

# Complexity of Propositional Proofs

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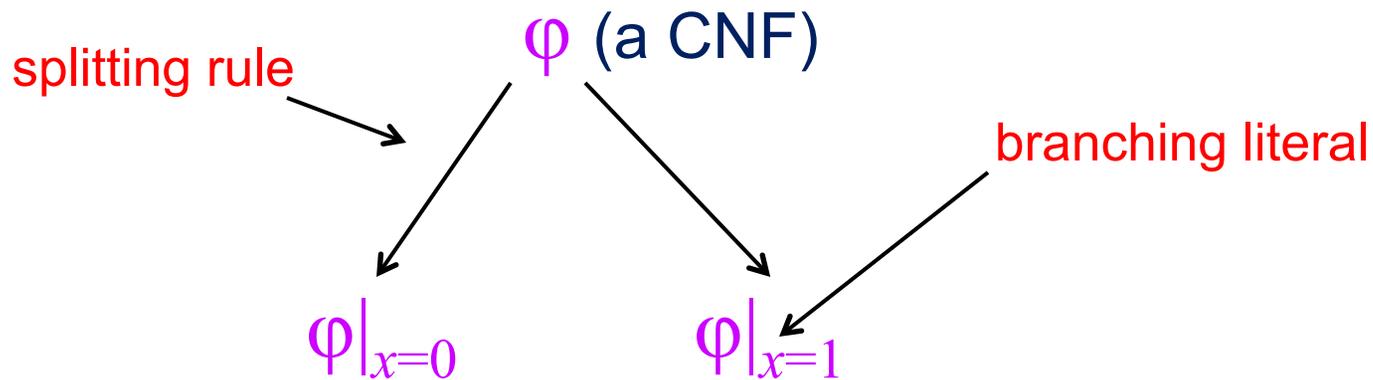
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# On universal character of propositional logic

- **Computer Scientist**: basic NP-complete problem, starting point for more interesting problems
- **Logician**: propositional calculus, basis for more complicated (and more interesting) calculi
- **Philosopher**: Aristotelian Logic which is the basis for more sophisticated (and, well, more interesting) philosophical systems

Putting it differently, propositional logic is pretty boring  
...that is, until we bring in complexity issues.  
and shallow...

# DPLL Algorithms (resolution based)



## Proof Complexity:

- restrict attention to **unsatisfiable** instances
- study **theoretical** limits of theorem proving procedures

# I. Framework

**Definition.** [Cook, Reckhow 73] **TAUT** is the set of all propositional tautologies. A **propositional proof system** is any poly-time computable function

$$P : \{0, 1\}^* \xrightarrow{\text{onto}} \text{TAUT}$$

**Intuition.**  $w \in \{0, 1\}^*$  is a  **$P$ -proof** of the tautology  $\phi = P(w)$ . “Onto” means completeness.

**Definition.** The **complexity** of  $\phi$  is the minimal bit size  $|w|$  of any  **$P$ -proof**  $w$  of  $\phi$ .

**Definition.** [CR73] A propositional proof system  $P$  is  $p$ -bounded if every tautology has a proof whose length is polynomially bounded in its own length  $|\phi|$ .

**Theorem.** [CR73]  $p$ -bounded propositional proof systems exist if and only if  $\text{NP} = \text{co-NP}$ .

**Proof idea.**  $\text{NP}$  is the class of all decision problems possessing efficient “proofs” of membership.

**Proof Complexity** begins when we are interested in **natural** proof systems  $P$  that have clear logical meaning (proofs in the ordinary, “Aristotelian” sense).

