

# The Rewriting Approach to Decision Procedures

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- **Objective:** Decision procedures for automated verification
- **Desiderata:** Fast, expressive, easy to use, extend, integrate, prove sound and complete
- **Issues:**
  - Soundness and completeness proofs: usually involved (e.g. based on model theoretic arguments) and **ad hoc**
  - Combination of theories: usually done by combining procedures: often complex.
  - Implementation: usually from scratch: correctness, duplication of work, integration with other reasoning modules, ...

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# “Little” engines and “big” engines of proof

- “Little” engines, e.g., validity checkers for specific theories  
Built-in (decidable) theory, quantifier-free conjecture
- “Big” engines, e.g., general first-order theorem provers  
Any first-order (semi-decidable) theory, any conjecture
- Not an issue of size (e.g., lines of code) of systems!
- Continuity: e.g.,
  - “big” engines may have theories built-in and
  - “little” engines may support theory-independent reasoning component (e.g. for rewriting, dealing with quantifiers, ...)
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- **Combination of theories:** give union of presentations as input to the prover
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## 1 Motivation

## 2 Rewrite-based satisfiability

- A rewrite-based methodology for  $T$ -satisfiability
- A modularity theorem for combination of theories

## 3 Experimental appraisal

- Comparison of E with CVC and CVC Lite
- Synthetic benchmarks (valid and invalid): evaluate scalability
- “Real-world” problems

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## Trick: flattening

- Flatten terms by introducing “fresh” constants, e.g.

$$\begin{aligned}\{f(f(f(a))) = b\} &\rightsquigarrow \{f(a) = c_1, f(f(c_1)) = b\} \\ &\rightsquigarrow \{f(a) = c_1, f(c_1) = c_2, f(c_2) = b\} \\ \{g(h(d)) \neq a\} &\rightsquigarrow \{h(a) = c_1, g(c_1) \neq a\} \\ &\rightsquigarrow \{h(a) = c_1, g(c_1) = c_2, c_2 \neq a\}\end{aligned}$$

- **Exercise**: show that this transformation preserves satisfiability
- The number of constants introduced is equal to the number of sub-terms occurring in the input set of literals
- **Key observation**: after flattening, literals are “close” to literals built out of constants only... we need to take care of substitution in a very simple way...

# A (extended) set of inference rules for CSAT( $T_{UF}$ )

$$\text{CP} \quad \frac{c = c' \quad c = d}{c' = d} \quad \text{if } c \succ c' \text{ and } c \succ d$$

$$\text{Cong}_1 \quad \frac{c_j = c'_j \quad f(c_1, \dots, c_j, \dots, c_n) = c_{n+1}}{f(c_1, \dots, c'_j, \dots, c_n) = c_{n+1}} \quad \text{if } c_j \succ c'_j$$

$$\text{Cong}_2 \quad \frac{f(c_1, \dots, c_n) = c'_{n+1} \quad f(c_1, \dots, c_n) = c_{n+1}}{c_{n+1} = c'_{n+1}} \quad \text{if } c_{n+1} \succ c'_{n+1}$$

$$\text{DH} \quad \frac{c = c' \quad c \neq d}{c' \neq d} \quad \text{if } c \succ c' \text{ and } c \succ d$$

$$\text{UN} \quad \frac{c \neq c}{\square}$$

Notice that we **only need to compare constants!**

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# A decision procedure for CSAT(UF): summary

- 1 Flatten literals
- 2 Exhaustive application of the rules in the previous slide
- 3 if  $\square$  is derived, then return *unsatisfiable*
- 4 otherwise, return *satisfiable*

In the worst case, the complexity is quadratic in the number of sub-terms occurring in the input set of UF literals

**Exercise:** explain why.

You can do better (i.e.  $O(n \log n)$ ) by using a **dynamic** ordering over constants...

➔ [Bachmair, Tiwari, and Vigneron] for more on this point

# Outline

- 1 The constraint satisfiability problem for  $T_{UF}$
- 2 Deciding the constraint satisfiability problem for  $T_{UF}$ 
  - Equality as a graph
  - Convexity
  - Rewriting techniques for  $T_{UF}$
- 3 Superposition for extensions of  $T_{UF}$ 
  - The Superposition Calculus
  - A catalogue of theories
  - Limitations of the rewriting approach
- 4 References

# Can we extend the approach to other theories?

- Yes, but using more general concepts:
  - ▷ rewriting on arbitrary **terms** (not only constants)
  - ▷ considering arbitrary **clauses** since many interesting theories are axiomatized by formulae which are more complex than simple equalities or disequalities, e.g. the theory of arrays:

$$\begin{aligned} \text{read}(\text{write}(A, I, E), I) &= E \\ I = J \vee \text{read}(\text{write}(A, I, E), J) &= \text{read}(A, J) \end{aligned}$$

where  $A, I, J, E$  are implicitly universally quantified variables

# Our goal

- **Given**

- ▷ a presentation of a theory  $T$  extending UF  
(Notice that  $T$  is **not restricted** to equations!)

