

*Jean Goubault-Larrecq*

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# Randomized complexity classes

Today: **BPP** (part 2)  
and **P/poly**

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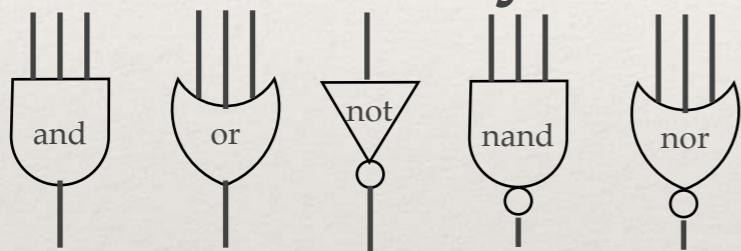
# Today

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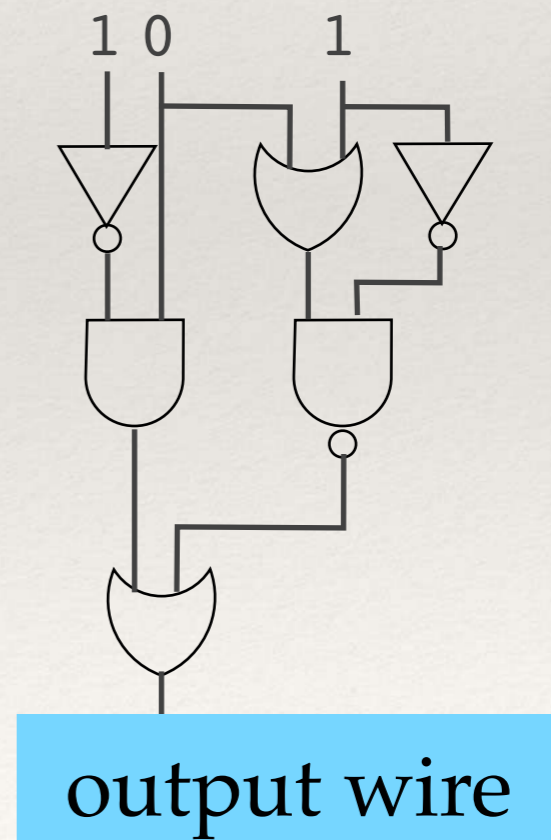
- ❖ Circuits,  $\mathbf{P/poly}$
- ❖ Adleman's theorem:  $\mathbf{BPP} \subseteq \mathbf{P/poly}$
- ❖ The Karp-Lipton theorems, and consequences

# Circuits

- ❖ Informally, collections of logical **gates** connected by **wires**

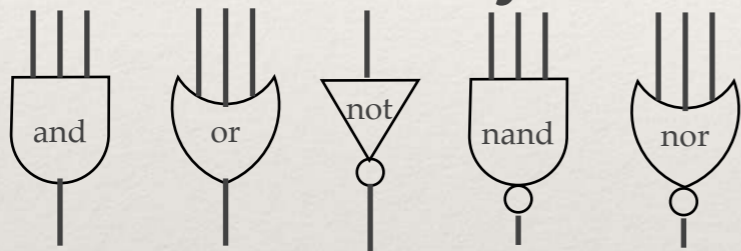


- ❖ Must be **acyclic**
- ❖ Wires can be **shared**
- ❖ **Fan-in** arbitrary here  
(e.g., 1=fan-in 0 and, 0=fan-in 0 or)



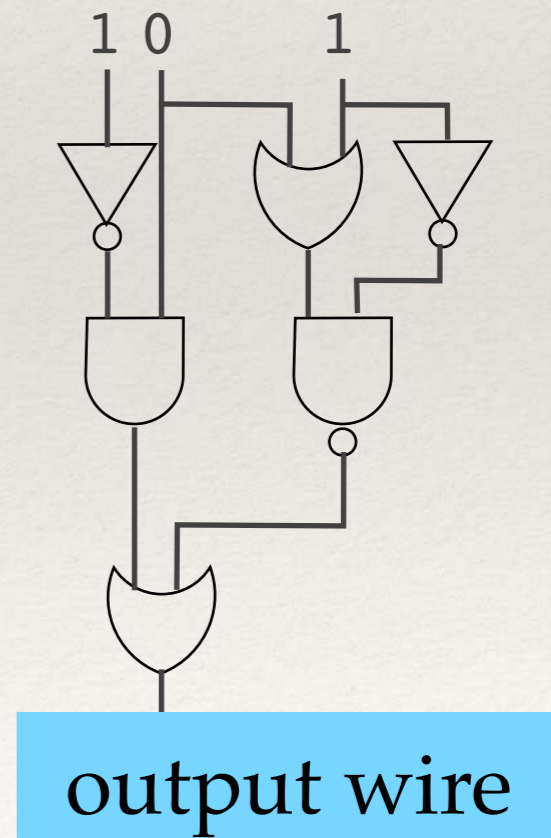
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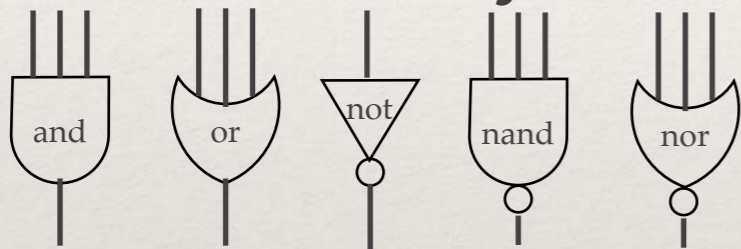
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- ❖ Remember: **CIRCUIT-VALUE** is **P-complete** (for logspace reductions)



# Circuits

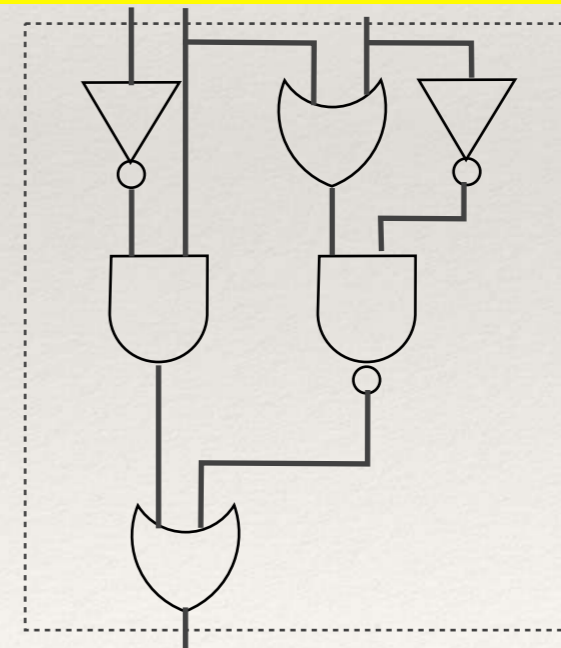
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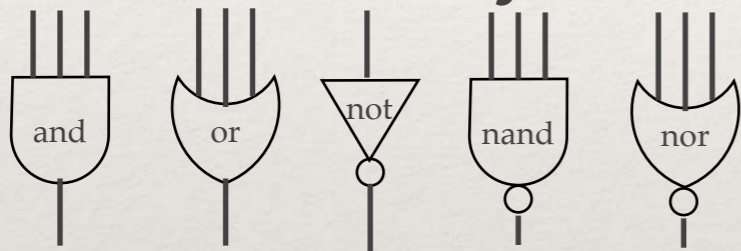
input wires ( $x$ )



output wire

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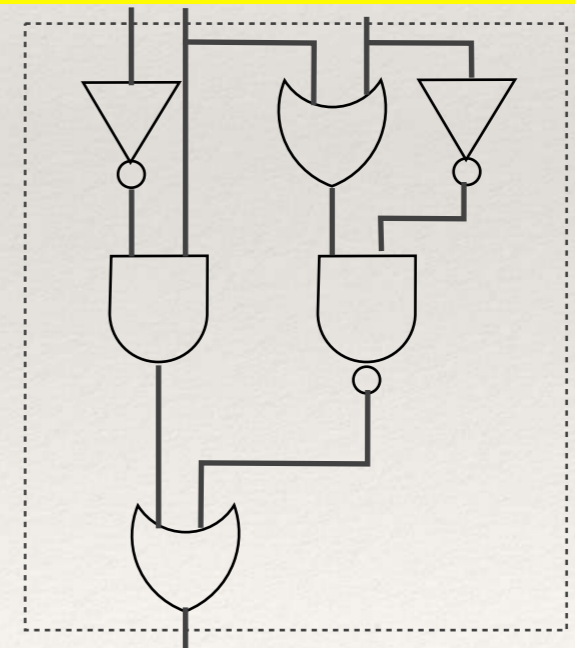


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- ❖  $C[x]$  = value of  $C$  when fed input bits  $x$

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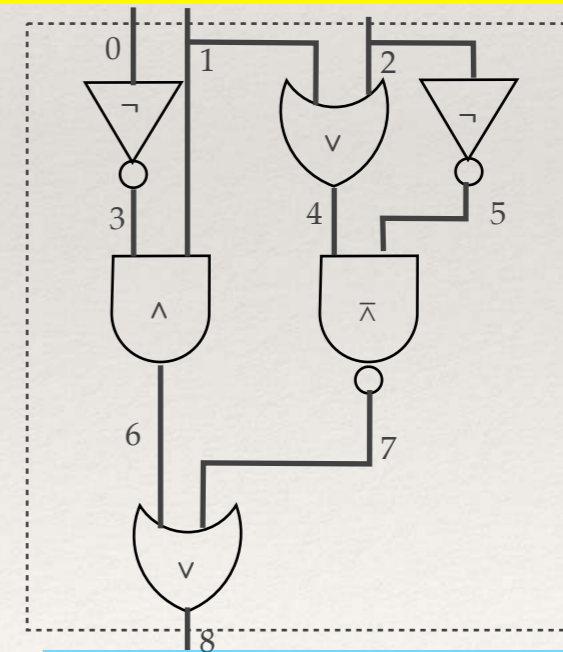
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# Circuits, formally: net-lists

- ❖ We encode circuits as **words (net-lists)**, e.g.:



