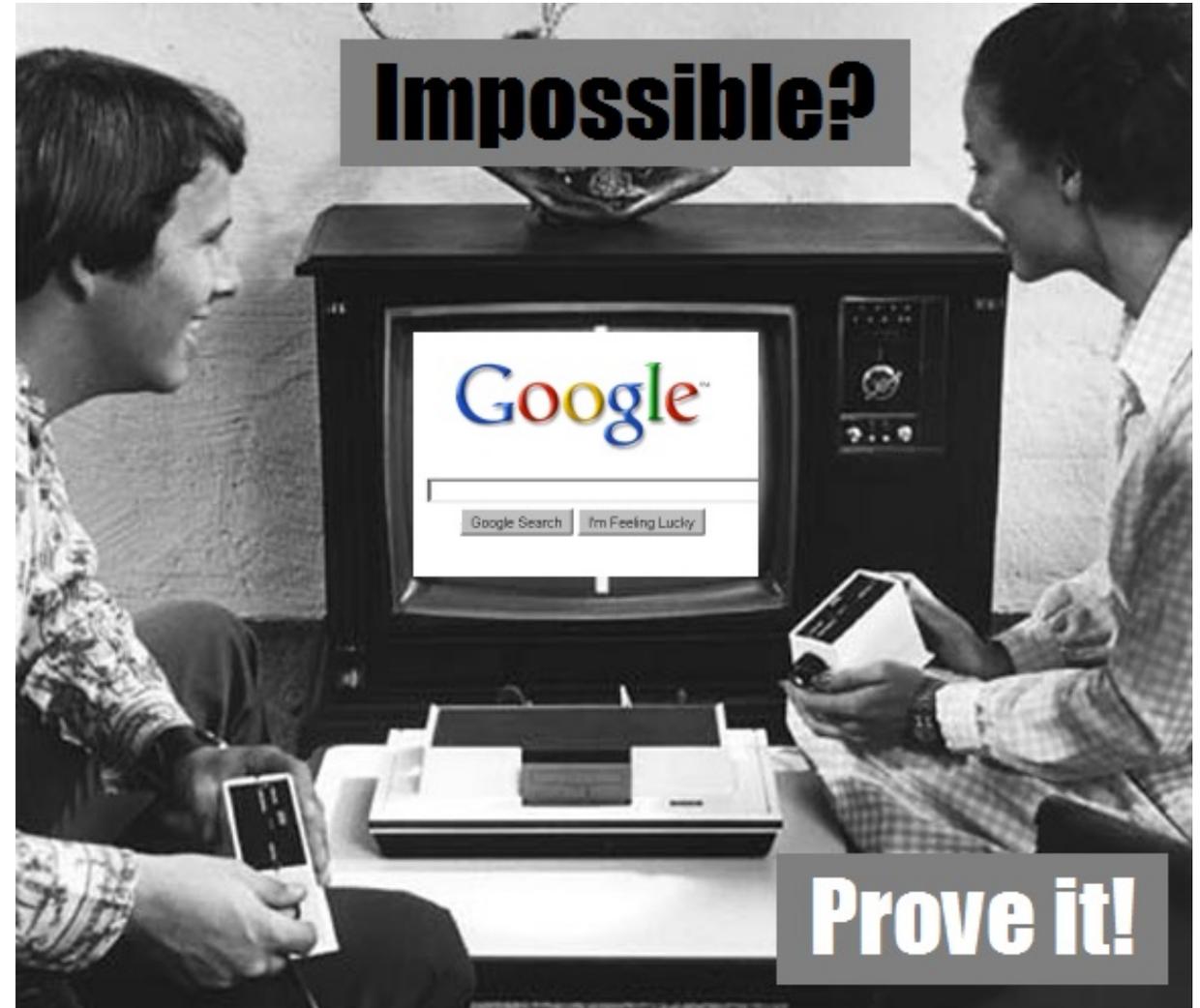


Why do lower bounds stop “just before” proving major results?

Emanuele Viola

Northeastern University



3

2

1

Outline

- **History, conjectures, and upper bounds**
- The lower bounds we have are best?
- A basic obstacle (what to work on tonight)
- Some recent connections and results

Multiplication of n-digit integers



- Feeling: “As regards number systems and calculation techniques, it seems that the final and best solutions were found in science long ago”
- In 1950's, Kolmogorov conjectured time $\Omega(n^2)$
Started a seminar with the goal of proving it



Multiplication of n-digit integers

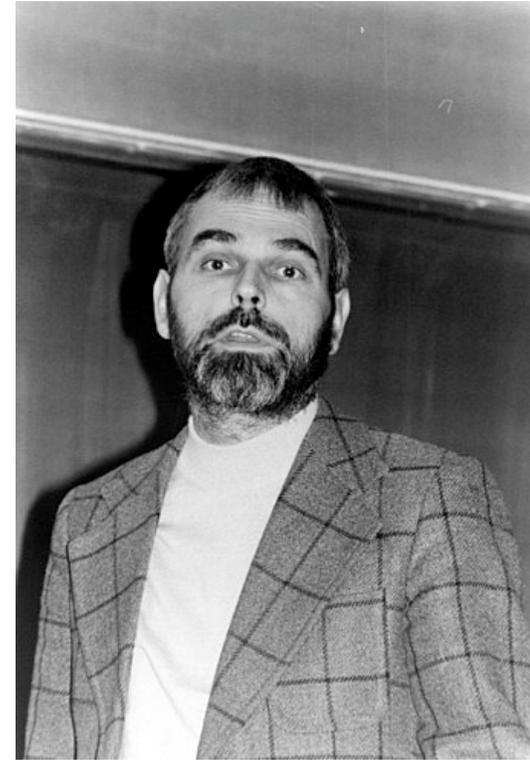


- Feeling: “As regards number systems and calculation techniques, it seems that the final and best solutions were found in science long ago”
- In 1950's, Kolmogorov conjectured time $\Omega(n^2)$
Started a seminar with the goal of proving it
- One week later, $O(n^{1.59})$ time by Karatsuba
- [..., 2019] Harvey & van der Hoeven $O(n \cdot \log(n))$

