## Improving the SMT Proof Reconstruction Pipeline in Isabelle/HOL

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## Motivation: Formal Verification

#### Isabelle/HOL:

- · Interactive theorem prover: Human and machine work together
- Expressive language (HOL) and large knowledge base of lemmas
- · Offers a very high level of assurance
- Example: Verified SeL4 Microkernel

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- · Example: Verified SeL4 Microkernel

Proving lemmas can be tedious though...

```
lemma unimportant_detail_with_long_tedious_proof:
    fixes n::int
    assumes "boring n"
    shows "inconsequential n"
```

#### Proof Automation to the Rescue

Isabelle's Sledgehammer tool can help:

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lemma unimportant_detail_with_long_tedious_proof:
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```
Stedgehammer can call
external ATPs
including SMT solvers

spass found a proof...
verit from this: using gauss_neq_0 apply blast (1 ms)
zipperposition found a proof...
zipperposition: Try this: apply (simp add: gauss_eq_0 less_le) (9 ms)
vmpire found a proof...
zipperposition found a proof...
zipperposition found a proof...
zipperposition found a proof...
zipperposition found a proof...
zipperposition: Duplicate proof
vampire: Try this: apply (metis add_diff_cancel_left' diff_minus_eq_add dual_order.strict_trans_done)
```

It learns which facts the solver used and finds an internal proof

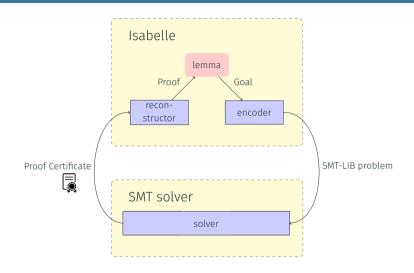
#### **Proof Reconstruction**

Finding an internal proof is not always possible even if the facts are known:

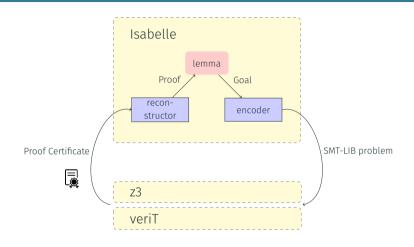
```
Sledgehammering...
Proof found...
"cvc4": Try this: by (metis Collect_cong Sup_lexord_def) (> 1.0 s, timed out)
```

If the solver explains its reasoning in the form of a proof certificate Isabelle can check each step. This increases the rate of success.

## **Proof Automation Circle**



# **Currently Supported Solvers**



Our goal: facilitate adding new proof-producing solvers to Isabelle

## Agenda

Goal: add a new proof-producing solver to Isabelle Running case study: integrating cvc5

- 1. required modifications on the solver-side
- 2. required modifications on the Isabelle-side
- 3. new debugging tools

# Adding a New Solver

Adding reconstruction for a new format is very expensive!

• Isabelle already supports veriT's and z3's proof certificates



Reconstruction should be <u>gratis</u> if the new solver outputs proofs in an existing format.

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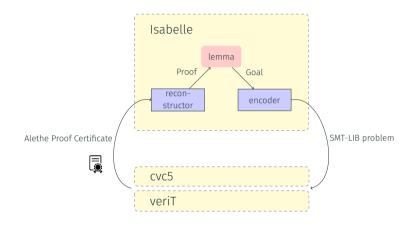
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Reconstruction should be gratis if the new solver outputs proofs in an existing format.

- · z3 format is too coarse, not well documented, and has known bugs
- veriT's output is now called the Alethe format, is generic and has detailed specification

# Adding cvc5 using Alethe Proofs



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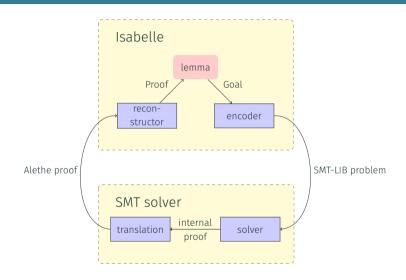


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What if solver does not natively output Alethe proofs?

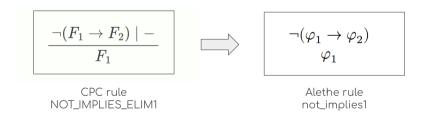
# Proof Replay with Translation into Alethe



## Translation Approach

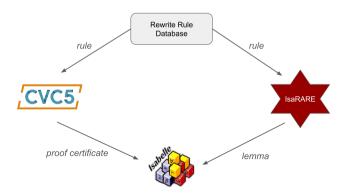
We want to support cvc5 as a proof producing solver in Isabelle

- cvc5's internal proof format is called CPC
- Each proof rule in the original calculus needs to be translated into a Alethe rules
- This adds some overhead in time and proof size
- Most rules are easy to translate!



