

Last time:

- overview of some restricted comput. models we'll consider; worst-case, avg-case l.b's; PRGs
- PRG \Rightarrow worst-case lb

Today:

- finish overview: PRG \Rightarrow avg-case lb
- det. approx. counting
- ⊛ Boolean formulas: various worst-case l.b's.

Scribe(s): Yiming ☺

Questions?

Lemma: (PRG \Rightarrow average-case lb)

Let \mathcal{C} be a class of n -bit fns f s.t.
 \mathcal{C} closed under restrictions

Let $G: \{0,1\}^s \rightarrow \{0,1\}^n$ be ϵ -PRG for \mathcal{C} , where
 $s \leq n, \epsilon < 1/2$. Let $r = s + \log \frac{1}{\epsilon} \leq n$.

Define $h: \{0,1\}^r \rightarrow \{0,1\}$ as outputting 1 on x
if some string in range of PRG starts with x :

$$h(x) = 1 \quad \text{iff} \quad \exists \underset{\substack{\text{s bits}}}{y} \in \{0,1\}^s, \underset{\substack{\text{n-r bits}}}{z} \in \{0,1\}^{n-s-1} \text{ s.t.}$$

$$\underline{G(y) = (x, z)}$$

Let \mathcal{C}' be all restric. of fns in \mathcal{C} by fixing
last $n-r$ bits, leaving first r alive.

Let $\mathcal{D} = \frac{1}{2} \cdot \mathcal{U}_r + \frac{1}{2} G(\mathcal{U}_s)_{1:r}$ → over $\{0,1\}^r$

Then h is ϵ -hard for \mathcal{E} w.r.t. \mathcal{D} .

aug-case
LB!

Pf: Let $\mathcal{U} \sim \mathcal{U}_r$ (unif. over $\{0,1\}^r$),
 $\mathcal{U}' \sim \mathcal{U}_s$ $\{0,1\}^s$

$$r = s + \log \frac{1}{\epsilon}$$

Fix any $f \in \mathcal{E}$, say $f(x) = f_0(x, a)$ some fixed $a \in \{0,1\}^{r-r}$,
some $f_0 \in \mathcal{E}$.

Then

$$\begin{aligned} \Pr_{X \sim \mathcal{D}} [f(X) = h(X)] &= \frac{1}{2} \Pr[f(\mathcal{U}) = h(\mathcal{U})] + \frac{1}{2} \Pr[f(G(\mathcal{U}')_{1:r}) = h(G(\mathcal{U}')_{1:r})] \\ &= \frac{1}{2} \Pr[f(\mathcal{U}) = h(\mathcal{U})] + \frac{1}{2} \Pr[f(G(\mathcal{U}')_{1:r}) = 1] \\ &\leq \frac{1}{2} \Pr[f(\mathcal{U}) = 0] + \frac{1}{2} \Pr[h(\mathcal{U}) = 1] \\ &\quad + \frac{1}{2} (\Pr[f(\mathcal{U}) = 1] + \epsilon) \\ &= \frac{1}{2} + \frac{\epsilon + \mathbb{E}[h]}{2} \leq \frac{1}{2} + \frac{2\epsilon}{2} = \frac{1}{2} + \epsilon. \end{aligned}$$

$f \in \mathcal{E} \subseteq \mathcal{E}$
+ G^ϵ fools \mathcal{E}

$$2^r = 2^{s + \log \frac{1}{\epsilon}} = \frac{1}{\epsilon} \cdot 2^s$$

similarly
Can argue: $\Pr_{X \sim \mathcal{D}} [f(X) = h(X)] \geq \frac{1}{2} - \epsilon$.

$h = 1$ on 2^s of 2^r inputs

So....

$WCLB$, then Corr. bds, then PRG's.
 $ACLB$

Weird uncle: Deterministic Approximate Counting
algs.

PRGs nice b/c they let us ^{obviously} derandomize ...

the 2^s n-bits outputs fool every $f \in \mathcal{C}$
w/o looking at f .

you want $\mathbb{E}[f] \pm \epsilon$

If you know what f is, could conceivably use
it...

① → (Deterministic Approx. Count)

Def: (DAC) Let \mathcal{C} be a class of representations
of f 's $\{0,1\}^n \rightarrow \{0,1\}$.