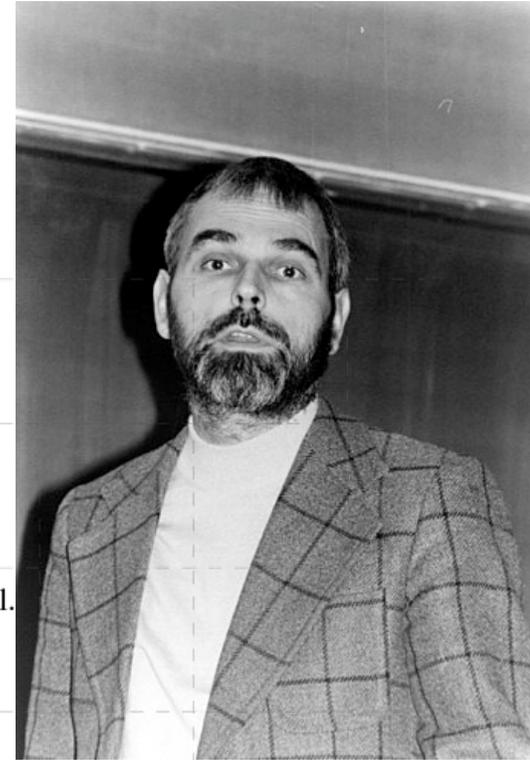


Multiplication of $n \times n$ matrices

1968 Strassen working to prove $\Omega(n^3)$



Multiplication of $n \times n$ matrices



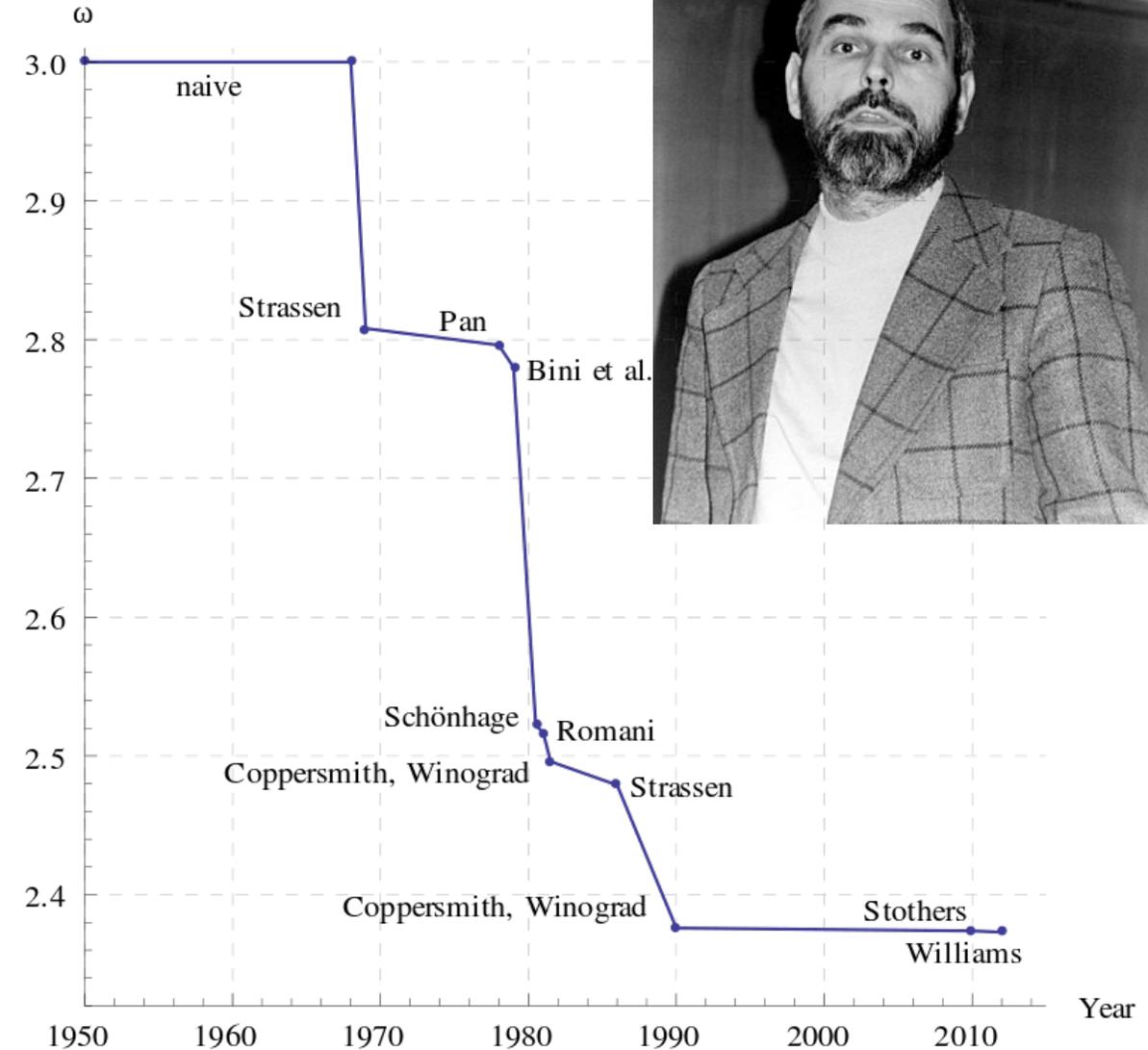
1968 Strassen working to prove $\Omega(n^3)$

1969: Volker Strassen.

Gaussian elimination is not optimal.

Numer. Math., 13:354–356, 1969.

$O(n^{2.81})$ algorithm



Proving lower bounds for linear transformations

Problem: Give explicit $n \times n$ matrix such that
linear transformation requires $\omega(n)$ size circuits

1970 Valiant:

Fourier transform matrix is a **super-concentrator**

Conjecture: Super-concentrators require $\omega(n)$ wires



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Conjecture: Super-concentrators require $\omega(n)$ wires

