

# General theorem proving for satisfiability modulo theories: an overview

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## Motivation

## Some reasoning methods/strengths

## General TP for SMT: our results

- Termination results for  $\mathcal{T}$ -satisfiability problems

- Modularity of termination for combination of theories

- Experiments with  $\mathcal{T}$ -satisfiability problems

- Decomposition: unite FOL $_{+=}$  and SMT strengths

## Discussion

# Motivation

- ▶ Software is everywhere
- ▶ Needed: *Reliability*
- ▶ Difficult goal: Software may be
  - ▶ Artful
  - ▶ Complex
  - ▶ Huge
  - ▶ Varied
  - ▶ Old (and undocumented)
  - ▶ ... possibly reflecting some “natural” laws of computing?
  - ▶ ...
- ▶ Software/hardware border: blurred, evolving

# Some approaches to software reliability

- ▶ Testing (test case generation ...)
- ▶ Programmer assistants
- ▶ Program analyzers
- ▶ Static analysis (types, extended static checking, abstract interpretations ...)
- ▶ Dynamic analysis (traces ...)
- ▶ Software model checkers (+ theorem proving, e.g., BMC, CEGAR-SMC)
- ▶ ...

*Reasoning* about software

# Reasoning about software

- ▶ Help find and remove bugs
- ▶ Find and remove bugs
- ▶ Prove a program free of certain bugs
- ▶ Prove a program correct

# Systems with reasoning about software

Typical architecture:

- ▶ *Front-end*: interface, problem modelling, compiling
- ▶ *Back-end*: problem solving by reasoning engine

Focus of this talk: **the reasoning engine**

Reasoning: theorem proving, model building

# Problems for the back-end reasoner

- ▶ From programs to formulæ (via specifications, annotations ...)
- ▶ Formula:  $H \supset \varphi$
- ▶ Problems: determine whether
  - ▶  $H \supset \varphi$  is *valid*, i.e.  
 $H \models \varphi$ , i.e.  
 $H \cup \{\neg\varphi\}$  is *unsatisfiable*  
by giving refutation (proof): *theorem proving*;
  - ▶ or  $H \cup \{\neg\varphi\}$  is *satisfiable*, i.e.  
 $H \supset \varphi$  is *not valid*  
by giving model (counter-model): *model building*

# Ingredients of formulæ

- ▶ Propositional logic (PL):  $\forall, \neg, \wedge$
- ▶ Equality:  $\simeq, \not\simeq, a, b, c, \dots, f, g, h, \dots$
- ▶ First-order theories, e.g.:
  - ▶ Theories of *data structures*, e.g.:
    - ▶ Lists
    - ▶ Recursive data structures (with constructors and selectors)
    - ▶ Arrays
    - ▶ Records
    - ▶ Bitvectors
  - ▶ Linear arithmetic:  $\leq, +, -, \dots - 2, -1, 0, 1, 2, \dots$
- ▶ First-order logic (FOL):  $\forall, \exists, P, Q, R, \dots$



# Reasoning procedures

- ▶ Semi-decidable problem: *semi-decision procedure*
- ▶ Decidable problem: *decision procedure*

Quantifier-free fragment: ground formulæ

- ▶  **$\mathcal{T}$ -decision procedure**: decide satisfiability of a ground formula (w.l.o.g. a set of ground clauses  $S$ ) in a theory  $\mathcal{T}$
- ▶  **$\mathcal{T}$ -satisfiability procedure**: decide satisfiability of a conjunction of ground literals  $S$  in  $\mathcal{T}$

# Desiderata for reasoning procedures

- ▶ *Expressive*: handle all ingredients (e.g., all theories) in formula
- ▶ *Sound and complete*: no false negatives, no false positives
- ▶ *Efficient*: each formula only a sub-task
- ▶ *Scalable*: practical problems generate huge formulæ
- ▶ *Proof-producing*: check proof, manipulate proof (e.g., extract info for predicate abstraction)
- ▶ *Model-producing*: model as counter-example, bug finding

# Some reasoning methods

- ▶ Davis-Putnam-Logemann-Loveland (DPLL) procedure: case analysis
- ▶ Congruence closure (CC) algorithm
- ▶ Theory solvers, e.g., Simplex method
- ▶ DPLL(T) (e.g., DPLL(EUF) with CC)
- ▶ Combination of theory solvers (on top of CC): DPLL-based SMT-solvers
  - ▶ Nelson-Open method
  - ▶ Delayed theory combination
  - ▶ Model-based theory combination

