

Disjoint Set - Union/Find

# Disjoint Set – Union/Find

- $n$  distinct elements named  $1, 2, \dots, n$
- Initially, each element is in its own set
$$S_1 = \{1\}, \quad S_2 = \{2\}, \dots, \quad S_n = \{n\}$$
- Each set has a **representative** element
- $S_x$  : Set represented by element  $x$

Operations:

**Union**( $S_x, S_y$ ): Create set  $S = S_x \cup S_y$  and return the representative of  $S$

**Find**( $z$ ): Given (a ptr to)  $z$ , find set  $S$  that contains  $z$  and return the representative of  $S$

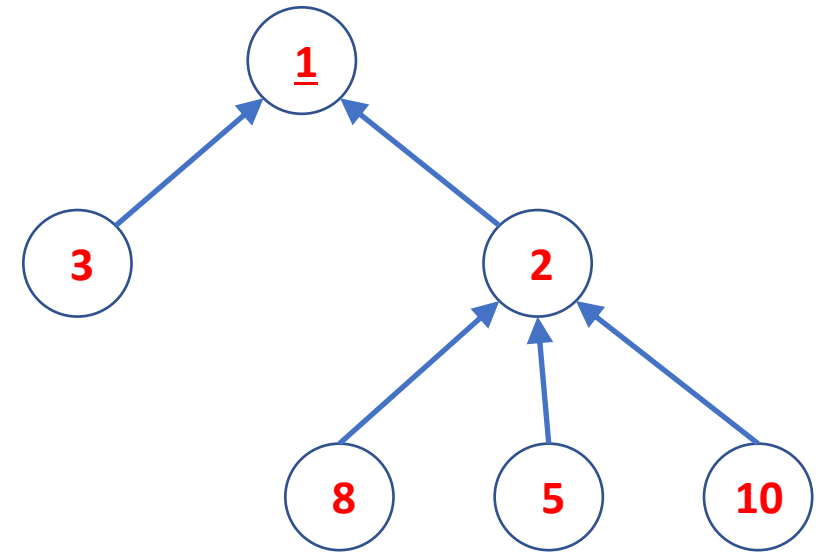
$\sigma$  : Sequence of  $n - 1$  **Unions** mixed with  $m \geq n$  **Finds**

**Goal**: a data structure that minimizes the **total cost** of executing such sequences

# Forest structure for Union-Find

- Each set is represented by a tree
- The root contains the set representative

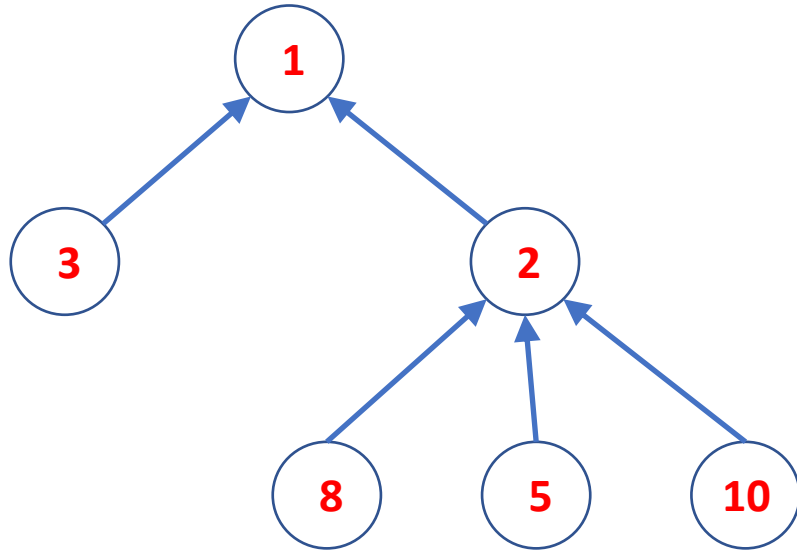
$$S_1 = \{\underline{1}, 3, 2, 8, 5, 10\}$$



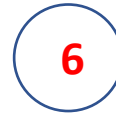
Example with  $n = 10$

$S = \{1, 2, 3, 4, 5, 6, 7, 8, 9, 10\}$

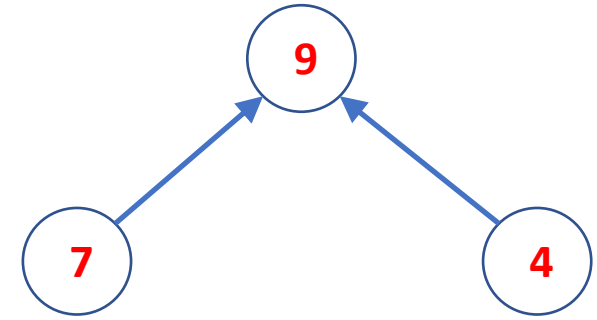
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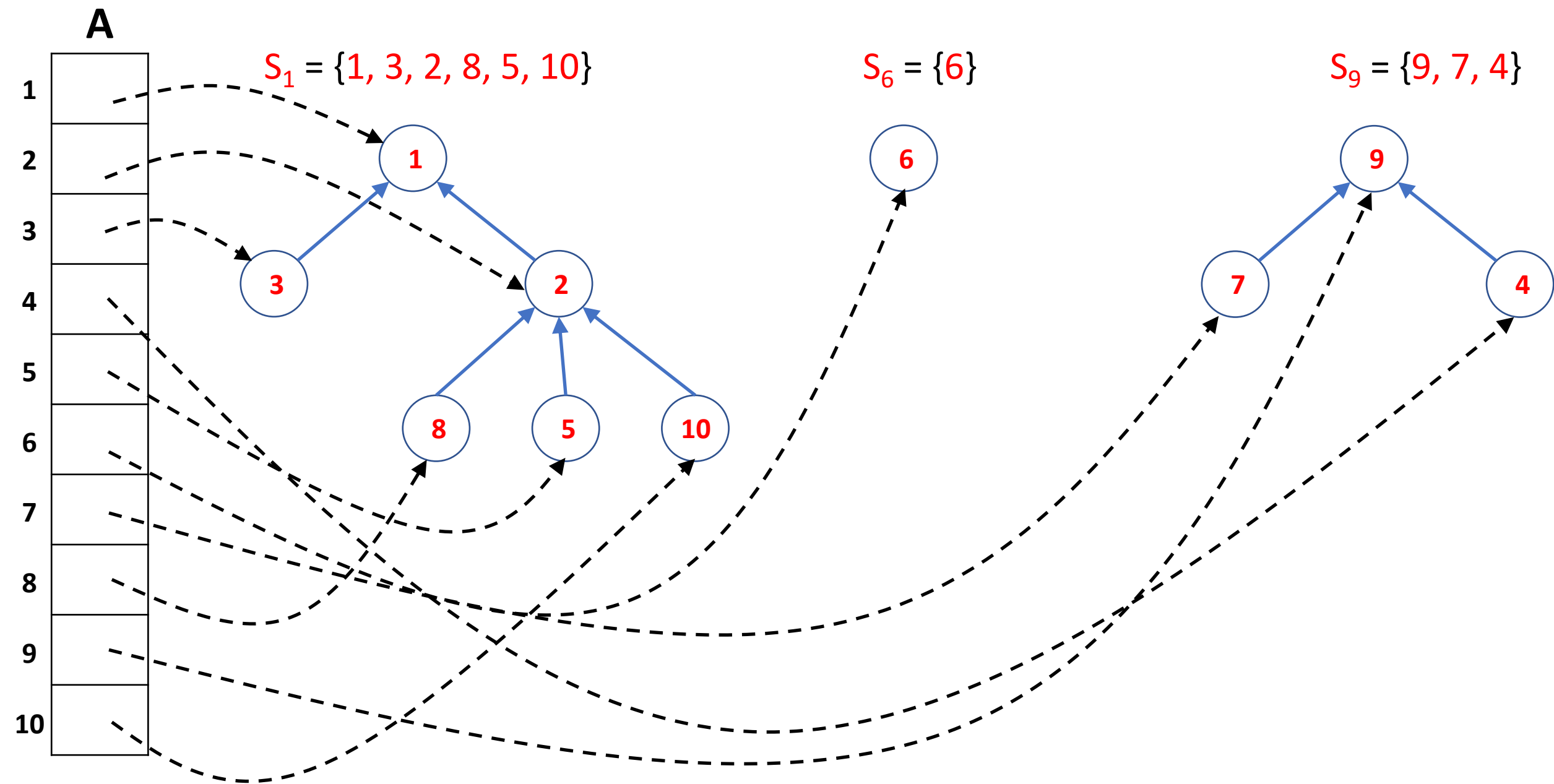
$S_6 = \{6\}$