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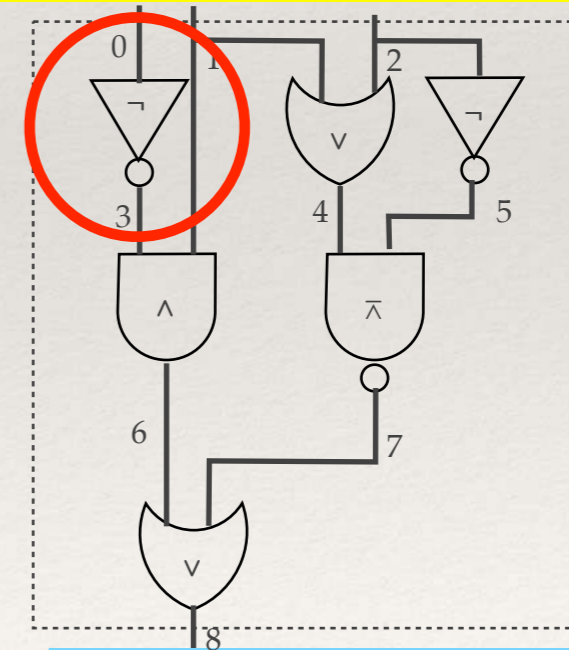
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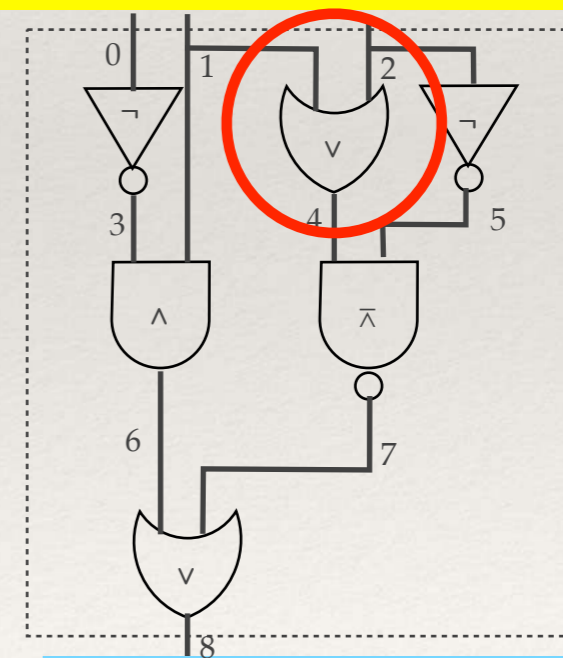
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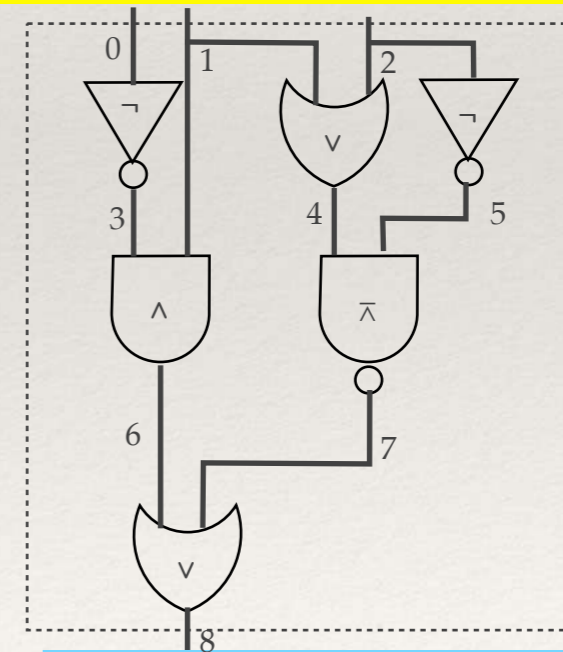
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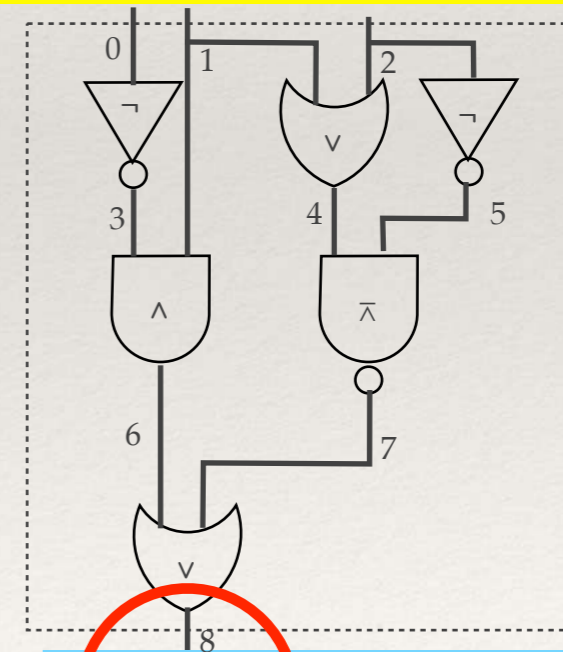
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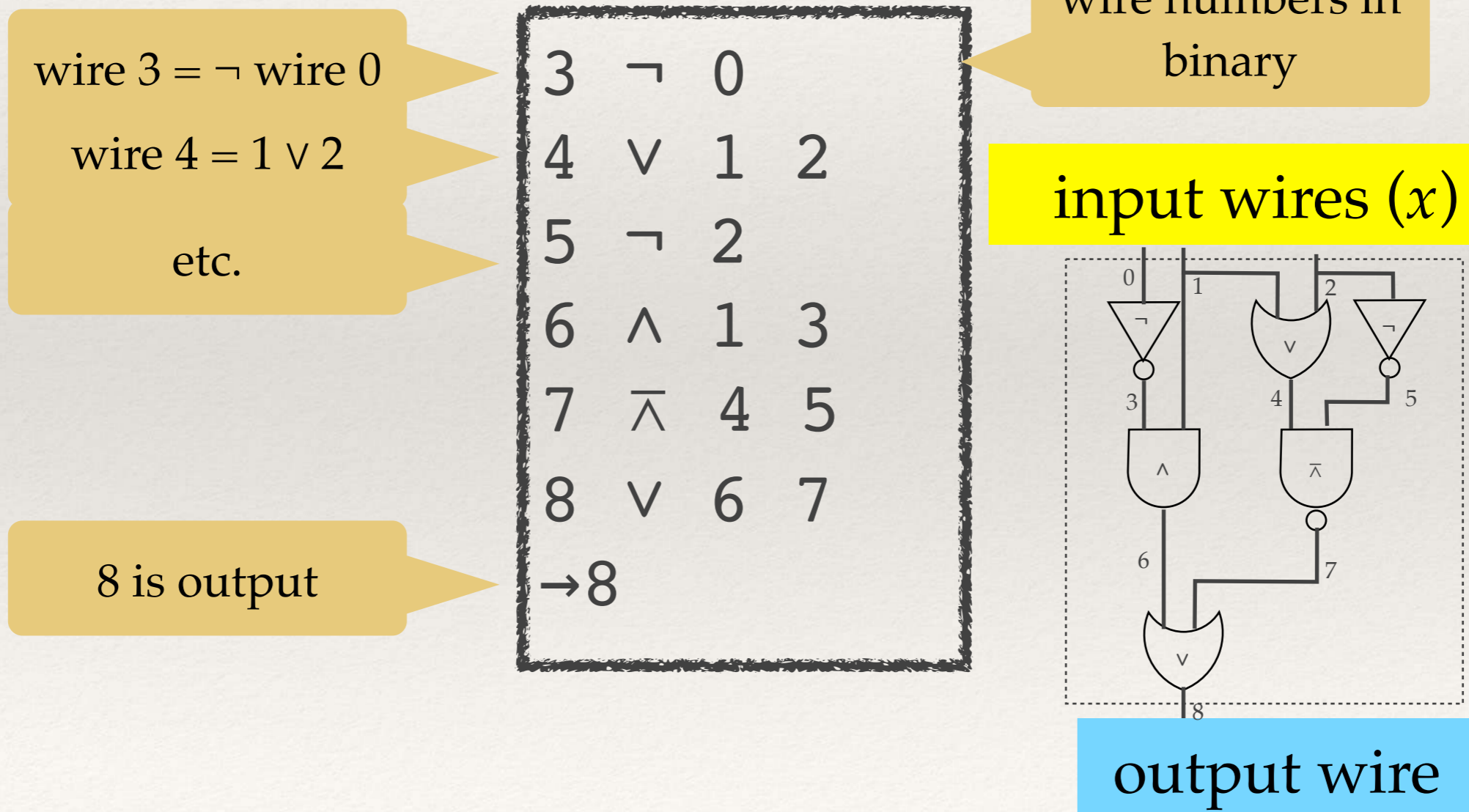
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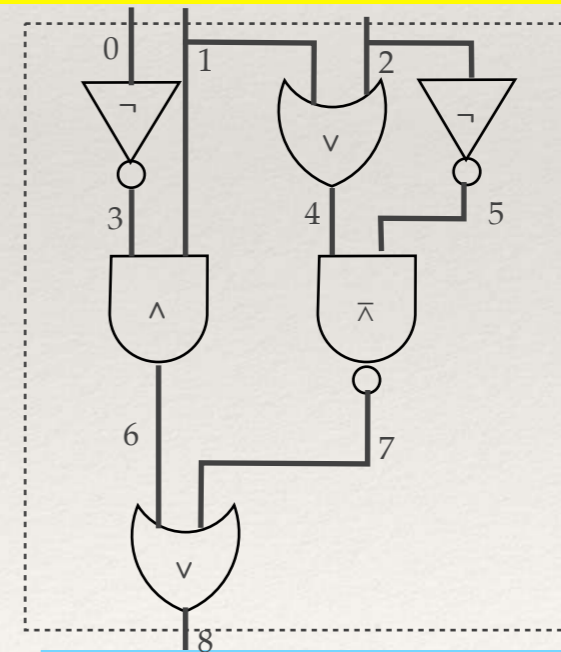
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3	$\neg$	0	
4	$\vee$	1	2
5	$\neg$	2	
6	$\wedge$	1	3
7	$\bar{\wedge}$	4	5
8	$\vee$	6	7
$\rightarrow$		8	

We require wire numbers to be **sorted**  
(implies acyclicity)  
(sortedness checkable in logspace, acyclicity is NL-complete)

