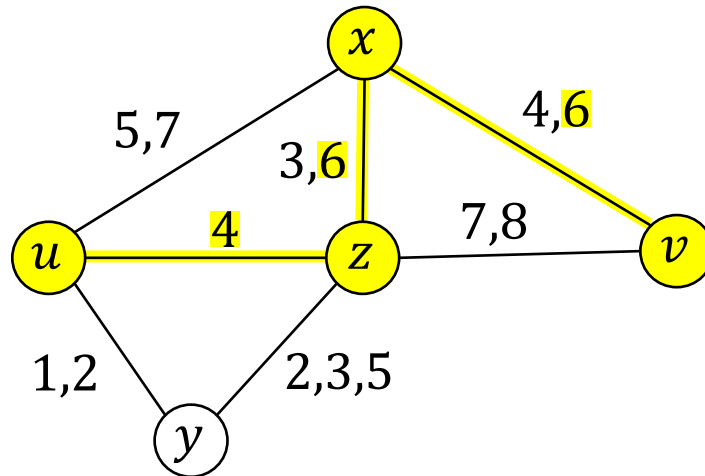
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Minimum arrival time of a temporal  $u - v$  path with departure time  $\geq d$



$$EA(u, v, 3) = 6$$

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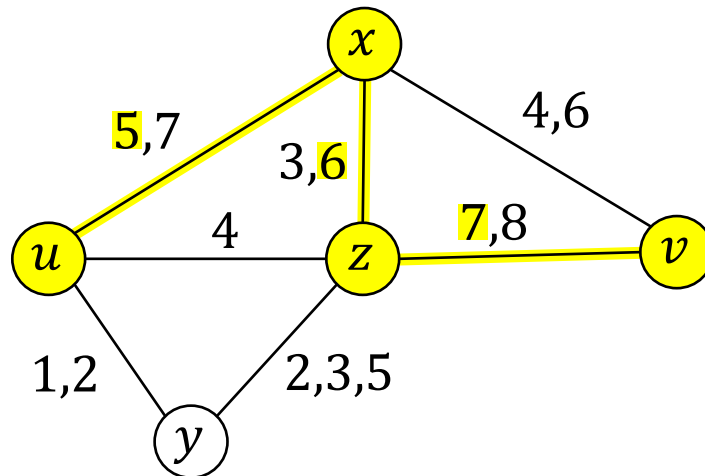
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**Latest Departure**  $LD(u, v, a)$

Maximum departure time of a temporal  $u - v$  path with arrival time  $\leq a$



$$LD(u, v, 7) = 5$$

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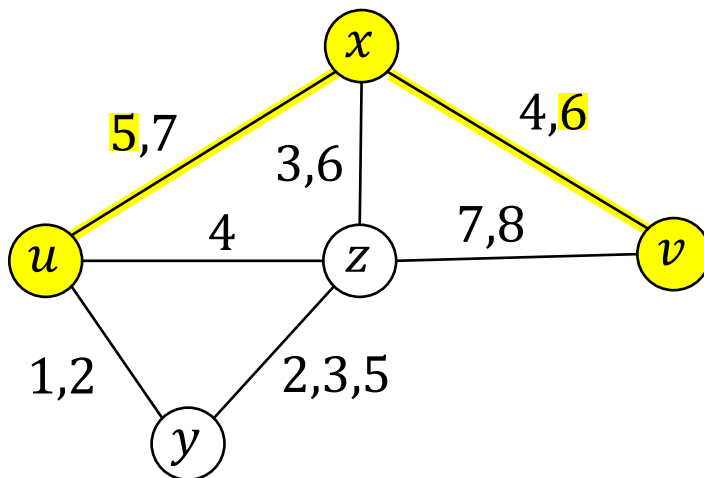
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**Latest Departure**  $LD(u, v, a)$

Maximum departure time of a temporal  $u - v$  path with arrival time  $\leq a$

**Min Duration**  $MD(u, v, [d, a])$

Minimum duration of a temporal  $u - v$  path restricted to the time interval  $[d, a]$



$$MD(u, v, [3, 7]) = 1$$



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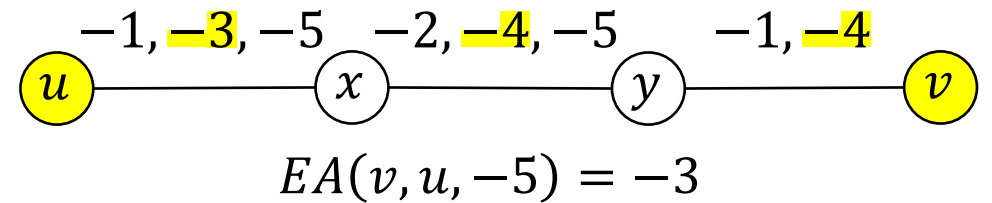
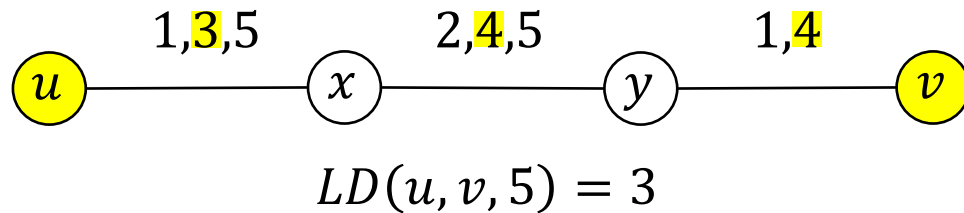
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- **Brito, Albertini, Travençolo, and Navarro, The Computer Journal 2024:** compact representation in practice

# Our contribution

[1] B., Gualà, Leucci, Proietti, and Straziota, ALGOWIN 2025  
[2] B., Gualà, Leucci, Proietti, and Straziota, ISAAC 2024

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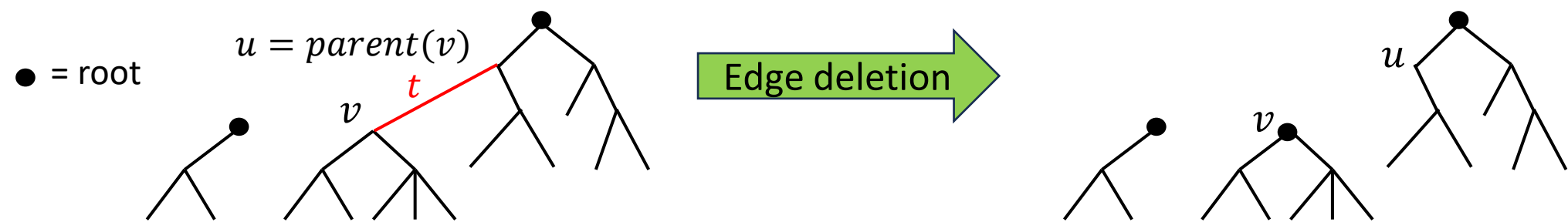
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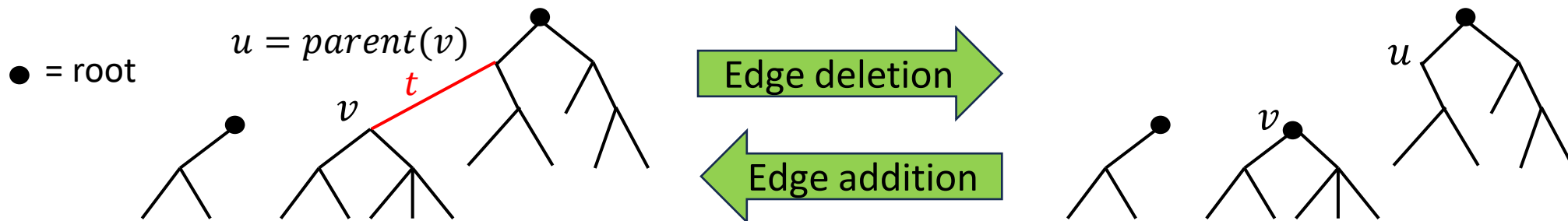
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- If we add latencies to forests of rooted trees
  - Uniform latencies: same trade-offs

