

# Sorting networks

Lecture 20

November 4, 2014

# Model of Computation

- 1 Q: Perform a computational task considerably faster by using a different architecture? *Yep.*
- 2 *Spaghetti sort!*

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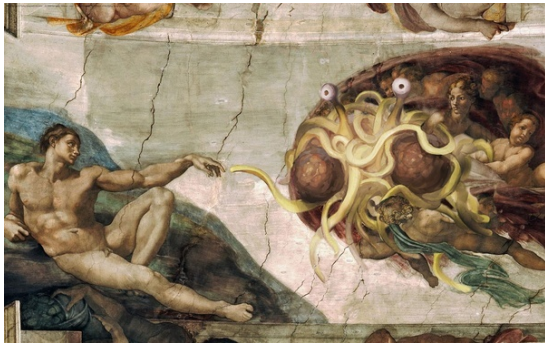
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# Spaghetti



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Pastafarianism

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The spaghetti tree hoax was a three-minute hoax report broadcast on April Fools' Day 1957 by the BBC current-affairs programme Panorama, purportedly showing a family in southern Switzerland harvesting spaghetti from the family "spaghetti tree". At the time spaghetti was relatively little-known in the UK, so that many Britons were unaware that spaghetti is made from wheat flour and water; a number of viewers afterwards contacted the BBC for advice on growing their own spaghetti trees. Decades later CNN called this broadcast "the biggest hoax that any reputable news establishment ever pulled."

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- 2 Have much Spaghetti (this are longish and very narrow tubes of pasta).
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- 4 take all these pieces of pasta in your hand..
- 5 make them stand up vertically, with their bottom end lying on a horizontal surface
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- ➋ allowed new “strange” operations  
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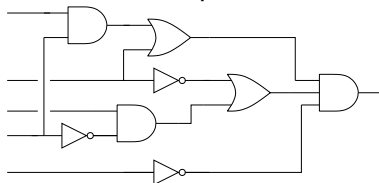
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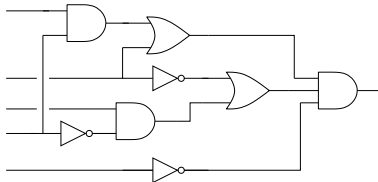
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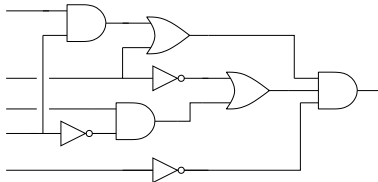


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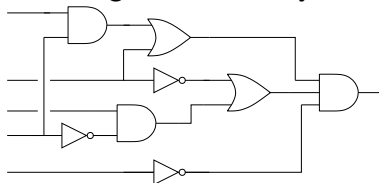


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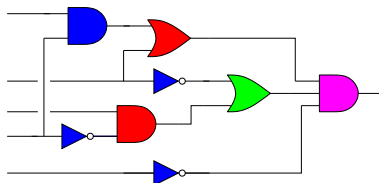
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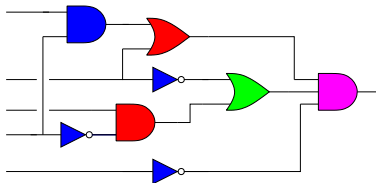
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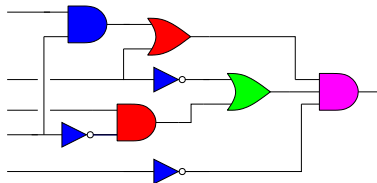
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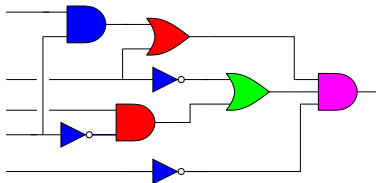
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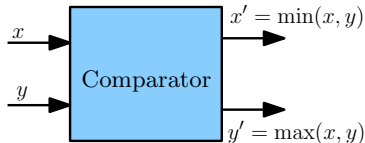