An alg. is an ϵ -DAC for \mathcal{C} if it's
det. \forall , on input any $F \in \mathcal{C}$, outputs a value in

$$[\mathbb{E}\{F(u)\} - \epsilon, \mathbb{E}\{F(u)\} + \epsilon].$$

Can show: if have $\text{poly}(n)$ -time $(\epsilon=0.1)$ -DAC
for $\mathcal{C} = \{\text{all poly}(n)\text{-size ckt's}\}$, then $P=BPP$.

Fact: For various \mathcal{C} 's, can give ϵ -DAC's
which are faster than $2^s \cdot \text{poly}(n)$, where
 $s =$ seed length of best known ϵ -PRG.

Conventions:

$$|a - b| \leq \epsilon \iff \boxed{a \approx_{\epsilon} b}$$

\mathcal{U}_s : unif. over $\{0, 1\}^s$
 $\{\pm 1\}^s$

$\mathbb{E}[f]$ means $\mathbb{E}[f(\mathcal{U})]$

Scribe:

Use **bold** for random vars ☺

$$\mathbb{E}[f(\mathcal{U})]$$

Unit: Bool. Formulas

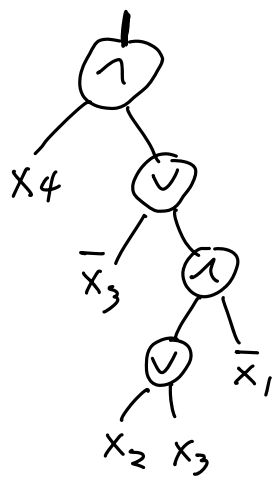
(worst-case l.b's)

(readings on web).

Basics: Def: Bool. formula: rooted bin. tree
with

- leaf nodes (lab. with x_i or \bar{x}_i)
- internal nodes (lab. \oplus or \odot)
binary

(\mathcal{U}_2 basis,
de Morgan)

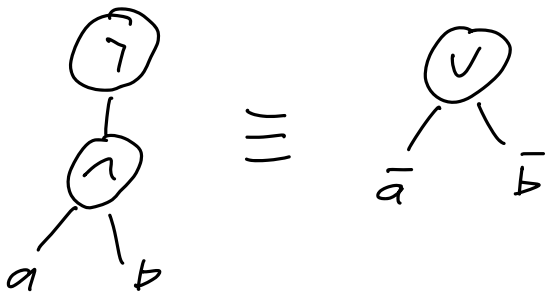


Form. on $\{0,1\}^n$
computes a fn in
obvious way.

size of formula $F = \# \text{ leaves}$
 $= (\# \text{ int.} + 1)$

depth $= \text{length of longest root-to-leaf path.}$

WLOG all negations at leaves:



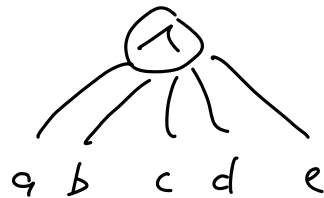
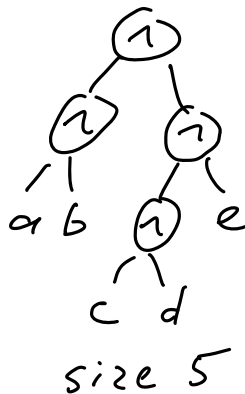
Def: Given $f: \{0,1\}^n \rightarrow \{0,1\}$,

formula size $\text{size}(f) = \text{size of smallest } F$
 computing f

" depth $\text{depth}(f) = \text{depth " " "$
 " " " " " "

(Sometimes: unbounded fan-in allowed.

Size unchanged



depth changes.

DNF, CNF: depth-2, unbounded fan-in.

Ex: ^{This} "decision list" function:

if $x_1 \rightarrow 1$
 else if $x_2 \rightarrow 0$
 " " $x_3 \rightarrow 1$
 ...

