

CSE 105: Data Structures and Algorithms-I (Part 2)

Instructor
Dr Md Monirul Islam

Graphs and Trees: Representation and Search

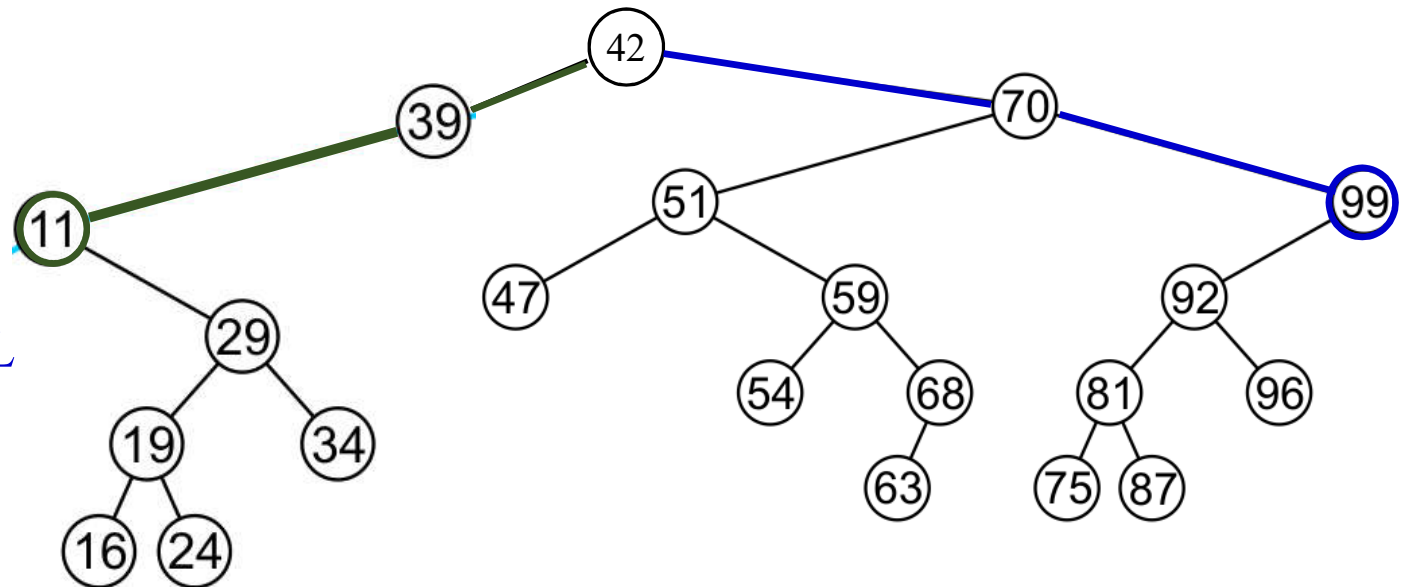
BST Operation: Minimum and Maximum

Review

Complexity: $O(h)$

```
TREE_MINIMUM(x)
1 if x == NULL return NULL
2 while x->left != NULL
3   x = x->left
4 return x
```

```
TREE_MAXIMUM(x)
1 if x == NULL return NULL
2 while x->right != NULL
3   x = x->right
4 return x
```

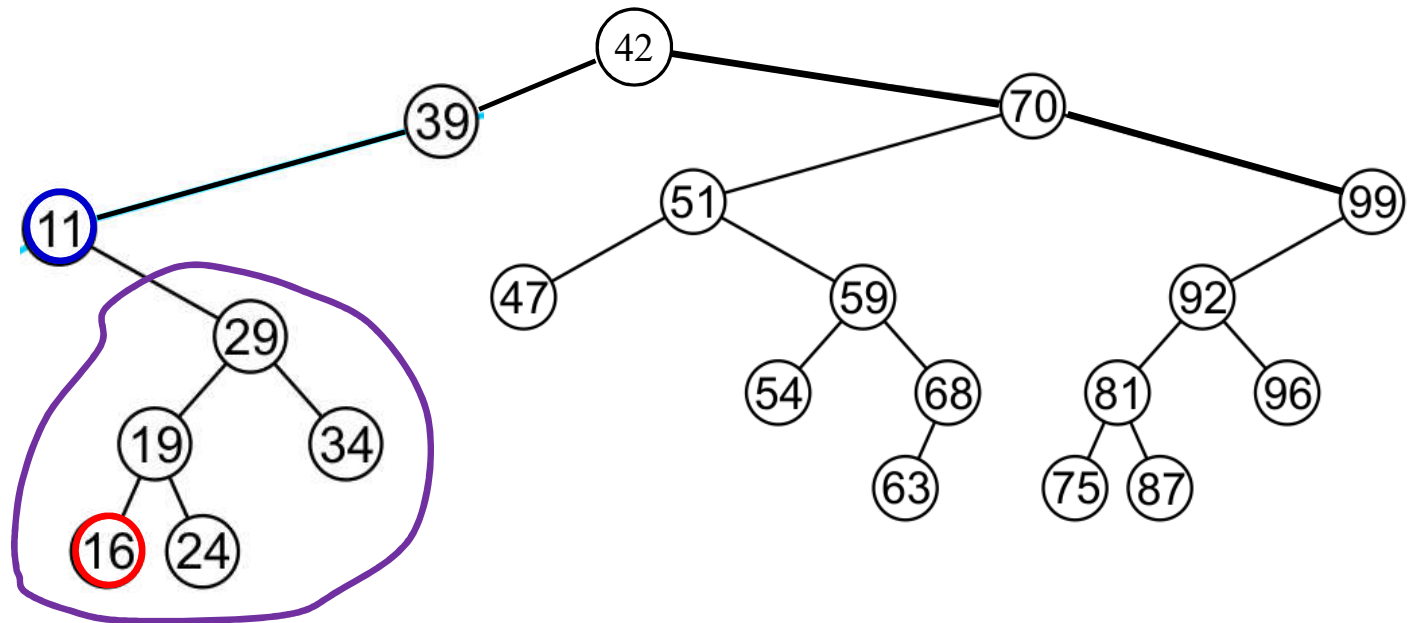


BST Operation: Successor

Review

successor of a node x : the node with the **smallest key** greater than $x.key$

successor of the node with 11 : **the node with 16** (minimum of right subtree)



BST Operation: Successor

Review

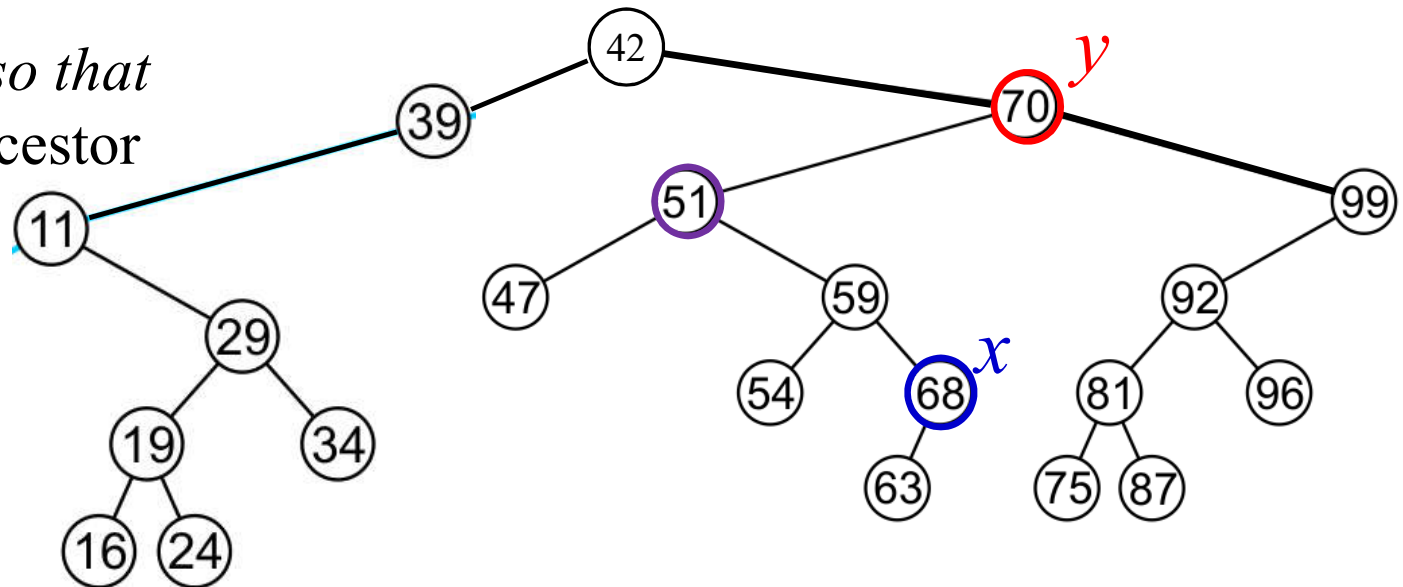
successor of a node x : the node with the **smallest key** greater than $x.key$

successor of the node with 68 : **the node with 70** (right subtree is NULL)

y is successor of x

y is lowest ancestor of x so that

y 's left child is also an ancestor of x



BST Operation: Deletion

Review

A node being deleted is **not always** going to be a leaf node

There are **three** possible scenarios:

- The node is a **leaf node**
- It **has** exactly **one child**, or
- It has **two children** (it is a full node)