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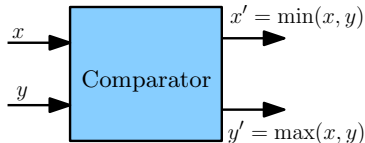
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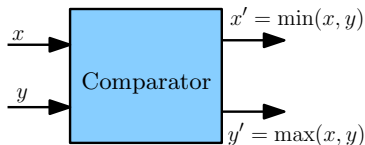


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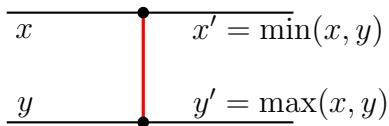


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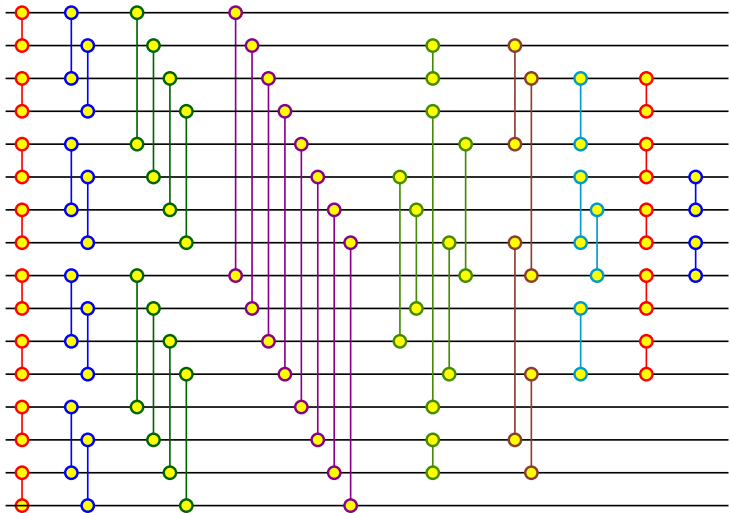
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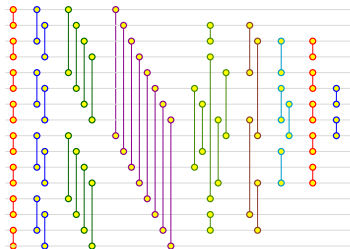


# Sorting network - an example



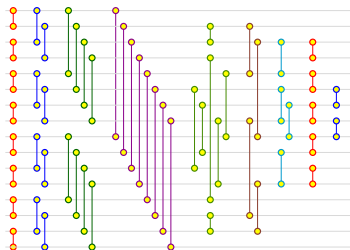
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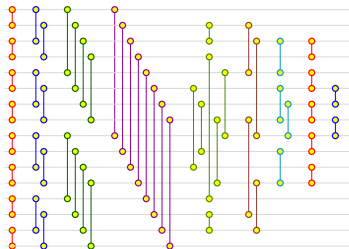
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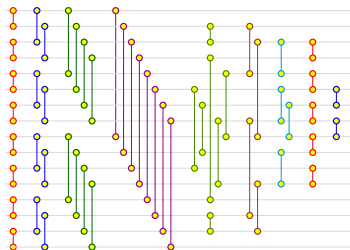
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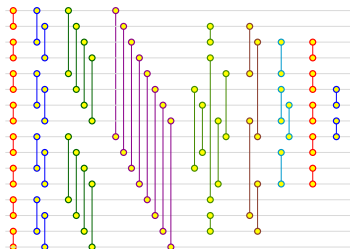
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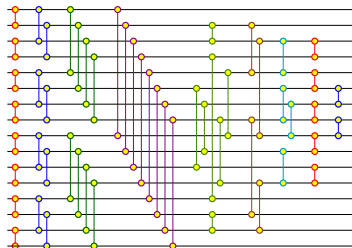
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# Definitions

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A **comparison network** is a DAG, with  $n$  inputs and  $n$  outputs, where each gate has two inputs and two outputs.

