

# CS 121: Lecture 7

## Infinite Functions

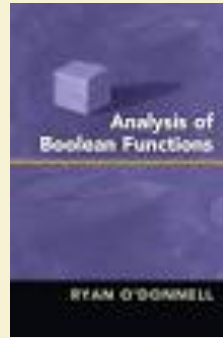
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<https://madhu.seas.harvard.edu/courses/Fall2020>

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# Reminders



- 121.5: Ryan O'Donnell, Analysis of Boolean Functions. Today @ 4:30
- Section 3 cycle begins today
- Extra-length sections:
  - Will (Thursdays: 6-7:30pm), Max & Zuzanna (Tuesdays: 7:30am-9am).

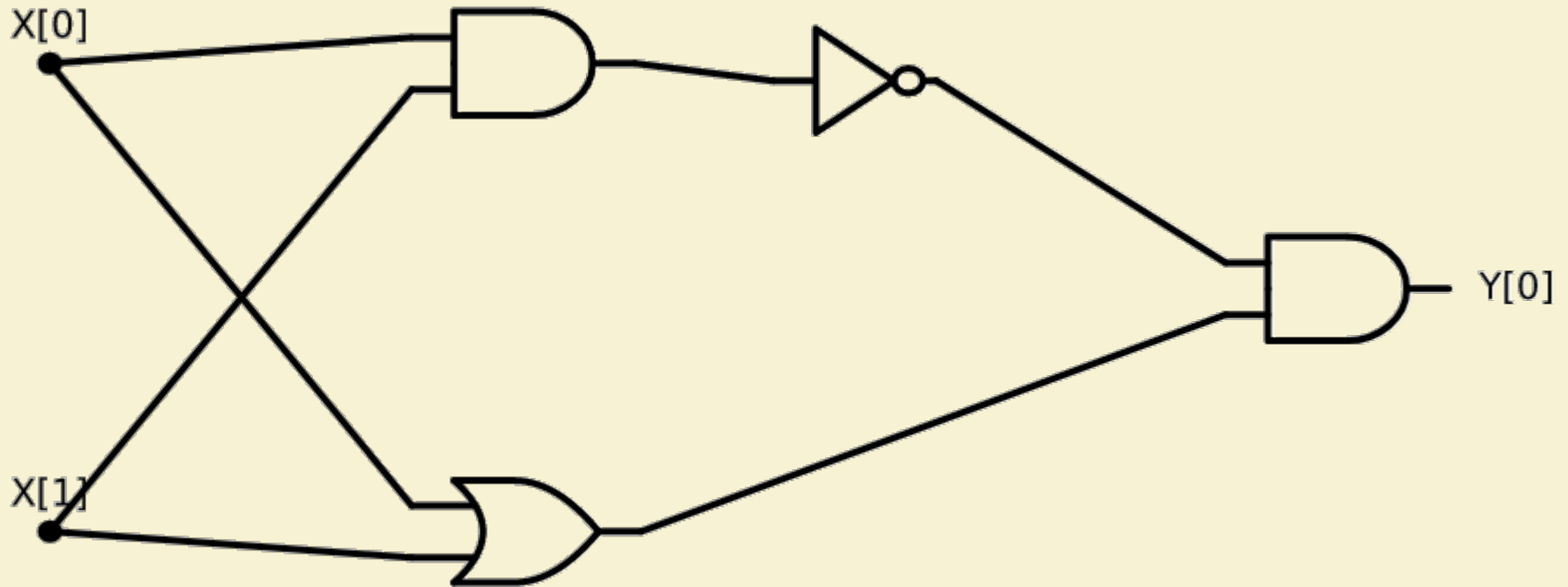
# Today

- Infinite vs. Finite functions
- Example: Addition as finite state algorithm
- (Deterministic) Finite Automata:
- Break 1: Understand DFA
- Break 2: Design DFA
- Preview of next lecture: Regular Expressions