wire numbers in  
binary

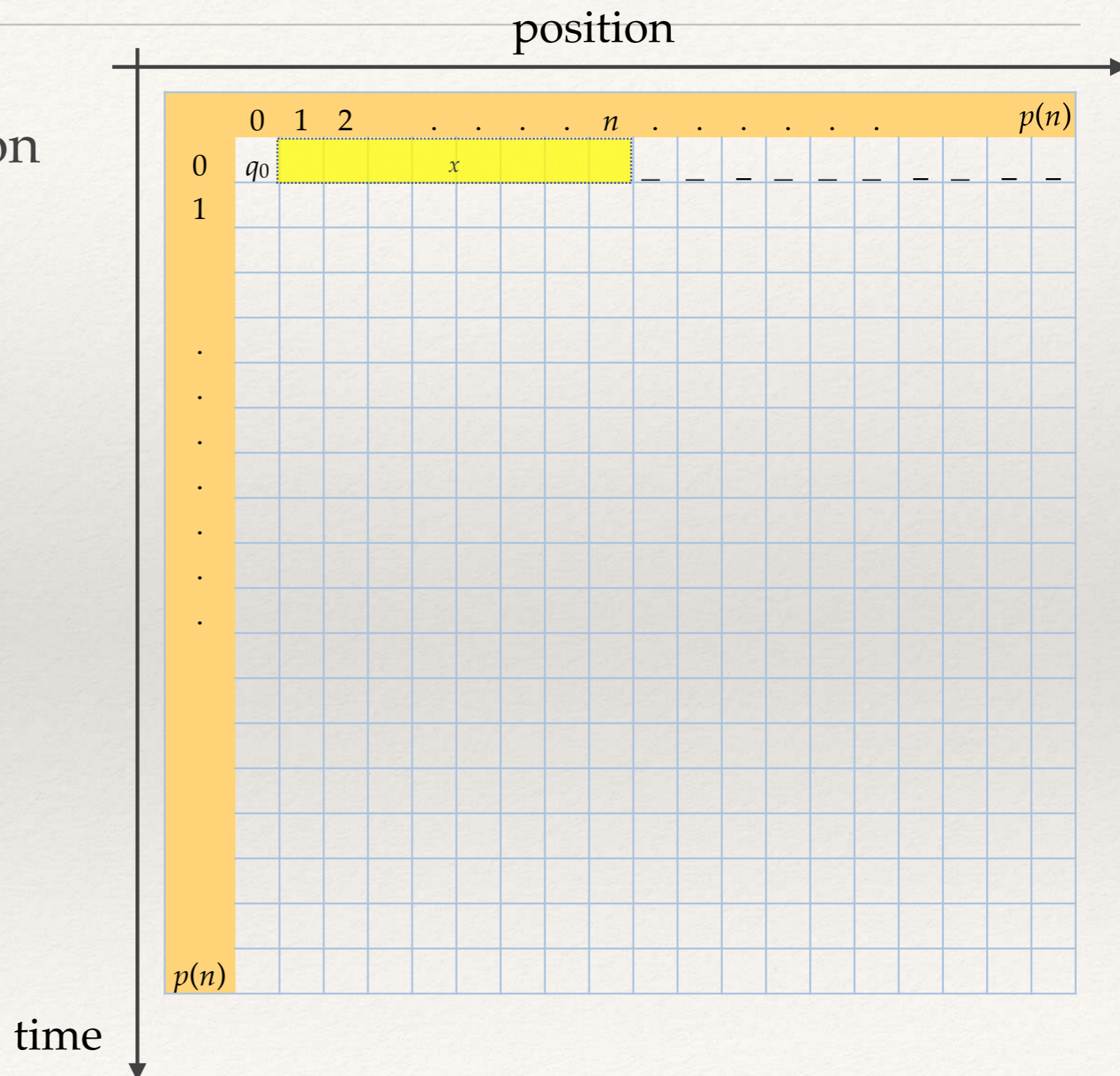
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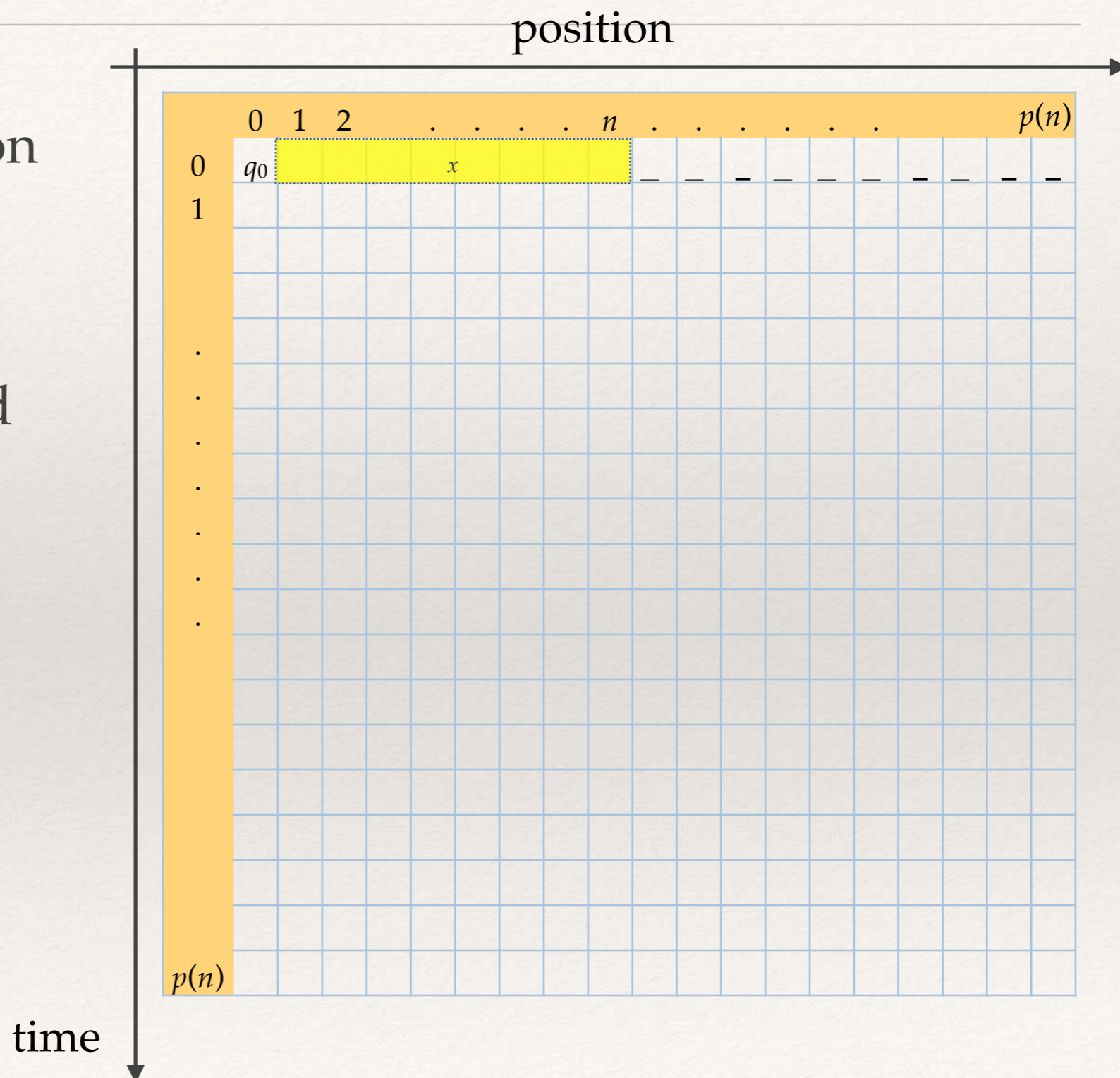
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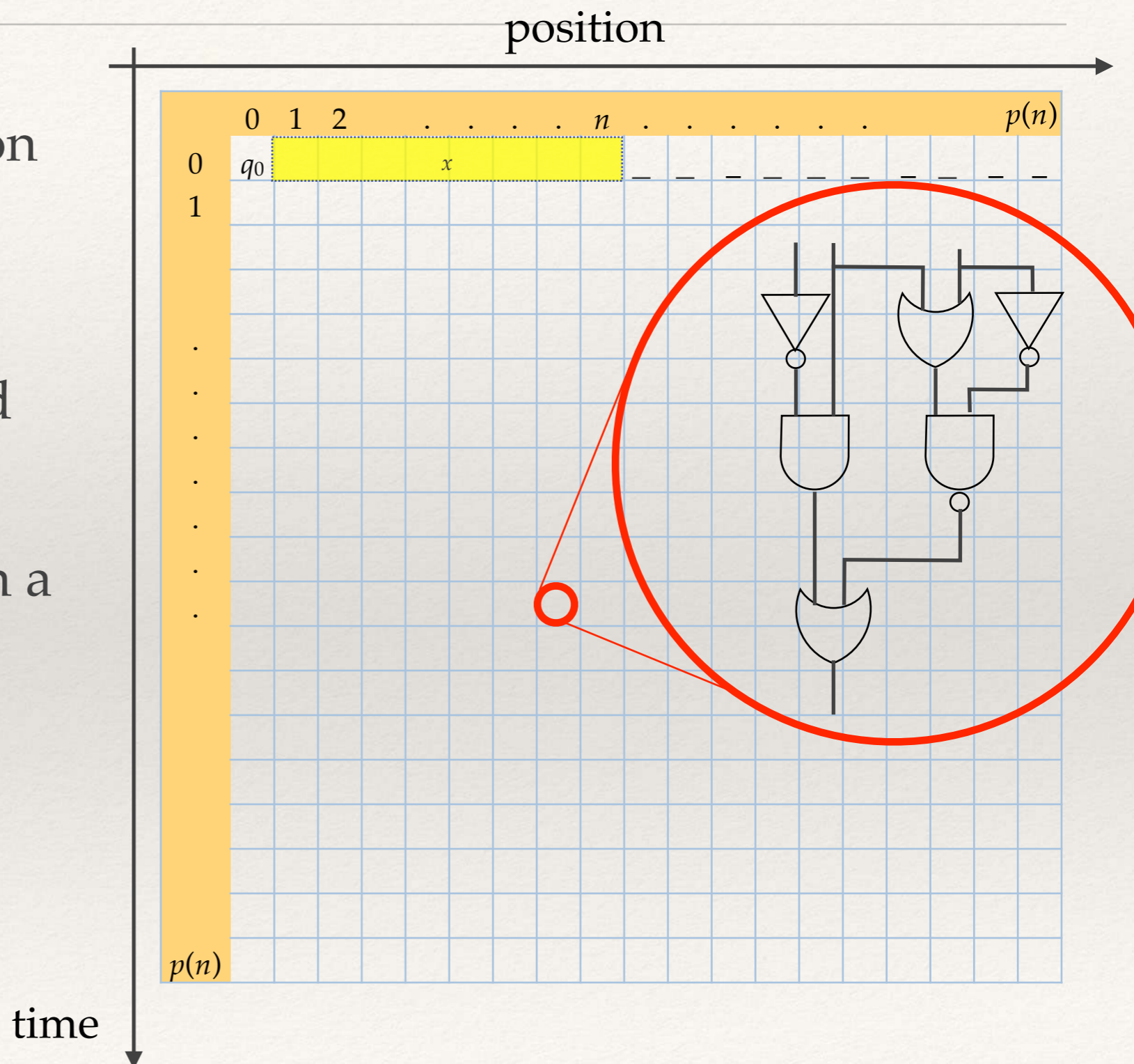
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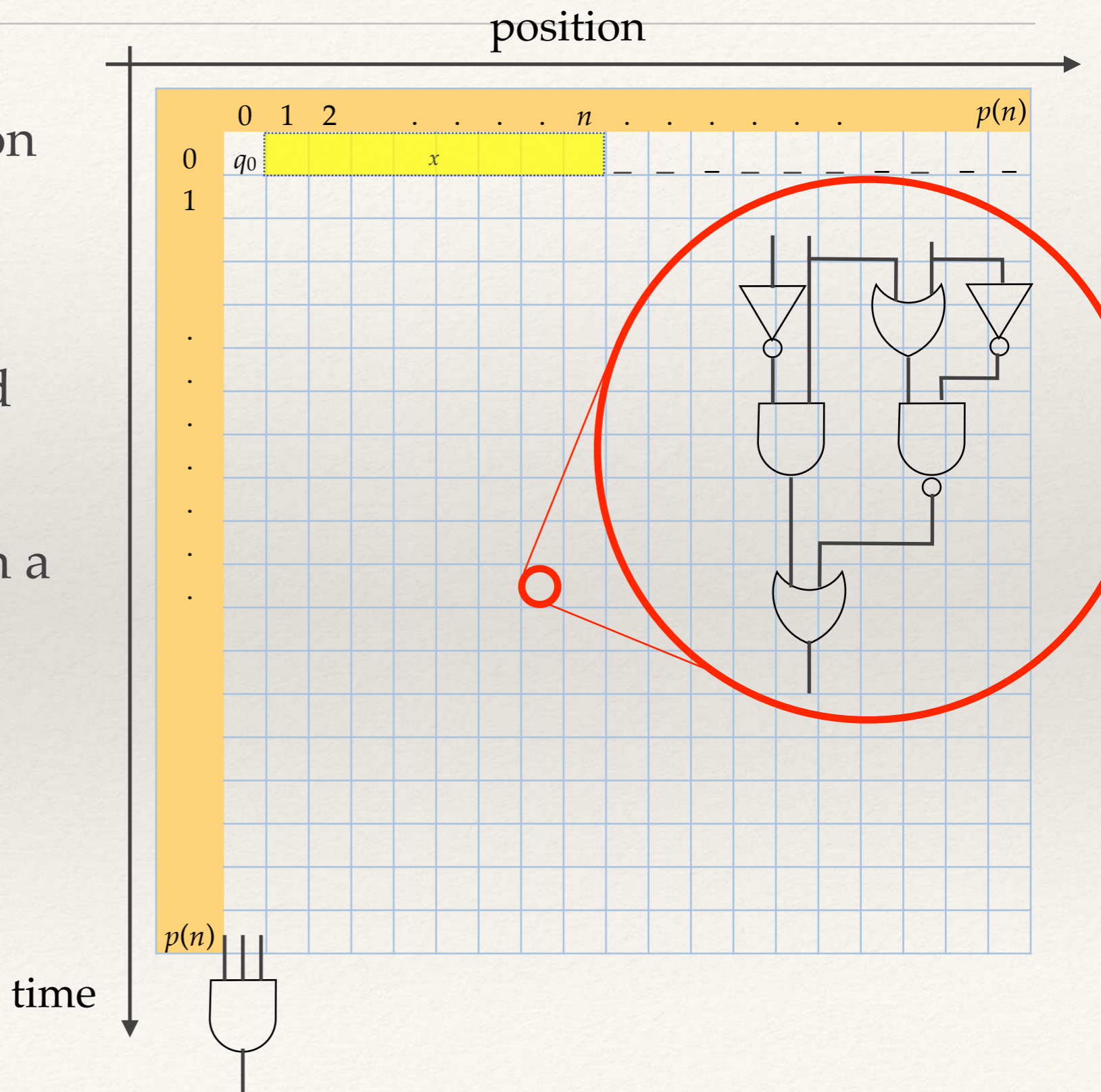
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⇒ **circuit piece** of cst size (replicated  $p(n)^2$  times)





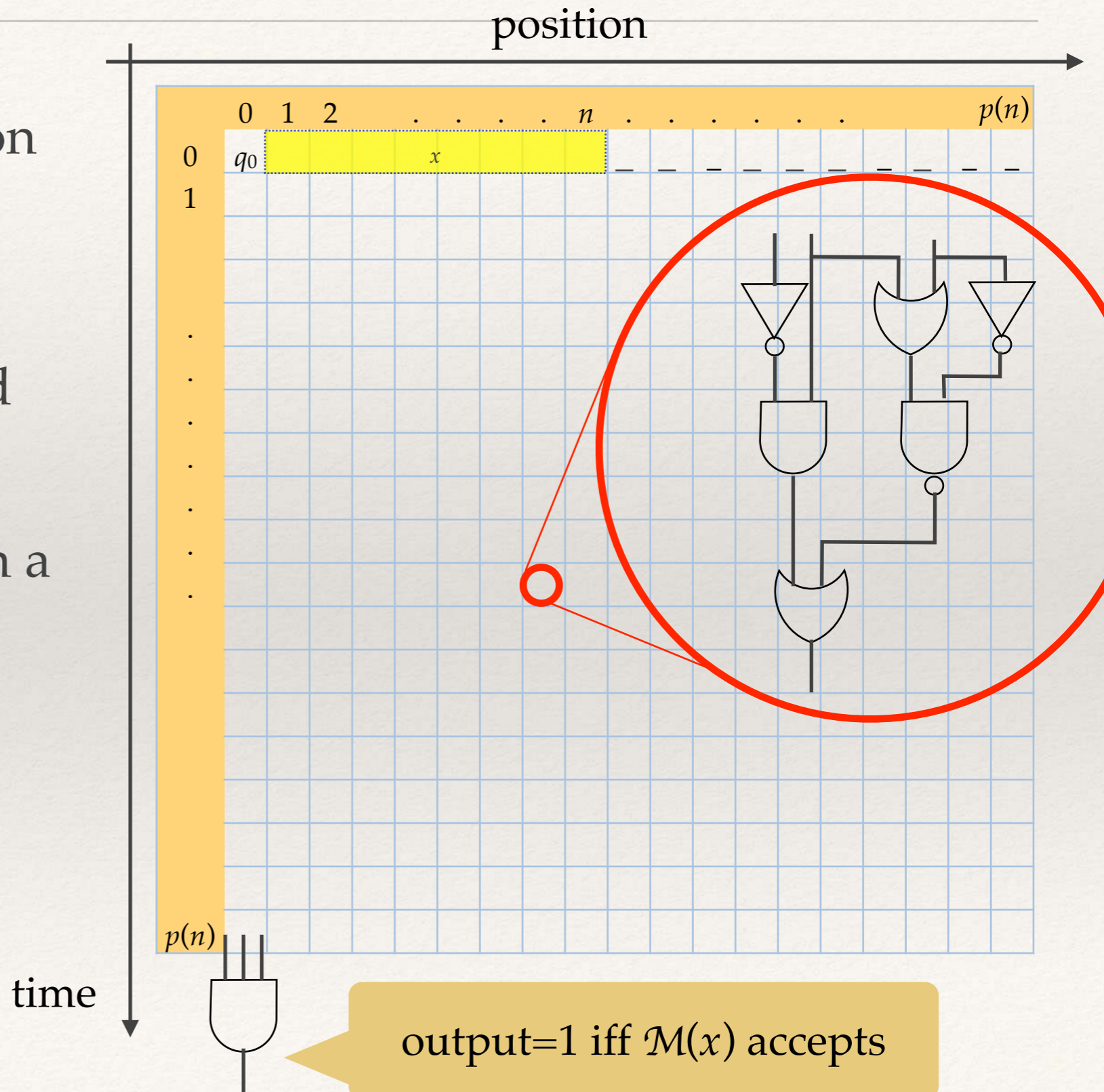
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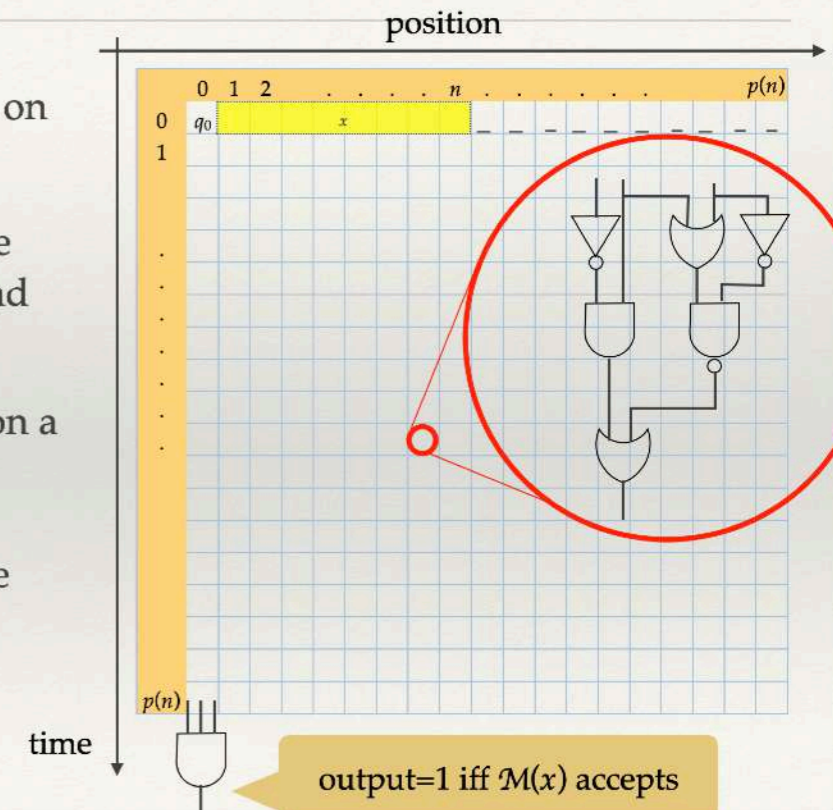


