

# Data structures and algorithms

Part 8

## Searching and Search Trees

With some Czech slides just for terminology

Petr Felkel

# Searching – talk overview

Typical operations

Quality measures

Implementation in an array

- Sequential search
- Binary search

Binary search tree – BST (*BVS*) – in dynamic memory

- Node representation
- Operations
- Tree balancing

# Searching

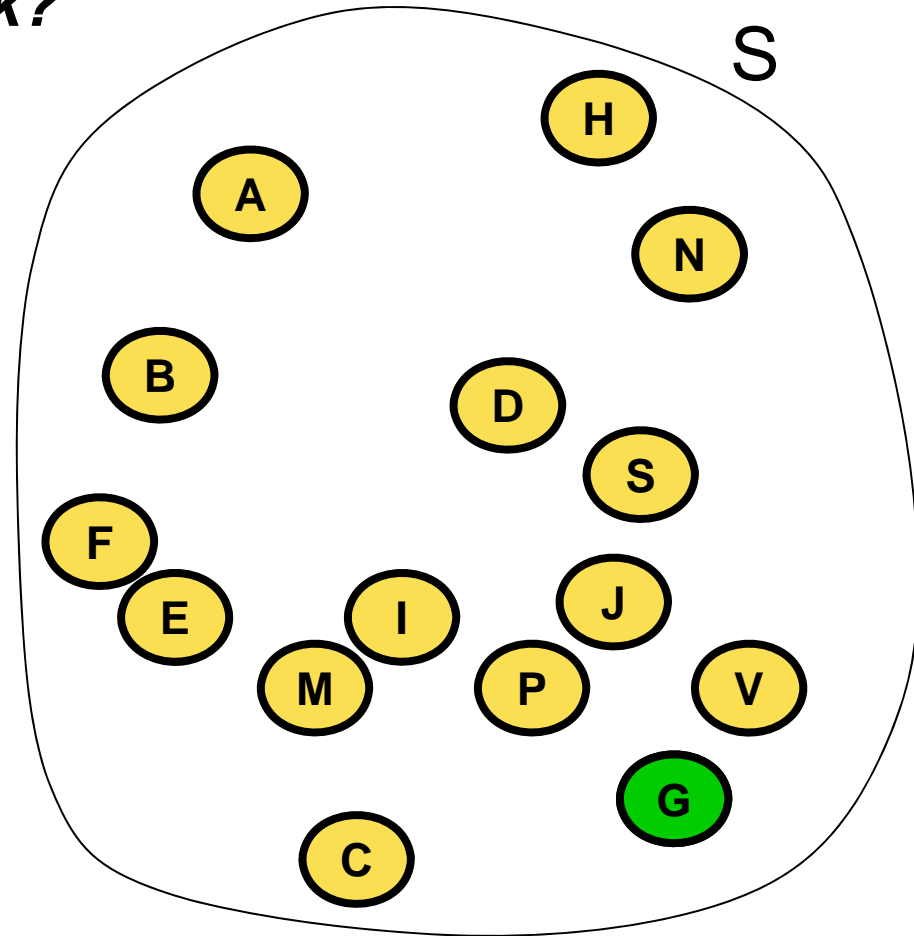
Input: a set of  $n$  keys, a query key  $k$

Problem description: *Where is  $k$ ?*

**G?**

Search was successful

Sequential search



# Searching

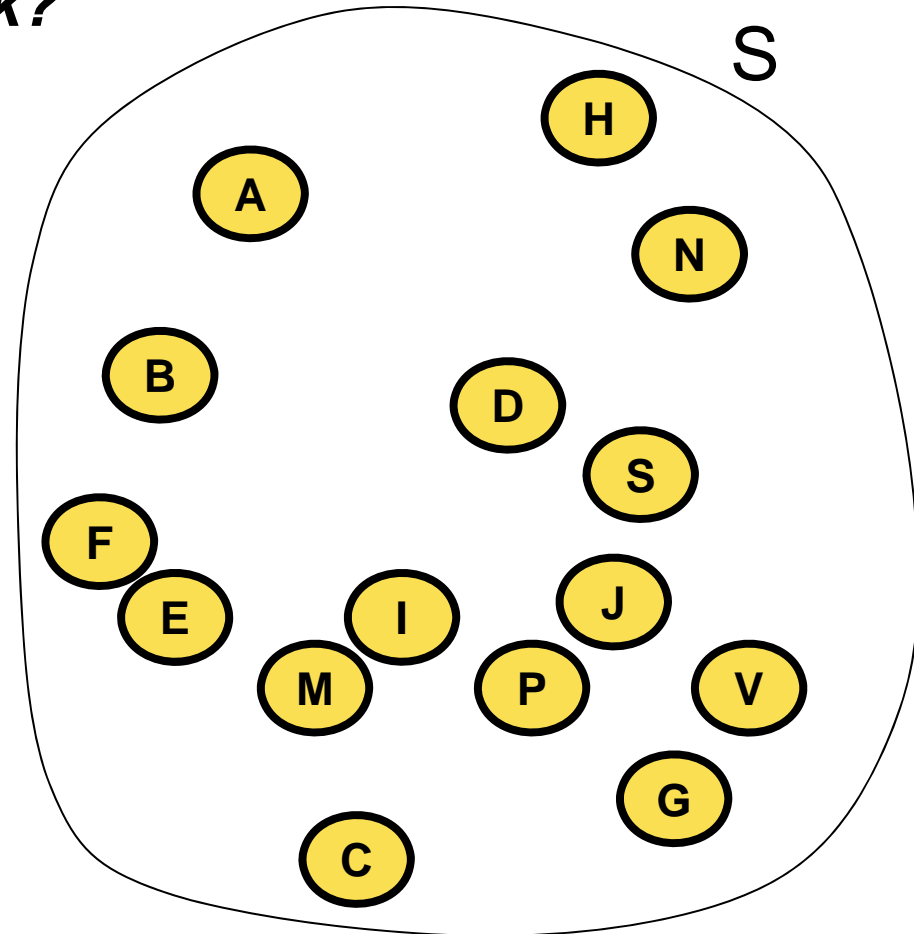
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**Problem description:** *Where is  $k$ ?*

**L?**

Search was unsuccessful

Sequential search



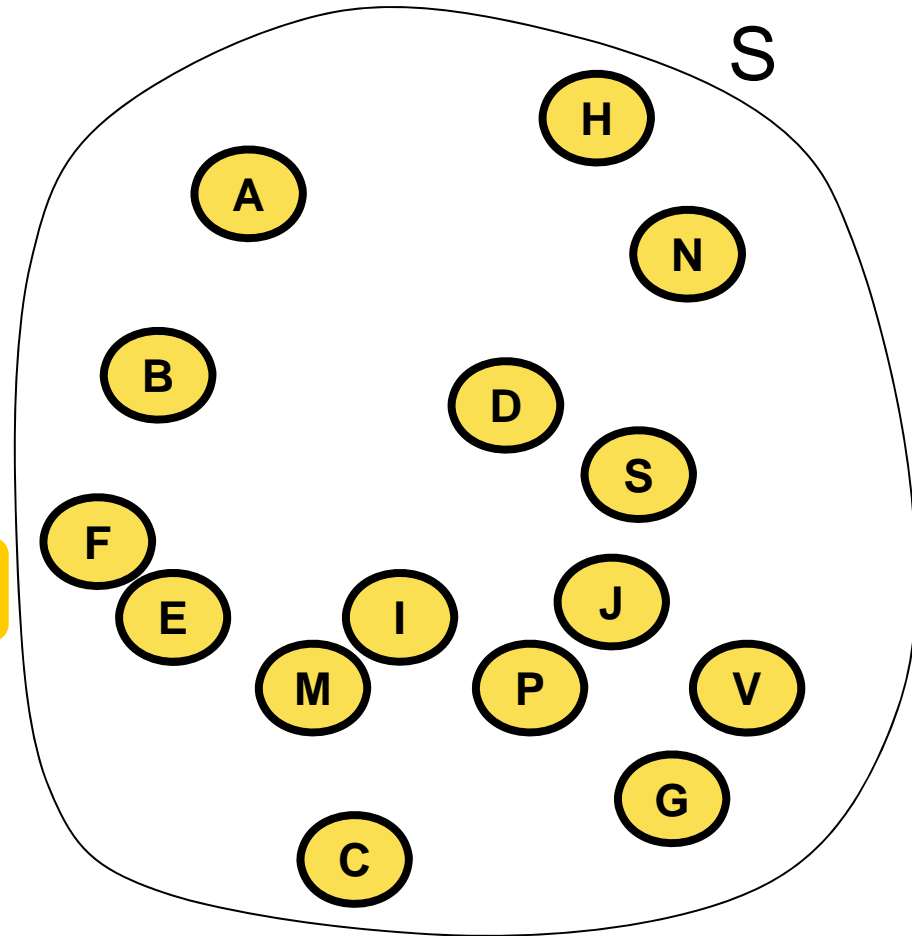
# Searching

## Search space $S$

- = set of keys where we search
  - precisely: set of records with keys we search
  - unique keys
  - (table, file,...)

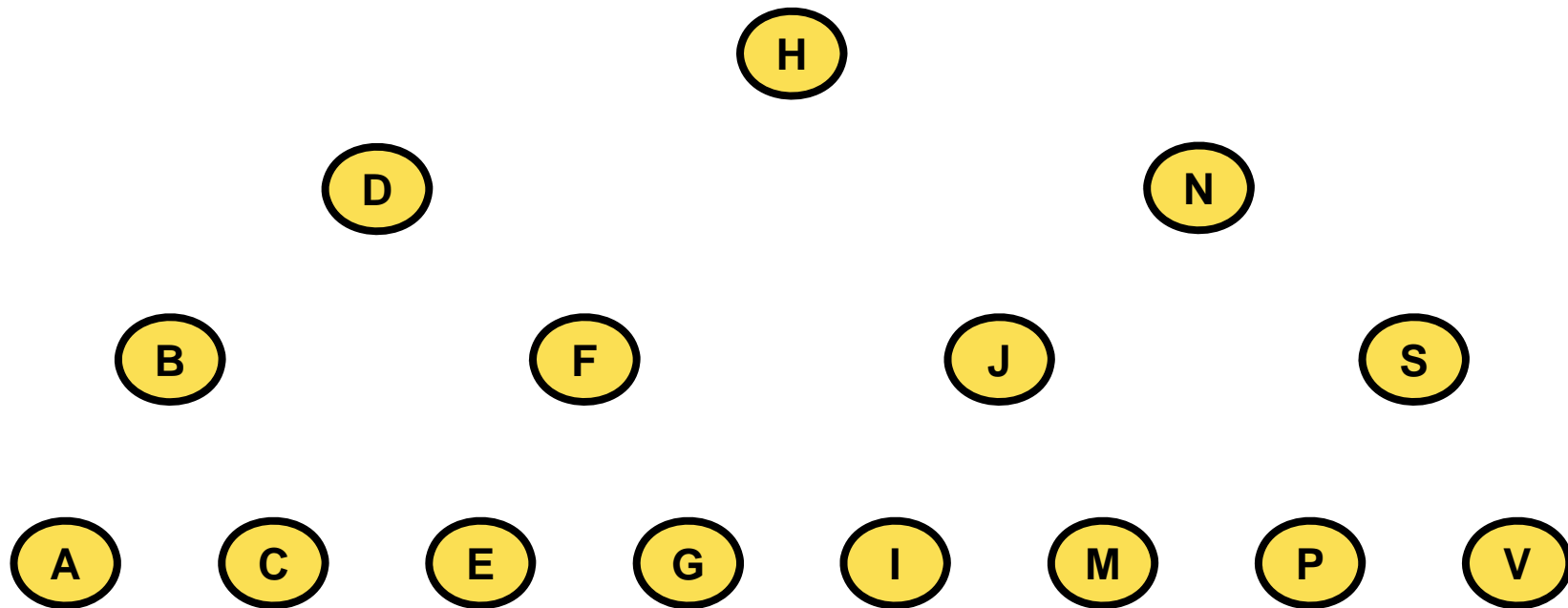
## Universum $U$ of the search space

- = set of ALL possible keys
- $$S \subset U$$



# Searching

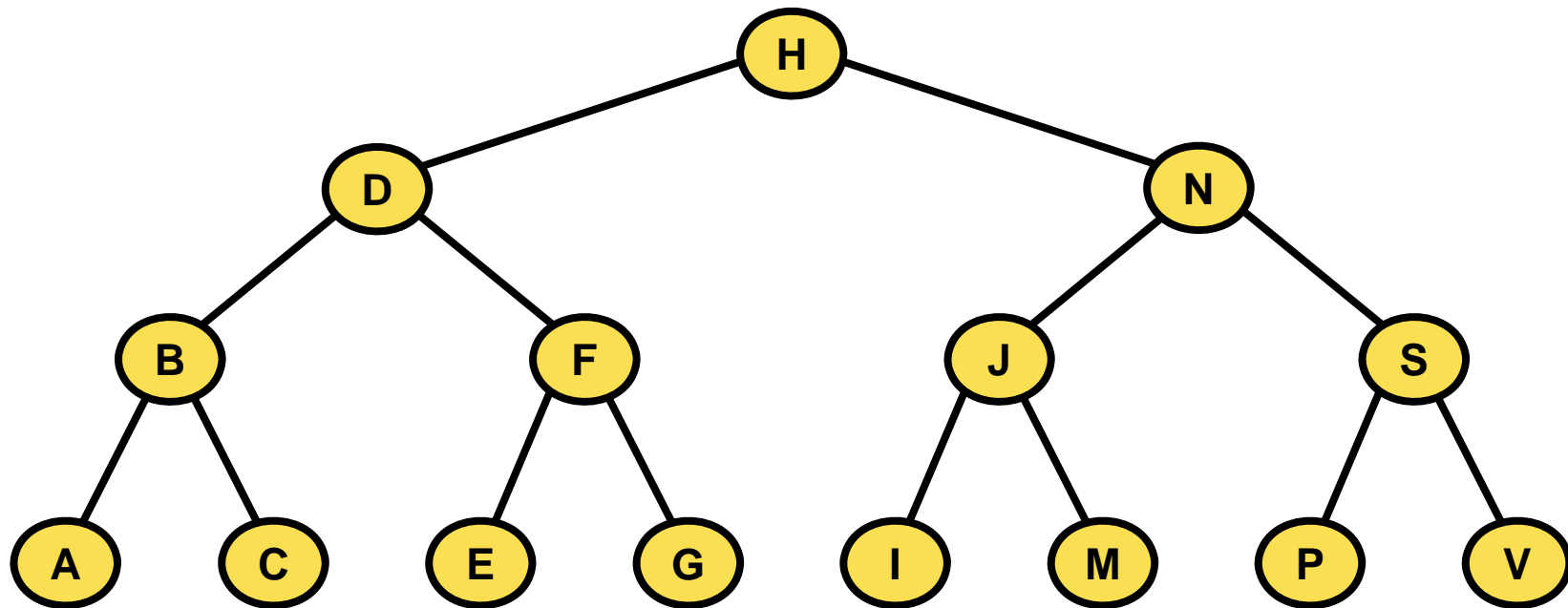
Speed-up



# Searching

Input: a set of  $n$  keys, a query key  $k$

Problem description: *Where is  $k$ ?*

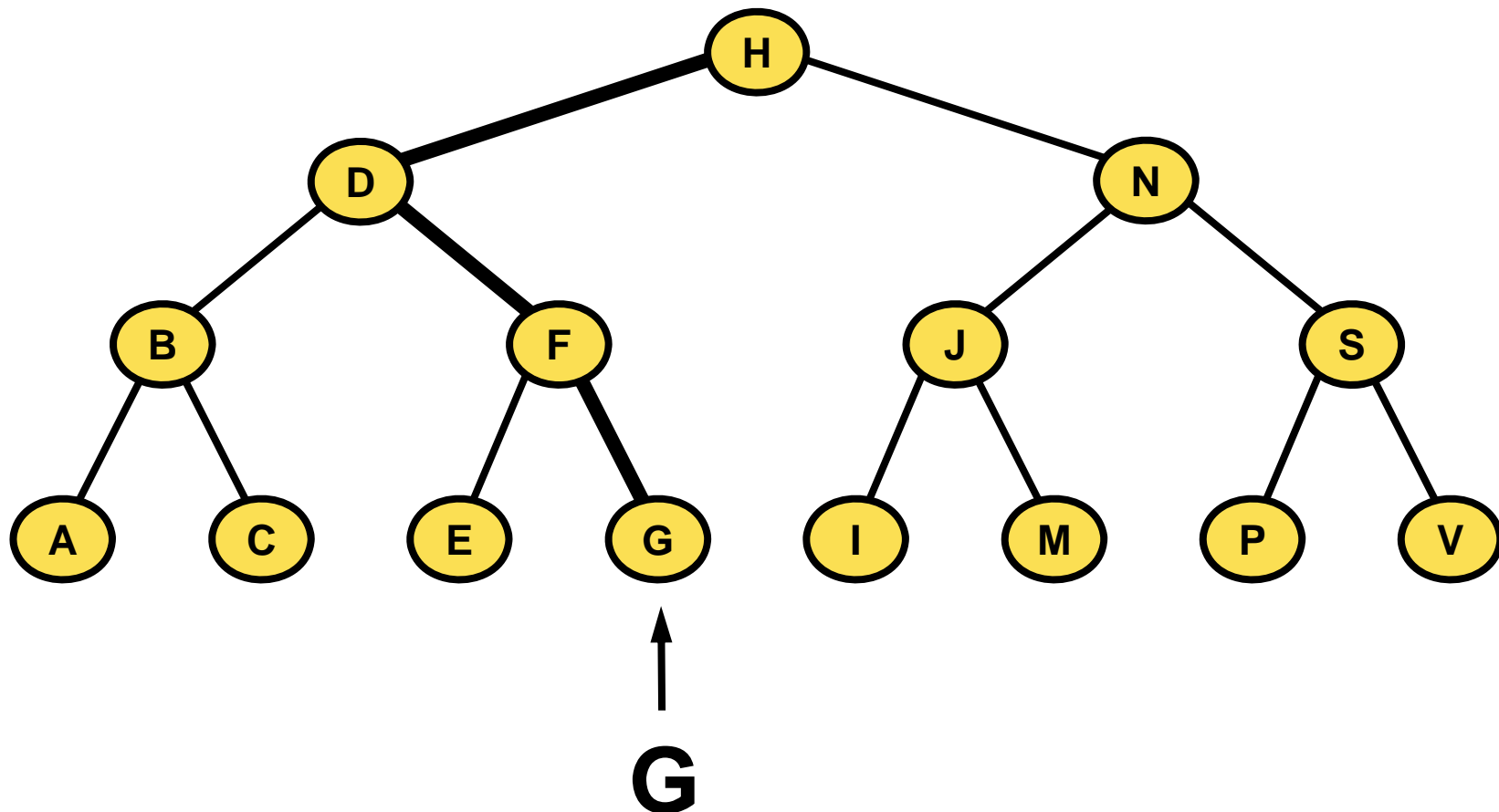


**G?**

# Searching

Input: a set of  $n$  keys, a query key  $k$

Problem description: *Where is  $k$ ?*

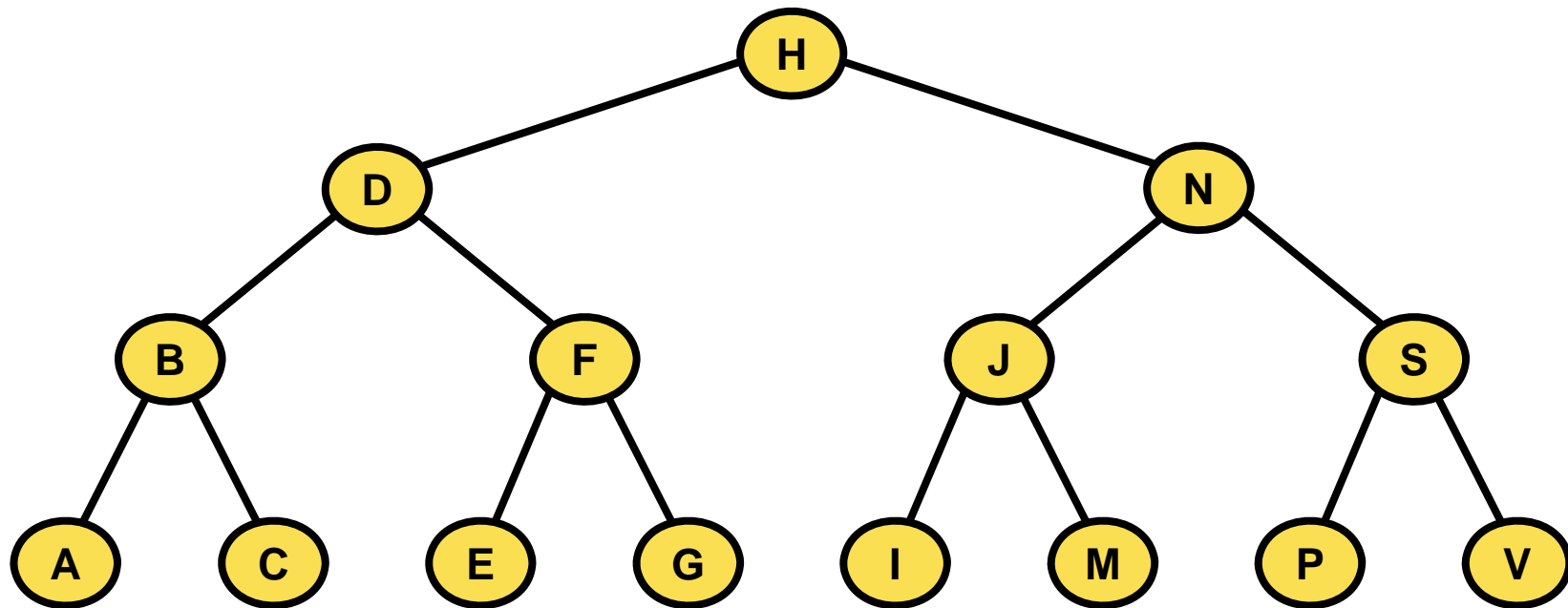




# Searching

Input: a set of  $n$  keys, a query key  $k$

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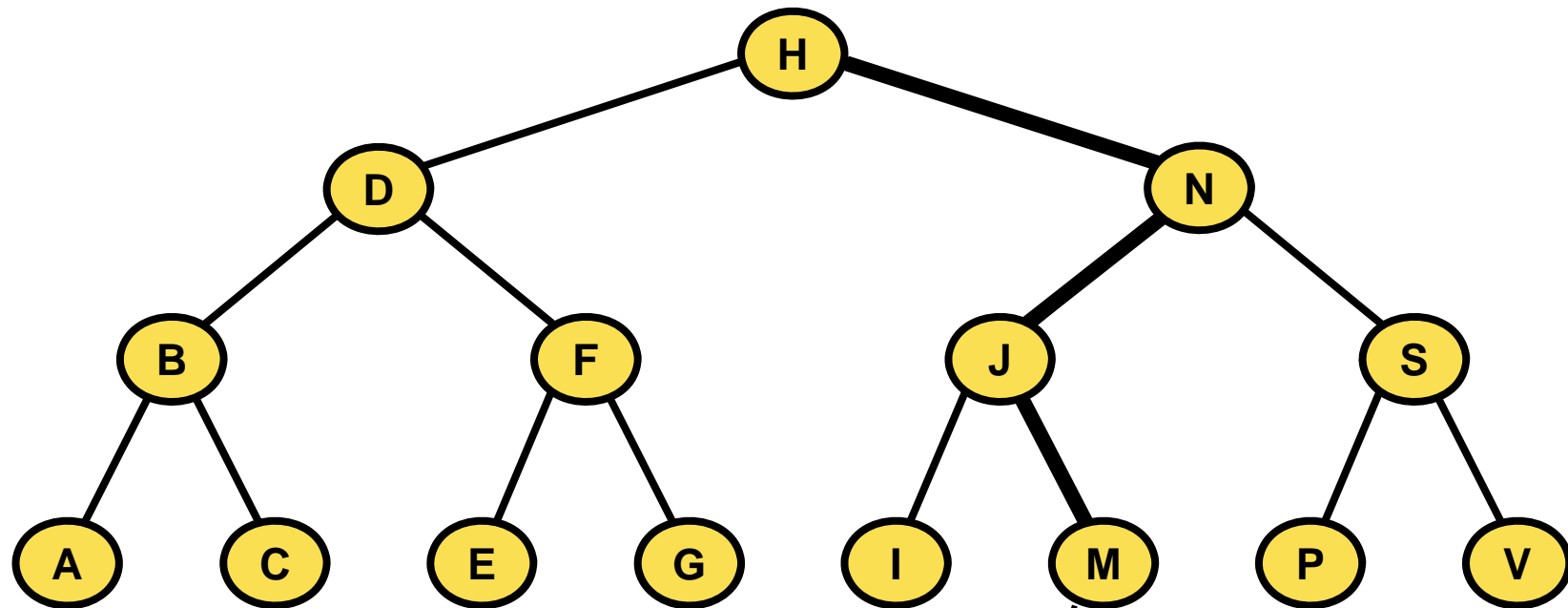


