

# COMP4161

## Advanced Topics in Software Verification



based on slides by J. Blanchette, L. Bulwahn and T. Nipkow

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# Content

## → Foundations & Principles

- Intro, Lambda calculus, natural deduction [1,2]
- Higher Order Logic, Isar (part 1) [2,3<sup>a</sup>]
- Term rewriting [3,4]

## → Proof & Specification Techniques

- Inductively defined sets, rule induction [4,5]
- Datatype induction, primitive recursion [5,7]
- General recursive functions, termination proofs [7]
- Proof automation, Isar (part 2) [8<sup>b</sup>]
- Hoare logic, proofs about programs, invariants [8,9]
- C verification [9,10]
- Practice, questions, exam prep [10<sup>c</sup>]

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

# Overview

## Part 1: Automatic Proof and Disproof

- Sledgehammer: automatic proofs
- Quickcheck: counter example by testing
- Nitpick: counter example by SAT

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

## Part 2: Structured Proofs

# Automation

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

- First-order logic (ATP): Otter, Vampire, E, SPASS
- Propositional logic (SAT): MiniSAT, Chaff, RSat
- SAT modulo theory (SMT): CVC3/4/5, Yices, Z3

## The key:

*Efficient reasoning engines, and **restricted logics**.*

# Automation in Isabelle

*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)*

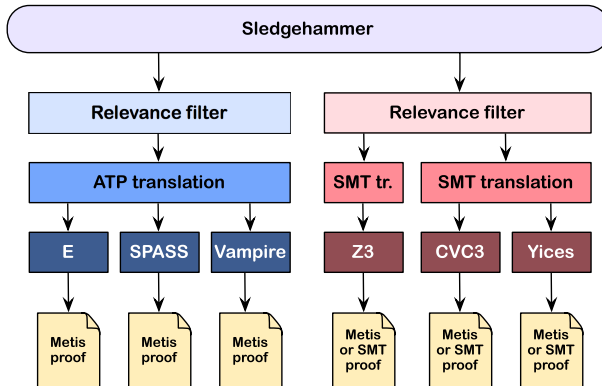
# Sledgehammer

## Sledgehammer:

- *Connects Isabelle with ATPs and SMT solvers:  
E, SPASS, Vampire, CVC4, Yices, Z3*
- *Simple invocation:*
  - *Users don't need to select or know facts*
  - *or ensure the problem is first-order*
  - *or know anything about the automated prover*
- *Exploits local parallelism and remote servers*

**DEMO: SLEDGEHAMMER**

# Sledgehammer Architecture

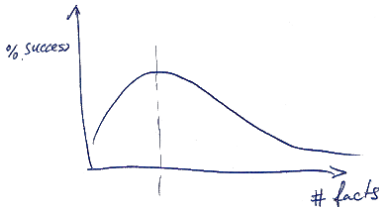




# Fact Selection

## 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 ( $n = 250, 1000, \dots$ )
- Meng & Paulson method: *lightweight, symbol-based filter*
- Machine learning method:  
*look at previous proofs to get a probability of relevance*



# From HOL to FOL

**Source:** *higher-order, polymorphism, type classes*

**Target:** *first-order, untyped or simply-typed*

→ **First-order:**

→ *SK combinators,  $\lambda$ -lifting*

→ *Explicit function application operator*

→ **Encode types:**

→ *Monomorphise (generate multiple instances), or*

→ *Encode polymorphism on term level*

# Reconstruction

***We don't want to trust the external provers.***

*Need to check/reconstruct proof.*

- *Re-find using Metis*  
*Usually fast and reliable (sometimes too slow)*
- *Rerun external prover for trusted replay*  
*Used for SMT. Re-runs prover each time!*
- *Recheck stored explicit external representation of proof*  
*Used for SMT, no need to re-run. Fragile.*
- *Recast into structured Isar proof*  
*Fast, not always readable.*

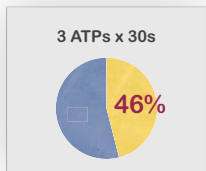
# Judgement Day (up to 2013)

## **Evaluating Sledgehammer:**

- 1240 goals out of 7 existing theories.
- How many can sledgehammer solve?
  
