

# Chapter 5

# trees



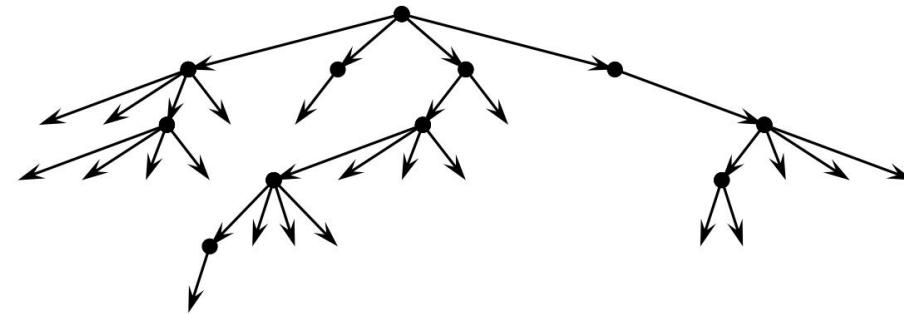
## 5.1 Definition of trees

A **tree** is a special graph that defines a hierarchical structure over a set of objects

Intuitive conceptual model - Non-linear data structure

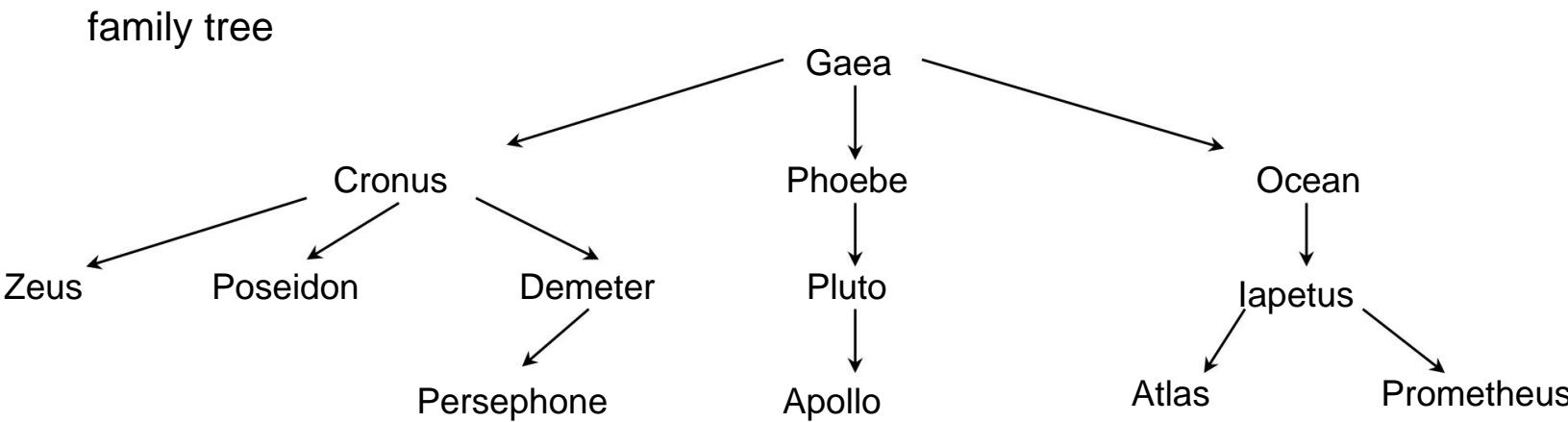
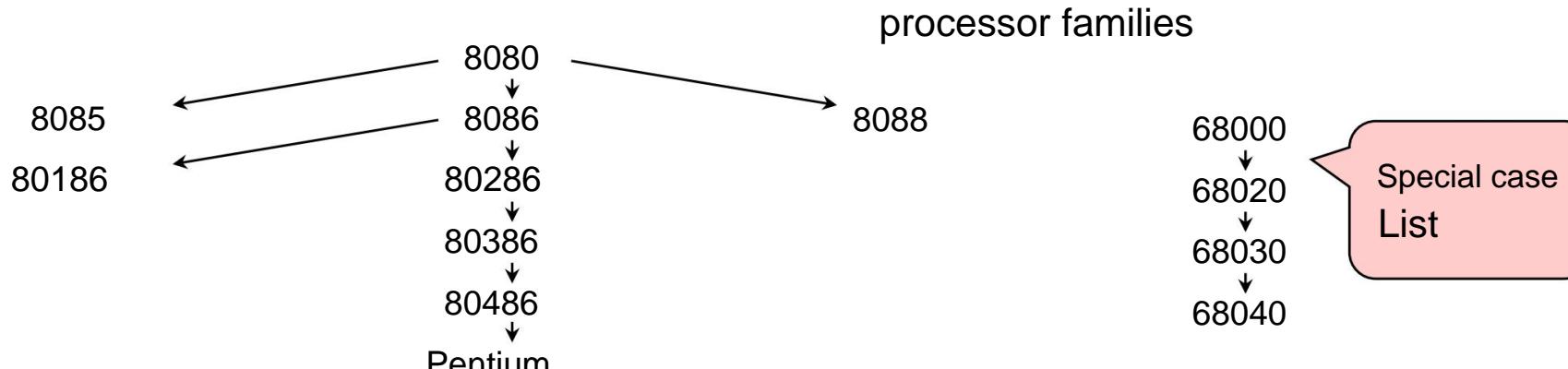
Applications

Represent knowledge, representation of structures, mapping of access paths, analysis of hierarchical relationships, ...





# Example trees





# *Tree, nodes, edges, way, path*

A **tree** consists of a set of **nodes** connected by **directed edges**

A **path** is a list of distinct nodes, with consecutive nodes connected by an **edge**

**Defining property of a tree** • There is exactly one path that connects 2 nodes

- Each node has only one direct predecessor
- all predecessors of a node are different from itself

A tree therefore does not contain **any circles**, ie a path where the Start node is equal to the end node

# Root, leaf, internal nodes

The **root** is **the** only node with only leading ones

Laces

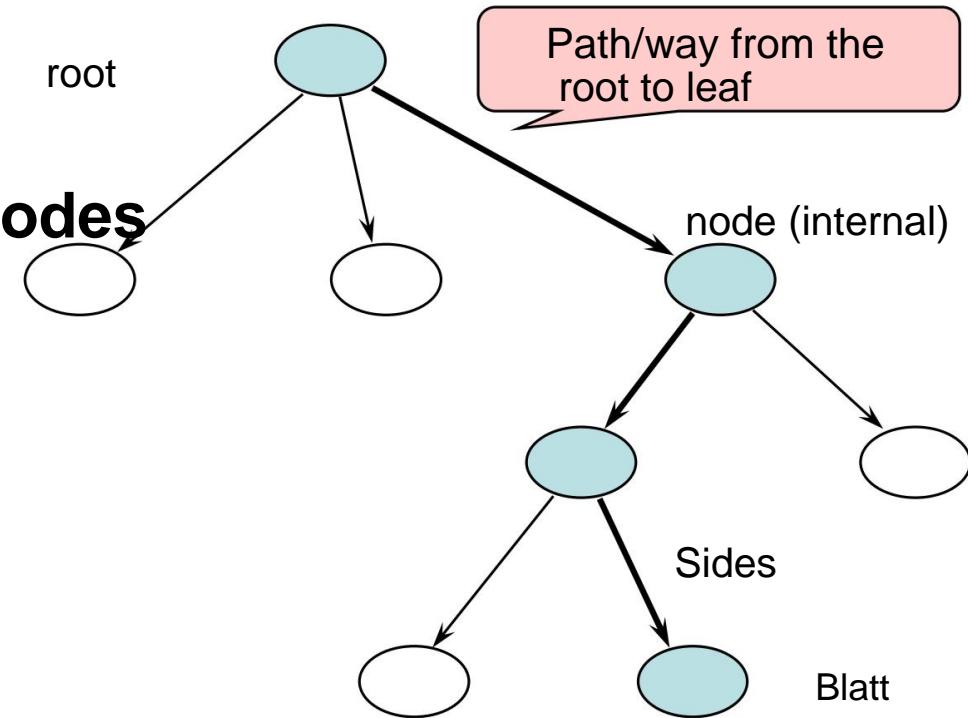
A **leaf** is a node with no edges leading away from it

Nodes into which an

edge leads and

from which edges lead

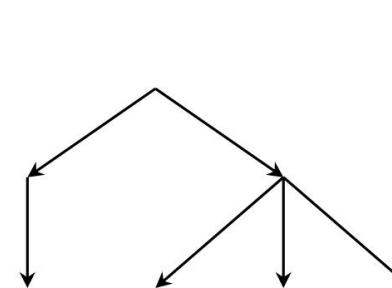
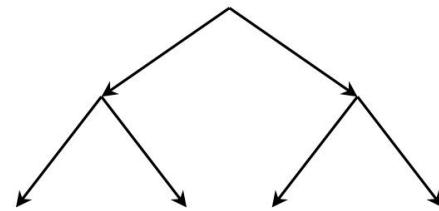
away are called **internal nodes**



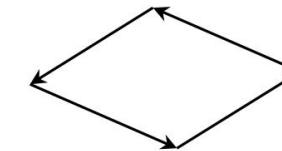
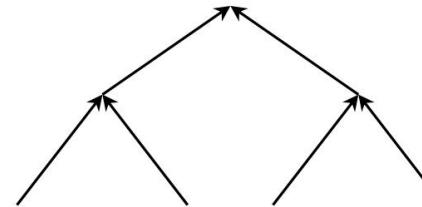
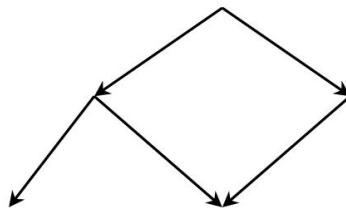


# Valid and invalid trees

## Valid trees



## Invalid trees



- There is exactly one path that connects 2 nodes
- Each node has only one direct predecessor
- all predecessors of a node are different from itself

# Special knots

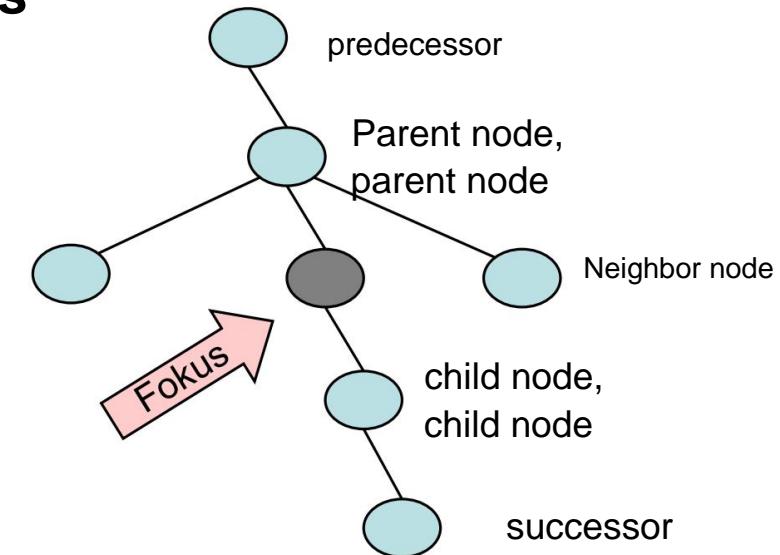
Every node (except the root) has exactly one Node above itself, which is called **parent node** or **parent node**

The nodes directly below a node are called **child nodes** or **child nodes**

Transitive parents are referred to as **predecessors** and transitive children are referred to as **successors**

Spatially adjacent nodes at the same depth are called

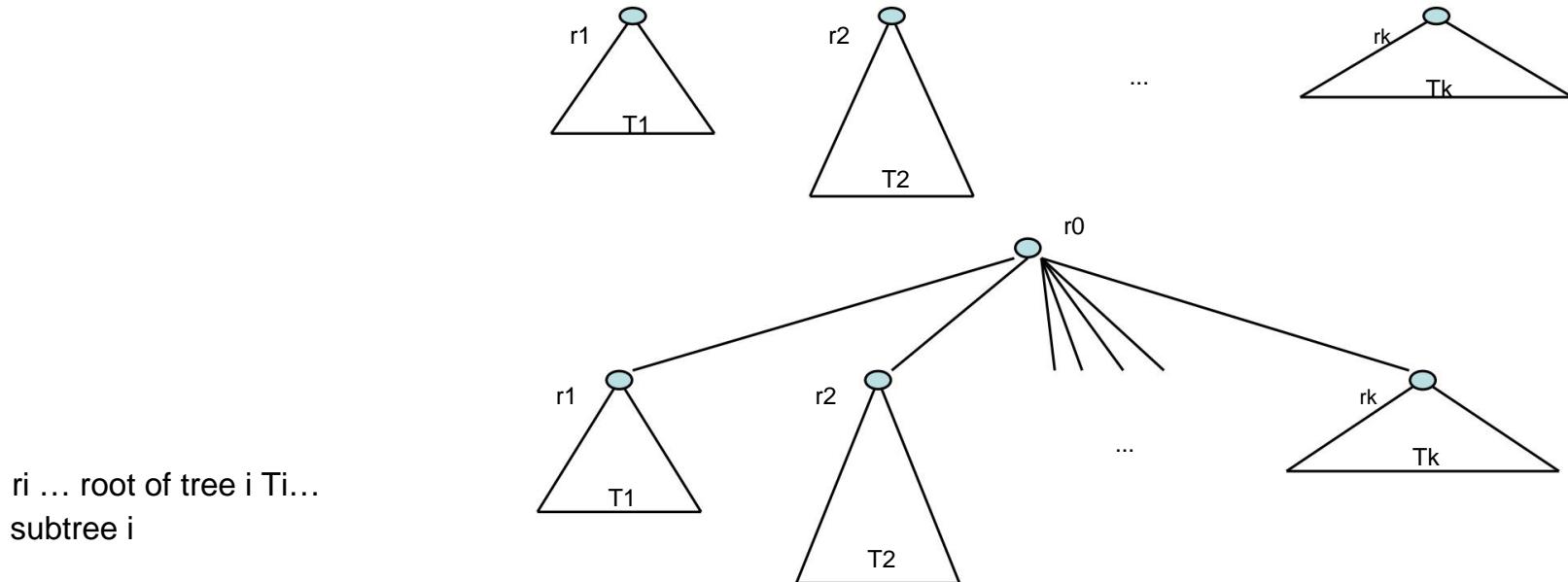
**Neighbors**



# Recursive tree definition

A single node without edges is a tree

Let  $T_1, \dots, T_k$  ( $k > 0$ ) be trees without common nodes. Let the roots of these trees be  $r_1, \dots, r_k$ . A tree  $T_0$  with the root  $r_0$  consists of the nodes and edges of the trees  $T_1, \dots, T_k$  and new edges from  $r_0$  to the nodes  $r_1, \dots, r_k$ . The node  $r_0$  is then the new root and  $T_1, \dots, T_k$  are **subtrees** of  $T_0$



# Length, height, depth

The **length of a path** between

2 nodes corresponds to the number of edges on the path between the two nodes

The **height of a node** is

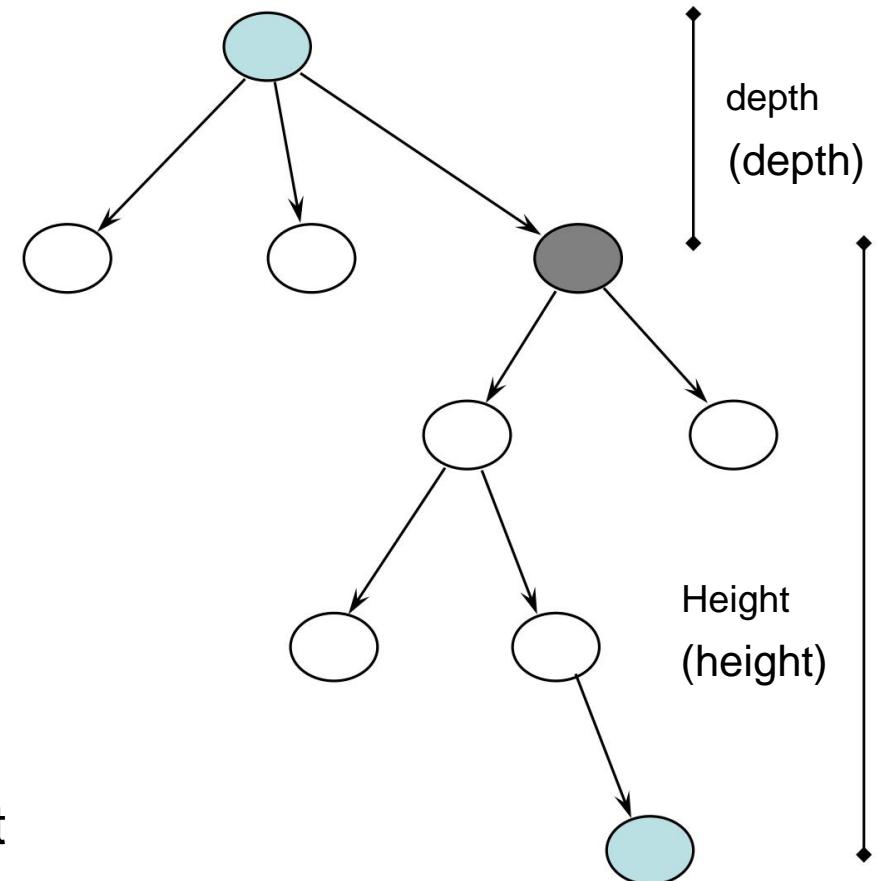
Length of the longest path from this node to the reachable leaves

The **depth of a node** is

Length of the path to the root

The **height of a tree**

corresponds to the height of the root



# Example Parse Tree

**Parse trees** analyze statements

or programs of a programming language with respect to a given grammar

A grammar defines rules about how and from which elements a programming language is constructed