$S_9 = \{9, 7, 4\}$

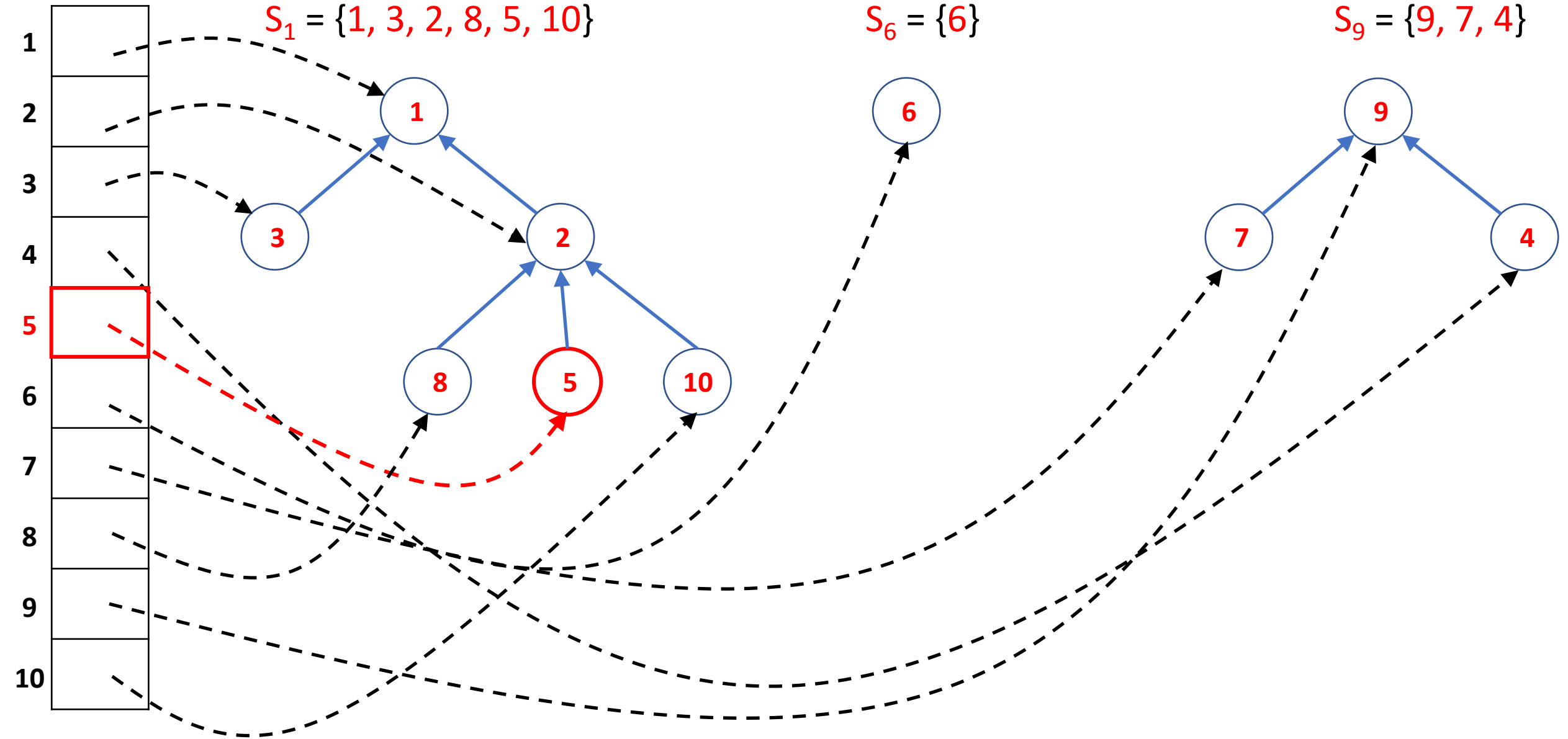


## Example with $n = 10$



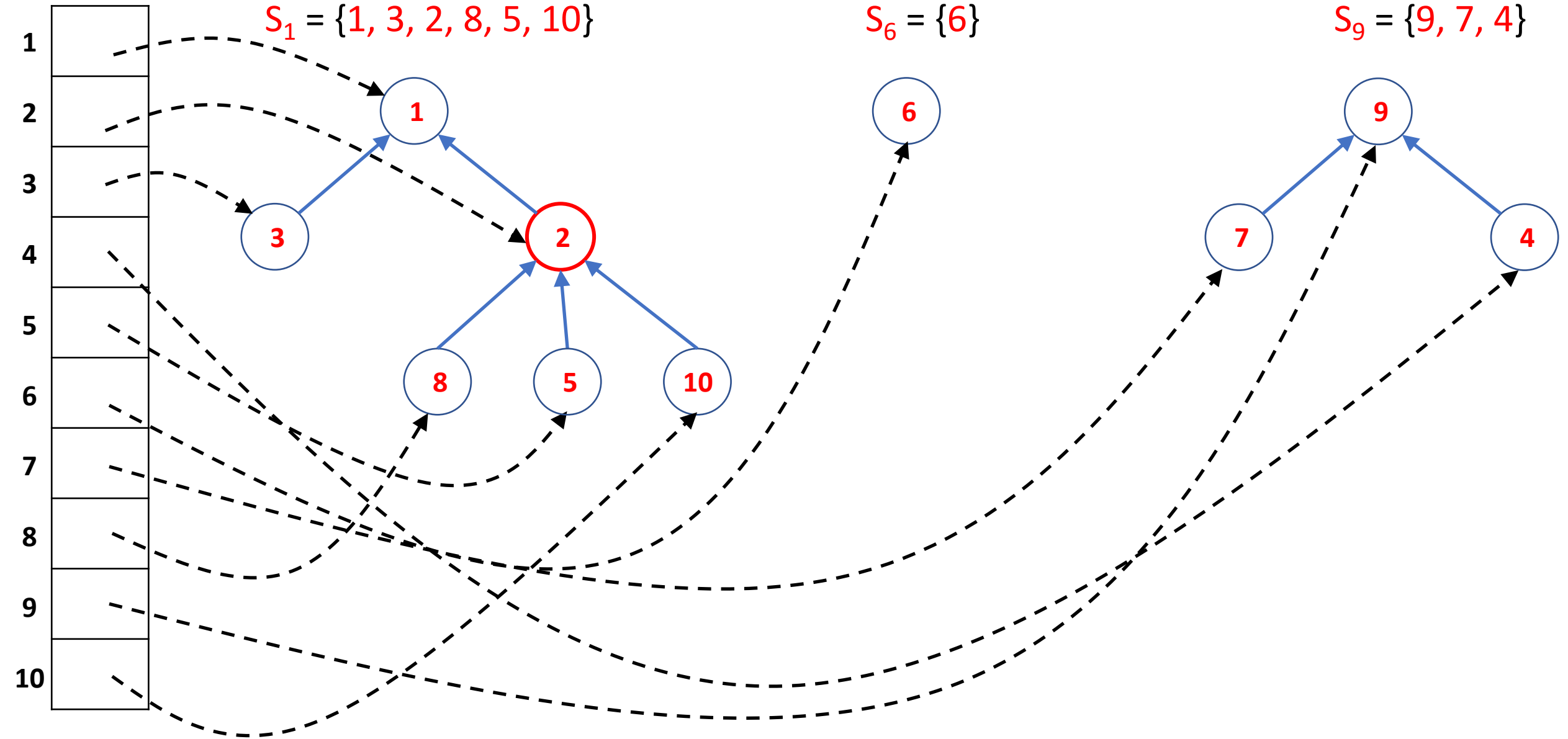
Find(5)

A



Find(5)

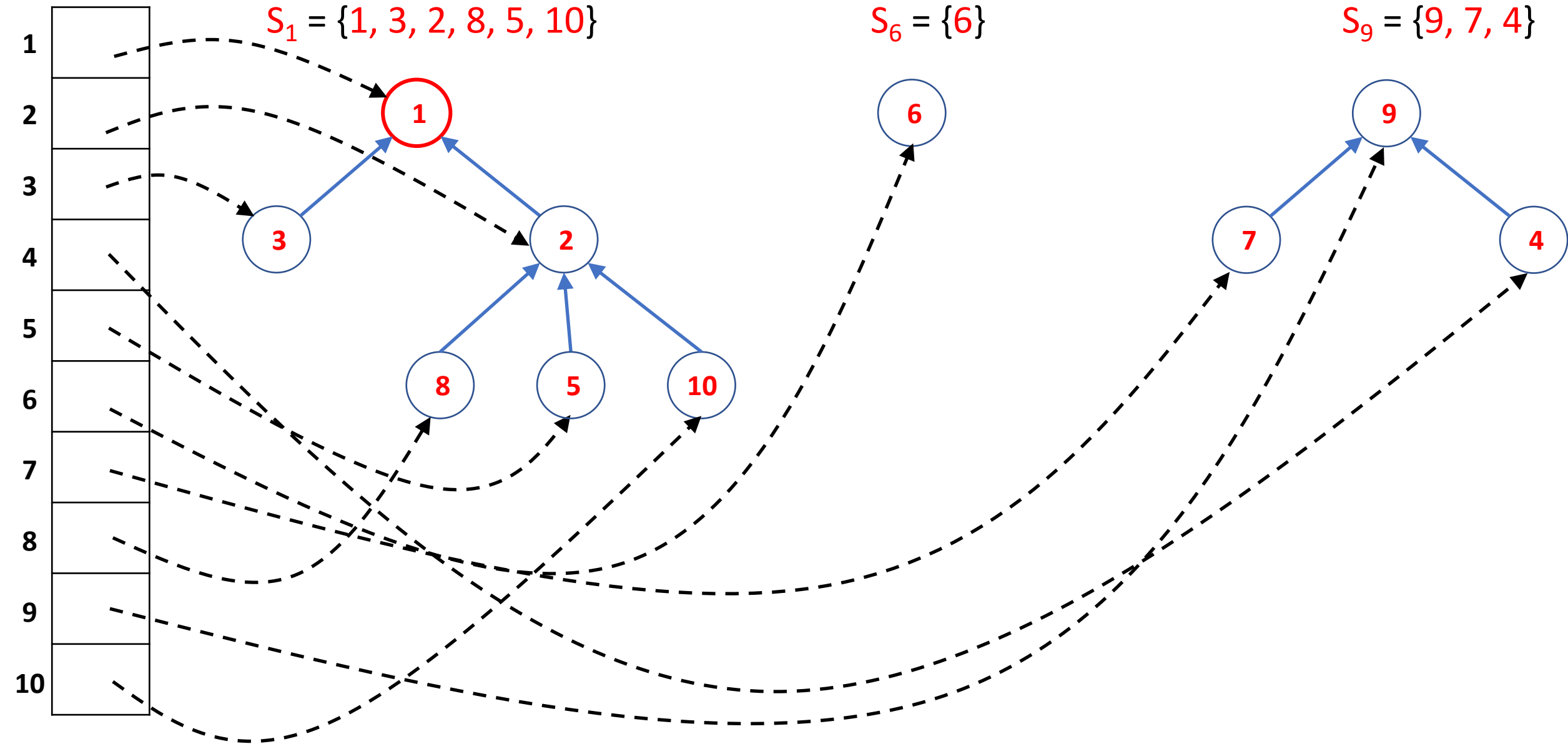
A



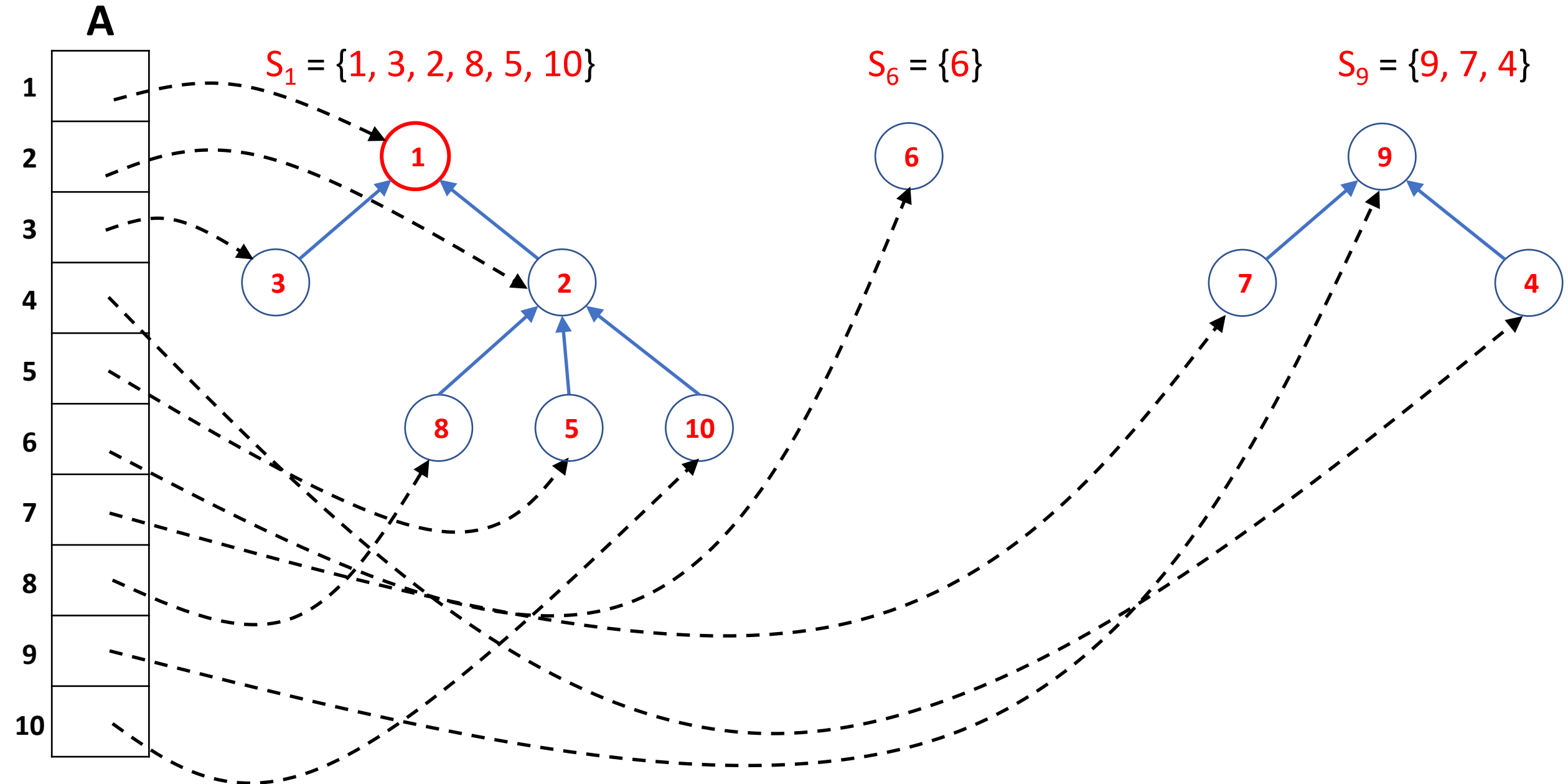


Find(5)

A



**Find(5) : Return (ptr to) 1**



# Operations

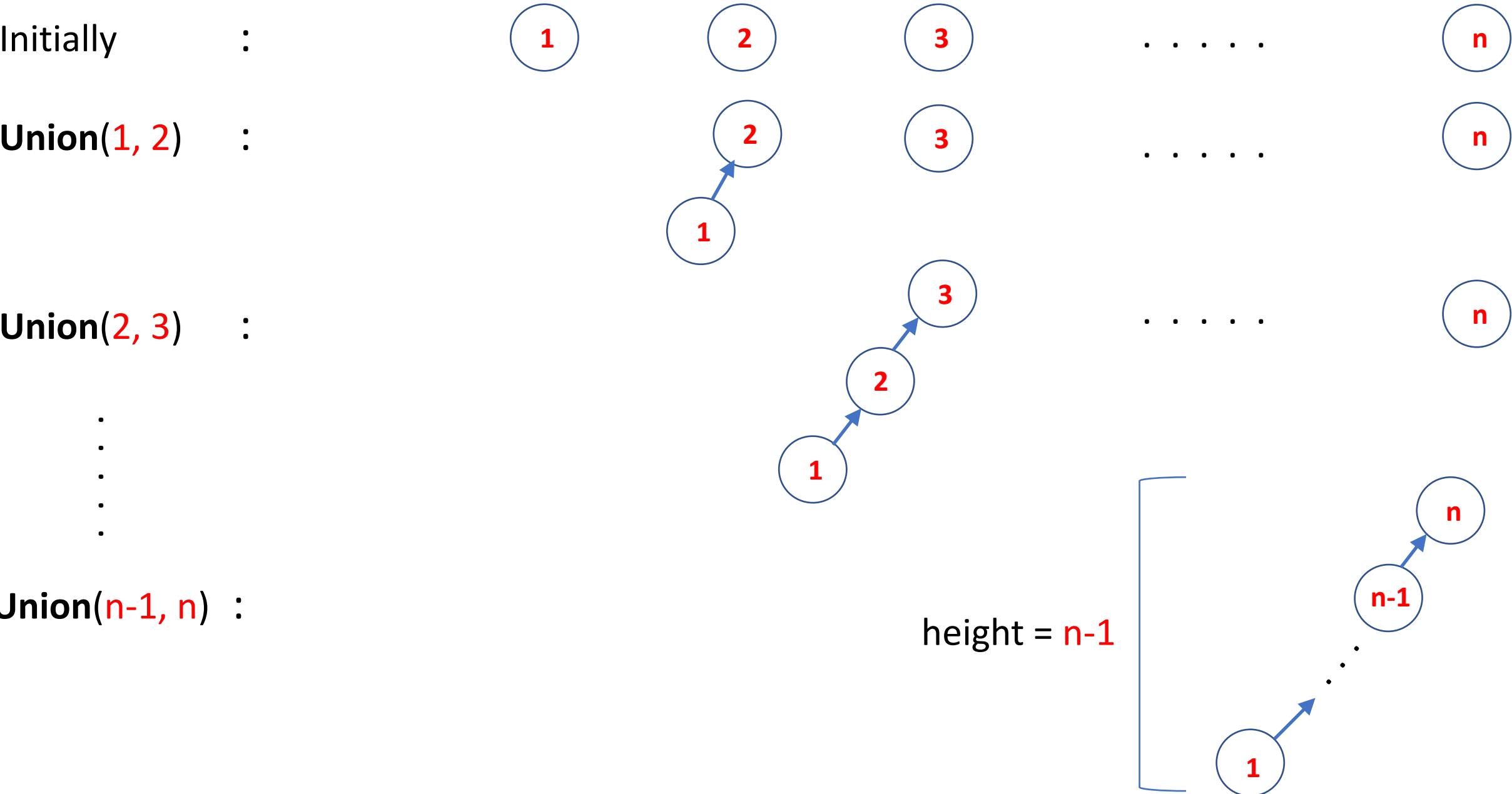
- **Find**( $x$ ): Follow path from  $x$  up to root, return ptr to the root