- **We want to derive**

- ▷ a satisfiability decision procedure capable of establishing whether  $S$  is  $T$ -satisfiable, i.e.  $S \cup T$  is satisfiable (where  $S$  is a set of *ground literals*)

# Our approach to the problem

- Based on the **rewriting approach**
  - ▷ uniform and simple
  - ▷ efficient alternative to the congruence closure approach
- **Tune** a general (off-the-shelf)  
*refutation complete superposition inference system*  
(from [Nieuwenhuis and Rubio]) in order to obtain  
*termination*  
on some interesting theories

# An overview of a rewriting approach

Our methodology consists of two steps: given an axiomatization  $Ax(T)$  of a theory  $T$  and a constraint  $S$  in  $T$

- 1 flatten all the literals in  $S$  (by extending the signature introducing “fresh” constants)  
    ➡ recall that this preserves satisfiability
- 2 exhaustively apply the rules of the **superposition calculus**

# Expansion rules of $\mathcal{SP}$ (I)

Name	Rule	Conditions
<i>Sup.</i>	$\frac{\Gamma \rightarrow \Delta, l[u'] = r \quad \Pi \rightarrow \Sigma, u = v}{\Gamma, \Pi \rightarrow \Delta, \Sigma, l[v] = r}$	$u \not\leq v, l[u'] \not\leq r, *$
<i>Par.</i>	$\frac{\Gamma, l[u'] = r \rightarrow \Delta \quad \Pi \rightarrow \Sigma, u = v}{l[v] = r, \Gamma, \Pi \rightarrow \Delta, \Sigma}$	$u \not\leq v, l[u'] \not\leq r, *$
<i>Ref.</i>	$\frac{\Gamma, u' = u \rightarrow \Delta}{\Gamma \rightarrow \Delta}$	$(u' = u) \not\leq (\Gamma \cup \Delta)$
<i>Fac.</i>	$\frac{\Gamma \rightarrow \Delta, u = v, u' = v'}{\Gamma, v = v' \rightarrow \Delta, u = v'}$	$u \not\leq v, u \not\leq \Gamma, (u = v) \not\leq \{u' = v'\} \cup \Delta$

\*  $(u = v) \not\leq (\Pi \cup \Sigma), (l[u'] = r) \not\leq (\Gamma \cup \Delta)$

\*\*  $\sigma = mgu(u, u')$  implicitly applied to consequents and conditions

## Contraction rules of $\mathcal{SP}$ (II)

Name	Rule	Conditions
<i>Subsumption</i>	$\frac{S \cup \{C, C'\}}{S \cup \{C\}}$	for some $\theta$ , $\theta(C) \subseteq C'$ , and for no $\rho$ , $\rho(C') = C$
<i>Simplification</i>	$\frac{S \cup \{C[\theta(l)], l = r\}}{S \cup \{C[\theta(r)], l = r\}}$	$\theta(l) \succ \theta(r)$ , $C[\theta(l)] \succ$ $(\theta(l) = \theta(r))$
<i>Deletion</i>	$\frac{S \cup \{\Gamma \rightarrow \Delta, t = t\}}{S}$	

# Orderings

- Requirement:  $f(c_1, \dots, c_n) \succ c_0$

for each non-constant symbol  $f$  and constant  $c_i$  ( $i = 0, 1, \dots, n$ )

- [Definition:]  $(a = b) \succ (c = d)$  iff  $\{a, b\} \succneq \{c, d\}$

(where  $\succneq$  is the multiset extension of  $\succ$  on terms)

- multisets of literals are compared by the multiset extension of  $\succ$  on literals
- clauses are considered as multisets of literals
- **Intuition:** the ordering  $\succ$  is such that only maximal sides of maximal instances of literals are involved in inferences

# Refutation Completeness

- The **exhaustive** and **fair** application of the rules of the superposition calculus allows us to detect unsatisfiability in a finite amount of time!
- Problem: for which theories do we have finite (fair) derivations?

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- Problem: **for which theories do we have finite (fair) derivations?**

## Example: $\mathcal{SP}$ on lists (I)

- Consider the following (simplified) theory of lists

$$Ax(\mathcal{L}) := \{\text{car}(\text{cons}(X, Y)) = X, \text{cdr}(\text{cons}(X, Y)) = Y\}$$

- Recall that a literal in  $S$  has one of the four possible forms: (a)  $\text{car}(c) = d$ , (b)  $\text{cdr}(c) = d$ , (c)  $\text{cons}(c_1, c_2) = d$ , and (d)  $c \neq d$ .
- There are three cases to consider:
  1. inferences between two clauses in  $S$
  2. inferences between two clauses in  $Ax(\mathcal{L})$
  3. inferences between a clause in  $Ax(\mathcal{L})$  and a clause in  $S$

## Example: $\mathcal{SP}$ on lists (II)

- Case 1: inferences between two clauses in  $S$

It has already been considered when considering equality only (please, **keep in mind this point**)

- Case 2: inferences between two clauses in  $Ax(\mathcal{L})$

This is not very interesting since there are no possible inferences between the two axioms in  $Ax(\mathcal{L})$

- Case 3: inferences between a clause in  $Ax(\mathcal{L})$  and a clause in  $S$

▷ a superposition between  $\text{car}(\text{cons}(X, Y)) = X$  and  $\text{cons}(c_1, c_2) = d$  yielding  $\text{car}(d) = c_1$  and

▷ a superposition between  $\text{cdr}(\text{cons}(X, Y)) = Y$  and  $\text{cons}(c_1, c_2) = d$  yielding  $\text{cdr}(d) = c_2$

## Example: $\mathcal{SP}$ on lists (III)

- We are almost done, it is sufficient to notice that
  - ▷ only finitely many equalities of the form (a) and (b) can be generated this way out of a set of clauses built on a finite signature
  - ▷ so, we are entitled to conclude that  $\mathcal{SP}$  can only generate finitely many clauses on set of clauses of the form  $Ax(\mathcal{L}) \cup S$
- A decision procedure for the satisfiability problem of  $\mathcal{L}$  can be built by simply using  $\mathcal{SP}$  after flattening the input set of literals