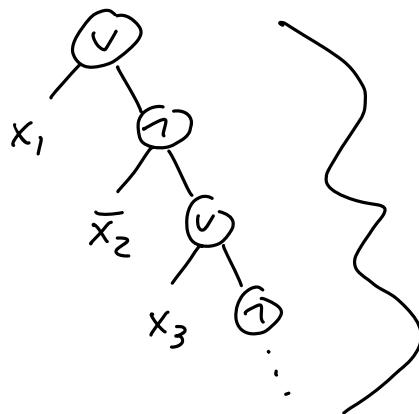
$x_1 \rightarrow x_2 \rightarrow x_3 \rightarrow x_4$
 $\downarrow \quad \downarrow \quad \downarrow \quad \downarrow$
 1 \quad 0 \quad 1 \quad 0

Formula:

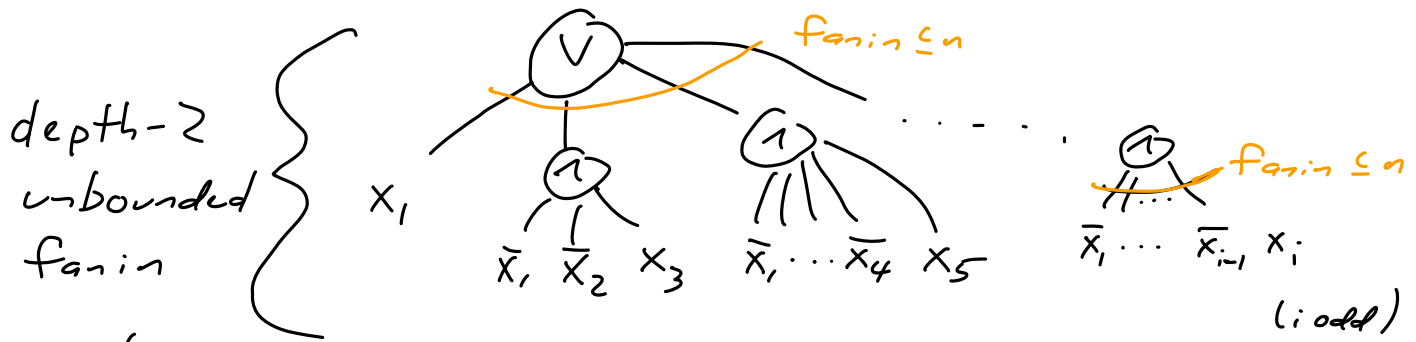
$$x_1 \vee (\bar{x}_2 \wedge (x_3 \vee (\bar{x}_4 \wedge (\dots))))$$

size = n, min. possible so size(F) = n ☺

depth(this F) = n



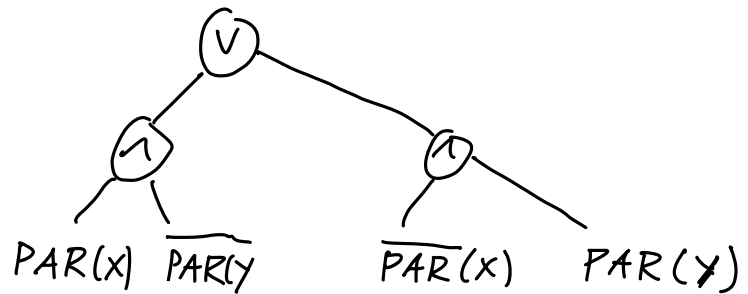
$O(\log n)$ depth F for this f_n : DNF.



convert to $2 \log n$ depth
 $\Theta(n^2)$ size formula.

Ex 2: Parity f_n $f(x_1, \dots, x_n) = \sum_{i=1}^n x_i \pmod 2$

Recursive: $\frac{n}{2}$ bits each
 $\downarrow \downarrow$
 $\text{PAR}(X, Y) =$



$s(i) =$ size for i vars

$s(1) = 1$

$s(2i) = 4s(i)$

$s(n) = n^2$

Optimal!

FACT:

There are $O(n)$ -size cmts for PAR_n .

We'll do $\Omega(n^{1.5})$ lower bound, using PRG-relevant techniques.

Shannon's \rightarrow (exponential!) lower bnd on formula size.

via counting arguments

Fact: There are 2^{2^n} many $f: \{0,1\}^n \rightarrow \{0,1\}$.

Thm (Shannon): $1 - 2^{-n}$ fraction (actually more) of all n -bit $f: \{0,1\}^n \rightarrow \{0,1\}$ have $\text{form. size}(f) \geq \frac{2^n}{2 \log n}$.

