

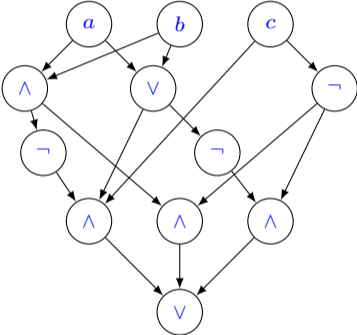


# Boolean Circuits: a quick introduction

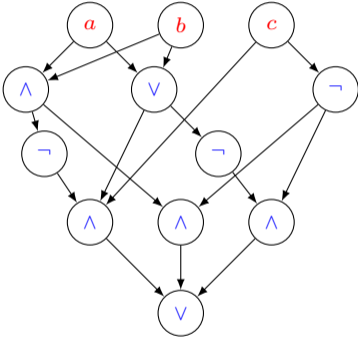
Charles Paperman, University of Lille

June 2020

# A Boolean circuit

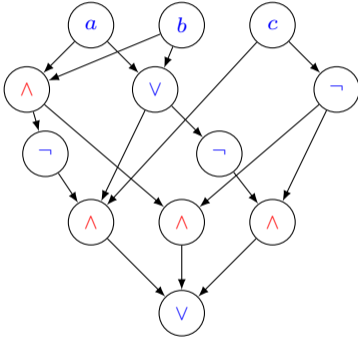


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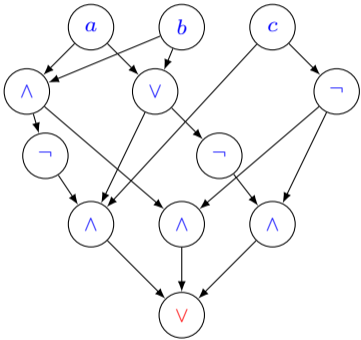
$$a, b, c \in \{0, 1\}$$

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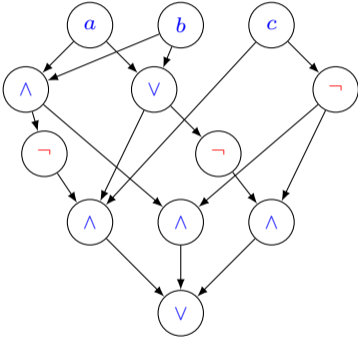
$\wedge \equiv$  All inputs must be one

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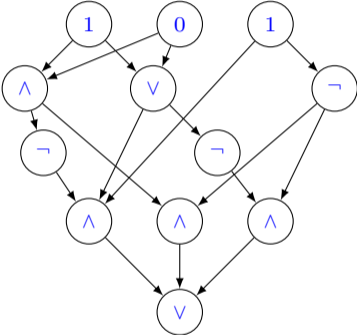
$\vee \equiv$  Some input must be one

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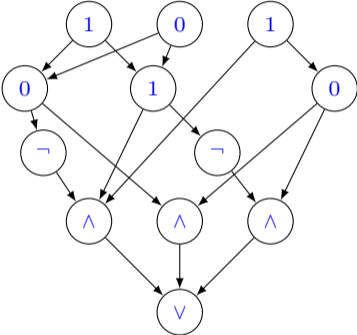


$\neg \equiv$  Negates its input

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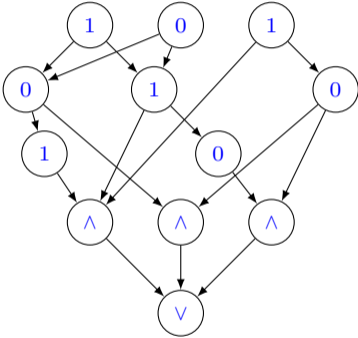


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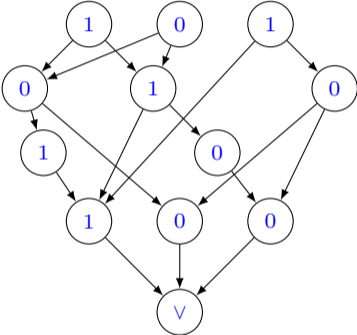




