

# Components of a Hammer for Type Theory

## Goal Translation and Proof Reconstruction

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# Interactive Proof in Type Theory

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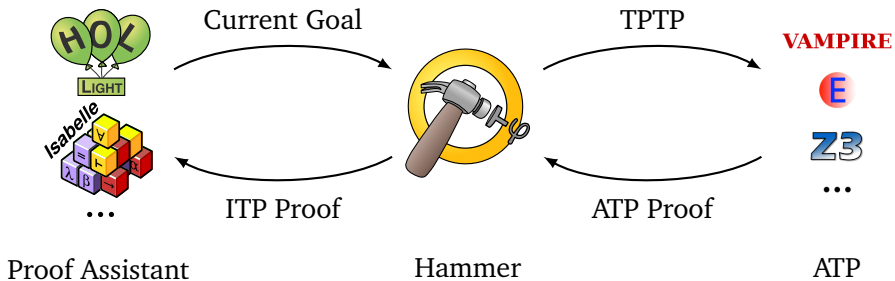
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  - Rewriting: Simp, Subst, HORewrite
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- **AI/ATP** techniques: Hammers
  - MizAR for Mizar
  - Sledgehammer for Isabelle/HOL
  - HOL(y)Hammer for HOL Light and HOL4

# Hammer Overview



# Evaluations

## Top-level goals:

- HOL(y)Hammer
  - Flyspeck text formalization: 47%
  - Similar results for HOL4 and CakeML
- Sledgehammer
  - Probability theory: 40%
  - Term rewriting: 44%
  - Java threads: 59%
- MizAR
  - Mizar Mathematical Library: 40%

## More for subgoals

# For Type Theory?

## Premise selection

- Features
- Machine Learning

## Encoding CoC and variants in formalisms of ATPs

- Soundness? Completeness? **Efficiency!**
- This talk

## Reconstruction: Get an ITP proof

- Extract information from the ATP proof
- **Redo** the proof



# Translation

Target logic

Target logic: untyped FOL with equality.

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    - $\mathcal{C}_\Gamma(t)\mathcal{C}_\Gamma(s)$  otherwise.
  - $\mathcal{C}_\Gamma(\lambda \vec{x} : \vec{t}.s) = F\vec{y}$  where  $s$  does not start with a lambda-abstraction any more,  $F$  is a fresh constant,  $\vec{y} = \text{FV}(\lambda \vec{x} : \vec{t}.s)$  and  $\forall \vec{y}.\mathcal{F}_\Gamma(\forall \vec{x} : \vec{t}.F\vec{y}\vec{x} = s)$  is a new axiom.

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- Translate the typing of the inductive definition.
- Translate induction principles and recursor definitions.



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- Do automatic proof search using our tactic `yreconstr`.

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- If a subterm of the form `match x with ...` occurs in the goal or in one of the hypotheses, then destruct `x`.
- Use an `isolve` tactic at the leaves of the search tree: a combination of `Coq`'s `congruence`, `subst`, `easy`, `eauto` tactics, some hypotheses simplification and goal splitting.

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Prover	Solved%	Solved	Sum%	Sum	Unique
Vampire	32.9	6839	32.9	6839	855
Z3	27.6	5734	34.9	7265	390
E Prover	25.8	5376	35.3	7337	72
any	35.3	7337	35.3	7337	

Table 1: Results of the experimental evaluation on the 20803 FOL problems generated from the propositions in the Coq standard library.

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- about 70% provable using `firstorder isolve` provided that generic equality axioms are added to the context.

## Experimental evaluation

Tactic	Time	Solved%	Solved
yreconstr	1s	83.1	6097
yreconstr	2s	85.8	6296
yreconstr	5s	87.5	6421
yreconstr	10s	88.1	6466
yreconstr	15s	88.2	6473
simple	1s	50.1	3674
firstorder'	10s	69.6	5103
jprover	10s	56.1	4114
any		90.1	6609

Table 2: Results of the evaluation of proof reconstruction on the 7337 problems solved by the ATPs.

# Conclusion

- **Provided missing components** of a hammer for type theory
- Efficient encoding in FOL
  - Able to automatically prove **35%** of Coq's standard library
- Simple reconstruction
  - **90%** of the ATP-found proofs can be rebuilt in Coq
- Other libraries?
  - Mathematical Components / SS-Reflect where different automation?
  - Libraries of Matita, Lean, ...?
- **Optimize, optimize, optimize!**
  - Learning
  - Translation
  - Reconstruction