## Theory of lists: some remarks

- Recall that in the proof of termination of  $\mathcal{SP}$  on  $Ax(\mathcal{L}) \cup S$ , we have observed that inferences between clauses in  $S$  were already considered for the ground case
- So, if we consider a signature  $\Sigma := \{\text{cons}, \text{car}, \text{cdr}\} \cup \Sigma_{UF}$ , where  $\Sigma_{UF}$  is a finite set of function symbols, the proof of termination above continues to hold
- In other words, we are capable of solving the satisfiability problem for  $\mathcal{L} \cup T_{UF} \cup S$ , where  $S$  is a set of ground literals built out of the **interpreted** function symbols  $\text{cons}$ ,  $\text{car}$ ,  $\text{cdr}$  and arbitrary **uninterpreted** function symbols
- The above holds for all satisfiability procedure built by the rewriting approach described here

## Rewriting-based dec proc for lists: **summary**

- Analysis of the possible inferences in  $\mathcal{SP}$

### Lemma

*Let  $S$  be a finite set of flat  $\Sigma_{\mathcal{L}}$ -literals. The clauses occurring in the saturations of  $S \cup Ax(\mathcal{L})$  by  $\mathcal{SP}$  can only be the empty clause, ground flat literals, or the equalities in  $Ax(\mathcal{L})$ .*

- Termination follows

### Lemma

*Let  $S$  be a finite set of flat  $\Sigma_{\mathcal{L}}$ -literals. All the saturations of  $S \cup Ax(\mathcal{L})$  by  $\mathcal{SP}$  are finite.*

- From termination, fairness, and refutation completeness...

### Theorem

*$\mathcal{SP}$  is a decision procedure for  $\mathcal{L}$ .*

## A rewriting approach: theories of **lists**

- Theory of uninterpreted functions:  $\Sigma_{UF} :=$  finite set of function symbols,  $Ax(UF) := \emptyset$
- Theory of lists *à la* Shostak:  $\Sigma_{\mathcal{L}_{Sh}} := \{\text{cons}, \text{car}, \text{cdr}\} \cup \Sigma_{UF}$ ,

$$Ax(\mathcal{L}_{Sh}) := \{\text{car}(\text{cons}(X, Y)) = X, \text{cdr}(\text{cons}(X, Y)) = Y, \\ \text{cons}(\text{car}(X), \text{cdr}(X)) = X\}$$

- Theory of lists *à la* Nelson-Oppen:  
 $\Sigma_{\mathcal{L}_{NO}} := \{\text{cons}, \text{car}, \text{cdr}, \text{atom}\} \cup \Sigma_{UF}$ ,

$$Ax(\mathcal{L}_{NO}) := \{\text{car}(\text{cons}(X, Y)) = X, \text{cdr}(\text{cons}(X, Y)) = Y, \\ \neg \text{atom}(\text{cons}(X, Y)) \\ \text{atom}(X) \vee \text{cons}(\text{car}(X), \text{cdr}(X)) = X\}$$

# A rewriting approach: theories of **arrays**

- arrays w/ extensionality:  $\Sigma_{\mathcal{A}^s} := \{\text{rd}, \text{wr}\} \cup \Sigma_{UF}$ ,

$$Ax(\mathcal{A}^s) := \left\{ \begin{array}{l} \text{rd}(\text{wr}(A, I, E), I) = E \\ I = J \vee \text{rd}(\text{wr}(A, I, E), J) = \text{rd}(A, J) \end{array} \right\}$$

$$Ax(\mathcal{A}_e^s) := Ax(\mathcal{A}^s) \cup \{\forall A, B. (\forall I. (\text{rd}(A, I) = \text{rd}(B, I)) \implies A = B)\}$$

# A rewriting approach: theories of **records**

- records w/ extensionality:  $\Sigma_{\mathcal{R}^s} := \{\text{rsel}_i, \text{rst}_i \mid i = 1, \dots, n\} \cup \Sigma_{UF}$ ,

$$\text{Ax}(\mathcal{R}^s) := \left\{ \begin{array}{ll} \text{rsel}_i(\text{rst}_i(X, V)) = V & \text{for all } i, 1 \leq i \leq n \\ \text{rsel}_j(\text{rst}_i(X, V)) = \text{rsel}_j(X) & \text{for all } i, j, 1 \leq i \neq j \leq n \end{array} \right\}$$

$$\text{Ax}(\mathcal{R}_e^s) := \text{Ax}(\mathcal{A}^s) \cup \left\{ \forall X, Y. \left( \bigwedge_{i=1}^n \text{rsel}_i(X) = \text{rsel}_i(Y) \implies X = Y \right) \right\}$$

# A rewriting approach: small fragments of Arithmetics

- Integer Offsets:  $\Sigma_{\mathcal{I}} := \{\text{succ}, \text{prec}\} \cup \Sigma_{UF}$ ,

$$Ax(\mathcal{I}) := \left\{ \begin{array}{l} \text{succ}(\text{prec}(X)) = X, \text{prec}(\text{succ}(X)) = X, \\ \underbrace{\text{succ}^i(X) \neq X}_{\text{acyclicity}} \end{array} \right. \text{ for } i > 0$$

where  $\text{succ}^1(x) = \text{succ}(x)$ ,  $\text{succ}^{i+1}(x) = \text{succ}(\text{succ}^i(x))$  for  $i \geq 1$

- Integer Offsets Modulo:  $\Sigma_{\mathcal{I}_k} := \{\text{succ}, \text{prec}\} \cup \Sigma_{UF}$ ,

$$Ax(\mathcal{I}_k) := \left\{ \begin{array}{l} \text{succ}(\text{prec}(X)) = X, \text{prec}(\text{succ}(X)) = X, \\ \underbrace{\text{succ}^i(X) \neq X}_{k\text{-acyclicity}} \text{ for } 1 \leq i \leq k-1 \\ \text{succ}^k(X) = X \end{array} \right.$$