Cost is  $O(1 + \text{length of the Find path})$

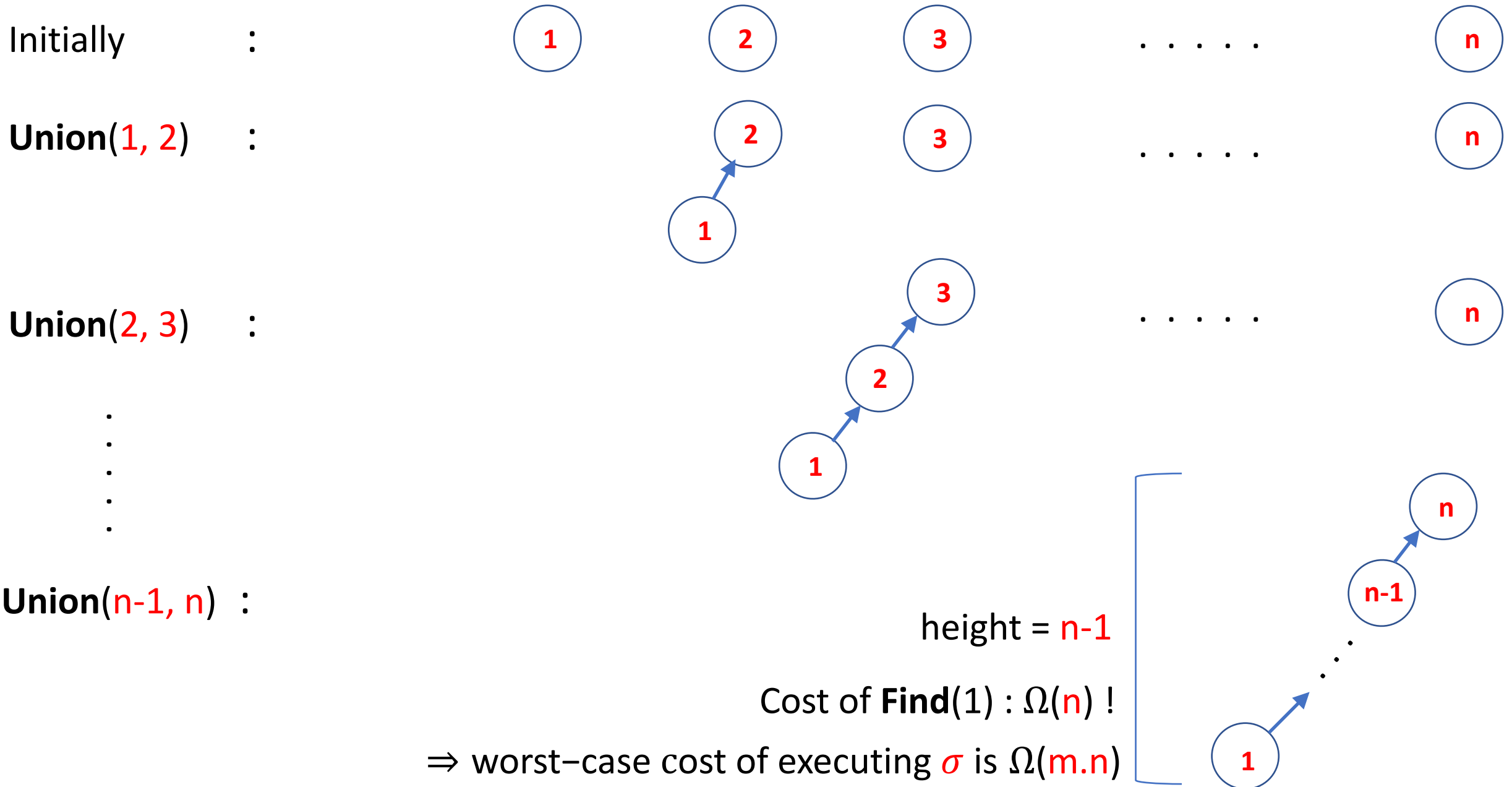
- **Union**( $S_x, S_y$ ): Make root of  $S_x$  the child of root of  $S_y$

Cost is  $O(1)$

# Disjoint Forest: Time Complexity



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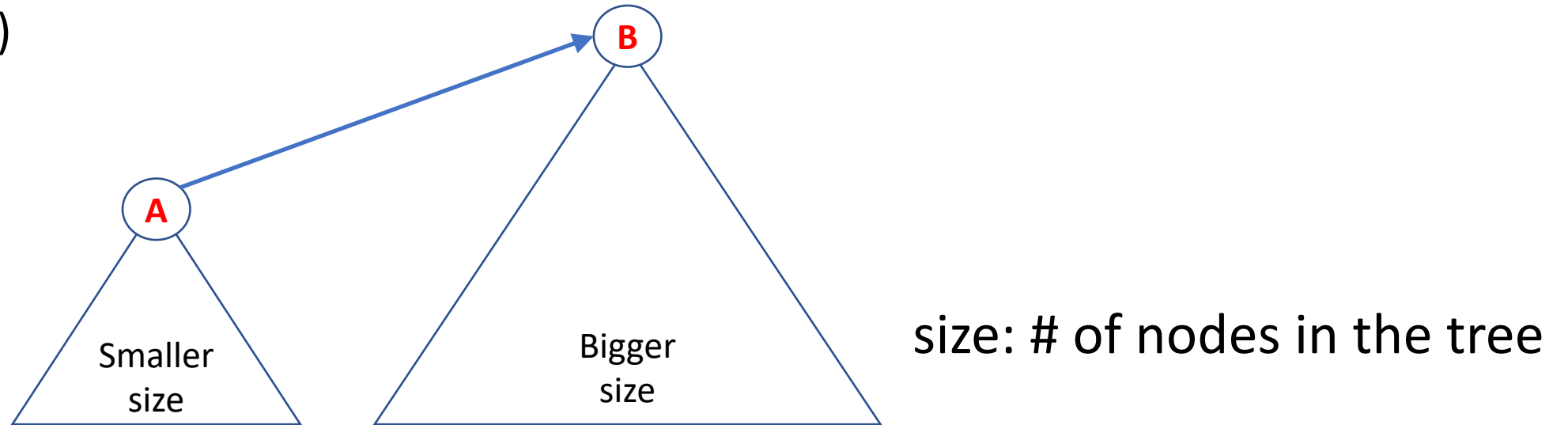
# Disjoint Forest: Time Complexity

To reduce cost of executing  $\sigma$ , reduce the length of **Find** paths

⇒ reduce **height** of the trees formed during the execution of  $\sigma$

# Heuristic 1: **W**eighted **U**nion (**WU**) by Size

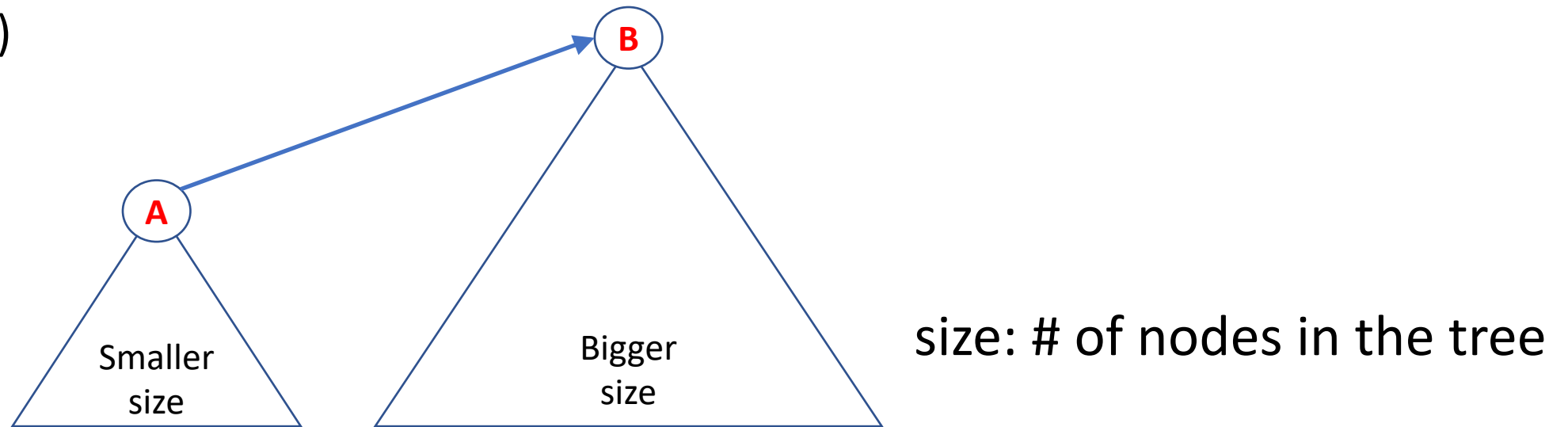
**Union**(**A**, **B**)



**WU rule** (by size): Smaller size tree becomes the child of the bigger size tree

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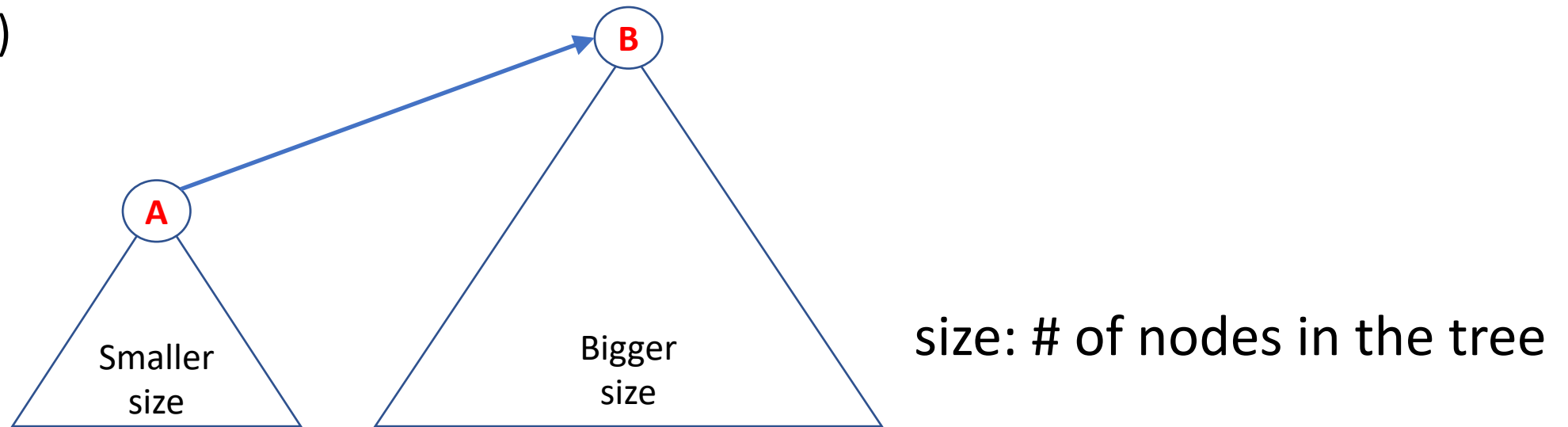
With **WU**:

- Any tree **T** created during the execution of  $\sigma$  has height at most  $\log_2 n$



