

# Interactive Proofs: Automation, Computer Algebra, Presentation

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August 25, 2014

# Outline

## Automation for Interactive Proof (HOL(y)Hammer)

- Machine Learning

- Translation

- Reconstruction

## Computer Algebra

- Certified Computer Algebra

- SMTs and special functions

## Readable Proofs

- Declarative Proofs

## Conclusion

## Interactive proofs

- ▶ Formal proof **skeleton** + filling in the gaps
  - ▶ Searching for needed theorems
  - ▶ **Tedious** properties
- ▶ Proof structure is lost
  - ▶ Uninteresting parts **overshadow** interesting ones

# Interactive proofs

- ▶ Formal proof **skeleton** + filling in the gaps
  - ▶ Searching for needed theorems
  - ▶ **Tedious** properties
- ▶ Proof structure is lost
  - ▶ Uninteresting parts **overshadow** interesting ones
- ▶ **Automation** for Interactive Proof
  - ▶ Tableaux: Itaut, Tauto, Blast
  - ▶ Rewriting: Simp, Subst, HORewrite
  - ▶ Decision Procedures: Congruence Closure, Ring, Omega, Cooper
- ▶ Large-theory **ATP** and translation techniques
  - ▶ Mizar: MaLARea
  - ▶ Isabelle/HOL: Sledgehammer
  - ▶ HOL(y)Hammer

# HOL(y) Hammer

*Learning-assisted automated  
reasoning for HOL Light*



## Request Advice:

Input the HOL Light formula to prove and select HOL Light session:

- polyhedron p ==> convex (relative\_interior p)
- mv193.

(cache:OK)(session:OK)(parse:OK)S5SSAWAAWAW

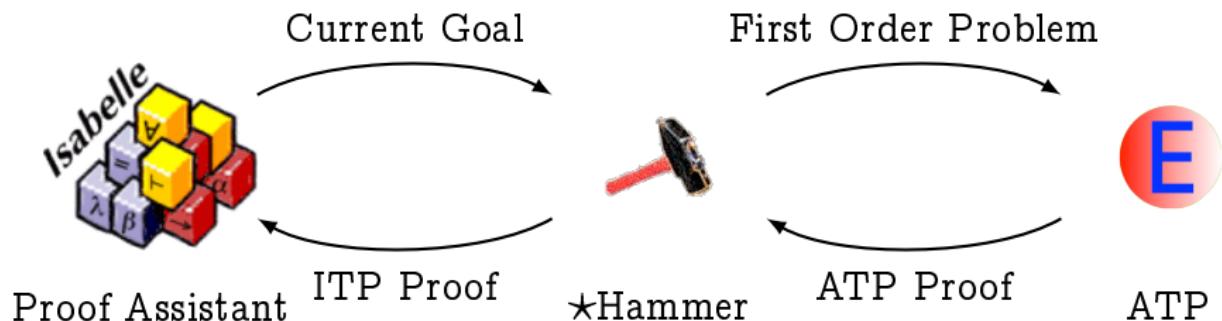
Result (3.81s): CONVEX\_RELATIVE\_INTERIOR POLYHEDRON\_IMP\_CONVEX

Replaying: SUCCESS

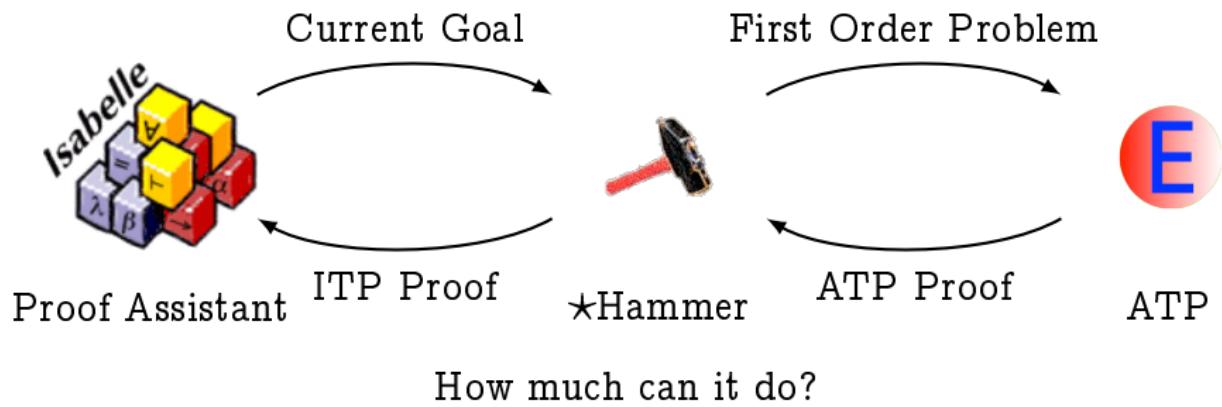
(0.29s):SIMP\_TAC[POLYHEDRON\_IMP\_CONVEX;CONVEX\_RELATIVE\_INTERIOR]