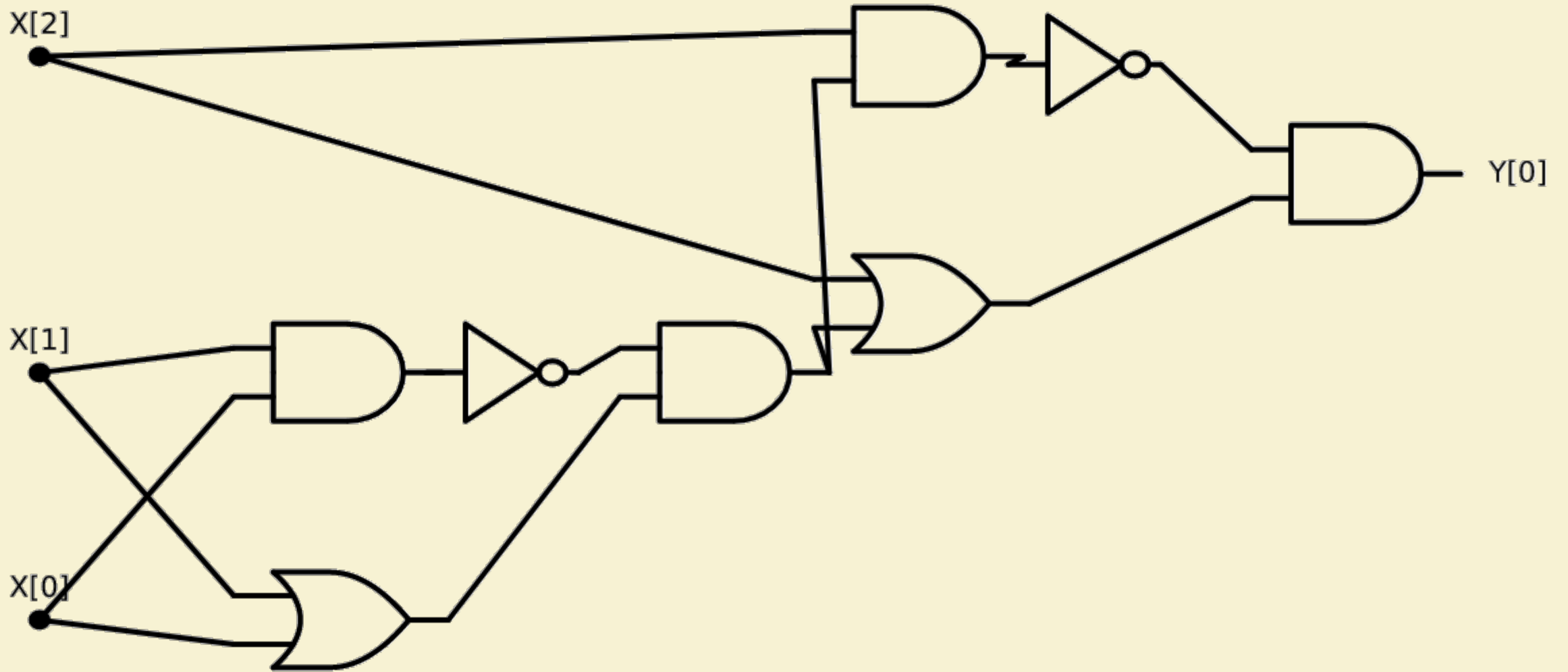
# So far

- Have seen Circuits/NAND-CIRC Programs
- Compute all finite functions:
  - Given  $f: \{0,1\}^n \rightarrow \{0,1\}^m$ , exists NAND-CIRC  $C$ , s.t.  $\forall x \in \{0,1\}^n, C(x) = f(x)$
  - Sounds great?

