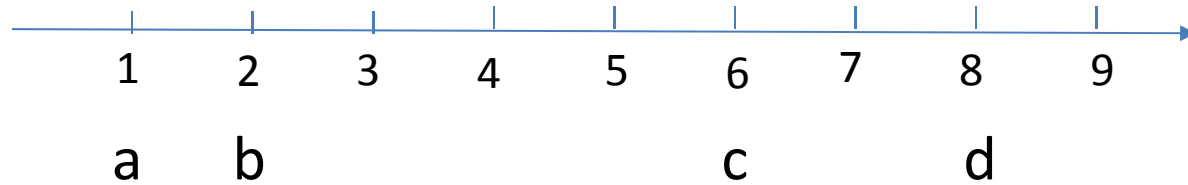


# Example of Hierarchical Clustering Using Heap

INF 553

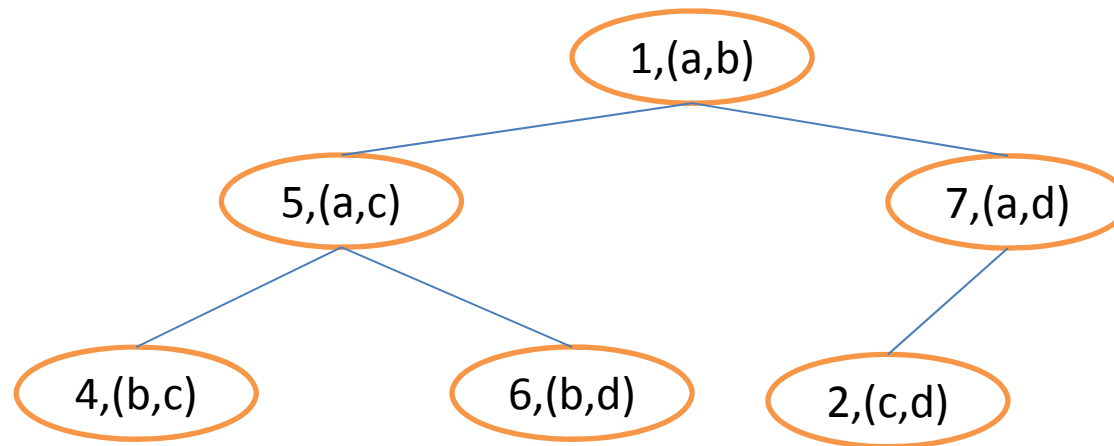
Wensheng Wu

# Clustering Problem

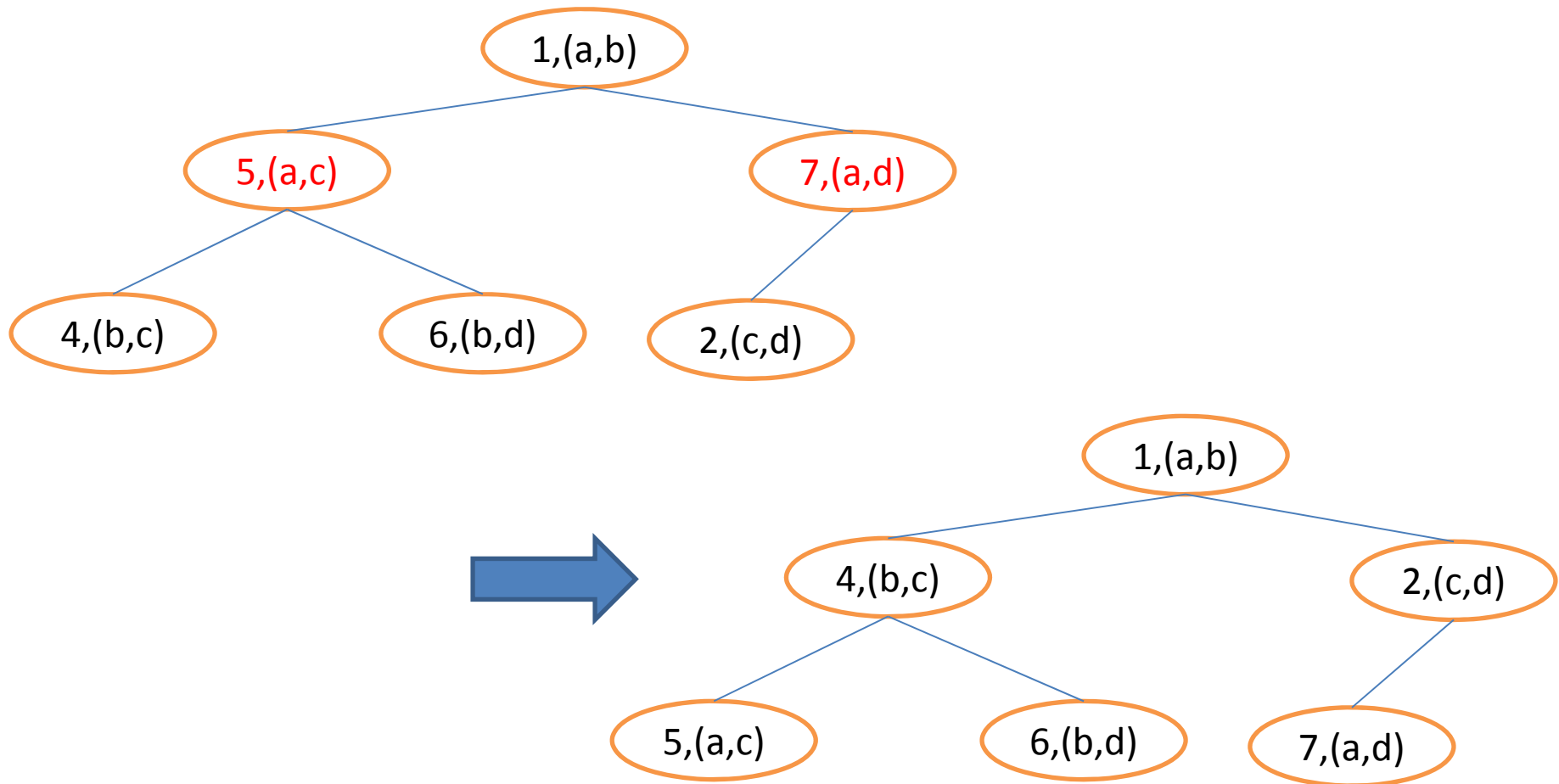


	b	c	d
a	1	5	7
b		4	6
c			2

# Initial Heap Before Heapified

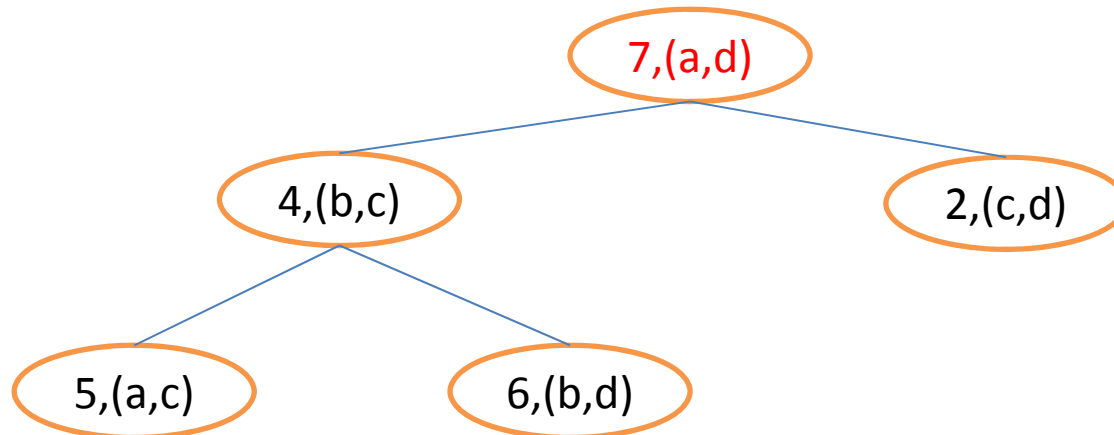
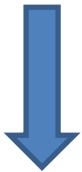
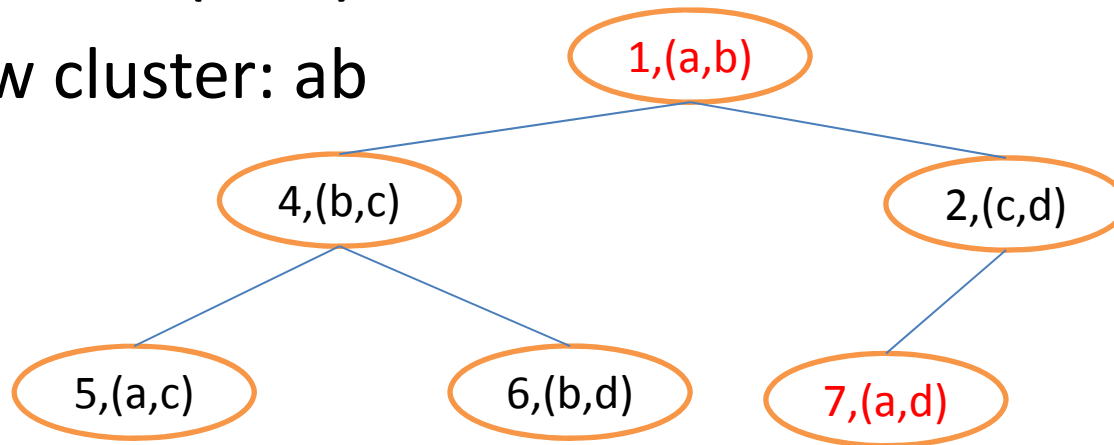