**L?**

# Searching

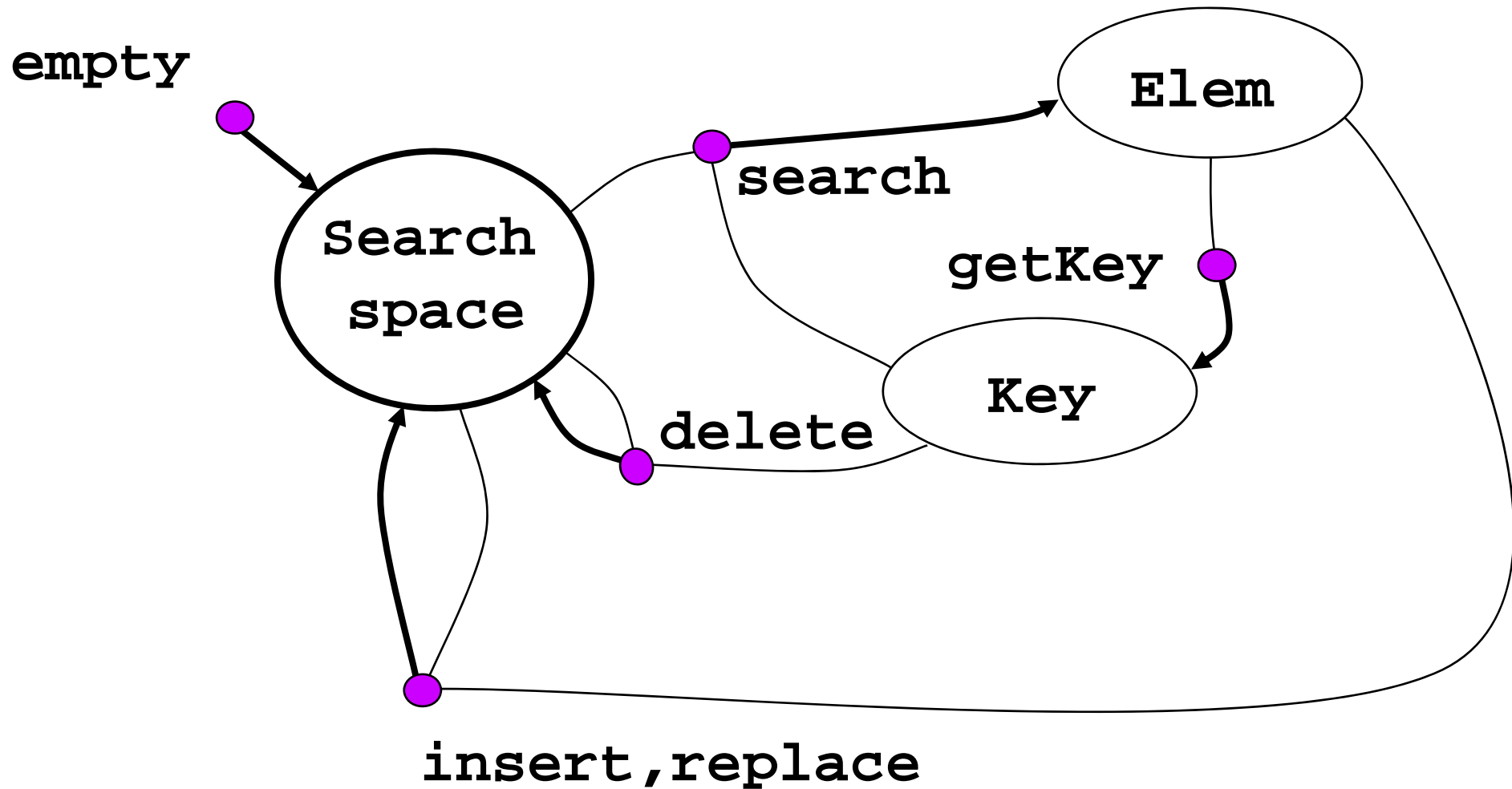
Input: a set of  $n$  keys, a query key  $k$

Problem description: *Where is  $k$ ?*



**L not found**

# Search space



# Searching

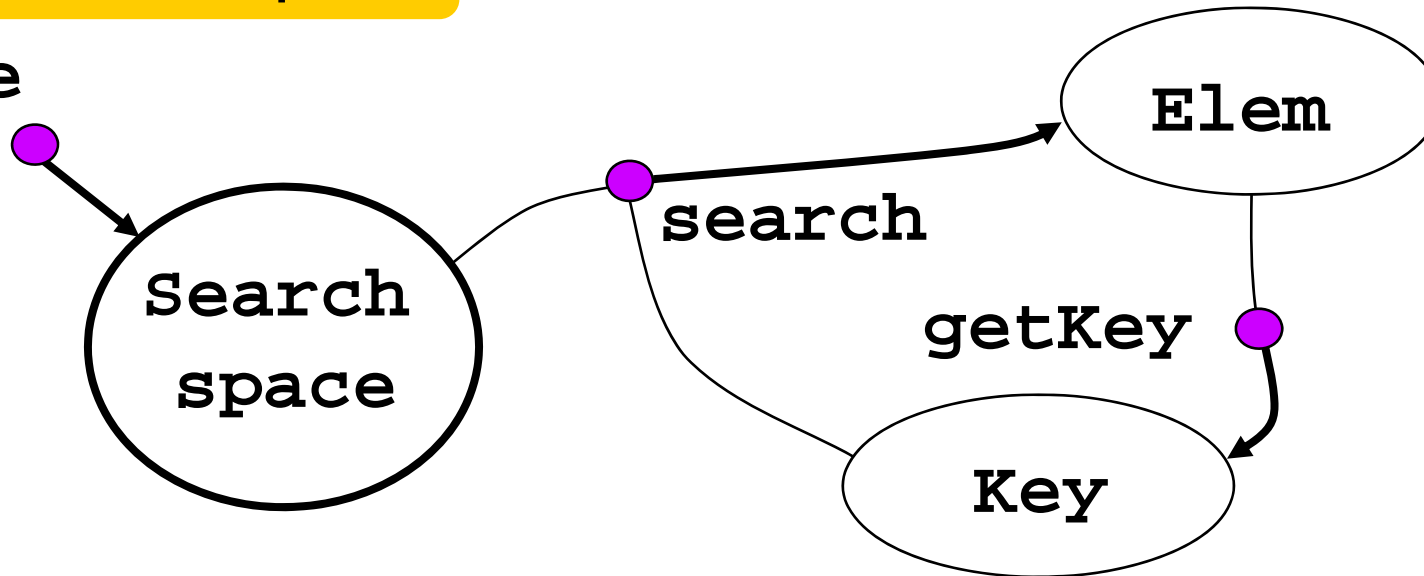
## Search space (*lexicon*)

- Static
  - fixed search space
    - > simpler implementation
    - > change => new release
    - > example: Phonebook, printed dictionary
- Dynamic
  - search space changes in time
    - > more complex implementation
    - > change by `insert`, `delete`, `replace`
    - > table of symbols in compiler, dictionary,...

# Search space

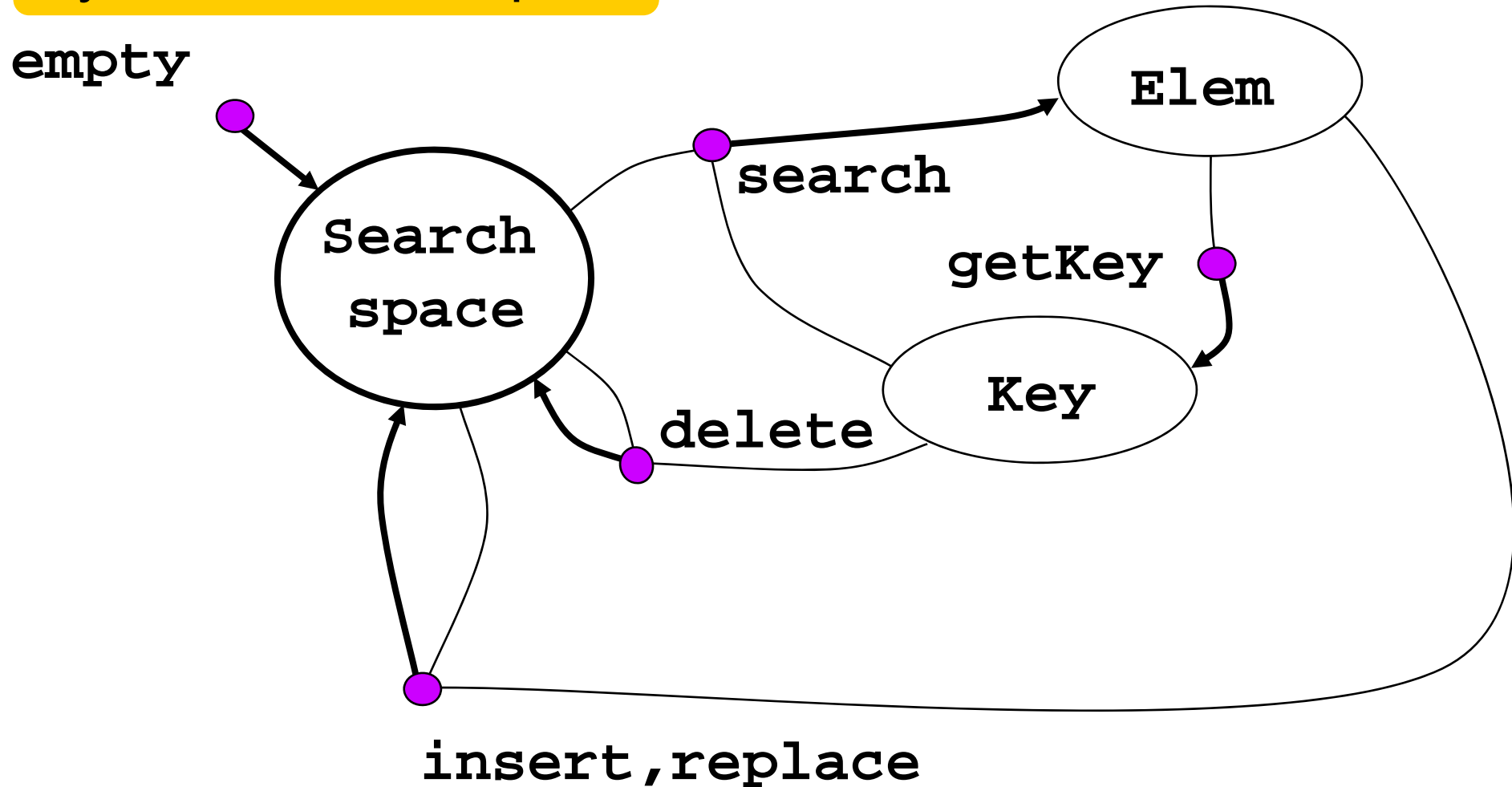
## Static search space

**create**



# Search space

## Dynamic search space



# Searching

Variables:     $k$  ... key  
               $e$  ... element with key  $k$   
               $s$  ... data set

Operations (Informal list):

selectors

- **search( $k, s$ )**
- $\text{min}(s), \text{max}(s)$
- $\text{pred}(e, s), \text{succ}(e, s)$  } extension

Key of element  
to replace is  
part of the new  
element  $e$

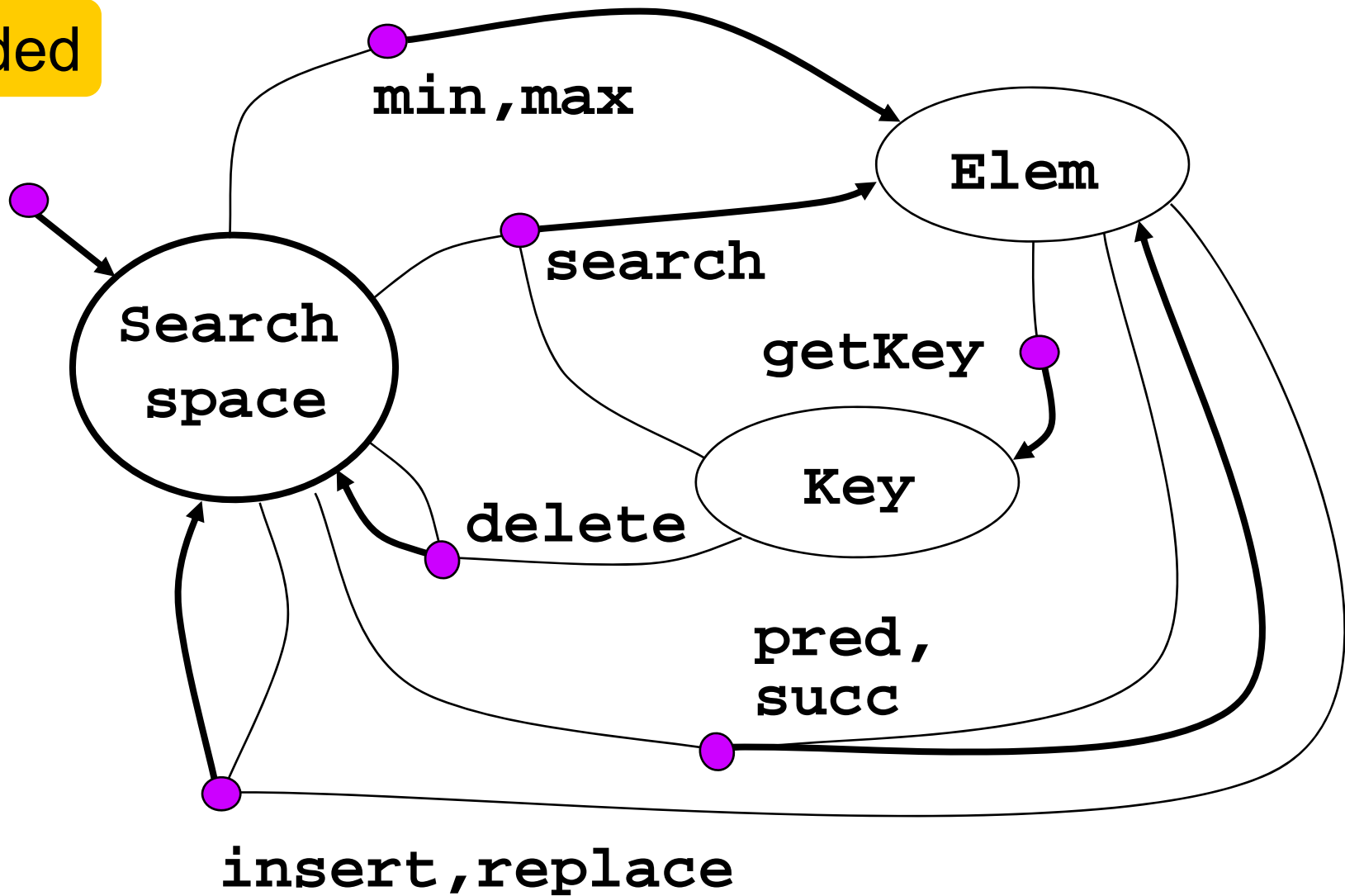
modifiers

- $\text{insert}(e, s), \text{delete}(k, s), \text{replace}(e, s)$

# Search space

Extended

empty





# Another classification

**Address search** - based on digital properties of keys

- Compute position from key  $\text{pos} = f(k)$
- Direct access (*přímý přístup*), hashing
- Array, table, ...
- Direct => FAST (see lecture 11) ...  $O(1)$

**Associative search** - based on comparison between el.

- Element is located in relation to others
- Sequential, binary search, search trees
- Needs searching => SLOWER ...  $O(\log n)$  to  $O(n)$

# Another classification

## Internal or external

- **internal in the memory**
- external in files on disk or tape

## Dimensionality of keys

- **One dimensional - k**
- Multidimensional - [x,y,z]

# Searching – talk overview

Typical operations

Quality measures

Implementation in an array

- Sequential search
- Binary search

Binary search tree – BST (*BVS*)

- Node representation
- Operations
- Tree balancing

# Quality measures

Space for data

**P(n)** = memory complexity

Time / Number of operations

**Q(n)** = complexity of **search**, **query**

**I(n)** = complexity of **insert**

**D(n)** = complexity of **delete**

# Searching – talk overview

Typical operations

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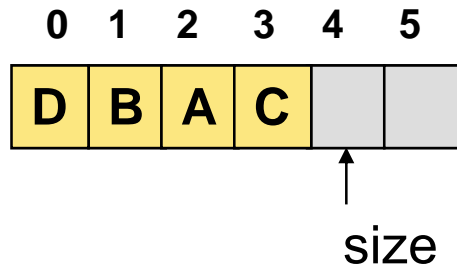
Binary search tree – BST (*BVS*) – in dynamic memory

- Node representation

- Operations

- Tree balancing

# Searching in unsorted array



Unsorted array

Sequential search

insert

delete

min, max

$P(n) = O(n)$

$Q(n) = O(n)$  😞

$I(n) = O(1)$  😊

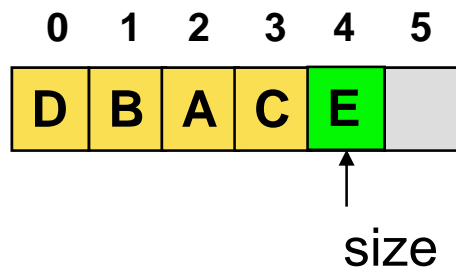
$D(n) = O(n)$  😞

$Q_m(n) = O(n)$  😞

```
nodeT seqSearch( key k, nodeT a[] ) {  
    int i = 0;  
    while( (i < a.size) && (a[i].key != k) )  
        i++;  
    if( i < a.size ) return a[i];  
    else return NODE_NOT_FOUND;  
}
```

Java-like pseudo code

# Searching in unsorted array



Unsorted array with **sentinel (zarážka)**

Sequential search still  $Q(n) = O(n)$  ☹️

But saves one test per step 😊

search("E", a)

```
nodeT seqSearchWithSentinel( key k, nodeT a[] ) {  
    int i = 0;  
    a[a.size] = createArrayElement(k); // add sentinel  
    while( a[i].key != k ) // save one test per step  
        i++;  
    if( i < a.size ) return a[i];  
    else return NODE_NOT_FOUND;  
}
```



Java-like pseudo code

# Searching – talk overview

Typical operations

Quality measures

Implementation in an array

- Sequential search

- Binary search

Binary search tree – BST (*BVS*) – in dynamic memory

- Node representation

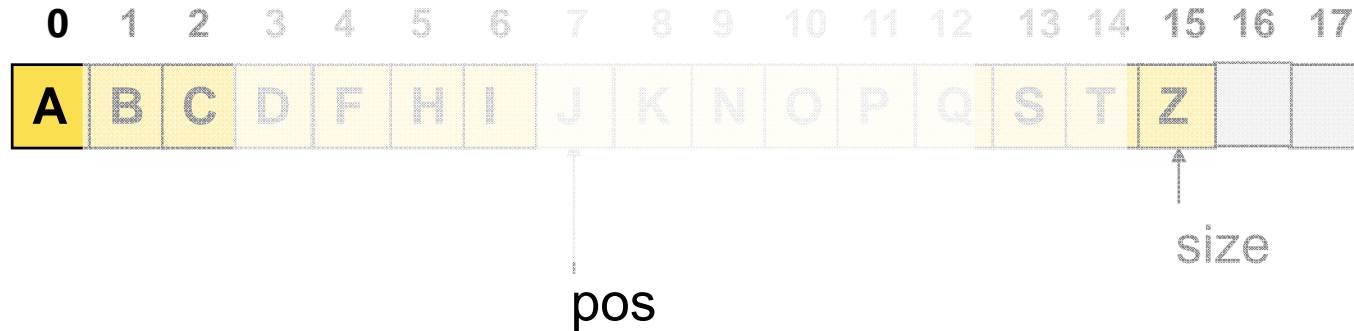
- Operations

- Tree balancing



# Searching in sorted array

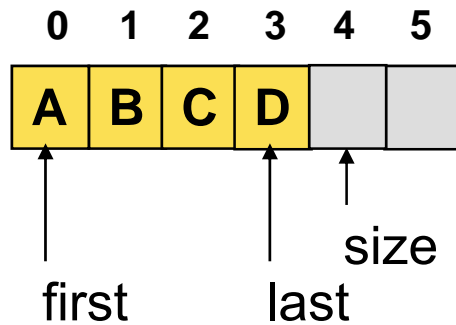
## Binary search



`search("A", a)`

Java-like pseudo code

# Searching in sorted array



Sorted array

Binary search

insert

delete

min, max

$P(n) = O(n)$

$Q(n) = O(\log(n))$  😊

$I(n) = O(n)$  😞

$D(n) = O(n)$  😞

$Q_m(n) = O(1)$  😊

```
nodeT binarySearch( key k, nodeT sortedArray[] ) {  
    int pos = bs( k, sortedArray, 0, sortedArray.size - 1 );  
  
    if( pos >= 0 ) return sortedArray[pos];  
    else return NODE_NOT_FOUND;  
        // bs can return -(pos+1), i.e.  
        // position to insert the node with key k  
}
```

Java-like pseudo code

# Binary search <,=,>

```
//Recursive version          Stop if found -> O(log(n))
int bs( key k, nodeT a[], int first, int last ) {
    if( first > last ) return -(first + 1); // not found
    int mid = ( first + last ) / 2;
    if( k < a[mid].key ) return bs( k, a, first, mid - 1);
    if( k > a[mid].key ) return bs( k, a, mid + 1, last );
    return mid; // found!
}
```

Java-like pseudo code

```
// Iterative version          Stop if found -> O(log(n))
int bs(key k, nodeT a[], int first, int last ) {
    while (first <= last) {
        int mid = (first + last) / 2; // mid point
        if (k < a[mid].key) last = mid - 1;
        else if (key > a[mid].key) first = mid + 1;
        else return mid; // found
    } return -(first + 1); // failed to find key
}
```

Java-like pseudo code

# Binary search $\leq$ , $>$

```
// Iterative fix length version ->  $\Theta(\log(n))$ 
// with just one test, stop after  $\log(n)$  steps
int bs(key k, nodeT a[], int first, int last) {
    while (first < last) {
        int mid = (first + last) / 2;
        if (key > a[mid].key) first = mid + 1;
        else //can't be last = mid-1: here A[mid] >= key
            //so last can't be < mid if A[mid] == key
            high = mid;
    }
    return -(first + 1); // failed to find key

    if (first < N and (A[first ] == value)
        return first
    else return not_found
```

Java-like pseudo code

# Binary search bug

## Binary search bug

[pointed out by Ondřej Karlík/Joshua Bloch]

[Sun JDK 1.5.0 beta, 2004]

```
int mid = (first + last) / 2;
```

```
int mid = (first + last) >> 1;
```

gibibyte

Signed arithmetic overflow for large arrays

- number larger than  $2^{30}$  !!! ~ 1 GiB
- negative index out of bounds

Solution:

```
int mid = first + ((last - first) / 2);
```

```
int mid = (first + last) >>> 1; // unsigned shift
```

```
int mid = ((unsigned) (first + last)) >> 1;
```

# Interpolation search

## Interpolation search

- parallels how humans search through a phone book
- estimates position based on values of bounds `a[first]` and `a[last]`

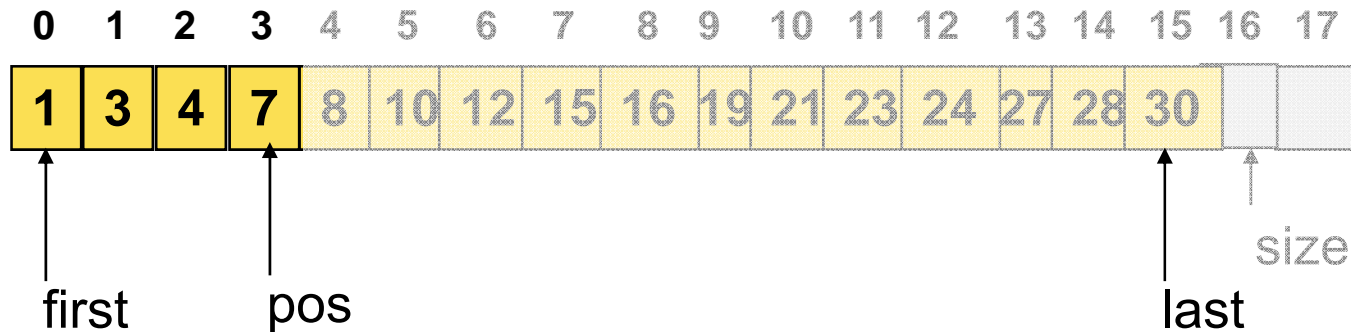
$$\text{pos} = \text{first} + \frac{(\text{last} - \text{first})}{a[\text{last}] - a[\text{first}]} (x - a[\text{first}])$$

- $O(\log \log n)$  average case for uniform distribution
- $O(n)$  maximum for e.g. exponential distribution

# Searching in sorted array

## Interpolation search

search("7", a)



$$\text{pos} = \text{first} + \frac{(\text{last} - \text{first})}{a[\text{last}] - a[\text{first}]} (x - a[\text{first}])$$

$$\text{pos} = 0 + \frac{(15 - 0)}{30 - 1} * (7 - 1) = 15/29 * 6 = 3 \Rightarrow \text{found}$$

while mid = 15-0 = 7

# Searching (*Vyhledávání*)

Typical operations

Quality measures

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Binary search tree – BST (*BVS*) – in dynamic memory

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# Binární vyhledávací strom (BVS)

**Binární strom** (=kořenový, orientovaný, dva následníci) +

= prázdný strom, nebo

trojice: kořen a TL (levý podstrom) a TR (pravý podstrom).