### Logical Proof Systems

- **Resolution** and tree-like resolution
- (bounded-depth) **Frege** or **Extended Frege**

### Algebraic and Geometric Proof Systems

- **Nullstellensatz** and **Polynomial Calculus**
- **Cutting Planes**
- **Lovász-Schrijver** type systems

# Some terminology

$x_1, x_2, \dots, x_n, \dots$  – Boolean (=  $\{0, 1\}$ -valued) variables

$x_1, \neg x_1, \dots, x_n, \neg x_n, \dots$  – literals

$x_1 \vee \neg x_2 \vee x_5$  – clauses

$x_1 \wedge \neg x_2 \wedge x_5$  – terms

A set of clauses  $C_1, \dots, C_h$  (interpreted as their conjunction) – **Conjunctive Normal Form (CNF)**

A disjunction of terms  $K_1 \vee \dots \vee K_h$  – **Disjunctive Normal Form (DNF)**.

# Resolution and tree-like resolution

Want to prove DNF  $\phi = K_1 \vee \dots \vee K_m \Rightarrow$  refute (infer a contradiction) instead the set of clauses  $(\neg K_1), \dots, (\neg K_m)$ .

**Resolution** proof system  $R$  operates with clauses and has one inference **Resolution rule**:

$$\frac{C \vee x \quad D \vee \bar{x}}{C \vee D}$$

## (Bounded-Depth) Frege Proof System

Any textbook proof system. Finitely many axiom schemes and inference rules like  $A \rightarrow$