- **2010:** E, SPASS, Vampire (for 5-120s). 46%  
 *$ESV \times 5s \approx V \times 120s$*
- **2011:** Add E-SInE, CVC2, Yices, Z3 (30s).  
 *$Z3 > V$*
- **2012:** Better integration with SPASS. 64%  
*SPASS best (small margin)*
- **2013:** Machine learning for fact selection. 69%  
*Improves a few percent across provers.*

# Evaluation

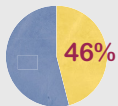
2010



# Evaluation

2010

3 ATPs x 30s



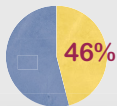
3 ATPs x 30 s  
nontrivial goals



# Evaluation

2010

3 ATPs x 30s

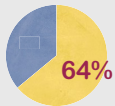


3 ATPs x 30 s  
nontrivial goals



2012

(4 ATPs + 3 SMTs) x 30s



(4 ATPs + 3 SMTs) x 30s  
nontrivial goals



# Judgement Day (2016)

Prover	MePo	MaSh	MeSh	Any selector
CVC4 1.5pre	679	749	<b>783</b>	830
E 1.8	622	601	<b>665</b>	726
SPASS 3.8ds	678	684	<b>739</b>	789
Vampire 3.0	703	698	<b>740</b>	789
veriT 2014post	543	556	<b>590</b>	655
Z3 4.3.2pre	638	668	<b>703</b>	788
Any prover	801	885	<b>919</b>	943

**Fig. 15** Number of successful Sledgehammer invocations per prover on 1230 Judgment Day goals

$$919/1230 = 74\%$$



# Sledgehammer rules!

## ***Example application:***

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

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

**DISPROOF**

# Theorem proving and testing

***Testing can show only the presence of errors, but not their absence. (Dijkstra)***

*Testing cannot prove theorems, but it can refute conjectures!*

## ***Sad facts of life:***

- *Most lemma statements are wrong the first time.*
- *Theorem proving is expensive as a debugging technique.*

**Find counter examples automatically!**

# 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.*
  - ***You have probably seen this already!***

# Quickcheck

## ***Covers a number of testing approaches:***

- *Random and exhaustive testing.*
- *Smart test data generators.*
- *Narrowing-based (symbolic) testing.*

Creates test data generators automatically.

**DEMO: QUICKCHECK**

# Test generators for datatypes

## Fast iteration in continuation-passing-style

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

### Test function:

$\text{test}_{\alpha \text{ list}} P = P \text{ Nil } \textit{andalso} \text{test}_{\alpha} (\lambda x. \text{test}_{\alpha \text{ list}} (\lambda xs. P (\text{Cons } x \text{ xs})))$

# Test generators for predicates

$\text{distinct } xs \implies \text{distinct } (\text{remove1 } x \text{ } xs)$

## **Problem:**

*Exhaustive testing creates many useless test cases.*

## **Solution:**

*Use definitions in precondition for smarter generator.*

*Only generate cases where  $\text{distinct } xs$  is true.*

*$\text{test-distinct}_{\alpha} \text{ list } P = P \text{ Nil}$  and also*

*$\text{test}_{\alpha} (\lambda x. \text{test-distinct}_{\alpha} \text{ list } (if\ x \notin xs\ then\ (\lambda xs. P\ (Cons\ x\ xs))\ else\ True))$*

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



# Narrowing

## ***Symbolic execution with demand-driven refinement***

- *Test cases can contain variables*
- *If execution cannot proceed: instantiate with further symbolic terms*

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

*distinct (Cons 1 (Cons 1 x))*

*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*

# Nitpick Successes

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

## 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**

# Automation Summary

- Proof: Sledgehammer
- Counter examples: Quickcheck
- Counter examples: Nitpick

# ISAR (PART 1)

A LANGUAGE FOR STRUCTURED PROOFS



# Motivation

Is this true:  $(A \longrightarrow B) = (B \vee \neg A)$  ?