Later, Valiant: Super-concentrators with $O(n)$ wires exist



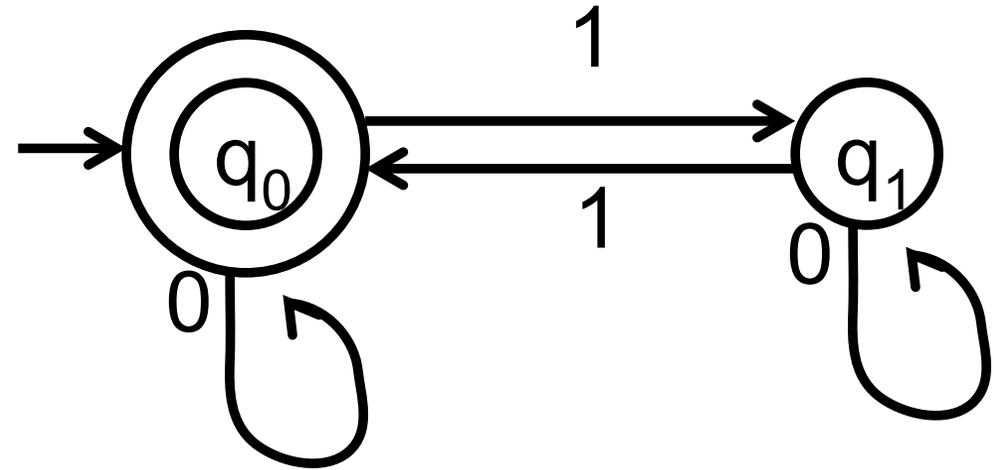
Space-bounded

Finite-state automata read input left to right

Theorem: Can't recognize palindromes

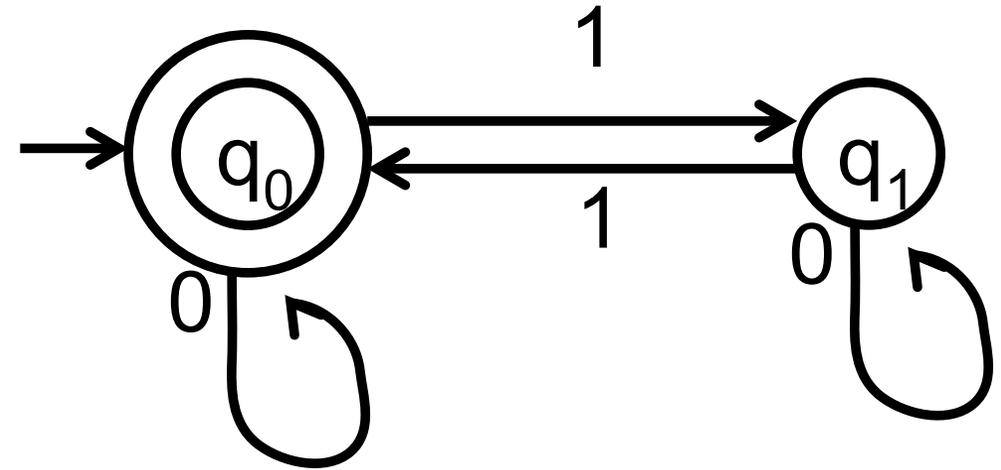
Let's allow them to read bits multiple times

Conjecture 1983 [Borodin, Dolev, Fich, Paul] Can't compute majority efficiently



Space-bounded

Finite-state automata read input left to right



Theorem: Can't recognize palindromes

Let's allow them to read bits multiple times

Conjecture 1983 [Borodin, Dolev, Fich, Paul] Can't compute majority efficiently

Mix Barrington 1989: Can compute Majority (and NC^1)



Boolean circuits

Universal hash functions [Carter Wegman 79]

Conjecture 1990 [Mansour Nisan Tiwari]

Require super-linear size circuits

Boolean circuits

Universal hash functions [Carter Wegman 79]

Conjecture 1990 [Mansour Nisan Tiwari]

Require super-linear size circuits

Theorem 2008 [Ishai Kushilevitz Ostrovsky Sahai]

Linear-size suffices

Conjecture $P \neq NP$

Outline

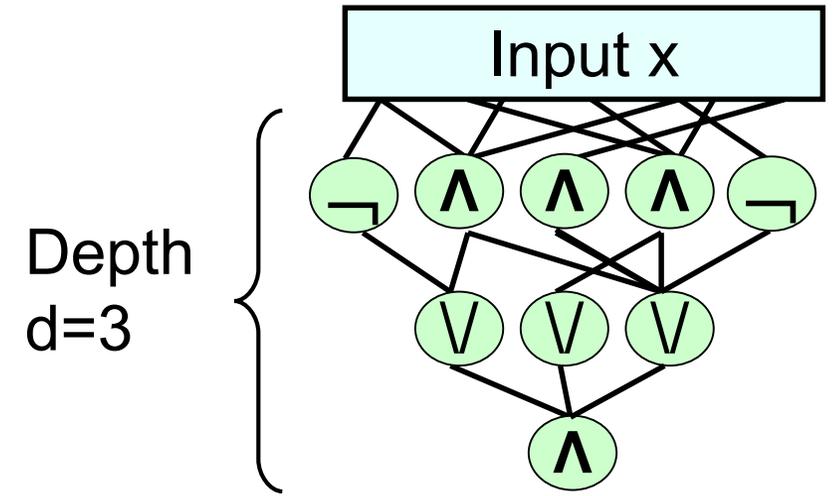
- History, conjectures, and upper bounds
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AC^0 circuits

- Depth-d, And-Or-Not circuits (AC^0)

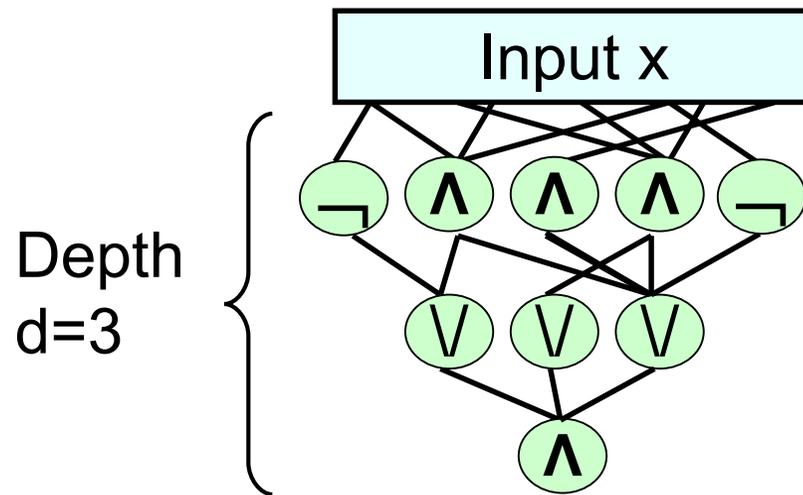
- $2^{n^{\Omega(\frac{1}{d})}}$ lower bounds [80's: Furst Saxe Sipser, Ajtai, Yao, Hastad,...]

- Why not stronger bounds?



AC^0 circuits

- Depth- d , And-Or-Not circuits (AC^0)



- $2^{n^{\Omega(\frac{1}{d})}}$ lower bounds [80's: Furst Saxe Sipser, Ajtai, Yao, Hastad,...]
- Why not stronger bounds?
- Logarithmic space (L) has circuits of size $2^{n^{O(\frac{1}{d})}}$
 \Rightarrow 80's bounds are best without proving **major result** ($P \neq L$)
- Improvement for $d = 3$ already implies new results for space

Similar phenomenon

- Similar situation in many other models, for example:
- **Threshold circuits:**
 - [90's Impagliazzo Paturi Saks] $n^{1+c^{-d}}$ lower bounds
 - [Allender Koucky, 2018 Chen Tell]: best without **major result** ($NC^1 \neq TC^0$)
- **Algebraic complexity**
 - [2013 Gupta Kamath Kayal Saha Saptharishi]
 $n^{\Omega(\sqrt{n})}$ lower bounds for depth-4 homogeneous circuits
 - [Agrawal Vinay, Koiran, Tavenas] best without **major result** ($VP \neq VNP$)

Why do current bounds stop “just before” proving major results?

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1. No reason, it's coincidence

I would find this “strange” because same bounds proved with seemingly different techniques

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Why do current bounds stop “just before” proving major results?