BST Operation: Deletion

Review

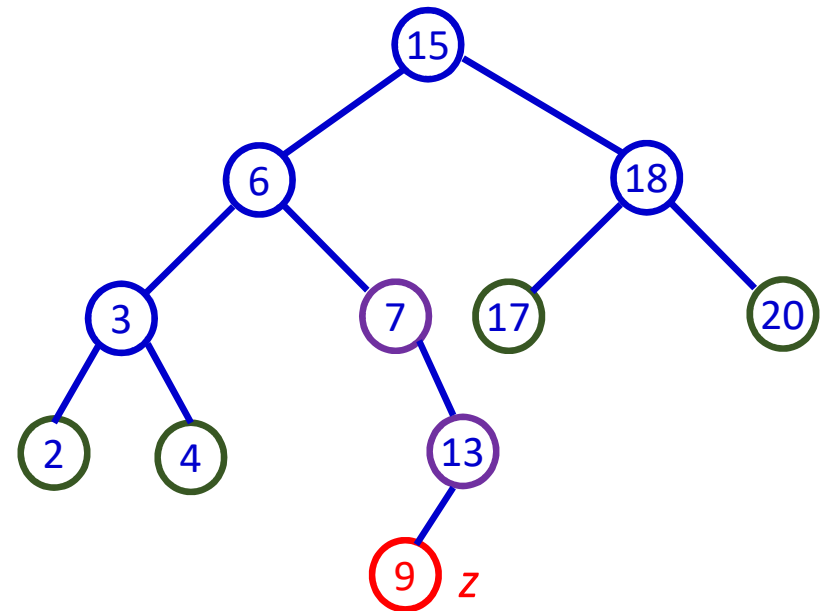
Removing a **leaf node**

Set left pointer of 13 as NULL

If $z == z \rightarrow \text{parent} \rightarrow \text{left}$

$z \rightarrow \text{parent} \rightarrow \text{left} = \text{NULL}$

else $z \rightarrow \text{parent} \rightarrow \text{right} = \text{NULL}$



BST Operation: Deletion

Review

Removing a node with exactly **one child**

Remove **node** with **key 13** which has a **left subtree ONLY**

Promote the left subtree

If $z \rightarrow \text{left} = \text{NULL}$

$x = z \rightarrow \text{right}$

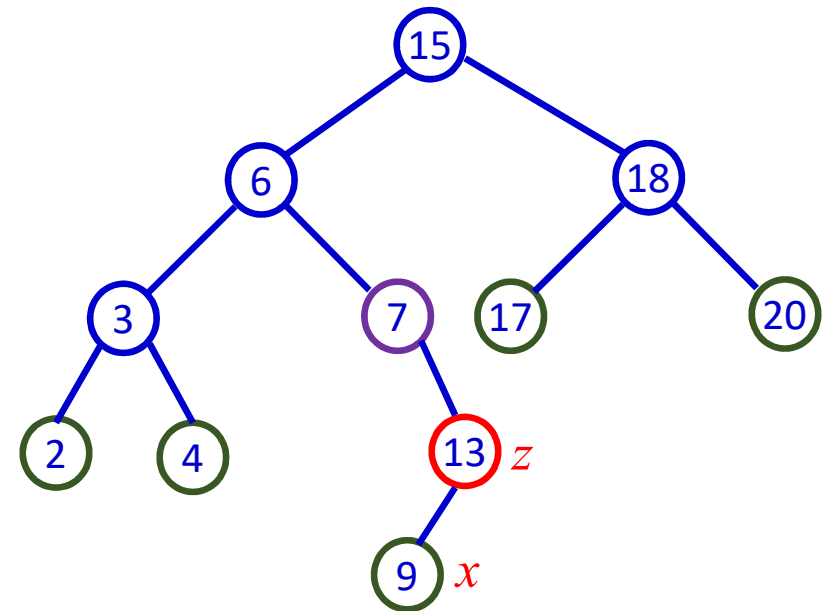
else $x = z \rightarrow \text{left}$

If $z == z \rightarrow \text{parent} \rightarrow \text{left}$

$z \rightarrow \text{parent} \rightarrow \text{left} = x$

else $z \rightarrow \text{parent} \rightarrow \text{right} = x$

$x \rightarrow \text{parent} = z \rightarrow \text{parent}$



BST Operation: Deletion

Review

Removing a node with exactly **one** child

Remove **node** with **key 7** which has a **RIGHT** subtree **ONLY**

If $z \rightarrow \text{left} = \text{NULL}$

$x = z \rightarrow \text{right}$

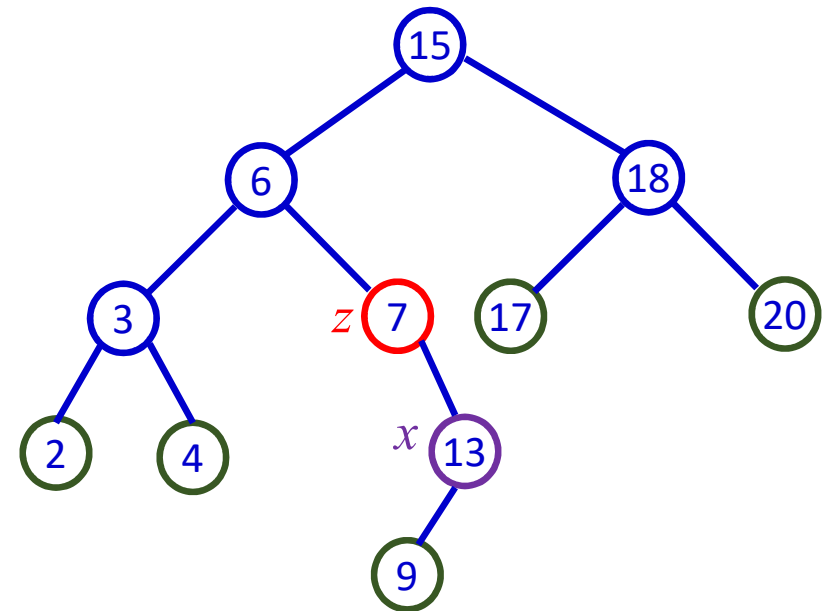
else $x = z \rightarrow \text{left}$

If $z == z \rightarrow \text{parent} \rightarrow \text{left}$

$z \rightarrow \text{parent} \rightarrow \text{left} = x$

else $z \rightarrow \text{parent} \rightarrow \text{right} = x$

$x \rightarrow \text{parent} = z \rightarrow \text{parent}$



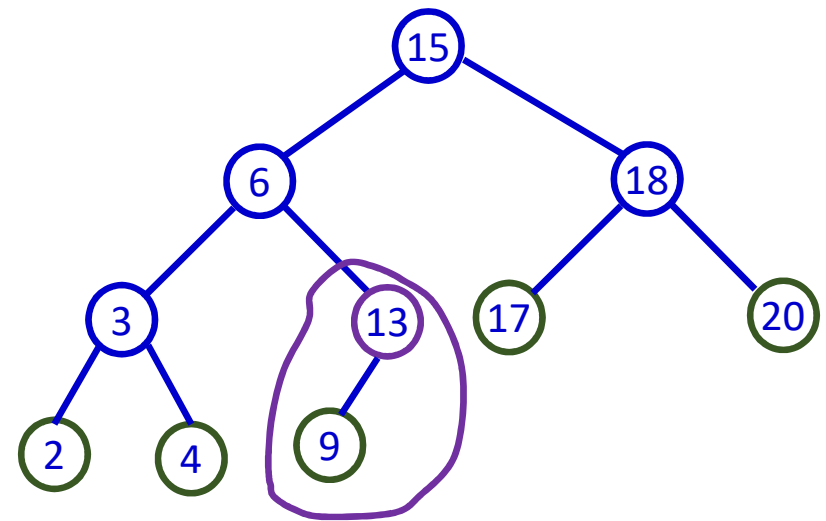
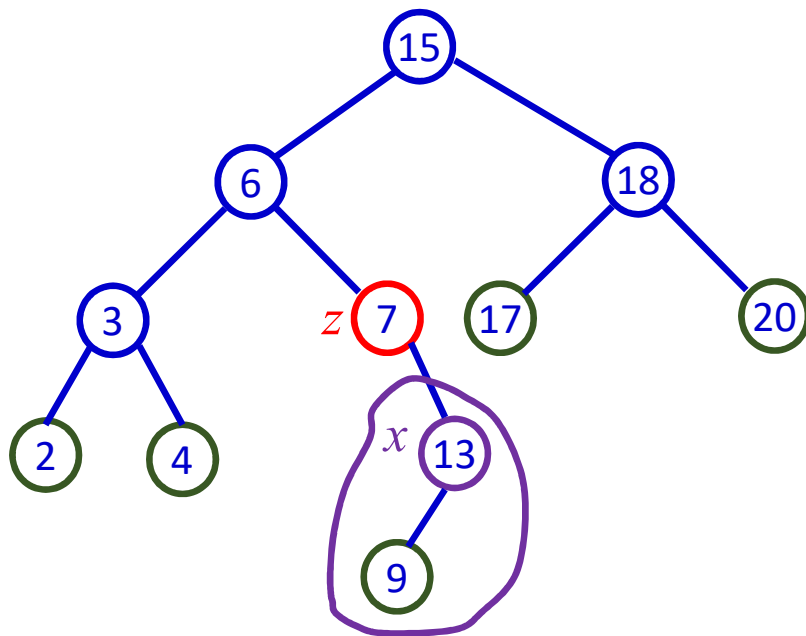
BST Operation: Deletion

Review

Removing a node with exactly **one** child

Remove **node** with **key 7** which has a **RIGHT** subtree **ONLY**

BST property holds



BST Operation: Deletion

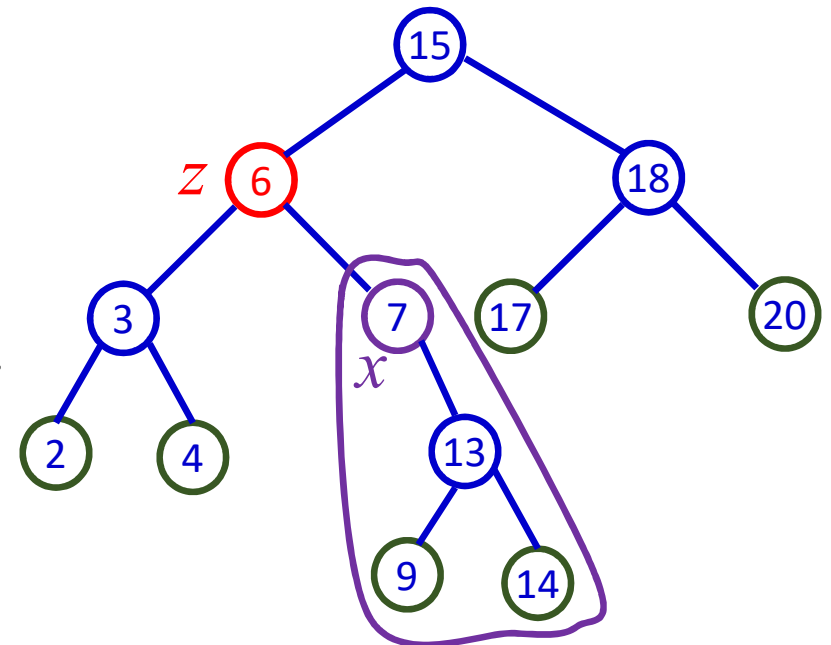
Removing a node having **two children** (full node)

Remove node with **6**

the **successor** is minimum in the **right** subtree

The minimum will be a **leaf node** OR
a **node with NO left child**

*If x would have a left child
that would be the minimum of the subtree*



Review

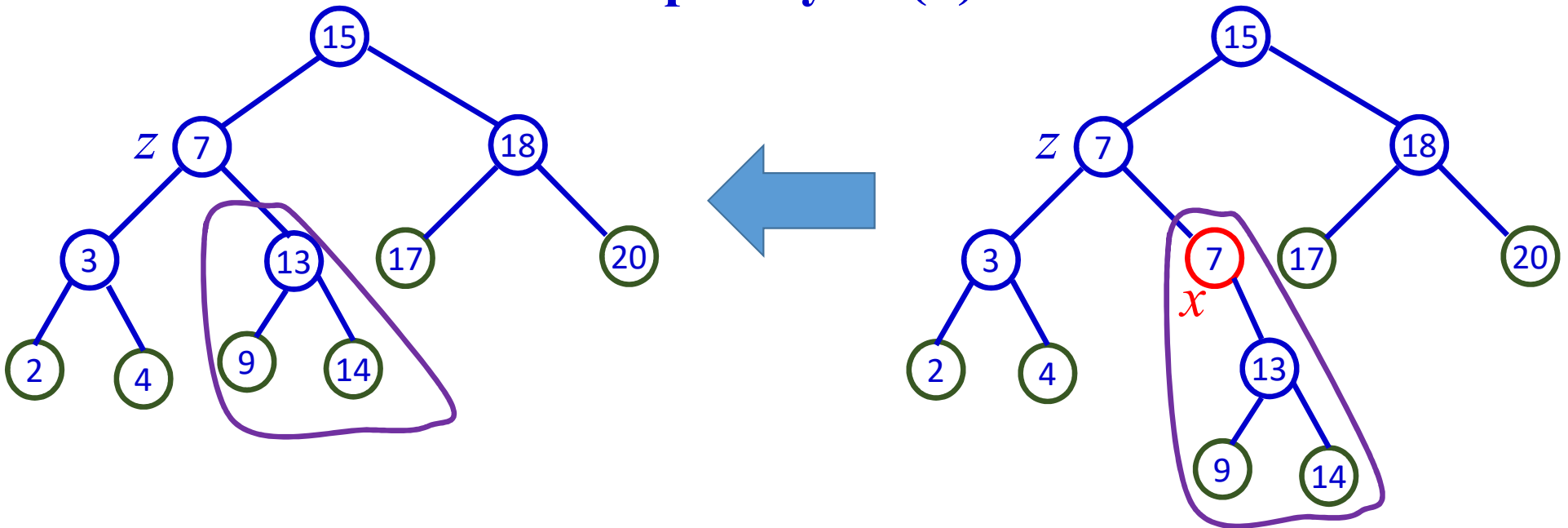
BST Operation: Deletion

Removing a node having **two children** (full node)