## Example: C++ (excerpt)

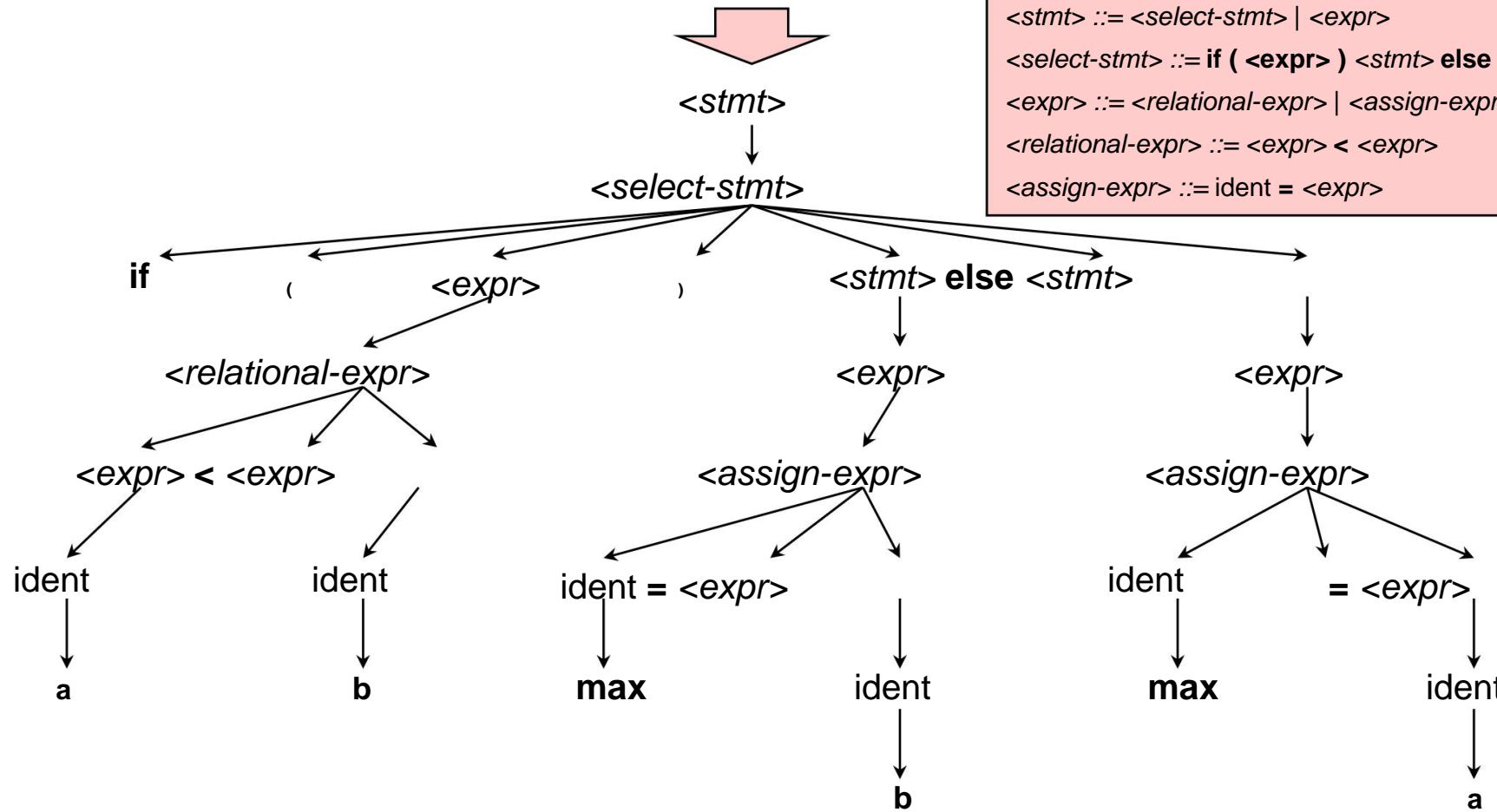
```
<stmt> ::= <select-stmt> | <expr>  
<select-stmt> ::= if ( <expr> ) <stmt> else <stmt>  
<expr> ::= <relational-expr> | <assign-expr> | ident  
<relational-expr> ::= <expr> < <expr>  
<assign-expr> ::= ident = <expr>
```

<stmt>	Nonterminal Symbole (are dissolved)
if, ident	Terminalsymbole (no longer dissolved)
::=,	Grammar symbolism



# Example Parse Tree (2)

**if (a < b) max = b else max = a**



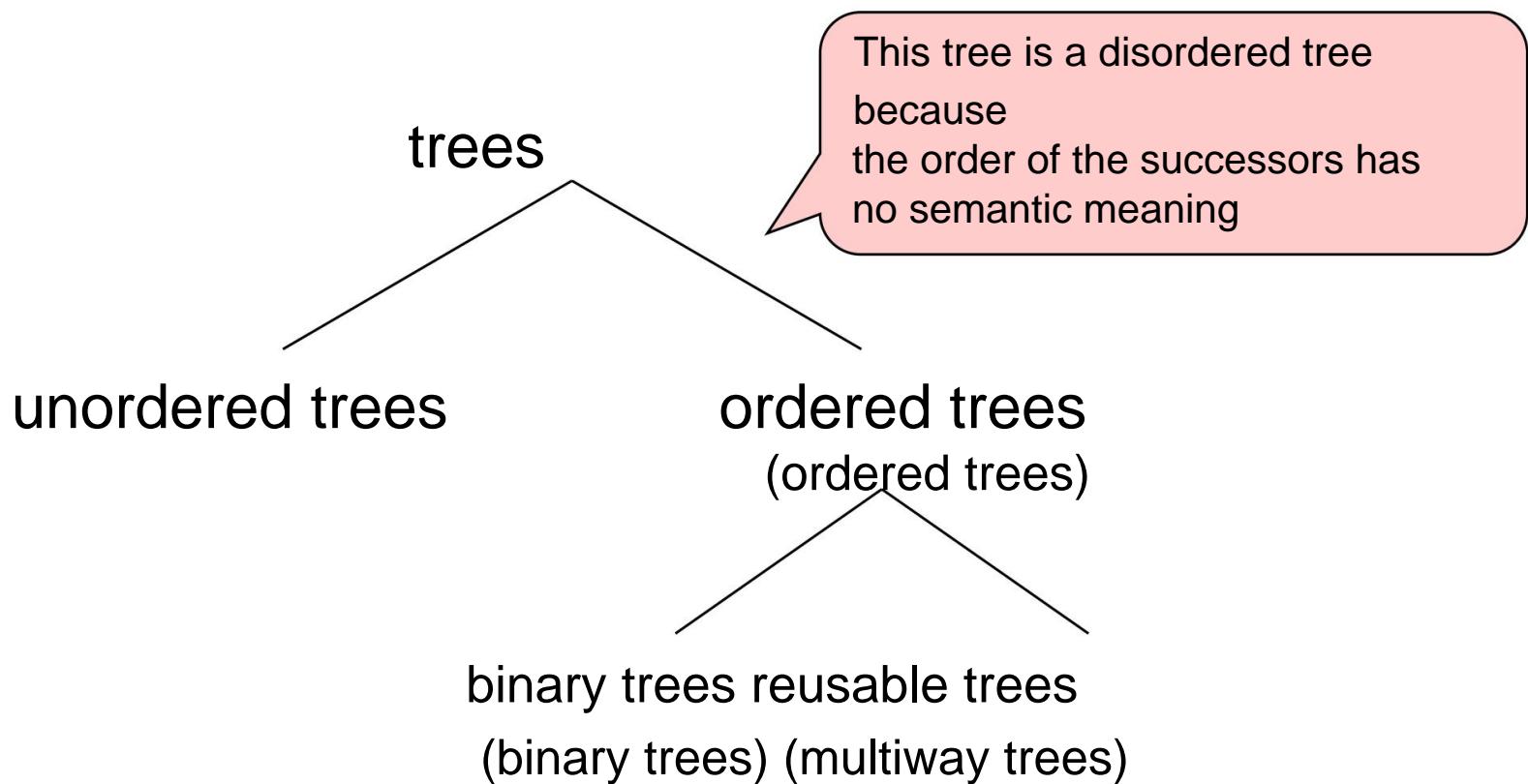
```

<stmt> ::= <select-stmt> | <expr>
<select-stmt> ::= if ( <expr> ) <stmt> else <stmt>
<expr> ::= <relational-expr> | <assign-expr> | ident
<relational-expr> ::= <expr> < <expr>
<assign-expr> ::= ident = <expr>
  
```

# Special trees

The **order** determines the position of the successors of a node in the graphical representation of the tree (node A to the left of node B)

This means that an order relation is defined for the children of each node

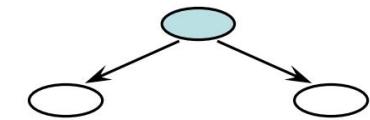


## 5.2 Binary trees

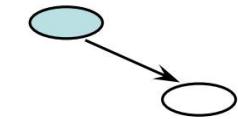


**Binary trees** are trees in which each node has a maximum of 2 children and the order of the nodes is defined as left and right

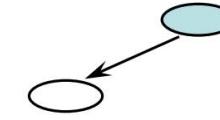
Binary tree with 2 children



Binary tree with right child



Binary tree with left child



Binary tree without child (leaf)

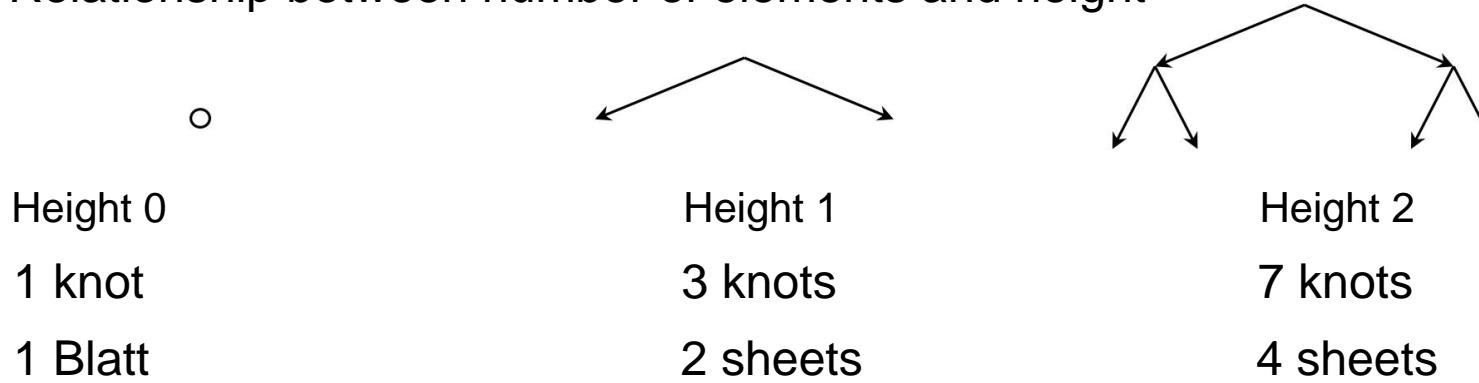


# Binary Trees - Properties

Frequently used in algorithms

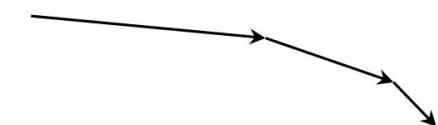
Efficient manipulation algorithms

Relationship between number of elements and height



In each new level, in the optimal case, the number of sheets doubled

Degeneracy possible: Every node has exactly one child → corresponds to linear list



# Forms of binary trees

## Empty binary tree

Binary tree without nodes

## Full binary tree

Each node has zero or 2 children

## Perfect binary tree

A full binary tree in which all leaves have the same depth

## Complete binary tree

A perfect binary tree except that the leaf level is not  
is completely filled, but from left to right

## Height-balanced binary tree

For each node is the difference in the height of the left and right  
child maximum 1

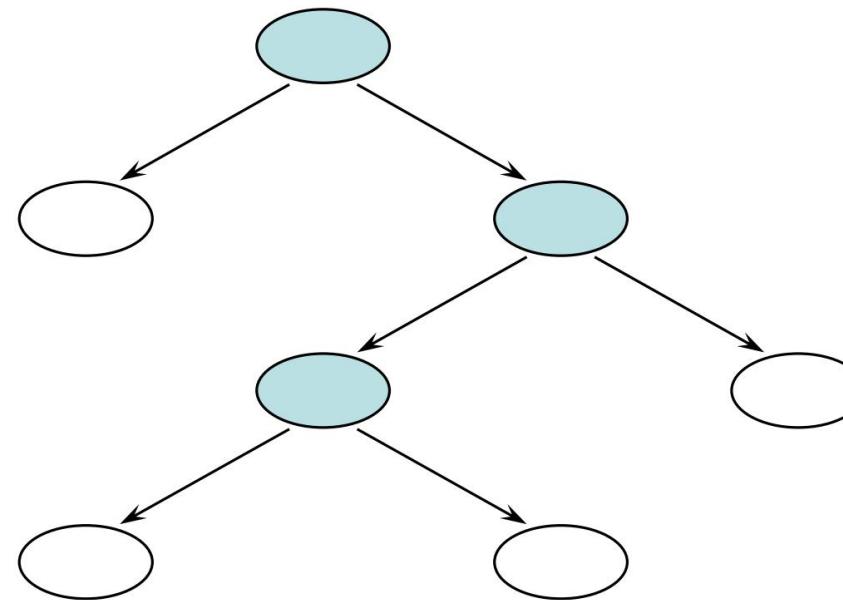
# Full binary tree



## Full binary tree

Each node in the tree has no children or exactly 2 children.

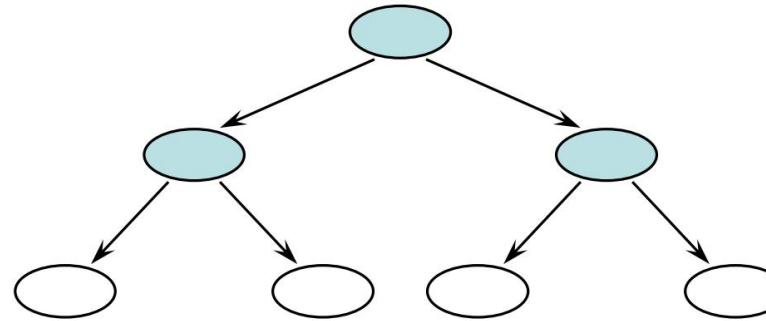
In other words, no node has only 1 child



# Perfect binary tree

## Perfect binary tree

A full binary tree (all nodes have no or exactly 2 children) in which all leaves have the same depth.



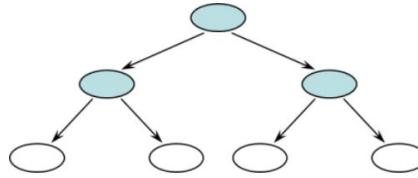
# Properties of the perfect binary Baumes



## Characteristics

Question: what height  $h$  must a perfect binary tree have to reach  $n$

To have leaves



Doubling in every level, i.e.  $2^h = n$

$$h \stackrel{*}{\log} 2 = \log n$$

$$h = \log_2 n = \lceil \log n \rceil$$

A perfect binary tree of height  $h$  has  $2^h + 1 - 1$  nodes  
 $2^h$  of which are leaves

Proof with complete induction

Relationship between nodes/leaves and height:

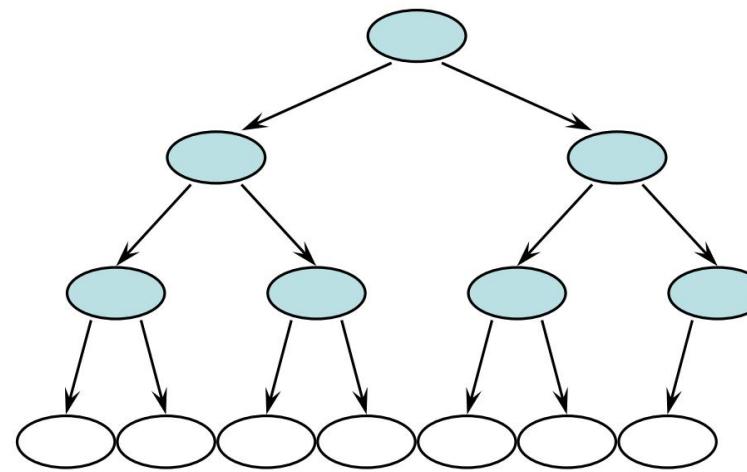
$O(n)$  nodes/leaves :  $O(\log n)$  height

most important  
Characteristic  
of trees

# Complete binary tree

## Complete binary tree

A complete binary tree is a perfect binary tree with the exception that the sheet layer is not completely filled, but from left to right



## Characteristic

A complete binary tree with  $n$  nodes has a height of maximal  $h = \lceil \log_2 n \rceil$

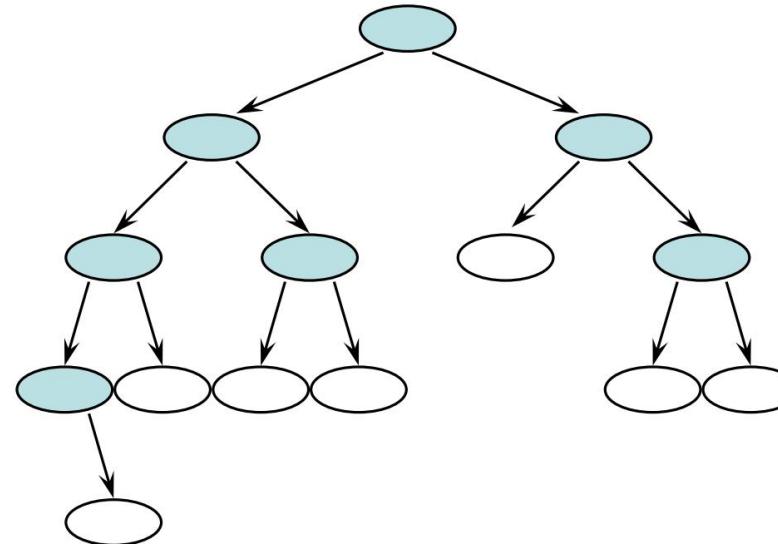


# Height-balanced binary tree

## Height-balanced binary tree

For each node is the difference in the height of the left and right child maximum 1

This guarantees that locally for each child the balancing property is fulfilled relatively well, but globally the overall tree differences can be larger  
⇒ simpler algorithms



# Tree traversal

Traversing a tree means systematic  
Visiting all of its nodes

Different methods differ in the order of  
visited nodes

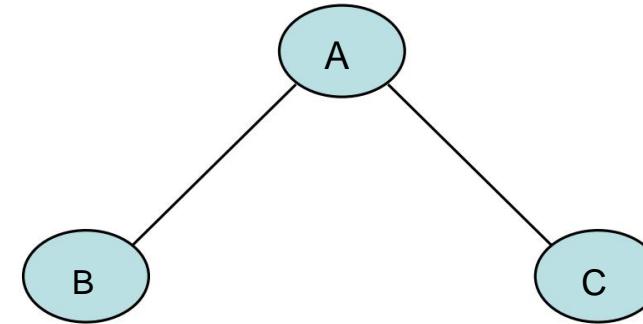
Possible orders

A, B, C

B, A, C

B, C, A

...