$(A \vee B)$ ,  $A \vee \neg A$ ,

$((A \rightarrow B) \wedge (B \rightarrow C)) \rightarrow (A \rightarrow C)$ ,

$$\frac{A, \quad A \rightarrow B}{B} \quad (\text{modus ponens})$$

**Theorem.** [Reckhow 76] Every two Frege proof systems  $p$ -simulate each other.

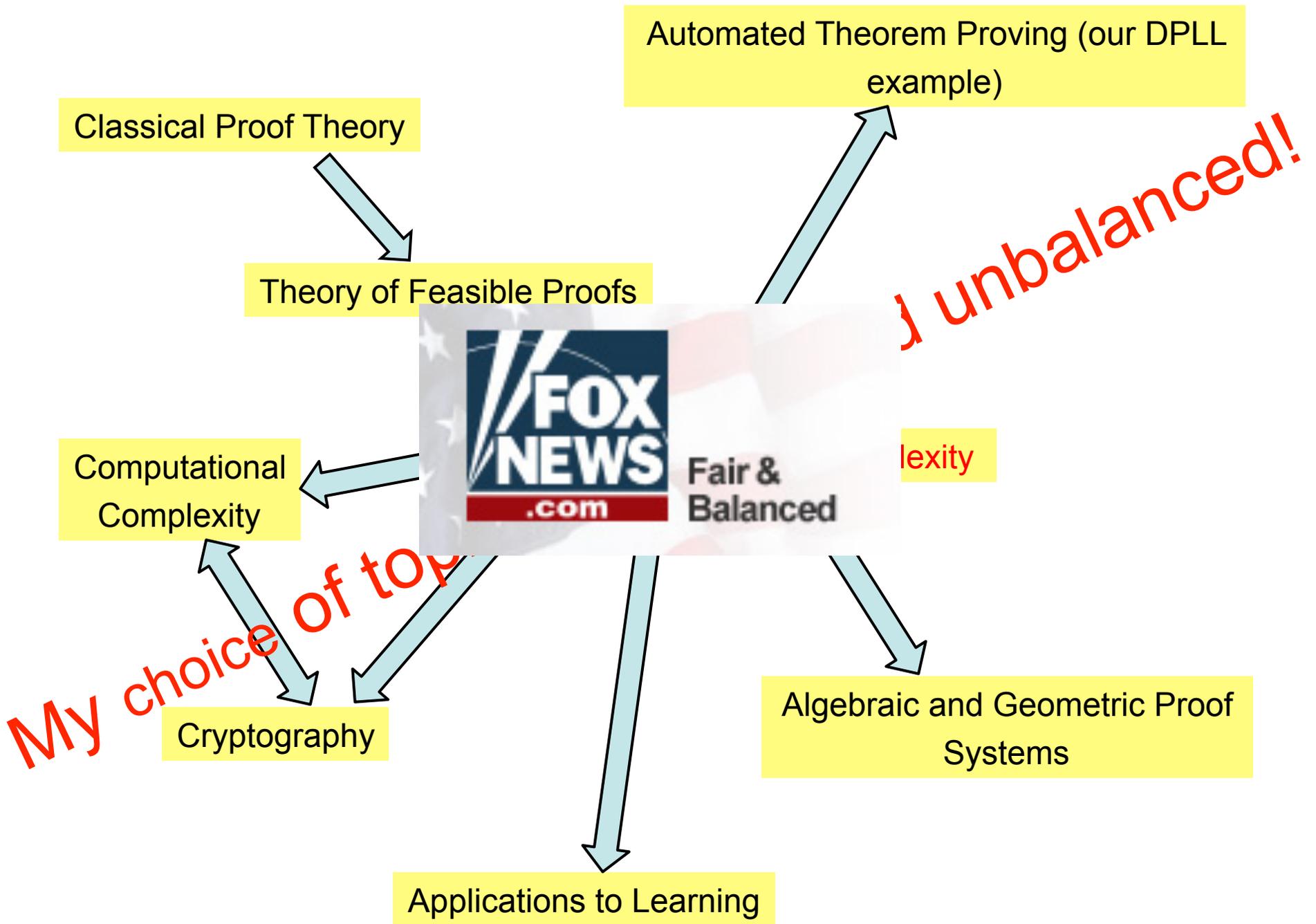
## Extended Frege Proof System

Extend a Frege proof system with the following **extension axioms** (essentially, allow abbreviations):

$$(p_A \equiv A),$$

where  $p_A$  is a **new** propositional variable.

**Remark.** Reckhow's theorem becomes trivial for Extended Frege proof systems. Moreover, we get an **equivalent** system of Extended **Resolution** (or, for that matter, of Extended **4-Resolution**).



## II. Bounded Arithmetic

- **Bounded Arithmetic** is a generic name for a collection of weak (well below  $I\Delta_1$ ) arithmetical theories capturing feasible **arguments**
- customary look: open axioms describing non-logical symbols + schemes of limited induction (+ comprehension, collection etc. in the second-order case)
- main characteristic feature: focus on **bounded** quantifiers  $(\exists x \leq t), (\forall x \leq t)$ , as opposed to unbounded.

# The most famous member of the family [Buss 86]

Language of  $S_2^1$ : Peano Arithmetic plus  $\lfloor x/2 \rfloor$ ,  $|x|$ ,  $x \# y$  (smash function  $2^{|x| \cdot |y|}$ )

The hierarchy  $\Sigma_i^b$  of bounded formulae: forbid unbounded quantifiers, count bounded quantifiers  $(\exists x \leq t)A(x)$ ,  $(\forall x \leq t)A(x)$  and ignore sharply bounded quantifiers  $(\exists x \leq |t|)A(x)$ ,  $(\forall x \leq |t|)A(x)$

Axioms of  $S_2^1$ :

A set of **open** axioms **BASIC** (like Robinson's arithmetic);

$\Sigma_1^b$  – *PIND* induction principle:

$$A(0) \wedge (\forall x)(A(\lfloor x/2 \rfloor) \rightarrow A(x)) \rightarrow A(a),$$

where  $A \in \Sigma_1^b$ .

**Main Witnessing Theorem** [Buss 86] *If  $S_2^1 \vdash (\forall x)(\exists y)A(x, y)$ , where  $A \in \Sigma_1^b$  then there exists a **poly-time computable** function  $f(x)$  on integers such that for every  $n$ ,  $\models A(n, f(n))$ . The converse is also true.*

The class of functions  $\Sigma_1^b$ -definable in  $S_2^1 =$   
The class of poly-time computable functions

**Feasible** proofs = proofs in  $S_2^1$

**Mathematical corollary:** If **FACTORING** is hard then Fermat's little theorem is not provable in  $S_2^1$

**Fun corollary:** two ways to destroy the world economy: build a Quantum Computer or prove Fermat's little theorem in  $S_2^1$

**Informal corollary:**  $S_2^1$  is precisely what you can prove in the world in which all **intermediate** constructions are also feasible

What about  $\Sigma_0^b$ -formulas?