## Definition

**depth** of a wire is 0 at input. For gate with two inputs of depth  $d_1$  and  $d_2$  the depth on the output wire is  $1 + \max(d_1, d_2)$ .

**depth** of comparison network is maximum depth of an output wire.

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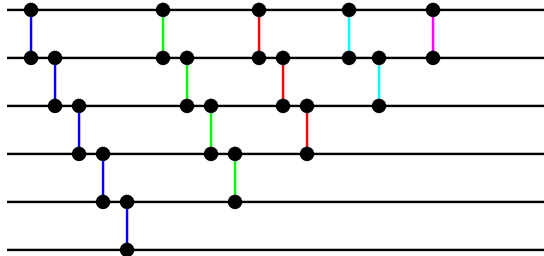
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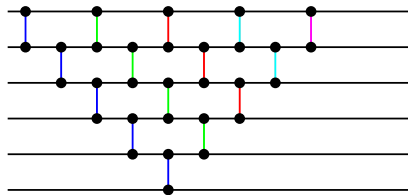
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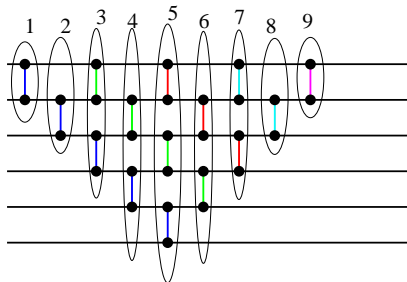
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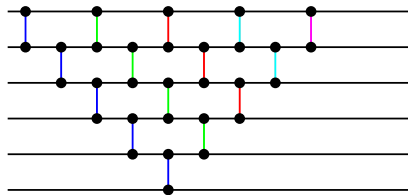


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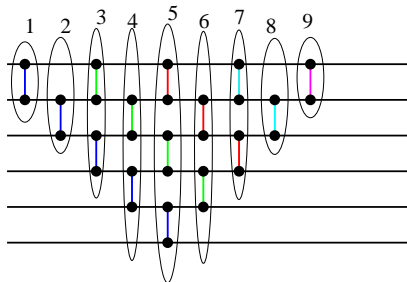
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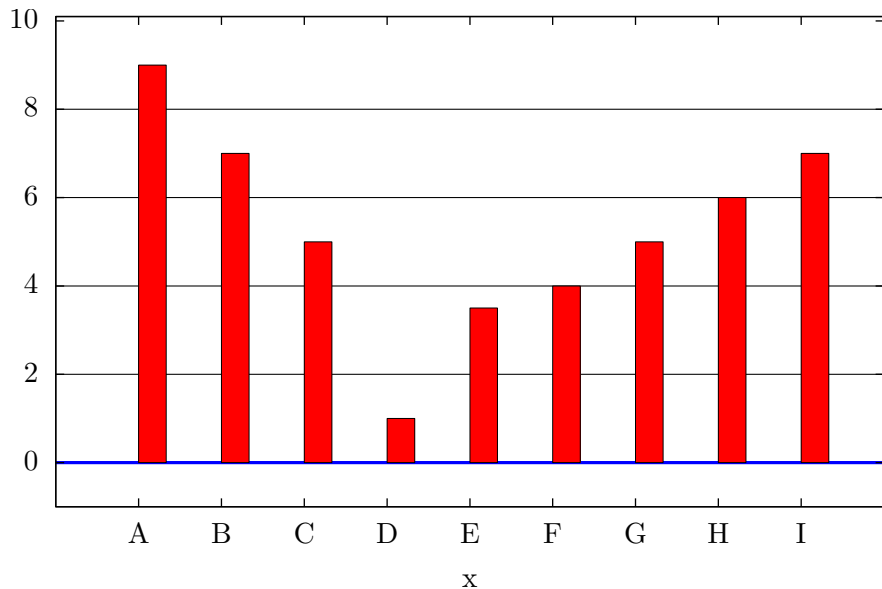