#### **Automated Translation**

- cvc5 uses hundreds of rewrite rules that might be added or deleted.
   Translating them would be tedious!
- We use IsaRARE to automatically add them to the Isabelle Alethe reconstruction

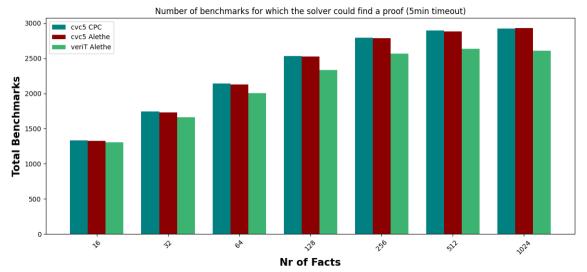


# Making cvc5 Alethe Proof-Producing: Evaluation

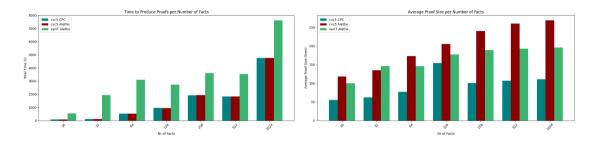
#### **Evaluation**

- · SMT-LIB problems and those generated from Isabelle goals have a very different structure
- $\cdot$  We test on Sledgehammer generated benchmarks from the seventeen provers paper [1]
  - Each set contains the same 5000 problems with different amount of facts included
- We compare cvc5's CPC with cvc5's and veriT's Alethe proofs

#### **Solved Instances**



# Solving Time and Proof Size (on Benchmarks Solved by All Solvers)



#### Conclusion:

- $\cdot$  cvc5 is faster even with the translation overhead to Alethe
- cvc5 Alethe proofs are larger than veriT's proofs.

I'll just plug it into Isabelle and we are done. Thanks for your attention! Any questions? I'll just plug it into Isabelle and we are done.

Thanks for your attention!

Any questions?

Maybe you should try it out first?

#### Problems with the Alethe Reconstruction

Not the whole standard was supported by Isabelle

- veriT produces only a subset of allowed Alethe proofs
- the structure of the problems restricted the fragment even more

Proofs outside of the standard were supported

· it was not clear what was expected by Isabelle

Even updating to a newer version of veriT was not possible without changes!

#### Insights:

- Parts of the Isabelle code were too coupled.
  - E.g., encoding and reconstruction
  - · Developers needed to become experts in every part of the code to fix any bug
  - Efficient testing was not possible. E.g., only one instance of the onepoint rule

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We extensively re-factored and extended the Isabelle code as well as the Alethe standard.

This was a huge team effort!

## The smt Method: An Example Lemma

Search Markers Folding View Utilities Macros Plugins Edit · 🛎 · 😘 🔥 · 💥 📵 📵 · 👸 🚱 · 👕 🔀 😡 💿 · 🗷 🕉 · 🐽 · 🔞 🖠 CENTAUR Demo Bool.thy (\$ISABELLE HOME/src/HOL/SMT Examples/CENTAUR/) Booleans \*) File Browser Documentation lemma assumes " $(p \lor q) \land \neg p$ " shows "q" using assms **bv** (smt (cvc5))

Isabelle/Pure -

## Testing Infrastructure

Great now cvc5 works on the examples we have but how do we know that we actually support Alethe proofs?

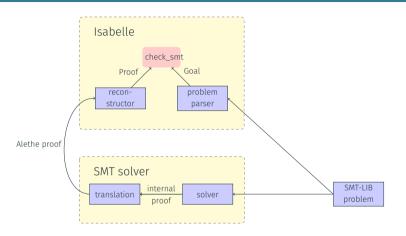
Previous experiments only included an extremely small set of benchmarks ...

In this talk am going to focus on the biggest problem:

For any given Alethe proof rule, can all instances of it can be reconstructed?

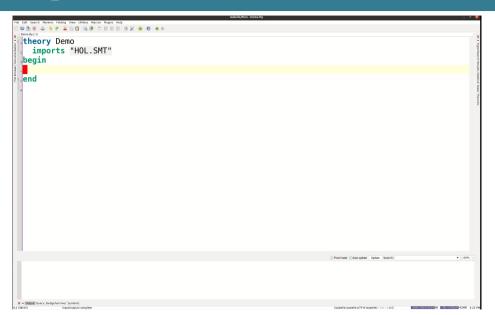
Testing Infrastructure
Enabling large-scale testing

# Decoupling Encoding and Replay



Our tool check\_smt can parse external SMT-LIB problems and check them against an Alethe proof certificate!

## Demo: check\_smt



#### **Evaluation**

**Table 1:** Reconstruction Success. The average (reconstruction) time in ms only takes benchmarks into account that were solved both by veriT and cvc5 and does not take the solving time into account.

Benchmark Set	cvc5 Alethe				veriT Alethe			
	solved	rec.	unique rec.	Av. time	solved	rec.	unique rec.	Av. time
max facts 16	1327	1326	45	386	1305	1295	14	131
max facts 32	1732	1730	100	349	1658	1644	14	133
max facts 64	2130	2123	168	423	2003	1980	25	161
max facts 128	2523	2512	235	528	2335	2309	32	203
max facts 256	2788	2777	276	702	2565	2537	36	215
max facts 512	2881	2869	317	904	2637	2600	48	251
max facts 1024	2927	2916	411	1328	2607	2560	55	343