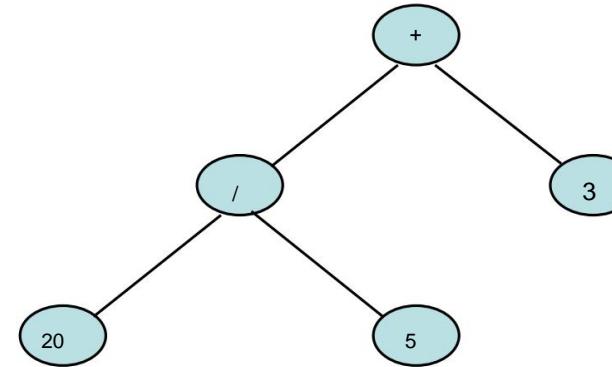


# Expression Tree

Systematic evaluation of a mathematical expression

A mathematical expression can be in the form of an Expression Trees are specified

$$(20 / 5) + 3$$



Leaves represent operands (numerical values), internal nodes  
Operators

Evaluation of the expression runs from the leaves to the root

Tree representation saves bracket notation

# Traversal algorithm

Traversal algorithms basically consist of 3 different steps

Editing a node (process node)

Recursively visit and edit the left child (visit left child)

Recursively visit and edit the right child (visit right child)

By arranging the 3 steps differently, different orders

3 processing sequences interesting

**Preorder traversal**

Postal order Traversierung

Inorder traversal

# Preorder traversal

## algorithm

```

preorder(node) {
  if(node != 0) {
    process(node)
    preorder(left child)
    preorder(right child)
  }
}
  
```

Visits the nodes in the tree in *prefix*

*Notation order*

(Operator, Operand1 , Operand2 )

Rule of thumb

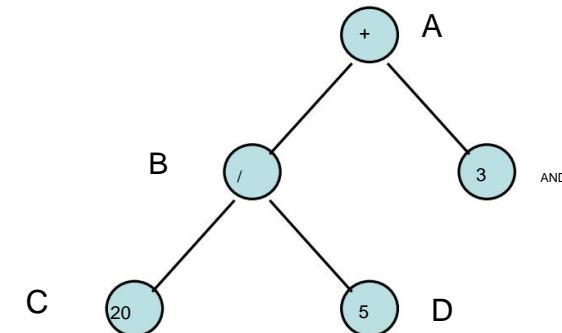
Edit nodes on 1st visit

Application

LISP, Assembler

Example

20/5+3



Process order: ABCDE

Notation order:

+ / 20 5 3

# Postal order Traversierung

## algorithm

```
postorder(node) {
    if(node != 0) {
        mail order(left child)
        mail order(right child)
        process(node)
    }
}
```

## Postfix notation order

(Operand1, Operand2, Operator)

Rule of thumb

Edit nodes at the last one

Visit

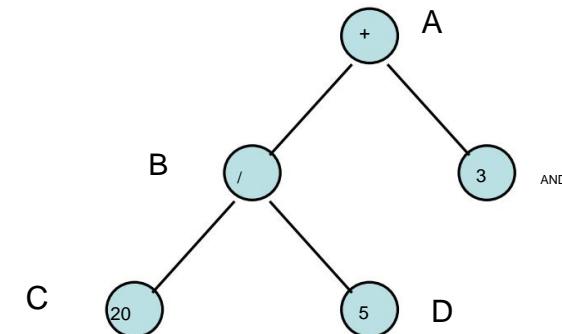
## Application

Invers Polish Notation, HP

Calculator, FORTH

## Example

$$20/5+3$$



Process order:

Notation order:

CDBEA

20 5 / 3 +

# Inorder traversal

## algorithm

```

inorder(node) {
    if(node != 0) {
        inorder(left child)
        process(node)
        inorder(right child)
    }
}
  
```

## Infix notation order

(Operand1 , Operator, Operand2 )

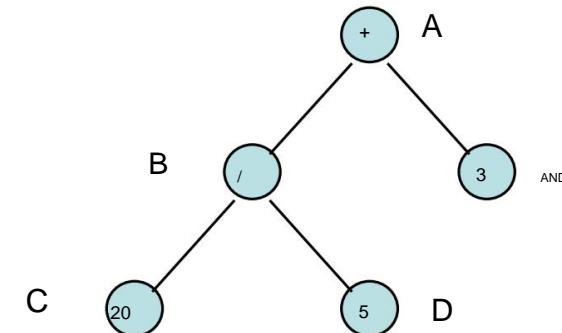
Rule of thumb

Edit nodes on 2nd or last visit

Using simple  
algebraic calculators (without  
brackets)

## Example

$$20/5+3$$



Process order:

Notation order:

CBDAE

$20 / 5 + 3$



## 5.3 Binary search trees

In a binary tree, each (internal) node has a left and a right connection that points to a binary tree or an external node (full binary tree)

Connections to external nodes are called zero connections, external Nodes have no further connections

A binary search tree (BST) is a  
Binary tree in which each internal node has a key

external nodes do not have keys

External nodes contain the managed information, i.e. data storage (will not discussed further here)

A linear order “ $<$ ” is defined on the keys

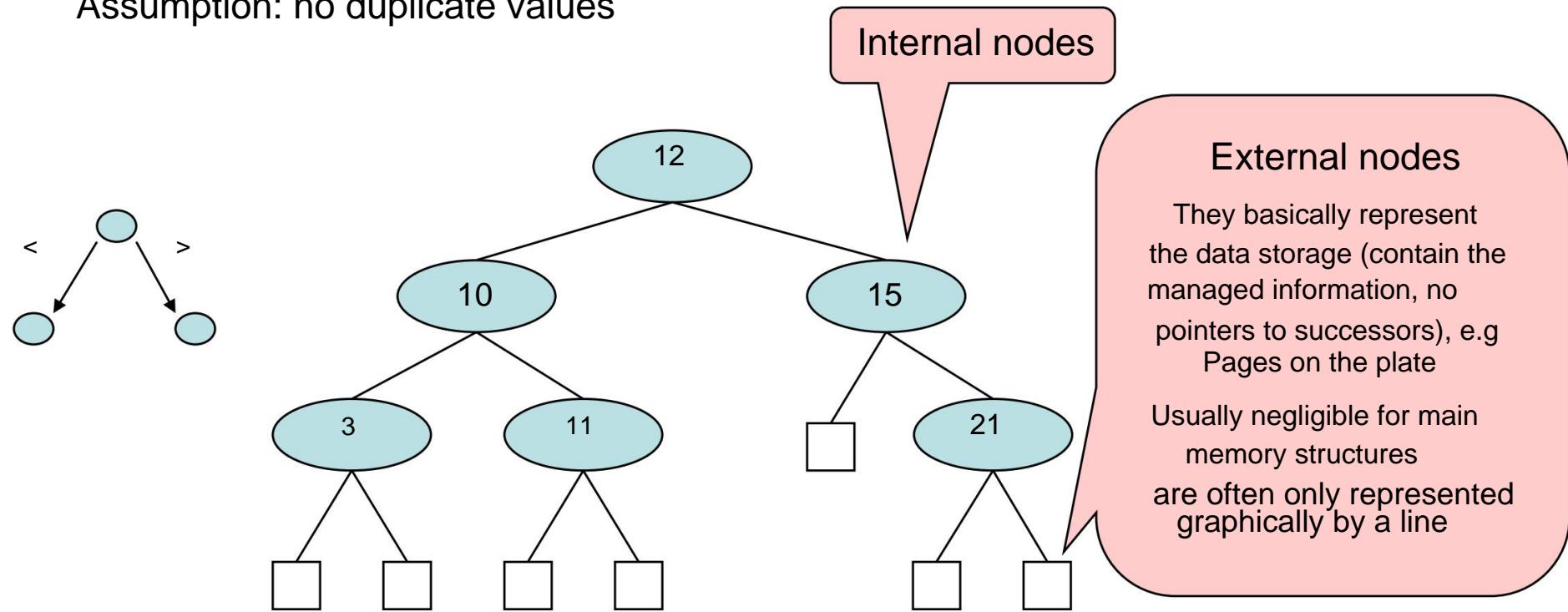
If  $x$  and  $y$  are different, then  $x < y$  or  $y < x$ ; if  $x < y$  and  $y < z$ , then  $x < z$  also applies

# *Key property in BST*

For each internal node, all values of the successors in the left subtree are less than the node value and the values of the successors in the right subtree are greater than that

node value are

Assumption: no duplicate values



# Properties of binary search trees

Management of any size of data

dynamic structure

Efficient administration

Effort proportional to the height of the tree (expected value!) and not to the number of elements

Insertion, access and deletion average  $O(\log n)$

Significant improvement compared to the linear effort  $O(n)$ .  
List

Access elements in sorted order through inorder traversal

# The operation

## Create

Creating an empty search tree

## Insert

Inserting an element into the tree taking the  
Order property

## Search

Test for inclusion

## Delete

Removing an element from the tree while preserving the  
Order property

## output

Output all elements in sorted order

...

# Class definition

```

typedef int ItemType; class
SearchTree { class node
{ public:

  ItemType info;
  node * leftchild, * rightchild; node(ItemType
  x, node * l, node * r) {info=x; leftchild=l; rightchild=r;} }; typedef node * link; link root; void

```

For the sake of simplicity,  
everything is **public** in the **node**

```

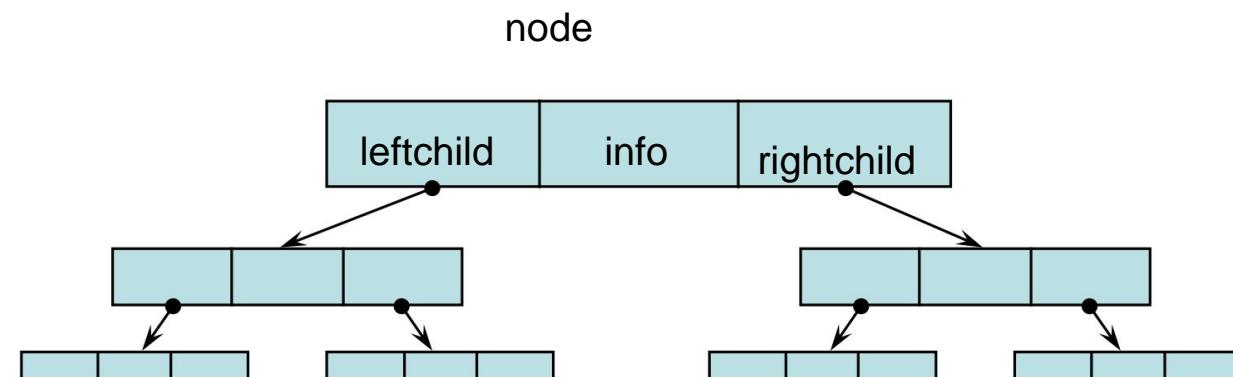
AddL(ItemType); void
AddR(link&,
ItemType); bool
MemberL(ItemType); bool MemberR(link,
ItemType); void PrintR(link, int);
public:

```

```

SearchTree(){root = 0;} void
Add(ItemType); int
Delete(ItemType); bool
Member(ItemType); void
Print(); };

```





## Searching in a binary tree

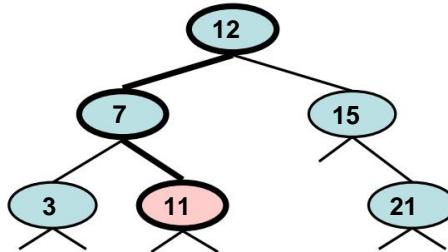
Finding a key involves tracing a path from the root downwards

For each internal node, the key  $x$  is combined with the search key  $s$  compared

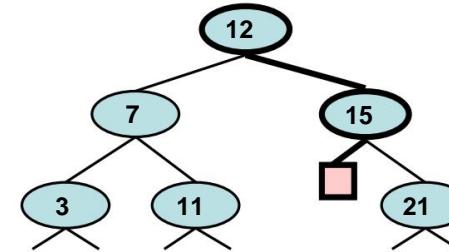
If  $x = s$  there is a hit, if  $s < x$  search in the left subtree, otherwise in the right

Reaching an external node was the key search  
“unsuccessful”

Successful search (e.g. 11)



Unsuccessful search (e.g. 13)



# Search (iterative)

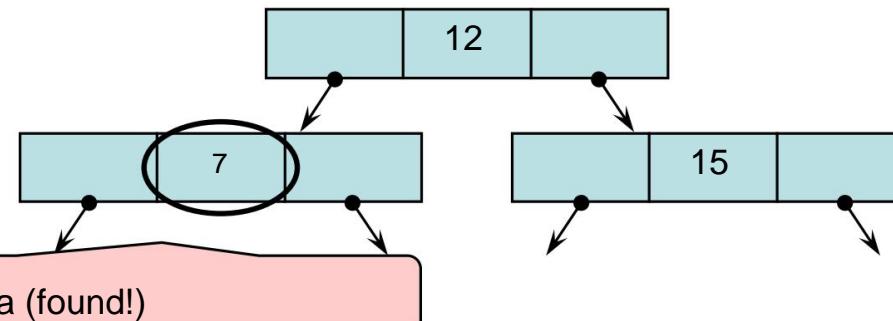
```

bool SearchTree::Memberl(ItemType a) { if(root) { link
  current = root;
  while(current) {
    if(current->info == a) return true; if(a < current->info)
      current = current->leftchild;
    else
      current = current->rightchild;
  }
} return false;

} bool SearchTree::Memberl(ItemType a) {
  return Memberl(a);
}
  
```

Call:  
**SearchTree t;**  
 ...  
**t.Member(7);**

Branching to current->leftchild, since a < current->info (dl 7 < 12)



# Search (recursive)

```
bool SearchTree::MemberR(link h, ItemType a) { if(!h) return false;
  else { if(a == h->info) return
    true; if(a
      < h->info)

        return MemberR(h->leftchild, a); else return

      MemberR(h->rightchild, a);
  }
}

bool SearchTree::Member(ItemType a) {
  return MemberR(root, a);
}
```

Call:

```
SearchTree t;
...
t.Member(7);
```

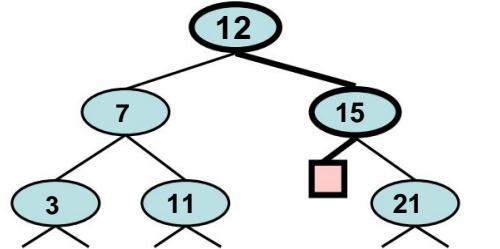


# Inserting into a binary search tree

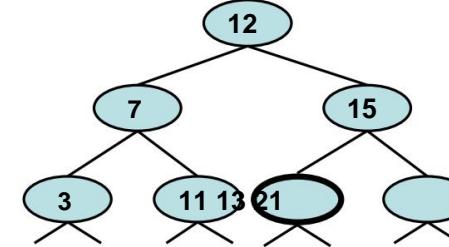
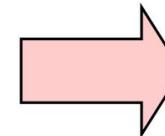
Inserting corresponds to an unsuccessful search and that  
Adding a new node to the zero connection where the  
Search ends (instead of the external node)

## Insert 13

Search



Add nodes



# Insert (iterative)

Similar to inserting into a list (2 auxiliary pointers)

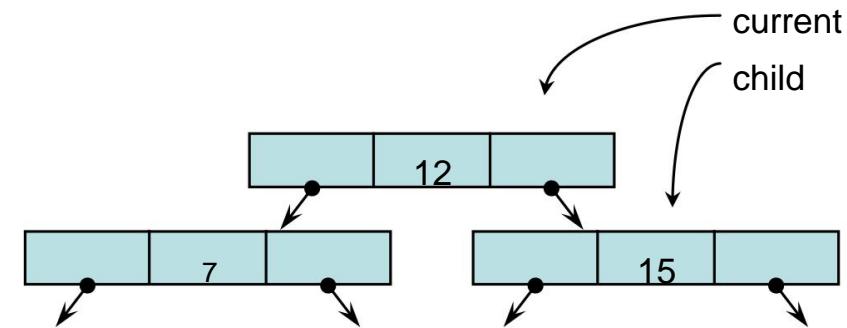
```
void SearchTree::Addl(ItemType a) { if(root) { link
  current = root;
  link child; while(1) { if(a ==
  current->info)
  return; if(a <
  current->info) { child = current->leftchild; if(!
  child) {current->leftchild = new
  node(a, 0, 0); return;} else { child =
  current->rightchild; if(!child) {current->rightchild = new node(a, 0, 0); return;}
  ...
  t.Add(7);
```

Hilfszeiger: **current**, **child** SearchTree t;

} current = child;

} } else
 { root = new node(a, 0, 0); return;
}

```
} void SearchTree::Addl(ItemType a) {
...
Addl(a);
}
```



# Insert (recursive)

```
void SearchTree::AddR(link& h, ItemType a) {  
    if(!h) {h = new node(a, 0, 0); return;}  
    if(a == h->info) return;  
    if(a < h->info)  
        AddR(h->leftchild, a);  
    else  
        AddR(h->rightchild, a);  
}  
  
void SearchTree::Add(ItemType a) {  
    AddR(root, a);  
}  
  
call  
SearchTree t;  
  
...  
  
t.Add(7);
```

Note the use of a reference parameter (**link&**), which saves the 2nd one

Auxiliary pointer

# traverse

```
void SearchTree::PrintR(link h, int n) {  
    if(!h) return; PrintR(h->rightchild, n+2); for(int i = 0; i < n; i++)  
        cout << cout << h->info << endl; PrintR(h->leftchild, " ");  
    n+2);  
  
} void SearchTree::Print() {  
    PrintR(root, 0);  
}  
call  
SearchTree t;  
...  
t.Print();
```

Inorder  
traversal

Gives tree 90 degrees against the  
twisted clockwise

# *Deletion in a binary tree*

The deletion process distinguishes between 3 cases

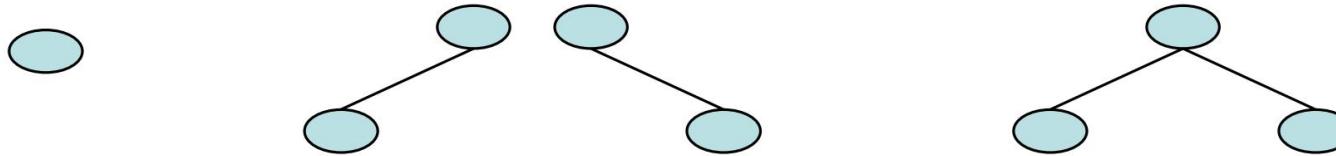
Delete internal nodes with

(1) none

(2) an

internal node as child(ren)

(3) two



Cases 1 and 2 are easily solved by appending the remaining subtree to the parent of the node to be deleted.

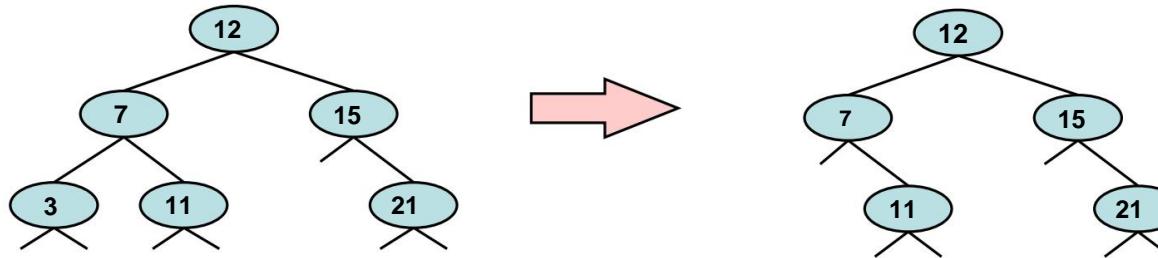
For case 3, a suitable replacement node must be found. For this either the smallest in the right subtree (inorder successor) or the largest in the left subtree (inorder predecessor) are suitable.



# Delete (2)

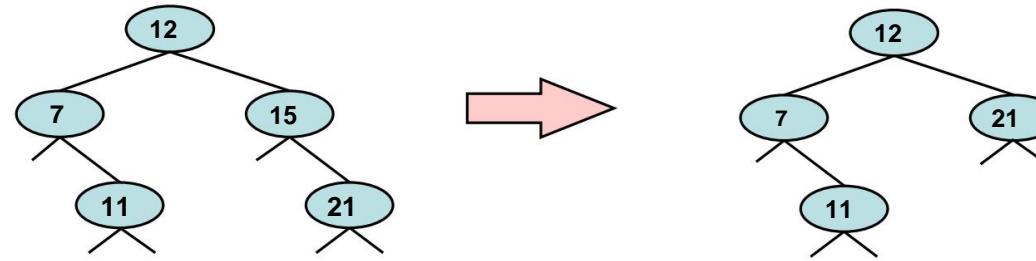
## Fall 1

Delete node 3 by replacing the left child pointer of node 7 through the external node (here zero connection)



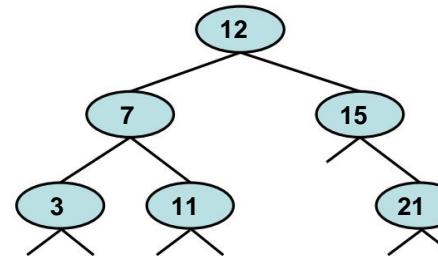
## Fall 2

Delete node 15 by mounting node 21 as the right one  
Child of 12



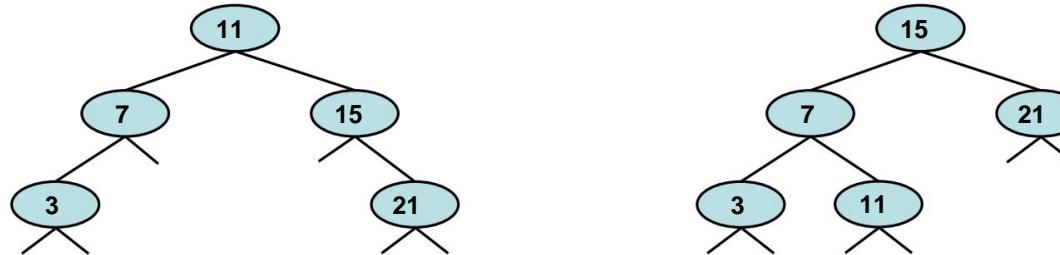
# Delete (3)

## Fall 3



In the case of deleting 12, suitable replacements are the nodes with the values 11 (largest in the left subtree) or 15 (smallest in the right subtree).