# Our contribution

[1] B., Gualà, Leucci, Proietti, and Straziota, ALGOWIN 2025

[2] B., Gualà, Leucci, Proietti, and Straziota, ISAAC 2024

$$\begin{aligned} \bullet \quad M &= \sum_e |\lambda(e)| \\ \bullet \quad L &= \max_e |\lambda(e)| \end{aligned}$$

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- If we add latencies to forests of rooted trees
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  - Non-uniform latencies
    - Incremental and decremental scenarios (i.e., only insertions or deletions)
    - same trade-offs, but update time bounds become amortized



# Results presented in this talk

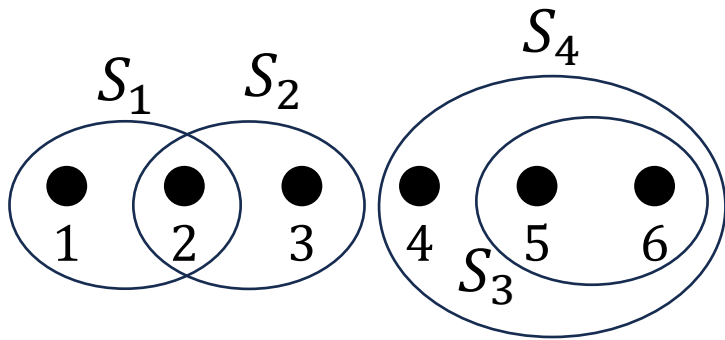
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# The conditional LB of oracles supporting MD queries

**SET DISJOINTNESS PROBLEM:** Given  $k$  subsets  $S_1, \dots, S_k$  of a universe  $U$  with  $N = \sum_i |S_i|$ , design an oracle that can answer to queries «Given  $i$  and  $j$ , are  $S_i$  and  $S_j$  disjoint?».

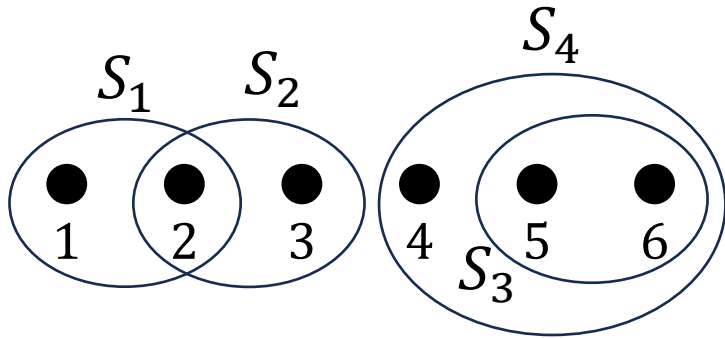


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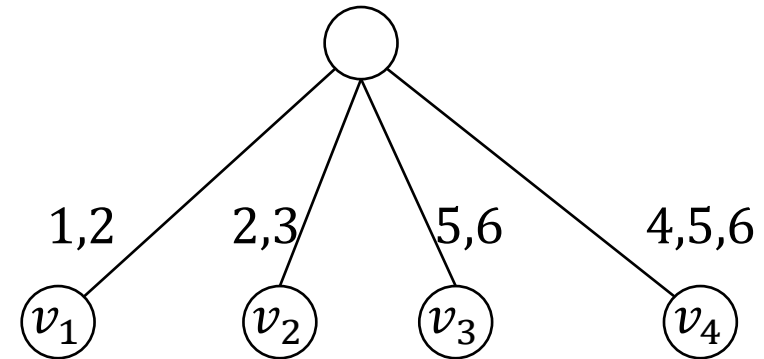
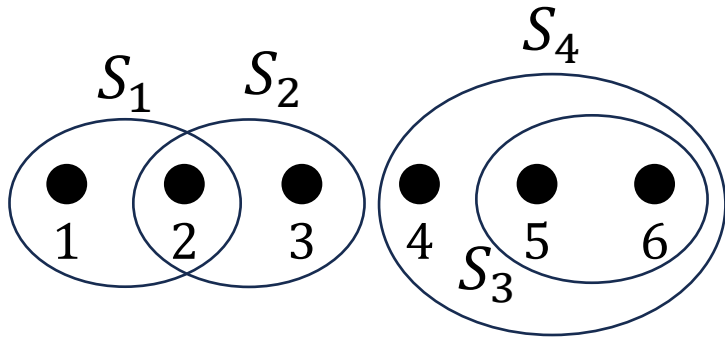


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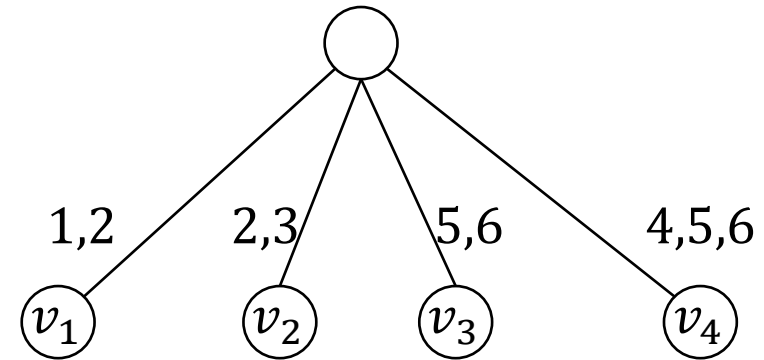
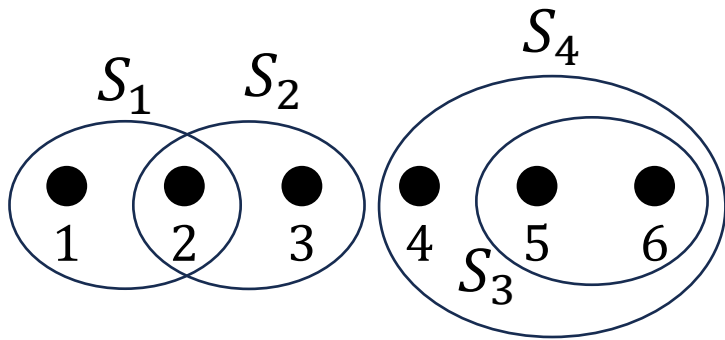


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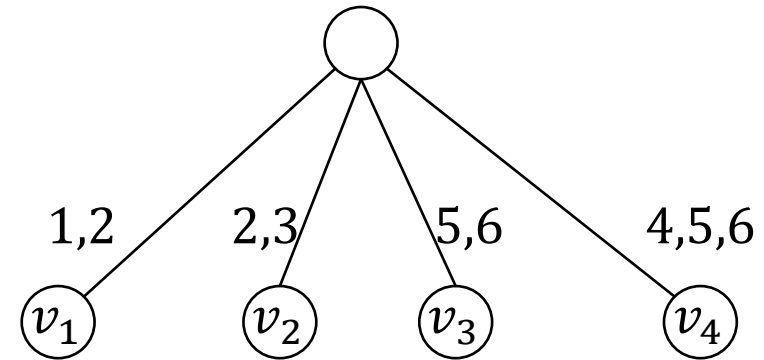
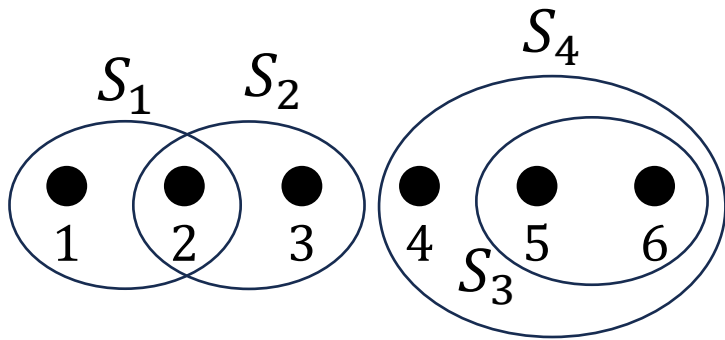
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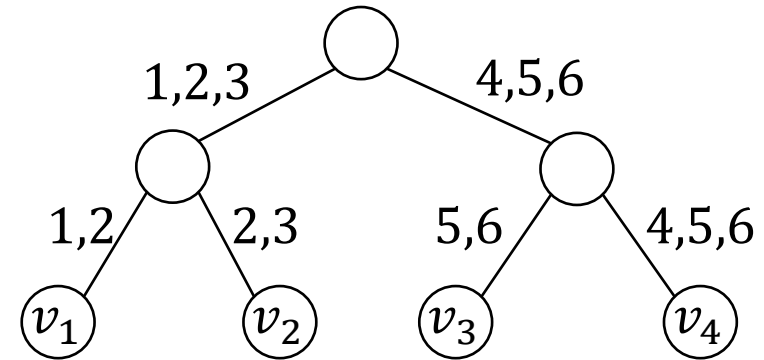
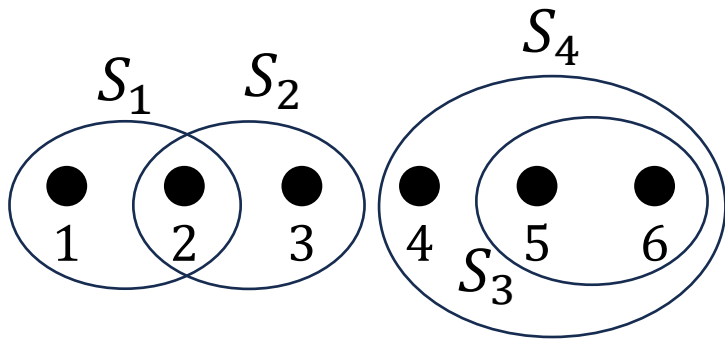
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Any oracle for STATIC temporal TREES supporting MD queries in worst-case time  $t$  requires  $\tilde{\Omega}(M^2/t^2)$  space even if the tree has max degree 3.