```
Original Problem

(set-logic QF_UF)
(declare-fun a () Bool)
(declare-fun b () Bool)
(declare-fun c () Bool)
(assert (= c b))
(assert (and (= a b) (=> a c)))
(assert (not (= a c)))
```

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Original Proof
(assume a0 (cl (= c b)))
(assume a1 (cl (and (= a b) (=> a c))))
(assume a2 (cl (not (= a c))))
(step t1 (cl (= a b))
  :rule and :prems a1 :args 0)
(step t2 (cl (= b c))
  :rule symm :prems a0)
(step t3 (cl (= a c))
  :rule trans :prems t1 t2)
(step t4 (cl)
  :rule resolution :prems t3 a2)
```

```
Sliced Problem

(set-logic QF_UF)

(declare-fun a () Bool)

→(declare-fun b () Bool)

(declare-fun c () Bool)

(assert (not (= a c)))

(assert (= a b))

(assert (= b c))
```

```
Original Problem
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(set-logic QF UF)
                                           (set-logic QF UF)
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                                              :rule trans :prems a0 a1)
(step t3 (cl (= a c))
                                           (step t4 (cl)
  :rule trans :prems t1 t2)
                                              :rule resolution :prems a2 t3)
(step t4 (cl)
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```

## **Contributions Summary**

#### SMT solver and Alethe standard:

- · Show that translation from industry-strength solver to Alethe is possible with little overhead
- Small number of holes remaining
- · Correct, refine and extend Alethe standard

#### Isabelle:

- Refactor smt tactic implementation
- Support automatic lemma based reconstruction for simple rules
- Support new solver: cvc5

#### Testing:

- · Isabelle mode for Carcara
- · Slice tool for Carcara
- · Isabelle internal tools and regression test library

# Thank you for your attention

Want to learn more about the cvc5 proof reconstruction project? Check out my blog post on the cvc5 website (https://cvc5.github.io/)

Please feel free to contact me with any questions (lachnitt@stanford.edu):



