# Exponential lower bounds for Dag-like Resolution

# **History of Results**

#### History [Main]

- (1) [Tseitin69] implicitly gave a first example of UNSAT formula requiring subexponetial regular Resolution refutations
- (2) [Haken 85] Gave the first exponential lower bounds for DLR. Use PHP.
- (3) [Chvatal Szemeredi 86] usign Haken method, prove the lower bounds for random k-CNF.
- (4) [Urquhart 88] Extended [CS86] to get exponential lower bounds in DLR for Tseitin Tautologies
- (5) [BeamePitassi 96] Simplify the Haken's metod to prove DLR lower bounds for PHP and Random CNF [This Lecture]
- (6) [Ben-Sasson Wigderson 99] Synthesis of the [BP] method into a general method based on the width [This Lecture]
- (7) [Raz 02, Razborov 05] get exponential lower bounds for WeakPHP, introducing psuedowidth

#### Plan

- 1. From Resolution to Monotone Resolution. Polynomial equivalence wrt PHP.
- 2. The Beame-Pitassi method: PHP requires exponential refutations in DLR.
- 3. Synthesis of BP method: The width method of Ben-Sasson-Wigderson
- 4. Application of width method I : Random k-CNF
- 5. Application of width method II : Tseitin formulae
- 6. The "strange case" of Weak PHP: pseudowidth

# **Notions and Techniques**

- 1. The Beame-Pitassi method
- 2. The width method of Ben-Sasson-Wigderson
- 3. Complexity of Random k-CNF
- 4. Pseudowidth

# **Monotone Resolution**

# **Motivations**

DLR Complexity of PHP was considered a big problem. Haken's technique was pretty complicated. Many efforts to simplify it

Monotone Resolution: clauses without negations Polynomial Equivalence with DLR wrt PHP.

[BP96, BP96] noticed that it sufficient to study monotone DLR to prove lower bounds for PHP

Consequences:

- Great simplification of Haken result on PHP
- Slight simplification of [CS 86] results on random k-CNF
- Developing ground for the width method of [BSW99] <sup>126</sup>

## Monotone Resolution for PHP

Let us consider PHP[n+1,n]. Only clauses with positive literals

$$\neg p_{i,j} = \bigvee_{\substack{k \in [n+1]\\k \neq i}} p_{k,j} \qquad P_{R,j} = \bigvee_{i \in R} p_{i,j}$$

Monotone Resolution Rule for PHP

$$\frac{A \lor P_{R,j} \lor P_{S,j}}{A \lor B \lor P_{R,j}} \xrightarrow{B \lor P_{R,j} \lor P_{T,j}}$$

Where R,S, and T are disjoint set of indices

#### Idea of the monotone Rule

Since different pigeons can't go to the same hole we delete variables speaking of different holes and keep only those of common pigeons

## **Polynomial Simulation**

Thm[Buss,Pitassi] MR and DLR polynomially simulate each other on the PHP[m,n], m>n.

Proof

MR proof  $\rightarrow$  DLR proof. See how to simulate the monotone Rule.

$$\frac{A \lor p_{i,j} \lor p_{i_{1},j}}{A \lor p_{i,j}} \qquad \begin{array}{c} B \lor p_{i,j} \lor p_{i_{2},j} \\ A \lor p_{i,j} \end{array}$$



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## **Polynomial Simulation**

DLR proof  $\rightarrow$  MR proof.

**Negation Transformation** 

$$\neg p_{i,j} = \bigvee_{\substack{k \in [n+1]\\k \neq i}} p_{k,j}$$

**Initial clause** 

 $\bigvee_{j \in [n]} p_{i,j}$  unchanged

 $\neg p_{i,k} \lor \neg p_{j,k} \Longrightarrow \bigvee_{l \in [n]} p_{l,k}$ 

# **Polynomial Simulation**

**Clauses Transformation** 

$$C=AvB \implies C^+=AvB^+$$

where only B contains negated literals and B<sup>+</sup> is obtained from B applying the transformation

Proof strategy

$$\frac{A \qquad B}{C} \Longrightarrow \frac{A^{+} \qquad B^{+}}{C^{+}}$$

I case B is an initial clause of the form  $\neg p_{i_1,j} \lor \neg p_{i_2,j}$ II case General Case [Exercise 1] Study the exact simulations and asymptotic

## Conclusions

Exponential lower bounds for the size of MR refutations of the PHP will give exponential lower bounds for the size of DLR refutations of the PHP.