Remove node with **6**

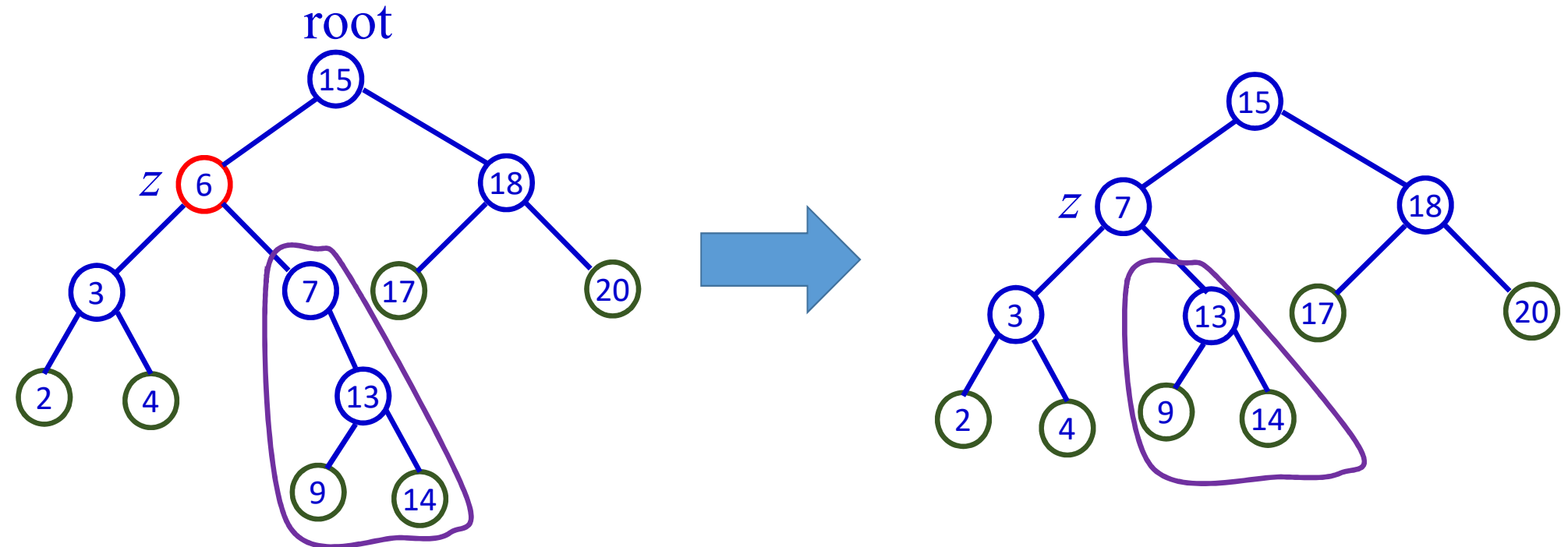
Review

Complexity: $O(h)$



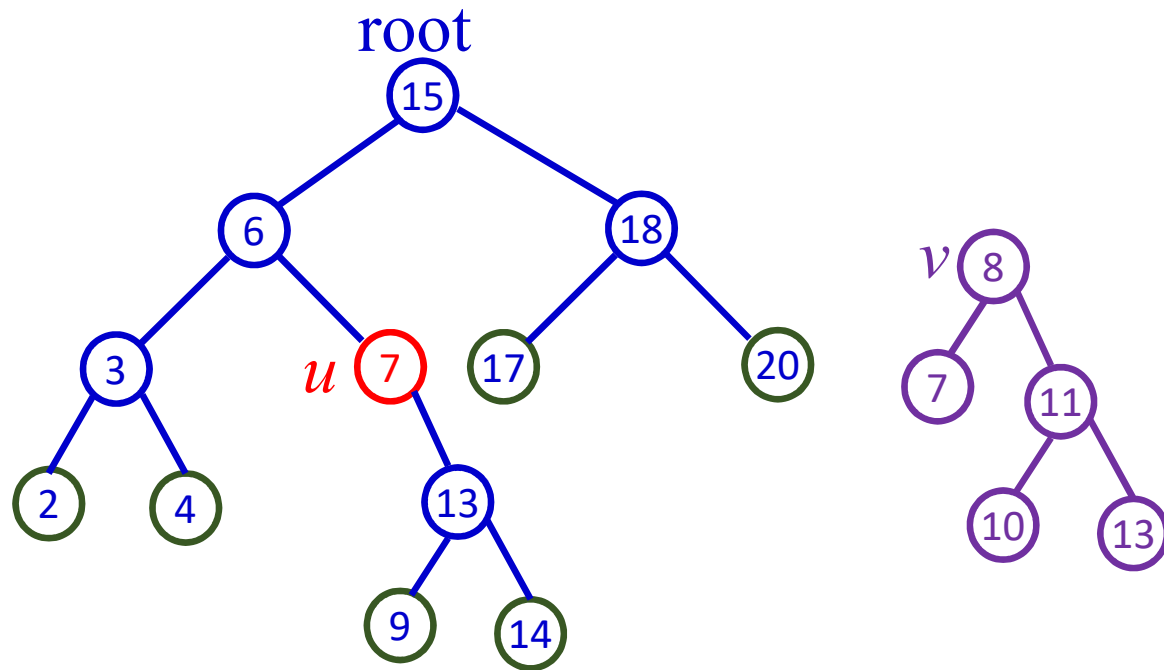
BST Operation: Deletion (2)

Removes a node directly even if it has two children (full node)



BST Operation: Deletion (2)

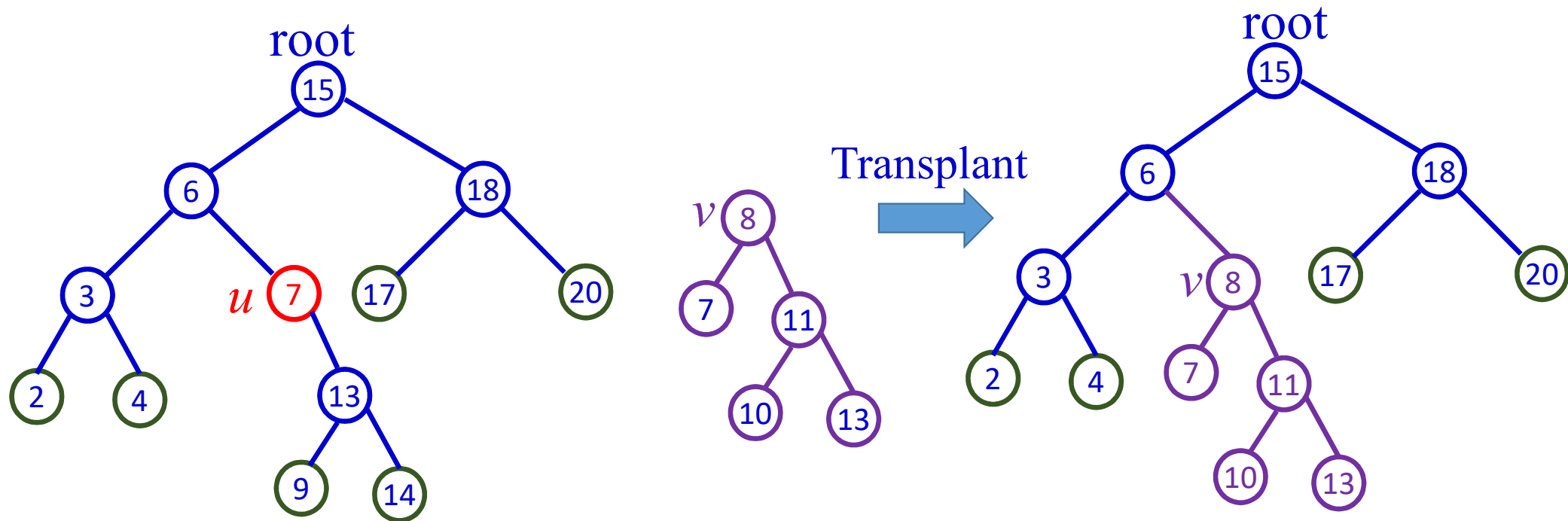
First try to replace node u by node v



BST Operation: Deletion (2)

First try to replace node u by node v

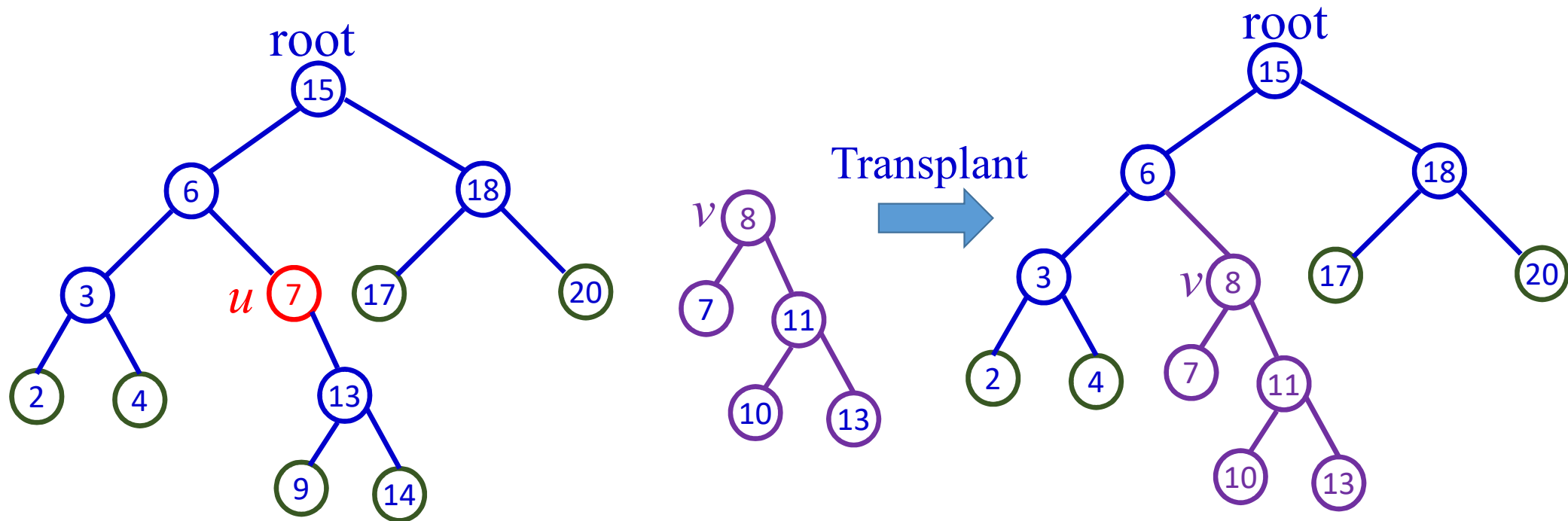
Removes a node directly even if it has **two children** (full node)



BST Operation: Deletion (2)

Removes a node directly even if it has two children (full node)