# After Heapified

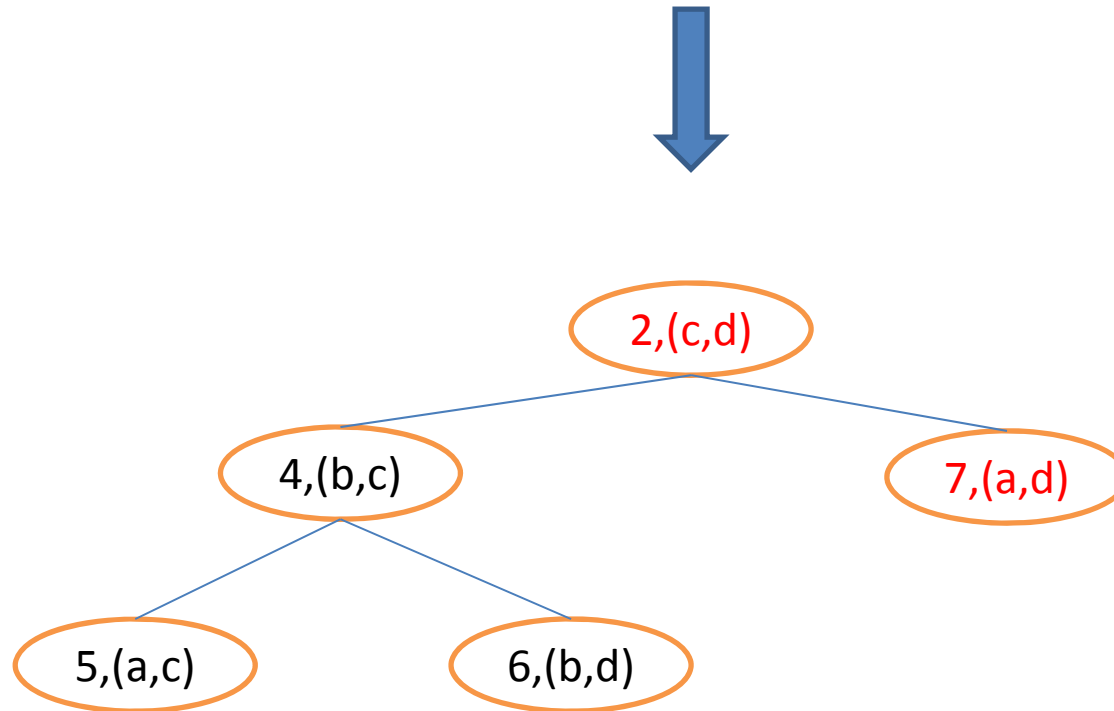


# After one merge

- Extract: 1, (a, b)
  - New cluster: ab

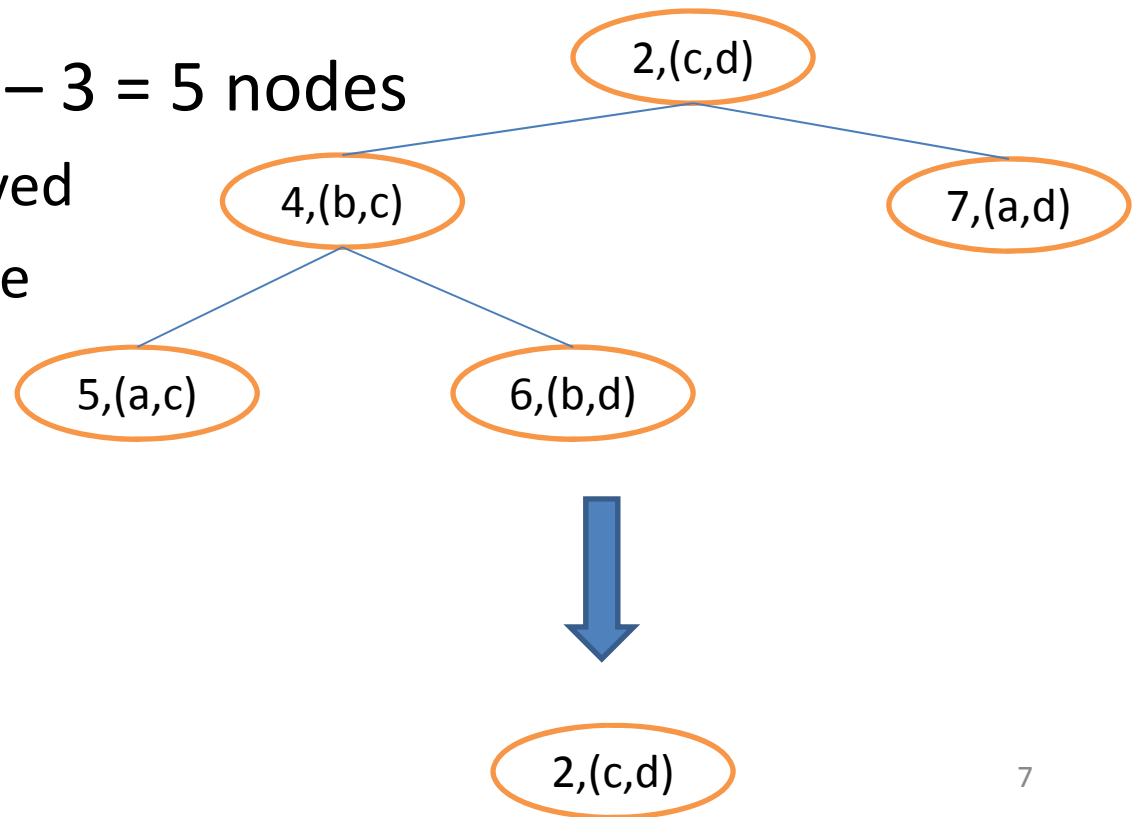


- Sifting root down



# Remove Nodes Having Old Clusters

- Need an index to know which nodes having a or b
  - # of clusters = 4
  - Need to remove  $2n - 3 = 5$  nodes
    - (a, b) already removed
    - Remove 4 more here



# Compute Distance of ab with c & d

	b	c	d
a	1	5	7
b		4	6
c			2

	c	d
ab	4	6
c		2

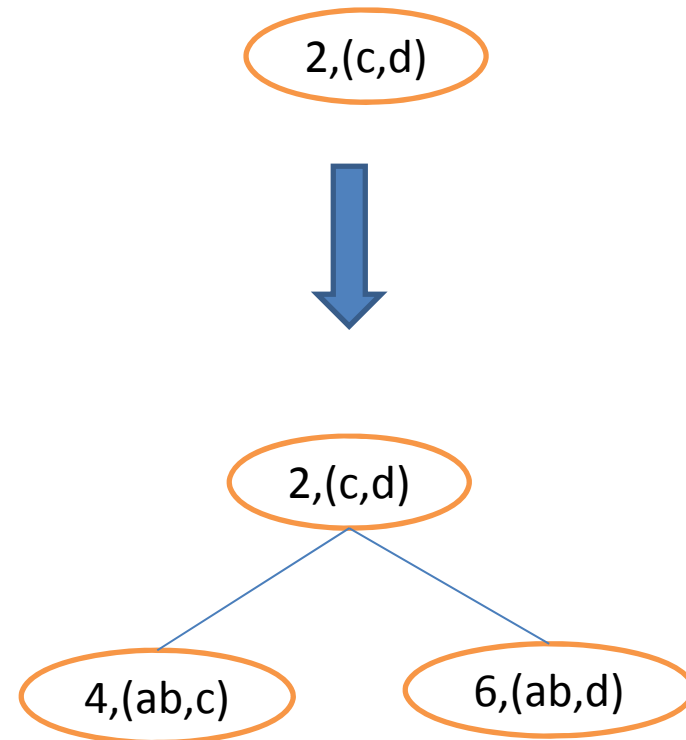
New





# Adding new pairs to heap

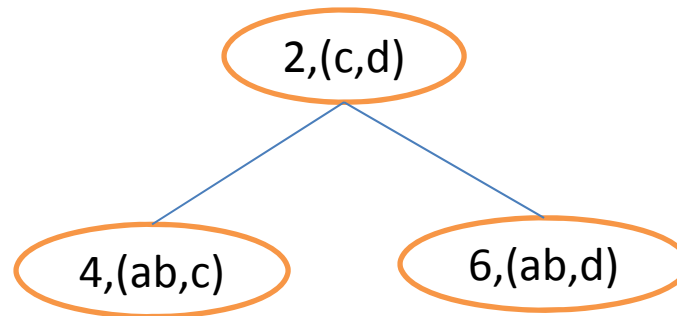
- # of clusters
  - before merge = 4 or  $n$
  - After merge = 3 or  $n - 1$ 
    - $ab, c, d$
- Add  $n - 2$  pairs
  - Dist btw  $ab$  and  $c$
  - Dist btw  $ab$  and  $d$



# Merging c and d

- Remove 2, (c, d)
- Remove all nodes involving c and d
  - $2k - 3 = 3$ , since  $k = 3$

