

Advances in Automated Theorem Proving

Leonardo de Moura, Nikolaj Bjørner
Ken McMillan, Margus Veanes

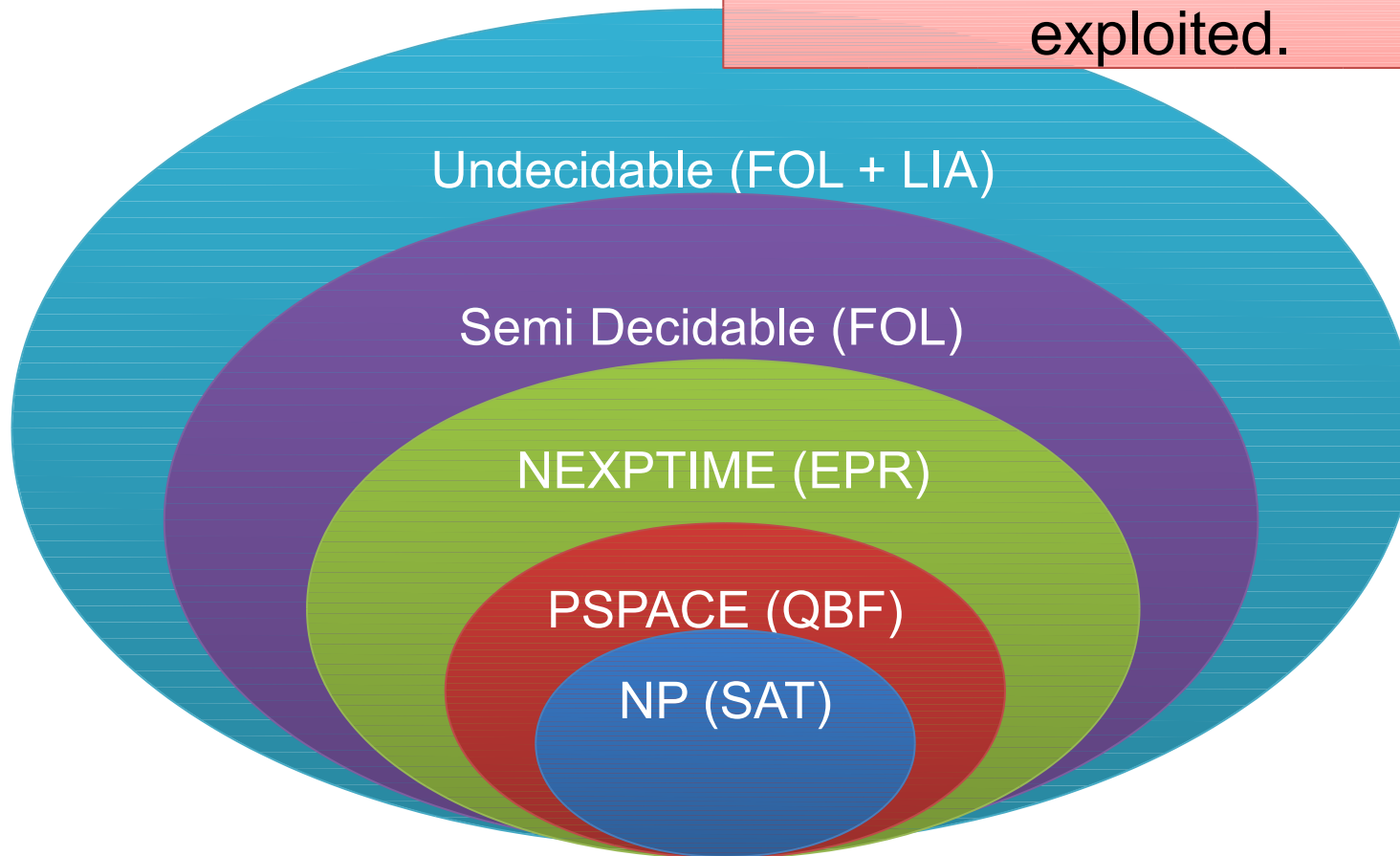
presented by
Thomas Ball

<http://research.microsoft.com/rise/>
<http://rise4fun.com/z3py/>

Symbolic Reasoning

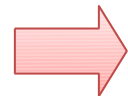
Logic is “The Calculus of Computer Science” Zohar Manna

Practical problems often have **structure** that can be exploited.



Satisfiability

Solution/Model



unsat, Proof

Z3

Automated Theorem Provier

<http://research.microsoft.com/projects/z3/>
Leonardo de Moura and Nikolaj
Bjørner

DPLL

Simplex

Rewriting

Superpositio
n




Z3 is a collection of
Symbolic Reasoning Engines



Congruence
Closure

Groebner
Basis


eliminatio
n

Euclidean
Solver

Learn about Z3 and get the source code!

Start here

<http://rise4fun.com/Z3Py/tutorial/guide>

Strategies

<http://rise4fun.com/Z3Py/tutorial/strategies>

Advanced topics

<http://rise4fun.com/Z3Py/tutorial/advanced>

Source code

<http://z3.codeplex.com/>

Some Applications

Functional verification

Defect detection

Test generation

Design-space exploration

New programming languages

Impact

Z3 used by many research groups (> 700 citations)