1. No reason, it's coincidence

I would find this “strange” because same bounds proved with seemingly different techniques

2. Current techniques are X, for major results need Y

3. Major results are false

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Frontier of P vs. NP

Circuit lower
bounds

Frontier of P vs. NP

Circuit lower
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Matrix rigidity

Frontier of P vs. NP

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Matrix rigidity

Correlation
bounds for
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Multi-party
Communication
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Matrix rigidity

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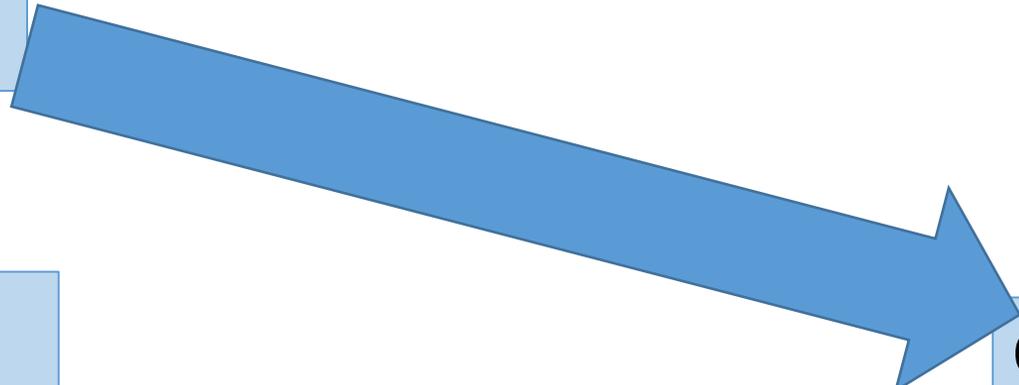
Frontier of P vs. NP

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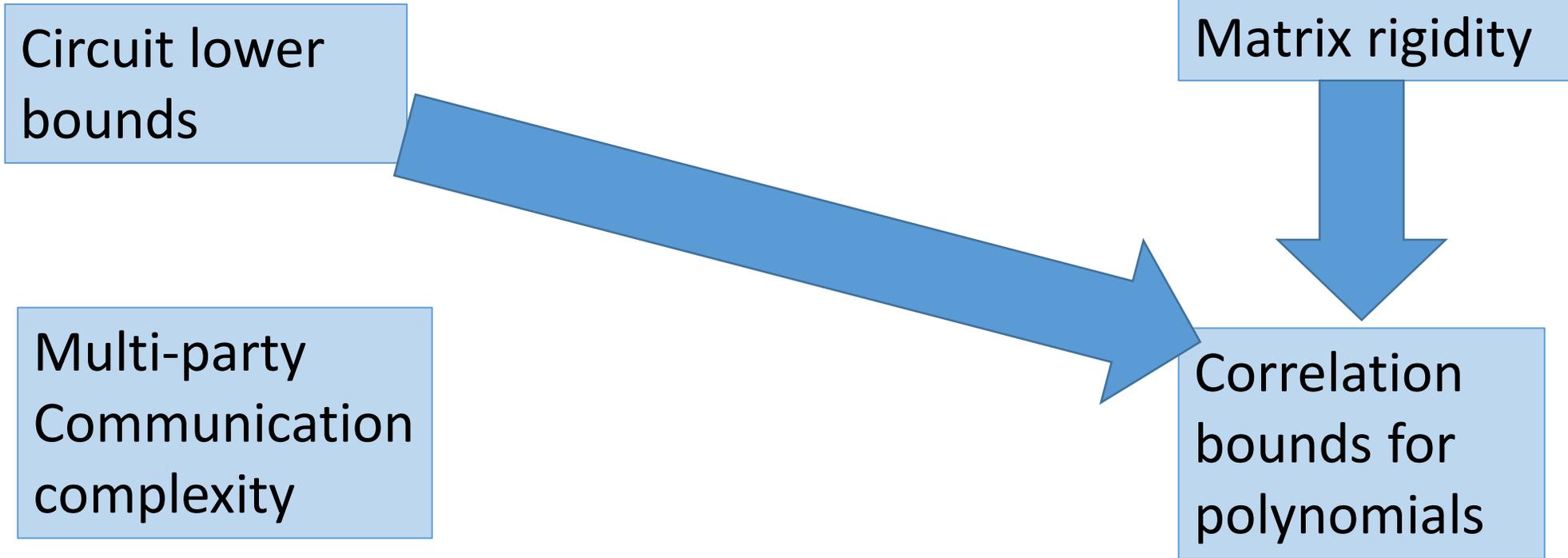
A



B

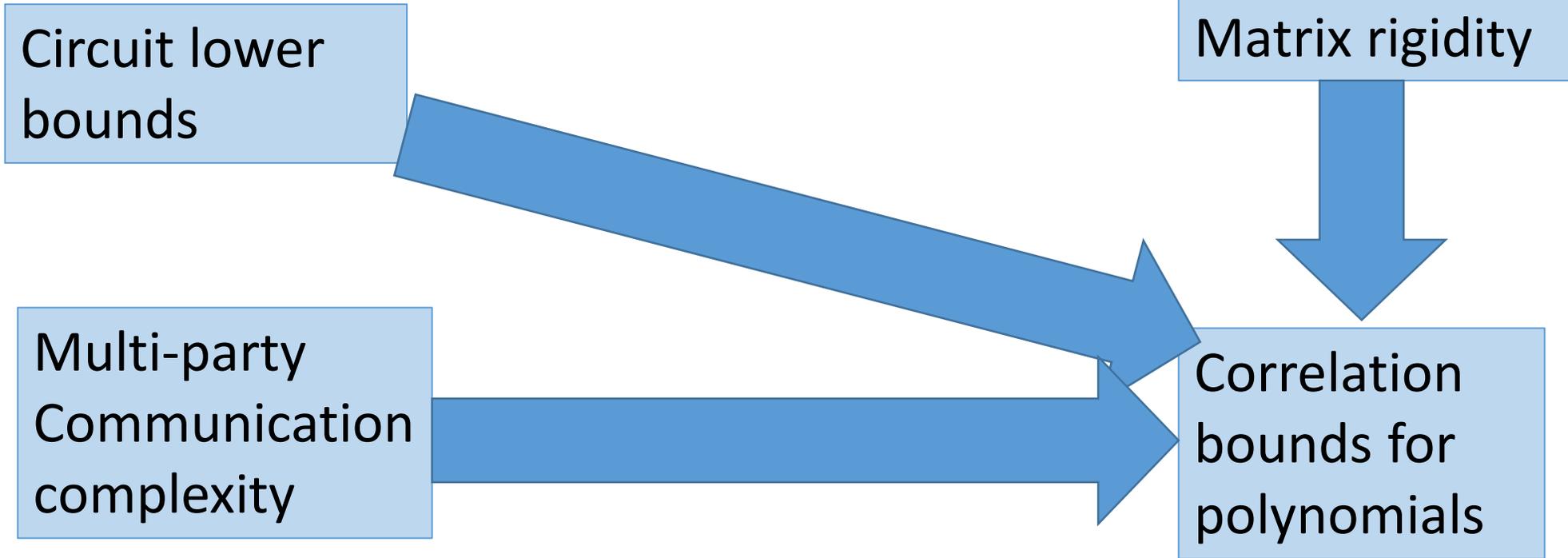
means progress on A requires progress on B