Jeden i oba mohou být prázdné [Kolář]

– uzel má 0, 1, 2 následníky (nemusí být pravidelný)

## **Binární vyhledávací strom (BVS)**

– binární strom, v němž navíc

– Pro libovolný uzel  $u$  platí, že

pro všechny uzly  $u_L$  z levého podstromu a

pro všechny uzly  $u_R$  z pravého podstromu uzlu  $u$  platí:

$$\text{klíč}(u_L) < \text{klíč}(u) < \text{klíč}(u_R)$$

# Binary search tree (BST)

**Binary tree** (=rooted, i.e., oriented, two successors,...) +

= empty tree, or

triple: root, TL (left subtree), and TR (right subtree). One or both can be empty [Kolář]

– node has 0, 1, 2 successors (need not to be regular)

## **Binární vyhledávací strom (BVS)**

= Binary tree, and moreover

– For any node  $u$  holds

for all nodes  $u_L$  from the left subtree and

for all nodes  $u_R$  from the right subtree of node  $u$  holds:

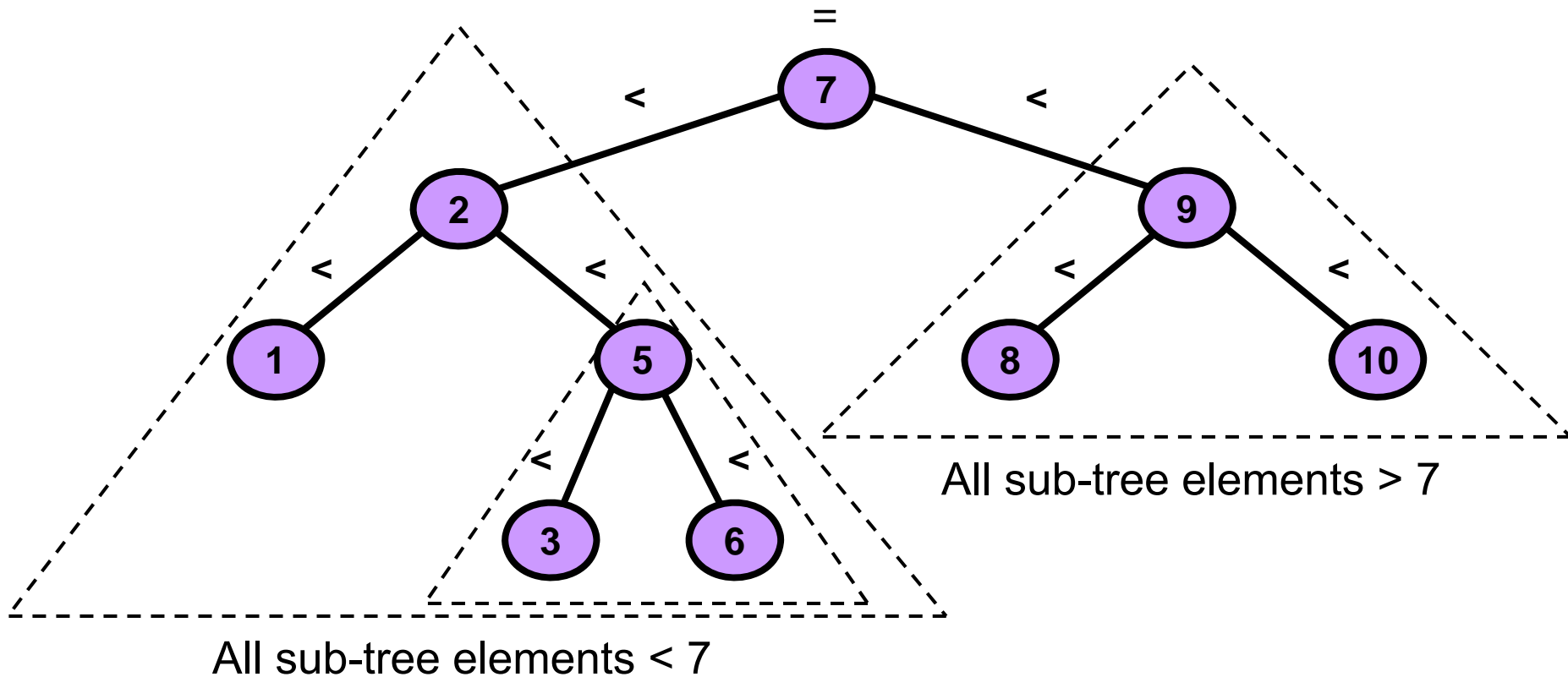
$$\text{key}(u_L) < \text{key}(u) < \text{key}(u_R)$$

# Binární vyhledávací strom

## Binary Search Tree

Smaller left

Greater right



# Searching (*Vyhledávání*)

Typical operations

Quality measures

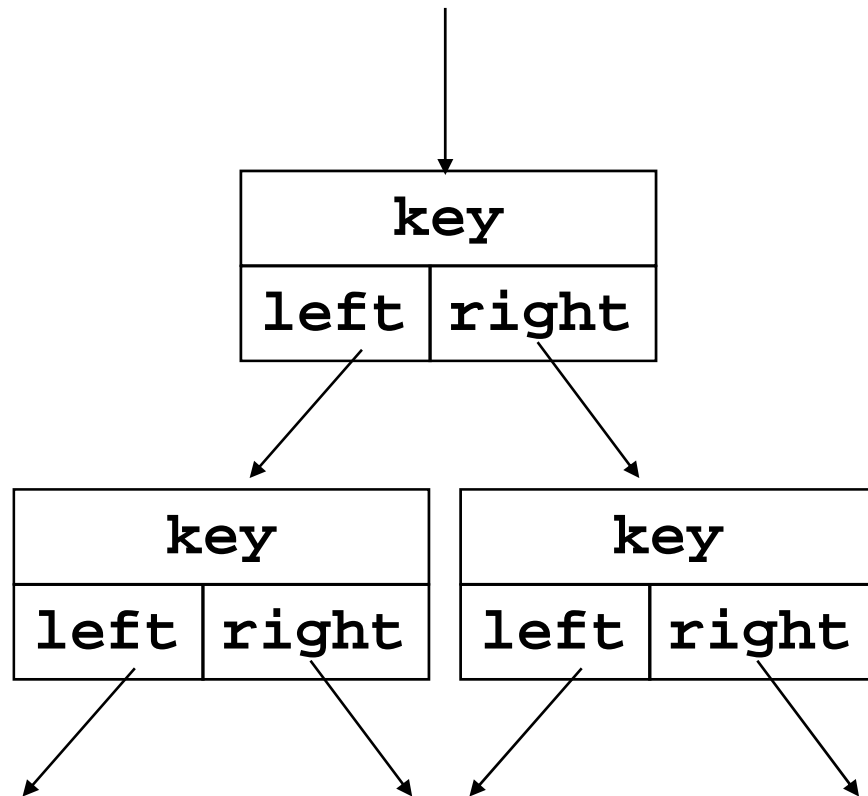
Implementation in an array

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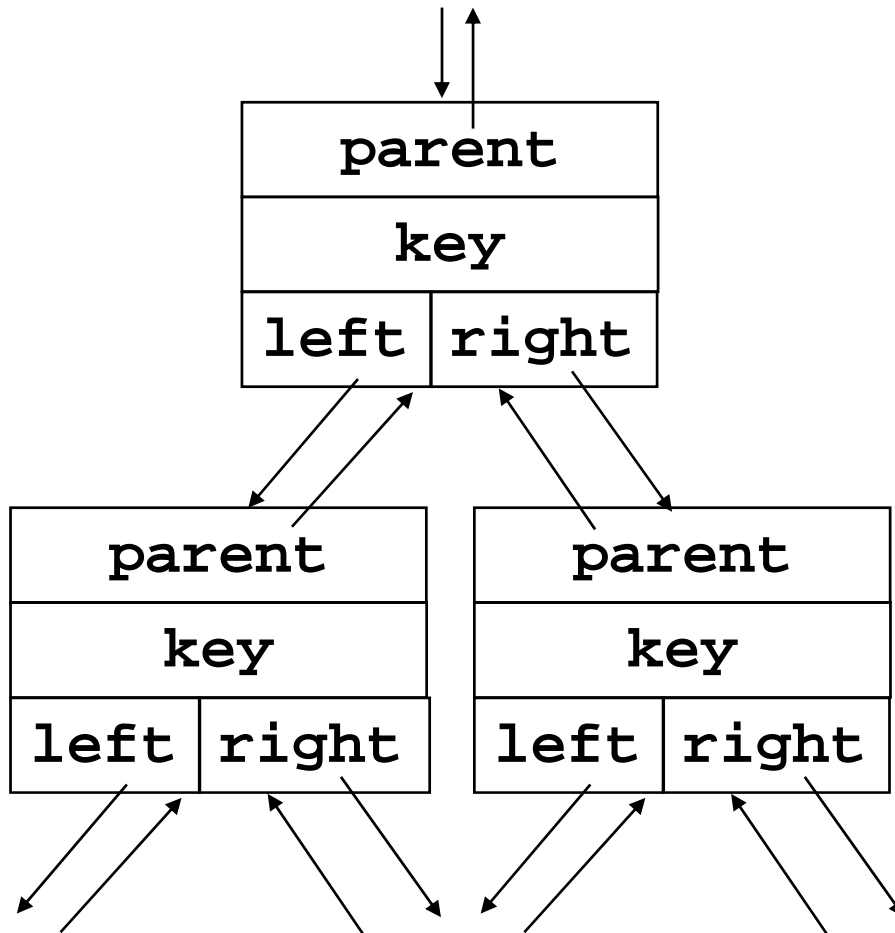
# Tree node representation



Good for:

- search
- min, max

# Tree node representation



Good for

- search
- min, max
- predecessor, successor

# Tree node representation

```
public class Node {  
    public Node left;  
    public Node right;  
    public int key;  
  
    public Node(int k) {  
        key = k;  
        left = null;  
        right = null;  
        data = ...;  
    }  
}  
  
public class Tree {  
    public Node root;  
    public Tree() {  
        root = null;  
    }  
}
```

See Lesson 6, page 17-18

```
public class Node {  
    public Node parent;  
    public Node left;  
    public Node right;  
    public int key;  
  
    public Node(int k) {  
        key = k;  
        parent = null;  
        left = null;  
        right = null;  
        data = ...;  
    }  
}  
  
public class Tree {  
    ...  
}
```

# Searching (*Vyhledávání*)

Typical operations

Quality measures

Implementation in an array

- Sequential search
- Binary search

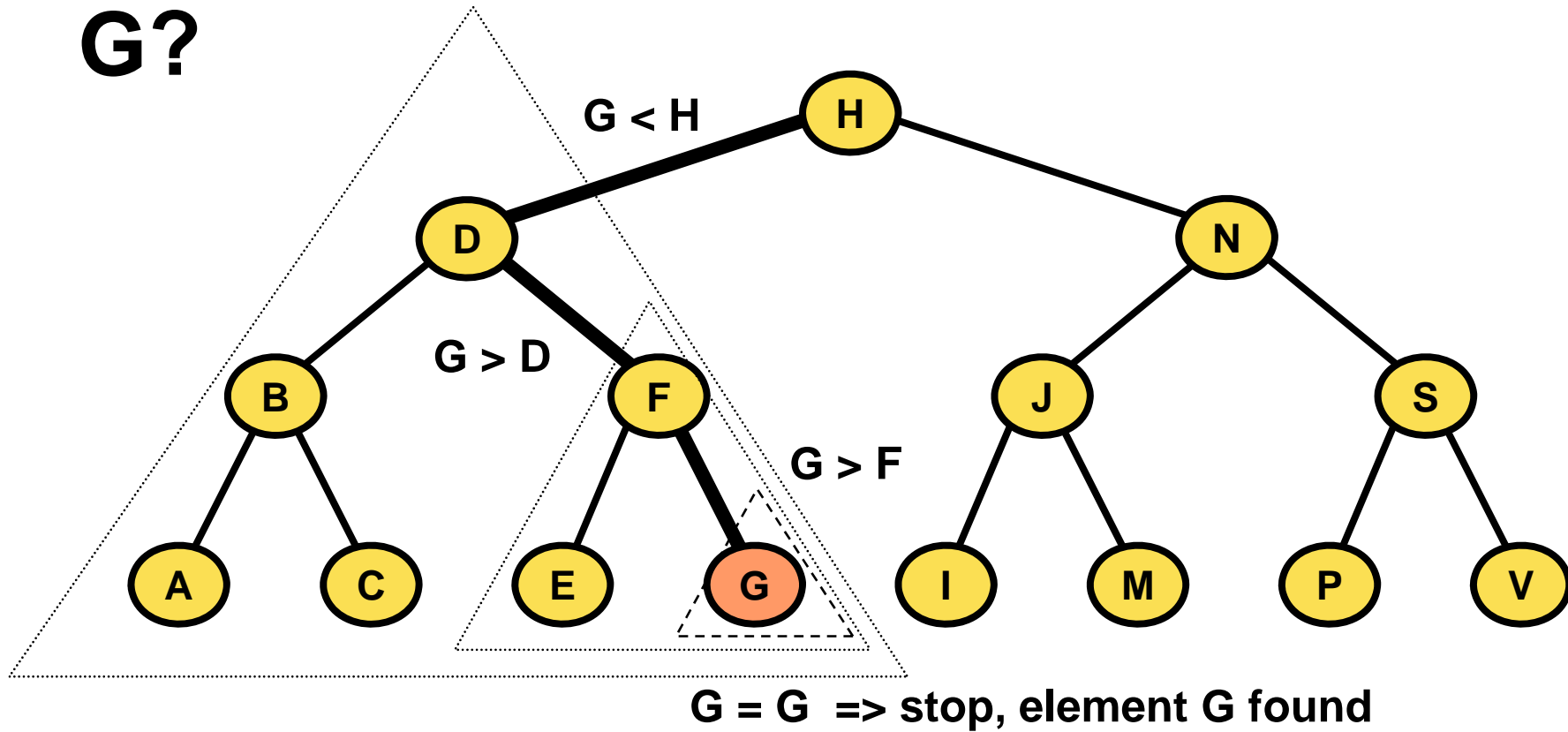
Binary search tree – BST (*BVS*) – in dynamic memory

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# Searching BST

**G?**



# Searching BST - recursively

```
//Recursive version
```

```
Node treeSearch( Node x, key k )  
{  
    if(( x == null ) or ( k == x.key ))  
        return x;  
    if( k < x.key )  
        return treeSearch( x.left, k );  
    else  
        return treeSearch( x.right, k );  
}
```

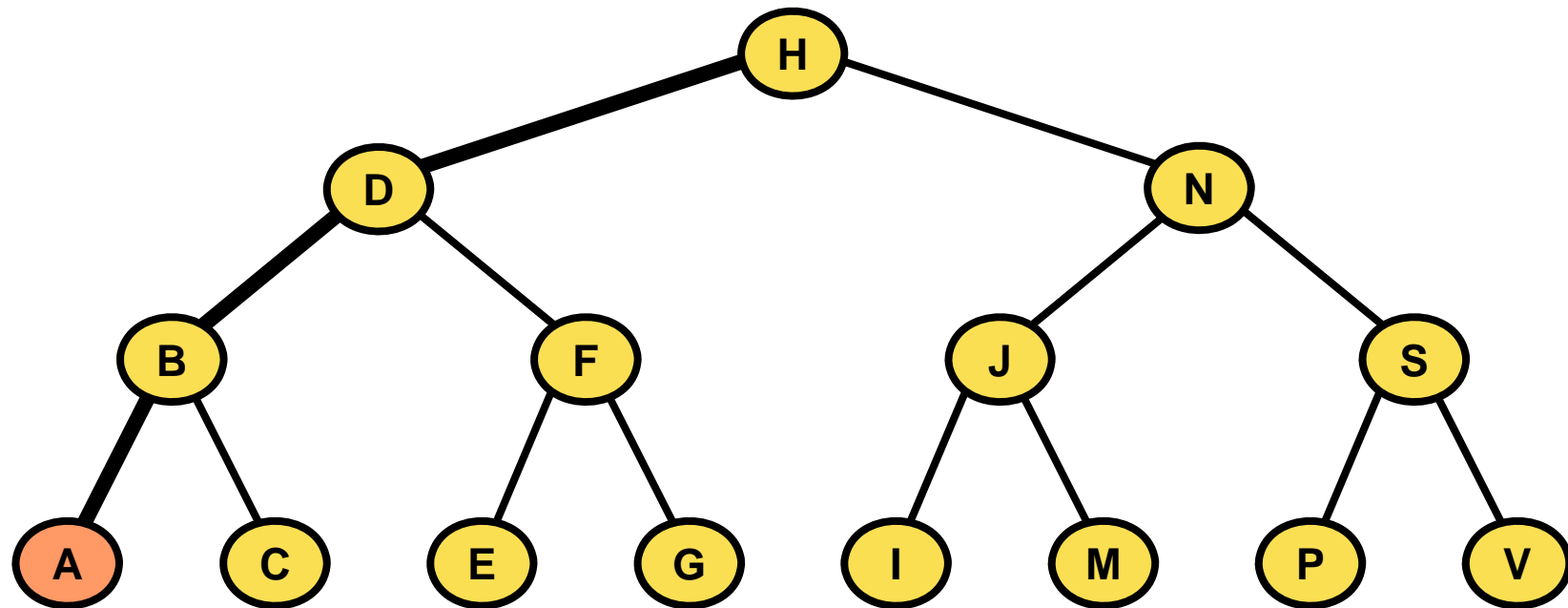
Java-like pseudo code

# Searching BST - iteratively

```
//Iterative version
Node treeSearch( Node x, key k )
{
    while(( x != null ) and (k != x.key ))
    {
        if( k < x.key ) x = x.left;
        else           x = x.right;
    }
    return x;
}
```

Java-like pseudo code

# Minimum in BST



# Minimum in BST - iteratively

```
Node treeMinimum( Node x )
{
    if( x == null ) return null;
    while( x.left != null )
    {
        x = x.left;
    }
    return x;
}
```

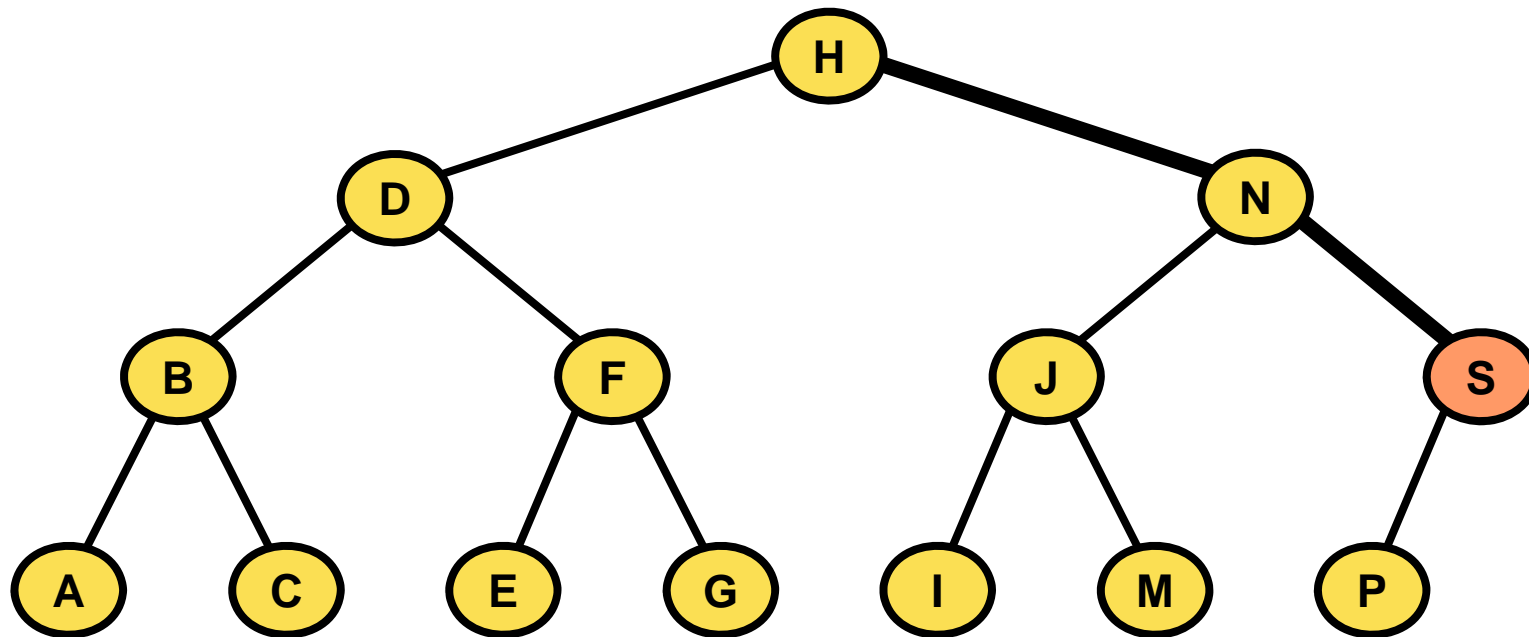
Java-like pseudo code

# Maximum in BST - iteratively

```
Node treeMaximum( Node x )
{
    if( x == null ) return null;
    while( x.right != null )
    {
        x = x.right;
    }
    return x;
}
```

Java-like pseudo code

# Maximum in BST



# Successor in BST

1/6

in the sorted order (in-order tree walk)

Two cases:

1. Right son exists
2. Right son is null

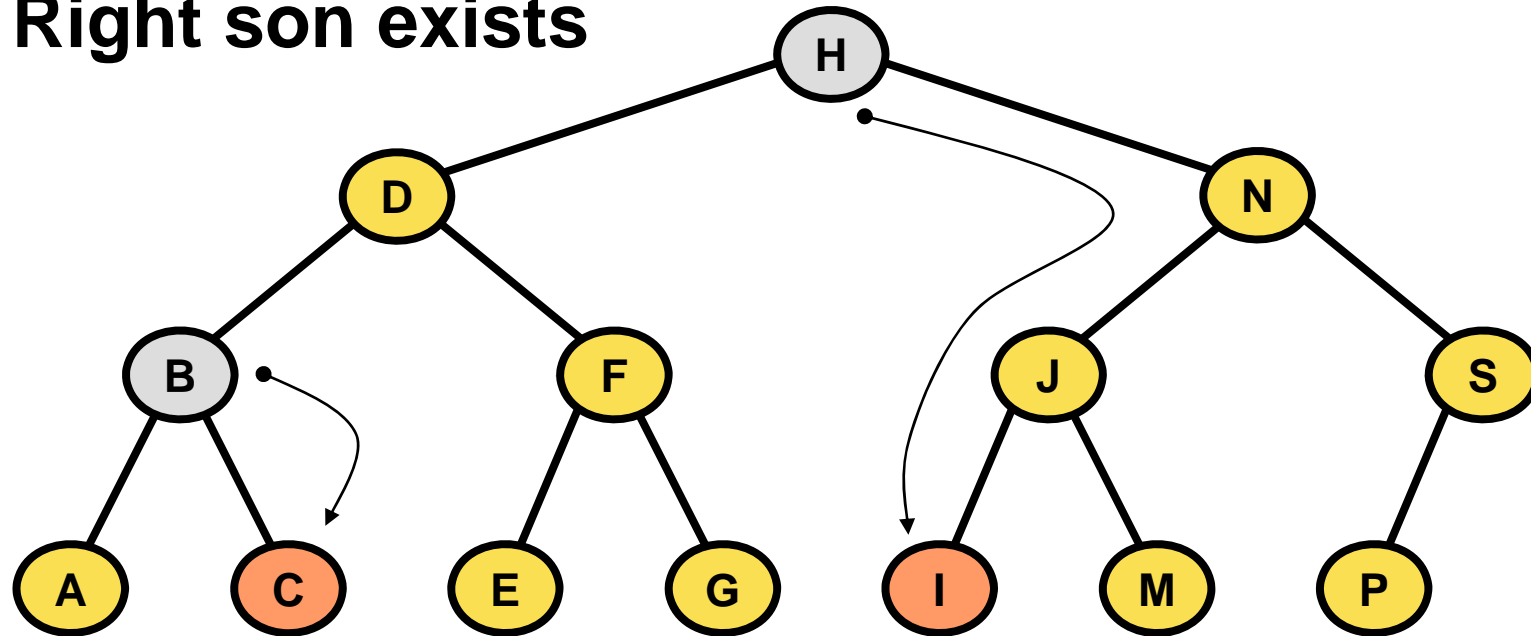


# Successor in BST

2/6

in the sorted order (in-order tree walk)