This results in 2 possible trees:



Thus, the deletion process for case 3 must be broken down into two parts:

1. Find a suitable replacement node
2. Replacing the node to be deleted (which in turn consists of removing of the replacement node from its original position (corresponds to case 1 or 2) and hanging it in the new location)

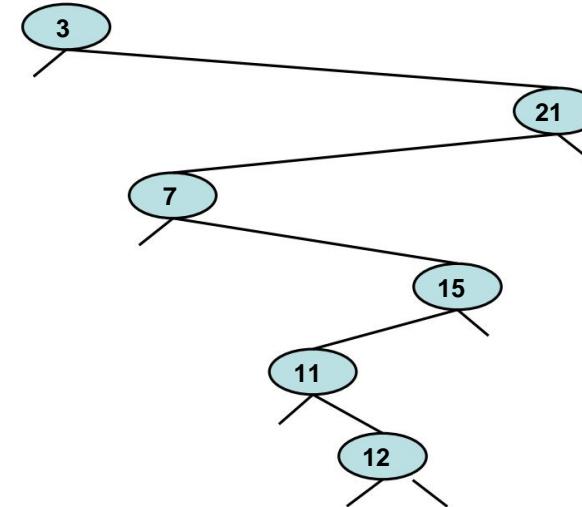
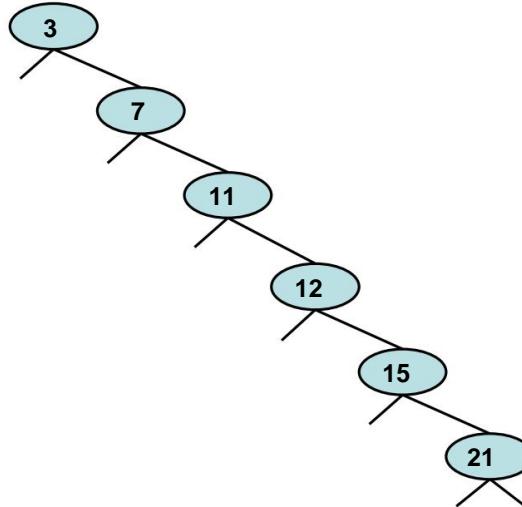


# Duration

Expected value of the insert and search operations with  $n$  random key values is approximately  $1.39 \lg n$

In the worst case, the effort can be approximately  $n$   
Operations “degenerate”

Examples of unfavorable search trees





# Binary search tree analysis

Data management

supports insert and delete

Amount of data

unlimited

Models

Main memory oriented

Support complex operations

Range queries, sort order

Duration

Storage space	$O(n)$
Constructor	$O(1)$
access	$O(\log n)$
Insert	$O(\log n)$
Delete	$O(\log n)$
Sorting order	$O(n)$

Please note:  
considerable constant  
effort is necessary!

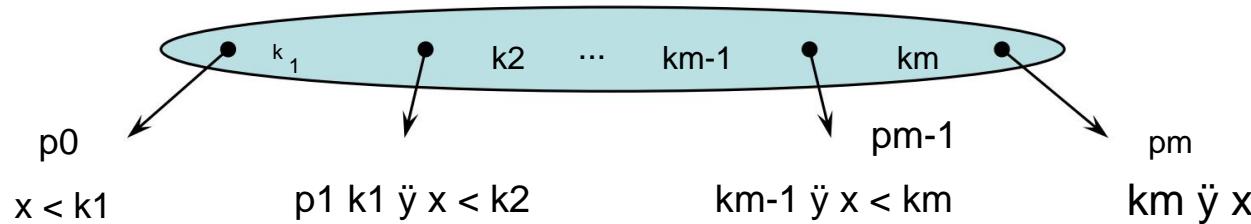
} Expected value!



## 5.4 Reusable trees

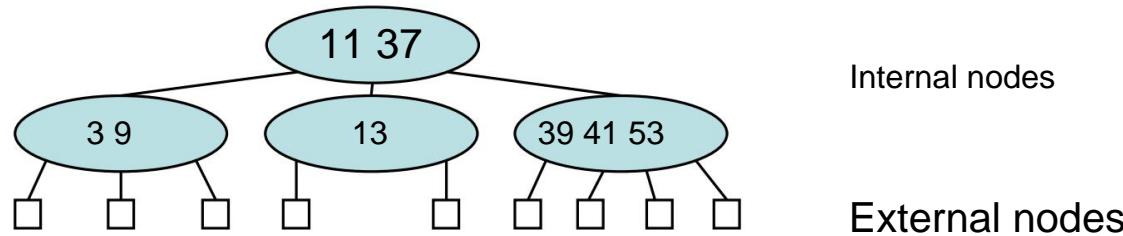
**Reusable trees** are trees with nodes that can have more than 2 children

### Interval-based search data structures



Node consists of a set of **m key values**  $k_1, k_2, \dots, k_m$  and **m + 1 references** (edges)  $p_0, p_1, \dots, p_m$ , such that for all keys  $x_j$  in the subtree referenced by  $p_i$ ,  $k_i \leq x_j < k_{i+1}$  (keys lie in the interval  $[k_i, k_{i+1}]$ ).

### Example



# *Search in the reusable tree*

Similar to searching in the binary search tree

For every internal node with keys  $k_1, k_2, \dots, k_m$  and connections  $p_0, p_1, \dots, p_m$  search key

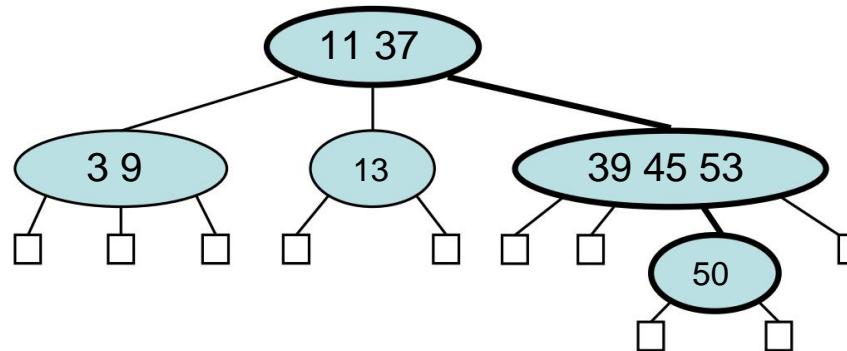
$s = ki$  ( $i = 1, \dots, m$ ): search successful  $s <$

$k_1$  : continue in subtree  $p_0$   $k_1 \leq s < k_1 + 1$ : continue in the subtree  $p_1$   $s$

$\ddot{y}$  km: continue in the subtree pm If you reach

an external node: key search unsuccessful

## Example: Search 50



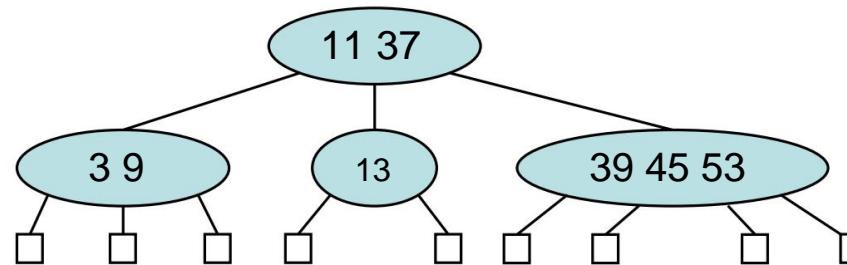
# 2-3-4 trees

A **2-3-4 tree** is a multi-way tree with the following Characteristics

**Size property:** each internal node has a minimum of 2 and a maximum 4 children

**Depth property:** all external nodes have the same depth

Depending on the number of children, an internal node is called 2-node, 3-knot or 4-knot



# Height of a 2-3-4 tree

**Theorem:** A 2-3-4 tree that stores  $n$  internal nodes has (always) a height of  $O(\log n)$

## Proof

Let the height of the 2-3-4 tree with  $n$  internal nodes be  $h$

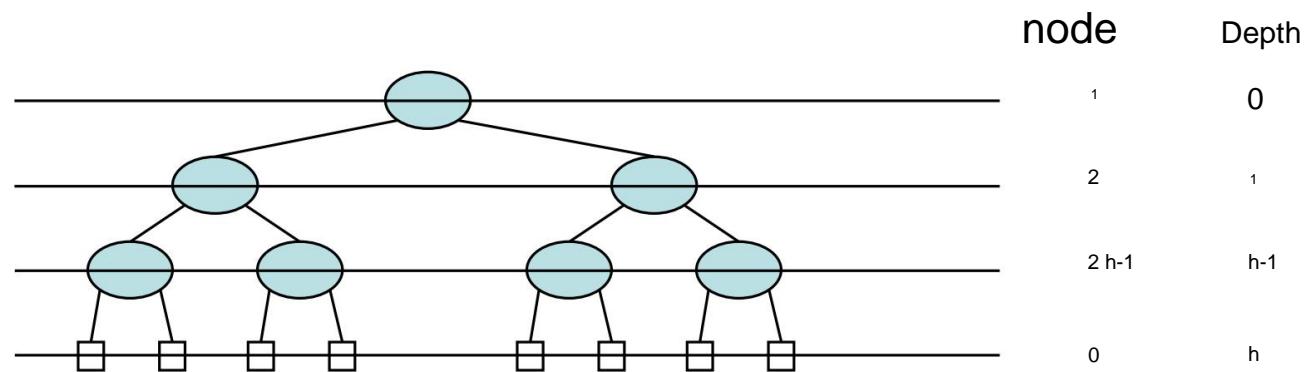
Since there are at least  $2^i$  internal nodes at depths  $i = 0, \dots, h-1$  and no internal nodes at depth  $h$ ,  $2^h \leq n$

$$2^h \leq n \Rightarrow 2^h \leq 2^{h-1} + 2^{h-2} + \dots + 2^0$$

$$n \geq 1 + 2 + 4 + \dots$$

Therefore  $h \geq \log_2(n + 1)$

$$\begin{aligned} n &\geq 2h - 1 \\ 1 &+ 1 \geq 2h \\ \log(n + 1) &\geq h \log 2 \\ h &\geq \log(n + 1) / \log 2 = \log_2(n + 1) \end{aligned}$$



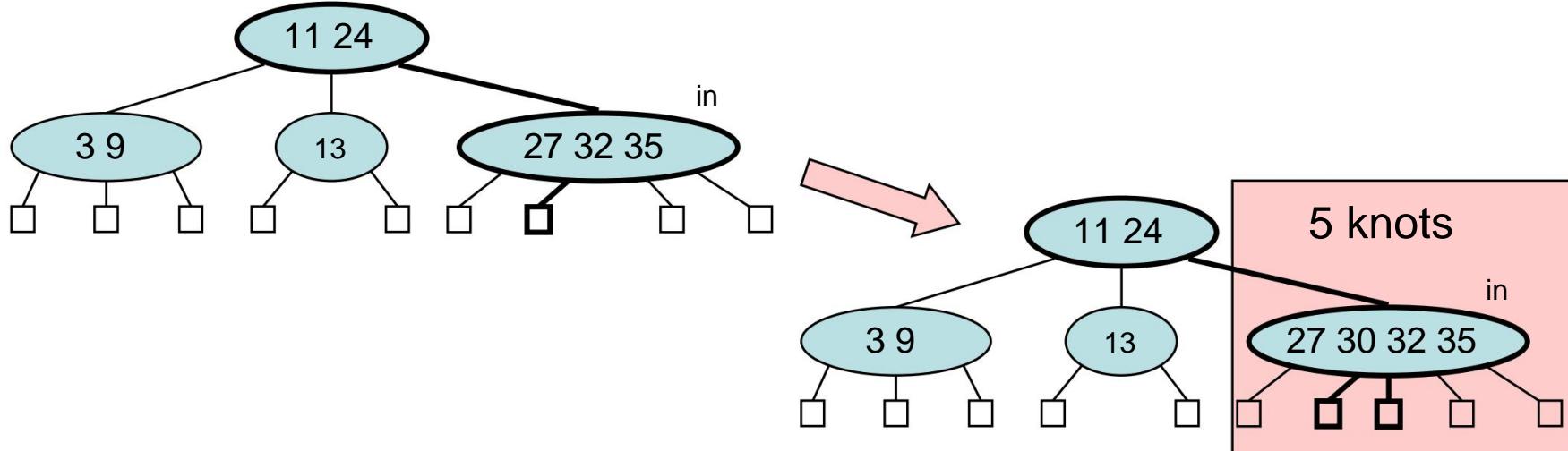
# Insert into a 2-3-4 tree

A new key  $s$  is created in the parent node  $v$  of the external  
Inserted node that was reached when searching for  $s$

The depth property of the tree is preserved, but the size property is potentially  
violated

A (node) overflow is possible (a 5-node is created)

Example: Inserting 30 creates overflow



# Overflow and split

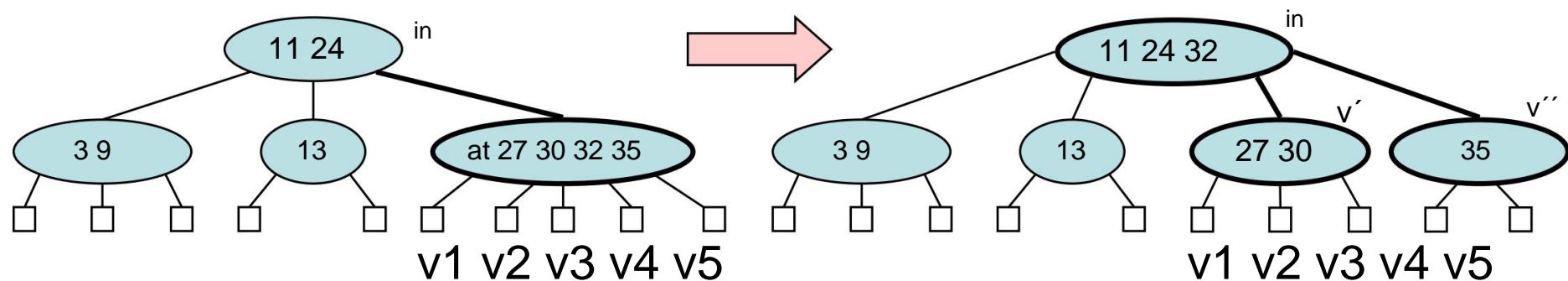
An overflow at a 5-node  $v$  is resolved by a split operation. The children of  $v$  are  $v_1, \dots, v_5$  and the keys of  $v$  are  $k_1, \dots, k_4$ . Node  $v$  is represented by

the nodes  $v'$  and  $v''$  replaced, whereby

$v'$  is a 3-node with keys  $k_1$  and  $k_2$  and children  $v_1, v_2$  and  $v_3$ ,  $v''$  is a 2-node with key  $k_4$  and children  $v_4$  and  $v_5$

Key  $k_3$  is inserted into the parent node  $u$  of  $v$  (this can create a new root)

## An overflow can be propagated to the predecessors of $u$



# Delete

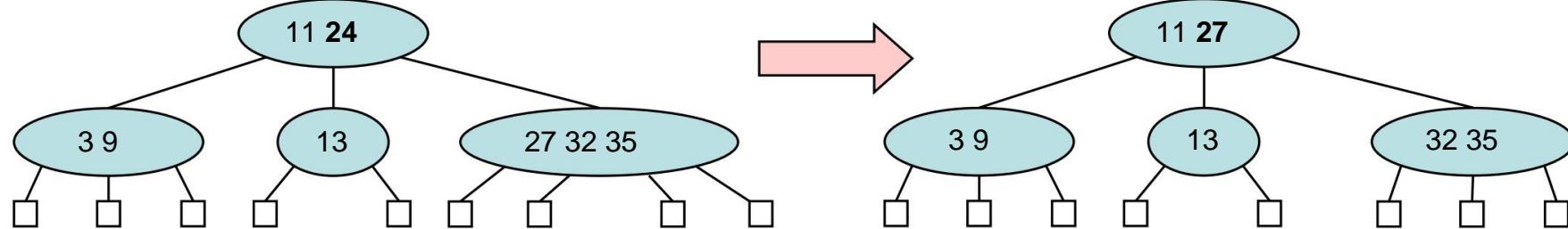
The deletion process is reduced to the case where the key value to be deleted lies in an internal node with external node children

Otherwise the key value will be with its inorder

Successor (or inorder predecessor) replaced

Analogous to case 3 binary search trees

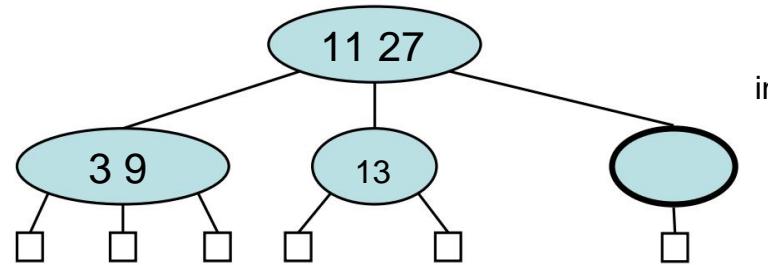
Example Delete Key 24



# Underflow

Deleting a key in a node  $v$  can cause an underflow

Node  $v$  degenerates into a 1-node with one child and none  
Key



in

Two cases can be distinguished in the case of an underflow

Case 1: Merge

Adjacent nodes are merged into one allowed node

Case 2: Move

Key values and corresponding children are passed between nodes  
delay



# Merge in the 2-3-4 tree

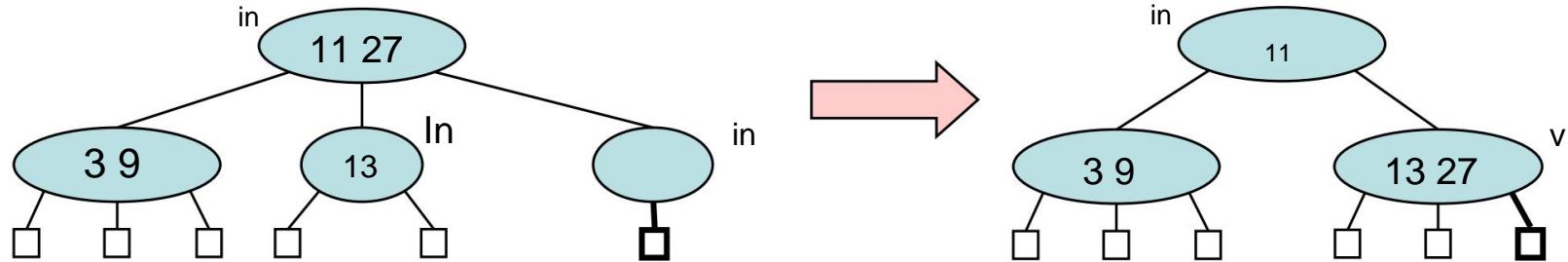
## Case 1: Merging nodes

Condition: All neighboring nodes at the same depth to the underlying node  $v$  are 2-nodes

You merge  $v$  with a neighbor  $w$  and don't move it

more required key from the parent node  $u$  to the merged node  $v'$

Merging can propagate the underflow to the parent node



# Moving in the 2-3-4 tree

## Case 2: Moving keys

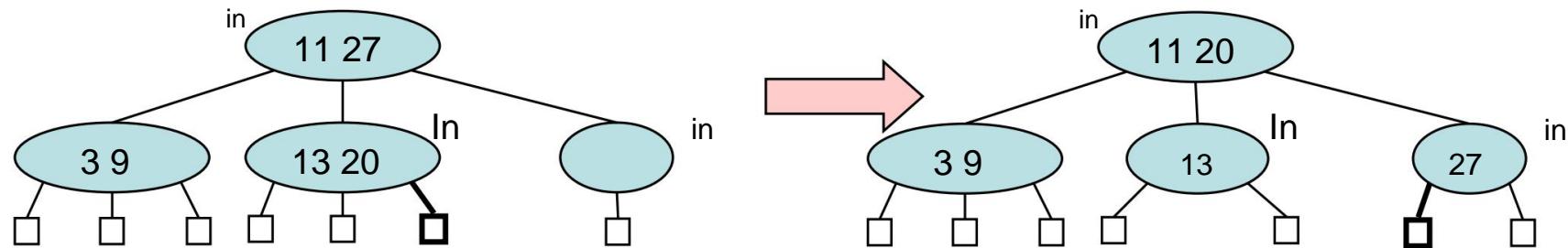
Condition: An adjacent node at the same depth w to the underlying node v is a 3-node or 4-node

You move a child from w to v

You move a key from u to v

You move a key from w to u

After moving, the underflow is fixed





# Analysis 2-3-4 tree

Data management

Insert and delete supported

Amount of data  
unlimited

Models

Main memory oriented

Support complex operations

Range queries, sort order

Duration

Storage space	$O(n)$
Merge, Move $O(1)$	
access	$O(\log n)$
Insert	$O(\log n)$
Delete	$O(\log n)$
Sorting order	$O(n)$

Guaranteed!