# Rewrite-based methodology for $T$ -satisfiability

- **$T$ -satisfiability**: decide satisfiability of set  $S$  of ground literals in theory  $T$
  - **Methodology**:
    - **$T$ -reduction**: apply inferences (e.g., to remove certain literals or symbols) to get equisatisfiable  **$T$ -reduced** problem
    - **Flattening**: flatten all ground literals (by introducing new constants) to get equisatisfiable  **$T$ -reduced flat** problem
    - **Ordering selection and termination**: select a CSD  $\succ$  and prove that any fair  $SP_{\succ}$ -strategy terminates when applied to a  **$T$ -reduced flat** problem. We call  **$T$ -good** any such  $\succ$ .
  - Everything **fully automated** except for termination proof
- 1 A. Armando, S. Ranise, M. Rusinowitch. **Uniform Derivation of Decision Procedures by Superposition**. In the Proceedings on the Annual Conference on Computer Science Logic (CSL01), Paris, France, 10-13 September 2001, pp. 513-527.
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    - **Flattening**: flatten all ground literals (by introducing new constants) to get equisatisfiable  $T$ -reduced **flat** problem
    - **Ordering selection and termination**: select a CSO  $\succ$  and prove that any fair  $SP_{\succ}$ -strategy terminates when applied to a  $T$ -reduced flat problem. We call  **$T$ -good** any such  $\succ$ .
  - Everything **fully automated** except for termination proof
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# Rewrite-based methodology for $T$ -satisfiability

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- **EUF**, **lists**, **arrays** with and without extensionality, **sets** with extensionality [Armando, Ranise, Rusinowitch 2003]
- **Records** with and without extensionality, **integer offsets**, **integer offsets modulo** [Armando, Bonacina, Ranise, Schulz 2005]
- **Theory of inductively defined data structures** [Bonacina, Echenim 2006]

## 1 Motivation

## 2 Rewrite-based satisfiability

- A rewrite-based methodology for  $T$ -satisfiability
- A modularity theorem for combination of theories

## 3 Experimental appraisal

- Comparison of E with CVC and CVC Lite
- Synthetic benchmarks (valid and invalid): evaluate scalability
- “Real-world” problems

**Question:** If  $\mathcal{SP}$  terminates on  $\mathcal{T}_i$ -sat problems, then does it terminate on  $\mathcal{T}$ -sat problems with  $\mathcal{T} = \bigcup_{i=1}^n \mathcal{T}_i$ ?

- $\mathcal{T}_i$ -reduction and flattening apply as for each theory
- Termination?

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**Theorem** [Armando, Bonacina, Ranise, Schulz 2005]: If

- No shared function symbol (shared constants allowed),
- Variable-inactive presentations  $\mathcal{T}_i$ ,  $1 \leq i \leq n$  (no max literal in a ground instance of a clause is instance of an equation  $t \simeq x$  where  $x \notin \text{Var}(t)$ ); it disables *Superpos* from variables across theories.
- Fair  $\mathcal{T}_i$ -good  $\mathcal{SP}_{\succ}$ -strategy is satisfiability procedure for  $\mathcal{T}_i$ ,

then

a fair  $\mathcal{T}$ -good  $\mathcal{SP}_{\succ}$ -strategy is a satisfiability procedure for  $\mathcal{T}$ .

EUF, **arrays** (with or without extensionality), **records** (with or without extensionality), **integer offsets** and **integer offsets modulo**, all satisfy these hypotheses.

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- Three systems:
  - The E theorem prover: E 0.82 [Schulz 2002]
  - CVC 1.0a [Stump, Barrett and Dill 2002]
  - CVC Lite Lite 1.1.0 [Barrett and Berezin 2004]
- Two very simple strategies for E: **E(good-lpo)** and **E(std-kbo)**
- Benchmarks:
  - Parametric synthetic problems
  - “Real world” problems from UCLID
- 3.00GHz 512MB RAM Pentium 4 PC: max 150 sec and 256 MB per run

## Theory of arrays with extensionality

$$\begin{aligned} & \forall x, z, v. \text{select}(\text{store}(x, z, v), z) \simeq v \\ & \forall x, z, w, v. (z \neq w \supset \text{select}(\text{store}(x, z, v), w) \simeq \text{select}(x, w)) \\ & \forall x, y. (\forall z. \text{select}(x, z) \simeq \text{select}(y, z) \supset x \simeq y) \end{aligned}$$

where  $x$  and  $y$  have sort ARRAY,  
 $z$  has sort INDEX, and  
 $v$  has sort ELEM.

**$\mathcal{A}$ -reduction**: eliminate disequalities between arrays by resolution with extensionality.

**$\mathcal{A}$ -good**:  $t \succ c$  for all ground compound terms  $t$  and constants  $c + a \succ e \succ j$ , for all constants  $a$  of sort ARRAY,  $e$  of sort ELEM and  $j$  of sort INDEX.

**Termination**: case analysis of generated clauses (CSO plays key role).

**Theorem**: A fair  $\mathcal{A}$ -good  $\mathcal{SP}_{\succ}$ -strategy is a satisfiability procedure for the theories of arrays and arrays with extensionality.