Examples:

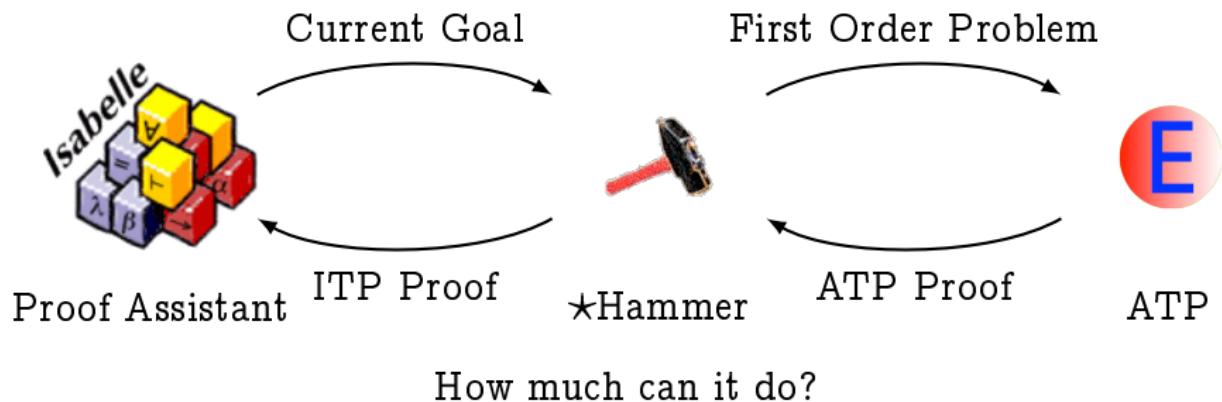
# AI-ATP systems ( $\star$ -Hammers)



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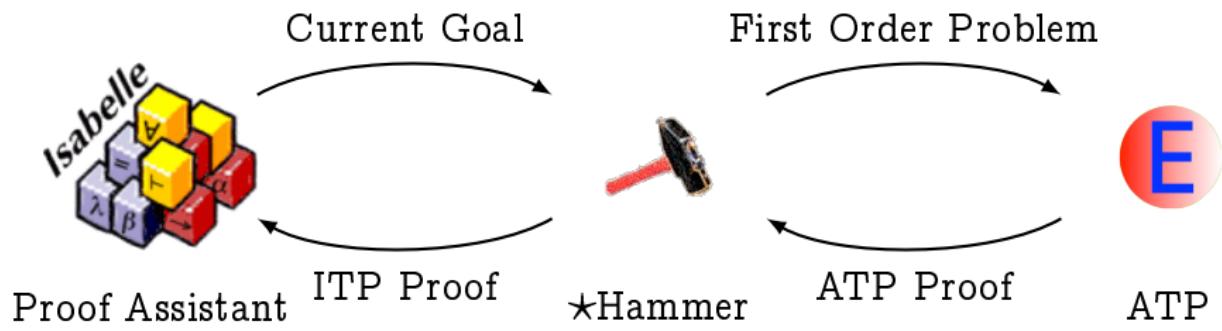


# AI-ATP systems ( $\star$ -Hammers)



- ▶ Flyspeck (including core HOL Light and Multivariate)
- ▶ Mizar / MML
- ▶ Isabelle (Auth, Ninja)

# AI-ATP systems ( $\star$ -Hammers)



How much can it do?

