# Size Bounds on Low Depth Circuits for Promise Majority 

Joshua Cook<br>The University of Texas at Austin

July 3, 2022

## Talk Outline

(1) Result Overview

- Motivation
- Previous Results
- Proof Ideas
(2) Monotone Depth-3 Lower Bound
- Clause Size Lower Bound
- Greedy Set Cover Algorithm
- Monotone DNF Size Lower Bound
- Circuit Size Lower Bound
(3) General Depth-3 Lower Bounds
- Probabilistic Restriction
- General DNF Size Lower Bounds

4 Upper Bounds
(5) Open Problems
(6) References

## Result Overview

## Majority



## Definition (Majority)

For $n \in \mathbf{N}$, let Maj : $\{0,1\}^{n} \rightarrow\{0,1\}$ be defined by

$$
\operatorname{Maj}(x)=\mathbf{1}\left[\sum_{i} x_{i} \geq n / 2\right] .
$$

## Majority



## Definition (Majority)

For $n \in \mathbf{N}$, let Maj : $\{0,1\}^{n} \rightarrow\{0,1\}$ be defined by

$$
\operatorname{Maj}(x)=\mathbf{1}\left[\sum_{i} x_{i} \geq n / 2\right] .
$$

- Component of many results, such as circuit derandomization [1].


## Majority



## Definition (Majority)

For $n \in \mathbf{N}$, let Maj : $\{0,1\}^{n} \rightarrow\{0,1\}$ be defined by

$$
\operatorname{Maj}(x)=\mathbf{1}\left[\sum_{i} x_{i} \geq n / 2\right] .
$$

- Component of many results, such as circuit derandomization [1].
- Widely studied, not computable by AC0, simple computation models.


## Promise Majority



Approximate majority[2], promise majority[6], approximate selector[4], etc.

## Definition (Promise Majority)

For $n \in \mathbf{N}, \epsilon \in(0,1 / 2)$, and function $f:\{0,1\}^{n} \rightarrow\{0,1\}$, we say $f$ solves $\epsilon$-promise majority if for all $x \in\{0,1\}^{n}$ with $\sum_{i \in[n]} x_{i}<\epsilon n$ and for all $y \in\{0,1\}^{n}$ with $\sum_{i \in[n]} 1-y_{i}<\epsilon n$

$$
f(x)=0, f(y)=1 .
$$

■ Often usable in place of majority, in circuit derandomization.

## Promise Majority



Approximate majority[2], promise majority[6], approximate selector[4], etc.

## Definition (Promise Majority)

For $n \in \mathbf{N}, \epsilon \in(0,1 / 2)$, and function $f:\{0,1\}^{n} \rightarrow\{0,1\}$, we say $f$ solves $\epsilon$-promise majority if for all $x \in\{0,1\}^{n}$ with $\sum_{i \in[n]} x_{i}<\epsilon n$ and for all $y \in\{0,1\}^{n}$ with $\sum_{i \in[n]} 1-y_{i}<\epsilon n$

$$
f(x)=0, f(y)=1 .
$$

■ Often usable in place of majority, in circuit derandomization.
■ Widely studied, computable by ACO.

## ACO



■ Alternating circuit: unbounded fan in "AND" and "OR" gates.

## ACO



- Alternating circuit: unbounded fan in "AND" and "OR" gates.

■ Layers "Alternate" between "AND" and "OR" gates.

## ACO



■ Alternating circuit: unbounded fan in "AND" and "OR" gates.
■ Layers "Alternate" between "AND" and "OR" gates.

- Bottom layer includes negated inputs.


## ACO



■ Alternating circuit: unbounded fan in "AND" and "OR" gates.
■ Layers "Alternate" between "AND" and "OR" gates.

- Bottom layer includes negated inputs.

■ Size is number of gates (same results for wires).

## ACO



- Alternating circuit: unbounded fan in "AND" and "OR" gates.

■ Layers "Alternate" between "AND" and "OR" gates.

- Bottom layer includes negated inputs.

■ Size is number of gates (same results for wires).

- AC0 constant depth, polynomial size.


## Depth-3 $\epsilon$-Promise Circuit Upper Bounds

## Depth-3 Upper Bounds:

| Author | $\epsilon$ | Size | Uniformity |
| :--- | :---: | :---: | :---: |
| Ajtai 1983 [2] | $(0,1 / 2)$ | $(\epsilon \ln (\epsilon) n)^{2+\frac{\ln (1-\epsilon)}{\ln (\epsilon)-\ln (1-\epsilon)}}$ | Non-Uniform |
| Viola 2009 [7] | $\frac{1}{\ln (n)}$ | $n^{4+o(1)}$ | P |
| Viola 2009 [7] | $(0,1 / 2)$ | $n^{4+O\left((1-2 \epsilon)^{-2}\right)}$ | P |
| Us | $\frac{1}{\ln (n)}$ | $n^{3+o(1)}$ | P |

## Depth-3 -Promise Circuit Lower Bounds

Depth-3 Lower Bounds (Suppressing polylogarithmic factors):

| Author | Size | Monotone |
| :--- | :---: | :---: |
| Trivial | $\epsilon n$ | General |
| Chaudhuri, Radhakrishnan 1996 [4] | $(\epsilon n)^{\frac{64}{63}-n}$ | General |
| Viola 2011 [8] | $n^{\Omega(-\ln (1-2 \epsilon))}$ | General |
| Us | $\epsilon^{3} n^{2+\frac{\ln (1-\epsilon)}{\ln (\epsilon)}}$ | Monotone |
| Us | $\epsilon^{3} n^{2+\frac{\ln \left(1-\epsilon^{2}\right)}{2 \ln (\epsilon)}}$ | General |

## Higher Depth $\epsilon$-Promise Circuit Upper Bounds

Upper Bounds (Constant $\epsilon$ ):

| Author | Size | Uniformity |
| :--- | :---: | :---: |
| Ajtai 1990 [3] | poly $(n)$ | LOGTIME |
| Chaudhuri, Radhakrishnan 1996 [4] | $n^{\frac{1}{1-2^{-O(d)}}}$ | LOGTIME |
| Us | $n^{\frac{1}{1-2^{-(d-2) / 2}}}$ | Non-Uniform |
| Us | $n^{\frac{1}{1-(2 / 3)^{(d-2) / 2}}}$ | P |

## Higher Depth $\epsilon$-Promise Circuit Lower Bounds

Lower Bounds:

| Author | $\epsilon$ | Size |
| :--- | :---: | :---: |
| Trivial | any | $\epsilon n$ |
| Chaudhuri, Radhakrishnan 1996 [4] | any | $(\epsilon n)^{\frac{1}{1-4-d}-n}$ |
| Viola 2011 [8] | $\frac{1}{2}-\frac{1}{\ln (n)^{d-2}}$ | $\omega(\operatorname{poly}(n))$ |

## Depth 3 Circuits Terminology



Focus on depth-3 promise Majority

- Negation of promise majority circuit, also promise majority. Assume lowest level gate is "AND".


## Depth 3 Circuits Terminology



Focus on depth-3 promise Majority

- Negation of promise majority circuit, also promise majority. Assume lowest level gate is "AND".
■ Call input bits "variables".


## Depth 3 Circuits Terminology

Clauses


Focus on depth-3 promise Majority

- Negation of promise majority circuit, also promise majority. Assume lowest level gate is "AND".
- Call input bits "variables".

■ First level, AND gates "clauses".

## Depth 3 Circuits Terminology

## DNFs

Clauses

Variables


Focus on depth-3 promise Majority

- Negation of promise majority circuit, also promise majority. Assume lowest level gate is "AND".
- Call input bits "variables".

■ First level, AND gates "clauses".
■ Second level, OR gates "DNFs".

## Depth 3 Circuits Terminology



Focus on depth-3 promise Majority
■ Negation of promise majority circuit, also promise majority. Assume lowest level gate is "AND".

- Call input bits "variables".

■ First level, AND gates "clauses".

- Second level, OR gates "DNFs".

■ Third level, AND gate "circuits".

## Size Definitions



■ Clause $A$, size $|A|$ is the number of variables in $A$.

## Size Definitions



■ Clause $A$, size $|A|$ is the number of variables in $A$.
■ DNF $F$, size $|F|$ is the number of clauses in $F$.

## Size Definitions



■ Clause $A$, size $|A|$ is the number of variables in $A$.
■ DNF $F$, size $|F|$ is the number of clauses in $F$.
■ If $C$ is a circuit, denote

- $|C|$ as the number of clauses in $C$.
- $\|C\|$ as the number of DNFs in $C$.
- the size of $C$ as $|C|+\|C\|$.


