

Deciding satisfiability problems by general-purpose deduction: Experiments in the theory of arrays

Maria Paola Bonacina, Dip. Informatica, Università degli Studi di Verona, Italy

Joint work with:

Alessandro Armando, DIST, Università degli Studi di Genova, Italy

Silvio Ranise, LORIA & INRIA-Lorraine, Nancy, France

Michaël Rusinowitch, LORIA & INRIA-Lorraine, Nancy, France

Aditya Kumar Sehgal, Dept. of Computer Science, U. Iowa, USA

Outline

- Motivation
- Background on satisfiability procedures
- A deduction-based approach
- Theory of arrays : synthetic benchmarks
- Experimental results with E and CVC
- Discussion of results and research directions

Motivation

- HW/SW verification requires reasoning with theories of data types, e.g., integer, real, arrays, lists, trees, tuples, sets.
- E.g., use arrays to model registers and memories in formalizing HW verification problems.
- Some of these theories are decidable.
- Built-in theories for verification tools and proof assistants.

Some background on

Satisfiability Procedures

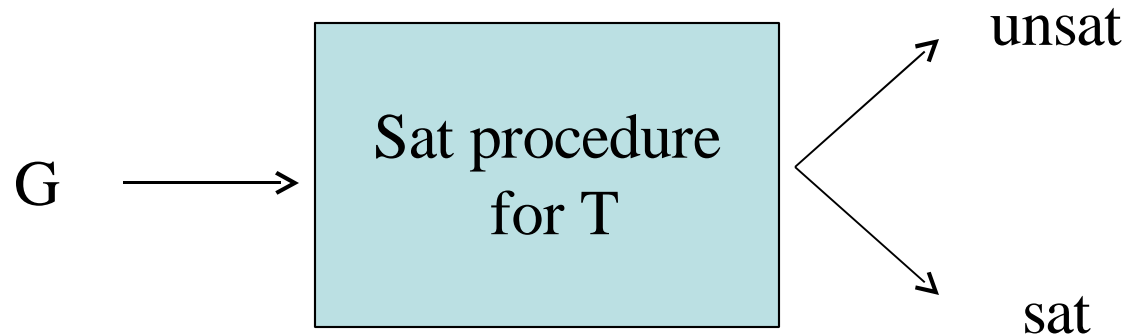
Satisfiability procedure

T : background theory, possibly with intended interpretation

φ : quantifier-free formula

φ' : DNF ($\neg\varphi$) /* not in practice : more later */

G : conjunction (set) of ground literals from φ'



Common approach

Design, prove sound and complete, and implement a satisfiability procedure for each decidable theory of interest.

Issues:

- Most problems involve multiple theories: **combination** of theories / procedures [Nelson-Oppen, Shostak, ..]
- Proofs for **concrete procedures** [e.g., Shankar, Stump] or **abstract frameworks** [e.g., Tiwari, Ganzinger]
- Implement from scratch data structures and algorithms for each procedure: **correctness** of implementation? **SW reuse**?

Un-interpreted and interpreted symbols

- **Un-interpreted** function and predicate symbols :
all properties are stated by axioms

Conjunction of ground equalities and inequalities with only un-interpreted function symbols : **congruence closure**
[Nelson-Oppen, Downey-Sethi-Tarjan 1980]

- **Interpreted** function and predicate symbols :

built-in properties, e.g., from $x - 1 = y$ to $x = y + 1$
Conjunction of ground equalities and inequalities including interpreted symbols: **combination** of congruence closure and specialized procedures

Combination of theories : Nelson- Oppen 1979

$T_1 \dots T_k$ $G_1 \dots G_k$

- **Disjoint theories** : if r_i occurs in G_j rename as x and add $x = r$ to G_i
- Communication among procedures : only **equalities between variables**
- **Convex theories** :

if $T \models \bigvee_{i=1..n} s_i = r_i$ then $T \models s_i = r_i$ for some i

Non-convex theories : splitting of disjunctions

Combination : Shostak 1984

[Cyrluk-Lincoln-Shankar, CADE 1996]