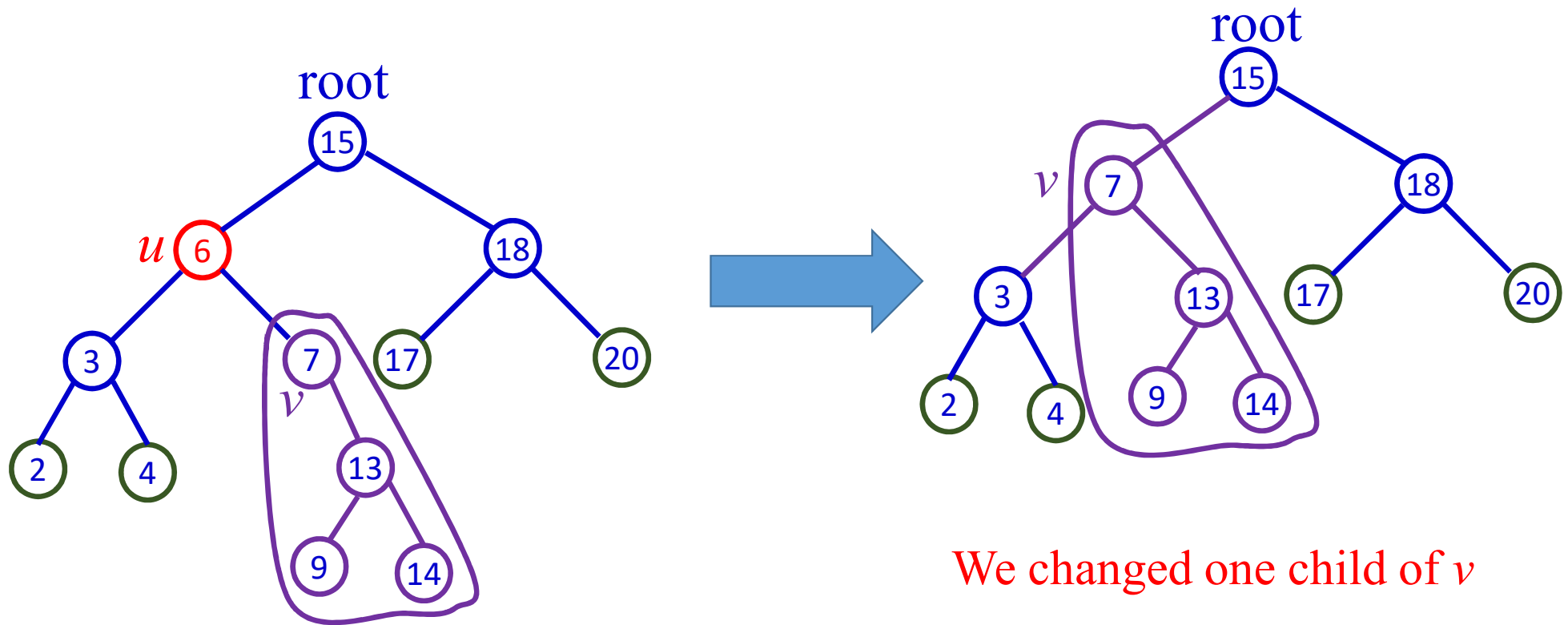
First try to replace node u by node v



We did not change children of v

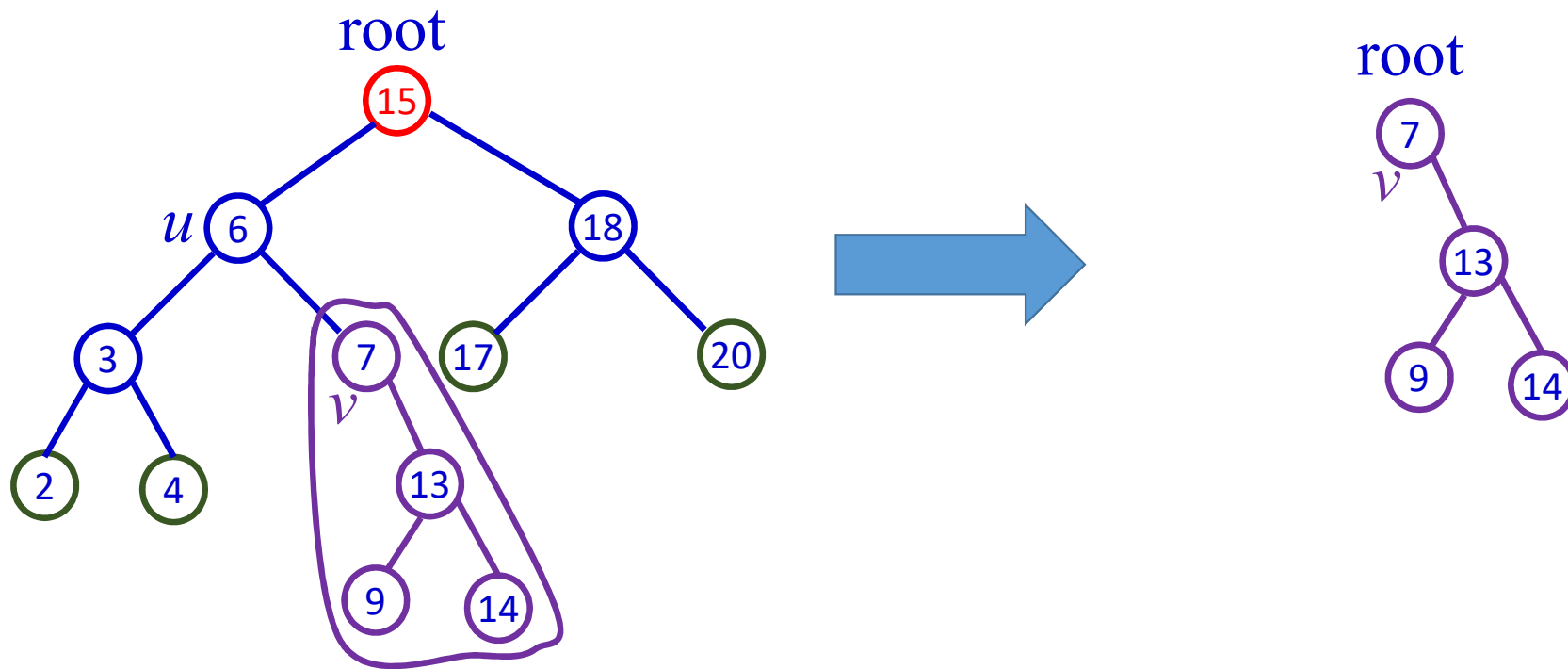
BST Operation: Deletion (2)

This is also transplant



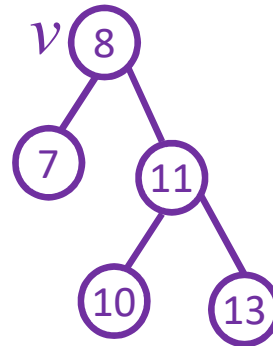
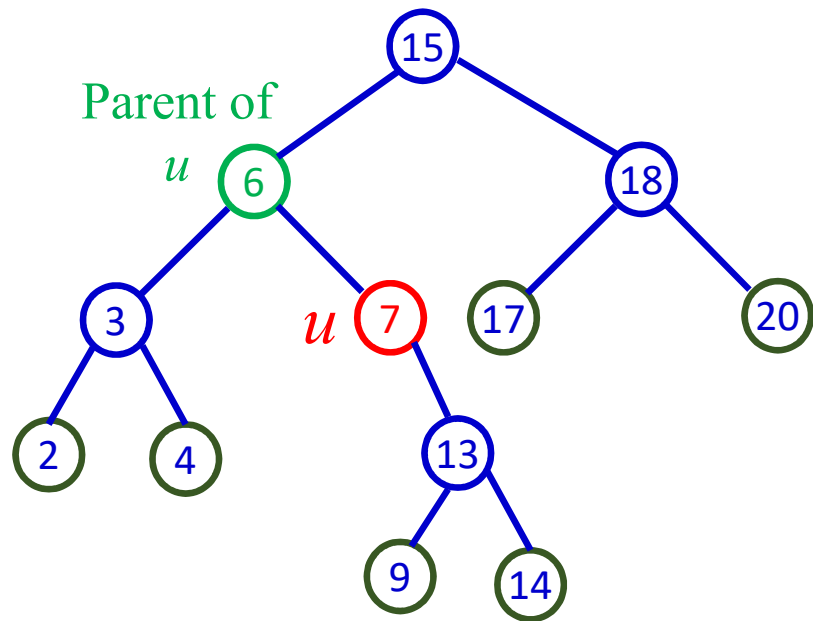
BST Operation: Deletion (2)

Even we can replace the root



BST Operation: Deletion (2)

This algorithm replaces node u by node v

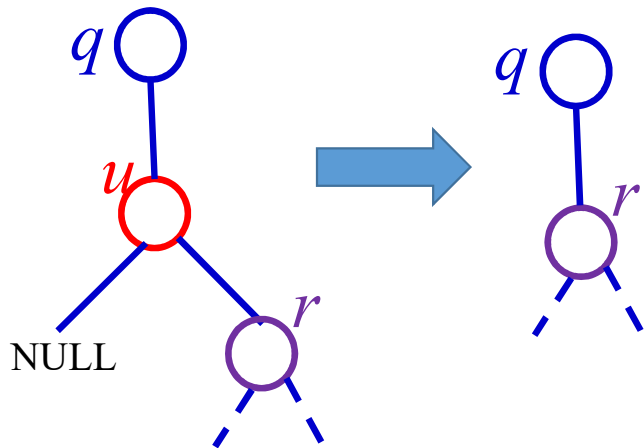


```
TRANSPLANT( $T, u, v$ )  
1 if  $u \rightarrow \text{parent} == \text{NULL}$  //special case  
2    $T \rightarrow \text{root} = v$   
3 elseif  $u == u \rightarrow \text{parent} \rightarrow \text{left}$  //set appropriate child  
4    $u \rightarrow \text{parent} \rightarrow \text{left} = v$   
5 else  $u \rightarrow \text{parent} \rightarrow \text{right} = v$   
6 if  $v \neq \text{NULL}$  //set parent  
7    $v \rightarrow \text{parent} = u \rightarrow \text{parent}$ 
```

BST Operation: Deletion (2)

Node Deletion Cases

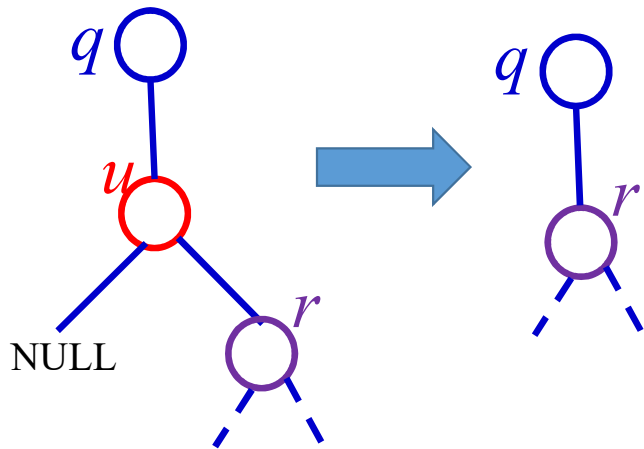
Node u has **NO LEFT** child



BST Operation: Deletion (2)

Node Deletion Cases

Node u has **NO LEFT** child

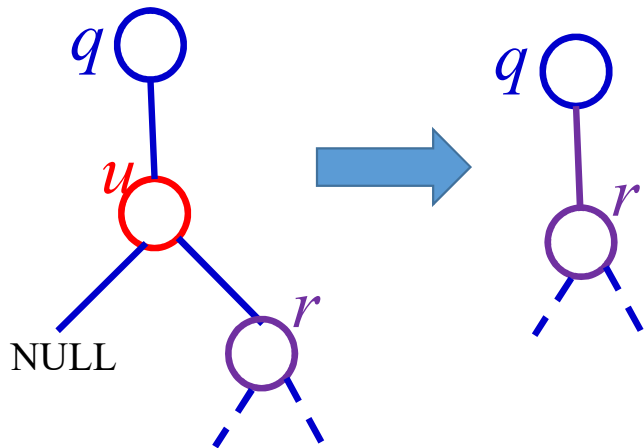


This also covers if both children are empty

BST Operation: Deletion (2)

Node Deletion Cases

Node u has **NO LEFT** child



TREE_DELETE (T, u)

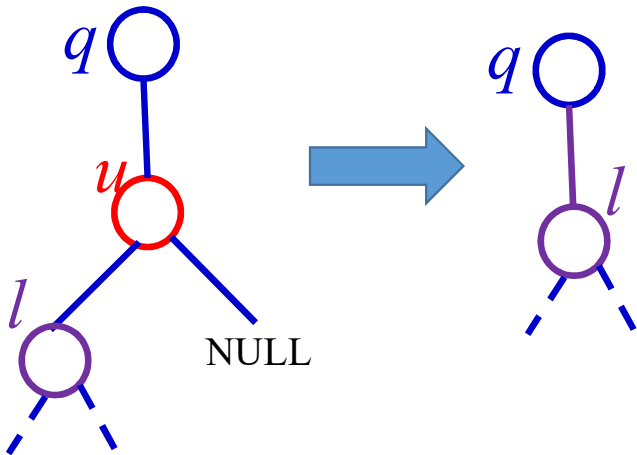
1 **if** $u \rightarrow \text{left} == \text{NULL}$

2 TRANSPLANT($T, u, u \rightarrow \text{right}$)

BST Operation: Deletion (2)

Node Deletion Cases

Node u has **NO RIGHT** child



TREE_DELETE (T, u)

1 **if** $u \rightarrow \text{left} == \text{NULL}$

2 TRANSPLANT($T, u, u \rightarrow \text{right}$)

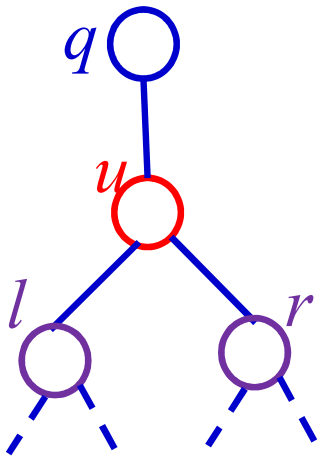
3 **elseif** $u \rightarrow \text{right} == \text{NULL}$