## Monotone Lower Bound Idea

Idea: Lower bound the fan in at each layer.
Pretend $\epsilon \in(0,1 / 2)$ is constant for simplicity. Let $\alpha=\frac{\ln (1-\epsilon)}{\ln (\epsilon)}$.
1 From Viola [7], clauses have size $\frac{\ln (n)}{\ln (1 / \epsilon)}$.

## Monotone Lower Bound Idea

Idea: Lower bound the fan in at each layer.
Pretend $\epsilon \in(0,1 / 2)$ is constant for simplicity. Let $\alpha=\frac{\ln (1-\epsilon)}{\ln (\epsilon)}$.
1 From Viola [7], clauses have size $\frac{\ln (n)}{\ln (1 / \epsilon)}$.
2 If DNFs have size $\tilde{o}\left(n^{1+\alpha}\right)$, then we can hit every clause with fewer than $\epsilon n$ variables.
Thus clauses have size $\tilde{\Omega}\left(n^{1+\alpha}\right)$.

## Monotone Lower Bound Idea

Idea: Lower bound the fan in at each layer.
Pretend $\epsilon \in(0,1 / 2)$ is constant for simplicity. Let $\alpha=\frac{\ln (1-\epsilon)}{\ln (\epsilon)}$.
1 From Viola [7], clauses have size $\frac{\ln (n)}{\ln (1 / \epsilon)}$.
2 If DNFs have size $\tilde{o}\left(n^{1+\alpha}\right)$, then we can hit every clause with fewer than $\epsilon n$ variables.
Thus clauses have size $\tilde{\Omega}\left(n^{1+\alpha}\right)$.
3 If fewer than $\tilde{o}\left(n^{2+\alpha}\right)$ clauses, can hit every DNF with fewer than $\frac{n}{\ln (n)^{2}}$ clauses.
Thus circuit has $\tilde{\Omega}\left(n^{2+\alpha}\right)$ clauses.

## General Lower Bound Idea

Idea: Same as monotone EXCEPT level 2 bounds might fail.

## General Lower Bound Idea

Idea: Same as monotone EXCEPT level 2 bounds might fail.
Issue: Negated variables might make DNF one while fixing adversarial bits.

## General Lower Bound Idea

Idea: Same as monotone EXCEPT level 2 bounds might fail.
Issue: Negated variables might make DNF one while fixing adversarial bits.
Solution: Let $\beta=\frac{\ln \left(1-\epsilon^{2}\right)}{2 \ln (\epsilon)}$. Fix adversarial bits probabilistically.

## General Lower Bound Idea

Idea: Same as monotone EXCEPT level 2 bounds might fail.
Issue: Negated variables might make DNF one while fixing adversarial bits.
Solution: Let $\beta=\frac{\ln \left(1-\epsilon^{2}\right)}{2 \ln (\epsilon)}$. Fix adversarial bits probabilistically.
Result: Likely won't set DNF to one. Almost definitely will eliminate $\tilde{\Omega}\left(n^{1+\beta}\right)$ clauses.

## Main Tool

Greedy Algorithm for set cover.

## Theorem

Let $S=\left\{S_{1}, \ldots, S_{m}\right\}$ be subsets of $[n]$ where each $i \in[m]$ has $\left|S_{i}\right| \geq w$. Then for any $t \in[n]$ there is some $T \subseteq[n]$ with $|T|=t$ so that $T$ doesn't intersect with at most

$$
m e^{w \ln \left(1-\frac{t}{n+1}\right)}
$$

of the sets in $S$.
Idea: Just greedily take the variable in the most sets.

## Upper Bound

Idea: Amplify promise, iteratively reduce size with promise majority.
1 Use random walks on expander graph to amplify promise to $\frac{1}{\ln (n)^{d}}$. Only increases size by polylogarithmic factor.

## Upper Bound

Idea: Amplify promise, iteratively reduce size with promise majority.
1 Use random walks on expander graph to amplify promise to $\frac{1}{\ln (n)^{d}}$. Only increases size by polylogarithmic factor.
2 Seperate input into groups of size $\tilde{\Omega}\left(n^{\frac{1}{2^{d}-1}}\right)$. Run depth-3 $\frac{1}{\ln (n)}$-promise majority circuit on each group.

## Upper Bound

Idea: Amplify promise, iteratively reduce size with promise majority.
1 Use random walks on expander graph to amplify promise to $\frac{1}{\ln (n)^{d}}$. Only increases size by polylogarithmic factor.
2 Seperate input into groups of size $\tilde{\Omega}\left(n^{\frac{1}{2^{d}-1}}\right)$. Run depth-3 $\frac{1}{\ln (n)}$-promise majority circuit on each group.
3 Repeat with appropriate group d times.
Circuit has depth $2+2 d$ and size $\tilde{\Omega}\left(n^{\frac{1}{1-2^{-d}}}\right)$.

## Uniform Depth-3 Circuits

Best known is Viola's based of derandomization of Lautemann's proof $B P P \subseteq \Sigma_{2} \cap \Pi_{2}$ [5].

## Uniform Depth-3 Circuits

Best known is Viola's based of derandomization of Lautemann's proof $B P P \subseteq \Sigma_{2} \cap \Pi_{2}$ [5].

Viola uses $o(\ln (n))$ length walks on expander graphs to get size- $n^{4+o(1)}$, depth-3 circuits for $\frac{1}{\ln (n)}$-promise majority.

## Uniform Depth-3 Circuits

Best known is Viola's based of derandomization of Lautemann's proof $B P P \subseteq \Sigma_{2} \cap \Pi_{2}$ [5].

Viola uses $o(\ln (n))$ length walks on expander graphs to get size- $n^{4+o(1)}$, depth-3 circuits for $\frac{1}{\ln (n)}$-promise majority.

We use walks more efficiently to get size- $n^{3+o(1)}$ depth- 3 circuits.

## Uniform Depth-3 Circuits

Best known is Viola's based of derandomization of Lautemann's proof $B P P \subseteq \Sigma_{2} \cap \Pi_{2}$ [5].

Viola uses $o(\ln (n))$ length walks on expander graphs to get size- $n^{4+o(1)}$, depth-3 circuits for $\frac{1}{\ln (n)}$-promise majority.

We use walks more efficiently to get size- $n^{3+o(1)}$ depth-3 circuits.
We use this circuit to get small uniform upper bounds with more depth.

## Monotone Depth-3 Lower Bound

## What We Actually Show

Here we prove the simpler lower bounds for constant $\epsilon \in(0,1 / 2)$ of: Monotone

$$
n^{2+\Omega\left(\frac{\epsilon}{\ln (1 / \epsilon)}\right)}
$$

General

$$
n^{2+\Omega\left(\frac{\epsilon^{2}}{\ln (1 / \epsilon)}\right)}
$$

The tighter bounds follow the same ideas with tighter analysis.

## Biased Coin Distributions

## Definition

Let $D_{\epsilon}$ be the distribution on $\{0,1\}^{n}$ that sets each bit independently to 1 with probability $\epsilon$.

## Biased Coin Distributions

## Definition

Let $D_{\epsilon}$ be the distribution on $\{0,1\}^{n}$ that sets each bit independently to 1 with probability $\epsilon$.

Example: $D_{1 / 3}$ with 3 coins:

| outputs | probabilities |
| :---: | :---: |
| 111 | $\left(\frac{1}{3}\right)^{3}$ |
| $011,101,110$ | $\left(\frac{1}{3}\right)^{2} \frac{2}{3}$ |
| $100,010,001$ | $\left(\frac{1}{3}\right)\left(\frac{2}{3}\right)^{2}$ |
| 000 | $\left(\frac{2}{3}\right)^{3}$ |

## Biased Coin Distributions

## Definition

Let $D_{\epsilon}$ be the distribution on $\{0,1\}^{n}$ that sets each bit independently to 1 with probability $\epsilon$.

Example: $D_{1 / 3}$ with 3 coins:

| outputs | probabilities |
| :---: | :---: |
| 111 | $\left(\frac{1}{3}\right)^{3}$ |
| $011,101,110$ | $\left(\frac{1}{3}\right)^{2} \frac{2}{3}$ |
| $100,010,001$ | $\left(\frac{1}{3}\right)\left(\frac{2}{3}\right)^{2}$ |
| 000 | $\left(\frac{2}{3}\right)^{3}$ |

By central limit theorem, with probability almost one half, $D_{\epsilon}$ has less than $\epsilon$ fraction ones.

## Restriction

## Definition

We say $\rho \in\{0,1, *\}^{n}$ is a restriction on $n$ bits. We say the size of $\rho,|\rho|$, is the number of 1 s and 0 s in $\rho$. If $f:\{0,1\}^{n} \rightarrow\{0,1\}$, then define $f \upharpoonright_{\rho}$ as the function where the values from $\rho$ are passed into $f$ where it is 1 or 0 , and otherwise the corresponding variable from the argument is passed in.