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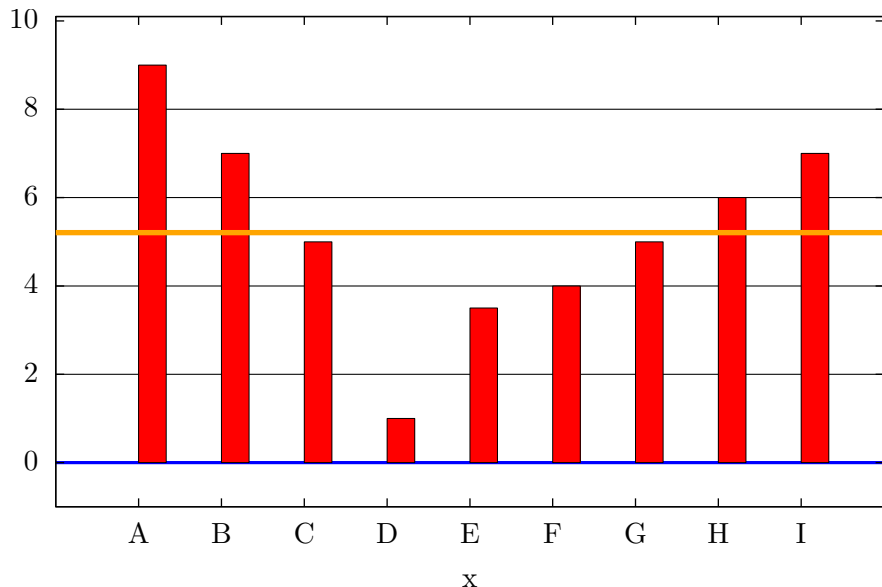
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# Converting a sequence into a binary sequence

