

# Chapter Thirteen

## Advances in Heap

## Section 13.1

# Double-Ended Priority Queues

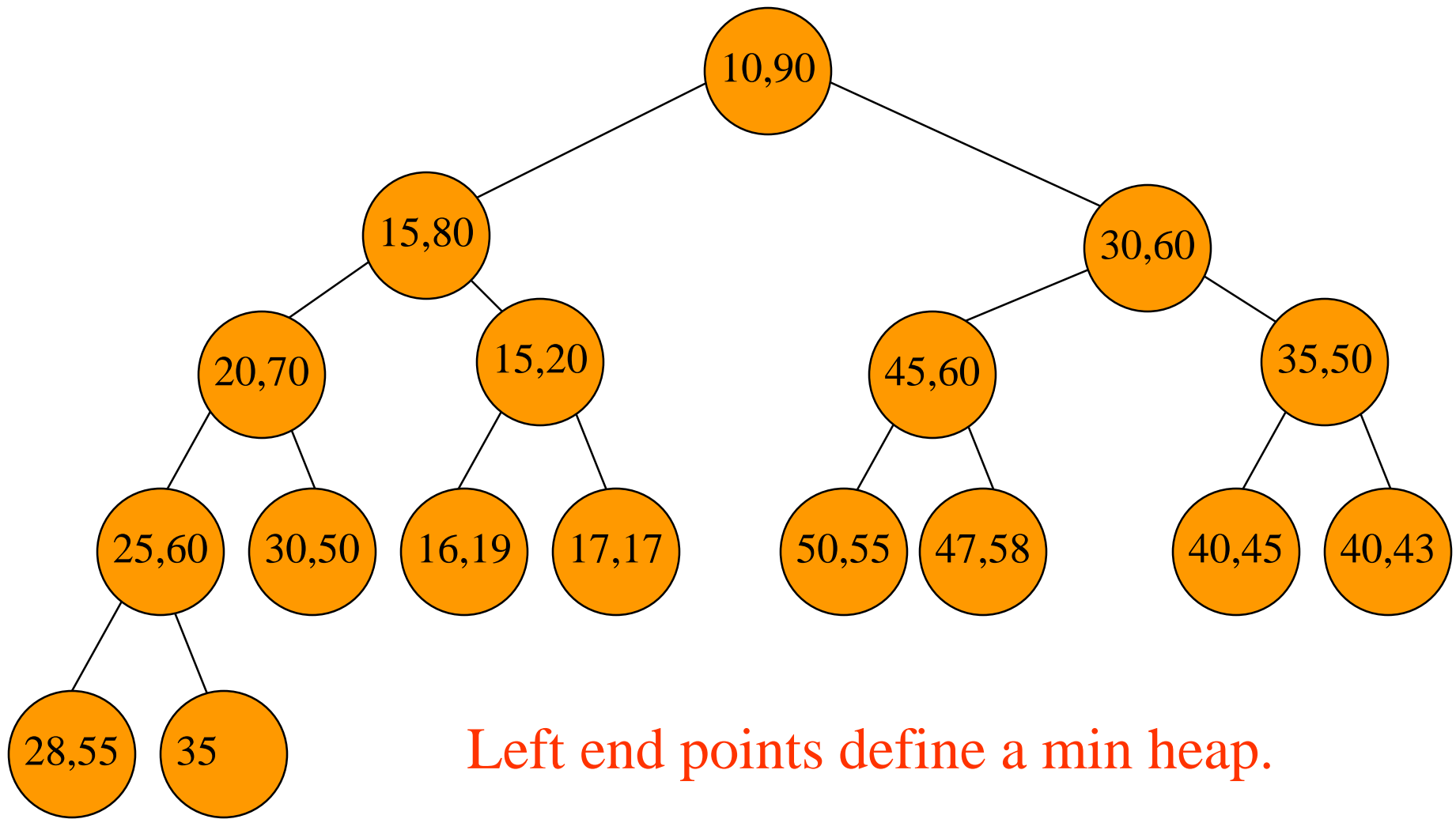
# Double-Ended Priority Queues

- Primary operations
  - Insert
  - Delete Max
  - Delete Min
- Note that a single-ended priority queue supports just one of the above remove operations.

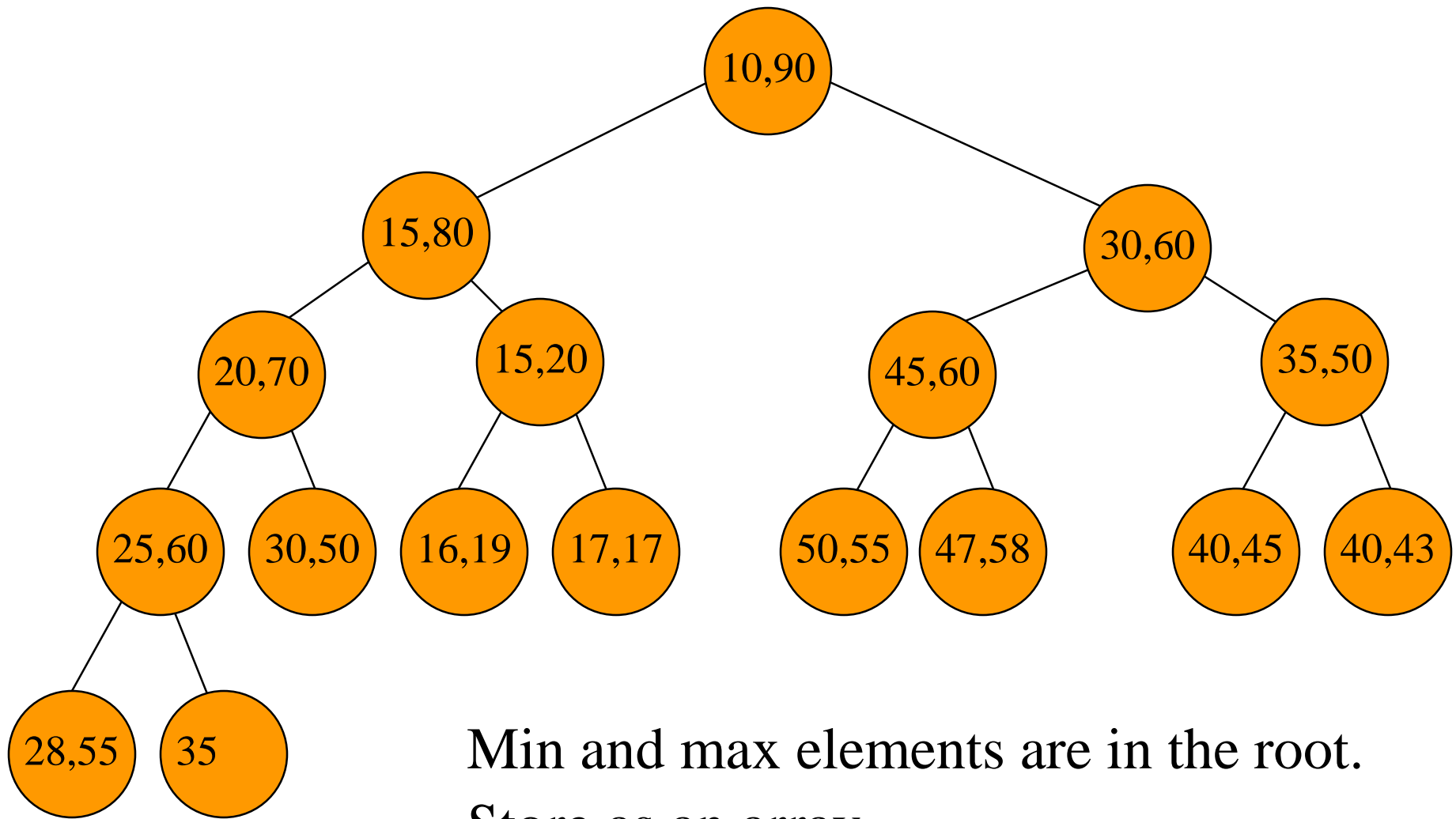
# Interval Heaps

- Complete binary tree.
- Each node (except possibly last one) has 2 elements.
- Last node has 1 or 2 elements.
- Let  $a$  and  $b$  be the elements in a node  $P$ ,  $a \leq b$ .
- $[a, b]$  is the interval represented by  $P$ .
- The interval represented by a node that has just one element  $a$  is  $[a, a]$ .
- The interval  $[c, d]$  is contained in interval  $[a, b]$  iff  $a \leq c \leq d \leq b$ .
- In an interval heap each node's (except for root) interval is contained in that of its parent.

# Example Interval Heap



# Example Interval Heap

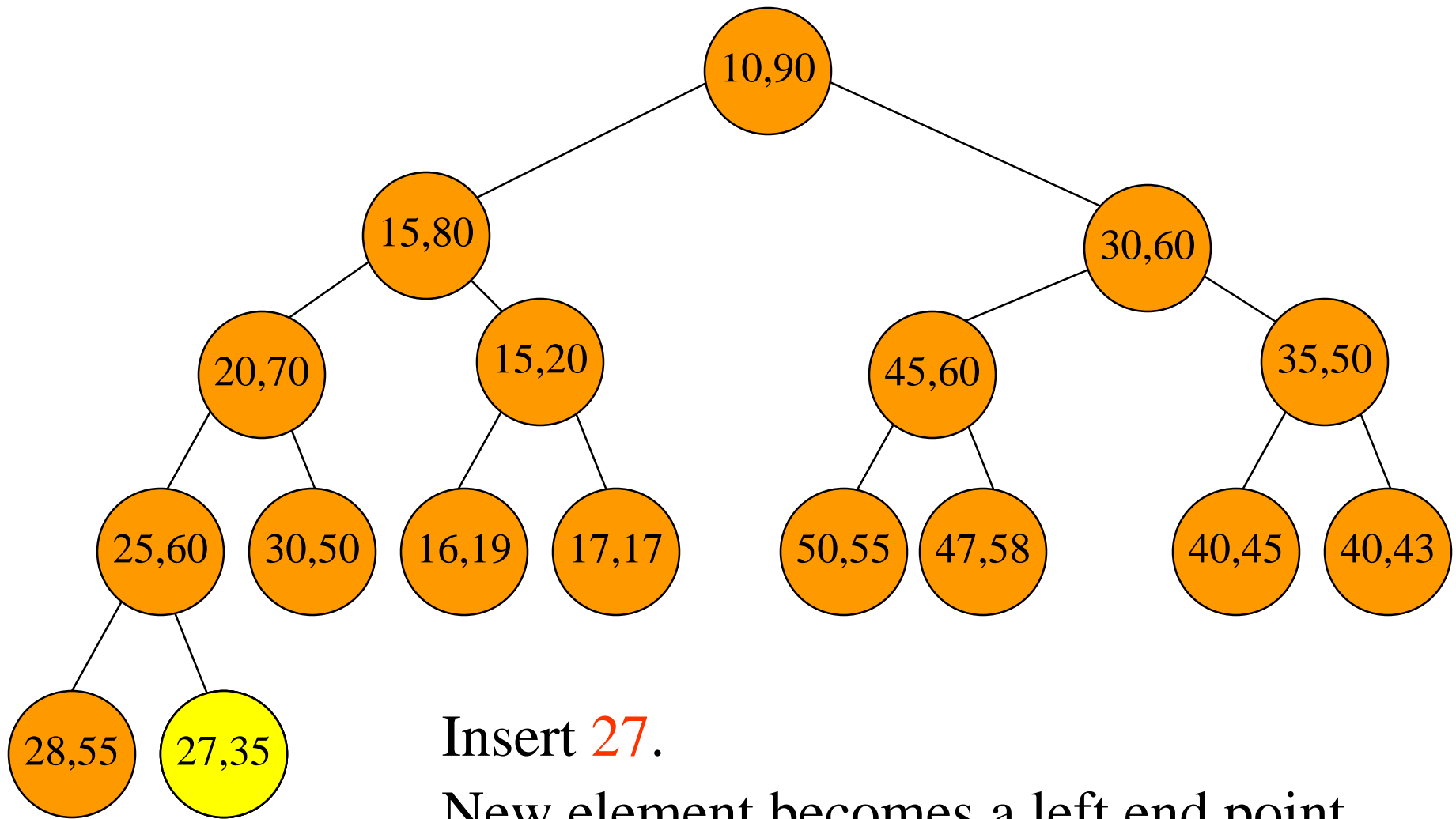


Min and max elements are in the root.

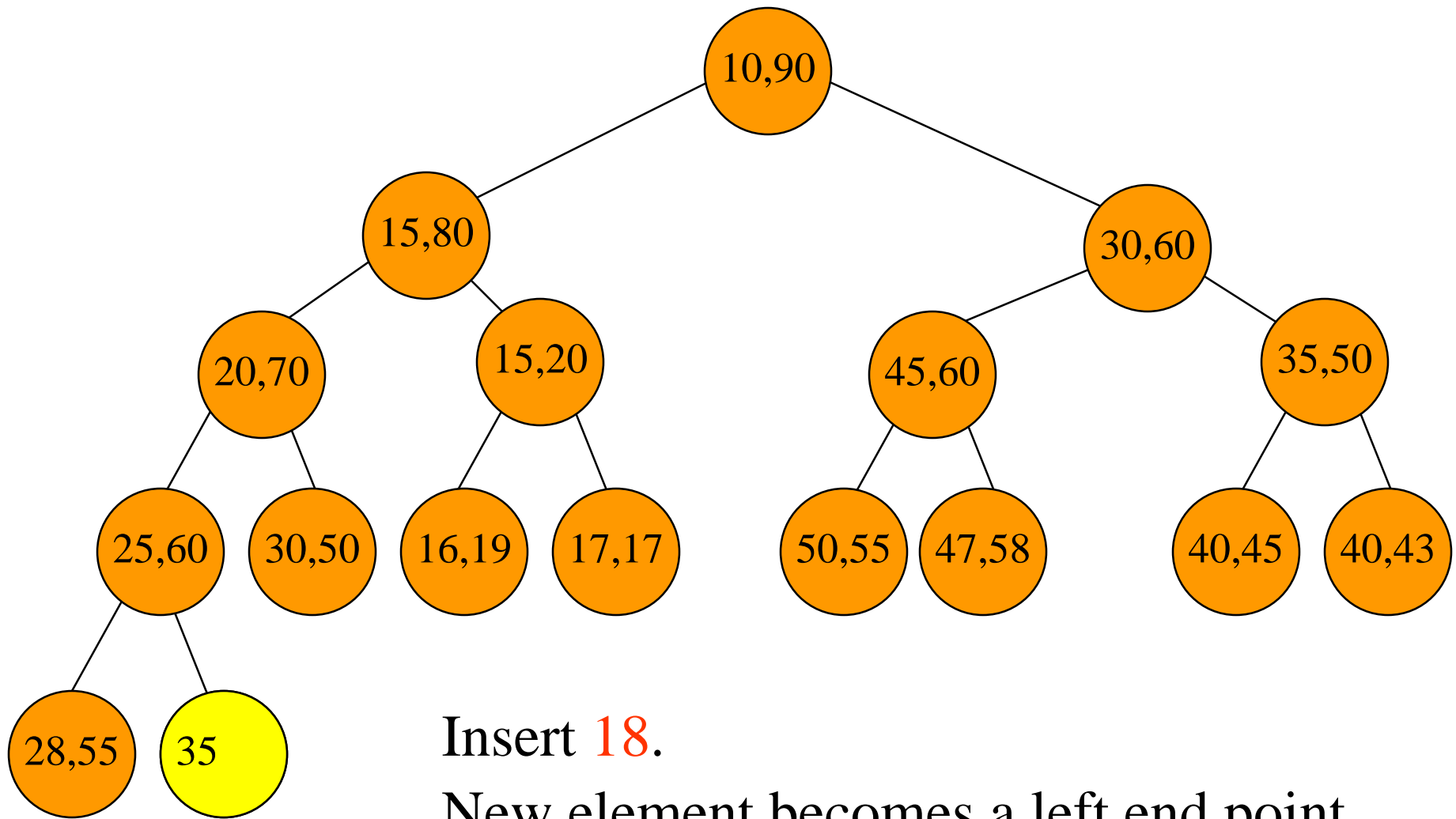
Store as an array.

Height is  $\sim \log_2 n$ .

# Insert An Element



# Another Insert



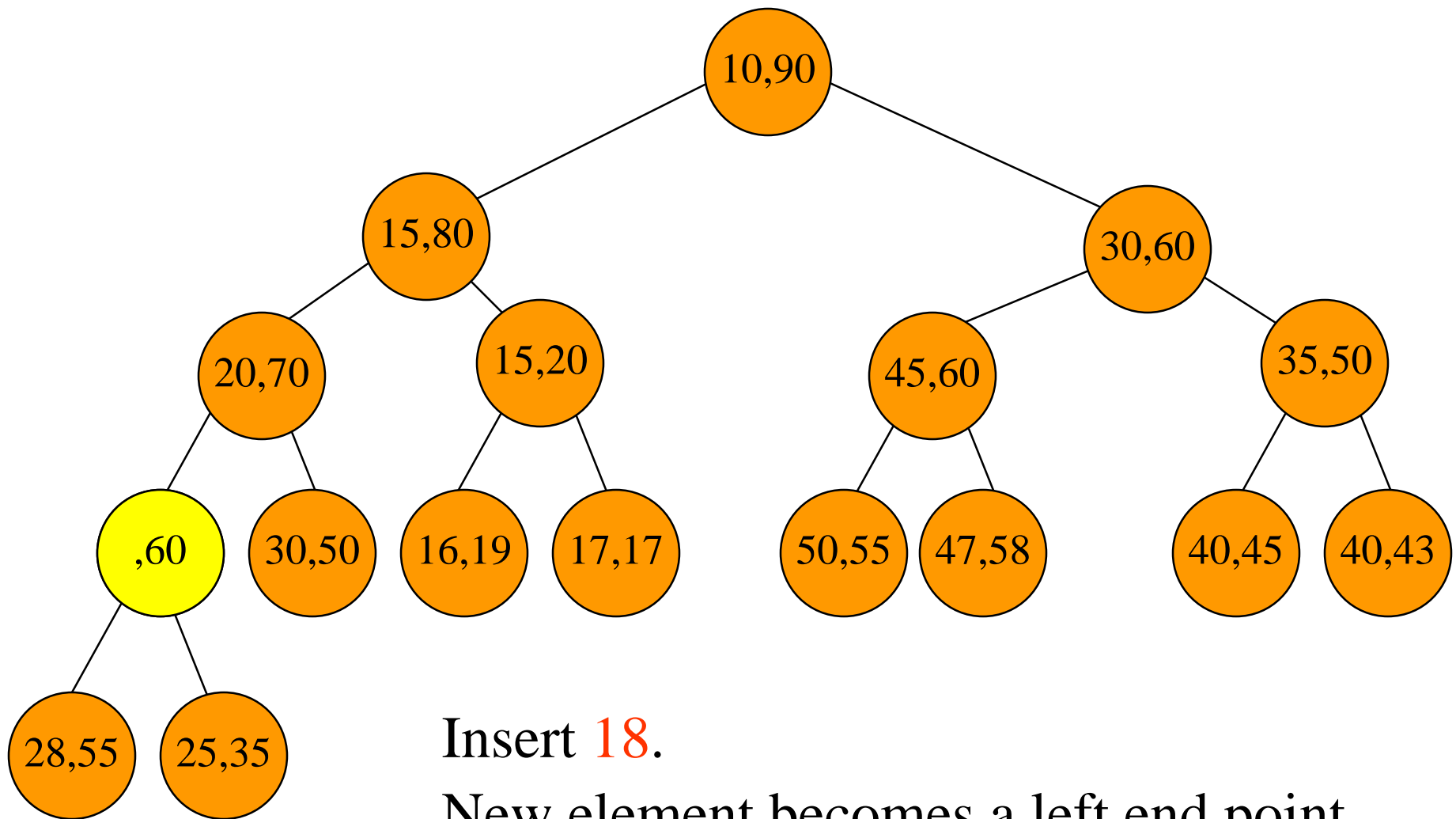
Insert 18.

New element becomes a left end point.

Insert new element into min heap.



# Another Insert

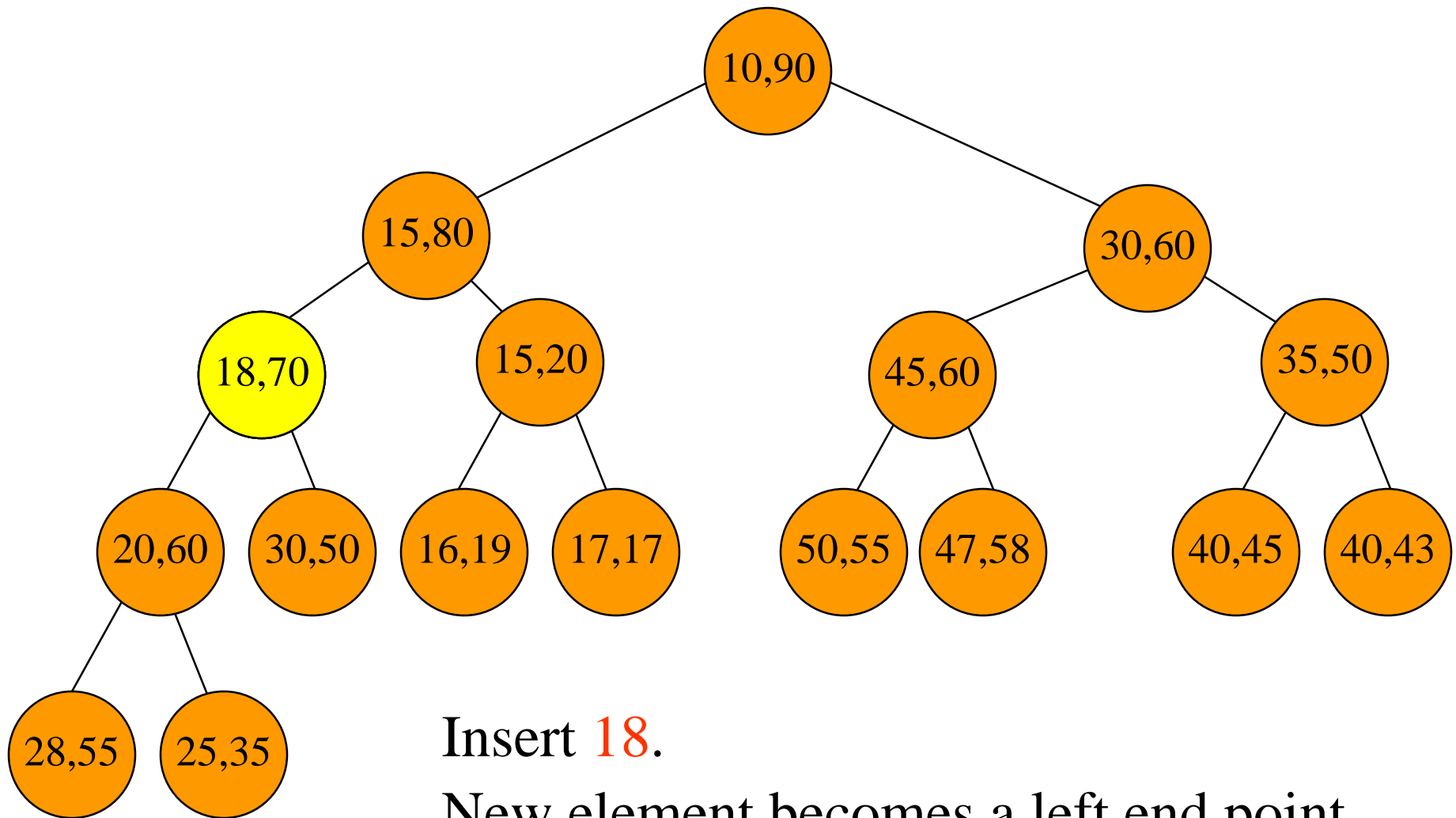


Insert 18.

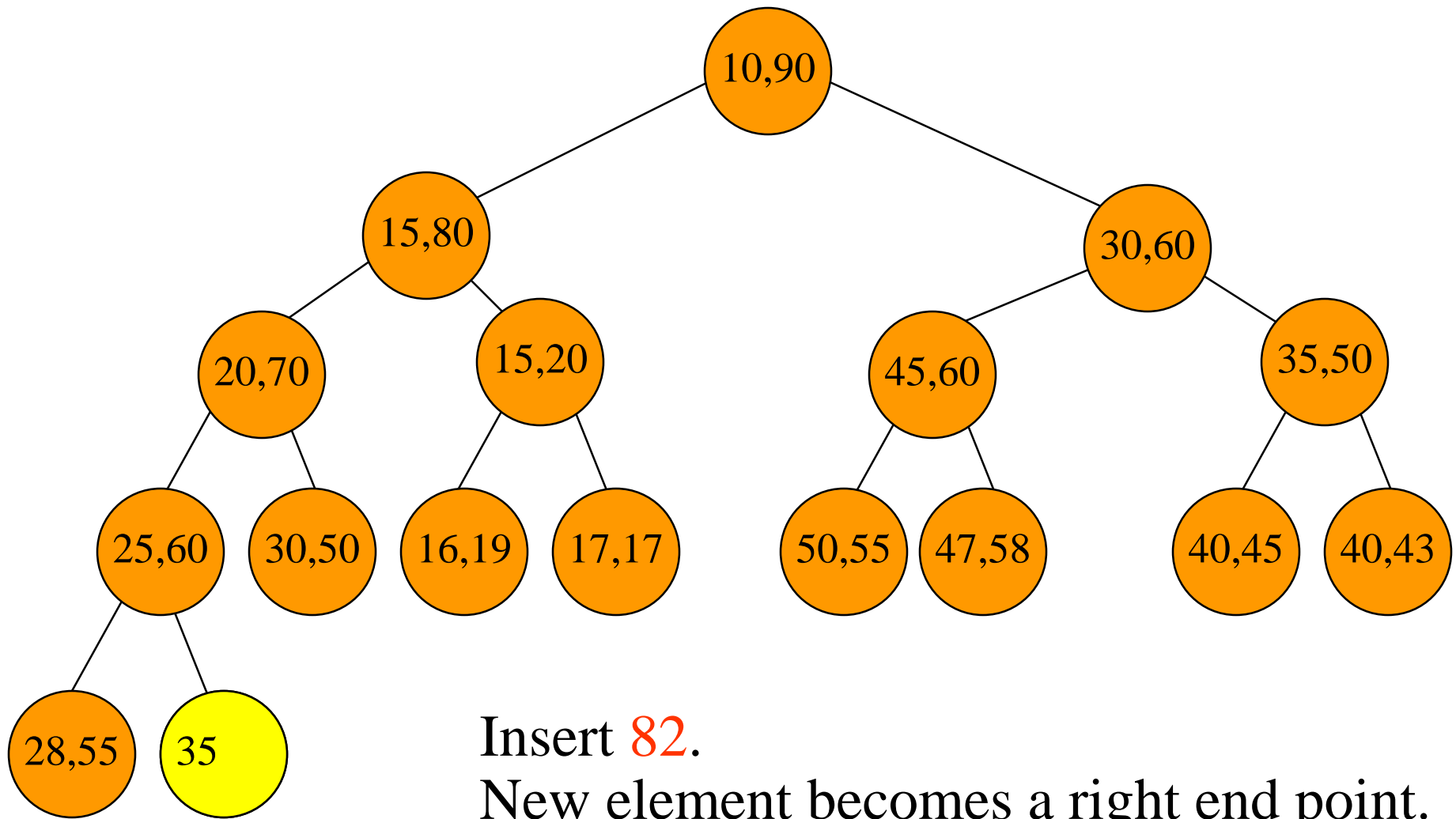
New element becomes a left end point.

Insert new element into min heap.

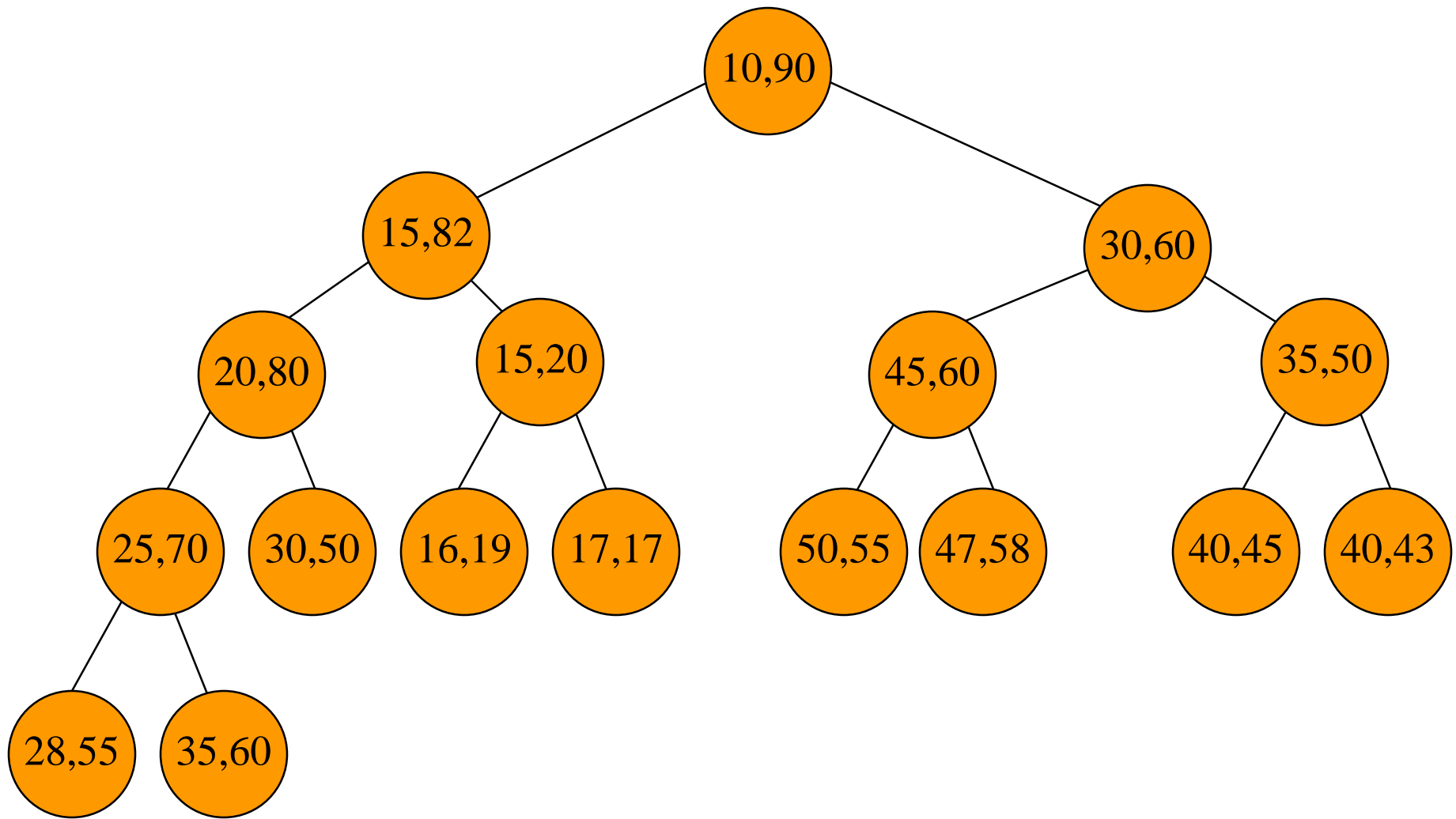
# Another Insert



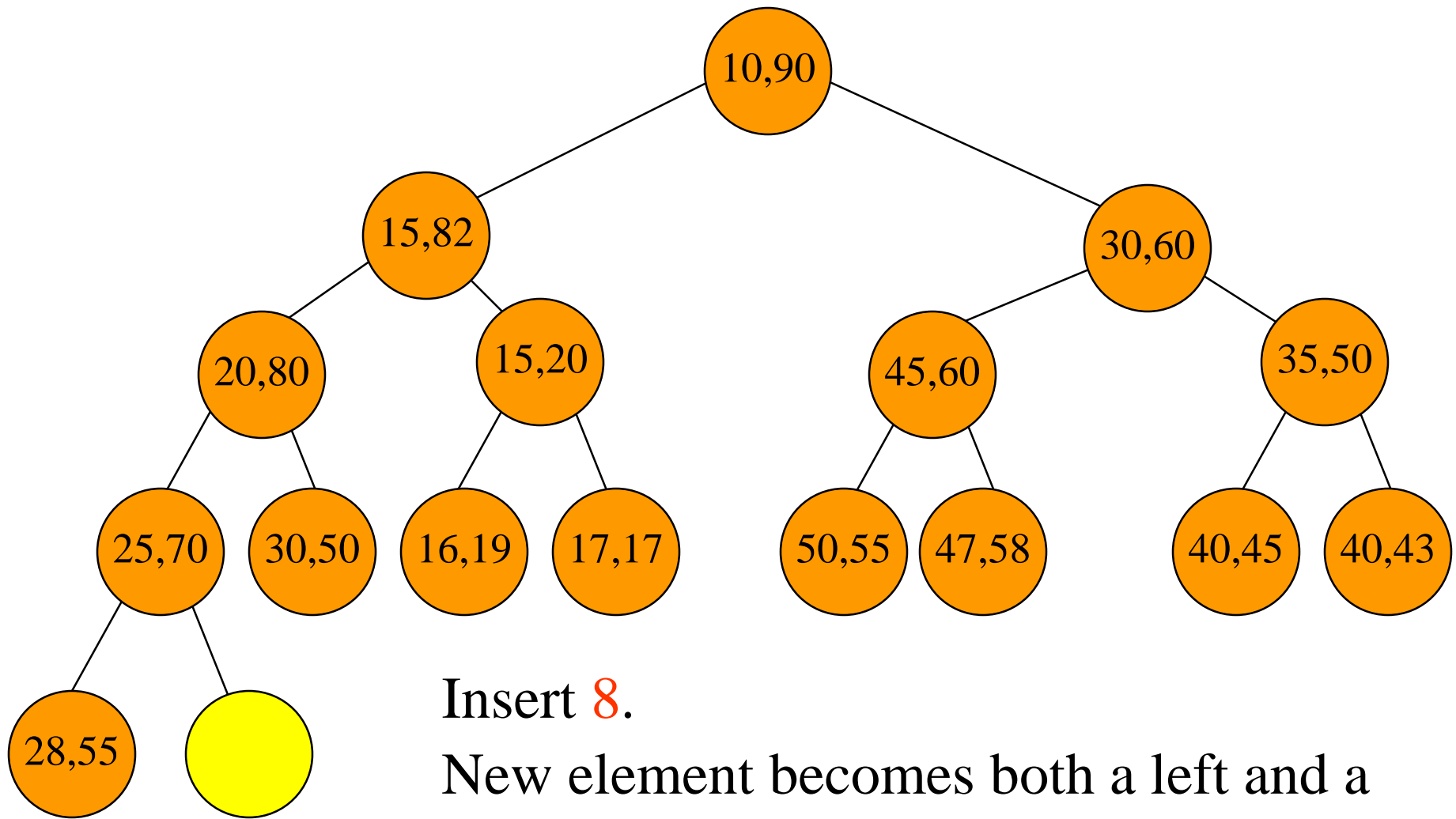
# Yet Another Insert



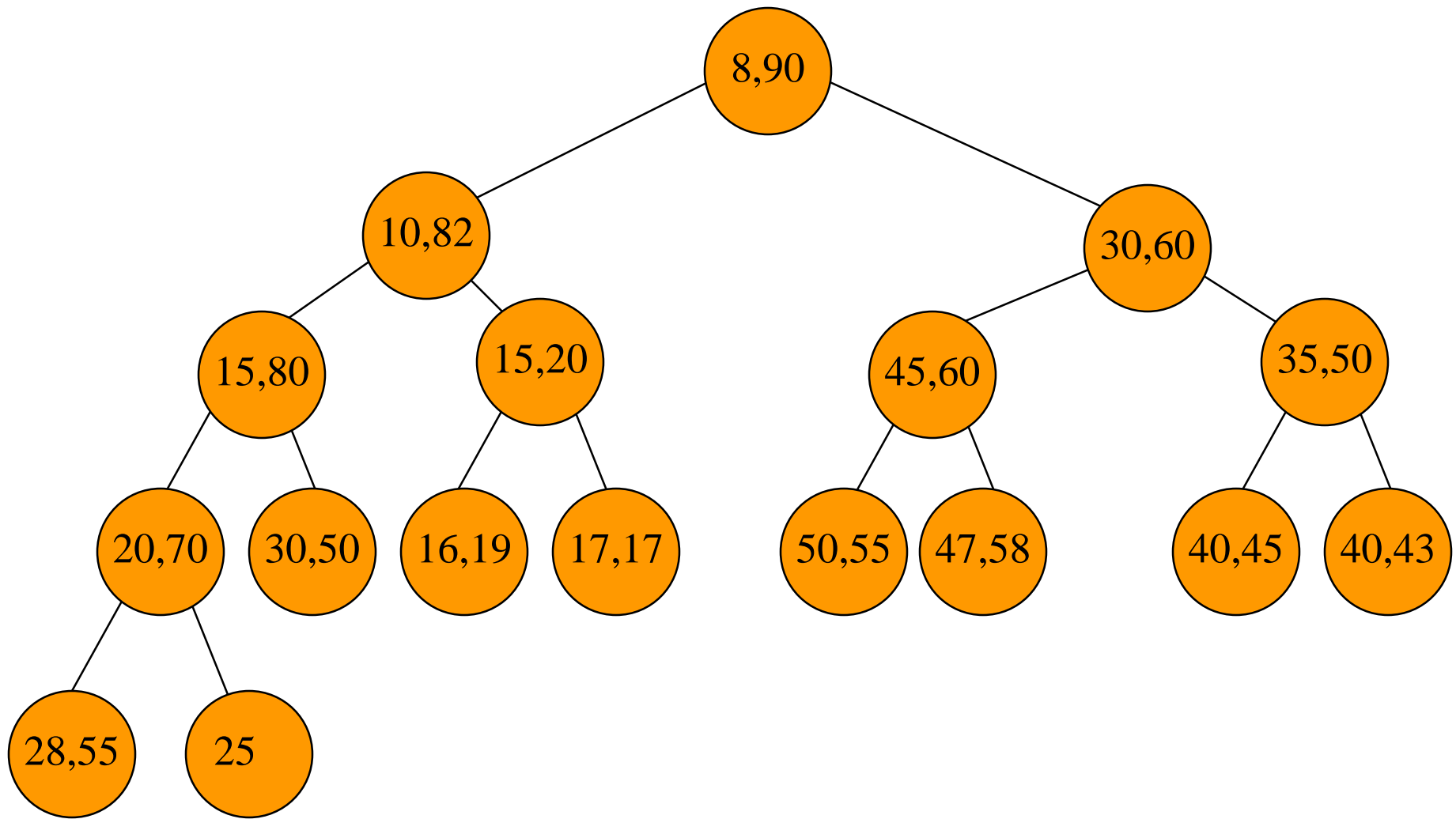
# After 82 Inserted



# One More Insert Example



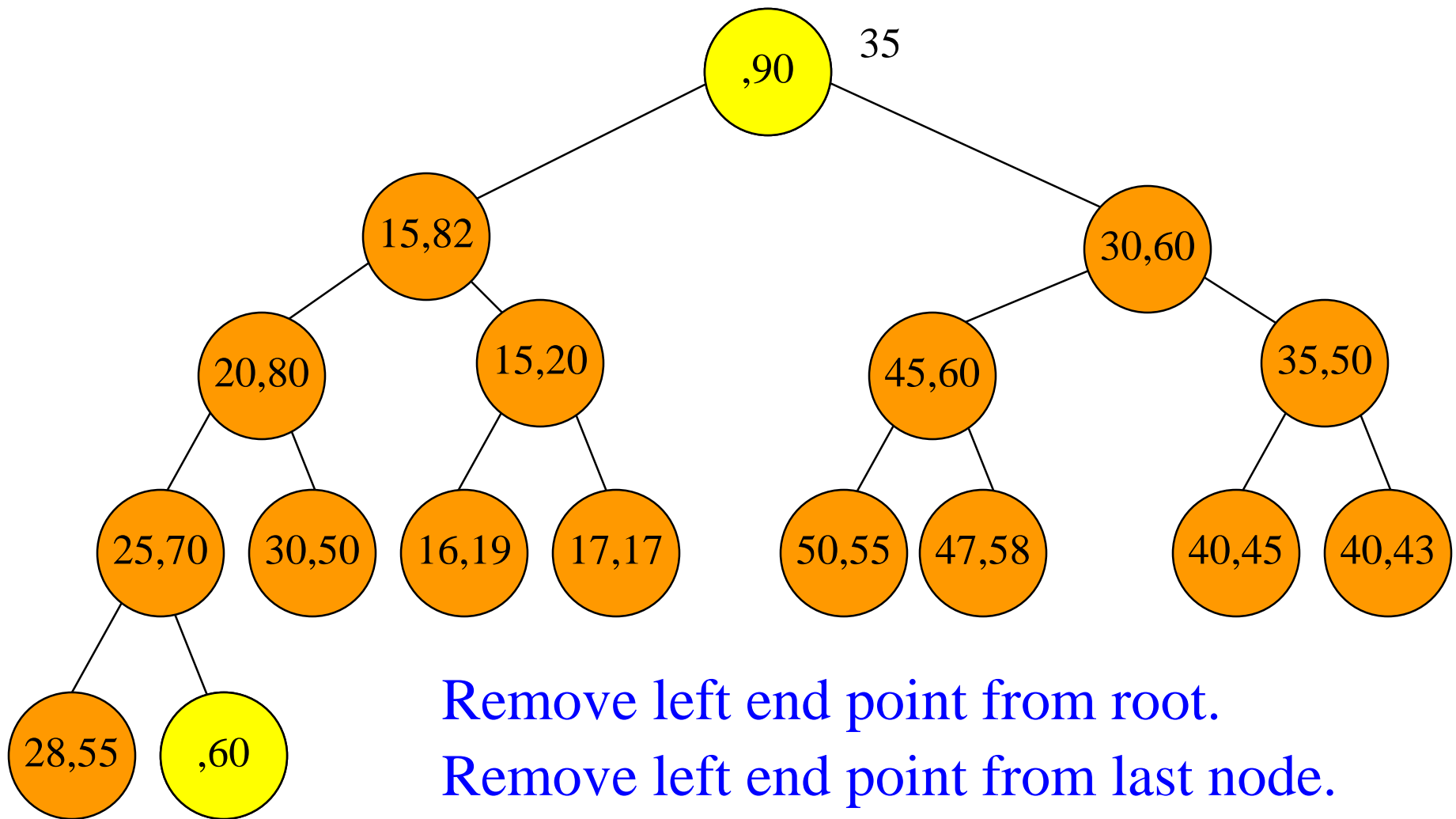
# After 8 Is Inserted



# Remove Min Element

- $n = 0 \Rightarrow$  fail.
- $n = 1 \Rightarrow$  heap becomes empty.
- $n = 2 \Rightarrow$  only one node, take out left end point.
- $n > 2 \Rightarrow$  not as simple.