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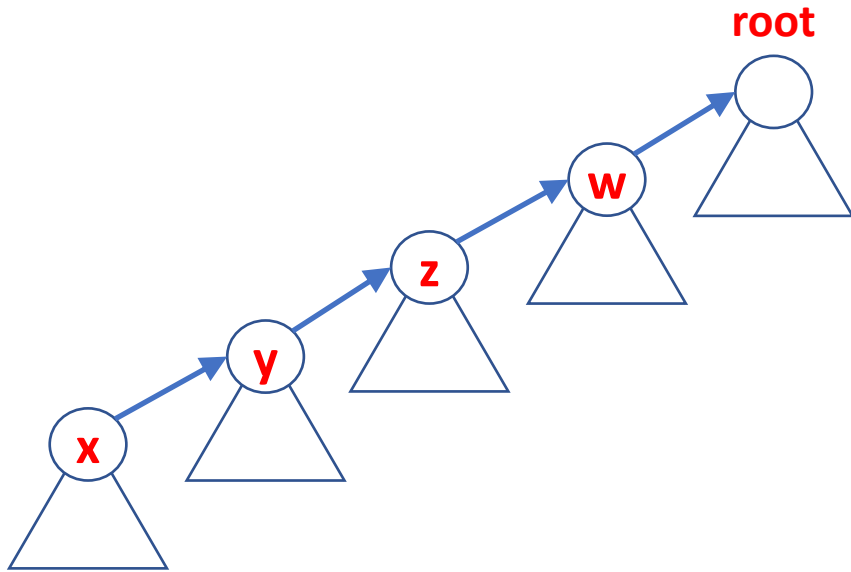


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With **WU**:

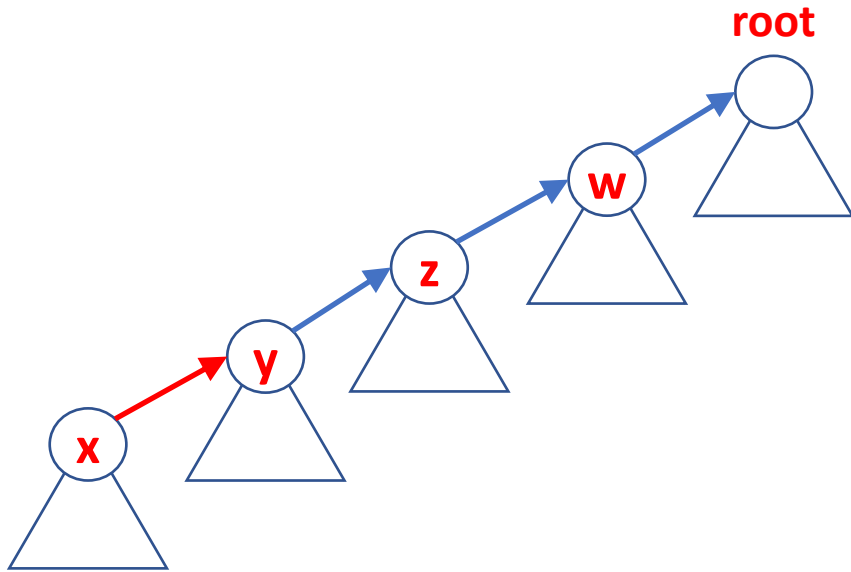
- Any tree **T** created during the execution of  $\sigma$  has height at most  $\log_2 n$
- The worst-case cost of executing  $\sigma$  is  $O(m \log n)$

## Heuristic 2: Path Compression (PC)



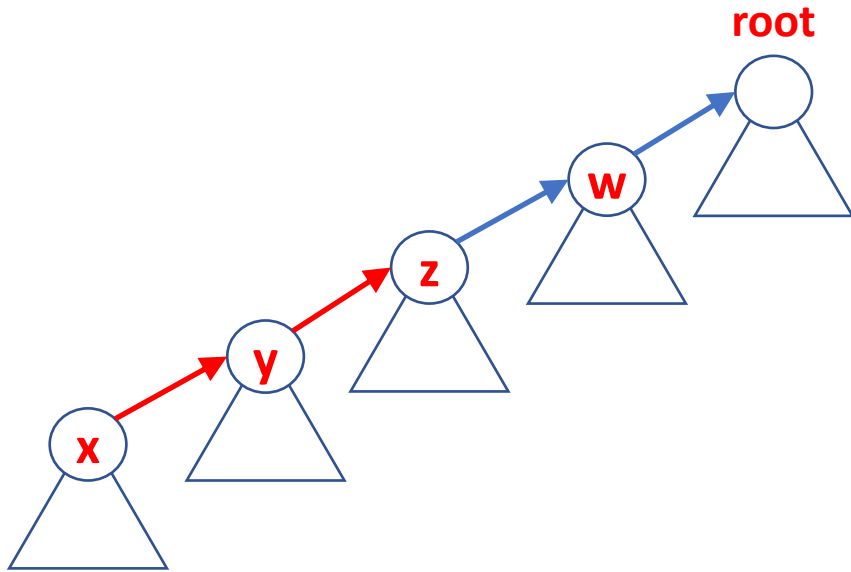
**Find(**x**)**

## Heuristic 2: Path Compression (PC)



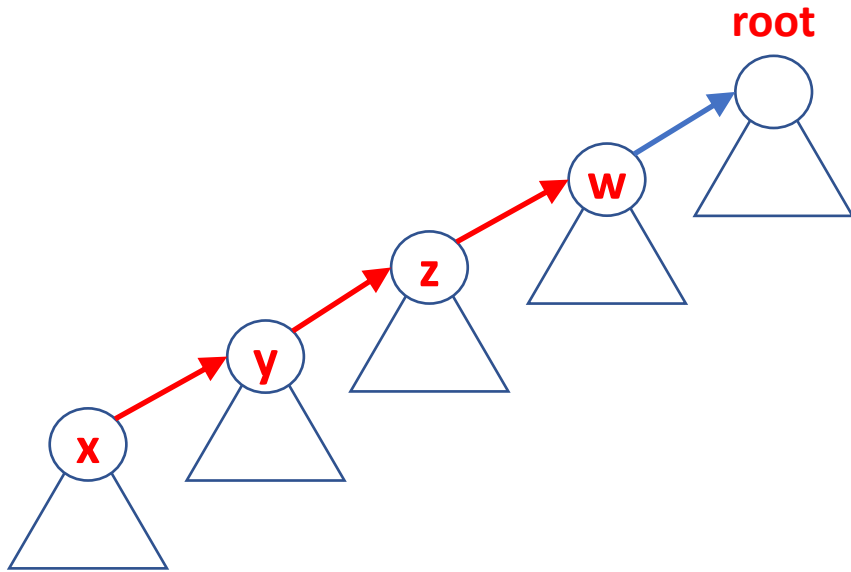
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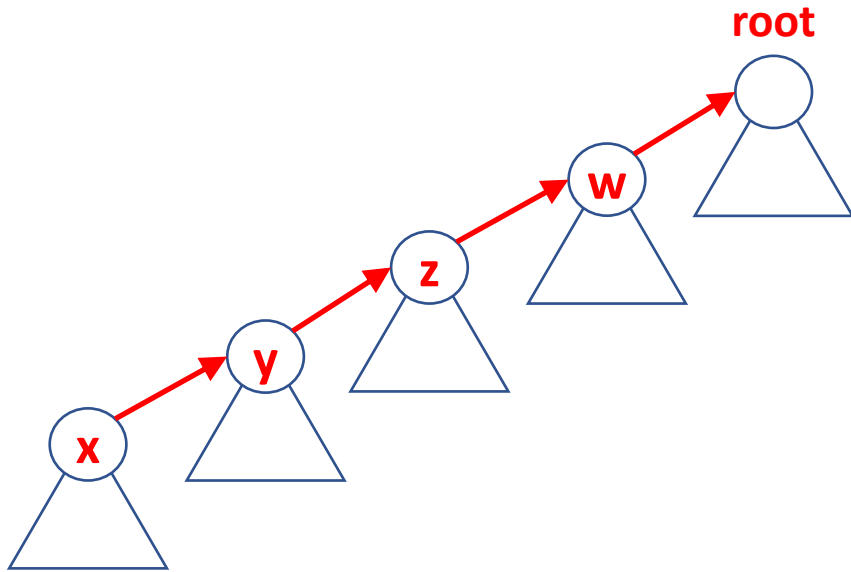
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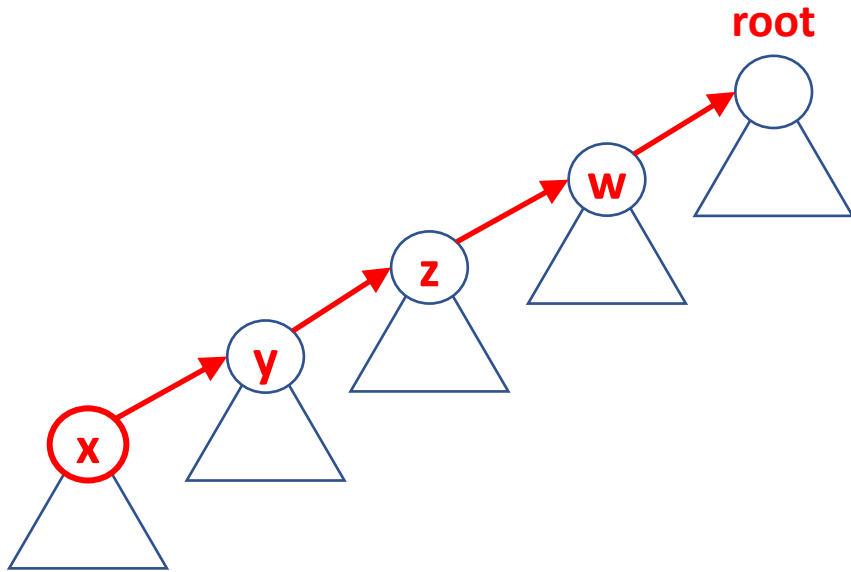
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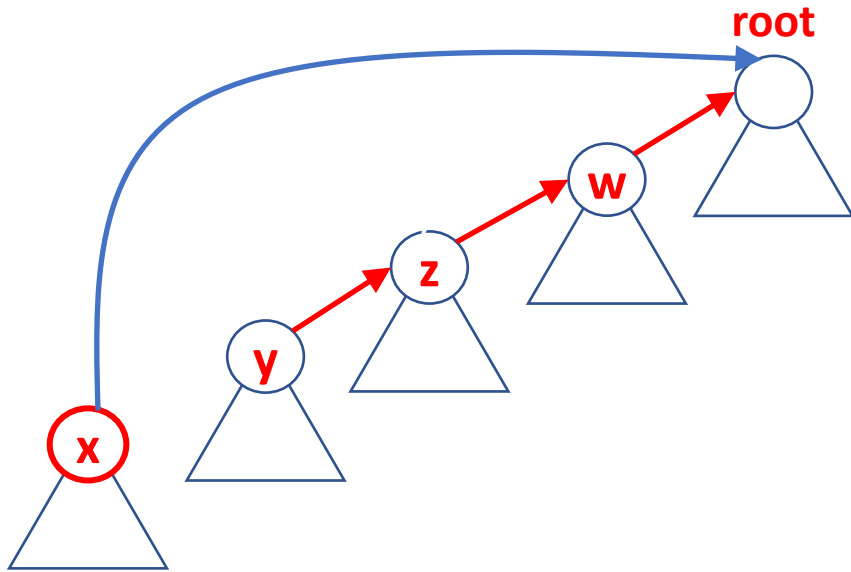
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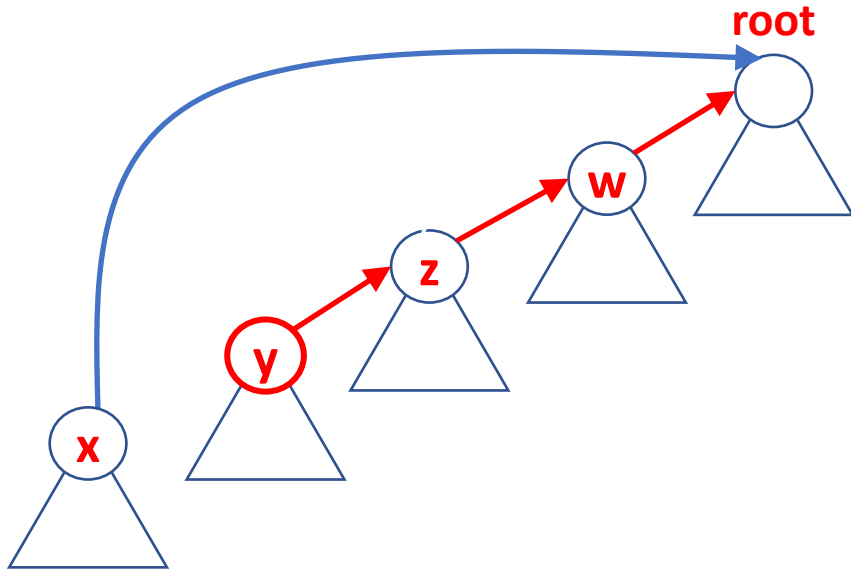
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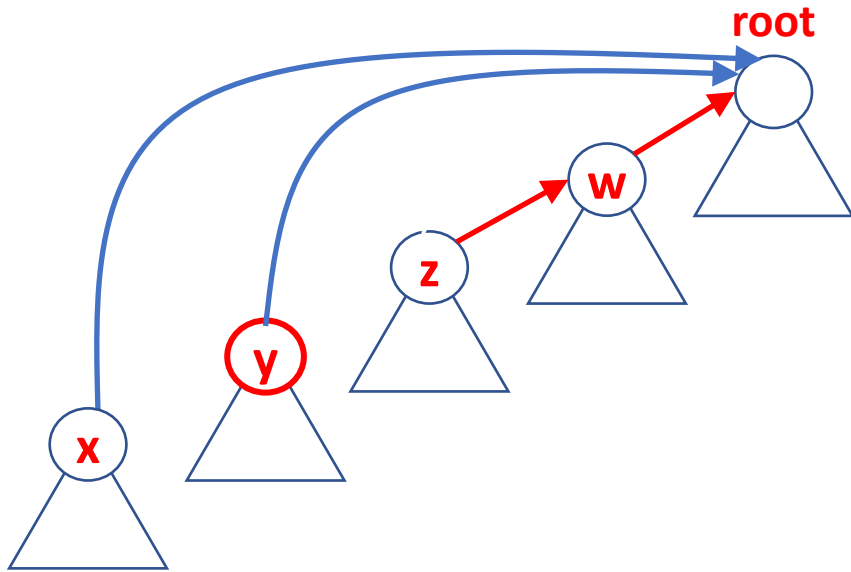