⇒ Empty heap



Empty heap

# Adding new pairs to heap

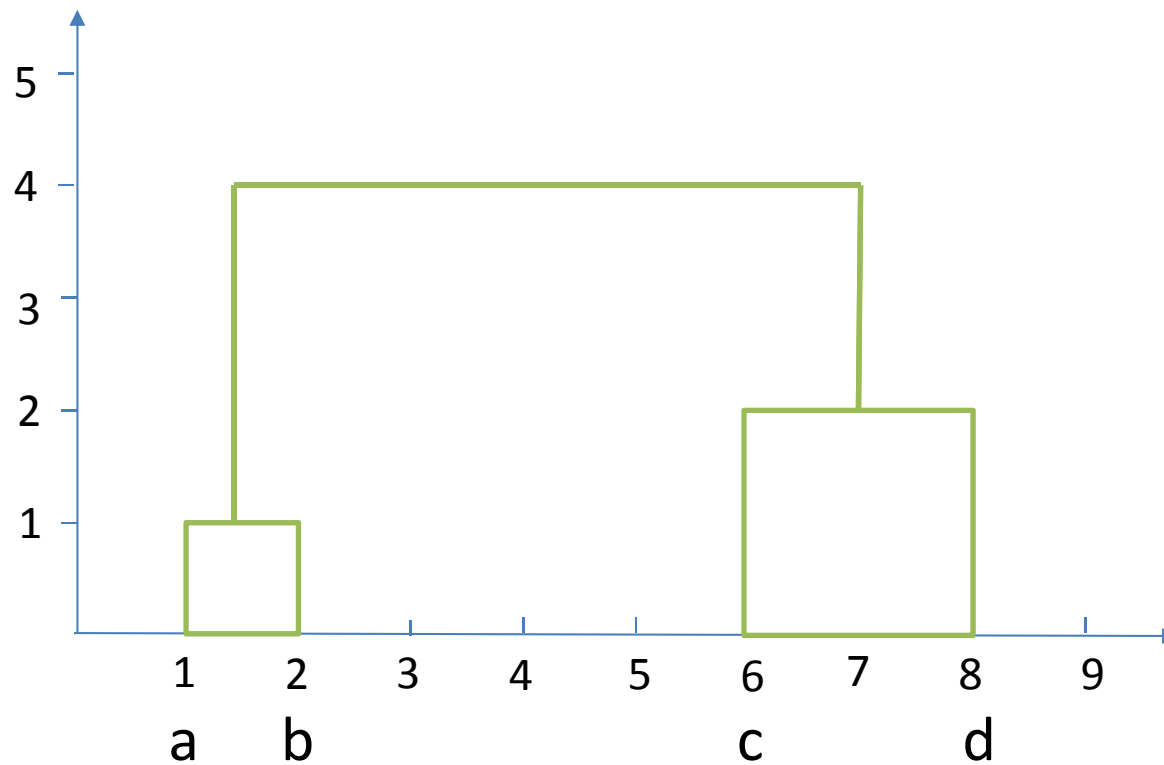
- Clusters: (ab) (cd)
  - Distance = dist btw b and c = 4

- Add to heap
  - Add  $k - 2 = 1$  node

4,(ab, cd)

- Final merge  $\Rightarrow$  (abcd)

# Dendrogram

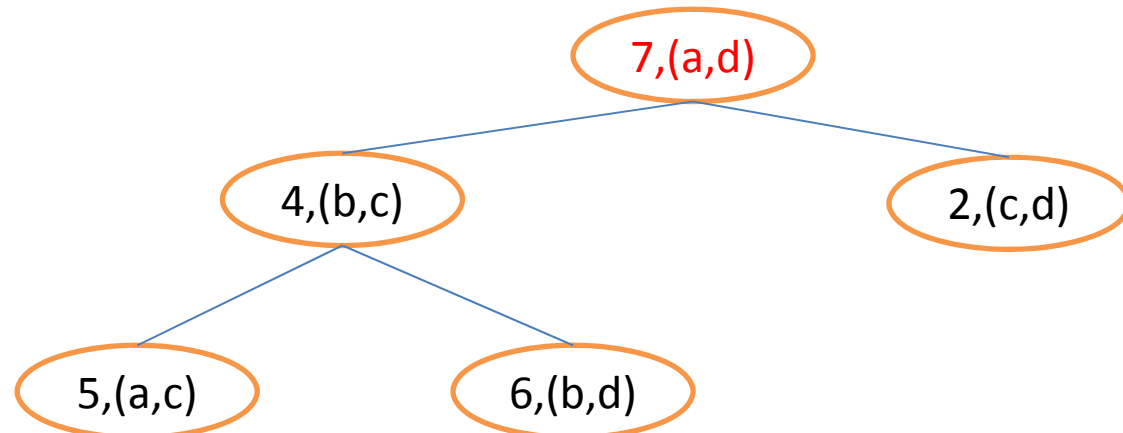
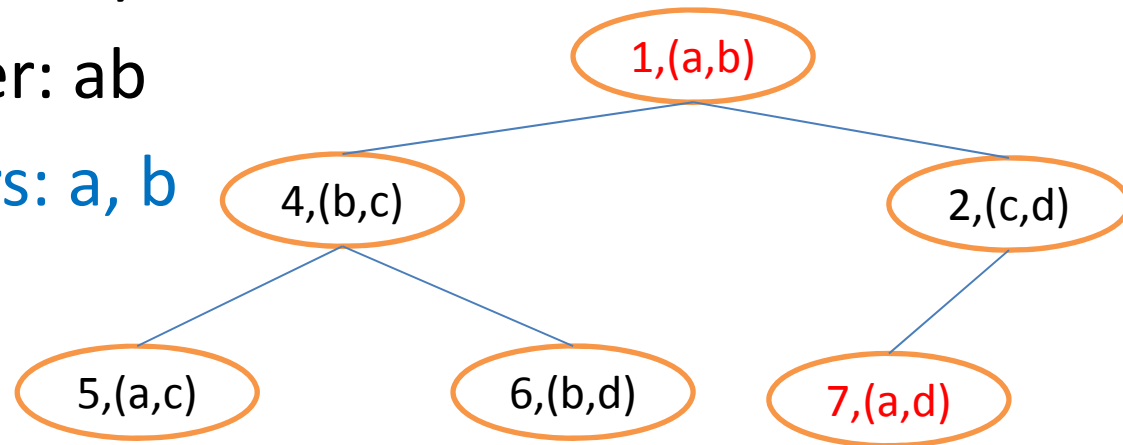