## 1. Right son exists



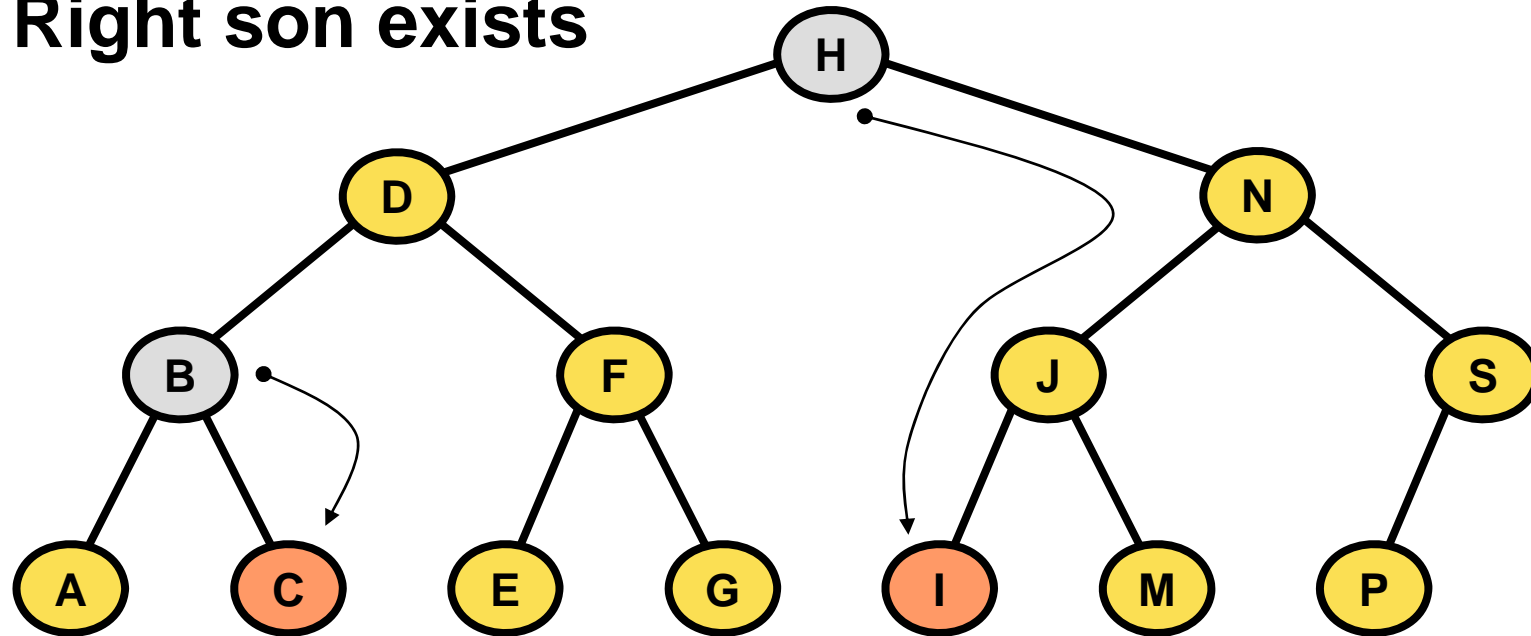
`succ(B) -> C`  
`succ(H) -> I`    **How?**

# Successor in BST

3/6

in the sorted order (in-order tree walk)

## 1. Right son exists



`succ(B) -> C`

`succ(H) -> I`

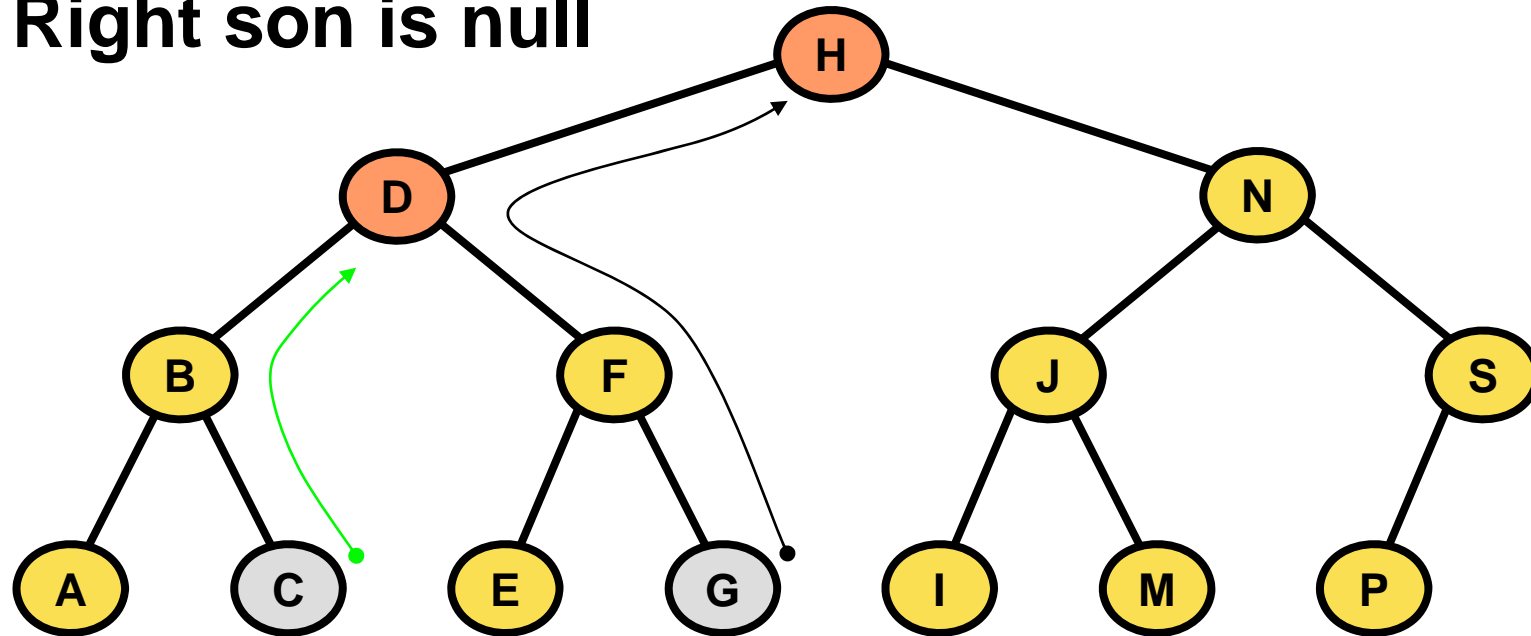
) Find the *minimum* in the *right* tree  
= `min( x.right )`

# Successor in BST

4/6

in the sorted order (in-order tree walk)

## 2. Right son is null



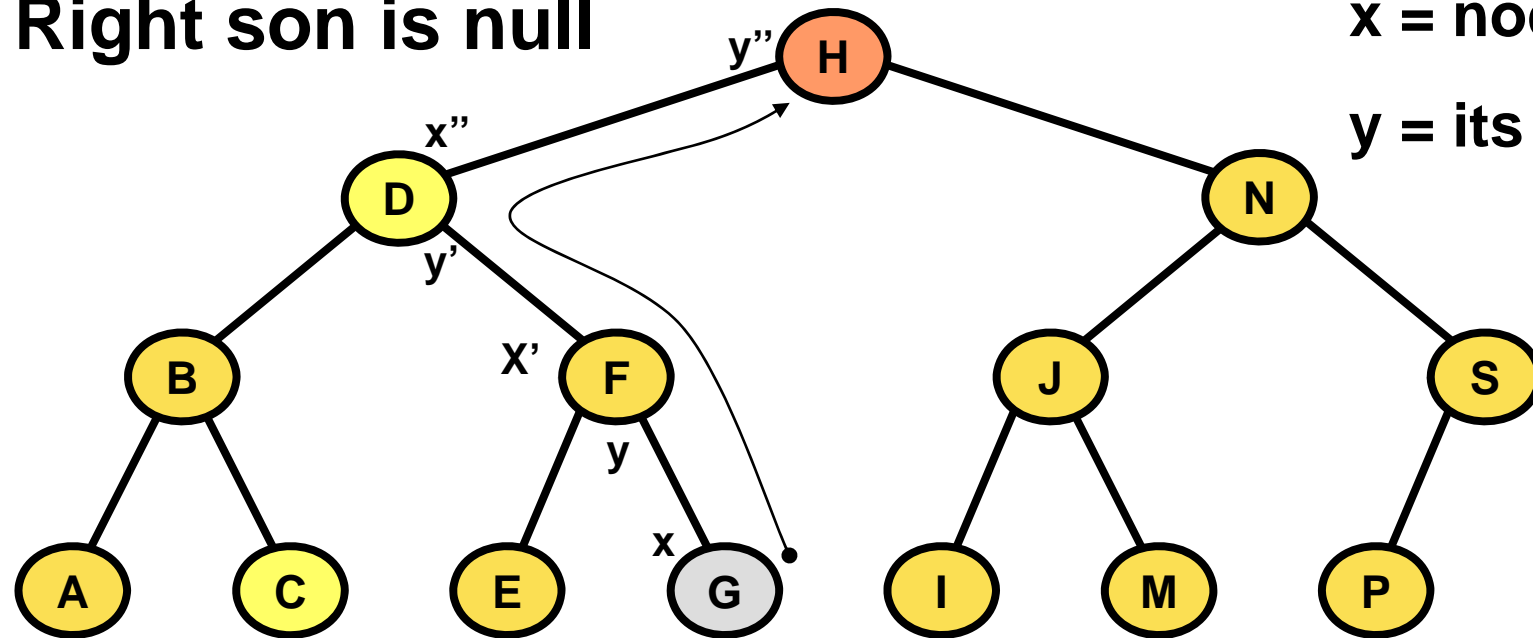
**succ(C) -> D**  
**succ(G) -> H**    **How?**

# Successor in BST

5/6

in the sorted order (in-order tree walk)

## 2. Right son is null



x = node on path

y = its parent

$\text{succ}(G) \rightarrow H$

Find the *minimal parent to the right*

(the minimal parent the node is left from)

# Successor in BST

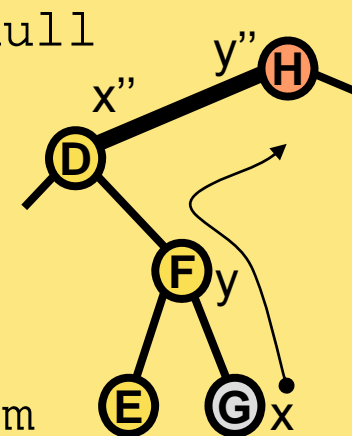
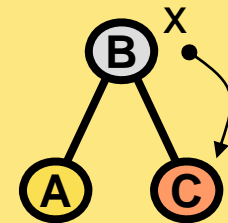
6/6

in the sorted order (in-order tree walk)

```
Node treeSuccessor( Node x )  
{  
    if( x == null ) return null;  
  
    if( x.right != null ) // 1. right son exists  
        return treeMinimum( x.right );  
  
    y = x.parent;        // 2. right son is null  
    while( (y != null) and (x == y.right))  
    {  
        x = y;  
        y = x.parent;  
    }  
    return y;           // first parent x is left from  
}
```

**x = node on path**

**y = its parent**



Java-like pseudo code

# Predecessor in BST

1/1

in the sorted order (in-order tree walk)

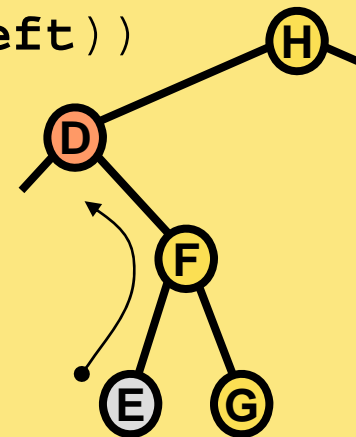
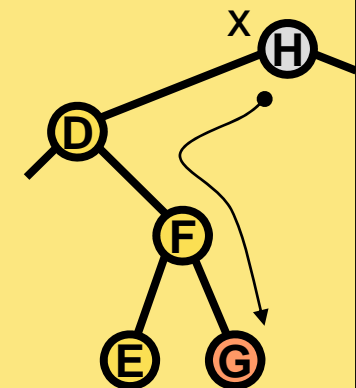
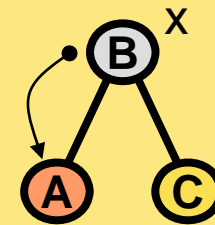
```
Node treePredecessor( Node x )
{
    if( x == null ) return null;

    if( x.left != null )
        return treeMaximum( x.left );

    y = x.parent;
    while( (y != null) and (x == y.left))
    {
        x = y;
        y = x.parent;
    }
    return y;
}
```

**x = node on path**

**y = its parent**



Java-like pseudo code

# Operational Complexity

The following dynamic-set operations:

Search,

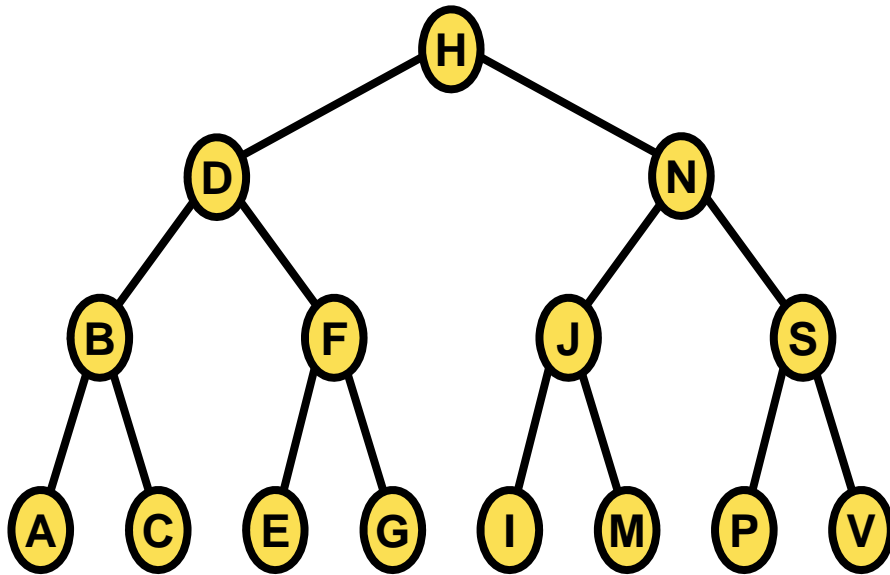
Maximum, Minimum,

Successor, Predecessor

can run in  $O(h)$  time

on a binary tree of height  $h$ . .... *what  $h$ ?*

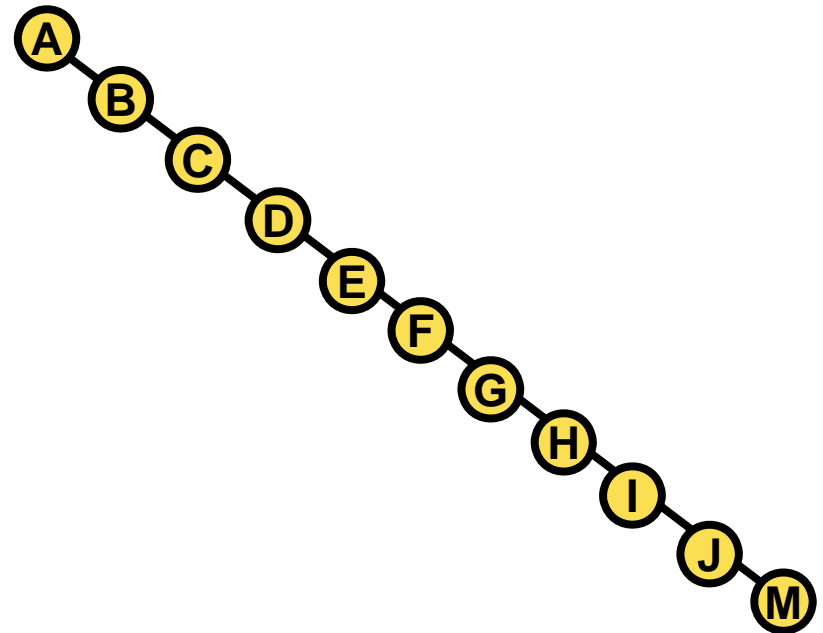
# Operational Complexity



$$h = \log_2(n)$$

$$\Rightarrow O(\log(n)) \text{ 😊}$$

**$\Rightarrow$  balance the tree!!!**



$$h = n$$

$$\Rightarrow O(n) !!! \text{ 😞}$$



# Operational Complexity

The following dynamic-set operations:

Search,

Maximum, Minimum,

Successor, Predecessor

can run in  $O(n)$  time

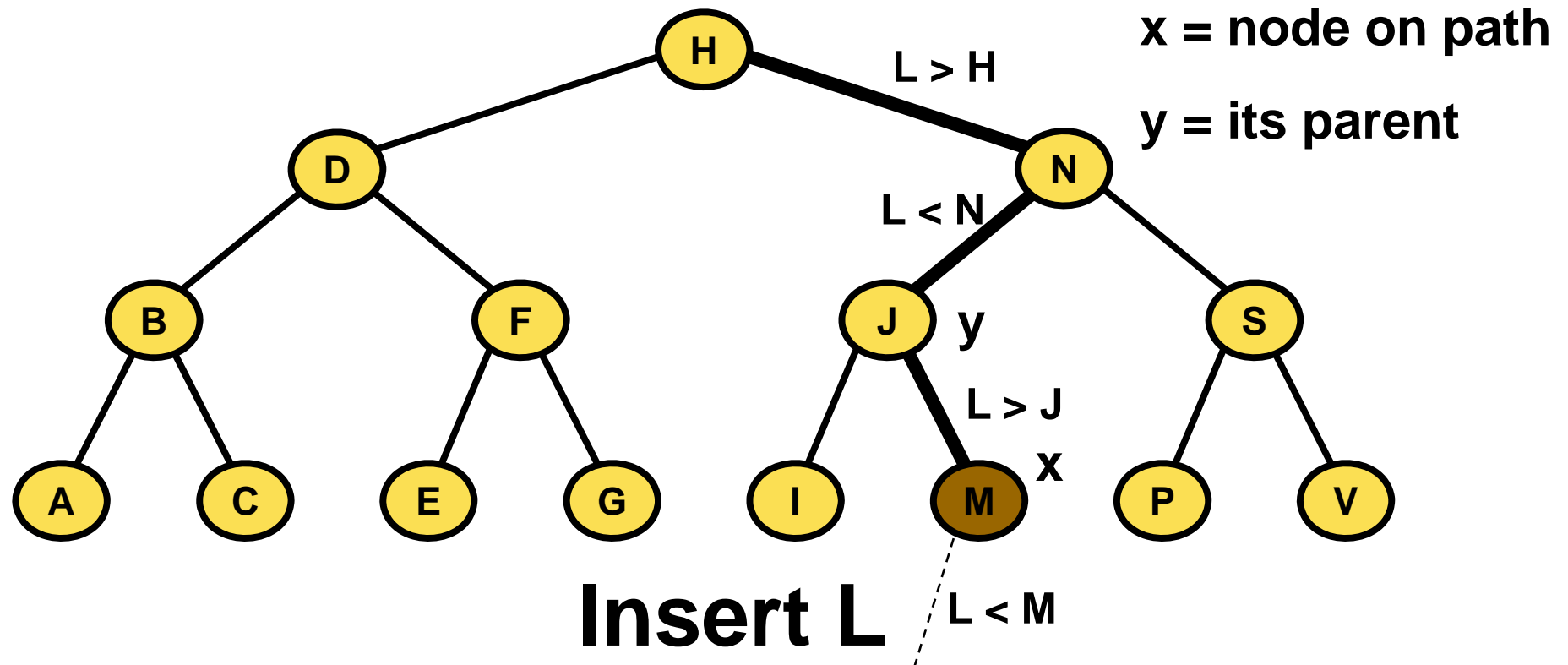
on a **not-balanced binary tree** with  $n$  nodes.

*and*

can run in  $O(\log(n))$  time

on a **balanced binary tree** with  $n$  nodes.

# Insert (vložení prvku)



1. find the parent leaf ... M
2. connect new element as a new leaf ... M.left

# Insert (vložení prvku)

```
void treeInsert( Tree t, Node e )  
{  
    x = t.root; y = null; // set x to tree root  
  
    if( x == null )  
        t.root = e; // tree was empty  
    else {  
        while(x != null) { // find the parent leaf  
            y = x;  
            if( e.key < x.key ) x = x.left;  
            else x = x.right;  
        }  
        if( e.key < y.key ) y.left = e; // add e to parent y  
        else y.right = e;  
    }  
}
```

x = node on path

y = its parent

Java-like pseudo code

This is a simple version – with no update for equal keys

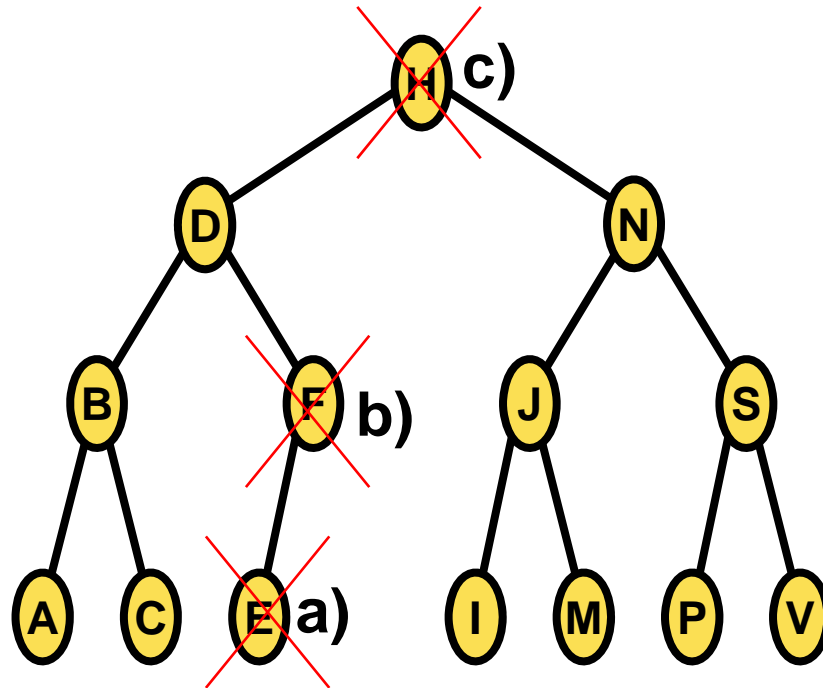
# Operational Complexity

## Insert

1. find the parent leaf  
 $O(h)$ ,  $O(\log(n))$  on balanced tree
2. connect the new element as a new leaf  
 $O(1)$

$\Rightarrow O(h)$ , i.e.  $O(\log(n))$  on balanced tree

# Delete (odstranění prvku)

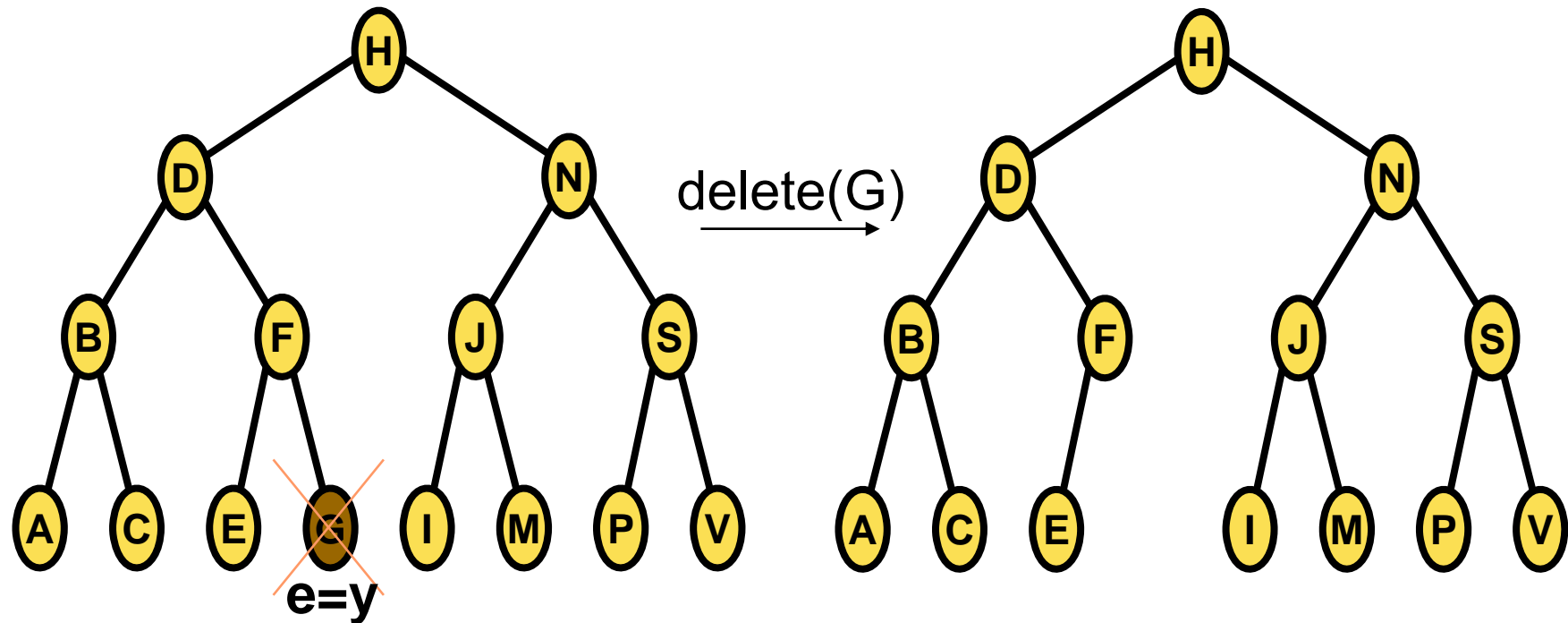


## Delete – 3 cases

- a) leaf has no children
- b) node with one child
- c) node with two children  
(problem with two subtrees)