Frontier of P vs. NP



A  B means progress on A requires progress on B

Frontier of P vs. NP



A  B means progress on A requires progress on B

Correlation bounds for polynomials

- **Challenge:** Find explicit $f: \{0,1\}^n \rightarrow \{0,1\}$ such that for every polynomial $p(x)$ of degree $\log(n)$

$$\Pr_x[f(x) \neq p(x)] \geq 1/2 - 1/n$$

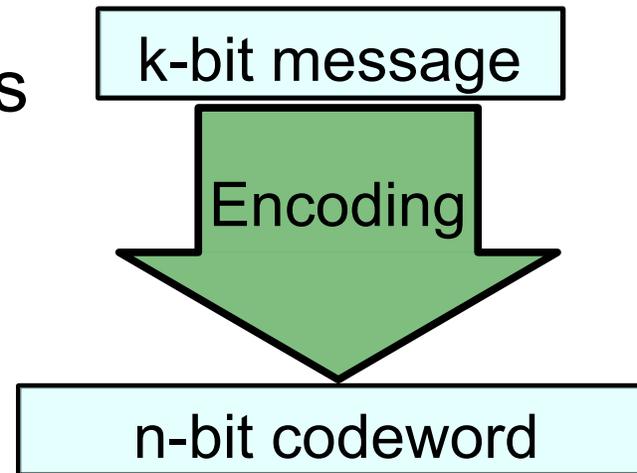
- Stands in the way of progress for each box in previous slide
- Candidate: $f = \text{parity}$

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Complexity of error-correction encoding

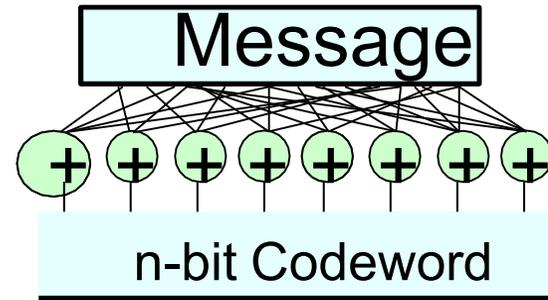
- Asymptotically **good code** over $\{0,1\}$: $C \subseteq \{0,1\}^n$
rate $\Omega(1)$: $|C| = 2^k$, $k = \Omega(n)$
distance $\Omega(n)$: $\forall x \neq y \in C$, x and y differ in $\Omega(n)$ bits
- Consider **encoding function** $f: \{0,1\}^k \rightarrow \{0,1\}^n$
- Want to compute f with circuits with **arbitrary** gates;
only count number of wires



Previous work

Depth 1 Wires $\Theta(n^2)$

Unbounded fan-in

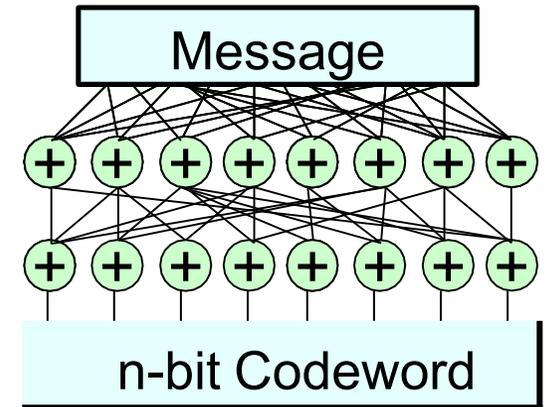
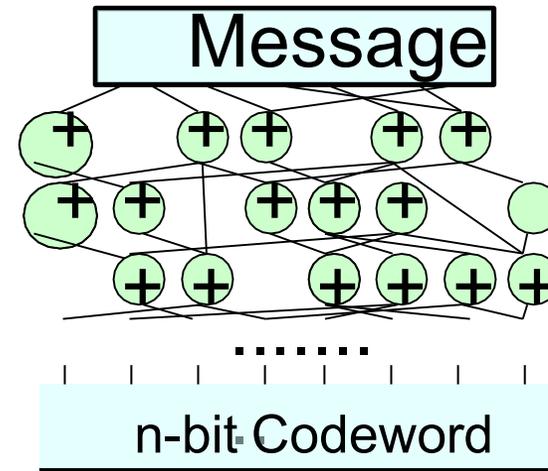


Depth $O(\log n)$ Wires $\Theta(n)$

Fan-in 2

[Gelfand Dobrushin Pinsker 73]

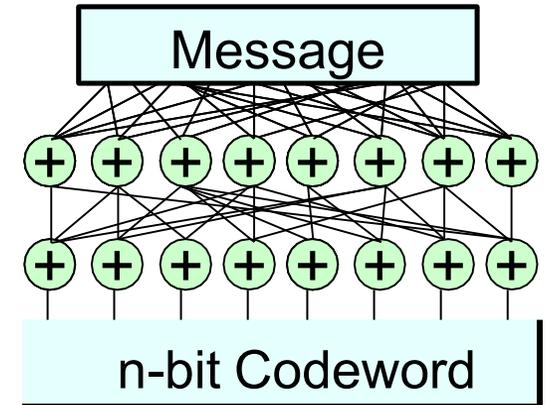
[Spielman 95]



Question: How many wires for depth 2?

[Gál Hansen Koucký Pudlák V 2012]

Depth	Wires
2	$n \cdot \Theta \left(\frac{\log n}{\log \log n} \right)^2$
$d > 2$	$n \cdot \Theta(\lambda_d(n))$

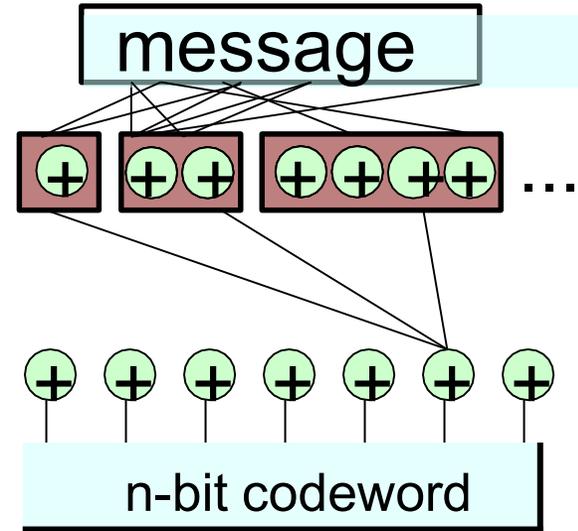


- λ inverse Ackermann: $\lambda_3(n) = \log \log n$, $\lambda_4(n) = \log^* n$, ...
- Best-known bound for linear function in NP