More than 17k downloads

Z3 placed 1st in 17/21 categories in 2011 SMT competition

Design & PL

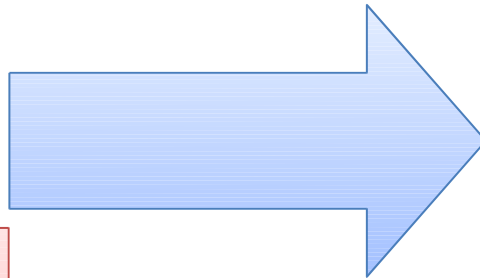
Verification/Defect Detection

Testing



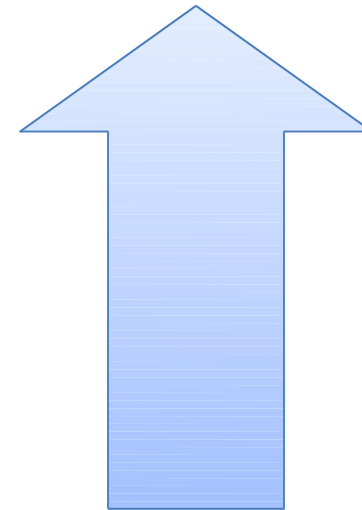
Recent Progress

1. Interpolants
2. Fixed Points



**New
Applications**

Beyond
Satisfiability



Z3

Arithmetic, Bit-Vectors,
Booleans, Arrays,
Datatypes, Quantifiers

M
a
t
h
e
m
a

3. Sequences/Strings
4. Nonlinear arithmetic

Craig Interpolation and Interpolating Z3

Ken McMillan

(FMCAD 2011)

Introduction

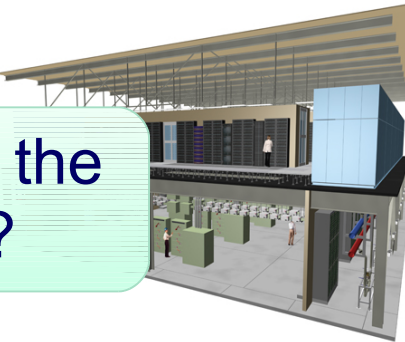
Imagine two companies that want to do business...

Click to edit Master text styles

Second level

- Third level
- Fourth level

Alice's Business Machines

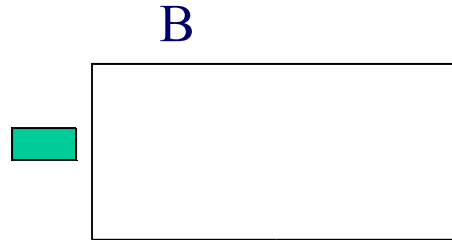


Bob's Good Hosting

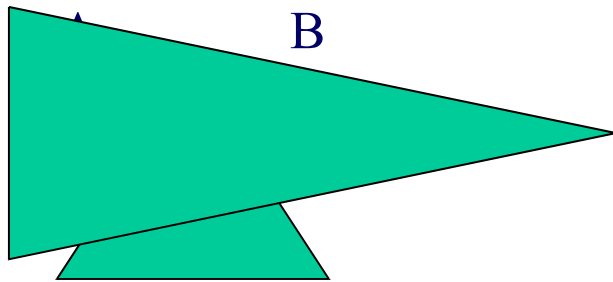
Constraints → UNSAT ← Constraints

Interpolants as Explanations

unknown,
complex



Proof



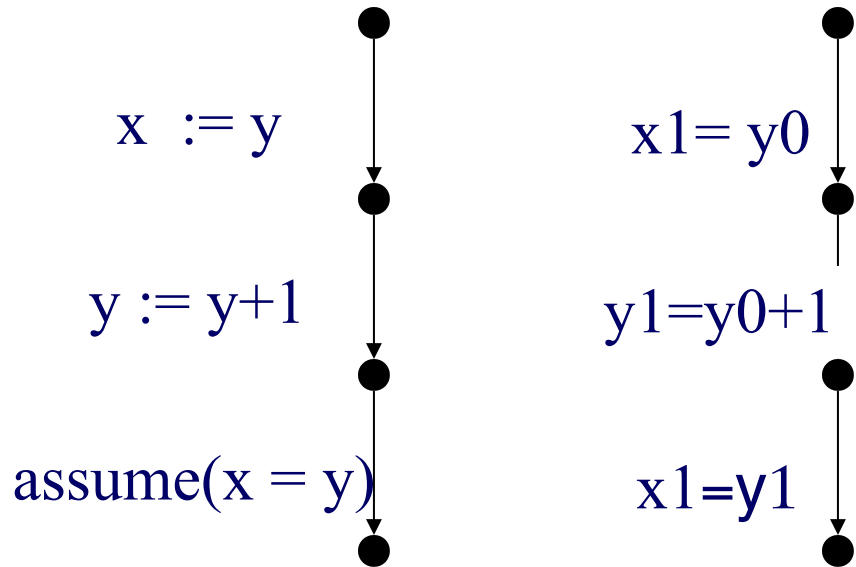
feasible interpolation

most general

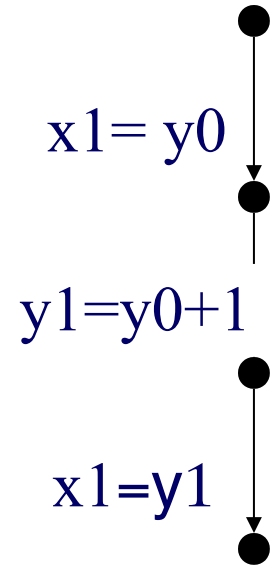
ie
RELEVANT
GENERALIZATION
of known variables.

