

# Fast Simplifications for Tarski Formulas

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# Computing with real polynomial inequalities/equalities

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## Some kinds of questions we might want to answer

### SAT

Is  $S$  satisfiable?

Yes, for example at  
 $(-13/16, 1/4)$

### QE

Describe  $x$  s.t.  $\exists y[S]$

$$\begin{aligned} x + 1 &\geq 0 \wedge x + 4/9 \leq 0 \\ &\vee 17x^2 + 16x + 3 < 0 \\ &\vee x - 1 = 0 \end{aligned}$$

### Optimization

maximize  $\frac{xy-1}{x^2+y^2}$  over  $S$

$$(\sqrt{2} - 1)/2$$

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## Problems with symbolic methods:

- slow
- memory intensive

- sensitive to input presentation
- overly complex results

# Simplification of polynomial eq's and ineq's

**Kinds:** SAT is simplification; minimize w.r.t. to some metric; more explicit is simpler; "I know it when I see it"

**Prior Work:** Limited!

- Hong 1992
- Dolzhan & Sturm 1997
- Brown 1999

**My goal:** Simplify quickly! We need *algorithms* for simplifications that *can* be done quickly, and *proofs* for simplifications that can't.

**This paper:** Defines subclass of simplifications, provides efficient algorithms for some, and intractability proofs for others.

# Using propositional logic to simplify inequalities

$$\begin{aligned} & x^2 - 3xyz > 0 \wedge z^3y + x < 0 \wedge y^2z^2 - 2x + 1 > 0 \\ & \vee \\ & x^2 - 3xyz \leq 0 \wedge z^3y + x < 0 \wedge y^2z^2 - 2x + 1 > 0 \end{aligned}$$

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↓ simplify

$$B \wedge C$$



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$$A \wedge B \wedge C \vee \neg A \wedge B \wedge C$$

↓ simplify

$$B \wedge C$$

↓ map back

$$z^3y + x < 0 \wedge y^2z^2 - 2x + 1 > 0$$

# Using propositional logic to simplify inequalities (cont.)

## The good

- Satisfiability and simplification for propositional logic is well-studied; algorithms exist with good practical performance
- The inequalities are complete black boxes — time to check SAT or simplify is independent of degree, bit-size, and other metrics for size of the individual inequalities. No algebraic computations!

## The bad

- Deductions require repetitions of inequalities (or their negations)
- The inequalities are complete black boxes — cannot make deductions based on them.
- SAT is NP-Complete, Simplification is  $\Sigma_2^P$ -Complete.

# Big idea: map to the theory of “monomial inequalities”

$$(x + y)^3 x < 0 \quad \wedge \quad (x + y)^2 x (z^2 - 2xy) < 0 \quad \wedge \quad (x + y) x^5 (z^2 - 2xy) > 0$$

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$$x_1^3 x_2 < 0 \quad \wedge \quad x_1^2 x_2 x_3 < 0 \quad \wedge \quad x_1 x_2^5 x_3 > 0$$

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# Restriction to conjunctions of monomial inequalities

- Allowing disjunctions means our SAT problem is NP-Hard, and simplification is  $\Sigma_2^P$ -Hard.
- Expressiveness of conjunctions of monomial inequalities lies strictly between that of conjunctions of single-variable sign conditions and of arbitrary boolean combinations of sign-conditions.
  - $x > 0 \wedge y > 0 \vee x = 0$  cannot be expressed as a conjunction of monomial inequalities
  - $xy < 0$  cannot be expressed as a conjunction of single-variable sign conditions.
- Conjunction of monomial-inequalities is often a compact representation.
- Simplifications still useful for formulas with disjunction.

# Results for conjunctions of monomial inequalities

- Algorithm for SAT for conjunctions of monomial inequalities; runs in (low degree) polynomial time.
- Proof that simplification of conjunctions of monomial inequalities (minimizing sum of total-degrees) is NP-Hard (decision-problem variant is NP-Complete)
- Proof that simplifying a single monomial inequality  $p \sigma 0$  assuming some conjunction of monomial inequalities  $F$  holds is NP-Hard.
- Algorithm for determining all single-variable sign-conditions implied by a given conjunction of monomial inequalities; runs in (low degree) polynomial time.
- Algorithm for determining all equalities implied by a given conjunction of monomial inequalities; runs in (low degree) polynomial time.