# Using Lazy Deletion

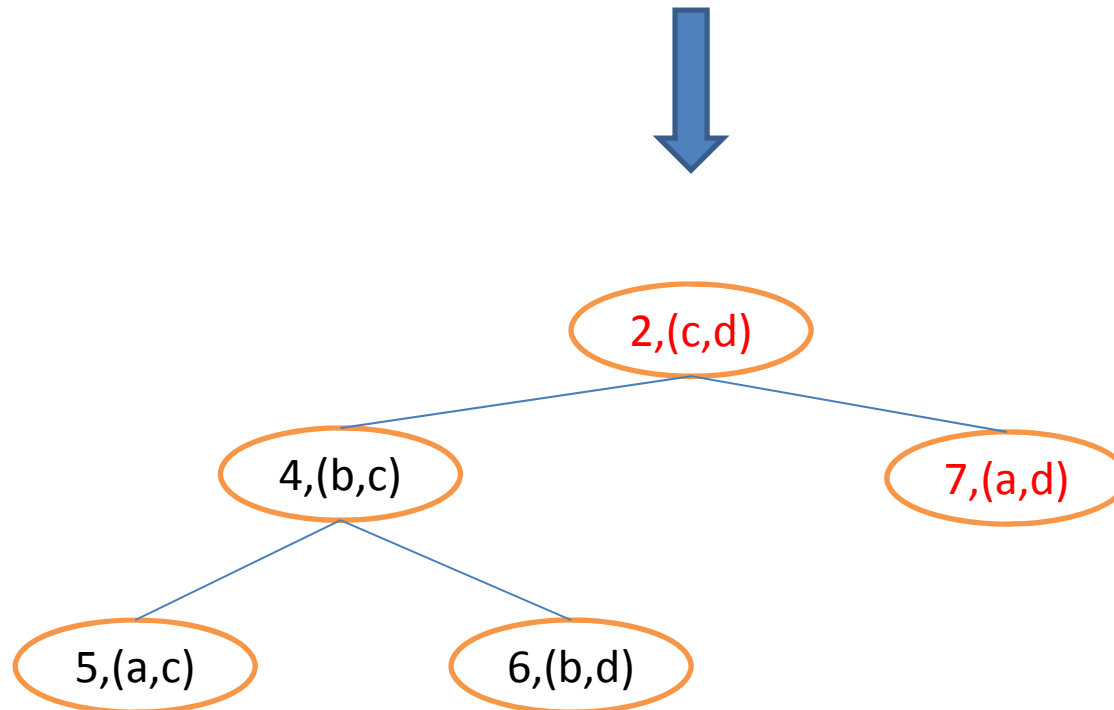
- Do not remove nodes that involve old clusters
- Until they show up at the root
  - When doing ExtractMin