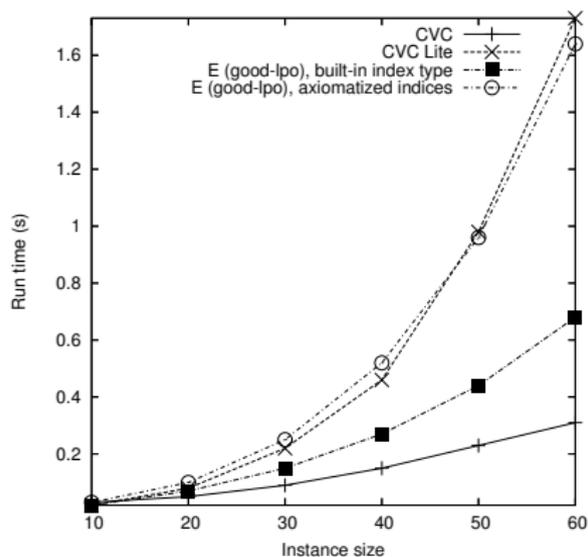
Parametric problem instances to assess scalability.

- $\text{STORECOMM}(n)$ . Encodes the fact that the result of storing a set of elements in different positions within an array is not affected by the relative order of the store operations.
- $\text{SWAP}(n)$ . Encodes the fact that swapping an element at position  $i_1$  with an element at position  $i_2$  is equivalent to swapping the element at position  $i_2$  with the element at position  $i_1$ .
- $\text{STOREINV}(n)$ . Encodes the fact that if the arrays resulting from exchanging elements of an array  $a$  with the elements of an array  $b$  occurring in the same positions are equal, then  $a$  and  $b$  must have been equal to begin with.

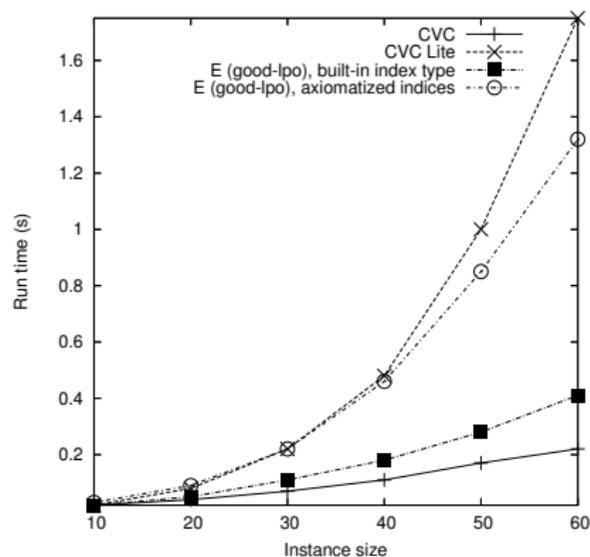
Both valid and invalid instances generated.