- ▶ Flyspeck (including core HOL Light and Multivariate)
- ▶ Mizar / MML
- ▶ Isabelle (Auth, Ninja)

$\approx 45\%$

# Machine learning techniques

## Algorithms

- ▶ Syntactic methods
  - ▶ Neighbours using various metrics, Recursive (MePo)
- ▶ Sparse Naive Bayes
  - ▶ Variable prior, Confidence
- ▶ k-Nearest Neighbours
  - ▶ TF-IDF, Dependency weighting
- ▶ Neural Networks
  - ▶ Winnow, Perceptron
- ▶ Linear Regression
  - ▶ Needs feature and theorem space reduction

## Combining original and ATP dependencies

- ▶ Added value depends on the precision of human deps

# Translation overview (FOL)

- 1 Heuristic type instantiation
  - ▶ Similar for induction
- 2 Eliminate  $\epsilon$
- 3 Remove  $\lambda$ -abstractions
  - ▶ lifting, combinators, ...
- 4 Optimizations
  - ▶ if..then..else,  $\exists!$
- 5 Separate predicates and terms
  - ▶ Consider cases, introduce bool variables
- 6 NNF, Skolemize
- 7 Use apply functor to make all applications first-order
- 8 Encode remaining types
  - ▶ monomorphisation, tags, guards
- 9 Various optimizations (incomplete)

Similar for TFF1, THF0, ...

## Re-proving (Flyspeck, 30sec)

Prover	Theorem%	CounterSat%	Sotac- $\Sigma$
E-par	38.4	0.0	69.12
Z3-4	36.1	0.0	61.51
E	32.6	0.0	45.44
Leo II	31.0	0.0	45.77
Vampire	30.5	0.0	45.75
CVC3	28.9	0.0	43.36
Satallax	26.9	0.0	48.75
Yices1	25.3	0.0	33.32
IProver	24.5	0.6	29.50
Prover9	24.3	0.0	29.98
Spass	22.9	0.0	26.22
LeanCop	21.4	0.0	26.98
AltErgo	19.8	0.0	26.82
Paradox 4	0.0	18.2	0.06
any	50.2	-	-

# Proof Reconstruction

- ▶ Existing reconstruction mechanisms
  - ▶ Metis, SMT
  - ▶ Mizar by
  - ▶ MESON, Prover9
- ▶ Parse TSTP/SMT proofs
  - ▶ Create subgoals that match ATP intermediate steps
  - ▶ Automatically solve all simple ones
- ▶ High reconstruction rates give confidence in our techniques
  - ▶ Naive reconstruction: 90% (of Flyspeck solved)
    - ▶ MESON, SIMP, ?\_ARITH\_TAC
  - ▶ With TSTP parsing: 96%

# Formal Physics

## Initial experiment

- ▶ Emf and Ray are 476 + 125 proved theorems
- ▶ 3 k-NN strategies and ATP deps only: 36%

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# Computer Algebra Systems

- ▶ Computer programs for **processing** mathematical expressions
  - ▶ simplifications, substitutions, equations, numerical approximations, graphs
- ▶ Easy to use for a beginner
- ▶ Efficient

Problems with Computer Algebra Systems:

- ▶ **Uncertified** Algorithms,
- ▶ Tracking Assumptions,
- ▶ **Domain** of variables and **type** of expressions.

Solution: Build a CAS inside a Proof Assistant

- ▶ CAS-like User Interface
- ▶ Abstract Computer Algebra System conversion
- ▶ Knowledge specific for CAS systems

## Computer Algebra Features

- ▶ Numerical approximation
  - ▶ Is **not** a computable function

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$$\begin{aligned}\forall x.(f \text{ diff } g) \ x &\rightarrow \text{diff } f = g \\ (f \text{ diff } g) \ x &\rightarrow (\text{diff } f) \ x = g \ x\end{aligned}$$

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- ▶ Partiality
  - ▶ On paper:  $\dots \frac{1}{x} \dots$
  - ▶ In a PA:  $\forall x \in \mathbb{C}. x \neq 0 \Rightarrow \dots \frac{1}{x} \dots$

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  - ▶ In a PA:  $\forall x \in \mathbb{C}. x \neq 0 \Rightarrow \dots \frac{1}{x} \dots$
- ▶ Real numbers
  - ▶ Either constructive and computable or classical