# Remove Min Element Example



Remove left end point from root.

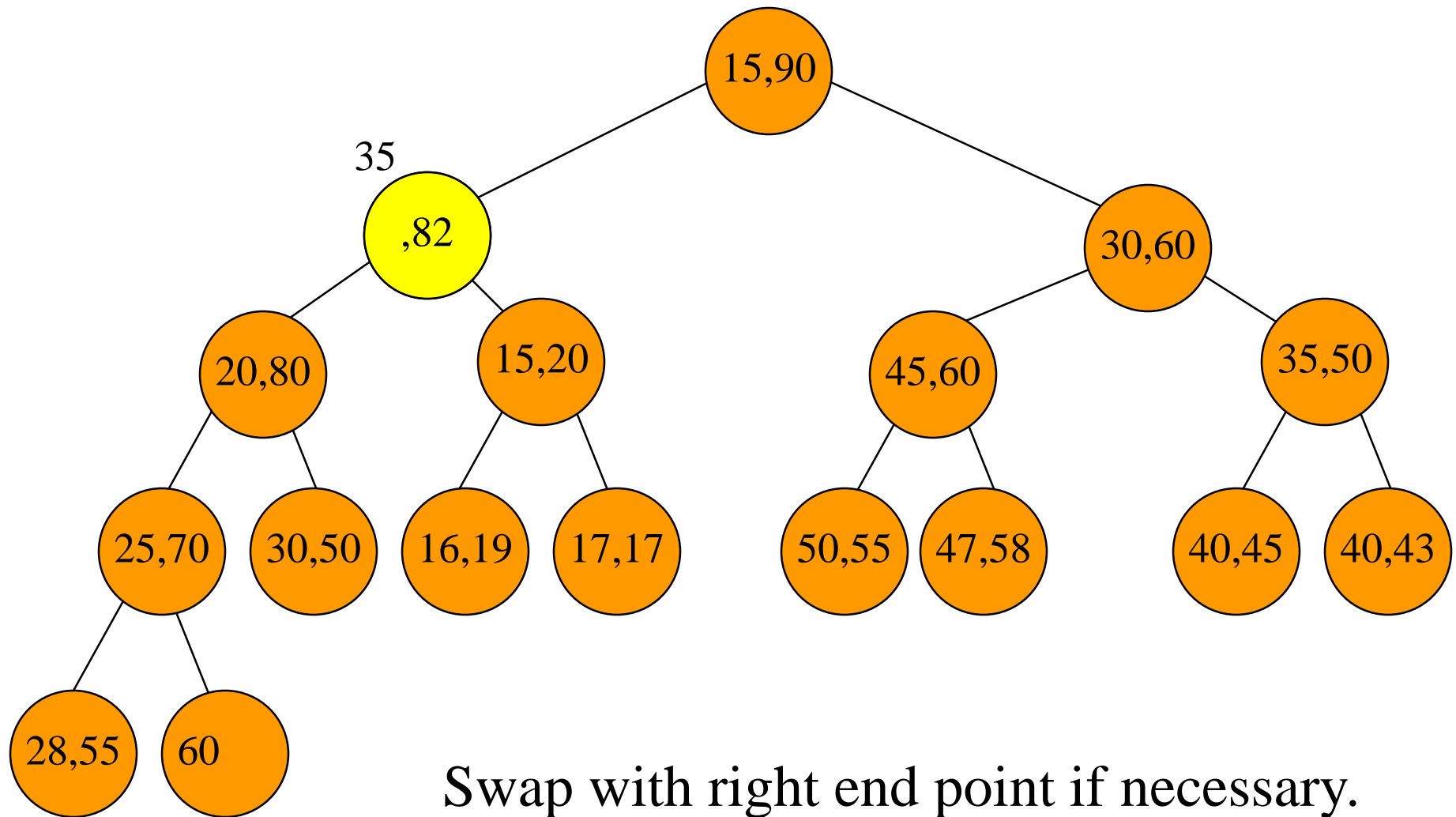
Remove left end point from last node.

Delete last node if now empty.

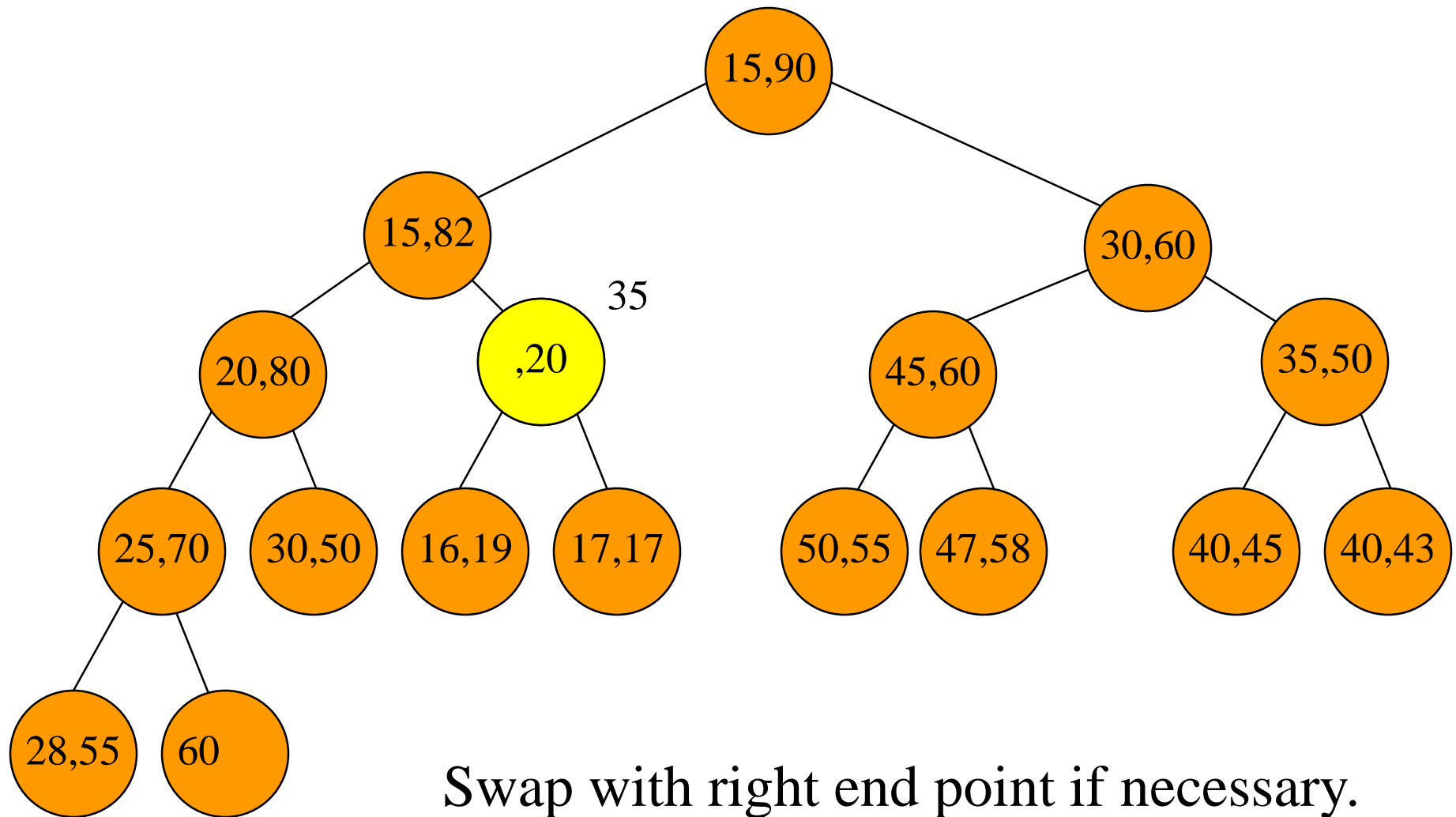
Reinsert into min heap, begin at root.



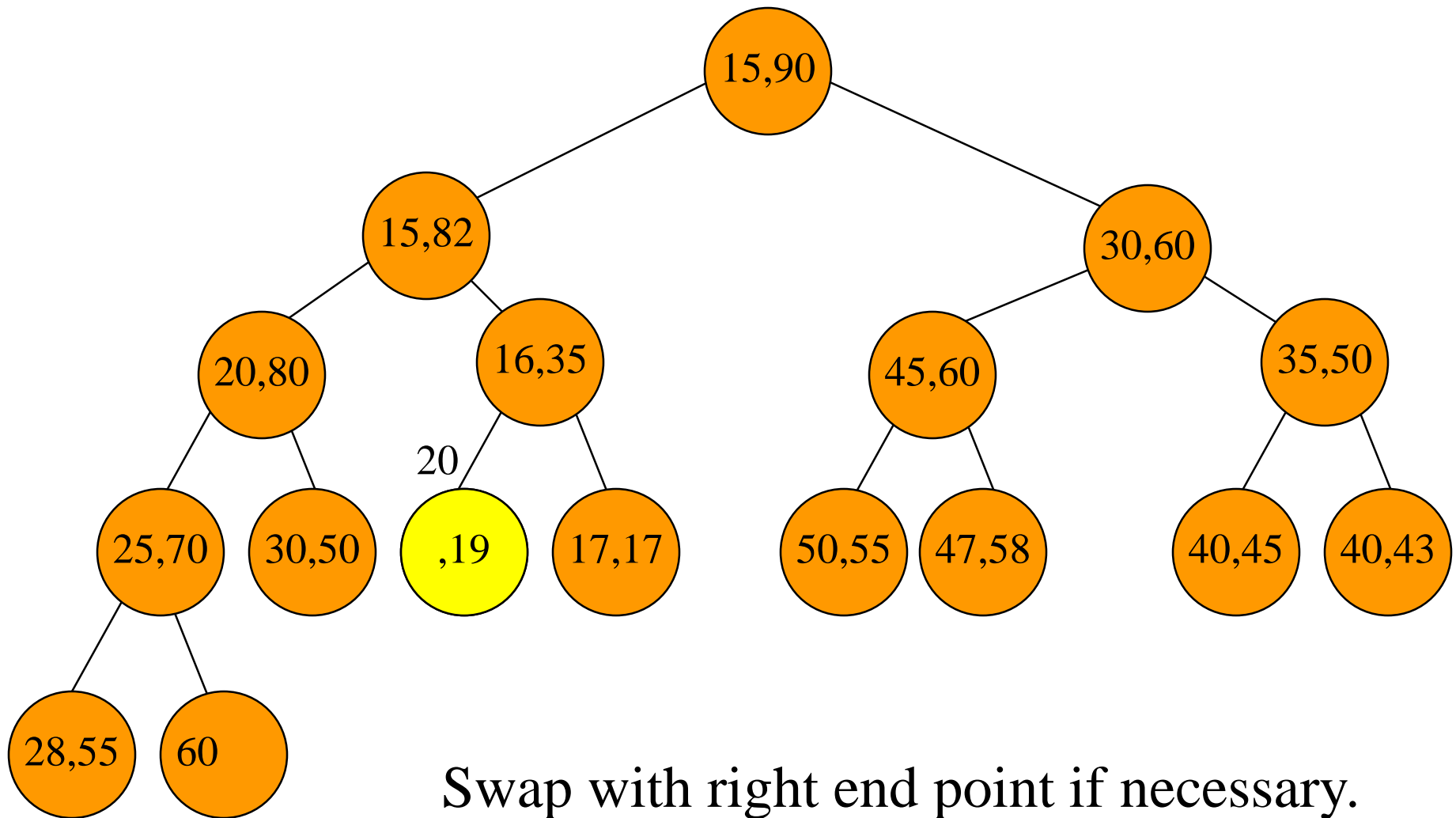
# Remove Min Element Example



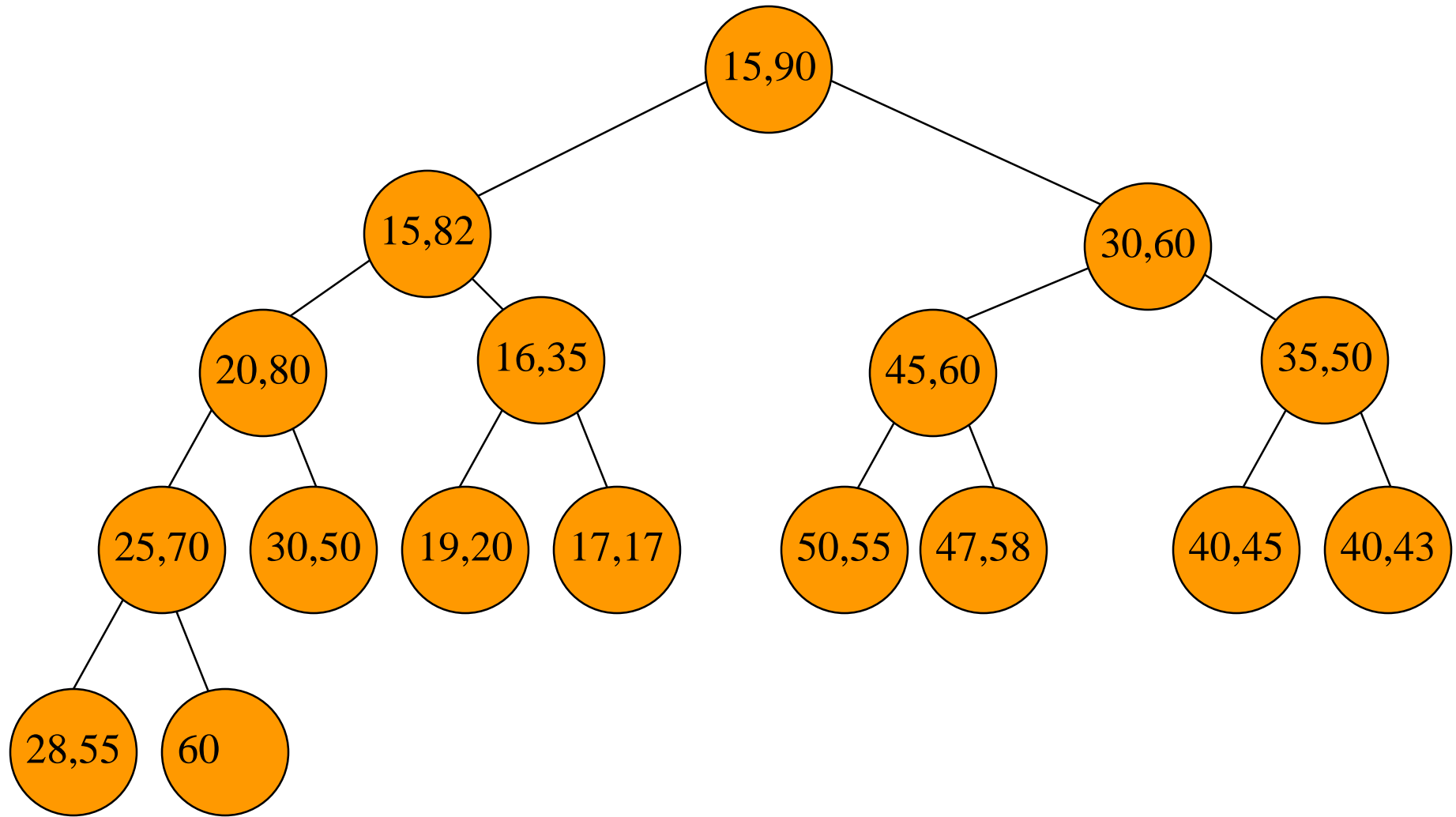
# Remove Min Element Example



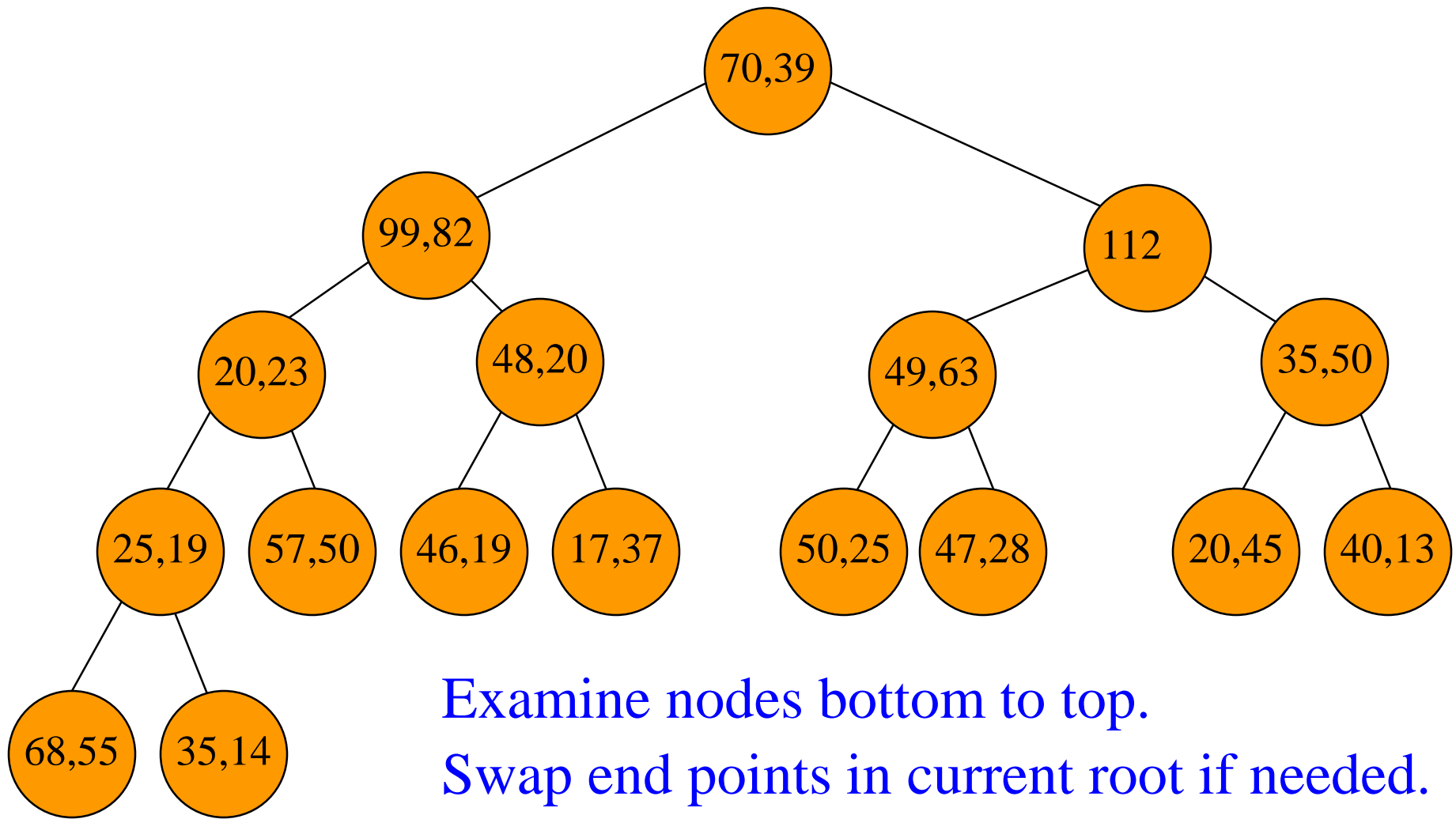
# Remove Min Element Example



# Remove Min Element Example



# Initialize



Examine nodes bottom to top.

Swap end points in current root if needed.

Reinsert left end point into min heap.

Reinsert right end point into max heap.

# Cache Optimization

- Heap operations.
  - Uniformly distributed keys.
  - Insert percolates 1.6 levels up the heap on average.
  - Remove min (max) height – 1 levels down the heap.
- Optimize cache utilization for remove min (max).

- L1 cache line is 32 bytes.
- L1 cache is 16KB.
- Heap node size is 8 bytes (1 8-byte element).
- 4 nodes/cache line.

## Cache Aligned Array



- A remove min (max) has  $\sim h$  L1 cache misses on average.
  - Root and its children are in the same cache line.
  - $\sim \log_2 n$  cache misses.
  - Only half of each cache line is used (except root's).

# d-ary Heap

- Complete  $n$  node tree whose degree is  $d$ .
- Min (max) tree.
- Number nodes in breadth-first manner with root being numbered  $1$ .
- $\text{Parent}(i) = \text{ceil}((i - 1)/d)$ .
- Children are  $d*(i - 1) + 2, \dots, \min\{d*i + 1, n\}$ .
- Height is  $\log_d n$ .
- Height of  $4$ -ary heap is half that of  $2$ -ary heap.



- Worst-case insert moves up half as many levels as when  $d = 2$ .
  - Average remains at about 1.6 levels.
- Remove-min operations now do 4 compares per level rather than 2 (determine smallest child and see if this child is smaller than element being relocated).
  - But, number of levels is half.
  - Other operations associated with remove min are halved (move small element up, loop iterations, etc.)

# 4-Heap Cache Utilization

- Standard mapping into cache-aligned array.



- Siblings are in 2 cache lines.
  - $\sim \log_2 n$  cache misses for average remove min (max).
- Shift 4-heap by 2 slots.



- Siblings are in same cache line.
  - $\sim \log_4 n$  cache misses for average remove min (max).

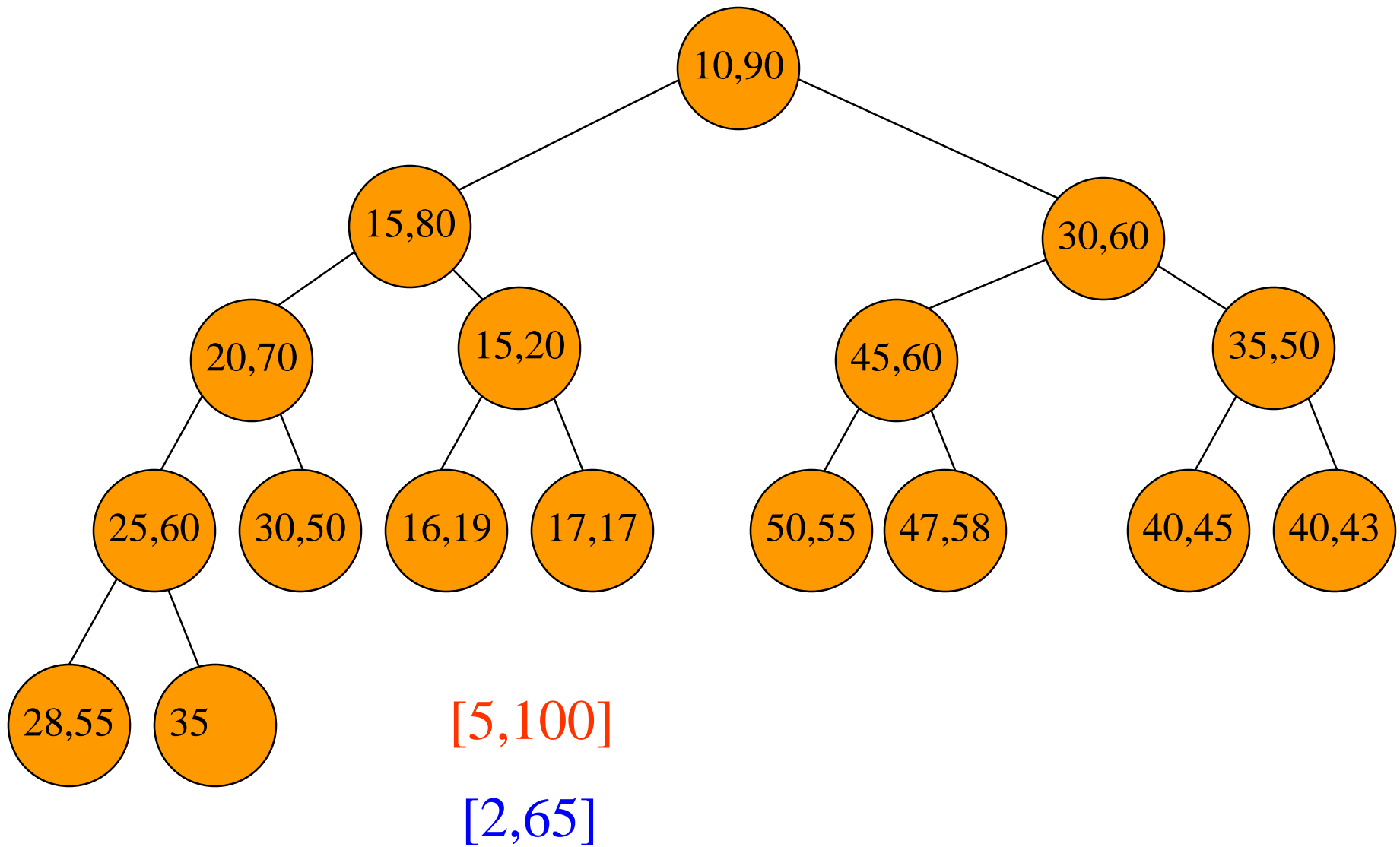
# d-ary Heap Performance

- Speedup of about 1.5 to 1.8 when sorting 1 million elements using heapsort and cache-aligned 4-heap vs. 2-heap that begins at array position 0.
- Cache-aligned 4-heap generally performs as well as, or better, than other d-heaps.
- Use degree 4 complete tree for interval heaps instead of degree 2.

# Application Of Interval Heaps

- Complementary range search problem.
  - Collection of 1D points (numbers).
  - Insert a point.
    - $O(\log n)$
  - Remove a point given its location in the structure.
    - $O(\log n)$
  - Report all points not in the range  $[a, b]$ ,  $a \leq b$ .
    - $O(k)$ , where  $k$  is the number of points not in the range.

# Example



## Section 13.2

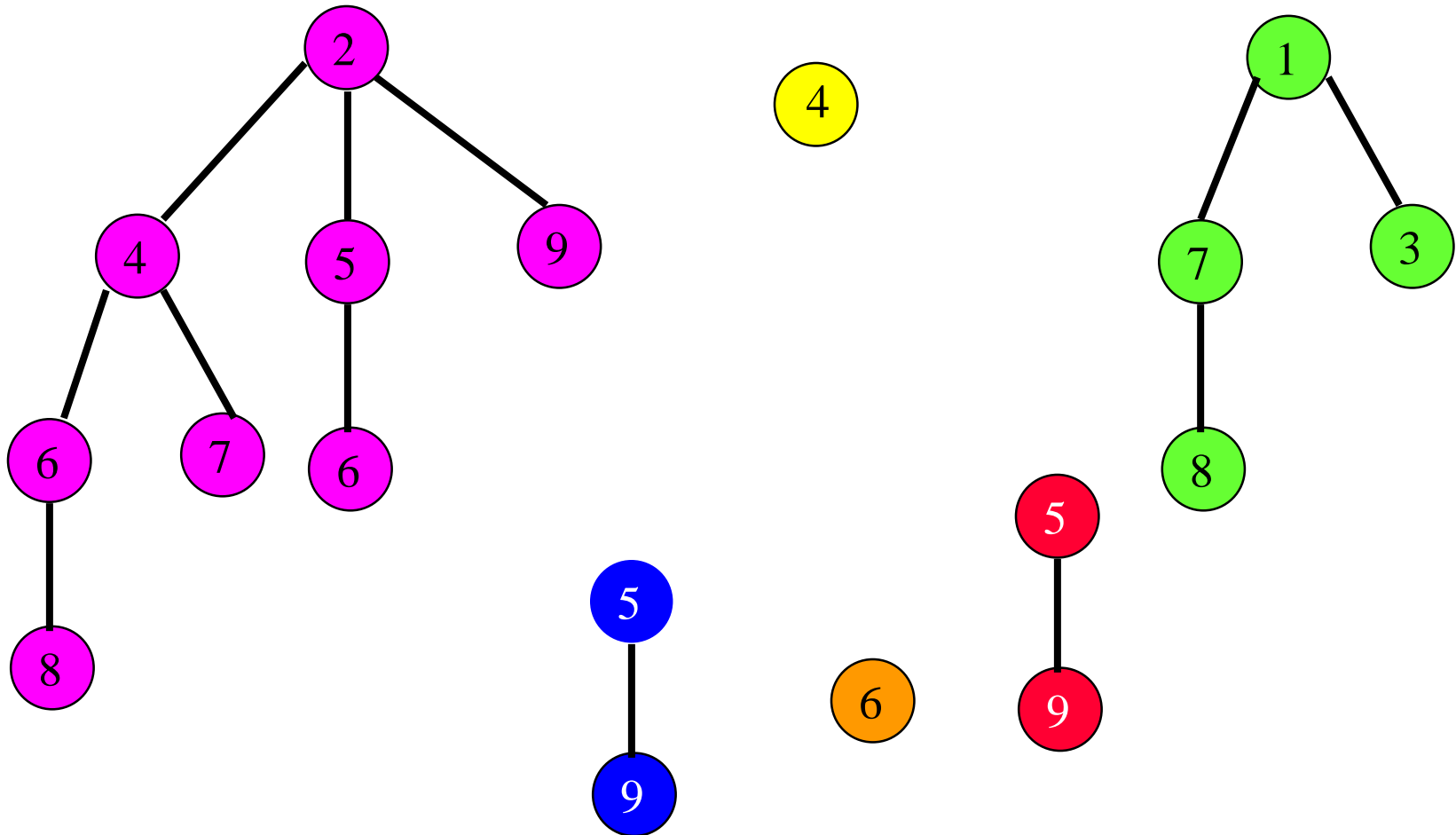
# Binomial Heap

# Binomial Heaps

	Leftist trees	Binomial heaps	
		Actual	Amortized
Insert	$O(\log n)$	$O(1)$	$O(1)$
Delete min (or max)	$O(\log n)$	$O(n)$	$O(\log n)$
Meld	$O(\log n)$	$O(1)$	$O(1)$

# Min Binomial Heap

- Collection of min trees.



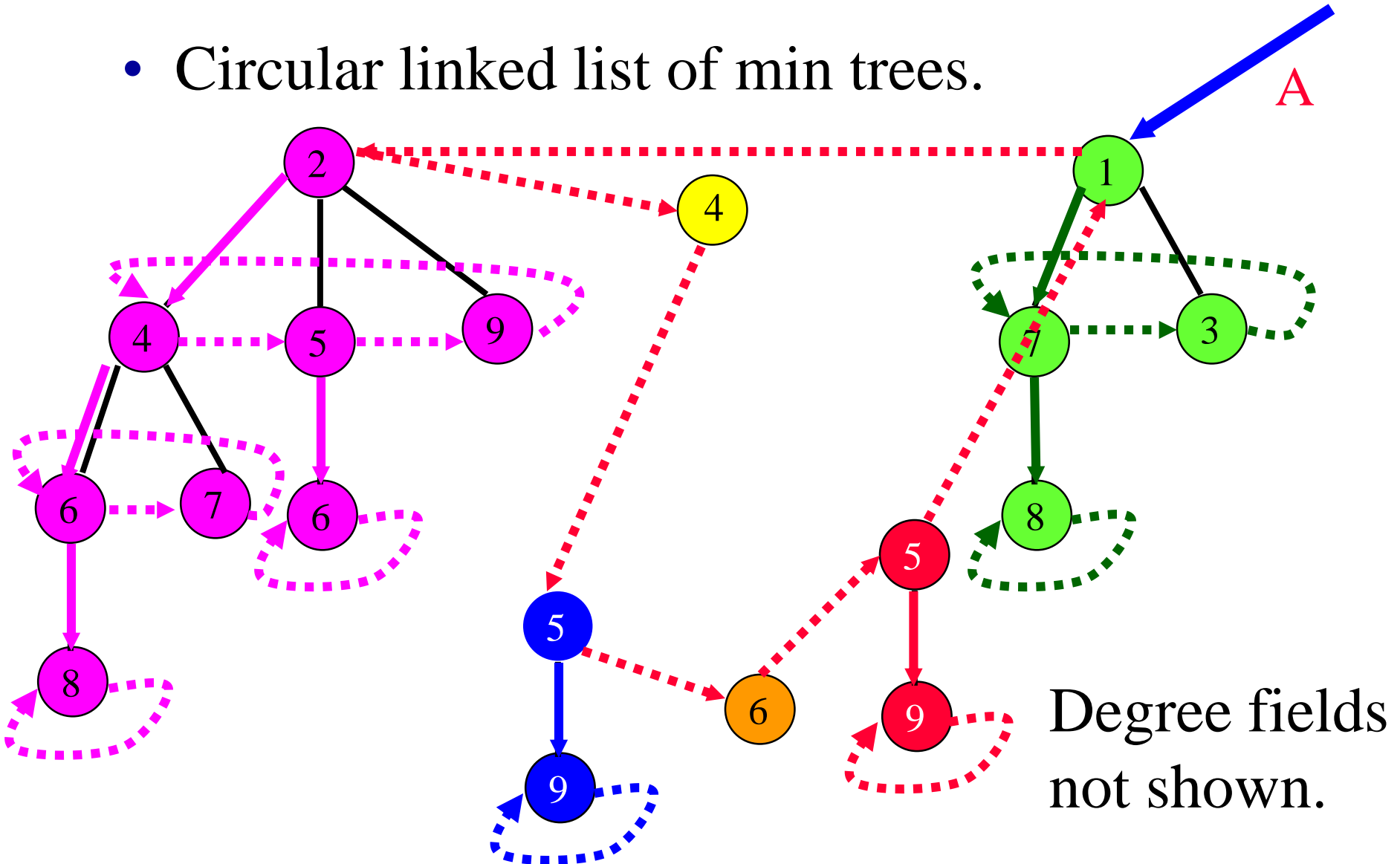


# Node Structure

- Degree
  - Number of children.
- Child
  - Pointer to one of the node's children.
  - Null iff node has no child.
- Sibling
  - Used for circular linked list of siblings.
- Data

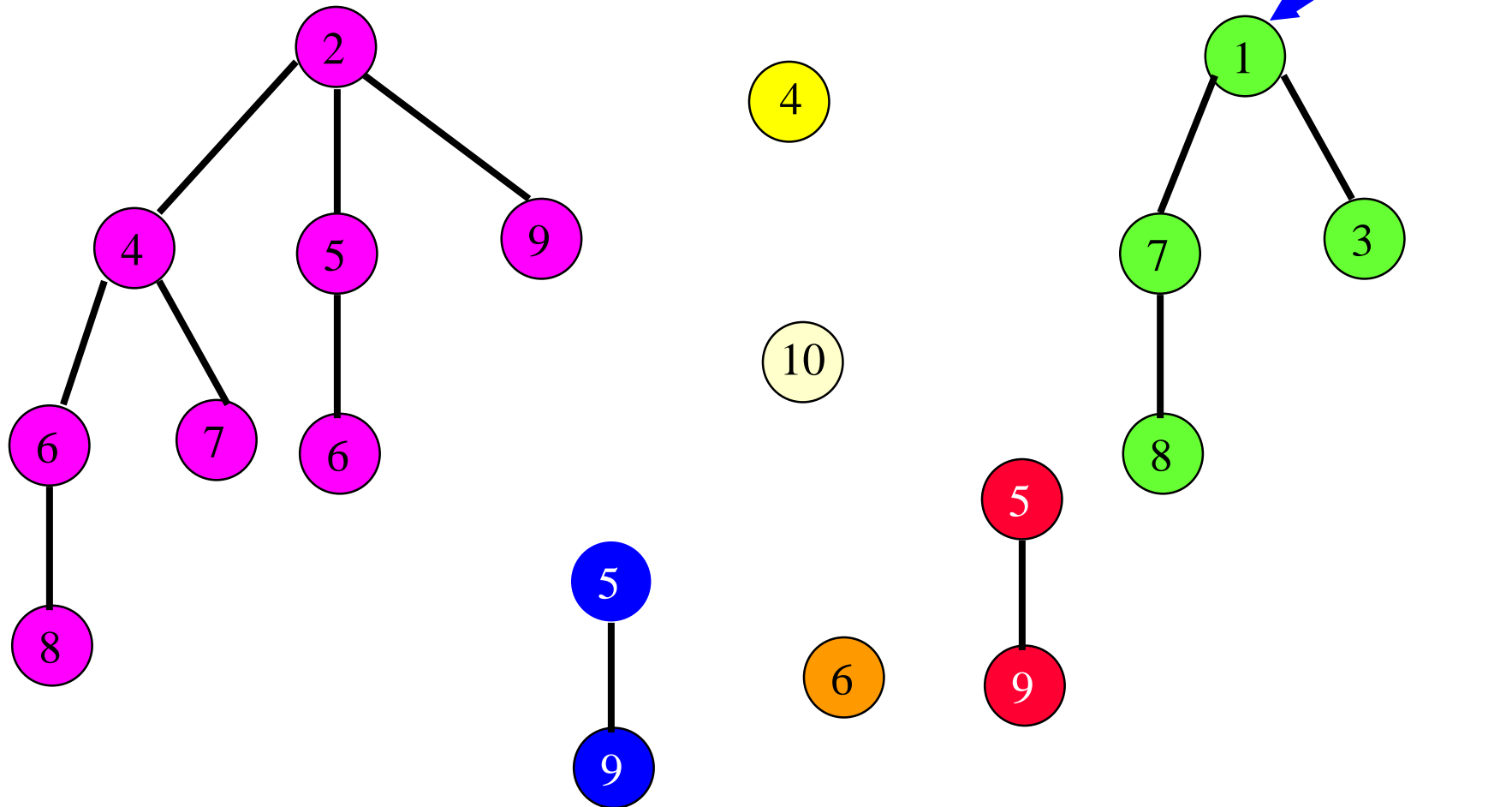
# Binomial Heap Representation

- Circular linked list of min trees.

