

# **ALGORITHMIC COMPLEXITY OF CERTIFIED UNSATISFIABILITY**

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# I.E., COMPLEXITY OF PROOF SEARCH

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## SAT-solvers revolution (since early 2000's)

SAT-solvers “routinely” find:

satisfying assignments

or

proofs of unsatisfiability



For formulas with 1000's of variables:

search space is RIDICULOUSLY **BIG!**

[MS'99, Chaff 2001, ...]


# “200 TB maths proof is largest ever”

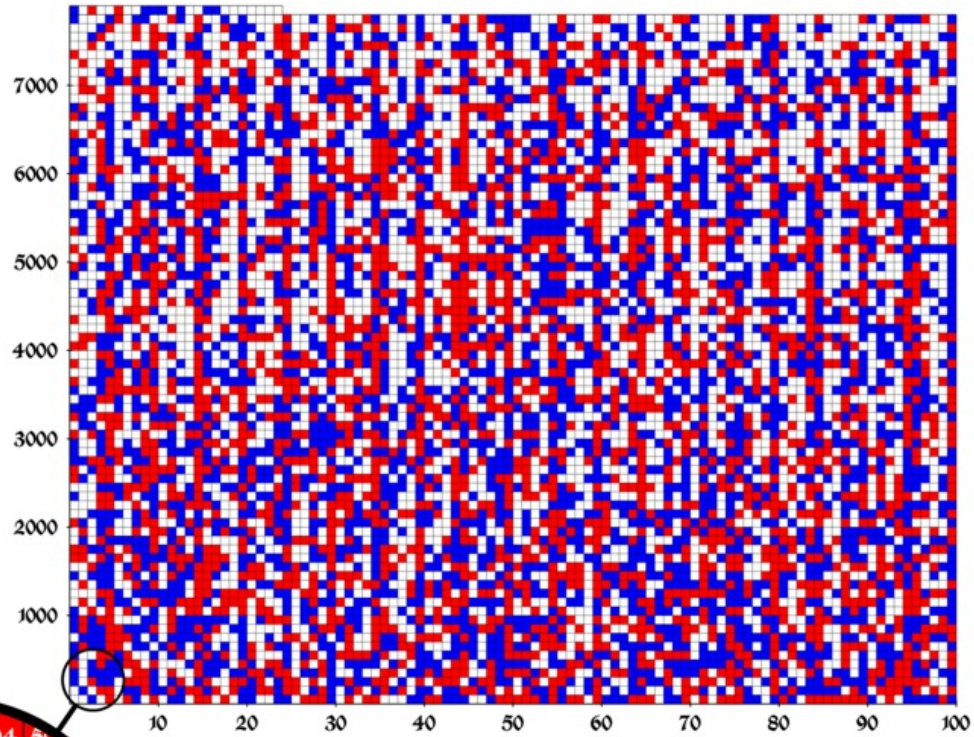
[Nature 2016]

**Theorem** [Heule, Kullmann, Marek 2016]

The numbers 1,...,7825 **cannot be partitioned**  
into two parts each **without** Pythagorean triples.

But the numbers 1,...,7824, **can**.


$$a^2 + b^2 = c^2$$



$$a^2 + b^2 \neq c^2$$

$$a^2 + b^2 \neq c^2$$

501	502	503	504	505	506
401	402	403	404	405	406
301	302	303	304	305	306
201	202	203	204	205	206
101	102	103	104	105	106
1	2	3	4	5	6

a valid red/blue coloring (white = either) of the numbers 1,2,...,7824.

For 7825, it **doesn't exist**.

[Source: Wikipedia]

**AUTOMATABILITY**

## Definition of automatability

**Def:** P is **AUTOMATABLE** in polynomial time  
if  
an algorithm finds P-proofs in time **polynomial in**  
the size of **smallest P-proof**

[Bonet, Pitassi, Raz 97]

## SAT-solver vs PROOF-searcher

evaluated through  
benchmarking

evaluated through  
provable guarantees

**Moshe Vardi** “For the SAT revolution to continue unabated, we must focus also on understanding, not only on benchmarking.”