most specific

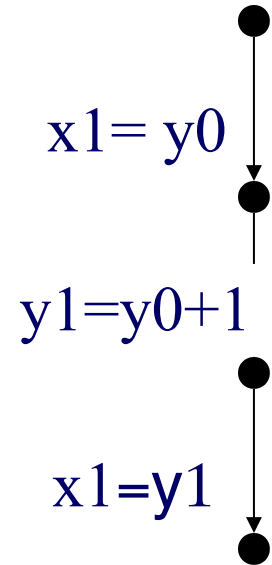
Interpolants as Floyd-Hoare proofs



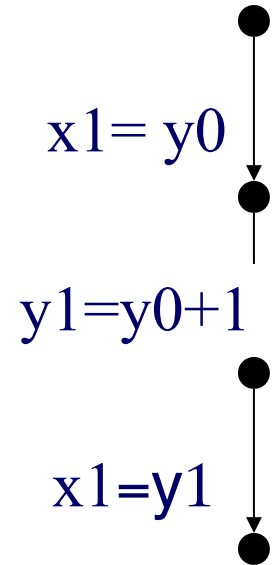
Interpolants as Floyd-Hoare proofs



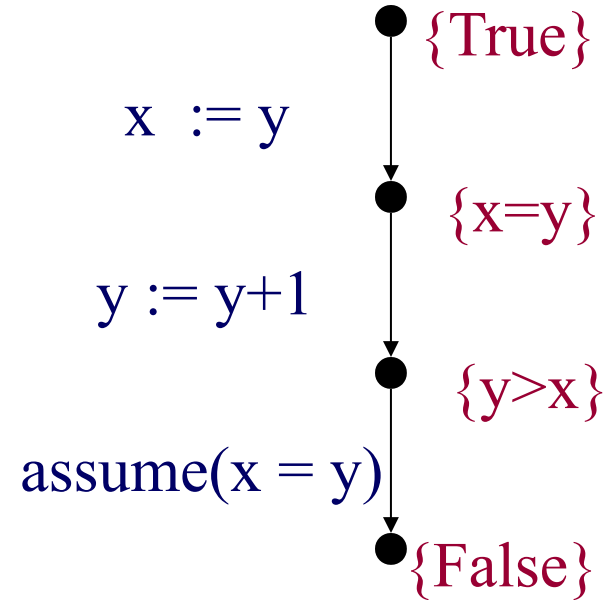
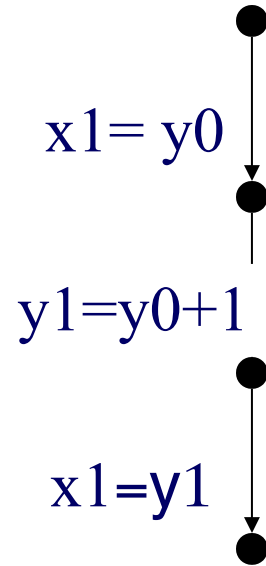
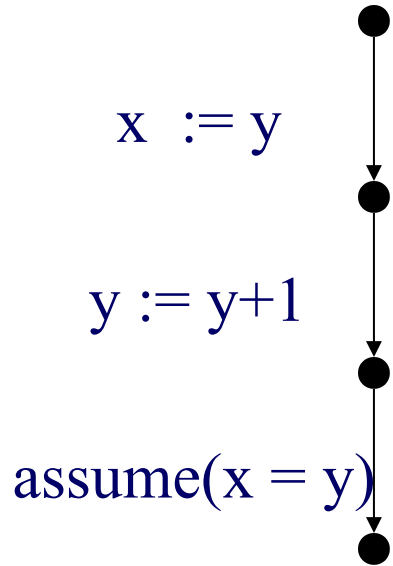
Interpolants as Floyd-Hoare proofs