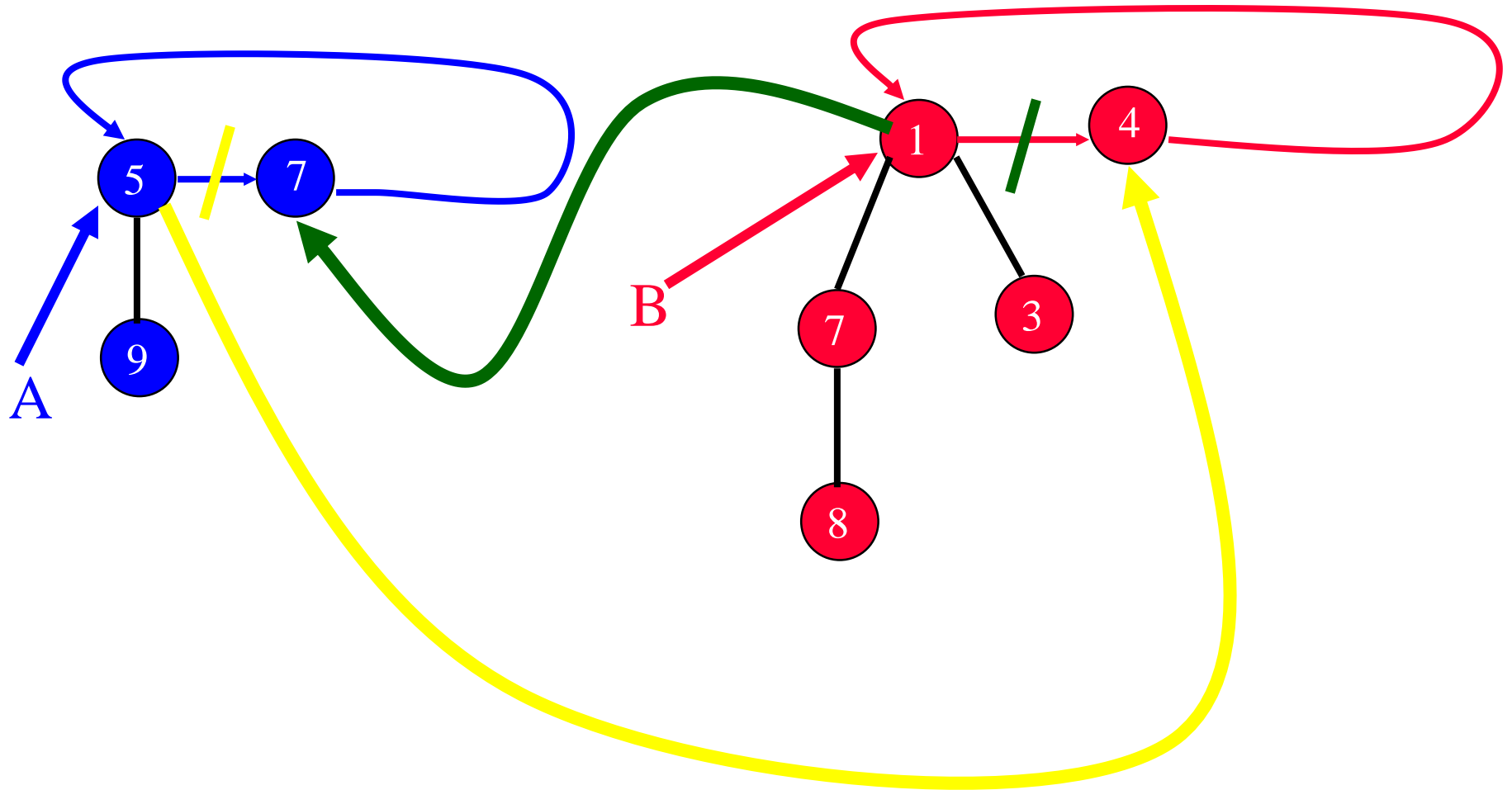


# Insert 10

- Add a new single-node min tree to the collection.
- Update min-element pointer if necessary.

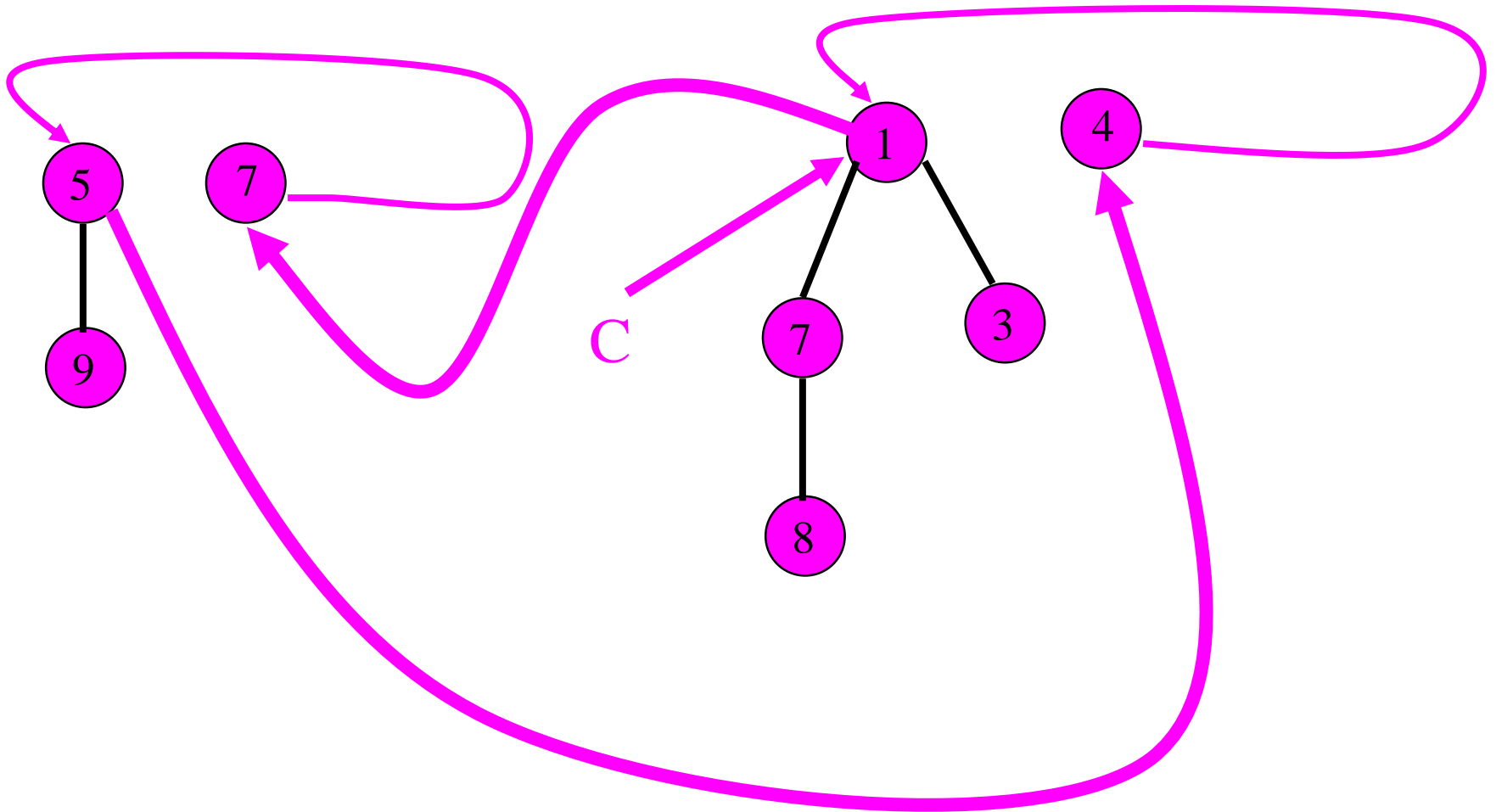


# Meld



- Combine the 2 top-level circular lists.
- Set min-element pointer.

# Meld

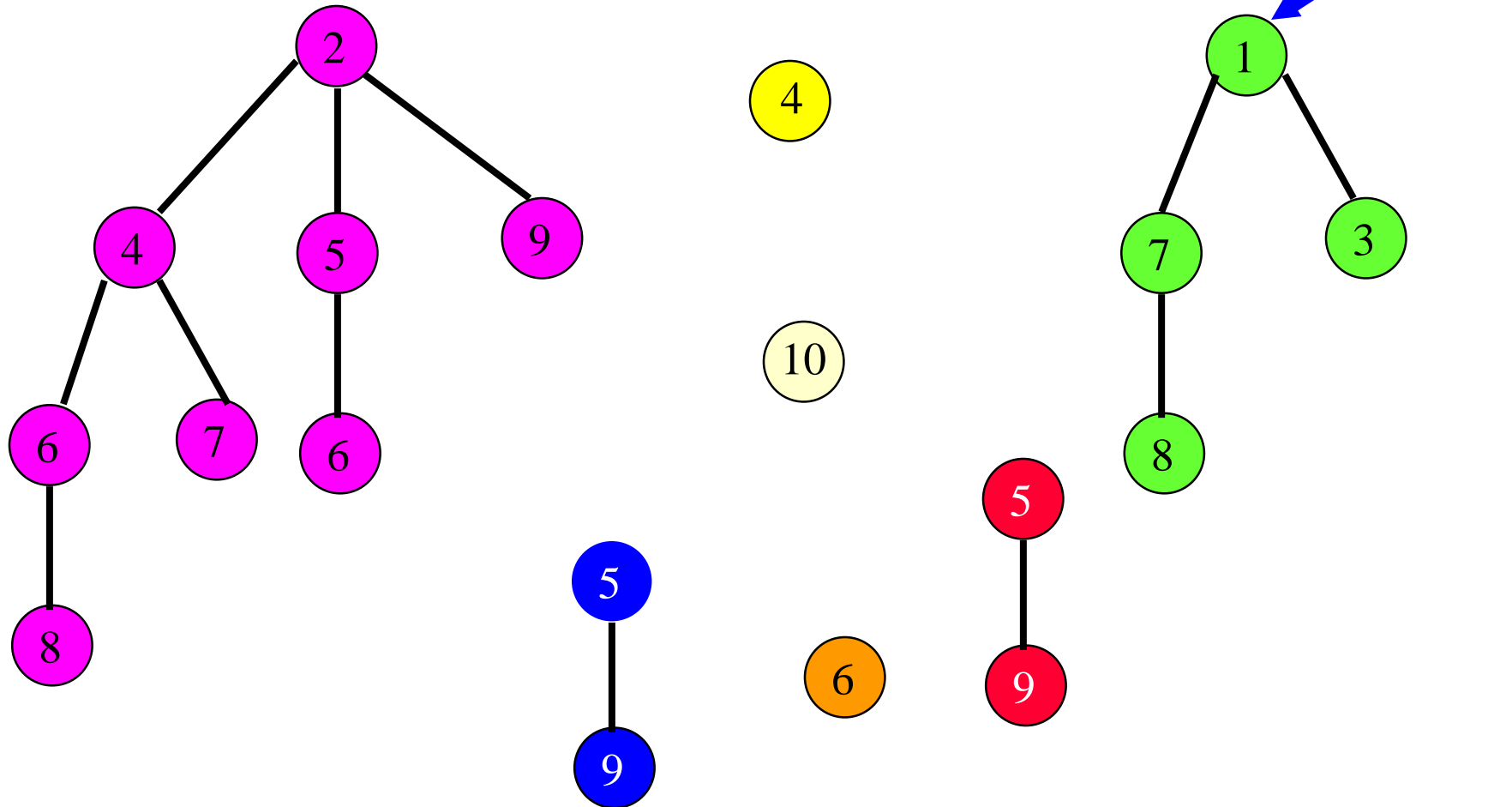


# Delete Min

- Empty binomial heap  $\Rightarrow$  fail.

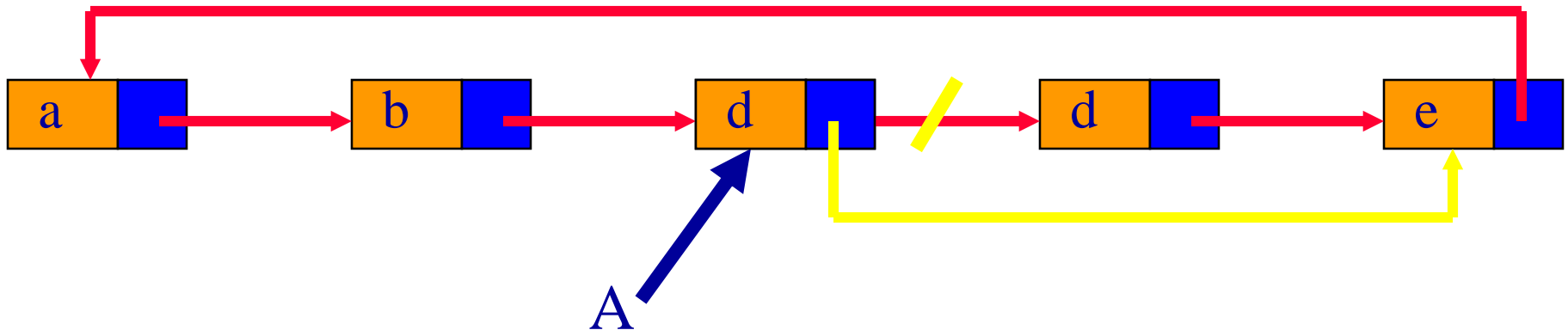
# Nonempty Binomial Heap

- Remove a min tree.
- Reinsert subtrees of removed min tree.
- Update binomial heap pointer.



# Remove Min Tree

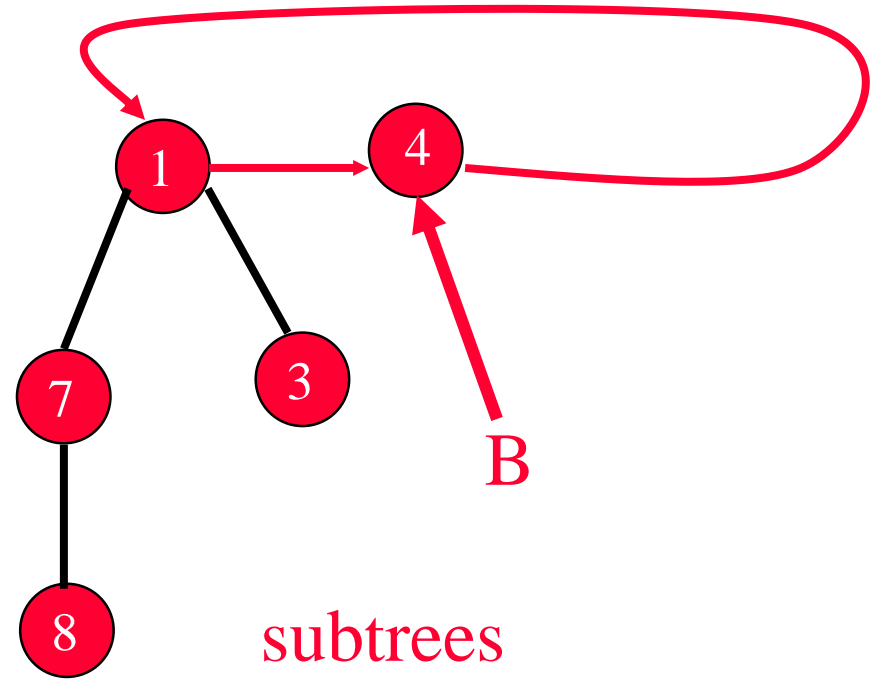
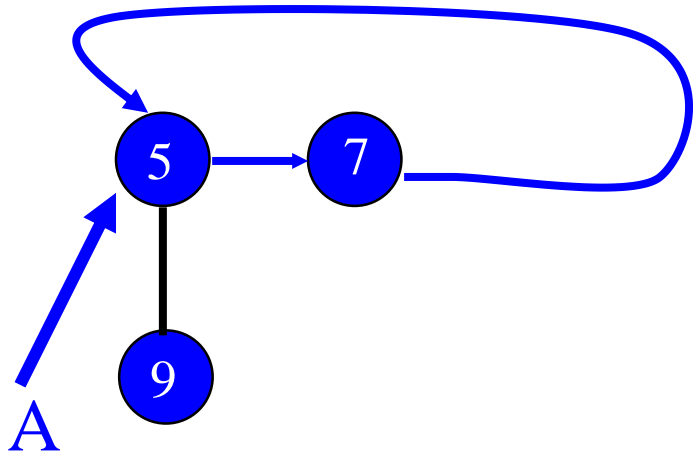
- Same as remove a node from a circular list.



- No next node  $\Rightarrow$  empty after remove.
- Otherwise, copy next-node data and remove next node.



# Reinsert Subtrees



- Combine the 2 top-level circular lists.
  - Same as in meld operation.

# Update Binomial Heap Pointer

- Must examine roots of all min trees to determine the min value.

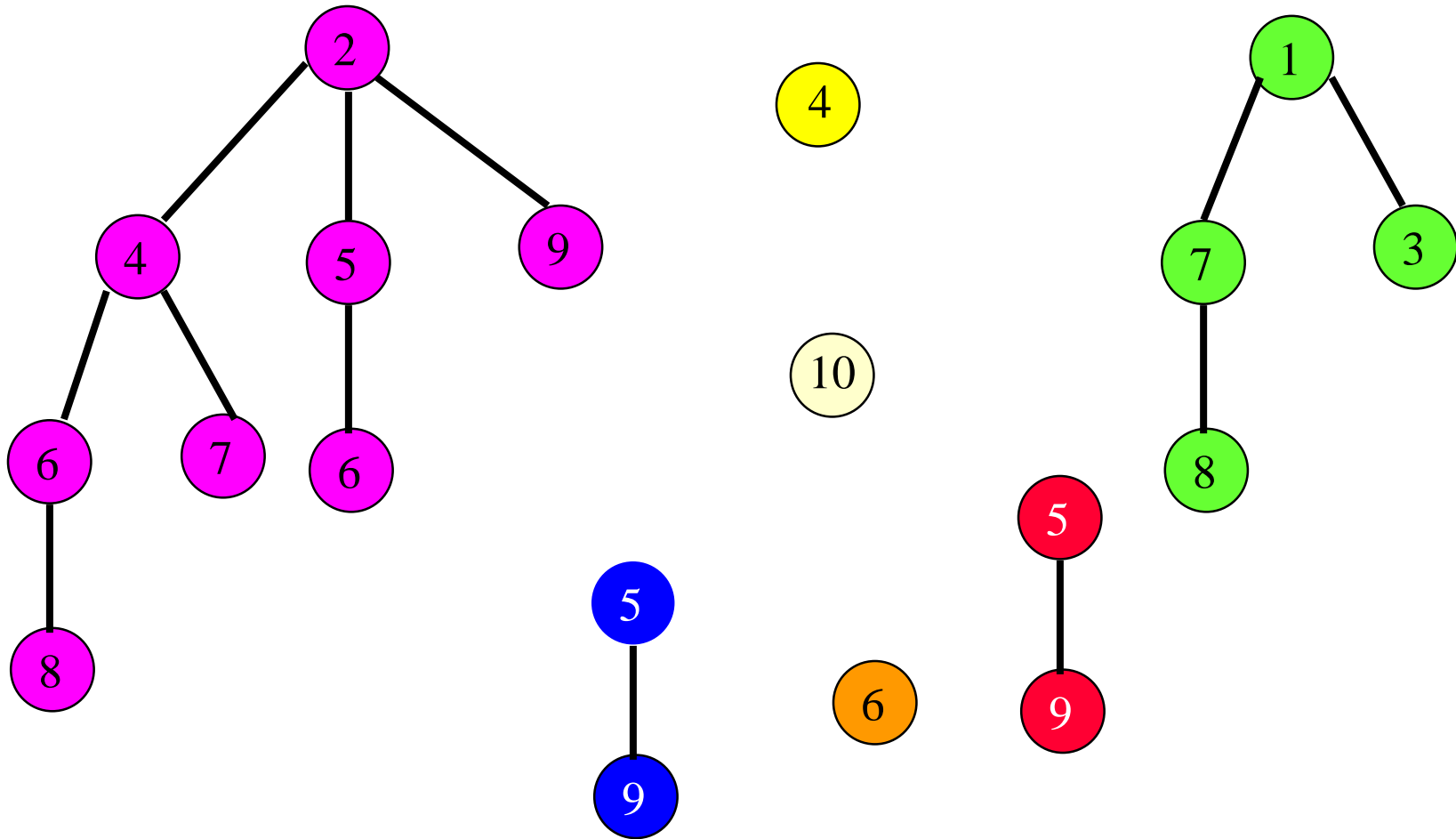
# Complexity Of Delete Min

- Remove a min tree.
  - $O(1)$ .
- Reinsert subtrees.
  - $O(1)$ .
- Update binomial heap pointer.
  - $O(s)$ , where  $s$  is the number of min trees in final top-level circular list.
  - $s = O(n)$ .
- Overall complexity of remove min is  $O(n)$ .

# Enhanced Delete Min

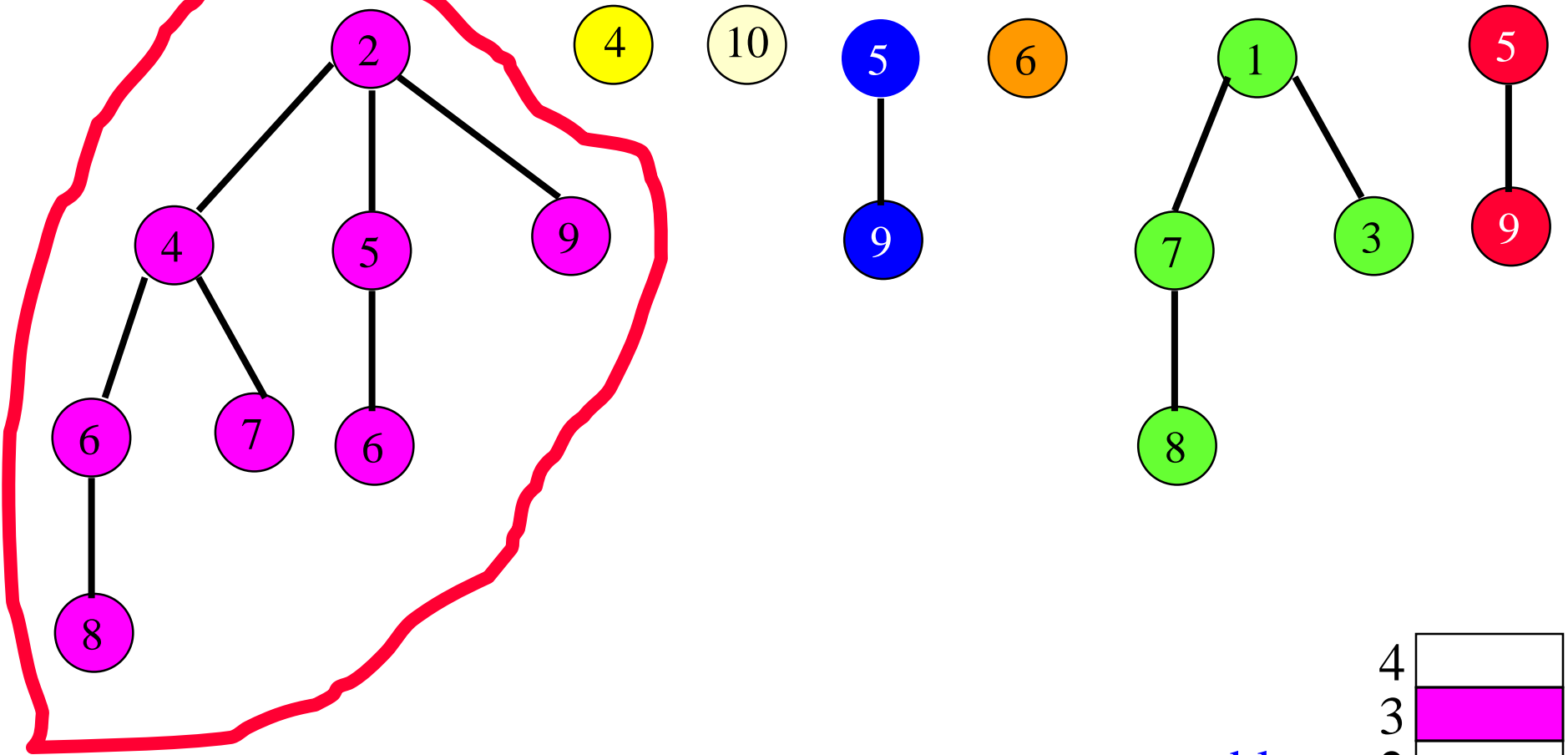
- During reinsert of subtrees, pairwise combine min trees whose roots have equal degree.

# Pairwise Combine



Examine the  $s = 7$  trees in some order.  
Determined by the 2 top-level circular lists.

# Pairwise Combine

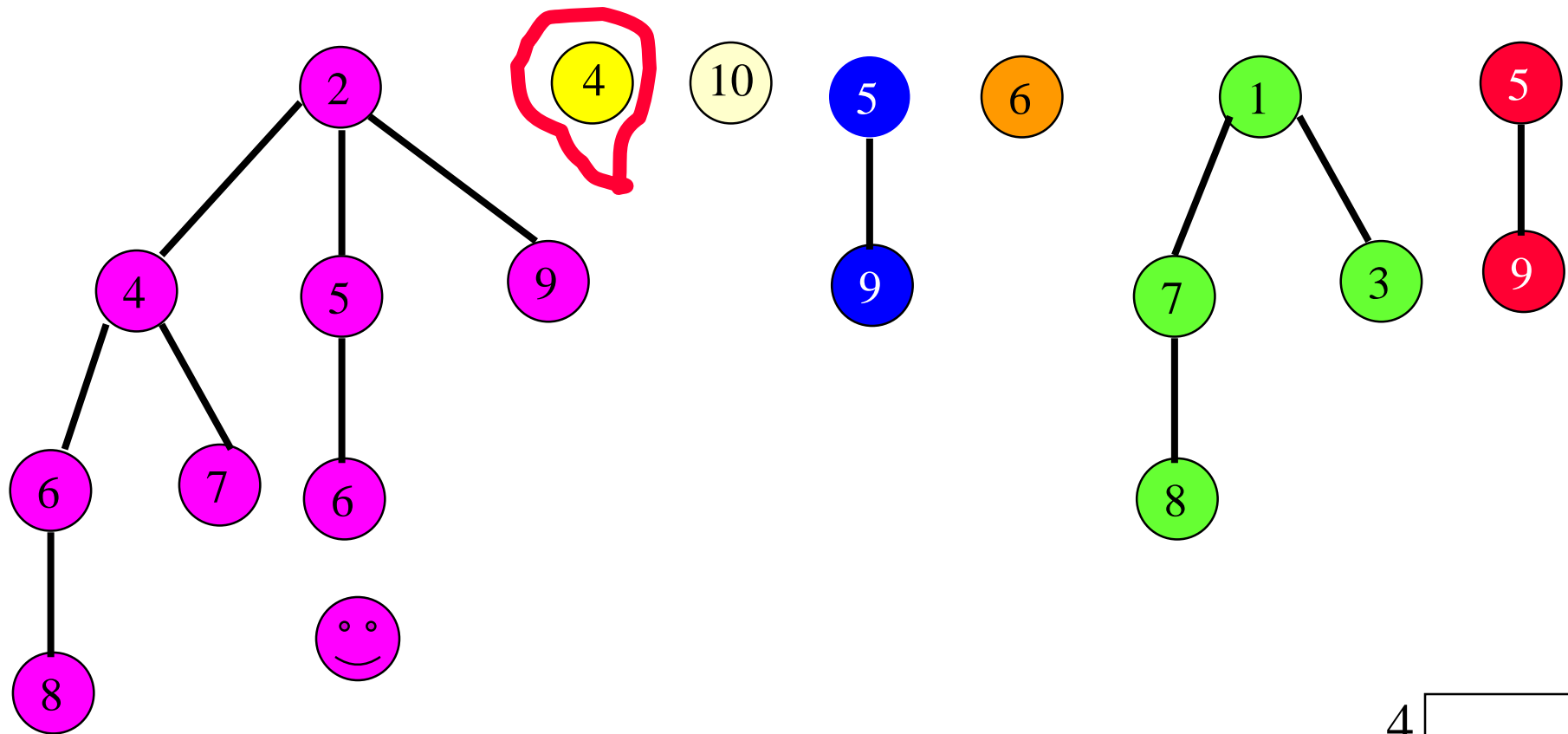


tree table

4	
3	
2	
1	
0	

Use a table to keep track of trees by degree.

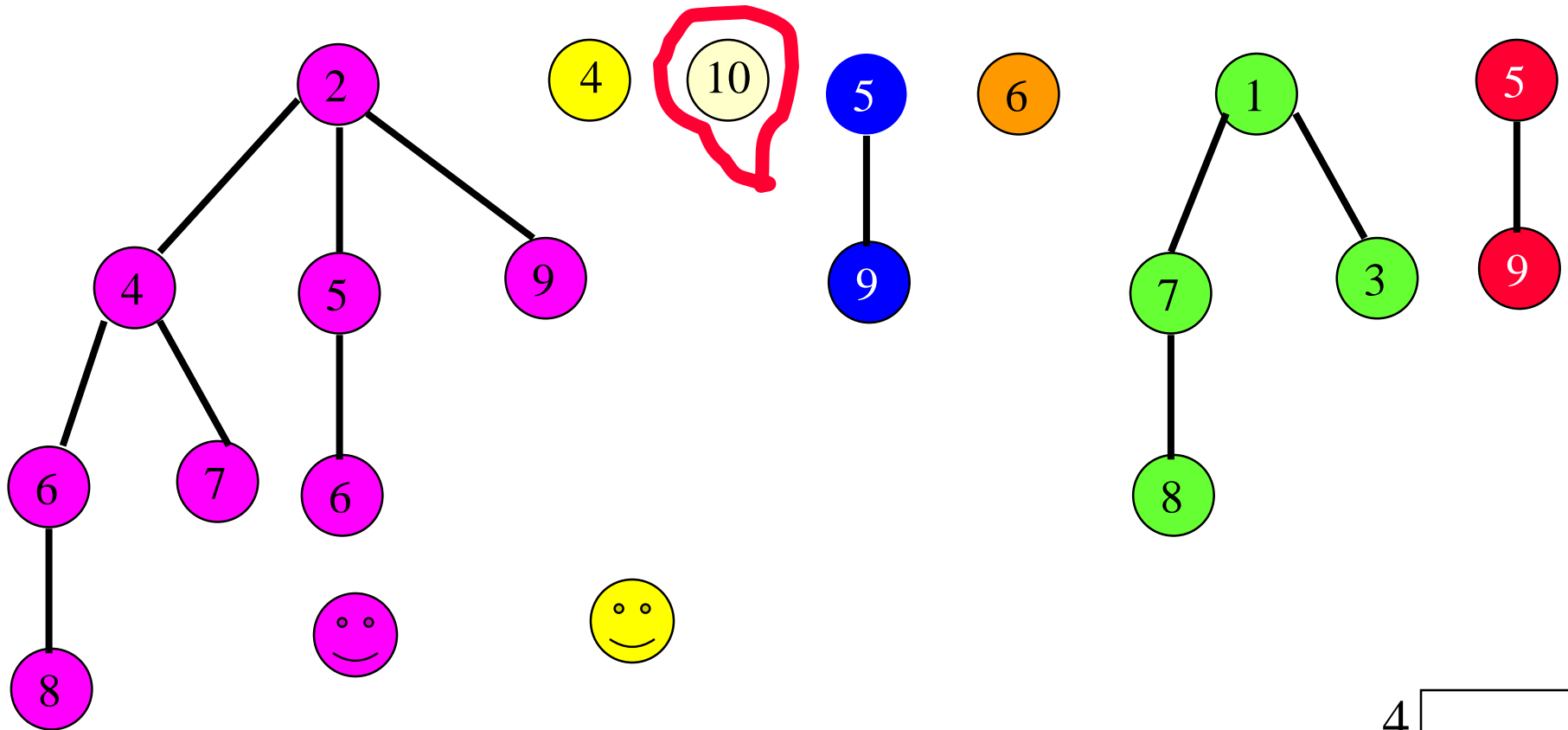
# Pairwise Combine



tree table

4	
3	
2	
1	
0	

# Pairwise Combine



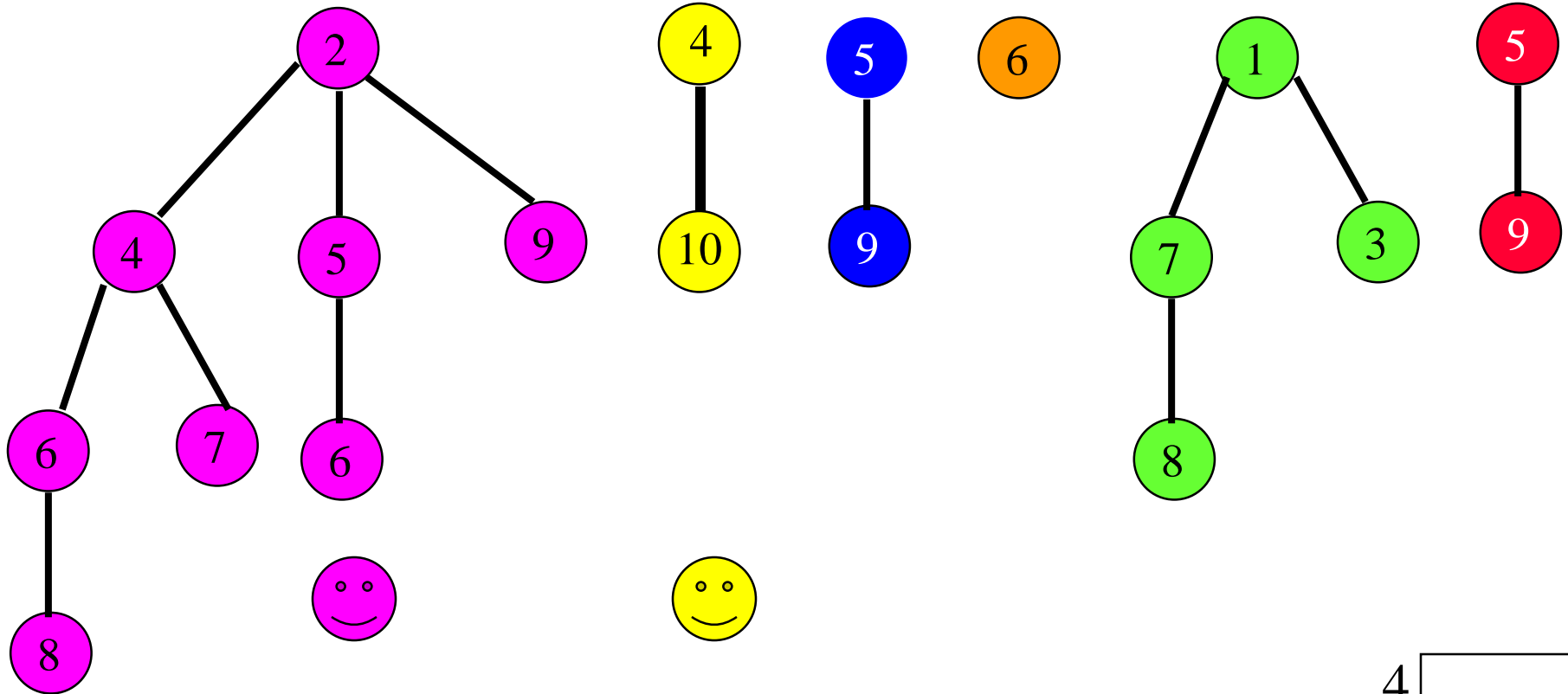
tree table

Combine **2** min trees of degree **0**.

Make the one with larger root a subtree of other.



# Pairwise Combine

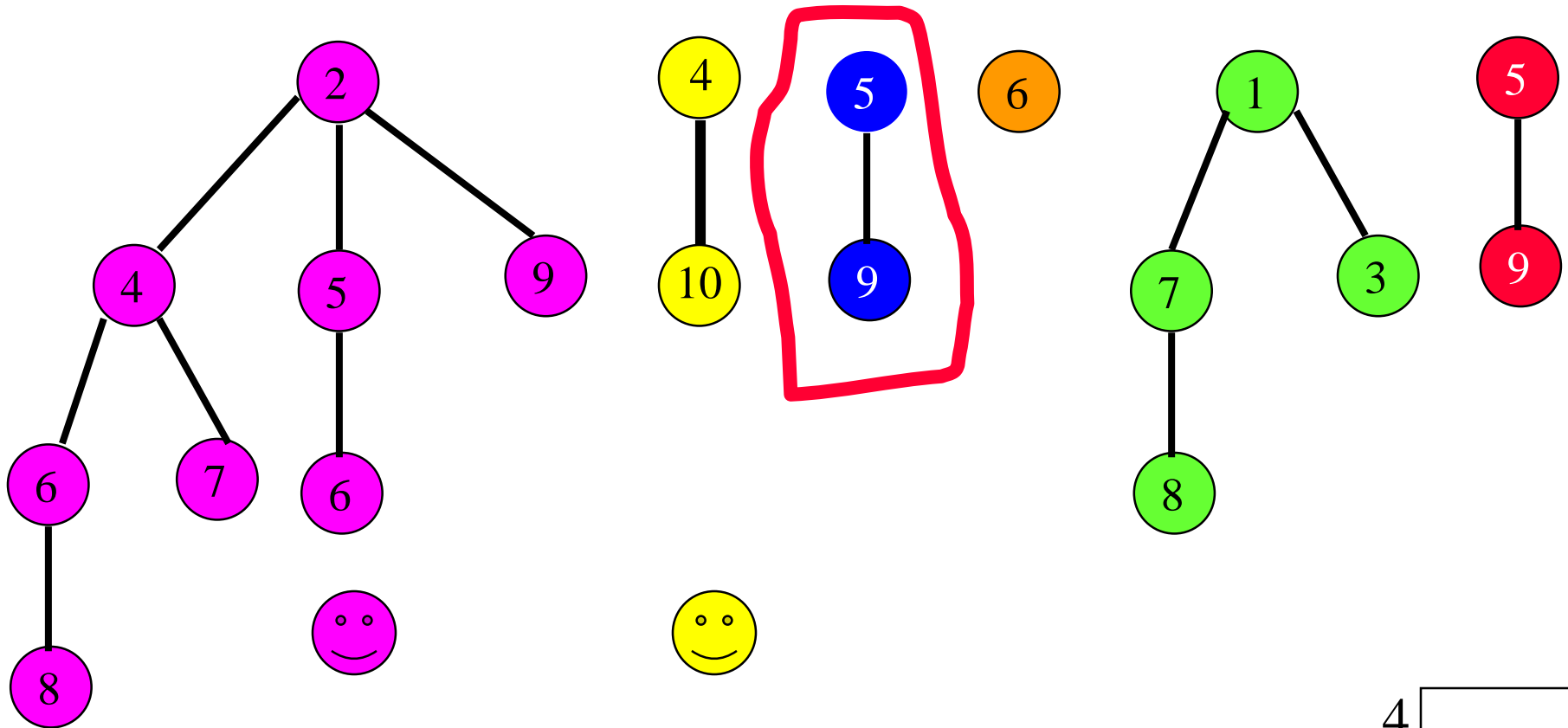


tree table

Update tree table.