[Ruess-Shankar, LICS 2001]

- Theories with **canonical form** :

$T \models s = r \text{ iff } \sigma (s) = \sigma (r)$

$\text{vars} (\sigma (s)) \subseteq \text{vars} (s)$ and $\sigma (x) = x$

$\sigma (\sigma (s)) = \sigma (s)$

if $\sigma (s) = f (s_1 .. s_n)$ then $\sigma (s_i) = s_i \quad i = 1 .. n$

Canonical form is representative of equivalence class

- And **algebraically solvable** :

$\text{solve} (s = r)$ is in tree normal form (idempotent substitution)

Relation to general deduction

- Congruence closure : ground completion
- Algebraic solvability : semantic unification
solve () : T- unification algorithm
- Canonical form : T- normal form

Abstract frameworks

- **Abstract Congruence Closure**

[Tiwari 2000] [Bachmair-Tiwari-Vigneron, JAR 2002]

CC algorithms as ground completion strategies with same inference rules (including flattening) and different search plans

Ground completion with indexing is fastest !

- **Shostak Light**

[Barrett-Dill-Stump, FroCoS 2002]

[Ganzinger, CADE 2002]

Shostak as completion modulo T_i (T_i - unification) or

Nelson-Oppen combination of CC and T_i - unification

General-purpose ordering-based theorem-proving :

Can it help ?

Theorem proving would help:

- Combination of theories: give union of the axiomatizations in input to the prover
- No need of ad hoc proofs for each procedure
- Reuse code of existing provers

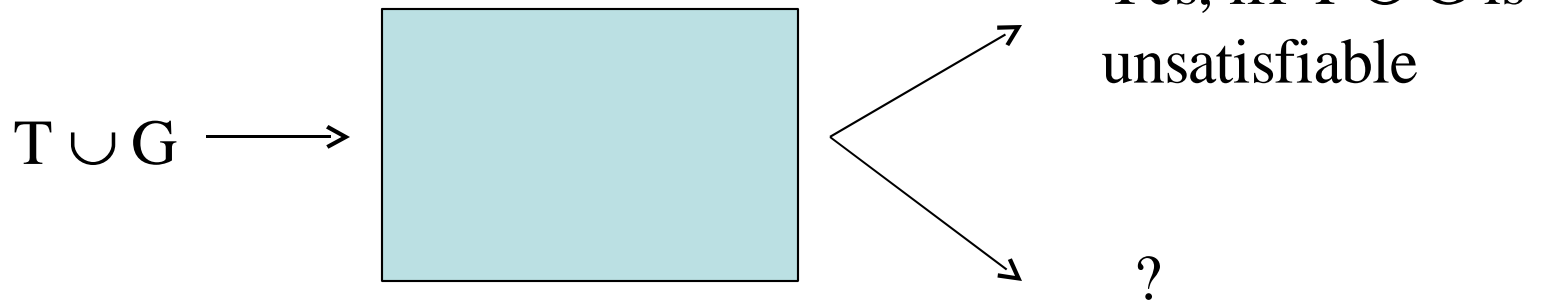
Termination ?

$C = \langle I, \Sigma \rangle$: theorem-proving strategy

I : **refutationally complete** inference system with superposition/
paramodulation, simplification, subsumption ...