## More reasoning methods

- ▶ Rewriting/Simplification: well-founded ordering, normal/canonical form, matching
- ▶ Resolution (unification): deduce clauses (synthetic)
- ▶  $E$ -matching,  $E$ -unification
- ▶ Instance generation
- ▶ Tableaux: subgoal-reduction (analytic), model elimination
- ▶ Knuth-Bendix completion (Rewriting+Superposition): deduce equations
- ▶ Resolution+Rewriting+Superposition/Paramodulation: deduce clauses with equations

## Which problems may they be especially good for

- ▶ DPLL: SAT-problems; large non-Horn clauses
- ▶ CC: ground equations
- ▶ Theory solvers: e.g., linear arithmetic, bitvectors
- ▶ DPLL-based SMT-solvers: ground SMT-problems
- ▶ Rewriting and KB completion: non-ground equations  
Non-ground: with (implicitly) *universally quantified variables*
- ▶ Resolution: non-ground FOL clauses, especially Horn
- ▶ Resolution+Paramodulation/Superposition+Rewriting:  
non-ground FOL+= clauses, especially Horn

## General theorem proving

*Inf.* rewrite-based inference system for FOL+=  
(e.g., Resolution+Paramodulation/Superposition+Rewriting)

*TP strategy*: inference system + search plan (e.g., *Inf*-strategy)

*Refutationally complete* inference system  
+  
*Fair* search plan  
=  
*Complete* strategy

## A rewrite-based approach to SMT: main idea

If *Inf* is guaranteed to **terminate** on any  $\mathcal{T}$ -satisfiability problem, any complete *Inf*-strategy is a

### **decision procedure**

for  $\mathcal{T}$ -satisfiability.

- ▶ Input:  $\mathcal{T} \cup S$ , where  $\mathcal{T}$  is presentation of theory.
- ▶  $\mathcal{T}$  can be union of presentations of theories.
- ▶ Non-ground formulæ may migrate from  $S$  to  $\mathcal{T}$ .

## Some advantages

- ▶ *Sound and complete* inference system, *complete* strategies
- ▶ *Expressivity*: FOL+= (native quantifier reasoning)
- ▶ *Combination of theories*: give union of presentations as input
- ▶ *Flexibility* in drawing the line between theory and problem
- ▶ Use existing theorem provers “off the shelf”
- ▶ *Proof generation*: already there by default
- ▶ *Model generation*: final  $\mathcal{T}$ -satisfiable set as starting point



## Our results

- ▶ *Termination*:  $\mathcal{T}$ -sat procedures for data structures theories, with cases of polynomial complexity
- ▶ *Combination of theories*: *modularity* of termination
- ▶ Some experimental evidence: *efficiency*, *scalability*
- ▶ Generalization from  $\mathcal{T}$ -satisfiability to  $\mathcal{T}$ -decision problems
- ▶ *Decomposition* approach: FOL+= prover | SMT-solver  
Choose  
what to pre-process by prover,  
what to pass on to solver (e.g., arithmetic, bitvectors)

## Termination results

$\mathcal{SP}$ : rewrite-based inference system for FOL+=

*Complete simplification ordering* (CSO)  $\succ$  such that  $t \succ c$  for all compound terms  $t$  and constants  $c$

*Complete  $\mathcal{SP}_\succ$ -strategy* :  $\mathcal{SP}_\succ$  + fair search plan

**Theorem:** A complete  $\mathcal{SP}_\succ$ -strategy is a  $\mathcal{T}$ -satisfiability procedure.

# Covered theories

- ▶ Lists
  - ▶ *non-empty possibly cyclic (polynomial time)*
  - ▶ *possibly empty possibly cyclic*
- ▶ Arrays with or without extensionality
- ▶ Records with or without extensionality (*polynomial time*)
- ▶ Fragments of linear arithmetic:
  - ▶ *integer offsets (polynomial time)*
  - ▶ *integer offsets modulo (polynomial time)*
- ▶ *Recursive data structures* with one constructor and  $k$  selectors:
  - ▶  $k = 1$ : integer offsets (*pred* and *succ*)
  - ▶  $k = 2$ : non-empty acyclic lists (*cons*, *car* and *cdr*)

## Integer offsets

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

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

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

s: successor    p: predecessor

**Infinitely many acyclicity axioms:** Problem reduction.

# Modularity of termination for combination of theories

*Modularity of termination:*

if  $\mathcal{SP}_{\succ}$ -strategy terminates on  $\mathcal{T}_i$ -sat problems then it terminates on  $\mathcal{T}$ -sat problems for  $\mathcal{T} = \bigcup_{i=1}^n \mathcal{T}_i$ .

