

# Proof Complexity and Its Relations to SAT-Solving

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## **PART I: PROOF COMPLEXITY AND SAT**

1. Propositional Logic
2. SAT-Solvers
3. Frege Systems
4. Cut-Free and Cut-Only Proofs

## **PART II: COMPLEXITY OF PROOF SEARCH**

1. Proof Search and Automatability
2. Proof of NP-hardness for Resolution
3. An Open Problem

## Part II

# COMPLEXITY OF PROOF SEARCH

# Automatability : Searching for *Short* Proofs

**Definition** [Bonet-Pitassi-Raz'1999]

A proof system  $P$  is **automatable in time  $T(s)$**  if there is an algorithm that **given a tautology  $F$  finds a  $P$ -proof** of  $F$  in time  $T(s^*)$ , where  $s^*$  is the size of the smallest  $P$ -proof of  $F$ .

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## A Fundamental Question

Which proof systems are automatable in non-trivial time?

## An Early Lower Bound:

**Theorem** [Krajicek-Pudlak'1994]

Extended Frege systems are **not automatable** in time  $T(s)$ ,  
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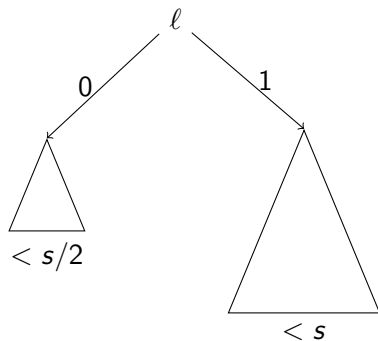
## An Early Upper Bound:

**Theorem** [Beame-Pitassi'1998]

Tree-like Resolution **is automatable** in time  $T(s) = s^{O(\log s)}$ .

# Beame-Pitassi Algorithm

1. **guess** the root literal  $\ell$   
( $2n$  choices only)
2. **recurse** with parameter  $s/2$   
(abort the branch if it fails)
3. **recurse** with parameter  $s - 1$   
(it must succeed).



$$T(n, s) \leq 2nT(n-1, s/2) + T(n-1, s-1)$$

$$T(n, s) = n^{O(\log s)} \leq s^{O(\log s)}.$$



# Non-Automatability of Resolution

**Theorem** [Atserias-Müller'2019]

Resolution is **not automatable** in time  $T(s)$ , [poly-time]  
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**Notes:**

- Compare with Beame-Pitassi algorithm!
- Improved earlier results of [Alekhovich-Razborov'2001]
- Introduced a **new method** for proving non-automatability
- Correctness of the reduction involves proving a lower bound!

# Proof Strategy for NP-Hardness

We want a polynomial-time reduction:

from  $n$ -variable SAT  
to min proof-size approximation for Resolution (R).

$$F \xrightarrow{\text{poly}(n) \text{ time}} G_F$$

## Requirements:

1. If  $F$  is **satisfiable**, then  $\text{SIZE}_R(G_F) \leq \text{poly}(n)$ .
2. If  $F$  is **unsatisfiable**, then  $\text{SIZE}_R(G_F) \not\leq \exp(\Omega(n))$ .

# Choice of the Formula $G_F$ : the REF Formulas

$\text{REF}_{F,s}$  = “the CNF formula  $F$  has an R-refutation of length  $s$ ”

## Variables:

- $D_{u,i,b}$  : “line  $u$  contains variable  $x_i$  with sign  $b \in \{0, 1\}$ ”
- $I_{u,j}$  : “line  $u$  is an **initial** assumption; the  $j$ -th clause of  $F$ ”
- $V_{u,i}$  : “line  $u$  is derived by resolving on **variable**  $x_i$ ”
- $L_{u,v}$  : “line  $u$  is derived using  $v$  as **left** assumption”
- $R_{u,v}$  : “line  $u$  is derived using  $v$  as **right** assumption”
- $A_u$  : “line  $u$  is **active**; i.e., actually used in the proof”

## Clauses (a sample):

$$\begin{array}{ccc} \overline{A_u} \vee \overline{V_{u,i}} \vee \overline{L_{u,v}} \vee D_{v,i,1} & \overline{A_u} \vee \overline{V_{u,i}} \vee \overline{R_{u,v}} \vee D_{v,i,0} & \overline{D_{s,i,b}} \\ \overline{A_u} \vee \overline{V_{u,i}} \vee \overline{L_{u,v}} \vee A_v & \overline{A_u} \vee \overline{V_{u,i}} \vee \overline{R_{u,v}} \vee A_v & A_s \\ \dots & & \end{array}$$

## Requirement 1 : The Upper Bound

If  $F$  is **satisfiable**, then  $\text{SIZE}_R(\text{REF}_{F,n^c}) \leq \text{poly}(n)$ .

### Proof idea:

Use a satisfying assignment  $\alpha$  of  $F$  to **nail down** the refutation!

### Proof sketch:

- Prove that every active line contains a literal satisfied by  $\alpha$ .
- Concretely, derive the clauses

$$T_u := \overline{A_u} \vee \bigvee_{i=1}^n D_{u,i,\alpha(i)} \quad \text{for } u = 1, 2, \dots, L.$$

- Produce empty clause by resolving  $T_s$  with  $A_s$  and the  $\overline{D_{s,i,b}}$ .

