

02393 Programming in C++ Module 11

Recursive Data-Structures: Trees

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Lecture Plan

#	Date	Topic
1	29.8.	Introduction
2	5.9.	Basic C++
3	12.9.	Data Types, Pointers Libraries and Interfaces; Containers
4	19.9.	
5	26.9.	
6	3.10.	Classes and Objects I
7	10.10.	Classes and Objects II
		<i>Efterårsferie</i>
8	24.10.	Classes and Objects III
9	31.10.	Recursive Programming
10	7.11.	Lists
11	14.11.	Trees
12	21.11.	Novel C++ features
13	28.11.	Summary
	5.12.	Exam

Vector vs. Lists

Recursive data-structures

```
struct listnode{  
    int content; // for an integer list  
    listnode *next;  
};
```

Vector List

Iterative Access

Random Access

Insert/Delete

Insert/Delete at end

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Vector vs. Lists

Recursive data-structures

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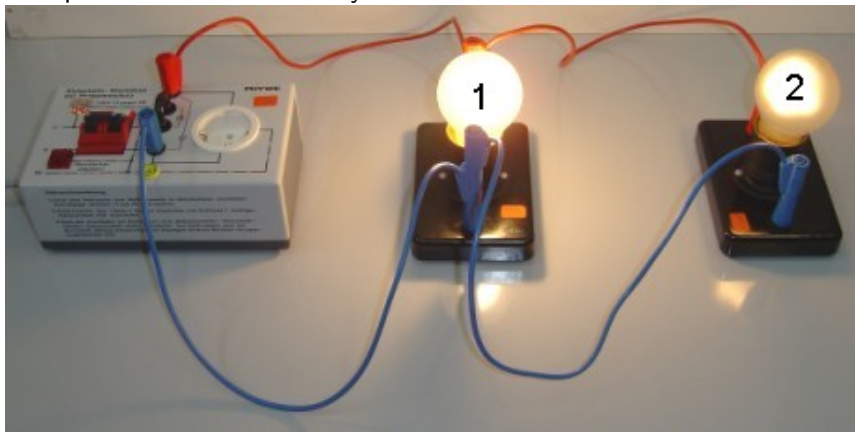
Think Big

- Don't focus on little optimizations.
- Think about $O(\cdot)$ runtime for large inputs.
- Do you expect such large inputs to happen in practice?
- Use profiling: which are the routines your program spends most time in?

Doubly-linked Lists

Some annoyances of single-linked lists: delete a pointed element, concatenate two lists, etc.

One possible solution: doubly-linked lists



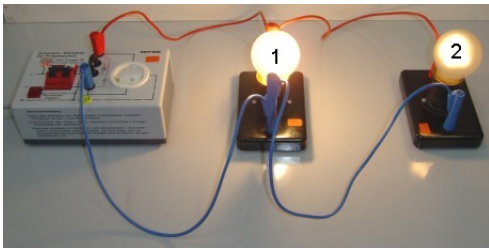
Doubly-Linked Lists

Recursive Definition

```
struct Node{  
    int content;  
    Node *prev;  
    Node *next;  
}
```

A **Node** has some content and points to two **Nodes**: the previous one and the next one in the list.

Double Linked Lists



Implementation

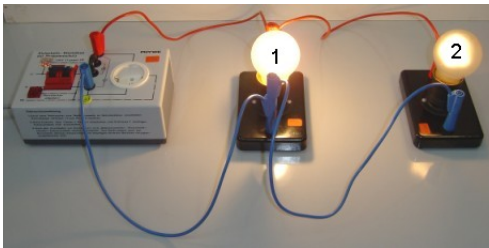
Insert head

Concat

Reverse

Concatenation by connecting the tail
of one list with head of other list.

Double Linked Lists



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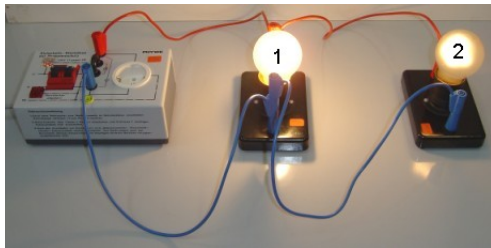
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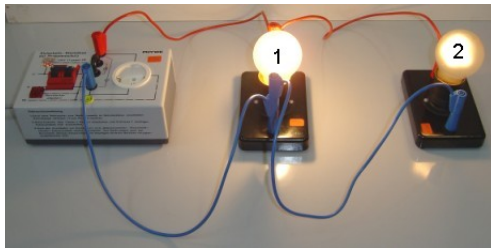
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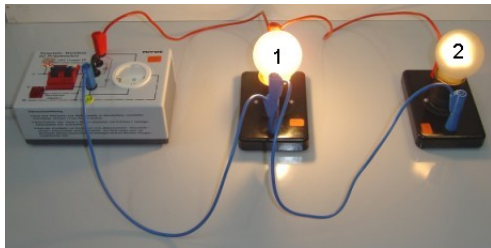
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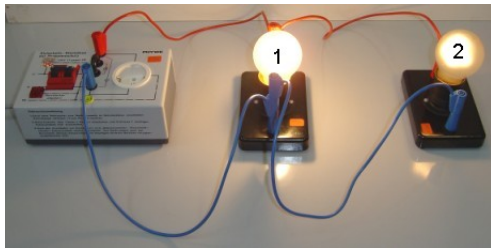
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Double Linked Lists