# Comparison of tree variants

<i>Baumvariant</i>	<i>Tree height + effort of The operation</i>	<i>Balancing form</i>	<i>Method</i>
More general Binary Search tree	On average $\log(n)$	Depends on the input	Coincidence, law of large numbers
2-3-4 Baum	$\log(n)$	perfectly balanced	Split, merge, Move



## 5.5 External storage management

### Goal

Creating a key tree for a large number of elements

### Problem

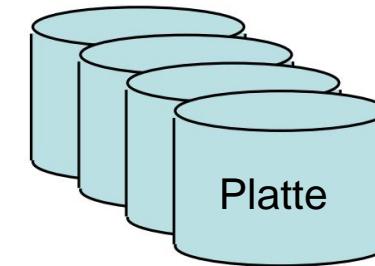
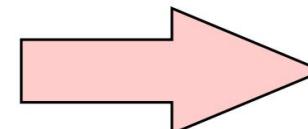
Main memory too small

### Solution

Storage of the nodes on the external memory (disk)

main memory

```
01001010010101  
11101101101010  
01010101011101  
...  
...
```



# Disk accesses

## Approach

Referencing a node corresponds to accessing the disk

When building a binary key tree for a data set of, for example, one million elements, the average tree height is  $\log_2 10^6 \approx 20$ , ie 20 search steps  $\approx$  20 disk accesses

## Dilemma

Difference in effort between main memory and disk access is a factor of 10,000

(SSD) to 100,000 (HD)

milli- to nano-seconds (e.g. 60 ns to 0.25-9ms)

Each search step requires disk access - a lot of effort

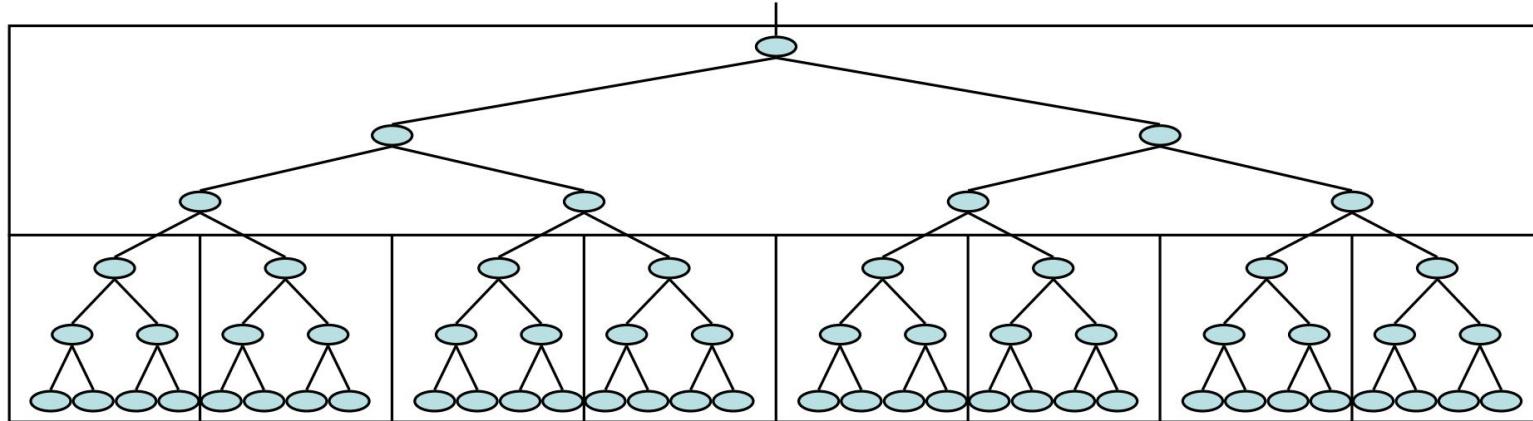
Calculation time



# Page management

## Solution

Decomposition of the binary tree into subtrees, which are saved in so-called *pages*



## ÿ Multiway tree

Interval-based search data structure

With 100 nodes per page for 1 million elements, only  $\log_{100} 10^6 = 3$  Pageviews

In the worst case (linear degeneracy) but still 104 accesses ( $10^6 / 100$ )

# Page management (2)

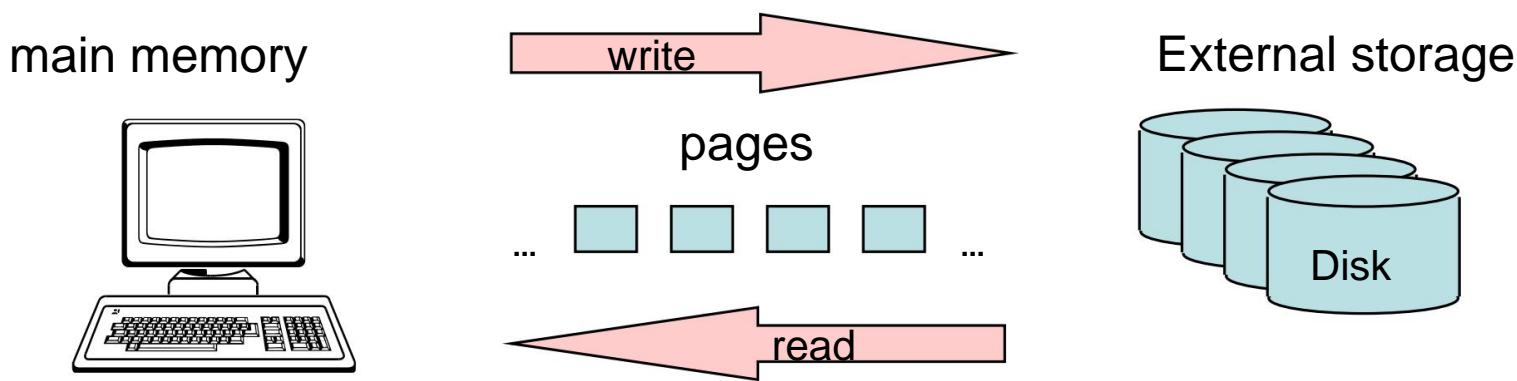


Nodes correspond to pages (blocks)

have a size, page size (number of entries contained or  
Memory size in bytes)

represent the transfer unit between main and external memory

To increase the efficiency of the transfer, the size of the pages is adjusted  
Block size of the memory transfer units of the operating system  
adjusted (Unit of Paging/Swapping)

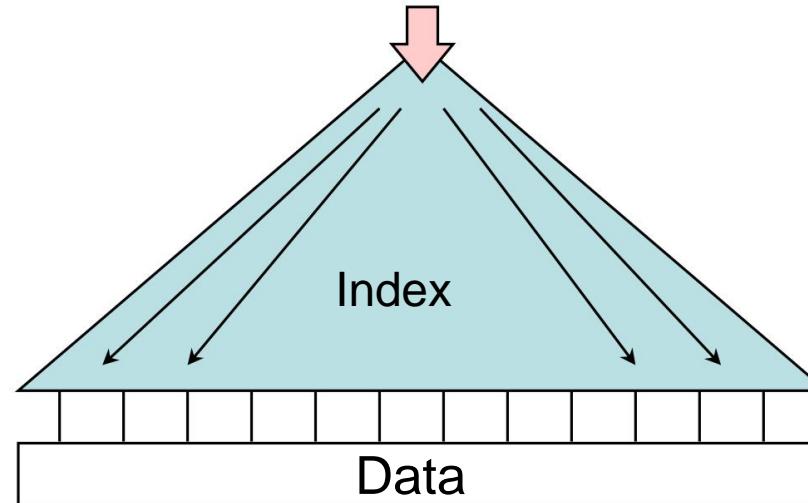




# Index structure

Index structure consists of key part (index) and data part

Graphic structure



Index

enables efficient access to the data

Data

contain the stored information (compare external nodes)



# Types of knots

2 types of knots

## Index notes

Allow efficient access to external nodes

Define the interval ranges of the elements in the associated subtree  
are stored.

realized by internal nodes

## External nodes

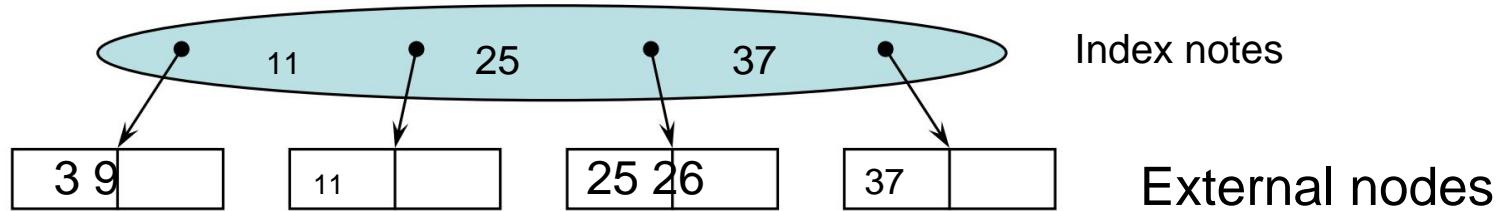
Contain the data set identified by key (**key, info**)

compare with **Dictionary**

realized by leaf nodes

In the example we only use key value, but represents entire data set

## Example





## 5.6 B+ tree

### Height-balanced (perfectly balanced) reusable tree

#### Characteristics

External storage data structure

One of the most common data structures in database systems

Dynamic data structure (insertion and deletion)

Insertion and deletion algorithms maintain the balancing characteristic

Guarantees a limited (worst-case) effort for access, insertion and delete

The effort for the operations access, insertion and deletion is due to the tree structure of the order  $\log n$  ( $O(\log n)$ )

Consists of index and data

The path to all data is the same length

# *Definition of B+ tree of order k*

All leaf nodes have the same depth (same path length to the root)

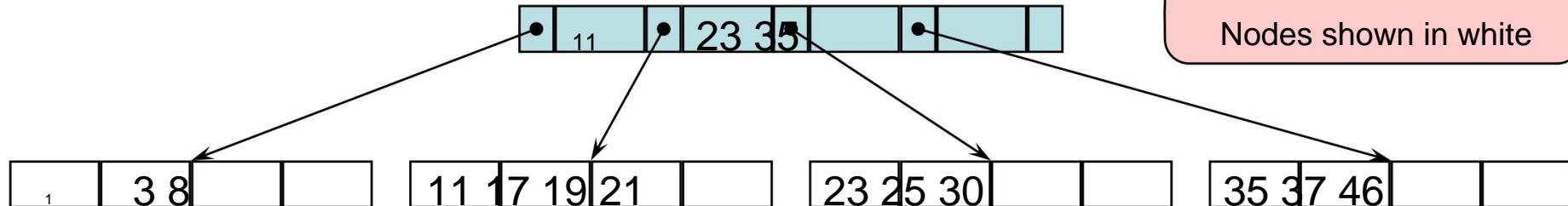
The root is either a leaf or has at least 2 and max.  $2k+1$  children

Each (internal) node has at least  $k$  and a maximum of  $2k$  key values, therefore at least  $k+1$  and a maximum of  $2k+1$  children

For each index entry, the left subtree only stores values that are smaller than the index entry and the right subtree only stores values that are greater than or equal to the index entry.

Interval-based search data structure

Example: B+ tree of order 2

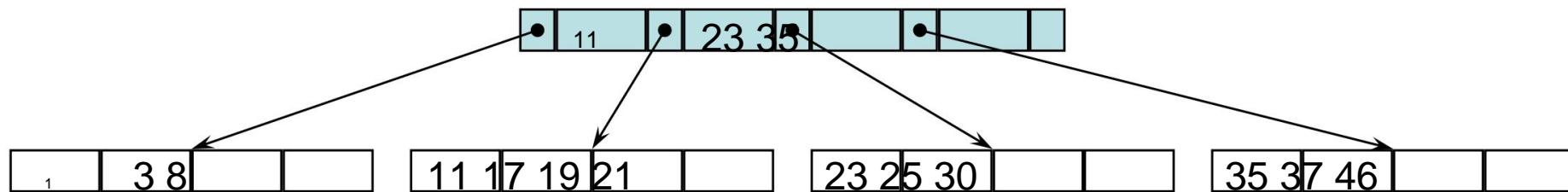


Each index node has a minimum of 2 and a maximum of 4 key values and therefore a minimum of 3 and a maximum of 5 children

The exception is the root, which can only contain 1 key value with 2 children

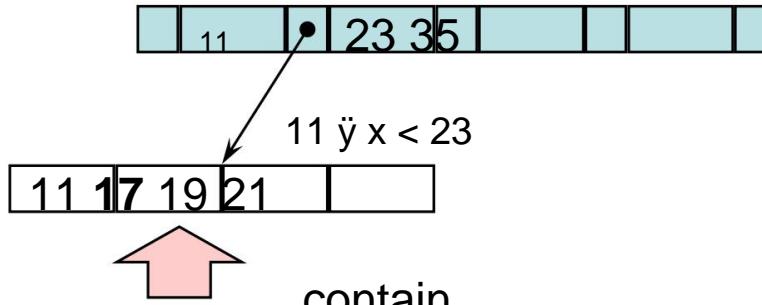
The size of the external nodes is actually not defined by the order but usually equated in the literature

# Search

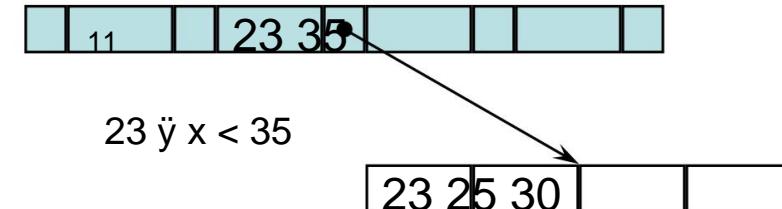


## Find a record with given key

Data record with key 17



Data record with key 27



Effort of the search

Height of a B+ tree of order k with *data block size b* (at least b, max  $2b$  elements) is maximum  $\log_k + 1(n/b)$ .

Area query possible

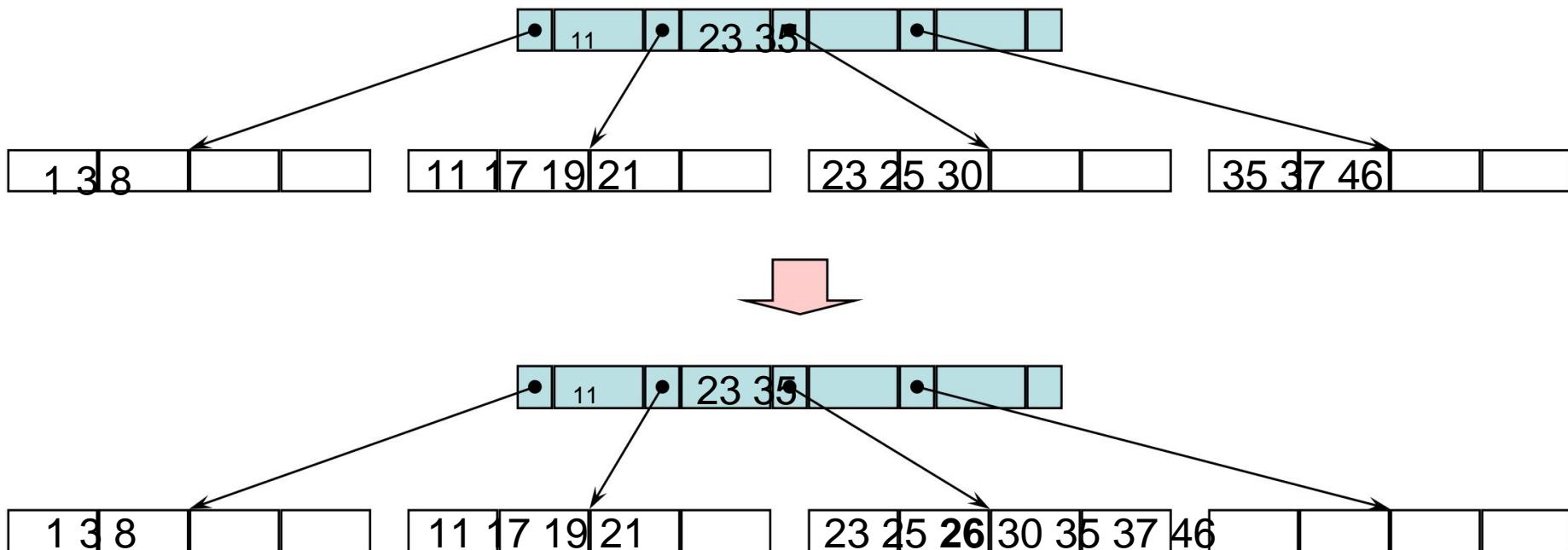
Find all elements in the range [lower limit, upper limit]

# B+ tree insertion (1)

Inserting here means that a data record with identifying Key is inserted into an external node, which may require index entries to be adjusted