# Motivation

Is this true:  $(A \longrightarrow B) = (B \vee \neg A)$  ?

YES!

```
apply (rule iffI)
  apply (cases A)
    apply (rule disjI1)
    apply (erule impE)
    apply assumption
  apply assumption
  apply (rule disjI2)
  apply assumption
  apply (rule impI)
  apply (erule disjE)
  apply assumption
  apply (erule notE)
  apply assumption
done
```

or by blast

OK it's true. But WHY? This doesn't look like typical maths proofs.

# Isar

## apply scripts

- hard to read
- hard to maintain

**No explicit structure.**

## What about..

- Elegance?
- Explaining deeper insights?

**Isar!**

## A typical Isar proof

```
proof  
  assume  $formula_0$   
  have  $formula_1$  by simp  
   $\vdots$   
  have  $formula_n$  by blast  
  show  $formula_{n+1}$  by ...  
qed
```

proves  $formula_0 \implies formula_{n+1}$

(analogous to **assumes/shows** in lemma statements)

# Isar core syntax

proof = **proof** [method] statement\* **qed**  
| **by** method

method = (simp ...) | (blast ...) | (rule ...) | ...

statement = **fix** variables  $(\wedge)$   
| **assume** proposition  $(\implies)$   
| [**from** name<sup>+</sup>] (**have** | **show**) proposition proof  
| **next** (separates subgoals)

proposition = [name:] formula

## proof and qed

**proof** [method] statement\* **qed**

**lemma** "[A; B]  $\implies$  A  $\wedge$  B"

**proof** (rule conjI)

**assume** A: "A"

**from** A **show** "A" **by** assumption

**next**

**assume** B: "B"

**from** B **show** "B" **by** assumption

**qed**

- **proof** (<method>) applies method to the stated goal
- **proof** applies a single rule that fits
- **proof -** does nothing to the goal

# How do I know what to Assume and Show?

## Look at the proof state!

**lemma** " $\llbracket A; B \rrbracket \implies A \wedge B$ "

**proof** (rule conjI)

- **proof** (rule conjI) changes proof state to
  1.  $\llbracket A; B \rrbracket \implies A$
  2.  $\llbracket A; B \rrbracket \implies B$
- so we need 2 shows: **show** "A" and **show** "B"
- We are allowed to **assume** A,  
because A is in the assumptions of the proof state.

# The Three Modes of Isar

- **[prove]**:  
goal has been stated, proof needs to follow.
- **[state]**:  
proof block has opened or subgoal has been proved,  
new *from* statement, goal statement or assumptions can follow.
- **[chain]**:  
*from* statement has been made, goal statement needs to follow.

**lemma** "[A; B]  $\implies$  A  $\wedge$  B" **[prove]**

**proof** (rule conj) **[state]**

**assume** A: "A" **[state]**

**from** A **[chain]** **show** "A" **[prove]** **by** assumption **[state]**

**next** **[state]** ...



# Have

Can be used to make intermediate steps.