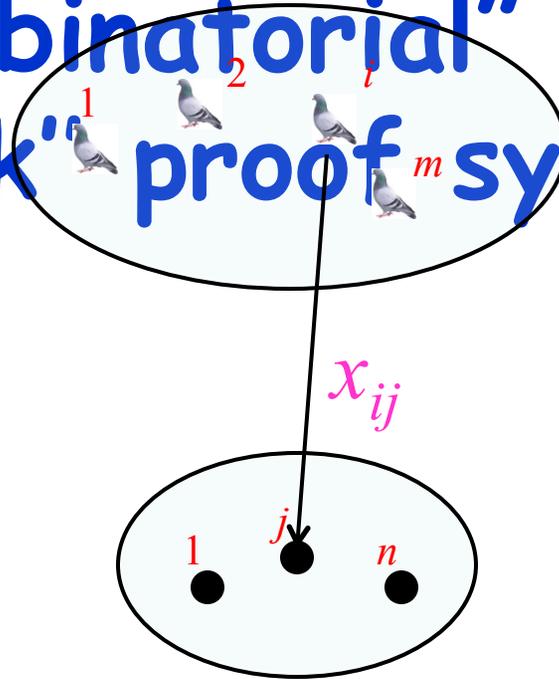
Gödel Incompleteness Theorem [Buss 86]:  
different versions depending on what kind  
of cuts is allowed.

No quantifiers to play with... very disappointing.

But this is where **propositional** proof complexity  
enters the stage.

**In the nutshell:** feasible (first-order) proofs  $\approx$   
short propositional proofs in the **companion  
propositional system**.

# III. "Combinatorial" results for "weak" proof systems



**Benchmark:** Pigeonhole Principle  $PHP_n^m$  is the following unsatisfiable ( $m > n$ ) set of clauses:

- $x_{i1} \vee \dots \vee x_{in}$ , for all pigeons  $i$  ( $i$ th pigeon flies somewhere);
- $\bar{x}_{ij} \vee \bar{x}_{i'j}$ , for different pigeons  $i, i'$  and every hole  $j$  (no two pigeons fly to the same hole).

$$m=n+1$$

**Theorem.** [Haken 85] Every *Resolution* proof of  $PHP_n^{n+1}$  must have size  $\exp(\Omega(n))$ .

**Theorem.** [Beame, Impagliazzo, Krajíček, Pitassi, Pudlák, Woods 92] Every *bounded-depth Frege* proof of  $PHP_n^{n+1}$  must have size  $\exp(\Omega(n))$ .

**Theorem.** [Buss 87] The *Frege* proof system proves  $PHP_n^{n+1}$  within polynomial size.

# $m$ way larger than $n$

**Theorem.** [Paris, Wilkie, Woods 88; Maciel, Pitassi, Woods 00] *Depth-2 Frege* operating with  $(\log n)^{O(1)}$ -CNFs proves  $PHP_n^{2^n}$  within quasi-polynomial  $(n^{(\log n)^{O(1)}})$  size.

**Theorem.** [Atserias, Bonnet, Esteban 00; Segerlind, Buss, Impagliazzo 02; Razborov 03] The previous bound is **tight**.

**Theorem.** [Raz 01; Razborov 02] *Every Resolution proof of  $PHP_n^\infty$  must have size  $\exp(\Omega(n^{1/3}))$ .*

# Feasible Provability of $P \neq NP$

Skipped

# IV. Algebraic Proof Systems (Vladimir's homework turned in)

0,1 can not only stand for FALSE and TRUTH but also can be interpreted as elements of a field!

