

# DD2445 COMPLEXITY THEORY: LECTURE 23

Recap

## Regular resolution

Clauses derived by resolution rule

$$\begin{array}{c} (C \vee x) \quad (D \vee \bar{x}) \\ \hline \rightarrow C \vee D \end{array}$$

Represent refutation as DAG

Regular: On any path from source/axiom to sink/contradiction any variable resolved only once

## Read-once branching program

One start node

Every non-sink



Truth value assignment & no path

Every sink labelled by clause CEF

Every x leading to sink should have  $\alpha(x) = 0$

Read-once: Along any path, query any variable at most once

Size of ROBP = # nodes

Regular resolution  
refutation



Read-once branching  
program

- Flip direction of edges
- query resolved variables.

### (iii) Clique formula

$k \in \mathbb{N}$

Basically clique-colouring formula but with restriction of to  $\vec{p}$ -variables.

But with extra twist to avoid formulae being hard for "syndic reasons"

Variables

$x_{v,i} = \text{"v is i-th member of clique"}$

$$v \in V = \{1, 2, \dots, n\} = [n]$$

$$i \in \{1, 2, \dots, k\} = [k]$$

Clique axioms

$$\bigvee_{v \in V} x_{v,i} \quad | \quad i \in [k]$$

Edge axioms

$$\bar{x}_{u,i} \vee \bar{x}_{v,j} \quad | \quad i \neq j \in [k]$$

$(u, v) \notin E$

Functionality axioms

$$\bar{x}_{u,i} \vee \bar{x}_{v,i} \quad | \quad i \in [k], u \neq v \in V$$

Ordering axioms

$$\bar{x}_{u,i} \vee \bar{x}_{v,j} \quad | \quad u < v \in V, (u, v^-) \in E$$

$i > j \in [k]$

"If  $u$  and  $v$  both in clique and  $u < v$ , then clique index of  $u <$  clique index of  $v$ "

Ordering axioms are important — but we will ignore them for simplicity

(All key ideas still there, and even w/o ordering axioms the lower bound is actually nontrivial)

Goal: Show lower bound  $n^{-\Omega(k)}$

(I.e.,  $\exists$  universal constant  $\gamma$  s.t. lower bound  $n^{\gamma \cdot k}$ )

## PREVIOUSLY KNOWN

KC VII

### Tree-like resolution

$n^{o(k)}$  lower bound for balanced complete  $(k-1)$ -partite graph

### General resolution [Beame, Impagliazzo, Sabharwal '07]

Lower bound  $\exp(n^\delta)$  for  $k = n^\delta$ ,  $\delta \geq 5/6$

Nothing known for smaller  $k$

### Regular resolution

Complete  $(k-1)$ -partite graphs easy

We show ~~lower bound~~  $n^{o(k)}$  for

$k \leq n^{1/2 - \varepsilon}$  on average for random graphs

Should be true also for general resolution,  
but this remains open

From now on, talk only about branching programs

ROBP: path  $\Leftrightarrow$  partial assignment

Branching program: nodes a, b

Graph  $G = (V, E)$ : vertices u, v, w

$\beta(a) :=$  maximal partial assignment contained  
in any path from source to a  
= all variable queries made along any  
path to a

"Assignments remembered at a"

Source path = path from source to some node

On path  $x$  x queried, edge  $\xrightarrow{x} b$  taken  
"x sets x to b"

If  $\exists$  source path  $\alpha$  to a such that

KC VIII

-  $\alpha$  sets  $x$

-  $\beta(a)$  doesn't contain  $x$

we say  $x$  **FORGOTTEN** at a

### OBSERVATION 1

If  $x$  forgotten at a and  $\exists$  path  $a \rightsquigarrow b$ , then  $x$  forgotten at b

Proof Use read-once property.

