

LECTURE 15

Last lecture: size-space trade-offs in proof complexity from time-space trade-offs in pebbling

Roughly: If matching upper and lower bounds for black & black-white pebbling [or trade-offs for "not-too-white" black-white pebbling] then:

- size-space trade-offs with same parameters for resolution
- size-space trade-offs with log factor loss for polynomial calculus

EXAMPLE RESULTS

\* also need  $g(n) = O(n^{1/3})$

THEOREM 1 [BN11]

using pebbling results in [Nordström '12]

Let  $g(n) = w(1)$  be arbitrarily slowly growing function\* and fix any  $\varepsilon > 0$ .

Then  $\exists$  explicitly constructible 6-CNF formulas  $\{F_n\}_{n=1}^{\infty}$  of size  $O(n)$  such that

- $F_n$  refutable in total space  $O(g(n))$  in resolution and PC
- $F_n$  refutable in simultaneous size  $O(n)$  and total space  $O((n/(g(n))^2)^{1/3})$  in resolution and PC
- Any resolution refutation ~~in dense~~ <sup>PCR refutation</sup> space <sup>monomial</sup> ~~space~~  $O((n/(g(n))^2 \log n)^{1/3-\varepsilon})$  must have superpolynomial size in resolution and PCR



## THEOREM 2 [BN11]

using pebbling results  
in [Nordström '12]

SC II

There is a family of explicitly constructible 6-CNF formulas of size  $\Theta(n)$  such that

- (a)  $F_n$  refutable in total space  $O(n^{1/11})$  in resolution and PC
- (b)  $F_n$  refutable in simultaneous size  $O(n)$  and total space  $O(n^{3/11})$  in resolution and PC
- (c) Any resolution refutation PCR refutation in clause space monomial space at most  $n^{2/11} / (10 \log n)$  must have size at least  $(n^{1/11})!$  in resolution and PCR

Technical core: Lift trade-offs between length and variable space to trade-offs between size and clause space for resolution

For polynomial calculus:

- Use that variable space is the same measure as for resolution
- Do substitution with XOR + random restriction argument

Pebbling formulas just happen to have such nice trade-offs

OPEN PROBLEM 1: Are there other such formulas?

OPEN PROBLEM 2: Can we get tighter results also for polynomial calculus?



Strength and weakness of results:

- Upper bounds for total space and syntactic proof systems
- Lower bounds for clause space / monomial space and SEMANTIC PROOF SYSTEMS:  
Anything implied can be derived in single step

But in this model all formulas are refutable in simultaneous linear size and linear space.

Traditionally, time-space trade-offs look something like

$$(\text{Space}) \cdot (\text{Time}) \geq n^2$$

or maybe

$$(\text{Space}) \cdot \log(\text{Time}) \geq n$$

These results say nothing about superlinear space

Recall question from last lecture:

If  $F$  is refutable in length/size  $L$ , can  $F$  be refuted in length  $\text{poly}(L)$  and linear clause/monomial space  $O(S(F))$  simultaneously?

**NO!** For regular resolution and resolution  
[Beame, Beck, & Impagliazzo '12, '16]



Tighe's results for resolution  
+ polynomial calculus

[Beck, Nordström, & Tang '13]

### THEOREM 3 [BNT'13]

For  $w = w(n)$  with  $3 \leq w(n) \leq n^{1/4}$  there are explicitly constructible 8-CNF formulas  $\{F_n\}_{n=1}^\infty$  of size  $\Theta(n)$  such that

(a)  $F_n$  refutable in clause space  $O(w \log n)$  and length  $\exp(O(w \log n))$  in resolution

(b)  $F_n$  refutable in length  $n^{O(w)} \exp(w)$  and clause space  $\exp(w) + n^{O(w)}$  in resolution

(c) For any PCR refutation  $\pi_n$  over a field  $\mathbb{F}$  s.t.  $\text{char}(\mathbb{F}) \neq 2$ , the proof size is bounded by

$$S(\pi_n) = \left( \frac{\exp(\Omega(w))}{\text{NBP}(\pi_n)} \right)^{\Omega\left(\frac{\log \log n}{\log \log \log n}\right)}$$