Probabilistic construction

Layer of $\log n$ blocks
 \forall message \exists balanced block

Output bit:
 XOR one random bit per block



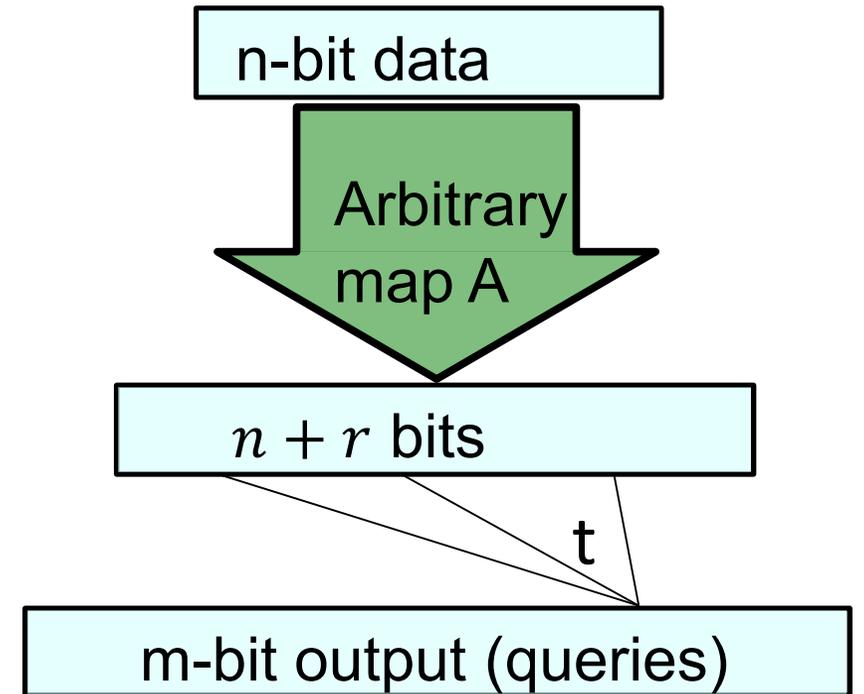
- i -th block balanced for message weight $w = \Theta(n/2^i)$
 Can do with wires $(n/w) \log \binom{n}{w} < n i$
- Total wires = $\sum_{i < \log n} (n i) + n \log n = n \cdot O(\log^2 n)$

Outline

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 - Circuits encoding error-correcting codes
 - **Data structures**
 - Turing machines

Static data structures

- Store n bits $x \in \{0,1\}^n$ into $n + r$ bits so that each of m queries can be answered reading t bits
- Trivial: $r = m - n, t = 1$ or $r = 0, t = n$
- This talk: Think $r = o(n), m = O(n)$
- Best lower bound:
 $t = \Omega\left(\frac{n}{r}\right)$ ['07 Gal Miltersen]



From circuits to data structures [V 2018]

- **Theorem:**

If $f: \{0,1\}^n \rightarrow \{0,1\}^m$ computable with w wires in depth d

then f has data structure with space $n + r$ time $t = \left(\frac{w}{r}\right)^d$ for any r

- **Corollaries:**

- $f = \text{encoding} \Rightarrow t = O\left(\frac{n}{r}\right) \log^3 n$ [GHKPV], matches [Gal Miltersen] $\Omega\left(\frac{n}{r}\right)$

- $t > \left(\frac{n}{r}\right)^5$ implies new circuit lower bounds

- [Gal Miltersen] stops “right before” proving **major result**

From circuits to data structures [V 2018]

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- **Proof:**

Store n -bit input and values of gates with fan-in $> w/r$

Number of such gates is $\leq r$

To compute any gate: either you have it, or it depends on $\leq w/r$ gates at next layer, repeat.

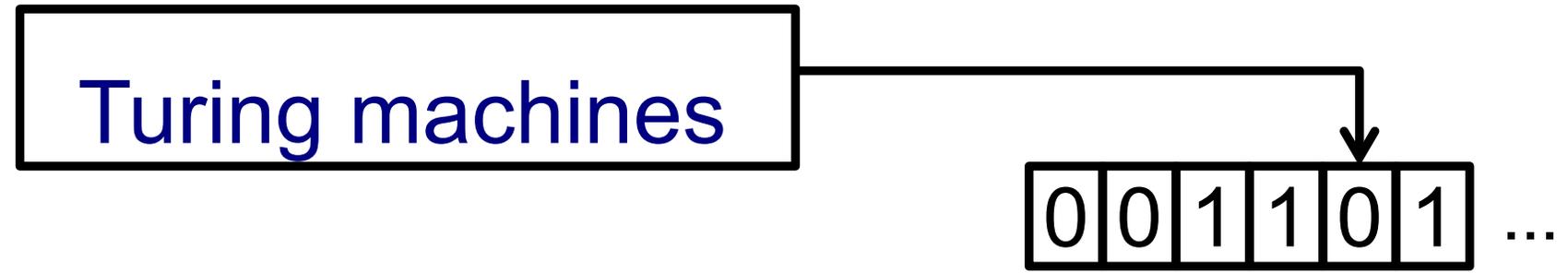
Qed

Open

- Data structures lower bounds for $r = n^2, m = r^3$ imply anything?

Outline

- History, conjectures, and upper bounds
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 - Data structures
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1) A useless model which only has historical significance

2) A fundamental challenge which lies right at the frontier of knowledge

Turing machines



[Hennie 65]

$\Omega(n^2)$ time lower bounds for 1-tape machines

Turing machines



[Hennie 65]

$\Omega(n^2)$ time lower bounds for 1-tape machines

Open:

$n^{1+\Omega(1)}$ lower bounds for 2-tape machines

Turing machines



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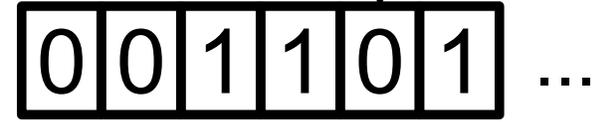
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$n^{1+\Omega(1)}$ lower bounds for 2-tape machines

[Maass Schorr 87,
van Melkebeek
Raz, Williams]

$n^{1+\Omega(1)}$ lower bounds for 2-tape machines
but input tape read-only

Turing machines



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Question [V, Lipton, ...]: What if the machine is **randomized**?



Turing machines



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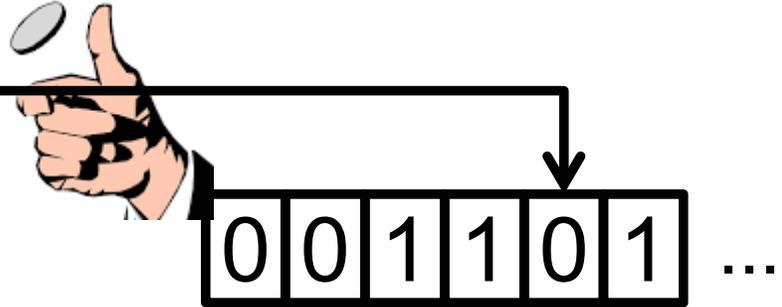
Question [V, Lipton, ...]: What if the machine is **randomized**?