$\exists \alpha$ : source and a not setting  $x$

$\exists \alpha'$ : source was a setting  $x$

Suppose  $\exists \beta$ : a  $\rightsquigarrow b$  setting  $x$

Then composed path  $\alpha' \circ \beta$  violates read-once property.  qed

Focusing on clique formulas

If  $x_{v,i}$  forgotten at a for some  $v \in V$ ,  
say **INDEX i FORGOTTEN** at a

If source path  $\alpha$  ends at clique axiom

$\bigvee_{v \in V} x_{v,i}$  (which it falsifies), say

**PATH  $\alpha$  RULES OUT INDEX i**

### OBSERVATION 2

If source path  $\alpha$  rules out index  $i$  at source b, then  $i$  is not forgotten at b

Proof Any  $\alpha'$  ending at b

must have queried all  $x_{v,i}$  -  $v \in V$

(and have received answers 0), so no  $x_{v,i}$  can be forgotten

For the rest of this lecture, fix arbitrary ROBP II solving  $k$ -clique formula for  $G = (V, E)$  without  $k$ -clique. Want to prove II has size  $n^{-\Omega(k)}$  asymptotically almost surely if Random graph.

| KC IX

Define distribution  $D$  over paths  $\alpha$  by following process, starting at source

Say current node  $a$  queries  $x_{v,i}$

(a) If  $\beta(a) \cup \{x_{v,i} \mapsto 1\}$  falsifies edge or functionality axiom, take 0-edge (set  $x_{v,i} \mapsto 0$ )  $\$$  (a)+(b) "FORCED CHOICES"

(b) If  $i$  forgotten at  $a$ , set  $x_{v,i} \mapsto 0$

(c) Otherwise, flip  $n^{-\delta}$ -biased coin ( $\delta > 0$ )

$\rightarrow x_{v,i} \mapsto 1$  with prob  $n^{-\delta}$

$x_{v,i} \mapsto 0$  otherwise (highly likely)

### OBSERVATION 3

- (i) Any  $\alpha \sim D$  ends by ruling out some index  $i$  (never falsifies functionality or edge axioms)
- (ii) Any  $\alpha \sim D$  sets at most  $k$  variables  $x_{v,i} \mapsto 1$

Proof Exercise. (Uses definition of  $D$ , obviously)

## FIRST PROOF IDEA (WON'T WORK)

LC X

Given any  $\alpha \sim D$ , define waypoints for  
 $a_0 = \text{source}$

$a_{i+1} = \text{first time after } a_i$  [  $k/t$  assignments  
 $x_{v,i} \mapsto 1$  on  $\alpha$  or sink of path,  
whichever comes first]

Suppose  $\alpha$  rules out  $i$

Let  $V_i = \{ v \mid x_{v,i} \mapsto 0 \text{ between } a_{i-1} \text{ and } a_i \}$

$$V = V_1 \cup \dots \cup V_t \quad t' \leq t$$

There must exist  $j$  s.t.  $|V_j| \geq n/t$

i.e., between  $a_{j-1}$  and  $a_j$  we have

$\geq n/t$  assignments  $x_{v,i} = 0$

ROBP II makes lots of progress in ruling out vertices

Call such pair  $(a_{j-1}, a_j)$  USEFUL\*.  
We just proved:

### OBSERVATION 4

Any path  $\alpha \sim D$  passes through a useful pair  $(a, b)$  with probability 1

Now we want to fix any pair  $(a, b)$  and argue that

$$\Pr_{\alpha \sim D} [(a, b) \text{ useful for } \alpha] \leq n^{-\Omega(k)}$$

If we can do this, then we're done!

We have

KC XI

$$\begin{aligned} 1 &= \Pr_{\alpha \sim D} [\exists (a, b) \in \Pi^2 \text{ useful for } \alpha] \\ &\leq \sum_{(a, b) \in \Pi^2} \Pr_{\alpha} [(a, b) \text{ useful for } \alpha] \\ &\leq |\Pi|^2 \cdot n^{-\Omega(k)} \end{aligned}$$

$$\text{So } |\Pi| \geq n^{-\Omega(k)}$$

### OBSERVATION 5 (CRUCIAL)

Suppose  $\exists$  path  $\alpha \sim D$  s.t.