# Plenty of technical details...

- ❖ Each row encodes a config. of a **one-tape** TM  $\mathcal{M}$

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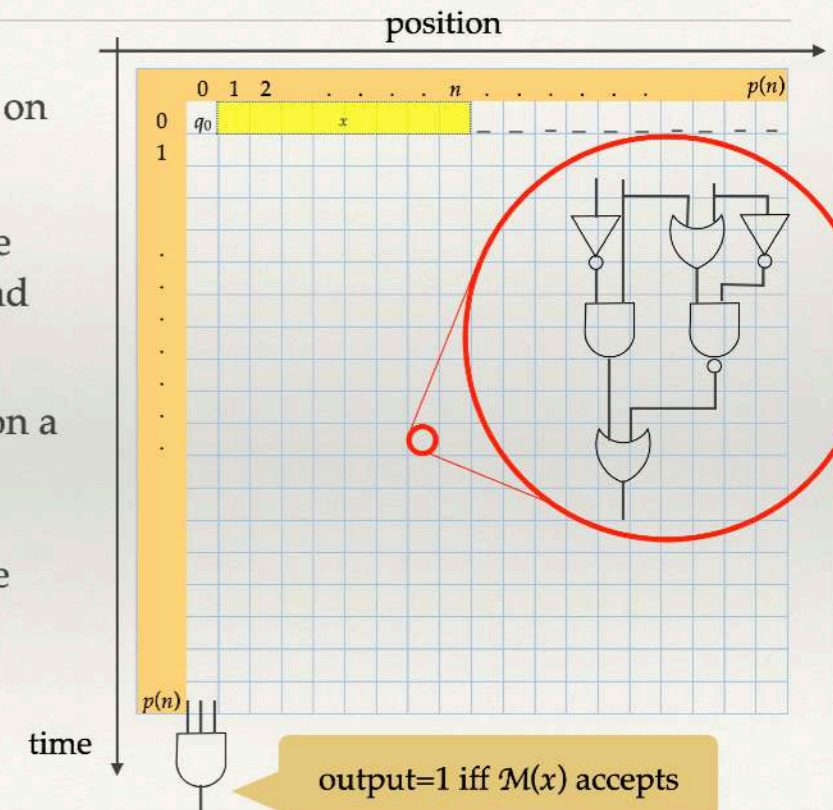


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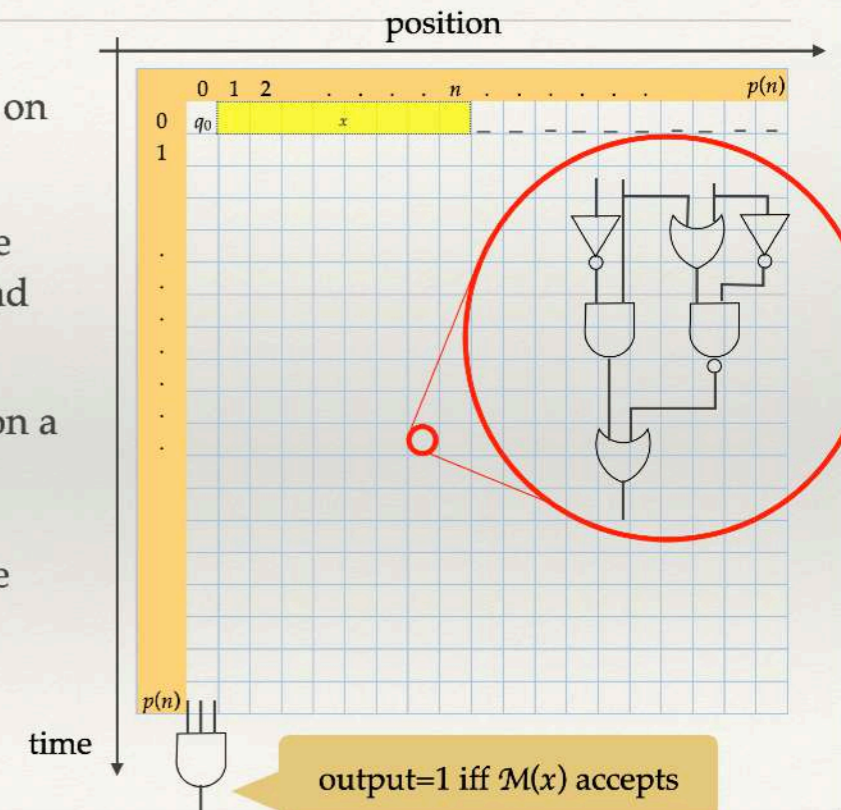


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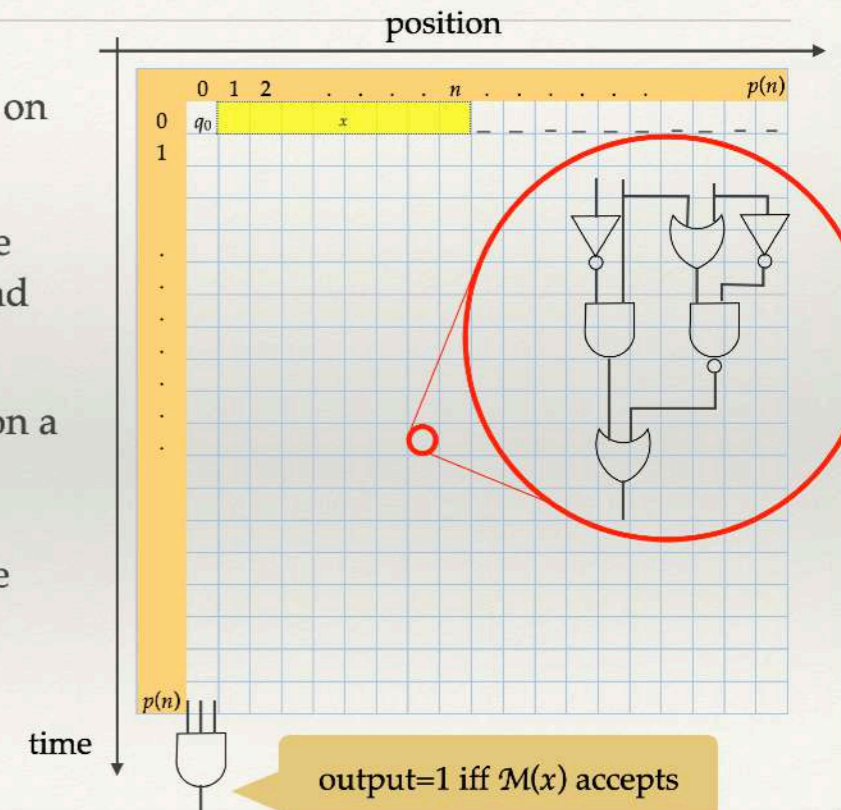


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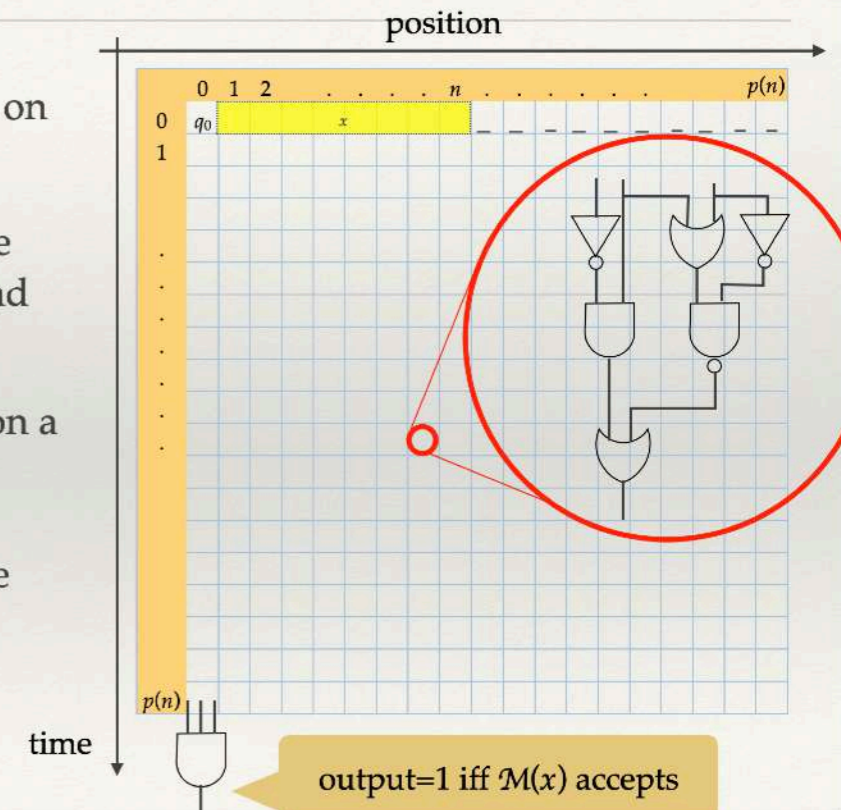


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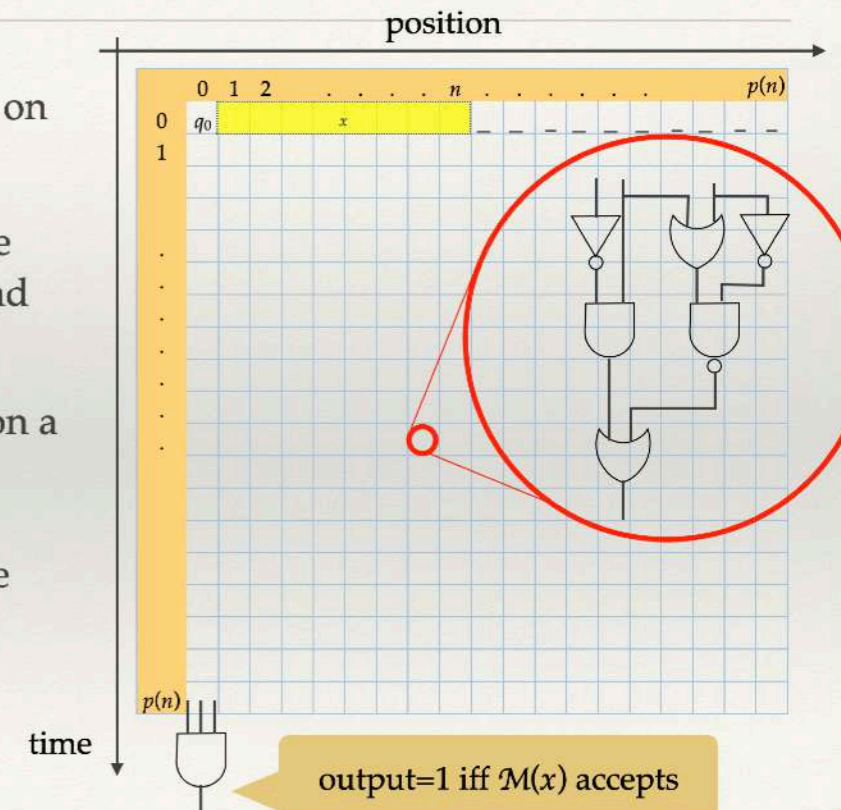
- ❖ Build the circuit in **logspace**: 2 nested loops from 0 to  $p(n)$ , with 2 **counters**