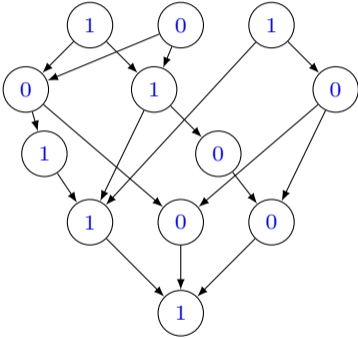
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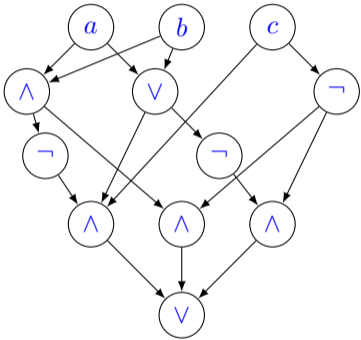
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Evaluate to 1 iff  $a \oplus b = c$

## Historical notes

- 1854 Simple mathematical reasoning requires few (simple) operations (Bool)
- 1936 Formalization of Turing Machine (Turing)
- 1937 Boolean algebra provides an abstraction of digital circuits design (Shannon)
- 1948 First transistor at Bell labs (John Bardeen, Walter Brattain, and William Shockley)
- 1958 First integrated circuit (Robert Noyce and Jack Kilby)
- 1965 Moore's Law
- 1971 The 4004 Intel processor (2250 transistors)
- 2019 AMD Ryzen 9 processor (10 billions transistors)

# Boolean algebra

$X_n = \{x_1, \dots, x_n\}$  a set of Boolean variables (taking values in  $\{0, 1\}$ ).

Basic operations:

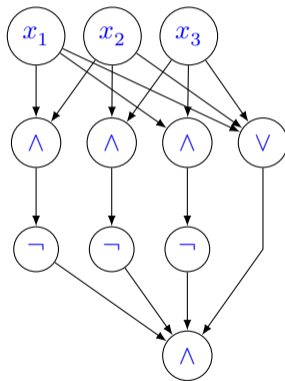
- $\wedge$  (AND)
- $\vee$  (OR)
- $\oplus$  (XOR)
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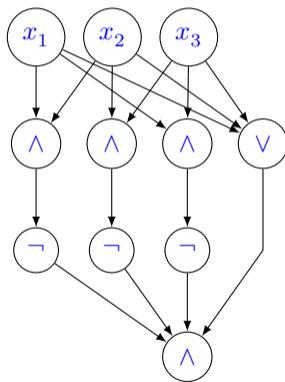


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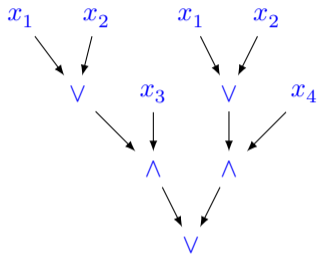


Compute  $\{0, 1\}^3 \cap 0^*10^*$ .



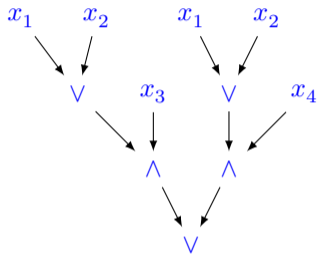
# Boolean computation: Terms and Circuits

Terms



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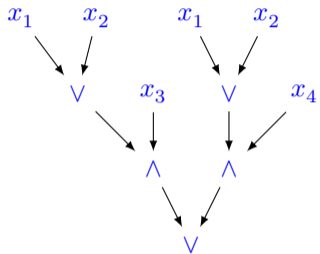


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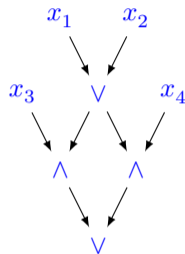
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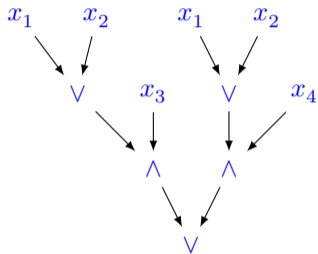


Equivalent to

$(y \text{ and } x_3) \text{ or } (y \text{ or } x_4)$  with  $y = x_1 \text{ or } x_2$ .