Hypotheses:

- ▶ No shared function symbols (shared constants allowed): standard condition
- ▶ *Variable-inactive* theories: technical, but simple condition

## The modularity theorem

**Theorem:** if

- ▶  $\mathcal{T}_i$ ,  $1 \leq i \leq n$ , do not share function symbols
- ▶  $\mathcal{T}_i$ ,  $1 \leq i \leq n$ , variable-inactive
- ▶  $\mathcal{SP}_\gamma$ -strategy is a  $\mathcal{T}_i$ -satisfiability procedure,  $1 \leq i \leq n$ ,

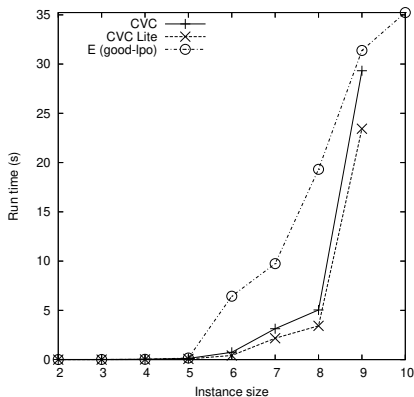
then it is a  $\mathcal{T}$ -satisfiability procedure.

All above mentioned theories satisfy these hypotheses.

# Experiments

- ▶ Reasoners: E 0.82, CVC 1.0a, CVC Lite 1.1.0
- ▶ Six sets of synthetic parametric benchmarks to test *scalability*
- ▶ Both satisfiable and unsatisfiable instances
- ▶ Combinations of theories
- ▶ Large sets of literals from the UCLID suite

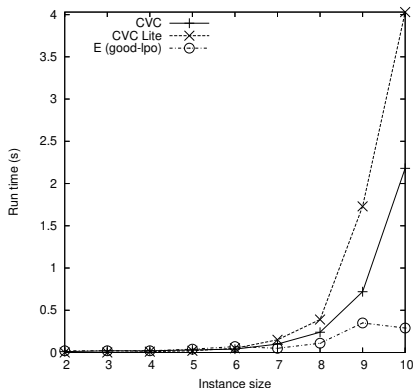
## Benchmarks SWAP( $n$ ): unsat instances



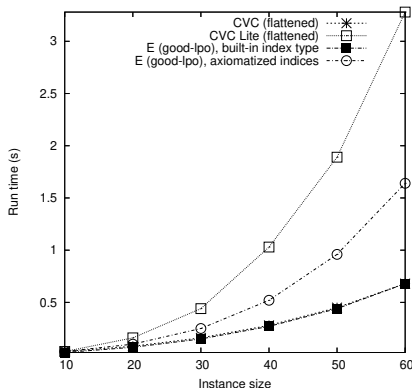
No system terminated for  $n \geq 10$   
Added lemma for E: additional flexibility



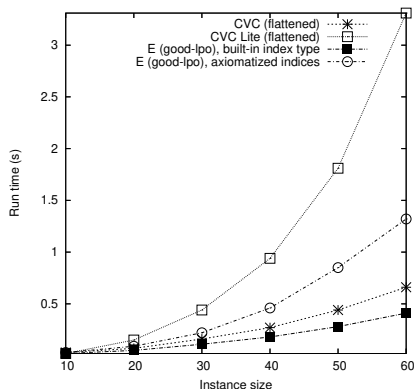
# Benchmarks SWAP( $n$ ): sat instances



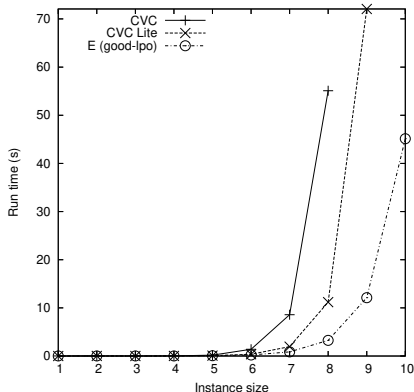
## Benchmarks STORECOMM( $n$ ): unsat instances