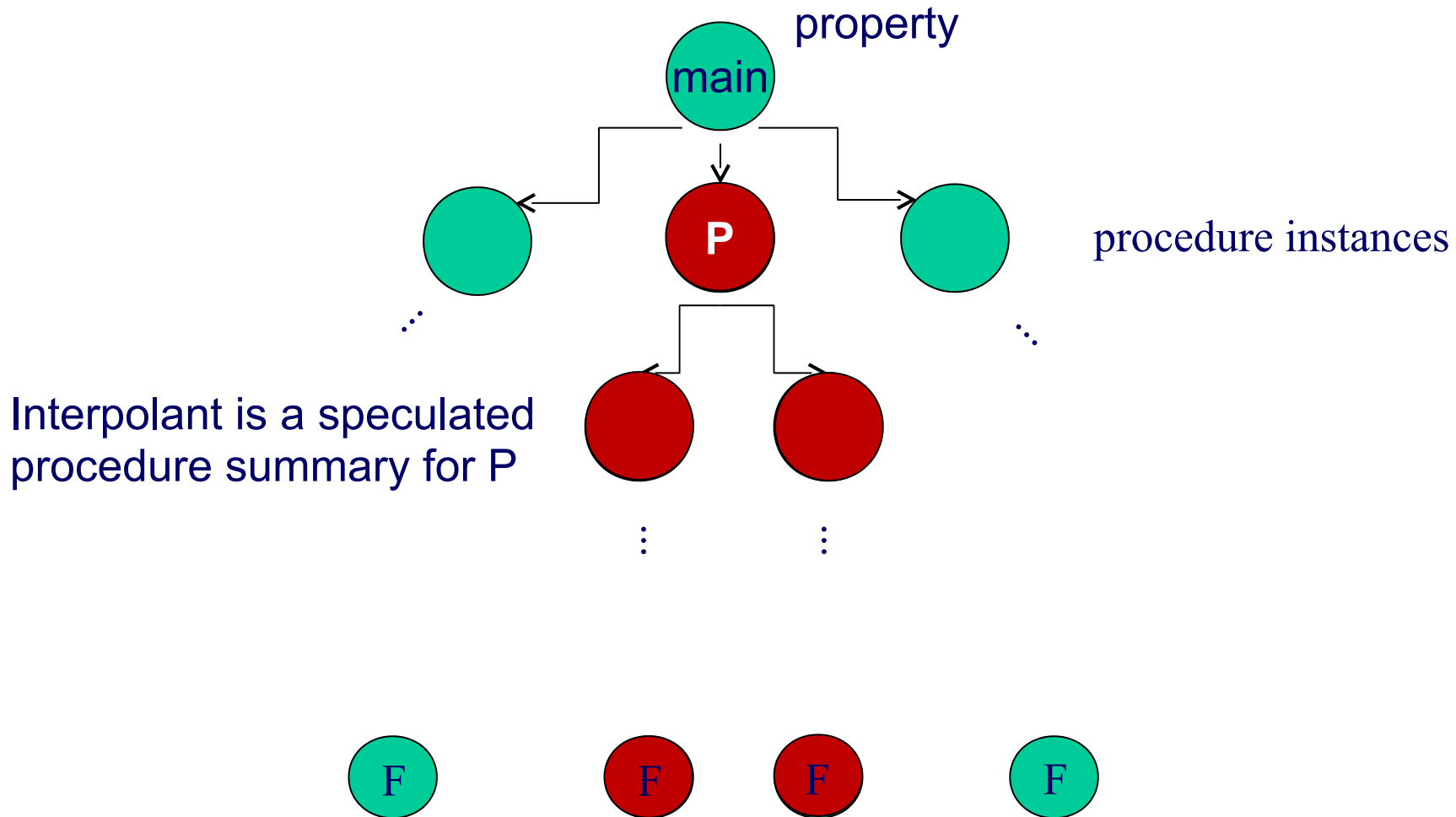
Interpolants as Floyd-Hoare proofs



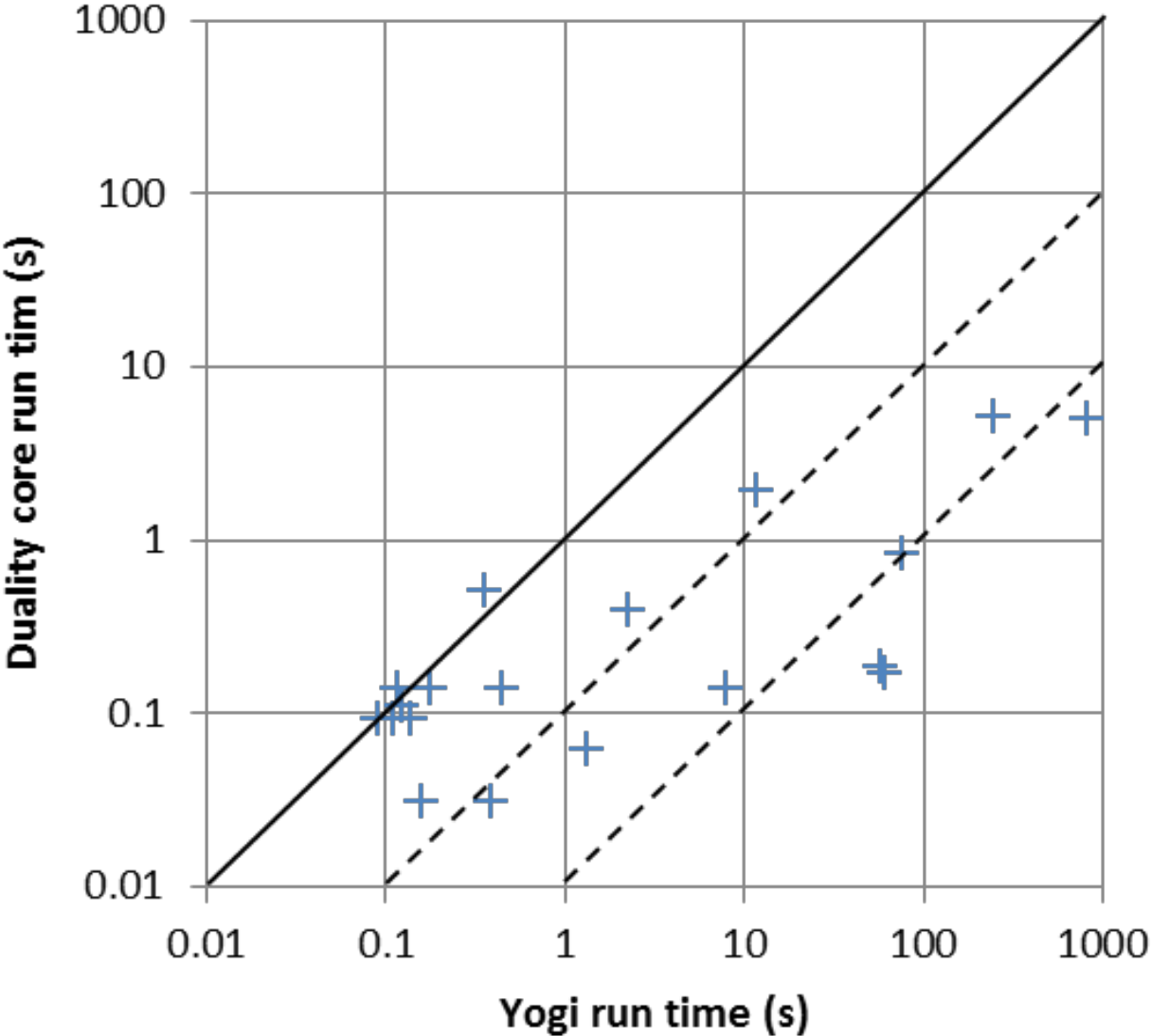
Interpolants as Floyd-Hoare proofs



Duality: Summaries from Interpolants



Duality performance vs. Yogi