Σ : **fair** search plan

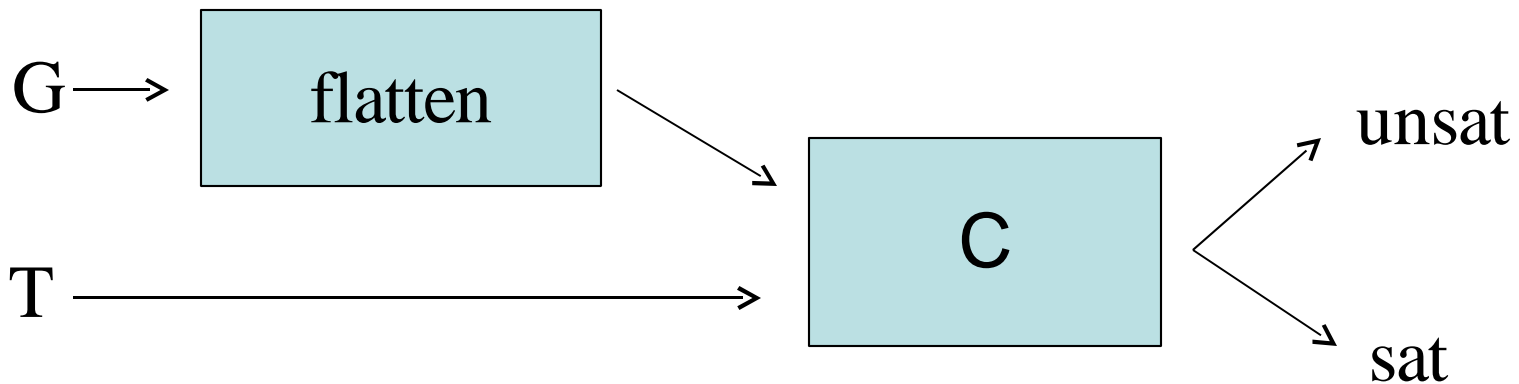
is a **semi-decision** procedure:



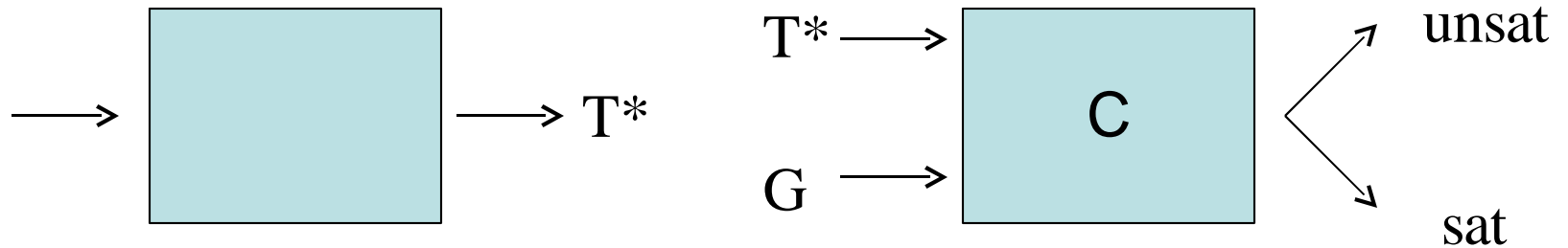
Termination results

[Armando, Ranise, Rusinowitch, CSL 2001]

T: theory of **arrays**, **lists**, **sets** and combinations thereof



Another way to put it



Pure equational: T^* canonical rewrite system

Horn equational: T^* saturated ground-preserving
[Kounalis & Rusinowitch, CADE 1988]

FO special theories: e.g., $T = T^*$ for arrays [ARR, CSL 2001]

Beyond conjunctions of literals

[Silvio Ranise, UNIF 2002]

Extension to arbitrary quantifier-free formulae including connectives `if_then_else_` and `let_in_` that are very useful in verification problems :

- transformation to clauses such that at most one literal is an equality of ground first-order flat terms and the other literals are propositional variables
- extension of termination results

How about efficiency ?

A satisfiability procedure with T built-in is expected to be always much faster than a theorem prover with T in input !

Totally obvious ? Or worth investigating ?