Fix  $w = \underbrace{K \log n}_{\text{constant}}$  for suitably large  $K$

Then resolution can refute formulas in

- length  $\approx n^K$
- clause space  $O(\log^2 n)$



But clause space, say,  $n^{K/2}$  causes  
superpolynomial blow-up in proof size  
(Need to adjust constants for precise statement)

Beame, Beck, & Impagliazzo have much  
sharper results for regular resolution

OPEN PROBLEM 3: Improve the parameters  
in the trade-offs in Thm 3. Is it possible to  
extend the much stronger trade-off results  
for regular resolution also to general  
resolution? What about  
exponential trade-offs? \*

\* Not for the formulas we talk about today

Trade-off formulas: TSITIN CONTRADICTIONS

Graph  $G = (V, E)$

Charge function  $\chi: V \rightarrow \{0, 1\}$  such  
that  $\sum_{v \in V} \chi(v) \equiv 1 \pmod{2}$

(ODD CHARGE)

$$\text{PARTY}_{v, \chi} = \left\{ \sum_{e \ni v} x_e \equiv \chi(v) \pmod{2} \right\}$$

$$= \left\{ \bigvee_{e \ni v} x_e^{1-b_e} \mid \sum_{e \ni v} b_e \not\equiv \chi(v) \pmod{2} \right\}$$

Recall  $x^b = \begin{cases} x & \text{if } b=1 \\ \bar{x} & \text{if } b=0 \end{cases}$



$$T_S(G, \chi) = \bigwedge_{v \in V} \text{PARITY}_{v, \chi}$$

Suppose  $G$  is connected.

Then  $T_S(G, \chi)$  unsatisfiable

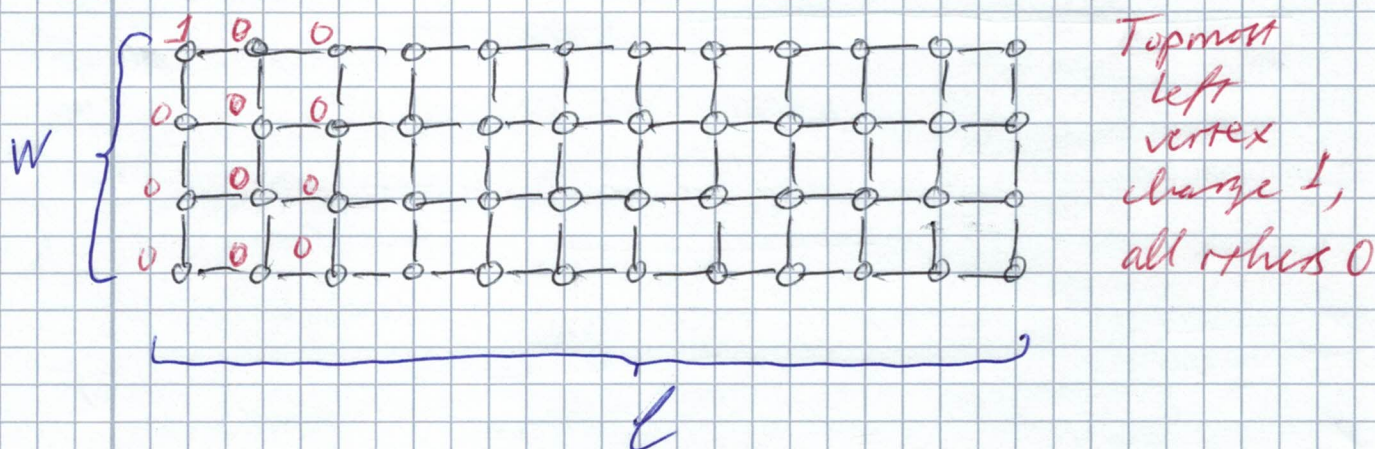
$\chi$  odd-charge function

Exact charge function does not matter — only whether charge is odd or even

Can use substitution to convert between different odd-charge functions

We know:  $G$  expander  $\Rightarrow T_S(G, \chi)$  exponentially hard

But we want only moderately hard formulas. Use rectangular grids with  $w$  rows and  $\ell$  columns ( $w \ll \ell$ )