4 TRANSPLANT ($T, u, u \rightarrow \text{left}$)

BST Operation: Deletion (2)

Node Deletion Cases

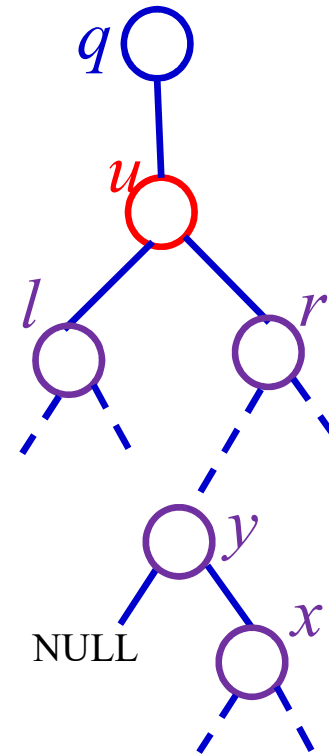
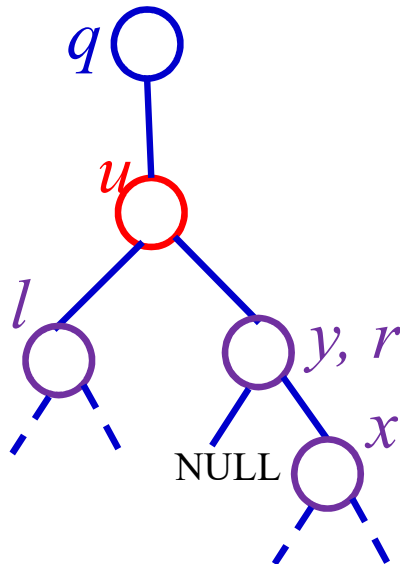
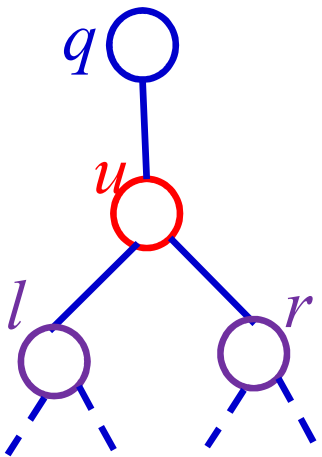
Node u has **BOTH** Children



BST Operation: Deletion (2)

Node Deletion Cases

Node u has **BOTH** Children

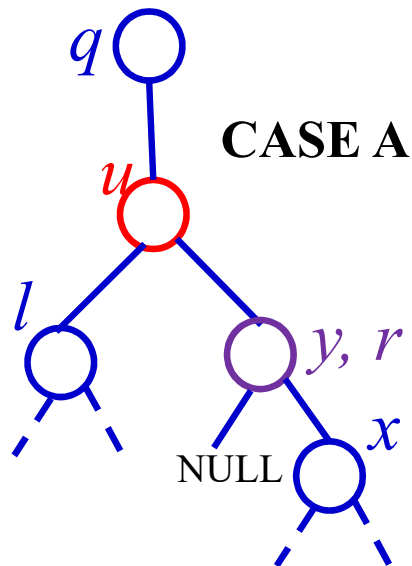
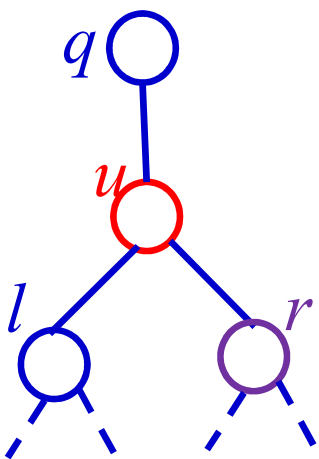


Find $y = \text{successor}$ (next minimum) from RIGHT subtree

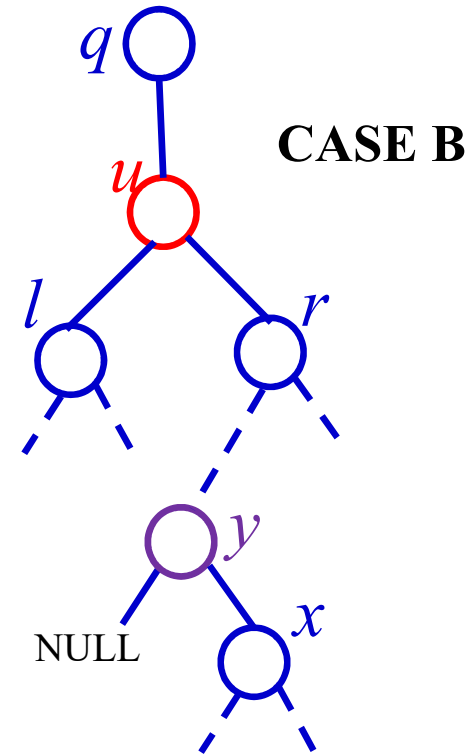
BST Operation: Deletion (2)

Node Deletion Cases

Node u has **BOTH** Children



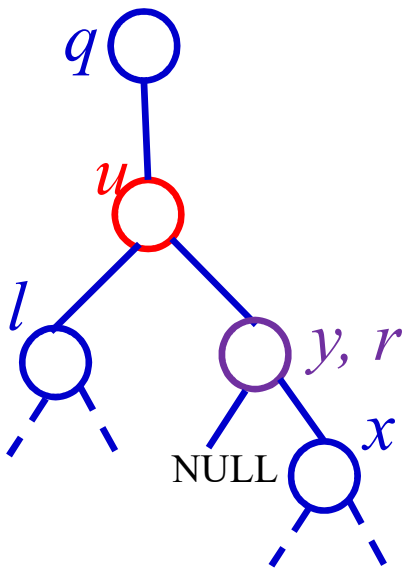
y is immediate **RIGHT**
child of u



y is NOT immediate child of u

BST Operation: Deletion (2)

CASE A



y is immediate RIGHT
child of u

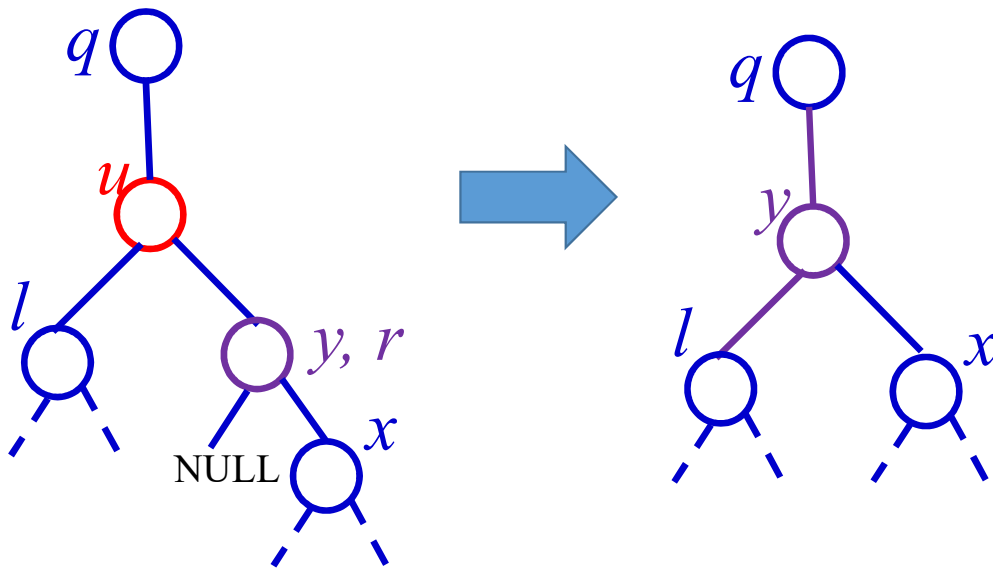
```
TREE_DELETE (T, u)
1 if  $u \rightarrow \text{left} == \text{NULL}$ 
2   TRANSPLANT(T, u,  $u \rightarrow \text{right}$ )
3 elseif  $u \rightarrow \text{right} == \text{NULL}$ 
4   TRANSPLANT (T, u,  $u \rightarrow \text{left}$ )
5 else  $y = \text{TREE\_MINIMUM}(u \rightarrow \text{right})$ 
```

when $y \rightarrow \text{parent} == u$

```
10 TRANSPLANT(T, u, y)
11  $y \rightarrow \text{left} = u \rightarrow \text{left}$ 
12  $y \rightarrow \text{left} \rightarrow \text{parent} = y$ 
```

BST Operation: Deletion (2)

CASE A



y is immediate RIGHT
child of u

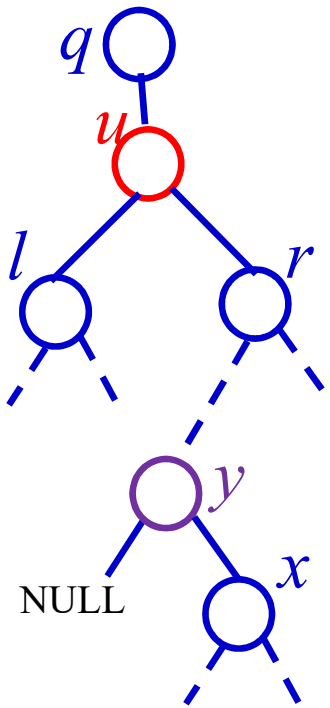
```
TREE_DELETE (T, u)
1 if  $u \rightarrow \text{left} == \text{NULL}$ 
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3 elseif  $u \rightarrow \text{right} == \text{NULL}$ 
4   TRANSPLANT (T, u,  $u \rightarrow \text{left}$ )
5 else  $y = \text{TREE\_MINIMUM}(u \rightarrow \text{right})$ 
```

when $y \rightarrow \text{parent} == u$

```
10 TRANSPLANT(T, u, y)
11  $y \rightarrow \text{left} = u \rightarrow \text{left}$ 
12  $y \rightarrow \text{left} \rightarrow \text{parent} = y$ 
```

BST Operation: Deletion (2)

CASE B

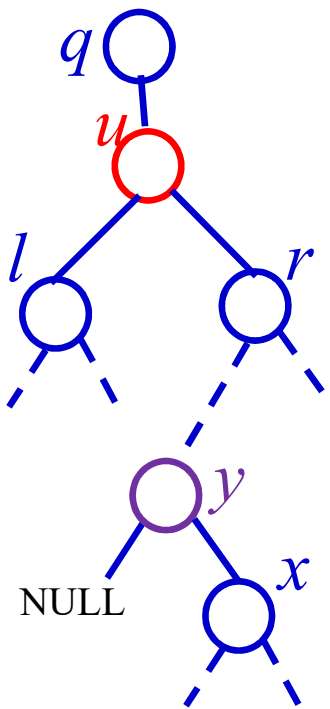


y is **NOT** immediate child of u

BST Operation: Deletion (2)