- theory of **arrays**
- **synthetic benchmarks** (allow to assess scalability by experimental asymptotic analysis)
- comparison of **E prover** and **CVC validity checker** with theory of arrays built-in

Theory of arrays: the signature

store : array \times index \times element \rightarrow array

select : array \times index \rightarrow element

The presentation (T_1)

$$(1) \quad \forall A, I, E. \text{ select (store (A, I, E), I) = E}$$

$$(2) \quad \forall A, I, J, E. I \neq J \Rightarrow \\ \text{select (store (A, I, E), J) = select (A, J)}$$

$$(3) \text{ Extensionality: } \forall A, B.$$

$$\forall I. \text{ select (A, I) = select (B, I)}$$

$$\Rightarrow$$

$$A = B$$

Pre-processing extensionality

$\text{select} (A, \text{sk} (A, B)) \neq \text{select} (B, \text{sk} (A, B)) \vee A = B$

$t \neq t'$



$\text{select} (t, \text{sk} (t, t')) \neq \text{select} (t' , \text{sk} (t, t'))$

Another presentation (T_2)

Keep (1) and (2) and replace extensionality (3) by:

$$(4) \forall A, I. \text{store} (A, I, \text{select} (A, I)) = A$$

$$(5) \forall A, I, E, F.$$

$$\text{store} (\text{store} (A, I, E), I, F) = \text{store} (A, I, F)$$

$$(6) \forall A, I, J, E. I \neq J \Rightarrow$$

$$\text{store} (\text{store} (A, I, E), J, F) = \text{store} (\text{store} (A, J, F), I, E)$$

T_1 entails (4) (5) (6)

Use of presentations

- T_1 is saturated and application of C to $T_1 \cup G$ is guaranteed to terminate [ARR2001]:
 C acts as decision procedure
- T_2 is not saturated (saturation does not halt):
 C applied to $T_2 \cup G$ acts as semi-decision procedure

Two sets of synthetic benchmarks

in array theory

storecomm(N): intuition

Storing values at distinct places
in an array is “commutative”

storecomm(N) : definition

$k_1 \dots k_N$: N indices

D : set of 2-combinations over $\{ 1 \dots N \}$

Indices must be distinct:

$$\bigwedge_{(p, q) \in D} k_p \neq k_q$$

$i_1 \dots i_N, j_1 \dots j_N$: two distinct permutations of $1 \dots N$

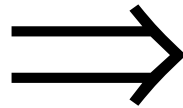
store (... (store (a, k_{i_1} , e_{i_1}), ... k_{i_N} , e_{i_N}) ...)

=

store (... (store (a, k_{j_1} , e_{j_1}), ... k_{j_N} , e_{j_N}) ...)

storecomm(N) : schema

$$\bigwedge_{(p, q) \in D} k_p \neq k_q$$



store (... (store (a, k_{i1} , e_{i1}), .. k_{iN} , e_{iN}) ...)

=

store (... (store (a, k_{j1} , e_{j1}), .. k_{jN} , e_{jN}) ...)

storecomm(N) : instances

Each choice of permutations generates a different instance:

$N!$ permutations of the indices

The number of instances is the number of 2-combinations of $N!$ permutations:

$$N! (N! - 1) / 2$$

swap(N): intuition

Swapping pairs of elements in an array
in two different orders yields the same array

swap(N) : definition

Recursively:

Base case: $N = 2$ elements:

$L_2 = \text{store} (\text{store} (a, i_1, \text{select} (a, i_0)), i_0, \text{select} (a, i_1))$

$R_2 = \text{store} (\text{store} (a, i_0, \text{select} (a, i_1)), i_1, \text{select} (a, i_0))$

$$L_2 = R_2$$

Recursive case: $N = k+2$ elements:

$L_{k+2} = \text{store} (\text{store} (L_k, i_{k+1}, \text{select} (L_k, i_k)), i_k, \text{select} (L_k, i_{k+1}))$

$R_{k+2} = \text{store} (\text{store} (R_k, i_k, \text{select} (R_k, i_{k+1})), i_{k+1}, \text{select} (R_k, i_k))$

$$L_{k+2} = R_{k+2}$$

swap(N) : instances

N elements, N/2 pairs to exchange

N! permutations of the elements

C_i : number of i-combinations over the set of N/2 pairs
number of ways of picking i pairs for exchange

$$\sum_i C_i = 2^{(N/2)} - 1$$

Number of instances: $1/2 \times N! \times (2^{(N/2)} - 1)$

Experiments

with E and CVC

Set up of the experiments

- Two tools: CVC validity checker and E theorem prover
- E: **auto mode** and **user-selected strategy**
- Comparison of **asymptotic behavior** of E and CVC as N grows

The CVC validity checker

[Aaron Stump, David L. Dill et al., Stanford U.]