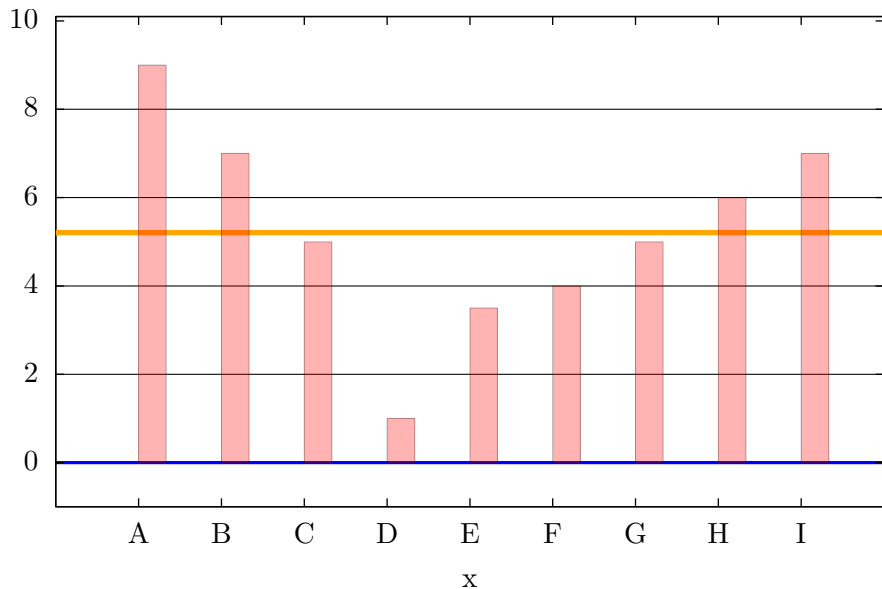




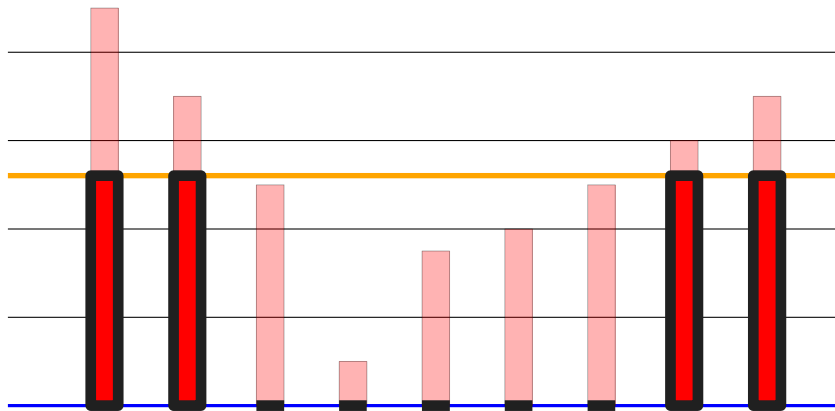
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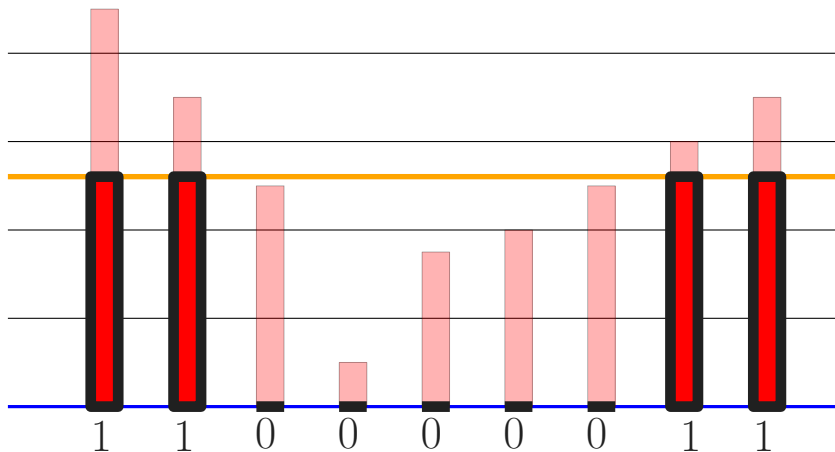
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# The Zero-One Principle

## Definition

**zero-one principle** states that if a comparison network sort correctly all binary inputs (*forall* inputs is 0 or 1) then it sorts correctly all inputs.

Need to prove the zero-one principle.

## Lemma

*A comparison network transforms input sequence*

$$a = \langle a_1, a_2, \dots, a_n \rangle \implies b = \langle b_1, b_2, \dots, b_n \rangle$$

*Then for any monotonically increasing function  $f$ , the network transforms*

$$f(a) = \langle f(a_1), \dots, f(a_n) \rangle \implies f(b) = \langle f(b_1), \dots, f(b_n) \rangle$$

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# Proof

- ① Induction on number of comparators.
- ② Consider a comparator with inputs  $x$  and  $y$ , and outputs  $x' = \min(x, y)$  and  $y' = \max(x, y)$ .
- ③ If  $f(x) = f(y)$  then the claim trivially holds.
- ④ If  $f(x) < f(y)$  then clearly

$$\begin{aligned}\max(f(x), f(y)) &= f(\max(x, y)) \text{ and} \\ \min(f(x), f(y)) &= f(\min(x, y)),\end{aligned}$$

since  $f(\cdot)$  is monotonically increasing.

- ⑤  $\langle x, y \rangle$ , for  $x < y$ , we have output  $\langle x, y \rangle$ .
- ⑥ Input:  $\langle f(x), f(y) \rangle \implies$  output is  $\langle f(x), f(y) \rangle$ .
- ⑦ Similarly, if  $x > y$ , the output is  $\langle y, x \rangle$ . In this case, for the input  $\langle f(x), f(y) \rangle$  the output is  $\langle f(y), f(x) \rangle$ . This establish the claim for a single comparator.