4	
3	
2	
1	
0	

# Pairwise Combine

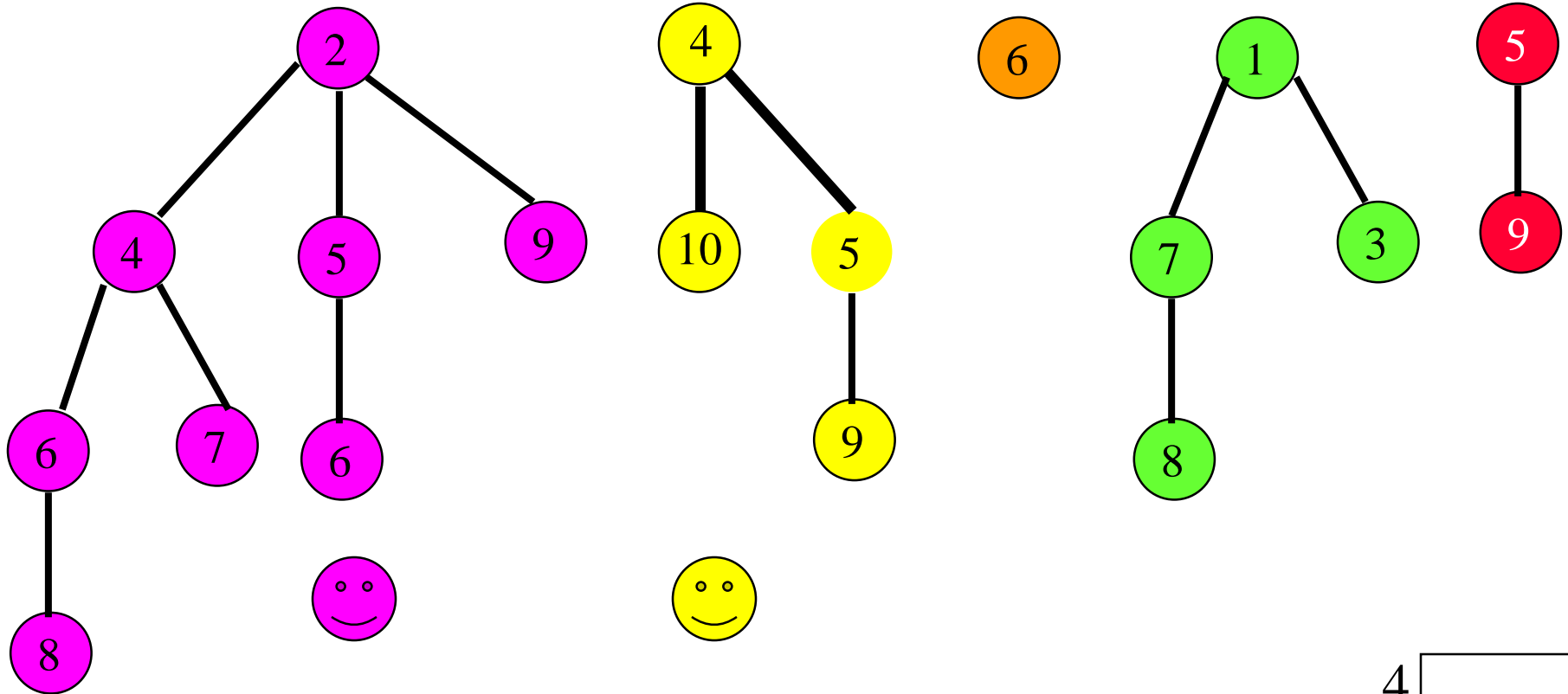


tree table

Combine 2 min trees of degree 1.

Make the one with larger root a subtree of other.

# Pairwise Combine

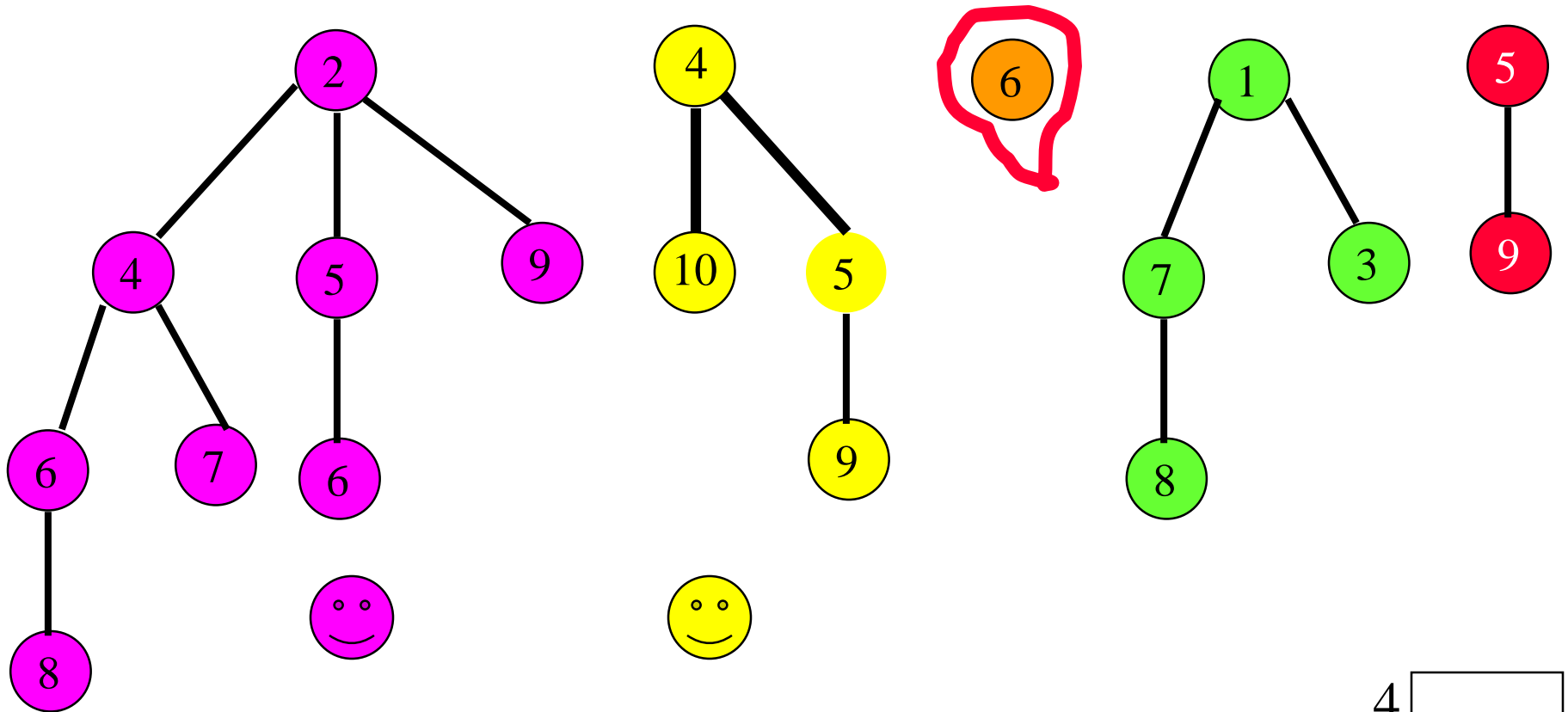


tree table

4	
3	
2	
1	
0	

Update tree table.

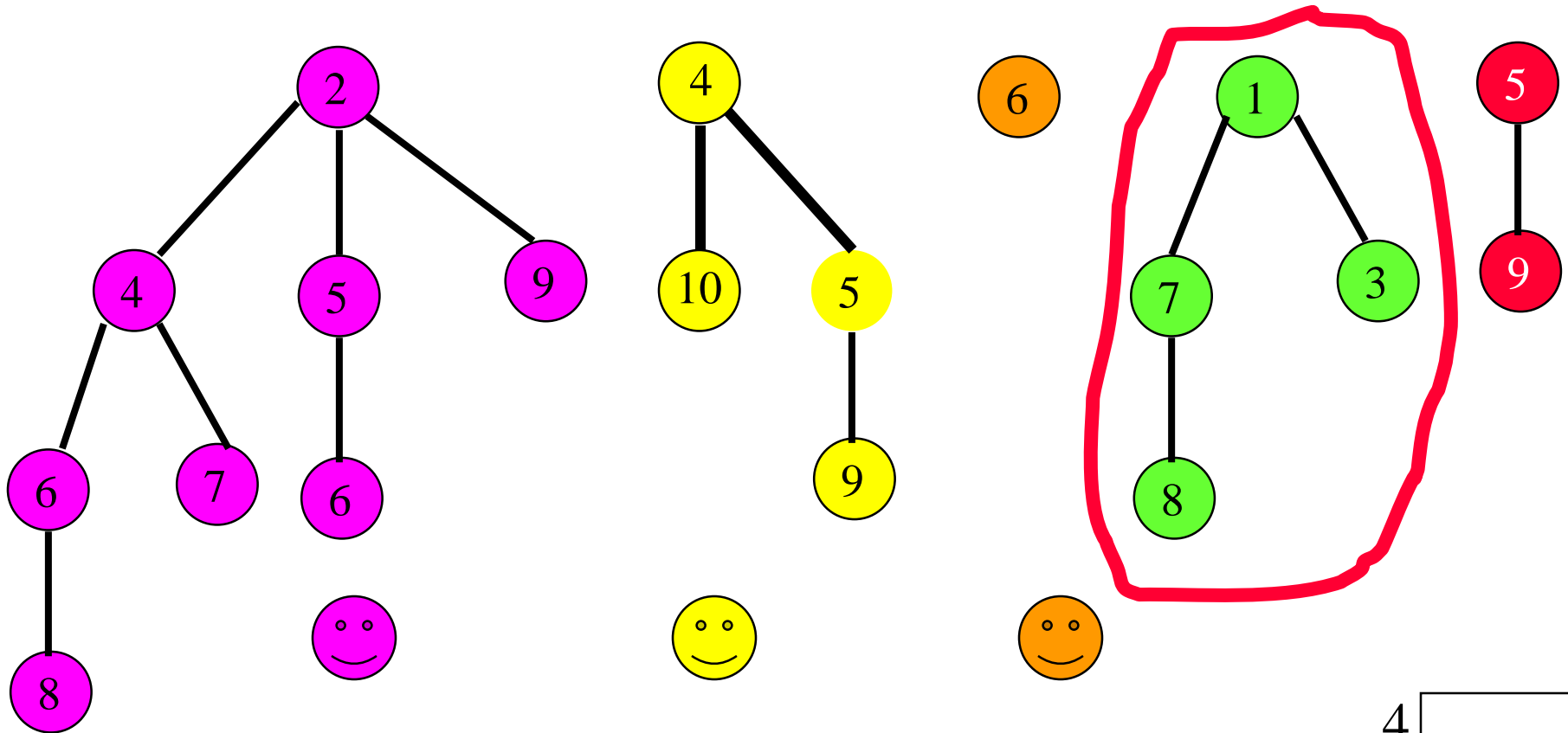
# Pairwise Combine



tree table

4	
3	
2	
1	
0	

# Pairwise Combine



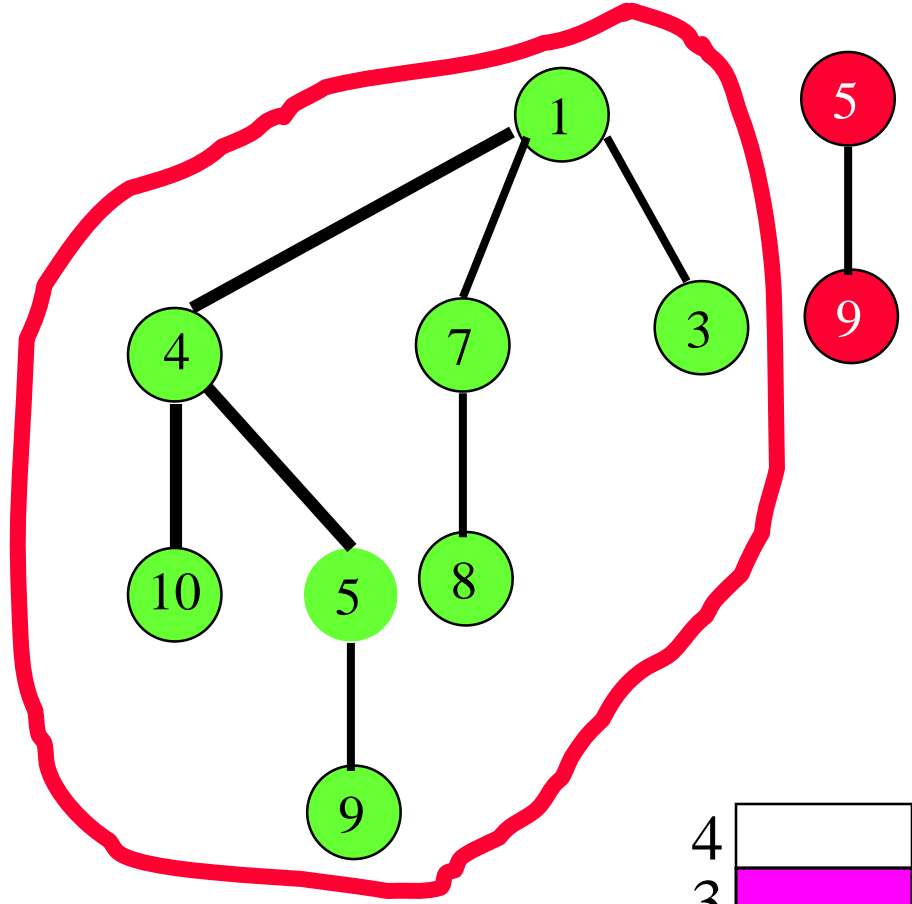
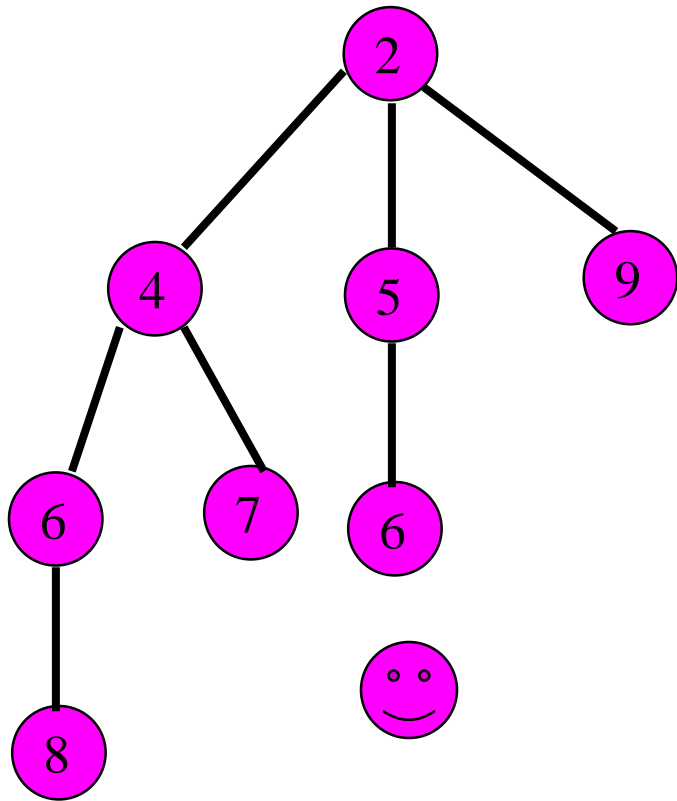
tree table

4	
3	
2	
1	
0	

Combine 2 min trees of degree 2.

Make the one with larger root a subtree of other.

# Pairwise Combine



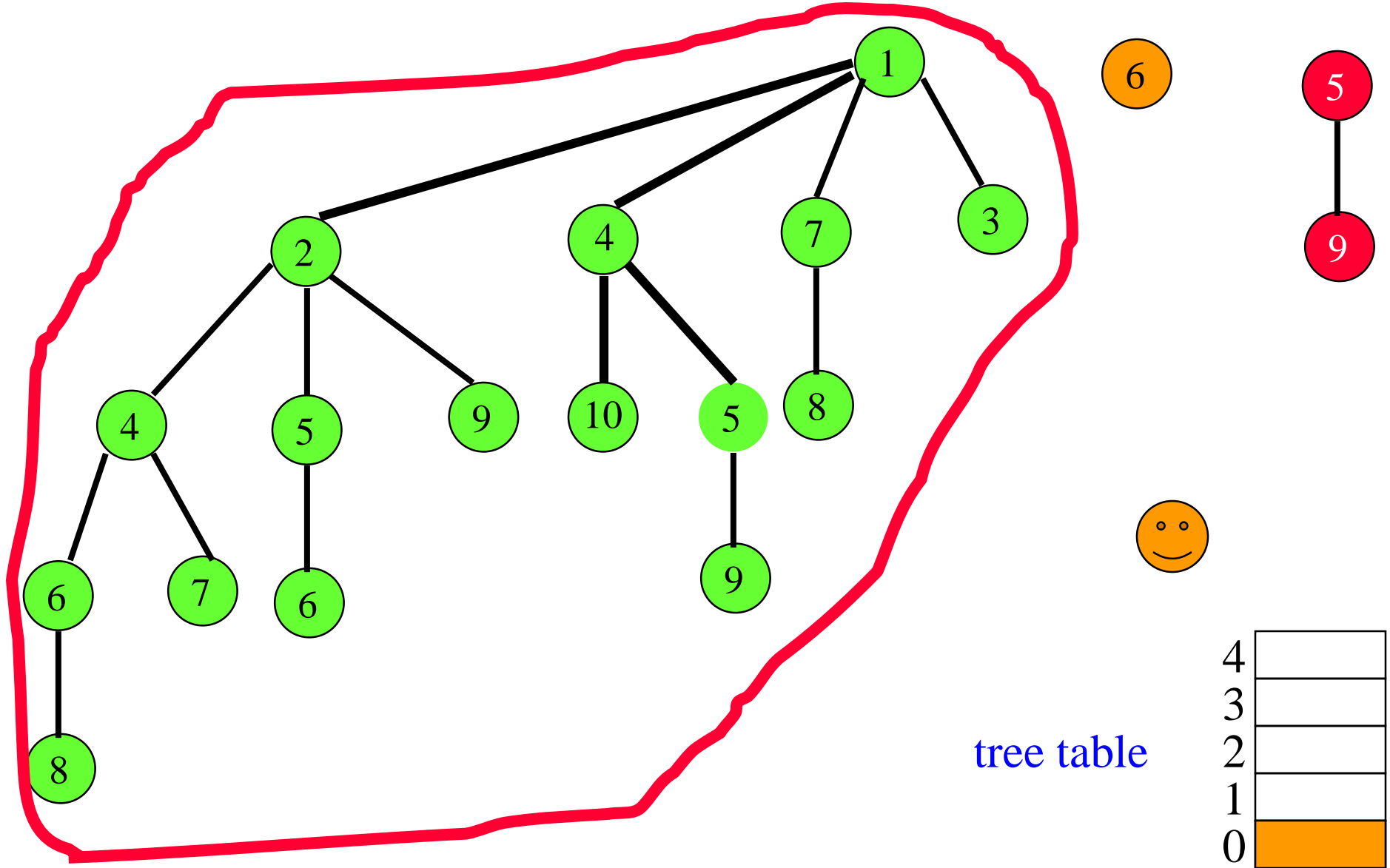
tree table

4	
3	
2	
1	
0	

Combine 2 min trees of degree 3.

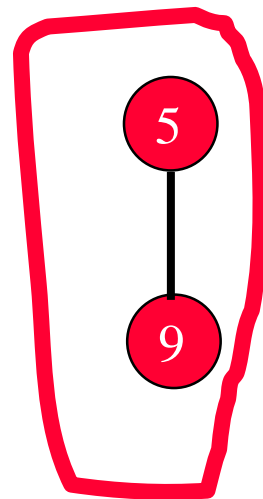
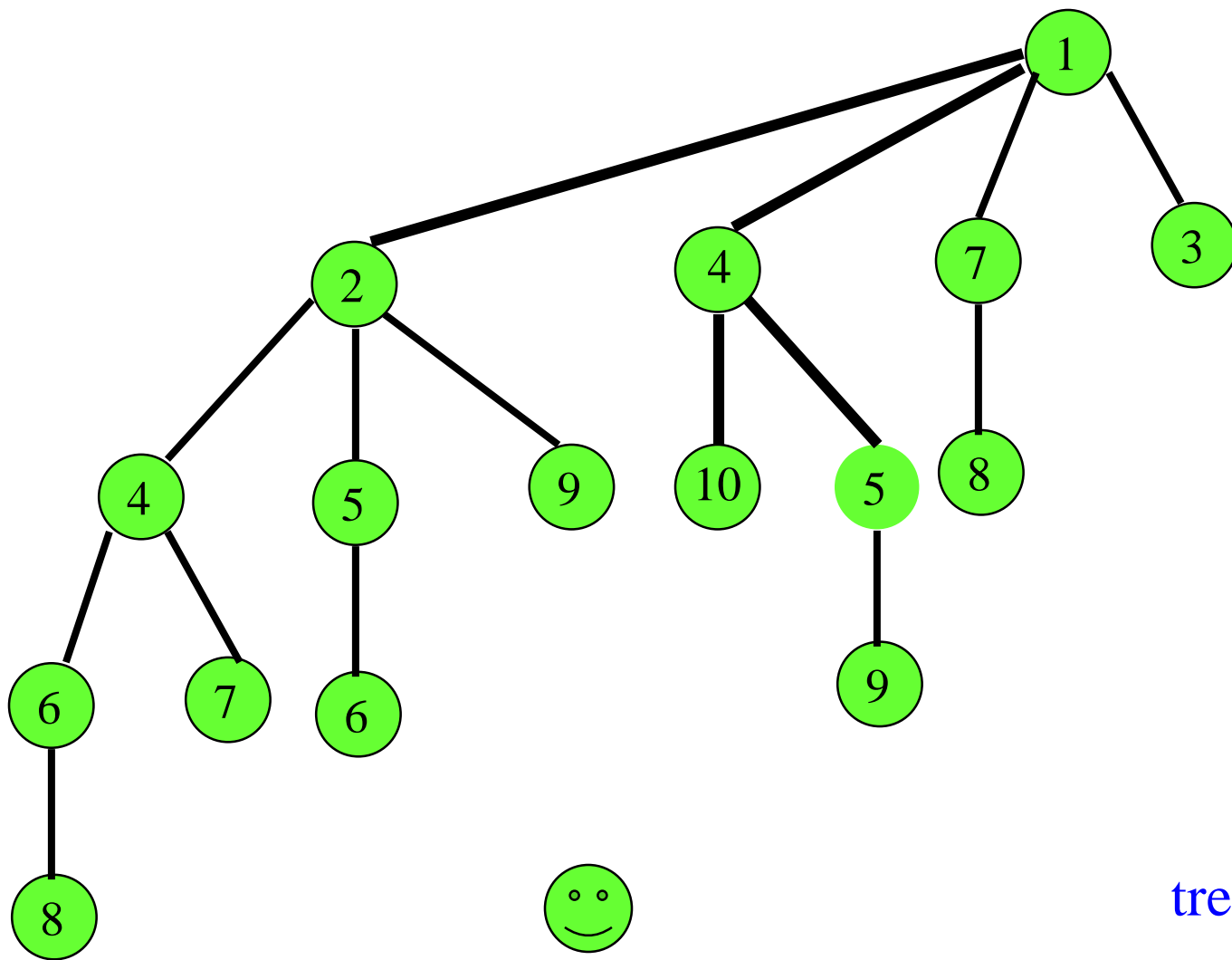
Make the one with larger root a subtree of other.

# Pairwise Combine



Update tree table.

# Pairwise Combine

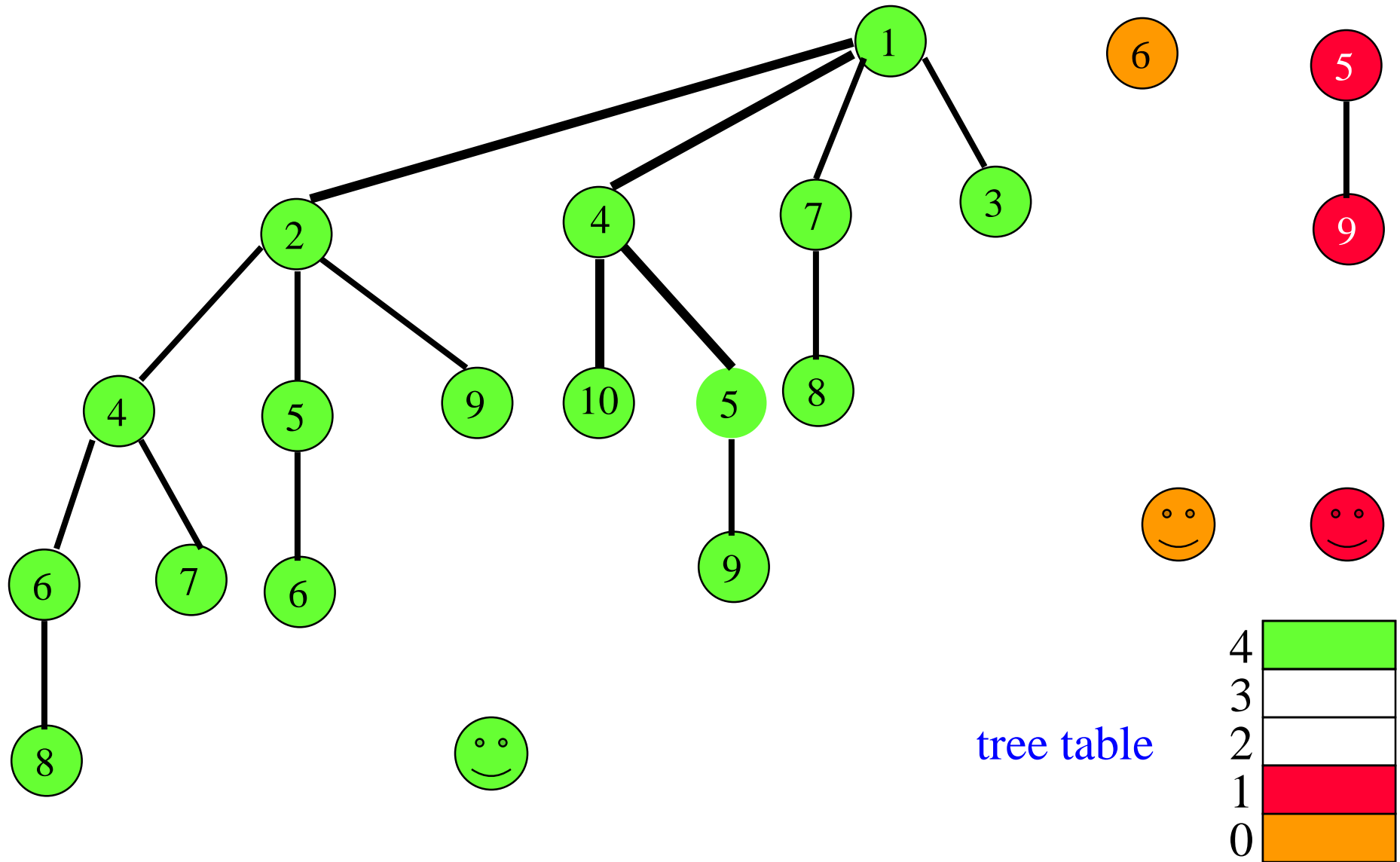


tree table

4	
3	
2	
1	
0	



# Pairwise Combine



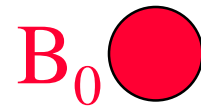
Create circular list of remaining trees.

# Complexity Of Delete Min

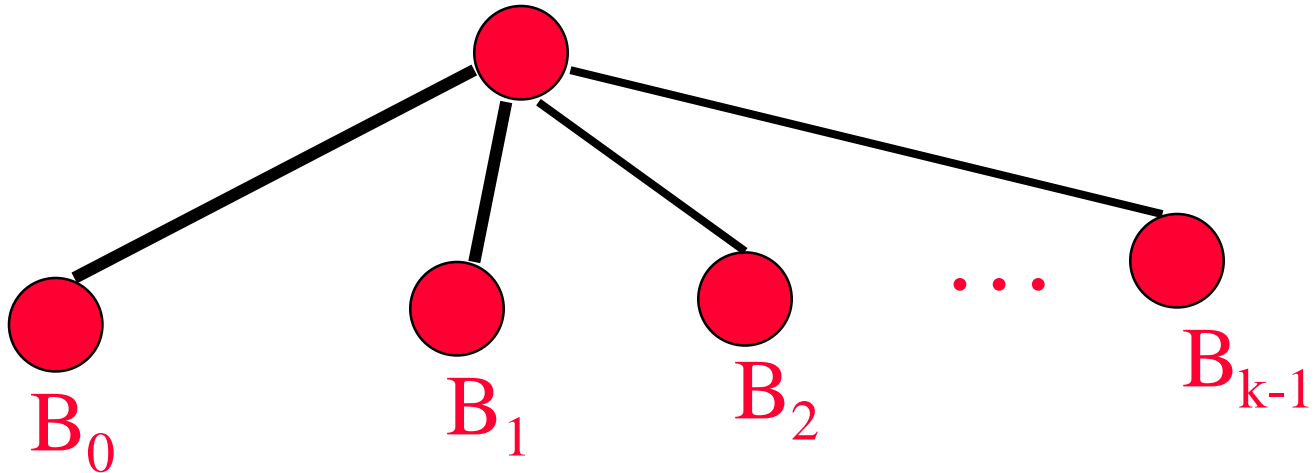
- Create and initialize tree table.
  - $O(\text{MaxDegree})$ .
  - Done once only.
- Examine  $s$  min trees and pairwise combine.
  - $O(s)$ .
- Collect remaining trees from tree table, reset table entries to **null**, and set binomial heap pointer.
  - $O(\text{MaxDegree})$ .
- Overall complexity of remove min.
  - $O(\text{MaxDegree} + s)$ .

# Binomial Trees

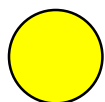
- $B_k$  is degree  $k$  binomial tree.



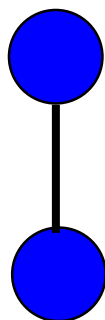
- $B_k$ ,  $k > 0$ , is:



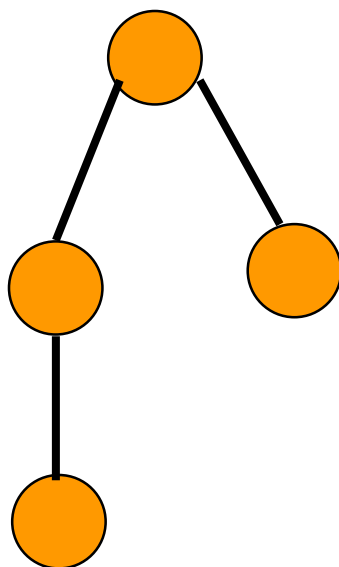
# Examples



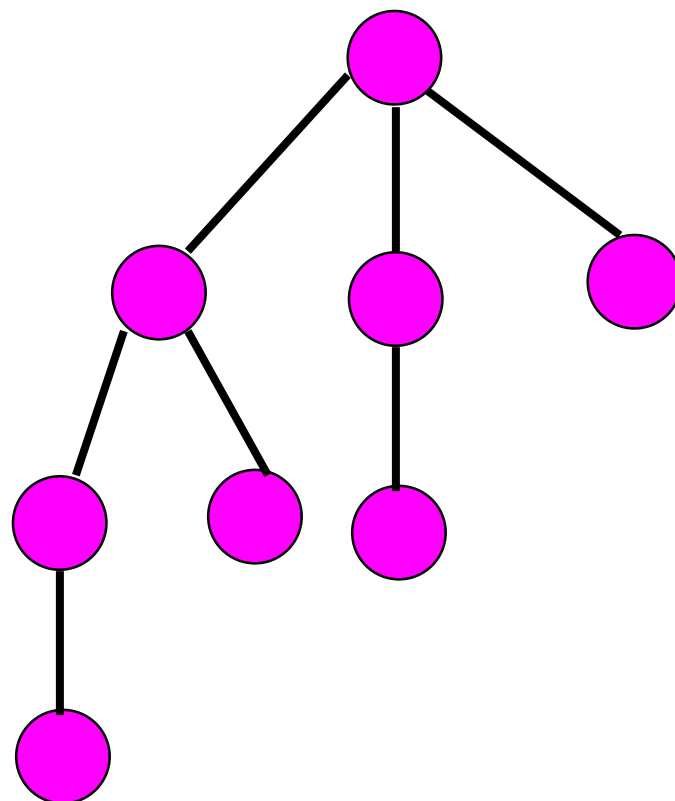
**B<sub>0</sub>**



**B<sub>1</sub>**



**B<sub>2</sub>**



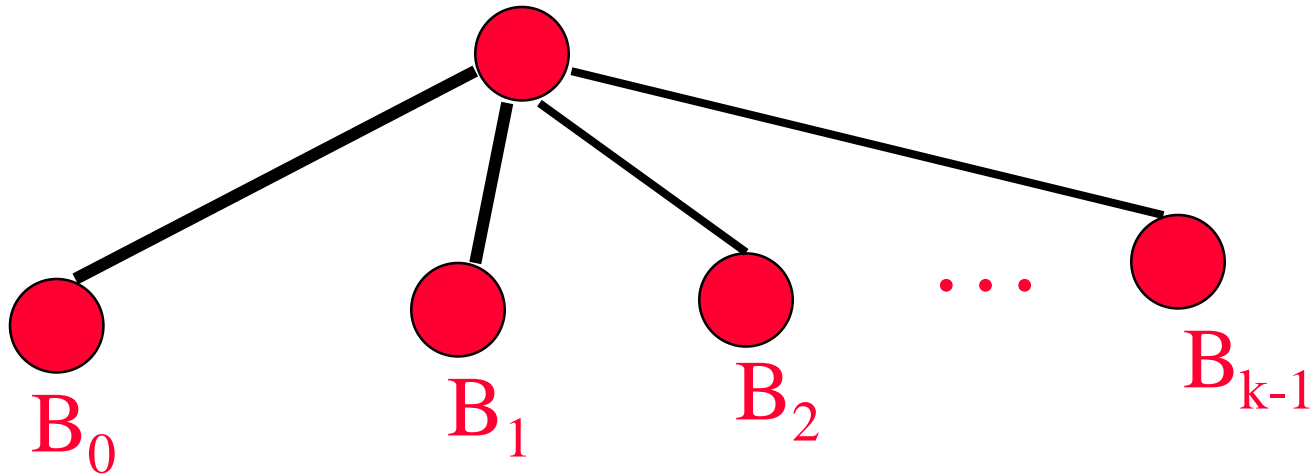
**B<sub>3</sub>**

# Number Of Nodes In $B_k$

- $N_k =$  number of nodes in  $B_k$ .

$$B_0 \quad N_0 = 1$$

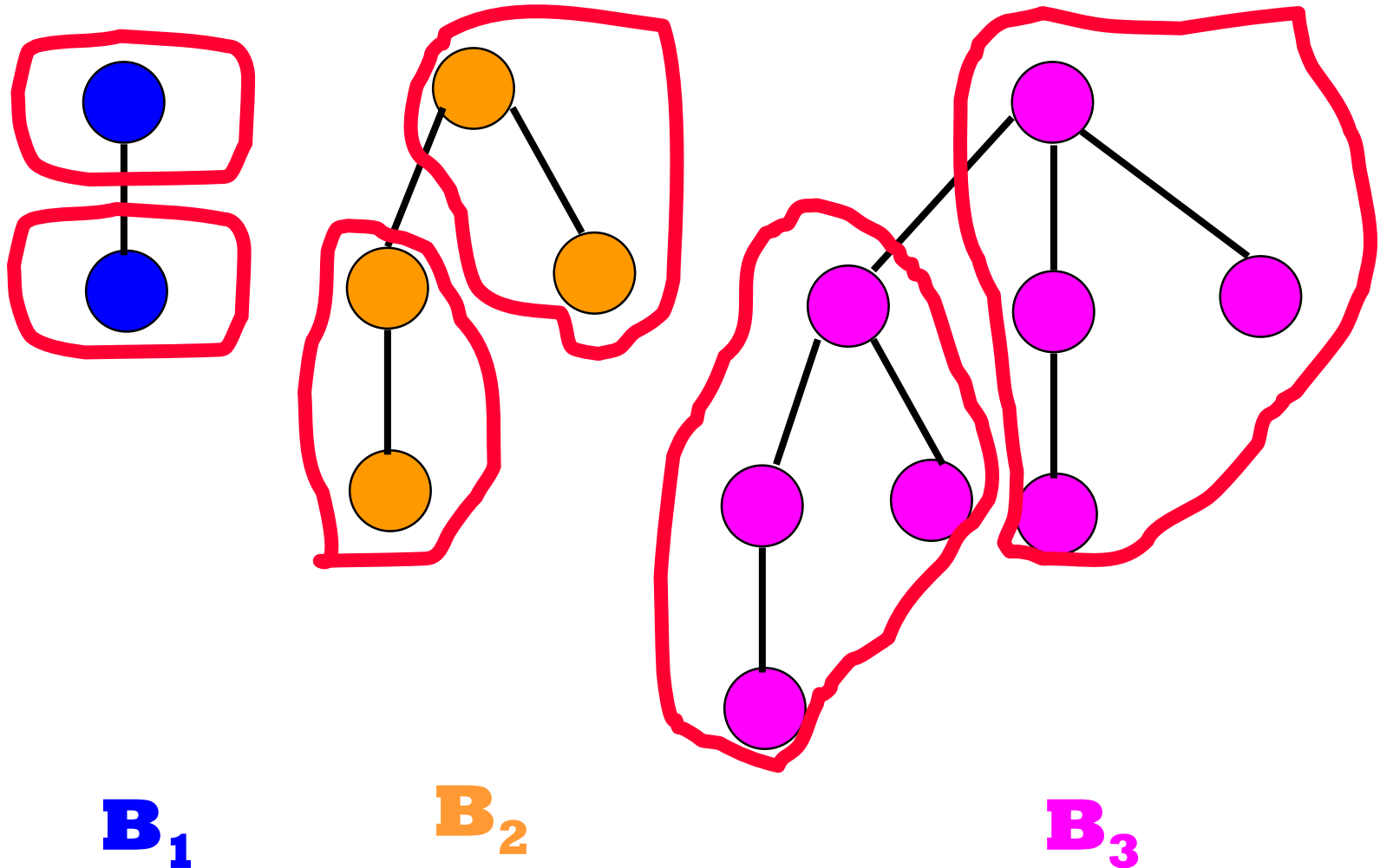
- $B_k, k > 0$ , is:



- $$N_k = N_0 + N_1 + N_2 + \dots + N_{k-1} + 1$$
$$= 2^k.$$

# Equivalent Definition

- $B_k$ ,  $k > 0$ , is two  $B_{k-1}$ s.
- One of these is a subtree of the other.



# $N_k$ And MaxDegree

- $N_0 = 1$
- $N_k = 2N_{k-1}$   
 $= 2^k.$
- If we start with zero elements and perform operations as described, then all trees in all binomial heaps are binomial trees.
- So,  $\text{MaxDegree} = O(\log n).$

# Analysis Of Binomial Heaps

	Leftist trees	Binomial heaps	
		Actual	Amortized
Insert	$O(\log n)$	$O(1)$	$O(1)$
Delete min (or max)	$O(\log n)$	$O(n)$	$O(\log n)$
Meld	$O(\log n)$	$O(1)$	$O(1)$

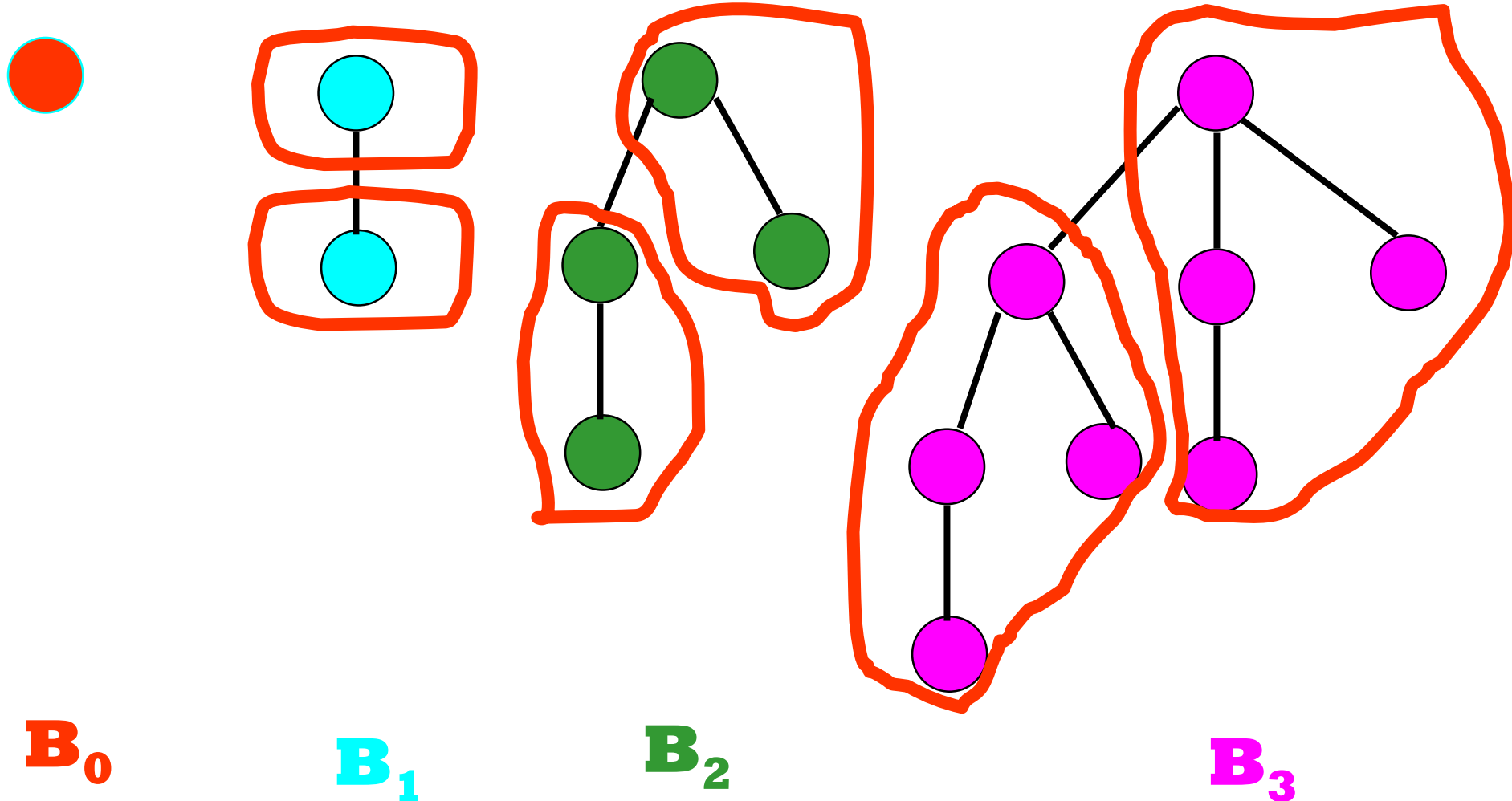


# Operations

- Insert
  - Add a new min tree to top-level circular list.
- Meld
  - Combine two circular lists.
- Delete min
  - Pairwise combine min trees whose roots have equal degree.
  - $O(\text{MaxDegree} + s)$ , where  $s$  is number of min trees following removal of min element but before pairwise combining.