## Restriction

## Definition

We say $\rho \in\{0,1, *\}^{n}$ is a restriction on $n$ bits. We say the size of $\rho,|\rho|$, is the number of 1 s and 0 s in $\rho$. If $f:\{0,1\}^{n} \rightarrow\{0,1\}$, then define $f \upharpoonright_{\rho}$ as the function where the values from $\rho$ are passed into $f$ where it is 1 or 0 , and otherwise the corresponding variable from the argument is passed in.

Example:
$f \upharpoonright_{\rho}\left(x_{1}, x_{2}\right)=f(1, *, 0, *)$

## Restriction

## Definition

We say $\rho \in\{0,1, *\}^{n}$ is a restriction on $n$ bits. We say the size of $\rho,|\rho|$, is the number of 1 s and 0 s in $\rho$.
If $f:\{0,1\}^{n} \rightarrow\{0,1\}$, then define $f \upharpoonright_{\rho}$ as the function where the values from $\rho$ are passed into $f$ where it is 1 or 0 , and otherwise the corresponding variable from the argument is passed in.

Example:


## Restriction

## Definition

We say $\rho \in\{0,1, *\}^{n}$ is a restriction on $n$ bits. We say the size of $\rho,|\rho|$, is the number of 1 s and 0 s in $\rho$.
If $f:\{0,1\}^{n} \rightarrow\{0,1\}$, then define $f \upharpoonright_{\rho}$ as the function where the values from $\rho$ are passed into $f$ where it is 1 or 0 , and otherwise the corresponding variable from the argument is passed in.

Example:


## Restriction

## Definition

We say $\rho \in\{0,1, *\}^{n}$ is a restriction on $n$ bits. We say the size of $\rho,|\rho|$, is the number of 1 s and 0 s in $\rho$.
If $f:\{0,1\}^{n} \rightarrow\{0,1\}$, then define $f \upharpoonright_{\rho}$ as the function where the values from $\rho$ are passed into $f$ where it is 1 or 0 , and otherwise the corresponding variable from the argument is passed in.

Example:


## Clause Lower Bound

## Viola proved:

## Theorem

Suppose that for constant $\epsilon \in(0,1 / 2)$, and DNF $F$ that

$$
\operatorname{Pr}\left[F\left(D_{\epsilon}\right)=0\right] \geq \operatorname{poly}(1 / n) .
$$

Then for some $w=\Omega\left(\frac{\ln (n)}{\ln (1 / \epsilon)}\right)$, there is a restriction $\rho$ restricting at most $m=\frac{\epsilon n}{\ln (n)}$ variables so that:

- Any clause $C$ in $F$ with width less than $w$ has $C \upharpoonright_{\rho}=0$.

■ $\operatorname{Pr}\left[F \upharpoonright_{\rho}\left(D_{\epsilon}\right)=0\right] \geq \operatorname{Pr}\left[F\left(D_{\epsilon}\right)=0\right]$
Eliminates small clauses from a DNF that is likely to output a 0 on $D_{\epsilon}$ with few variables without setting the DNF to 1.

## Viola's Clause Lower Bound Idea

For small sets $S_{1}, . . S_{m} \subseteq[n]$ :
Insight: Maximal independent sets $\sim$ minimal set cover.

## Viola's Clause Lower Bound Idea

For small sets $S_{1}, . . S_{m} \subseteq[n]$ :
Insight: Maximal independent sets $\sim$ minimal set cover.
■ Maximal independent $T \Longrightarrow$ set cover of size $|T| w$.
■ Independent $T \Longrightarrow$ set cover requires size $|T|$.

## Viola's Clause Lower Bound Idea

For small sets $S_{1}, . . S_{m} \subseteq[n]$ :
Insight: Maximal independent sets $\sim$ minimal set cover.
■ Maximal independent $T \Longrightarrow$ set cover of size $|T| w$.

- Independent $T \Longrightarrow$ set cover requires size $|T|$.

Large Independence: Not possible! Small width on $D_{\epsilon}$ outputs 1 too often.

## Viola's Clause Lower Bound Idea

For small sets $S_{1}, . . S_{m} \subseteq[n]$ :
Insight: Maximal independent sets $\sim$ minimal set cover.
■ Maximal independent $T \Longrightarrow$ set cover of size $|T| w$.

- Independent $T \Longrightarrow$ set cover requires size $|T|$.

Large Independence: Not possible! Small width on $D_{\epsilon}$ outputs 1 too often.
Small Independence: Fix few variables in small cover to reduce width.

- Choose values to only increase probability of 0 .

■ Repeat until clause width 0 .

## Greedy Set Cover

In this talk, we use

## Theorem

Let $S=\left\{S_{1}, \ldots, S_{m}\right\}$ be subsets of $[n]$ where each $i \in[m]$ has $\left|S_{i}\right| \geq w$.
Then for any $t \in[n]$ there is some $T \subseteq[n]$ with $|T|=t$ so that $T$ intersects all but at most

$$
|S| e^{-w \frac{t}{n}}
$$

of the sets in $S$.
Closer analysis gives that $T$ intersects all but $|S| e^{-w \ln \left(1-\frac{t}{n+1}\right)}$ sets.

## Greedy Set Cover

In this talk, we use

## Theorem

Let $S=\left\{S_{1}, \ldots, S_{m}\right\}$ be subsets of $[n]$ where each $i \in[m]$ has $\left|S_{i}\right| \geq w$. Then for any $t \in[n]$ there is some $T \subseteq[n]$ with $|T|=t$ so that $T$ intersects all but at most

$$
|S| e^{-w \frac{t}{n}}
$$

of the sets in $S$.
Closer analysis gives that $T$ intersects all but $|S| e^{-w \ln \left(1-\frac{t}{n+1}\right)}$ sets. In particular, if

■ $S$ is the set of clauses in a monotone DNF, $F$, and

- $\rho$ is some restriction restricting variables in $T$ to 0 , then $\left|F \upharpoonright_{\rho}\right| \leq|F| e^{-w \frac{t}{n}}$ variables remaining.


## Greedy Set Cover Proof



- The average number of sets an element is in is at least $\frac{w|S|}{n}$. So at least one variable, say $x_{2}$, is in at least $\frac{w|S|}{n}$ sets.


## Greedy Set Cover Proof



- The average number of sets an element is in is at least $\frac{w|S|}{n}$. So at least one variable, say $x_{2}$, is in at least $\frac{w|S|}{n}$ sets.


## Greedy Set Cover Proof



- The average number of sets an element is in is at least $\frac{w|S|}{n}$. So at least one variable, say $x_{2}$, is in at least $\frac{w|S|}{n}$ sets.
■ Let $S_{1}$ be the sets in $S$ not containing $x_{1}$. Then:

$$
\left|S_{1}\right| \leq|S|-\frac{w}{n}|S|=\left(1-\frac{w}{n}\right)|S| \leq|S| e^{-w / n}
$$

## Greedy Set Cover Proof



- The average number of sets an element is in is at least $\frac{w|S|}{n}$. So at least one variable, say $x_{2}$, is in at least $\frac{w|S|}{n}$ sets.
■ Let $S_{1}$ be the sets in $S$ not containing $x_{1}$. Then:

$$
\left|S_{1}\right| \leq|S|-\frac{w}{n}|S|=\left(1-\frac{w}{n}\right)|S| \leq|S| e^{-w / n}
$$

■ Repeat with $t$ times and $S_{2}, \ldots, S_{t}$ to get

$$
\left|S_{t}\right| \leq|S|-\frac{w}{n}|S| \leq|S| e^{-\frac{t w}{n}}
$$

## Greedy Set Cover Proof



- The average number of sets an element is in is at least $\frac{w|S|}{n}$. So at least one variable, say $x_{2}$, is in at least $\frac{w|S|}{n}$ sets.
■ Let $S_{1}$ be the sets in $S$ not containing $x_{1}$. Then:

$$
\left|S_{1}\right| \leq|S|-\frac{w}{n}|S|=\left(1-\frac{w}{n}\right)|S| \leq|S| e^{-w / n}
$$

■ Repeat with $t$ times and $S_{2}, \ldots, S_{t}$ to get

$$
\left|S_{t}\right| \leq|S|-\frac{w}{n}|S| \leq|S| e^{-\frac{t w}{n}}
$$

■ Then these $t$ variables work.

## Monotone DNF Size

## Theorem

Let $\epsilon \in(0,1 / 2)$ and monotone DNF $F$ be suchthat

- For all x with less than $\epsilon$ zeros, $F(x)=1$.