[Vardi, CACM 2014]  
restated by [Sakallah, Simons 2023]

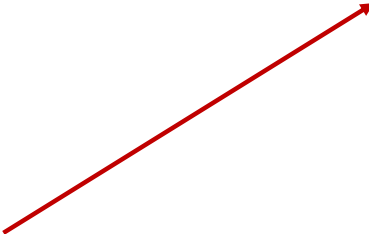


# Tree-like Resolution

**Theorem** [Beame, Pitassi 98]

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

number of  
variables



size of smallest  
tree-like refutation



# General Resolution

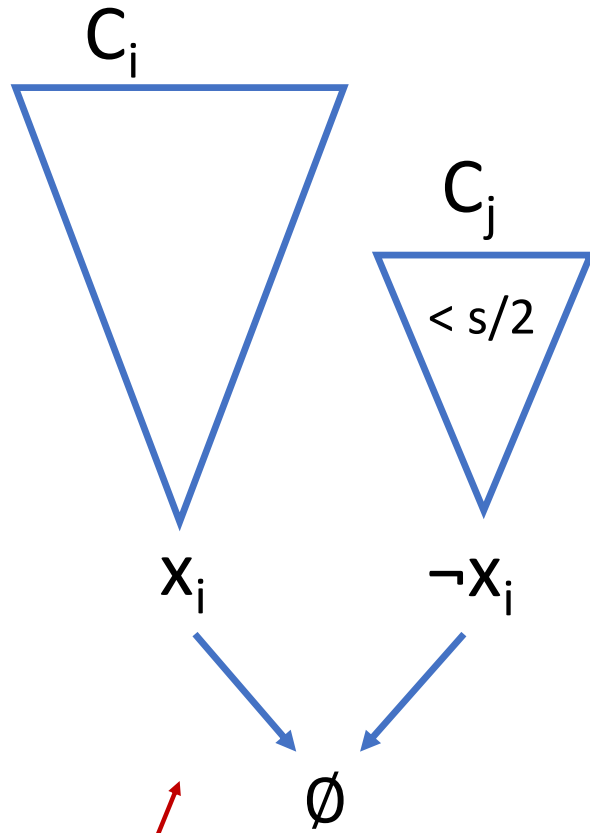
## Theorem [Ben-Sasson, Wigderson 99]

Resolution **is** automatable in time  $n^{O(\sqrt{n \log s} + k)}$

for  $s = \text{poly}(n)$ ,  $k = 3$   
this is  $\exp(n^{1/2} \log(n)^{3/2})$ .  
Compare with ETH.