# After one merge

- Extract: 1, (a, b)
  - New cluster: ab
  - Old clusters: a, b

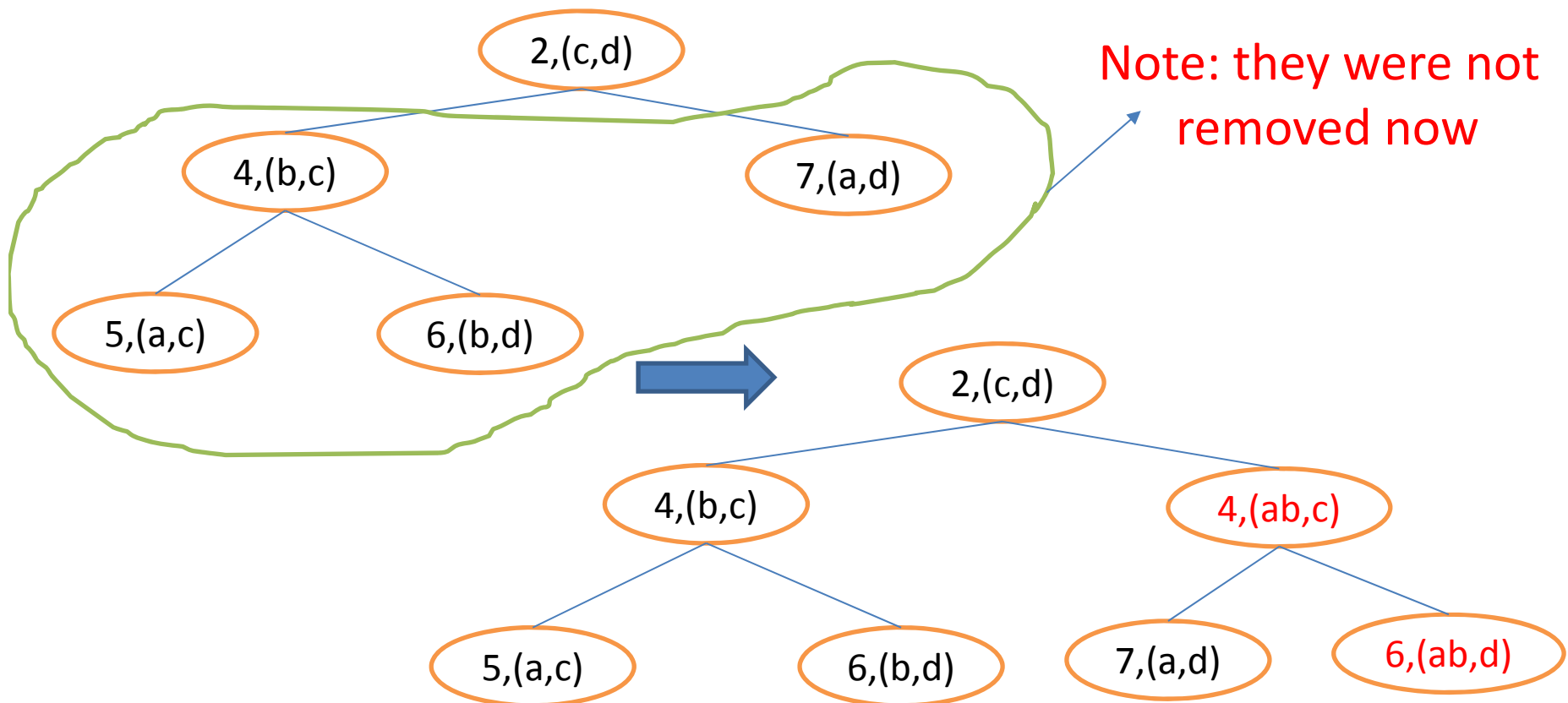


- After sifting root down



# Add Pairs for New Cluster ab

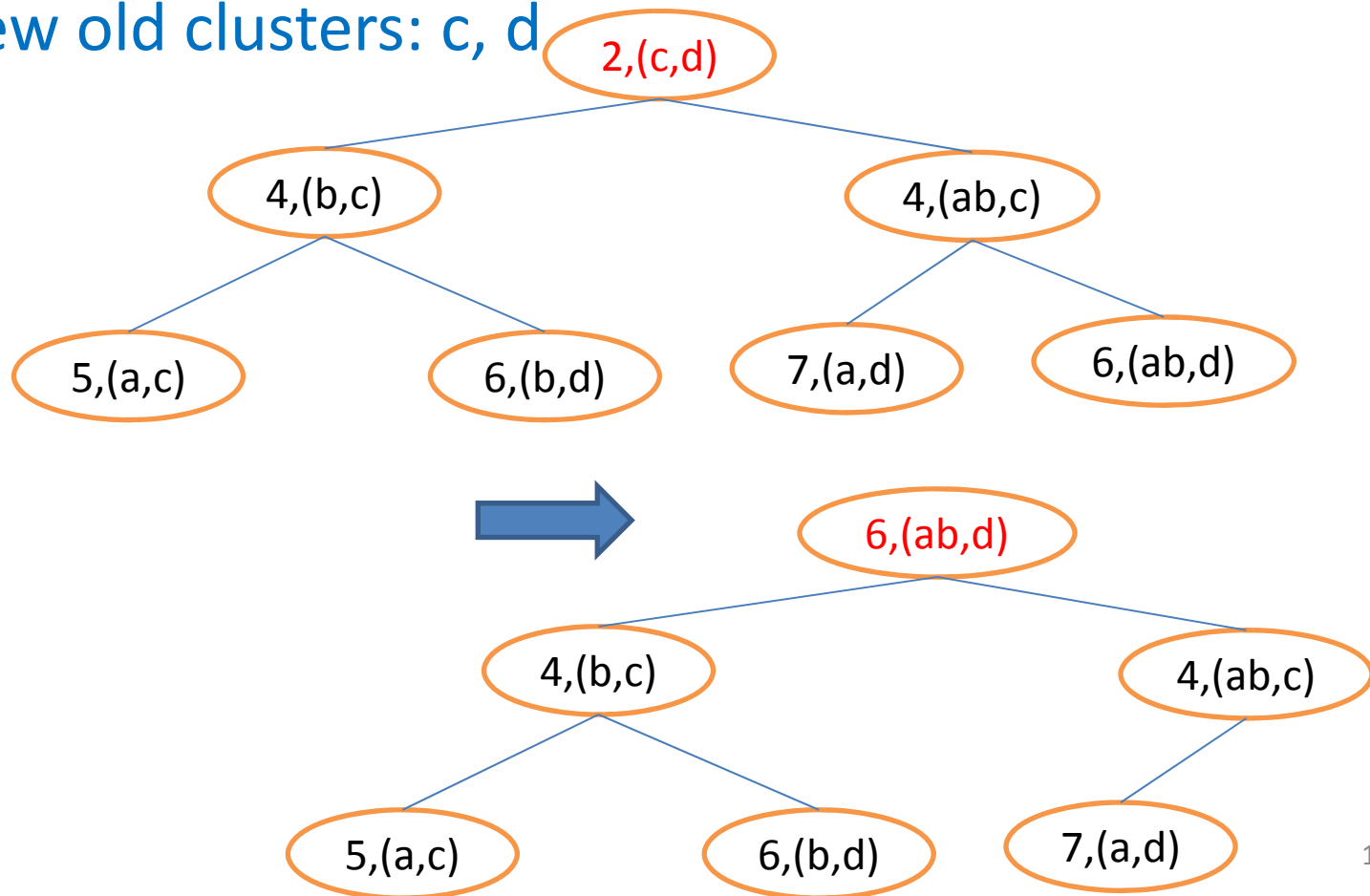
- 4, (ab, c) and 6, (ab, d): sifting up if needed