# Results presented in this talk

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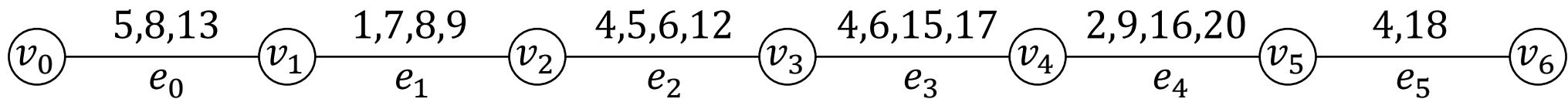
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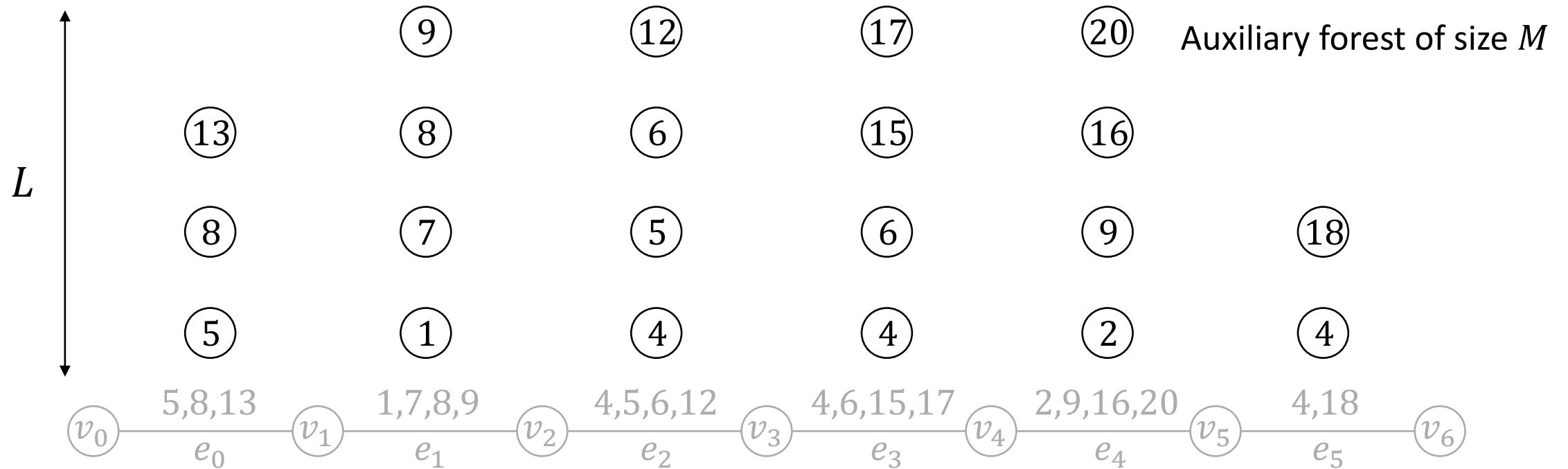
# An almost successful attempt