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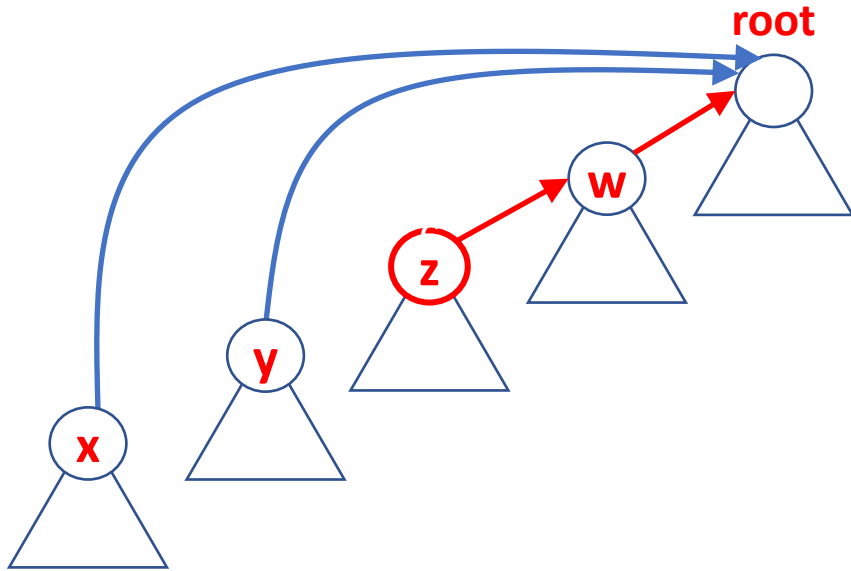
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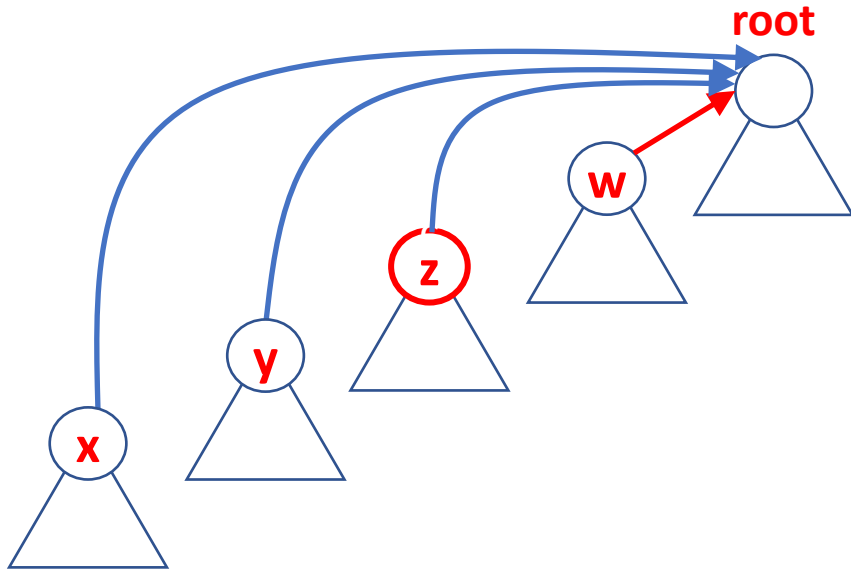
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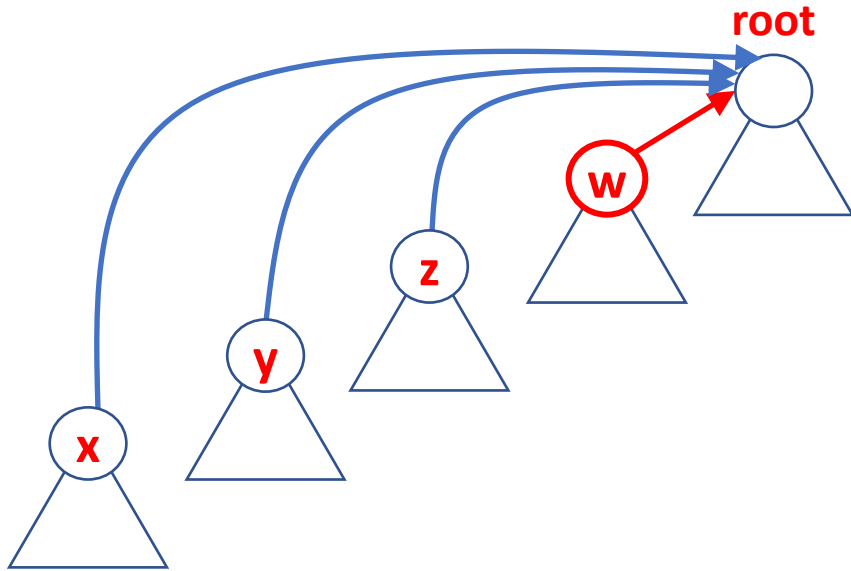
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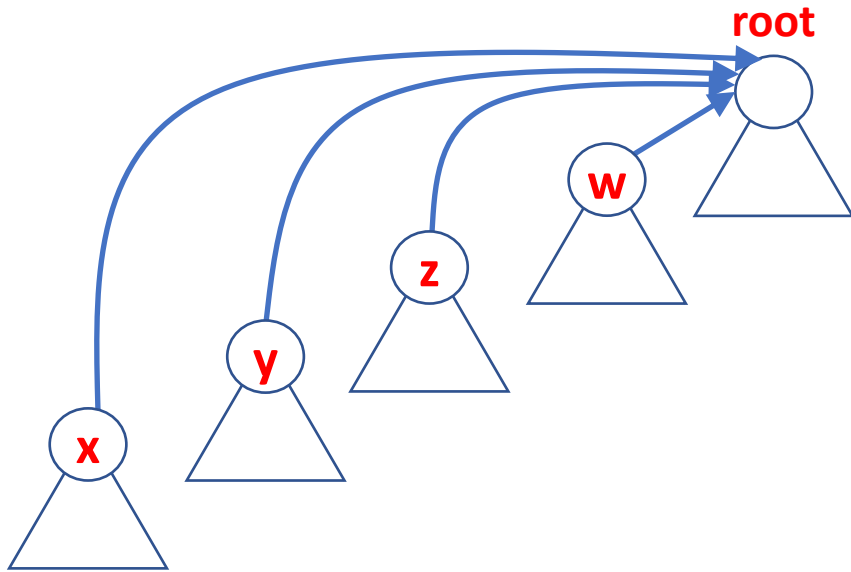
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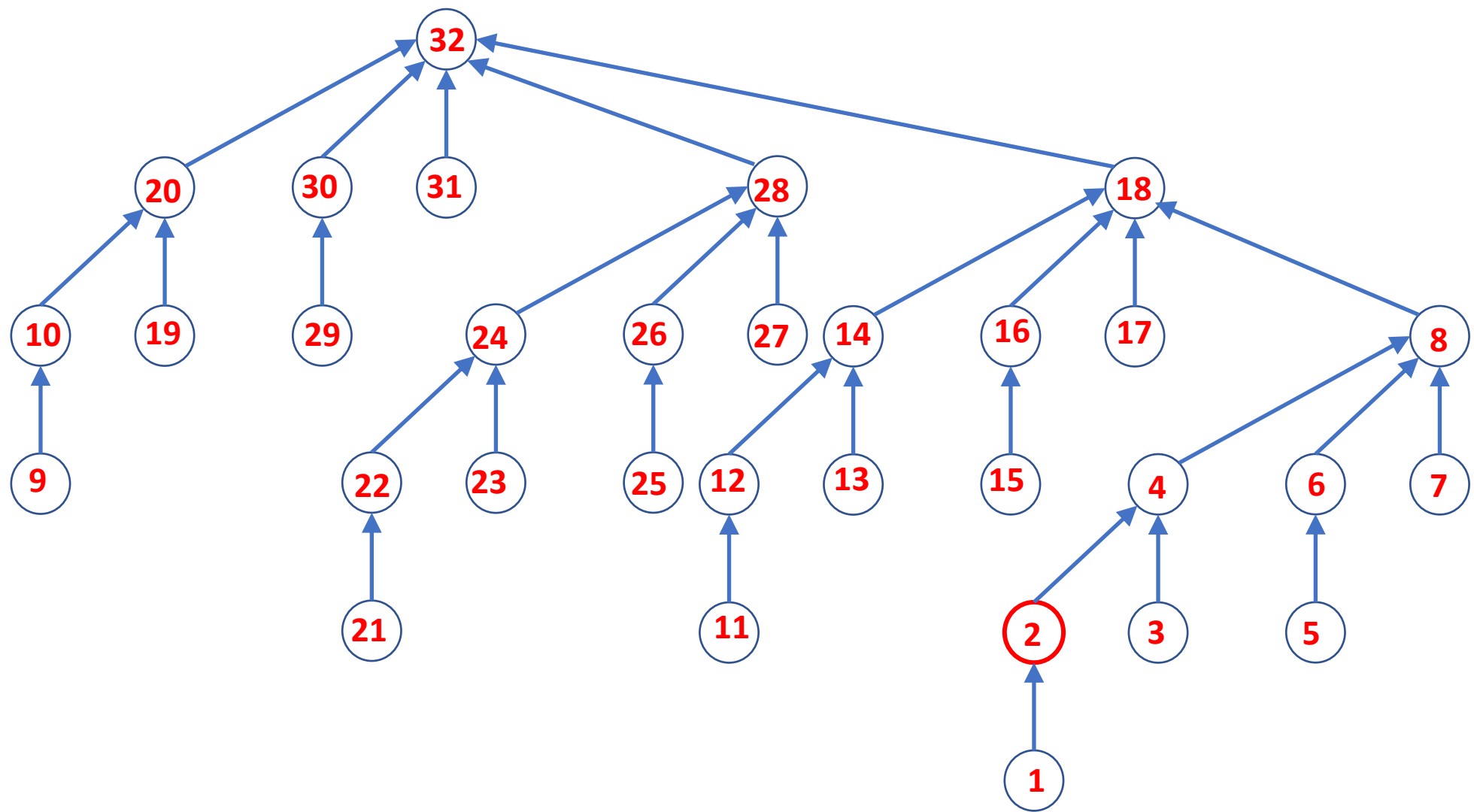
# Heuristic 2: Path Compression (PC)