## Example:

**lemma** "(x :: nat) + 1 = 1 + x"

**proof** -

**have** A: "x + 1 = Suc x" **by** simp

**have** B: "1 + x = Suc x" **by** simp

**show** "x + 1 = 1 + x" **by** (simp only: A B)

**qed**

**DEMO**

# Backward and Forward

## Backward reasoning: ... have " $A \wedge B$ " proof

- **proof** picks an **intro** rule automatically
- conclusion of rule must unify with  $A \wedge B$

## Forward reasoning: ...

**assume** AB: " $A \wedge B$ "

**from** AB **have** "... " **proof**

- now **proof** picks an **elim** rule automatically
- triggered by **from**
- first assumption of rule must unify with AB

## General case: from $A_1 \dots A_n$ have $R$ proof

- first  $n$  assumptions of rule must unify with  $A_1 \dots A_n$
- conclusion of rule must unify with  $R$

## Fix and Obtain

**fix**  $v_1 \dots v_n$

Introduces new arbitrary but fixed variables  
( $\sim$  parameters,  $\wedge$ )

**obtain**  $v_1 \dots v_n$  **where**  $\langle \text{prop} \rangle$   $\langle \text{proof} \rangle$

Introduces new variables together with property

# Fancy Abbreviations

this = the previous fact proved or assumed

**then** = **from** this

**thus** = **then show**

**hence** = **then have**

**with**  $A_1 \dots A_n$  = **from**  $A_1 \dots A_n$  this

**?thesis** = the last enclosing goal statement

**DEMO**

## Moreover and Ultimately

**have**  $X_1: P_1 \dots$   
**have**  $X_2: P_2 \dots$   
 $\vdots$   
**have**  $X_n: P_n \dots$   
**from**  $X_1 \dots X_n$  **show**  $\dots$

**have**  $P_1 \dots$   
**moreover have**  $P_2 \dots$   
 $\vdots$   
**moreover have**  $P_n \dots$   
**ultimately show**  $\dots$

wastes brain power  
on names  $X_1 \dots X_n$

## General Case Distinctions

**show** *formula*

**proof** -

**have**  $P_1 \vee P_2 \vee P_3$  <proof>

**moreover** { **assume**  $P_1$  ... **have** ?thesis <proof> }

**moreover** { **assume**  $P_2$  ... **have** ?thesis <proof> }

**moreover** { **assume**  $P_3$  ... **have** ?thesis <proof> }

**ultimately show** ?thesis **by** blast

**qed**

{ ... } is a proof block similar to **proof** ... **qed**

{ **assume**  $P_1$  ... **have**  $P$  <proof> }

stands for  $P_1 \implies P$



## Mixing proof styles

```
from ...  
have ...  
  apply -      make incoming facts assumptions  
  apply (...)  
  ⋮  
  apply (...)  
done
```

**ISAR**

**(PART 2)**

# DATATYPES IN ISAR

## Datatype case distinction

```
proof (cases term)  
  case Constructor1  
  ∴  
next  
∴  
next  
  case (Constructork  $\vec{x}$ )  
  ∴  $\vec{x}$  ∴  
qed
```

**case** (Constructor<sub>*i*</sub>  $\vec{x}$ )  $\equiv$   
**fix**  $\vec{x}$  **assume** Constructor<sub>*i*</sub> : "*term* = Constructor<sub>*i*</sub>  $\vec{x}$ "

## Structural induction for nat

```
show  $P\ n$   
proof (induct  $n$ )  
  case 0 ≡ let ?case =  $P\ 0$   
  ...  
  show ?case  
next  
  case (Suc  $n$ ) ≡ fix  $n$  assume Suc:  $P\ n$   
  ... let ?case =  $P\ (\text{Suc } n)$   
  ...  $n$  ...  
  show ?case  
qed
```

## Structural induction: $\implies$ and $\wedge$

**show** " $\wedge x. A n \implies P n$ "

**proof** (induct  $n$ )

**case** 0

...

**show** ?case

**next**

**case** (Suc  $n$ )

...

...  $n$  ...

...