**IDEA 1:** Model all useful *left-to-right* EA temporal paths.



# An almost successful attempt

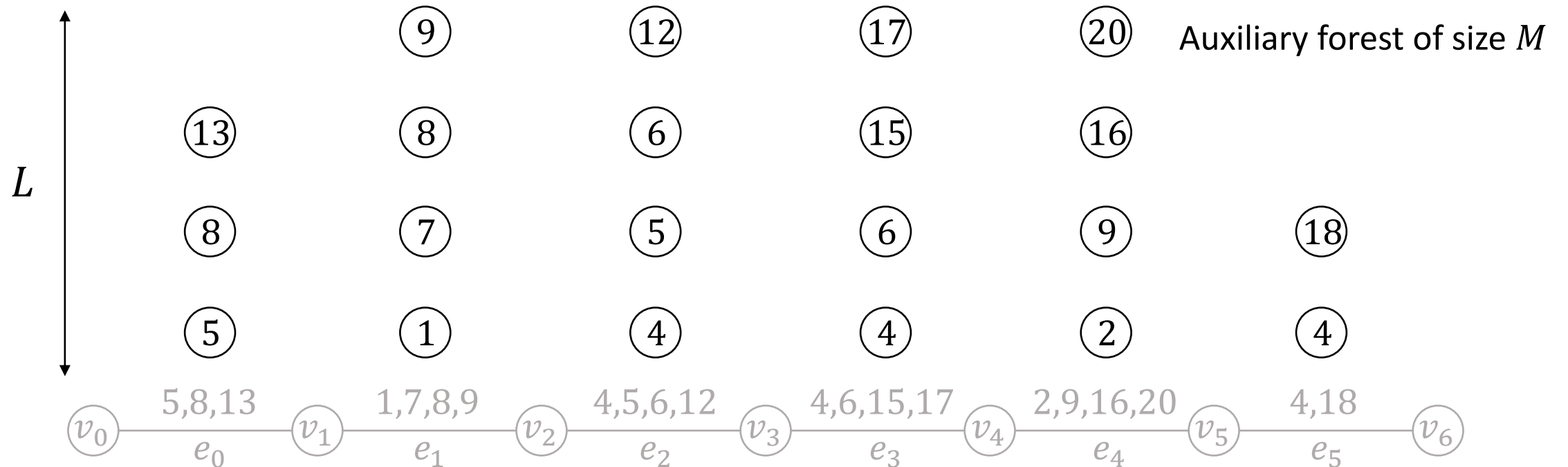
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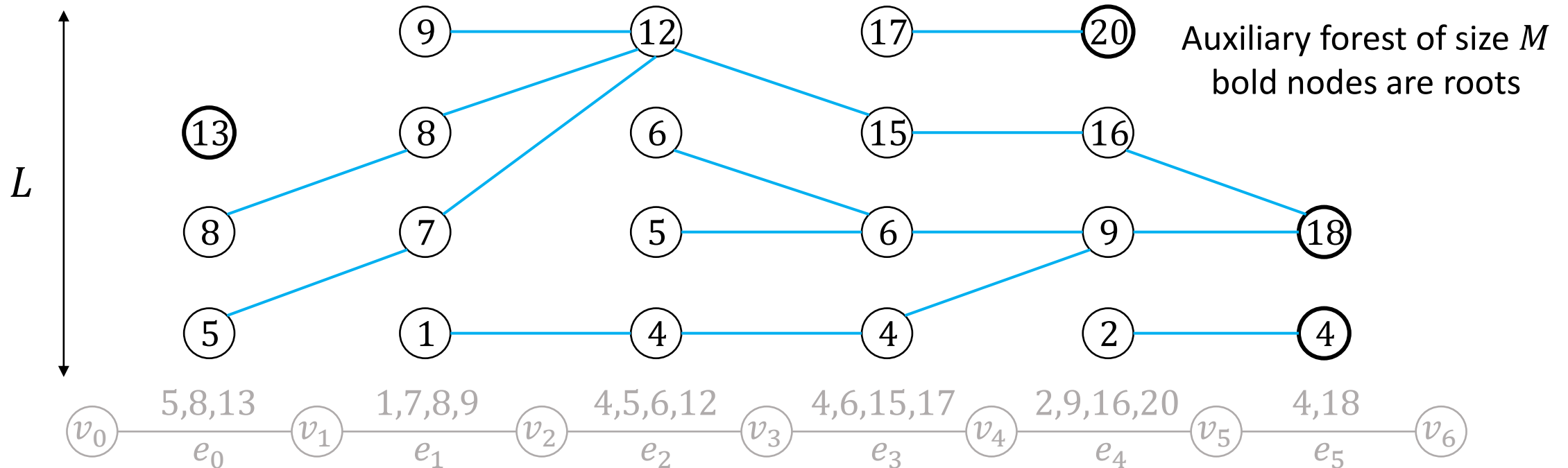
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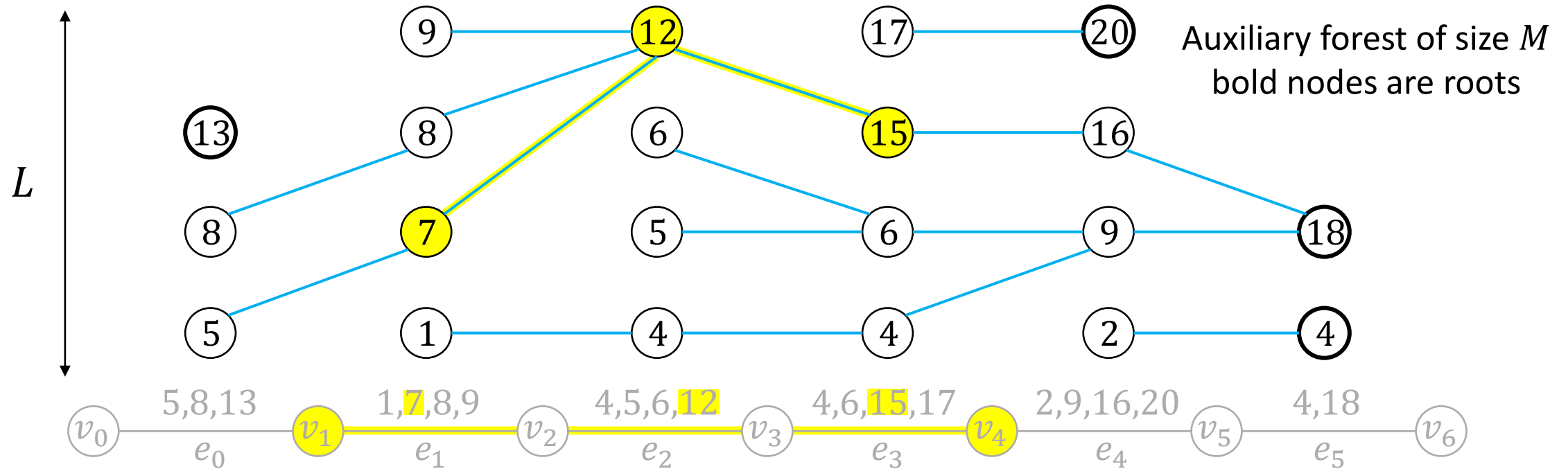
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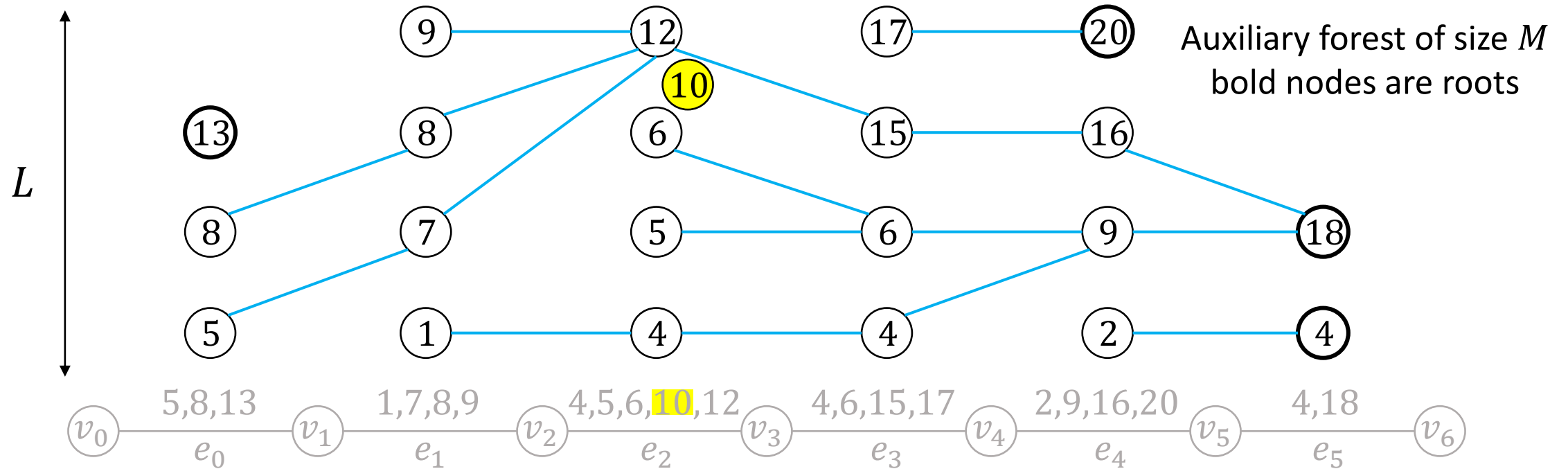
$EA(v_i, v_j, d)$ : Find non-strict successor of  $d$  in column  $i$  and return its  $(j - i - 1)$ th ancestor



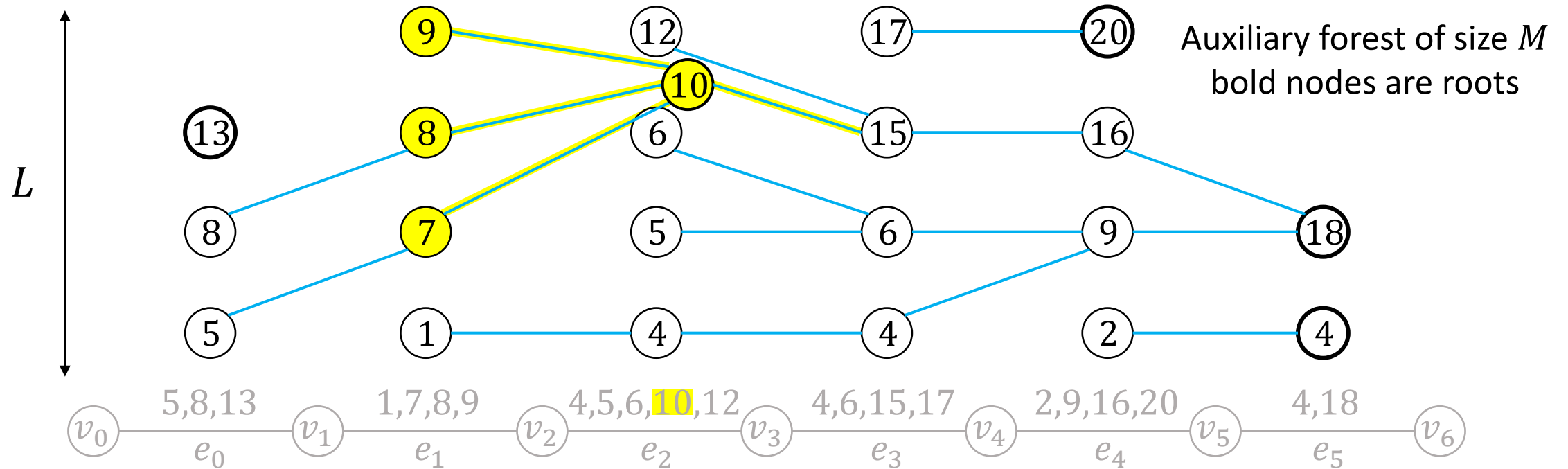
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# An almost successful attempt

