Near-Optimal Pseudorandom Generators for Constant-Depth Read-Once Formulas

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The University of Texas at Austin

Research Preparation Exam May 1, 2019

¹Supported by NSF Grant CCF-1705028

²Supported by a Simons Investigator Award (#409864, David Zuckerman)

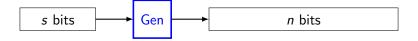
³Supported by the NSF GRFP under Grant DGE-1610403 and by a Harrington Fellowship from UT Austin

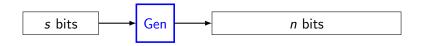
Randomness as a scarce resource

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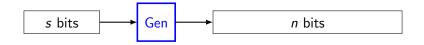
- ► Randomization is a popular algorithmic technique
- ▶ But randomness is costly
- ► An algorithm that uses fewer random bits is better





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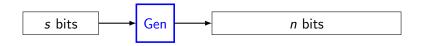
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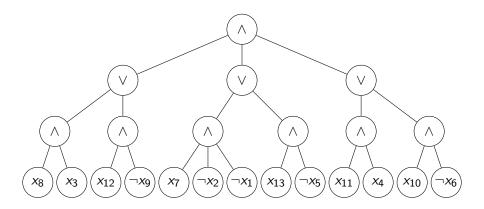


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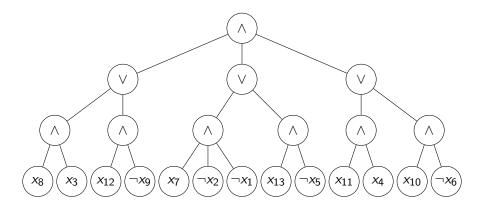
$$\mathbb{E}[f(\mathsf{Gen}(\mathit{U}))] = \mathbb{E}[f(\mathit{U})] \pm \varepsilon$$

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- ▶ Minimize seed length $s = s(n, \varepsilon)$

Read-once formulas

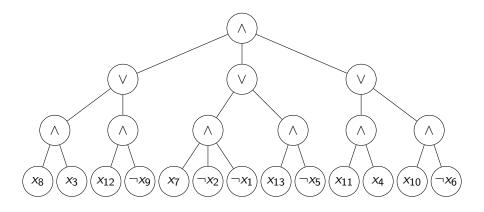


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- Read-once version of AC⁰

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▶ Main result: PRG for read-once **AC**⁰ with seed length

$$\log(n/\varepsilon) \cdot O(d \log \log(n/\varepsilon))^{2d+2}.$$

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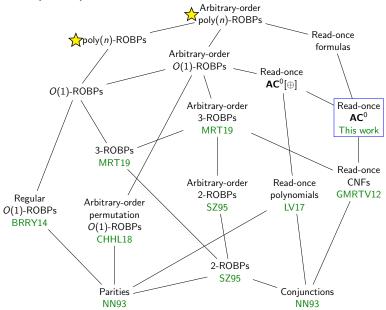
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- ▶ Bad news: Seed length O(log² n) has not been improved for decades [Nisan '92]
- ▶ Good news: Can achieve seed length $\widetilde{O}(\log n)$ for increasingly powerful restricted models
- ► Read-once **AC**⁰ is one of the frontiers of this progress

Seed length $\widetilde{O}(\log n)$



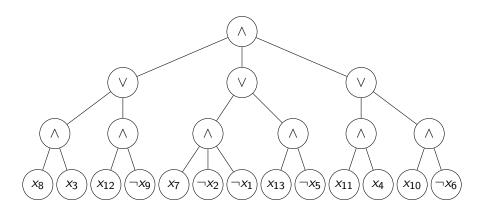
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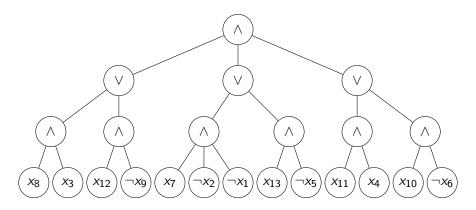
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PRGs via pseudorandom restrictions [AW89]



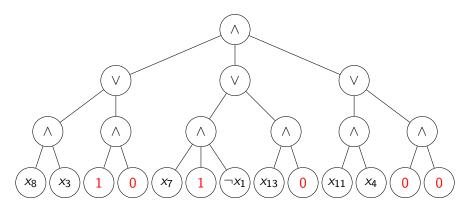
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Restriction notation