Combines procedures **à la Nelson-Oppen**
(e.g., lists, arrays, records, real arithmetics ..)

Has **SAT solver**: first GRASP then Chaff

Theory of **arrays**: ad hoc algorithm based on congruence closure with pre-processing wrt. axioms of T_1 and elimination of “store” via partial equations

Why a SAT solver ?

To handle **arbitrary quantifier-free formulae** :
cooperation of SAT solver and decision procedure(s)

Map first-order formula φ to propositional abstraction $\text{abs}(\varphi)$
 $\text{abs}(\varphi)$ unsatisfiable : φ unsatisfiable
 $\text{abs}(\varphi)$ satisfiable : model α yields
either model of φ (checked by decision procedure)
or minimal conflict clause to feed back to SAT solver

Interaction is **incremental**

The E theorem prover

[Stephan Schulz, TU-Muenchen]

Inference system I : o-superposition/paramodulation, reflection, o-factoring, simplification, subsumption

Search plans Σ :

- given-clause loop with clause selection functions and only “already-selected” list inter-reduced
- term orderings: KBO and LPO
- literal selection functions

Strategies in experiments

- E-auto: automatic mode
- E-SOS: { problem in form $T \cup G$ }
Clause selection:
(SimulateSOS, RefinedWeight)
Term ordering: LPO
- Precedence: $\text{select} > \text{store} > \text{sk} > \text{constants}$

First set of experiments on storecomm(N)

E takes presentation T_1 in input

N ranges from 2 to 150

Sample 10 permutations: 45 instances for each value of N

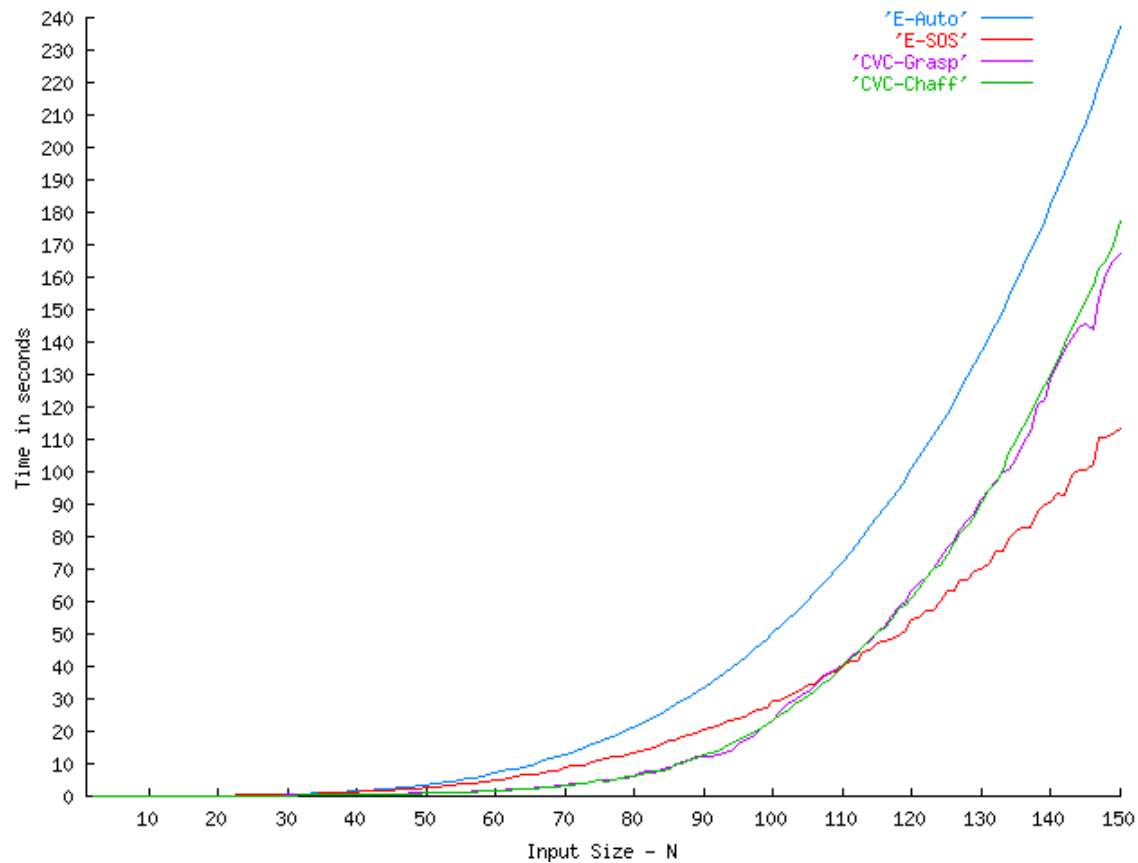
Non-uniform sampling (favors permutations with local changes)