# Delete (odstranění prvku)

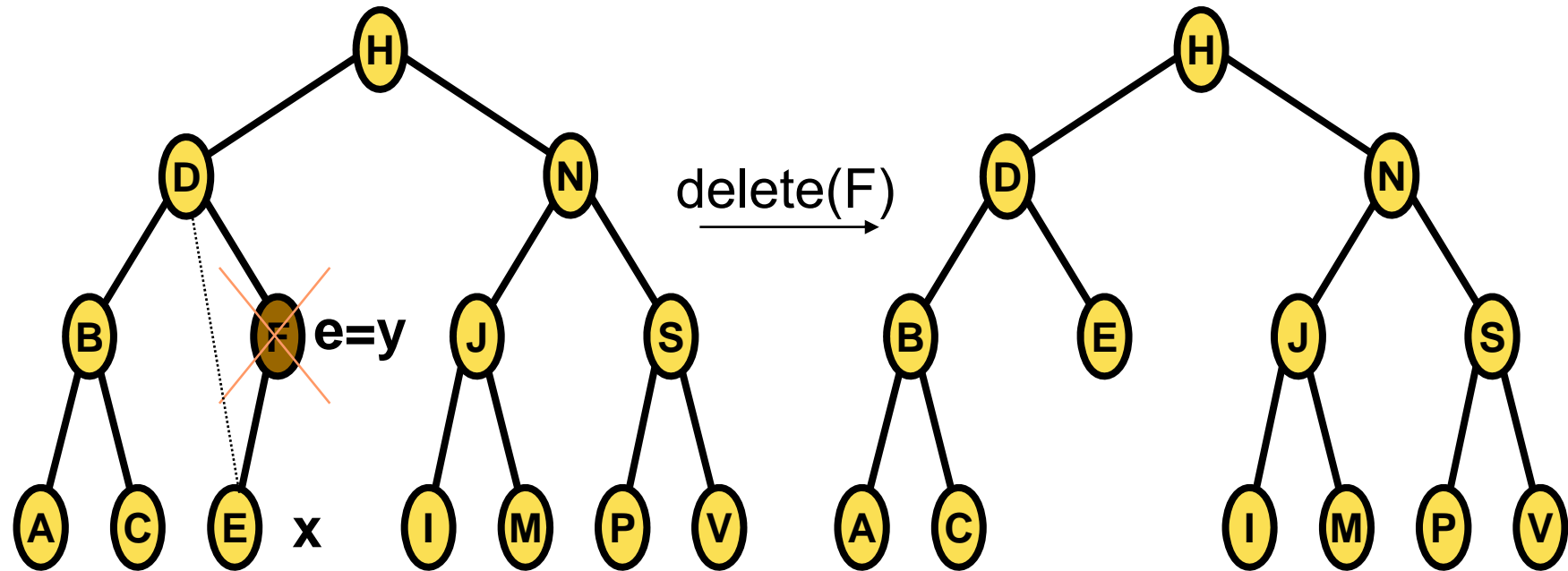
## a) leaf (smaž list)



a) leaf has no children -> it is simply removed

# Delete (odstranění prvku)

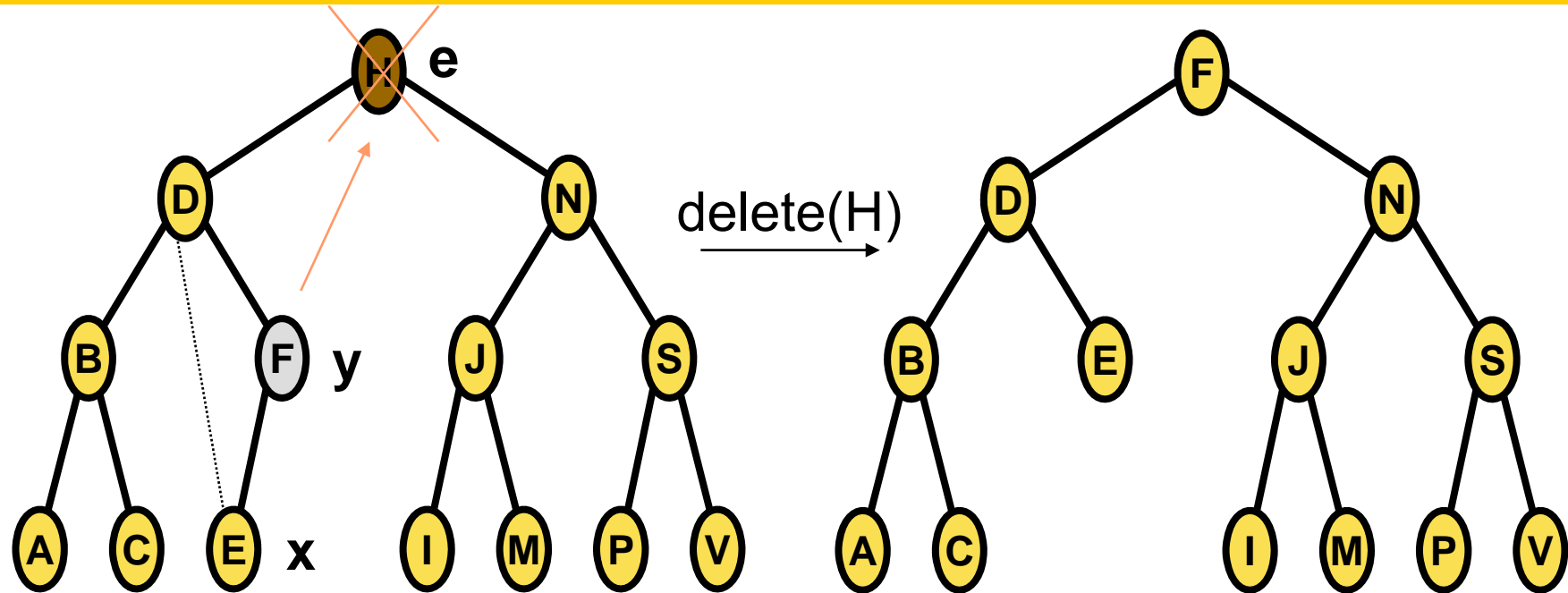
b) node with one child (vnitřní s 1 potomkem)



b) node has one child -> splice the node out  
(přemostí vymazaný uzel)

# Delete (odstranění prvku)

c) node with two children (se 2 potomky)



c) node has two children -> replace node with predecessor (or successor) (it has no or one child)

and delete the predecessor



# Delete (odstranění prvku)

Variables:

$t$  tree

$e$  element to be *logically* deleted from  $t$

$y$  element to be *physically* deleted from  $t$

$x$  is  $y$ 's only son or null

– will be connected to  $y$ 's parent

# Delete (odstranění prvku)

```
Node treeDelete( Tree t, Node e ) // e...node to logically delete
{ Node x, y;                       // y...node to physically delete
                                   // x...y's only son
```

1. find node y (e or predecessor of e)
2. find x = y's only child or null
3. link x up with parent of y
4. link parent of y down to x
5. replace e by in-order predecessor y
6. return y (for later use ~ delete y)

```
}
```

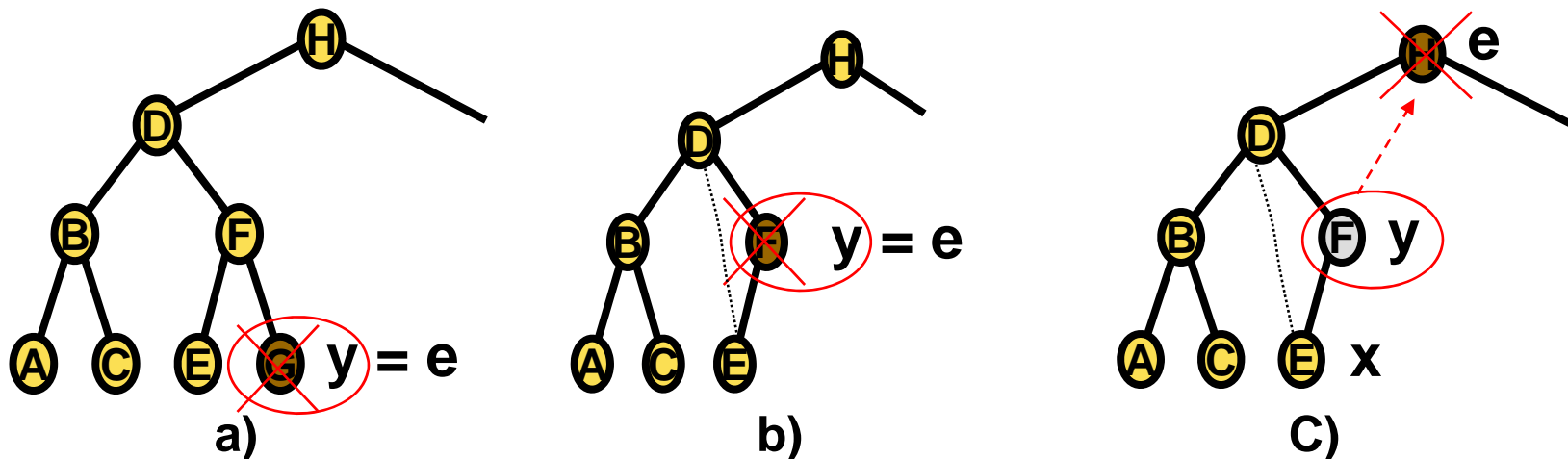
# Delete (odstranění prvku)

```
Node treeDelete( Tree t, Node e ) // e...node to logically delete
{ Node x, y;                       // y...node to physically delete
                                     // x...y's only son
```

## 1. find node y

```
if(e.left == null OR e.right == null) // cases a, b) 0 to 1 child
    y = e;
else
    y = TreePredecessor(e); // case c) 2 children
```

cont...



# Delete (odstranění prvku)

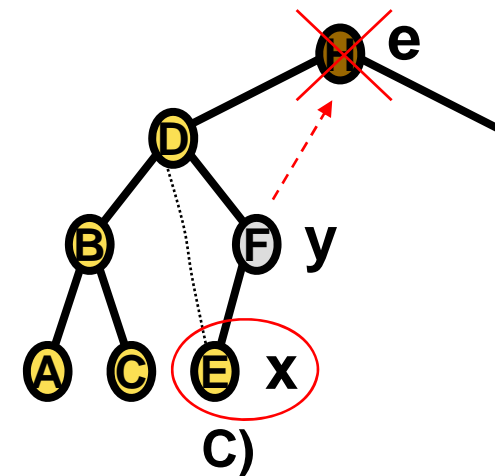
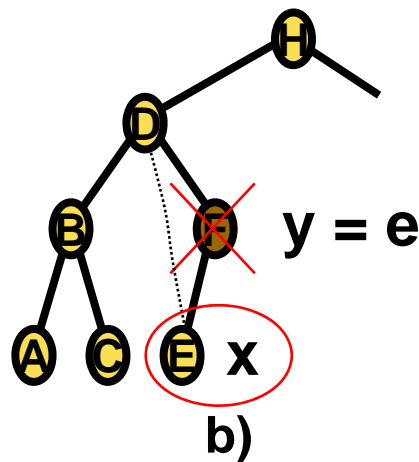
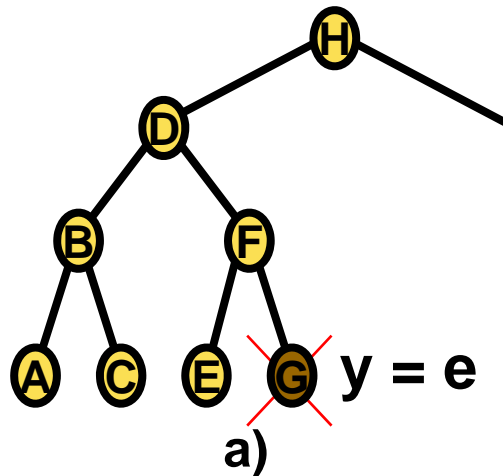
... Cont

// On which side the child is?

```
2. find x = y's only child (L or R) or null
```

```
if( y.left != null ) // a) null, b,c) only child  
x = y.left;  
else  
x = y.right;
```

cont...



# Delete (odstranění prvku)

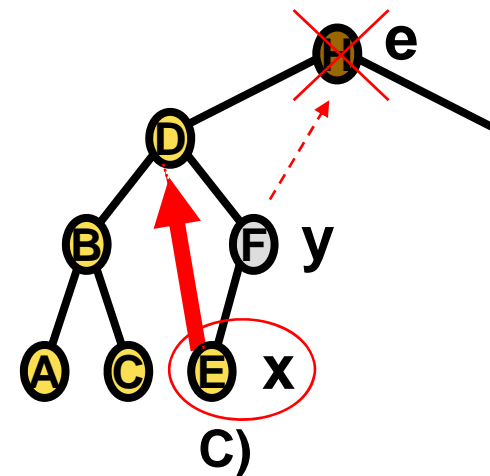
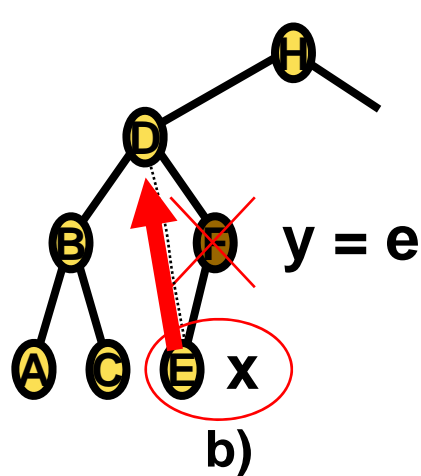
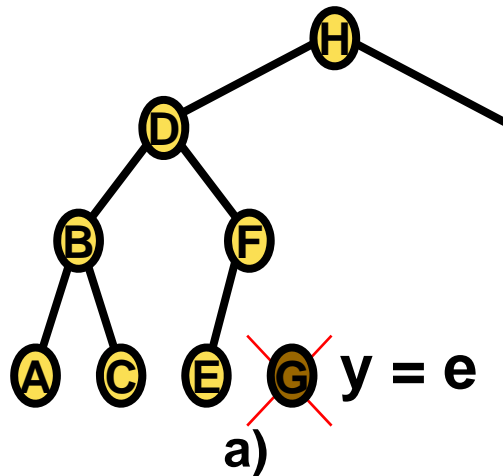
... cont

...

3. link x up with its new parent (former parent of y)

```
if( x != null ) x.parent = y.parent; // b,c)
```

cont...



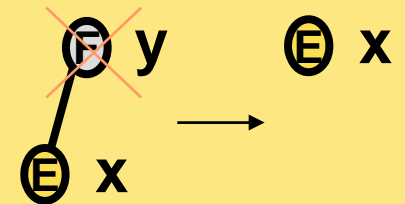
# Delete (odstranění prvku)

## 4. link parent of y down to x

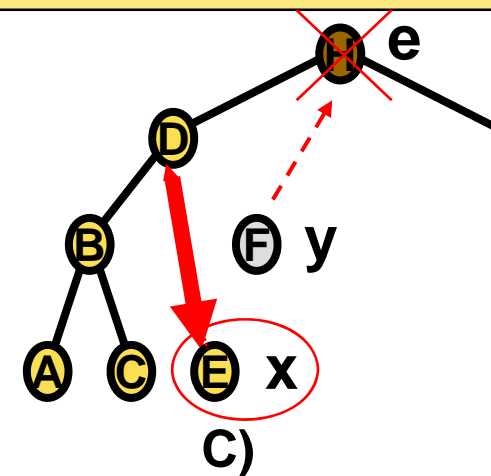
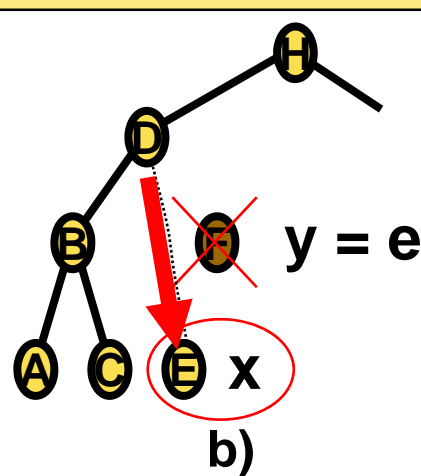
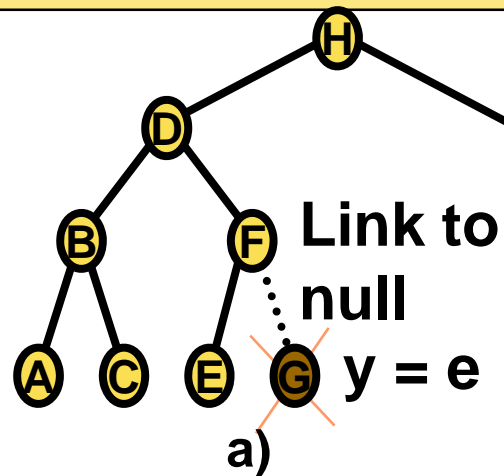
```

if( y.parent == null )
    t.root = x // y was root
else if( y == (y.parent).left )
    (y.parent).left = x; // y was left son
else
    (y.parent).right = x; // y was right son

```



cont...



# Delete (odstranění prvku)

...

```
5. replace e with in-order predecessor
```

```
    if( y != e )           // replace e with in-order predecessor
```

```
{
```

```
    e.key = y.key; // copy the key
```

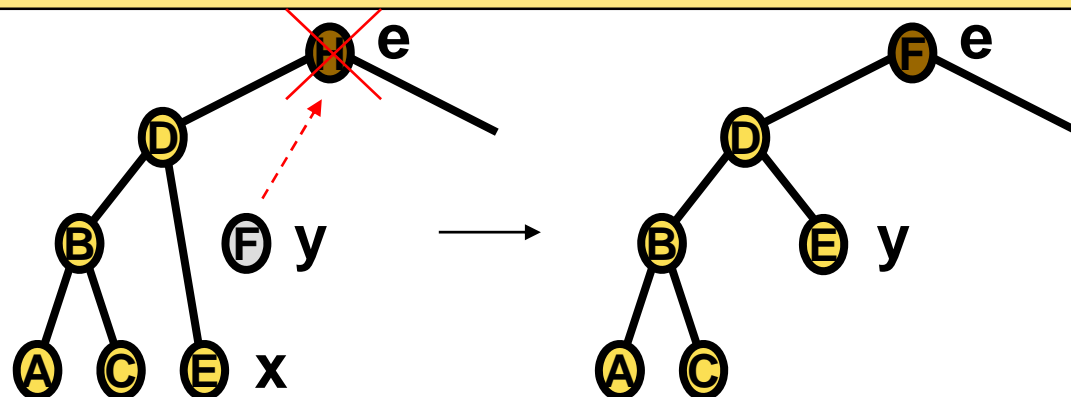
```
    e.data = y.data; // copy other fields too
```

```
}
```

```
6. return y (for later use)
```

```
return y; // instead of delete
```

```
}
```



# Delete on a single page

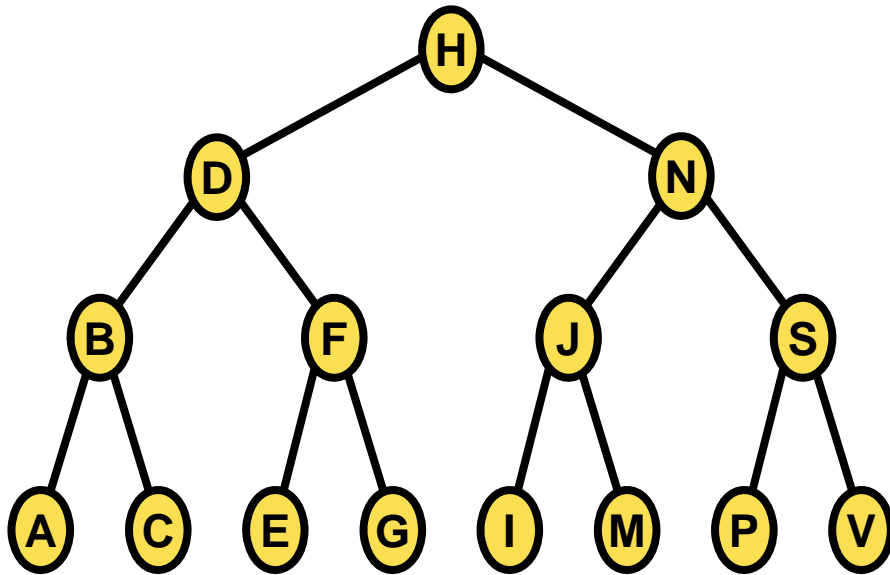
```
Node treeDelete( Tree t, Node e ) // e..node to logically delete
{ Node x, y;                       // y...node to physically delete, x...y's only son

    if(e.left == null OR e.right == null)
        y = e;                       // cases a, b) 0 to 1 child
    else y = TreePredecessor(e);    // c) 2 children
    if( y.left != null )             // a) null, b,c) only child
        x = y.left;
    else x = y.right;
    if( x != null ) x.parent = y.parent; // b,c)
    if( y.parent == null ) t.root = x // y-root
    else if( y == (y.parent).left ) (y.parent).left = x; // y-L son
        else (y.parent).right = x; // y-R son
    if( y != e ) { // replace e with in-order predecessor
        e.key = y.key;
        e.dat = y.data; // copy other fields too
    }
    return y; // instead of delete
}
```



And the operational complexity?

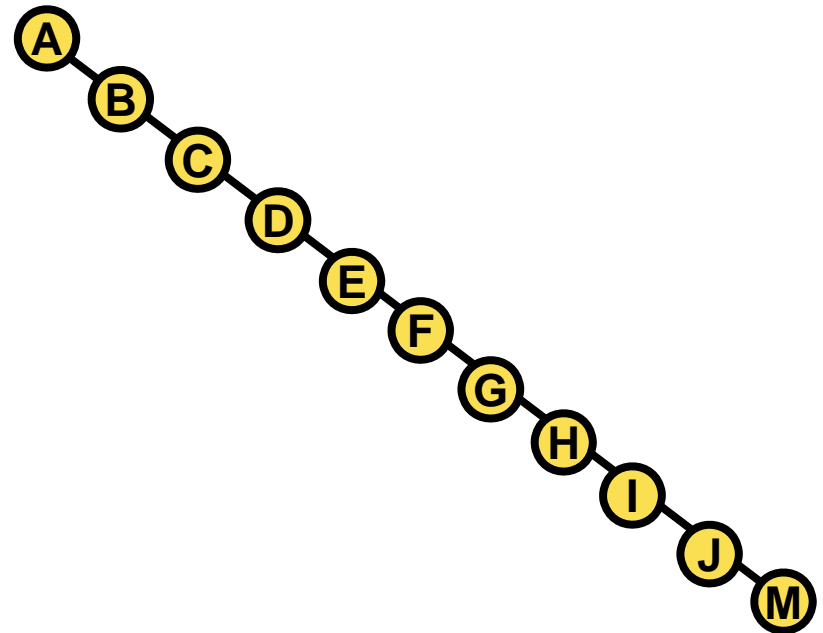
# Operational Complexity



$$h = \log_2(n)$$

$$O(\log(n))$$

**=> balance the tree!!!**



$$h = n !!!$$

$$O(n) !!!$$

# Searching – talk overview

Typical operations

Quality measures

Implementation in an array

- Sequential search
- Binary search

Binary search tree – BST (*BVS*) – in dynamic memory

- Node representation
- Operations
- Tree balancing

# Tree balancing

Balancing criteria

Rotations

AVL – tree

Weighted tree

# Tree balancing

Why?

To get the  $O(\log n)$  complexity of search,...

How?

By *local modifications* reach the global goal  
(*local modifications* = rotations)

# Kritéria vyvážení stromu

Silná podmínka – shoda  $h$  podstromů (Ideální případ)

Pro všechny uzly platí:

počet uzlů vlevo = počet uzlů vpravo

Slabší podmínka – násobek  $h \Rightarrow c \cdot h = O(\log n)$

- **výška** podstromů - AVL strom
- **výška** + počet potomků - 1-2 strom, ...
- **váha** podstromů (počty uzlů) - váhově vyvážený strom
- stejná **černá výška** – Červeno-černý strom

# Tree balancing criteria

Strong criterion (Ideal case)

For all nodes:

No of nodes to the left = No of nodes to the right

Weaker criterion:  $\Rightarrow c \cdot h = O(\log n)$

- subtree **heights** - AVL tree
- height + number of children - 1-2 tree, ...
- subtree **weights** (No of nodes) - weighted tree
- equal **Black height** – Red-Black tree

# Tree balancing

Balancing criteria

Rotations

AVL – tree

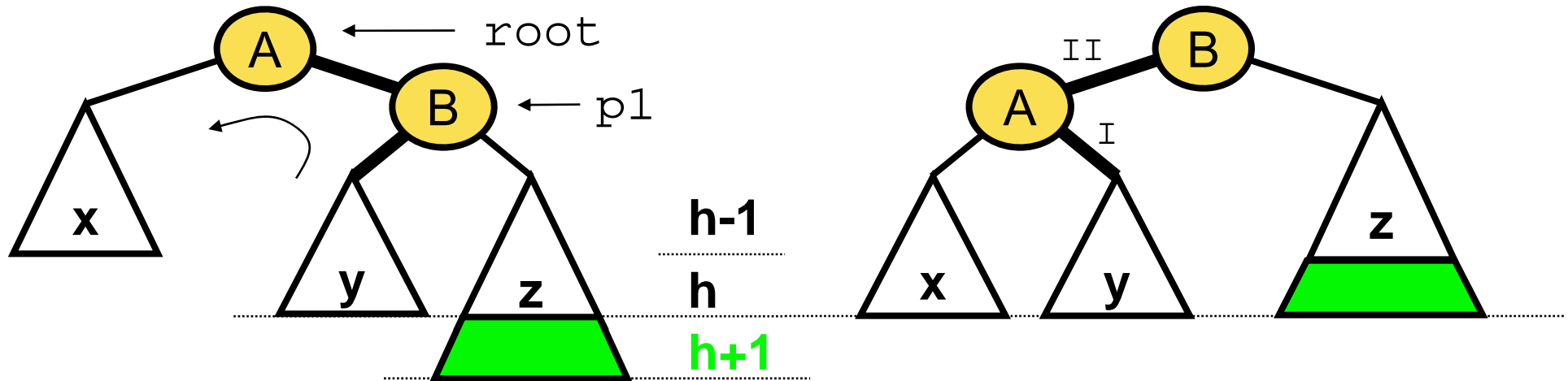
Weighted tree



# Rotations

- Balance the tree (by changing tree structure)
- Preserve mutual relation of nodes
  - what was left, will stay left, ...
  - left son is smaller, right son is larger,...