CASE B

$$y.key < \dots < x.key < \dots < r.key$$

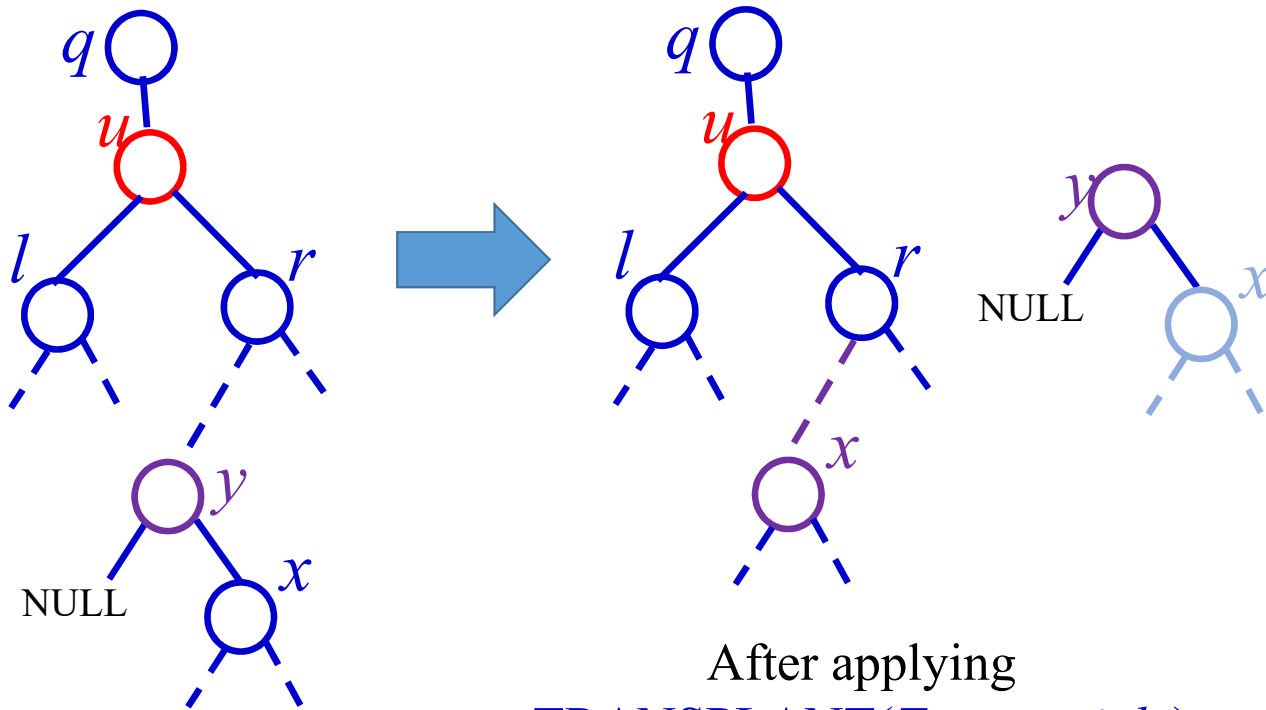


y is **NOT** immediate child of u

BST Operation: Deletion (2)

CASE B

$$y.key < \dots < x.key < \dots < r.key$$

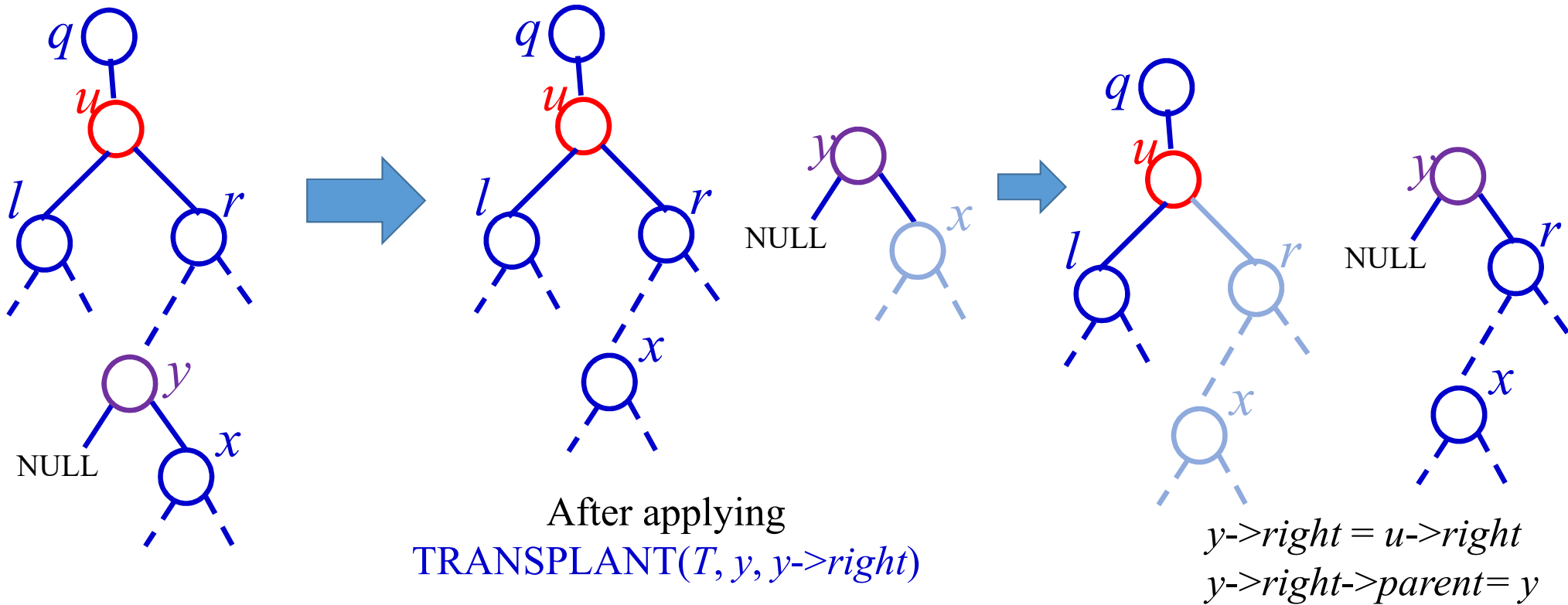


After applying
 $\text{TRANSPLANT}(T, y, y \rightarrow \text{right})$

BST Operation: Deletion (2)

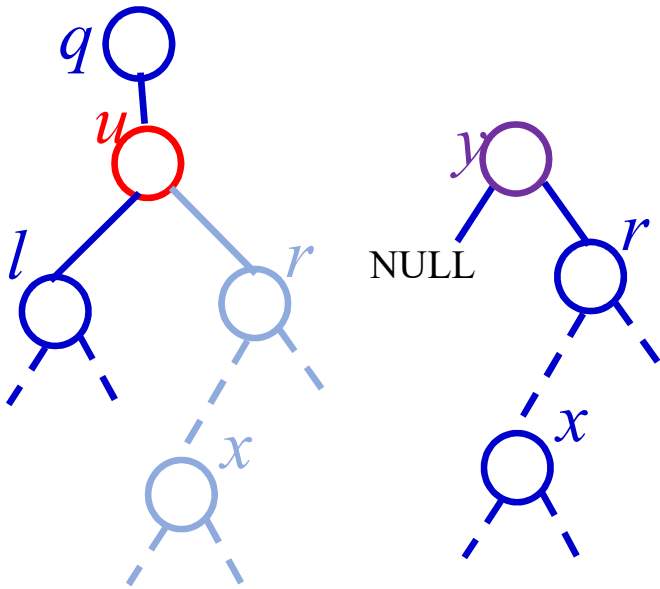
CASE B

$$y.key < \dots < x.key < \dots < r.key$$



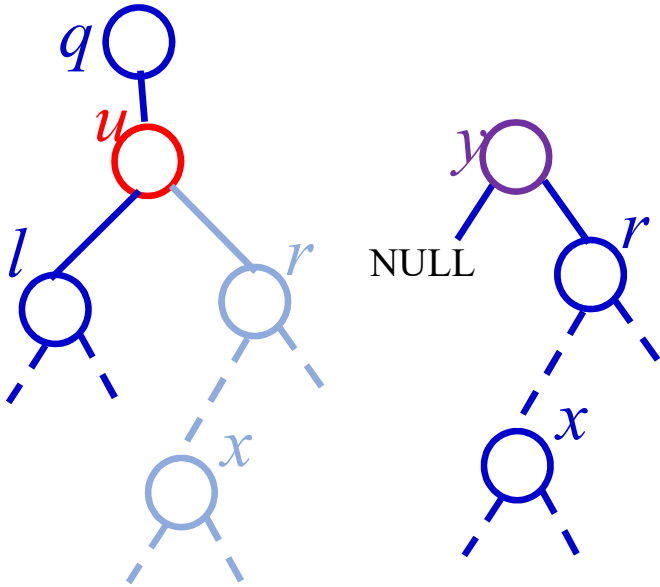
BST Operation: Deletion (2)

CASE B

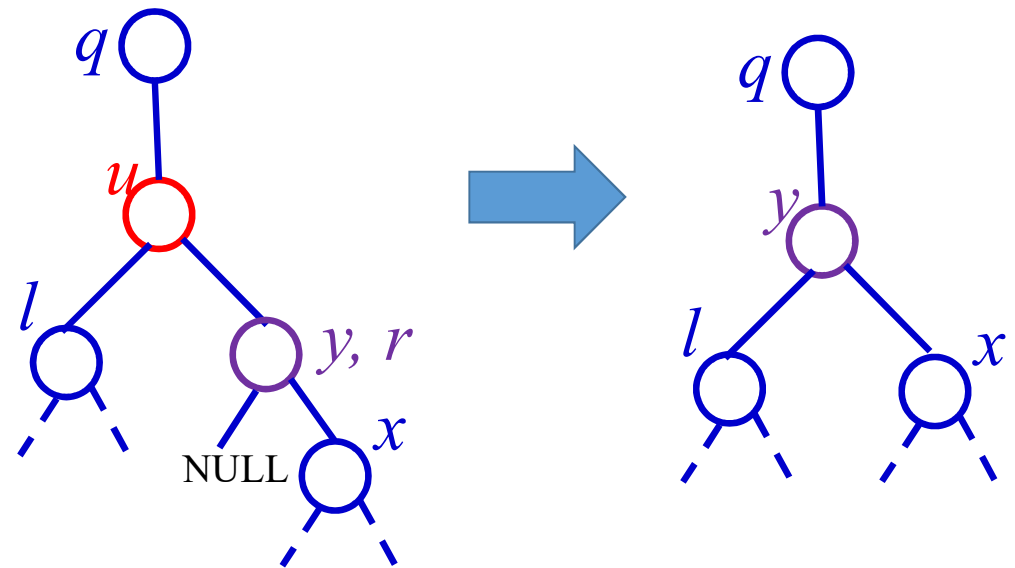


BST Operation: Deletion (2)

CASE B
Outcome



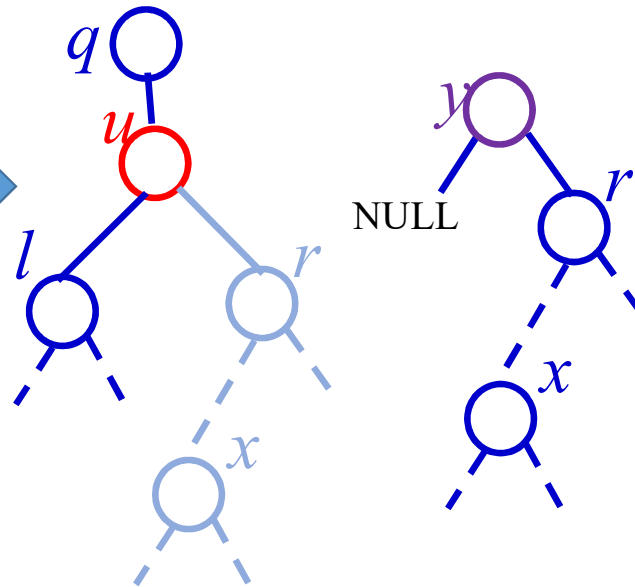
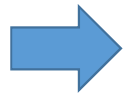
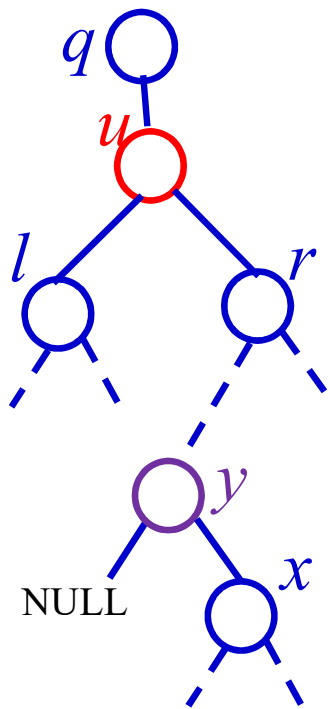
CASE A



y is immediate **RIGHT**
child of u

BST Operation: Deletion (2)