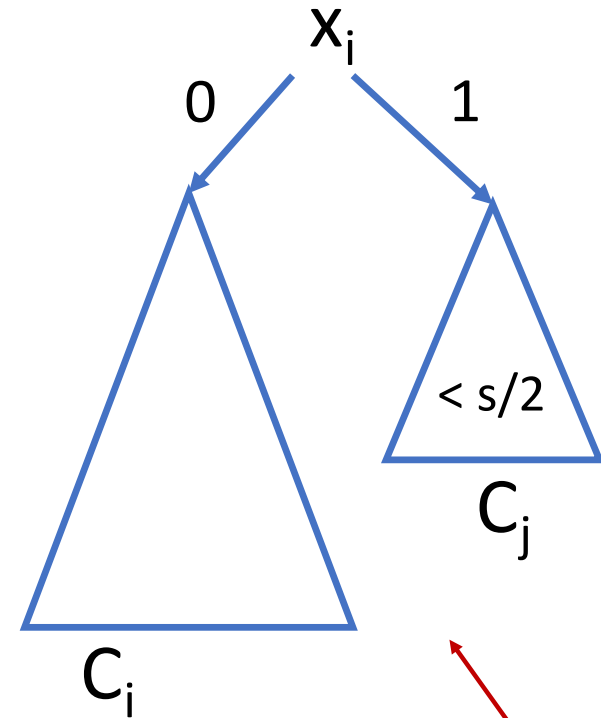
width of  
initial clauses

# Beame-Pitassi Algorithm



tree-like Resolution  
refutation of size  $s$

flipover



decision tree for  
the falsified clause  
search problem

## Algorithm

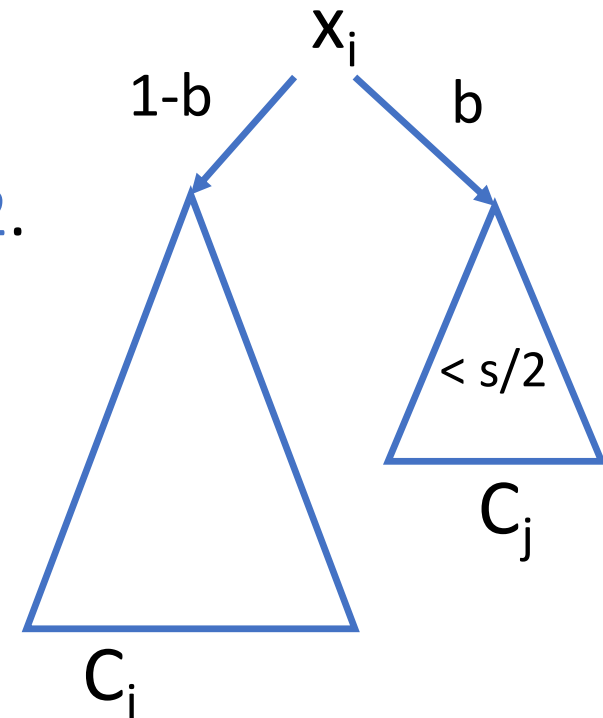
Given  $F$  and  $s$ .

Guess  $i$  and  $b$  and recurse on  $F[x_i=b]$  and  $s/2$ .

Then recurse on  $F[x_i=1-b]$  and  $s-1$ .



**Subtle:** Don't know  
if the guess that worked  
is the root of the optimal tree!



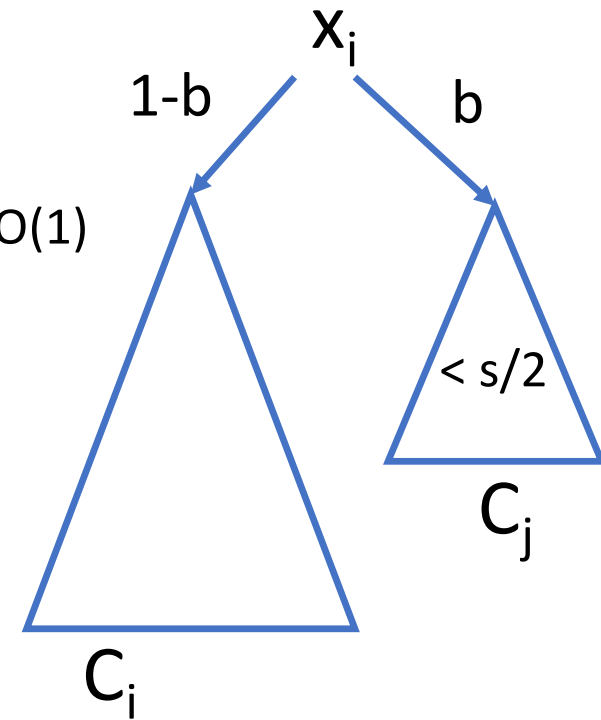
# Analysis

number of variables

target size

$$R(n, s) = 2n R(n-1, s/2) + R(n-1, s-1) + n^{O(1)}$$

number of choices in guess



**Solution:**  $n^{O(\log s)}$

## Proof Searchers

**Restatement:** There is a proof-searcher for tree-like Resolution with quasipolynomial-time  $n^{O(\log s)}$  guarantee.

