

# Algorithms and datastructures II

## Lecture 6: circuit complexity 2/2

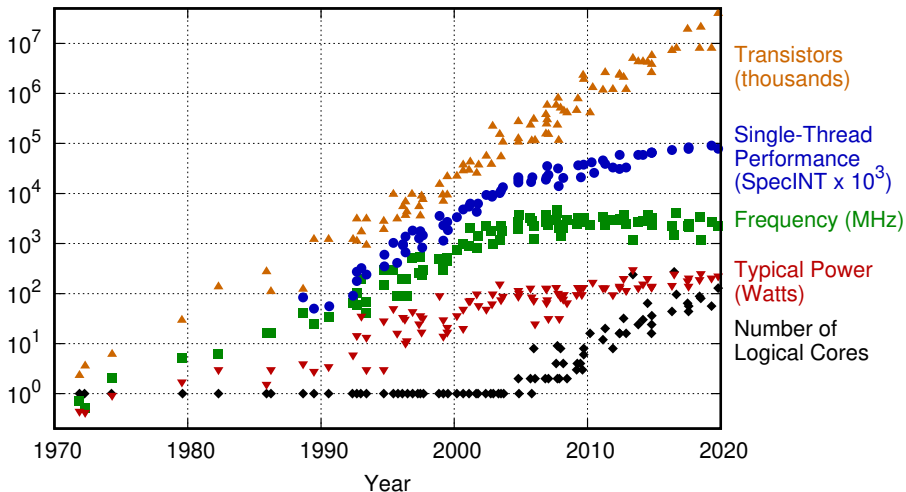
Jan Hubička

Department of Applied Mathematics  
Charles University  
Prague

Nov 9 2020

# Parallel computing

## 48 Years of Microprocessor Trend Data



Original data up to the year 2010 collected and plotted by M. Horowitz, F. Labonte, O. Shacham, K. Olukotun, L. Hammond, and C. Batten  
New plot and data collected for 2010-2019 by K. Rupp

# Computational model

## Definition (Circuit)

**Circuit** is defined by:

- ① Alphabet  $\Sigma$ .
- ② Pairwise disjoint set of vertices  $I$  (input),  $O$  (output) and  $H$  (gate).
- ③ Acyclic directed multi-graph  $(V, E)$  with  $E = I \cup O \cup H$ .
- ④ Mapping  $F$  which assign every gate  $g \in H$  of arity  $a(g)$  a function  $F(g) : \Sigma^{a(g)} \rightarrow \Sigma$ .
- ⑤ Mapping  $z : E \rightarrow \mathbb{N}$  which maps every edge to a gate to index which argument it represents.

Satisfying:

- ① In-degree of vertices in  $I$  is 0.
- ② In-degree of vertices in  $O$  is 1 and out-degree is 0.
- ③ In-degree of every gate corresponds to its arity. Out-degree of every gate is at least 1.
- ④ Every input of every gate is assigned.

# Computational model: computation

## Definition (Computation)

**Computation** happens in steps (clocks):

- ① step 0: All inputs and constants gets assigned value.
- ② step  $i + 1$ : Assign value to all gates and outputs for which all inputs are determined at step  $i$ .

Computation ends once all vertices have value assigned.

## Definition (Layer)

**Layer**  $i$  consist of all vertices whose value is determined in step  $i$ .

Layer is also maximal distance from some input.

## Definition (Time complexity)

**Time** of the computation of a given circuit is determined by the number of layers.

## Definition (Space complexity)

**Space** of the computation is determined by the number of gates in the circuit.

# Computational model: program

## Definition (Program)

**Program** is a sequence of circuits for individual sizes of inputs.

Remarks:

- ① It is necessary to restrict types of allowed gates (or their arity) and  $\Sigma$ . Otherwise every problem can be solved by a single gate.
- ② Typically we want network for a given size to be generated by an effective non-parallel algorithm.

We will typically consider boolean circuits where  $\Sigma = \{0, 1\}$  and arity is at most 2.

# Comparator networks: An example

$\Sigma$  consists of values being sorted.