Poor update time when inserting/deleting a time label

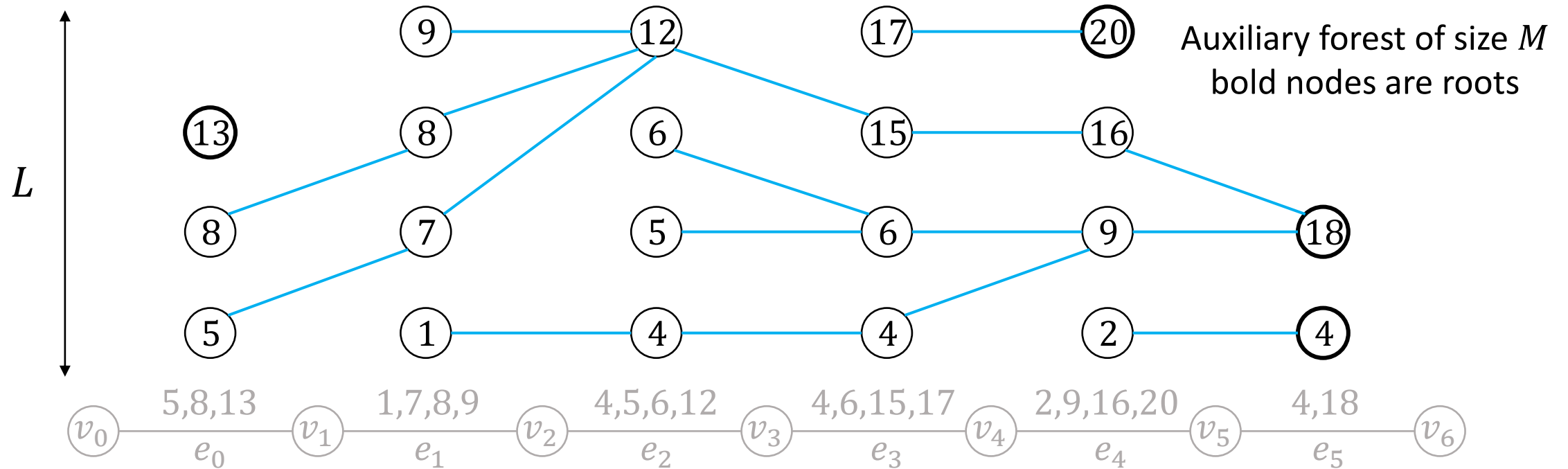


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# How to reduce node degrees