**Restatement:** There is a proof-searcher for Resolution with subexponential-time  $n^{O(\sqrt{n \log s})}$  guarantee.

Indeed, CDCL (with enough restarts, enough random decisions, and full memory) achieves this!

[AFT'2011]

# **FEASIBLE INTERPOLATION**

## Craig Interpolants

$$F(x, y) \wedge G(x, z)$$

← suppose this is unsatisfiable.

$$\neg \text{INT}(x) \rightarrow \neg F(x, y)$$

← Then these are tautologies.

$$\text{INT}(x) \rightarrow \neg G(x, z)$$

↗  
INT(x) tells which one is unsatisfiable, for each given x.




## Interpolants in graph theory

$\text{CLIQUE}_{k+1}(x, y) :=$  “ $y$  codes a  $k+1$ -clique of  $x$ ”

$\text{COL}_k(x, z) :=$  “ $z$  codes a proper  $k$ -coloring of  $x$ ”

  
x codes a graph

$\text{CLIQUE}_{k+1}(x, y) \wedge \text{COL}_k(x, z)$

  
unsatisfiable  
(by the PHP)

## What are its interpolants?

“y is  $k+1$ -clique of x”  $\wedge$  “z is  $k$ -coloring of x”

$\neg \text{INT}_k(x) \rightarrow “\omega(x) \leq k”$

$\text{INT}_k(x) \rightarrow “\chi(x) > k”$


E.g. Lovász's Theta “ $\vartheta(x) > k$ ”

## Interpolants in Cryptography


$\text{ONE}_i(x, y) := \text{“}f(y) = x \text{ and } y_i = 1\text{”}$

$\text{ZERO}_i(x, z) := \text{“}f(z) = x \text{ and } z_i = 0\text{”}$

a permutation that is  
easy to compute  
hard to invert



unsatisfiable  
since  $f$  is 1-to-1



$\text{ONE}_i(x, y) \wedge \text{ZERO}_i(x, z)$

## What are its interpolants?

“ $f(\mathbf{y}) = x$  and  $y_i = 1$ ”  $\wedge$  “ $f(\mathbf{z}) = x$  and  $z_i = 0$ ”

$\neg \text{INT}_i(x) \rightarrow “f^{-1}(x)_i = 0”$

$\text{INT}_i(x) \rightarrow “f^{-1}(x)_i = 1”$



any interpolant inverts  
the function (its i-th bit)

## Feasible Interpolation

**Def:** P has **feasible interpolation**:

all unsatisfiable  $F(x, y) \wedge G(x, z)$  have  
interpolants of circuit-size **polynomial** in  
the size of their smallest P-refutations.

[Krajicek 1997]

## Resolution has feasible interpolation

**Theorem:** [Krajicek 1997]

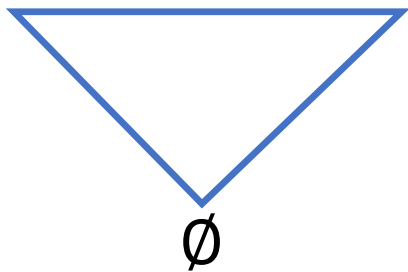
Resolution **has** (monotone) feasible interpolation.