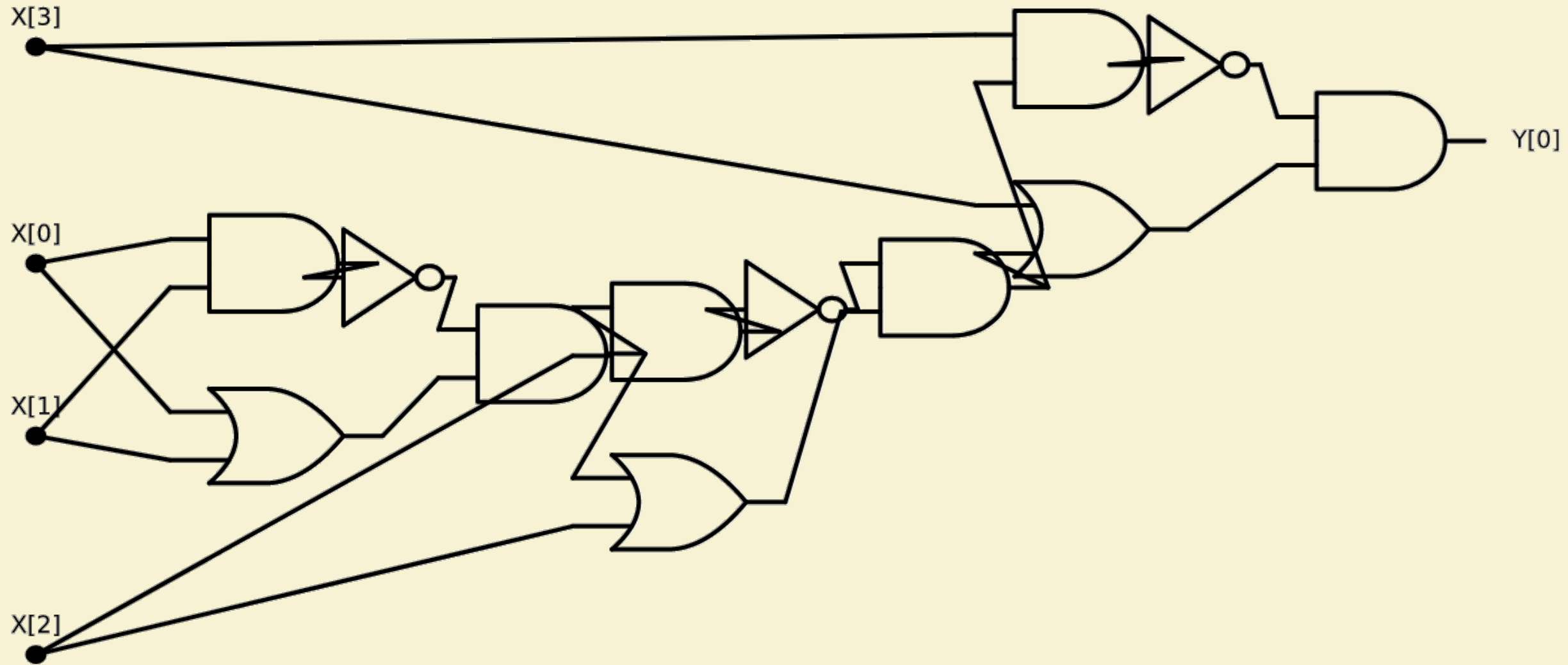
# *XOR* on 2 variables



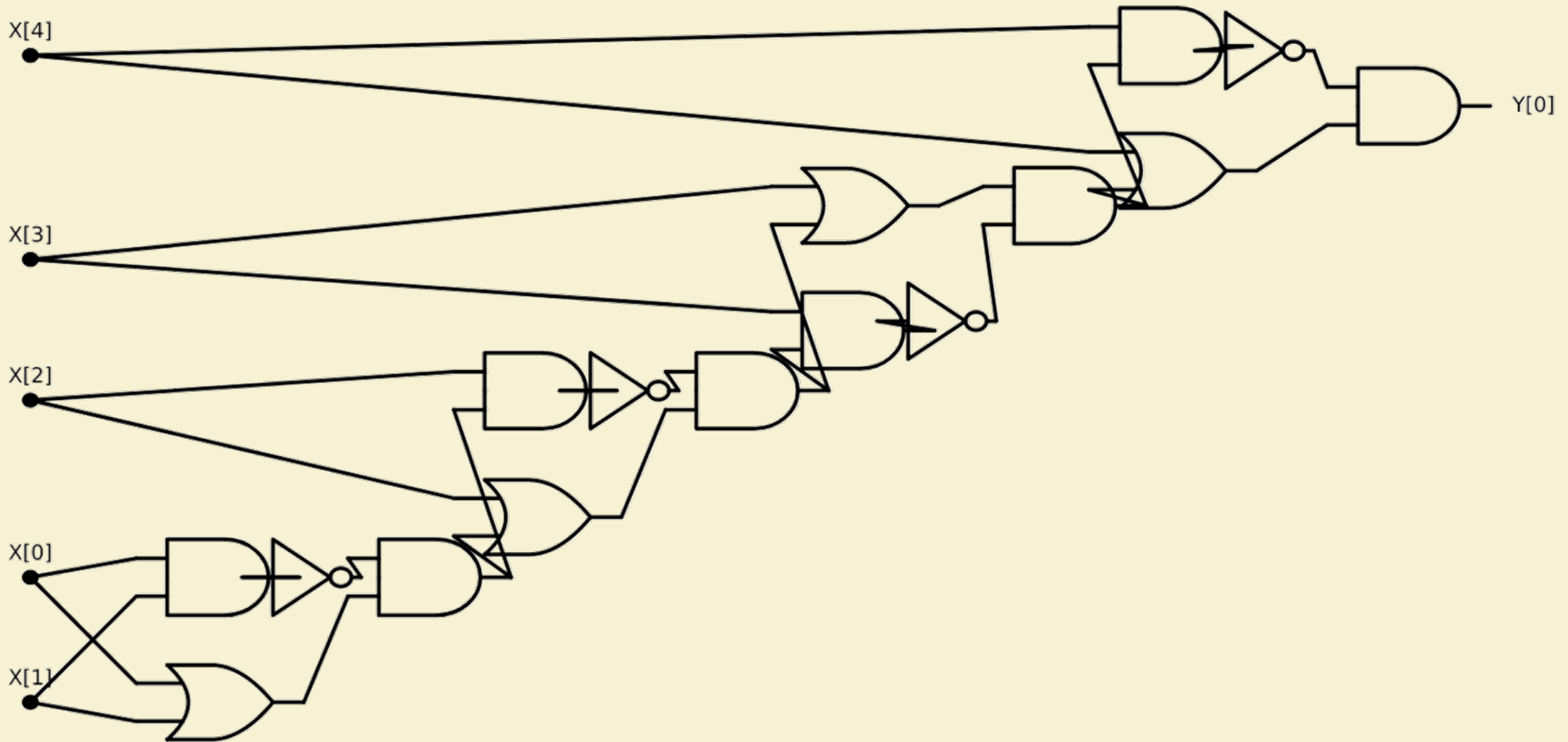
# *XOR* on 3 variables



# *XOR* on 4 variables

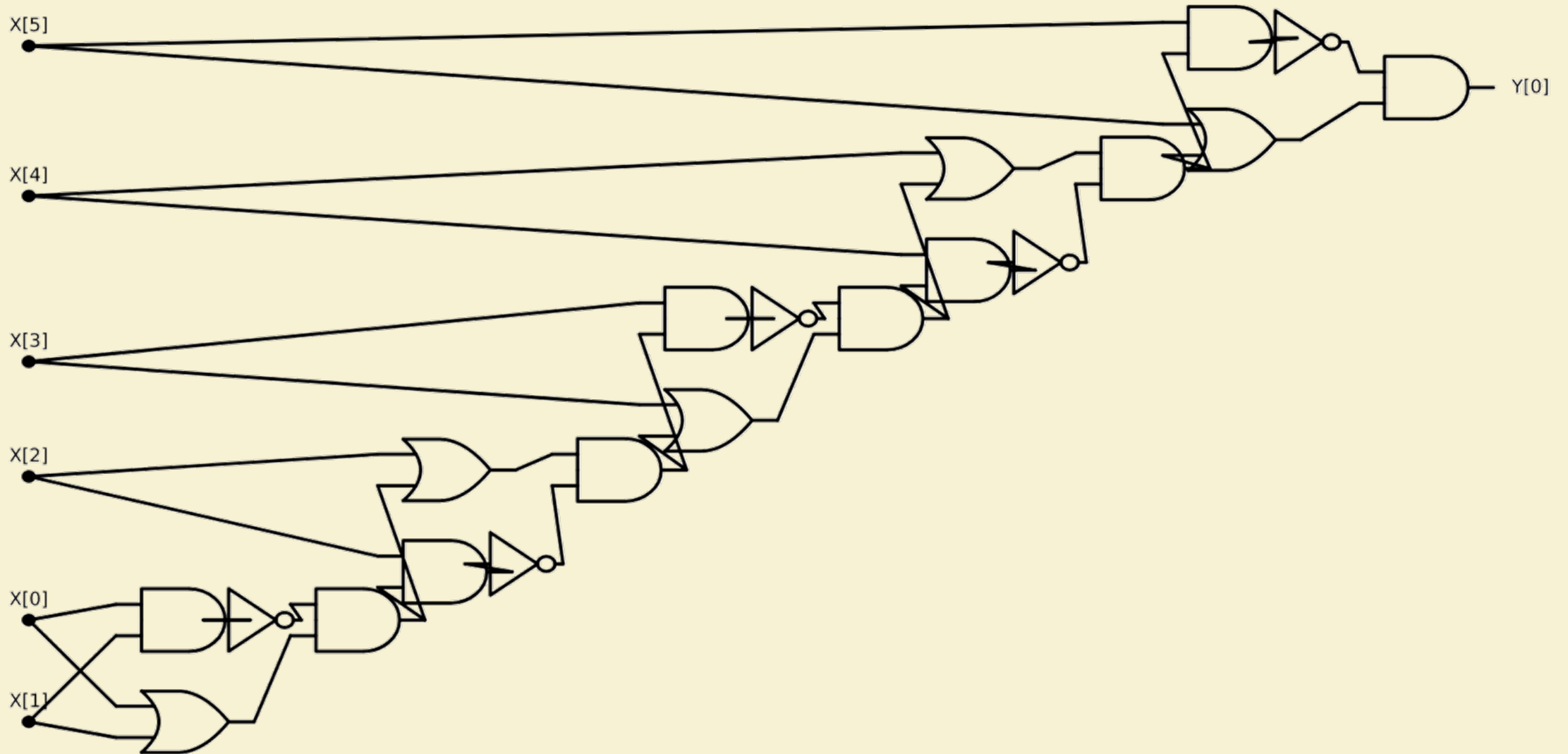


# *XOR* on 5 variables

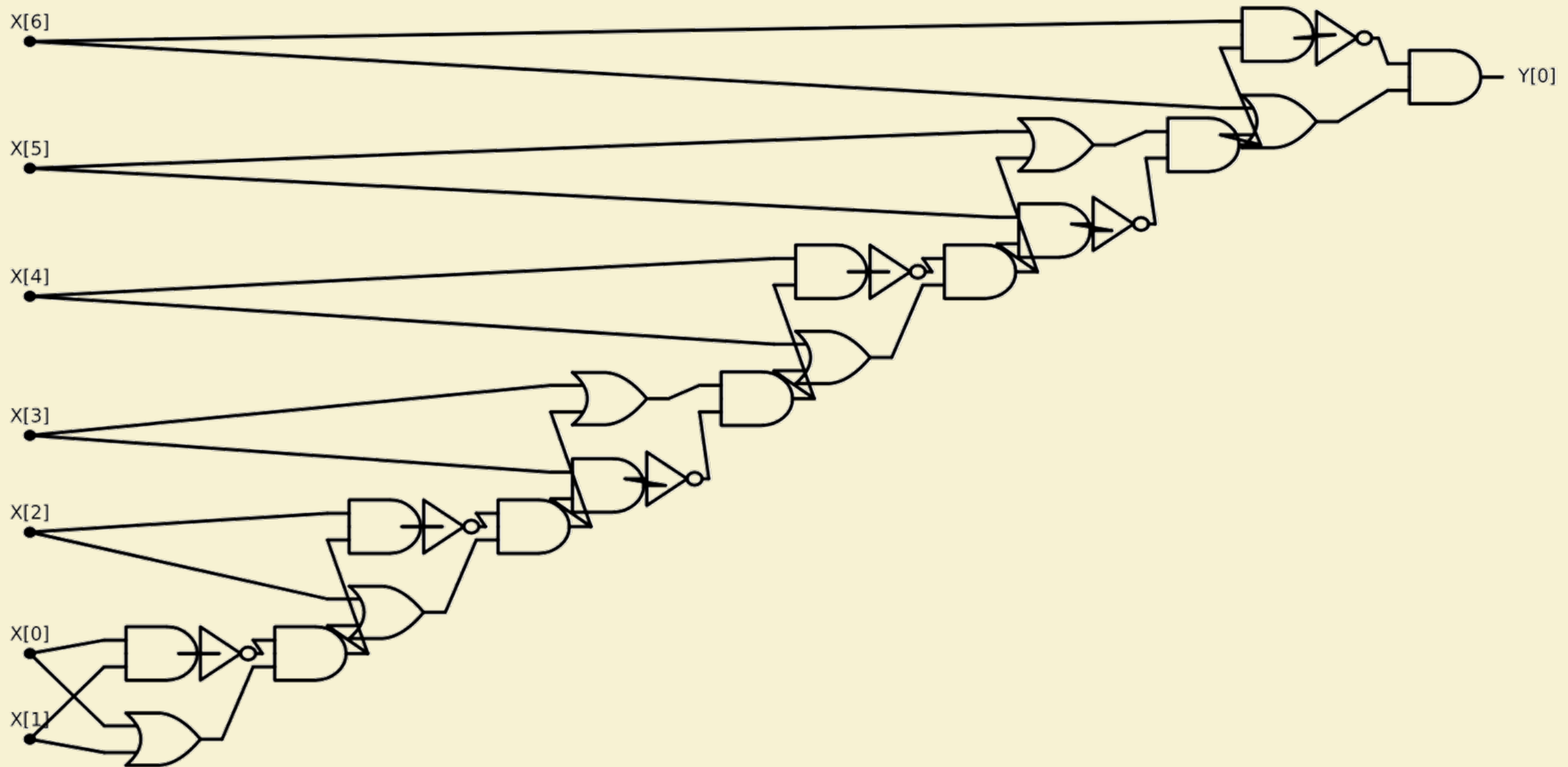




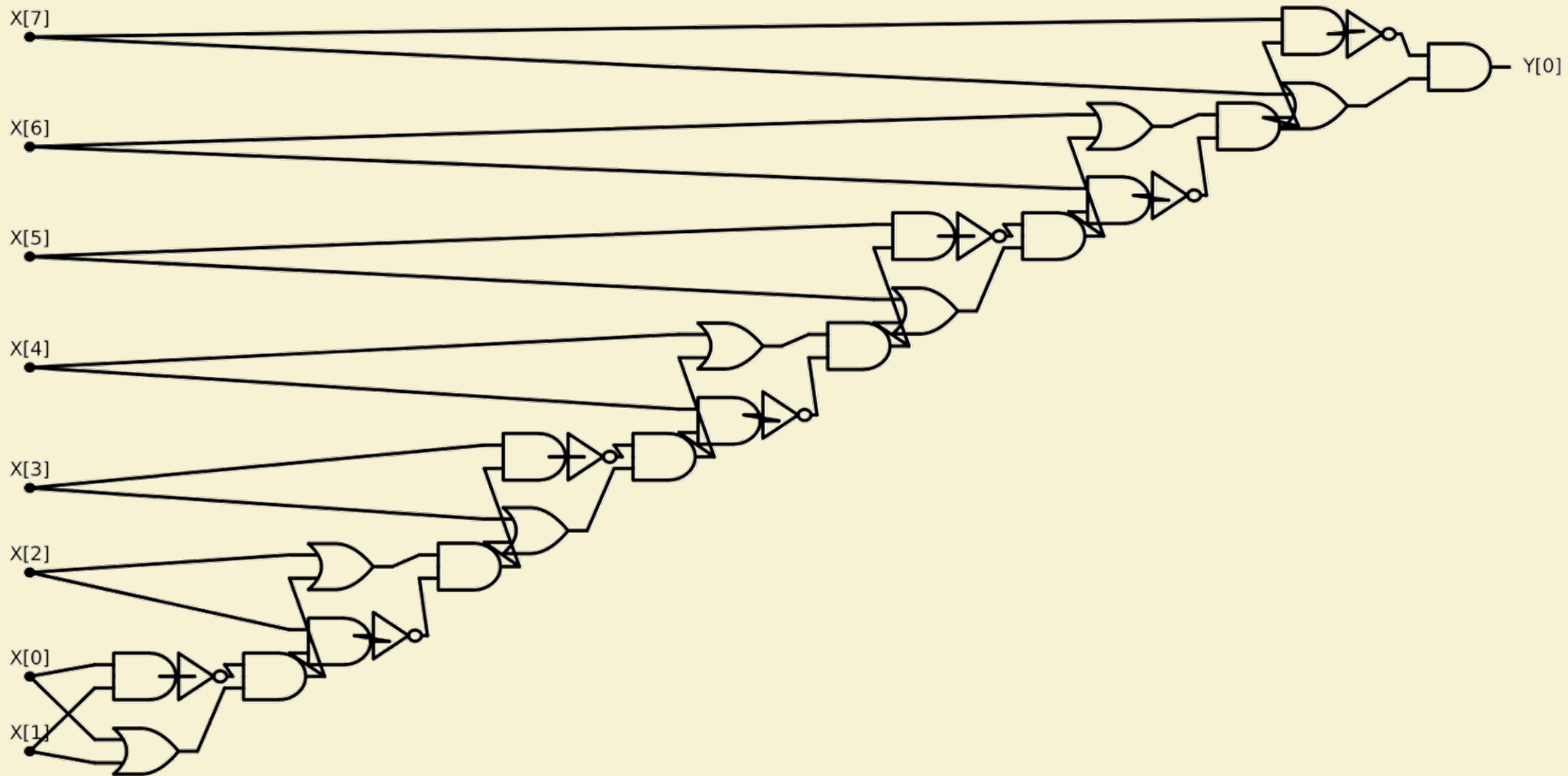
# *XOR* on 6 variables



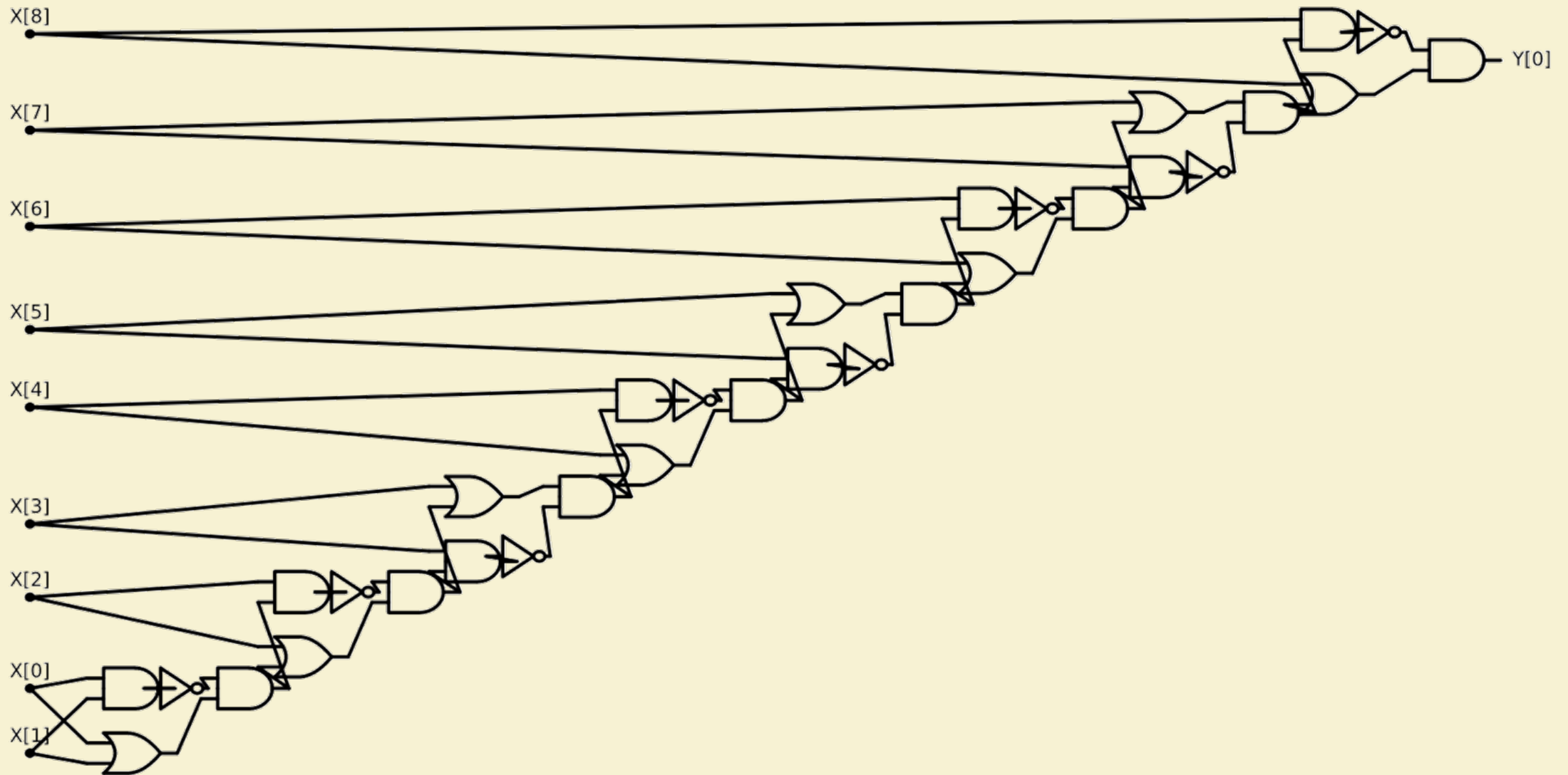
# *XOR* on 7 variables



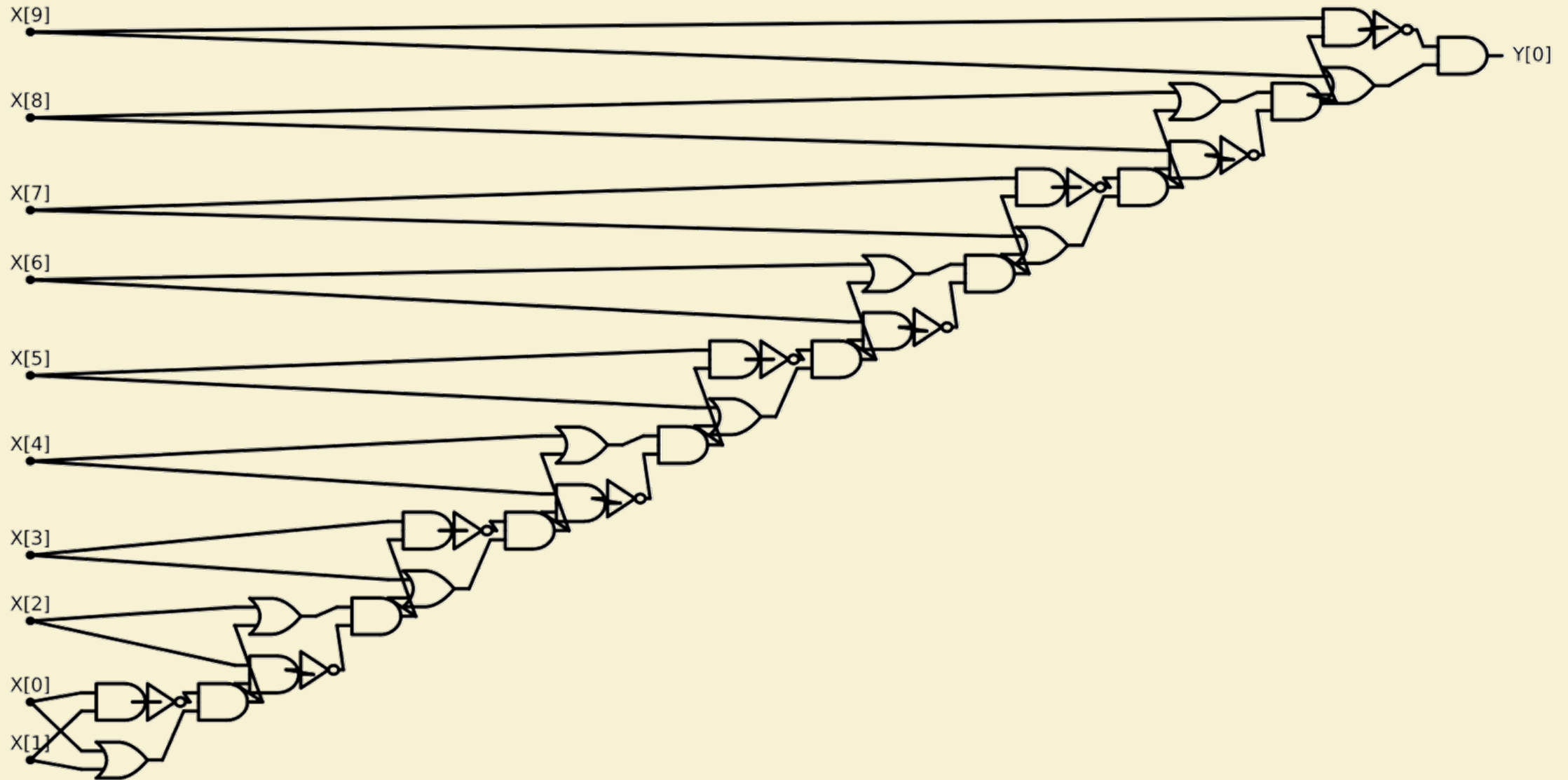
# *XOR* on 8 variables



# *XOR* on 9 variables



# *XOR* on 10 variables



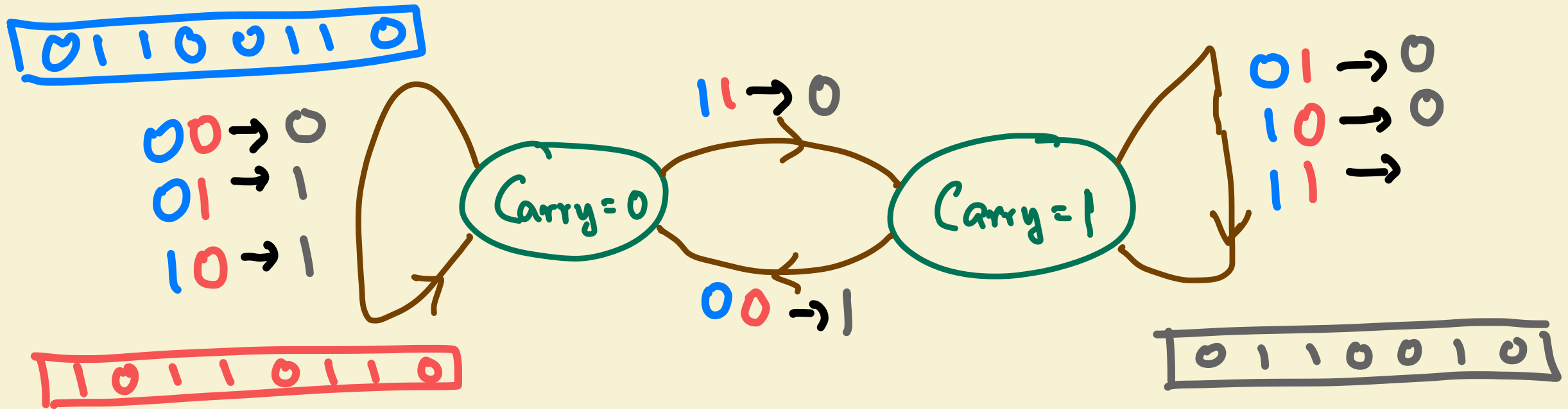