Symbolic Automata and Transducers

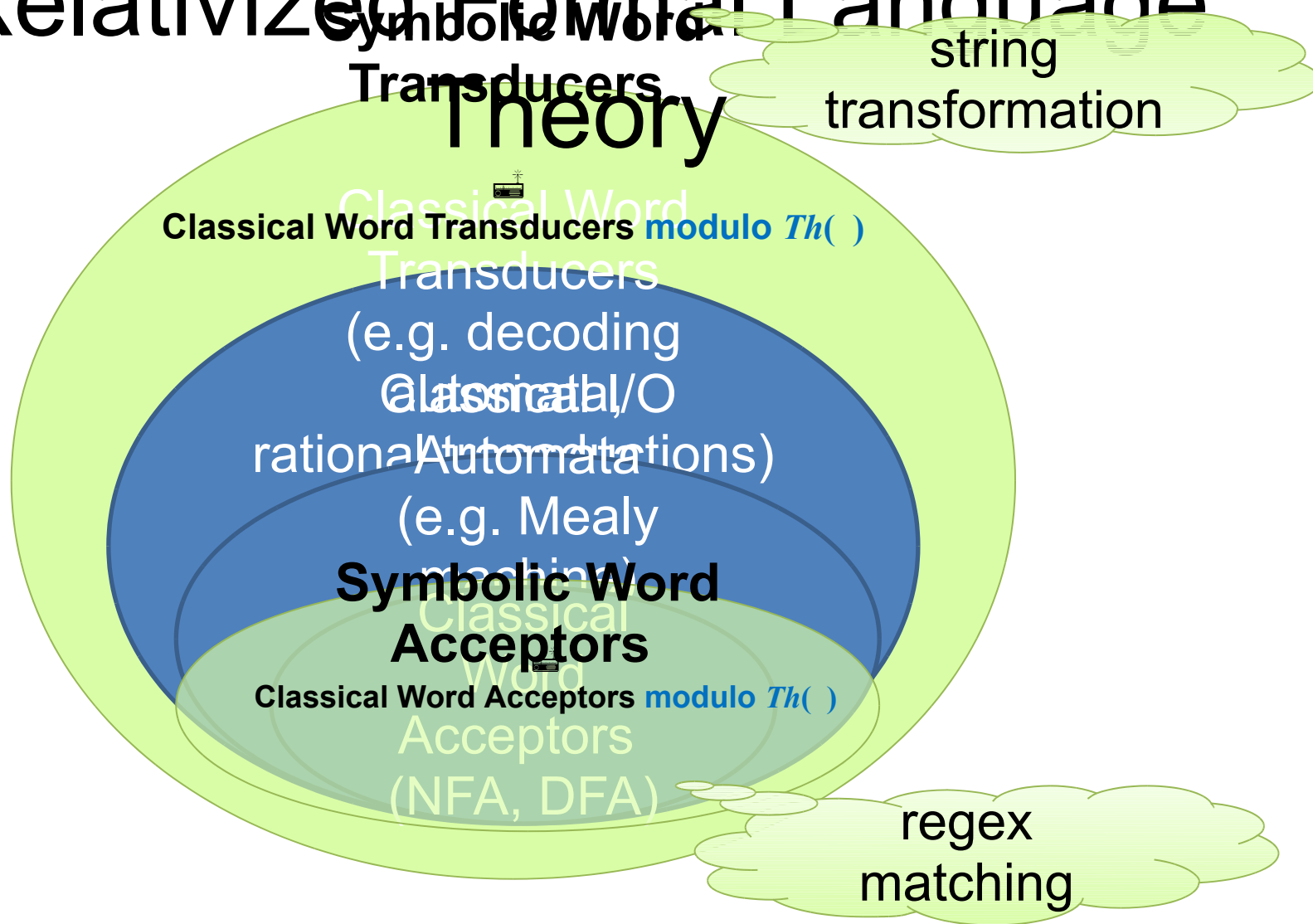
Margus Veanes, Nikolaj Bjørner
(POPL 2011)

Core Question

Can classical automata theory and algorithms be extended to work *modulo* large (infinite) alphabets Υ ?

Symbolic Automata:

Relativized Formal Language

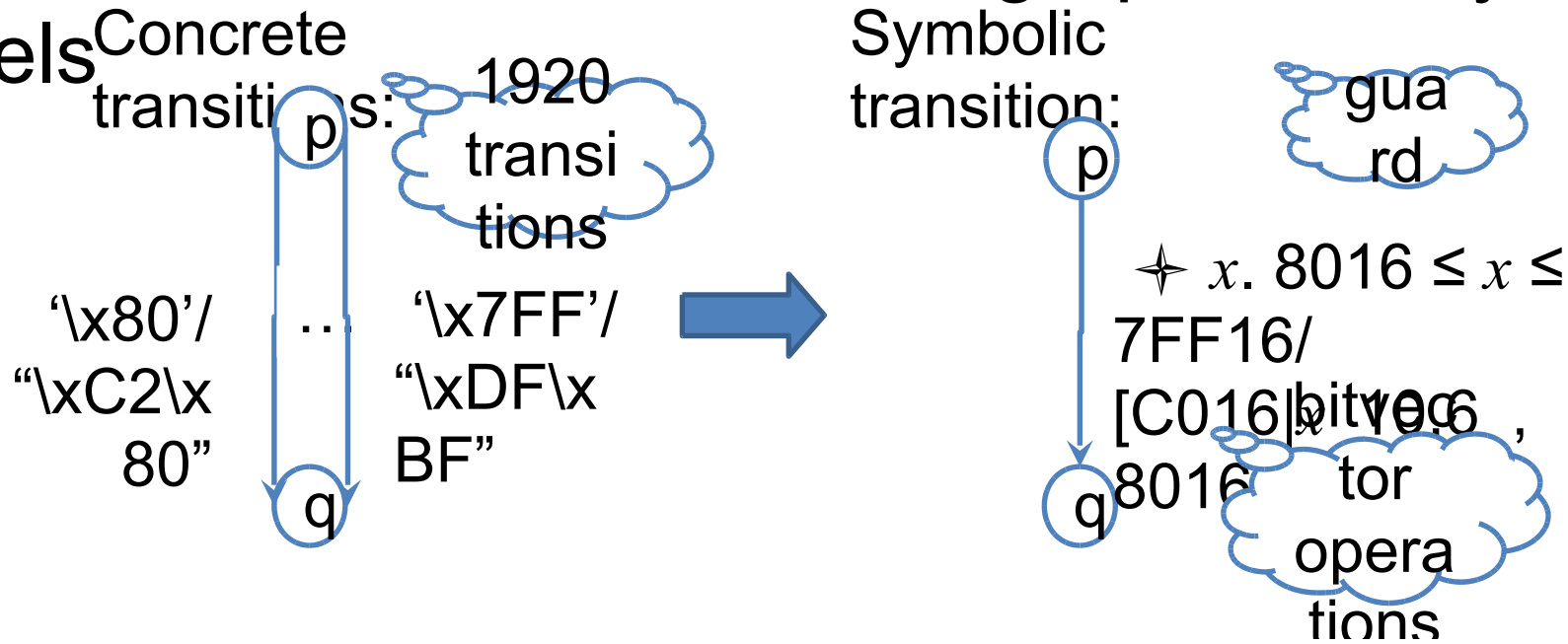


Symbolic Finite Transducer (SFT)

Classical transducer *modulo* a rich *label theory*

Core Idea: represent labels with guarded transformers

Separation of concerns: finite graph / theory of labels



Algorithms

New algorithms for SFAs and SFTs




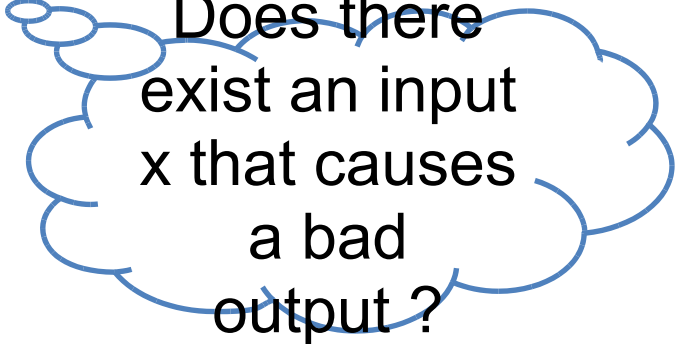
Extensions of classical algorithms *modulo*
Th()

Big-O complexity matches that of classical algorithms, with factor for decision procedure

Analysis

➤ Example 1: $\exists x(\text{utf8encode}(x) \in R_{\text{utf8}})$?

- 
1. $E = SFT(\text{utf8encode})$
 2. $A = \text{Complement}(SFA(R_{\text{utf8}}))$
 3. $B = \{x \mid A(E(x))\}$
 4. $B \neq \emptyset$?



Does there exist an input x that causes a bad output ?

➤ Example 2: $\exists x.\text{utf8decode}(\text{utf8encode}(x)) = Id$?

Links

Symbolic Automata Tool Kit

<http://research.microsoft.com/automata/>

Rex (acceptors) online

<http://rise4fun.com/rex/>

Bek (transducers) online

Samples: <http://rise4fun.com/Bek/>

Tutorials: <http://rise4fun.com/Bek/tutorial>

Solving Nonlinear Arithmetic

Dejan Jovanović (NYU) and Leonardo de Moura

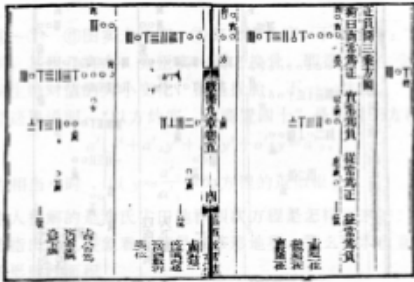
(IJCAR 2012)

Polynomial Constraints

AKA
Existential Theory of the Reals
 $\exists \mathbb{R}$

Milestones

RCF admits QE
non elementary complexity

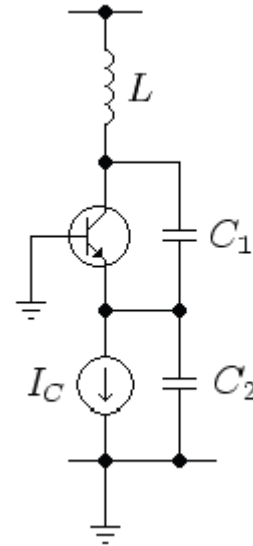
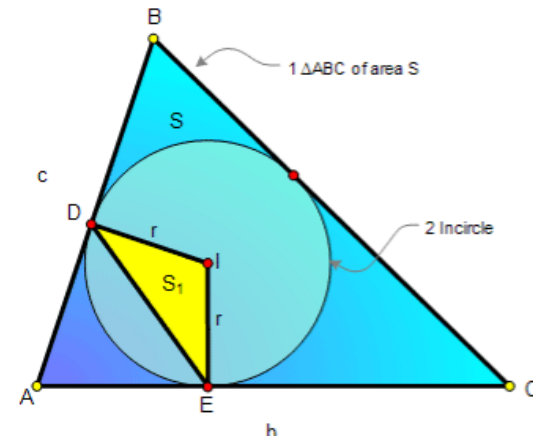
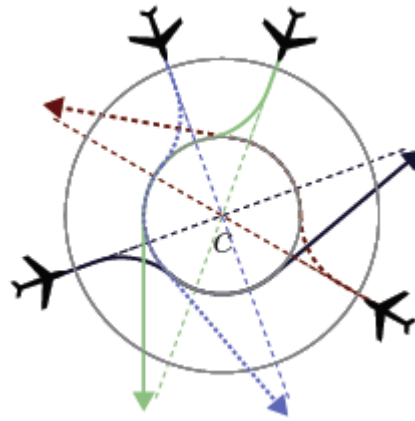
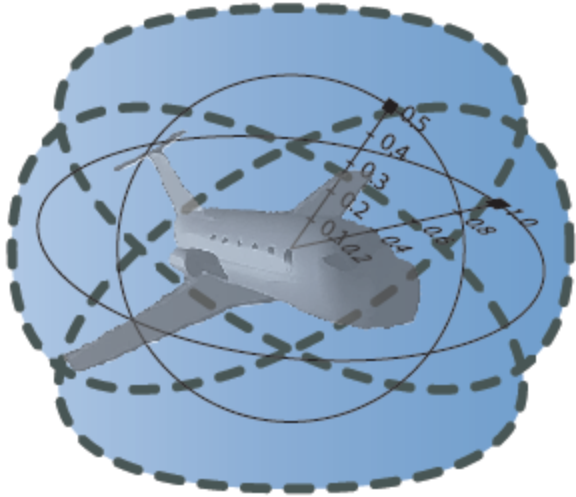