■ $\operatorname{Pr}\left[F\left(D_{\epsilon}\right)=0\right] \geq \operatorname{poly}(1 / n)$.
Then $F$ has $n^{1+\alpha}$ clauses for some $\alpha=\Omega\left(\frac{\epsilon}{\ln (1 / \epsilon)}\right)$.
All DNFs in circuit must satisfy condition 1.

But For DNF to "help" by much, it must satisfy condition 2.

## Monotone DNF Size Proof

1 Using Viola's theorem, we fix $\frac{n}{\ln (n)}$ variables and $F$ is left with only clauses longer larger than $w=\Omega\left(\frac{\ln (n)}{\ln (1 / \epsilon)}\right)$.

## Monotone DNF Size Proof

1 Using Viola's theorem, we fix $\frac{n}{\ln (n)}$ variables and $F$ is left with only clauses longer larger than $w=\Omega\left(\frac{\ln (n)}{\ln (1 / \epsilon)}\right)$.
2 Using greedy set cover, there is a restriction $\rho$ of $\epsilon n / 2$ variables so that $\rho$ makes

$$
\left|F \upharpoonright_{\rho}\right| \leq|F| n^{-w \frac{\epsilon n}{2 n}}=|F| n^{-\Omega\left(\frac{\epsilon}{\ln (1 / \epsilon)}\right)} .
$$

## Monotone DNF Size Proof

1 Using Viola's theorem, we fix $\frac{n}{\ln (n)}$ variables and $F$ is left with only clauses longer larger than $w=\Omega\left(\frac{\ln (n)}{\ln (1 / \epsilon)}\right)$.
2 Using greedy set cover, there is a restriction $\rho$ of $\epsilon n / 2$ variables so that $\rho$ makes

$$
\left|F \upharpoonright_{\rho}\right| \leq|F| n^{-w \frac{\epsilon n}{2 n}}=|F| n^{-\Omega\left(\frac{\epsilon}{\ln (1 / \epsilon)}\right)}
$$

3 Input can have at least $\frac{\epsilon n}{3}$ more 0 s and still be one, so:

$$
\frac{\epsilon n}{3} \leq\left|F \upharpoonright_{\rho}\right| .
$$

## Monotone DNF Size Proof

1 Using Viola's theorem, we fix $\frac{n}{\ln (n)}$ variables and $F$ is left with only clauses longer larger than $w=\Omega\left(\frac{\ln (n)}{\ln (1 / \epsilon)}\right)$.
2 Using greedy set cover, there is a restriction $\rho$ of $\epsilon n / 2$ variables so that $\rho$ makes

$$
\left|F \upharpoonright_{\rho}\right| \leq|F| n^{-w \frac{\epsilon n}{2 n}}=|F| n^{-\Omega\left(\frac{\epsilon}{\ln (1 / \epsilon)}\right)}
$$

3 Input can have at least $\frac{\epsilon n}{3}$ more 0 s and still be one, so:

$$
\frac{\epsilon n}{3} \leq\left|F \upharpoonright_{\rho}\right| .
$$

4 Together

$$
\begin{aligned}
& \frac{\epsilon n}{3} \leq|F| n^{-\Omega\left(\frac{\epsilon}{\ln (1 / \epsilon)}\right)} \\
& n^{1+\alpha} \leq|F| .
\end{aligned}
$$

## Monotone Circuit Size Lower Bounds

## Theorem

Depth-3 Circuit C solving $\epsilon$-promise majority has size $n^{2+\Omega\left(\frac{\epsilon}{\ln (1 / \epsilon)}\right)}$.
Idea: Eliminate many DNFs with few clauses.
Can eliminate too many DNFs if there are not enough clauses.

## Eliminate All Large Clauses

## Theorem

For any Circuit $C$ with $|C| \leq n^{c}$, there is a restriction $\rho$ restricting $c \frac{n}{\ln (n)}$ variables such that $C \upharpoonright_{\rho}$ has no clauses larger than $\ln (n)^{2}$.

## Eliminate All Large Clauses

## Theorem

For any Circuit $C$ with $|C| \leq n^{c}$, there is a restriction $\rho$ restricting $c \frac{n}{\ln (n)}$ variables such that $C \upharpoonright_{\rho}$ has no clauses larger than $\ln (n)^{2}$.

Focus on large clauses. Let $F^{\prime}$ be the DNF with clauses from $C$ bigger than $\ln (n)^{2}$.

## Eliminate All Large Clauses

## Theorem

For any Circuit $C$ with $|C| \leq n^{c}$, there is a restriction $\rho$ restricting $c \frac{n}{\ln (n)}$ variables such that $C \upharpoonright_{\rho}$ has no clauses larger than $\ln (n)^{2}$.

Focus on large clauses. Let $F^{\prime}$ be the DNF with clauses from $C$ bigger than $\ln (n)^{2}$.
Eliminate with Greedy Cover Algorithm! Fix $c \frac{n}{\ln (n)}$ variables with restriction $\rho$ so that

$$
\left|F^{\prime} \upharpoonright_{\rho}\right|<|F| e^{-\ln (n)^{2} \frac{c n}{\ln (n) n}} \leq n^{c} n^{-c} \leq 1
$$

## Eliminate All Large Clauses

## Theorem

For any Circuit $C$ with $|C| \leq n^{c}$, there is a restriction $\rho$ restricting $c \frac{n}{\ln (n)}$ variables such that $C \upharpoonright_{\rho}$ has no clauses larger than $\ln (n)^{2}$.

Focus on large clauses. Let $F^{\prime}$ be the DNF with clauses from $C$ bigger than $\ln (n)^{2}$.
Eliminate with Greedy Cover Algorithm! Fix $c \frac{n}{\ln (n)}$ variables with restriction $\rho$ so that

$$
\left|F^{\prime}\right|_{\rho}\left|<|F| e^{-\ln (n)^{2} \frac{c n}{\ln (n) n}} \leq n^{c} n^{-c} \leq 1\right.
$$

Conclude $\left|F^{\prime} \upharpoonright_{\rho}\right|=0$, so $C$ has no clauses bigger than $\ln (n)^{2}$.

## Eliminate All Large Clauses

## Theorem

For any Circuit $C$ with $|C| \leq n^{c}$, there is a restriction $\rho$ restricting $c \frac{n}{\ln (n)}$ variables such that $C \upharpoonright_{\rho}$ has no clauses larger than $\ln (n)^{2}$.

Focus on large clauses. Let $F^{\prime}$ be the DNF with clauses from $C$ bigger than $\ln (n)^{2}$.
Eliminate with Greedy Cover Algorithm! Fix $c \frac{n}{\ln (n)}$ variables with restriction $\rho$ so that

$$
\left|F^{\prime} \upharpoonright_{\rho}\right|<|F| e^{-\ln (n)^{2} \frac{c n}{\ln (n) n}} \leq n^{c} n^{-c} \leq 1
$$

Conclude $\left|F^{\prime} \upharpoonright_{\rho}\right|=0$, so $C$ has no clauses bigger than $\ln (n)^{2}$. NOTE: Similar algorithm works if the clauses are non-monotone, but must generalize theorem.

## Monotone Lower Bound Final Ingredient

Simple version of final step in circuit lower bound.

## Theorem

If $F$ is a monotone DNF with clause width $m^{1+x}$ for constant $x>0$, $|F|=\operatorname{poly}(n)$ and such that $F$ computes " $O R$ ", then $F$ must have $n \geq \tilde{\Omega}\left(m^{2+x}\right)$.

## Monotone Lower Bound Final Ingredient

Simple version of final step in circuit lower bound.

## Theorem

If $F$ is a monotone DNF with clause width $m^{1+x}$ for constant $x>0$, $|F|=\operatorname{poly}(n)$ and such that $F$ computes " $O R$ ", then $F$ must have $n \geq \tilde{\Omega}\left(m^{2+x}\right)$.

1 Use greedy set cover to get a restriction $\rho$ restricting $m$ variables such that:

$$
\left|F \upharpoonright_{\rho}\right| \leq|F| e^{-m^{1+x} \frac{m}{n}}=|F| e^{-m^{2+x} \frac{1}{n}}
$$

## Monotone Lower Bound Final Ingredient

Simple version of final step in circuit lower bound.

## Theorem

If $F$ is a monotone DNF with clause width $m^{1+x}$ for constant $x>0$, $|F|=\operatorname{poly}(n)$ and such that $F$ computes " $O R$ ", then $F$ must have $n \geq \tilde{\Omega}\left(m^{2+x}\right)$.