## Benchmarks STORECOMM( $n$ ): sat instances

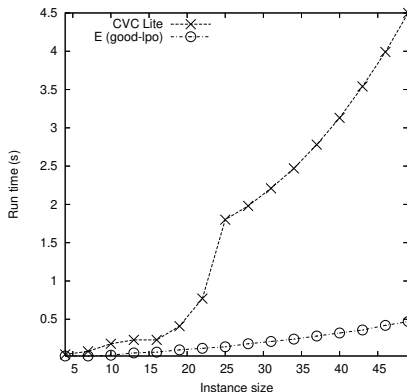


## Benchmarks STOREINV( $n$ ): unsat instances



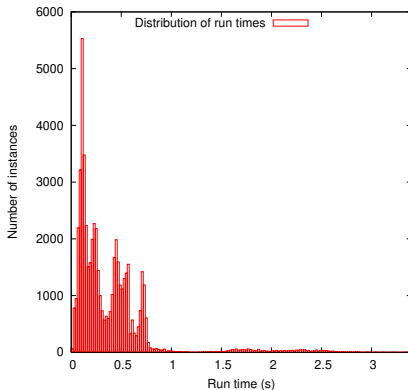
*E(std-kbo)* does it in *nearly constant time*

## Benchmarks CIRCULAR\_QUEUE( $n, k$ ) instances $k = 3$



CVC did not handle integers mod  $k$

## Run time distribution for $E(auto)$ on UCLID set



*Auto mode*: prover chooses search plan by itself

## From $\mathcal{T}$ -satisfiability to $\mathcal{T}$ -decision problems

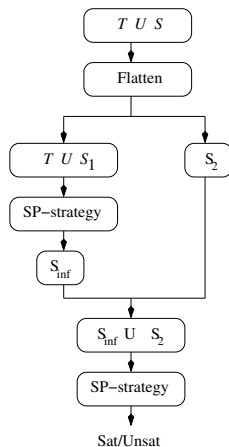
From  $S$  conjunction of ground unit clauses to  $S$  conjunction of ground clauses.

**Theorem:** if

- ▶  $\mathcal{T}$  is variable inactive
- ▶  $\mathcal{SP}_{\succ}$ -strategy is  $\mathcal{T}$ -satisfiability procedure

then it is also  $\mathcal{T}$ -decision procedure.

# $\mathcal{T}$ -decision scheme

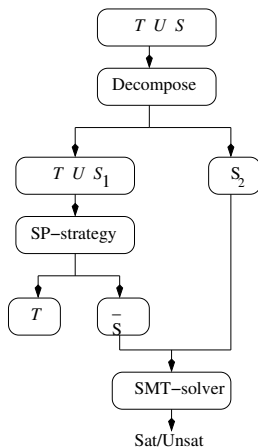




## Decomposition: unite FOL $_{+=}$ and SMT strengths

- ▶ *Decomposition*: definitional and operational part
- ▶ *Theory compilation*: apply FOL $_{+=}$  prover to “compile” the definitional part: theory reasoning, non-ground equational reasoning
- ▶ *Decision*: apply SMT-solver to subset of saturated set (without  $\mathcal{T}$ -axioms) + operational part
- ▶ Sufficient conditions to preserve satisfiability

## $\mathcal{T}$ -decision by stages



# Summary

- ▶ Termination results:  $\mathcal{T}$ -sat procedures based on generic reasoning
- ▶ *Modularity theorem* for combination of theories
- ▶ Experiments on  $\mathcal{T}$ -sat problems with prover *taken off the shelf* and optimized for very different search problems
- ▶ *Generalization* to  $\mathcal{T}$ -decision procedures
- ▶ *Decision by stages*: pipeline of FOL $_{+=}$  prover and SMT-solver

## Some current and future work

- ▶ Experiments with  $\mathcal{T}$ -decision problems
- ▶ More termination results for more (powerful) decision procedures
- ▶ Search plans for  $\mathcal{T}$ -sat and  $\mathcal{T}$ -decision problems
- ▶ Integration with automated model building, especially in combinations of theories

## References

- ▶ Alessandro Armando, Maria Paola Bonacina, Silvio Ranise and Stephan Schulz. *New results on rewrite-based satisfiability procedures*. *ACM Trans. on Computational Logic*, To appear. (Presented in part at *FroCoS 2005* and *PDPAR 2005*)
- ▶ Maria Paola Bonacina and Mnacho Echenim. *On variable-inactivity and polynomial T-satisfiability procedures*. *Journal of Logic and Computation*, 18(1): 77-96, Feb. 2008. (Presented in part at *PDPAR 2006*)
- ▶ Maria Paola Bonacina and Mnacho Echenim. *Theory decision by decomposition*. Submitted to journal, April 2008. (Presented in part at *CADE 2007*)

# Thanks

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Looking for more

- ▶ friends to work with, including post-doc's, students,
- ▶ problems, applications, theories to try ...

# Thank you!