Implies lower bound on CLIQUE & COL formulas  
by monotone circuits lower bounds  
[Razborov 1986], [Alon, Bopana 1987]

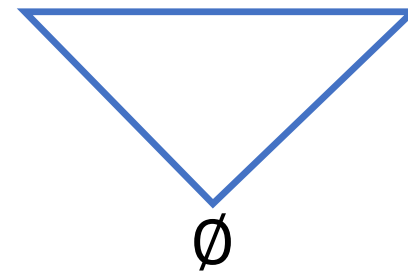
## Interpolation algorithm: restrict & split

$$F(x, y) \wedge G(x, z)$$

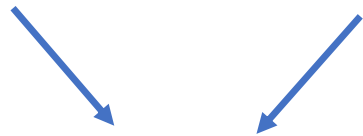


restrict

$$F'(y) \wedge G'(z)$$



$$Y \vee Z \vee z_i \quad Y' \vee Z' \vee \neg z_i$$



$$Y \vee Y' \vee Z \vee Z'$$

cut (z case)

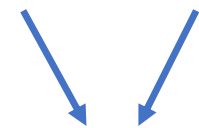
split

$$Y \quad Y'$$

$$Y \vee Y'$$

weakening

$$Z \vee z_i \quad Z' \vee \neg z_i$$



$$Z \vee Z'$$

cut

**INTERPOLATION  
AND  
AUTOMATABILITY**



## Automatability implies Interpolation

**Lemma:** [Bonet, Pitassi, Raz 97]

**If** a proof system is automatable,  
**then** it has feasible interpolation.

## The BPR argument

suppose this  
has P-refutation  
of size s

$$F(x, y) \wedge G(x, z)$$

$$\text{INT}(x_0) := \text{REF}_{P, p(s)}(\langle G(x_0, z) \rangle, A(\langle G(x_0, z) \rangle))$$

verifier of  
proof system P

If A is an automating algorithm for P  
then this is an interpolant

## Strong systems lack feasible interpolation

**Theorem** [Krajicek, Pudlak 98]

Extended Frege **does not** have feasible interpolation  
**unless** RSA is broken by poly-size circuits

## The Krajicek-Pudlak Argument

The statements

“ $\text{RSA}_i(\mathbf{y},k)=x$  and  $y_i = 1$ ”  $\wedge$  “ $\text{RSA}_i(\mathbf{z},k)=x$  and  $z_i = 0$ ”

have poly-size Extended Frege refutations.

Q.E.D.

## First Non-Automatability Result: EFrege

### Corollary

Extended Frege **is not** automatable  
**unless** RSA is invertible in poly-time



Later improved to  
Frege,  $TC^0$ -Frege,  $AC^0$ -Frege  
[Bonnet et al. 97, 99]

**SOUNDNESS PROOFS  
AND  
AUTOMATABILITY**

## Interpolants of soundness statements

$\text{SAT}(x, y) :=$  “ $y$  codes a satisfying assignment of  $x$ ”

$\text{REF}_{P,S}(x, z) :=$  “ $z$  codes a P-refutation of  $x$ ”

proof  
system

the size  
 $s = |z|$

codes a CNF

a contradiction  
since P is sound

$\text{SAT}(x, y) \wedge \text{REF}_{P,S}(x, z)$


## Interpolants of soundness statements

$$\text{SAT}(x, y) \wedge \text{REF}_{P,S}(x, z)$$

$$\neg \text{INT}(x) \rightarrow \neg \text{SAT}(x, y)$$

$$\text{INT}(x) \rightarrow \neg \text{REF}_{P,S}(x, z)$$

interpolant  
exists by  
the **soundness**  
of P



Sort of **dual** to  
what a SAT-solver does!





$$\text{SAT}(x, y) \wedge \text{REF}_{P,S}(x, z)$$

If P is automatable  
then there is a poly-time interpolant

$$\text{INT}(x) := \neg \text{REF}_{P,p(s)}(x, A(x))$$

polynomial runtime  
of automating algorithm

automating  
algorithm of P

$$\text{SAT}(x, y) \wedge \text{REF}_{P,S}(x, z)$$

If Q p-simulates P  
and Q is automatable  
then there is a poly-time interpolant

$$\text{INT}(x) := \neg \text{REF}_{Q,p(q(s))}(x, A(x))$$

polynomial loss  
in automating algorithm

polynomial loss  
in p-simulation

automating  
algorithm of Q

[Pudlák 2001]