▶ Define Res: $\{0,1\}^n \times \{0,1\}^n \to \{0,1,\star\}^n$ by

$$\operatorname{Res}(y,z)_i = \begin{cases} \star & \text{if } y_i = 1\\ z_i & \text{if } y_i = 0 \end{cases}$$

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$$y = 0 1 1 0 0 1 0 0$$

 $z = 0 0 1 1 1 1 0 1$

$$Res(y,z) = 0 \star \star 1 1 \star 0 1$$

▶ A distribution D over $\{0,1\}^n$ is ε -biased if it fools parities:

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Forbes-Kelley pseudorandom restriction

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- Proof involves clever Fourier analysis, building on [RSV13, HLV18, CHRT18])

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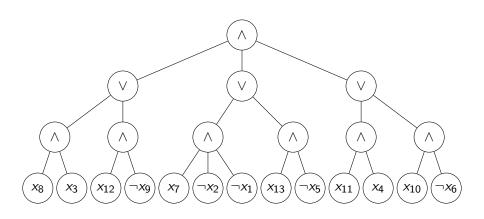
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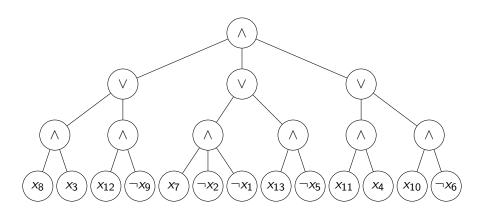
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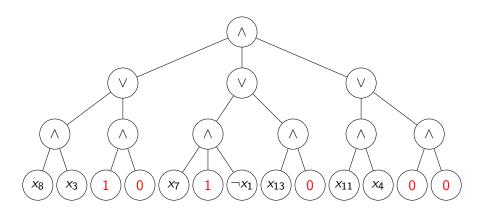
► Total cost: $\widetilde{O}(\log^2 n)$ truly random bits



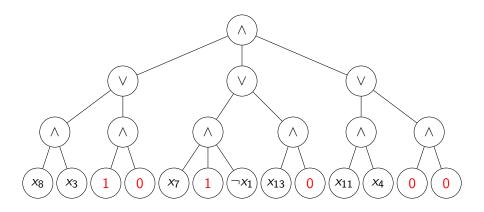
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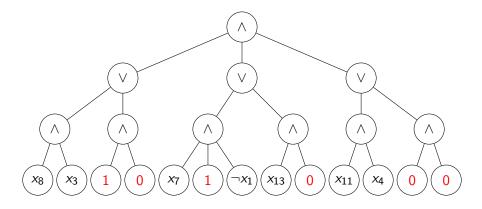
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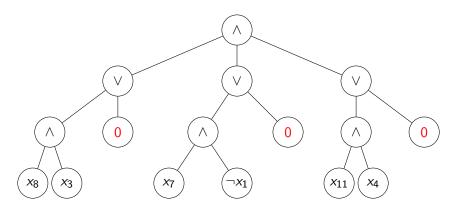
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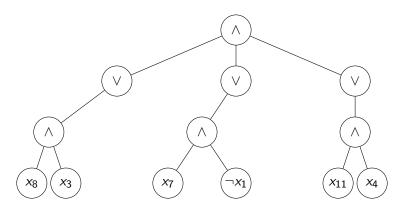
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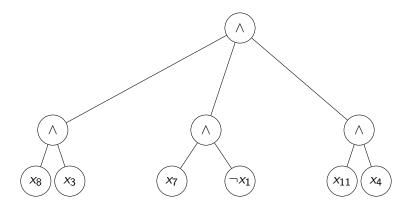
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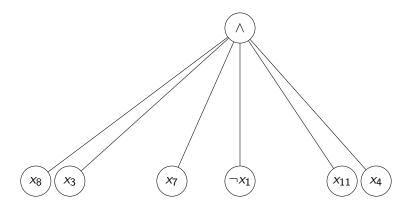
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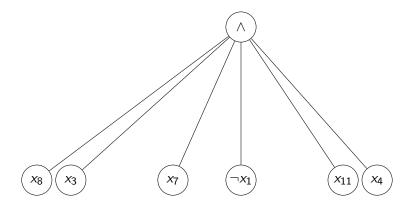
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Step 2: Fool restricted formula, taking advantage of simplicity

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- 3. $X = \text{Res}(G_d \oplus D, G'_d \oplus D')$