## Restricting to strict monomial inequalities

Consider the following mapping from strict monomial inequalities in  $\{x_1, \dots, x_n\}$  and  $GF(2)^{n+1}$ :

$$\Gamma \left( \prod_{j=1}^n x_j^{d_j} \sigma 0 \right) = [B_1, \dots, B_{n+1}],$$

where  $B_j = d_j \bmod 2$ , for  $1 \leq j \leq n$ ,  
and  $B_{n+1} = 0$  if  $\sigma$  is  $>$  and  $1$  if  $\sigma$  is  $<$ .

Examples:

- $\Gamma(x_1 x_3 < 0) = [1, 0, 1, 1]$
- $\Gamma(x_1 x_3 > 0) = [1, 0, 1, 0]$
- $\Gamma(x_1^2 x_2^3 x_3 < 0) = [0, 1, 1, 1]$
- $\Gamma^{-1}([1, 0, 1, 1]) = x_1 x_3 < 0$
- $\Gamma^{-1}([0, 0, 0, 0]) = 1 > 0$
- $\Gamma^{-1}([0, 0, 0, 1]) = 1 < 0$

# Main theorem

**Theorem:** Let  $F = A_1 \wedge \dots \wedge A_m$ , where each  $A_i$  is a monomial inequality over  $\{x_1, \dots, x_n\}$ , and let  $b_i = \Gamma(A_i)$ . Assuming that  $F$  is satisfiable over  $\mathbb{R}$ ,

- ①  $[0, \dots, 0, 1] \notin \text{span}(b_1, \dots, b_m)$ , and
- ②  $b \in \text{span}(b_1, \dots, b_m)$  if and only if  $\forall x_1, \dots, x_n [F \Rightarrow \Gamma^{-1}(b)]$ .

**Corollary:**  $F$  is satisfiable over  $\mathbb{R}$  iff  $[0, \dots, 0, 1] \notin \text{span}(b_1, \dots, b_m)$ .

## Example application of main theorem

Is  $f = 87xy - 56xyz^2 - 62x^2z^3 + 97xy^3z - 73yz^4$  Hurwitz stable?

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Routh-Hurwitz criterion gives

$$\begin{aligned}
 & 73/62 x^2 y > 0 \wedge 3844x^3(3472x^2 + 7081y^3)y > 0 \wedge \\
 & 1/62 (3472x^2 + 7081y^3)^2 y x^2 (-336784y^3 x^2 - 686857y^6 + 334428x^3) > 0 \\
 & \wedge -1/87 (-336784y^3 x^2 - 686857y^6 + 334428x^3)((3472x^2 + 7081y^3)y) > 0
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Combinatorial part:  $x_1^2 x_2 > 0 \wedge x_1^3 x_2 x_3 > 0 \wedge x_3^2 x_2 x_1^2 x_4 > 0 \wedge x_2 x_3 x_4 < 0$

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$$x < 0 \wedge y > 0 \wedge 3472x^2 + 7081y^3 < 0 \wedge -336784y^3 x^2 - 686857y^6 + 334428x^3 > 0$$

# Main theorem and NP-Hardness of simplification

**Problem:** STRICT MONOMIAL INEQUALITY CONJUNCTION SIMPLIFICATION

**Instance:**  $F$ , a conjunction of strict monomial inequalities, and  $d$ , a non-negative integer.

**Question:** Is there a conjunction  $F'$  of strict monomial inequalities with sum-of-total-degrees  $\leq d$  such that  $F' \Leftrightarrow F$  under the assumption that all variables are non-zero?

# Main theorem and NP-Hardness of simplification

- Problem:** MINIMUM-DISTANCE  
**Instance:**  $m$   $n$ -dimensional vectors  $b_1, \dots, b_m$  over  $GF(2)$  and  $d$ , a non-negative integer.  
**Question:** Is there an element of the vector space spanned by  $b_1, \dots, b_n$  of Hamming weight at most  $d$ ?  
 (Proven NP-Complete in Vardy 1997)

↓ reduce to

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# Conclusion and Future Work

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- Paper extends algorithms to mixed strict/non-strict inequalities.
- Paper gives algorithm for deducing equations implied by conjunctions of monomial inequalities.

## Future Work

- Implement and combine with fast methods for making sign deductions (as in the example problem).
- Integrate with algorithms such as Weisspfenning's virtual term substitution or CAD to make deductions and simplifications during algorithm execution.
- Dealing with disjunction.