820 1247 1637 1732 1830 1835 1876 1930 1975

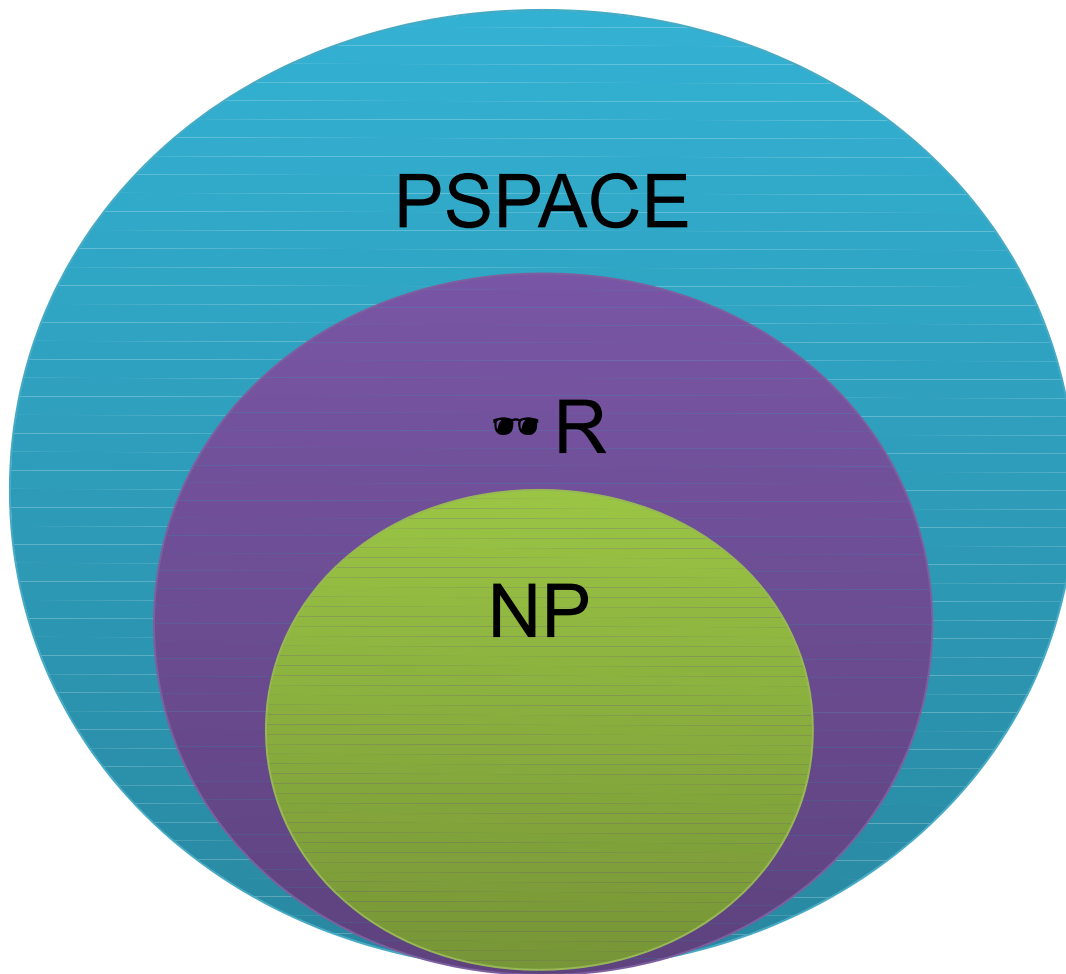


QE by CAD
Doubly exponential

Applications



How hard is R?



PSPACE membership

Canny – 1988,

Grigor'ev – 1988

NP-hardness

x is “Boolean” $x(x-1) = 0$

x or y or z  $x + y + z$

0

CAD “Big Picture”