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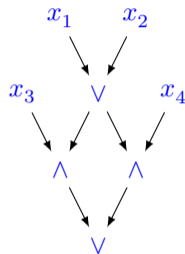
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Circuits are factorized trees.

## Small exercises

### Exercise 1.

Any functions  $f : \{0, 1\}^n \rightarrow \{0, 1\}$  can be computed by Boolean terms.

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### Exercise 2.

Any function computed by a Boolean circuit can be computed by a Boolean term.

Simply by unfolding the circuits.



# Shannon master Thesis

A Symbolic Analysis of Relay and Switching Circuits. Shannon, MIT 1937.

Main contribution:

1. The arrangement of Electrical switch can be improved by using Boolean algebra reasoning.
2. Electrical switch can be used to execute Boolean circuits.

One of the first appearance of computational complexity!

# Electronic and Boolean complexity

**Electronic synthesis:** process of turning an abstract specification of some computations into a working electronic design. Ultimately, the goal is to obtain the most efficient electronic layout.

## What efficiency means?

- Size of the design
- Speed of stabilization
- Power consumption

All those electronic parameters can be translated into Boolean circuits parameters.

# Electronic and Boolean complexity

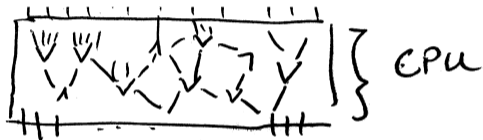
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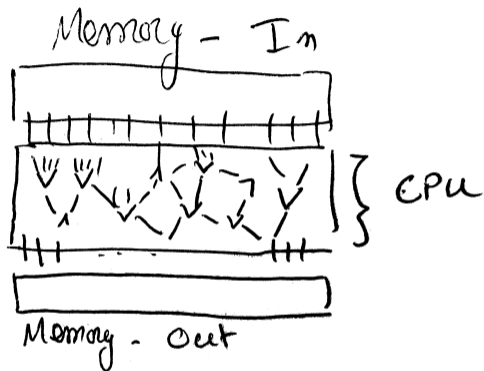
- Size of the design → number of gates
- Speed of stabilization → depth of the circuits
- Power consumption → number of wires

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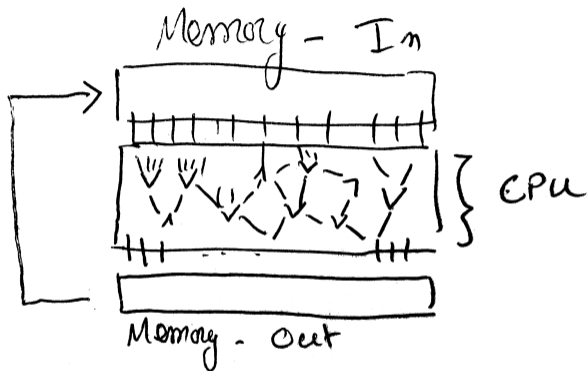
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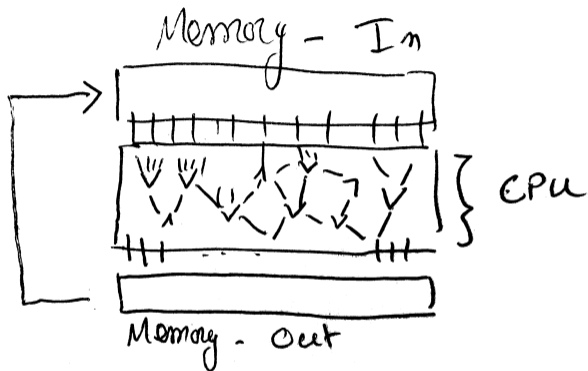


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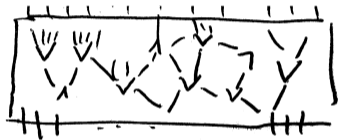
classical complexity focus on the number of loop and memory used by the algorithm.