# Binomial Trees

- $B_k$ ,  $k > 0$ , is two  $B_{k-1}$ s.
- One of these is a subtree of the other.



# All Trees In Binomial Heap Are Binomial Trees

- Insert creates a  $B_0$ .
- Meld does not create new trees.
- Pairwise combine takes two trees of equal degree and makes one a subtree of the other.
- Let  $n$  be the number of operations performed.
  - Number of inserts is at most  $n$ .
  - No binomial tree has more than  $n$  elements.
  - $\text{MaxDegree} \leq \log_2 n$ .
  - Complexity of remove min is  $O(\log n + s) = O(n)$ .

# Aggregate Method

- Get a good bound on the cost of every sequence of operations and divide by the number of operations.
- Results in same amortized cost for each operation, regardless of operation type.
- Can't use this method, because we want to show a different amortized cost for remove mins than for inserts and melds.

# Aggregate Method – Alternative

- Get a good bound on the cost of every sequence of delete mins and divide by the number of delete mins.
- Consider the sequence **insert, insert, ..., insert, delete min**.
  - The cost of the delete min is  $O(n)$ , where  $n$  is the number of operations in the sequence.
  - So, amortized cost of a delete min is  $O(n/1) = O(n)$ .

# Accounting Method

- Guess the amortized cost.
  - Insert  $\Rightarrow 2$ .
  - Meld  $\Rightarrow 1$ .
  - Delete min  $\Rightarrow 3\log_2 n$ .
- Show that  $P(i) - P(0) \geq 0$  for all  $i$ .

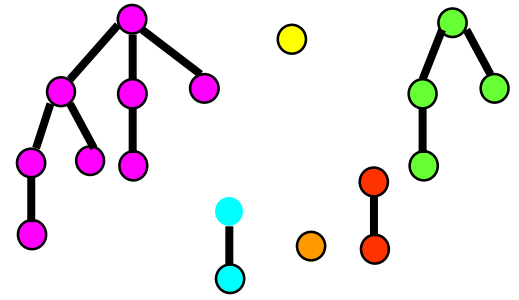
# Potential Function

- $P(i) = \text{amortizedCost}(i) - \text{actualCost}(i) + P(i - 1)$
- $P(i) - P(0)$  is the amount by which the first  $i$  operations have been over charged.
- We shall use a credit scheme to show  $P(i) - P(0) \geq 0$  for all  $i$ .
- $P(i)$  = number of credits after operation  $i$ .
- Initially number of credits is  $0$ .
- $P(0) = 0$ .

- Guessed amortized cost = 2.
- Use 1 unit to pay for the actual cost of the insert.
- Keep the remaining 1 unit as a credit for a future delete min operation.
- Keep this credit with the min tree that is created by the insert operation.
- Potential increases by 1, because there is an overcharge of 1.

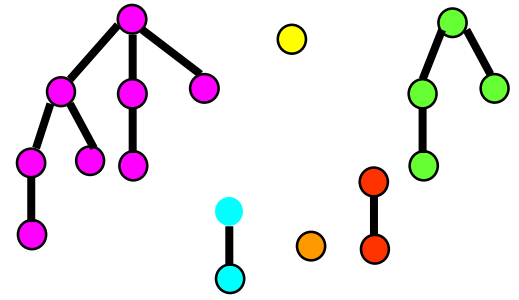


# Meld



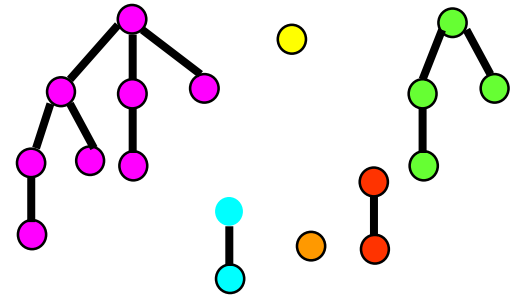
- Guessed amortized cost = 1.
- Use 1 unit to pay for the actual cost of the meld.
- Potential is unchanged, because actual and amortized costs are the same.

# Delete Min



- Let **MinTrees** be the set of min trees in the binomial heap just before delete min.
- Let **u** be the degree of min tree whose root is removed.
- Let **s** be the number of min trees in binomial heap just before pairwise combining.
  - $s = \text{\#MinTrees} + u - 1$
- Actual cost of delete min is  $\leq \text{MaxDegree} + s$   
 $\leq 2\log_2 n - 1 + \text{\#MinTrees}.$

# Delete Min



- Guessed amortized cost =  $3\log_2 n$ .
- Actual cost  $\leq 2\log_2 n - 1 + \text{\#MinTrees}$ .
- Allocation of amortized cost.
  - Use  $2\log_2 n - 1$  to pay part of actual cost.
  - Keep remaining  $\log_2 n + 1$  as a credit to pay part of the actual cost of a future delete min operation.
  - Put 1 unit of credit on each of the at most  $\log_2 n + 1$  min trees left behind by the delete min operation.
  - Discard the remaining credits (if any).

# Paying Actual Cost Of A Delete Min

- Actual cost  $\leq 2\log_2 n - 1 + \text{\#MinTrees}$
- How is it paid for?
  - $2\log_2 n - 1$  comes from amortized cost of this delete min operation.
  - $\text{\#MinTrees}$  comes from the min trees themselves, at the rate of 1 unit per min tree.
  - Potential remains nonnegative, because there are enough credits to pay the balance of the actual cost.

# Potential Method

- Guess a suitable potential function for which  $P(i) - P(0) \geq 0$  for all  $i$ .
- Derive amortized cost of  $i$ th operation using
$$\Delta P = P(i) - P(i - 1)$$
$$= \text{amortized cost} - \text{actual cost}$$
- $\text{amortized cost} = \text{actual cost} + \Delta P$

# Potential Function

- $P(i) = \sum \# \text{MinTrees}(j)$ 
  - $\# \text{MinTrees}(j)$  is  $\# \text{MinTrees}$  for binomial heap  $j$ .
  - When binomial heaps  $A$  and  $B$  are melded,  $A$  and  $B$  are no longer included in the sum.
- $P(0) = 0$
- $P(i) \geq 0$  for all  $i$ .
- $i$ th operation is an insert.
  - Actual cost of insert = 1
  - $\Delta P = P(i) - P(i - 1) = 1$
  - Amortized cost of insert = actual cost +  $\Delta P$   
 $= 2$

# $i$ th Operation Is A Meld

- Actual cost of meld = 1
- $P(i) = \sum \# \text{MinTrees}(j)$
- $\Delta P = P(i) - P(i - 1) = 0$
- Amortized cost of meld = actual cost +  $\Delta P$   
= 1

# **i**th Operation Is A Delete Min

- **old**  $\Rightarrow$  value just before the delete min
- **new**  $\Rightarrow$  value just after the delete min.
- $\#MinTrees^{old}(j)$   $\Rightarrow$  value of **#MinTrees** in **j**th binomial heap just before this delete min.
- Assume delete min is done in **k**th binomial heap.



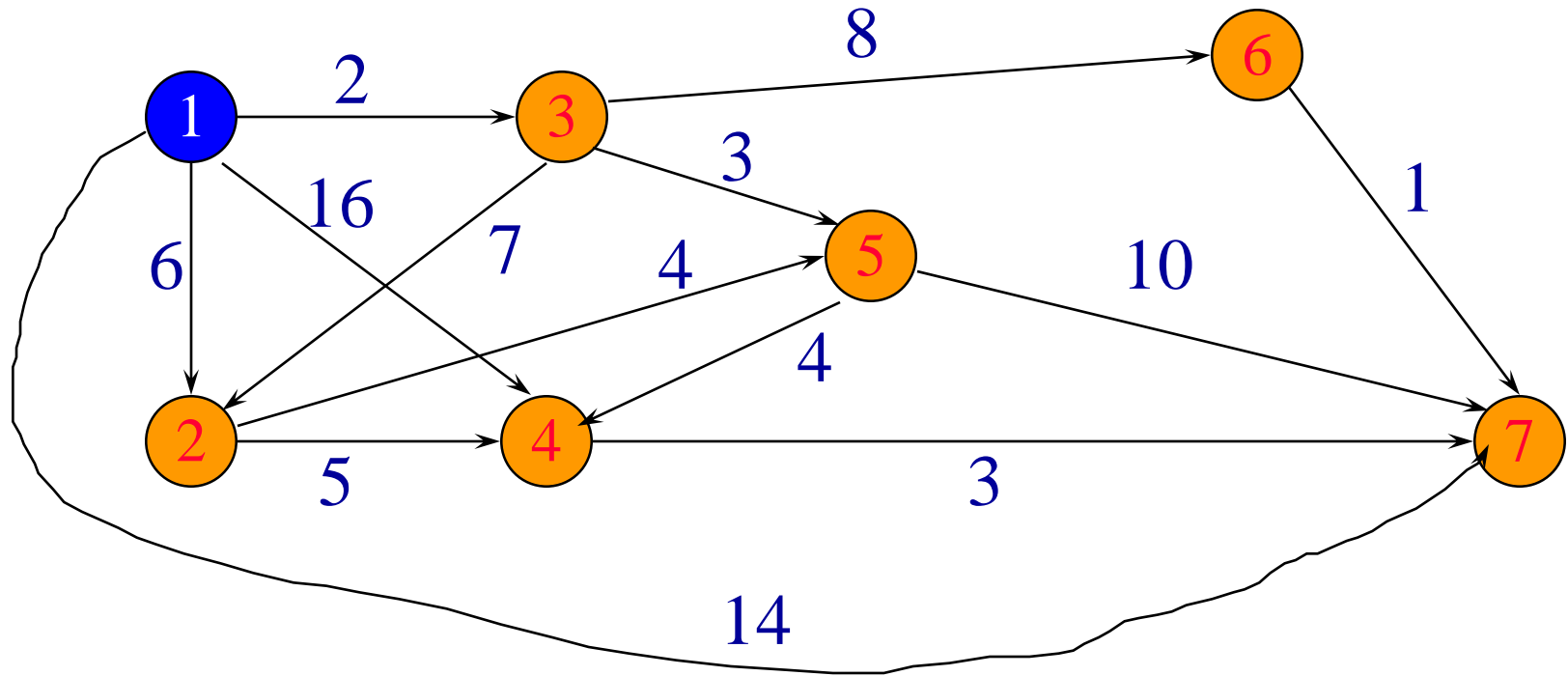
# ith Operation Is A Delete Min

- Actual cost of delete min from binomial heap **k**  
 $\leq 2\log_2 n - 1 + \#MinTrees^{old}(k)$
- $\Delta P = P(i) - P(i - 1)$   
 $= \sum [\#MinTrees^{new}(j) - \#MinTrees^{old}(j)]$   
 $= \#MinTrees^{new}(k) - \#MinTrees^{old}(k).$
- Amortized cost of delete min = actual cost +  $\Delta P$   
 $\leq 2\log_2 n - 1 + \#MinTrees^{new}(k)$   
 $\leq 3\log_2 n.$

# Fibonacci Heaps, referenced

	Actual	Amortized
Insert	$O(1)$	$O(1)$
Delete min (or max)	$O(n)$	$O(\log n)$
Meld	$O(1)$	$O(1)$
Delete	$O(n)$	$O(\log n)$
Decrease key (or increase)	$O(n)$	$O(1)$

# Single Source All Destinations Shortest Paths



# Greedy Single Source All Destinations

- Known as Dijkstra's algorithm.
- Let  $d(i)$  be the length of a shortest one edge extension of an already generated shortest path, the one edge extension ends at vertex  $i$ .
- The next shortest path is to an as yet unreachable vertex for which the  $d()$  value is least.
- After the next shortest path is generated, some  $d()$  values are updated (decreased).

# Operations On $d()$

- Remove min.
  - Done  $O(n)$  times, where  $n$  is the number of vertices in the graph.
- Decrease  $d()$ .
  - Done  $O(e)$  times, where  $e$  is the number of edges in the graph.
- Array.
  - $O(n^2)$  overall complexity.
- Min heap.
  - $O(n \log n + e \log n)$  overall complexity.
- Fibonacci heap.
  - $O(n \log n + e)$  overall complexity.

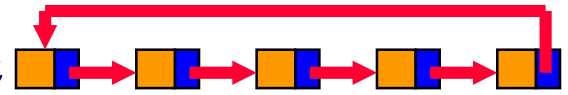
# Prim's Min-Cost Spanning Tree Algorithm

- Array.
  - $O(n^2)$  overall complexity.
- Min heap.
  - $O(n \log n + e \log n)$  overall complexity.
- Fibonacci heap.
  - $O(n \log n + e)$  overall complexity.

# Min Fibonacci Heap

- Collection of min trees.
- The min trees need not be Binomial trees.

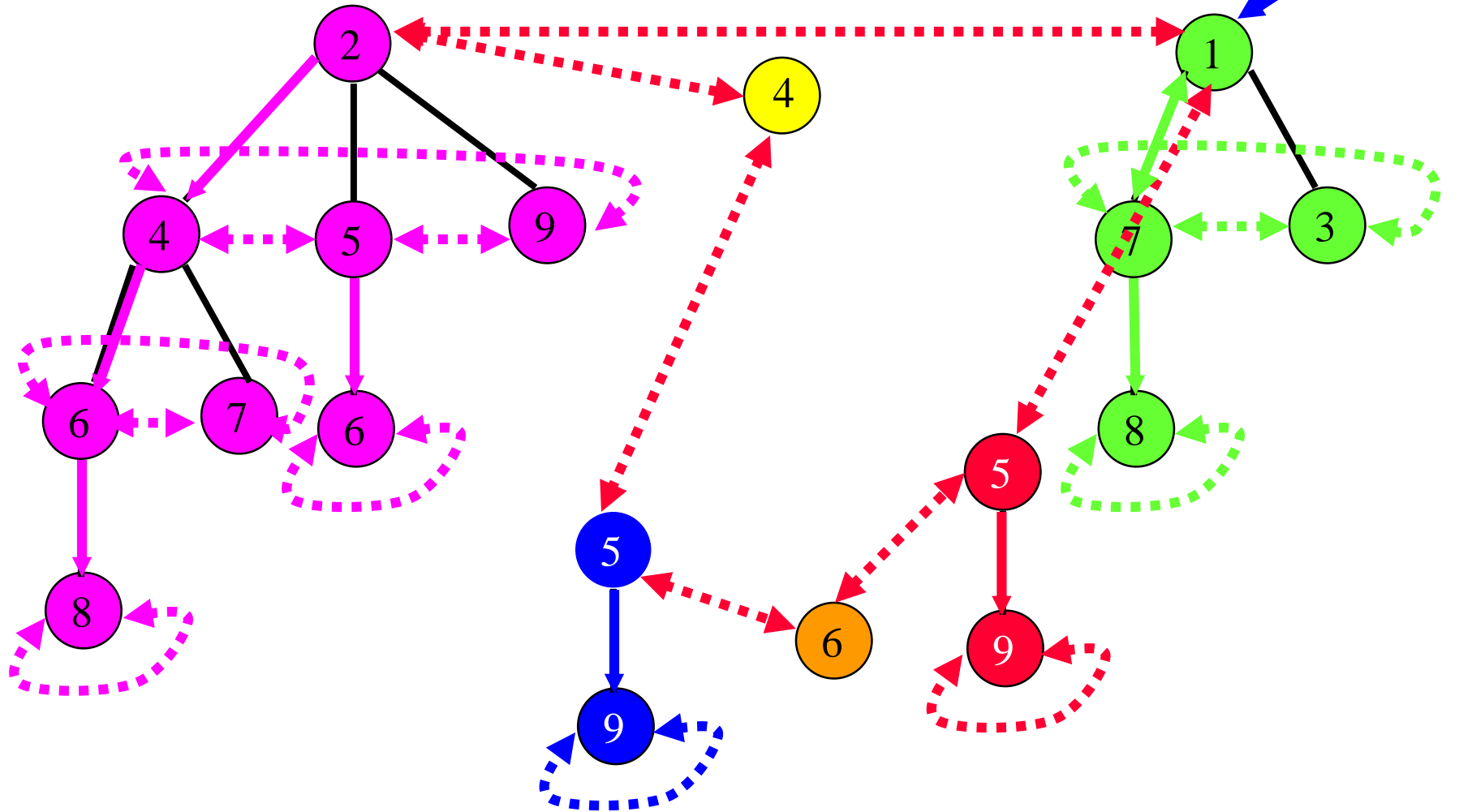
# Node Structure



- Degree, Child, Data
- Left and Right Sibling
  - Used for circular **doubly** linked list of siblings.
- Parent
  - Pointer to parent node.
- ChildCut
  - True if node has lost a child since it became a child of its current parent.
  - Set to false by remove min, which is the only operation that makes one node a child of another.
  - Undefined for a root node.



# Fibonacci Heap Representation

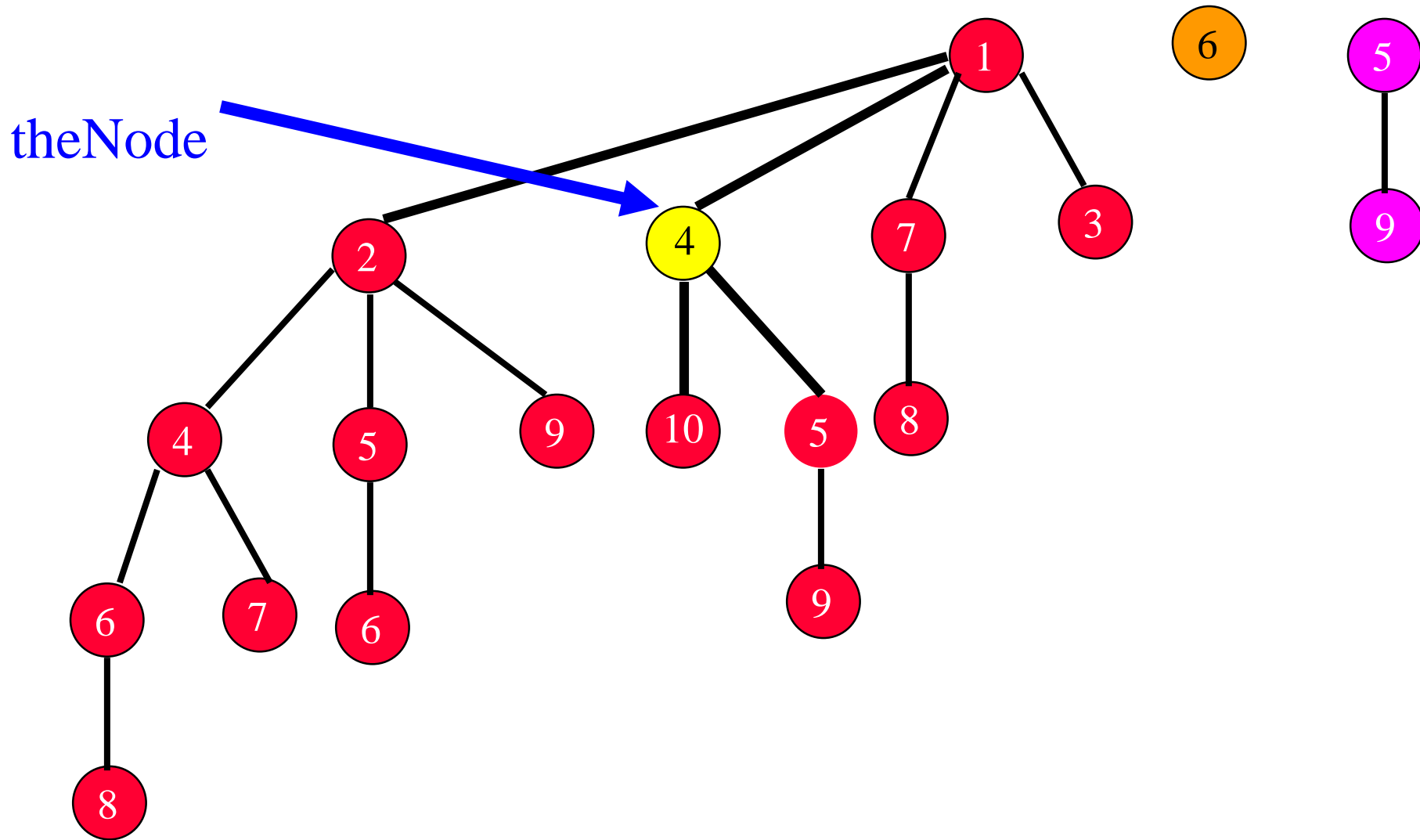


- Parent and ChildCut fields not shown.

# Delete(theNode)

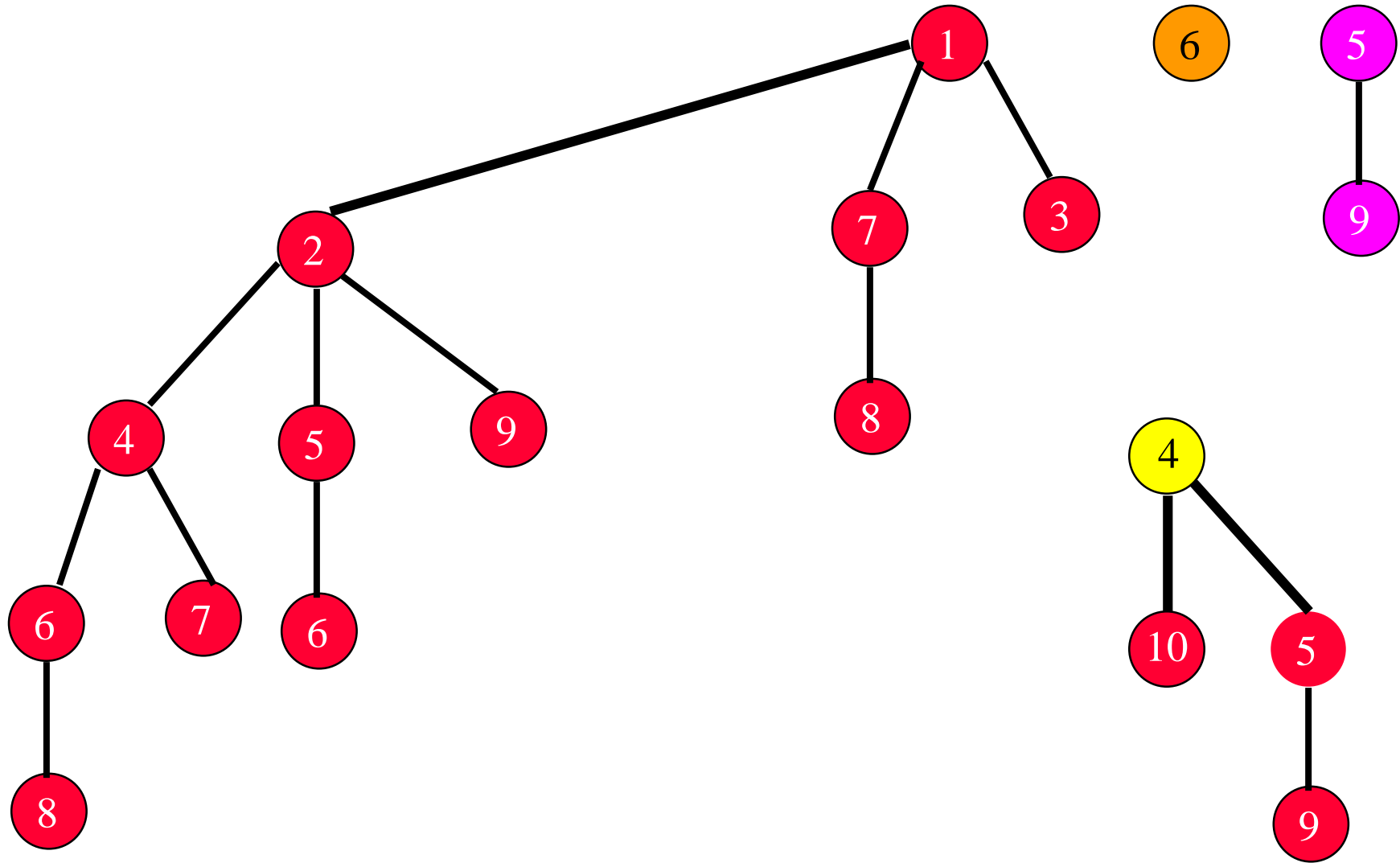
- **theNode** points to the Fibonacci heap node that contains the element that is to be deleted.
- **theNode** points to min element  $\Rightarrow$  do a delete min.
  - In this case, complexity is the same as that for delete min.

# Delete(theNode)



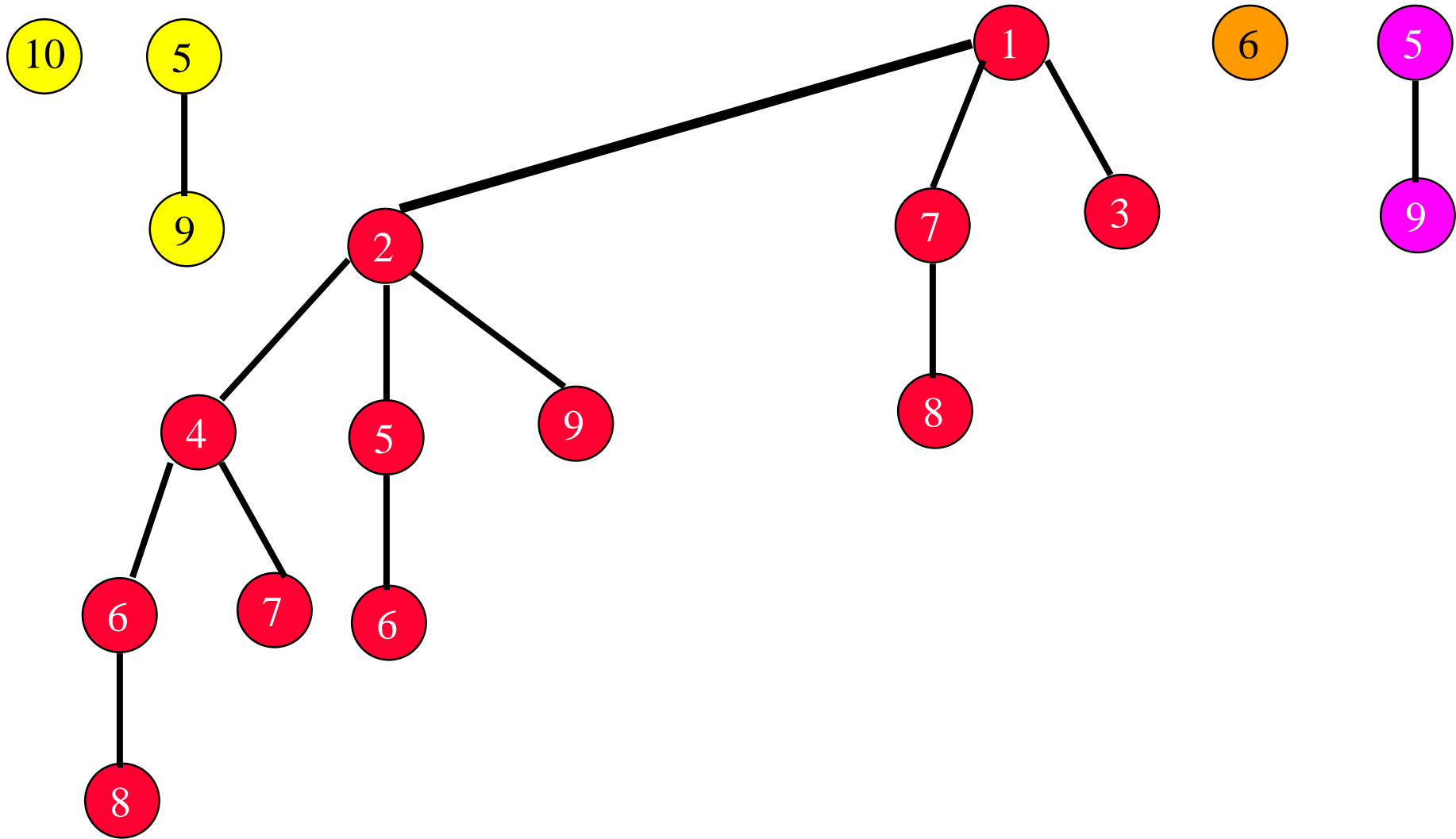
Remove **theNode** from its doubly linked sibling list.

# Delete(theNode)

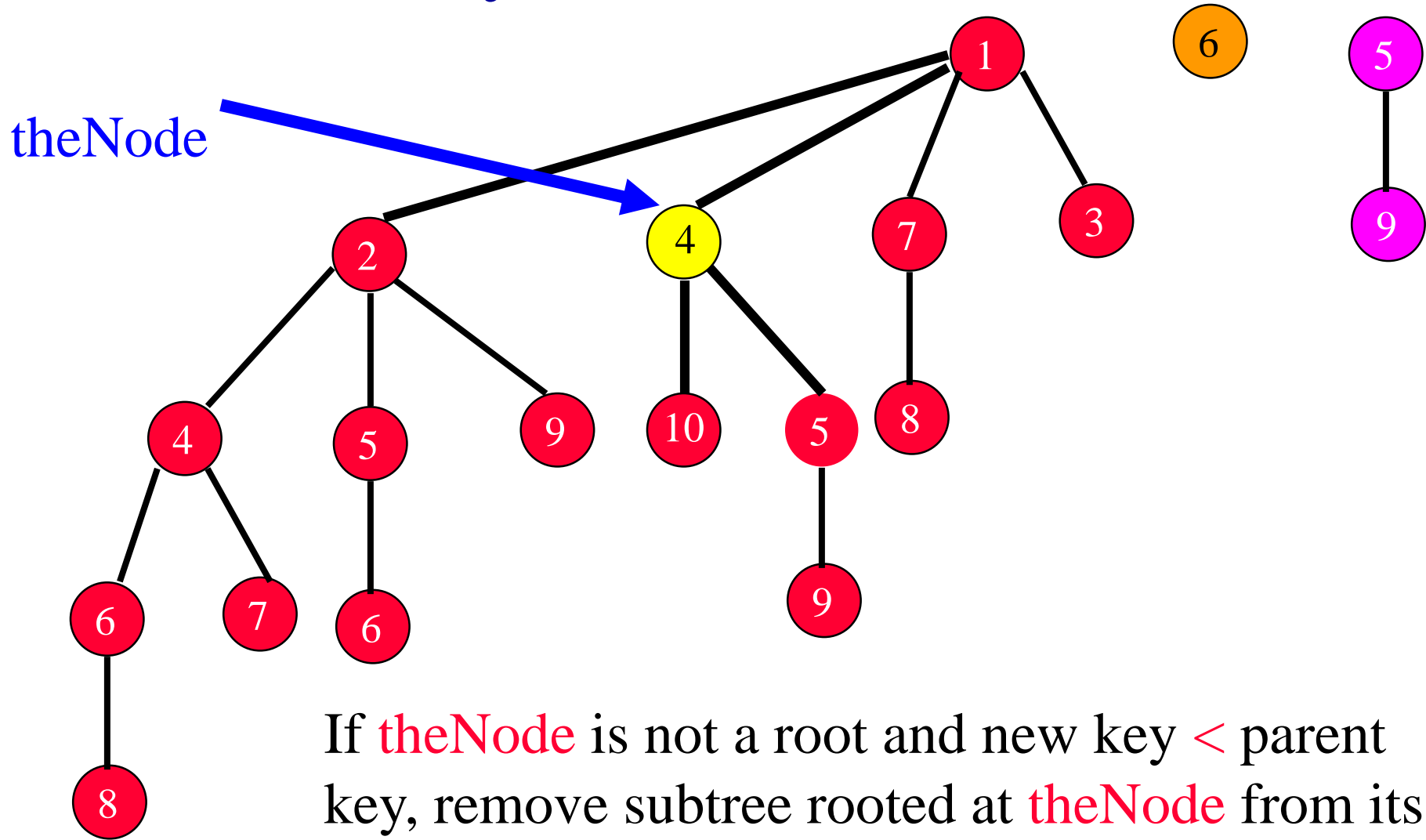


Combine top-level list and children of **theNode**.

# Delete(theNode)

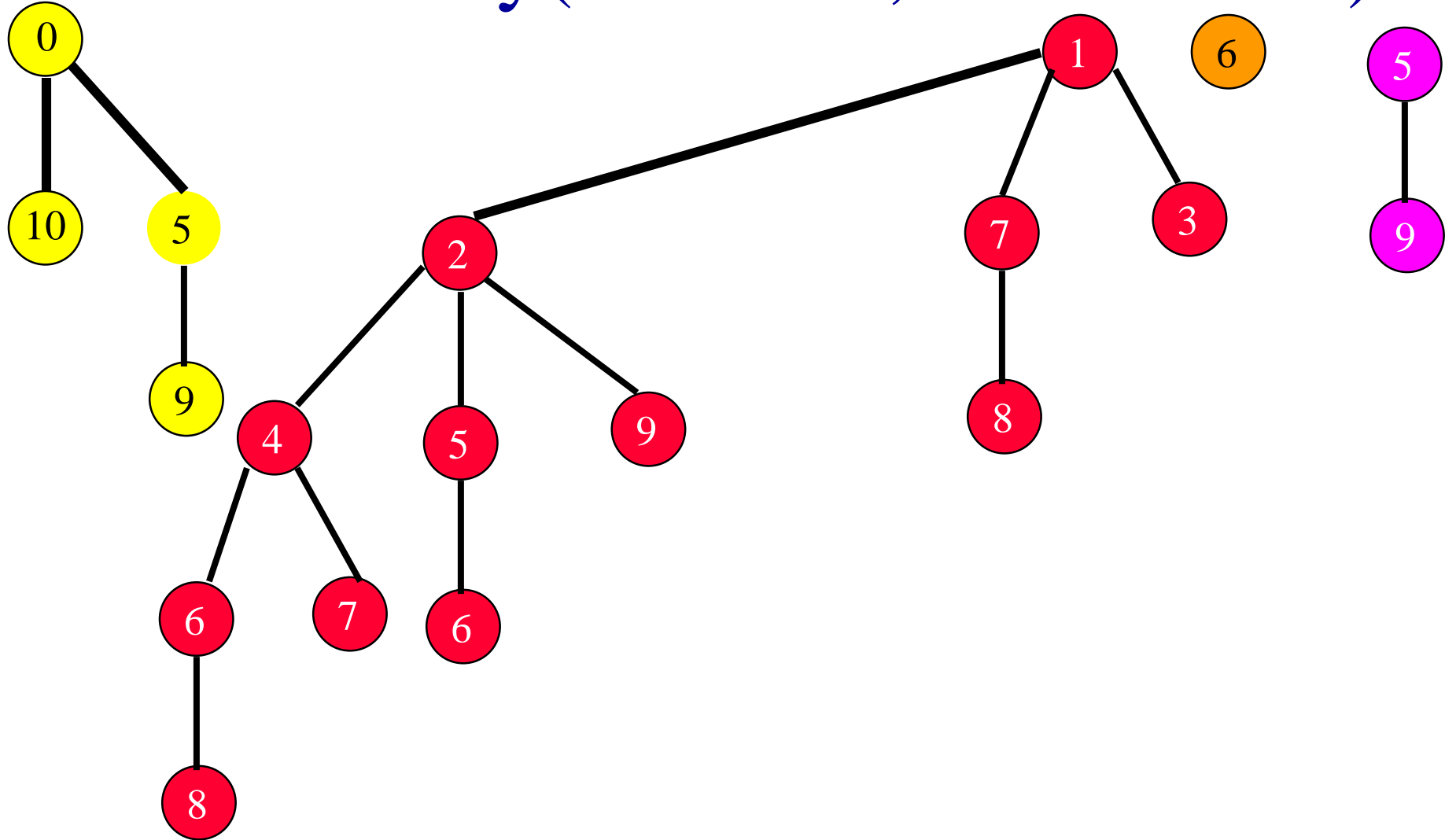


# DecreaseKey(theNode, theAmount)



Insert into top-level list.

# DecreaseKey(theNode, theAmount)

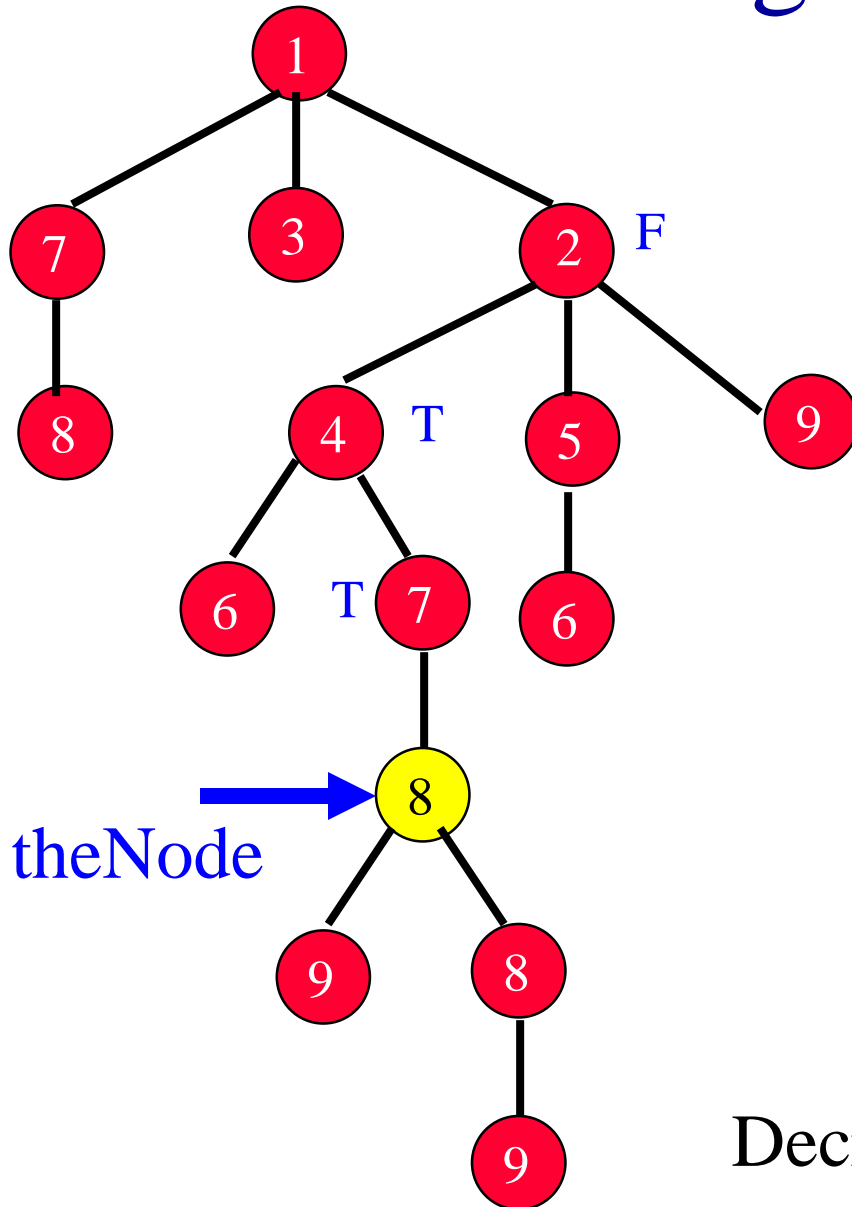


# Cascading Cut

- When **theNode** is cut out of its sibling list in a remove or decrease key operation, follow path from parent of **theNode** to the root.
- Encountered nodes (other than root) with **ChildCut = true** are cut from their sibling lists and inserted into top-level list.
- Stop at first node with **ChildCut = false**.
- For this node, set **ChildCut = true**.

