# On the Virtue of Succinct Proofs: Amplifying Communication Complexity Hardness to Time-Space Trade-offs in Proof Complexity 

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Joint work with Trinh Huynh

## The SAT Problem in Theory and Practice

- SAT NP-complete and so probably intractable in worst case
- But enormous progress on applied algorithms last 10-15 years
- Surprising fact 1: State-of-the-art SAT solvers can deal with real-world instances containing millions of variables
- Surprising fact 2: Best SAT solvers today still based on methods from early 1960s
- Algebraic and geometric methods more efficient in theory but not so far in practice


## SAT Solving and Proof Complexity

## SAT solving

- Constructive (almost deterministic) algorithms
- Key resources for solvers: time and memory
- Ideally minimize simultaneously


## Proof complexity

- Study proofs, i.e., nondeterministic algorithms
- Complexity measures: proof size and proof space
- Lower bounds for optimal algorithms


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Hope to understand potential and limitation of SAT solvers by studying corresponding proof systems

Complexity measures also natural and interesting in their own right
This talk: Size-space trade-offs for algebraic and geometric systems

## Some Terminology and Notation

- Literal $a$ : variable $x$ or its negation $\bar{x}$
- Clause $C=a_{1} \vee \cdots \vee a_{k}$ : disjunction of literals
- CNF formula $F=C_{1} \wedge \cdots \wedge C_{m}$ : conjunction of clauses
- $k$-CNF formula: all clauses of size $\leq k$ (some constant)
- Goal: Refute given CNF formula (i.e., prove it is unsatisfiable)
- All formulas in this talk are $k$-CNFs
(cleanest and most interesting case)


## The Theoretical Model

- Proof system operates with lines of some syntactic form
- Proof/refutation is "presented on blackboard"
- Derivation steps:
- Write down axiom clauses of CNF formula being refuted (as encoded by proof system)
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## Complexity Measures: Length, Size and Space

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\# derivation steps

## Size

$\approx$ total \# symbols in proof counted with repetitions

## Space

$\approx$ max size of blackboard to carry out proof (e.g., space 3 for this blackboard)

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Note that:
(1) These are (very) informal definitions only - see paper for details
(2) Length and size can be very different but we won't distinguish between them here

## Resolution

Basis for the most successful SAT solvers to date (DPLL method plus clause learning)

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- Optimal (exponential) lower bounds on size [Urquhart '87; Chvátal \& Szemerédi '88]
- Optimal (linear) lower bounds on clause space [Torán '99; Alekhnovich, Ben-Sasson, Razborov \& Wigderson '00]
- Strong size-space trade-offs [Ben-Sasson \& N. '11; Beame, Beck \& Impagliazzo '12]


## Polynomial Calculus (or Actually PCR [ABRW '00])

Clauses interpreted as polynomial equations over finite field E.g., $x \vee y \vee \bar{z}$ translated to $x^{\prime} y^{\prime} z=0$ Show no common root by deriving $1=0$

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Boolean axioms $\overline{x^{2}-x=0}$
Negation $\overline{x+x^{\prime}=1}$
Linear combination $\frac{p=0 \quad q=0}{\alpha p+\beta q=0}$

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\text { Multiplication } \frac{p=0}{x p=0}
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- Optimal (exponential) lower bounds on size [Alekhnovich-Razborov '01] and others
- Only recently lower bounds on monomial space for $k$-CNFs [Filmus, Lauria, N., Thapen \& Zewi '12] building on [ABRW '00] But not optimal(!?)
- No size-space trade-offs


## Cutting Planes

Clauses interpreted as linear inequalities E.g., $x \vee y \vee \bar{z}$ translated to $x+y+(1-z) \geq 1$ Show inconsistent by deriving $0 \geq 1$

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Variable axioms

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0 \leq x \leq 1
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Multiplication $\frac{\sum a_{i} x_{i} \geq A}{\sum c a_{i} x_{i} \geq c A}$
Addition

$$
\frac{\sum a_{i} x_{i} \geq A \quad \sum b_{i} x_{i} \geq B}{\sum\left(a_{i}+b_{i}\right) x_{i} \geq A+B} \quad \text { Division } \frac{\sum c a_{i} x_{i} \geq A}{\sum a_{i} x_{i} \geq\lceil A / c\rceil}
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- Only one (exponential) lower bounds on size [Pudlák '97]
- No lower bounds on line space
- No size-space trade-offs


## Trade-offs for Polynomial Calculus and Cutting Planes

We make some progress on understanding space and size-space trade-offs in polynomial calculus and cutting planes

## Theorem (Informal)

There are $k$-CNF formulas $\left\{F_{n}\right\}_{n=1}^{\infty}$ of size $\Theta(n)$ such that