1 Use greedy set cover to get a restriction $\rho$ restricting $m$ variables such that:

$$
\left|F \upharpoonright_{\rho}\right| \leq|F| e^{-m^{1+x} \frac{m}{n}}=|F| e^{-m^{2+x} \frac{1}{n}}
$$

2 See that $m<m^{1+x} \leq n$. So $F \upharpoonright_{\rho} \neq 0$, and $\left|F \upharpoonright_{\rho}\right| \geq 1$.

## Monotone Lower Bound Final Ingredient

Simple version of final step in circuit lower bound.

## Theorem

If $F$ is a monotone DNF with clause width $m^{1+x}$ for constant $x>0$, $|F|=\operatorname{poly}(n)$ and such that $F$ computes " $O R$ ", then $F$ must have $n \geq \tilde{\Omega}\left(m^{2+x}\right)$.

1 Use greedy set cover to get a restriction $\rho$ restricting $m$ variables such that:

$$
\left|F \upharpoonright_{\rho}\right| \leq|F| e^{-m^{1+x} \frac{m}{n}}=|F| e^{-m^{2+x} \frac{1}{n}}
$$

2 See that $m<m^{1+x} \leq n$. So $F \upharpoonright_{\rho} \neq 0$, and $\left|F \upharpoonright_{\rho}\right| \geq 1$.
3 Together:

$$
\begin{aligned}
1 & \leq|F| e^{-m^{2+x} \frac{1}{n}} \\
\tilde{\Omega}\left(m^{2+x}\right) & \leq n
\end{aligned}
$$

## Monoton Circuit Lower Bound Proof Idea

■ Remove Large Clauses.

- Use DNF lower bounds to get each cause bigger than $n^{1+\alpha}$.
- Fix whole clauses with the idea from the previous slide to lower bound number of clauses.


## Monoton Circuit Lower Bound Proof Idea

■ Remove Large Clauses.

- Use DNF lower bounds to get each cause bigger than $n^{1+\alpha}$.
- Fix whole clauses with the idea from the previous slide to lower bound number of clauses.

Issue: Some DNFs might be small.

## Monoton Circuit Lower Bound Proof Idea

■ Remove Large Clauses.

- Use DNF lower bounds to get each cause bigger than $n^{1+\alpha}$.
- Fix whole clauses with the idea from the previous slide to lower bound number of clauses.

Issue: Some DNFs might be small.
Solution: Focus on large DNFs during elimination.
Insight: Some large DNF must survive if few variables fixed.

## Monotone Circuit Lower Bound Proof

Let $C$ be a circuit solving $\epsilon$-promise majority.

- Remove all clauses larger than $\ln (n)^{2}$ with a restriction $\rho_{1}$ which restricts $O\left(\frac{n}{\ln (n)}\right)$ variables.


## Monotone Circuit Lower Bound Proof

Let $C$ be a circuit solving $\epsilon$-promise majority.

- Remove all clauses larger than $\ln (n)^{2}$ with a restriction $\rho_{1}$ which restricts $O\left(\frac{n}{\ln (n)}\right)$ variables.
- Let $C^{\prime}$ be $C \upharpoonright_{\rho_{1}}$ only including DNFs with size at least $n^{1+\alpha}$ for $\alpha=\Omega\left(\frac{\epsilon}{\ln (1 / \epsilon)}\right)$ from our DNF size lower bounds.


## Monotone Circuit Lower Bound Proof

Let $C$ be a circuit solving $\epsilon$-promise majority.

- Remove all clauses larger than $\ln (n)^{2}$ with a restriction $\rho_{1}$ which restricts $O\left(\frac{n}{\ln (n)}\right)$ variables.
■ Let $C^{\prime}$ be $C \upharpoonright_{\rho_{1}}$ only including DNFs with size at least $n^{1+\alpha}$ for $\alpha=\Omega\left(\frac{\epsilon}{\ln (1 / \epsilon)}\right)$ from our DNF size lower bounds.
- Use greedy set cover algorithm to select $\frac{n}{\ln (n)^{3}}$ clauses and set them to one in $\rho_{2}$ so that

$$
\left\|C^{\prime} \upharpoonright_{\rho_{2}}\right\| \leq\left\|C^{\prime}\right\| e^{-n^{1+\alpha} \frac{n}{\ln (n)^{3}\left|C^{\prime}\right|}}
$$

## Monotone Circuit Lower Bound Proof

Let $C$ be a circuit solving $\epsilon$-promise majority.

- Remove all clauses larger than $\ln (n)^{2}$ with a restriction $\rho_{1}$ which restricts $O\left(\frac{n}{\ln (n)}\right)$ variables.
- Let $C^{\prime}$ be $C \upharpoonright_{\rho_{1}}$ only including DNFs with size at least $n^{1+\alpha}$ for $\alpha=\Omega\left(\frac{\epsilon}{\ln (1 / \epsilon)}\right)$ from our DNF size lower bounds.
- Use greedy set cover algorithm to select $\frac{n}{\ln (n)^{3}}$ clauses and set them to one in $\rho_{2}$ so that

$$
\left\|C^{\prime} \upharpoonright_{\rho_{2}}\right\| \leq\left\|C^{\prime}\right\| e^{-n^{1+\alpha} \frac{n}{\ln (n)^{3}\left|C^{\prime}\right|}}
$$

- See that $C \upharpoonright \rho_{\rho_{1}} \upharpoonright_{\rho_{2}}$ still solves $\left(\epsilon-O\left(\frac{1}{\ln (n)}\right)\right)$-promise majority. If $\|C\| \leq n^{3}$, by a counting argument some DNF, $F$, must have $\operatorname{Pr}\left[F\left(D_{\epsilon}\right)=0\right] \geq \operatorname{poly}(1 / n)$. Thus, $\left\|C^{\prime} \upharpoonright_{\rho_{2}}\right\| \geq 1$.


## Monotone Circuit Lower Bound Proof

Let $C$ be a circuit solving $\epsilon$-promise majority.

- Remove all clauses larger than $\ln (n)^{2}$ with a restriction $\rho_{1}$ which restricts $O\left(\frac{n}{\ln (n)}\right)$ variables.
- Let $C^{\prime}$ be $C \upharpoonright_{\rho_{1}}$ only including DNFs with size at least $n^{1+\alpha}$ for $\alpha=\Omega\left(\frac{\epsilon}{\ln (1 / \epsilon)}\right)$ from our DNF size lower bounds.
- Use greedy set cover algorithm to select $\frac{n}{\ln (n)^{3}}$ clauses and set them to one in $\rho_{2}$ so that

$$
\left\|C^{\prime} \upharpoonright_{\rho_{2}}\right\| \leq\left\|C^{\prime}\right\| e^{-n^{1+\alpha} \frac{n}{\ln (n)^{3}\left|C^{\prime}\right|}}
$$

- See that $C \upharpoonright \rho_{1} \upharpoonright \rho_{2}$ still solves $\left(\epsilon-O\left(\frac{1}{\ln (n)}\right)\right)$-promise majority. If $\|C\| \leq n^{3}$, by a counting argument some DNF, $F$, must have $\operatorname{Pr}\left[F\left(D_{\epsilon}\right)=0\right] \geq \operatorname{poly}(1 / n)$. Thus, $\left\|C^{\prime} \upharpoonright_{\rho_{2}}\right\| \geq 1$.
- Together:

$$
\tilde{\Omega}\left(n^{2+\alpha}\right)=n^{2+\Omega\left(\frac{\epsilon}{\ln (1 / \epsilon)}\right)} \leq\left|C^{\prime}\right|
$$

## General Depth-3 Lower Bounds

## Non Monotone Lower Bound Overview

Monotone Idea: Bound size at each level, using restrictions from set cover algorithm.

## Non Monotone Lower Bound Overview

Monotone Idea: Bound size at each level, using restrictions from set cover algorithm.

General Idea: Same!

## Non Monotone Lower Bound Overview

Monotone Idea: Bound size at each level, using restrictions from set cover algorithm.

General Idea: Same!
■ Clause lower bounds, works!

## Non Monotone Lower Bound Overview

Monotone Idea: Bound size at each level, using restrictions from set cover algorithm.

General Idea: Same!

- Clause lower bounds, works!

■ DNF lower bounds, almost works.

## Non Monotone Lower Bound Overview

Monotone Idea: Bound size at each level, using restrictions from set cover algorithm.

General Idea: Same!
■ Clause lower bounds, works!
■ DNF lower bounds, almost works.

Following first proof, may set DNF to one early due to negations. Then, can't argue restriction left any clauses. Will fix next.

## Non Monotone Lower Bound Overview

Monotone Idea: Bound size at each level, using restrictions from set cover algorithm.

General Idea: Same!

- Clause lower bounds, works!

■ DNF lower bounds, almost works.