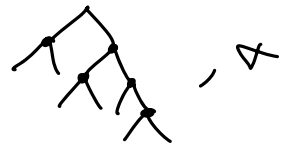
Pf: We show: for $s = \frac{2^n}{2 \log n}$,

(# of Bool. form. of size s over x_1, \dots, x_n) $\ll 2^{2^n} \cdot \frac{1}{2^n}$.

Here's why:

Any formula F specified by

Ⓘ • tree struc. of binary tree



Ⓣ • labels of all nodes.

We'll bd # specifications.

Ⓘ: s -leaf form. has $s-1$ internal nodes.

Can describe any such tree as elt of

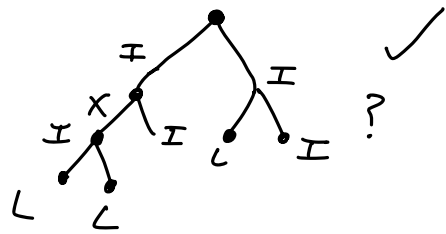
$\{II, IL, LI, LL\}^{s-1}$

I = internal

L = leaf

(1st child, 2nd child)

\checkmark \times $?$
II II LI LL :



Every tree has such a descrip., so # tree struc
 w/ $s-1$ int. nodes $\leq 4^{s-1}$. (good enough)

(II) #labelings: 2^{s-1} for $s-1$ int. nodes (a) (v)
 $(2n)^s$ for s leaves x_1, \dots, x_n .

So # size- s form. over $\{0,1\}^n$ is \leq

$$\underbrace{4^{s-1}}_{\# \text{ trees}} \cdot \underbrace{2^{s-1} \cdot (2n)^s}_{\# \text{ labels}} \leq (16n)^s$$

For $s = \frac{2^n}{2 \log n}$, this is

$$(16n)^{\frac{2^n}{2 \log n}} = 2^{2^n \cdot \frac{(\log n) + 4}{2 \log(n)}} \stackrel{\text{for } n \text{ suff. large}}{<} 2^{0.51 \cdot 2^n} \ll 2^{2^n} \cdot \frac{1}{2^n}.$$

Note: DNF or CNF for f : $\leq 2^{n-1}$ terms

n lit / term, ^{so} easy $n \cdot 2^{n-1}$ u. b.

OFFICIAL HW PROBLEM:

extend to avg-case l. b. under \mathcal{U} .

This l. b. not satisfying: not explicit.

Break

Subbotousskaya's lower bound via random restrictions

for an explicit fn!

Sub. '61: analyzed effect of random restrictions on Bool. formulas.

Idea: given form F computing $f(x_1, \dots, x_n)$

- set some of inputs x_i to 0/1 values, leaving rest "free"
- Argue this shrinks F "by a lot", yet size after restric. ≥ 1 .

This means size(F) must have been large!

Def A restriction ρ is a mapping $[n] \rightarrow \{0, 1, *\}$
 ρ is a partial assignment to vars x_1, \dots, x_n ;

$i \rightarrow * : x_i$ is left unassigned.

$$p \in \{0, 1, *\}^n.$$

We write $f|_p$ to denote restric. of f by p .

Ex: $p = (1, 0, 1, *, *, 1)$, f is 6-var f_n ,

$$f|_p(x) = f(1, 0, 1, x_4, x_5, 1). \quad \left(\begin{array}{l} \text{"zoom in" on} \\ \text{subcube of } f \end{array} \right)$$

Let R_k denote ^{following} dist. over restrictions:
choose k vars u.g.r. for $*$,
other $n-k$ get 0/1 $\textcircled{\$}$

Thm: (Sub.) Let $f: \{0, 1\}^n \rightarrow \{0, 1\}$, let $p \leftarrow R_k$.
w.p. $\geq 3/4$ (over p),

$$\textcircled{\star} \quad \text{size}(f|_p) \leq 4 \cdot \left(\frac{k}{n}\right)^{3/2} \cdot \text{size}(f).$$

Applic: Let $k=1$, let $f = \text{PAR}_n$.