# Proof

- 1 Induction on number of comparators.
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- ⑤  $G$ : gate which this wire is an output of.
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# 0/1 sorting implies real sorting


## Theorem

*If a comparison network with  $n$  inputs sorts all  $2^n$  binary strings of length  $n$  correctly, then it sorts all sequences correctly.*


# Proof: 0/1 sorting implies real sorting

- ① Assume for contradiction that fails for input  $a_1, \dots, a_n$ . Let  $b_1, \dots, b_n$  be the output sequence for this input.
- ② Let  $a_i < a_k$  be the two numbers that are output in incorrect order (i.e.  $a_k$  appears before  $a_i$  in output).
- ③ 
$$f(x) = \begin{cases} 0 & x \leq a_i \\ 1 & x > a_i. \end{cases}$$
- ④ By lemma for input  $\langle f(a_1), \dots, f(a_n) \rangle$ , circuit would output  $\langle f(b_1), \dots, f(b_n) \rangle$ .
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# Part I

## A bitonic sorting network

# Bitonic sorting network

## Definition

A **bitonic sequence** is a sequence which is first increasing and then decreasing, or can be circularly shifted to become so.

## example

The sequences  $(1, 2, 3, \pi, 4, 5, 4, 3, 2, 1)$  and  $(4, 5, 4, 3, 2, 1, 1, 2, 3)$  are bitonic, while the sequence  $(1, 2, 1, 2)$  is not bitonic.

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# Binary bitonic sequences

## Observation

*binary bitonic sequence is either of the form  $0^i 1^j 0^k$  or of the form  $1^i 0^j 1^k$ , where  $0^i$  (resp,  $1^i$ ) denote a sequence of  $i$  zeros (resp., ones).*

# Bitonic sorting network

## Definition

A ***bitonic sorter*** is a comparison network that sorts all bitonic sequences correctly.



# Half cleaner...

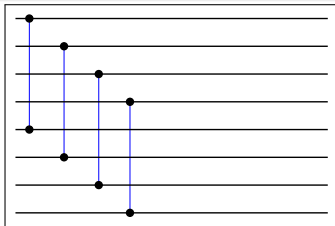
## Definition

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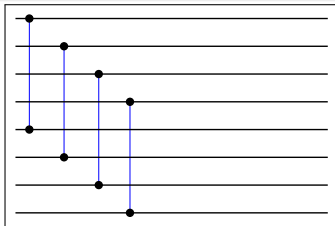
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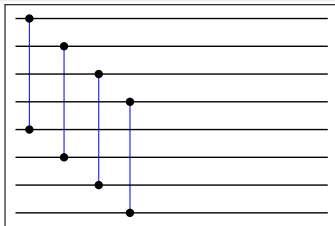


**Half-Cleaner** $[n]$  denote half-cleaner with  $n$  inputs.

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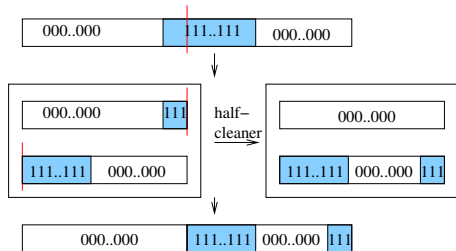
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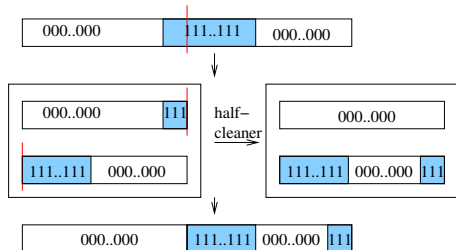
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Depth of **Half-Cleaner** $[n]$  is one.

# Half cleaner on bitonic sequence...



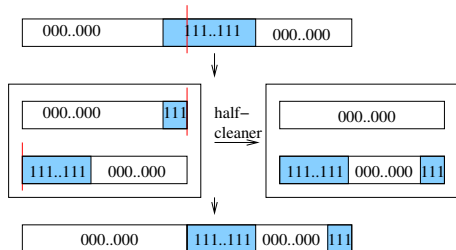
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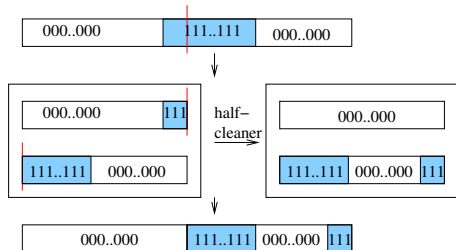
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# Half cleaner half sorts a bitonic sequence...

