

COMP4161: Advanced Topics in Software Verification



based on slides by J. Blanchette, L. Bulwahn and T. Nipkow Gerwin Klein, June Andronick, Ramana Kumar \$2/2016



### Content

DATA IIII CSIRO	)
[1]	

→	Intro	&	motivation,	getting	started
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→ Foundations & Principles

<ul> <li>Lambda Calculus, natural deduction</li> </ul>	[1,2]
Higher Order Logic	[3ª]
<ul> <li>Term rewriting</li> </ul>	[4]

→ Proof & Specification Techniques

Inductively defined sets, rule induction

	[-]
<ul> <li>Datatypes, recursion, induction</li> </ul>	[6, 7]
<ul> <li>Hoare logic, proofs about programs, C verification</li> </ul>	$[8^{b}, 9]$

(mid-semester break)

<ul> <li>Writing Automated Proof Methods</li> </ul>	[10]
	[110.10]

Isar, codegen, typeclasses, locales [11c,12]

<sup>&</sup>lt;sup>a</sup>a1 due: <sup>b</sup>a2 due: <sup>c</sup>a3 due



### **Automatic Proof and Disproof**

→ Sledgehammer: automatic proofs



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→ Quickcheck: counter example by testing



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→ Sledgehammer: automatic proofs

→ Quickcheck: counter example by testing

→ Nipick: counter example by SAT

Based on slides by Jasmin Blanchette, Lukas Bulwahn, and Tobias Nipkow (TUM).



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### The key:

Efficient reasoning engines, and restricted logics.

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- 1980s rule applications, write ML code
- 1990s simplifier, automatic provers (blast, auto), arithmetic
- 2000s embrace external tools, but don't trust them (ATP/SMT/SAT)

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  - → Users don't need to select or know facts
  - → or ensure the problem is first-order
  - → or know anything about the automated prover

# Sledgehammer



#### Sledgehammer:

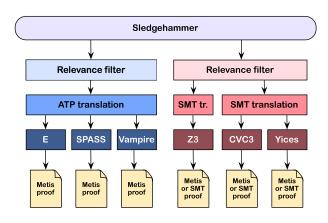
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  - → or know anything about the automated prover
- → Exploits local parallelism and remote servers



**Demo: Sledgehammer** 

# **Sledgehammer Architecture**





## **Fact Selection**



### Provers perform poorly if given 1000s of facts.

- → Best number of facts depends on the prover
- → Need to take care which facts we give them
- → Idea: order facts by relevance, give top n to prover (n = 250, 1000, . . . )



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- → Meng & Paulson method: lightweight, symbol-based filter
- → Machine learning method: look at previous proofs to get a probability of relevance



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#### → Encode types:

- → Monomorphise (generate multiple instances), or
- → Encode polymorphism on term level



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- → Recast into structured Isar proof Fast, experimental.



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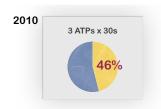
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- → 2013: Machine learning for fact selection. 69% Improves a few percent across provers.

### **Evaluation**





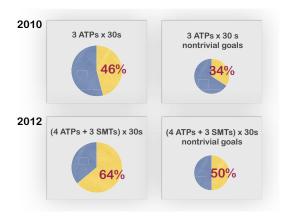
### **Evaluation**





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### Sledgehammer rules!



#### **Example application:**

- → Large Isabelle/HOL repository of algebras for modelling imperative programs (Kleene Algebra, Hoare logic, . . ., ≈ 1000 lemmas)
- → Intricate refinement and termination theorems
- → Sledgehammer and Z3 automate algebraic proofs at textbook level.

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"The integration of ATP, SMT, and Nitpick is for our purposes very very helpful." – G. Struth





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Find counter examples automatically!

### Quickcheck



Lightweight validation by testing.

### Quickcheck



#### Lightweight validation by testing.

- → Motivated by Haskell's QuickCheck
- → Uses Isabelle's code generator
- → Fast
- → Runs in background, proves you wrong as you type.

### Quickcheck



#### Covers a number of testing approaches:

- → Random and exhausting testing.
- → Smart test data generators.
- → Narrowing-based (symbolic) testing.

Creates test data generators automatically.



## Test generators for datatypes



#### Fast iteration in continuation-passing-style

**datatype** 
$$\alpha$$
 list = Nil | Cons  $\alpha$  ( $\alpha$  list)

#### **Test function:**

$$test_{\alpha \ list} P = P \ Nil \ and also \ test_{\alpha} \ (\lambda x. \ test_{\alpha \ list} \ (\lambda xs. \ P \ (Cons \ x \ xs)))$$



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Use data flow analysis to figure out which variables must be computed and which generated.

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#### Pays off if large search spaces can be discarded:

distinct (Cons 1 (Cons  $1 \times 1$ ))

False for any x, no further instantiations for x necessary.

#### Implementation:

Lazy execution with outer refinement loop. Many re-computations, but fast.

### **Quickcheck Limitations**



#### Only executable specifications!

- → No equality on functions with infinite domain
- → No axiomatic specifications



### **Nitpick**



#### Finite model finder

- → Based on SAT via Kodkod (backend of Alloy prover)
- → Soundly approximates infinite types

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- → Algebraic methods
- → C++ memory model
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#### Fan mail:

"Last night I got stuck on a goal I was sure was a theorem. After 5–10 minutes I gave Nitpick a try, and within a few secs it had found a splendid counterexample—despite the mess of locales and type classes in the context!"



### We have seen today ...



→ Proof: Sledgehammer

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→ Proof: Sledgehammer

→ Counter examples: Quickcheck

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