Case 1: Insert record with key 26

Space available in the external node, easy insertion

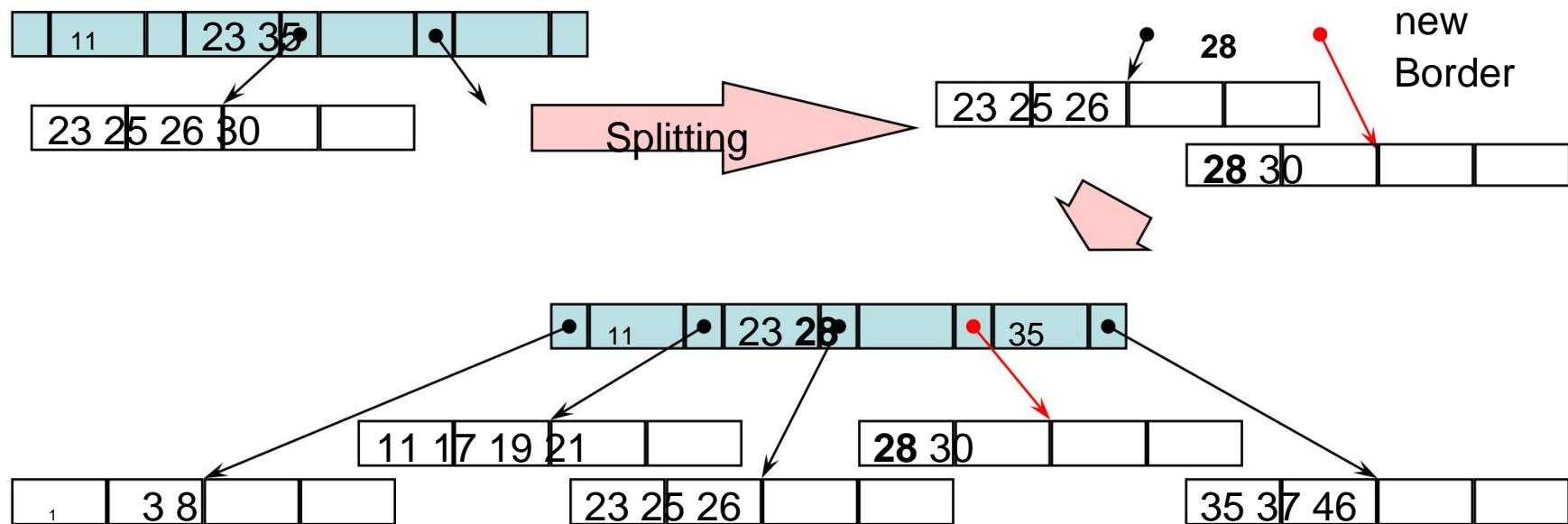




# B+ tree insertion (2)

## Case 2: Insert record with key 28

No more space in the external node (**overflow, overflow**), external node must be split → **Split**

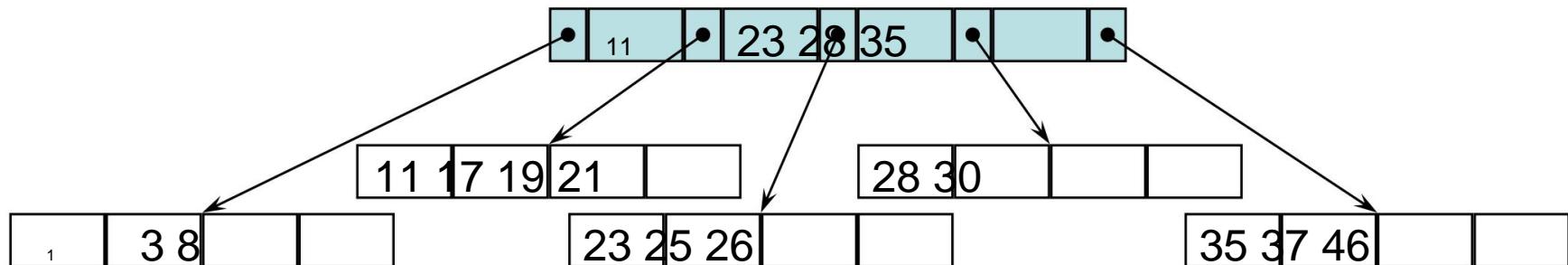




# B+ tree insertion (3)

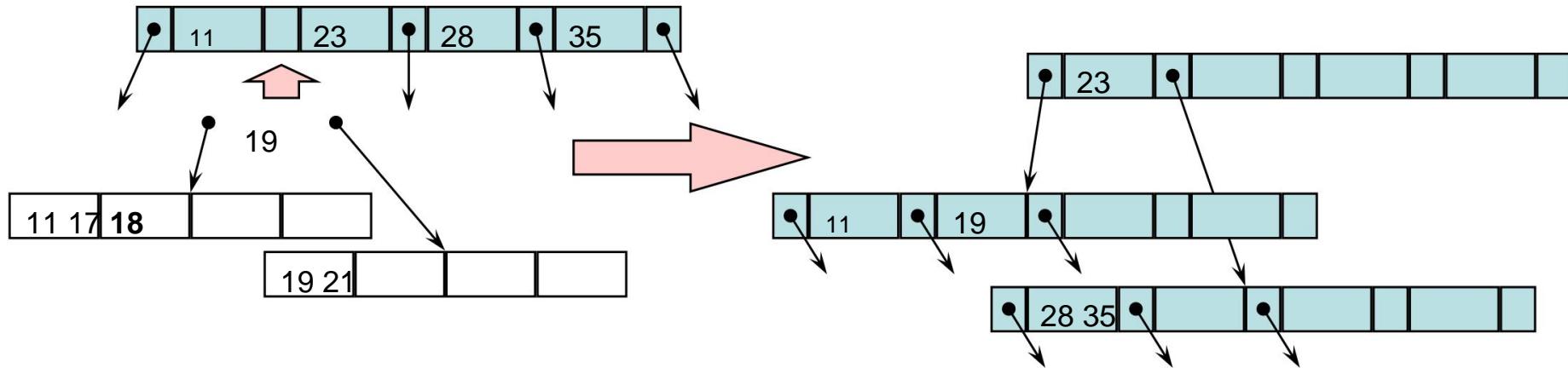
## Case 3: Insert record with key 18

No more room in the knot and no more room in the index node above, index node must be split



# B+ tree insertion (4)

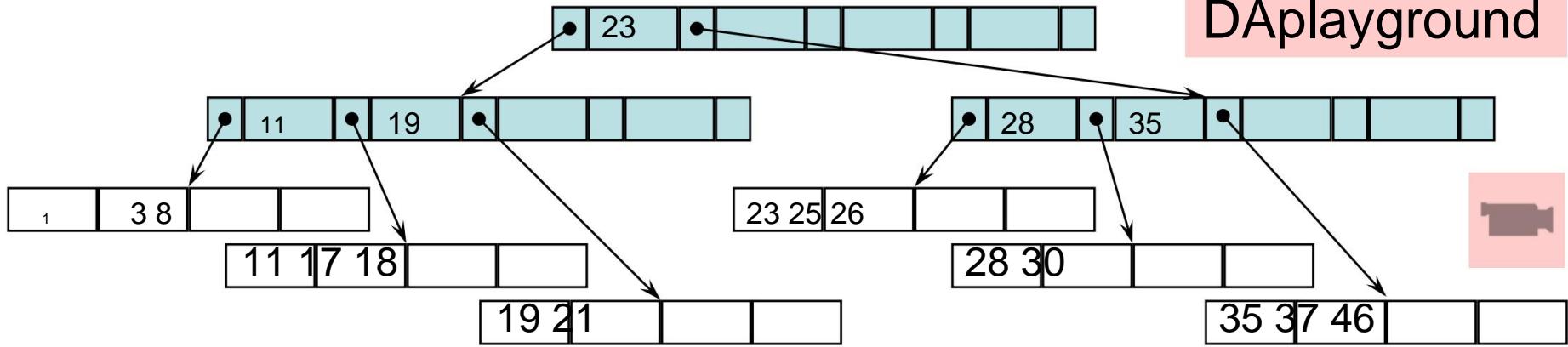
When splitting an index node, the middle index element is entered in the index node above it. If it does not exist (*root split*), a new root is created



## B+ tree insertion (5)

The resulting tree has the following appearance

DAplayground



## Differentiation of the split for external and internal nodes

External nodes:  $2k+1$  elements are divided between 2 neighboring external nodes

Internal nodes:  $2k+1$  index elements (key values) are divided into 2 neighboring index nodes with  $k$  elements each, the middle index element is entered into the index level above.

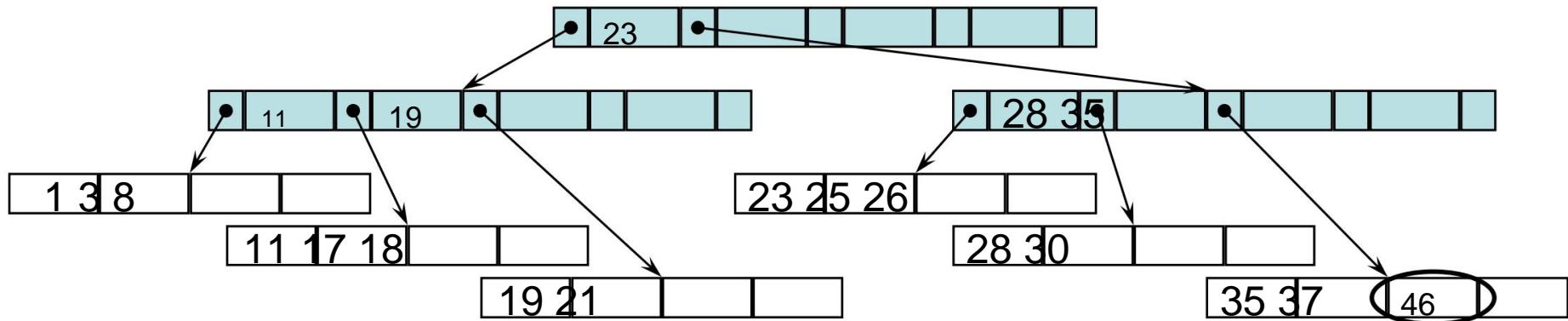
If no level above exists, a new root is created, the tree grows by one level (“tree grows from the leaves to the root”), the access path to the data increases by 1.



# B+ Tree Delete (1)

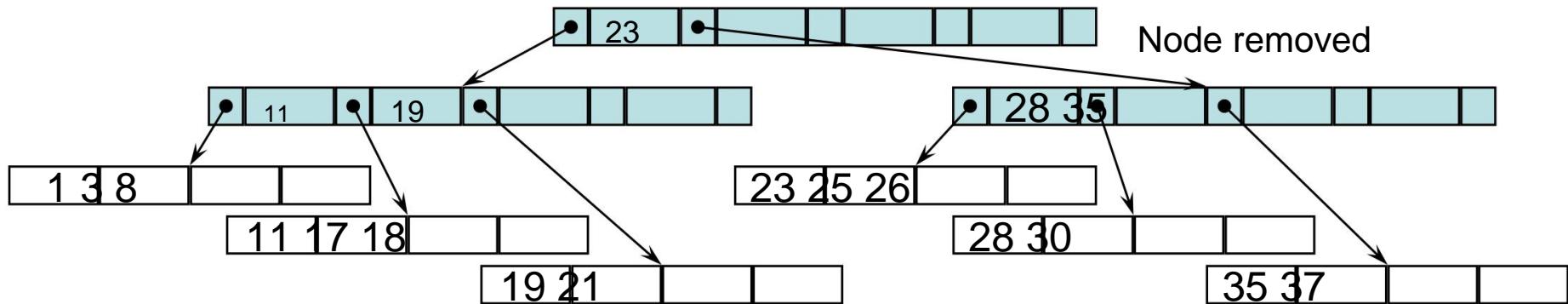
Case 1: Remove record with key 46

External node not understaffed after deletion



Data set is simply taken from

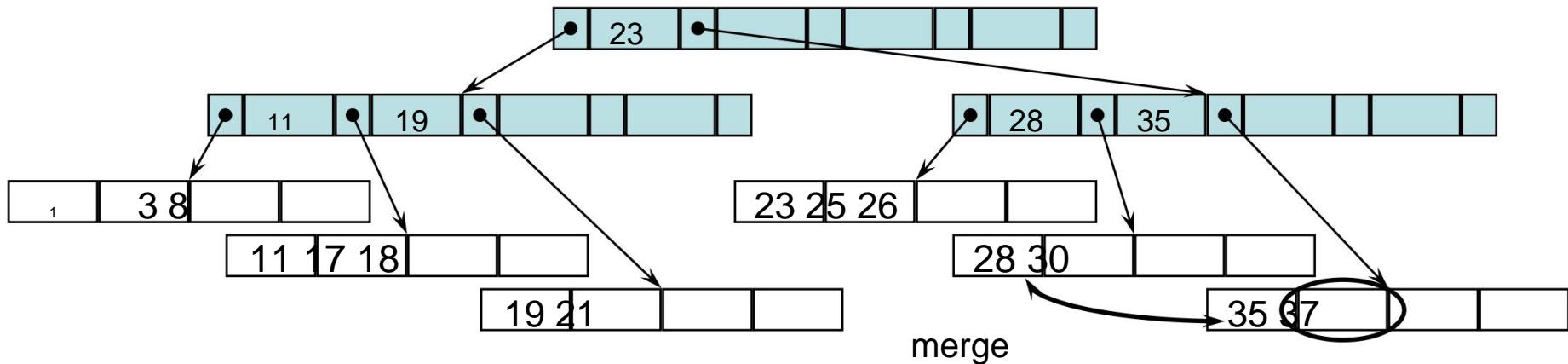
the external  
Node removed



# B+ Tree Delete (2)

Case 2: Remove record with key 37

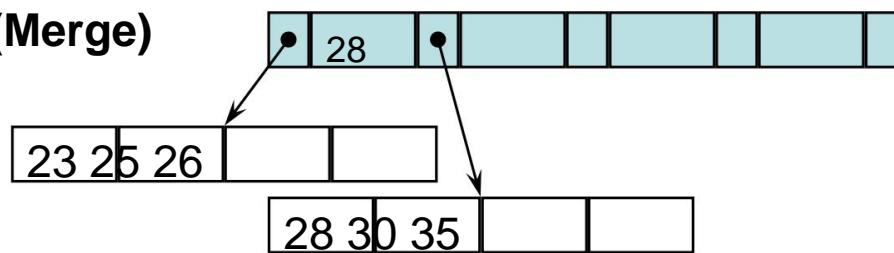
External node understaffed after deletion



Element is removed, node is underflow , number of elements < k

Reverse process to split ſy neighboring nodes are **merged**

**(Merge)**

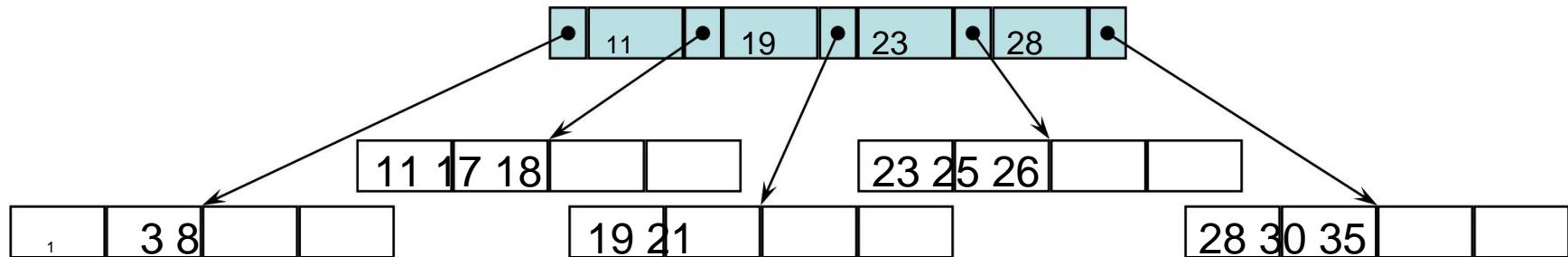


Internal node underflow, also needs to be merged with neighbors.



# B+ Tree Delete (3)

Merging can lead to tree height reduction, 2 nodes are merged to form new root, old root is removed.



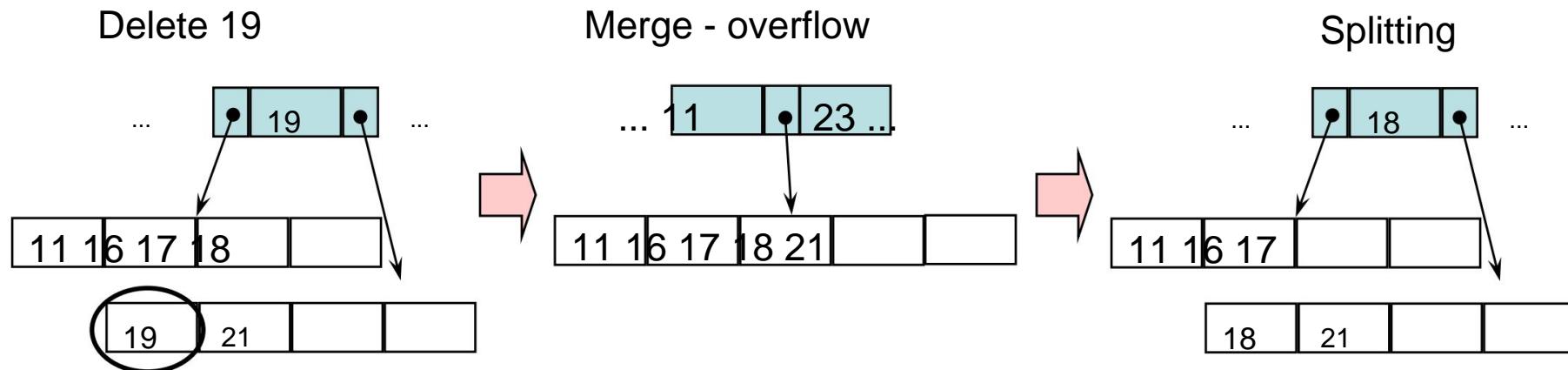
# B+ Tree Delete (4)

## annotation

Merging two nodes can lead to an overflow (analog Insertion) of the new node, which makes a subsequent split necessary.



## Example: (tree section)

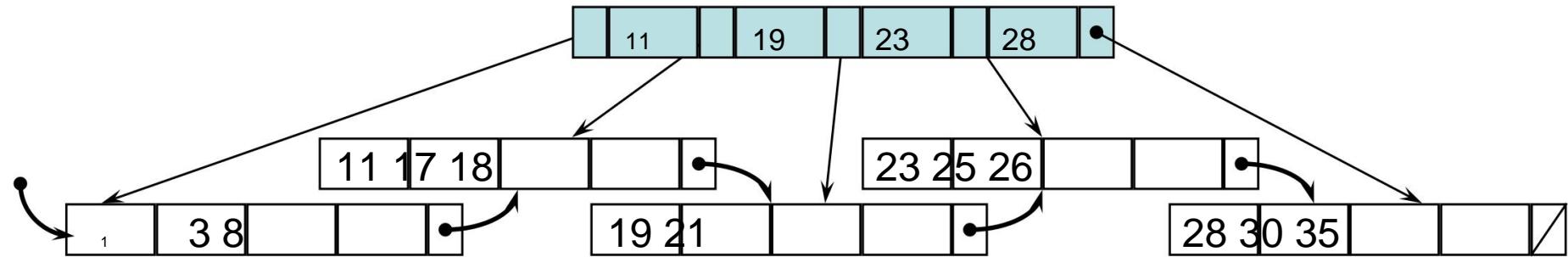


This (merge-split) sequence produces a better division of records between neighboring nodes. This is also referred to here (see 2-3-4 tree, actually incorrectly) as a data record shift.



# Data block chaining

In practice, the external nodes (data blocks) linearly chained to allow efficient, sequential access in the sort order of stored elements



# Analysis B+ - Tree

Data management

Insert and delete supported

Unlimited

data volume

depending on the size of the available storage space

Models

**External storage oriented**

Support complex operations

Range queries, sort order



# Analysis B+ - Tree (2)

Storage space	$O(n)$
Split, merge	$O(1)$
access	$O(\log n)$
Insert	$O(\log n)$
Delete	$O(\log n)$
Sorting order	$O(n)$

} Guaranteed!

Please note: Order of the tree is a constant factor!

Because of these properties and the focus on external storage media, the B+ tree is very good for  
**Suitable for use in database systems**



## 5.7 Trie

A trie is a digital search tree or prefix tree

Used to store and search character strings

Management of dictionaries, telephone books, spell checkers, etc.

The name is derived from “retrieval” but is pronounced like “try”.