## Lemma

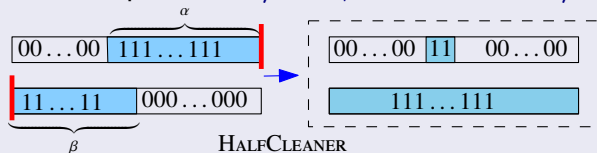
*If the input to a half-cleaner (of size  $n$ ) is a binary bitonic sequence then for the output sequence we have that*

- (i) the elements in the top half are smaller than the elements in bottom half, and*
- (ii) one of the halves is clean, and the other is bitonic.*

# Proof

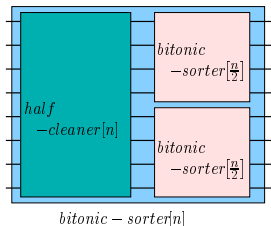
## Proof.

If the sequence is of the form  $0^i 1^j 0^k$  and the block of ones is completely on the left side (i.e., its part of the first  $n/2$  bits) or the right side, the claim trivially holds. So, assume that the block of ones starts at position  $n/2 - \beta$  and ends at  $n/2 + \alpha$ .

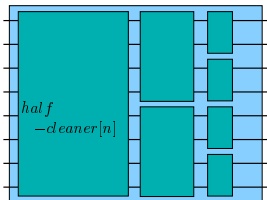


If  $n/2 - \alpha \geq \beta$  then this is exactly the case depicted above and claim holds. If  $n/2 - \alpha < \beta$  then the second half is going to be all ones, as depicted on the right. Implying the claim for this case. A similar analysis holds if the sequence is of the form  $1^i 0^j 1^k$ .  $\square$

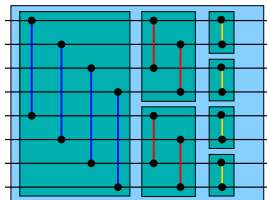
# Bitonic sorter - sorts bitonic sequences...



(i)



(ii)



(iii)

- (i) recursive construction of  $\text{BitonicSorter}[n]$ ,
- (ii) opening up the recursive construction, and
- (iii) the resulting comparison network.

# Bitonic sorter... the result

## Lemma

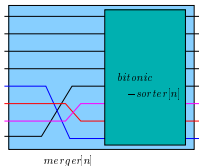
**BitonicSorter** $[n]$  sorts bitonic sequences of length  $n = 2^k$ , it uses  $(n/2)k = (n/2) \lg n$  gates, and it is of depth  $k = \lg n$ .

# Merging sequence

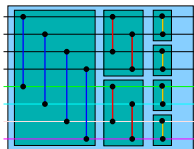
- ① Merging question: Given two *sorted* sequences of length  $n/2$ , how do we merge them into a single sorted sequence?
- ② Concatenate the two sequences...
- ③ ... second sequence is being flipped (i.e., reversed).
- ④ Easy to verify that the resulting sequence is bitonic, and as such we can sort it using the **BitonicSorter** $[n]$ .
- ⑤ Given two sorted sequences  $a_1 \leq a_2 \leq \dots \leq a_n$  and  $b_1 \leq b_2 \leq \dots \leq b_n$ , observe that the sequence  $a_1, a_2, \dots, a_n, b_n, b_{n-1}, b_{n-2}, \dots, b_2, b_1$  is bitonic.