- resolution can refute $F_{n}$ in length $\mathcal{O}(n)$ (and hence so can polynomial calculus and cutting planes)
- any polynomial calculus or cutting planes refutation of $F_{n}$ in length $L$ and space s must have

$$
s \log L \gtrsim \sqrt[4]{n}
$$

## Proof Ingredients

- Pebbling
- Communication complexity
- Lifting


## Pebbling Formulas

CNF formulas encoding pebble games played on DAGs (as studied in 1970s and 1980s)

1. $u$
2. $v$
3. $w$
4. $\bar{u} \vee \bar{v} \vee x$
5. $\bar{v} \vee \bar{w} \vee y$
6. $\bar{x} \vee \bar{y} \vee z$


- sources are true
- truth propagates upwards
- but sink is false

7. $\bar{z}$

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Appeared in various contexts in [Bonet et al. '98, Raz \& McKenzie '99, Ben-Sasson \& Wigderson '99] and other papers

Used to study size and space in resolution in [N. '06, N. \& Håstad '08, Ben-Sasson \& N. '08, '11]

## Two-Player Randomized Communication Complexity

- Alice has private input $x$ and private source of randomness
- Bob has private input $y$ and private source of randomness
- Both have unbounded computational powers
- Want to compute $f(x, y)$ by sending messages back and forth
- Output correct for any $x$ and $y$ except with error probability $\varepsilon$
- Communication cost: max \# bits communicated on any $x$ and $y$


## Falsified Clause Search Problem

Fix:

- unsatisfiable CNF formula $F$
- (devious) partition of $\operatorname{Vars}(F)$ between Alice and Bob


## Falsified clause search problem $\operatorname{Search}(F)$

Input: Assignment $\alpha$ to $\operatorname{Vars}(F)$ split between Alice and Bob Output: Clause $C \in F$ such that $\alpha(C)=0$

Actually, computing not function but relation - more about that later

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(E.g. for polynomial calculus Alice and Bob simply evaluate their part of each monomial and exchange values - cutting planes bit more involved but can be done)

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| :--- | :--- | :--- | :--- | :--- | :--- |



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Length- $\ell$ lifting of $f$ defined as


Lift $_{\ell}(f)(x, y):=f\left(x_{1, y_{1}}, \ldots, x_{m, y_{m}}\right)$

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Idea borrowed from [Beame, Huynh \& Pitassi '10]

## Critical Block Sensitivity of Search Problems

- Block sensitivity of $f$ on $\alpha$ : \# disjoint blocks of $\alpha$ that flip $f$ if flipped
- Problem: falsified clause search problem defines relation, not function
- Study block sensitivity of search problems
- In addition restrict to critical inputs (where relation is "function-like" in that there is only one right answer)
- Prove randomized communication complexity lower bounds in terms of critical block sensitivity of search problems
- Proof uses information-theoretic approach inspired by [Bar-Yossef, Jayram, Kumar \& Sivakumar '04]


## Communication Complexity Results

We prove two technical lemmas:

## Lemma 1

If critical block sensitivity of search problem $S$ is large, then communication complexity of lifted search problem $\operatorname{Lift}(S)$ is large

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## Lemma 2

Search problems for pebbling formulas constructed from specfic family of pyramid graphs have large critical block sensitivity

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- Encode lifting of search problem for CNF as new formula Lift $(F)$ (as in [Beame, Huynh \& Pitassi '10])


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- But communication complexity of lifted search problem lower-bounded by critical block sensitivity (Lemma 1)


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- Protocol for $\operatorname{Search}(\operatorname{Lift}(F))$
$\Rightarrow$ use to solve $\operatorname{Lift}(\operatorname{Search}(F))$ - easy
- But communication complexity of lifted search problem lower-bounded by critical block sensitivity (Lemma 1)
- Plug in lower bound for pyramid pebbling formulas (Lemma 2) $\Rightarrow$ trade-off for lifted pebbling formulas


## More General Trade-offs?

Our proofs only work for formulas generated from pyramid graphs
For resolution, correspondence between pebbling and size-space trade-offs holds for arbitrary graphs

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Recently achieved for polynomial calculus in [Beck, N. \& Tang '12] (using different techniques; in particular random restrictions)

Still open for cutting planes (random restrictions don't work)

## Unconditional Space Lower Bounds?

## Open Problem

Can log length factor be removed from results to yield unconditional space lower bounds?

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Again answer known to be "yes" for resolution
But [Beck, N. \& Tang '12] still has log factor for polynomial calculus
Underlying question: For how wide a family of proof systems do pebbling properties of graphs carry over to CNF size-space trade-offs?

## Take-Home Message

- Modern SAT solvers enormously successful in practice - key issue is to minimize time and memory consumption
- Modelled by proof size and space in proof complexity
- We show trade-offs indicating that simultaneous optimization impossible for well-known algebraic and geometric proof systems
- Future theoretical work: Understand size and space in these proof systems better
- Future practical work: Build efficient algebraic or geometric SAT solvers!


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## Thank you for your attention!