(We will need to tweak this a bit, but this is the idea)



## PROPOSITION 4

SCVII

If  $F$  has resolution refutation in depth  $d$ , then tree-like resolution can refute  $F$  in simultaneous

- length  $2^{d+1} - 1$
- clause space  $d + 2$

### Proof sketch

- Make resolution refutation tree-like — does not increase space
- # nodes in proof DAG  $\leq 2^{d+1} - 1$
- Black-puddle proof DAG to get the space bounds

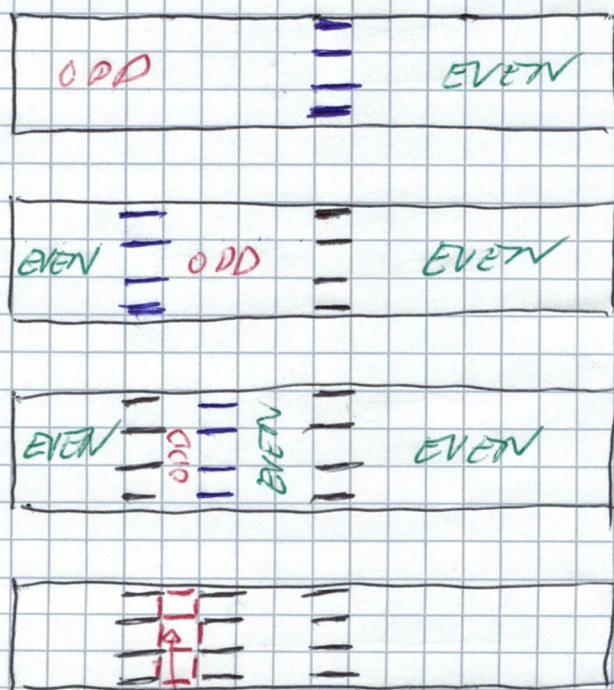


## PROPOSITION 5

Let  $G$  be  $w \times l$  grid and let  $\chi: V \rightarrow \{0, 1\}$  be odd-charge function. Then  $Ts(G, \chi)$  can be refuted in depth  $O(w \log l)$

### Proof sketch

- Use short tree-like resolution
- Decision tree
- Do binary search
- Query middle column
- disconnects graph
- Recurse on odd-charge component
- $O(\log l)$  recursive steps
- $w$  queries per step



Virtual vertex somewhere here



PROPOSITION 6

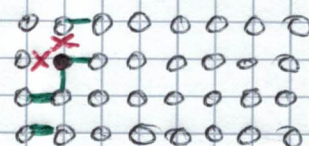
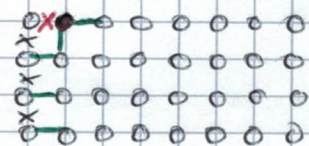
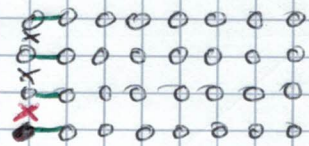
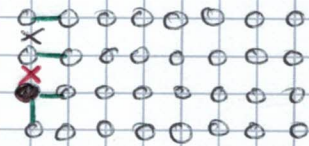
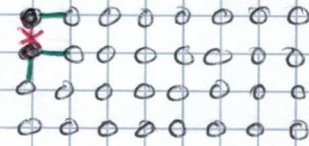
Let  $G$   $w \times l$  grid and  $k$  odd-charge  
 Then  $TS(G, k)$  can be refuted in  
 simultaneous length  $l \cdot 2^{O(w)}$  and  
clause space  $2^{O(w)}$ .