**show** ?case

**qed**

$\equiv$  **fix**  $x$  **assume** 0: " $A 0$ "  
**let** ?case = " $P 0$ "

$\equiv$  **fix**  $n$  and  $x$   
**assume** Suc: " $\wedge x. A n \implies P n$ "  
" $A (\text{Suc } n)$ "  
**let** ?case = " $P (\text{Suc } n)$ "

# DEMO: DATATYPES IN ISAR

# CALCULATIONAL REASONING



# The Goal

Prove:

$$x \cdot x^{-1} = 1$$

using:    assoc:     $(x \cdot y) \cdot z = x \cdot (y \cdot z)$   
          left\_inv:     $x^{-1} \cdot x = 1$   
          left\_one:     $1 \cdot x = x$

# The Goal

Prove:

$$\begin{aligned}x \cdot x^{-1} &= 1 \cdot (x \cdot x^{-1}) \\ \dots &= 1 \cdot x \cdot x^{-1} \\ \dots &= (x^{-1})^{-1} \cdot x^{-1} \cdot x \cdot x^{-1} \\ \dots &= (x^{-1})^{-1} \cdot (x^{-1} \cdot x) \cdot x^{-1} \\ \dots &= (x^{-1})^{-1} \cdot 1 \cdot x^{-1} \\ \dots &= (x^{-1})^{-1} \cdot (1 \cdot x^{-1}) \\ \dots &= (x^{-1})^{-1} \cdot x^{-1} \\ \dots &= 1\end{aligned}$$

$$\begin{aligned}\text{assoc:} & \quad (x \cdot y) \cdot z = x \cdot (y \cdot z) \\ \text{left\_inv:} & \quad x^{-1} \cdot x = 1 \\ \text{left\_one:} & \quad 1 \cdot x = x\end{aligned}$$

**Can we do this in Isabelle?**

- Simplifier: too eager
- Manual: difficult in apply style
- Isar: with the methods we know, too verbose

# Chains of equations

## The Problem

$$\begin{array}{lcl} a & = & b \\ \dots & = & c \\ \dots & = & d \end{array}$$

shows  $a = d$  by transitivity of  $=$

Each step usually nontrivial (requires own subproof)

## Solution in Isar:

- Keywords **also** and **finally** to delimit steps
- $\dots$ : predefined schematic term variable, refers to right hand side of last expression
- Automatic use of transitivity rules to connect steps

## also/finally

**have** " $t_0 = t_1$ " [proof]

**also**

**have** " $\dots = t_2$ " [proof]

**also**

$\vdots$

**also**

**have** " $\dots = t_n$ " [proof]

**finally**

**show** P

— 'finally' pipes fact " $t_0 = t_n$ " into the proof

calculation register

" $t_0 = t_1$ "

" $t_0 = t_2$ "

$\vdots$

" $t_0 = t_{n-1}$ "

$t_0 = t_n$

## More about also

- Works for all combinations of  $=$ ,  $\leq$  and  $<$ .
- Uses all rules declared as `[trans]`.
- To view all combinations: `print_trans_rules`

# Designing [trans] Rules

**have** = " $h_1 \odot r_1$ " [proof]  
**also**  
**have** " $\dots \odot r_2$ " [proof]  
**also**

## Anatomy of a [trans] rule:

- Usual form: plain transitivity  $\llbracket h_1 \odot r_1; r_1 \odot r_2 \rrbracket \Longrightarrow h_1 \odot r_2$
- More general form:  $\llbracket P \ h_1 \ r_1; Q \ r_1 \ r_2; A \rrbracket \Longrightarrow C \ h_1 \ r_2$

## Examples:

- pure transitivity:  $\llbracket a = b; b = c \rrbracket \Longrightarrow a = c$
- mixed:  $\llbracket a \leq b; b < c \rrbracket \Longrightarrow a < c$
- substitution:  $\llbracket P \ a; a = b \rrbracket \Longrightarrow P \ b$
- antisymmetry:  $\llbracket a < b; b < a \rrbracket \Longrightarrow \textit{False}$
- monotonicity:  $\llbracket a = f \ b; b < c; \bigwedge x \ y. x < y \Longrightarrow f \ x < f \ y \rrbracket \Longrightarrow a < f \ c$

**DEMO**