In the next section we study lower bounds for the PHP in MR

Lower bounds for PHP In daglike Resolution

## Main theorem

Th[BP96]. Any monotone Resolution refutation of PHP[n,n-1] requires 2<sup>n/20</sup> many clauses

#### **Critical Truth Assignments**

Assingments to  $p_{i,j}$ 's defining 1-1 mapping from pigeons to holes.

- every pigeon is sent to at most one hole
- no two pigeons are sent to the same hole

# **Critical Truth Assignments**

Consider the PHP[5,4] a 5-cta



Property: Exactly one initial clause of PHP is falsified  $p_{5,1} \vee p_{5,2} \vee p_{5,3} \vee p_{5,4}$ 

Notation: i-cta if column i in the matrix is all 0's or falsifies initial clause  $p_{i,1}v p_{i,2}v \dots v p_{i,n}$ 

# Proof Idea

- 1. Assume to have a short MR refutation P of PHP[n,n-1].
- Identifies LARGE CLAUSES in P as those having approx n<sup>2</sup> variables
- 3. Killing Process: Hit the proof P with a simplification process (assigning a partial cta  $\alpha$ ) that at each step delete many wide clauses from the proof, but leave P[ $\alpha$ ] yet a proof of a simplified PHP[n',n'-1] with n'< n.
- 4. Forcing Prop.Prove that any proof of the PHP[n,n-1] contains a moderately LARGE clause
- Argue that If P is short, it contains few LARGE clauses, and hence the simplifications process deletes to fast LARGE clauses contradicting (4).

# Killing Large clauses -I

#### Defn

LARGE clauses are those with n<sup>2</sup>/10 literals

Let P a be a MR refutation of PHP[n,n-1] with less than S LARGE clauses

Claim. There is a variable that appears in at least S/10 LARGE Clauses

Proof.

$$\frac{\#(\text{large clauses}) * \text{size}(\text{large clause})}{\#(\text{variables})} = \frac{S * n^2 / 10}{n(n-1)} \ge \frac{S}{10}$$

# Killing Large clauses - II

**Defn Assignment** 

Pick  $p_{i,i}$  appearing in at least S/10 large clause.

pigeons



holes		1		i		n
	1			0		
	•••			0		
	j	0	0	1	0	0
				0		
	n-1			0		

Claim [Exercise 3]  $P[\alpha]$  is a proof of PHP[n-1,n-2] with at most 9S/10 Large Clauses

# Killing Large clauses - III

#### Saturating the Process

Apply previous simplification process x times, up to delete all large clauses and be left with a MR refutation of PHP[n-x,n-x-1].

Computing x

$$S(1 - \frac{1}{10})^x < 1 \Longrightarrow x = \log_{\frac{10}{9}} S$$

# Forcing Lemma & Contradiction

#### Forcing Lemma

Any MR refutation of PHP[n,n-1] contains a clause with n<sup>2</sup>/9 variables.

Getting the Contradiction  $S < 2^{n/10}$ . By Forcing Lemma applied on PHP[n-x,n-x-1] for  $x = \log_{\frac{10}{9}} S$  we get  $2(n - \log_{\frac{10}{9}} S)^2 \xrightarrow{S < 2^{n/10}} 2(0.5n^2)/9 \ge n^2/10$ 

This contradicts the fact that after  $x = \log_{\frac{10}{9}} S$  steps we have eliminated all the large clauses.