Performance for N is **average** over all generated instances for value N

Versioni : E 0.62

CVC/GRASP Fall 2001, CVC/CHAFF January 2002

First set : storecomm(N)



Second set of experiments on storecomm(N)

E takes presentation T_1 in input

N ranges from 2 to 90

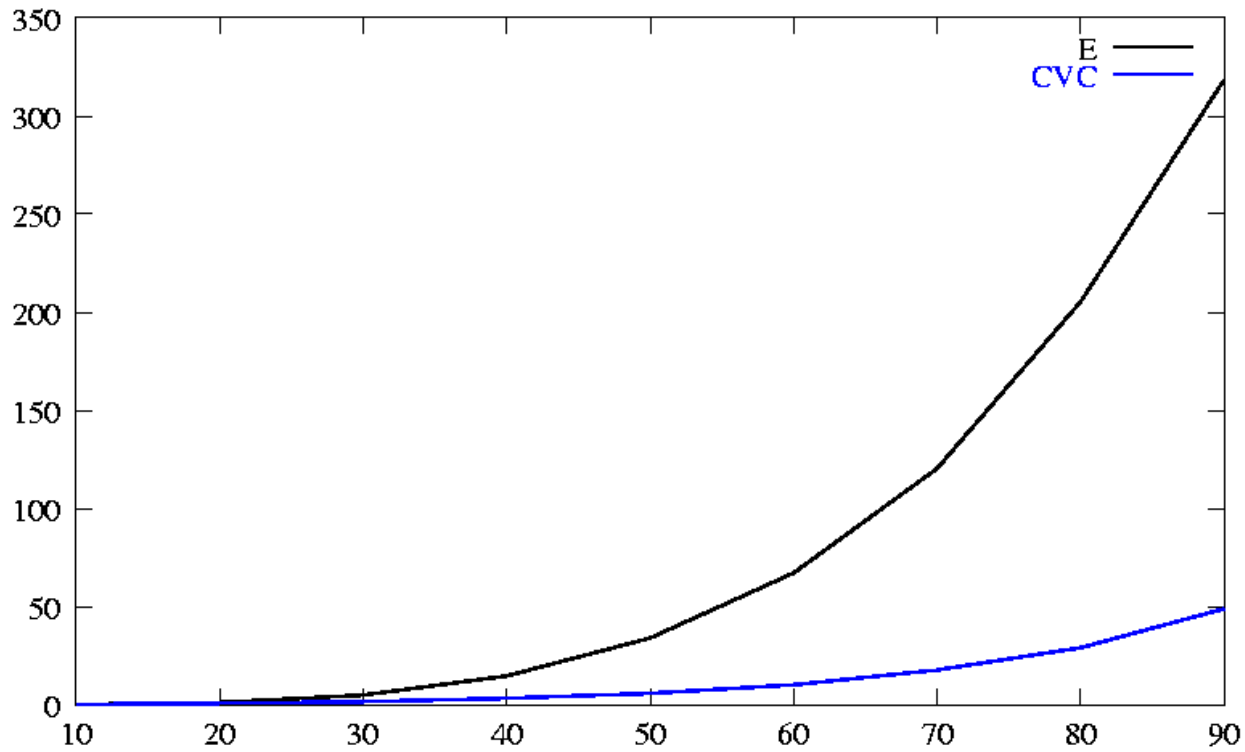
For each value of N pick one instance **at random** :
no averages