1. Saturate



2. Search

Our Procedure

Start search before saturate/project

Saturate on demand

Apply SAT solver heuristics

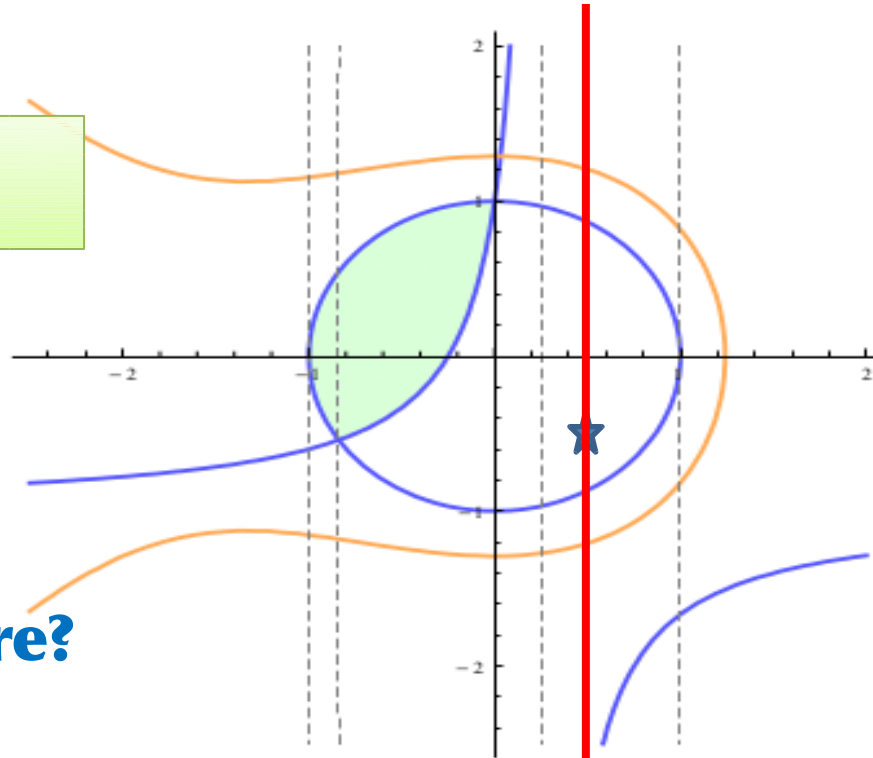
Learn lemmas from conflicts

Non-chronological backtracking

Our Procedure (1)

Key ideas: Use partial solution to guide the search

Feasible Region



What is the core?

Fig. 1. Solutions of $f_2 = x^2 + y^2 - 1 = 0$ and $f_3 = -4xy - 4x + y - 1 = 0$ in blue, solutions of $f_4 = x^3 + 2x^2 + 3y^2 - 5 = 0$ in orange. Solution set of $\{f_2 < 0, f_3 > 0, f_4 < 0\}$ in green. The dashed lines represent the zeroes of the projection set (2).

Our Procedure (2)

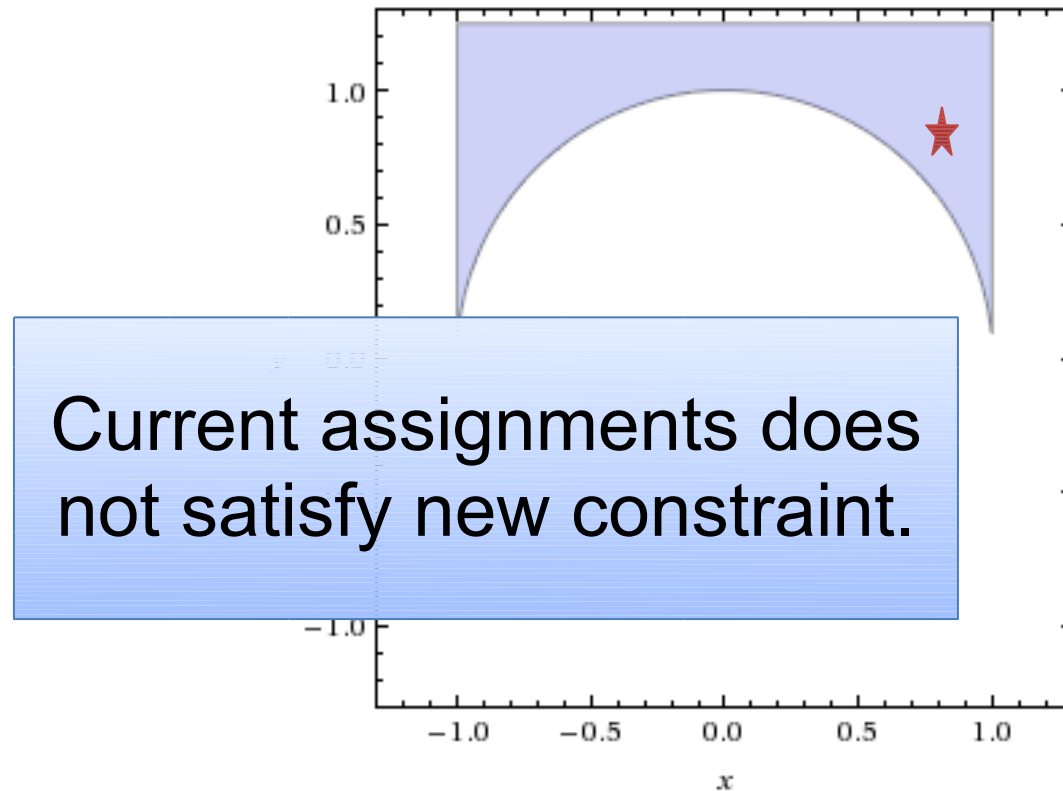
Key ideas: **Nonchronological Backtracking**



Our Procedure (3)

Key ideas: **Lemma Learning**

Prevent a **Conflict** from happening again.



Complexity Trap: P

Efficient

“Real algebraic numbers are efficient”
“CAD is polynomial for a fixed number of variables”

Every detail matters

GCD of two polynomials

Our procedure “dies” in polynomial time steps

Real algebraic number computations

Computing PSCs

Root isolation of polynomials with irrational coefficients

Experimental Results

NEW ENGINE

	meti-tarski (1006)		keymaera (421)		zankl (166)		hong (20)		kissing (45)		all (1658)	
solver	solved	time (s)	solved	time (s)	solved	time (s)	solved	time (s)	solved	time (s)	solved	time (s)
nlsat	1002	343	420	5	89	234	10	170	13	95	1534	849
Mathematica	1006	796	420	171	50	366	9	208	6	29	1491	1572
QEPCAD	991	2616	368	1331	21	38	6	43	4	5	1390	4036
Redlog-VTS	847	28640	419	78	42	490	6	3	10	275	1324	29488
Redlog-CAD	848	21706	363	730	21	173	6	2	4	0	1242	22613
z3	266	83	379	1216	21	0	1	0	0	0	667	1299
iSAT	203	122	291	16	21	24	20	822	0	0	535	986
cvc3	150	13	361	5	12	3	0	0	0	0	523	22
MiniSmt	40	697	35	0	46	1370	0	0	18	44	139	2112

Conclusions

“Logic is the Calculus of Computer Science”

Automating mathematical logic

Logic engines as a service