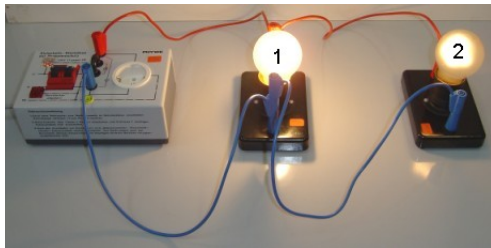
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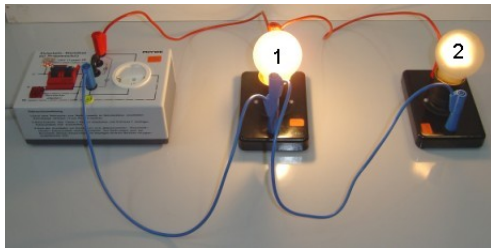
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Possible?	$O(1)$	$O(1)$	$O(1)$

Recursive Data-Structures

Example: Binary tree of integers

Recursive Definition

```
struct Node{  
    int content;  
    Node *left;  
    Node *right;  
}
```

Review: The Map ADT

English-Danish Dictionary

red	rød
green	grøn
blue	blå
yellow	gul
...	

What data structure to use?

<i>Data Structure</i>	<i>lookup</i>	<i>insert/delete</i>
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unsorted array (Mod. 6)		

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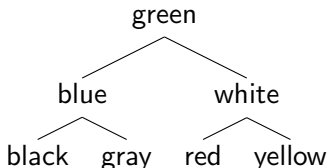
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Map as a Tree

Organize the keys of a dictionary in a binary search tree:



- Binary search tree:
 - ★ Every node is larger than all nodes in the left subtree
 - ★ ...and smaller than all nodes in the right subtree
- Mirrors what binary search does: split search space in half in each step of the space—if tree is balanced.
- The tree is dynamic: can easily grow and shrink (adding and removing entries).

Liveprogramming: A Binary Search Tree in C++

Reimplementation of the Map class from Module 6

Class of Trees

Another possible recursive definition of trees

```
class Tree{  
public:  
...  
private:  
    bool empty;  
    int content;  
    Tree *left;  
    Tree *right;  
}
```

Here a flag `empty` is used to denote empty trees. Every tree (node) will be a class. We will use this representation in the examples.

Class of Trees: Methods

Most methods we need to implement can be implemented using recursion.

Consider, for example, the size of a tree. A recursive formulation could be based on the idea that:

- the size of an empty tree is 0;
- the size of a non empty tree is 1 (for the root node) plus the size of its sub-trees

All other methods that we will see can exploit the recursive structure of trees.

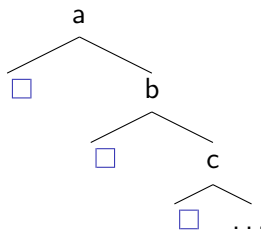
Some of them are not easy to implement without recursion.

Balance

- Scenario: start with empty binary search tree, and insert nodes with increasing keys, e.g. a, b, c, \dots

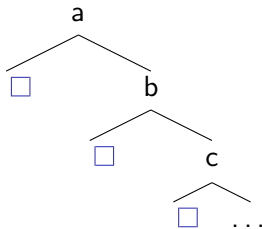
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- The resulting tree is very **unbalanced** (\square written for nil-pointers):

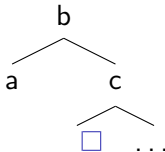


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- AVL trees:** keep track of balance and perform re-arrangements:



Review: Sorting

Sorting Algorithms

	Time		Space
	average	worst-case	
Bubble sort			
Merge sort			
Quick sort			
...			
Theoretical Optimum			

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...			

Theoretical Optimum

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...			
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- Again $O(n \log n)$ for the entire sorting.