Following first proof, may set DNF to one early due to negations. Then, can't argue restriction left any clauses. Will fix next.
■ Circuit lower bounds, works!

## Non Monotone Lower Bound Overview

Monotone Idea: Bound size at each level, using restrictions from set cover algorithm.

General Idea: Same!

- Clause lower bounds, works!

■ DNF lower bounds, almost works.

Following first proof, may set DNF to one early due to negations. Then, can't argue restriction left any clauses.

## Will fix next.

- Circuit lower bounds, works!
- At worst, might eliminate or shrink DNFs and clauses early.
- But circuit still solves a promise problem, so it still has large DNFs after restriction.


## Probabilistic Restriction

## Main Lemma

## Lemma

For constant $\epsilon \in(0,1 / 2)$, let $F$ be a DNF with:

- For all $x$ with less than $\epsilon n$ zeros, $F(x)=1$.

■ $\operatorname{Pr}\left[F\left(D_{\epsilon}\right)=0\right] \geq \operatorname{poly}(1 / n)$
Let $\beta=\Omega\left(\frac{\epsilon^{2}}{\ln (1 / \epsilon)}\right)$. Then there is a random variable $\rho$ which is a restriction on $\epsilon n / 2$ variables such that:

■ $F\left(D_{\epsilon}\right)=F \upharpoonright_{\rho}\left(D_{\epsilon}\right)$.

- Let $F^{\prime}$ be the DNF with clauses in $F \upharpoonright_{\rho}$ bigger than $w=\Omega\left(\frac{\ln (n)}{\ln (1 / \epsilon)}\right)$. Then: $\operatorname{Pr}\left[\left|F^{\prime}\right|>|F| n^{-\beta}\right] \leq e^{-\Omega(n)}$.


## Probabilistic Restriction Idea

Idea: Define sequence of restrictions, each restricting one more variable such that:

## Probabilistic Restriction Idea

Idea: Define sequence of restrictions, each restricting one more variable such that:

■ Each restriction in the sequence adds one more restriction, sampled from $D_{\epsilon}$.

## Probabilistic Restriction Idea

Idea: Define sequence of restrictions, each restricting one more variable such that:

- Each restriction in the sequence adds one more restriction, sampled from $D_{\epsilon}$.
- Each restriction has a good chance of eliminating many clauses.


## Probabilistic Restriction Idea

Idea: Define sequence of restrictions, each restricting one more variable such that:

- Each restriction in the sequence adds one more restriction, sampled from $D_{\epsilon}$.
- Each restriction has a good chance of eliminating many clauses.
- Focuses on deleting clauses bigger then $w$.


## Probabilistic Restriction Idea

Idea: Define sequence of restrictions, each restricting one more variable such that:

■ Each restriction in the sequence adds one more restriction, sampled from $D_{\epsilon}$.

- Each restriction has a good chance of eliminating many clauses.

■ Focuses on deleting clauses bigger then $w$.
Use greedy set cover algorithm to choose variables like monotone case.

Instead of just setting them to 0 , we set them to 1 with probability $\epsilon$.

## Probabilistic Restriction Idea

Idea: Define sequence of restrictions, each restricting one more variable such that:

- Each restriction in the sequence adds one more restriction, sampled from $D_{\epsilon}$.
- Each restriction has a good chance of eliminating many clauses.
- Focuses on deleting clauses bigger then $w$.

Use greedy set cover algorithm to choose variables like monotone case.

Instead of just setting them to 0 , we set them to 1 with probability $\epsilon$.

Then by Chernoff bounds, its likely that we eliminate many clauses.

And by definition if we restrict the rest of the variables, it is the same as using $D_{\epsilon}$.

## Probabilistic Restriction Construction

First, define sequence of DNFs $F_{1}, \ldots, F_{m}$, and restrictions $\rho_{0}, \ldots, \rho_{m}$ for $m=\epsilon n / 2$.
1 Let $F_{1}$ be the DNF only including clauses from $F$ with width larger than $w=\Omega\left(\frac{\ln (n)}{\ln (1 / \epsilon)}\right)$ from the clause lower bound. Let $\rho_{0}$ restrict nothing.

## Probabilistic Restriction Construction

First, define sequence of DNFs $F_{1}, \ldots, F_{m}$, and restrictions $\rho_{0}, \ldots, \rho_{m}$ for $m=\epsilon n / 2$.
1 Let $F_{1}$ be the DNF only including clauses from $F$ with width larger than $w=\Omega\left(\frac{\ln (n)}{\ln (1 / \epsilon)}\right)$ from the clause lower bound.
Let $\rho_{0}$ restrict nothing.
2 There is some variable that is in at least $\frac{w\left|F_{i}\right|}{n}$ clauses of $F_{i}, x_{i}$.
Let $\rho_{i}$ be the restriction restricting $\rho_{i-1}$ plus restricting $x_{i}$ to one with probability $\epsilon$, and 0 otherwise.

## Probabilistic Restriction Construction

First, define sequence of DNFs $F_{1}, \ldots, F_{m}$, and restrictions $\rho_{0}, \ldots, \rho_{m}$ for $m=\epsilon n / 2$.
1 Let $F_{1}$ be the DNF only including clauses from $F$ with width larger than $w=\Omega\left(\frac{\ln (n)}{\ln (1 / \epsilon)}\right)$ from the clause lower bound. Let $\rho_{0}$ restrict nothing.
2 There is some variable that is in at least $\frac{w\left|F_{i}\right|}{n}$ clauses of $F_{i}, x_{i}$.
Let $\rho_{i}$ be the restriction restricting $\rho_{i-1}$ plus restricting $x_{i}$ to one with probability $\epsilon$, and 0 otherwise.
3 Define $F_{i}$ to be the DNF which has the clauses in $F \upharpoonright_{\rho_{i-1}}$ that have width greater than w.

## Probabilistic Restriction Construction

First, define sequence of DNFs $F_{1}, \ldots, F_{m}$, and restrictions $\rho_{0}, \ldots, \rho_{m}$ for $m=\epsilon n / 2$.
1 Let $F_{1}$ be the DNF only including clauses from $F$ with width larger than $w=\Omega\left(\frac{\ln (n)}{\ln (1 / \epsilon)}\right)$ from the clause lower bound. Let $\rho_{0}$ restrict nothing.
2 There is some variable that is in at least $\frac{w\left|F_{i}\right|}{n}$ clauses of $F_{i}, x_{i}$.
Let $\rho_{i}$ be the restriction restricting $\rho_{i-1}$ plus restricting $x_{i}$ to one with probability $\epsilon$, and 0 otherwise.
3 Define $F_{i}$ to be the DNF which has the clauses in $F \upharpoonright_{\rho_{i-1}}$ that have width greater than w.
Then $\rho=\rho_{m}$, and $F^{\prime}$ is the DNF with clauses from $F_{m} \upharpoonright_{\rho}$ bigger than $w$. See that $F \upharpoonright_{\rho_{m}}\left(D_{\epsilon}\right)=F\left(D_{\epsilon}\right)$.

## Probabilistic Restriction Analysis

At step $i$, either $x_{i}$ or $\neg x_{i}$ is in at least is in $\frac{w\left|F_{i}\right|}{2 n}$ clauses.

## Probabilistic Restriction Analysis

At step $i$, either $x_{i}$ or $\neg x_{i}$ is in at least is in $\frac{w\left|F_{i}\right|}{2 n}$ clauses.
There is at least an $\epsilon$ chance of successfully eliminating $\frac{w\left|F_{i}\right|}{2 n}$ clauses.