**IDEA 2:** Reduce the degree of nodes to a constant.

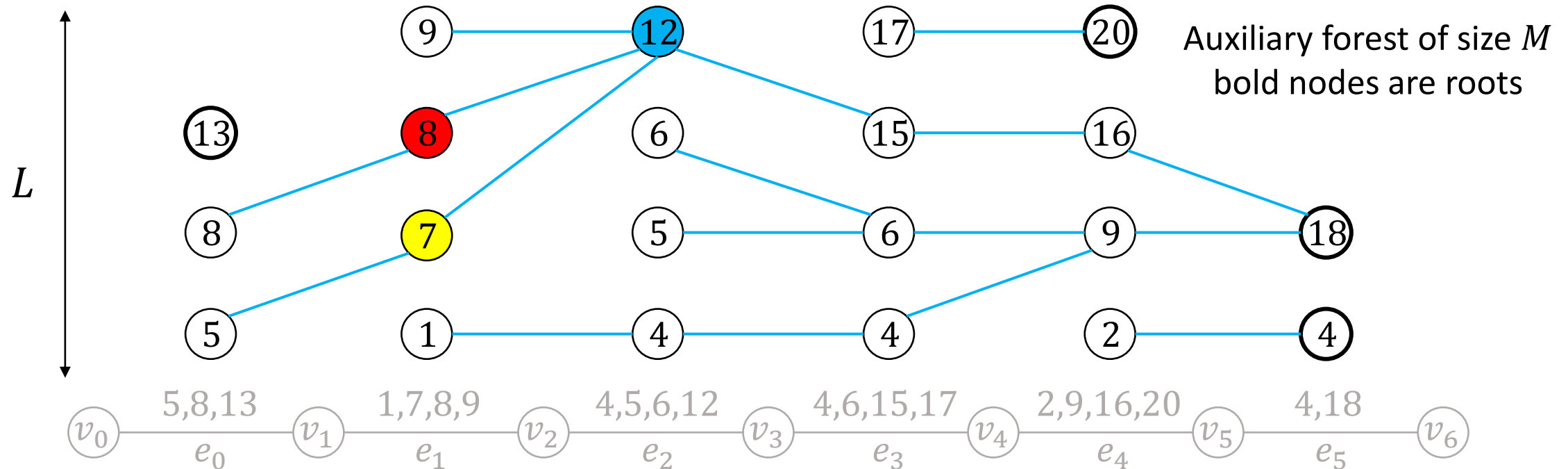




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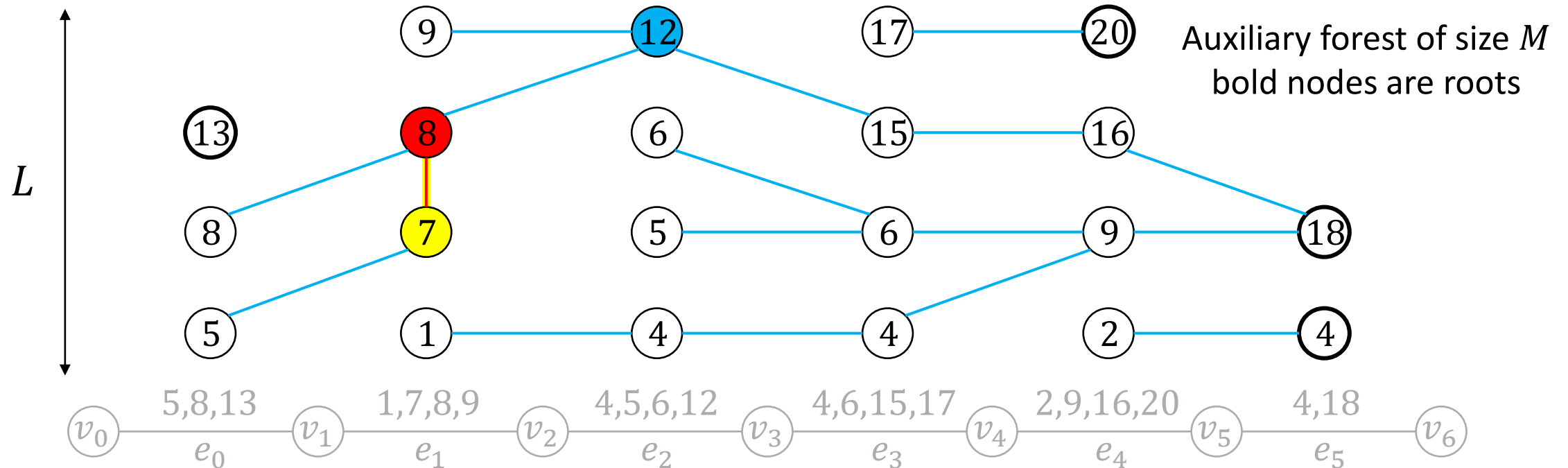
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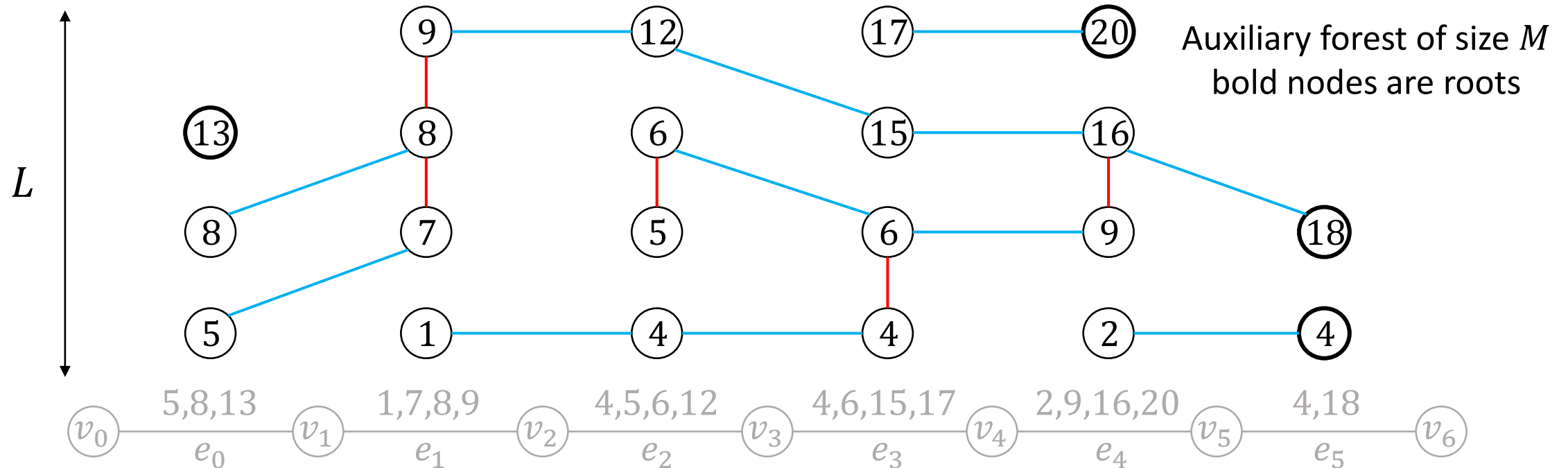
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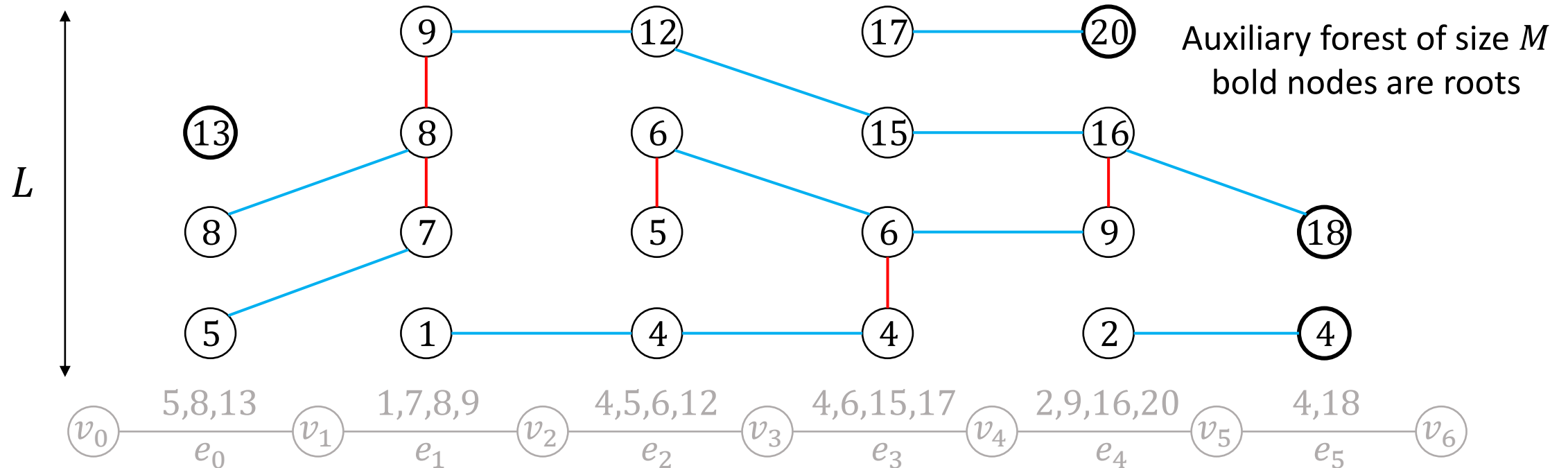
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# Fixing EA queries