# An important remark

- ❖ We can precompile a circuit  $C_n$  with  $n$  free input wires
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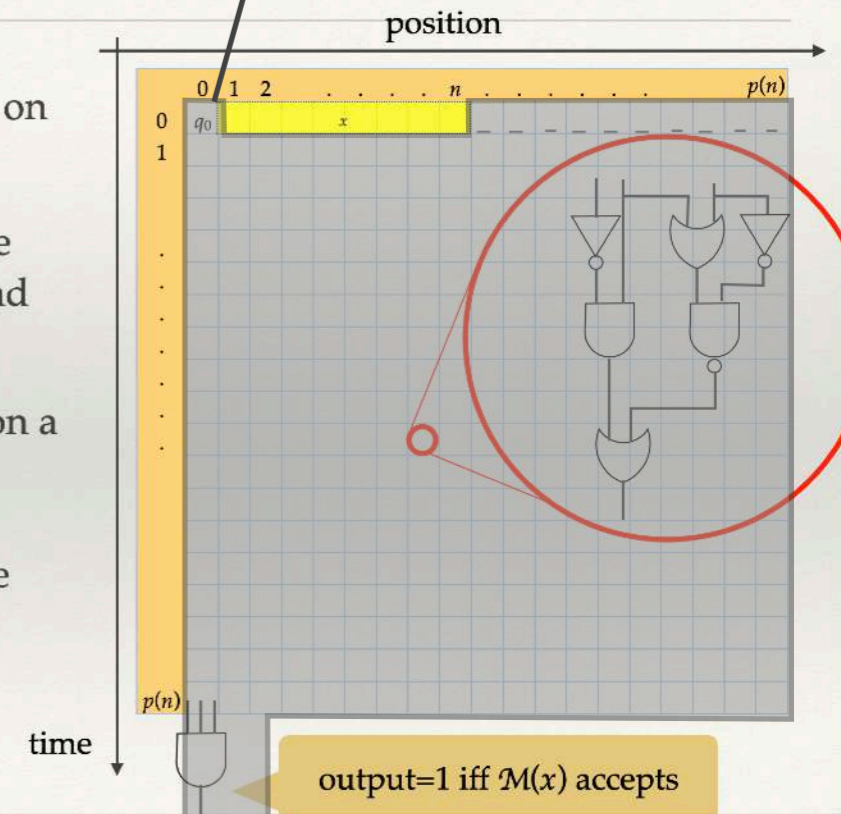


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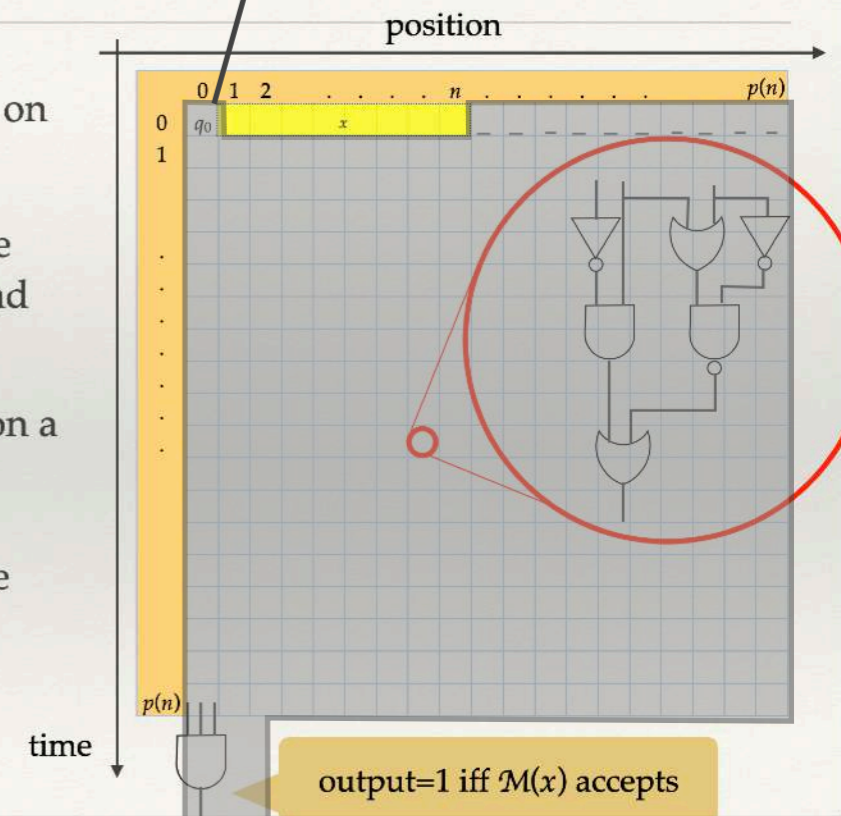


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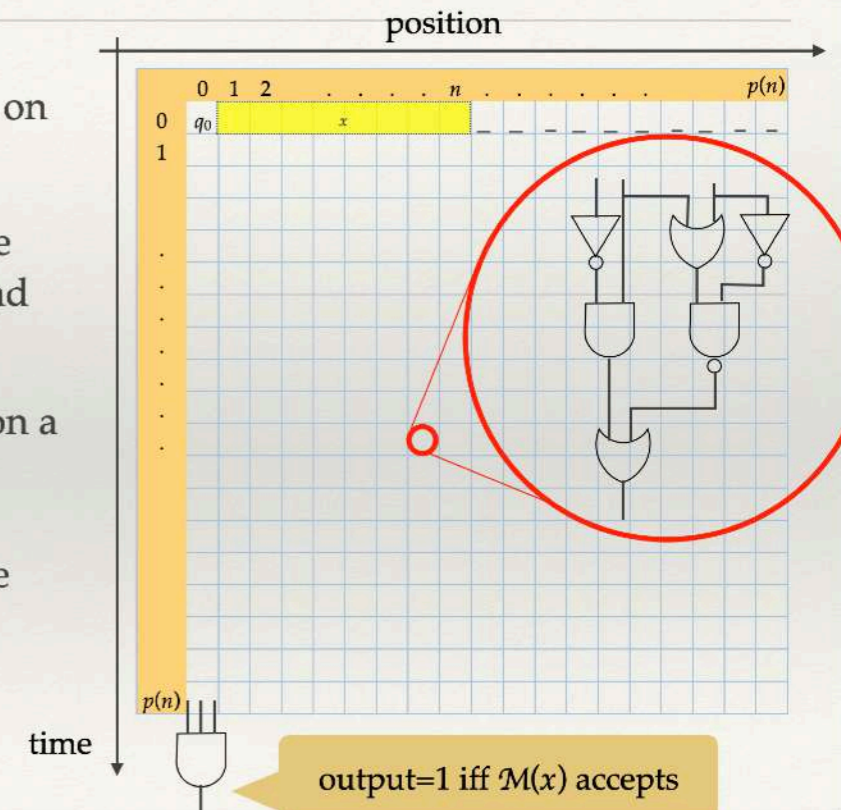


# Uniform P/poly

- ❖ A language  $L$  is in **uniform P/poly** iff for every  $n$ , one can build a circuit  $C_n$ 
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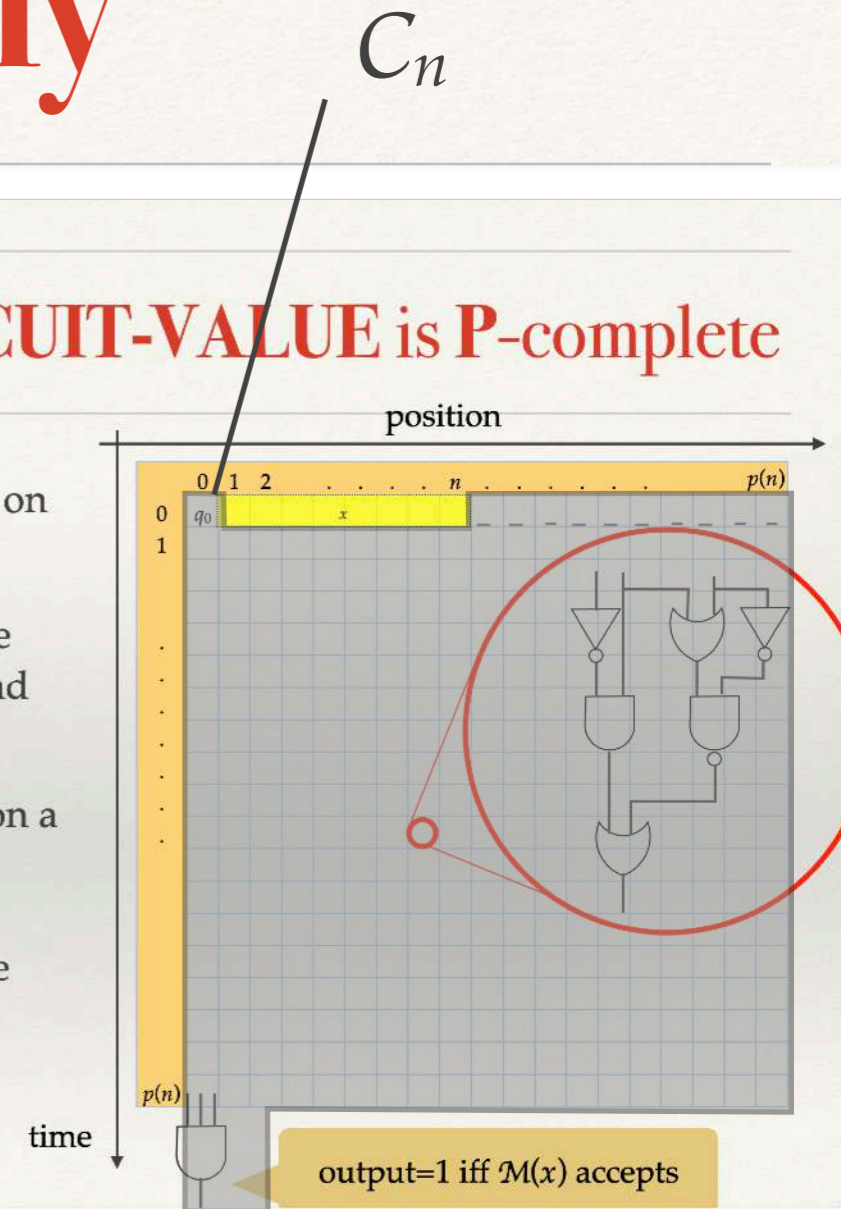


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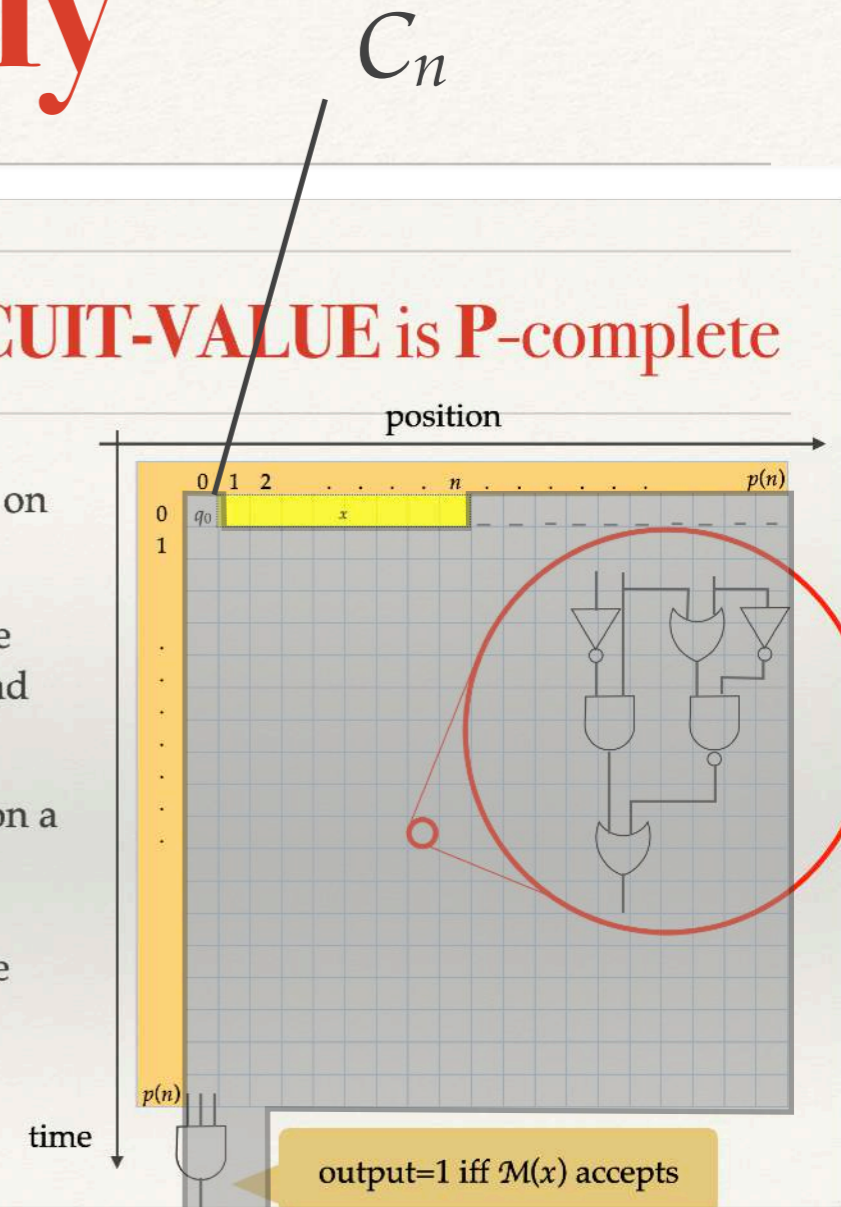
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❖ **Prop.  $P \subseteq$  uniform P/poly.**

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(This is what we have just proved!)