Preserving expectation

▶ Claim: For any depth-(d+1) read-once AC^0 formula f,

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- ▶ **Proof**: Read-once **AC**⁰ can be simulated by constant-width ROBPs [CSV15]
- So we can simply apply Forbes-Kelley result:

$$X = \operatorname{Res}(G_d \oplus D, G'_d \oplus D')$$

Simplification

 $ightharpoonup \Delta(f) \stackrel{\mathsf{def}}{=} \mathsf{maximum} \mathsf{ fan-in} \mathsf{ of} \mathsf{ any} \mathsf{ gate} \mathsf{ other} \mathsf{ than} \mathsf{ root}$

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Actually we only prove this statement "up to sandwiching"

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$\Delta \mapsto \text{polylog } n$: Proof outline

- ▶ Chen, Steinke, Vadhan '15: Read-once AC⁰ simplifies under truly random restrictions
- ► Testing for simplification is another read-once **AC**⁰ problem
- ▶ So we can derandomize the [CSV15] analysis:

$$X = \operatorname{Res}(G_d \oplus D, G'_d \oplus D')$$

Collapse under truly random restrictions

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$$\mathbb{E}[f] \leq \rho \text{ or } \mathbb{E}[f] \geq 1 - \rho$$

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where $s = O(\log \log n)$

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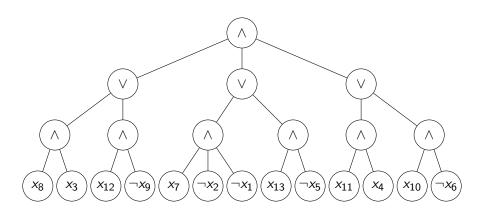
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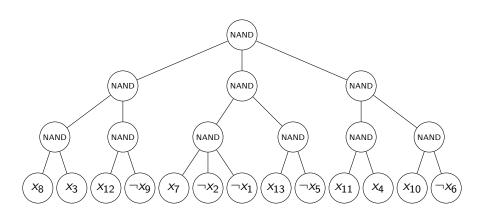
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(Proof uses Fourier analysis)

NAND formulas



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▶ Corollary: If $\mathbb{E}[f] \ge 1 - \rho$, then

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Let \mathcal{F} be a set of formulas on disjoint variable sets

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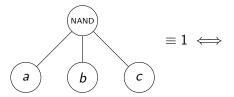
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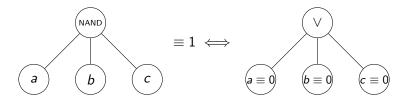
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► **Lemma**: Can be decided in depth-*d* read-once **AC**⁰

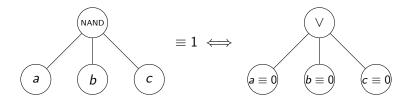
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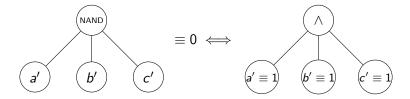


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$$(\operatorname{Res}(y,z)_i \equiv b) \iff (y_i = 0 \land z_i = b)$$

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▶ At top: " $\exists f \in \mathcal{F}$ " is one more \lor gate (merge with top \lor gates)

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- **Lemma**: With high probability over $X^{\circ s}$,

$$\Delta(f|_{X^{\circ s}}) \leq \sqrt{\Delta(f)} \cdot \text{polylog } n$$

Illustration: $\Delta \mapsto \sqrt{\Delta} \text{ polylog } n$



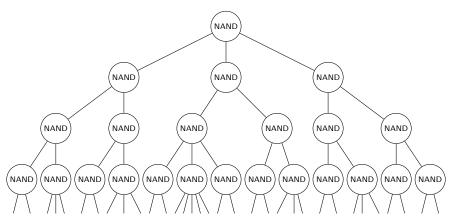


Illustration: $\Delta \mapsto \sqrt{\Delta} \text{ polylog } n$

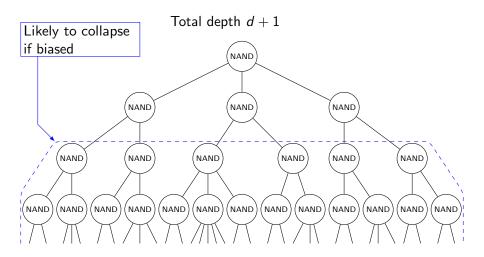
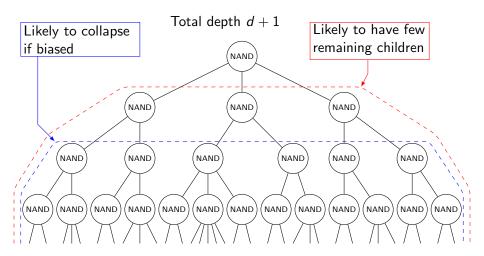


