

How Limited Interaction Hinders Real Communication (and What it Means for Proof and Circuit Complexity)

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joint work with Susanna F. de Rezende and Jakob Nordström

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When are SAT Solvers Not Good?

Proof complexity

- ▶ Examples of hard formulas... yes, we knew that
- ▶ Examples of easy formulas... but hard in practice!

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- ▶ Simulation results do not allow forgetting clauses
- ▶ This talk: aggressive memory minimization is dangerous

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- ▶ This talk: aggressive memory minimization is dangerous

Disclaimer

- ▶ Theoretical work, no experiments

Trade-offs

Question

Assume F has a proof in length L and *another* proof in space s .
Is there a proof in length $O(L)$ *and* space $O(s)$?

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No

- ▶ Studied for resolution, polynomial calculus, and a model of CDCL
[Ben Sasson, Nordström '11] [Beame, Beck, Impagliazzo '12] [Beck, Nordström, Tang '13]
[Elffers, Johannsen, Lauria, Magnard, Nordström, V '16]
- ▶ This talk: cutting planes

Cutting Planes

Work with inequalities

$$x \vee \bar{y} \quad \rightarrow \quad x + (1 - y) \geq 1 \quad \rightarrow \quad x - y \geq 0$$

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Rules

Variable axioms

$$\frac{}{x \geq 0} \quad \frac{}{-x \geq -1}$$

Addition

$$\frac{\sum a_i x_i \geq a \quad \sum b_i x_i \geq b}{\sum (a_i + b_i) x_i \geq a + b}$$

Division

$$\frac{\sum a_i x_i \geq a}{\sum (a_i/k) x_i \geq \lceil a/k \rceil}$$

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Goal: derive $0 \geq 1$

Complexity Measures

Size # bits in proof

- ▶ Size $2^{O(N)}$ always possible.

Length # lines in proof

- ▶ Worst case $2^{\Omega(N^\epsilon)}$. [Pudlák '97]

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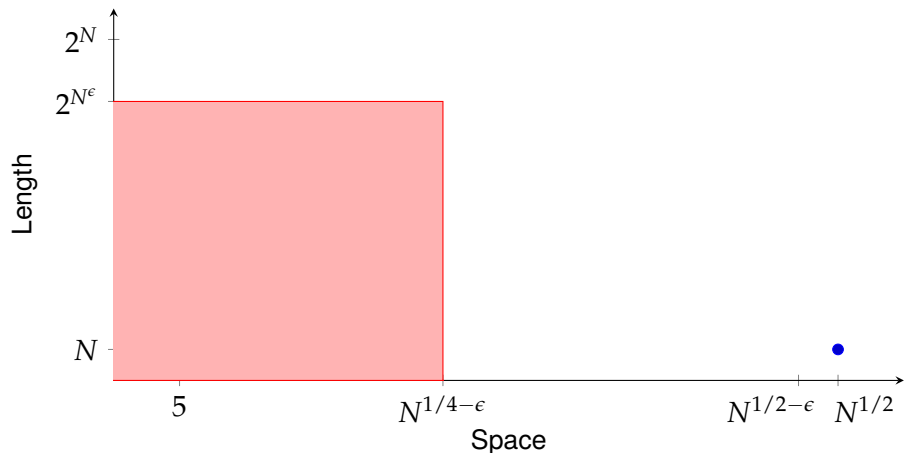
Total space max # bits in memory at the same time

- ▶ Space $O(N^2)$ always possible; worst case $\Omega(N)$.

Line space max # lines in memory at the same time

- ▶ Space 5 always possible. [Galesi, Pudlák, Thapen '15]

Trade-offs

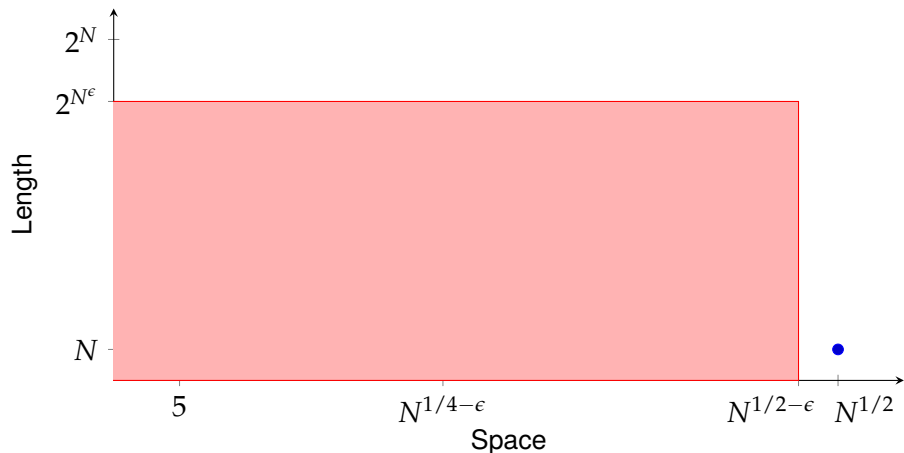


[Huynh, Nordström '12]

Can do length $O(N)$, space $N^{1/2}$.