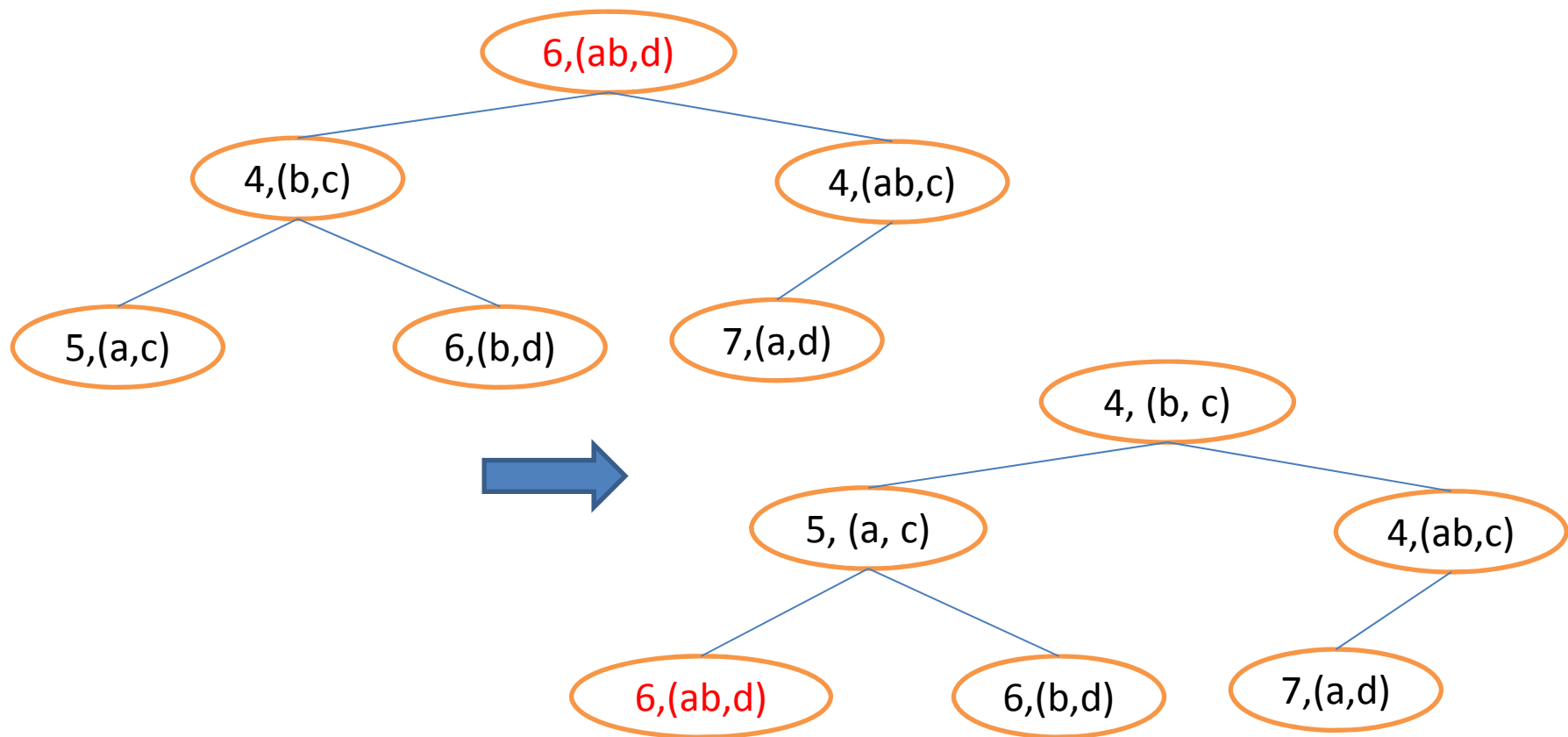
# Second Merge

- Extract 2, (c, d), i.e., merge c and d
  - Move last leaf to root and sift down (next slide)
  - New old clusters: c, d