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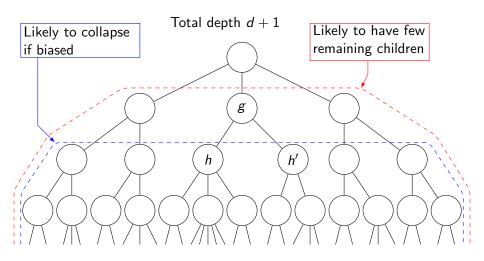
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Illustration: $\Delta \mapsto \sqrt{\Delta} \text{ polylog } n \text{ (continued)}$



Proof that $\Delta \mapsto \sqrt{\Delta}$ polylog n (continued)

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Proof that $\Delta \mapsto \sqrt{\Delta} \operatorname{polylog} n$ (continued)

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- ▶ We also trivially have $|\mathcal{B}| \leq \Delta$

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$$\sim 1.1 M_{\odot} \sim 1.$$

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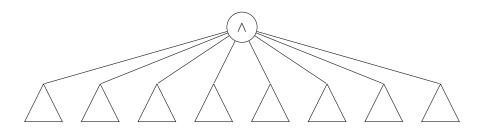
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$$\begin{split} & \qquad \qquad \mathsf{Pr}[L \geq M] = \, \mathsf{Pr}\left[\binom{L}{k} \geq \binom{M}{k}\right] \qquad \qquad \mathsf{Pascal} \\ & \leq \frac{1}{\binom{M}{k}} \cdot \mathbb{E}\left[\binom{L}{k}\right] \qquad \qquad \mathsf{Markov} \\ & \leq \frac{1}{\binom{M}{k}} \cdot \binom{|\mathcal{B}|}{k} \cdot \left(O(\rho)^k + \frac{1}{n^{200}}\right) \\ & \leq \left(\frac{|\mathcal{B}|e}{M}\right)^k \cdot \left(O(\rho)^k + \frac{1}{n^{200}}\right) \qquad \mathsf{Stirling} \\ & \leq \left(\frac{1}{\sqrt{\Delta}}\right)^k + \frac{1}{n^{200}} \cdot (\sqrt{\Delta})^k \end{split}$$

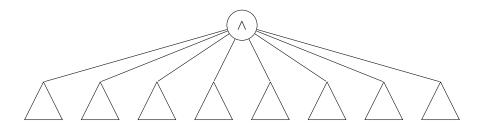
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- ▶ Therefore, after $t = O((\log \log n)^2)$ restrictions, $\Delta = \text{polylog } n$
- ► Total cost so far: $\widetilde{O}(\log n)$ truly random bits



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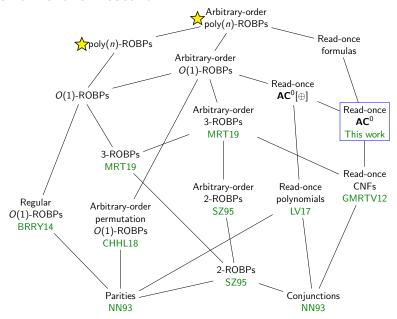
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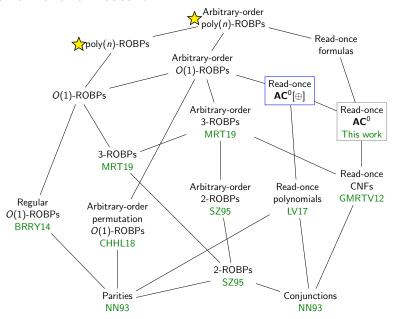
$$f = \bigwedge_{i=1}^{m} f_i = \sum_{S \subseteq [m]} \frac{(-1)^{|S|}}{2^m} \prod_{i \in S} (-1)^{f_i}$$

Directions for further research

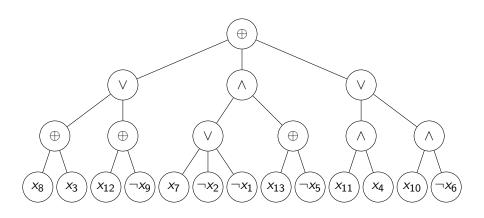
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Read-once $\mathbf{AC}^0[\oplus]$



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- ► Thanks! Questions?