[V 2019]

Randomized machines

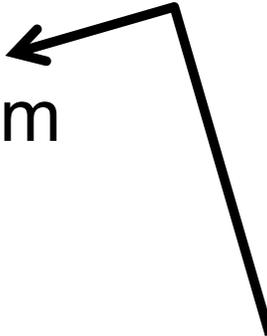
Turing machines



- Key step of proof:
Pseudorandom generator for 1-tape machines

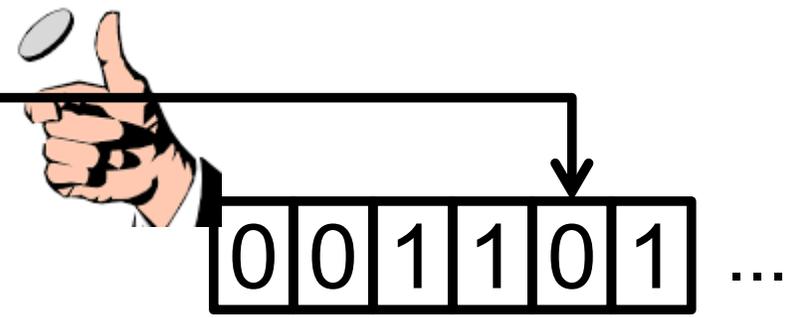
- [1994 Impagliazzo Nisan Wigderson]
Weaker model:
Fill the tape with bits that look random

- We can toss coins at any point! This breaks



Tape cell	1	2	3	4	5	6	7	8	9
	*1								
		H							
			H						
				H					
					H				
						H			
							*3		
							*3		
							H		
								H	
						H			
				H					
		H							
			H						
				H					
			H						
				*2					
				H					
					*3				
						H			
							H		
								H	
							H		

Turing machines



- First attempt to pseudorandom generator:
bounded independence [Carter Wegman]
- Does not work
- **Bounded independence plus noise**
flip each bit independently with probability 0.1 (And recurse)
- Theorem: [Haramaty Lee V 2017, ...]
Bounded independence plus noise fools small-space algorithms
- Essentially simulate Turing machine computation with small space

Thanks!



Natural proofs [90's Razborov Rudich, Naor Reingold]

- If class C can compute **pseudorandom functions**,
Then proving lower bounds against C is “difficult”

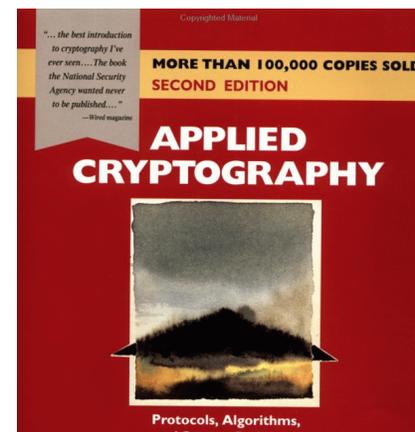
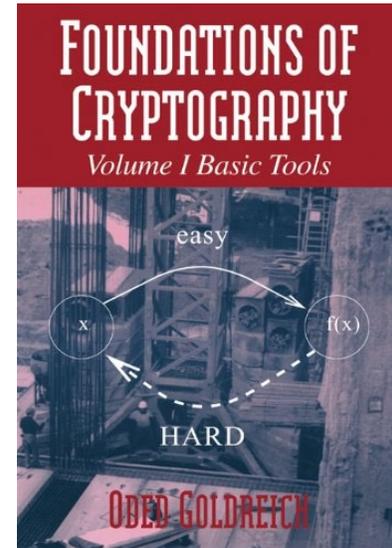
- **theory** of cryptography

Candidate pseudorandom functions in classes such as NC^1

Somewhat far from state of lower bounds

- [Miles V] **practice** of cryptography

Candidate more efficient pseudorandom functions



The SPN paradigm

[Shannon '49, Feistel-Notz-Smith '75]