Proof Order edges from right  
 to left and from top to bottom  
 in each column

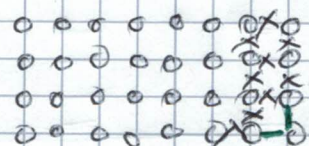
Resolve all clauses  
 containing top left vertical  
 edge

Keep rest of memory

Download all axioms for  
 third vertex in first column



⋮



FACT Resolving over all  
 variables in fixed order  
 yields resolution refutation  
 DAVIS-PUTNAM RESOLUTION  
 or VARIABLE ELIMINATION

*Prove, e.g., by induction over # variables*

In this case: Invariant  
 is that sum of charges  
 of cut edges is odd

Space  $\leq w+1$  edges=variables  $\Rightarrow \leq 2^{w+1}$  clauses

Length  $w \cdot l$  vertices  $\times 2^{O(w)}$  steps per vertex  $\square$

$w$ -parameter is tree-width of graph  
 This is special case of more general result.



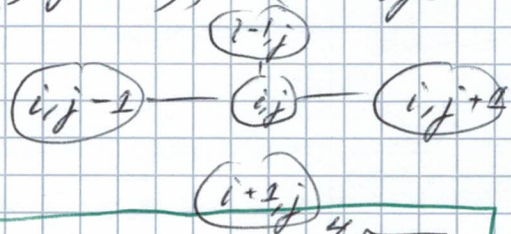
How to prove trade-off?

### HIGH-LEVEL IDEA

- ① Formalize notion of PROGRESS of proof
- ② Divide proof into large number of equal-sized EPOCHS
- ③ Prove the following claims:
  - (a) If epochs are small, then no single epoch makes very much progress
  - (b) If space is small, then not much progress can be carried over from one epoch to the next
  - (c) To refute formula, proof needs to make substantial progress summed over all epochs
- ④ Hence, a proof that is too short and uses too little space cannot refute the formula



Fix grid graph with  $w$  rows and  $l$  columns  
 Vertices indexed by  $(ij)$   $i \in [w]$ ,  $j \in [l]$   
 Edges from  $(ij)$  to  $(i, j \pm 1)$ ,  $(i \pm 1, j)$



Choose  $w$  so that

$$\log l \leq w \leq \sqrt[4]{l}$$

Do binary XOR substitution in  $TS(G, \chi)$  to get  $TS(G, \chi)[\oplus]$

Same thing as letting  $G' = G$  with two copies of every edge and taking  $TS(G', \chi)$

We will prove (or at least sketch proof) for resolution that  $TS(G', \chi)$  does not have resolution refutations in short length and small space simultaneously

Note that upper bounds in Props 5 & 6 still hold just replacing  $w$  by  $2w$

Will not talk about proof for PCR - this is much more complicated

Let  $\mathcal{g}$  be random restriction that

- picks one copy of edge uniformly and independently at random
- fix this edge to  $\top$  or  $\perp$  uniformly and independently at random

Then  $TS(G', \chi)|_{\mathcal{g}} = (TS(G, \chi)[\oplus])|_{\mathcal{g}} = TS(G, \chi)$  except for renaming variables & flipping polarities



SC XI

Define/recall complexity measure for clauses derived from Tseitin formulas  $TS(G, \chi)$

$$\mu(C) = \min \{ |S| : \bigwedge_{v \in S} \text{PARITY}_{v, \chi} \models C \}$$

Properties

- $\mu(A) = 1$  for  $A \in TS(G, \chi)$
- $\mu(\perp) = |V(G)|$  (if  $G$  connected)
- SUBADDITIVITY  $\mu(C \vee D) \leq \mu(C \vee x) + \mu(D \vee \bar{x})$

If  $S \subseteq V = V(G)$  is such that

$$\bigwedge_{v \in S} \text{PARITY}_{v, \chi} \models C \text{ and } |S| = \mu(C)$$

call  $S$  a CRITICAL SET for  $C$

Recall definition of BOUNDARY

$$\partial S = \{ (u, v) \in E \mid u \in S, v \in V \setminus S \}$$

### LEMMA 7

Let  $C$  clause over variables of  $TS(G, \chi)$  and suppose  $S$  critical set for  $C$ . Then

