

## Content

$\rightarrow$ Intro \& motivation, getting started
$\rightarrow$ Foundations \& Principles

- Lambda Calculus, natural deduction
- Higher Order Logic [3a]
- Term rewriting [4]
$\rightarrow$ Proof \& Specification Techniques
- Inductively defined sets, rule induction
- Datatypes, recursion, induction
- Hoare logic, proofs about programs, C verification
- (mid-semester break)
- Writing Automated Proof Methods
- Isar, codegen, typeclasses, locales

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## Overview

## Automatic Proof and Disproof

$\rightarrow$ Sledgehammer: automatic proofs

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$\rightarrow$ Sledgehammer: automatic proofs
$\rightarrow$ Quickcheck: counter example by testing
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Based on slides by Jasmin Blanchette, Lukas Bulwahn, and Tobias Nipkow (TUM).

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Dramatic improvements in fully automated proofs in the last 2 decades.

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The key:
Efficient reasoning engines, and restricted logics.

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2000s embrace external tools, but don't trust them (ATP/SMT/SAT)

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$\rightarrow$ or know anything about the automated prover
$\rightarrow$ Exploits local parallelism and remote servers


Demo: Sledgehammer

## Sledgehammer Architecture

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## Fact Selection

Provers perform poorly if given 1000s of facts.
$\rightarrow$ Best number of facts depends on the prover
$\rightarrow$ Need to take care which facts we give them
$\rightarrow$ Idea: order facts by relevance, give top $n$ to prover ( $n=250,1000, \ldots$ )


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


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$\rightarrow$ First-order:
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$\rightarrow$ Explicit function application operator
$\rightarrow$ Encode types:
$\rightarrow$ Monomorphise (generate multiple instances), or
$\rightarrow$ Encode polymorphism on term level

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$\rightarrow$ Recast into structured Isar proof Fast, experimental.

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$\rightarrow$ 2012: Better integration with SPASS. 64\% SPASS best (small margin)
$\rightarrow$ 2013: Machine learning for fact selection. 69\% Improves a few percent across provers.

## Evaluation



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3 ATPs $\times 30 \mathrm{~s}$ nontrivial goals

34\%

## Evaluation



## Sledgehammer rules!

## Example application:

$\rightarrow$ Large Isabelle/HOL repository of algebras for modelling imperative programs (Kleene Algebra, Hoare logic, ..., $\approx 1000$ lemmas)
$\rightarrow$ Intricate refinement and termination theorems
$\rightarrow$ 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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Disproof

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Find counter examples automatically!

## Quickcheck

Lightweight validation by testing.

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

## Quickcheck

Covers a number of testing approaches:
$\rightarrow$ Random and exhausting testing.
$\rightarrow$ Smart test data generators.
$\rightarrow$ Narrowing-based (symbolic) testing.

Creates test data generators automatically.


## Demo: Quickcheck

## Test generators for datatypes

Fast iteration in continuation-passing-style

$$
\text { datatype } \alpha \text { list }=\text { Nil } \mid \text { Cons } \alpha \text { ( } \alpha \text { list) }
$$

Test function:
$\operatorname{test}_{\alpha}$ list $\mathrm{P}=\mathrm{P}$ Nil andalso test ${ }_{\alpha}\left(\lambda \times\right.$. test $_{\alpha}$ list $(\lambda \times s . \mathrm{P}($ Cons $\left.\mathrm{x} \times \mathrm{s}))\right)$

## Test generators for predicates

## distinct $\mathrm{xs} \Longrightarrow$ distinct (remove1 $\times \mathrm{xs}$ )

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

## Narrowing

Symbolic execution with demand-driven refinement
$\rightarrow$ Test cases can contain variables
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False for any $x$, no further instantiations for $x$ necessary.

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Pays off if large search spaces can be discarded: distinct (Cons 1 (Cons $1 \times$ ))
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!

$\rightarrow$ No equality on functions with infinite domain
$\rightarrow$ No axiomatic specifications


Nitpick





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## 

## Nitpick

## Finite model finder

$\rightarrow$ Based on SAT via Kodkod (backend of Alloy prover)
$\rightarrow$ Soundly approximates infinite types

## Nitpick Successes

$\rightarrow$ Algebraic methods
$\rightarrow$ C ++ memory model
$\rightarrow$ Found soundness bugs in TPS and LEO-II

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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!"


Demo: Nitpick

## We have seen today ...

$\rightarrow$ Proof: Sledgehammer

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$\rightarrow$ Proof: Sledgehammer
$\rightarrow$ Counter examples: Quickcheck

## We have seen today ...

$\rightarrow$ Proof: Sledgehammer
$\rightarrow$ Counter examples: Quickcheck
$\rightarrow$ Counter examples: Nitpick


[^0]:    ${ }^{a}$ a1 due; ${ }^{b}$ a2 due; ${ }^{c}$ a3 due