$f|_p$ is x_i or \bar{x}_i so $\text{size}(f|_p) = 1$.

$$\text{so} \quad 1 \leq 4 \cdot \left(\frac{1}{n}\right)^{3/2} \cdot \text{size}(f) \quad \times$$

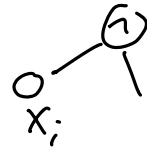
$$\text{size}(f) \geq \frac{1}{4} \cdot n^{3/2} \quad \text{''}$$

Pf of \star : Let F be opt (smallest) form. for f .
 $\text{size}(F) = s$.

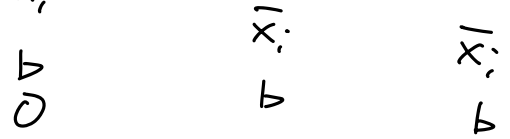
View p as constr. in $n-k$ stages:

each stage - pick un-fixed var at rand, pick 0/1 assign. Analyze one stage: what happens to F ?

1st stage: pick x_i . $b \in \{0,1\}$



Fixing x_i to b , all inst. of x_i or \bar{x}_i vanish.

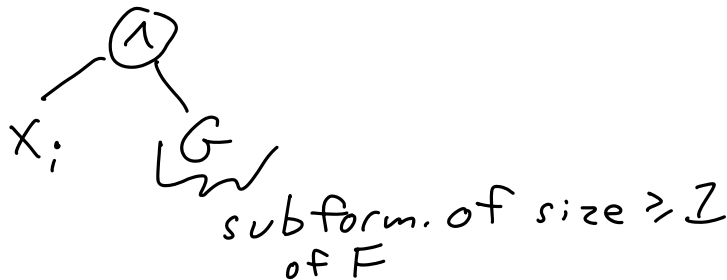


$\mathbb{E}\{\# \text{occ. of } x_i \text{ or } \bar{x}_i\} = \frac{s}{n}$. So $\mathbb{E}\{\text{size of } F\}$

shrinks by $\frac{s}{n}$!!

Key: F shrinks by more (in expectation).

Consider any occurrence of x_i or \bar{x}_i in F , i.e.



G doesn't have any x_i or \bar{x}_i : G only matters if $x_i = 1$, + then by repl. x_i in G with 0 , \bar{x}_i

would have smaller form (contrad.).

w.p. $\frac{1}{2}$ $x_i \leftarrow 0$, & then G vanishes, so
 ≥ 1 more lit. vanishes.

So $\mathbb{E}[\# \text{ lit. vanish b/c of this "secondary effect"}] \geq \frac{1}{2} \cdot \frac{s}{n}$.

$$\begin{aligned} \text{And } \mathbb{E}[\text{size of } F \uparrow_\rho \text{ after 1st stage}] &\leq s - \frac{3}{2} \frac{s}{n} \\ &= s \left(1 - \frac{3}{2n}\right) \\ &\leq s \cdot \left(1 - \frac{1}{n}\right)^{3/2}. \end{aligned}$$

Repeat (on opt. form. each time).

2nd step:
 $n-1$ vars, so $\mathbb{E}[\text{size after 2 stages}]$
 $\leq s \cdot \left(1 - \frac{1}{n}\right)^{3/2} \cdot \left(1 - \frac{1}{n-1}\right)^{3/2}$
 $= s \cdot \left(\frac{n-1}{n}\right)^{3/2} \cdot \left(\frac{n-2}{n-1}\right)^{3/2}$

So after $n-k$ stages,

$$\mathbb{E}[\text{size}] \leq s \cdot \left(\frac{n-k}{n}\right)^{3/2} = s \cdot \left(\frac{k}{n}\right)^{3/2}.$$

Markov: w.p. $\geq \frac{3}{4}$ $\text{size}(F \uparrow_\rho) \leq 4 \cdot s \left(\frac{k}{n}\right)^{3/2}$

History:

Γ = "shrinkage exponent"

= best # in place of $\frac{3}{2}$
s.t. still true.

$\Gamma \leq 2$ (PAR)

Nisan-Impagliazzo: ^{'91} $\Gamma \geq 1.55$

Paterson-Zwick: ^{'91} $\Gamma \geq 1.63$

Hastad: ^{'93} $\Gamma \geq 2 - o(1)$

Tal '14: better $o(1)$.

Project topic:

Andreiev's lower bound

→ '87: clever way to get $n^{\Gamma+1}$ form. size l.b. for an explicit f .