- (a)  $S$  is a connected set
- (b)  $\{ x_e \mid e \in \partial S \} \subseteq \text{Vars}(C)$

Proof Suppose  $S = S_1 \cup S_2$  with no edges between  $S_1$  &  $S_2$

$$\bigwedge_{v \in S_i} \text{PARITY}_{v, \chi} \not\models C$$



Fix  $\alpha_i$  s.t.

$$\alpha_i \left( \bigwedge_{v \in S_i} \text{PARITY}_{v,x} \right) = T$$

$$\alpha_i (C) \neq T$$

Note that  $\alpha_1$  &  $\alpha_2$  assigns disjoint sets of variables, so  $\alpha_1 \vee \alpha_2$  is <sup>valid</sup> assignment.

$$(\alpha_1 \vee \alpha_2) \left( \bigwedge_{v \in S} \text{PARITY}_{v,x} \right) = T$$

$$(\alpha_1 \vee \alpha_2) (C) \neq T$$

Extend to  $\alpha$  s.t.  $\alpha(C) = \perp$   $\hookrightarrow$

(6) We did this flipping argument in lecture on Tseitin formula lower bounds

Suppose exists  $e \in \partial S$  such that  $x_e \notin \text{Vars}(C)$   
 $e = (u,v), u \in S$

$$\bigwedge_{v \in S \setminus \{u\}} \text{PARITY}_{v,x} \neq C$$

$$\text{Fix } \alpha \text{ s.t. } \alpha \left( \bigwedge_{v \in S \setminus \{u\}} \text{PARITY}_{v,x} \right) = T$$

$$\alpha(C) = \perp$$

Flip  $\alpha$  on  $x_e$  to get  $\alpha'$   $\alpha(\text{PARITY}_{u,x}) = \perp$  by necessity

$$\text{Now } \alpha'(\text{PARITY}_{u,x}) = T$$

so

$$\alpha' \left( \bigwedge_{v \in S} \text{PARITY}_{v,x} \right) = T$$

But since  $x_e \notin \text{Vars}(C)$ , we have  $\alpha'(C) = \perp$   $\hookrightarrow$   $\square$



Fix  $t_0 = w^4$

Say that  $C$  has MEDIUM COMPLEXITY  
if  $t_0 \leq \mu(C) \leq |V|/4 = \frac{wl}{4}$

(note that  $w \geq 4$  since  $w \geq \log l$  and  $l \rightarrow \infty$ )

Say that  $C$  has COMPLEXITY LEVEL  $i$   
for  $i \in \mathbb{N}$  if

$$t_0 \cdot 2^i \leq \mu(C) \leq t_0 \cdot 2^{i+1}$$

We have  $\approx \log l$  complexity levels

### OBSERVATION 8

By subadditivity, in any resolution refutation  $\pi: TS(G, \chi)$  there are clauses of all complexity levels.

We want to argue that if

$$\pi': TS(G', \chi) + \perp$$

has small length  $L$  and clause space  $S$   
then can find  $g$  in support of our random restriction distribution such that

$$\pi'|_g \text{ is refutation of } TS(G', \chi)|_g = TS(G, \chi)$$

where not all complexity levels appear

For this to work, need to prove for  $C_1$  &  $C_2$  of complexity levels  $i_1 \neq i_2$  Dependent events!

$$(i) \Pr_g[C_1|_g \neq T] \leq \exp(-w)$$

$$(ii) \Pr_g[\text{For } i=1,2 \ C_i|_g \neq T] \leq \Pr_g[C_1|_g \neq T] \cdot \Pr_g[C_2|_g \neq T]$$



### LEMMA 9

SC XIV

$$\Pr_{\mathcal{F}} [C \wedge \mathcal{F} \text{ has } \geq w \text{ variables}] \leq \left(\frac{3}{4}\right)^w$$