**PC rule:** In **Find(x)**, make each vertex along the **Find** path a child of **root**

# Example of Path Compression (PC)

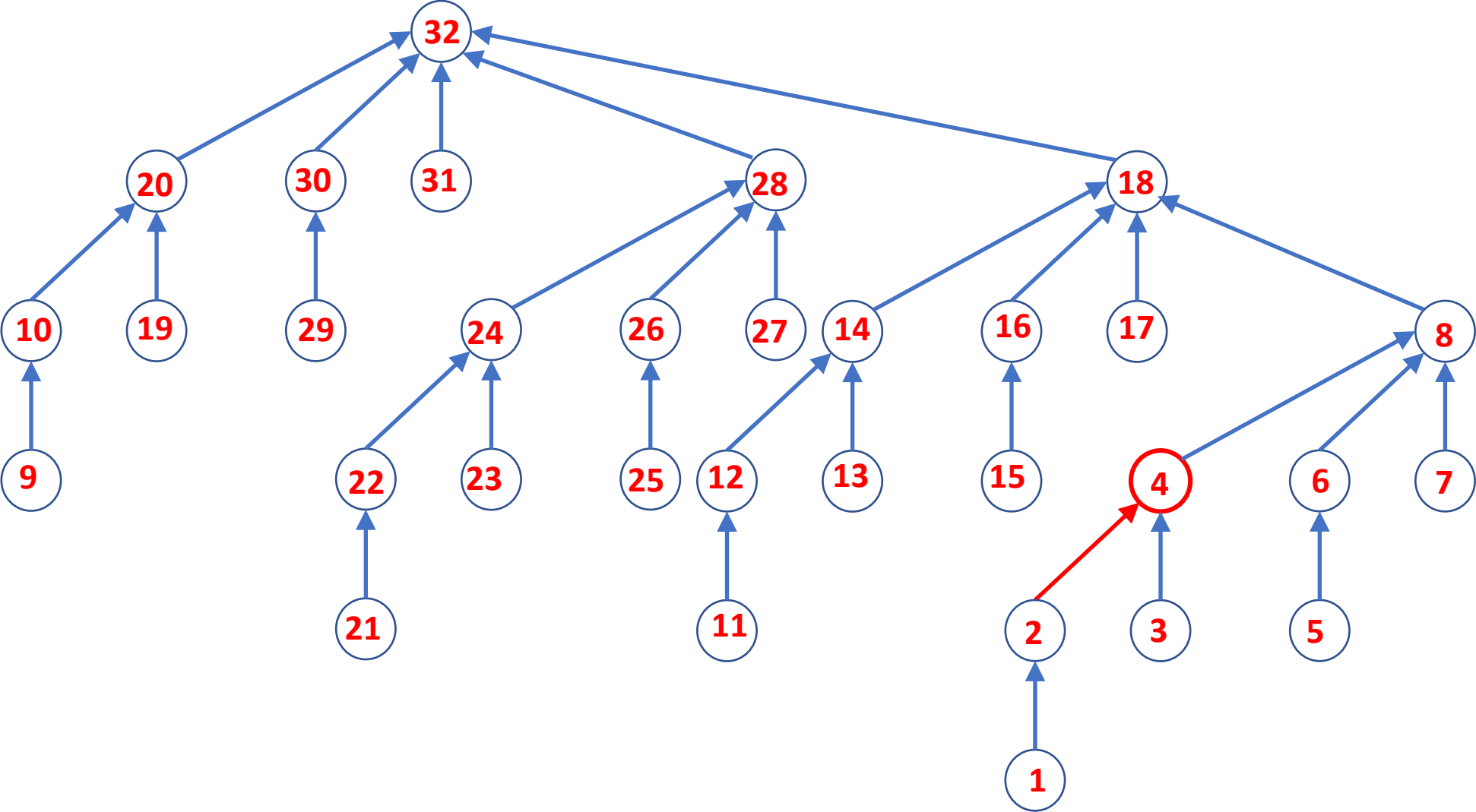
Find(2)