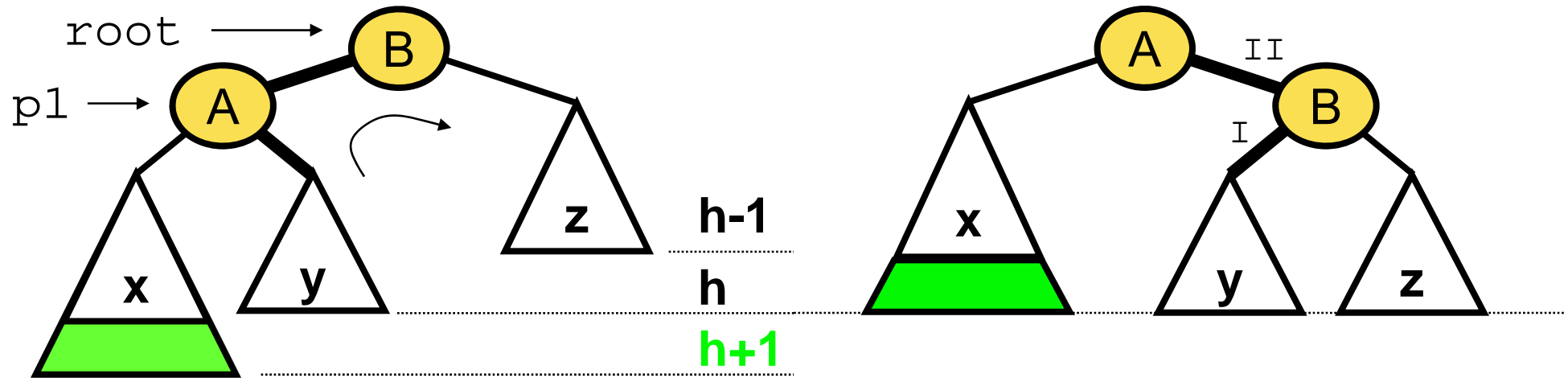
# L rotace (Left rotation)



```
Node leftRotation( Node root ) { // subtree root!!!
    if( root == null ) return root;
    Node p1 = root.right;        (init)
    if (p1 == null) return root;
    root.right = p1.left;       (I)
    p1.left = root;            (II)
    return p1;
}
```

Java-like pseudo code

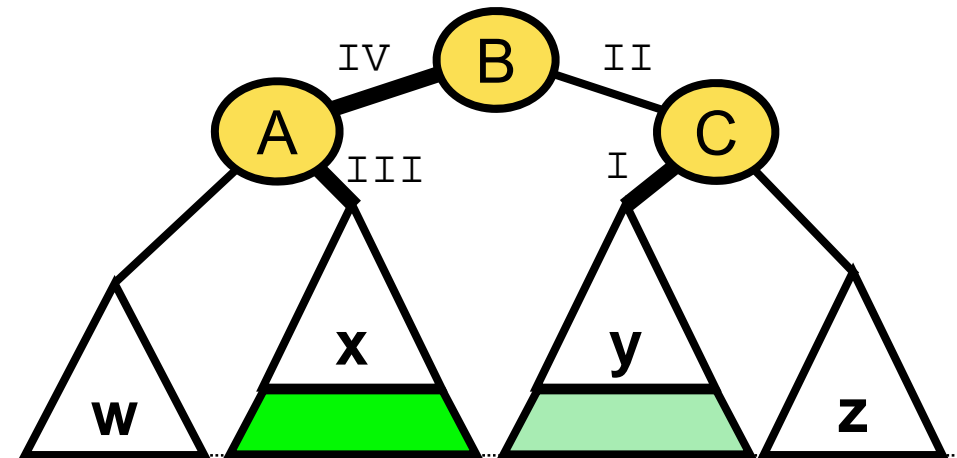
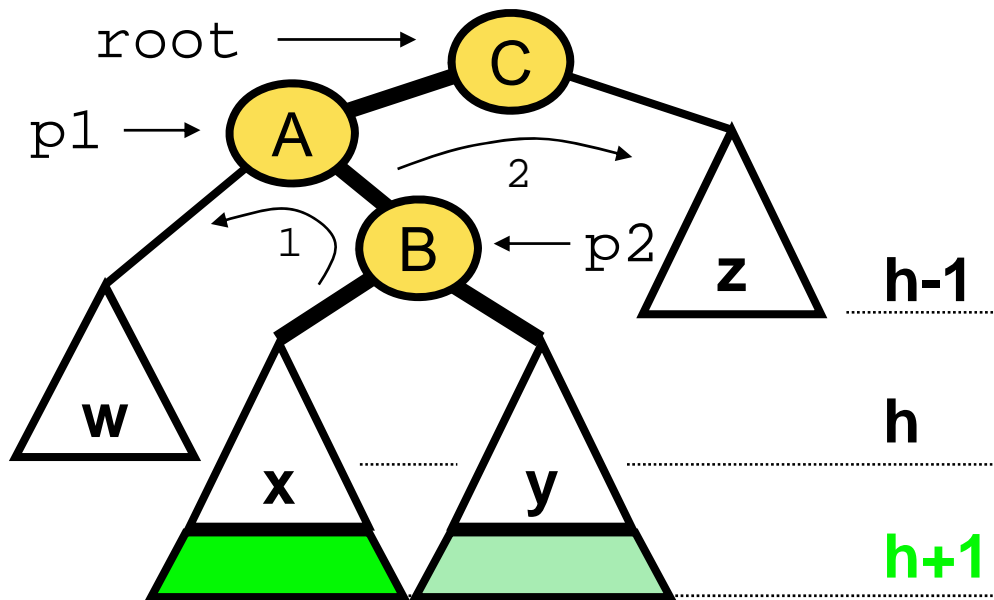
# R rotace (right rotation)



```
Node rightRotation( Node root ) { // subtree root!!!
    if( root == null ) return root;
    Node p1 = root.left;      (init)
    if (p1 == null) return root;
    root.left = p1.right;    (I)
    p1.right = root;        (II)
    return p1;
}
```

Java-like pseudo code

# LR rotace (left-right rotation)

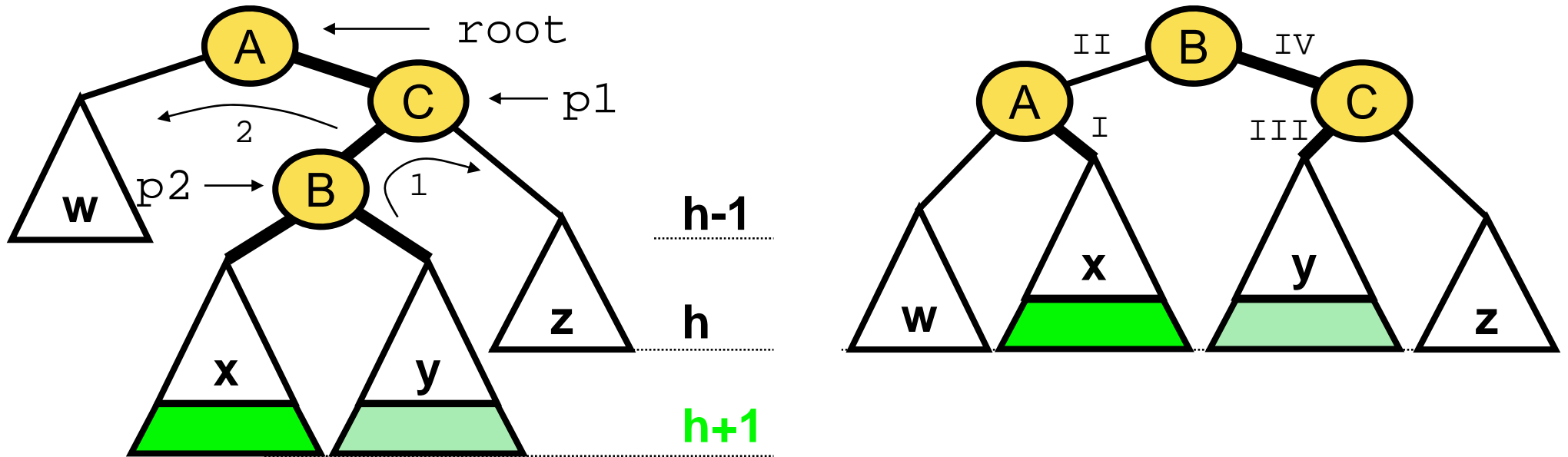


```

Node leftRightRotation( Node root ) { if(root==null)....;
Node p1 = root.left; Node p2 = p1.right;           (init)
root.left = p2.right;           (I)
p2.right = root;                 (II)
p1.right = p2.left;             (III)
p2.left = p1;                   (IV)
return p2;                       }
    
```

Java-like pseudo code

# RL rotace (right- left rotation)



```

Node rightLeftRotation( Node root ) {  if(root==null)...;
Node p1 = root.right; Node p2 = p1.left;      (init)
root.right = p2.left;      (I)
p2.left = root;           (II)
p1.left = p2.right;      (III)
p2.right = p1;           (IV)
return p2;      }
    
```

Java-like pseudo code

# Tree balancing

Balancing criteria

Rotations

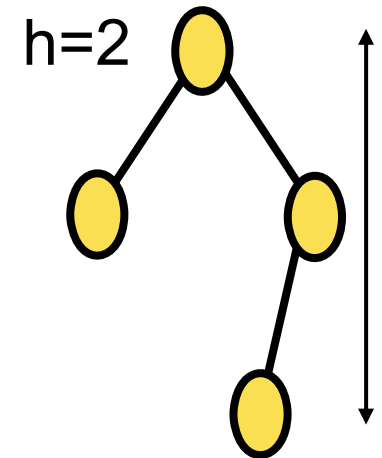
AVL Tree

Weighted tree

# AVL strom

## AVL strom [Richta90]

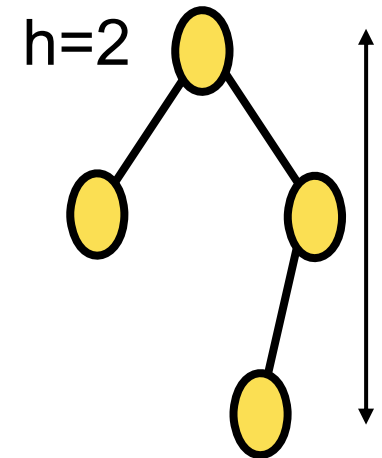
- Výškově vyvážený strom
- Georgij Maximovič Adelson-Velskij a Evgenij Michajlovič Landis 1962
- Výška:
  - Prázdný strom: výška = -1
  - neprázdný: výška = výška delšího potomka
- Vyvážený strom:  
rozdíl výšek potomků **bal** = {-1, 0, 1}



# AVL Tree

AVL tree [Richta90]

- Height balanced BST
- Georgij Maximovič Adelson-Velskij and Evgenij Michajlovič Landis, 1962
- Height:
  - Empty tree: height = -1
  - Non-empty: height = height of the highest son
- Height balanced tree:
  - difference of son heights in interval
  - $bal = \{-1, 0, 1\}$





# AVL tree

// A very inefficient recursive definition

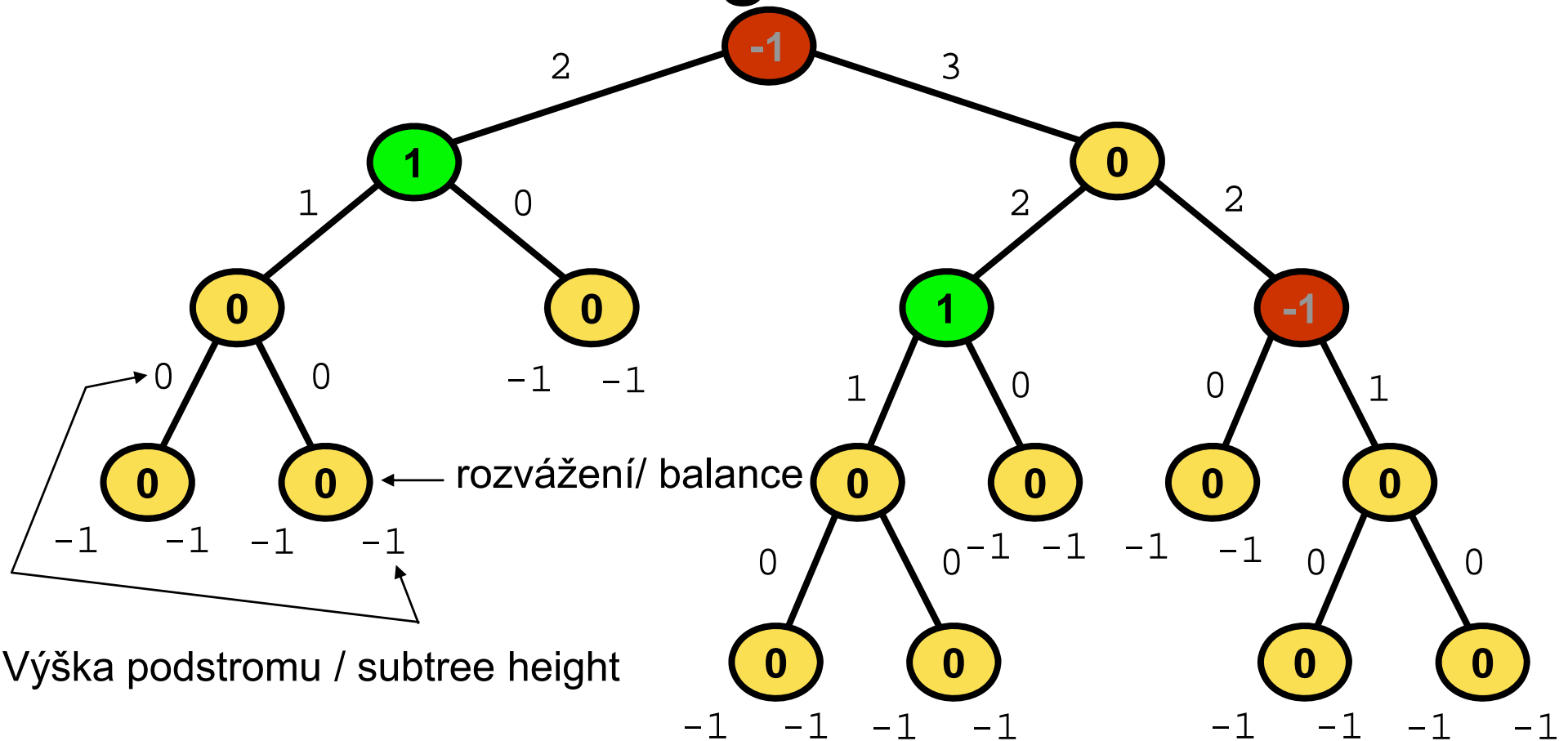
```
int height( Node t )
{
    if( t == null )
        return -1;    //leaf
    else
        return 1 + max( height( t.left ),
                        height( t.right ) );
}
```

```
int bal( Node t )
{
    return height( t.left ) - height( t.right );
}
```

Java-like pseudo code

# AVL strom - výšky a rozvážení

## AVL tree - heights and balance



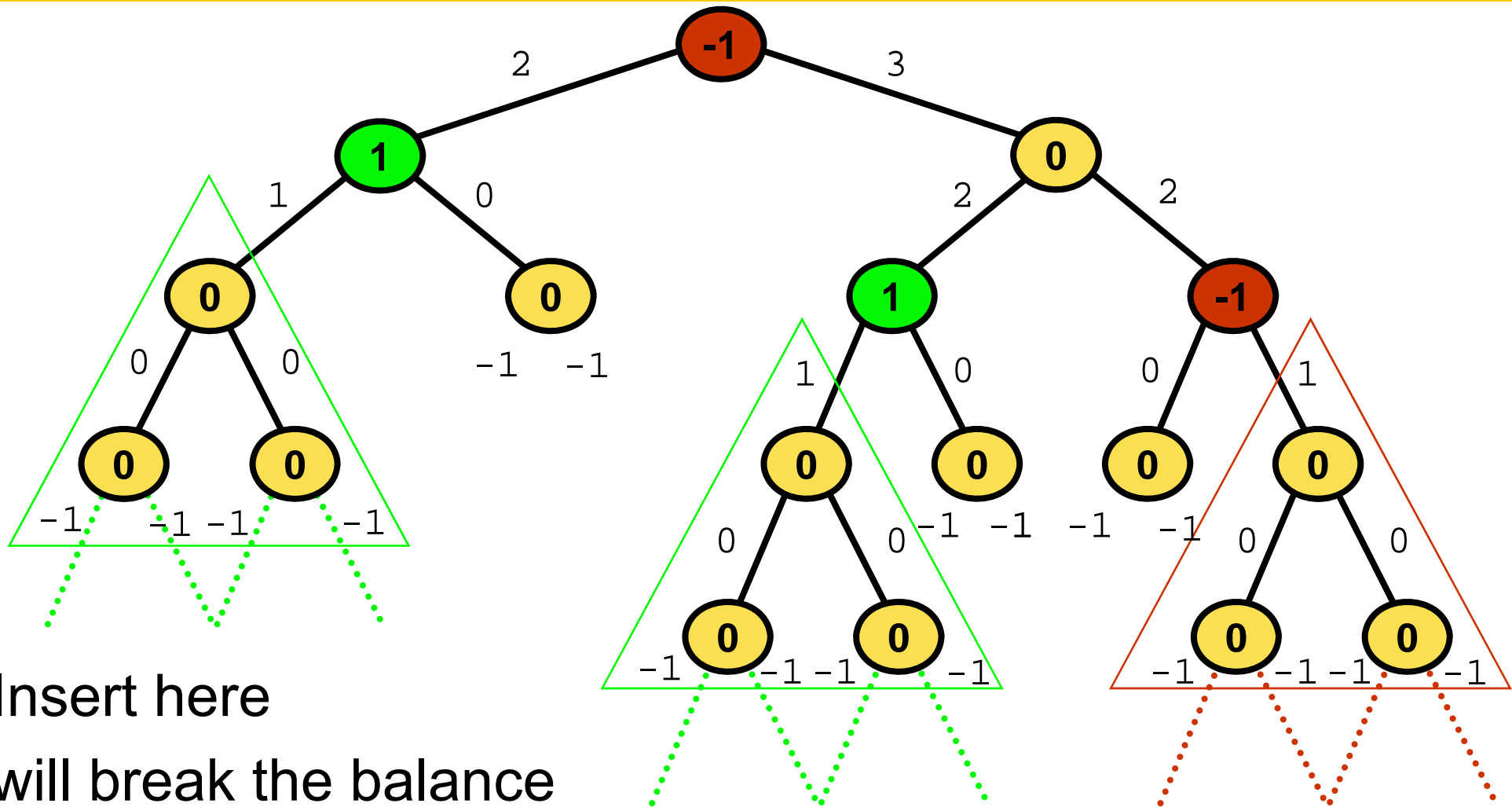
Výška podstromu / subtree height

bal = {-1, 0, 1}

=> nodes with **-1** and **1** absorb insertion or break the balance

# AVL strom před vložením uzlu

## AVL tree before node insertion



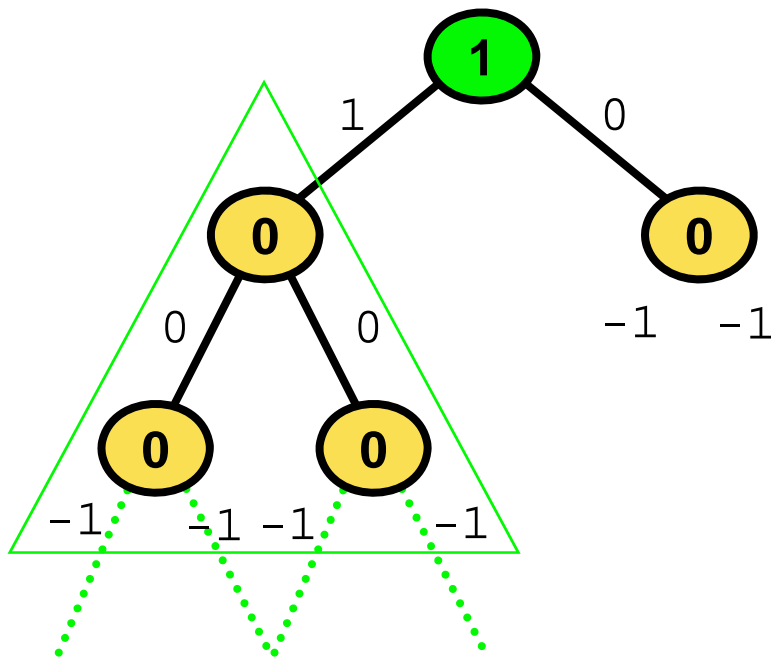
Insert here  
will break the balance

# AVL strom - nejmenší podstrom

## AVL tree - the smallest subtree

Nejmenší podstrom, který se může přidáním uzlu rozvážit

The smallest sub-tree that can lose its balance by insertion



△ its “neutral” subtree

- is balanced:  $bal = 0$
- remains balanced after insert  
 $bal \in \langle -1, +1 \rangle$

Subtree with root **1**

- absorbs insert right  $\rightarrow$  **0**
- breaks balance if insert left  
 $\rightarrow$  **2**