Proof If  $W(C) < w$  there is nothing to prove. Suppose  $e$  &  $e'$  are edges. If  $x_e \in \text{Vars}(C)$ ,  $x_{e'} \notin \text{Vars}(C)$ , then

$$\Pr [f(x_e) = T] = \frac{1}{2} \cdot \frac{1}{2} = \frac{1}{4}$$

If  $x_e, x_{e'}$  both in  $\text{Vars}(C)$

$$\Pr [\text{literals over } x_e \text{ or } x_{e'} \text{ (don't) satisfy } C \text{ after } \mathcal{F}] \\ = \frac{1}{2} \leq \left(\frac{3}{4}\right)^2$$

$$\text{So } \Pr [C \wedge \mathcal{F} \neq T] \leq \left(\frac{3}{4}\right)^{W(C)} \leq \left(\frac{3}{4}\right)^w \quad \square$$

### COROLLARY 10

For any clauses  $C_1, C_2, \dots, C_k$  it holds that

$$\Pr_{\mathcal{F}} \left[ \begin{array}{l} \text{For all } i: C_i \wedge \mathcal{F} \neq T \\ \text{and} \\ \{C_i \wedge \mathcal{F} \mid i \in [k]\} \text{ contains } \geq w \text{ variables} \end{array} \right] \leq \left(\frac{3}{4}\right)^w$$

Proof Just view  $C_1, C_2, \dots, C_k$  as a big clause with all literals concatenated.

No literal must be assigned to true by  $\mathcal{F}$ . Use proof of Lemma 9  $\square$



Fix  $G$  to be  $w \times \ell$  grid,  
 $\log \ell \leq w \leq \sqrt[4]{\ell}$ ,  $\ell$  large enough

Consider set  $S \subseteq V = V(G)$

Say that column  $j$  in grid  $G$  is

- full in  $S$  if all vertices in column  $\in S$
- empty in  $S$  if no " "
- partial otherwise

Any clause  $C$  of medium complexity  
 has width  $W(C) \geq w$  because the  
 boundary of any critical set  $S_C$  for  $C$   
 has  $|\partial S| \geq w$  edges

### LEMMA 11

For any  $S \subseteq V$  s.t.  $w^4 \leq |S| \leq |V|/4$  it  
 holds that  $|\partial S| \geq w$

Proof If  $S$  has  $w$  partial columns,  
 then  $\partial S$  has  $w$  vertical edges, so suppose  
 $S$  has less than  $w$  partial columns.

Then  $|S| - w^2 \geq w^4 - w^2 > 0$  vertices  
 are in full columns, so  $S$  has a full column

Since  $|S| \leq |V|/4$ , at most  $\frac{1}{4}$  <sup>fraction</sup> of columns are full  
 By assumption, at most  $\frac{w}{\ell} \leq \frac{1}{w^3} \leq \frac{1}{4}$  fraction  
 of columns are partial.

So  $S$  has empty columns, and also full columns  
 Hence in every row there is at least one edge in boundary,  
 and  $|\partial S| \geq w$  □



This means that a single medium-complex SC XVI  
clause  $C$  is likely to get satisfied by  $\mathcal{P}$ .

To get a kind-of-independence result,  
we prove that clauses  $C_1, C_2, \dots, C_k$  of  
distinct complexity levels contain a  
total of  $\Omega(kw)$  distinct variables

### LEMMA 12 ( $k \leq w$ )

Let  $C_1, C_2, \dots, C_k$  be clauses of distinct and  
increasing complexity levels as witnessed  
by critical sets  $S_1, S_2, \dots, S_k$ .

Then  $| \bigcup_{i=1}^k \partial(S_i) | = \Omega(kw)$ .

Proof Take every third set in  $S_1, \dots, S_k$  (if  
necessary) to get  $S'_1, S'_2, \dots, S'_{k'}$  such that

$$t_0 \leq S'_1$$

$$4 |S'_i| \leq |S'_{i+1}|$$

$$|S'_{k'}| \leq |V|/4$$

$$k' \geq \lceil k/3 \rceil$$

$S'_i$  and  $S'_{i+1}$  are at least  
2 complexity levels apart

If some  $S'_i$  has  $\geq w^2$  partial columns,  
then  $|\partial(S'_i)| \geq w^2 \geq kw$  and we are done,  
so suppose every  $S'_i$  has  $\leq w^2$  partial columns.