- $\alpha$  passes through a and b
- $\alpha$  assigns  $x_{v,i} \mapsto 0$  for  $v \in V_j$
- Then  $\alpha$  rules out any path  $\alpha'$  through a and b  
has to set  $x_{v,i} \mapsto 0$  for  $v \in V_j$  <sup>exactly</sup>

Proof Exercise. (Use read-once property)

HOPEFUL CLAIM 6 (BROKEN)

For any  $(a, b) \in \Pi^2$

$$\Pr_{\alpha \sim D} [(a, b) \text{ useful for } \alpha] \leq n^{-\Omega(k)}$$

Attempt at proof

- 1) If  $(a, b)$  not useful for any path  $\Rightarrow$  probability 0.
- 2) Suppose  $\beta(a)$  contains  $\Omega(k)$  assignments  $x_{v,j} \mapsto 1$ . Then

$$\Pr_{\alpha \sim D} [\alpha \text{ passes through } a] \leq n^{-\delta k} \quad - \text{OK}$$

3) At a few 1s in  $\beta(a)$  —  $\Pi$  knows  $kC \text{ XII}$   
almost nothing about the clique  
Yet makes  $\geq n/t$  assignments  $x_{v_i} \mapsto 0$   
Some of these might be forced.  
But polynomial fraction should  
be free coin flips. say  $n^\delta$   $\gamma \gg \delta$

$$\Pr[\text{all these free coin flips yield } 0] = \\ = (1 - n^{-\delta})^{n^\delta} = \exp(-\Omega(n^{-(\delta-\delta)}))$$

Great! Except case 3 broken.  
We could have essentially all choices forced.  
Need better notion of "useful".

### ACTUAL PROOF (MODULO CALCULATIONS)

For any assignment  $\beta$ , let  $\beta_1 = \{x_{v_j} \text{ in } \beta \text{ set to } 1\}$

$\Gamma(v) = \{u \mid (u, v) \in E\}$  neighbours of  $v$

$\Gamma_W(R) = \bigcap_{v \in R} \Gamma(v) \cap R$  common neighbours  
of  $R$  inside  $W$

$W \subseteq V$  is  $g$ -NEIGHBOUR-DENSE for  $R \subseteq V$   
if  $|\Gamma_W(R)| > g$

$W$  is  $(r, g)$ -NEIGHBOUR-DENSE if it is  
 $g$ -neighbour-dense  $\forall R, |R| \leq r$

Means that any clique of size  $r$  can  
be enlarged with vertex from  $W$

Should be likely to hold for random graph  $kC \underline{XIII}$   
 But as  $r, q$  get larger, property gets  
 more unlikely

If it fails want to find "mostly neighbour-dense"  
 set  $W$  for which few  $R$  make  $W$  fail.

In what follows, think

$$r, r' = \Omega(k), \quad r' \leq r \\ q = n\delta \\ s = n\delta' \quad 1 \gg \gamma \gg \gamma' > 0$$

$W$  is  $(r, r', q, s)$ - MOSTLY NEIGHBOUR-DENSE  
 if  $\exists S \subseteq V, |S| \leq s$  s.t. if  $\overset{\text{for}}{R} \subseteq V, |R| \leq r$ ,  
 $W$  is not  $q$ -neighbour dense for  $R$ ,  
 then  $|R \cap S| \geq r'$

$G = (V, E)$  is  $(k, r, s, \varepsilon)$ - CLIQUE-DENSE

if  $\exists t, q \in \mathbb{R}^+$  s.t.

- (1)  $V$  is  $(tr, tq)$ -neighbour-dense
- (2) Every  $(r, q)$ -neighbour-dense set  $W$   
 is  $(r^*, r', q', s)$ - mostly neighbour-dense  
 for

$$r' = \varepsilon \cdot r / (2(1+\varepsilon))$$

$$r^* = r_{k/t} + r'$$

$$q' = (\varepsilon r/2) s^{1+\varepsilon} \log s$$

THEOREM 7 For  $n$  large enough,

| KC XIV

For appropriately chosen  $r, s$  as above,  
for  $\epsilon$  small,  $t = o(1)$ ,  $g \gg s$ , it holds  
that  $G \sim G(n, p)$  for  $p = n^{-2\eta/(k-1)}$  is  
 $(k, r, s, \epsilon)$ -clique-dense.

Proof 3 pages of calculations ...

THEOREM 8

If  $k \in \mathbb{N}^+$  and  $r, s, \epsilon \in \mathbb{R}^+$  are such that  
 $G$  is  $(k, r, s, \epsilon)$ -clique-dense, then  
any regular resolution refutation of  
the clique formula for  $G$  requires  
length  $\Omega(s^{r/4})$  (i.e., any ROBP  
requires this size).