# $P = \text{Uniform } P/\text{poly}$

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- ❖ **Prop.  $P \subseteq \text{uniform } P/\text{poly}$ .**

- ❖ In fact:

**Prop.  $P = \text{uniform } P/\text{poly}$ .**

- ❖ *Proof.*

Let  $L \in \text{uniform } P/\text{poly}$ .

On input  $x$  (size  $n$ ),

compute  $C_n$  in space  $k \log n$ ,

hence in time  $O(n^k)$ .

Then evaluate  $C_n[x]$

in polytime.

Hence  $L \in P$ .

# (Non-uniform) P/poly

- ❖ A language  $L$  is in **uniform P/poly** iff for every  $n$ ,
  - one ~~can build~~ **there is** a circuit  $C_n$ 
    - ~~in space  $O(\log n)$~~  **of size  $p(n)$** , for some fixed polynomial  $p$
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- ❖ We no longer require to be able to **compute  $C_n$** !
- ❖ Familiarly, we say that  $L$  has **polynomial circuits**

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# P/poly

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- ❖ **Defn.** A language  $L$  is in **P/poly** iff there is a family  $(C_n)_{n \in \mathbb{N}}$  of circuits:
  - of size  $p(n)$  (for some fixed polynomial  $p$ )
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- ❖ It was initially hoped that we could prove that some **NP**-complete languages do **not** have polynomial circuits. That would immediately imply **P**  $\neq$  **NP**, since **P**  $\subseteq$  **P/poly**.

# P/poly is pretty weird

- ❖ **Prop.** P/poly contains some undecidable languages.

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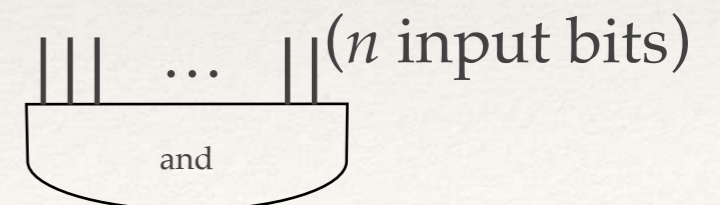
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(size  $n \log n$ : check the net-list!)

# Weird, too: advice strings

- ❖ Imagine you wish to decide whether  $x$  is in  $L$ .
- ❖ ... and you have a « cheat sheet »  $w_n$  depending only on  $n = \text{size}(x)$ .

How can this help?

Corpus ID: 115398060

## Turing machines that take advice

R. Karp, R. J. Lipton · Published 1982 · Computer Science





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# Advice strings and P/poly (1/2)

- ❖ **Prop.**  $L \in \mathbf{P/poly}$  iff there is a polytime TM  $\mathcal{M}$  and a family  $(w_n)_{n \in \mathbb{N}}$  of so-called **advice strings**:
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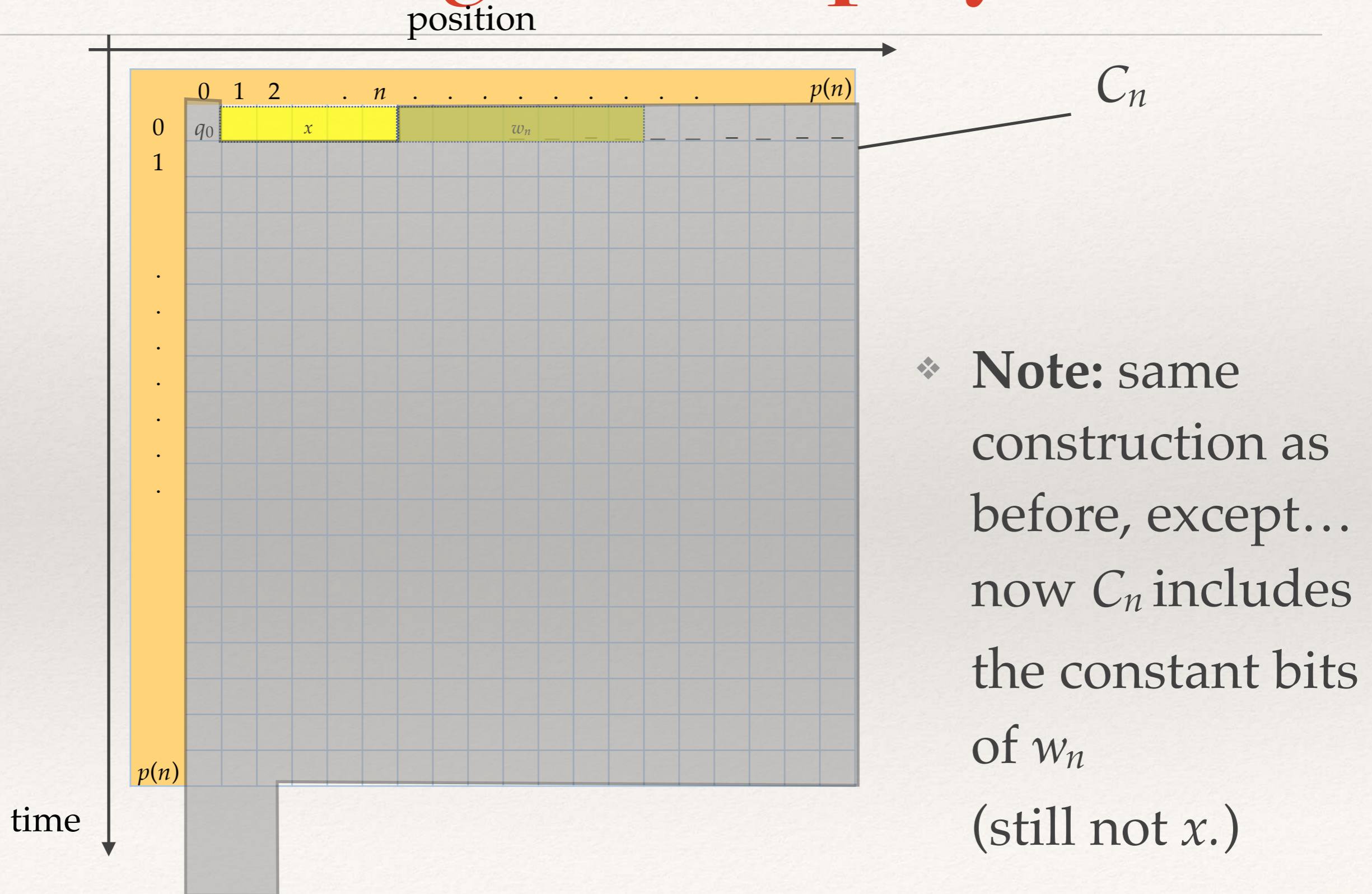
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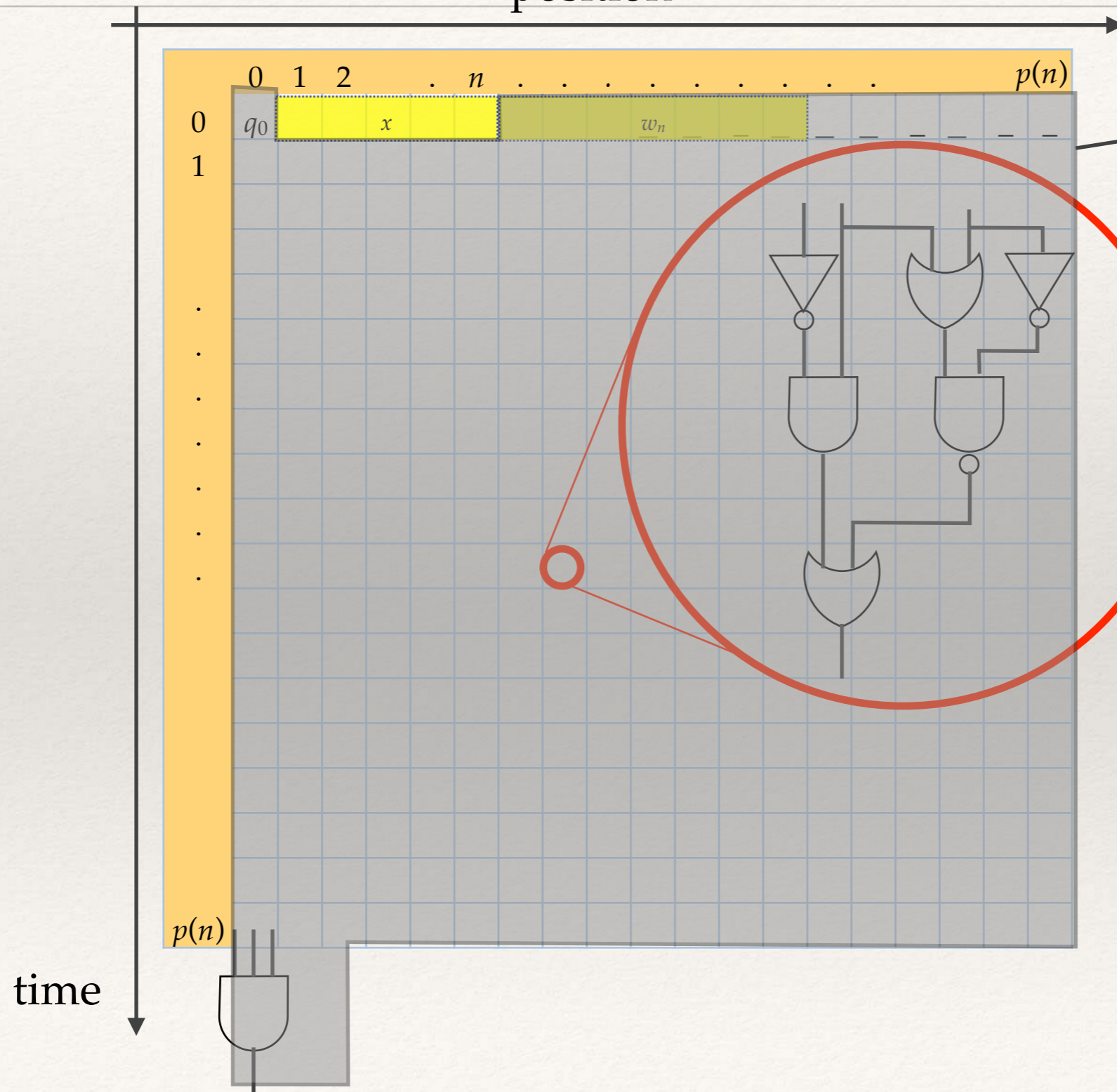
(see next slide)