But space $N^{1/4-\epsilon}$ requires size $\exp(N^{\epsilon-o(1)})$.

Trade-offs

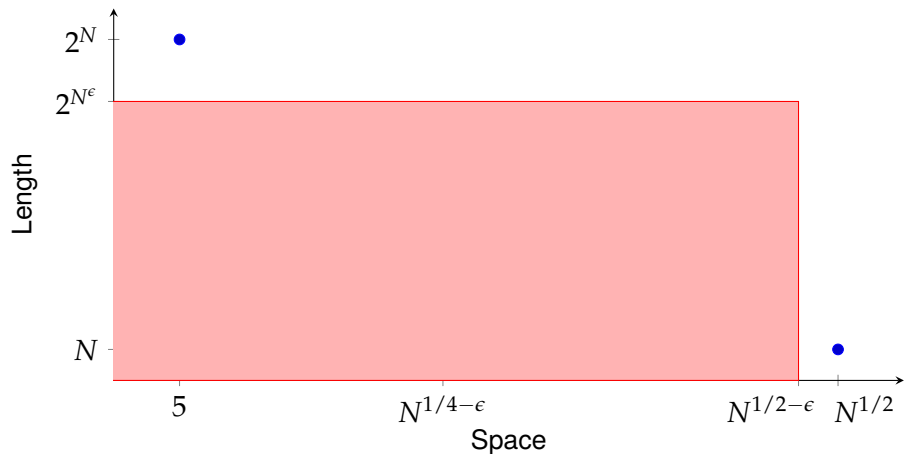


[Göös, Pitassi '14]

Can do length $N^{1+o(1)}$, space $N^{1/2+o(1)}$.

But space $N^{1/2-\epsilon}$ requires size $\exp(N^{\epsilon-o(1)})$.

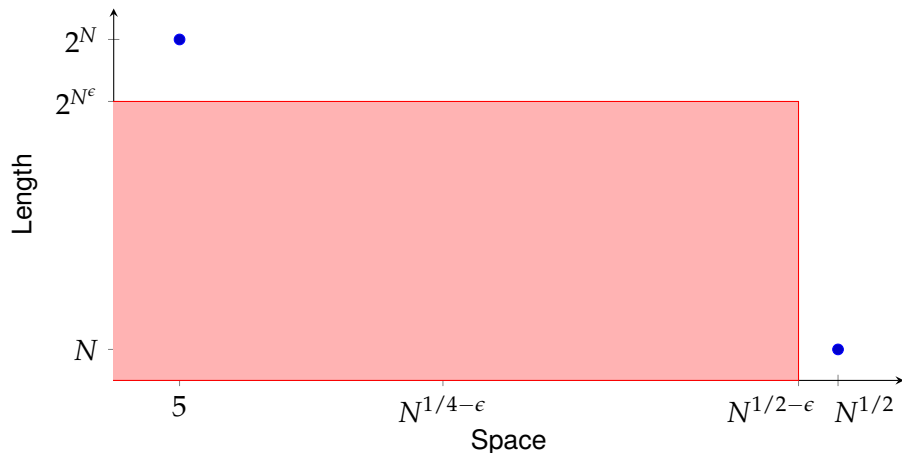
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[Galesi, Pudlák, Thapen '15]

Can do length 2^N , space 5 .

Trade-offs



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Can do length 2^N , space 5.

But exponential coefficients and quadratic total space.

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*Assume F has a proof in small total space with polynomial coefficients.
Are there still trade-offs?*

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This talk:

Yes

Main Result

Theorem

There is a family of 6-CNF formulas with

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- ▶ Upper bounds with constant coefficients, counting all bits.
- ▶ Lower bound with unbounded coefficients, only counting lines.
- ▶ Lower bound for semantic cutting planes.

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- ▶ Upper bounds with constant coefficients, counting all bits.
- ▶ Lower bound with unbounded coefficients, only counting lines.
- ▶ Lower bound for semantic cutting planes.
- ▶ Holds for resolution and polynomial calculus proof systems.