For k letters, a “k+1-ary tree”, where each node is separated by a

Table is represented with k+1 edges on children

A path starting from the root to a leaf in the shoot represents a character string

Can also be interpreted in the broadest sense as an interval-based search data structure , since intervals [A,B[, [B,C[, ...



Special shapes

Patricia Tree, from the Briandais Tree

## *Example Trie*

## Trie

TEN

THE

**THEN**

THIN

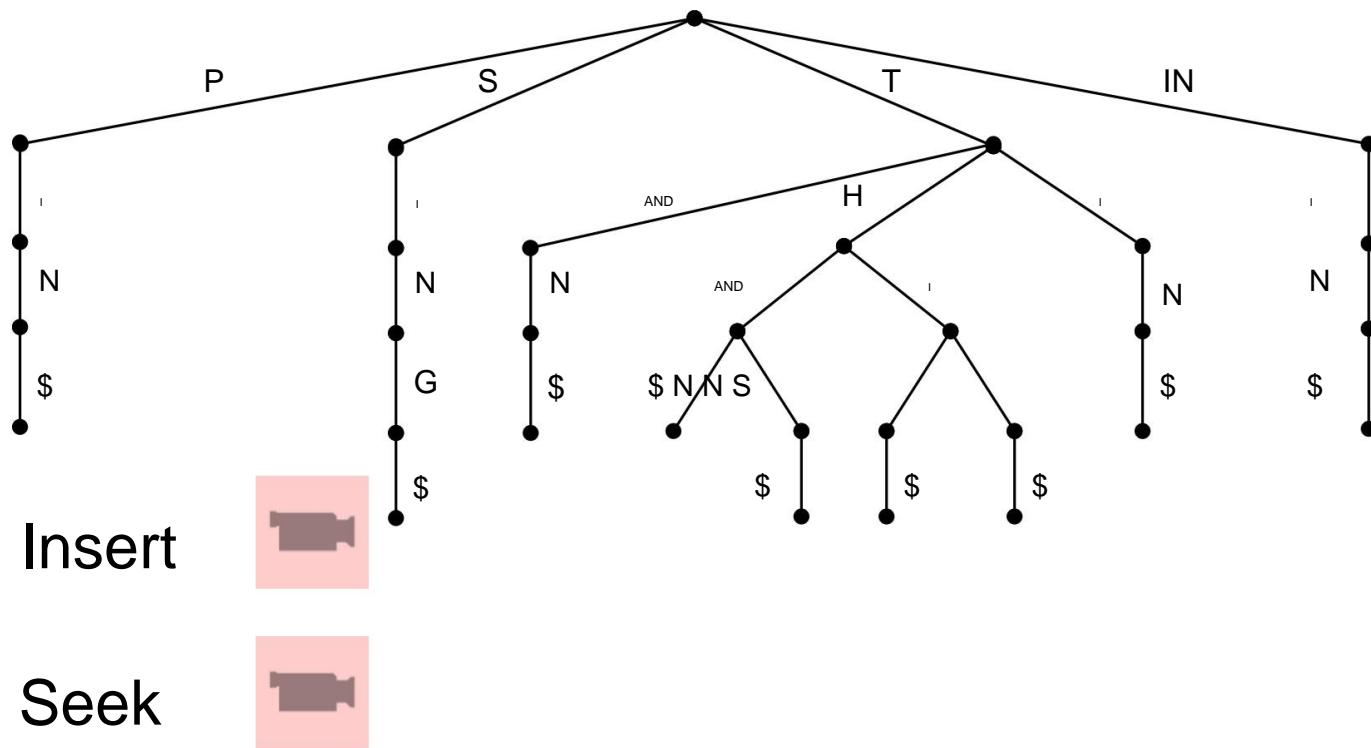
THIS

## BELIEVE

## SING

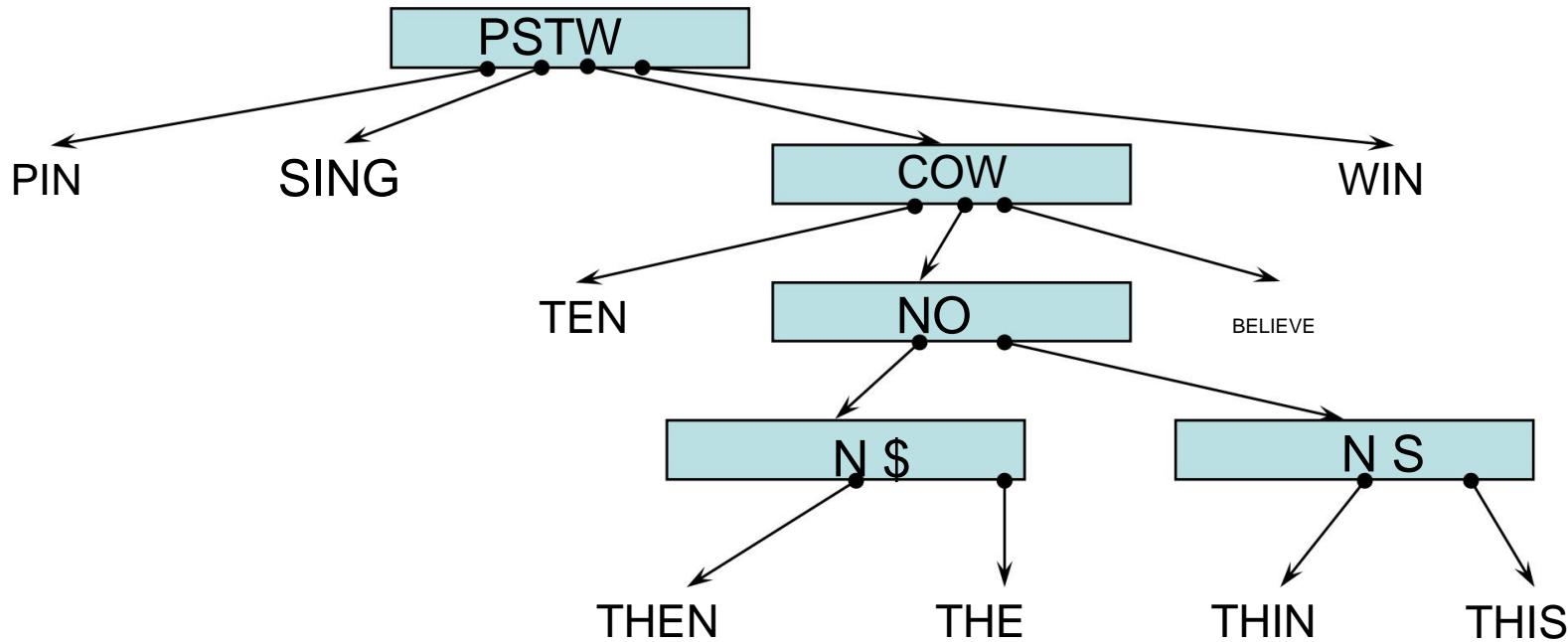
PIN

WIN



# Practical Algorithm to Retrieve Information Coded in Alphanumeric

The aim is to compress the trie





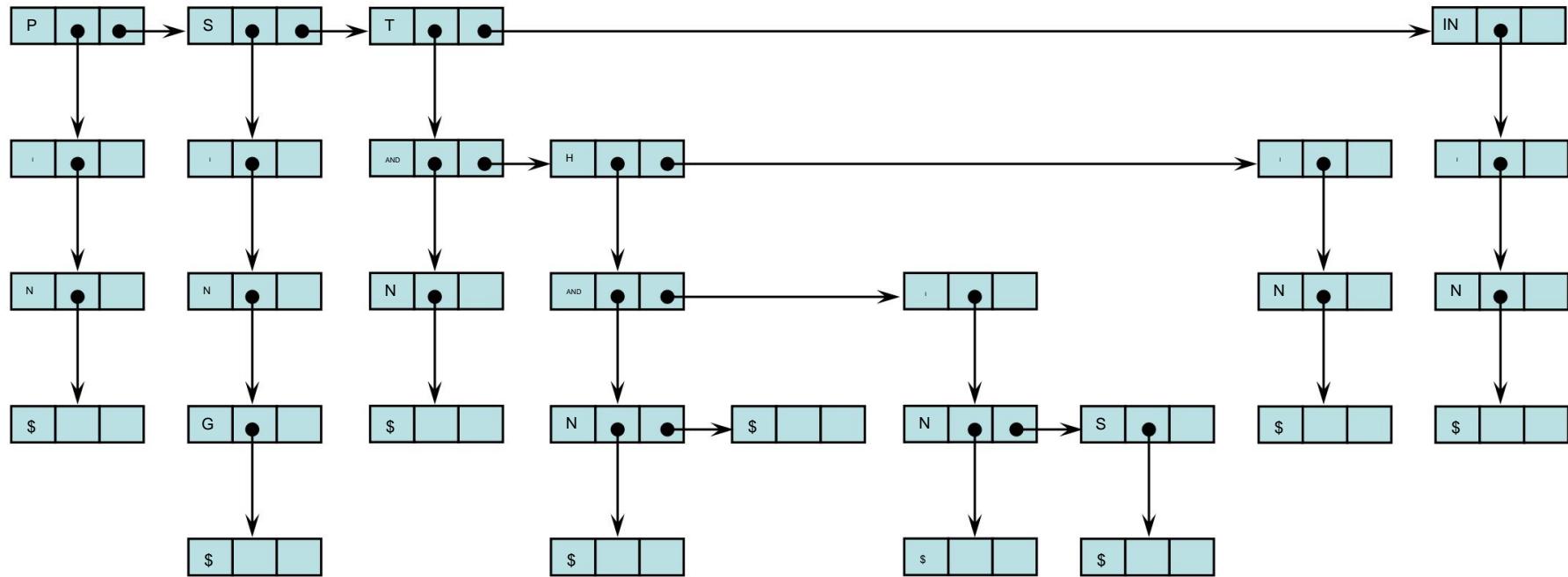
# from Briandais Trie

## List representation of a trie

instead of the tables in the linear list node

Node consists of 2 child components

Next value - next level



# Sort Analysis

Data management

Insert and delete supported

Structure of the trie independent of the insertion order

Amount of data  
unlimited

Models

Main memory oriented

Support complex operations

Range queries, sort order

Duration

Storage space	$O(n)$
access	$O(\log n)$
Insert	$O(\log n)$
Delete	$O(\log n)$
Sorting order	$O(n)$

For the exact calculation, the base of the logarithm depends. on the cardinality of the character set, e.g. 26 (upper case letters), 2 (bit strings)

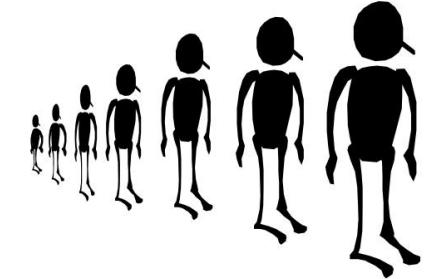
# 5.8 Priority Queues

Data structure for repeating

Find and remove the element

with the smallest (or largest)

Key value from a lot of applications



Simulation systems (key values represent execution times of events)

Process management (priorities of the processes)

Numerical calculations (key values correspond to the calculation errors, with the big ones being eliminated first)

Basis for a number of complex algorithms (graph theory, Filekompression, etc.)

Note: In the following we only consider priority queues that have the Support access to the smallest elements

# The operation

Construct

Creating an empty priority queue

IsEmpty

Query for empty priority queue

Insert

Inserting an element

FindMinimum

Returning the smallest element

DeleteMinimum

Delete the smallest element

# Implementation approaches

## Unordered list

Elements are entered into the list arbitrarily (cost  $O(1)$ ).

When accessing or deleting the 'smallest' element, the list must effort  $\ddot{y} O(n)$ .

## Ordered list

Elements are entered in the order of their size (effort  $O(n)$ ).

Access or deletion constant effort  $\ddot{y} O(1)$

## Problem

Effort  $O(n)$  difficult to avoid.



# Priority queue as a tree structure

## Balanced key trees

Insertion in the balanced key tree requires  $O(\log n)$  effort

Realize access by following the leftmost path in the tree (to the smallest element)  $\Rightarrow$  effort  $O(\log n)$

## Cheapest implementation via

unordered, complete key trees

with the property that for all nodes the key values of their Successors are larger (or smaller).

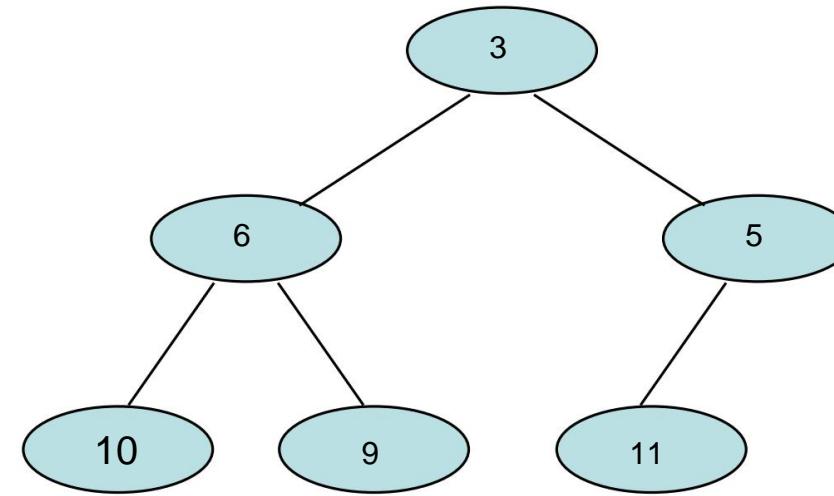




## 5.8.1 Heap

set of values

3 6 5 10 9 11



Heap

Unordered, binary, complete key tree

Value of each node is less than (larger) or equal to the values of its successor nodes

Root contains smallest (largest) element

Arrangement of the subtrees in relation to their root undefined (unordered Baum)

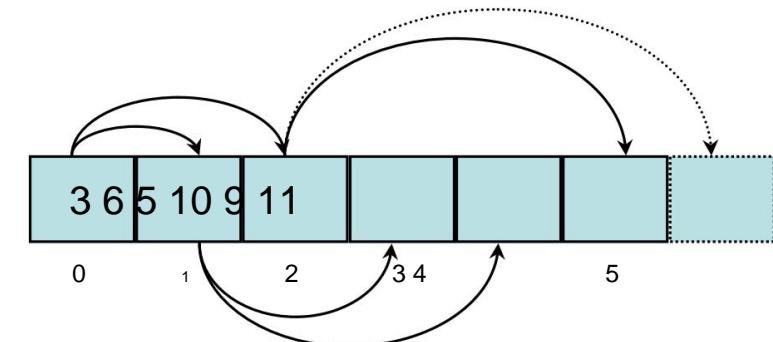
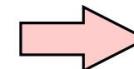
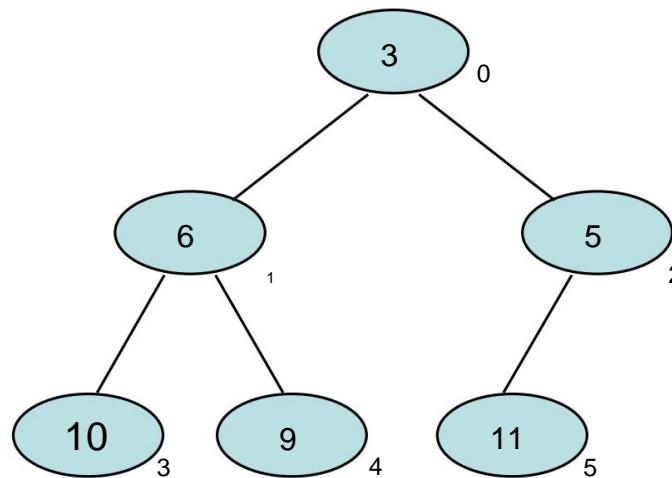
# Heap data structure

Realization of a heap efficiently through a field

The n key values of the heap can be interpreted as a sequence of elements  $x_0, x_1, x_2, \dots, x_{n-1}$ , where the position of each node value in the field is determined by the following rule:

Root in position 0, the children of node i are stored at position  $2i+1$  and  $2i+2$ .

Example

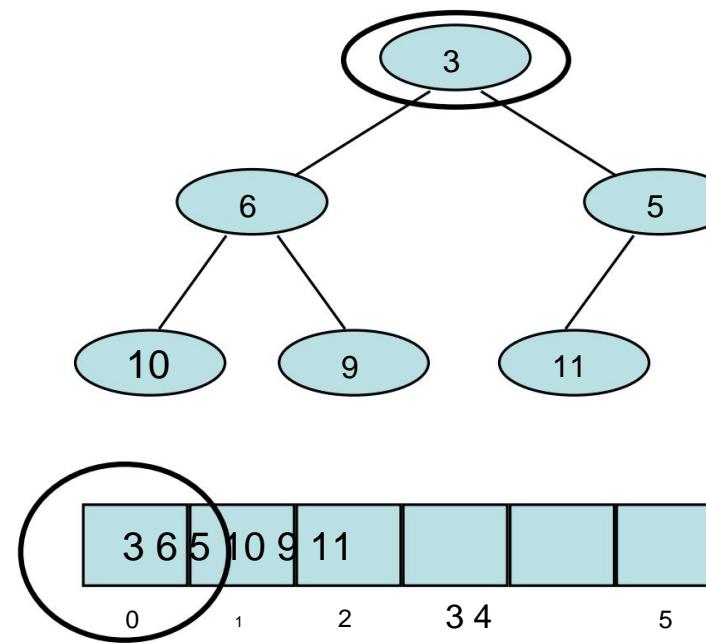




## access

Accessing the smallest element with constant effort:  $O(1)$

ÿ Root = first element in the field.