# Performances on STORECOMM( $n$ ) instances

## valid instances



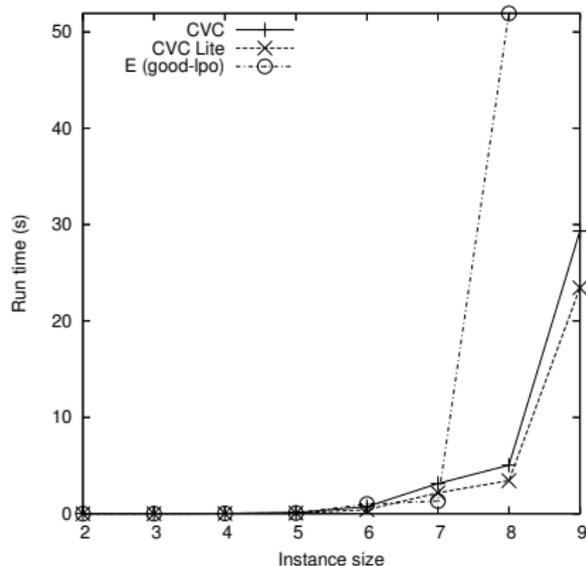
## invalid instances



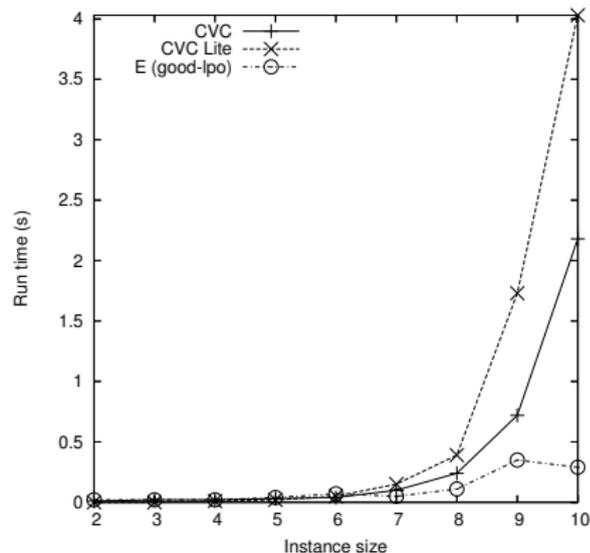
CVC wins but E better than CVC Lite

# Performances on $SWAP(n)$ instances

## valid instances

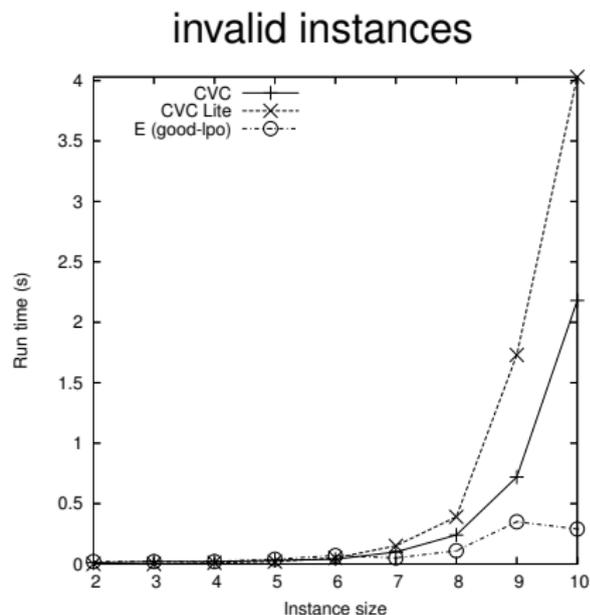
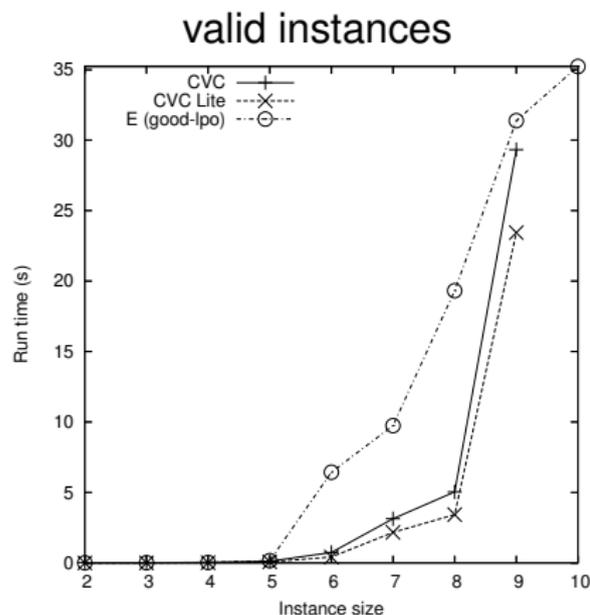


## invalid instances



CVC and CVC Light win on valid instances, E wins on invalid ones.

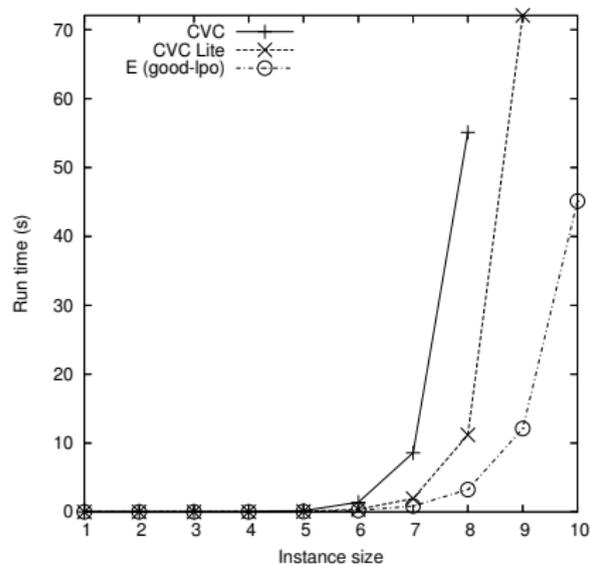
# Performances on $SWAP(n)$ instances



CVC and CVC Light win on valid instances, E wins on invalid ones.  
The situation improves by **adding a lemma to E**.

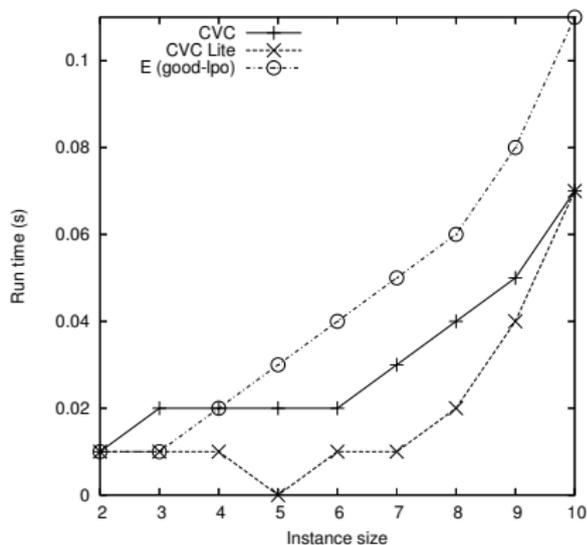
# Performances on STOREINV( $n$ ) instances

## valid instances



**E(std-kbo)** does it in **nearly constant time!**

## invalid instances



Not as good for E but run times are minimal

# Integer offsets: presentation

A fragment of the theory of the integers:

s: successor

p: predecessor

## Theory of integer offsets

$$\forall x. \quad s(p(x)) \simeq x$$

$$\forall x. \quad p(s(x)) \simeq x$$

$$\forall x. \quad s^i(x) \not\simeq x \quad \text{for } i > 0$$

Infinitely many **acyclicity axioms!**

## $\mathcal{I}$ -reduction:

- eliminate  $p$  by replacing  $p(c) \simeq d$  with  $c \simeq s(d)$ :  
first two axioms no longer needed.
- Bound the number of acyclicity axioms:  
 $\forall x. s^i(x) \neq x$  for  $0 < i \leq n + 1$   
if there are  $n$  occurrences of  $s$  in the conjecture.

$\mathcal{I}$ -good: any CSO.

**Termination:** case analysis of generated clauses.

**Theorem:** A fair  $\mathcal{SP}_{\prec}$ -strategy is a satisfiability procedure for the theory of integer offsets.

# Benchmarks for integer offsets

$IOS(n)$ : needs combination of theories of arrays and integer offsets.