# So far

- Have seen Circuits/NAND-CIRC Programs
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  - Given  $f: \{0,1\}^n \rightarrow \{0,1\}^m$ , exists NAND-CIRC  $C$ , s.t.  $\forall x \in \{0,1\}^n, C(x) = f(x)$
  - Sounds great?
- Weakness: Only computes finite functions.
  - No generalization?
  - Given circuits for  $ADD_1, ADD_2, ADD_3, \dots, ADD_n$  - do we know what circuit for  $ADD_{n+1}$  looks like?
  - Our favorite algorithms generalize!!

# Today: Algorithms with finite state

- What should an algorithm be?
  - Sequence of simple steps
  - Different steps for different inputs
  - Exactly which step to take must be determined (based on input, easily, locally).
  - Different #steps for different input lengths
  - When to stop must be determined (based on input, easily, locally).
- Finite state algorithms: What step to take, when to stop determined by "finite state" (constant # bits of memory).

# Example: Addition as finite state algorithm



- Advantage:  $O(1)$ -sized description. Tells how to compute an infinite function  $\text{ADD}: \{0,1\}^* \times \{0,1\}^* \rightarrow \{0,1\}^*$
- Can you do anything else?
  - Multiplication? NO 😞
  - ... but can do modular counting, pattern matching



# Boolean functions

- From now will focus only on Boolean functions:  $G: \{0,1\}^* \rightarrow \{0,1\}$
- Why?
  - Given  $F: \{0,1\}^* \rightarrow \{0,1\}^*$ , can design  $bF: \{0,1\}^* \times \mathbb{N} \rightarrow \{0,1\}$  or  $BF: \{0,1\}^* \times \mathbb{N} \rightarrow \{0,1\}$ , that are roughly “equally easy/hard”.
  - Idea:  $BF(x, i) = F(x)_i$
  - If  $F(x) \in \{0,1\}^m$  for some  $m$ :
    - Can go from  $F(x)$  to  $BF(x, i)$  (for any single  $i$ ) by erasing other parts of output.
    - Can go from  $BF(x, i)$  to  $F(x)$  by  $m$  calls to algorithm for  $BF(\cdot, \cdot)$

# Exercise Break 1

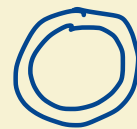
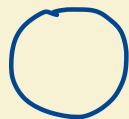
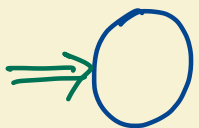
- Booleanize  $Mult: \{0,1\}^* \times \{0,1\}^* \rightarrow \{0,1\}^*$ , where  $Mult$  is the multiplication function for integers (given in "little-endian").
- What is domain of your function?
- What is the range?