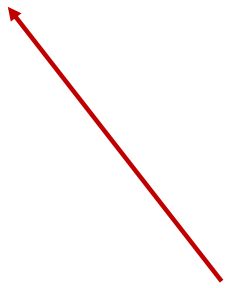
## Weak Automatability

**Theorem** [Pudlák 2001]:

The following are equivalent:

- (1) SAT & REF formulas for P have **polytime interpolants**
- (2) there exists an **automatable** Q that **p-simulates** P

I.e., P is **weakly automatable** in Q  
[A., Bonnet 2003]



## Resolution proofs of own soundness?

**Theorem** [A., Bonet 2003]

Resolution proofs of its own soundness

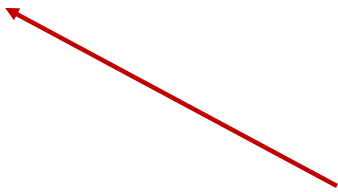
**must** be of **superpolynomial** in size

**but** poly-size Res(2)-proofs **do** exist!

Lower bound by reduction from  
CLIQUE & COL formulas



Resolution with 2-DNFs  
instead of clauses



**AUTOMATING  
RESOLUTION  
IS HARD**

# The Alekhnovich-Razborov Theorem

**Theorem** [Alekhnovich-Razborov 2001]

Resolution is **not** automatable

**unless**  $W[P]$  is tractable



- relies on a strong assumption.
- best lower bound: time  $n^{\log\log(n)^{0.14}}$ , under ETH [Mertz-Pitassi-Wei 19]
- applies to tree-like Resolution!

## Automating Resolution is NP-hard

**Theorem** [A., Müller 2019]

Resolution **is not** automatable

in polynomial-time **unless**  $P = NP$

nor in subexponential-time **unless** ETH fails



- optimal assumption
- new method
- based on soundness proofs!

## A glimpse at the proof

Find a map that takes CNFs into CNFs

$$F \xrightarrow{\text{polytime}} G$$

$$F \text{ is sat} \implies \text{min-ref-size}(G) \leq |G|^{1+\varepsilon}$$

$$F \text{ is unsat} \implies \text{min-ref-size}(G) \not\leq \exp(|G|^{\frac{1}{2}-\varepsilon})$$

minimum Resolution  
refutation size

SMALL

BIG



## The easy/hard formula

$$G := \text{RREF}(\langle F \rangle, z)$$

a minor variant of REF

for poly length  $z$

**Upper bound** : Uses the small **soundness proof** of Resolution in Res(2)!

**Lower bound** : Adversary argument to mimic the exponentially big refutation.

## Beyond Resolution?

**Thm:** [Goos-Koroth-Metz-Pitassi'20]

Resolution **is not** weakly automatable in  
Cutting Planes **unless**  $P = NP$

**Thm:** [de Rezende-Goos-Nordström-Pitassi-Robere-Sokolov'21]

Resolution **is not** weakly automatable in  
Nullstellensatz or Polynomial Calculus **unless**  $P = NP$

## Below Resolution?

**Thm:** [de Rezende'21]

Tree-like Resolution **is not** automatable  
in less than quasipolynomial time  
**unless** ETH fails

$$F \text{ is sat} \implies \text{min-tree-size}(G) \leq 2^{c\sqrt{N}}$$

$$F \text{ is unsat} \implies \text{min-tree-size}(G) \not\leq 2^{dN}$$

# **THE BIG REMAINING PROBLEM**

# Is Resolution Weakly Automatable?

**Difficulty:**

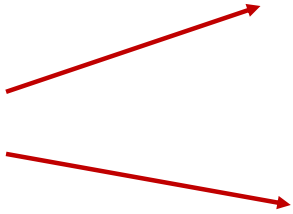
Equivalent to distinguishing:

satisfiable formulas (**SAT**)

**from**

shortly refutable formulas (**REF<sub>poly</sub>**)

both  
are  
problems  
in NP



THE END