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Example: Bubble sort

Example: Insert sort



# Bitonic sorting, 1968



Ken Batcher

# Bitonic sequences

## Definition (Purely bitonic sequence)

Sequence  $x_0, x_1, \dots, x_{n-1}$  is **purely bitonic** if it can be split at some position  $k$  such that  $x_0, x_1, \dots, x_k$  is growing and  $x_k, x_{k+1}, \dots, x_{n-1}$  is decreasing.

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## Definition (Bitonic sequence)

Sequence is **bitonic** if it is created as a rotation of a purely bitonic sequence.

# Bitonic comparator

## Definition (Bitonic separator)

An **separator** of degree  $n$  is a comparator network  $S_n$  with inputs  $x_0, x_1, \dots, x_{n-1}$  and outputs  $y_0, y_1, \dots, y_{n-1}$ . If it is given a bitonic sequence it produces its permutation with the following properties:

- 1  $y_0, y_1, \dots, y_{n/2-1}$  and  $y_{n/2}, y_{n/2+1}, \dots, y_{n-1}$  are bitonic sequences;
- 2  $y_i < y_j$  whenever  $0 \leq i < n/2 \leq j < n$ .

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## Lemma (On separators)

*For every  $n$  there exists a separator  $S_n$  of constant depth with  $\Theta(n)$  comparators.*

Will show this later

# Bitonic sorter

## Definition (Bitonic sorter)

**Bitonic sorter** of degree  $n$  is a comparator network  $B_n$  with  $n$  inputs and  $n$  outputs which sorts every bitonic sequence of length  $n$ .

## Lemma (On bitonic sorter)

*For every  $n = 2^k$  there exists a bitonic of depth  $\Theta(\log n)$  and with  $\Theta(n \log n)$  comparators.*

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# Merge

## Definition (Merging network)

**Merging network** of degree  $n$  is a comparator network  $M_n$  with  $2n$  inputs and  $2n$  outputs. Given two sorted sequences on input it merges them to output.

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We need  $\log n$  layers of merging networks. Network on layer  $i$  has depth  $i$ .

$$\Theta(1 + 2 + 3 + \cdots + \log n) = \Theta(\log_n^2)$$

.

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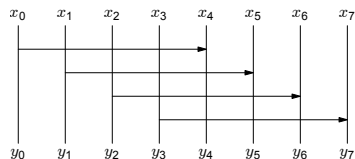
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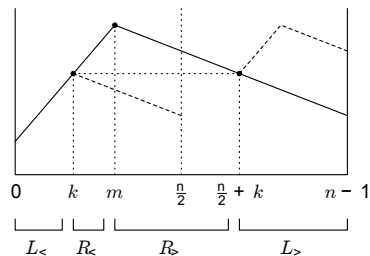
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## Observation

Separator works on purely bitonic sequences.



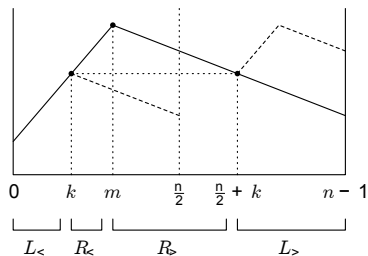
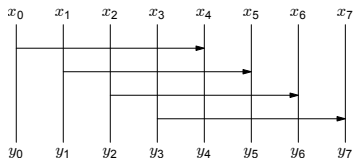
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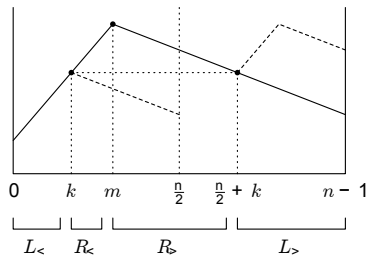
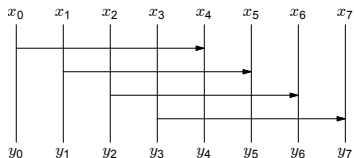