# Advice strings and P/poly (2/2)



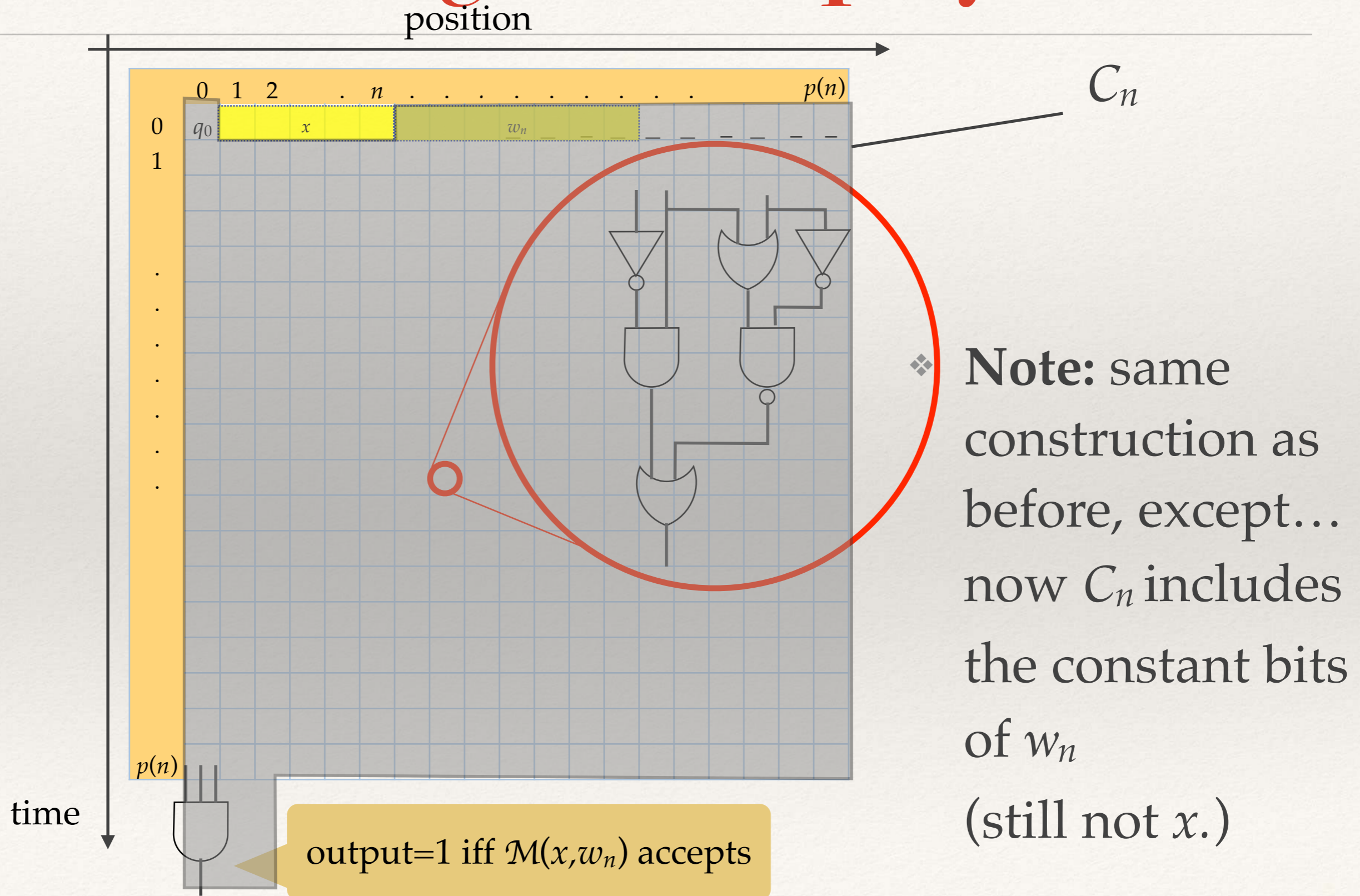
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# Adleman's Theorem

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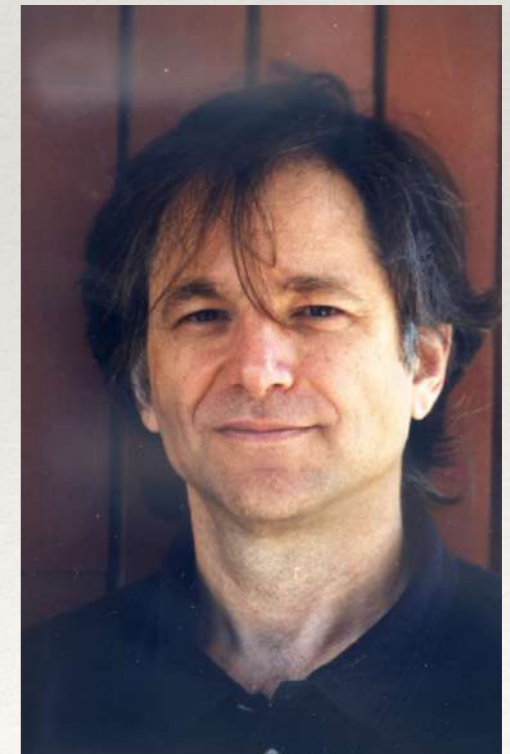
❖ Theorem (Prop. 1.20).  $BPP \subseteq P/poly$ .

DOI: 10.1109/SFCS.1978.37 • Corpus ID: 15176763

## Two theorems on random polynomial time

L. Adleman • Published 1978 • Computer Science •  
19th Annual Symposium on Foundations of Computer Science (sfcs 1978)

The use of randomness in computation was first studied in abstraction by Gill [4]. In recent years its use in both practical and theoretical areas has become apparent. Strassen and Solovay [10]; Miller [7]; and Rabin [8] have used it to transform primality testing into a (for many purposes) tractible problem. We can see in retrospect that it was implicit in algorithms by Berlekamp [2], Lehmer [6], and Cippola [3] (1903!). Where the traditional method of polynomial reduction has been... [CONTINUE READING](#)



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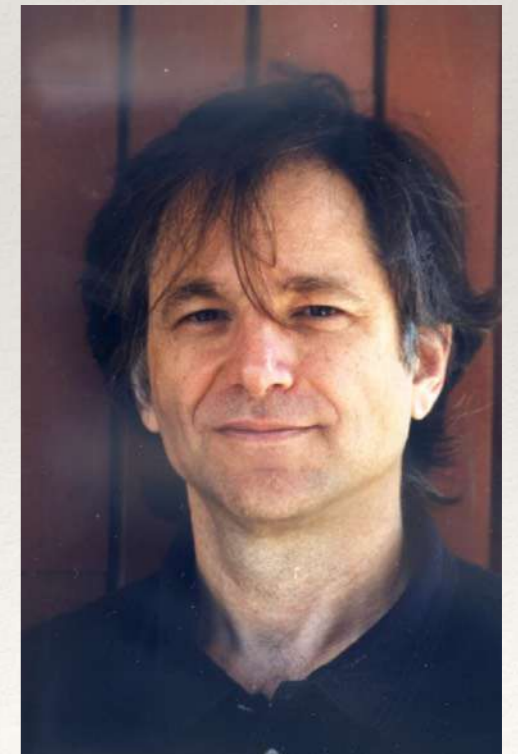
- ❖ **Theorem (Prop. 1.20).  $BPP \subseteq P/poly$ .**
- ❖ Interestingly, we will be able to show the **existence** of the circuits  $C_n$ , (or the advice strings) but we won't be able to **compute** them (efficiently).

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# The proof of Adleman's Theorem (1/2)

❖ Let  $L$  be in **BPP**.

A language  $L$  is in **BPP** if and only if there is a **polynomial-time** TM  $\mathcal{M}$  such that for every input  $x$  (of size  $n$ ):

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error  $\varepsilon =$   
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- ❖ ...  $< 1$  if we had the good taste to pick  $q(n)=n+1$ , say.



---

# The proof of Adleman's Theorem (2/2)

---

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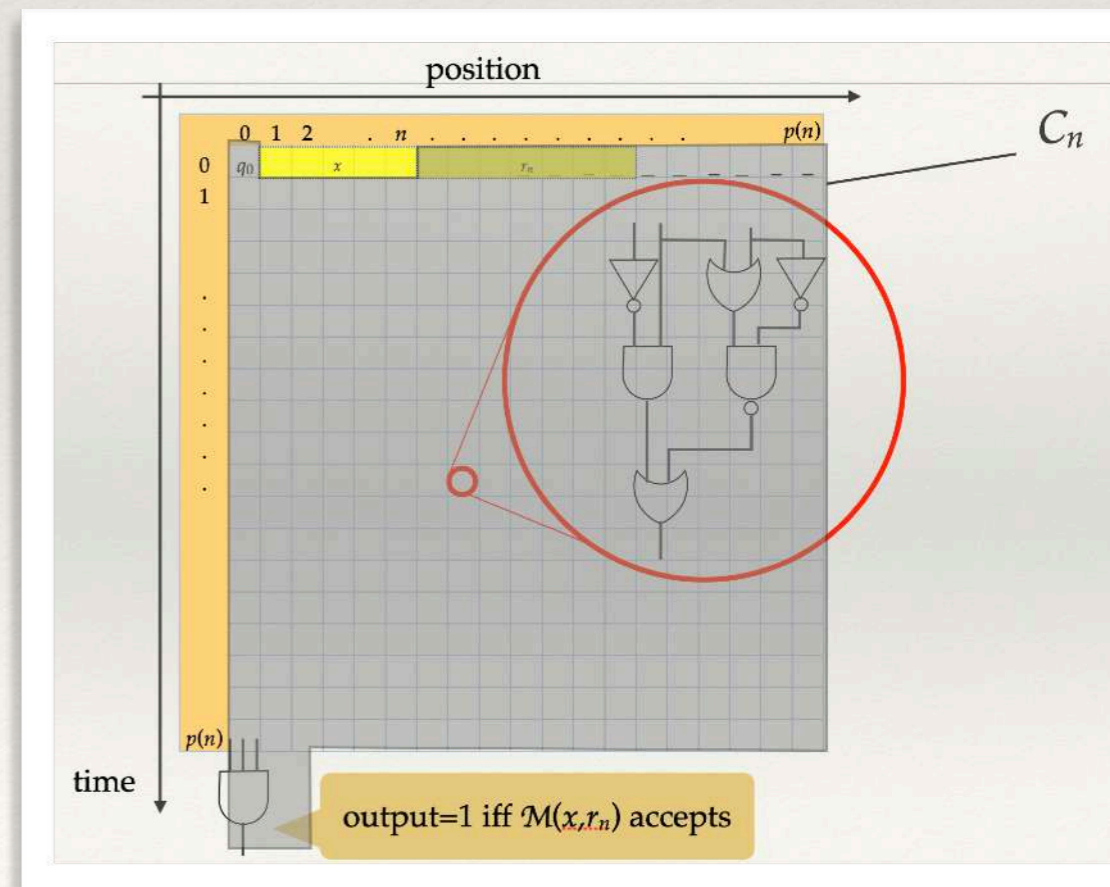
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❖ ... Just use  $r_n$  as advice string!  $\square$



# The Karp-Lipton Theorems, and consequences

(Yes, them again!)

Corpus ID: 115398060

## Turing machines that take advice

R. Karp, R. J. Lipton · Published 1982 · Computer Science



[https://upload.wikimedia.org/wikipedia/commons/thumb/3/3e/Karp\\_mg\\_7725-b.cr2.jpg/520px-Karp\\_mg\\_7725-b.cr2.jpg](https://upload.wikimedia.org/wikipedia/commons/thumb/3/3e/Karp_mg_7725-b.cr2.jpg/520px-Karp_mg_7725-b.cr2.jpg)

[https://cyber.gatech.edu/sites/default/files/styles/faculty\\_bio\\_pic/public/dick-lipton\\_1.jpg?itok=EkU43aPB](https://cyber.gatech.edu/sites/default/files/styles/faculty_bio_pic/public/dick-lipton_1.jpg?itok=EkU43aPB)

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- ❖ (Already argued last time, as part of the Sipser-Gács-Lautemann theorem.)

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❖  $3 \Rightarrow 2$ , and therefore  $3 \Rightarrow 1$ : similar.  $1 \Rightarrow 2$ : obvious.  $\square$

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---

- ❖ We say that **PH collapses at level 2** iff  $\Sigma P_2 = \Pi P_2$ .  
By the previous claim, equivalent to  $\Pi P_2 \subseteq \Sigma P_2$ .
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# The first Karp-Lipton theorem

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- ❖ **Theorem (Prop. 1.21).** If  $\text{NP} \subseteq \text{P/poly}$ , then the polynomial hierarchy collapses at level 2:  $\Pi\text{P}_2 \subseteq \Sigma\text{P}_2$ .
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We can permute quantifiers,  
because  $C_{\text{size}(x,y)} = C_{n+p(n)+3}$  does **not** depend on  $y$ .

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- ❖  $L = \{x \mid \forall y \text{ of size } p(n), C_{\text{size}(x,y)}[(x,y)]=1\}$
- ❖  $= \{x \mid \exists \text{poly size } C, \forall y \text{ of size } p(n), C[(x,y)]=1\}$   
 $\in \Sigma\mathbf{P}_2$ .

Where is the bug?

We can permute quantifiers,  
because  $C_{\text{size}(x,y)}=C_{n+p(n)+3}$  does **not** depend on  $y$ .

# The first Karp-Lipton theorem

❖ **Theorem (Prop. 1.21).** If  $\mathbf{NP} \subseteq \mathbf{P/poly}$ , then the polynomial hierarchy collapses at level 2:  $\Pi\mathbf{P}_2 \subseteq \Sigma\mathbf{P}_2$ .

❖ Let me give you a **wrong** argument first. (We will repair it later.)

❖ Let  $L \in \Pi\mathbf{P}_2$  be  $\{x \mid \forall y \text{ of size } p(n), (x,y) \in L'\}$ ,  $L' \in \mathbf{NP}$ .

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Hint: this is  $\Sigma^*$ , not  $L$   
(just take the constant circuit 1 for  $C$  here)

We can permute quantifiers,  
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---

# The bug

---

❖  $L = \{x \mid \forall y \text{ of size } p(n), C_{\text{size}(x,y)}[(x,y)]=1\}$

$\neq \{x \mid \exists \text{poly size } C, \forall y \text{ of size } p(n), C[(x,y)]=1\}$ :

here we trust some divine (all-powerful) being Merlin to give us the magical circuit  $C_{\text{size}(x,y)}$  for  $C...$



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- ❖ ... but what prevents it from **cheating**?

We must **check** that the circuit  $C$  it gives us does the job.