# **Proof of Forcing Lemma**

#### Idea

- We introduce a complexity measure  $\mu$  on clauses.
- We prove that there exists a clause K with high measure
- We prove that K contains the required number of variables

# Definition of $\boldsymbol{\mu}$

# Notation $R \subseteq [n]$ , $\wedge R$ clauses of PHP with pigeons in R C a clause in the proof

 $R \longrightarrow feerry cta that satisfies \land R also satisfies C$ 

## Defn $\mu(C)$ C a clause in the proof. $I_C$ be the minimal subset of [n] s.t. $I_C \Longrightarrow C$ $\mu(C)=|I_C|$

# Properties of $\mu$

#### Properties of $\mu(C)$ [Exercise 4] 1. $\mu(C)=1$ if $C \in PHP$

2. μ([])=n

3. 
$$\frac{A \quad B}{C}$$
 then  $\mu(C) \leq \mu(A) + \mu(B)$ 

4. 
$$(1)+(2)+(3) \Rightarrow \exists K \text{ s.t. } n/3 \le \mu(K) = \le 2n/3$$

## K is a large clause



Since  $j \notin I_{K}$  then  $\beta$  satisfies K. hence  $p_{i,l} \in K$ Claim follows since  $|I_{K}|^{*}|L_{K}| \ge n^{2}/9$ 

# The Width Method: Short proofs are narrow

# Width definitions

Restrictions [Exercise 5] understand what rules add to Resolution in such a way to keep the system consistent with application of restrictions to proofs

#### **Notation**

 $F \xrightarrow{w} C$  means there is Resolution refutation of C from F of width w

#### Width properties

Prop 1 If  $F[x=1] \xrightarrow{w} []$  then  $F \xrightarrow{w+1} \neg x$ Proof. F= F'  $\land \{\neg x \lor y\}$  and F' not contain x or  $\neg x$ 



### Width properties

**Prop2 If**  $F[x=1] \xrightarrow{k-1} []$  and  $F[x=0] \xrightarrow{k} []$ , then  $w_R(F) \le \max(k, w(F^x))$ where  $F^x$  is the set of clauses of F containing x **Proof.** Assume f.i. that  $F^x = \{x \lor A\}$ 



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## Short proofs are narrow: TLR

Thm  $w_R(F) \le w(F) + \log S_{TLR}(F)$ Proof. Prove that  $S_{TLR}(F) \le 2^b \Rightarrow w_R(F) \le w(F) + b$ By induction on b and n. b=0 OK! Assume wlog  $|P1| \le |P|/2$ .



|P|=|P1|+|P2|+1. The claim follows from Prop 2

Cor. 
$$S_{TLR}(F) \ge 2^{(w_R(F) - w(F))}$$

## Short proofs are narrow: DLR

Thm 
$$w_R(F) \le w(F) + O(\sqrt{n \ln S_{DLR}(F)})$$

Proof. Let P be a minimal size DLR refutations for F of size S.

Set "clause largeness"  $d = \sqrt{2n \ln S_{DLR}(F)}$ 

$$a = \left(1 - \frac{d}{2n}\right)^{-1}$$

Let  $P^{L} \subseteq P$  the set of "large clauses". Prove induction on b and n that

$$|P^{L}| \le a^{b} \Rightarrow w_{R}(F) \le d + w(F) + b$$

#### Short proofs are narrow: DLR

#### Argue [Exercise 7]

$$F[x = 1] \xrightarrow{d + w(F) + b - 1} []$$

$$F[x = 0] \xrightarrow{d + w(F) + b} []$$

#### Claim follows from Prop2

Cor. 
$$S_{DLR}(F) \ge \exp\left(\frac{\left(w_R(F) - w(F)\right)^2}{n}\right)$$

# Limitations and optimality

Thm [BG00] The size width tradeoffs for DLR is optimal

- Proof. Use a formula F (LOP) over O(n<sup>2</sup>) variables and with bounded initial width and prove that
- 1.  $S_{DLR} \le n^{O(1)}$
- 2.  $w_R(F) \ge \Omega(n)$
- 3. w(F)<=O(1)

# Width proof search

An algorithm to produce a DLR refutation of a UNSAT formula A in CNF Res<sub>k</sub>(A)={C : w(C)<=k and C is resolvent of two clauses in A}

- 1. k=1
- 2. Repeat
- 3.  $S = Res_k(S)$
- 4. k= k+1
- 5. While ([]  $\notin$  S)
- 6. Output([]∈S)

Running Time. On UNSAT F over n variables The algorithm runs in time  $n^{O(w_{R}^{(F)})}$ 

# Width Lower bounds: general framework

Given an UNSAT F, define a complexity measure on clauses  $\mu_{\text{F}}$  s.t.