Proof of Thm 8 is what we will focus on  
Reuse our previous idea, but make  
better definition of useful

$$N_i(a) = \{u \in V \mid \beta(a) \text{ sees } x_{ui}, i \mapsto 0\}$$

$$P_i(a) = \{u \in V \mid \beta(a) \text{ sees } x_{ui}, i \mapsto 1\}$$

Keeps distribution  $D$

Probability of coin flip 1 =  $s^{-(1+\epsilon)}$

Observation 3 still true

Fix  $t, g$  witnessing that  $G$  is  
 $(k, r, s, \epsilon)$ -clique-dense.  $\boxed{\forall v \notin T_v \left( \bigcup_{j \in [t]} P_j(v) \right)}$

Forced choice (a) in  $D$  for node  $v$  if

Say  $(a, b) \in \Pi^2$  [TRULY USEFUL] if | KC XV

$\exists$  path  $\alpha$  in  $\mathcal{D}$  s.t.

- (1)  $\alpha$  passes through  $a$  &  $b$  in that order
- (2)  $|\beta_1(b) \setminus \beta_1(a)| \leq \lceil k/t \rceil$ , i.e. path sets at most that many 1s between  $a$  &  $b$  ( $a$  included;  $b$  excluded)
- (3)  $\alpha$  rules out some index  $i$
- (4)  $N_i(b) \setminus N_i(a)$  is  $(r, g)$ -neighbour-dense

Key difference: (4)

Don't consider how many zeros filled in

Consider how hard/unlikely these zeros are

### LEMMA 9 ( $\Leftrightarrow$ OBS 4)

Say that path  $\alpha$  in  $\Pi$  USEFULLY TRAVERSES

$(a, b)$  if (1), (2) & (4) hold

[Note that other paths can also go through  $(a, b)$ ]

Then any path  $\alpha \sim \mathcal{D}$  usefully traverses  $(a, b)$  some with probability 1.

Proof Exercise. Use waypoints idea from Obs 4 + neighbour-denseness.  
Also use Obs 5.

### LEMMA 10 ( $\Leftrightarrow$ HOPEFUL CLM 6)

For any useful pair  $(a, b)$ , it holds that

$$\Pr_{\alpha \sim \mathcal{D}} [\alpha \text{ traverses } (a, b)] \leq 2^{-\varepsilon t/2}.$$

Lemmas 9+10 immediately yield Thm 8 as per our previous proof idea.

## Proof of Lemma 10

Lk C XVI

Fix useful part  $(a, b)$

Fix index  $i^*$  ruled out by some path witnessing the usefulness

$$P := \bigcup_{j \in [k]} P_j(a) \quad \text{"clique members known at } a\text{"}$$

$$W := N_{i^*}(G) \setminus N_{i^*}(a) \quad \text{"vertices ruled out during a run for } i\text{th member"}$$

$W(r, q)$ -neighbour-dense by definition

+

$G(k, r, s, \epsilon)$ -clique-dense  $\Rightarrow$

$W$  is mostly neighbour-dense

Let  $S$  be the set witnessing this

(Any  $R$  for which  $W$  fails to be neighbour-dense has large intersection with  $S$ )

Let  $E = \text{event "x usefully traverses } (a, b)"$

Want to upper-bound  $P_E$  [E]

and

Case analysis depending on  $|P|$ .

Case 1:  $|P| > \epsilon r / (2(1+\epsilon))$

$P(a)$  contains many assignments  $x_{v,j} \mapsto 1$ .

But these are all free coin flips  $\Rightarrow x$  very unlikely even to reach a (as argued before)

Formally

$$\Pr_{\alpha}[\mathcal{E}] \leq \Pr_{\alpha}[\alpha \text{ passes through } a]$$

$$\leq (S^{-(1+\varepsilon)}) \cdot \varepsilon r / (2(1+\varepsilon))$$

$$= S^{-\varepsilon r / 2}$$

Case 2 :  $|P| \leq \varepsilon r / (2(1+\varepsilon))$

Let  $R(\alpha) = \{u \mid \text{some } x_{u,j} \mapsto i \text{ between } a \& b\}$

If  $\alpha$  does not pass through  $(a, b)$   $R(\alpha) = \emptyset$

If  $\alpha \in E$ , then  $|R(\alpha)| \leq \lceil k/\varepsilon \rceil$

In hopeful claim 6, failed because dangerous vertices in  $R(\alpha)$  can make  $T_W(R(\alpha))$  shrink a lot, forcing many  $x_{v,i} \mapsto 0$ .