# Class Priority Queue

```
class PQ {  
    int *a, N;  
  
public:  
    PQ(int max) { a = new int[max]; N = -1; }  
    ~PQ() { delete[] a; }  
  
    int FindMinimum(){ return a[0]; }  
    int IsEmpty() { return (N == -1); } void Insert(int); int  
    DeleteMinimum();  
  
    ...  
};
```

# Insert into a heap

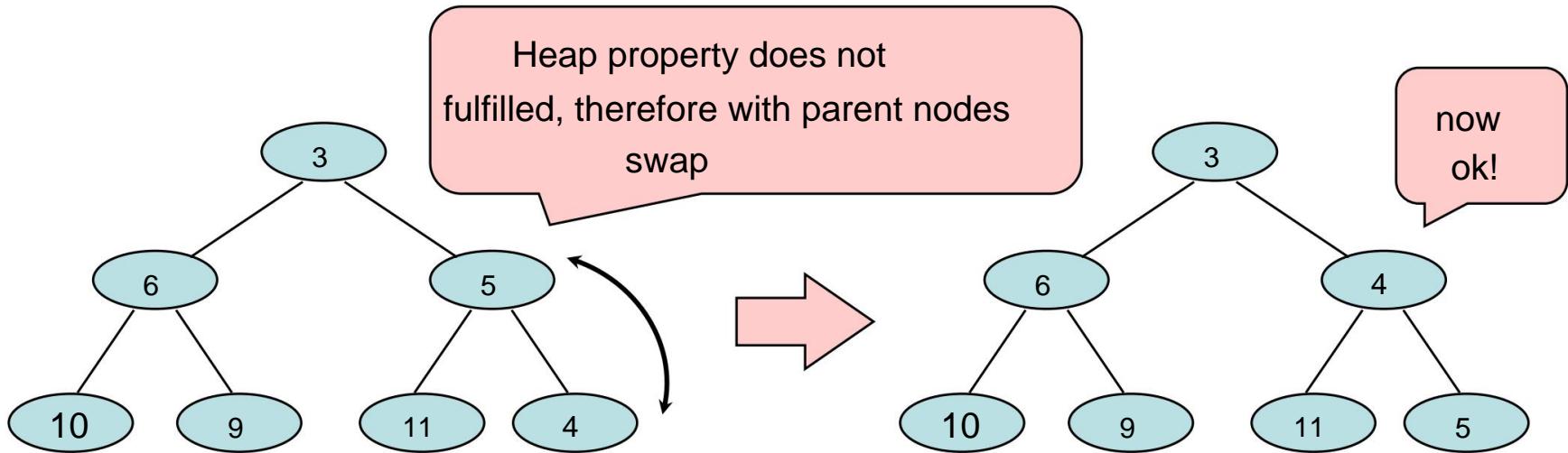
Enter new element at the last position in the field

Check whether the heap property is fulfilled

If not, swap with parent node and repeat until fulfilled

Enter 4 (at the  
last position in the field)

Effort:  $O(\log n)$



# Method Insert

```
void PQ::Insert(int v) {  
    int child, parent; a[++N] =  
    v;  
    child = N;  
    parent = (child - 1)/2; while(child !=  
    parent) {  
        if(a[parent] > a[child]) {  
            swap(a[parent], a[child]); child =  
            parent; parent =  
            (parent - 1)/2; } else break; // to stop  
        the loop  
    }  
}
```

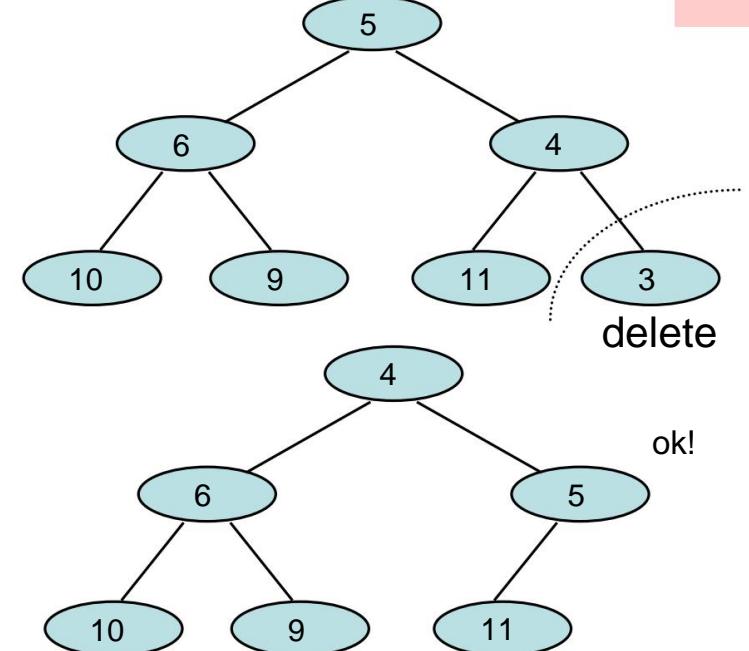
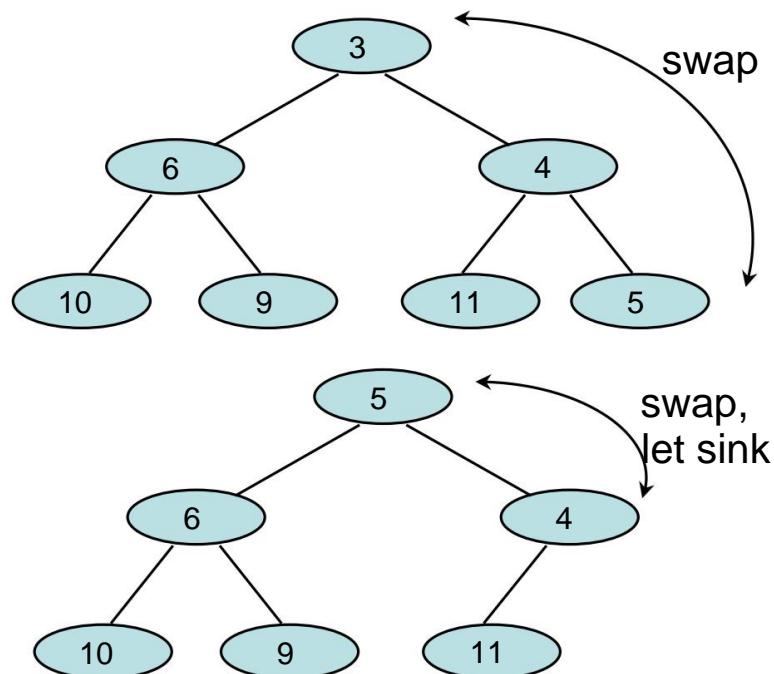


# Delete from a heap

Swap root with rightmost leaf node, this one

Delete leaf node, let root sink into the tree ( swap with smaller child node) until Heap property applies.

Effort:  $O(\log n)$



# Method DeleteMinimum

```
int PQ::DeleteMinimum() {  
    int parent = 0, child = 1; int v = a[0];  
    a[0] = a[N];  
  
    N--;  
    while(child <= N) { if(a[child]  
        > a[child+1]) child++; if(a[child] < a[parent]) {  
  
            swap(a[parent], a[child]); parent =  
            child; child = 2*child  
            + 1; } else break; // to stop  
            the loop  
    }  
    } return v;  
}
```

# Analyse Heap

Data management

Insert and delete supported

Amount of data

unlimited

Models

Main memory oriented

Just simple operations

Duration

Storage space	$O(n)$
Access (minimum/maximum)	$O(1)$
Insert	$O(\log n)$
Delete	$O(\log n)$

The heap provides an efficient basic data structure for many others based on it data structures



# Heaps und Heaps

Please differentiate! The term heap is used in computer science to describe various concepts

Heap as a data structure for storing priority queues

Heap as a memory area for managing dynamically allocated memory areas (managed by the user).

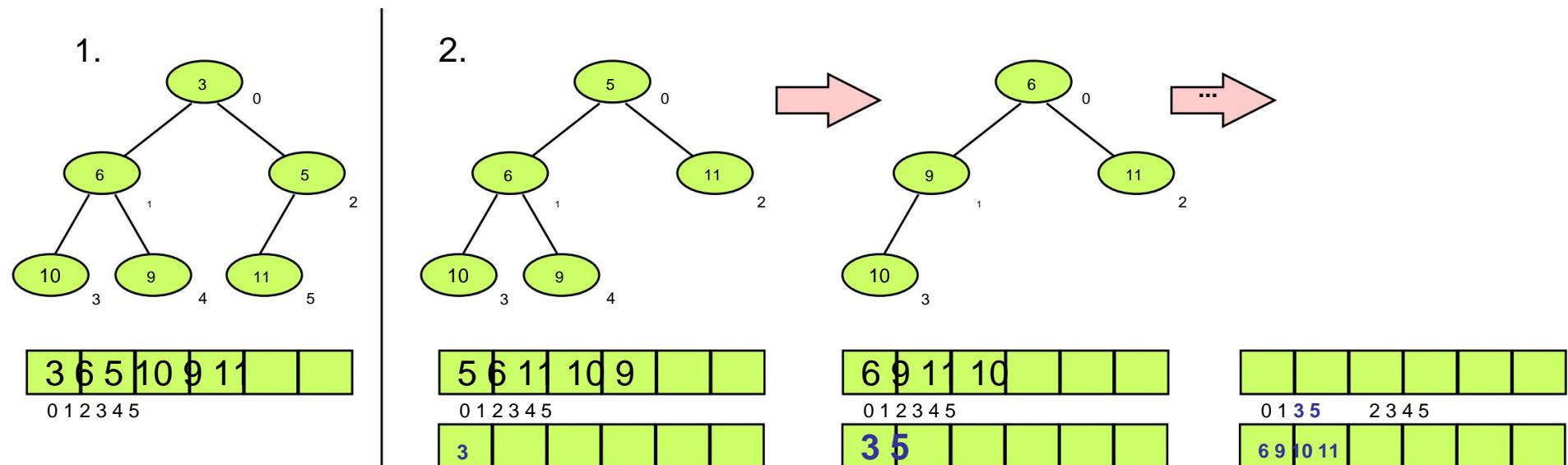
Heap as a form of storage in databases



## 5.8.2 Heapsort

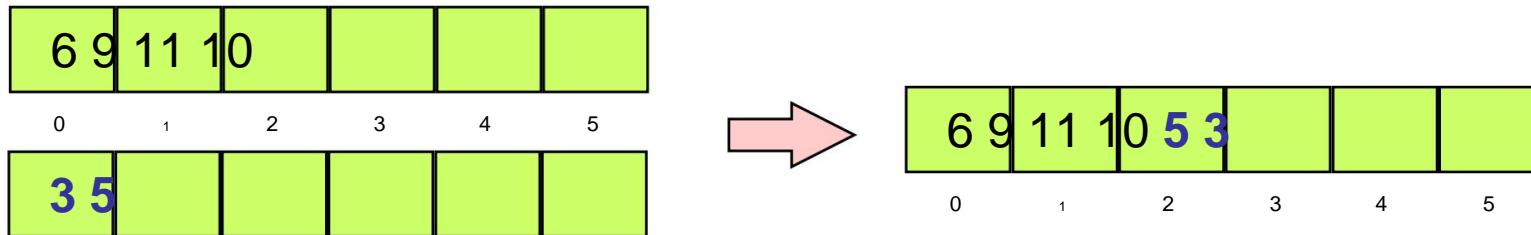
A heap (priority queue) can form the basis for sorting (Williams 1964):

1. Insert one element at a time into a heap
2. the smallest or largest element is successively removed  
the elements are delivered in ascending or descending order

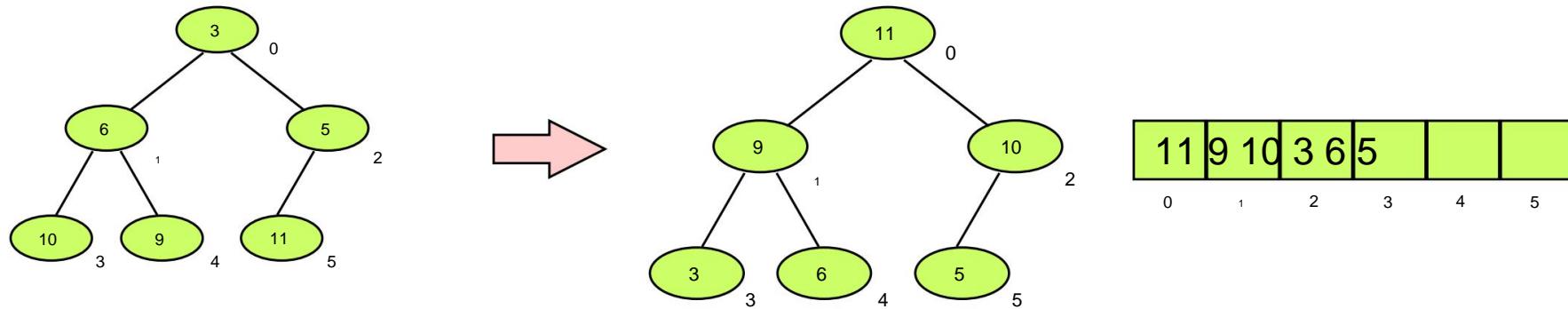


# Heapsort (modified approach)

Combining the two arrays, avoiding duplicate storage space



Flip heap property: Value of each node is greater than or equal to the values of its children nodes



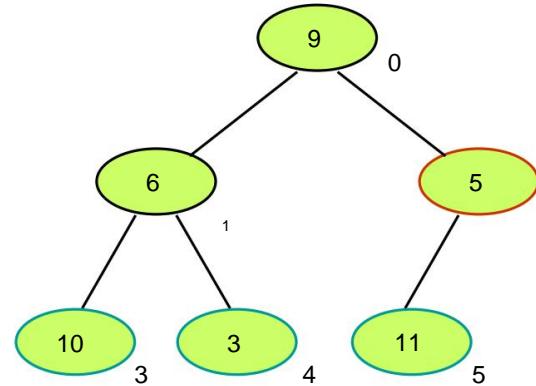


# Example: buildheap

set of values

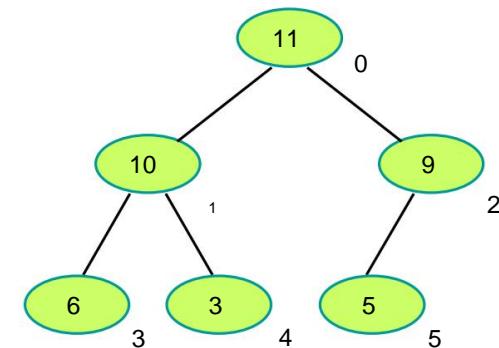
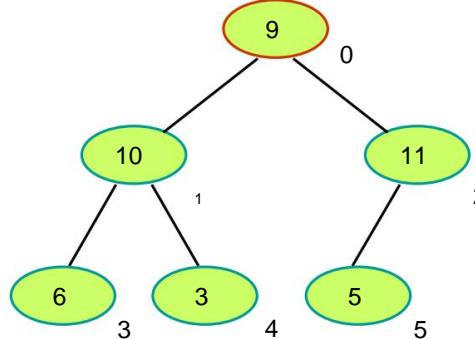
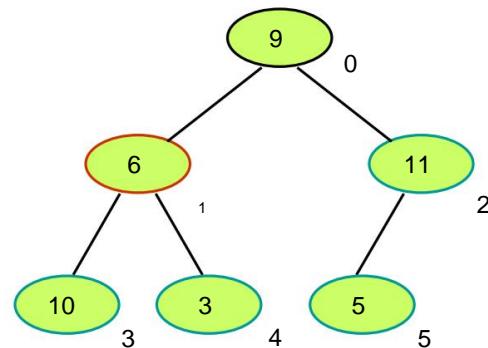
9 6 5 10 3 11

9	6	5	10	3	11
0	1	2	3	4	5



Idea: Heap property generate; for leaf nodes trivially fulfilled

No. 2 first to be examined  
 Knot, 11 does not fit, in  
 let tree sink, ie  
 Swap 5 for 11



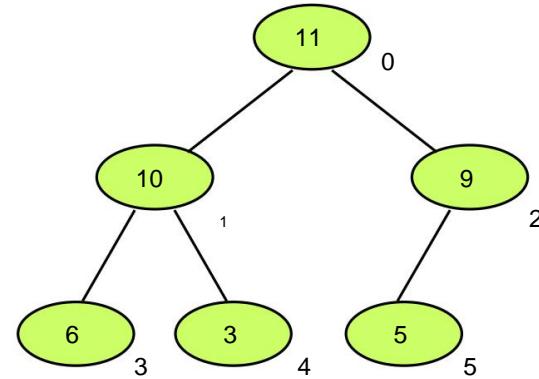
Value 6 (No. 1) does not fit,  
 drop into subtree, ie  
 with larger the successor  
 swap, i.e. 6 with 10

No. 0 (9) sink into tree. Heap property fulfilled!

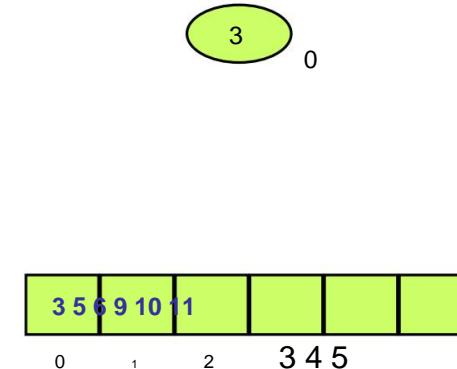
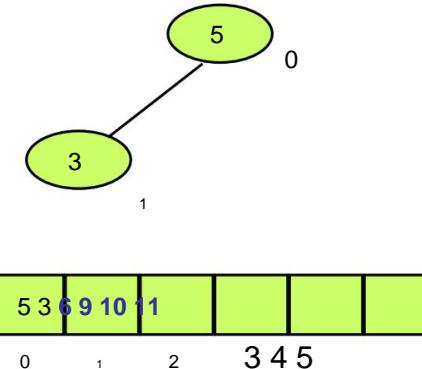
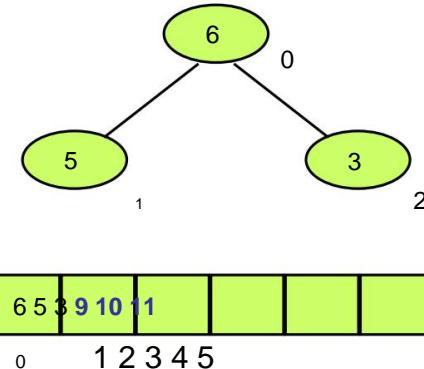
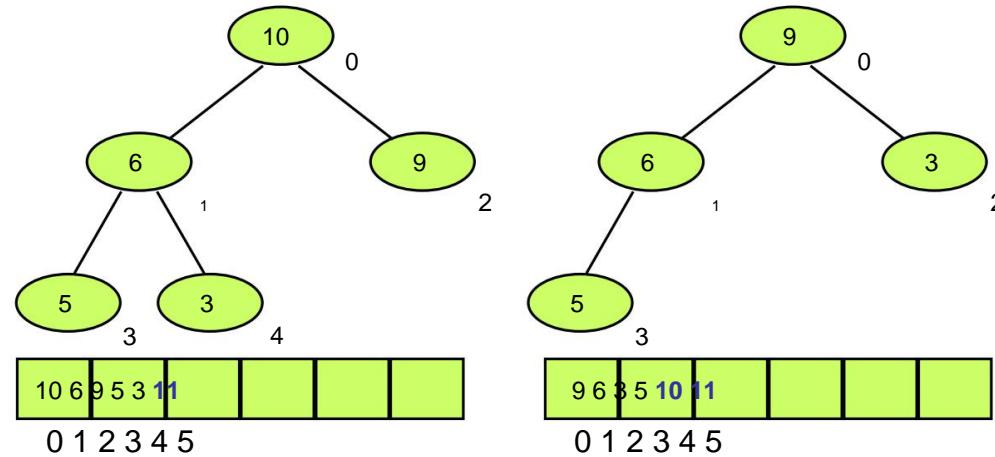
11	10	9	6	3	5
0	1	2	3	4	5



# Example: heapsort



Idea: “Delete” the maximum and save it in the space that becomes free



# Heapsort algorithm (1)

```
void Vector::Heapsort() {  
    int heapsize = Length();  
    BuildMaxheap();  
    for(int i = Length()-1; i >= 1; i--) { swap(a[0], a[i]);  
        heapsize--; heapify(0,  
        heapsize);  
    }  
}  
  
void Vector::BuildMaxheap() { for(int i =  
Length()/2 - 1; i >= 0; i--)  
    heapify(i, Length());  
}
```

# Heapsort algorithm (2)

```
void Vector::heapify(int i, int heapsize) {  
    int left = 2*i + 1; int right =  
    2*i + 2; int largest; if (left <  
    heapsize &&  
    a[left] > a[i]) largest = left;  
  
    else  
        largest = i; if  
(right < heapsize && a[right] > a[largest])  
        largest = right; if  
(largest != i) { swap(a[i],  
        a[largest]); heapify(largest,  
        heapsize);  
    }  
}
```

# Properties of the complex Proceedings

## Quicksort

Degeneracy to  $O(n^2)$  possible

Choice of pivot element!

## Merge sort

always runs time  $O(n * \log(n))$

twice the storage space required

## Heapsort

none of the above

disadvantages but higher constant effort

# What do we take with us?

## Tree structures

Notation

spec. Properties, from  $O(n)$  to  $O(\log n)$

## Search trees

Binary search trees

AVL trees

2-3-4 trees

B+ tree

Balancing

## Trie

## Priority Queues

Heap