	Theories	
	arrays	ios
STORECOMM, SWAP, STOREINV	•	
IOS	•	•

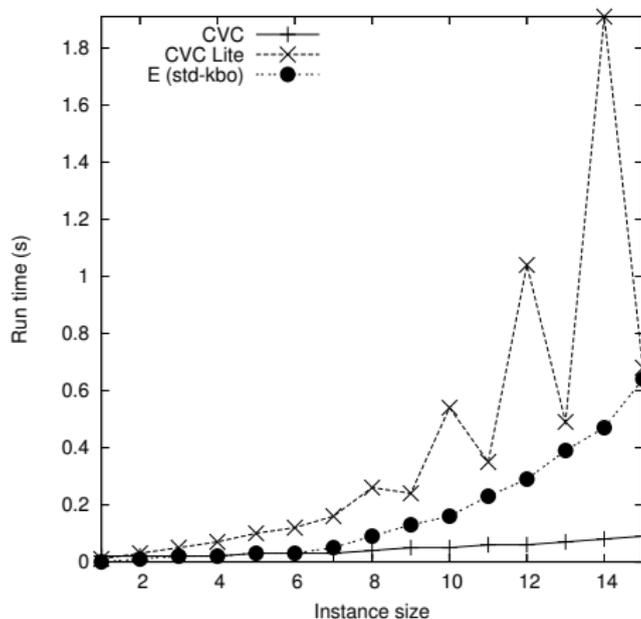
Based on the following observation:

```
for (k=1; k<=n; k++)  
  a[i+k]=a[i]+k;
```

```
for (k=1; k<=n; k++)  
  a[i+n-k]=a[i+n]-k;
```

If the execution of either fragment produces the same result in the array  $a$ , then  $a[i+n]==a[i]+n$  must hold initially for any value of  $i$ ,  $k$ ,  $a$ , and  $n$ .

# Performances on IOS instances



CVC and CVC Lite have built-in  $\mathcal{LA}(\mathcal{R})$  and  $\mathcal{LA}(\mathcal{I})$  respectively!

Sort  $\text{REC}(id_1 : T_1, \dots, id_n : T_n)$

## Theory of records

$$\begin{aligned}\forall x, v. \quad & \text{rselect}_i(\text{rstore}_i(x, v)) \simeq v & 1 \leq i \leq n \\ \forall x, v. \quad & \text{rselect}_j(\text{rstore}_i(x, v)) \simeq \text{rselect}_j(x) & 1 \leq i \neq j \leq n \\ \forall x, y. \quad & (\bigwedge_{i=1}^n \text{rselect}_i(x) \simeq \text{rselect}_i(y)) \supset x \simeq y\end{aligned}$$

where  $x, y$  have sort  $\text{REC}$  and  $v$  has sort  $T_j$ .

**$\mathcal{R}$ -reduction**: eliminate disequalities between records by resolution with extensionality + splitting.

**$\mathcal{R}$ -good**:  $t \succ c$  for all ground compound terms  $t$  and constants  $c$ .

**Termination**: case analysis of generated clauses (CSO plays key role).

**Theorem**: A fair  $\mathcal{R}$ -good  $\mathcal{SP}_{\succ}$ -strategy is a satisfiability procedure for the theories of records and records with extensionality.

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Queues can be defined on top a combination of theories of arrays, records and integer offsets:

	Theories		
	arrays	ios	records
STORECOMM, SWAP, STOREINV	•		
IOS	•	•	
QUEUE	•	•	•

$$\text{enqueue}(v, x) = \text{rstore}_t(\text{rstore}_i(x, \text{store}(\text{rselect}_i(x), \text{rselect}_t(x), v)), \text{s}(\text{rselect}_t(x))))$$

$$\text{dequeue}(x) = \text{rstore}_h(x, \text{s}(\text{rselect}_h(x)))$$

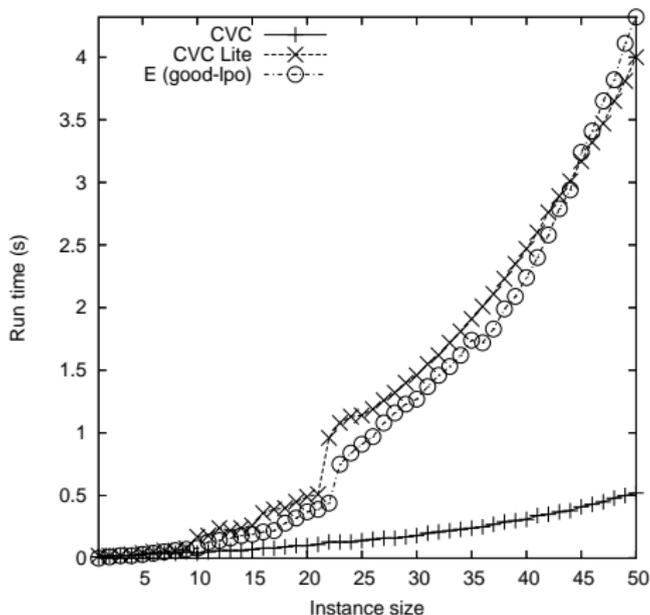
$$\text{first}(x) = \text{select}(\text{rselect}_i(x), \text{rselect}_h(x))$$

$$\text{last}(x) = \text{select}(\text{rselect}_i(x), \text{p}(\text{rselect}_t(x)))$$

$$\text{reset}(x) = \text{rstore}_h(x, \text{rselect}_t(x))$$

$\text{QUEUE}(n)$  expresses the property that if  $q \in \text{QUEUE}$  is obtained from a properly initialized queue by adding elements  $e_0, e_1, \dots, e_n$ , for  $n > 0$ , and performing  $0 \leq m \leq n$  dequeue operations then  $\text{first}(q) = e_m$ .