**IDEA 3:** Add edge weights.

Blue edges have weight 1  
Red edges have weight 0

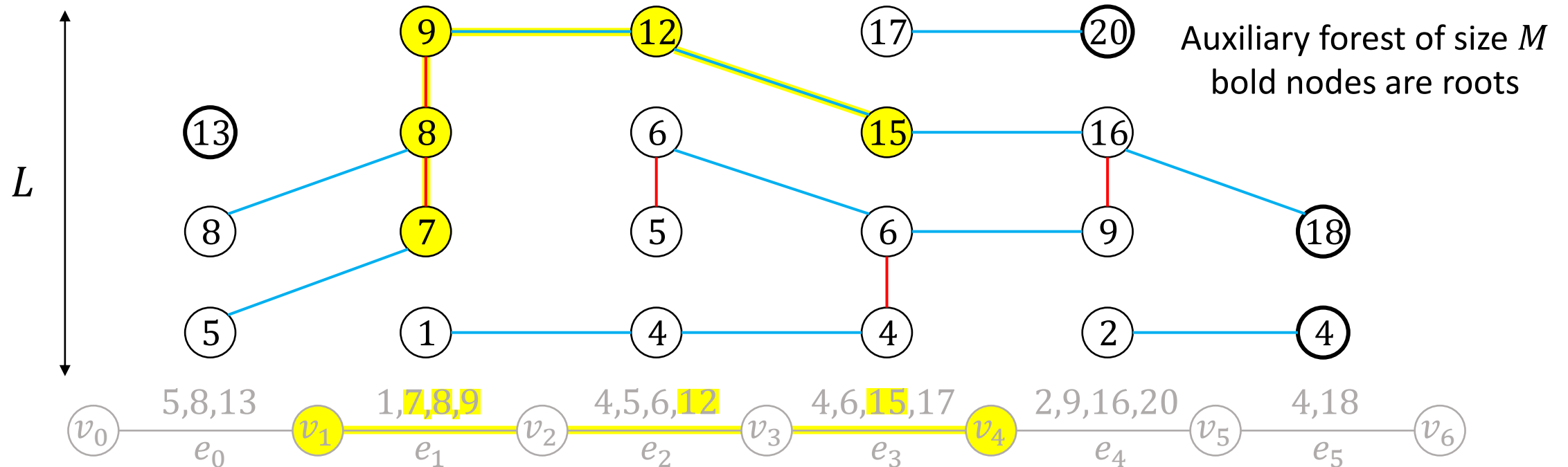


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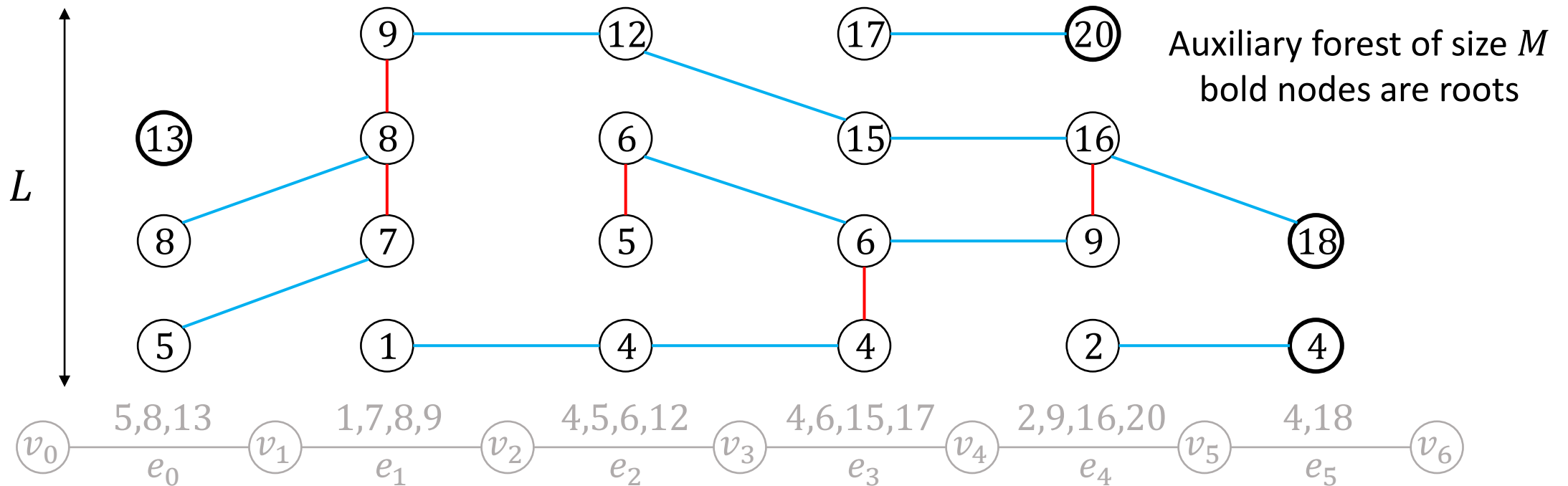
# The oracle

A dictionary for each  $e_i$  to store its time labels

- total size is  $O(M)$
- total building time is  $O(M \log L)$
- insertions/deletions in  $O(\log L)$  time
- predecessor/successor queries in  $O(\log L)$  time

A top tree to store the auxiliary forest

- size is  $O(M)$
- building time is  $O(M)$
- node/edge insertions/deletions in  $O(\log M)$  time
- weighted level-ancestor queries in  $O(\log M)$  time



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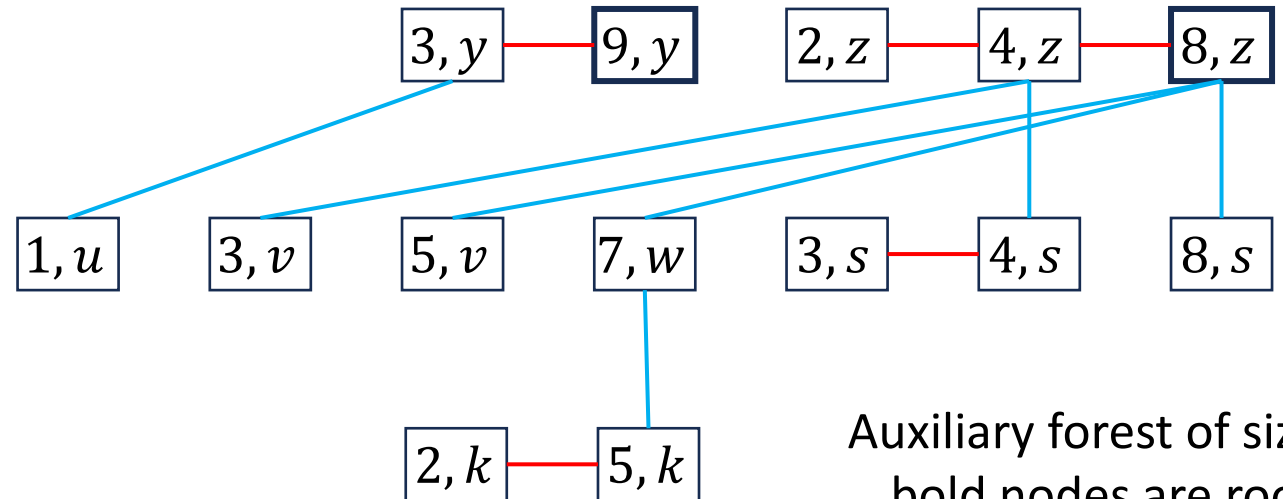
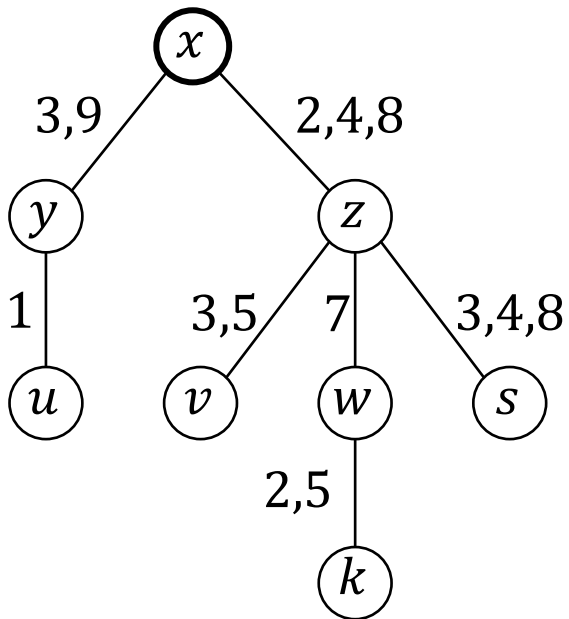
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# Oracle for dynamic temporal forests of rooted trees

**RECYCLED IDEA:** Model all useful *upwards* EA temporal paths.

It does not work as we create high-degree nodes.



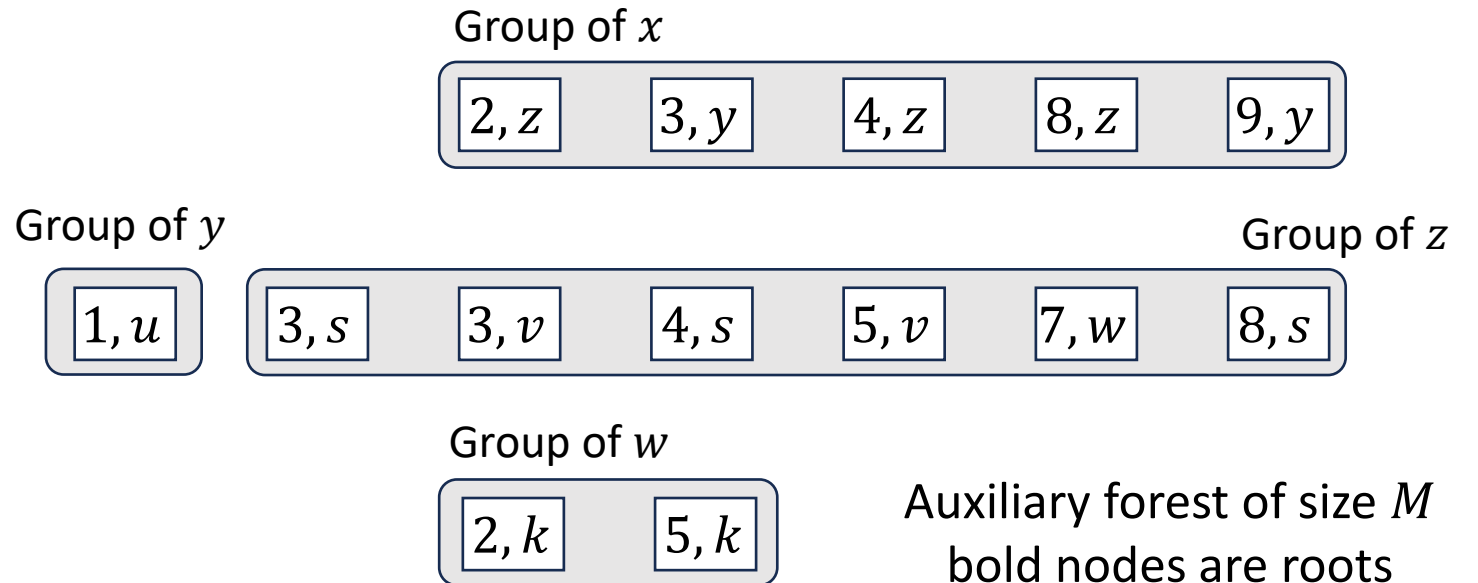
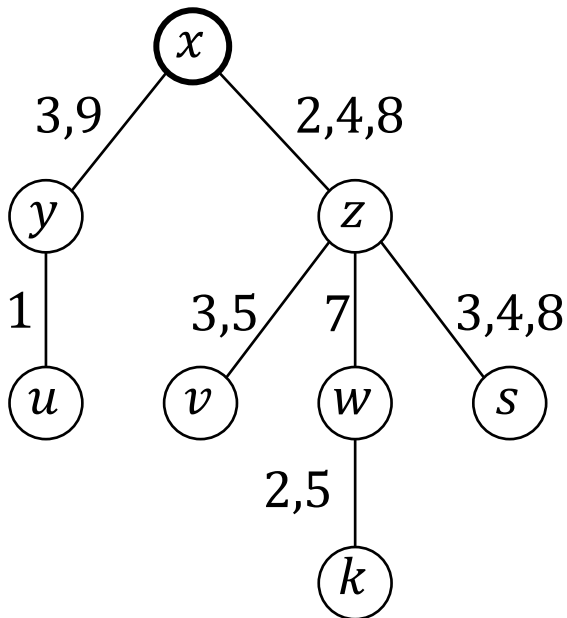
Auxiliary forest of size  $M$   
bold nodes are roots