## Probabilistic Restriction Analysis

At step $i$, either $x_{i}$ or $\neg x_{i}$ is in at least is in $\frac{w\left|F_{i}\right|}{2 n}$ clauses. There is at least an $\epsilon$ chance of successfully eliminating $\frac{w\left|F_{i}\right|}{2 n}$ clauses. If $k$ steps succeed, then

$$
\left|F_{m} \upharpoonright_{\rho_{m}}\right| \leq\left(1-\frac{w}{2 n}\right)^{k}|F| \leq|F| e^{-\frac{w k}{2 n}} \leq|F| n^{-\Omega\left(\frac{k}{\ln (1 / \epsilon) n}\right)}
$$

## Probabilistic Restriction Analysis

At step $i$, either $x_{i}$ or $\neg x_{i}$ is in at least is in $\frac{w\left|F_{i}\right|}{2 n}$ clauses.
There is at least an $\epsilon$ chance of successfully eliminating $\frac{w\left|F_{i}\right|}{2 n}$ clauses. If $k$ steps succeed, then

$$
\left|F_{m} \upharpoonright \rho_{m}\right| \leq\left(1-\frac{w}{2 n}\right)^{k}|F| \leq|F| e^{-\frac{w k}{2 n}} \leq|F| n^{-\Omega\left(\frac{k}{\ln (1 / \epsilon) n}\right)}
$$

By Chernoff bound,

$$
\operatorname{Pr}[k<\epsilon m / 2] \leq e^{-\Omega(n)} .
$$

## Probabilistic Restriction Analysis

At step $i$, either $x_{i}$ or $\neg x_{i}$ is in at least is in $\frac{w\left|F_{i}\right|}{2 n}$ clauses.
There is at least an $\epsilon$ chance of successfully eliminating $\frac{w\left|F_{i}\right|}{2 n}$ clauses. If $k$ steps succeed, then

$$
\left|F_{m} \upharpoonright_{\rho_{m}}\right| \leq\left(1-\frac{w}{2 n}\right)^{k}|F| \leq|F| e^{-\frac{w k}{2 n}} \leq|F| n^{-\Omega\left(\frac{k}{\ln (1 / \epsilon) n}\right)}
$$

By Chernoff bound,

$$
\operatorname{Pr}[k<\epsilon m / 2] \leq e^{-\Omega(n)}
$$

Thus

$$
\begin{array}{r}
\operatorname{Pr}\left[\left|F_{m} \upharpoonright_{\rho_{m}}\right|>|F| n^{-\Omega\left(\frac{\epsilon m}{\ln (1 / \epsilon) n}\right)}\right] \leq e^{-\Omega(n)} \\
\operatorname{Pr}\left[\left|F^{\prime}\right|>|F| n^{-\Omega\left(\frac{\epsilon^{2}}{\ln (1 / \epsilon)}\right)}\right] \leq e^{-\Omega(n)}
\end{array}
$$

## Applying Restriction To Get DNF Bounds

1 Apply probabilistic restriction to get $\rho, F^{\prime}$ with

$$
\operatorname{Pr}\left[\left|F^{\prime}\right|>|F| n^{-\beta}\right] \leq e^{-\Omega(n)}
$$

## Applying Restriction To Get DNF Bounds

1 Apply probabilistic restriction to get $\rho, F^{\prime}$ with

$$
\operatorname{Pr}\left[\left|F^{\prime}\right|>|F| n^{-\beta}\right] \leq e^{-\Omega(n)}
$$

2 By assumption, $\operatorname{Pr}\left[F \upharpoonright_{\rho}\left(D_{\epsilon}\right)=0\right] \geq 1 / \operatorname{poly}(n)$. Thus:

$$
\underset{\rho}{\operatorname{Pr}}\left[\operatorname{Pr}_{D_{\epsilon}}\left[F \upharpoonright_{\rho}\left(D_{\epsilon}\right)=0\right] \geq 1 / \operatorname{poly}(n)\right] \geq 1 / \operatorname{poly}(n) .
$$

## Applying Restriction To Get DNF Bounds

1 Apply probabilistic restriction to get $\rho, F^{\prime}$ with

$$
\operatorname{Pr}\left[\left|F^{\prime}\right|>|F| n^{-\beta}\right] \leq e^{-\Omega(n)}
$$

2 By assumption, $\operatorname{Pr}\left[F \upharpoonright_{\rho}\left(D_{\epsilon}\right)=0\right] \geq 1 / \operatorname{poly}(n)$. Thus:

$$
\underset{\rho}{\operatorname{Pr}}\left[\operatorname{Pr}_{D_{\epsilon}}\left[F \upharpoonright_{\rho}\left(D_{\epsilon}\right)=0\right] \geq 1 / \operatorname{poly}(n)\right] \geq 1 / \operatorname{poly}(n) .
$$

$31 / \operatorname{poly}(n)>e^{-\Omega(n)}$, so some $\rho^{\prime}$ restricts $\epsilon n / 2$ variables such that

$$
\begin{aligned}
\operatorname{Pr}\left[F \upharpoonright_{\rho^{\prime}}\left(D_{\epsilon}\right)=0\right] & \geq 1 / \operatorname{poly}(n), \\
\left|F^{\prime}\right| & <|F| e^{-\beta} .
\end{aligned}
$$

## Applying Restriction To Get DNF Bounds

1 Apply probabilistic restriction to get $\rho, F^{\prime}$ with

$$
\operatorname{Pr}\left[\left|F^{\prime}\right|>|F| n^{-\beta}\right] \leq e^{-\Omega(n)}
$$

2 By assumption, $\operatorname{Pr}\left[F \upharpoonright_{\rho}\left(D_{\epsilon}\right)=0\right] \geq 1 / \operatorname{poly}(n)$. Thus:

$$
\underset{\rho}{\operatorname{Pr}}\left[\operatorname{Pr}_{D_{\epsilon}}\left[F \upharpoonright_{\rho}\left(D_{\epsilon}\right)=0\right] \geq 1 / \operatorname{poly}(n)\right] \geq 1 / \operatorname{poly}(n) .
$$

$31 / \operatorname{poly}(n)>e^{-\Omega(n)}$, so some $\rho^{\prime}$ restricts $\epsilon n / 2$ variables such that

$$
\begin{aligned}
\operatorname{Pr}\left[F \upharpoonright_{\rho^{\prime}}\left(D_{\epsilon}\right)=0\right] & \geq 1 / \operatorname{poly}(n), \\
\left|F^{\prime}\right| & <|F| e^{-\beta} .
\end{aligned}
$$

$4 F \upharpoonright{ }_{\rho} \rho^{\prime}$ has $\Omega(\epsilon n)$ clauses with width $\Omega\left(\frac{\ln (n)}{\ln (1 / \epsilon)}\right):\left|F^{\prime}\right| \geq \Omega(\epsilon n)$. Thus:

$$
\begin{aligned}
\Omega(\epsilon n) \leq\left|F^{\prime}\right| & \leq|F| n^{-\beta} \\
n^{1+\beta} & \leq|F| .
\end{aligned}
$$

## General Circuit Lower Bounds

Use the same argument as the monotone DNF, with the lower bounds of $n^{1+\beta}$ on the second level.

## Upper Bounds

## Depth-3 Upper Bounds

Upper bounds use depth-3 circuits as a subroutine. For constant $\epsilon$, we use:
Existential: constant $\epsilon$ : Ajtai gave size $O\left(n^{2+\frac{\ln (1-\epsilon)}{\ln (\epsilon-\ln (1-\epsilon)}}\right)$.
For $\epsilon=\frac{1}{\ln (n)}$, simplifies to $O\left(n^{2}\right)$.

## Depth-3 Upper Bounds

Upper bounds use depth-3 circuits as a subroutine. For constant $\epsilon$, we use:
Existential: constant $\epsilon$ : Ajtai gave size $O\left(n^{2+\frac{\ln (1-\epsilon)}{\ln (\epsilon-\ln (1-\epsilon)}}\right)$.
For $\epsilon=\frac{1}{\ln (n)}$, simplifies to $O\left(n^{2}\right)$.
P-Uniform: $\epsilon=\frac{1}{\ln (n)}$ : Viola gives $n^{4+o(1)}$.
In appendix, we improve the circuit to get size $n^{3+o(1)}$.

## Depth-3 Upper Bounds

Upper bounds use depth-3 circuits as a subroutine. For constant $\epsilon$, we use:
Existential: constant $\epsilon$ : Ajtai gave size $O\left(n^{2+\frac{\ln (1-\epsilon)}{\ln (\epsilon-\ln (1-\epsilon)}}\right)$.
For $\epsilon=\frac{1}{\ln (n)}$, simplifies to $O\left(n^{2}\right)$.
P-Uniform: $\epsilon=\frac{1}{\ln (n)}$ : Viola gives $n^{4+o(1)}$.
In appendix, we improve the circuit to get size $n^{3+o(1)}$. Reminder, Idea: Amplify, recursively apply promise majority.

## Amplification

- Easy to amplify constant $\epsilon$ promise to $1 / \operatorname{poly}(n)$ promise with depth-2 circuit.


## Amplification

- Easy to amplify constant $\epsilon$ promise to $1 / \operatorname{poly}(n)$ promise with depth-2 circuit.

Idea: Take majority of short walks on expander graphs (Used by Viola for depth-3 circuit).
How: Short DNFs: majority of $O(\ln (\ln (n)))$ bits has polylogarithmic-size DNF.
Chernoff: Expander Chernoff bound proves amplification
Motivation $1 / \ln (n)$-promise majority is easier.
Results $o\left(n^{2}\right)$-sized depth-4 circuits using careful analysis of Ajtai's.

## Amplification

■ Easy to amplify constant $\epsilon$ promise to $1 / \operatorname{poly}(n)$ promise with depth-2 circuit.