Only E-auto, E-SOS do not help

Versioni : E 0.62

CVC/CHAFF October 2002

Second set : storecomm(N)



First set of experiments on swap (N)

Sample up to 16 permutations and 20 instances for each value of N

Non-uniform sampling (favors permutations with local changes)

Performance for N is **average** over all generated instances for value N

CVC: does up to $N = 10$, runs out of memory on any instance of swap(12)

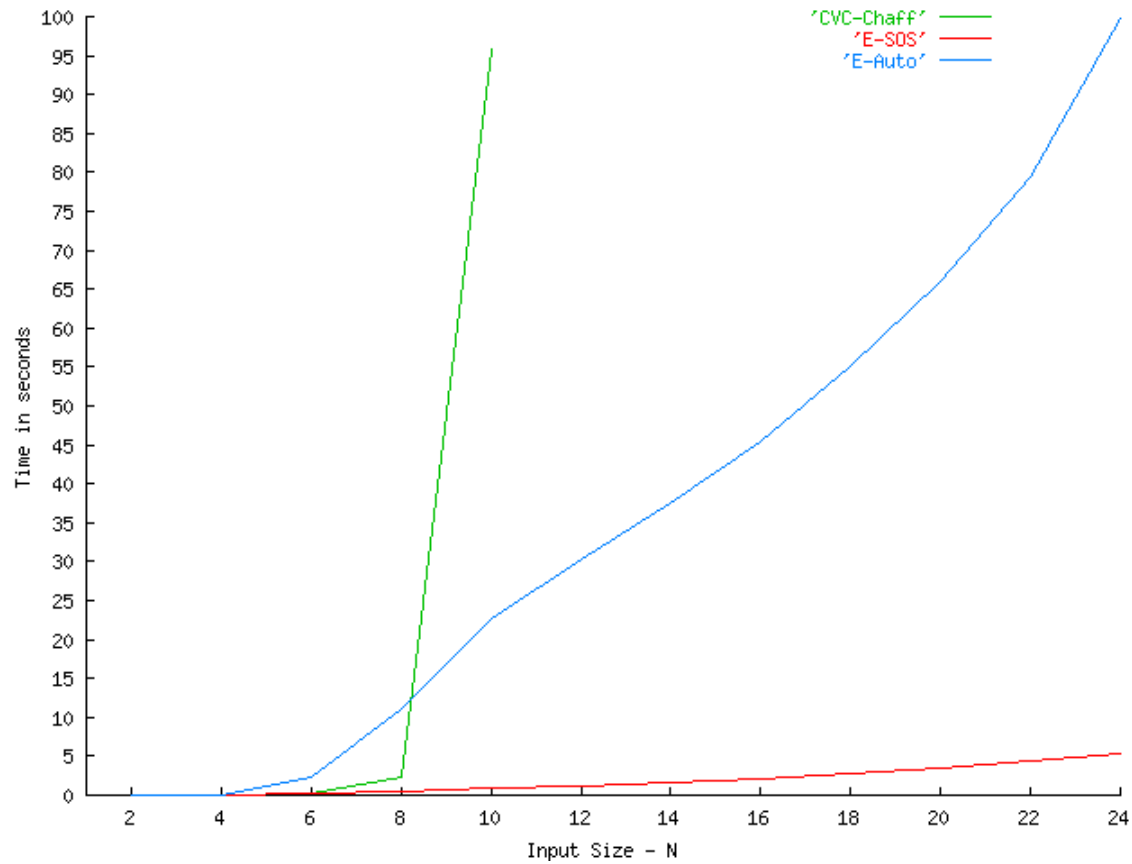
E with presentation T_1 : same as above and slower