Spin-off

Exponential separation of the monotone-AC hierarchy

Theorem

There is a monotone Boolean function with

- ▶ *small monotone circuits: size $O(n)$, depth $\log^i(n)$, fan-in $n^{4/5}$*
- ▶ *but monotone circuits of depth $O(\log^{i-1} n)$ require size $\exp(\Omega(n^\epsilon))$.*

Superpolynomial separation known [Raz, McKenzie '97]

Devious Plan

Assume refutation in length L and space s

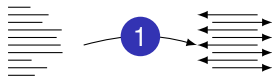


Devious Plan

Assume refutation in length L and space s



- 1 Communication protocol for falsified clause search problem

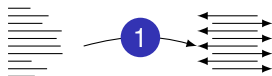


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1 Communication protocol for Search(F)



Devious Plan

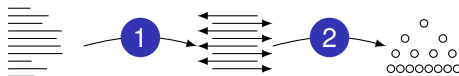
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1 Communication protocol for $\text{Search}(F)$



2 Parallel decision tree for $\text{Search}(F)$



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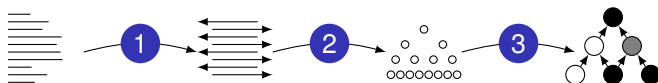
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3 Strategy for Dymond–Tomba pebble game



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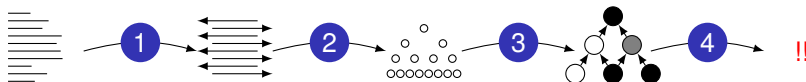
2 Parallel decision tree for $\text{Search}(F)$



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4 Construct graph with trade-offs



Devious Plan ①: Proof \rightarrow Protocol

Refutation in length L , space $s \rightarrow$

Protocol for Search(F) in $\log L$ rounds, communication $s \log L$

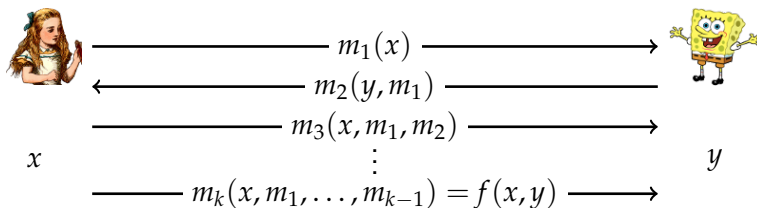
- ▶ Inspired by [Beame, Pitassi, Segerlind '05] [Beame, Huynh, Pitassi '10], explicit in [Huynh, Nordström '12].
- ▶ Key twists:
 - ▶ Real communication model
 - ▶ Measure number of rounds

Communication Complexity

 x $f(x, y)?$  y

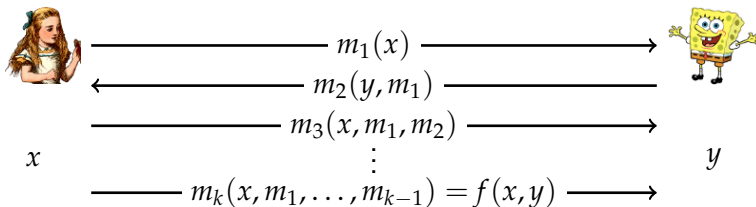
- ▶ Two parties compute $f(x, y)$
- ▶ Alice knows $x \in X$, Bob knows $y \in Y$

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- ▶ Two parties compute $f(x, y)$
- ▶ Alice knows $x \in X$, Bob knows $y \in Y$
- ▶ Communicate alternately
- ▶ Cost = # bits sent in worst case
- ▶ Rounds = # messages sent in worst case

Real Communication

Introduced in [Krajíček '98] to study cutting planes

- ▶ Compare real numbers at cost 1



Alice



Referee

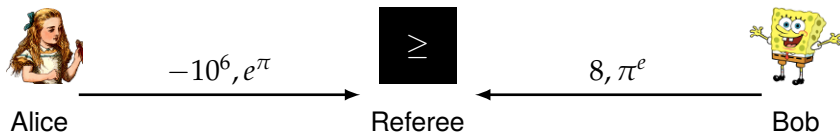


Bob

Real Communication

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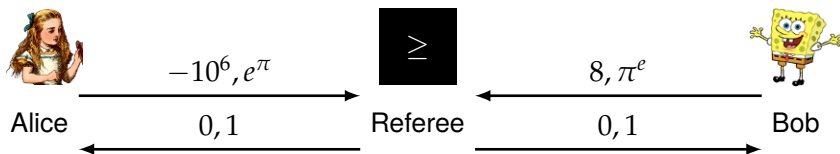
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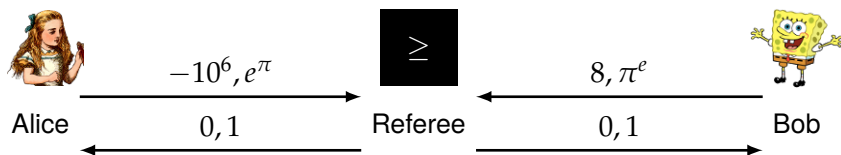
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Real Communication