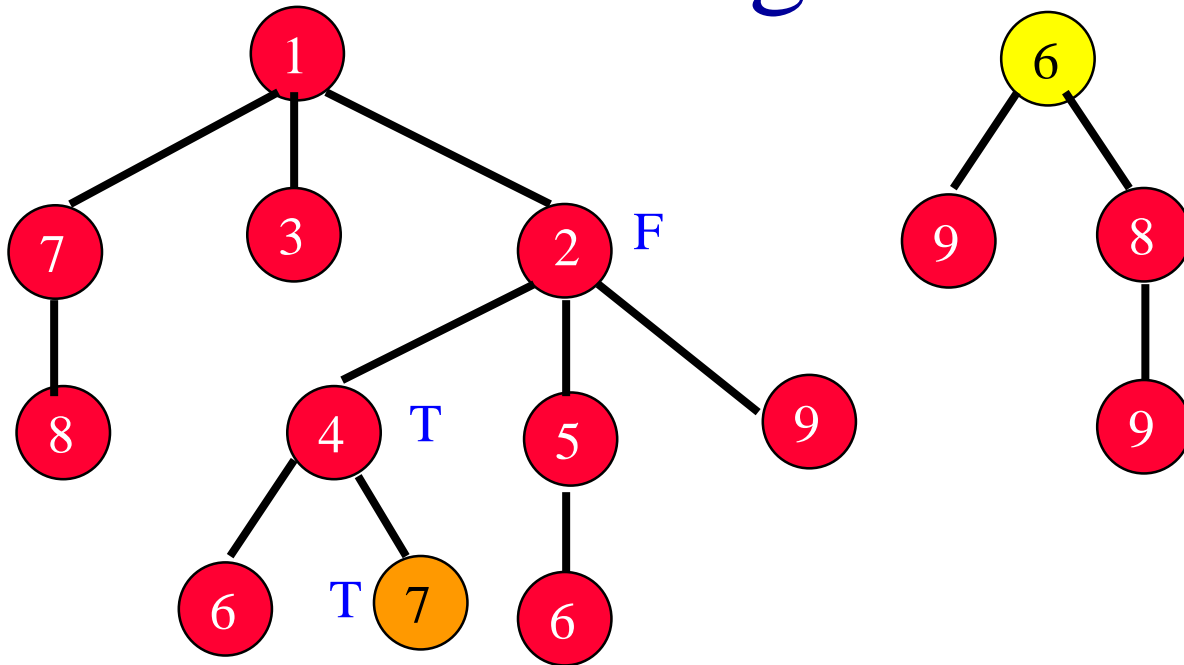


# Cascading Cut Example

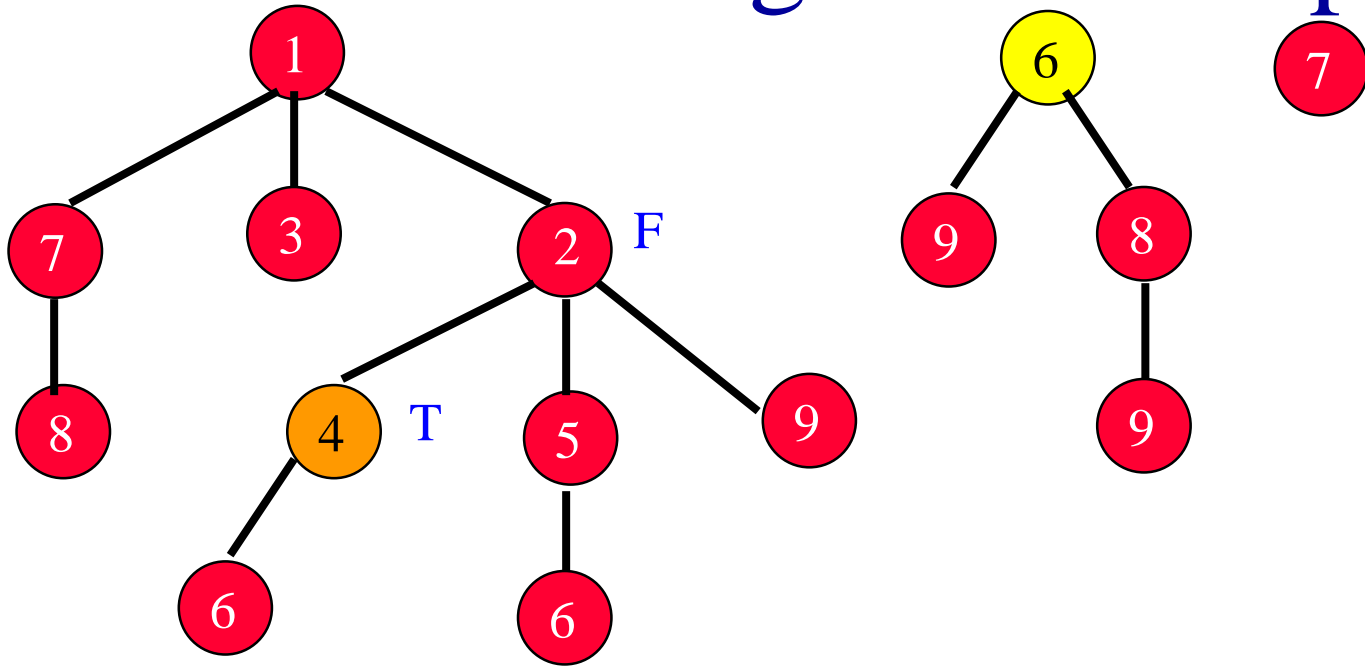


Decrease key by 2.

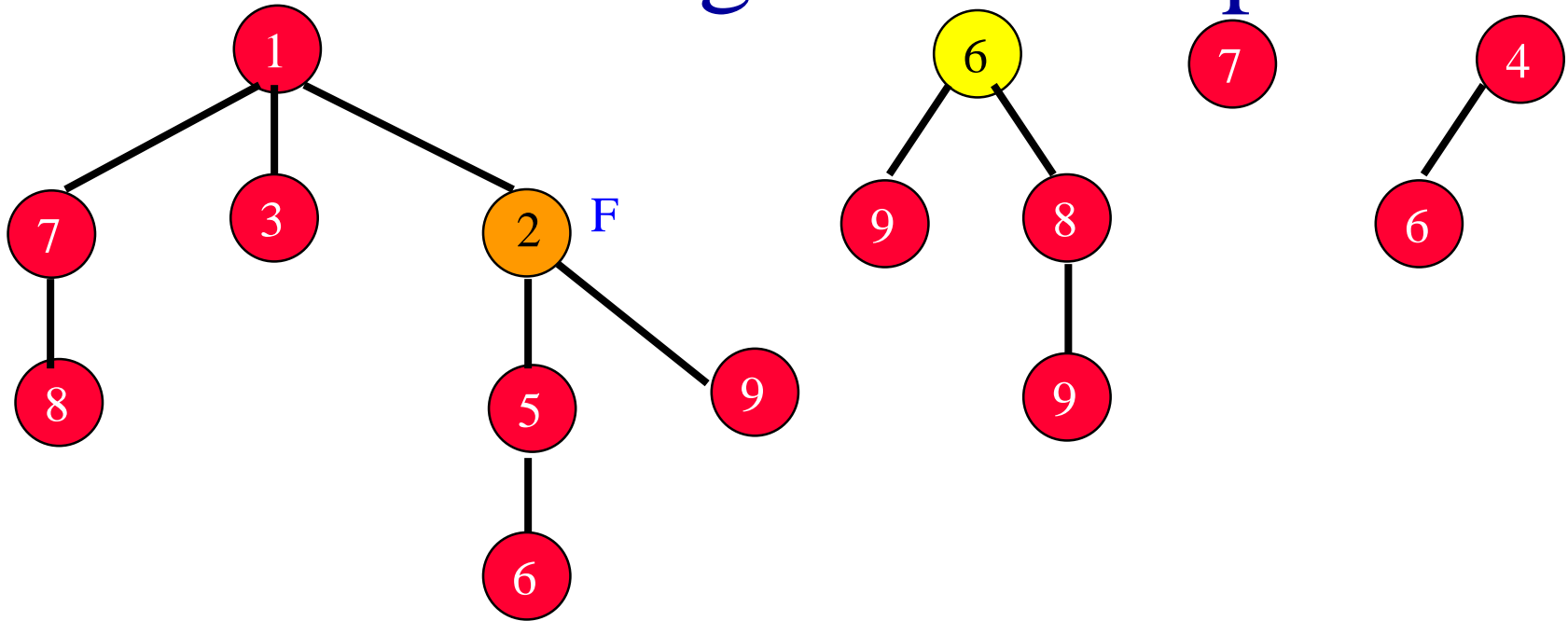
# Cascading Cut Example



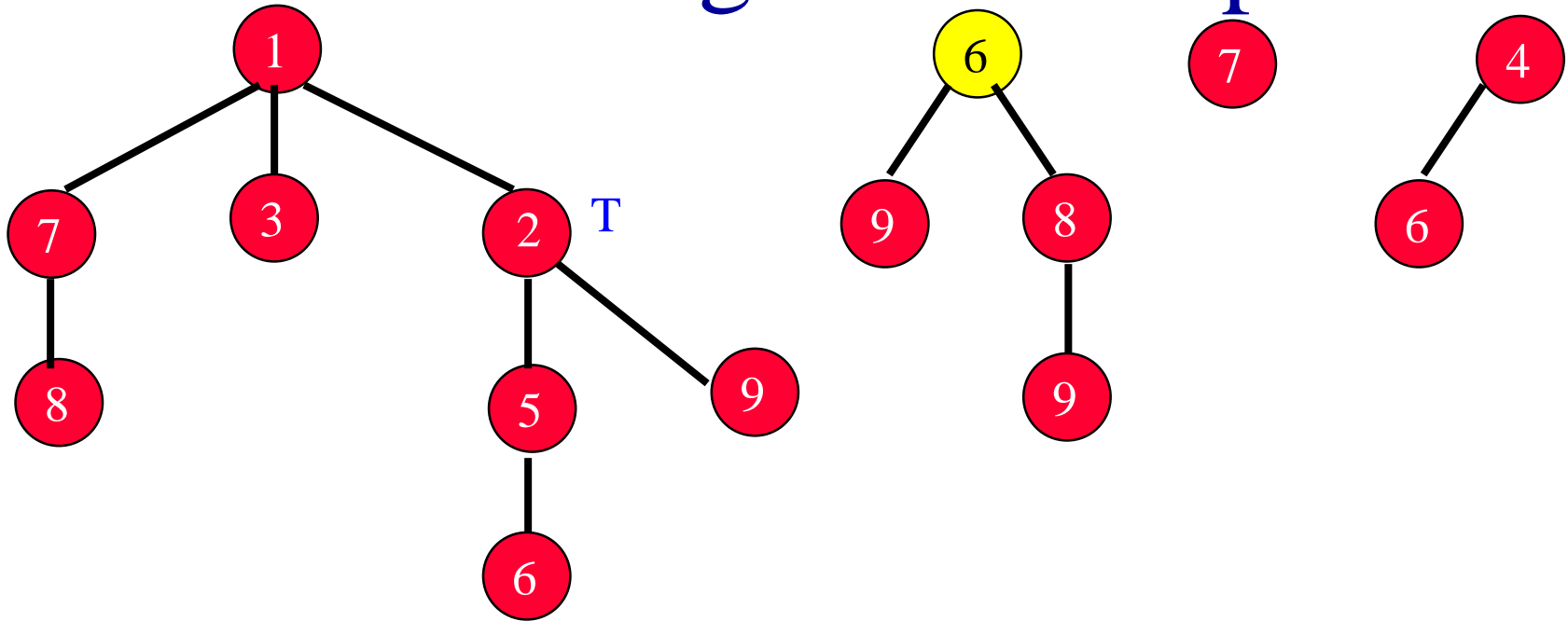
# Cascading Cut Example



# Cascading Cut Example



# Cascading Cut Example



Actual complexity of cascading cut is  $O(h) = O(n)$ .

# Analysis Of Fibonacci Heaps

	Actual	Amortized
Insert	$O(1)$	$O(1)$
Delete min (or max)	$O(n)$	$O(\log n)$
Meld	$O(1)$	$O(1)$
Delete	$O(n)$	$O(\log n)$
Decrease key (or increase)	$O(n)$	$O(1)$

# (\*\*MaxDegree not included in this year\*\*)

- Let  $N_i$  = min # of nodes in any min (sub)tree whose root has  $i$  children.

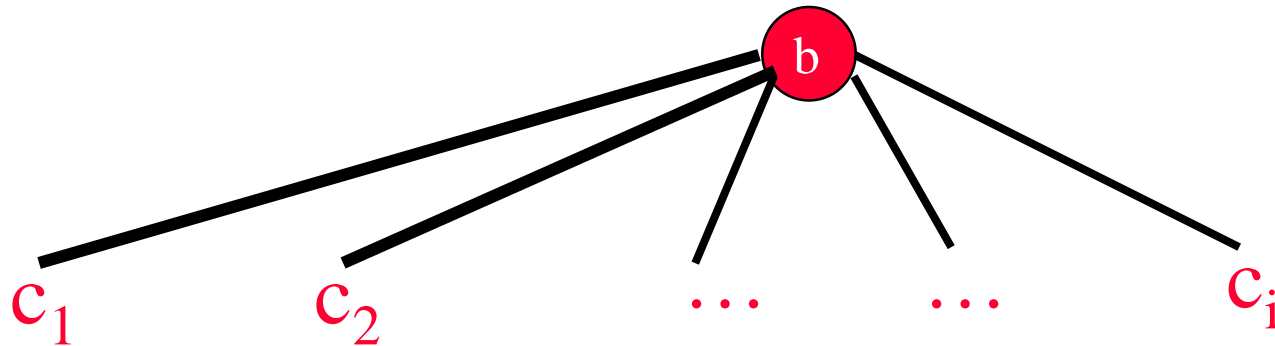
- $N_0 = 1$ .



- $N_1 = 2$ .



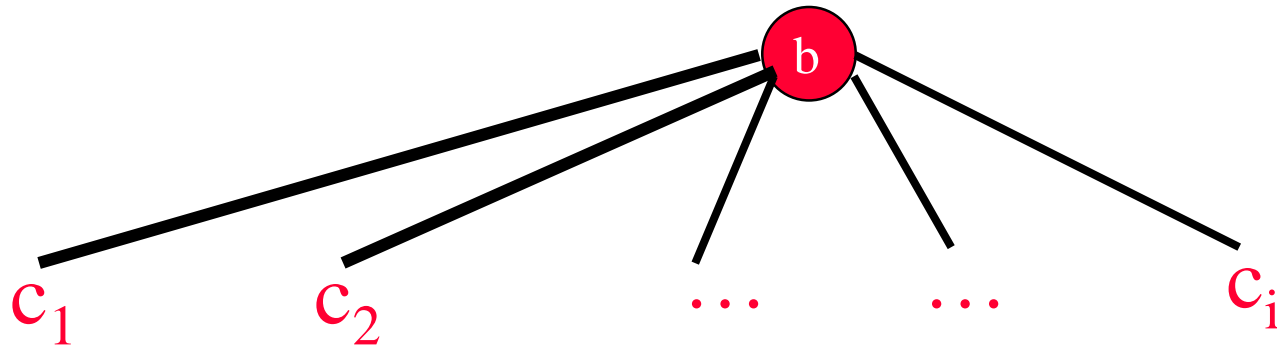
$$N_i, i > 1$$



- Children of  $b$  are labeled in the order in which they became children of  $b$ .
  - $c_1$  became a child before  $c_2$  did, and so on.
- So, when  $c_k$  became a child of  $b$ ,  $\text{degree}(b) \geq k - 1$ .
- $\text{degree}(c_k)$  at the time when  $c_k$  became a child of  $b$   
 $= \text{degree}(b)$  at the time when  $c_k$  became a child of  $b$   
 $\geq k - 1$ .



$$N_i, i > 1$$



- So, current  $\text{degree}(c_k) \geq \max\{0, k - 2\}$ .
- So,  $N_i = N_0 + (\sum_{0 \leq q \leq i-2} N_q) + 1$   
 $= (\sum_{0 \leq q \leq i-2} N_q) + 2.$

# Fibonacci Numbers

- $F_0 = 0$ .
- $F_1 = 1$ .
- $F_i = F_{i-1} + F_{i-2}, i > 1$   
 $= (\sum_{0 \leq q \leq i-2} F_q) + 1, i > 1$ .

- $N_0 = 1$ .
- $N_1 = 2$ .
- $N_i = (\sum_{0 \leq q \leq i-2} N_q) + 2, i > 1$ .

- $N_i = F_{i+2} \sim ((1 + \sqrt{5})/2)^i, i \geq 0$ .

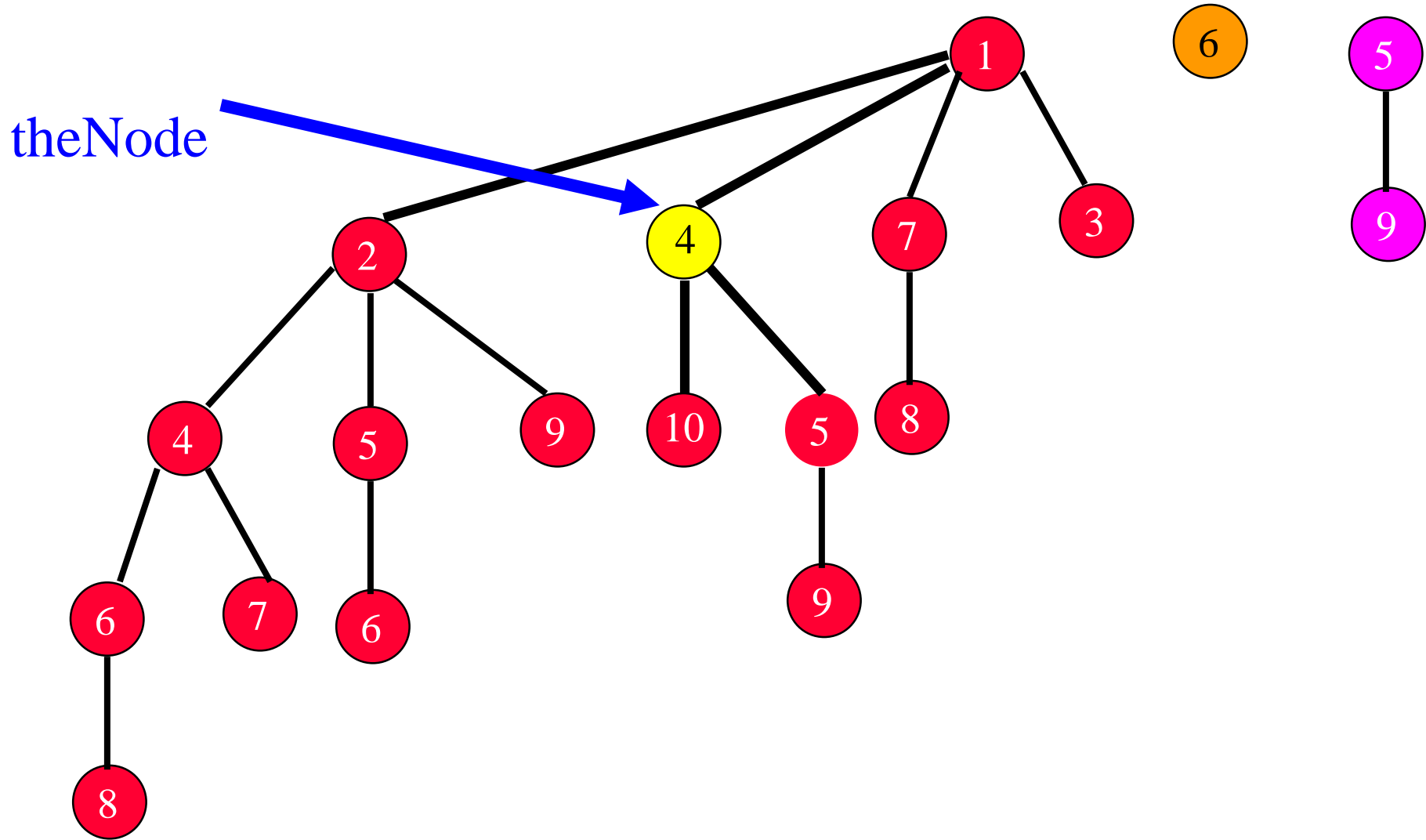
# MaxDegree

- $\text{MaxDegree} \leq \log_{\phi} n$ , where  $\phi = (1 + \sqrt{5})/2$ .

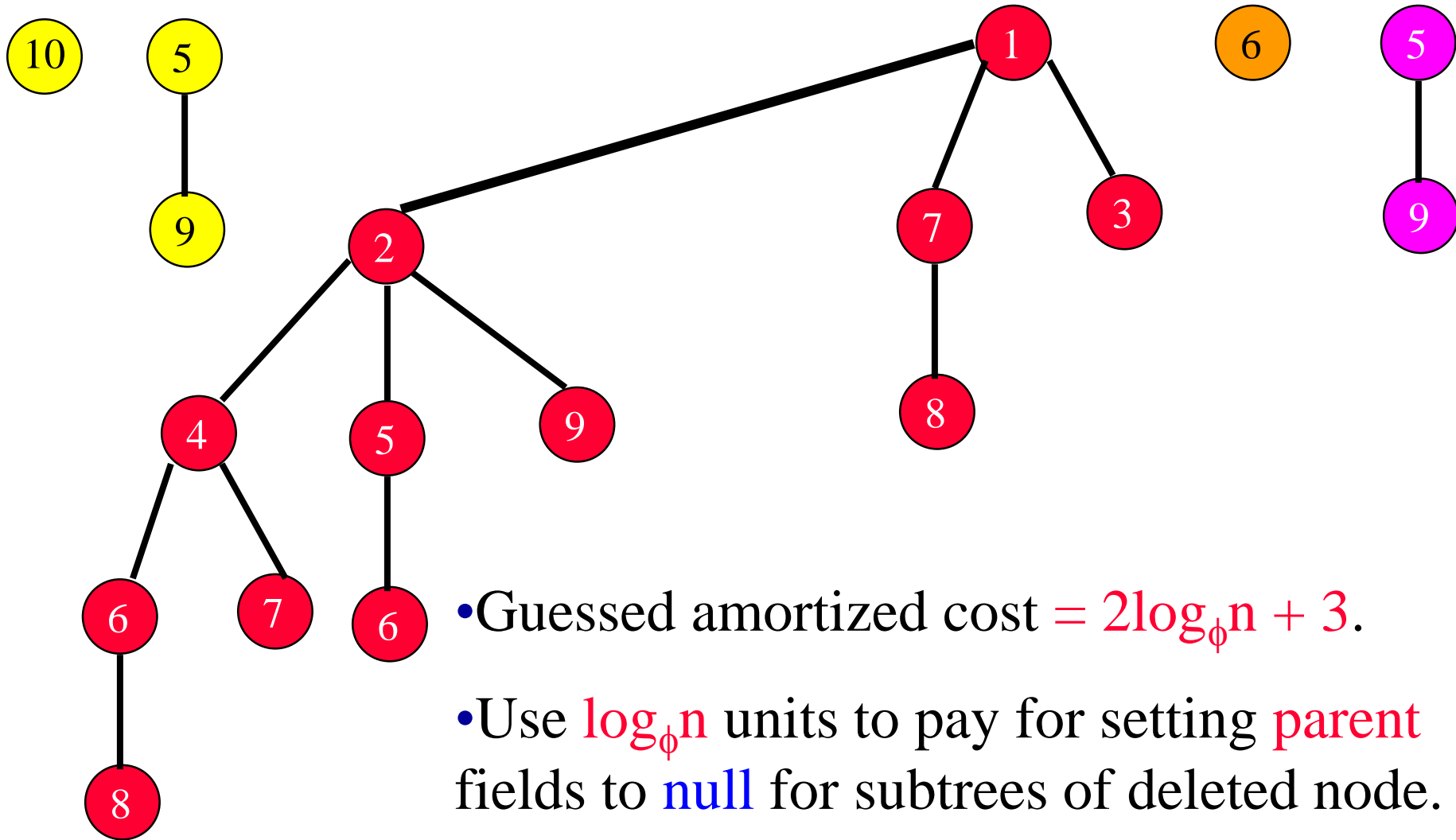
# Accounting Method

- Insert.
  - Guessed amortized cost = 2.
  - Use 1 unit to pay for the actual cost of the insert and keep the remaining 1 unit as a credit for a future remove min operation.
  - Keep this credit with the min tree that is created by the insert operation.
- Meld.
  - Guessed amortized cost = 1.
  - Use 1 unit to pay for the actual cost of the meld.

# Delete Nonmin Element

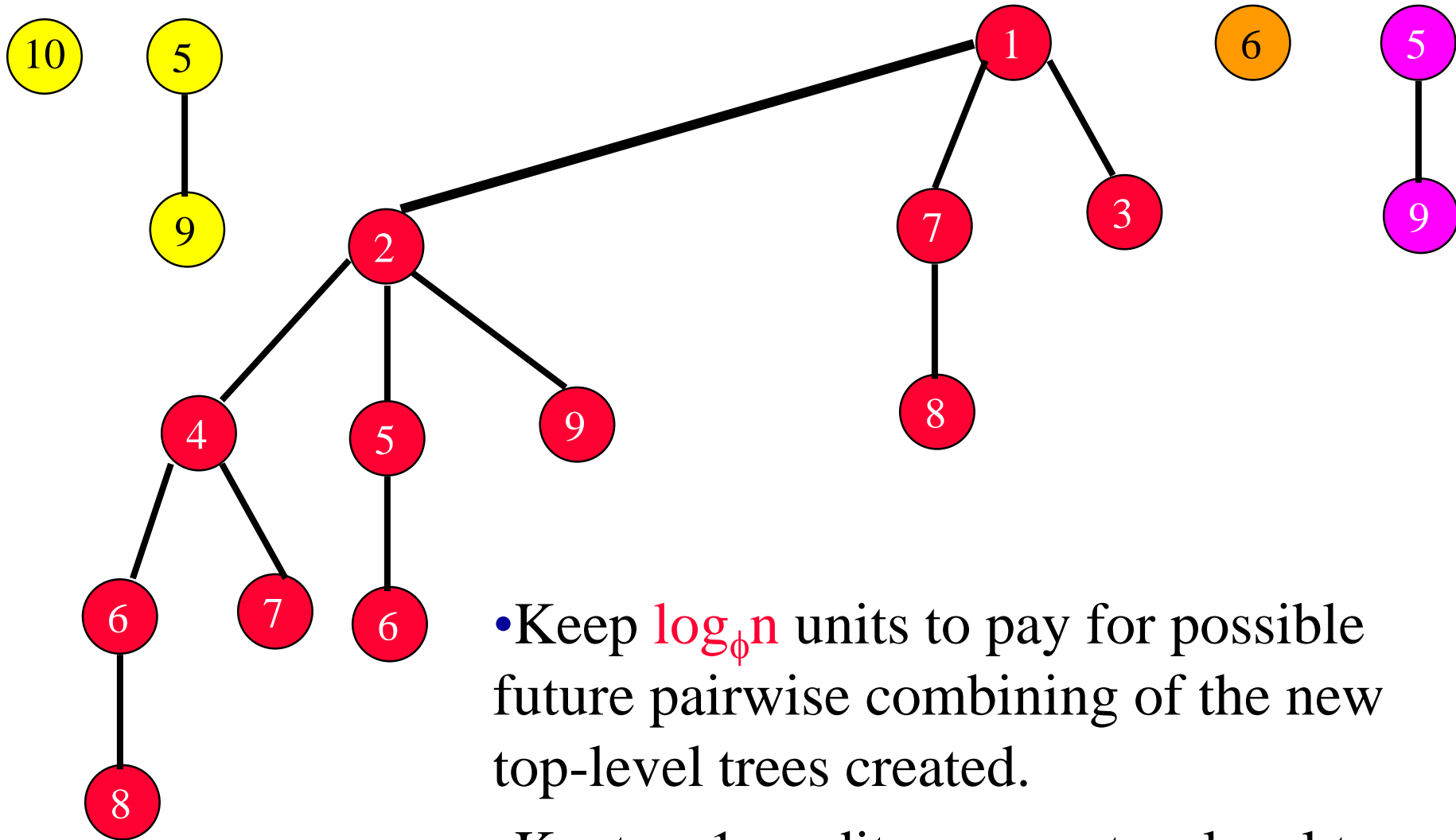


# Delete Nonmin Element



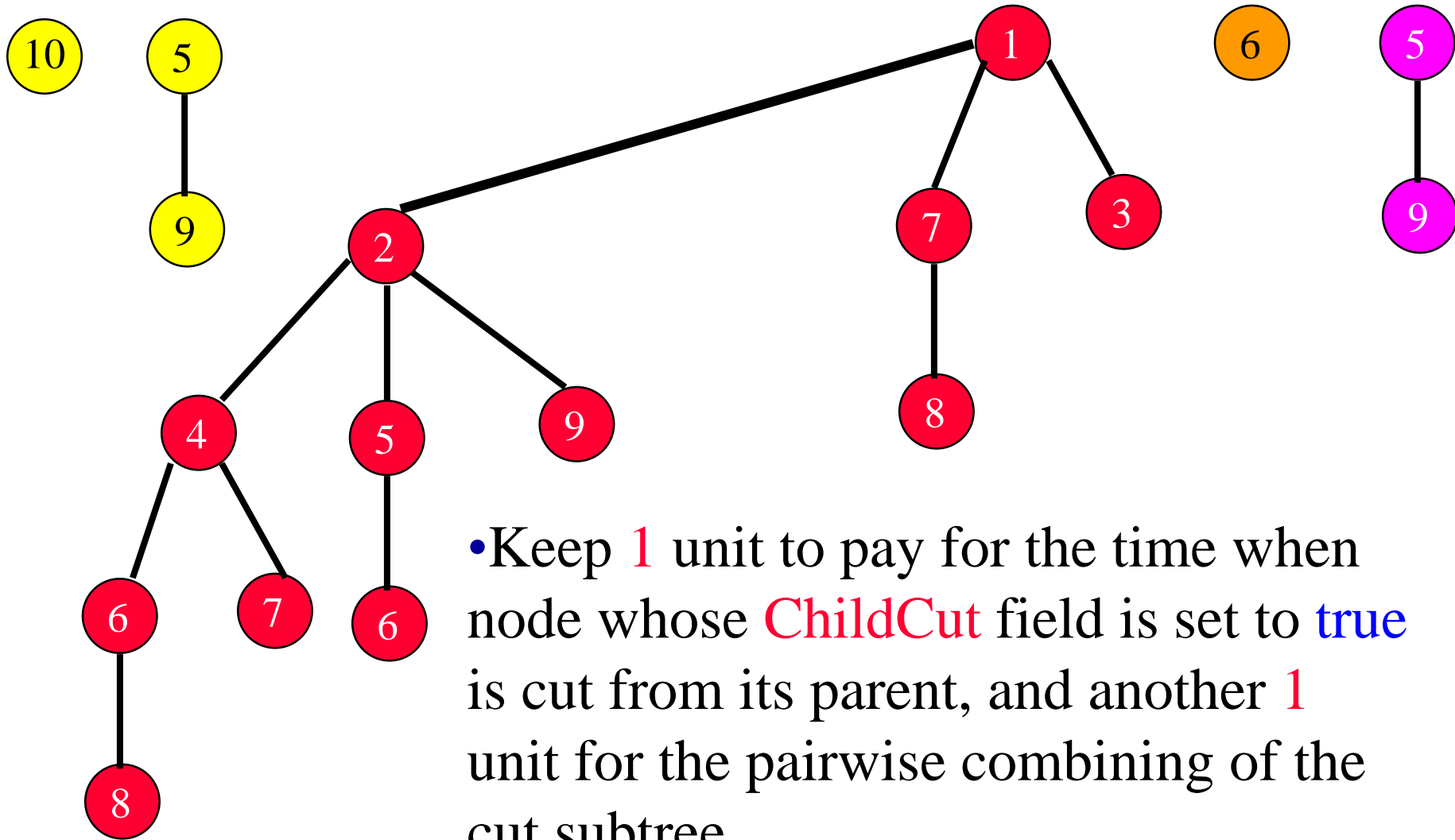
- Gussed amortized cost =  $2\log_{\phi}n + 3$ .
- Use  $\log_{\phi}n$  units to pay for setting **parent** fields to **null** for subtrees of deleted node.
- Use **1** unit to pay for remaining work not related to cascading cut.

# Delete Nonmin Element



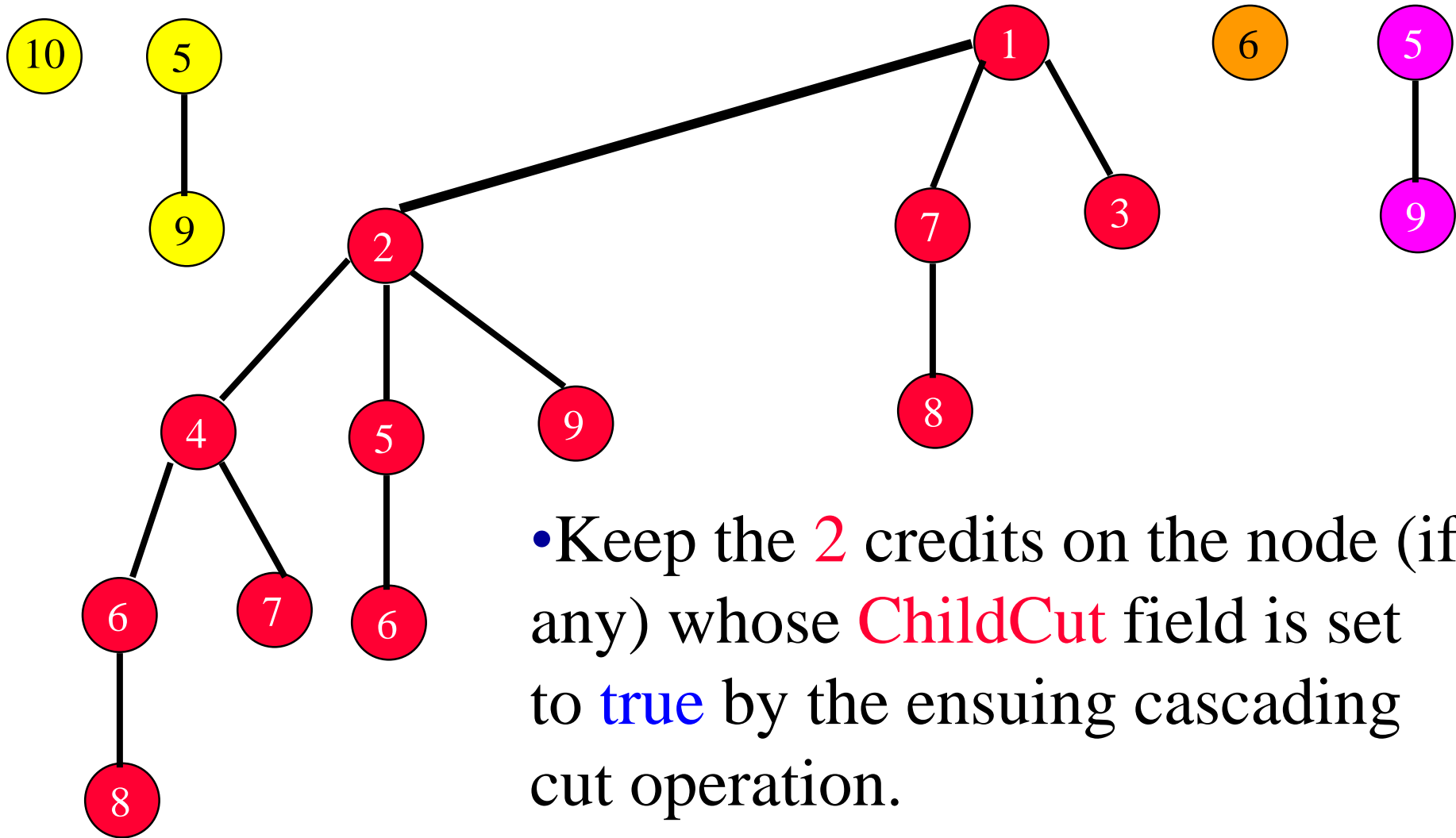
- Keep  $\log_{\phi} n$  units to pay for possible future pairwise combining of the new top-level trees created.
- Kept as 1 credit per new top-level tree.
- Discard excess credits (if any).