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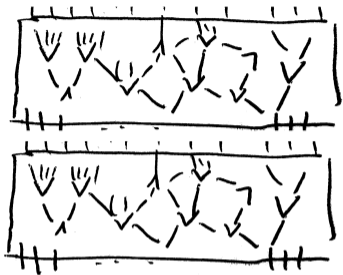
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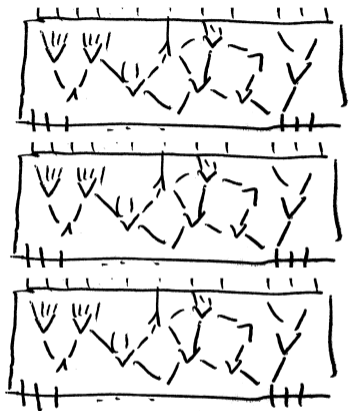




## Classical complexity to Boolean realm



## Classical complexity to Boolean realm



## Summary

- Boolean complexity cares about Boolean circuits resources to perform computation
- Boolean complexity provides model-free notion of complexity
- Boolean complexity is linked to parallel complexity

# Boolean Circuits Complexity

Remark.

Circuits have no memory model: they recognize finite subset of  $2^{X_n}$ , for some  $n$ .

What Boolean complexity means when we care only of a finite subset?

## An example: adding numbers

$\text{ADD}_n$  is the function  $\{0, 1\}^{2n} \rightarrow \{0, 1\}^{n+1}$  performing the addition on standard binary encoding of numbers on  $n$ -bits.

### Exercise 3.

Using what you learn in middle school, prove that  $\text{ADD}_n$  is computable by a circuit with  $\mathcal{O}(n)$  gates and  $\mathcal{O}(n)$  depth.

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Simply unroll the middle school classical algorithm.

## A weird example: middle of inputs

$\text{Middle}_n$  is the function (language)  $\{0, 1\}^{2n+1} \rightarrow \{0, 1\}$  that map to 1 all words in  $\{0, 1\}^n \times \{1\} \times \{0, 1\}^n$ .

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Select the input  $x_{n+1}$  as output.



## Boolean circuits complexity: a formal definition

Definition.

Let  $(r_n)_{n \in \mathbb{N}}$  be positive integers,  
and  $(f_n)_{n \in \mathbb{N}}$  be functions s.t.  $f_n : \{0, 1\}^n \rightarrow \{0, 1\}^{r_n}$ .

For  $g : \mathbb{N} \rightarrow \mathbb{N}$ , we say that  $(f_n)$  has a circuit-size  $\mathcal{O}(g(n))$  if there exists a circuits family  $(C_n)$  such that  $C_n$  computes  $f_n$  and  $|C_n| \in \mathcal{O}(g(n))$ .

Similarly we can define the circuit-depth complexity or alternative notion by changing the set of considered gates.

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## Note on uniformity of Boolean classes

It is possible to add constraint on the way circuits classes are produced to lift the non-uniformity.

→ To know more see Sipser's Book: [Introduction to the Theory of Computation](#) (chapter 10. Section Uniform Boolean circuits)

## Some important classes

- $P/poly$ : functions computable by polysize circuits.
- $AC^i$ : functions computable by polysize circuits and  $\mathcal{O}(\log^i(n))$  depth.
- $NC^i$ : functions computable by bounded arity polysize circuits and  $\mathcal{O}(\log^i(n))$  depth.
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- Can also be define as P-machine with polysize advices.
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- Worst name for a complexity class (Nick Class).
- Known as the classes of parallel computations.
- Strictness is a long standing open question.
- Not much is known ...

### Exercise 8.

Prove that  $AC^i \subseteq NC^{i+1}$ . Deduce that  $AC = NC$  and that Boolean matrix multiplication is in  $NC^2$

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- Look at [Barrington's Theorem](#).

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Proving that  $(\text{ADD}_n)$  is not computable by linear size circuits of  $AC^0$  is a long standing open problem