E with presentation T_2 : succeeds also for $N \geq 12$

Versioni : E 0.62

CVC/GRASP Fall 2001, CVC/CHAFF January 2002

First set : swap(N)



Second set of experiments on swap(N)

E takes presentation T_1 in input

For each value of N pick one instance **at random** : no averages

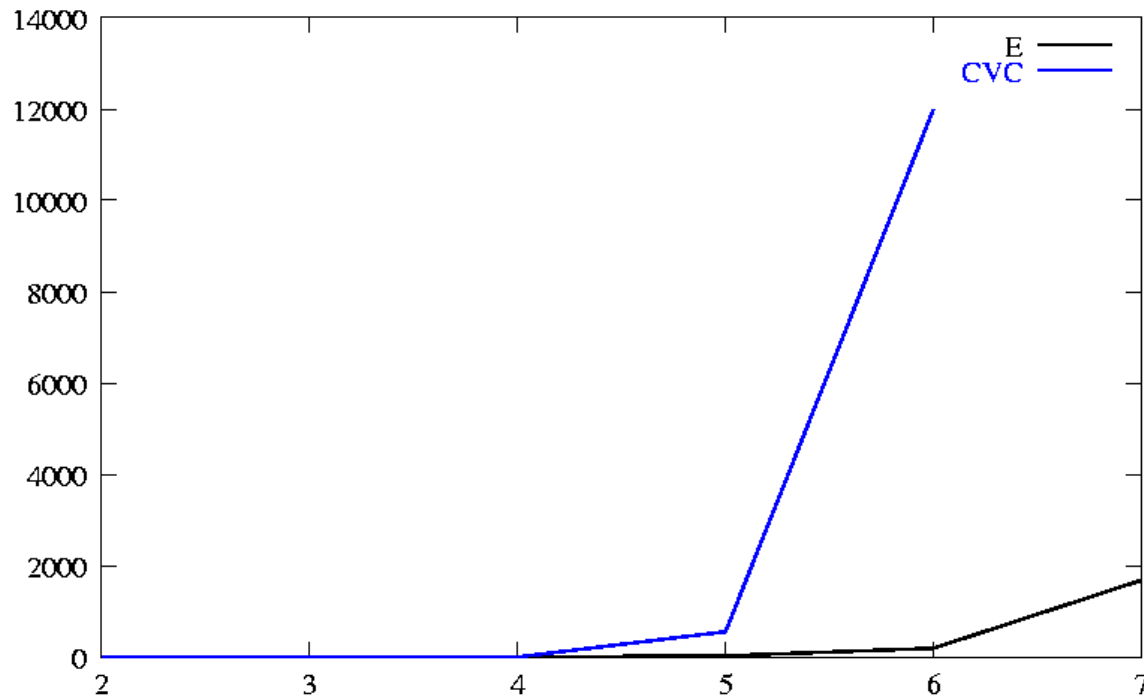
Only E-auto, E-SOS don' t help

CVC : does only up to $N = 6$, E goes beyond

Versioni : E 0.62

CVC/CHAFF October 2002

Second set : swap(N)



Discussion

- Need more experiments: other synthetic benchmarks, other theories, combination of theories, real-world problems
- Understand role of flattening better
- Other provers, e.g., w. more inter-reduction
- Termination results for other theories?
- Complexity of concrete strategies on specific theories

Discussion

- Deduction may help build better decision procedures
- Integration of automated theorem proving and automated model building
- ATP needs more work on auto mode and search plans (search, not blind saturation)
- Proof assistants incorporate satisfiability procedures: integration of ATP/AMB in proof assistants