CASE B

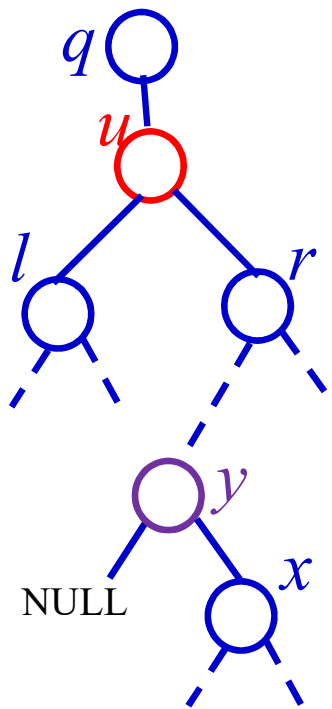


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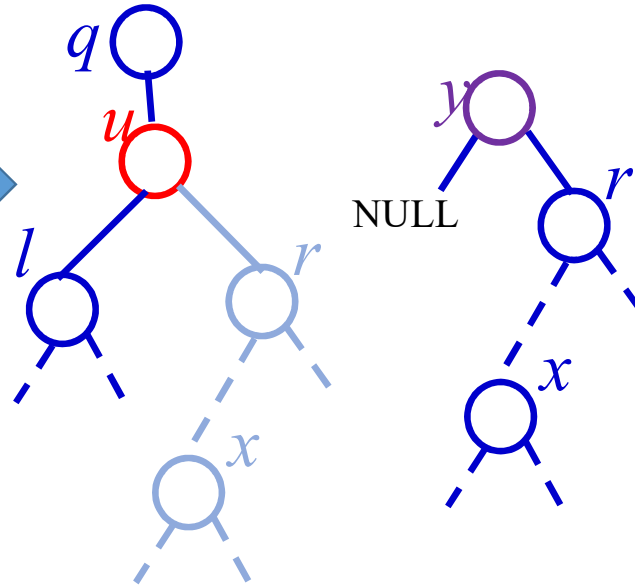
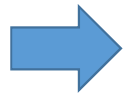
TREE_DELETE (T, u)
1  if  $u \rightarrow \text{left} == \text{NULL}$ 
2    TRANSPLANT(T, u,  $u \rightarrow \text{right}$ )
3  elseif  $u \rightarrow \text{right} == \text{NULL}$ 
4    TRANSPLANT (T, u,  $u \rightarrow \text{left}$ )
5  else  $y = \text{TREE\_MINIMUM}(u \rightarrow \text{right})$ 
6    if  $y \rightarrow \text{parent} \neq u$ 
7      TRANSPLANT(T, y,  $y \rightarrow \text{right}$ )
8       $y \rightarrow \text{right} = u \rightarrow \text{right}$ 
9       $y \rightarrow \text{right} \rightarrow \text{parent} = y$ 
10   TRANSPLANT(T, u, y)
11    $y \rightarrow \text{left} = u \rightarrow \text{left}$ 
12    $y \rightarrow \text{left} \rightarrow \text{parent} = y$ 
    