- 1.  $\mu_F(Axioms) \le 1$
- 2.  $\mu_F([]) \ge$  "large"
- 3.  $\mu_F$  is subadditive, i.e.  $\frac{A B}{C} = \mu_F(C) \le \mu_F(A) + \mu_F(B)$
- 4. (1)+(2)+(3)  $\Rightarrow$  there is a clause K of "medium" measure  $\mu_F(K)$
- 5. Argue that "medium" complexity implies "large" width

Lower bounds for TseitinTautologies

## **Tseitin Tautologies**

Let G =(V,E) be a connected graph. Let m:V $\rightarrow$ {0,1} a labelling of the nodes of V s,t.  $\sum_{v \in V} m(v) \equiv 1 \pmod{2}$ 

Assign a variable  $x_e$  to each edge e in G.

For a node v in V 
$$PARITY(v) = \bigoplus_{v \in e} x_e \equiv m(v) \pmod{2}$$

$$T(G,m) =_{def} \bigwedge_{v \in V} PARITY(v)$$

[Exercise 6] Take a small graph and build Tseitin formula on it

## **Expander Graphs**

We will apply the T(G,m) formulas on a graph G which is a good expander and we will show that the width of refuting T(G,m) is lower bounded by the expansion of G

Expansion

G a connected graph the e(G)=min{|E(V',V-V')|: |V|/3 <= V' <= 2|V|/3}

Thm There are 3-regular graphs G=(V,E) with expansion  $e(G) = \Omega(|V|)$ 

## Define the measure

$$A_{v} = \bigwedge_{v \in V} PARITY(v)$$
  
V' \(\begin{aligned} V, \delta V' = \{x\_{e} : e \equiv E(V', V-V')\} \equiv \}

A v-cta for T(G,m) is an assignment which falsifies only PARITY(v) and satisfies all the other PARITY(v') [Exercise 8: prove it exists]

For C clause let  $V_C$ =min V'  $\subseteq$  V s.t.  $A_{v'} \Rightarrow$  C under ctas

 $\mu(C) = |V_C|$ 

# Verifying the measure

- 1. C an Axiom,  $\mu(C)=1$  easy: C is in PARITY(v) for some v
- 2.  $\mu([])=|V|$ . [Exercise 9: Prove that for any |V'|<|V|,  $A_{V}$  is SAT)
- 3. Take the complex clause K having  $|V|/3 \leq \mu(K) = 2|V|/3$ . Let V<sub>K</sub> be the subset of V witnessing K
- 4. [Forcing] We prove that each variable in  $\partial V_{K}$  belongs to K
- 5. The result follows since  $|\partial V_{\kappa}| \ge e(G)$  (by def of e(G))

# Forcing

 $V_{K}$  is the minimal set implying K under ctas.

Assume that there is  $x_e \in \partial V_K$  s.t  $x_e \notin C$ 



Let  $\alpha$  s.t.  $A_{VK}[\alpha] = 1$  and  $C[\alpha] = 1$ . Form  $\beta$  from  $\alpha$  setting  $x_e = 0$  and keeping that  $\beta$  is a cta

 $A_{VK-\{v\}}[\beta]=1$  and  $C[\beta]=1$ . Contradictions with minimality of  $V_{K}$  Lower bounds for Random k-CNF

# **Encoding of Combinatorial principles**

#### Tseitin Principle - Odd Charged Graph

The sum along nodes of the edges of a simple connected graph is even.

#### Encoding

Let G =(V,E) be a connected graph. Let m:V $\rightarrow$ {0,1} a labelling of the nodes of V s,t.  $\sum_{v \in V} m(v) \equiv 1 \pmod{2}$ 

Assign a variable  $x_e$  to each edge e in G.