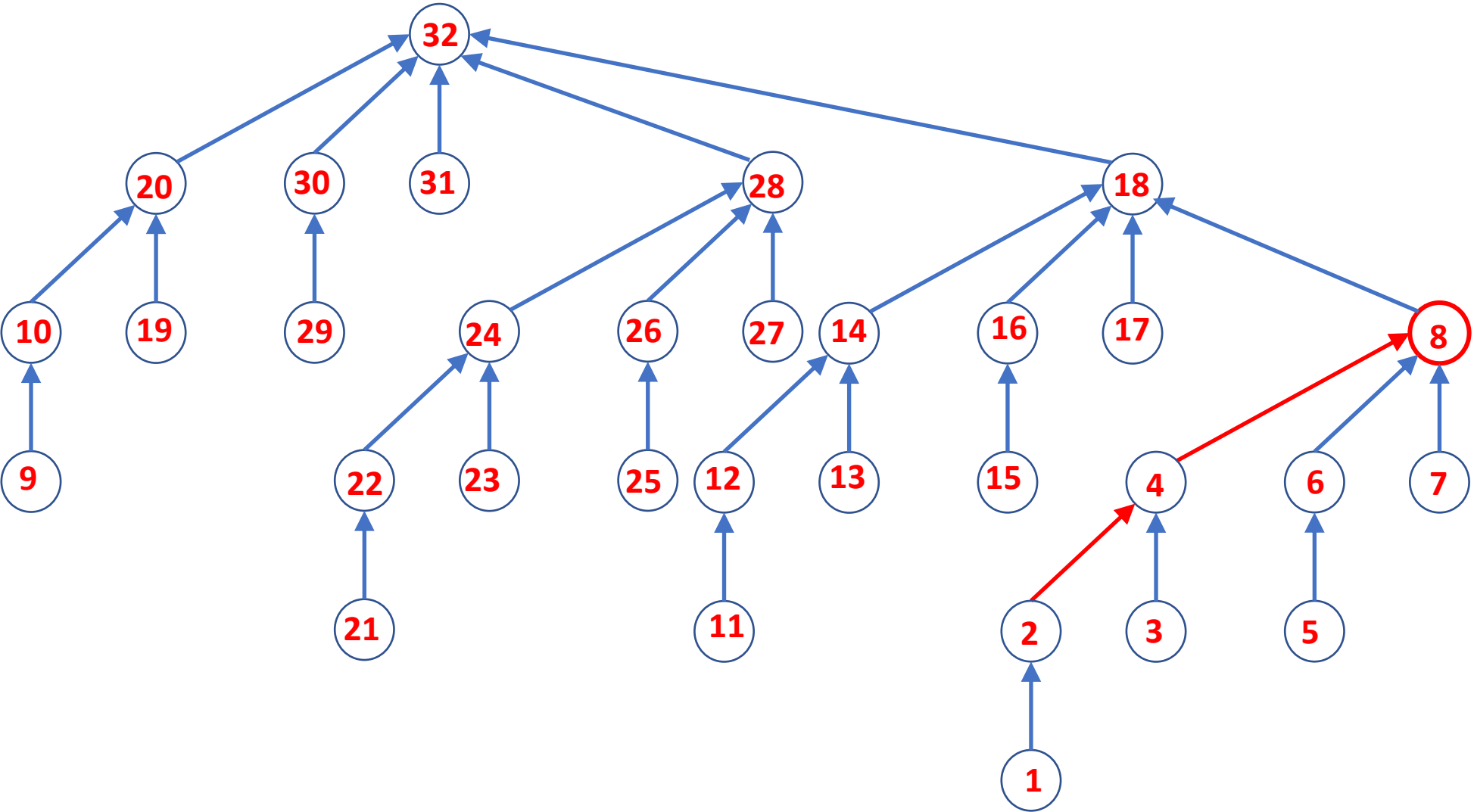
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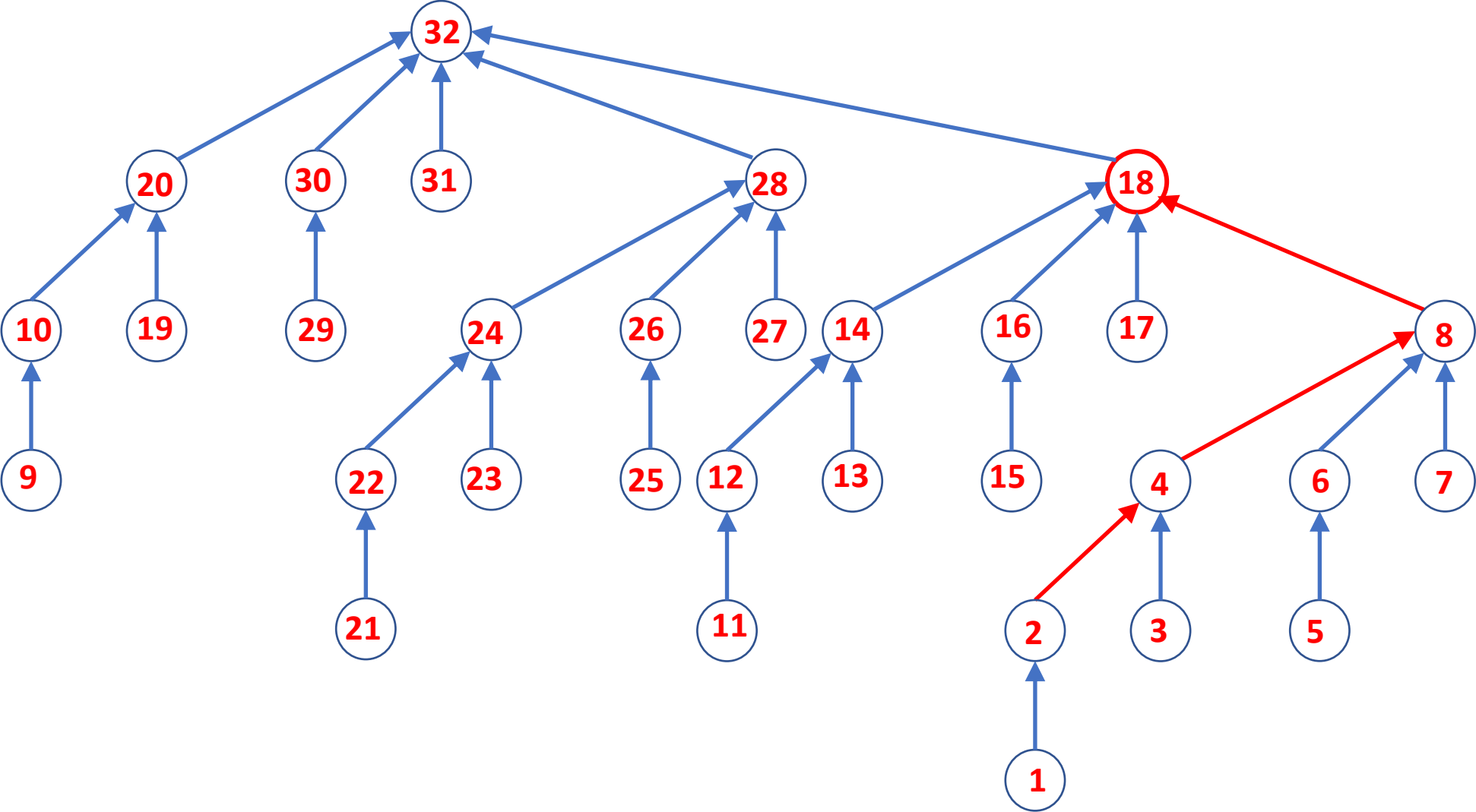
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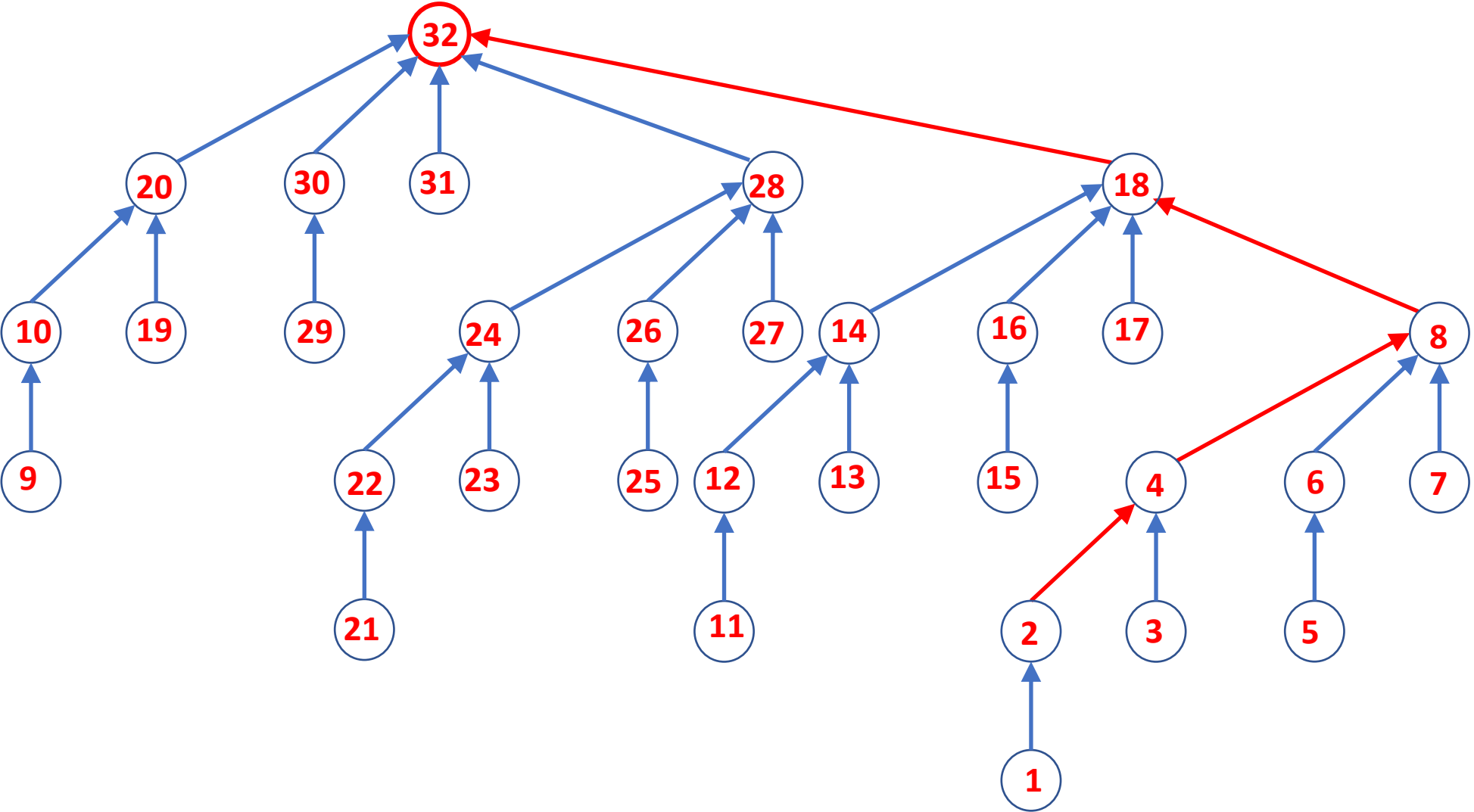
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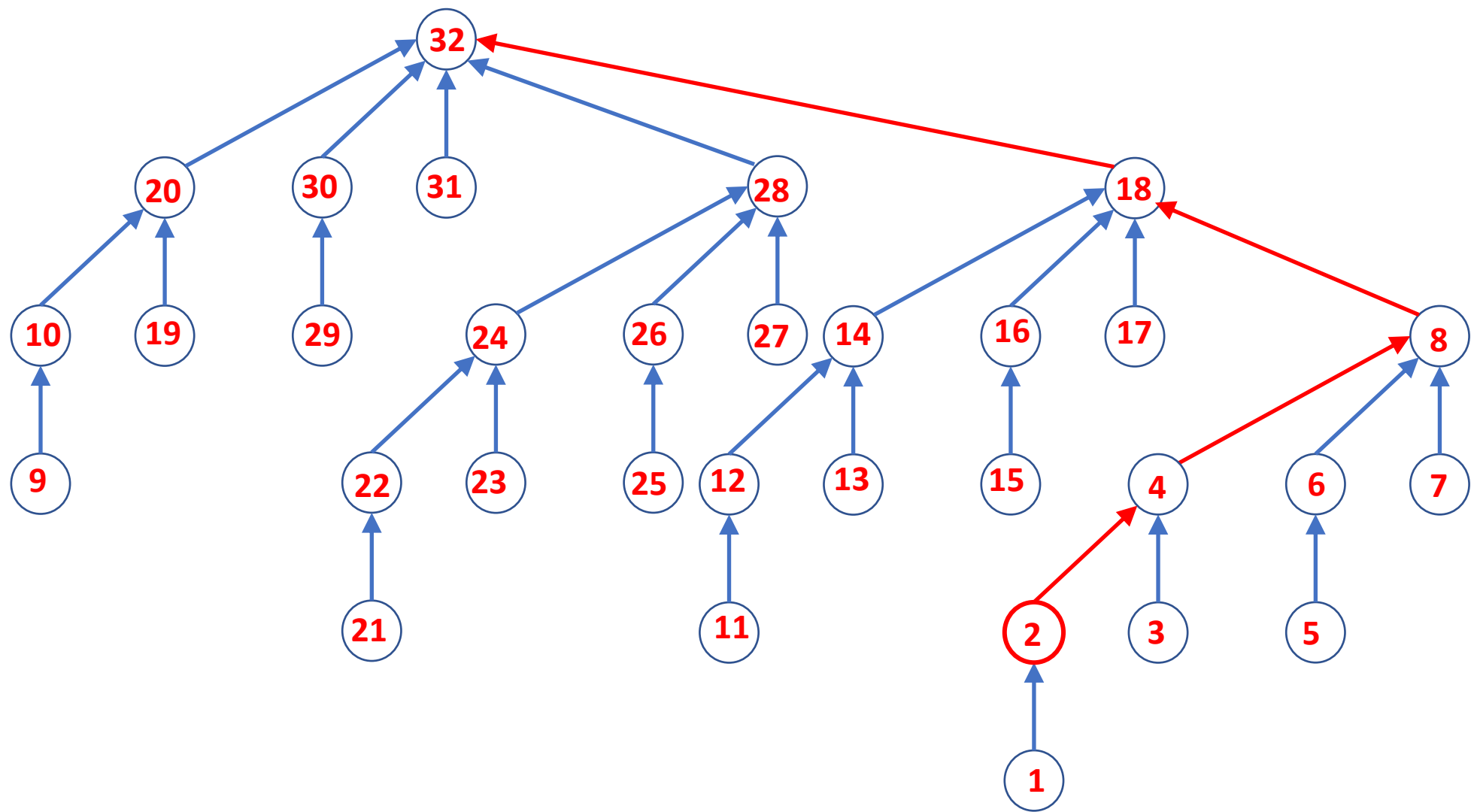
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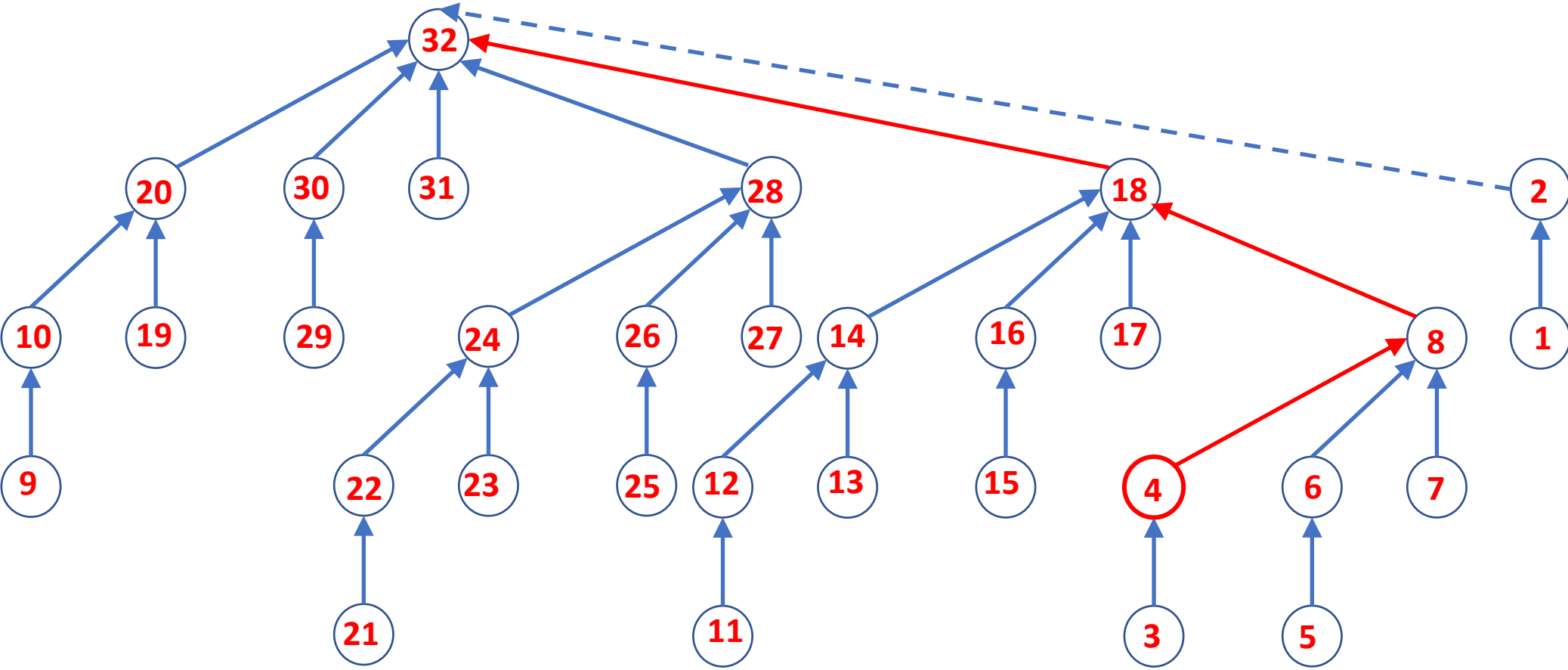
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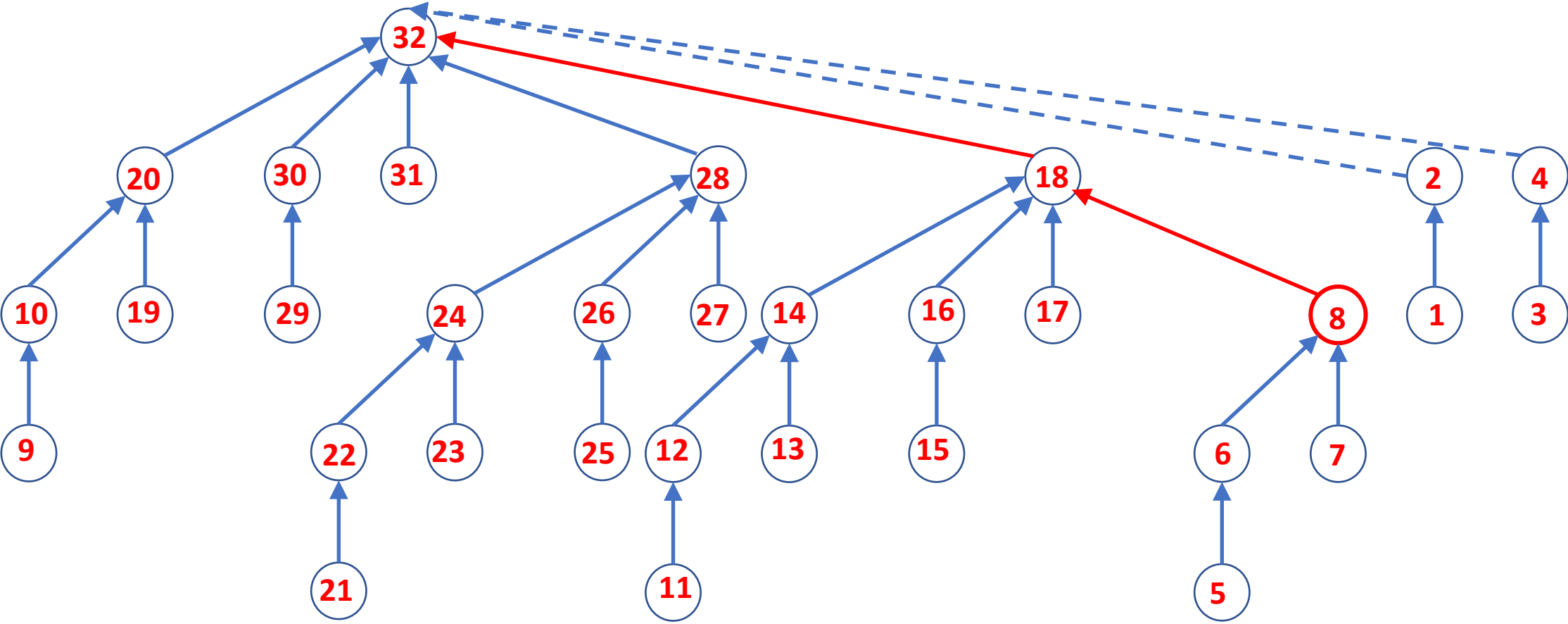
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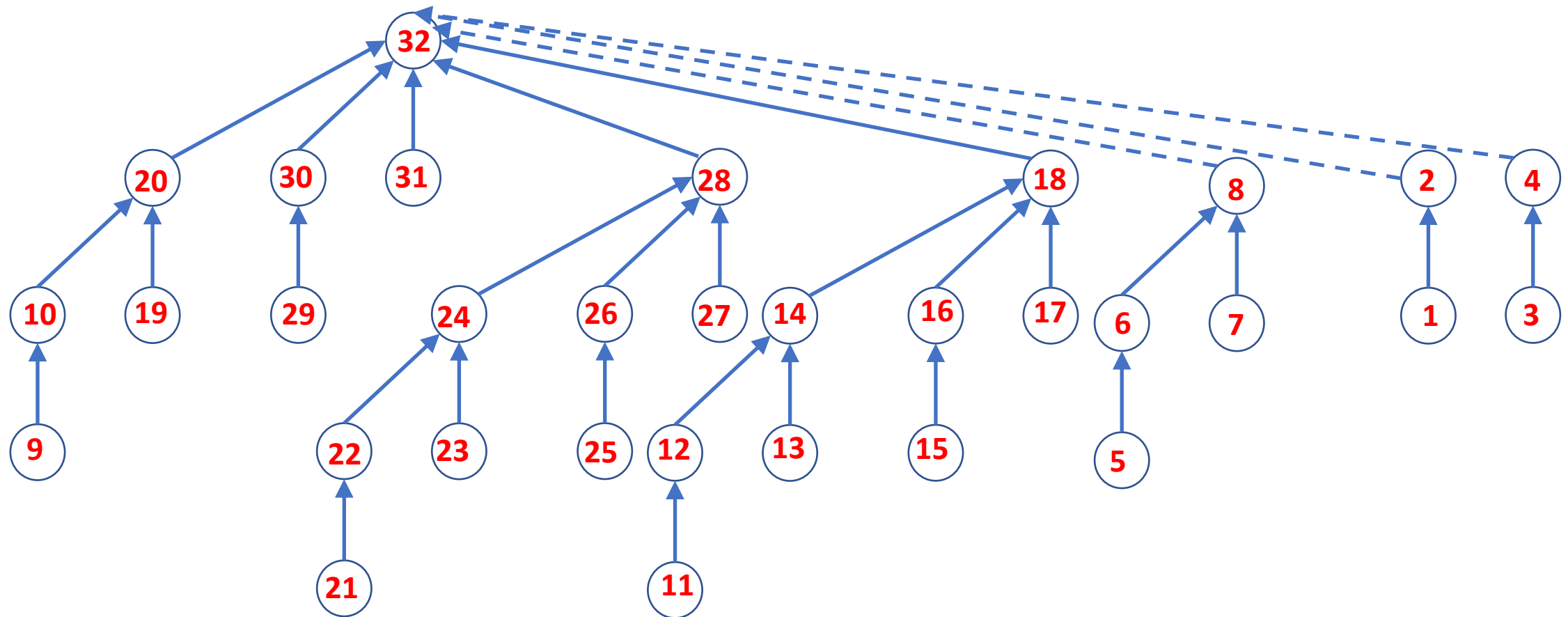
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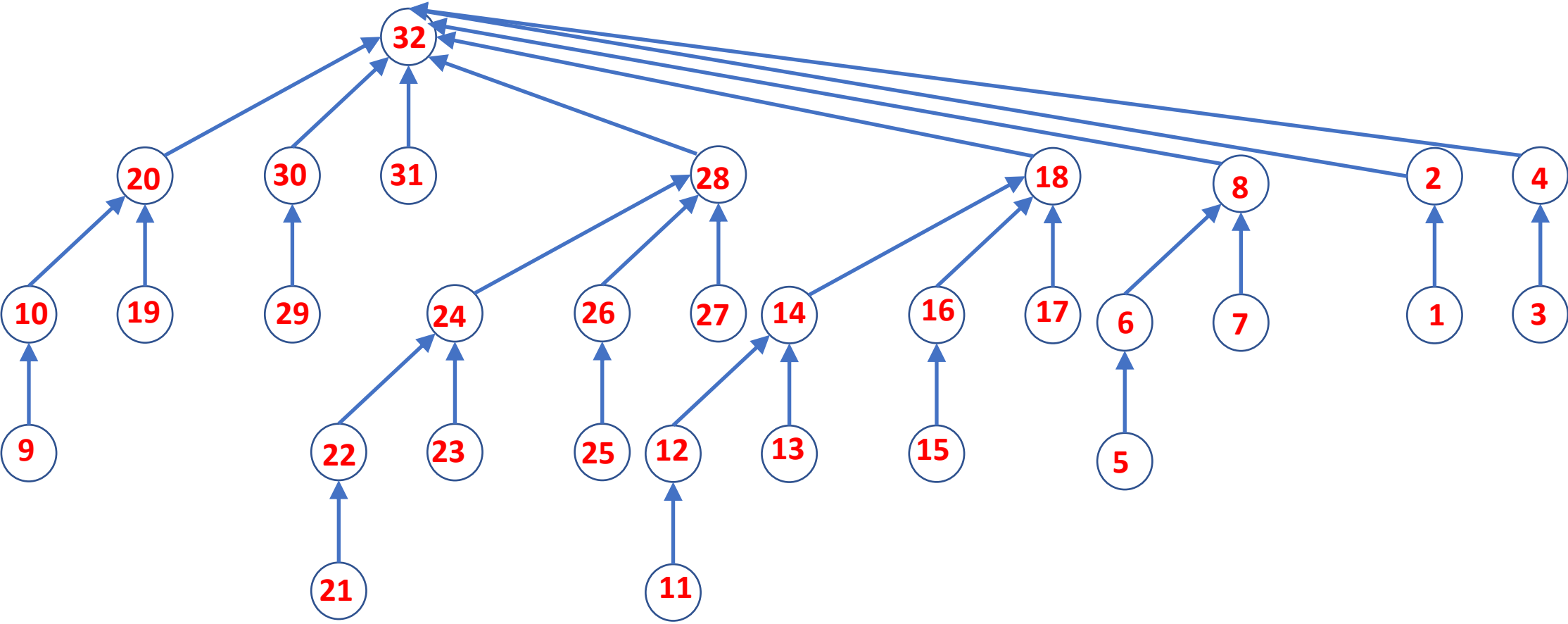
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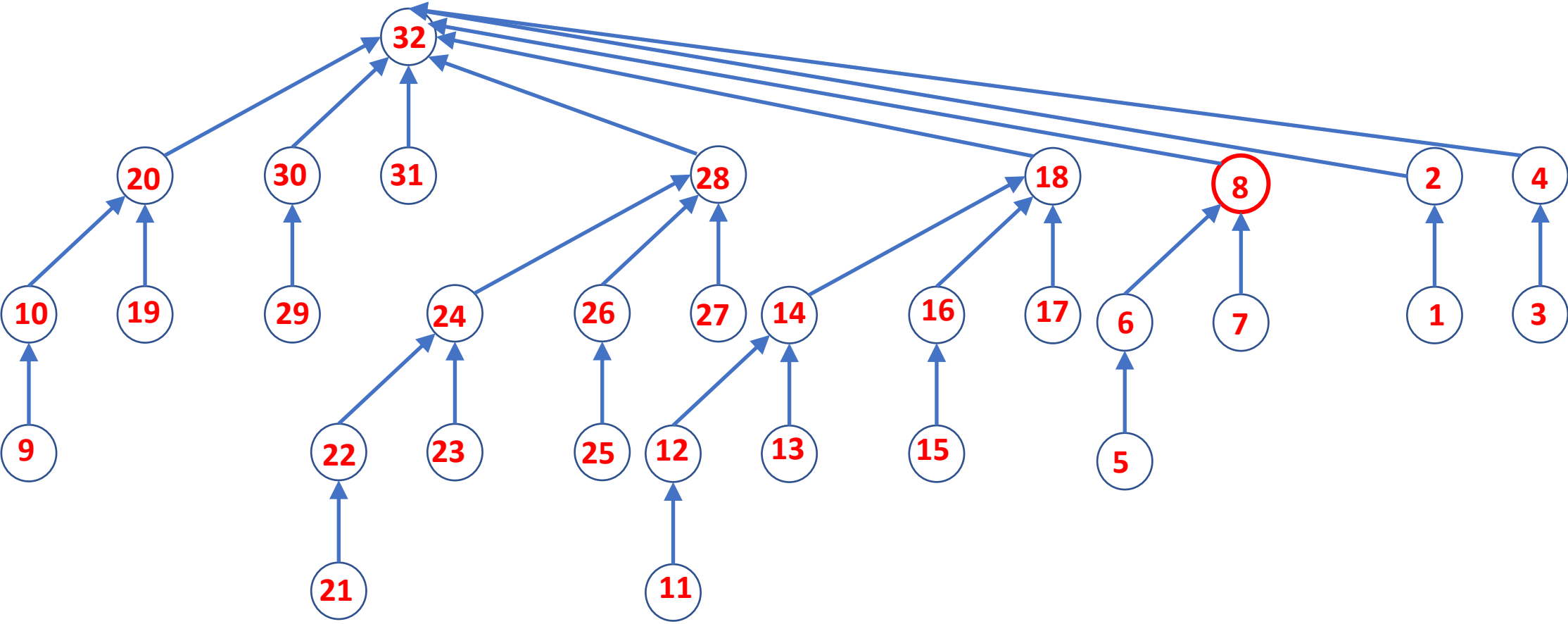
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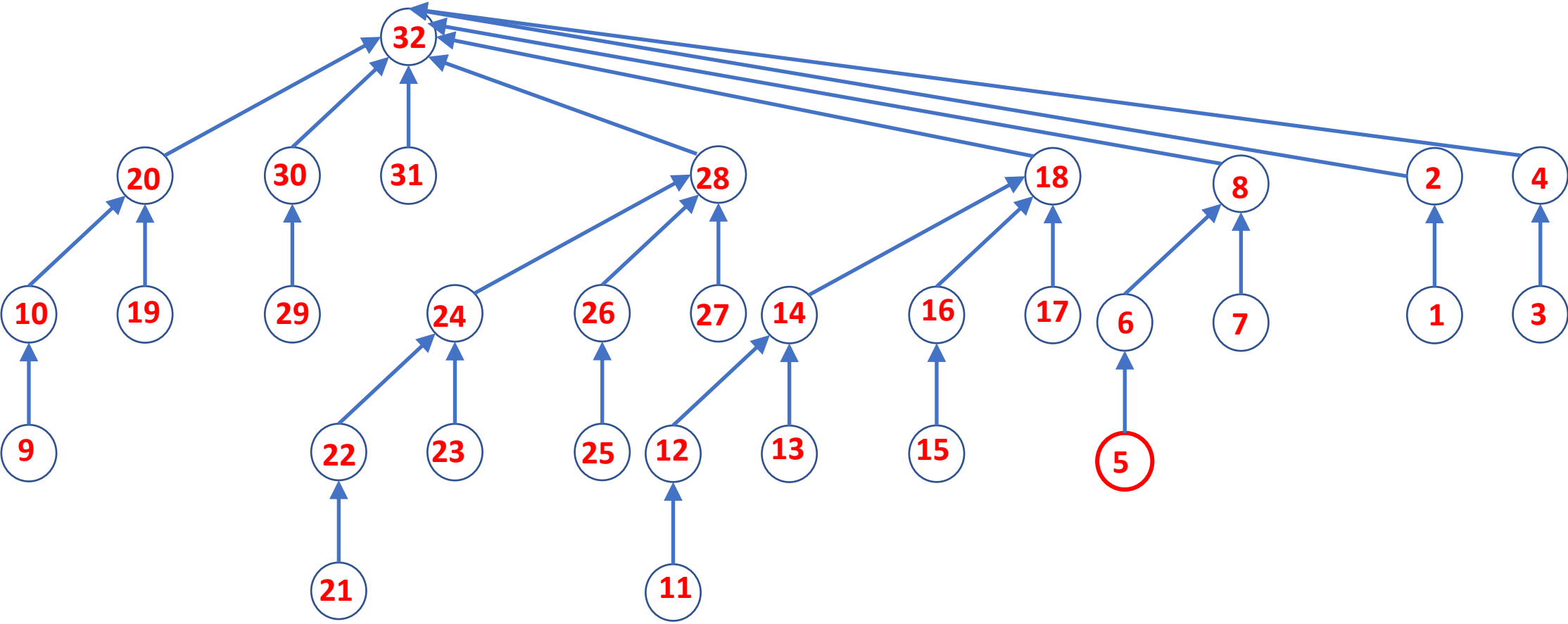
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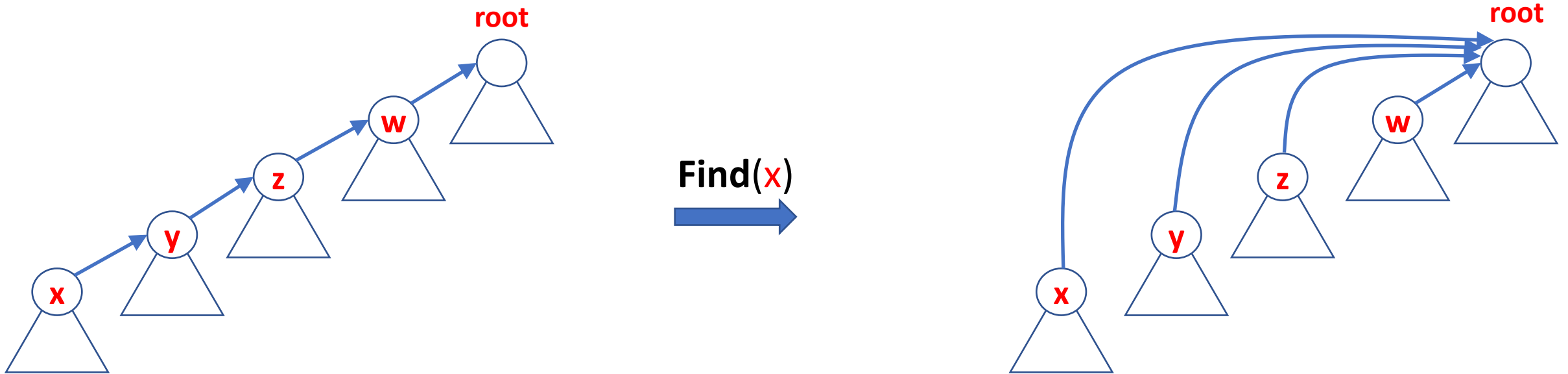


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Amortization

With WU and PC , Time Complexity of  $\sigma$ ?

$\sigma$ : Sequence of  $n-1$  Unions mixed with  $m \geq n$  Finds



# A quick detour...

**Definition:**  $2^n$

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Estimated # of atoms in  
observable universe  $\approx 10^{80}$

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This function grows very fast with  $n$  !!

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This function grows very fast with  $n$  !!

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**Definition:**  $\log^* n$

$$\log^* n = \min\{k : 2^{*k} \geq n\}$$

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$\log^* n$  grows very slowly with  $n$  !!

# Time Complexity of $\sigma$ , with WU and PC

$\sigma$ : Sequence of  $n-1$  **Unions** mixed with  $m \geq n$  **Finds**

**Theorem:** With **WU** and **PC**, executing every such  $\sigma$  takes  $O(m \log^* n)$  time

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Is the following claim true?

**Claim:** With **WU** and **PC**, executing every such  $\sigma$  takes  $O(m)$  time

# Analysis of Disjoint Forest: A Timeline



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Forest  
Implementation  
introduced

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$O(m \log^* n)$   
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Michael L. Fredman  
Michael E. Saks