Automatic Proofs and Refutations in Isabelle/HOL A Survey

Tobias Nipkow

Institut für Informatik Technische Universität München



Background

Isabelle

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• Interactive theorem prover

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- Based on higher-order logic

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Internal Provers External Provers FO ATPs SMT Solvers SDP Solvers





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Automatic Refutation Nitpick Quickcheck



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The user perspective:

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- Sometimes annoyingly incomplete

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Arithmetic and Algebra

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- arith: linear real arithmetic & Presburger arithmetic
- algebra: Gröbner basis



Automatic Refutation Nitpick Quickcheck



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Sledgehammer



by Paulson, Meng, Susanto, Quigley (at Cambridge) Wenzel, Immler, Meyer, Blanchette (at Munich)



higher-order, typed














































External ATPs act as relevance filter for Metis

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lemma $f xs \neq Suc 0$

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Work in progress!

Sledgehammer: empirical evaluation

Based on 1200 goals from diverse theories covering

- arithmetic
- inductive datatypes
- recursive functions
- inductive definitions
- set theory

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[Böhme, Nipkow, IJCAR 2010]



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Theory rules are lacking valuable information!

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[Böhme, Weber, ITP2010]

Evaluation

SMT-LIB benchmarks:

Logic	Z3			lsabelle		Rates	
		Med.	Med.		Med.		Time-
	#	Time	Size	#	Time	Succ.	out
AUFLIA+p	187	0.03 s	5 KB	187	0.06 s	100%	0%
AUFLIA-p	192	0.04 s	4 KB	190	0.06 s	98%	0%
AUFLIRA	189	0.02 s	16 KB	144	0.04 s	76%	0%
:	:	:	:	:	:	:	:
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Profiling:

- bottleneck: theory reasoning requires expensive proof search
- 50% of the runtime is spent on 15% of all Z3 proof steps


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The sum-of-squares (SOS) method (by John Harrison):

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Example:
$$x^2 + y^2 + z^2 = 1 \Longrightarrow (x + y + z)^2 \le 3$$

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Counterexample Generation: Motivation

Why counterexamples are important

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[Blanchette, Nipkow, ITP-10]

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Nitpick: Empirical Evaluation

Mutation testing:
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Mutation testing:

On average, Nitpick falsifies ${\approx}42\%$ of all mutants

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