# Deterministic Finite Automata (DFA)

- Finite algorithms computing Boolean functions:  $f: \{0,1\}^* \rightarrow \{0,1\}$
- Operation:
  1. Finite number of states:  $C$
  2. Starts in state 0, reads  $x_0$
  3. At any stage has current state  $q$ , last read input symbol  $\sigma$
  4. Moves to state  $T(q, \sigma)$ ; moves to read next input symbol
  5. If input not done, repeat from Step 3.
  6. When done: Accept (output 1) if current state  $q \in S$  and reject (output 0) otherwise.
- Specification:  $(T, S)$  where  $T: [C] \times \{0,1\} \rightarrow [C]$ ,  $S \subseteq [k]$
- (more elaborate spec. in Sipser):  $(Q, q_0, \Sigma, T, S)$  [  $Q = [C]$ ,  $q_0 = 0$ ,  $\Sigma = \{0,1\}$  ]

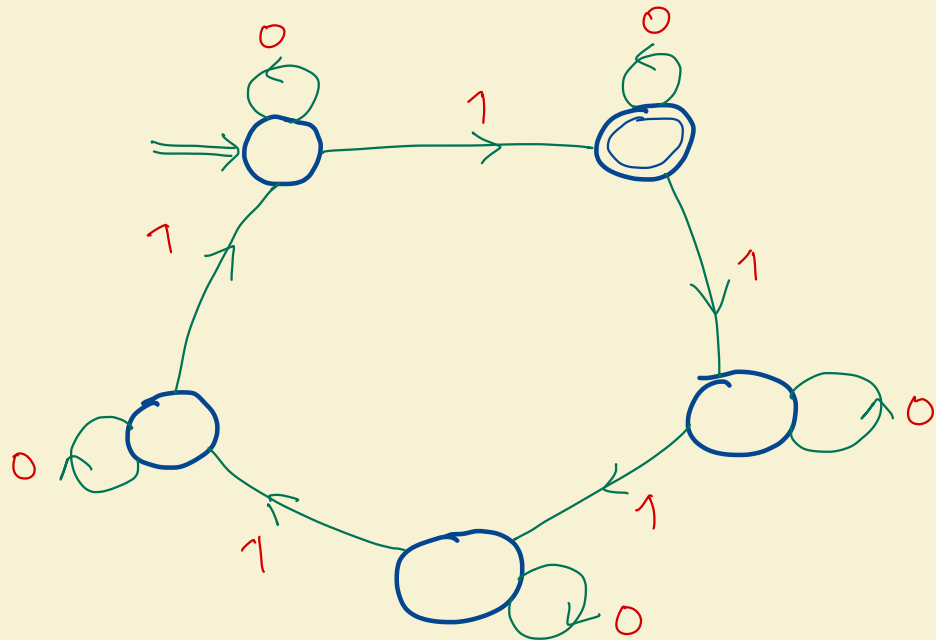
Example:

$f(x) = 1 \Leftrightarrow x$  contains 011 as a subsequence



# Exercise Break 2:

1) Convert the following diagram to transition function:



2) Describe the function  $f$  computed by this DFA.





# Regular Expressions

- Motivation: DFA detects simple patterns in strings. Can it do more complex ones?
- Regular expressions:
  - A generalization of "Patterns".
  - Succinct descriptions of subsets of  $\{0,1\}^*$
- Definition:
  - Basic cases:
    - 0 is a regular expression
    - 1 is a regular expression
  - Compound cases: If  $r_1, r_2$  are regular expressions, then so are:
    - $r_1 r_2$ : " $r_1$  followed by  $r_2$ " (or "concatenation")
    - $(r_1 | r_2)$ : " $r_1$  or  $r_2$ "
    - $r_1^*$ : "Concatenation of finite number of  $r_1$ 's"
  - End Cases:
    - $\phi$  (empty set) is regular.
    - "" (null string) is regular.



# Regular Expression Matching

- Basic
  - 0 matches 0
  - 1 matches 1
  - "" matches ""
  - No string matches  $\phi$
- Compound:
  - $s$  matches  $r_1r_2$  if there exists  $s_1, s_2$  such that  $s = s_1s_2$  and  $s_1$  matches  $r_1$  and  $s_2$  matches  $s_2$
  - $s$  matches  $(r_1|r_2)$  if  $s$  matches  $r_1$  or  $s$  matches  $s_2$
  - $s$  matches  $r_1^*$  if there exists  $s_1, s_2, \dots, s_\ell$  such that  $s = s_1s_2 \dots s_\ell$  and  $s_i$  matches  $r_1$  for every  $i \in [\ell]$

# Examples:

- $(0|1)^*011(0|1)^*$

# Examples:

- $(0|1)^*1(0|1)^*1(0|1)^*1(0|1)^*$

# Examples:

- $(0^*10^*10^*1)^*$



# Regular expressions = sets (languages) = functions

- Can think of a regular expression as a set or as a Boolean function:
  - Given regular expression  $r$  can look at set (language)
    - $L(r) = \{x \in \{0,1\}^* \mid x \text{ matches } r\}$
    - $f_r: \{0,1\}^* \rightarrow \{0,1\}$  where  $f_r(x) = 1 \Leftrightarrow x \in L(r) \Leftrightarrow x \text{ matches } r$
- We prefer the last version

# Next two lectures:

- Understanding DFA via regular expressions:
  - For which regular expressions  $r$  is  $f(r)$  computable by a DFA
    - (Note: # states can depend on  $r$ , but not on  $x$  or  $|x|$ )
  - What are some functions computable by DFA that are not regular
- Limits of DFA
  - What are some functions that are not computed by DFA?