S(ubstitution)-box

$$S : GF(2^b) \rightarrow GF(2^b)$$
$$X \mapsto X^{2^b-2}$$

- computationally expensive
- “strong” crypto properties

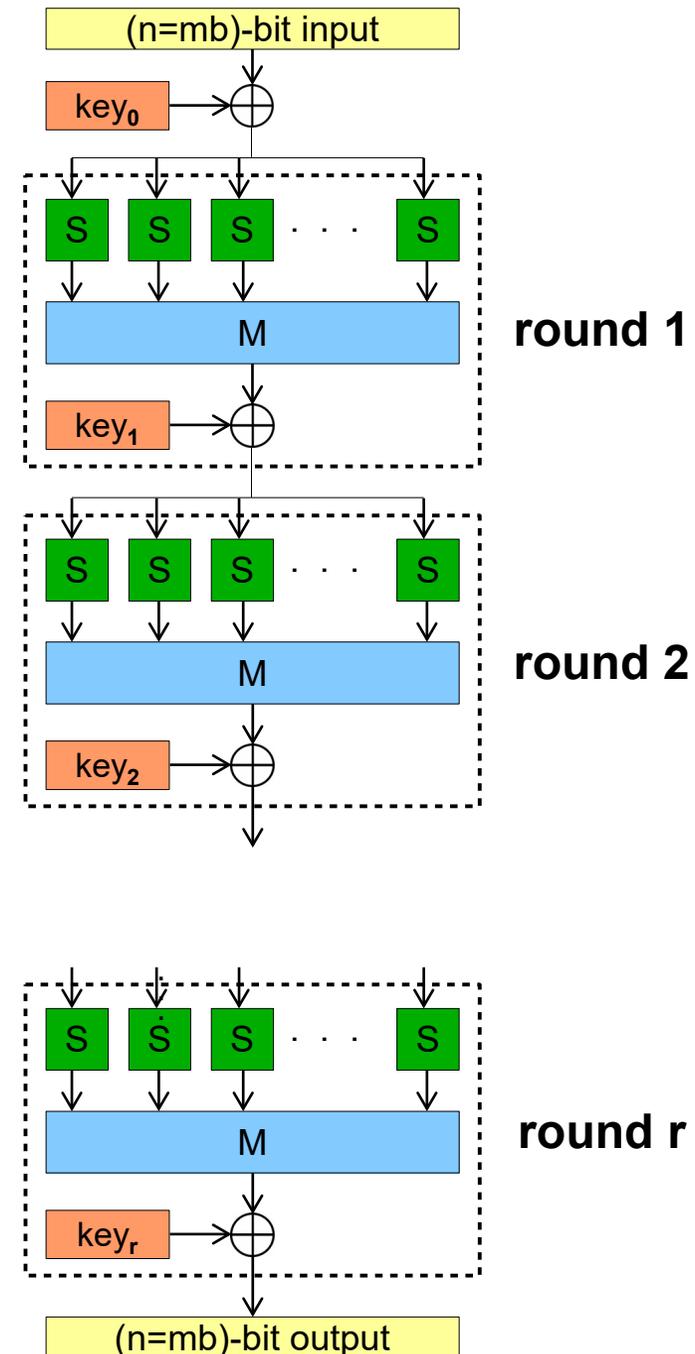
Linear transformation

$$M : GF(2^b)^m \rightarrow GF(2^b)^m$$

- computationally cheap
- “weak” crypto properties

Key XOR

- only source of secrecy
- round keys = uniform, independent



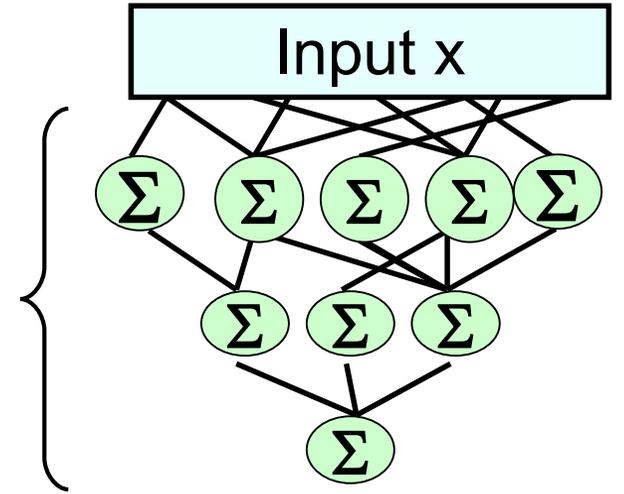
[Miles V]

- Candidate pseudorandom function computable in quasi-linear time
- ... And in other models that will appear later in this talk
- Open: Construct more candidates from practical constructions

Threshold circuits

- f := product of n permutations on $O(1)$ elements (NC^1 complete)
- [1997: Impagliazzo Paturi Saks] $n^{1+c^{-d}}$ lower bounds f
- [2010 Allender Koucky]: $NC^1 = TC^0 \Rightarrow f$ has size $n^{1+O(\frac{1}{d})}$

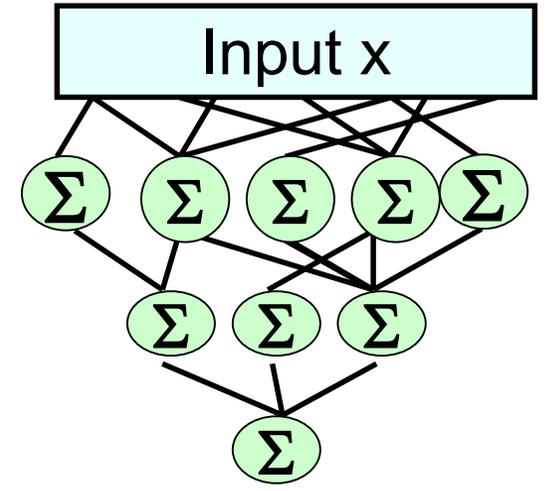
Depth
 $d=3$



Threshold circuits

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Depth
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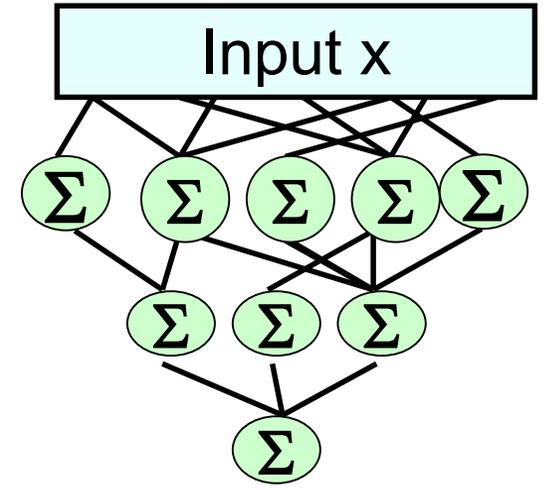


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- [2015 Miles Viola]: size $n^{1+O(\frac{1}{d})}$ candidate pseudorandom function

Threshold circuits

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 $d=3$



- [1997: Impagliazzo Paturi Saks] $n^{1+c^{-d}}$ lower bounds f
- [2010 Allender Koucky]: $NC^1 = TC^0 \Rightarrow f$ has size $n^{1+O(\frac{1}{d})}$
- [2015 Miles Viola]: size $n^{1+O(\frac{1}{d})}$ candidate pseudorandom function
- [2018 Chen Tell]: $NC^1 = TC^0 \Rightarrow f$ has size $n^{1+c^{-d}}$
 \Rightarrow 1997 bound is best without proving major (false?) results

Proof [2018 Chen Tell]

- Recall: f = product of n permutations on $O(1)$ elements (NC^1 complete)
- Theorem: $\exists k : f$ in size n^k & depth $k \Rightarrow \forall d : f$ in size $n^{1+c^{-d}}$ & depth $O(d)$
- Proof: Build a tree. Aim for size $n^{1+\epsilon}$
 $n_i :=$ number of nodes at level i (root level 0)

Level i fan-in: $(n^{1+\epsilon}/n_i)^{1/k}$ Recursion: $n_{i+1} = n_i \cdot (n^{1+\epsilon}/n_i)^{1/k}$

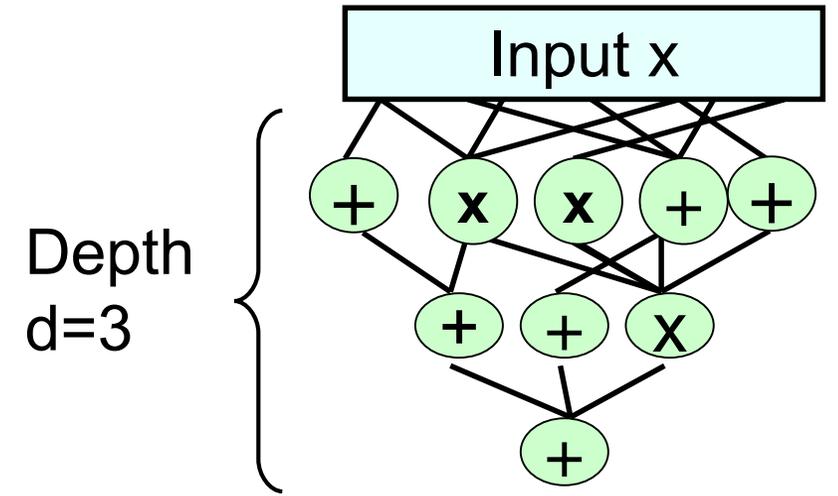
Solution: $n_i = n^{(1+\epsilon)(1-(1-1/k)^i)}$

Setting $i = O(k \log(1/\epsilon))$ gives $n_i > n$

QED

Algebraic complexity

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 $n^{\Omega(\sqrt{n})}$ lower bounds for depth-4 homogeneous circuits
- Why not stronger bounds?



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- Why not stronger bounds?
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 $n^{\omega(\sqrt{n})}$ lower bounds $\Rightarrow VP \neq VNP$