The clause  $x_1 \vee \bar{x}_2 \vee x_3$  translates to  $(1 - x_1)x_2(1 - x_3) = 0$ . A CNF translates into a system of polynomial equations

$$f_1(x_1, \dots, x_n) = 0, \dots, f_m(x_1, \dots, x_n) = 0,$$

and we want to prove that it does not have 0-1 solutions.

The ring

$$\Lambda_n \stackrel{\text{def}}{=} K[x_1, \dots, x_n] / (x_i^2 - x_i \mid 1 \leq i \leq n)$$

of multilinear polynomials is well-known in Complexity Theory.  $\text{Hom}(\Lambda_n, K)$  is precisely the set of 0-1 assignments!

By Hilbert's Nullstellensatz, the system is unsolvable if and only if there exist polynomials  $Q_1, \dots, Q_m$  such that

$$f_1 Q_1 + f_2 Q_2 + \dots + f_m Q_m = 1 \text{ in } \Lambda_n.$$

# Nullstellensatz Proof System

Just described: a proof is the set of polynomials  $Q_1, \dots, Q_m$ .

An important twist: the complexity is usually measured by the maximal degree of  $Q_1, \dots, Q_m$ .

$PHP_n^m$ : to say that the  $i$ th pigeon flies somewhere, we say  $\sum_{j=1}^n x_{ij} - 1 = 0$  instead of  $\bigvee_{j=1}^n x_{ij}$ .

**Benchmark:** Pigeonhole Principle  $PHP_n^m$  is the following unsatisfiable set of clauses:

- $x_{i1} \vee \dots \vee x_{in}$ , for all pigeons  $i$  ( $i$ th pigeon flies somewhere);
- $\bar{x}_{ij} \vee \bar{x}_{i'j}$ , for different pigeons  $i, i'$  and every hole  $j$  (no two pigeons fly to the same hole).

**Theorem.** [Beame Cook Edmonds Impagliazzo Pitassi 95] Every Nullstellensatz refutation of  $PHP_n^\infty$  must have degree  $\Omega(\sqrt{n})$ .

## Polynomial Calculus: a dynamical version

We generate elements in the ideal  $(f_1, \dots, f_m)$  using obvious rules:

$$\frac{f = 0 \quad g = 0}{\alpha f + \beta g = 0} \qquad \frac{f = 0}{fg = 0}$$

and keep track of the maximal degree of all polynomials occurring in the proof.

Polynomial Calculus is stronger than both Nullstellensatz and Resolution!

**Theorem.** [Razborov 98] Every Polynomial Calculus refutation of  $PHP_n^\infty$  must have degree  $\Omega(n)$ .

# V. Geometric Proof Systems

The clause  $x_1 \vee \bar{x}_2 \vee x_3$  translates to  $x_1 + (1 - x_2) + x_3 \geq 1$ . A CNF translates into a system of linear inequalities

$$f_1(x_1, \dots, x_n) \geq 0, \dots, f_m(x_1, \dots, x_n) \geq 0,$$

and we want to prove that it does not have 0-1 solutions.

The clause  $x_1 \vee \bar{x}_2 \vee x_3$  translates to  $(1 - x_1)x_2(1 - x_3) = 0$ . A CNF translates into a system of polynomial equations

$$f_1(x_1, \dots, x_n) = 0, \dots, f_m(x_1, \dots, x_n) = 0,$$

and we want to prove that it does not have 0-1 solutions.

## Cutting Planes Proof System

**Cutting Planes** operates with statements expressible as  $f(x_1, \dots, x_n) \geq 0$ , where  $f$  is a **linear** polynomial with **integer** coefficients and has obvious axioms and the following inference rules:

$$\frac{f \geq 0 \quad g \geq 0}{\alpha f + \beta g \geq 0} \quad (\alpha, \beta \geq 0)$$

$$\frac{r \cdot f \geq a}{f \geq \lceil a/r \rceil}.$$

Sound and complete, stronger than Resolution.

Homework #2, same due date.  $PHP_n^m$  is no longer with us – it has linear (in  $n$ ) size refutation in Cutting Planes.