For a node v in V  $PARITY(v) = \bigoplus_{v \in e} x_e \equiv m(v) \pmod{2}$ 

$$T(G,m) =_{def} \bigwedge_{v \in V} PARITY(v)$$
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# Random Formulae in CNF

#### **Experiment:**

Choose uniformly and independently m clauses with k variables from the space of all possible such clauses over n variables

$$(\neg \mathbf{X}_4 \lor \neg \mathbf{X}_2 \lor \mathbf{X}_6) \land (\mathbf{X}_1 \lor \neg \mathbf{X}_2 \lor \mathbf{X}_3) \land (\neg \mathbf{X}_1 \lor \neg \mathbf{X}_4 \lor \mathbf{X}_5)$$

#### Fact

Let D=m/n be **density**. There exists a threshold value r\* s.t.:

- if r < r\*: F (n,m) è SAT w.h.p
- If r > r\*: F(n,m) è UNSAT w.h.p.

# **Preliminary Definitions**

Dfn. A literal I is pure in a set of clauses F if I appears in F but no clause of F contains ¬I

Dfn. A set of clauses F over n variables is 1-sparse if |F|≤n

**Properties.** For  $s \ge 1$  and  $0 < \varepsilon < 1$ .

- A(s) iff every set of  $r \le s$  clauses is 1-sparse
- B<sub>ε</sub>(s) iff every set of r clauses, s/2<r≤s, has at least εr</li>
   pure literals

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# **Properties for Random Formulas**

#### Thm [CS,BSW,BKPS]

Let F be a random k-CNF over n variables and  $\Delta n$  clauses,  $\epsilon > 0$ . If  $s = O(\frac{n}{\Delta^{2/(k-2-\epsilon)}})$ , then w.h.p property A(s) and B<sub> $\epsilon$ </sub>(s) both hold.

Proof

Relatively elementary probability and counting. See [BKPS]

#### Assumption

From now on we assume to have for F both A(s) and  $B_{\epsilon}(s)$ .

## Define the measure

Let P be DLR refutations of a random k-CNF F.

```
\mu(C)= min I\subseteqF. s.t. I \rightarrowC
```

Prop1  $\mu$  is sub-additive

Prop2 C
$$\in$$
F  $\rightarrow \mu(C) \leq 1$ 

**Prop3** μ([])>s.

If a subset of F is 1-sparse then is satisfiable [Exercise: hint Hall theorem]. Then property A(s)

implies μ([])>s.

**Prop4.** There exists a clause K such that  $s/2 < \mu(C) \le s$ .

Choose the first clause in P with  $\mu(C)>s/2$ . By subadditivity get  $\mu(C)\leq s$ .

# High complexity implies high width

Lemma. w(K)≥εs/2

Proof.

 $\mu(K) \ge s/2$ , hence the minimal subset of F implying K has size at least s/2.

#### Claim

If S minimally implies K and I is pure in S, then  $I \in K$ . [Exercise]

Lemma follows from property  $B_{\epsilon}(s)$ .

Weak PHP: pseudowidth

### Weak PHP

The width method does not work for PHP[m,n] when m>=n<sup>2</sup>/log n

It was a big problem to understand the exact complexity of such a PHP

[Raz 02] Proved that it is hard for Resolution

[Razborov,03-05] Introduced a measure that generalize the width, called psuedowidth and prove Raz result and extend it to weaker form of Weak PHP

## Weak PHP

Pseudowidth.

```
Let i\in[m] and let C a clause J_C(i)=\{j\in[n] : p_{i,j} C\}
```

Consider a vector of pigeons threshold **d**=(d1,...,dm)

 $pw_{d}(C) = \{i \in [m] : |J_{C}(i)| \ge d_{i}\}$ 

Thm Short proofs of PHP[m,n] have small psuedowidth

Thm PHP[m,n] requires high pseudowidth

## **Open Problems**

Apply and define pseudowidth to other examples of formulas.

#### For instance

- Exact complexity of Ramsey formulas is not known in Resolution.
- Try to get stronger DLR lower bounds for random formulas (f.i. for a great density)