# Delete Nonmin Element



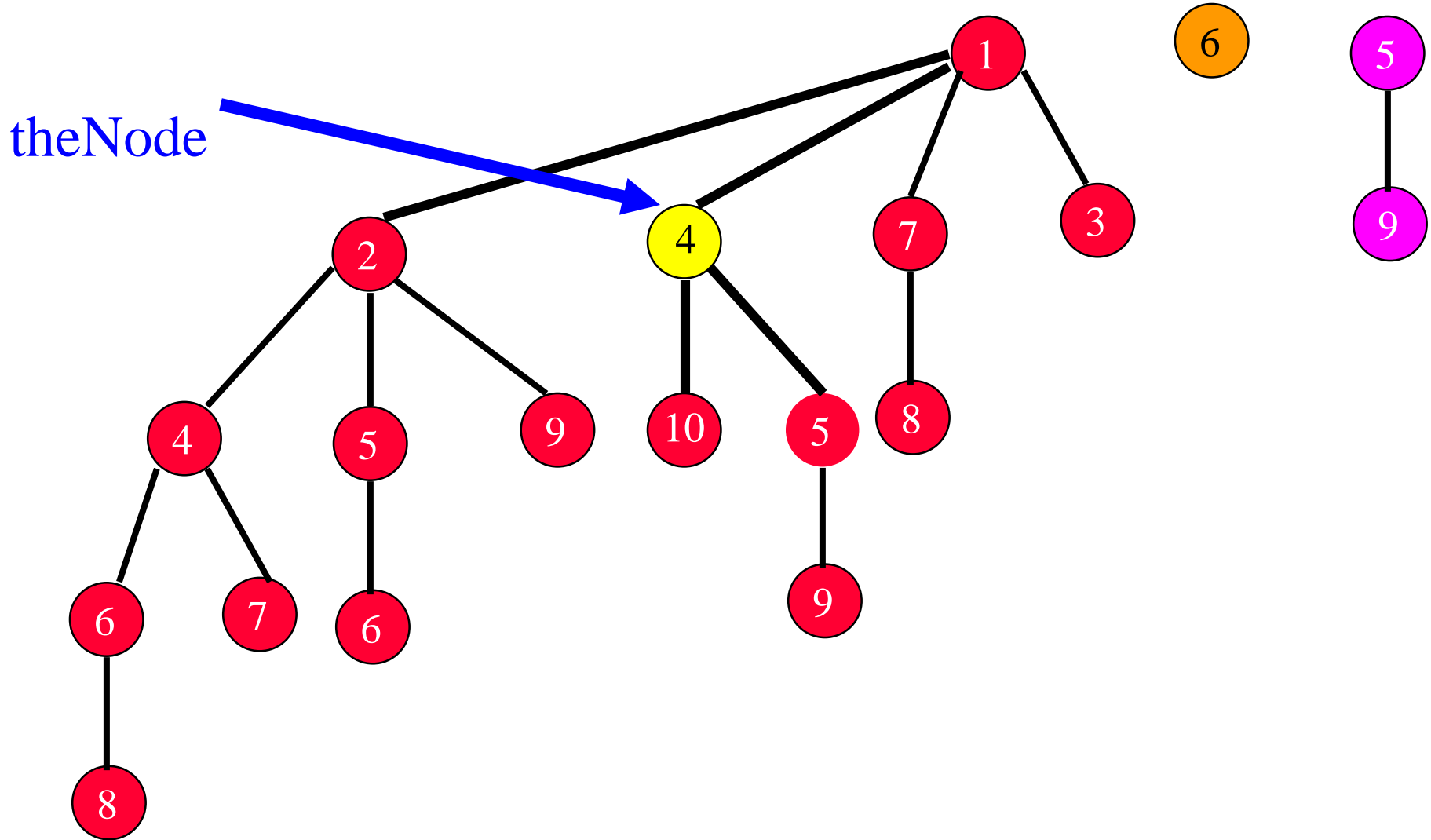


# Delete Nonmin Element

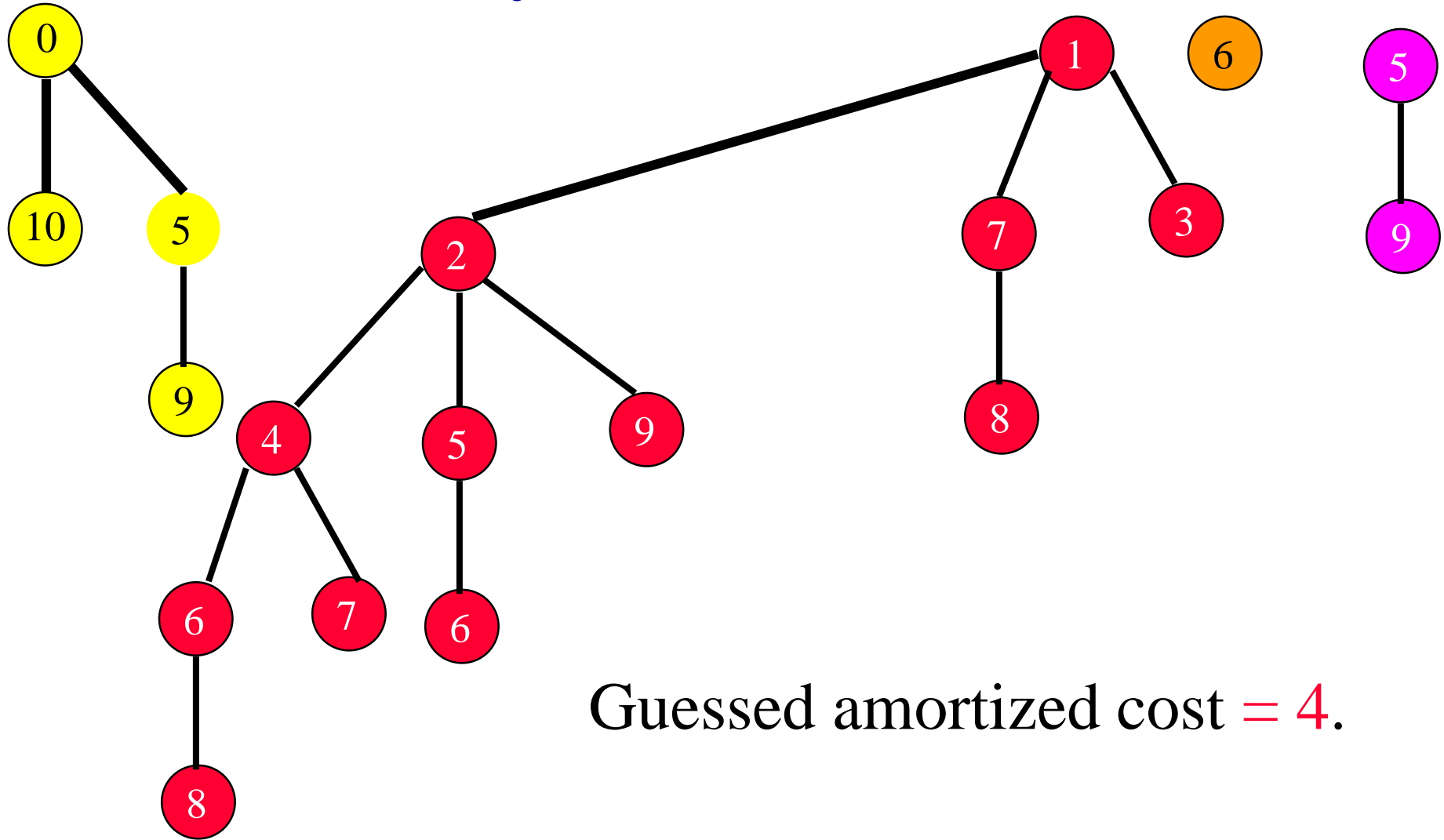


- Keep the 2 credits on the node (if any) whose **ChildCut** field is set to **true** by the ensuing cascading cut operation.
  - If there is no such node, discard the credits.

# DecreaseKey(theNode, theAmount)

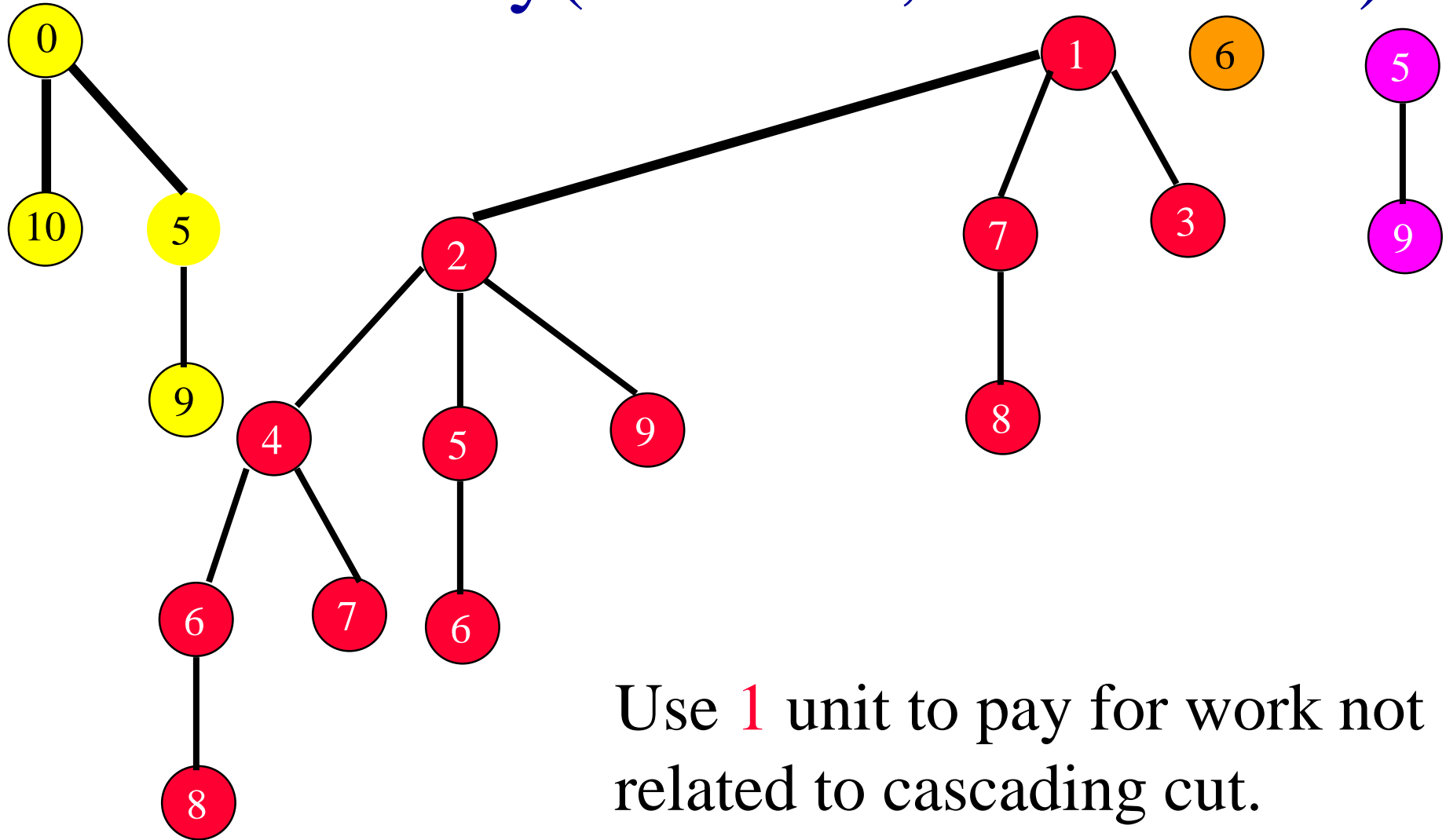


# DecreaseKey(theNode, theAmount)

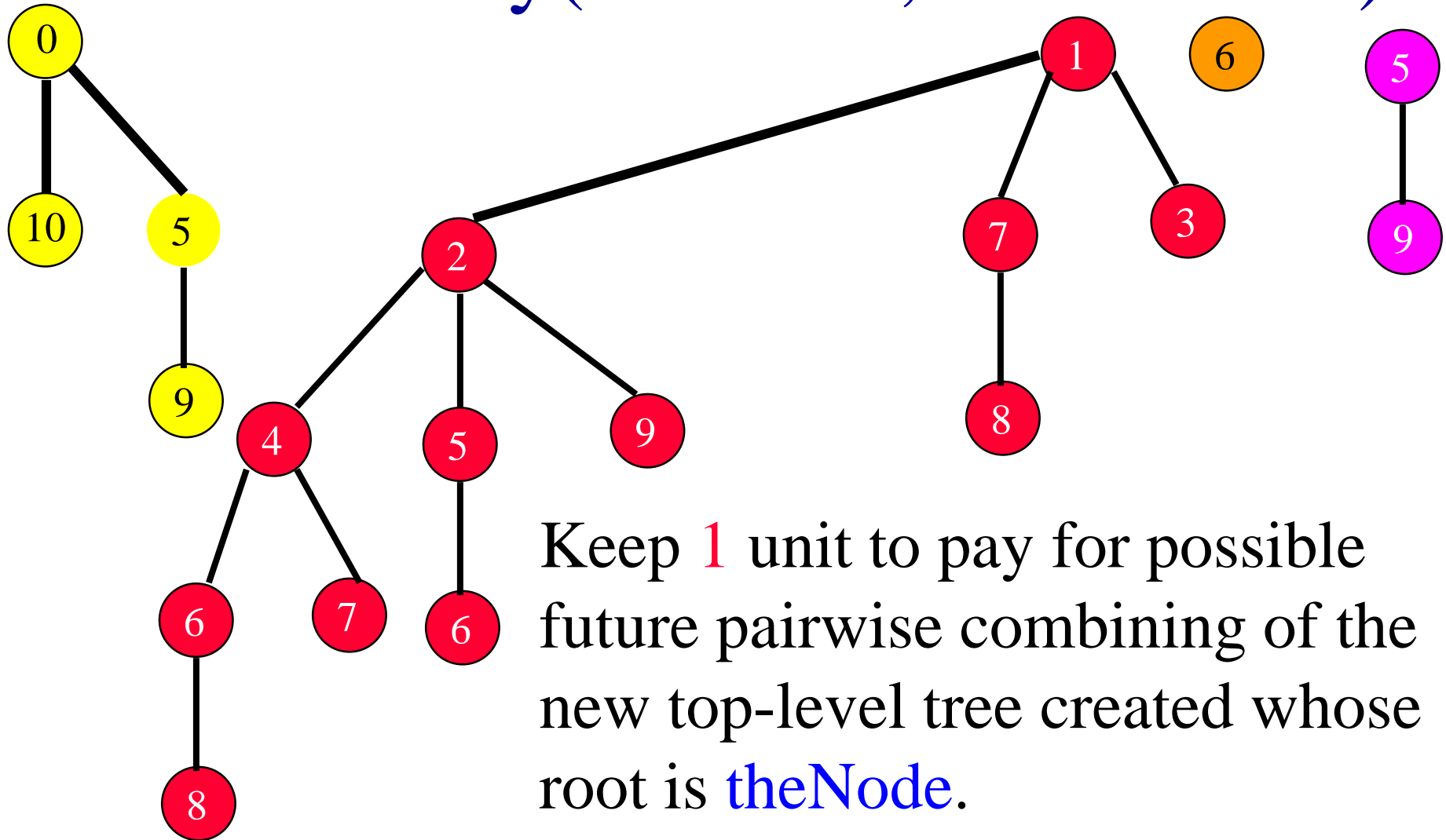


Guessed amortized cost = 4.

# DecreaseKey(theNode, theAmount)



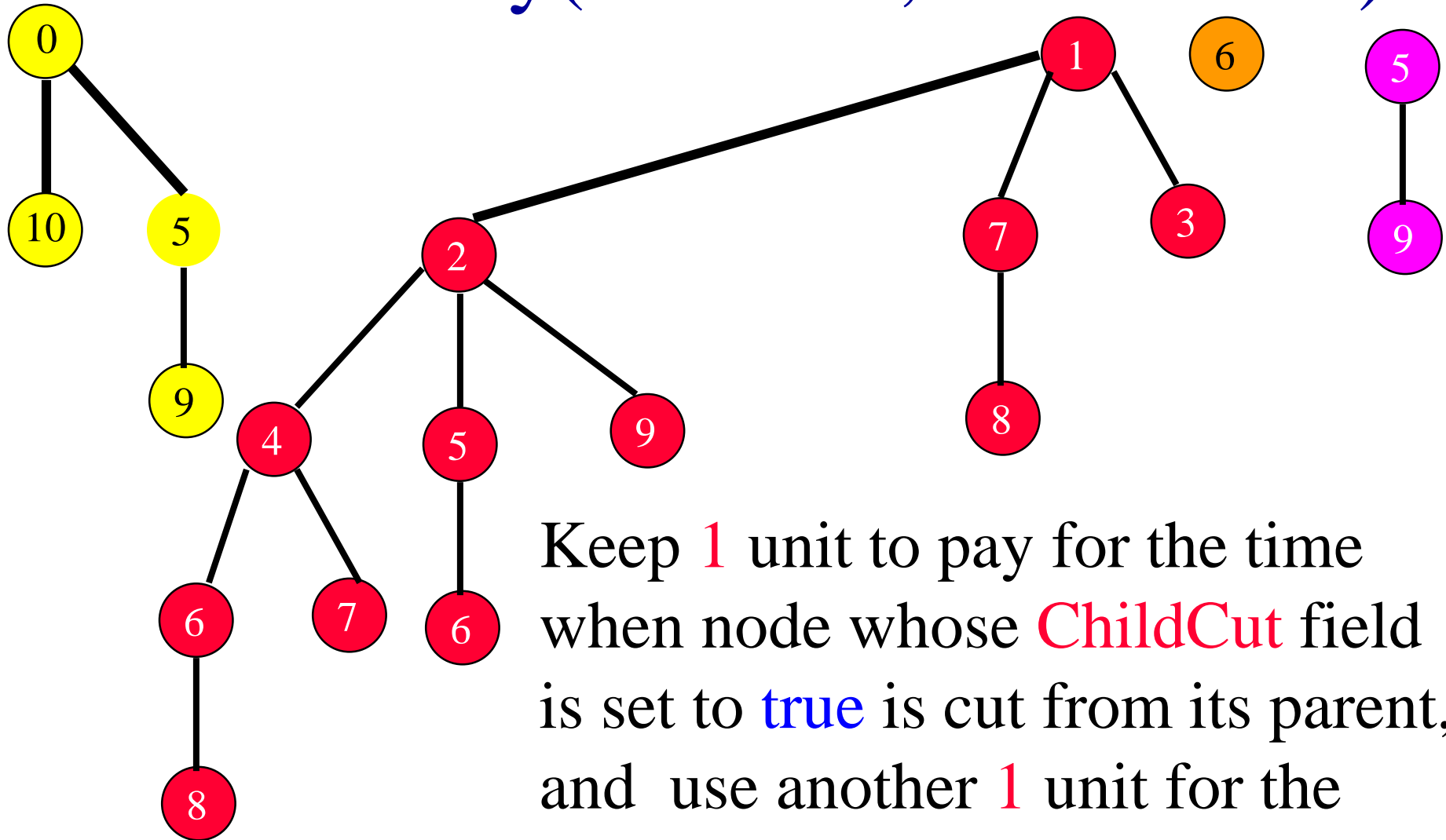
# DecreaseKey(theNode, theAmount)



Keep **1** unit to pay for possible future pairwise combining of the new top-level tree created whose root is **theNode**.

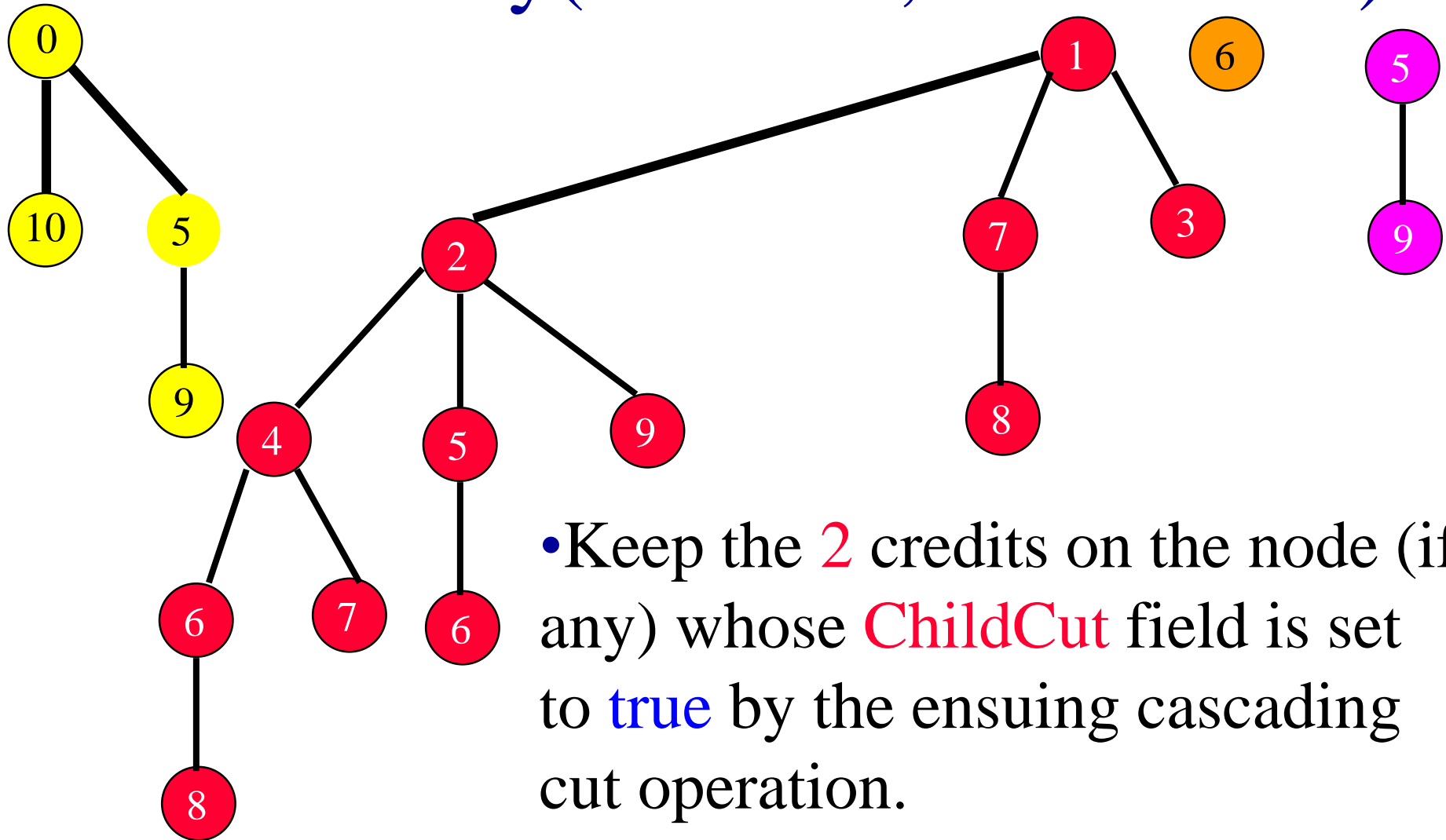
Kept as credit on **theNode**.

# DecreaseKey(theNode, theAmount)



Keep **1** unit to pay for the time when node whose **ChildCut** field is set to **true** is cut from its parent, and use another **1** unit for the pairwise combining of the cut subtree.

# DecreaseKey(theNode, theAmount)



- Keep the **2** credits on the node (if any) whose **ChildCut** field is set to **true** by the ensuing cascading cut operation.
  - If there is no such node, discard the credits.

# Delete Min

- Guessed amortized cost =  $3\log_{\phi}n$ .
- Actual cost  $\leq 2\log_{\phi}n - 1 + \text{\#MinTrees}$ .
- Allocation of amortized cost.
  - Use  $2\log_{\phi}n - 1$  to pay part of actual cost.
  - Keep remaining  $\log_{\phi}n + 1$  as a credit to pay part of the actual cost of a future delete min operation.
  - Put 1 unit of credit on each of the at most  $\log_{\phi}n + 1$  min trees left behind by the delete min operation.
  - Discard the remaining credits (if any).



# Paying Actual Cost Of A Delete Min

- Actual cost  $\leq 2\log_{\phi} n - 1 + \text{\#MinTrees}$
- How is it paid for?
  - $2\log_{\phi} n - 1$  is paid for from the amortized cost of the delete min.
  - $\text{\#MinTrees}$  is paid by the 1 unit credit on each of the min trees in the Fibonacci heap just prior to the delete min operation.

# Who Pays For Cascading Cut?

- Only nodes with **ChildCut = true** are cut during a cascading cut.
- The actual cost to cut a node is **1**.
- This cost is paid from the **2** units of credit on the node whose **ChildCut** field is true. The remaining unit of credit is kept with the min tree that has been cut and now becomes a top-level tree.

# Potential Method

- $P(i) = \Sigma[\text{\#MinTrees}(j) + 2 * \text{\#NodesWithTrueChildCut}(j)]$ 
  - $\text{\#MinTrees}(j)$  is  $\text{\#MinTrees}$  for Fibonacci heap  $j$ .
  - When Fibonacci heaps  $A$  and  $B$  are melded,  $A$  and  $B$  are no longer included in the sum.
- $P(0) = 0$
- $P(i) \geq 0$  for all  $i$ .

# Pairing Heaps

	Fibonacci	Pairing
Insert	$O(1)$	$O(1)$
Delete min (or max)	$O(n)$	$O(n)$
Meld	$O(1)$	$O(1)$
Delete	$O(n)$	$O(n)$
Decrease key (or increase)	$O(n)$	$O(1)$

**Actual Complexity**

# Pairing Heaps

	Fibonacci	Pairing
Insert	$O(1)$	$O(\log n)$
Delete min (or max)	$O(\log n)$	$O(\log n)$
Meld	$O(1)$	$O(\log n)$
Delete	$O(\log n)$	$O(\log n)$
Decrease key (or increase)	$O(1)$	$O(\log n)$

**Amortized Complexity**

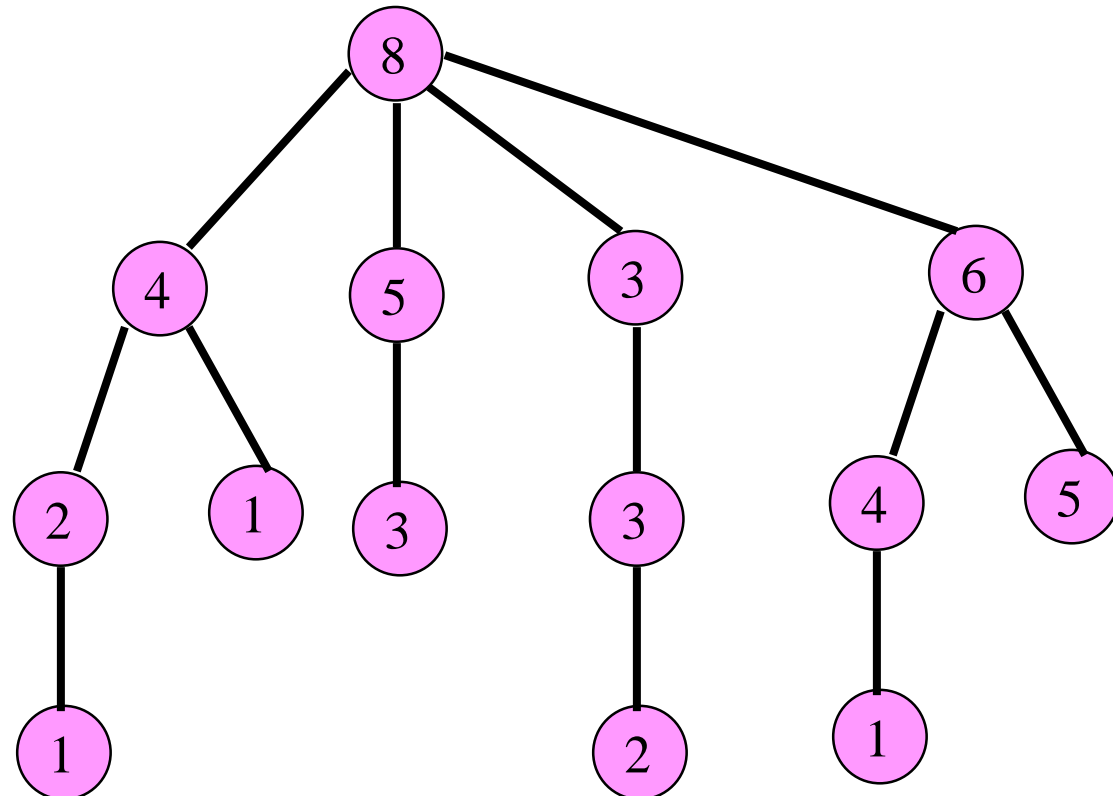
# Pairing Heaps

- Experimental results suggest that pairing heaps are actually faster than Fibonacci heaps.
  - Simpler to implement.
  - Smaller runtime overheads.
  - Less space per node.

# Definition

- A min (max) pairing heap is a min (max) tree in which operations are done in a specified manner.

**Max Tree**



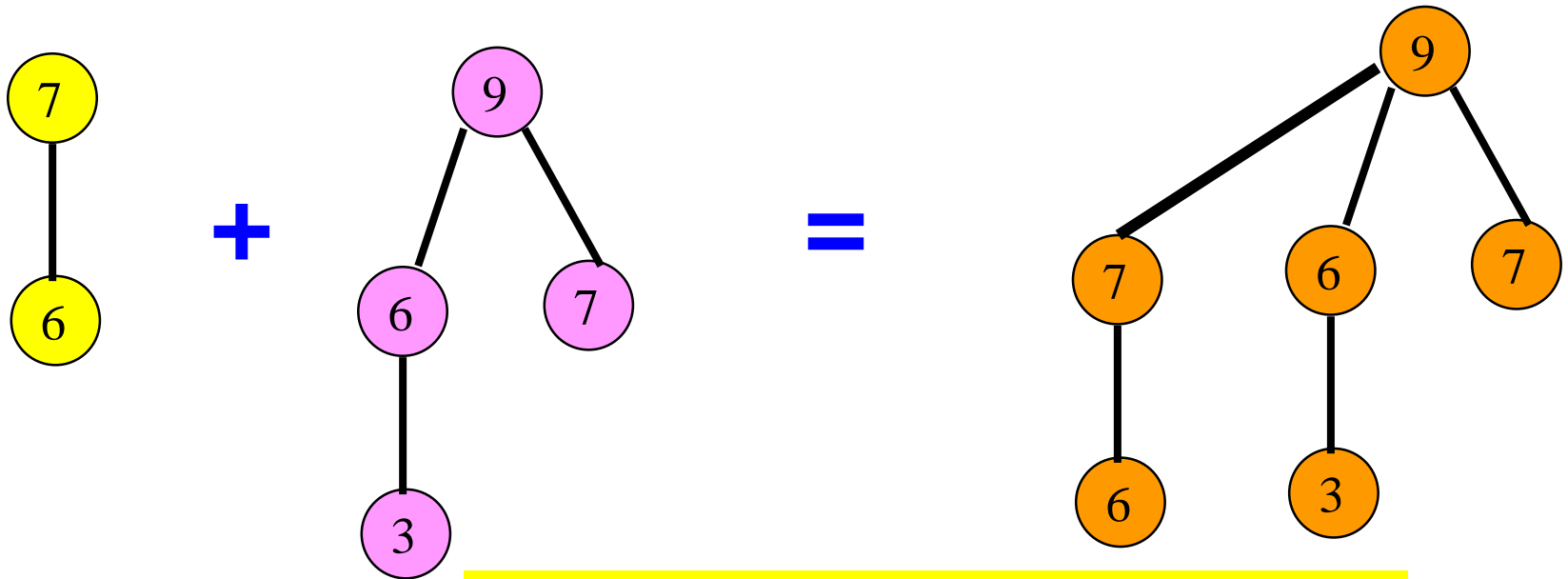
# Node Structure

- Child
  - Pointer to first node of children list.
- Left and Right Sibling
  - Used for doubly linked linked list (not circular) of siblings.
  - Left pointer of first node is to parent.
  - $x$  is first node in list iff  $x.\text{left.child} = x$ .
- Data
- Note: No **Parent**, **Degree**, or **ChildCut** fields.



# Meld – Max Pairing Heap

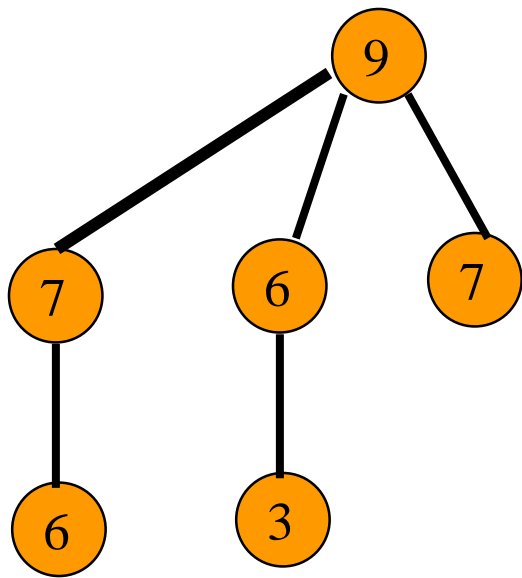
- Compare-Link Operation
  - Compare roots.
  - Tree with smaller root becomes leftmost subtree.



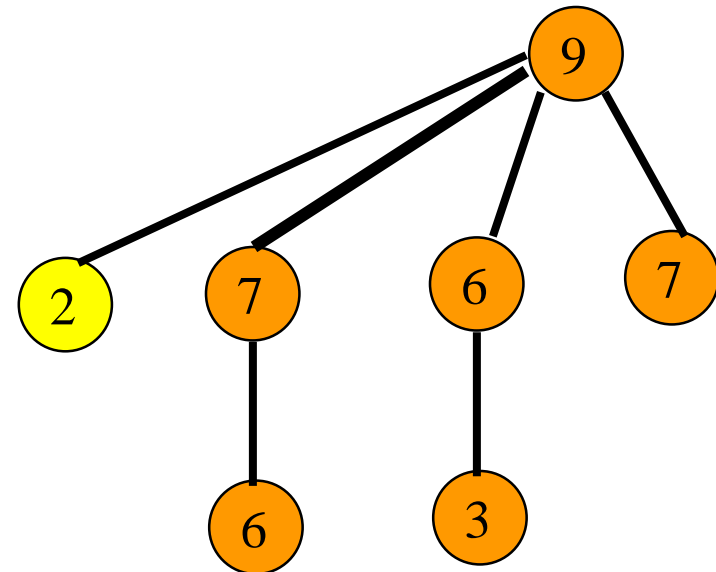
• Actual cost =  $O(1)$ .

# Insert

- Create **1**-element max tree with new item and meld with existing max pairing heap.

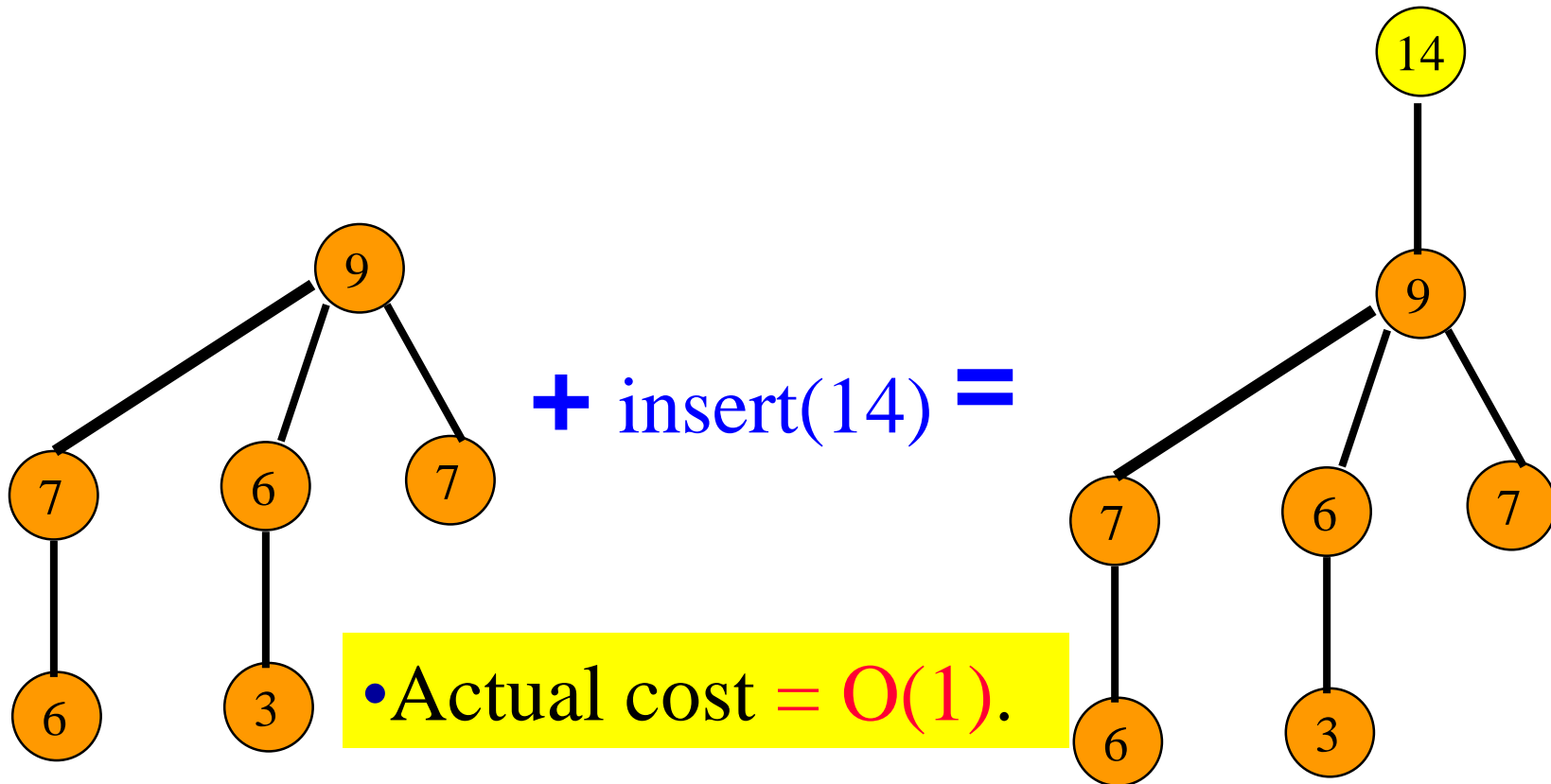


+ insert(2) =



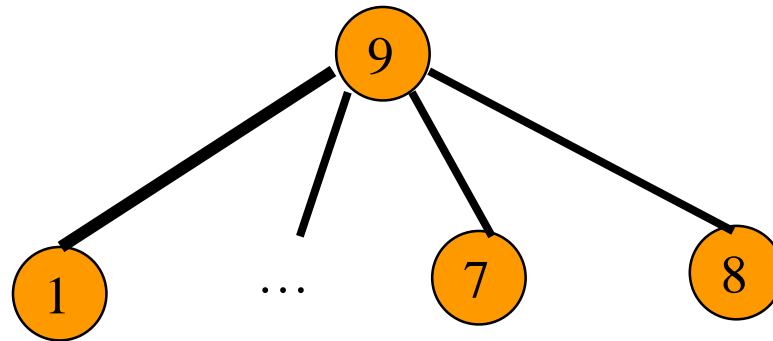
# Insert

- Create **1**-element max tree with new item and meld with existing max pairing heap.



# Worst-Case Degree

- Insert 9, 8, 7, ..., 1, in this order.



- Worst-case degree =  $n - 1$ .

# Worst-Case Height

- Insert 1, 2, 3, ..., n, in this order.

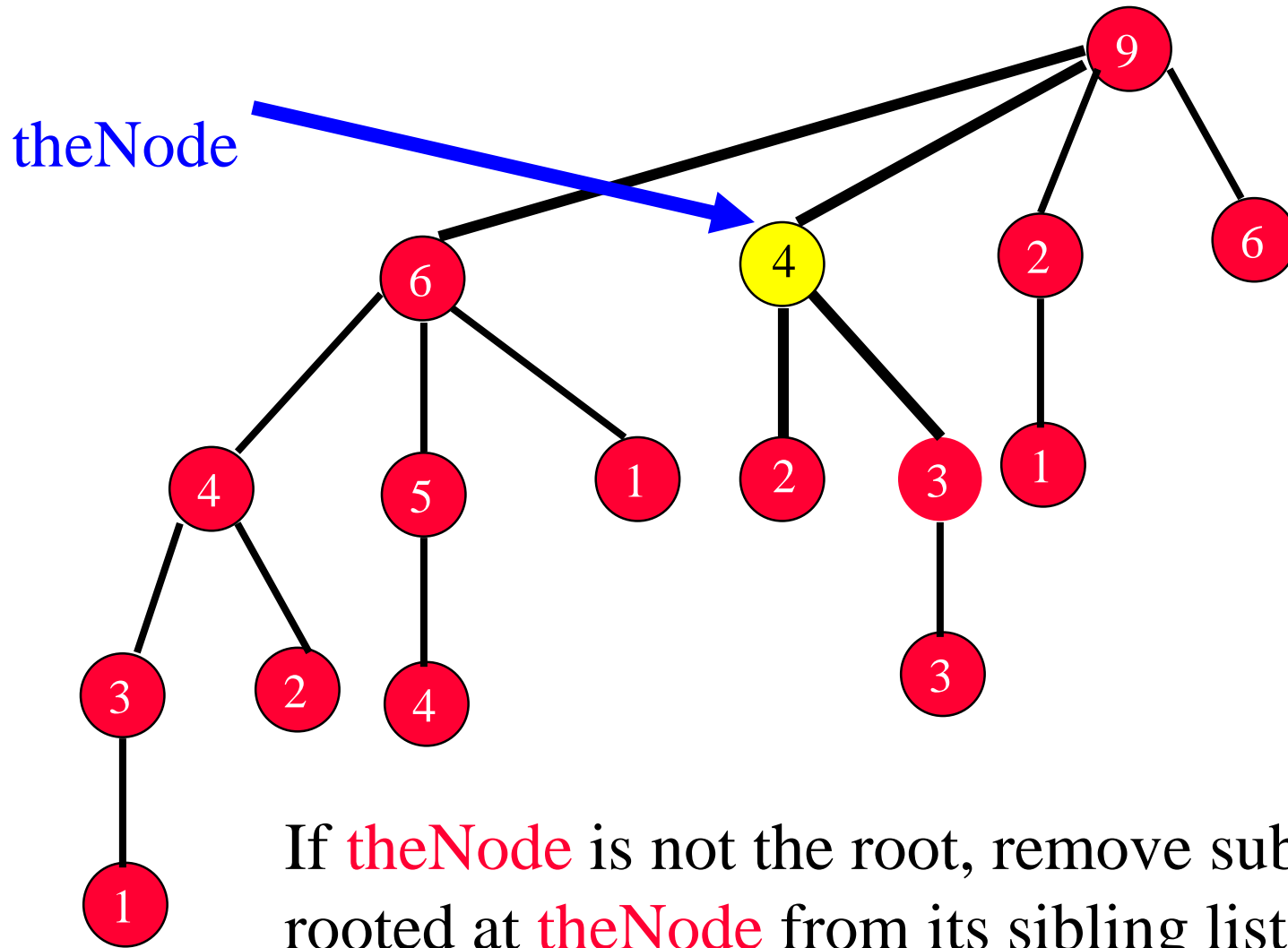
• Worst-case height = n.