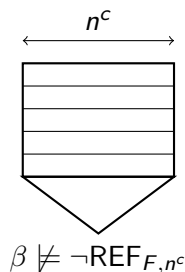
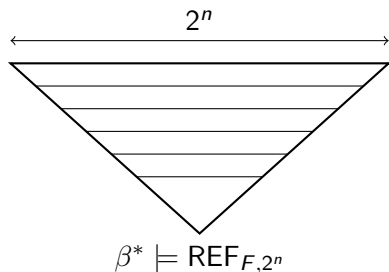
QED

## Requirement 2 : The Lower Bound

If  $F$  is **unsatisfiable**, then  $\text{SIZE}_R(\text{REF}_{F,n^c}) \not\leq \exp(\Omega(n))$ .

**Proof idea:**

Use a **model**  $\beta^*$  of  $\text{REF}_{F,2^n}$  to construct  
a collection of “**pseudo-models**”  $\beta$  for  $\text{REF}_{F,n^c}$ .



# The Lower Bound in Three Steps

- Identify a set  $H$  of  $\alpha$  such that  $\text{REF}_{F,s}|_{\alpha} \cong \text{REF}_{F,s/2}$ .
- Here: let  $\alpha$  set 1/2 of all lines as inactive (but not the last).
- And let  $\alpha$  also set all other variables of those lines.
  
- Identify a notion of **weak** clause made likely true by random  $\alpha$ .
- Here: the clauses that **mention** more than  $n/2$  lines.
- Calculation:  $\Pr_{\alpha \in H}[C|_{\alpha} \neq 1] \leq (3/4)^{n/2}$ .
  
- Prove that refutations of  $\text{REF}_{F,s/2}$  must contain weak clauses.
- Walk up the dag from empty clause to axioms, and do:
- Sustain a **matching** between **active lines** and the **lines in  $\beta^*$** .
- The corresponding assignments are the “**pseudo-models**”  $\beta$ .

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# The Tree-Like Case

We want a reduction:

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to min proof-size approximation for tree-like R (called  $R^*$ ).

$$F \xrightarrow{\text{exp}(o(n)) \text{ time}} G_F$$

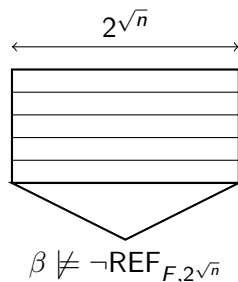
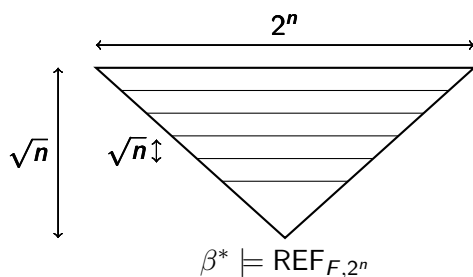
**Requirements:**

1. If  $F$  is **satisfiable**, then  $\text{SIZE}_{R^*}(G_F) \leq \exp(O(\sqrt{n}))$ .
2. If  $F$  is **unsatisfiable**, then  $\text{SIZE}_{R^*}(G_F) \not\leq \exp(\Omega(n))$ .

# Modification of the Formula $G_F$ : Shallow REF

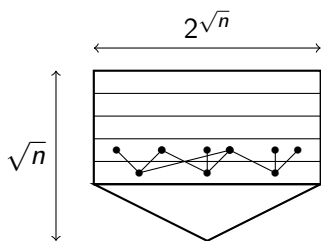
## Key Observation:

In the “ $F$  is **unsatisfiable**” case,  
the model  $\beta^*$  of  $\text{REF}_{F,2^n}$  happens to be:  
**tree-like** and **layered**, and have **depth**  $n$ .



# Modification of the Formula in More Details

- Modify the formula  $G_F$ ; now  $\text{REF}_{F,s|\gamma}$  with  $s = 2\sqrt{n}$ .
- The  $\gamma$  restricts  $A, D, I, V, L, R$  in a way **compatible** with  $\beta^*$ :
- Instead of arbitrary dag-depth, impose **depth  $n$** .
- Instead of arbitrary structure, impose  $\sqrt{n}$  **layers** of depth  $\sqrt{n}$ .
- Instead of  $\text{poly}(n)$ -size layers, allow layers of **size  $2\sqrt{n}$** .
- Instead of full connectivity between layers, place **expanders**.
- Their bounded degree  $d$  ensures tree-like size  $d^{\sqrt{n}} = 2^{O(\sqrt{n})}$ .
- Their expansion property ensures matchability with  $\beta^*$ .



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Is it computationally feasible to distinguish **satisfiable** formulas from **shortly refutable** formulas?

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- Therefore: it cannot be harder than  $NP \cap co-NP$ .
- For Resolution, the problem is PARITY GAMES hard [BPT].
- For (Extended) Frege, the problem is RSA-hard [KP,BPR].

# END OF PART II AND OF TUTORIAL