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- ② Let  $k = \min\{i : x_i > x_{n/2+i}\}$ .
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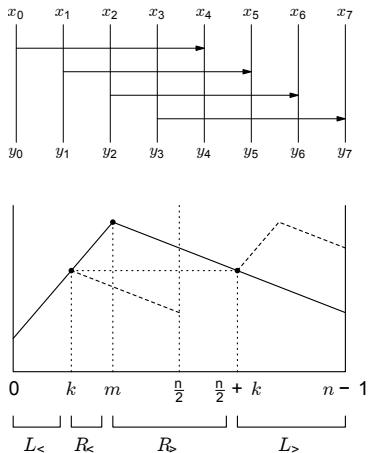
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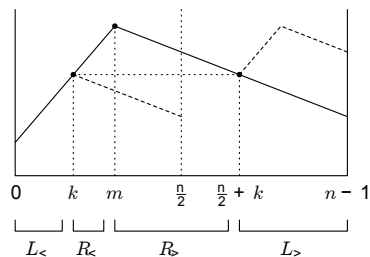
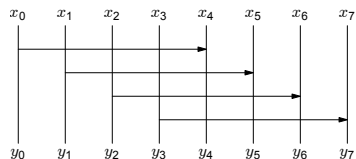
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- 4 Left subsequence is increasing sequence  $x_0, \dots, x_{k-1}$  merged with decreasing sequence  $x_{n/2+k}, \dots, x_{n-1}$ .
- 5 Right subsequence is decreasing sequence  $x_{n/2}, \dots, x_{n/2+k-1}$  merge with increasing sequence  $x_k, \dots, x_{m-1}$  and decreasing sequence  $x_m, \dots, x_{n/2} - 1$ .

Observe that both sequences are bitonic

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It remains to check that left sequence is smaller than right.

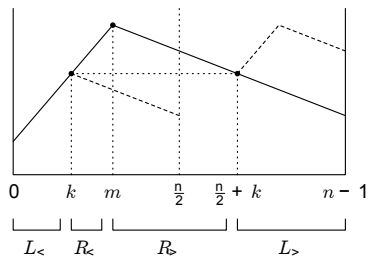
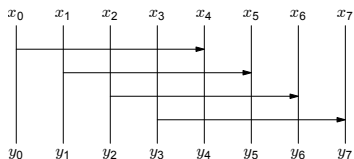
Put:

- ①  $L_< = (x_0, \dots, x_{k-1})$
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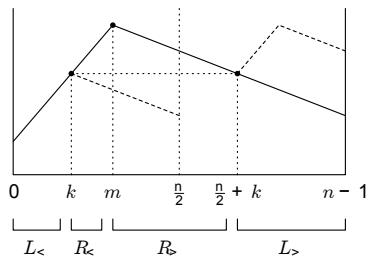
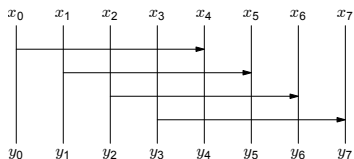
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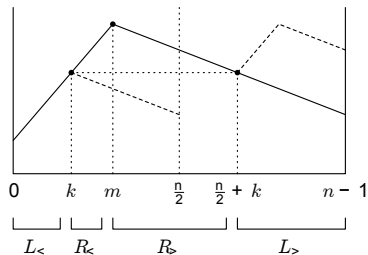
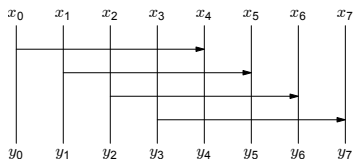
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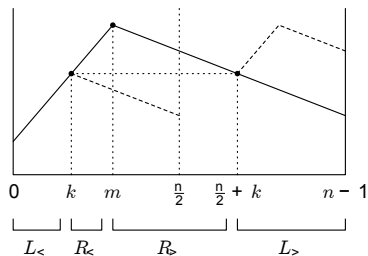
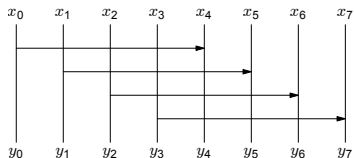
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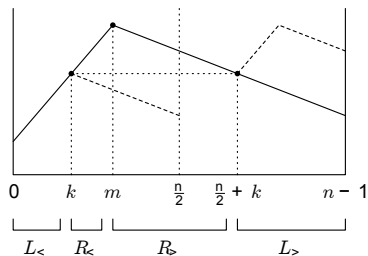
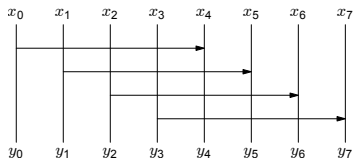
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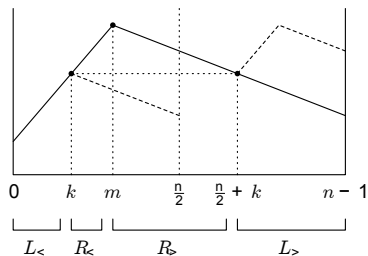
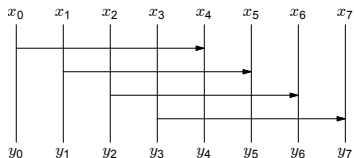
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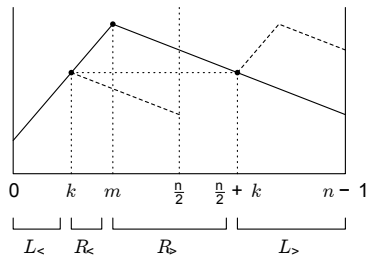
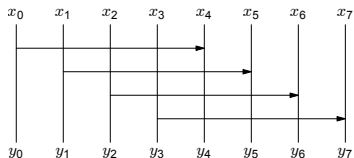
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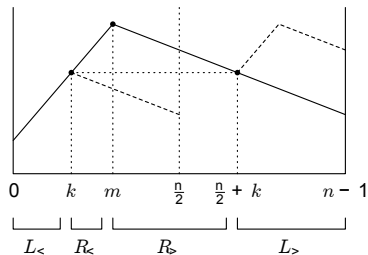
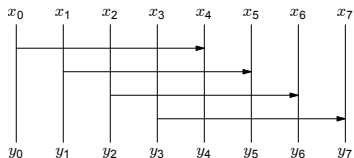
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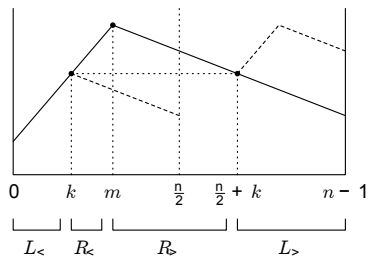
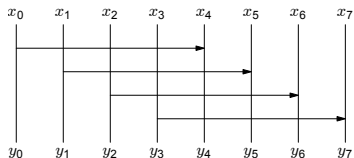
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Lemma (On separators)

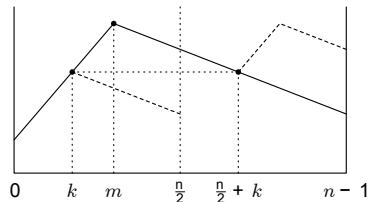
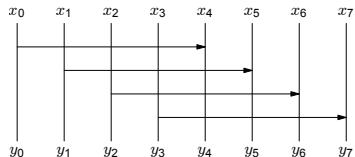
*For every  $n$  there exists a separator  $S_n$  of a constant depth with  $\Theta(n)$  comparators.*

# Bitonic separators

## Lemma (On separators)

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We proved Lemma for purely bitonic sequences. To see that separator works on bitonic sequence observe that it is symmetric for rotation. If input sequence is rotated by  $r$  to right, still same values are compared. Output bitonic sequences will also be rotated by  $r$ .



# Bitonic separators: alternative proof

## Lemma (On separators)

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## Lemma

*If a comparison network transforms the input sequence  $x_0, \dots, x_{n-1}$  into the output sequence  $y_0, \dots, y_{n-1}$ , then for any nondecreasing function  $f$ , the network transforms the input sequence  $f(x_0), \dots, f(x_{n-1})$  into the output sequence  $f(y_0), \dots, f(y_{n-1})$ .*

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If a sorting network works correctly when each input is drawn from the set  $\{0, 1\}$ , then it works correctly on arbitrary input numbers.

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## Observation

$\{0, 1\}$ -sequence is **bitonic** if it contains at most two changes between 0 and 1.



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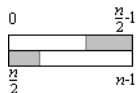
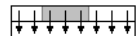
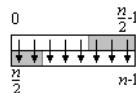
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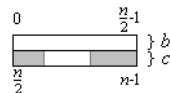
## Observation

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Initial situation

Application of  
comparator network

Result



# Bitonic sort