Idea: Take majority of short walks on expander graphs (Used by Viola for depth-3 circuit).
How: Short DNFs: majority of $O(\ln (\ln (n)))$ bits has polylogarithmic-size DNF.
Chernoff: Expander Chernoff bound proves amplification
Motivation $1 / \ln (n)$-promise majority is easier.
Results $o\left(n^{2}\right)$-sized depth-4 circuits using careful analysis of Ajtai's.
■ Can we get very small promise majority with just amplification and a single depth-3 promise majority?

## Amplification

■ Easy to amplify constant $\epsilon$ promise to $1 / \operatorname{poly}(n)$ promise with depth-2 circuit.

Idea: Take majority of short walks on expander graphs (Used by Viola for depth-3 circuit).
How: Short DNFs: majority of $O(\ln (\ln (n)))$ bits has polylogarithmic-size DNF.
Chernoff: Expander Chernoff bound proves amplification
Motivation $1 / \ln (n)$-promise majority is easier.
Results $o\left(n^{2}\right)$-sized depth-4 circuits using careful analysis of Ajtai's.
■ Can we get very small promise majority with just amplification and a single depth-3 promise majority?

■ Not without much better amplification!
■ Existing techniques increase size faster than promise, so that depth-3 promise majority circuits solving promise majority are still 'large'.

## Iteratively Computing Majority Idea

$$
\epsilon = 2 / 5 \longdiv { 1 | 1 | } | 1 | 0 | 0 | 1 | 1 | 1 | 0 | 0 | 1 | 1 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 \mid 0
$$

Since amplification increases size too fast, decrease size.

## Iteratively Computing Majority Idea



Since amplification increases size too fast, decrease size.

Idea: Run promise majority on small groups to get new bits.

## Iteratively Computing Majority Idea



Since amplification increases size too fast, decrease size.

Idea: Run promise majority on small groups to get new bits.
Problem: For large $\epsilon$, may violate promise.

## Iteratively Computing Majority Idea



Since amplification increases size too fast, decrease size.

Idea: Run promise majority on small groups to get new bits.
Problem: For large $\epsilon$, may violate promise.
Insight: $\epsilon$-promise input ran in groups through $\delta$-promise circuits gives $\frac{\epsilon}{\delta}$-promise input.

## Iteratively Computing Majority Idea



Since amplification increases size too fast, decrease size.

Idea: Run promise majority on small groups to get new bits.
Problem: For large $\epsilon$, may violate promise.
Insight: $\epsilon$-promise input ran in groups through $\delta$-promise circuits gives $\frac{\epsilon}{\delta}$-promise input.
Solution: Amplify, then run in groups.

## Iteratively Computing Majority

Using this idea:

## Theorem

If there are depth-3 circuits with size $n^{\alpha}$ solving $\frac{1}{\ln (n)}$-promise majority, then for any positive integer $k$, there are depth- $(1+2 k)$ circuits solving $\frac{1}{\ln (n)^{k}}$-promise majority with size

$$
k n^{\frac{1}{1-\left(\frac{\alpha-1}{\alpha}\right)^{k}}} .
$$

Combined with depth 2 amplification, we get our upper bounds for higher depths.

## Sub-Quadratic Size Promise Majority

As special cases, we get, using Ajtai's circuit, we get:

## Theorem

There exists a depth-4 circuits computing $\epsilon$-promise majority with size $o\left(n^{2}\right)$.

And using our circuit, we get:

## Theorem

There exists a depth-6, $P$-Uniform circuits computing $\epsilon$-promise majority with size $o\left(n^{2}\right)$.

Viola's original circuit needed depth-8 to get sub-quadratic size.

## Open Problems

## Open Problems

- Wanted fine grained tradeoff in depth vs size during derandomization. Particularly, if quadratic derandomization costs depth-3.


## Open Problems

- Wanted fine grained tradeoff in depth vs size during derandomization. Particularly, if quadratic derandomization costs depth-3.
- Did show existing derandomization techniques have this.
- Might not be only way to derandomize. Need to find explicit problem OR find a new way to derandomize.


## Open Problems

- Wanted fine grained tradeoff in depth vs size during derandomization. Particularly, if quadratic derandomization costs depth-3.
- Did show existing derandomization techniques have this.
- Might not be only way to derandomize. Need to find explicit problem OR find a new way to derandomize.
- Missing explicit, depth-4 quadratic sized circuits.
- Seems related to other psuedorandom objects. Can be rephrased as distribution over dispersers.


## Open Problems

- Wanted fine grained tradeoff in depth vs size during derandomization. Particularly, if quadratic derandomization costs depth-3.

■ Did show existing derandomization techniques have this.

- Might not be only way to derandomize. Need to find explicit problem OR find a new way to derandomize.
- Missing explicit, depth-4 quadratic sized circuits.
- Seems related to other psuedorandom objects. Can be rephrased as distribution over dispersers.
■ Results aren't tight!
- Upper and lower bounds don't match.
- Are the best circuits monotone?
- Do any uniform circuits have optimal size?
- Upper bounds for large depth don't match known lower bounds (Chaudhuri and Radhakrishnan are asymptotically close [4]).


## Depth-3 Bounds, Constant $\epsilon$

Note: Graphs slightly adjusted for visibility.
Y -axis is $c$ for circuit size $n^{c}$.


## Depth-3 Bounds, Constant $\epsilon$

Note: Graphs slightly adjusted for visibility.
Y -axis is $c$ for circuit size $n^{c}$.


## Depth-3 Bounds, Constant $\epsilon$

Note: Graphs slightly adjusted for visibility.
Y -axis is $c$ for circuit size $n^{c}$.


## Depth-3 Bounds, Constant $\epsilon$

Note: Graphs slightly adjusted for visibility.
Y -axis is $c$ for circuit size $n^{c}$.


## Depth-3 Bounds, Constant $\epsilon$

Note: Graphs slightly adjusted for visibility.
Y-axis is $c$ for circuit size $n^{c}$.


## Depth-3 Bounds, Constant $\epsilon$

Note: Graphs slightly adjusted for visibility.
Y-axis is $c$ for circuit size $n^{c}$.


## Depth-3 Bounds, Constant $\epsilon$

Note: Graphs slightly adjusted for visibility.
Y-axis is $c$ for circuit size $n^{c}$.


## Depth-3 Bounds, Constant $\epsilon$

Note: Graphs slightly adjusted for visibility.
Y -axis is $c$ for circuit size $n^{c}$.


## Depth-3 Bounds, Small $\epsilon$

Note: now might have many more wires than gates. X-axis is $c$ if $\epsilon=n^{c}$.


## Depth-3 Bounds, Small $\epsilon$

Note: now might have many more wires than gates. X-axis is $c$ if $\epsilon=n^{c}$.


## Depth-3 Bounds, Small $\epsilon$

Note: now might have many more wires than gates. X-axis is $c$ if $\epsilon=n^{c}$.


## Depth-3 Bounds, Small $\epsilon$

Note: now might have many more wires than gates. X-axis is $c$ if $\epsilon=n^{c}$.


## References

## References I

## 國 Leonard Adleman.

Two theorems on random polynomial time.
In Proceedings of the 19th Annual Symposium on Foundations of Computer Science, SFCS '78, page 75-83, USA, 1978. IEEE Computer Society.
R Miklós Ajtai.
Sigma11-formulae on finite structures.
Ann. Pure Appl. Log., 24:1-48, 1983.
嗇 Miklós Ajtai.
Approximate counting with uniform constant-depth circuits. In Advances In Computational Complexity Theory, volume 13, pages 1-20, 1993.

## References II

Rhiva Chaudhuri and Jaikumar Radhakrishnan.
Deterministic restrictions in circuit complexity.
In Proceedings of the Twenty-Eighth Annual ACM Symposium on
Theory of Computing, STOC '96, page 30-36, New York, NY, USA,
1996. Association for Computing Machinery.

國 Clemens Lautemann.
Bpp and the polynomial hierarchy.
Information Processing Letters, 17(4):215-217, 1983.
目 Nutan Limaye, Srikanth Srinivasan, and Utkarsh Tripathi.
More on $\mathrm{AC}^{0}[\oplus]$ and variants of the majority function.
In 39th IARCS Annual Conference on Foundations of Software Technology and Theoretical Computer Science (FSTTCS 2019), volume 150, pages 22:1-22:14, 2019.

## References III

Emanuele Viola.
On approximate majority and probabilistic time. Computational Complexity, 18:337-375, 2009.

Emanuele Viola.
Randomness buys depth for approximate counting. In 2011 IEEE 52nd Annual Symposium on Foundations of Computer Science, pages 230-239, 2011.