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# A thought experiment

---

- ❖ Imagine you want to solve **SAT**.  
You are given a clause set  $S$ ,  
and you ask Merlin: « is  $S$  satisfiable? »
- ❖ Merlin answers: « yes »
- ❖ What can you conclude?



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- ❖ Merlin answers: « yes »
- ❖ What can you conclude?
- ❖ Of course, nothing.





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- ❖ Merlin answers: ~~«yes»~~  $q$
- ❖ You check  $q \models S$ , **accept** if this is true, **reject** otherwise.
- ❖ If  $S$  satisfiable, then Merlin can make you accept.  
Otherwise, you will necessarily reject.



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# Self-reducibility

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- ❖ Now Merlin complains he can only decide whether  $S$  is satisfiable (using circuits  $C_n$ ), **not** find a satisfying  $\varphi$

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# Self-reducibility

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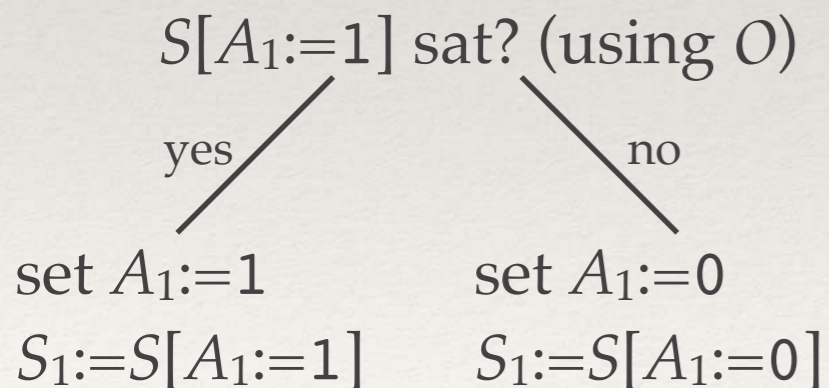
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- ❖ You retort that **SAT is self-reducible**:  
Given an oracle  $O$  deciding satisfiability, one can compute  $\varphi$  such that  $\varphi \models S$  (if any).

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# Self-reducibility

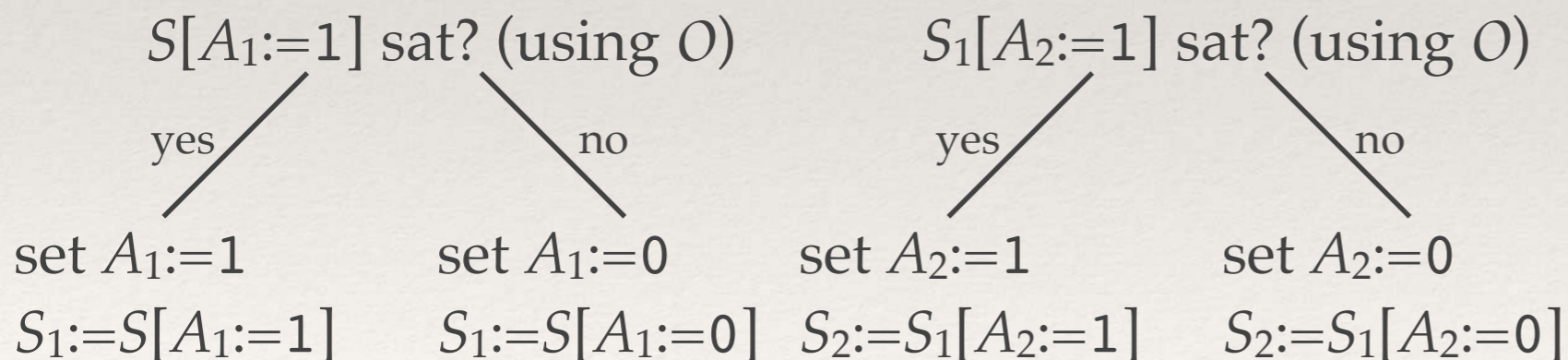
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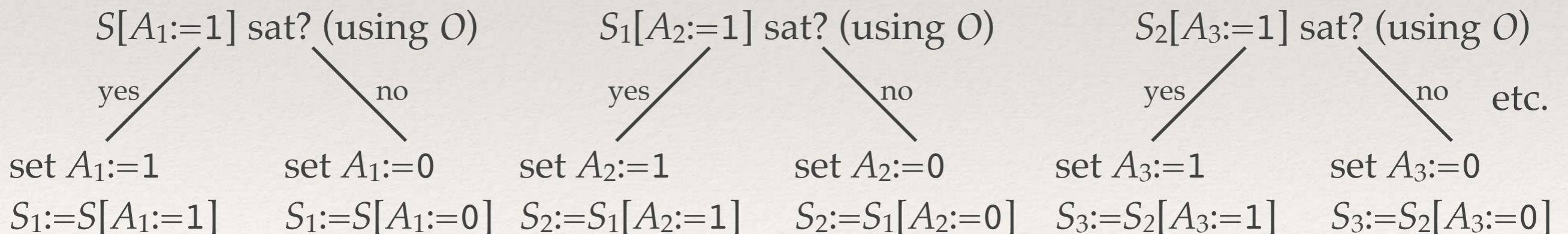
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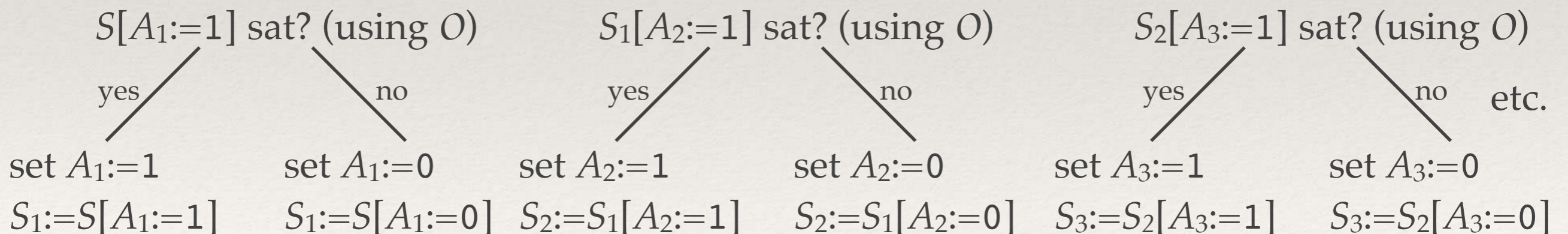
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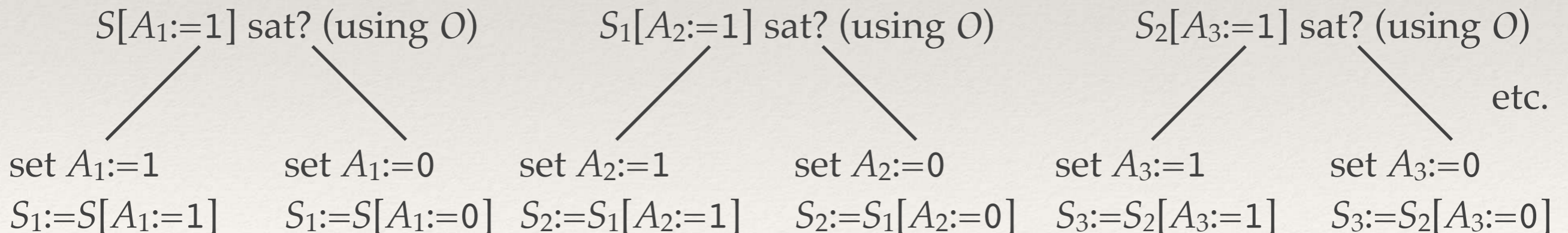
Call this the « **self-reducibility machine** »

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# Self-reducibility

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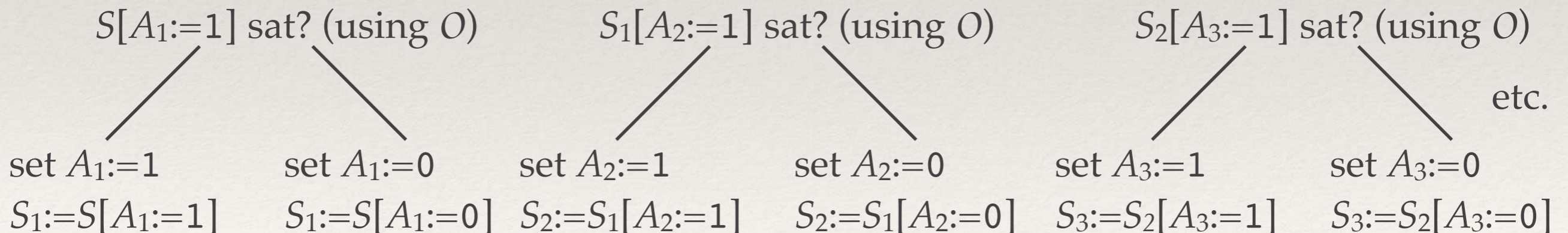
- ❖ Instead of an oracle  $O$ , Merlin will use circuits  $C_m$  on clause sets  $S, S_1, S_2, \dots$ , of various sizes  $m$ .



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# Self-reducibility

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- ❖  $m$  is bounded by  $n = \text{size}(S)$   
 (e.g.,  $S[A:=1]$  is obtained by removing clauses in which  $+A$  appears, and removing  $-A$  in the remaining clauses)



Call this the « **self-reducibility machine** »

---

# A circuit for self-reducibility

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- ❖ Now given (net-lists for)  $C_0, C_1, \dots, C_n$  as **advice**  $w_{0\dots n}$

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  - returning an environment  $\varrho$
  - satisfying  $S$ , if  $S$  is satisfiable and Merlin is **honest** (i.e., plays using the above advice  $w_{0\dots n}$  for  $w$ )

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by the way, not quite the trick used in the lecture notes



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# Karp-Lipton: the proof (1/3)

---

- ❖ **Theorem (Prop. 1.21).** If  $\mathbf{NP} \subseteq \mathbf{P/poly}$ , then the polynomial hierarchy collapses at level 2:  $\Pi\mathbf{P}_2 \subseteq \Sigma\mathbf{P}_2$ .
- ❖ Let  $L \in \Pi\mathbf{P}_2$  be  $\{x \mid \forall y \text{ of size } p(n), (x,y) \in L'\}$ ,  $L' \in \mathbf{NP}$ .

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- ❖ Hence  $L = \{x \mid \forall y \text{ of size } p(n), f(x,y) \in \mathbf{SAT}\}$

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# Karp-Lipton: the proof (2/3)

---

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size of advice polynomial in  $n=\text{size}(x)$

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# Karp-Lipton: the proof (3/3)

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- ❖ Let  $L'' = \{(x,w) \mid \exists y \text{ of size } p(\text{size}(x)), \mathcal{M}((x,y), w) \text{ accepts}\}$   
This is in  $\mathbf{NP}$ , hence has polynomial circuits  $C_n$ , too!

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This is in  $\mathbf{NP}$ , hence has polynomial circuits  $C_n$ , too!
- ❖ So  $L = \{x \mid C_{\text{appropriate size}}[(x, w_{\text{size}(x,y)})]=1\}$

# The second Karp-Lipton theorem

- ❖ **Theorem (Prop. 1.22).** If  $\mathbf{NP} \subseteq \mathbf{P/poly}$ , then  $\mathbf{PH} \subseteq \mathbf{P/poly}$ .
- ❖  $L = \{x \mid \exists y \text{ of size } p(n), \mathcal{M}((x,y), w_{\text{size}(x,y)}) \text{ accepts}\}$   
for some poly time TM  $\mathcal{M}$  (from last slide)
- ❖ Let  $L'' = \{(x,w) \mid \exists y \text{ of size } p(\text{size}(x)), \mathcal{M}((x,y), w) \text{ accepts}\}$   
This is in  $\mathbf{NP}$ , hence has polynomial circuits  $C_n$ , too!
- ❖ So  $L = \{x \mid C_{\text{appropriate size}}[(x, w_{\text{size}(x,y)})] = 1\}$

size of  $x$  + cst + size of  $w_{\text{size}(x,y)} \dots$   
polynomial in  $n = \text{size}(x)$

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# The second Karp-Lipton theorem

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size of  $x$  + cst + size of  $w_{\text{size}(x,y)} \dots$   
polynomial in  $n = \text{size}(x)$

❖ Hence  $L$  is decided by the circuits

$C_{\text{appropriate size}}[(\_, w_{\text{size}(x,y)})]$  □

(all sizes depending only on  $n = \text{size}(x)$ , not on  $x$  itself)

# Conclusion

# BPP cannot be too large

- ❖ **Corollary.** If BPP contains NP, then:
  - PH collapses at level 2 (unlikely)
  - and is included in P/poly.

- ❖ *Proof.*

## Adleman's Theorem

Theorem (Prop. 1.20).  $BPP \subseteq P/poly$ .

## The first Karp-Lipton theorem

Theorem (Prop. 1.21). If  $NP \subseteq P/poly$ , then the polynomial hierarchy collapses at level 2:  $\Pi P_2 \subseteq \Sigma P_2$ .

## The second Karp-Lipton theorem

Theorem (Prop. 1.22). If  $NP \subseteq P/poly$ , then  $PH \subseteq P/poly$ .