No direct combinatorial proofs of lower bounds are known for this system.

[Bonet Pitassi Raz 95; Pudlák 97] Exponential lower bounds  $\exp(n^{\Omega(1)})$  based on the material from the skipped part (and lower bounds for monotone circuits).

## Lovász-Schrijver type Proof Systems

*LS proof system* operates with statements expressible as  $f(x_1, \dots, x_n) \geq 0$ , where  $f$  is a *multi-linear quadratic* polynomial and has obvious axioms and the following inference rules:

$$\frac{f \geq 0 \quad g \geq 0}{\alpha f + \beta g \geq 0} \quad (\alpha, \beta \geq 0)$$

$$\frac{f \geq 0}{fx_i \geq 0}$$

$$\frac{f \geq 0}{f(1 - x_i) \geq 0}$$

as long as  $f$  is *linear*.

For simplicity: consider only **primal feasibility** problem for **0-1** programs.

$$\frac{f \geq 0 \quad g \geq 0}{\alpha f + \beta g \geq 0} \quad (\alpha, \beta \geq 0)$$

$P_0$  is the polytope generated by original linear constraints.

$$\frac{f \geq 0}{f x_i \geq 0} \quad \frac{f \geq 0}{f(1 - x_i) \geq 0}$$

**Lift:**  $P_1^+$  is the polytope made by all quadratic polynomials generated by these rules.

**Project:**  $P_1$  is the intersection of  $P_1^+$  with the subspace of **linear** polynomials.

Etc. until  $P_r = \emptyset$ . The minimal  $r$  is the **Lovász-Schrijver rank** of the original system.

Lovász-Schrijver rank =  
minimal proof depth in  $LS$

Other geometric proof systems/relaxation procedures:  $LS_+$ , Sherali-Adams, Lasserre... all operating with low-degree polynomial inequalities. Many upper/lower bounds are proven for  $\text{depth} = \text{rank}$ .

All these procedures are **highly** uneconomical and, unlike DPLL, do not try to separate “useful” constraints from stupid.

Size lower bounds for all these systems in the DAG model are at the moment **completely out of reach**.

$TH(k)$  – the proof system operating with arbitrary inequalities expressible by degree  $k$  polynomials;  $k$  is a constant.

[Beame Pitassi Segerlind 07] – exponential lower bounds for **tree-like**  $TH(k)$  proofs modulo lower bounds for the communication complexity of the **DISJOINTNESS** function in the **Number-on-Forehead model**.

The necessary lower bounds for **DISJOINTNESS** were recently supplied in the breakthrough development [Lee, Shraibman 08; Chattopadhyay Ada 08].

[Beame Huynh Pitassi 10]: industrial way to construct hard tautologies (for  $TH(k)$ ), **hardness escalation**.

# Group-Theoretical Proof Systems???

## (speculative)

What we are looking for: ways to convert a Boolean formula  $\phi(x_1, \dots, x_n)$  into a group-theoretic statement which is true iff it is satisfiable.

**Attempt # 1.** [Barrington Straubing Thérien McKenzie et. all] **programs over finite groups and monoids.**  $\phi \rightarrow P_\phi$ , and  $\phi$  is unsatisfiable iff  $P$  identically computes the unit element.

**Good news:** locality. **Bad News:** not clear what is the proof system.

Attempt # 2. [Birget Olshanskii Rips Sapir 02; Krajiček 03] Dehn functions.  $\phi \rightarrow w_\phi$  in a specially designed group, and  $\phi$  is unsatisfiable iff  $w_\phi = 1$ .

Good news: proof system is very clean. Bad news: neither the mapping is local in any reasonable sense nor the group is quite natural.

Attempt # 3????  $\phi \rightarrow G_\phi$  such that  $\phi$  is not satisfiable iff  $G_\phi \approx 1$ . Need some algebraic geometry like  $\text{Hom}(G, ???) \approx \{0, 1\}^n$  ( $G$  is a mother group like  $\Lambda_n$ ).

Thank you