Smallest subtree

- modification near the leaves

# AVL tree

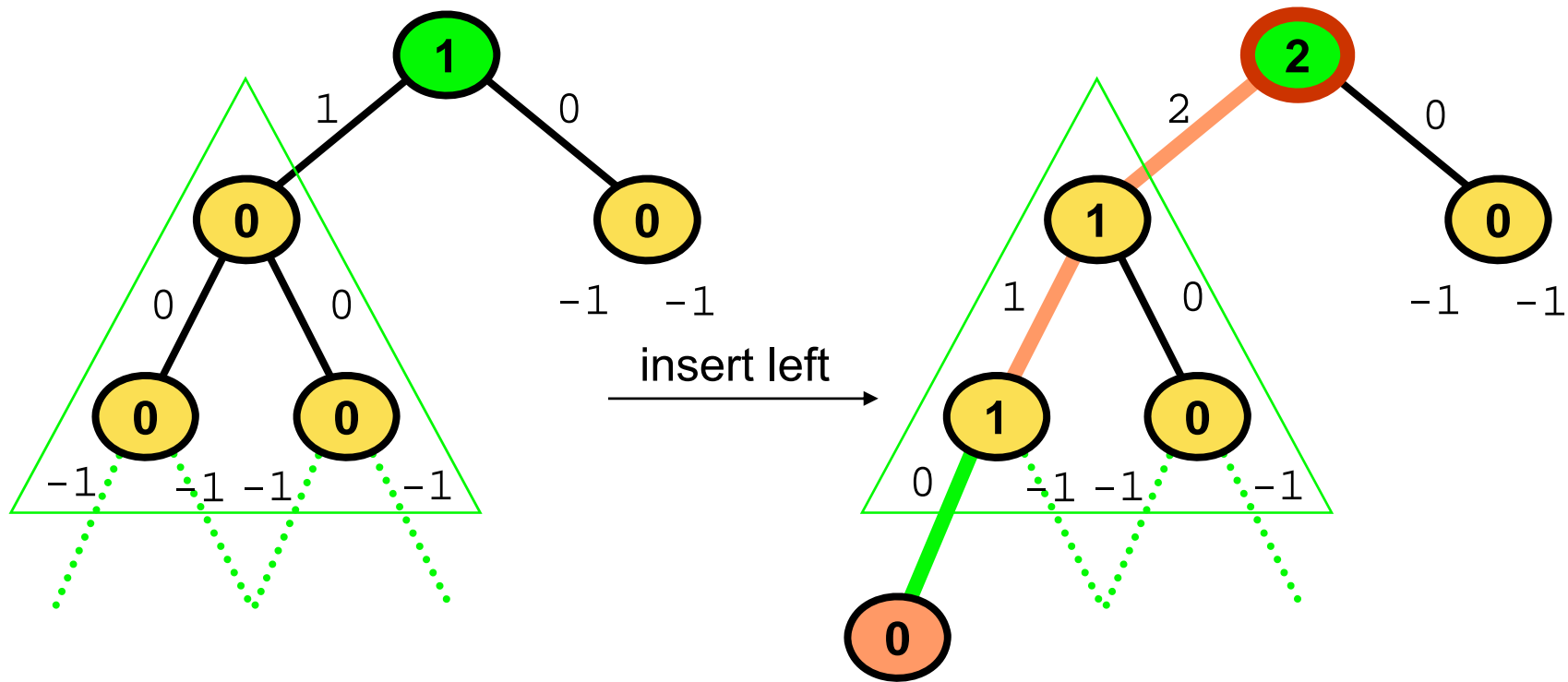
## Node insertion – an example

# AVL strom - vložení uzlu doleva

## AVL tree - node insertion left

a) Podstrom se přidáním uzlu doleva rozváží

The sub-tree loses its balance by node insertion - left

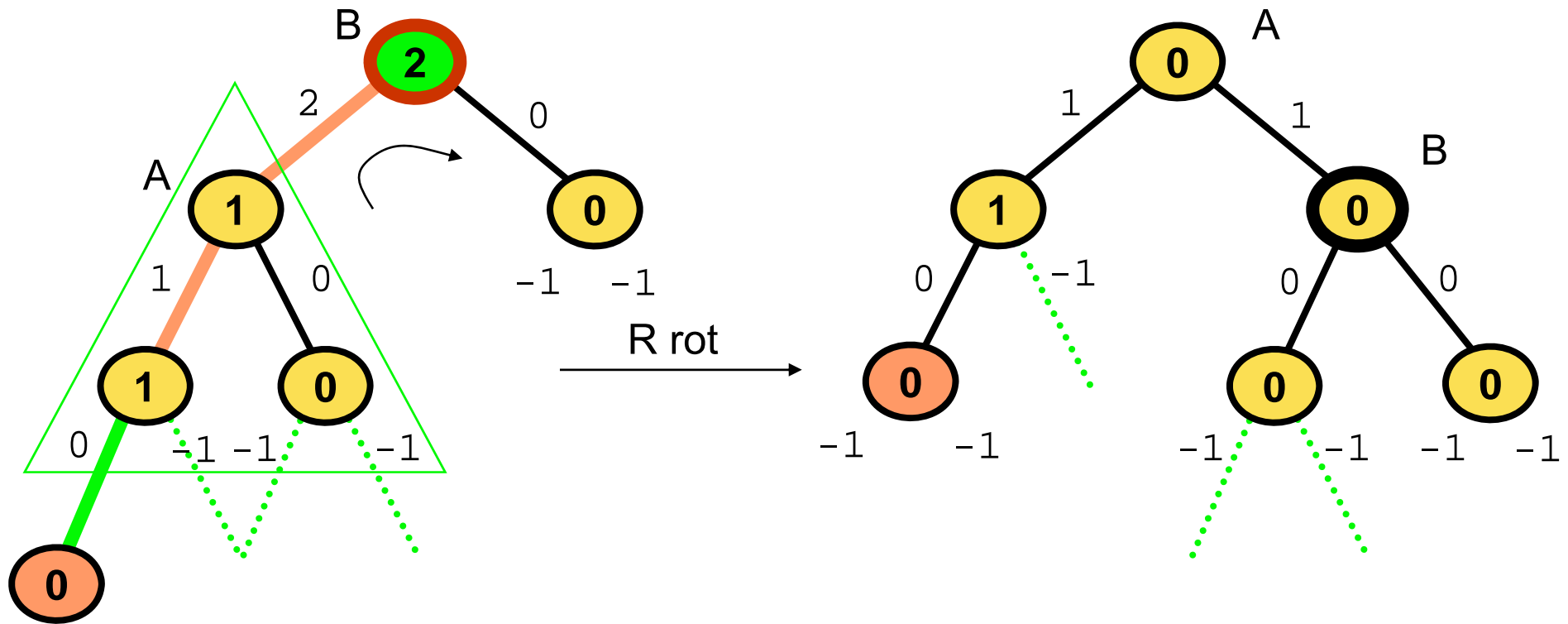


# AVL strom - pravá rotace

## AVL tree - right rotation

a) Vložen doleva – doleva => korekce pravou rotací

Node inserted to the left – left => balance by Right rotation

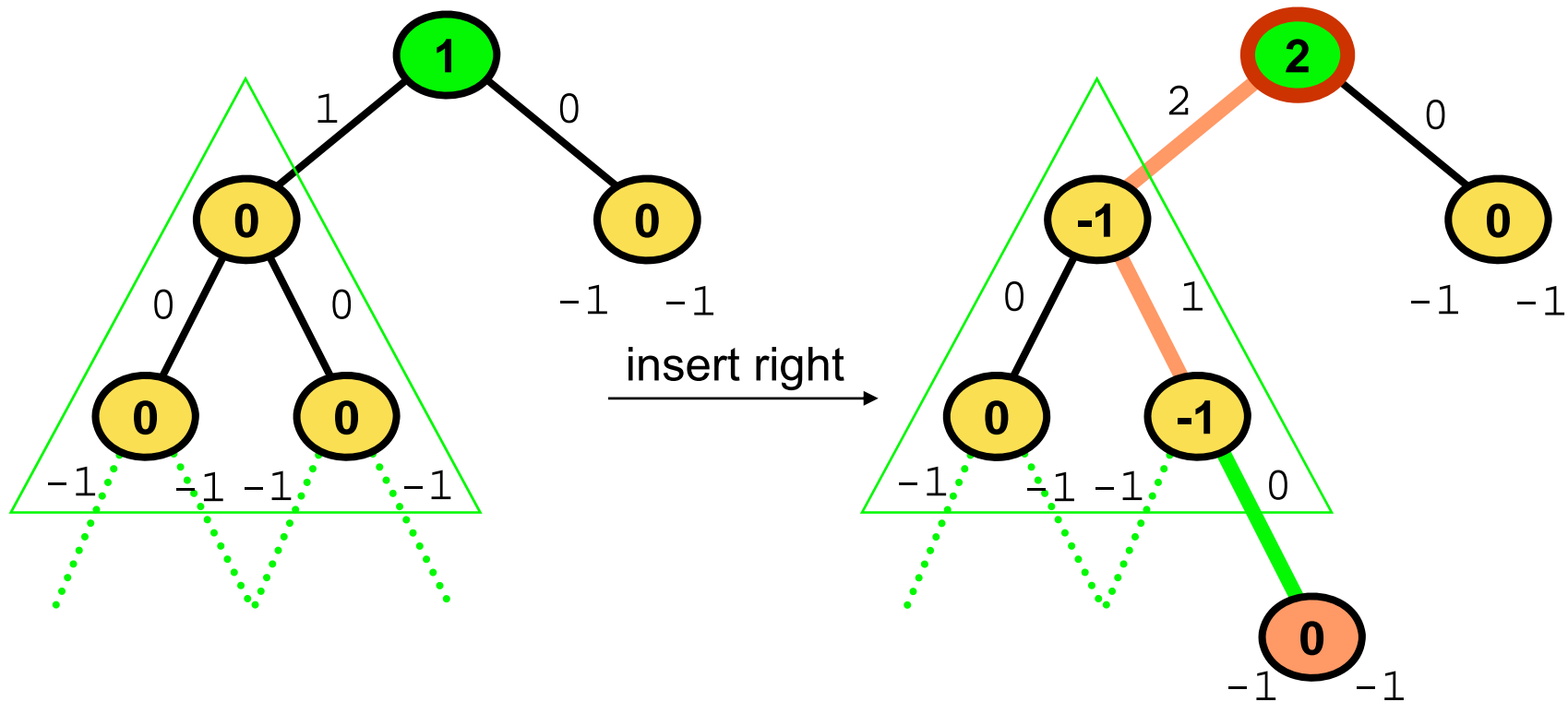


# AVL strom - vložení uzlu doprava

## AVL tree after insertion-right

b) Podstrom se přidáním uzlu doprava rozváží

The sub-tree loses its balance by node insertion - right



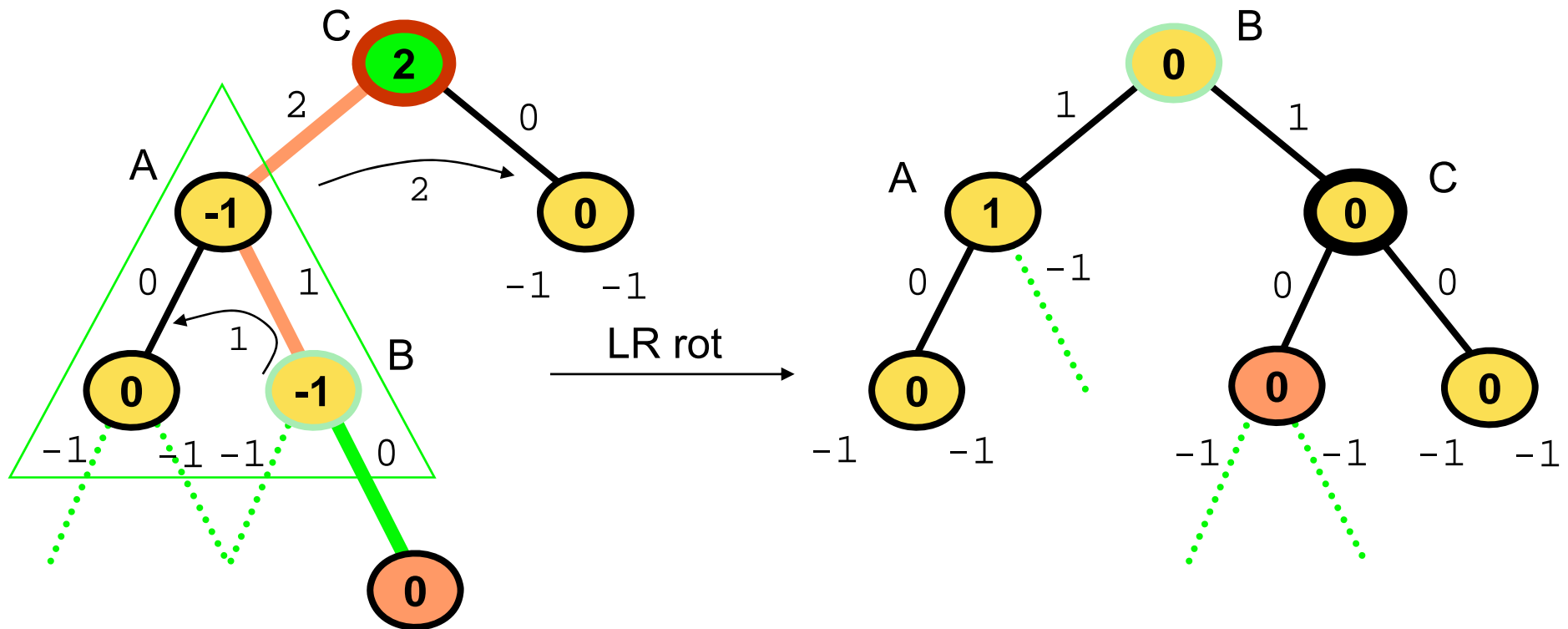


# AVL strom - pravá rotace

## AVL tree - right rotation

b) Vložen doleva – doprava => korekce LR rotací

Node inserted left – right => balance by the LR rotation



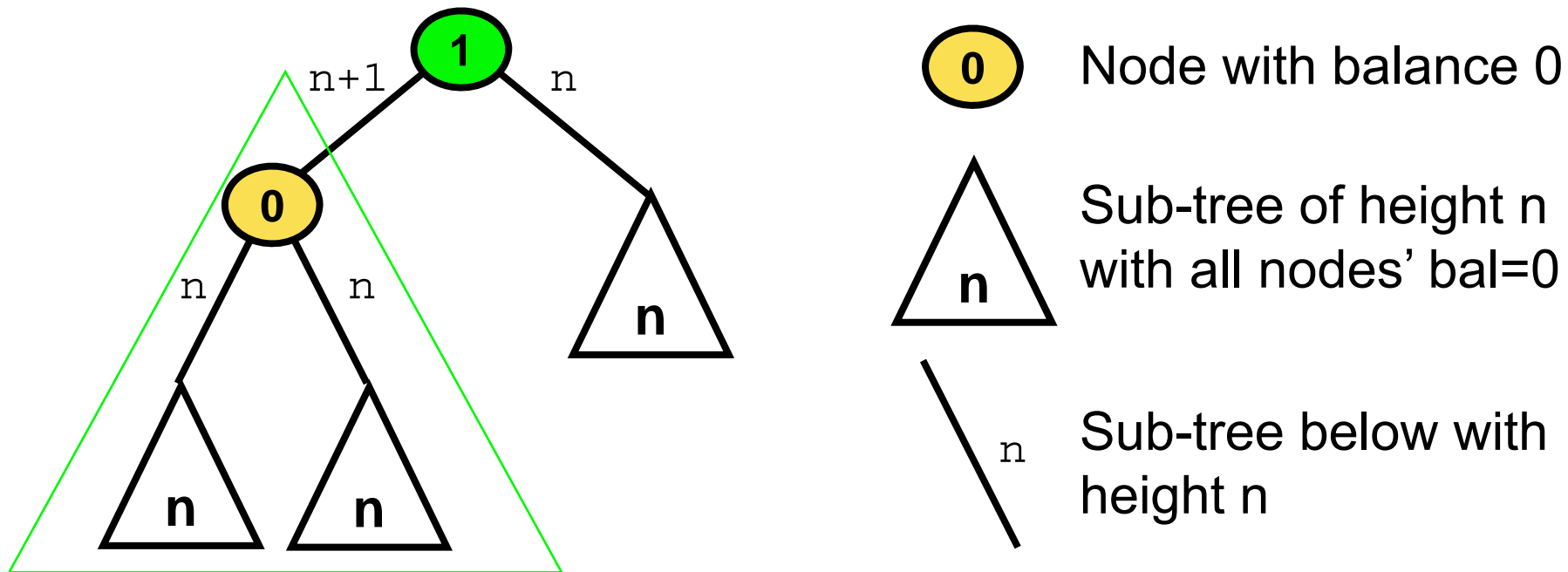
# AVL tree

## Node insertion - in general

# AVL strom - nejmenší podstrom

## AVL tree - the smallest subtree

Nejmenší podstrom, který se přidáním uzlu rozbije z  $bal = 0$   
The smallest sub-tree that loses its  $bal = 0$  by insertion

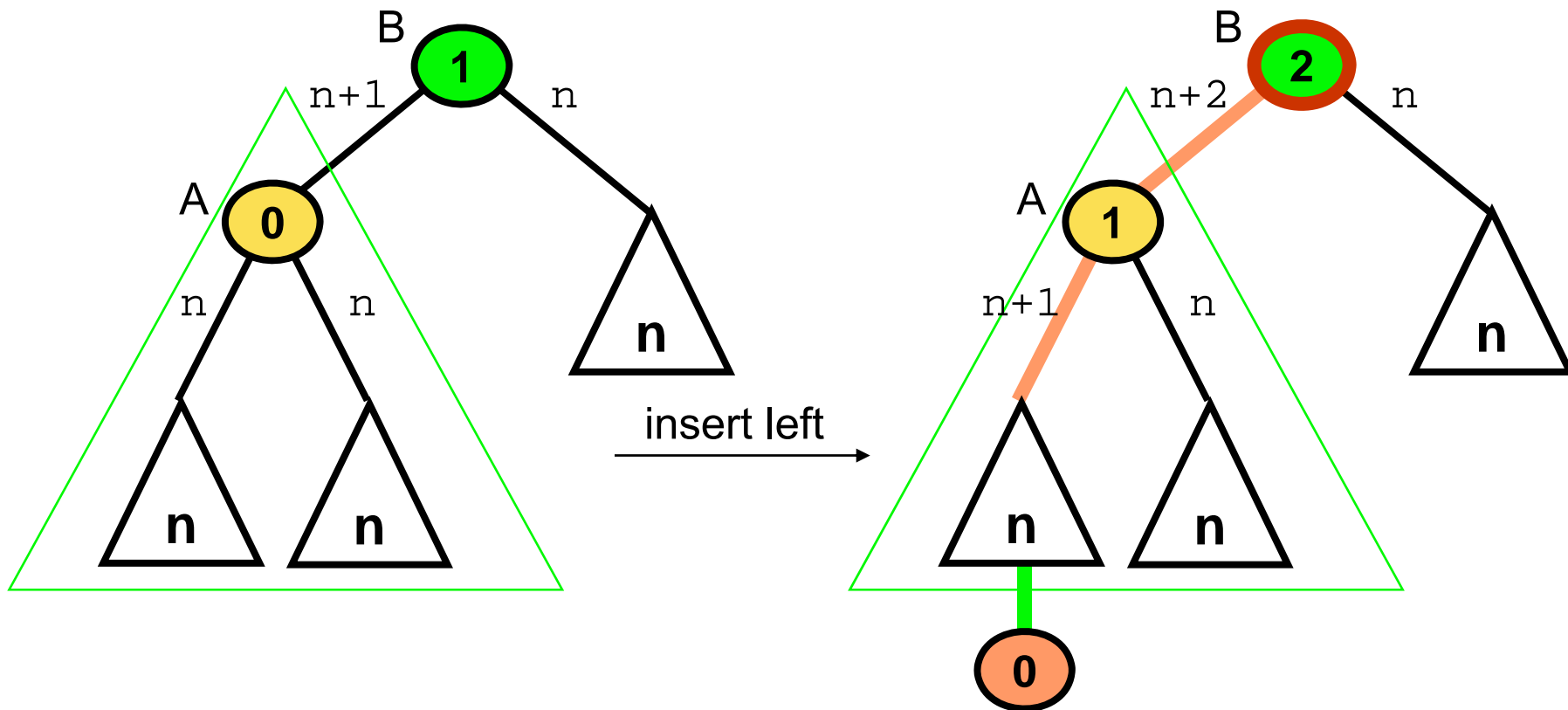


# AVL strom - vložení uzlu doleva

## AVL tree - node insertion left

a) Podstrom se přidáním uzlu doleva rozváží

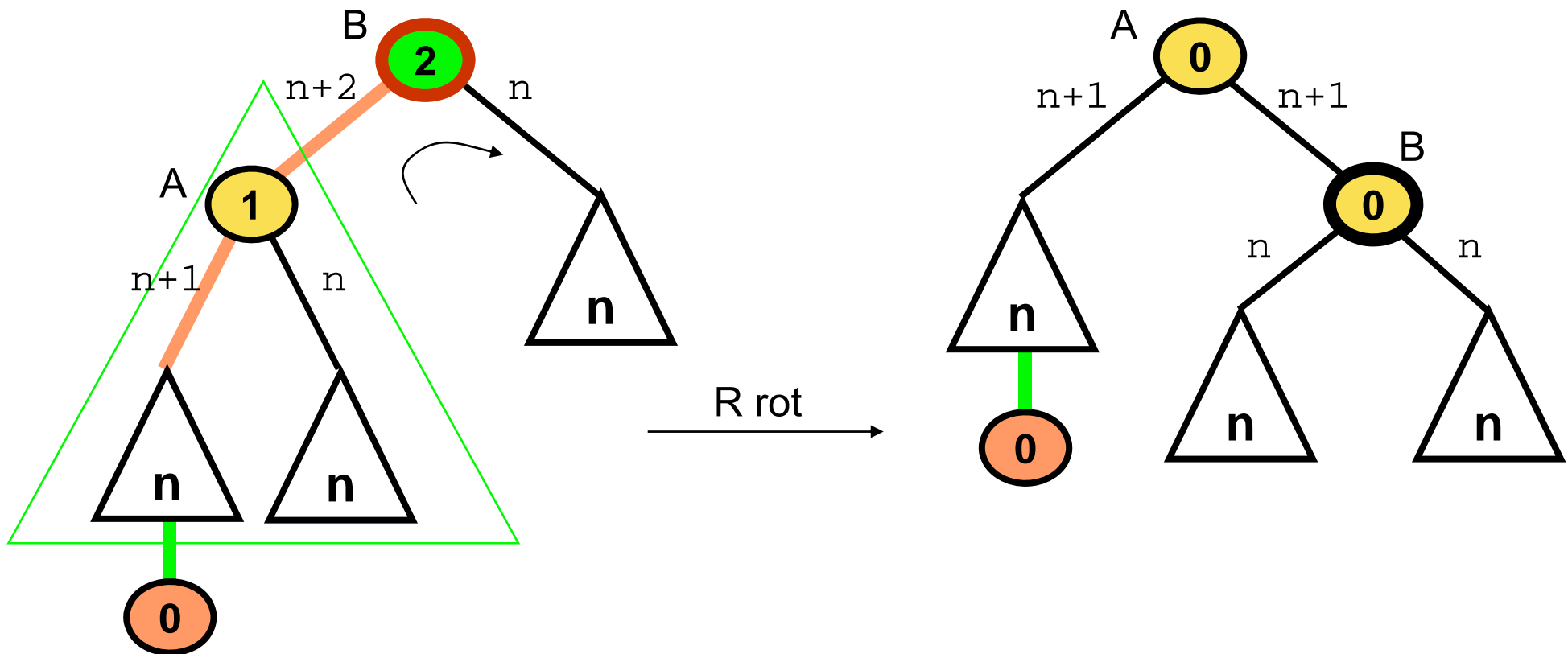
The sub-tree loses its balance by node insertion - left



# AVL strom - pravá rotace

## AVL tree - right rotation

- a) Vložen doleva – doleva => korekce pravou rotací (R rotací)  
Node inserted to the left – left => balance by right rotation