# Performances on `QUEUE` instances



CVC wins (built-in arithmetic!) but E matches CVC Lite

To reason with indices ranging over the integers mod  $k$  ( $k > 0$ ):

## Theory of integer offsets modulo

$$\forall x. \quad s(p(x)) \simeq x$$

$$\forall x. \quad p(s(x)) \simeq x$$

$$\forall x. \quad s^i(x) \not\simeq x \quad 1 \leq i \leq k - 1$$

$$\forall x. \quad s^k(x) \simeq x$$

Finitely many axioms.

**$\mathcal{I}$ -reduction**: same as above.

**$\mathcal{I}$ -good**: any CSO.

**Termination**: case analysis of generated clauses.

**Theorem**: A fair  $\mathcal{SP}_{\succ}$ -strategy is a satisfiability procedure for the theory of integer offsets modulo.

Termination also without  $\mathcal{I}$ -reduction.

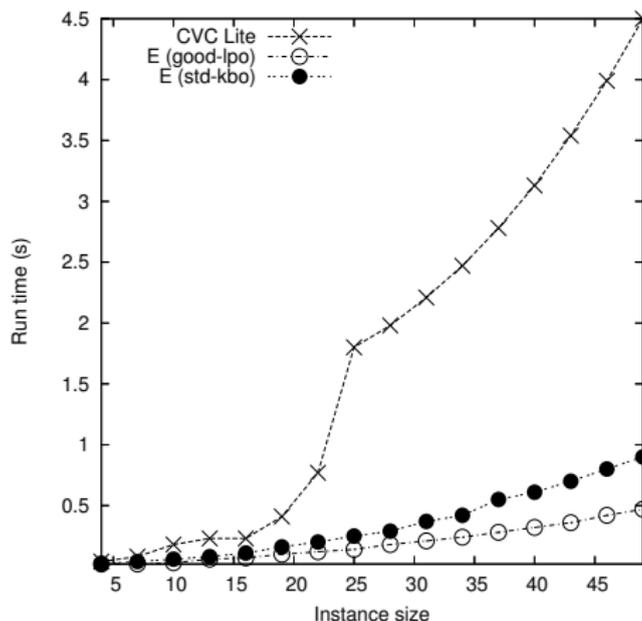
# Benchmarks for circular queues

$\text{CIRCULAR\_QUEUE}(n, k)$  as  $\text{QUEUE}(n, k)$  but with integer offsets modulo  $k$ .

	Theories			
	arrays	ios	records	mod_ios
STORECOMM, SWAP, STOREINV	•			
IOS	•	•		
QUEUE	•	•	•	
CIRCULAR_QUEUE	•	•		•

# Performances on `CIRCULAR_QUEUE( $n, k$ )` instances

$k = 3$



CVC does not handle integers mod  $k$ , E clearly wins

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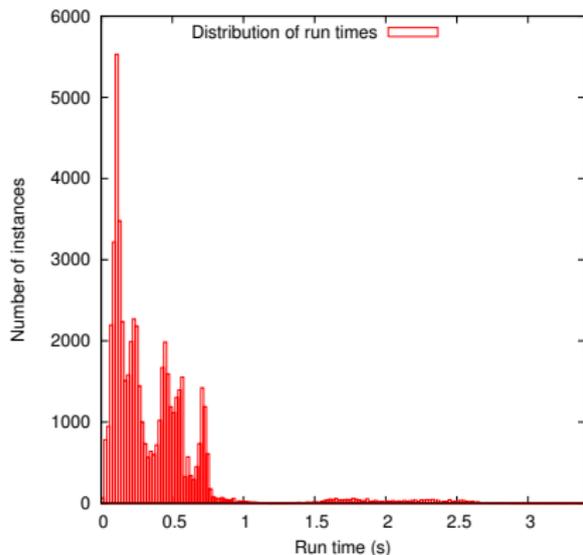
# “Real-world” problems

- UCLID [Bryant, Lahiri, Seshia 2002]: suite of problems
- haRVey [Déharbe and Ranise 2003]: extract  $T$ -sat problems
- over 55,000 proof tasks: integer offsets and equality
- all valid

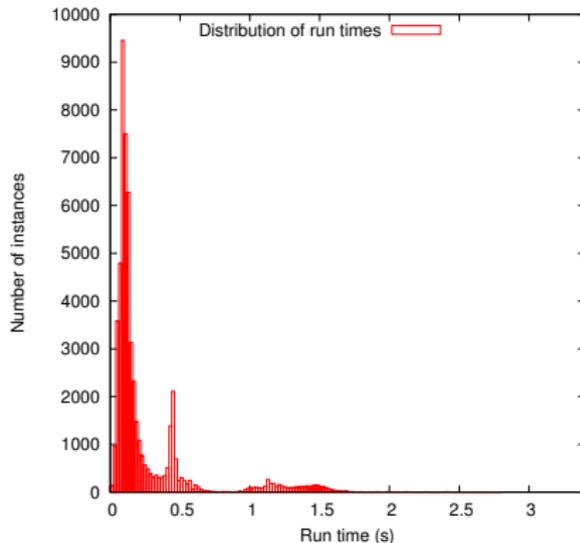
	Theories				
	arrays	ios	records	mod_ios	euf
STORECOMM, SWAP, STOREINV	•				
IOS	•	•			
QUEUE	•	•	•		
CIRCULAR_QUEUE	•	•		•	
UCLID		•			•

Test performance on huge sets of literals.

E in auto mode



E with **optimized strategy** found by testing on random sample of 500 problems (less than 1%)



- General methodology for rewrite-based  $T$ -sat procedures and its application to several theories of data structures
- Modularity theorem for combination of theories
- Experiments: first-order prover
  - **taken essentially off the shelf** and
  - conceived for very different search problemscompares surprisingly well with state-of-the-art verification tools