# Merger[n]: Using a bitonic sorter

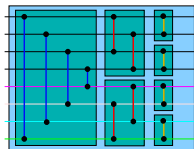
Merging two sorted sequences into a sorted sequence



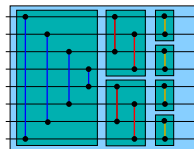
(i)



(ii)



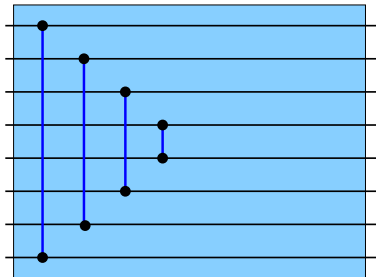
(iii)



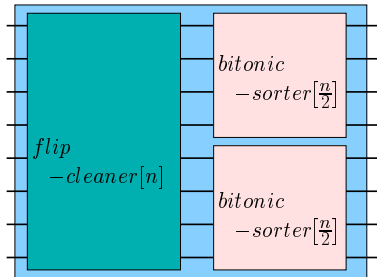
(iv)

- (i) **Merger** via flipping the lines of bitonic sorter.
- (ii) **BitonicSorter**.
- (iii) **Merger** after we “physically” flip the lines.
- (iv) Equivalent drawing of the resulting **Merger**.

# Merger[n] described using FlipCleaner



(i)



(ii)

- (i) **FlipCleaner**[*n*], and  
(ii) **Merger**[*n*] described using **FlipCleaner**.

# What **Merger**[ $n$ ] does...

## Lemma

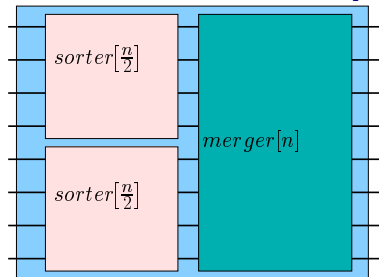
*The circuit **Merger**[ $n$ ] gets as input two sorted sequences of length  $n/2 = 2^{k-1}$ , it uses  $(n/2)k = (n/2) \lg n$  gates, and it is of depth  $k = \lg n$ , and it outputs a sorted sequence.*



# Sorting Network

Finally...

Implement *merge sort* using **Merger** $[n]$ .



**Sorter** $[n]$ :

## Lemma

The circuit **Sorter** $[n]$  is a sorting network (i.e., it sorts any  $n$  numbers) using  $G(n) = O(n \log^2 n)$  gates. It has depth  $O(\log^2 n)$ . Namely, **Sorter** $[n]$  sorts  $n$  numbers in  $O(\log^2 n)$  time.

## Proof.

The number of gates is

$$G(n) = 2G(n/2) + \text{Gates}(\text{Merger}[n]).$$

Which is  $G(n) = 2G(n/2) + O(n \log n) = O(n \log^2 n)$ .

As for the depth, we have that

$D(n) = D(n/2) + \text{Depth}(\text{Merger}[n]) = D(n/2) + O(\log(n))$ ,  
and thus  $D(n) = O(\log^2 n)$ , as claimed.  $\square$

# Resulting sorted

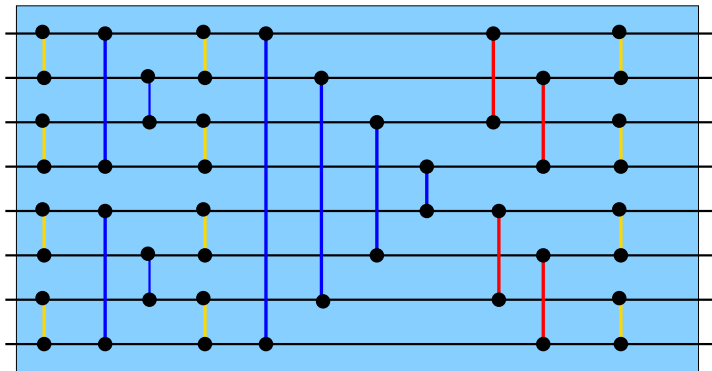


Figure: **Sorter**[8].

# Faster sorting networks

- ① Known: sorting network of logarithmic depth  
?
- ② Known as the ***AKS sorting network***.
- ③ Construction is complicated.
- ④ ? is better than bitonic sort for  $n$  larger than  $2^{8046}$ .