# Oracle for dynamic temporal forests of rooted trees

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For each non-leaf  $v$ , group all nodes created by all edges branching from  $v$

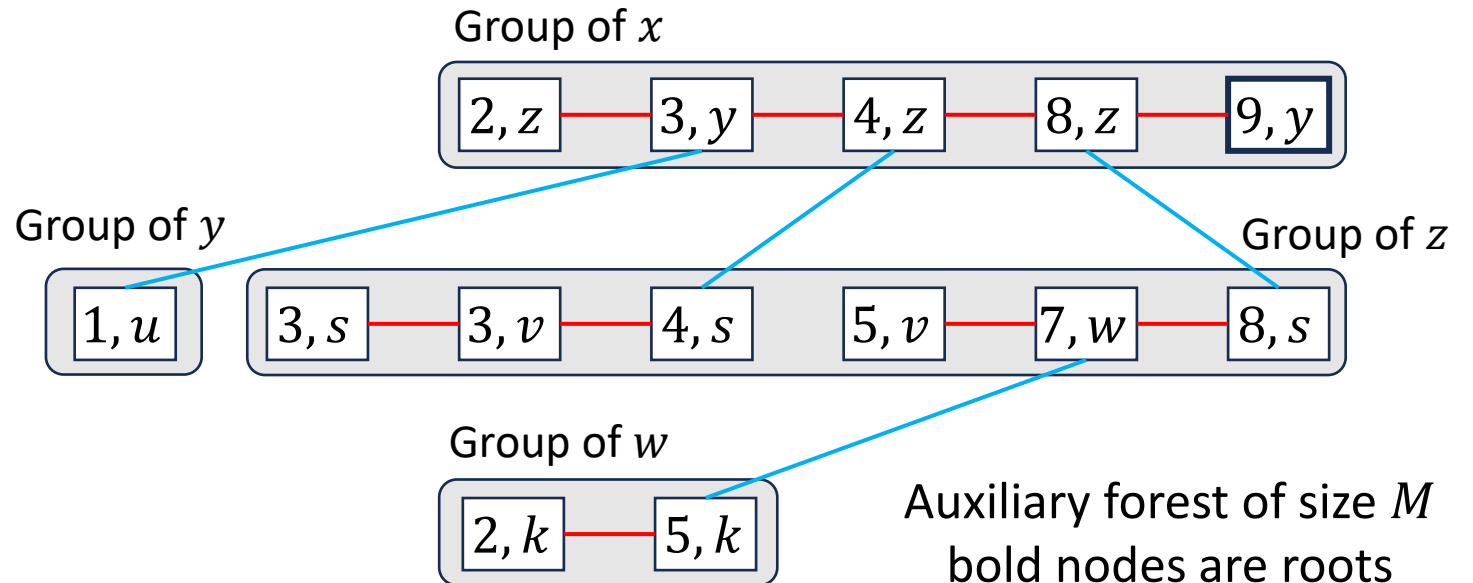
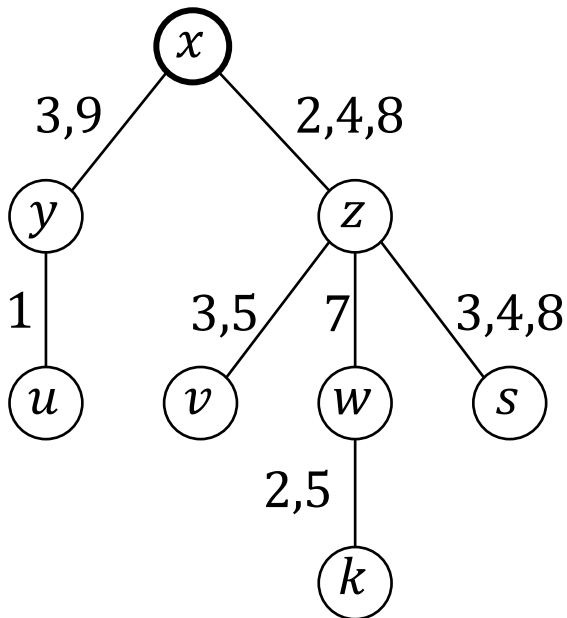


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Candidate **red parent** of a node is computed in its group.



# EA queries in $O(\log L \cdot \log M)$ time

$EA(u, v, d)$

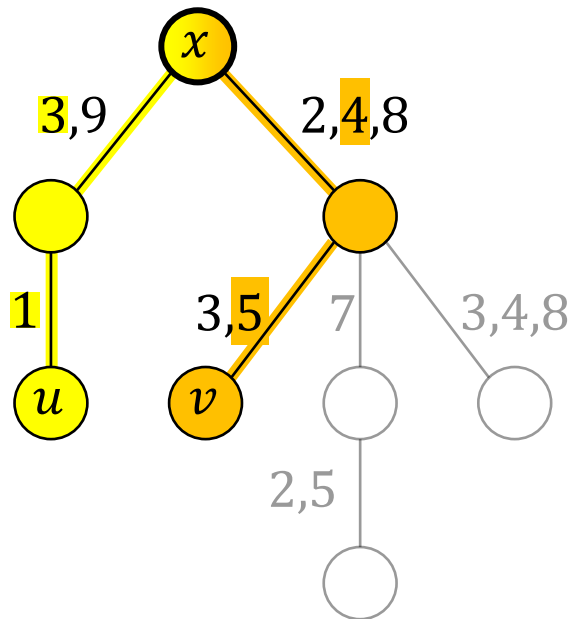
1.  $x = LCA(u, v)$

2.  $d_x = EA(u, x, d)$

// upward query in  $O(\log M)$  time

3. Return  $EA(x, v, d_x)$

// downward query in  $O(\log L \cdot \log M)$  time



$EA(u, v, 1) = 5$

- Upward query  $EA(u, x, 1) = 3$
- Downward query  $EA(x, v, 3) = 5$

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    - Asymptotic tight bounds, up to polylog factors, even for trees of max degree 3
  - DYNAMIC temporal FOREST of ROOTED TREES supporting TR/EA/LD queries
    - same amortized update times if we add latencies, but only in the incremental/decremental scenarios

**OPEN PROBLEM 1:** Oracles for fully dynamic temporal forests with latencies supporting TR/EA/LD queries

**OPEN PROBLEM 2:** Better oracles for static paths supporting MD queries

**OPEN PROBLEM 3:** Oracles for dynamic trees supporting MD queries and time-label updates

**OPEN PROBLEM 4:** Oracles for temporal graphs

(possibly with some useful restrictions like simple temporal graphs, or bounded treewidth)

# Summary and Open Problems

- Prior to our work, results known for directed graphs supporting TR queries and time-label insertions
- We designed oracles with good tradeoffs for
  - STATIC TREES supporting MD queries
    - Asymptotic tight bounds, up to polylog factors, even for trees of max degree 3
  - DYNAMIC temporal FOREST of ROOTED TREES supporting TR/EA/LD queries
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**OPEN PROBLEM 5:** Oracles supporting other types of queries (e.g., min travel time, min waiting time, etc.)

Thanks for your attention