We want to show that every row in grid  
has at least  $k' - 1$  horizontal edges.



Fix a row  $j$

Let  $l_i =$  column of leftmost vertex of  $S_i'$  in row  $j$

Let  $r_i =$  column of rightmost vertex of  $S_i'$  in row  $j$

If  $l_i \neq 1$ , there is boundary edge  $(l_i - 1, l_i)$

if  $r_i \neq l$ , there is boundary edge  $(r_i, r_i + 1)$

Let SIGNATURE of horizontal edge be column of left endpoint — uniquely determines edge in row

We take sequences  $(l_i - 1)_{i=1}^{k'}$  and  $(r_i)_{i=1}^{k'}$  and apply following proposition

### PROPOSITION 13

Let  $(a_i)_{i=1}^k$  and  $(b_i)_{i=1}^k$  be integer sequences such that for all  $i$  it holds that

$$|b_i - a_i| \geq 1$$

$$|b_{i+1} - a_{i+1}| \geq 2 |b_i - a_i|$$

Then  $\left| \bigcup_{i=1}^k \{a_i, b_i\} \right| \geq k+1$

### Proof of proposition

Exercise. Intuitively,

the intervals cannot overlap too much

because of the exponentially increasing sizes.  $\square$

If  $(l_i - 1)_{i=1}^{k'}$  and  $(r_i)_{i=1}^{k'}$  satisfy conditions of Proposition 13, then we get  $k' + 1$  distinct numbers. Remove 1 and  $l$ .

Still guaranteed  $k' - 1 = \lceil \frac{k}{3} \rceil - 1$  horizontal edges



It remains to prove that  $(l_i - 1)_{i=1}^{k'}$  and  $(r_i)_{i=1}^{k'}$  satisfy conditions.

Let  $f_i = \# \text{ full columns in } S'_i$ .  
We have

$$f_i \leq r_i - l_i \leq f_i + w^2 \quad (1)$$

since every column between  $l_i$  and  $r_i$  is non-empty (since  $S'_i$  is connected) and there are  $\leq w^2$  partial columns. There are at most  $|S'_i|$  and at least  $|S'_i| - w^3$  elements in full columns, so

$$\frac{|S'_i| - w^3}{w} \leq f_i \leq \frac{|S'_i|}{w} \quad (2)$$

From (1) and (2) we get

$$\frac{|S'_i|}{w} - w^2 \leq r_i - l_i \leq \frac{|S'_i|}{w} + w^2 \quad (3)$$

from which it follows that

$$\begin{aligned} \frac{r_{i+1} - l_{i+1}}{r_i - l_i} &\geq \frac{|S'_{i+1}| - w^3}{|S'_i| + w^3} \\ &\geq \frac{4|S'_i| - w^3}{|S'_i| + w^3} \\ &\geq \frac{4 - 1/w}{1 + 1/w} \geq 2 \end{aligned} \quad (\text{assuming } w \geq 2)$$





LEMMA 14SC XIX

If  $M$  is a set of clauses, then

$$\Pr_S [M|_S \text{ has clauses of } k \text{ distinct complexity levels}] \leq (|M|c^w)^k$$

for some  $c \in [\frac{3}{4}, 1)$

Proof Fix a subset of  $k$  clauses  $C_1, \dots, C_k$  of  $M$

If  $C_1|_S, \dots, C_k|_S$  have  $k$  distinct complexity levels, then by Lemma 12 they contain  $\Omega(kw)$  distinct variables

By Corollary 10, this probability is bounded by  $(\frac{3}{4})^{\Omega(kw)} \leq c^{kw}$  for some  $c < 1$

(With some more care, one can get  $c = \frac{3}{4}$ )

There are  $\binom{|M|}{k} \leq |M|^k$  subsets of  $k$  clauses in  $M$ , so by a union bound we get probability

$$\leq |M|^k \cdot c^{kw} = (|M| \cdot c^w)^k$$

 $\square$