We saw: there's an n -var f_n with form. size $\geq \frac{2^n}{2 \log n}$.

Scale down to $b := \log_2 n$ vars:

there's some $(\log n)$ -var f_n requiring form. size $\geq \frac{n}{\log \log n}$. Call this $\psi(x_1, \dots, x_b)$ _{$\log n$} .

Warmup to Andre'ev fn:

$$\text{Let } m = \frac{n}{b} = \frac{n}{\log n}.$$

View x_1, \dots, x_n as b blocks of m vars/block.

Define $f_\psi: \{0,1\}^n \rightarrow \{0,1\}$ as

$$f_\psi(x_1, \dots, x_n) = \psi(\overbrace{x_1 \oplus \dots \oplus x_m}^{B_1}, \overbrace{x_{m+1} \oplus \dots \oplus x_{2m}}^{B_2}, \dots, \overbrace{x_{n-m+1} \oplus \dots \oplus x_n}^{B_b}).$$

Apply Sub. thm to f_ψ , using $k = b \cdot \ln(4b)$
(so $p \sim R_k$ leaves $b \cdot \ln(4b)$ vars alive, *).

→: w.p. $\geq \frac{3}{4}$ over $p \sim R_k$, have

$$\textcircled{*} \text{ size}(f_\psi|_p) \leq 4 \cdot \left(\frac{k}{n}\right)^{\Gamma} \cdot \text{size}(f_\psi).$$

Also have:

Claim: w.p. $\geq \frac{3}{4}$ over $p \sim R_k$, ρ assigns ≥ 1

* to each block. \textcircled{\#}

Pf: Calculation: Fix a block $i \in [b]$.

$$P_p[\text{block } i \text{ gets } \underline{\text{no}} \text{ * under } \rho] = \frac{\binom{n-m}{k}}{\binom{n}{k}} \leq \left(\frac{n-m}{n}\right)^k$$

$$= \left(1 - \frac{1}{b}\right)^{b \cdot 4 \ln(b)} \leq \frac{1}{4b}.$$

UB over all b blocks

So w.p. $\geq \frac{1}{2}$, $p \sim R_K$ sat. $\textcircled{\star} \vee \textcircled{\#}$.

Fix any such p . For such a p ,
 $f_{\mathcal{X}} \upharpoonright_p$ has \mathcal{V} as a subfunc., so

$\text{size}(f_{\mathcal{X}} \upharpoonright_p) \geq \text{size}(\mathcal{V}) \geq \frac{n}{\log \log n}$. So,

$$\begin{aligned} \frac{n}{\log \log n} &\leq \text{size}(\mathcal{V}) \leq \text{size}(f_{\mathcal{X}} \upharpoonright_p) \\ &\leq 4 \left(\frac{K}{n}\right)^n \cdot \text{size}(f_{\mathcal{X}}) \\ &= 4 \cdot \left(\frac{(\log n) \cdot \ln(4 \ln n)}{n}\right)^n \cdot \text{size}(f_{\mathcal{X}}). \end{aligned}$$

So $\text{size}(f_{\mathcal{X}}) = \tilde{\Omega}(n^{\Omega(1)})$.

This $f_{\mathcal{X}}$ is not explicit...

Trick: give \mathcal{V} as input.

View $\mathcal{V}(x_1, \dots, x_b)$ as $(2^b = n)$ -bit string;

for any $y \in \{0, 1\}^n$ (view as b -bit fn),

have $f_y(x_1, \dots, x_n) = y(x_1 \oplus \dots \oplus x_m, \dots, x_{n-m+1} \oplus \dots \oplus x_n)$.

Andre'ev's actual fn:

$$A(x, y) =$$

n bits

Some $y \in \{0, 1\}^n$ gives χ , so

$$\text{so } \text{size}(A(x, y)) \geq \text{size}(f_{\chi}) \geq \tilde{\Omega}(n^{n+1}).$$

A is in P : in fact,

OFFICIAL HW PROBLEM:

Show $A(x, y)$ is computable by

$O(n)$ -size ckt.

A has

- ckt size $O(n)$
- form. size $\tilde{\Omega}(n^3)$

} biggest gap known!

Proj topic: KRW conjecture.