Introduced in [Krajíček '98] to study cutting planes

- ▶ Compare real numbers at cost 1



- ▶ Simulates deterministic communication (Alice sends m , Bob sends $1/2$)
- ▶ Stronger than deterministic communication (EQ)

Devious Plan ①: Proof \rightarrow Protocol

Falsified clause search on CNF $F(x, y)$

- ▶ Alice \leftarrow assignment to x variables
- ▶ Bob \leftarrow assignment to y variables
- ▶ Task: Find falsified clause

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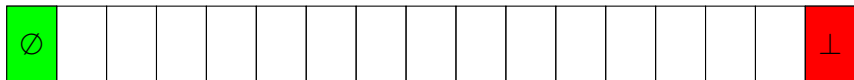
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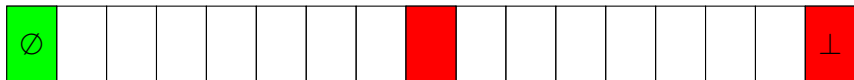


- ▶ Alice evaluates $\sum a_i x_i - a$ in s inequalities
- ▶ Bob evaluates $-\sum a_i y_i$ in s inequalities
- ▶ $\alpha(\mathbb{C}) = 1$ iff Referee answers 111...1

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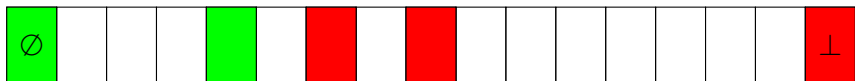
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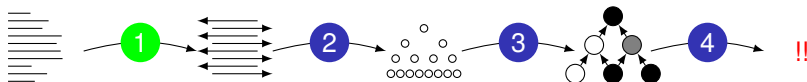


- ▶ $\alpha(\mathbb{C}) = 1 \quad \alpha(\mathbb{C} \cup \{A\}) = 0 \quad \Rightarrow \quad \alpha(A) = 0$
- ▶ $\log L$ rounds, communication $s \log L$

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Assume refutation in length L and space s

- 1 Communication protocol for $\text{Search}(F)$
in $\log L$ rounds and communication $s \log L$
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- 4 Construct graph with trade-offs



Devious Plan 2: Protocol \rightarrow Decision Tree

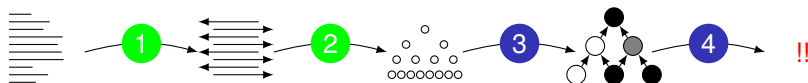
Protocol for $\text{Lift}(S)$ in r rounds, communication $c \rightarrow$
Parallel decision tree for S of depth r , c queries

- ▶ Main technical result (Simulation Theorem)
 - ▶ Technique from [Raz, McKenzie '97]
 - ▶ Adapted to real communication in [Bonet, Esteban, Galesi, Johannsen '98]
 - ▶ Connection to decision trees made explicit in [Göös, Pitassi, Watson '15]
- ▶ Our contribution
 - ▶ Introduce rounds
 - ▶ Adapt to real communication preserving rounds

Devious Plan

Assume refutation of **lifted** formula in length L and space s

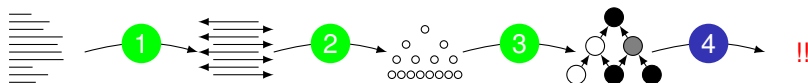
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Assume refutation of lifted **pebbling** formula in length L and space s

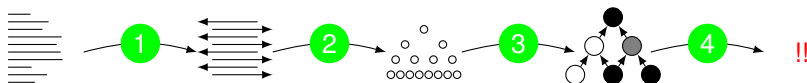
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- 3 Strategy for Dymond–Tompas pebble game for $\log L$ rounds and $s \log L$ pebbles [Chan '13]
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- 3 Strategy for Dymond–Tompkins pebble game for $\log L$ rounds and $s \log L$ pebbles
- 4 Construct graph where such strategy does not exist



Take Home

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- ▶ Smaller lift size
- ▶ Stronger models of communication

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Thanks!