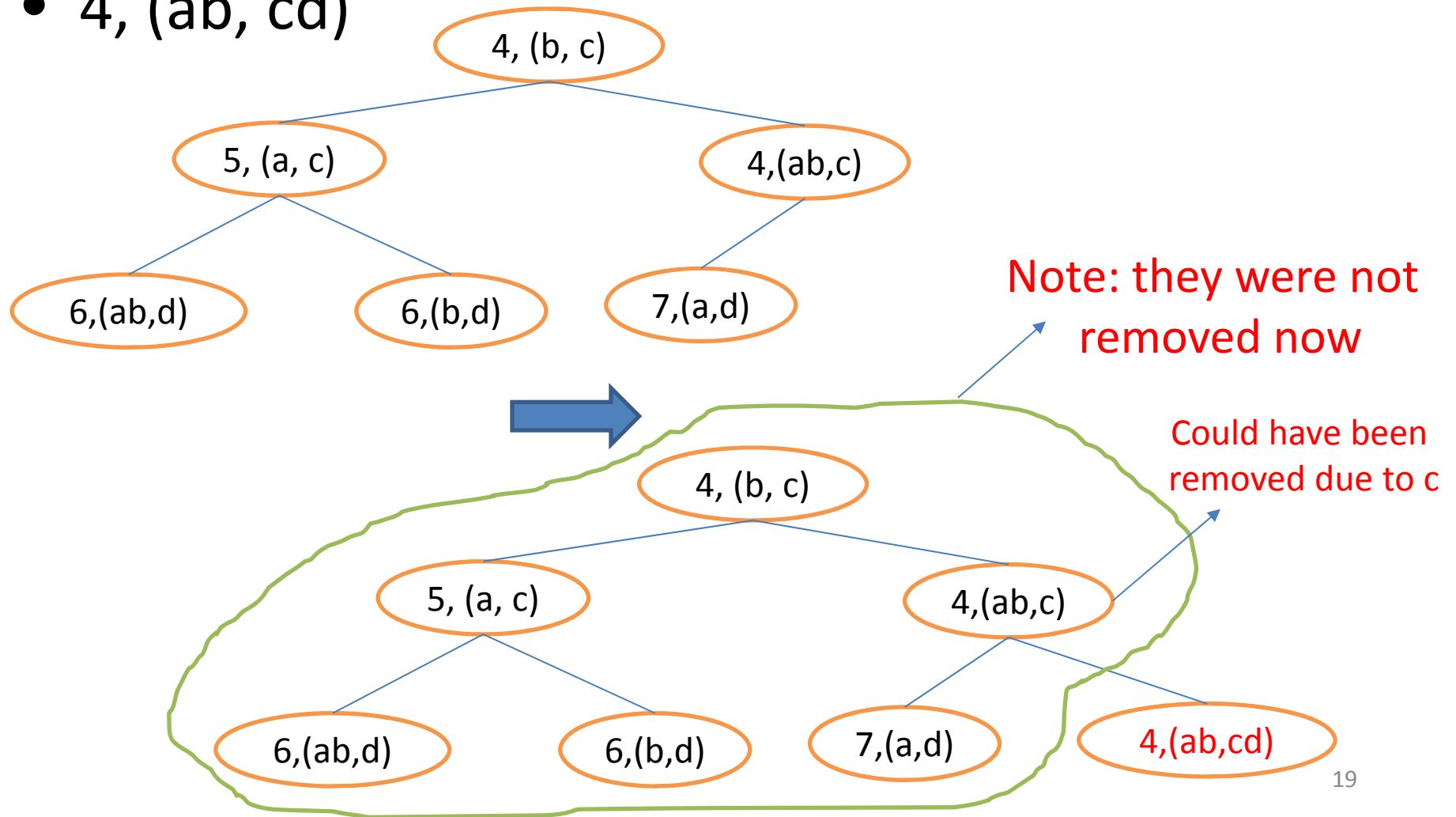
# Sift down root

- Can go either way, say left



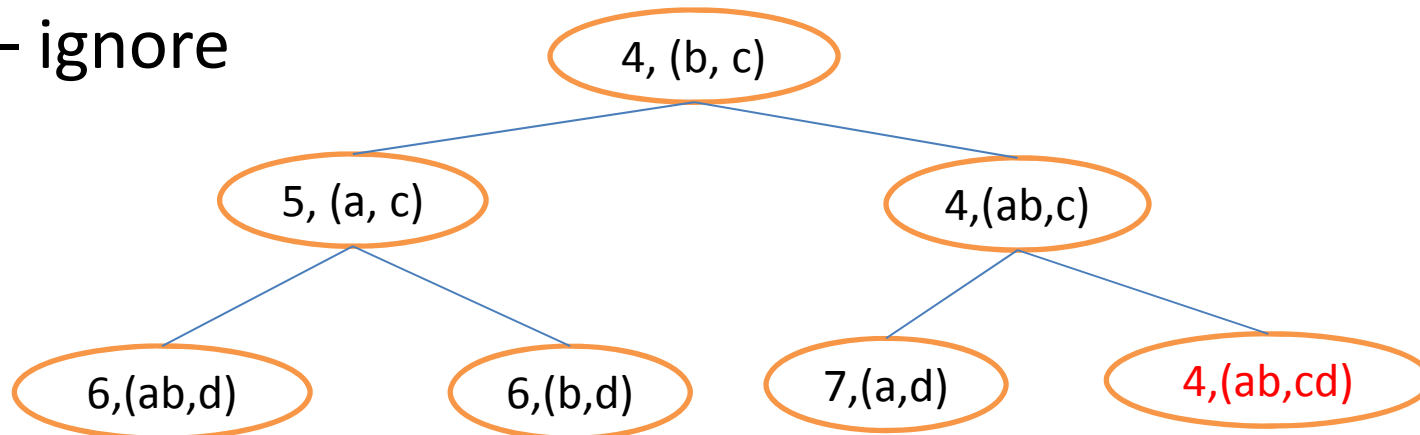
# Add Pairs for New Cluster cd

- 4, (ab, cd)

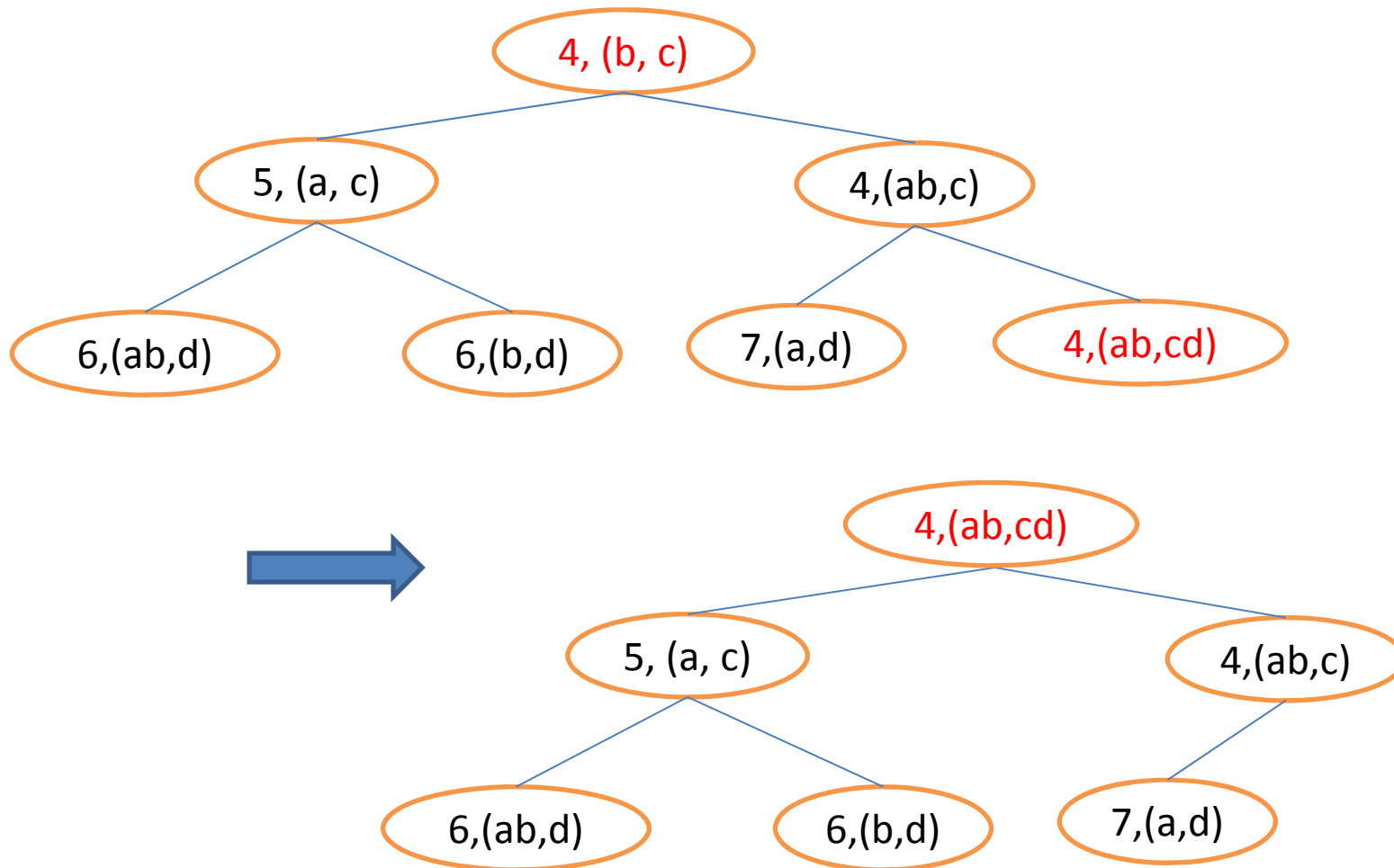


# Find Next Two Clusters Merge

- Old clusters: a, b, c, d
  - A & b merged into ab, c & d  $\Rightarrow$  cd
- Extract 4, (b, c)
  - found out it is for old cluster
  - ignore



# After Exacting 4, (b, c)



# Found a Qualified Pair

- Extract 4, (ab, cd)