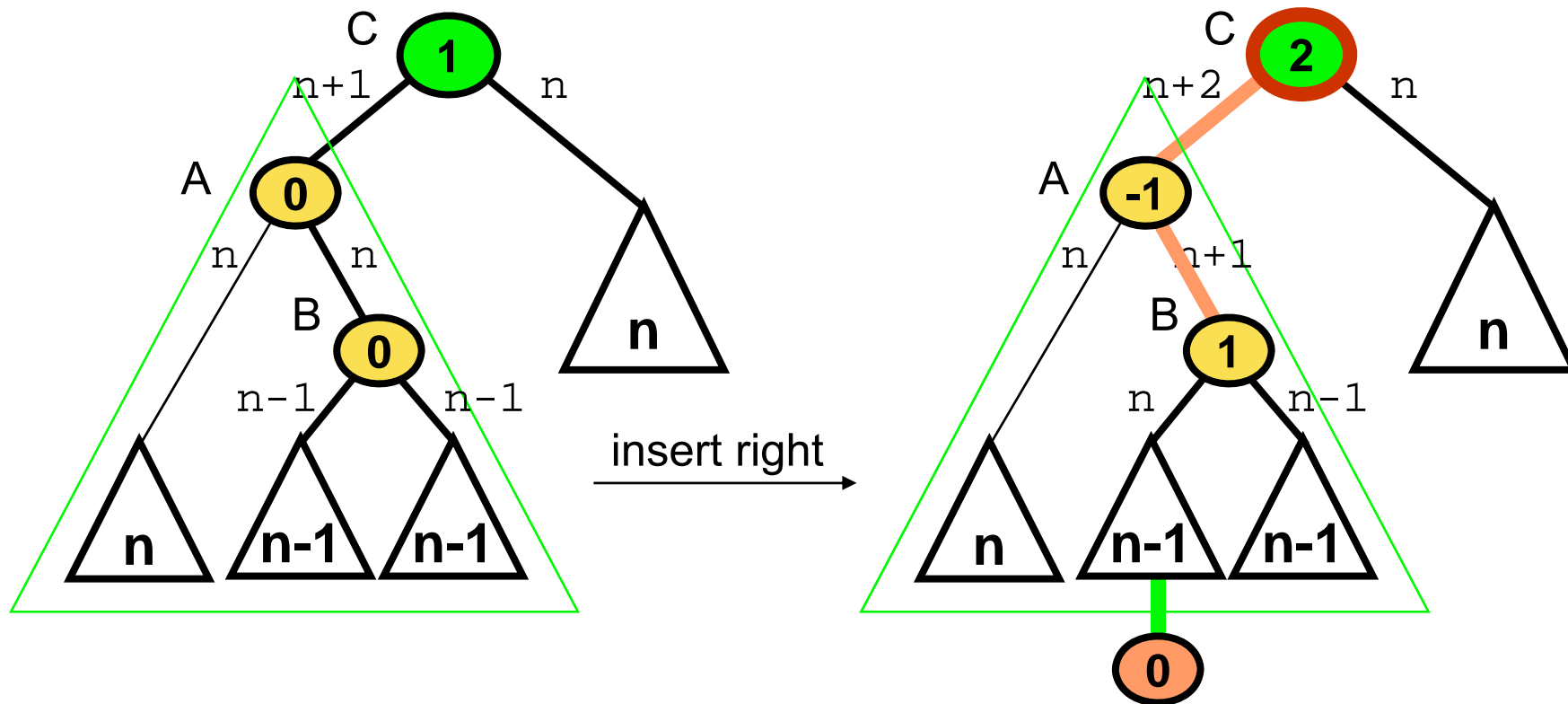


# AVL strom - vložení uzlu doprava

## AVL tree after insertion-right

b1) Podstrom se přidáním uzlu doprava rozváží

The sub-tree loses its balance by node insertion - right

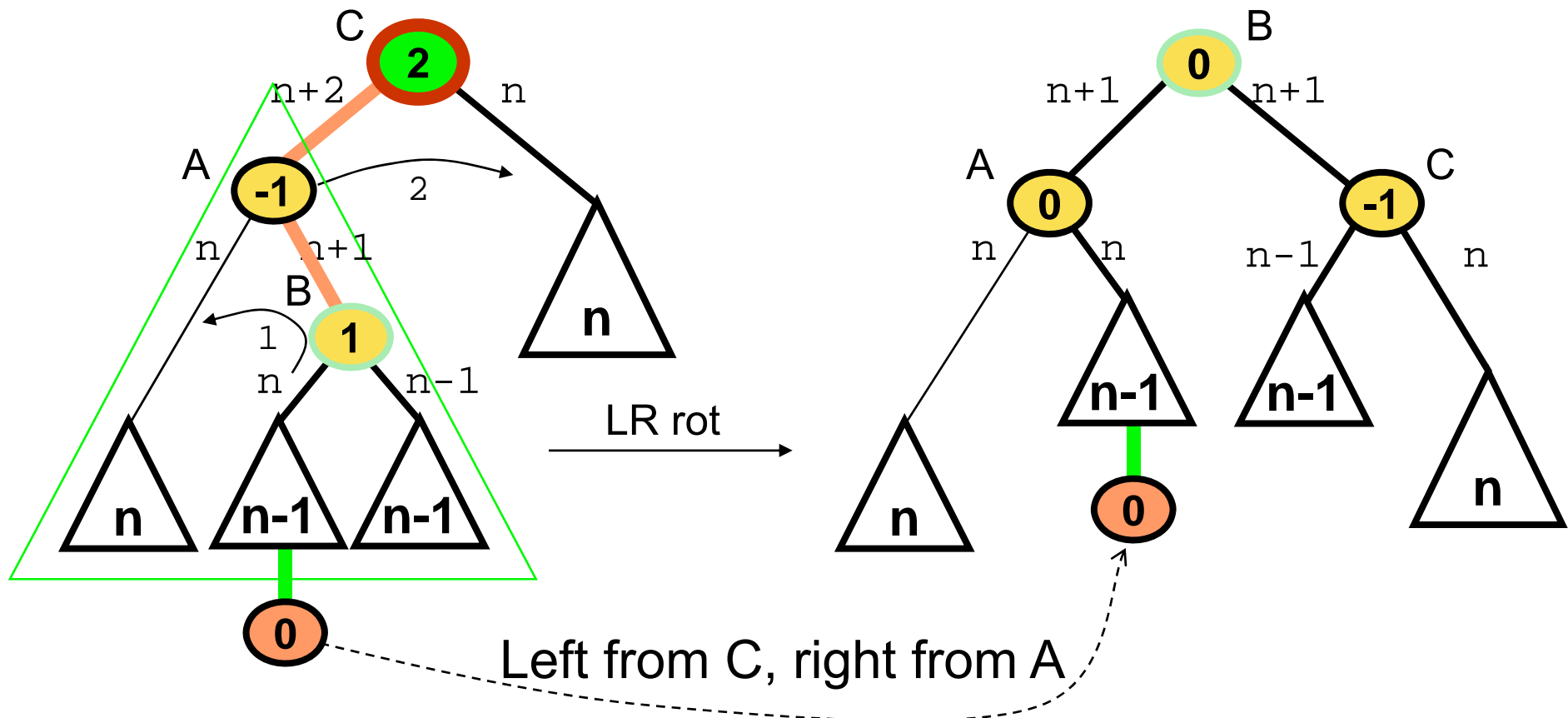


# AVL strom - pravá rotace

## AVL tree - right rotation

b1) Vložen doleva – doprava => korekce LR rotací

Node inserted left – right => balance by the LR rotation

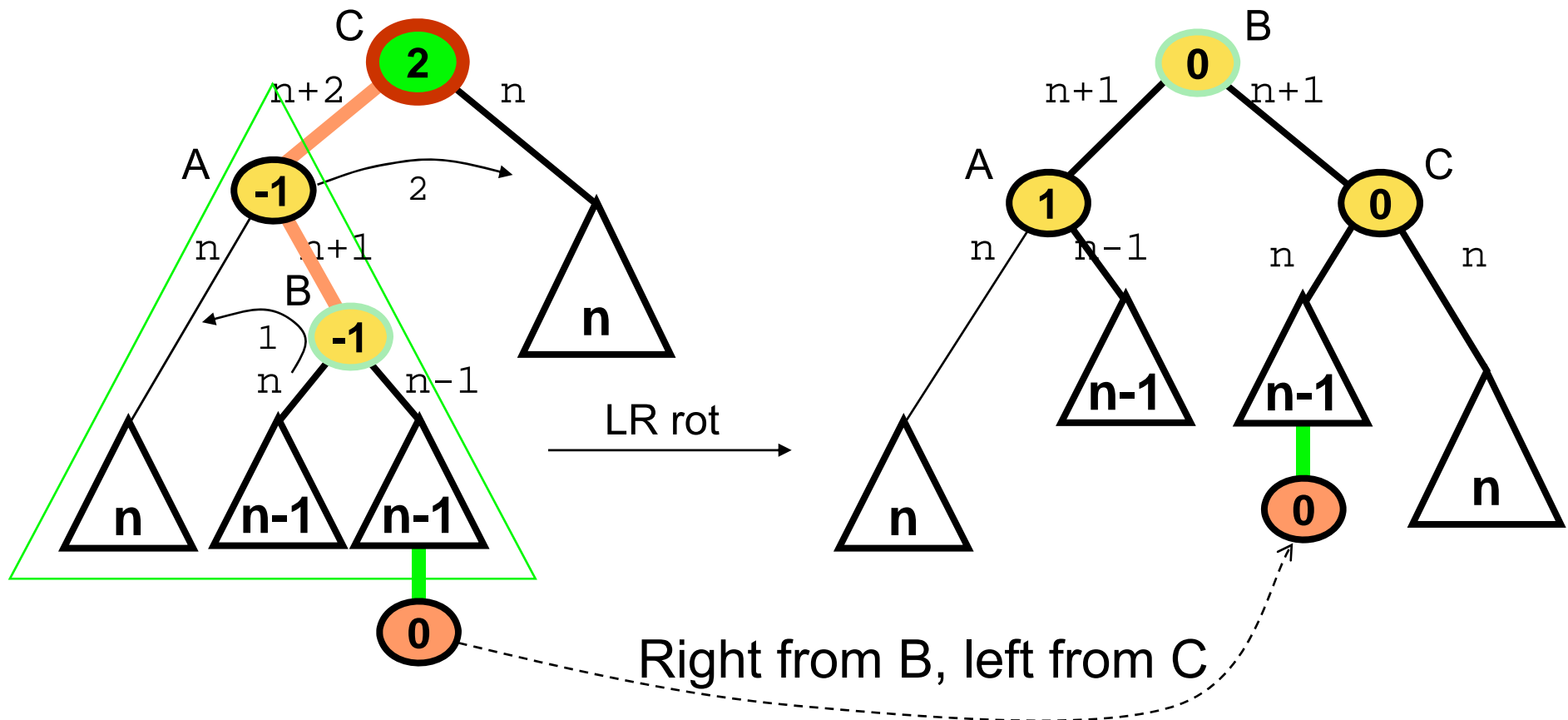


# AVL strom - pravá rotace

## AVL tree - right rotation

b2) Vložen doleva – doprava => korekce LR rotací

Node inserted left – right => balance by the LR rotation





# BST Insert without balancing

```
treeInsert( Tree t, Elem e )
{
    x = t.root;
    y = null;

    if( x == null ) t.root = e; // single-leaf tree
    else {
        while(x != null) { // find the parent leaf y
            y = x;
            if( e.key < x.key ) x = x.left
                else x = x.right
        }
        // add e to parent y
        if( e.key < y.key ) y.left = e
            else y.right = e
    }
}
```

Java-like pseudo code

# AVL Insert (with balancing)

```
avlTreeInsert( tree t, elem e )
{
    // 1. init
    // 2. find a place for insert
    // 3. if( already present )
    //         replace the node
    //     else
    //         insert new node
    // 4. balance the tree, if necessary
}
```

Java-like pseudo code

# AVL Insert - variables & init

```
avlTreeInsert( Tree t, Elem e )  
{  
    Node cur, fcur; // current sub-tree and its father  
    Node a, b;      // smallest unbalanced tree and its son  
    Bool found;     // node with the same key as e found
```

## 1. init

```
cur = t.root; fcur = null;  
a = cur, b = null;
```

## 2. find the place for insert

Java-like pseudo code

# AVL Insert - find place for insert

....

## 2. find the place for insert

```
while( ( cur != null ) and !found )
{
    if( e.key == cur.key ) found = true;
    else {
        fcur = cur;           // father of cur
        if( e.key < cur.key )
            cur = cur.left;
        else cur = cur.right;
        if( ( cur != null ) and ( bal(cur) != 0 ) ) {
            //remember possible place for unbalance
            a = cur; // the deepest bal = +1 or -1
        }
    }
}
....
```

# AVL Insert - replace or insert new

....

3. if( already present ) replace the node value

```
if( found )
    setinfo( cur, e );           // replace the value
else {
    // insert new node to fcur
                                // cons ( e, null, null );
    if( fcur == null ) t.root = leaf( e );           // new
root
    else {
        if( e.key < fcur.key )
            fcur.left = leaf( e );
        else
            fcur.right = leaf( e );
    }
    ....
}
```

# AVL Insert - balance the subtree

```
... // !found continues
```

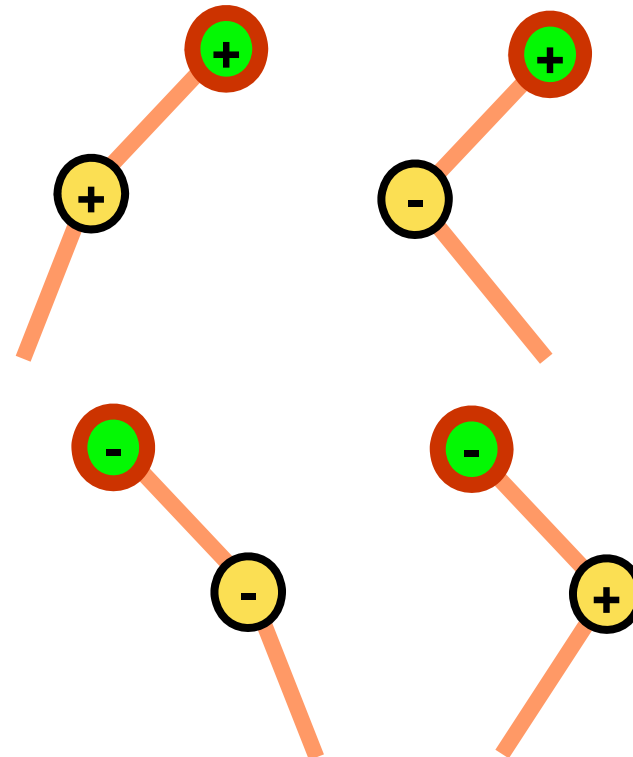
## 4.balance the tree, if necessary

```
if( bal(a) == 2 ) { //inserted left from 1
    b = a.left;
    if( b.key < e.key ) // and right from its left son
        a.left = leftRotation( b ); // L rotation (LR)
    a = rightRotation( a ); // R rotation
}
else if( bal(a) == -2){ //inserted right from -1
    b = a.right;
    if( e.key < b.key ) // and left from its right son
        a.right = rightRotation( b );// R rotation(RL)
    a = leftRotation( a ); // L rotation
} // else tree remained balanced
} // !found
}
```

# AVL Insert - balance the subtree

## 4. Balance summary

a	b	Rotation
+	+	R rotation
+	-	LR rotation
-	+	RL rotation
-	-	L rotation



# AVL - výška stromu

For AVL tree  $S$  with  $n$  nodes holds

Height  $h(S)$  is at maximum 45% higher in comparison to ideally balanced tree

$$\log_2(n+1) \leq h(S) \leq 1.4404 \log_2(n+2) - 0.328$$

[Hudec96], [Honzík85]



# Tree balancing

Balancing criteria

Rotations

AVL – tree

Weighted tree

# Váhově vyvážené stromy

(stromy s ohraničeným vyvážením)

Váha uzlu  $u$  ve stromě  $S$ :

$v(u) = 1/2$ , když je  $u$  listem

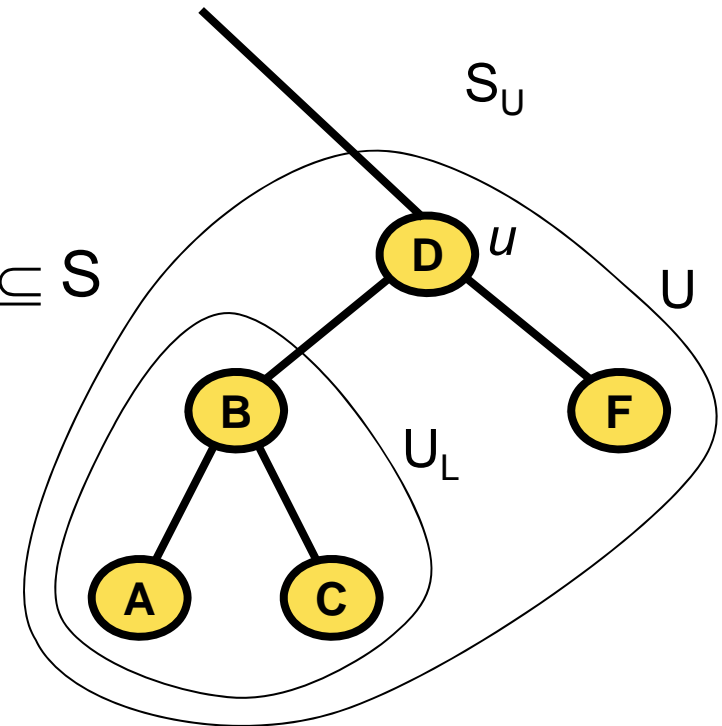
$v(u) = (|U_L| + 1) / (|U| + 1)$ ,

když  $u$  je kořen podstromu  $S_U \subseteq S$

$U_L$  = množina uzlů

levého podstromu v podstromu  $S_U$

$U$  = množina uzlů podstromu  $S_U$



# Weight balanced trees

Weight  $v(u)$  of node  $u$  in tree  $S$

$$v(u) = 1/2, \quad \text{if } u \text{ is leaf}$$

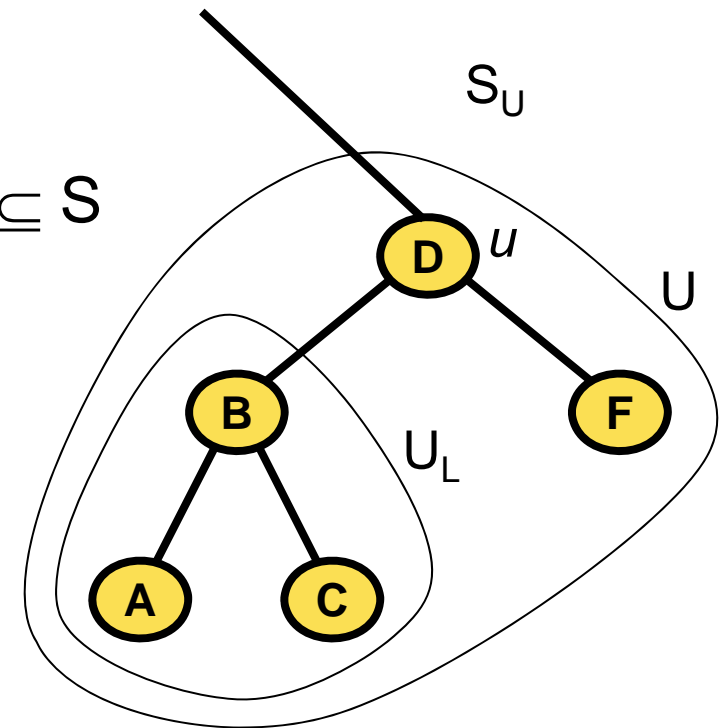
$$v(u) = (|U_L| + 1) / (|U| + 1),$$

if  $u$  is the root of sub-tree  $S_U \subseteq S$

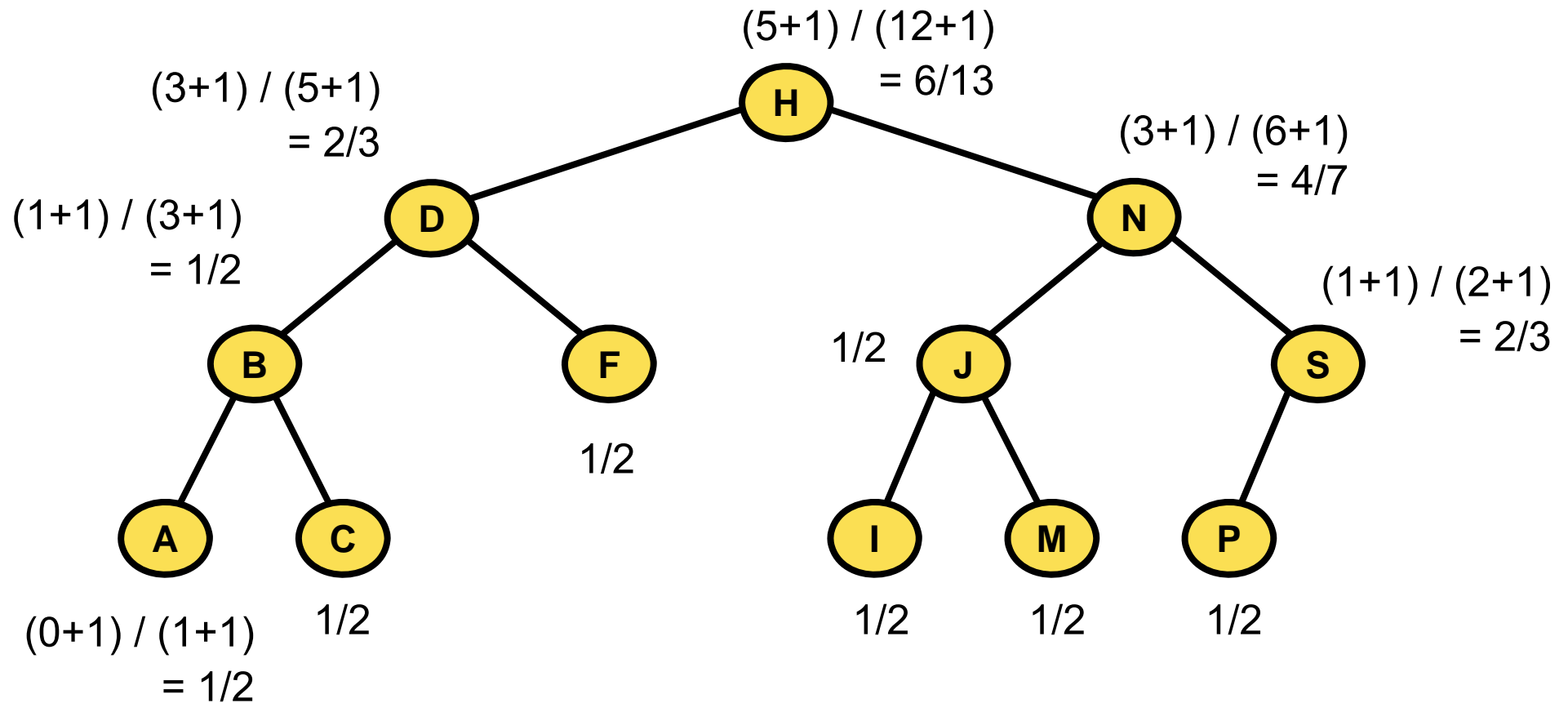
$U_L$  = set of nodes

in the left sub-tree of sub-tree  $S_U$

$U$  = set of nodes in sub-tree  $S_U$



# Weight balanced tree example



# Váhově vyvážené stromy

Strom s ohraničeným vyvážením  $\alpha$ :

Strom  $S$  má ohraničené vyvážení  $\alpha$ ,  $0 \leq \alpha \leq 0,5$ ,  
jestliže pro všechny uzly  $S$  platí

$$\alpha \leq v(u) \leq 1 - \alpha$$

Výška  $h(S)$  stromu  $S$  s ohraničeným vyvážením  $\alpha$

$$h(S) \leq (1 + \log_2(n+1) - 1) / \log_2(1 / (1 - \alpha))$$

Výška ideálně  
vyváženého stromu

[Hudec96], [Mehlhorn84]

# Weight balanced trees

Weight balanced tree delimited by  $\alpha$ :

Tree  $S$  has the balance delimited by  $\alpha$ ,  $0 \leq \alpha \leq 0,5$ ,  
if for all nodes  $S$  holds

$$\alpha \leq v(u) \leq 1 - \alpha$$

Height  $h(S)$  of tree  $S$  with balance delimited by  $\alpha$ :

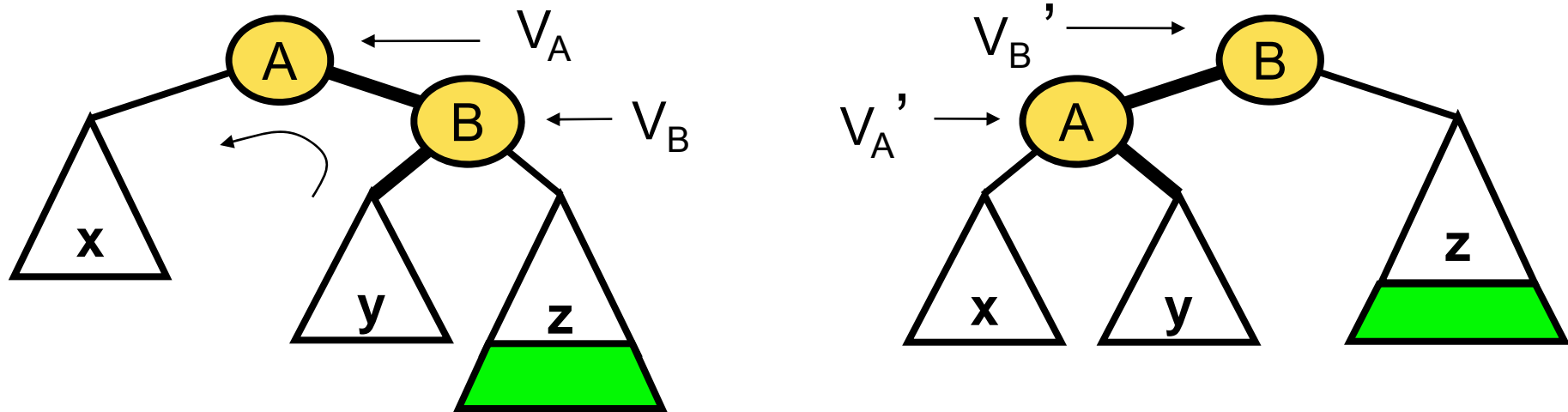
$$h(S) \leq (1 + \log_2(n+1) - 1) / \log_2 (1 / (1 - \alpha))$$

balanced tree

height

[Hudec96], [Mehlhorn84]

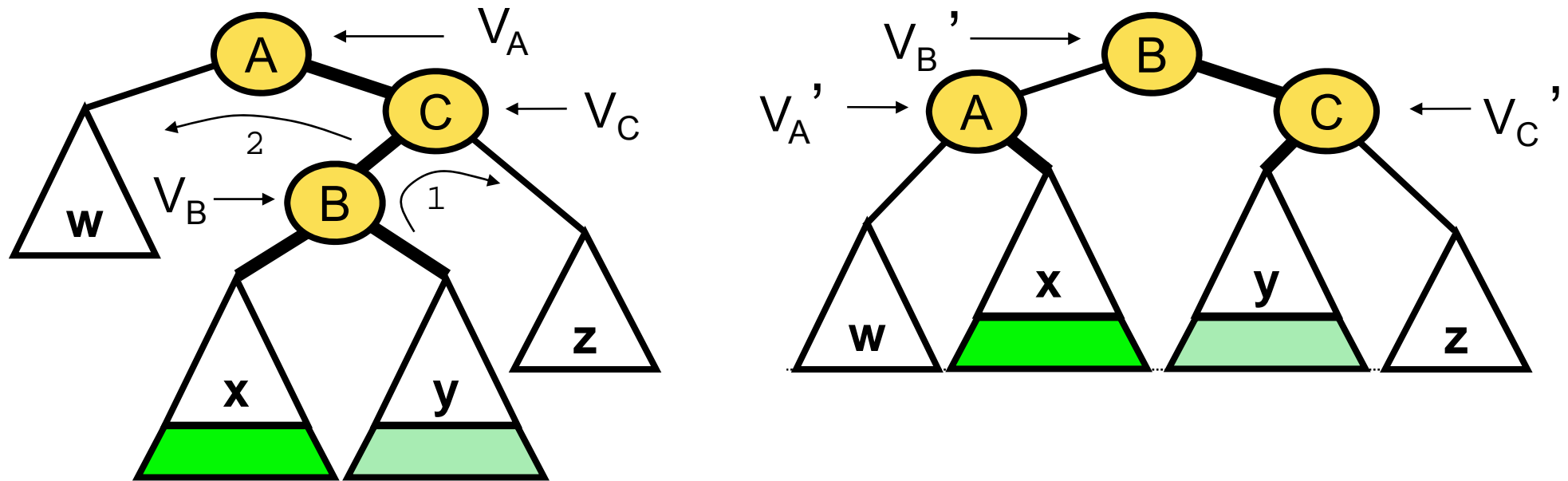
# L rotation (Left rotation) [Hudec96]



$$V_A' = V_A / (V_A + (1 - V_A) \cdot V_B)$$

$$V_B' = V_A + (1 - V_A) \cdot V_B$$

# RL rotation (Right-Left rotation)



$$V_A' = V_A / (V_A + (1 - V_A) V_B V_C)$$

$$V_B' = V_B (1 - V_C) / (1 - V_B V_C)$$

$$V_C' = V_A + (1 - V_A) \cdot V_A V_B$$

[Hudec96]



# Prameny

Bohuslav Hudec: Programovací techniky, skripta, ČVUT Praha,  
1993

# References

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