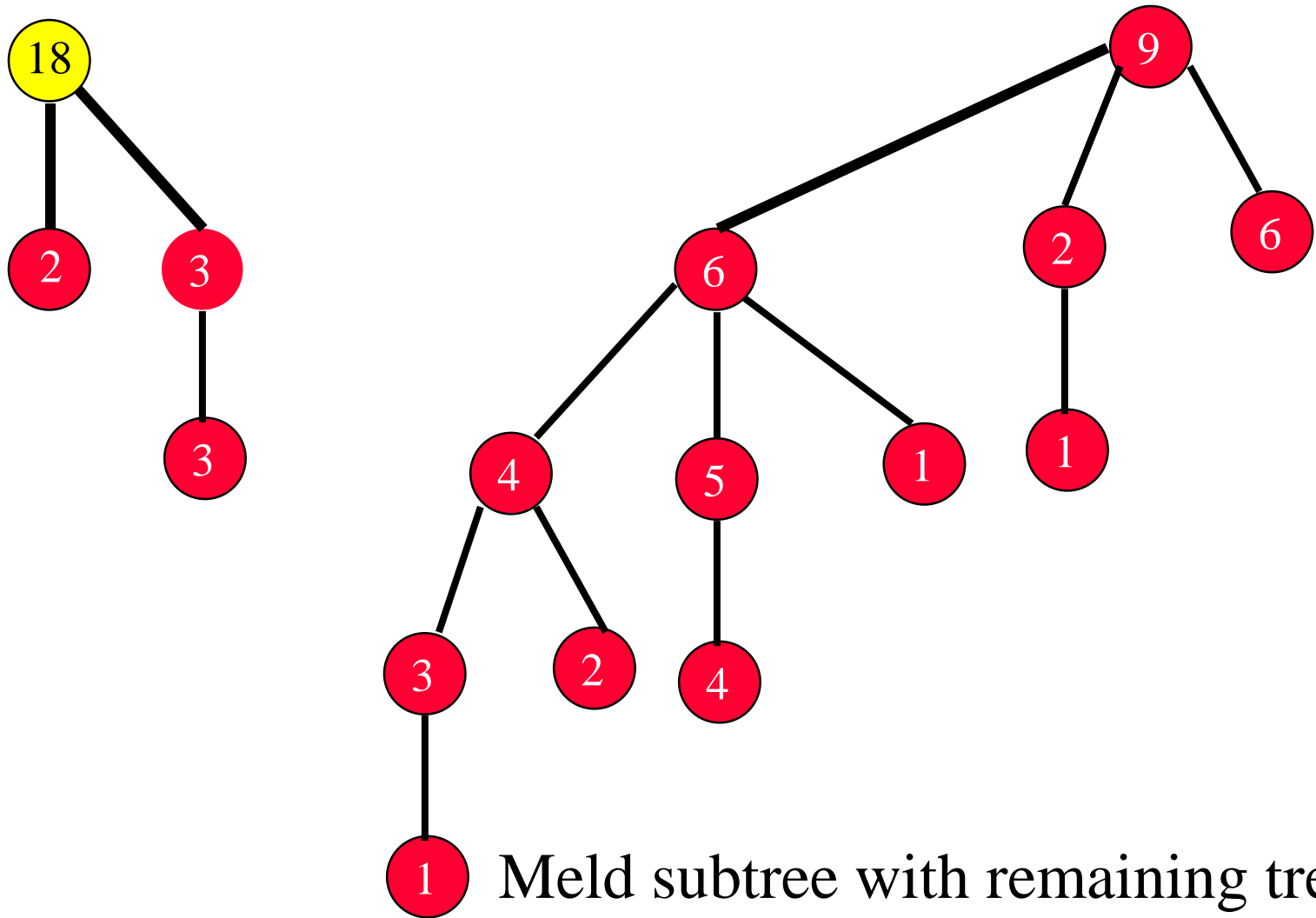
# IncreaseKey(theNode, theAmount)

- Since nodes do not have parent fields, we cannot easily check whether the key in **theNode** becomes larger than that in its parent.
- So, detach **theNode** from sibling doubly-linked list and meld.

# IncreaseKey(theNode, theAmount)

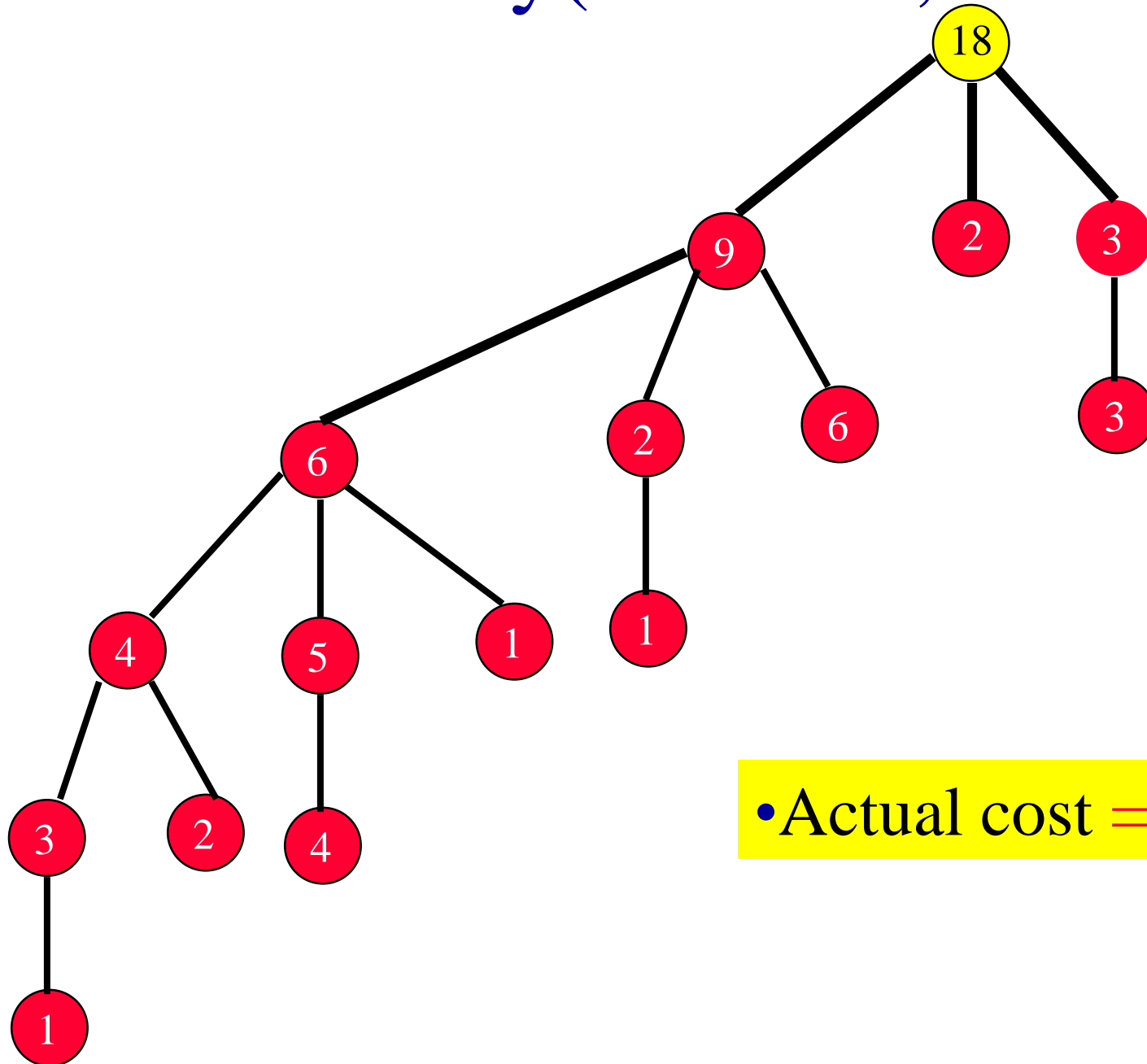


# IncreaseKey(theNode, theAmount)





# IncreaseKey(theNode, theAmount)



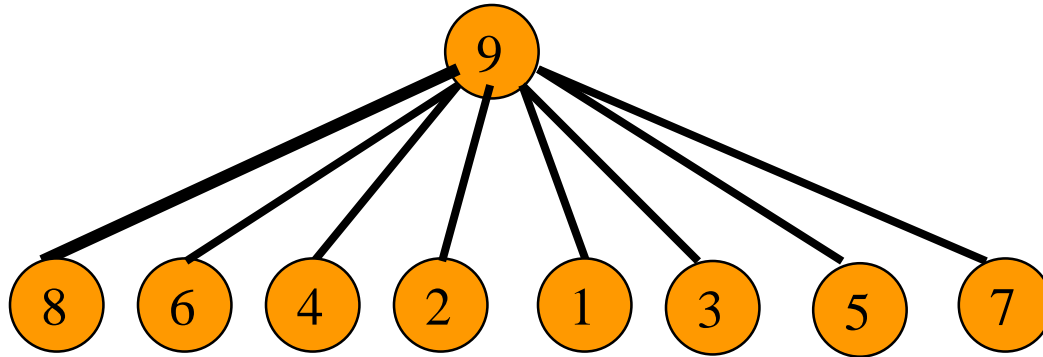
• Actual cost =  $O(1)$ .

# Delete Max

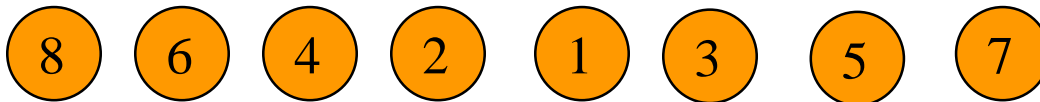
- If empty  $\Rightarrow$  fail.
- Otherwise, remove tree root and meld subtrees into a single max tree.
- How to meld subtrees?
  - Good way  $\Rightarrow O(\log n)$  amortized complexity for remove max.
  - Bad way  $\Rightarrow O(n)$  amortized complexity.



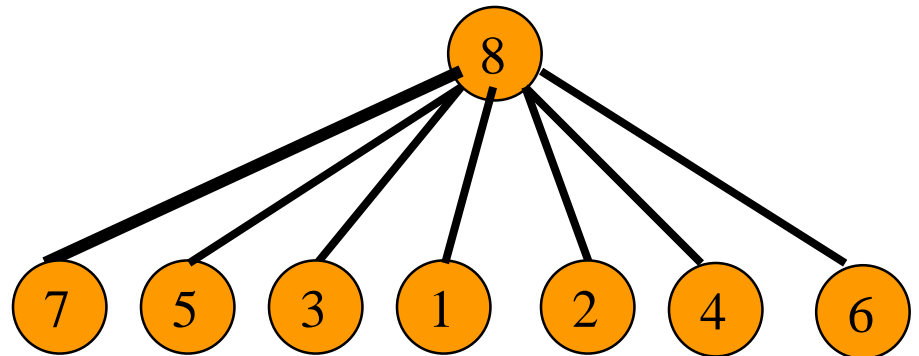
# Example



- Delete max.



- Meld into one tree.



# Example

- Actual cost of insert is  $1$ .
- Actual cost of delete max is degree of root.
- $n/2$  inserts (9, 7, 5, 3, 1, 2, 4, 6, 8) followed by  $n/2$  delete maxs.
  - Cost of inserts is  $n/2$ .
  - Cost of delete maxs is  $1 + 2 + \dots + n/2 - 1 = \Theta(n^2)$ .
  - If amortized cost of an insert is  $O(1)$ , amortized cost of a delete max must be  $\Theta(n)$ .

# Good Ways To Meld Subtrees

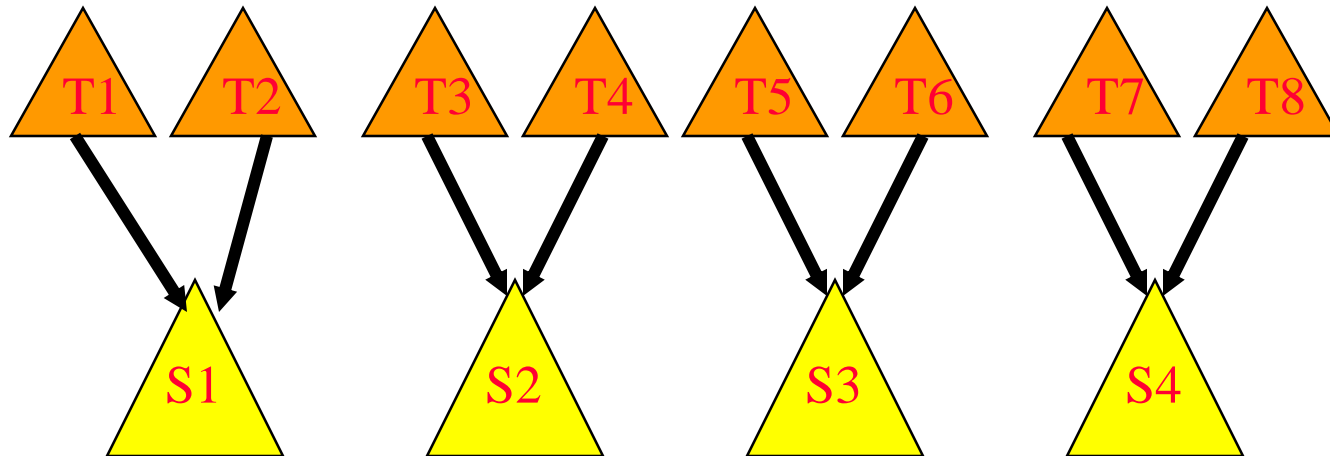
- Two-pass scheme.
- Multipass scheme.
- Both have same asymptotic complexity.
- Two-pass scheme gives better observed performance.

# Two-Pass Scheme

- Pass 1.
  - Examine subtrees from left to right.
  - Meld pairs of subtrees, reducing the number of subtrees to half the original number.
  - If # subtrees was odd, meld remaining original subtree with last newly generated subtree.
- Pass 2.
  - Start with rightmost subtree of Pass 1. Call this the working tree.
  - Meld remaining subtrees, one at a time, from right to left, into the working tree.

# Two-Pass Scheme – Example

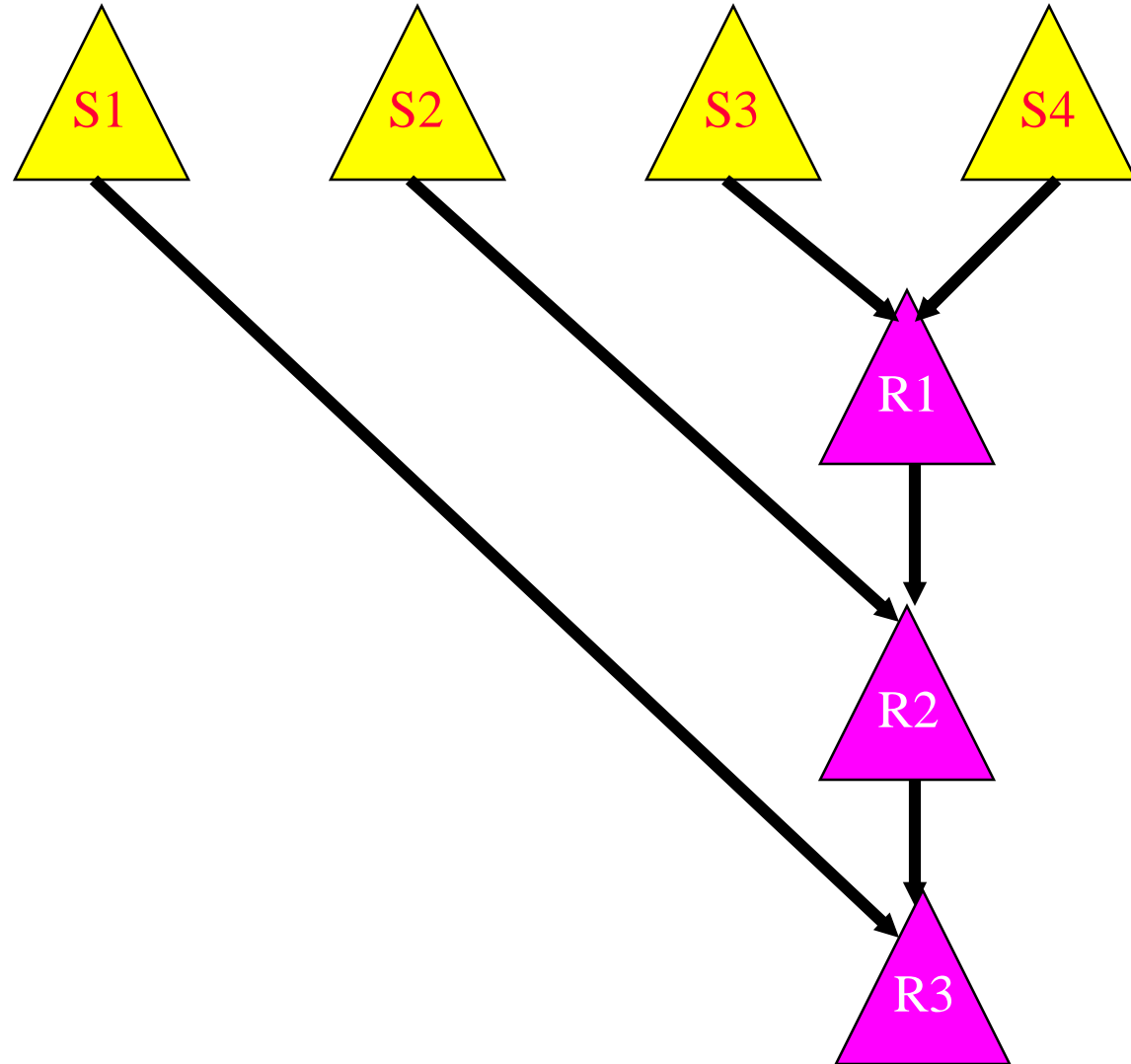
## Pass 1





# Two-Pass Scheme – Example

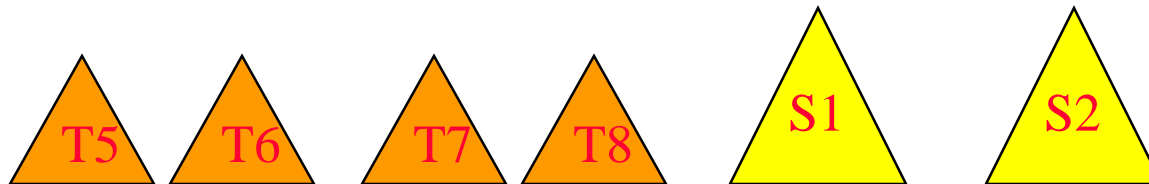
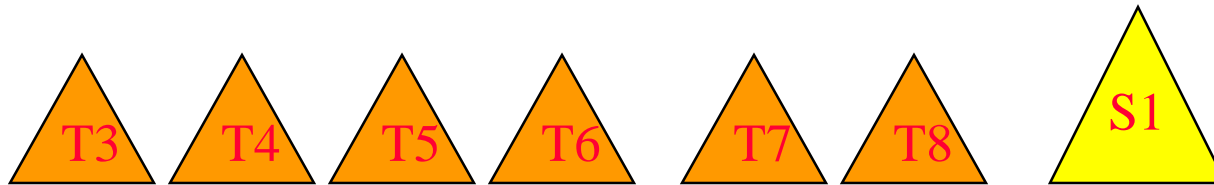
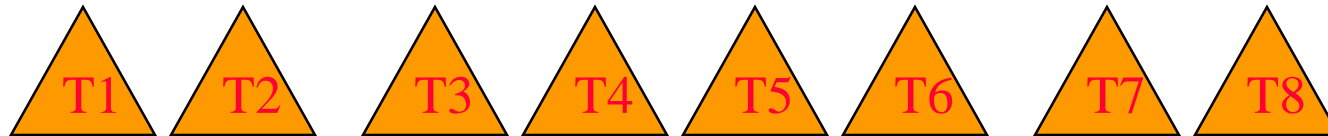
**Pass 2**



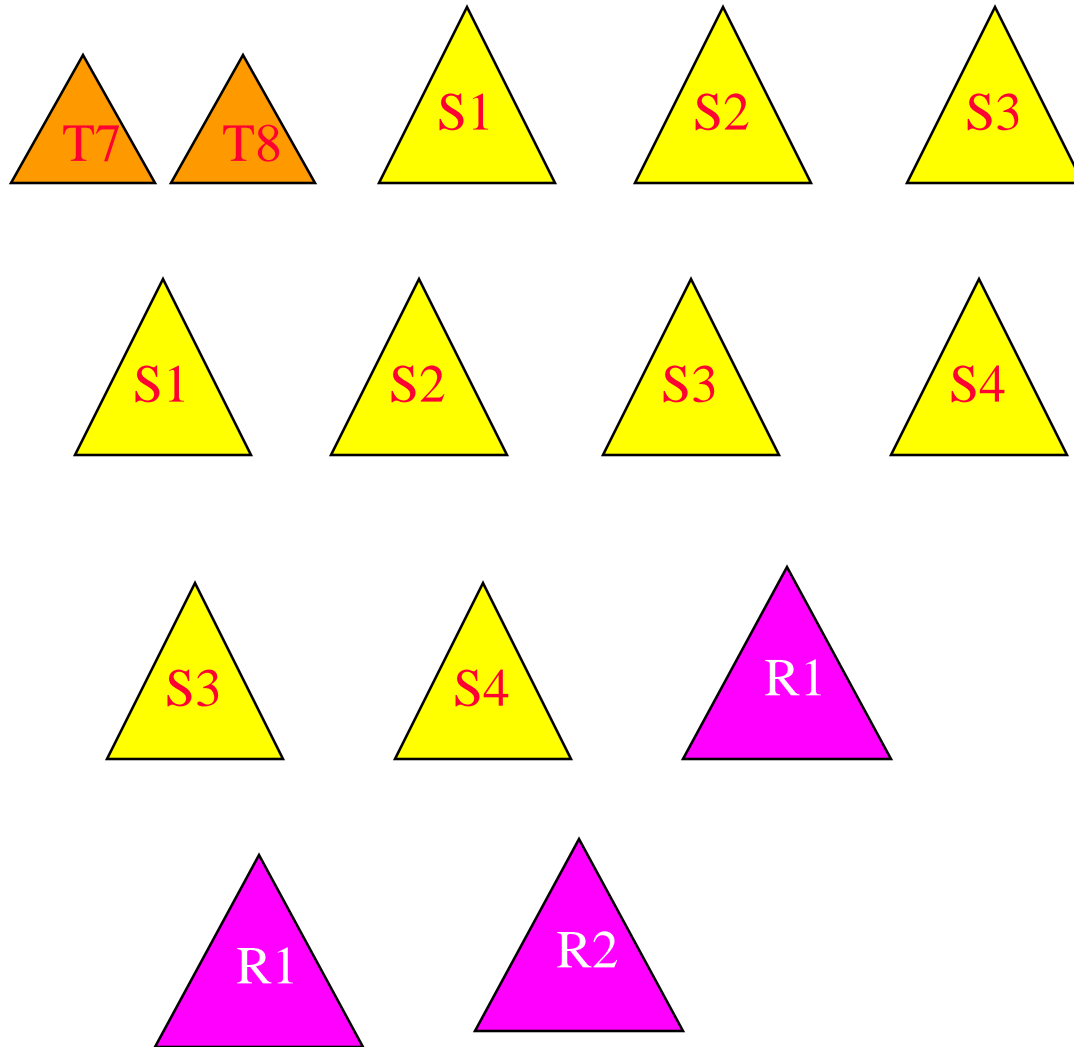
# Multipass Scheme

- Place the subtrees into a FIFO queue.
- Repeat until 1 tree remains.
  - Remove 2 subtrees from the queue.
  - Meld them.
  - Put the resulting tree onto the queue.

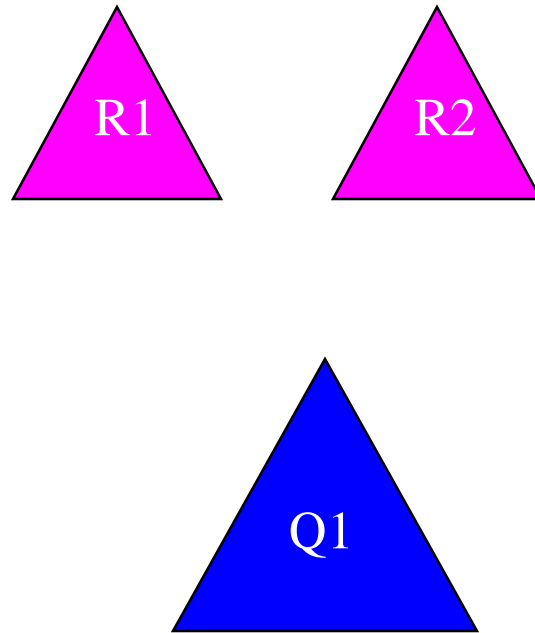
# Multipass Scheme – Example



# Multipass Scheme--Example



# Multipass Scheme--Example

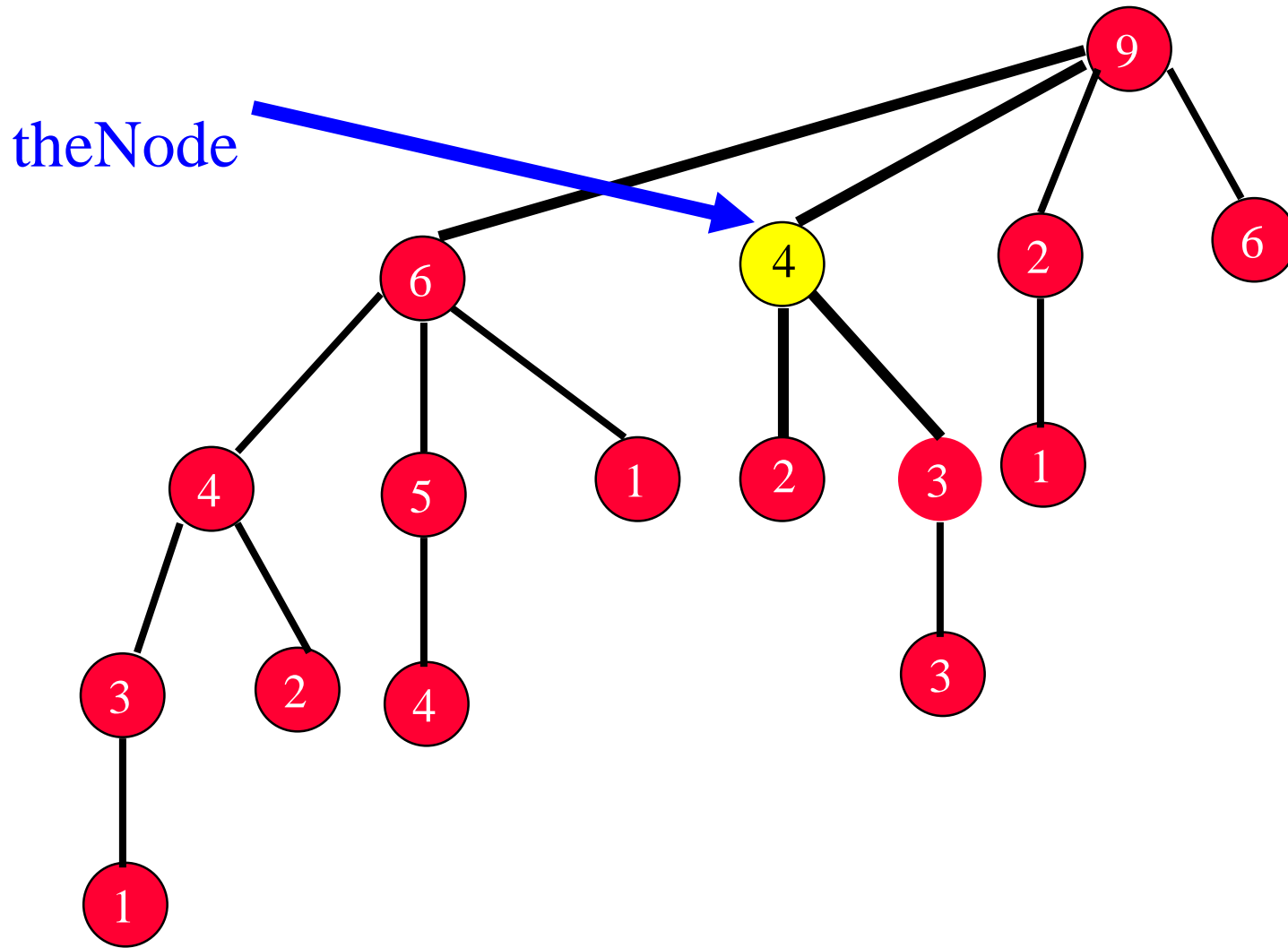


- Actual cost =  $O(n)$ .

# Delete Nonroot Element

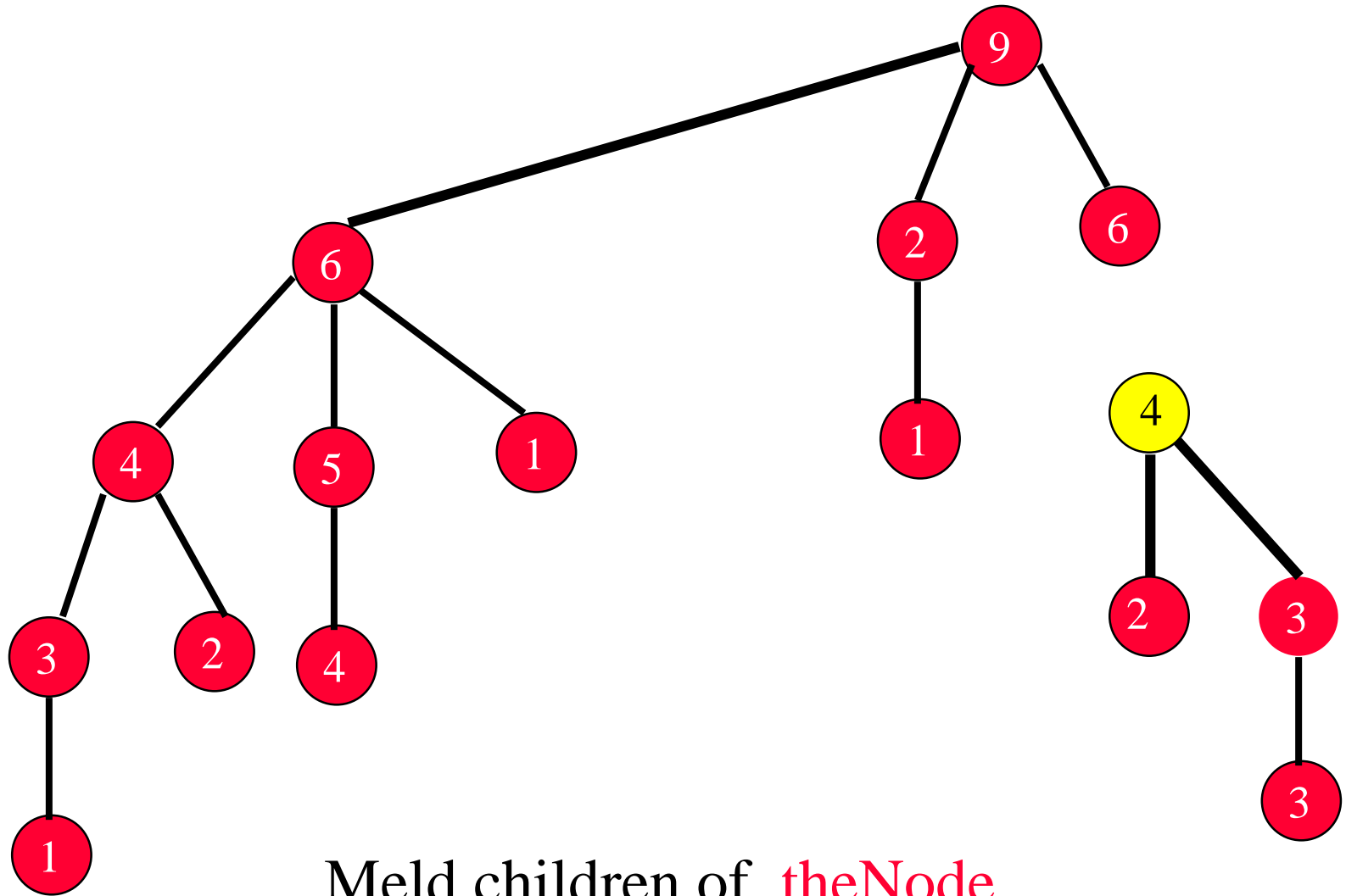
- Remove **theNode** from its sibling list.
- Meld children of **theNode** using either **2**-pass or multipass scheme.
- Meld resulting tree with what's left of original tree.

# Delete(theNode)



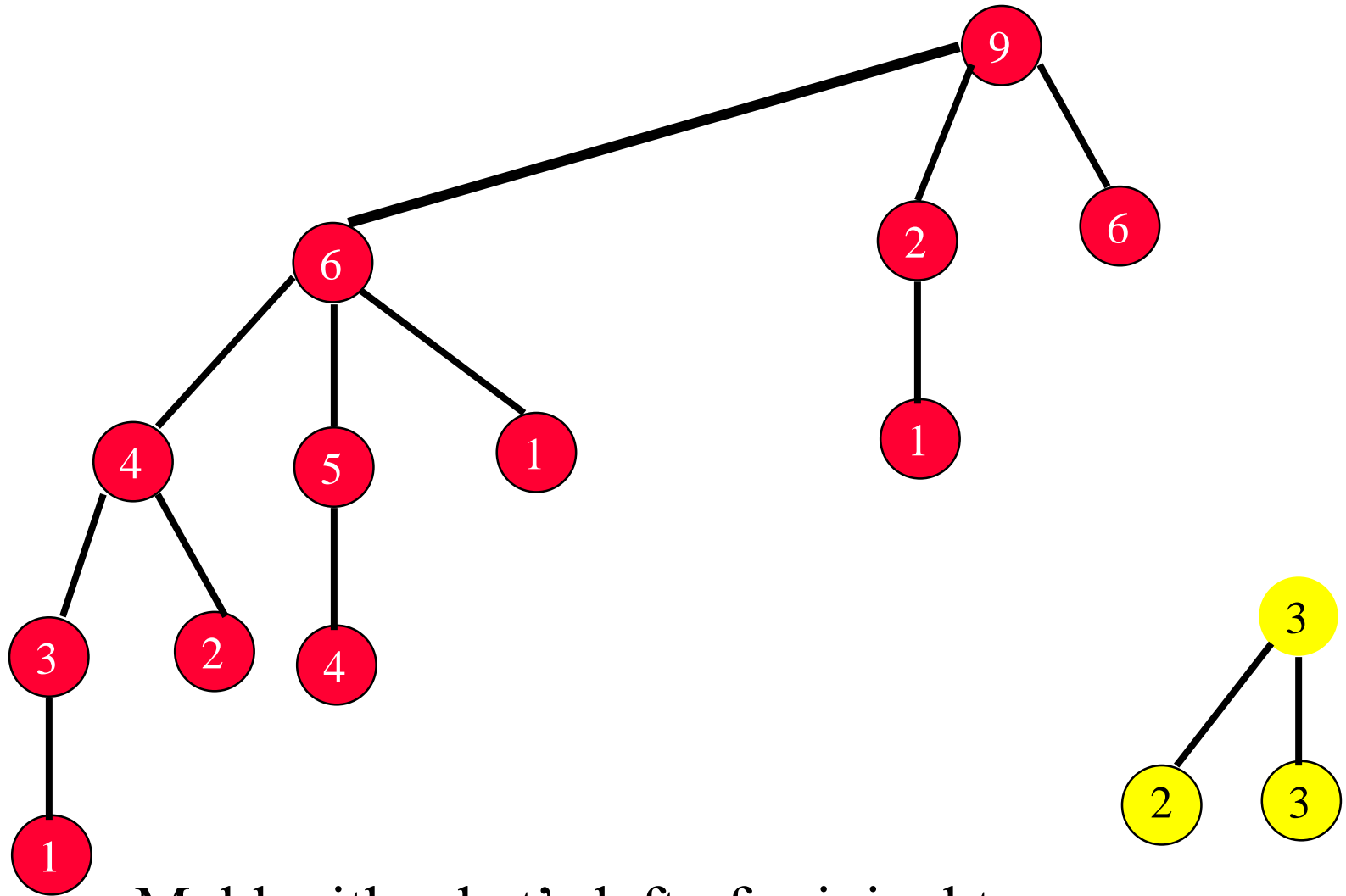
Remove **theNode** from its doubly-linked sibling list.

# Delete(theNode)



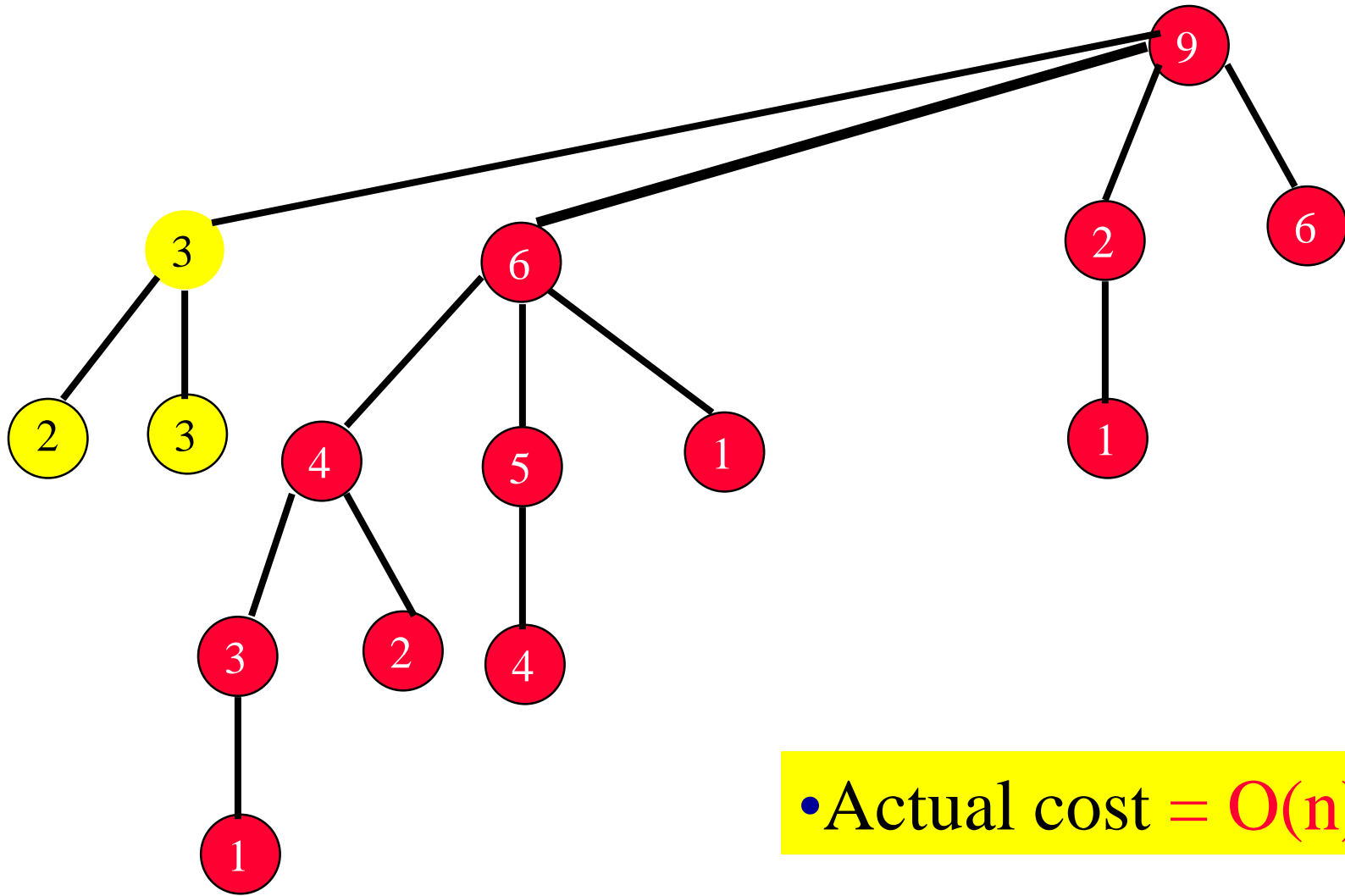


# Delete(theNode)



Meld with what's left of original tree.

# Delete(theNode)



• Actual cost =  $O(n)$ .