```

BST Operation: Deletion (2)

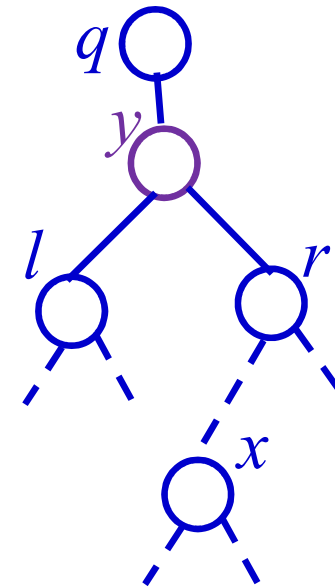
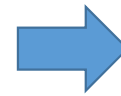
CASE B



Starting state



Converted to CASE A



After applying CASE A Code

Back to Graph

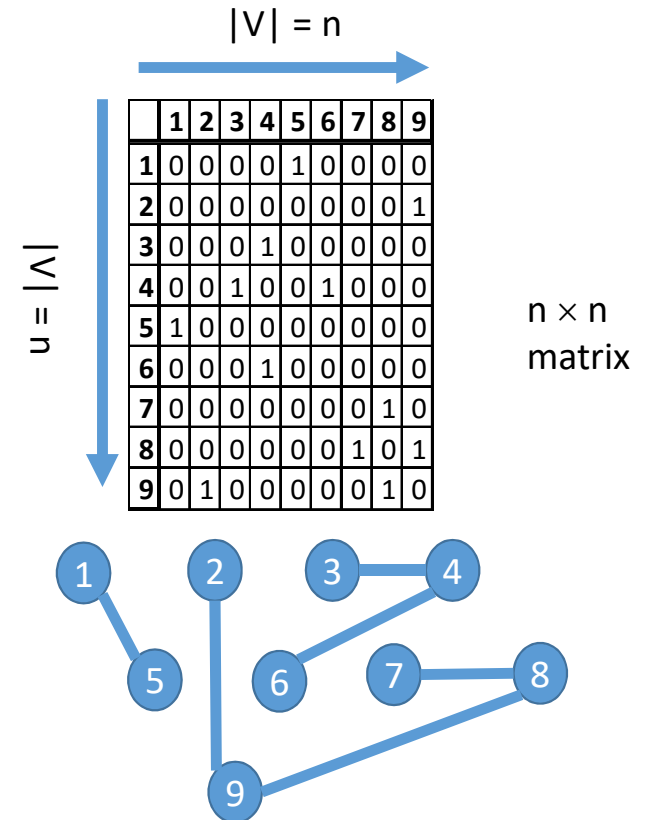
Adjacency Matrix Representation

◆ Pros:

- **Simple** to implement
- **Easy** and **fast** to tell if a pair (i, j) is an edge: simply check if $A[i, j]$ is 1 or 0
- Can be very **efficient for small graphs**
- **Good for dense graphs** (why?)

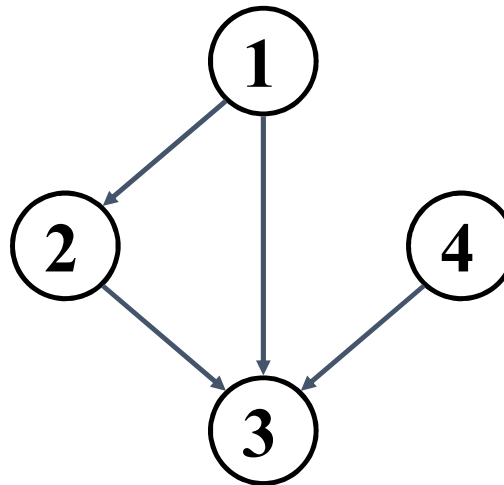
◆ Cons:

- No matter how few edges the graph has, the matrix takes $O(n^2)$, i.e., **$O(|V|^2)$ in memory**

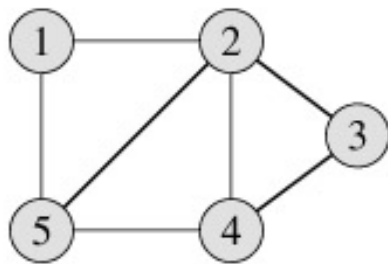


Adjacency Lists Representation

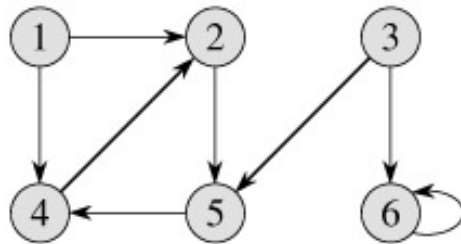
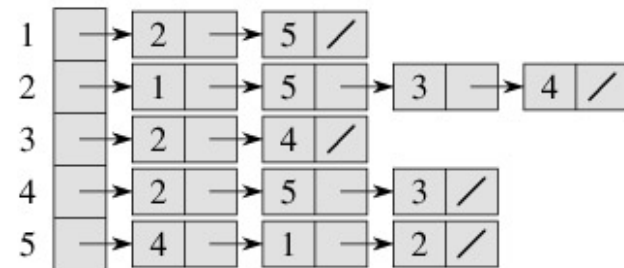
- ◆ A graph is represented by a **one-dimensional array L** of linked lists, where
 - $L[i]$ is the linked list containing all the nodes adjacent to node i .
 - The nodes in the list $L[i]$ are in NO particular order



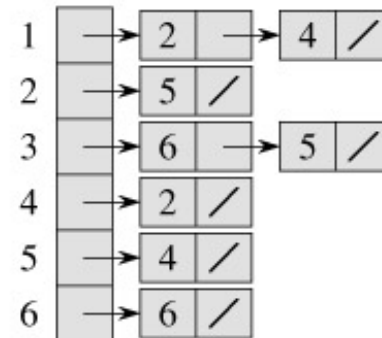
Adjacency Lists Representation



Undirected Graph



Directed Graph

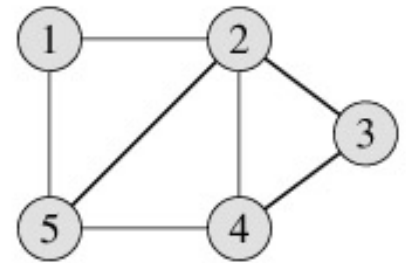


Adjacency Lists Representation

◆ Pros:

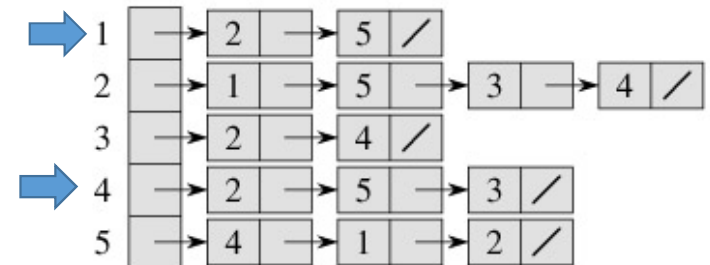
- Saves on space (memory): the representation takes $O(|V| + |E|)$ memory.
- Good for large, sparse graphs (e.g., planar maps)

How to find whether there is an edge (4,1)?



◆ Cons:

- It can take up to $O(n)$ time to determine if a pair of nodes (i, j) is an edge: one would have to search the linked list $L[i]$, which takes time proportional to the length of $L[i]$.



Graph Searching

Graph Searching

- **Given:** a graph $G = (V, E)$, directed or undirected
- **Goal:** methodically explore every vertex and every edge
- Ultimately: **build a tree** on the graph
- **General Procedure:**
 - **Pick** a vertex as the **root**
 - **Choose** certain **edges** to produce a tree
 - Note: might also build a *forest* if graph is not connected

Graph Searching

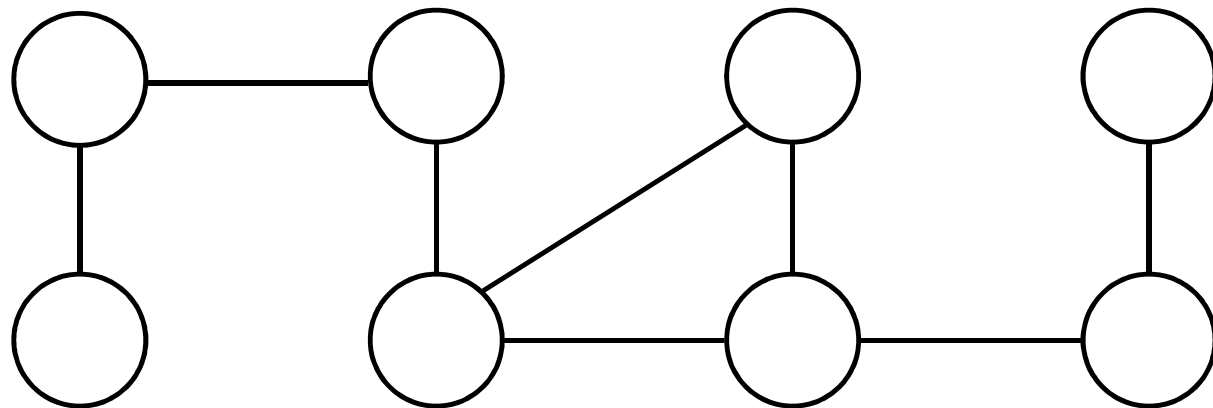
- There are two standard graph traversal techniques:
 - Breadth-First Search (BFS)
 - Depth-First Search (DFS)

Breadth-First Search

- “Explore” a graph, turning it into a tree
 - One vertex at a time
 - Expand frontier of explored vertices across the *breadth* of the frontier
- Builds a tree over the graph
 - Pick a *source vertex* to be the root
 - Find (“discover”) its children, then their children, etc.

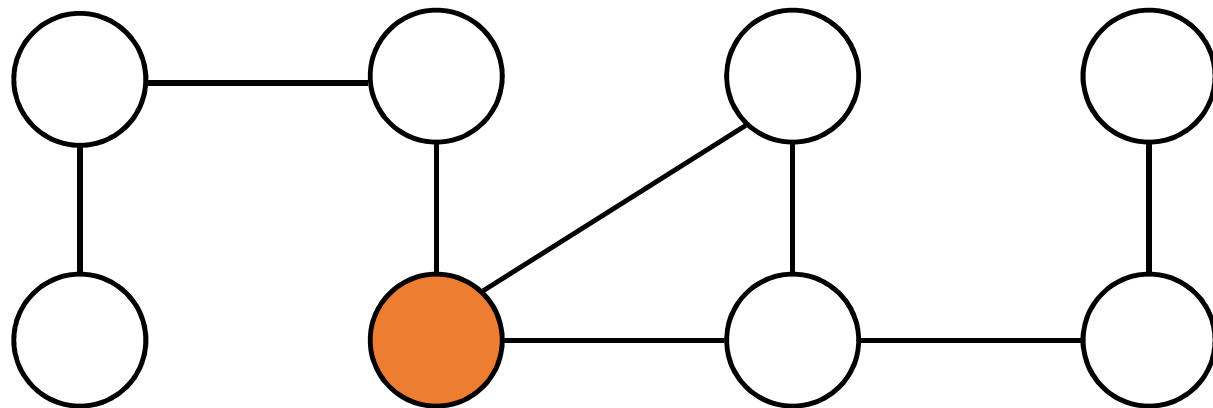
Breadth-First Search

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- Builds a tree over the graph
 - Pick a *source vertex* to be the root
 - Find (“discover”) its children, then their children, etc.



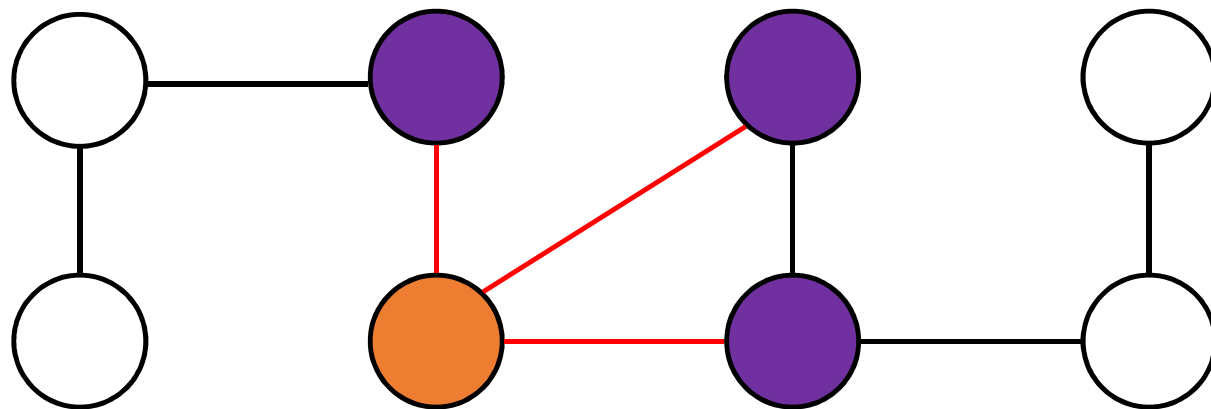
Breadth-First Search

- “Explore” a graph, turning it into a tree
 - One vertex at a time
 - Expand *frontier* of explored vertices *across* the *breadth* of the frontier
- Builds a tree over the graph
 - Pick a *source vertex* to be the root
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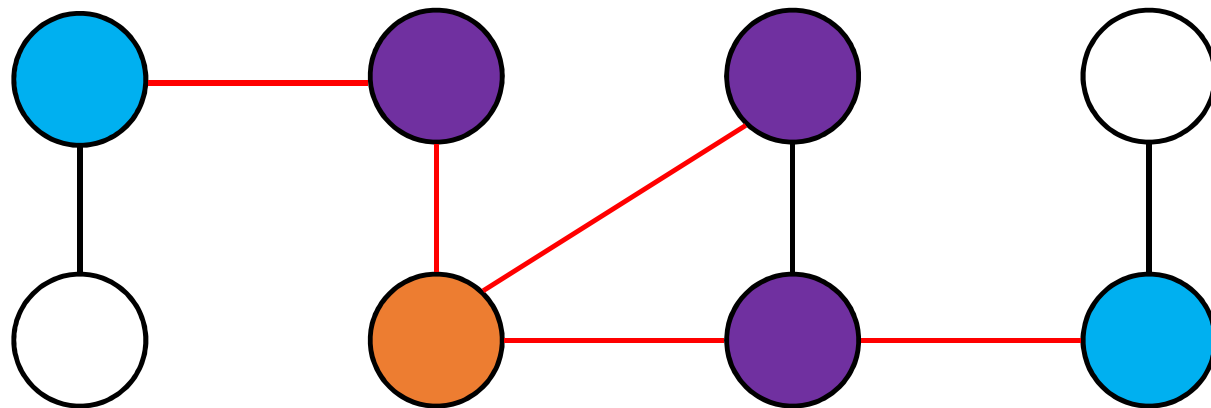
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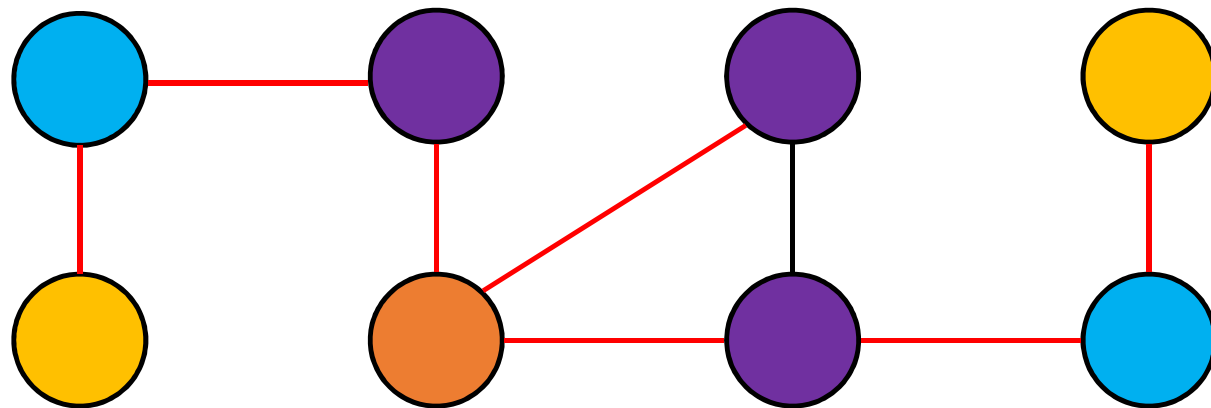
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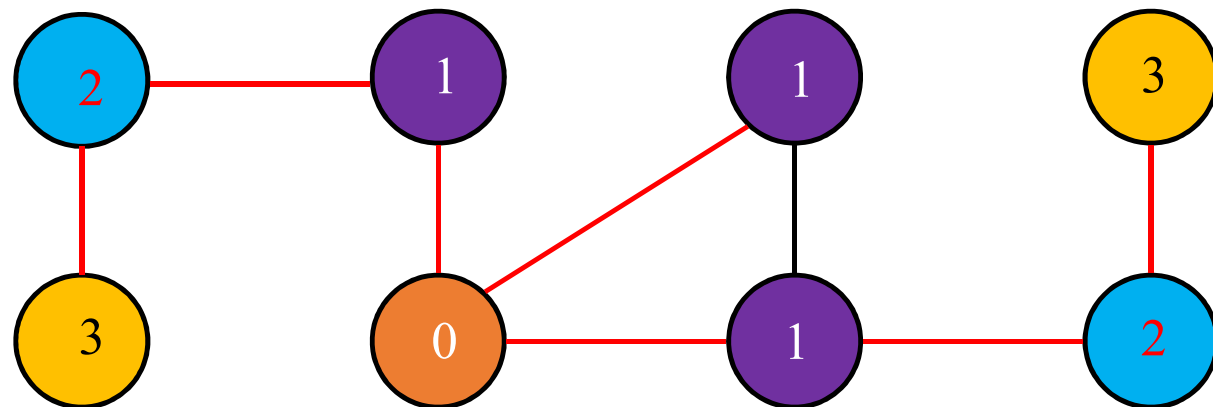
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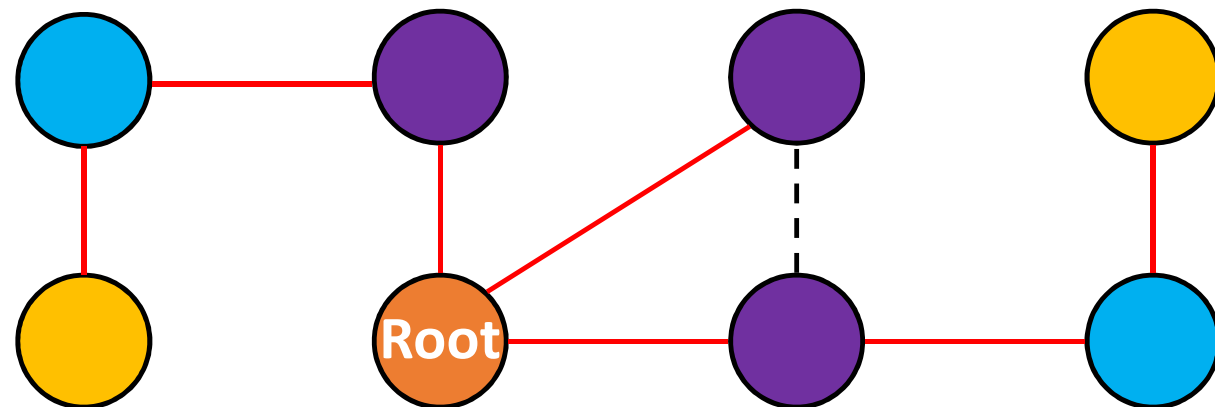
Breadth-First Search

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 - One vertex at a time
 - Expand *frontier* of explored vertices *across* the *breadth* of the frontier
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Breadth-First Search

- “Explore” a graph, turning it into a tree
 - One vertex at a time
 - Expand **frontier** of explored vertices **across** the *breadth* of the frontier
- Builds a **tree** over the graph
 - Pick a *source vertex* to be the **root**
 - Find (“discover”) its **children**, then **their children**, etc.



Breadth-First Search

- It associates vertex “colors” to guide the algorithm
 - **White vertices** have not been discovered
 - All vertices start out white
 - **Grey vertices** are discovered but not fully explored
 - They may be adjacent to white vertices
 - **Black vertices** are discovered and fully explored
 - They are adjacent only to black and grey vertices
- Explore vertices by scanning **adjacency list** of grey vertices

Breadth-First Search

```
BFS( $G, s$ )
1  for each vertex  $u \in G.V - \{s\}$ 
2       $u.color = \text{WHITE}$ 
3       $u.d = \infty$ 
4       $u.\pi = \text{NIL}$ 
5   $s.color = \text{GRAY}$ 
6   $s.d = 0$ 
7   $s.\pi = \text{NIL}$ 
8   $Q = \emptyset$ 
9  ENQUEUE( $Q, s$ )
10 while  $Q \neq \emptyset$ 
11      $u = \text{DEQUEUE}(Q)$ 
12     for each  $v \in G.Adj[u]$ 
13         if  $v.color == \text{WHITE}$ 
14              $v.color = \text{GRAY}$ 
15              $v.d = u.d + 1$ 
16              $v.\pi = u$ 
17             ENQUEUE( $Q, v$ )
18      $u.color = \text{BLACK}$ 
```

Breadth-First Search

BFS(G, s)

```
1  for each vertex  $u \in G.V - \{s\}$ 
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16              $v.\pi = u$ 
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18      $u.color = \text{BLACK}$ 
```

Whitening

Breadth-First Search

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Whitening

Enqueue the
root

Breadth-First Search

BFS(G, s)

```
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16              $v.\pi = u$ 
17             ENQUEUE( $Q, v$ )
18      $u.color = \text{BLACK}$ 
```

Whitening

Enqueue the
root

runs until queue
is empty