But if so,  $R(\alpha)$  is an example of  $W$  failing to be neighbour-dense.

And our  $W$  here is mostly neighbour-dense, so getting such  $R(\alpha)$  should not be too likely.

Do subcase analysis based on whether  $R(\alpha)$  is dangerous or not

$$R_0 := \{R : |R| \leq \lceil k/\epsilon \rceil, |T_w(R \cup P)| \leq (\epsilon r/2) s^{1+\epsilon} \log s\}$$

$$R_1 := \{R : |R| \leq \lceil k/\epsilon \rceil, |T_w(R \cup P)| > (\epsilon r/2) s^{1+\epsilon} \log s\}$$

$$\Pr[E] = \Pr[E \text{ and } R(x) \in R_0] + \Pr[E \text{ and } R(x) \in R_1]$$

looks OK;  
previous argument  
should work

Dangerous case  $E$  and  $R(x) \in R_0$

$$|R| \leq \lceil k/\epsilon \rceil, \text{ so}$$

$$|R \cup P| \leq \lceil k/\epsilon \rceil + \epsilon r / (2(1+\epsilon))$$

By mostly neighbour-denseness

$$|(R \cup P) \cap S| \geq \epsilon r / (2(1+\epsilon))$$

$$\text{Our Paper claims } \geq \frac{r}{2} \left(1 + \frac{\epsilon}{1+\epsilon}\right)$$

$$|P| \leq \frac{r}{2} \cdot \frac{\epsilon}{1+\epsilon} \Rightarrow$$

$$|R \cap S| \geq r/2$$

Using this we get

$$\begin{aligned} \Pr[E \text{ and } R(x) \in R_0] &\leq \Pr[R(x) \in R_0] \\ &\leq \Pr[|R(x) \cap S| \geq r/2] \end{aligned}$$

$$\leq \binom{|S|}{r/2} (s^{-(1+\epsilon)})^{r/2}$$

$$\leq |S|^{r/2} s^{-(1+\epsilon)r/2} \leq s^{-\epsilon r/2}$$

Safe case

$E \text{ and } R(\alpha) \in R_1$

KC XIX

For any  $\alpha \sim D$  let  $W^*(\alpha) \subseteq W$  be set of  $v \in W$  s.t.  $\alpha$  guesses  $x_{v,i^*}$  and answer is coin flip. If  $\alpha$  satisfies  $E$ , then

$$T_W(R(\alpha) \cup P) \subseteq W^*(\alpha)$$

(Because all of  $W$  queried, and max set of clique membership known is  $R(\alpha) \cup P$ )

And all of these guesses result in answers 0 (or else we can't reach 6 by Obs 5).

We don't know exactly which guesses are free coinflips, but many of them have to be since we have lower bound on  $|T_W(R \cup P)|$ .

$$\Pr[E \text{ and } R(\alpha) \in R_1] =$$

$$\Pr[x_{v,i^*} \mapsto 0 \forall v \in W \text{ and } |W^*(\alpha)| > \frac{\epsilon r}{2} s^{1+\epsilon} \log s] =$$

$$\Pr[x_{v,i^*} \mapsto 0 \forall v \in W^*(\alpha) \text{ and } |W^*(\alpha)| > \frac{\epsilon r}{2} s^{1+\epsilon} \log s] \leq$$

$$\leq (1 - s^{-(1+\epsilon)})^{\frac{\epsilon r}{2} s^{1+\epsilon} \log s}$$

$$\approx e^{-\frac{\epsilon r}{2} \log s} = s^{-\epsilon r/2}$$

Adding dangerous case and safe case, get probability  $\leq 2s^{-\epsilon r/2}$



KC XX

This concludes the course

What did we see during 2nd half?

- Communication complexity
- Circuit complexity
- Proof complexity

Seemingly quite different, but  
many connections at deeper level

General phenomena in TCS: often  
breakthrough results from unexpected  
connections.

At the end of the day:

Most of the questions we ask about  
we cannot answer.

Such is research

But lots of beautiful results have  
been obtained while trying

Tried to show you a (biased)  
selection of such results