# Satisfiability Modulo Theories

- ▶ SMT and TFA format

- ▶ Translation of int, rat, real straightforward
- ▶ Translation of nat

$$\forall x : \text{num}. F[x] \rightsquigarrow \forall x' : \text{int}. (x' \geq 0) \Rightarrow F[x']$$

$$F[x : \text{num}] \rightsquigarrow F[x'] \wedge (x' : \text{int} \geq 0)$$

$$F[f] \rightsquigarrow F[f'] \wedge \forall (x' : \text{int}) y. (x' \geq 0) \Rightarrow f'(x', y) \geq 0$$

- ▶ Initial evaluation of Beagle for the types above

- ▶ It proves 81% of conjectures solved by Metis without arithmetic lemmas
- ▶ Reconstruction requires proper traces

- ▶ Metitarski

- ▶ Reasoning modulo special functions

## ATP proof transformation

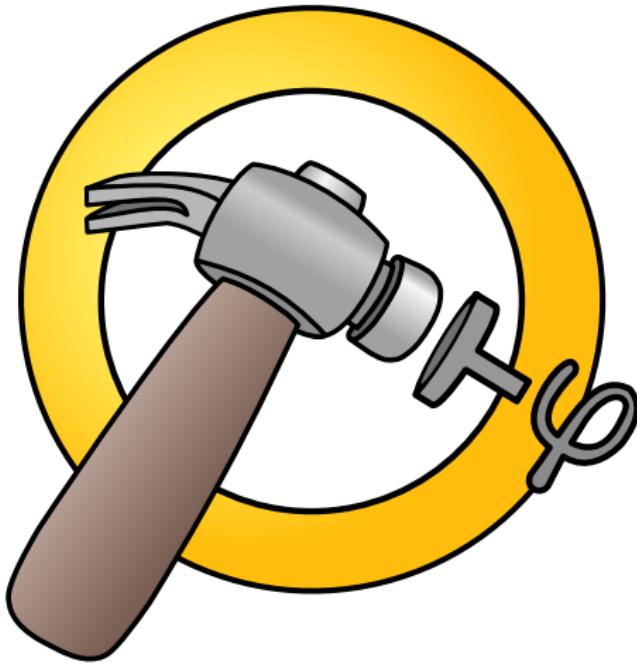
miz3

# Conclusion and Future work

- ▶ Hammer-systems
  - ▶ For Physics
- ▶ Computer Algebra
  - ▶ Translation and Reconstruction
- ▶ Readable Proofs
  - ▶ Good Automation
  - ▶ Declarative?
  - ▶ Rendering

# HOL(y) Hammer

Machine learning based premise selection for HOL Light



<http://cl-informatik.uibk.ac.at/software/hh/>

# References



C. Kaliszyk and J. Urban.  
MizAR 40 for Mizar 40.  
*CoRR*, abs/1310.2805, 2013.



C. Kaliszyk and J. Urban.  
PRocH: Proof reconstruction for HOL Light.  
In M. P. Bonacina, editor, *CADE*, volume 7898 of *Lecture Notes in Computer Science*, pages 267–274. Springer, 2013.



C. Kaliszyk and J. Urban.  
HOL(y)Hammer: Online ATP service for HOL Light.  
*Mathematics in Computer Science*, 2014.  
<http://dx.doi.org/10.1007/s11786-014-0182-0>.



C. Kaliszyk and J. Urban.  
Learning-assisted automated reasoning with Flyspeck.  
*Journal of Automated Reasoning*, 2014.  
<http://dx.doi.org/10.1007/s10817-014-9303-3>.



D. Kühlwein, J. C. Blanchette, C. Kaliszyk, and J. Urban.  
MaSh: Machine learning for Sledgehammer.  
In S. Blazy, C. Paulin-Mohring, and D. Pichardie, editors, *Proc. of the 4th International Conference on Interactive Theorem Proving (ITP'13)*, volume 7998 of *LNCS*, pages 35–50. Springer, 2013.



C. Tankink, C. Kaliszyk, J. Urban, and H. Geuvers.  
Formal mathematics on display: A wiki for Flyspeck.  
In J. Carette, D. Aspinall, C. Lange, P. Sojka, and W. Windsteiger, editors, *MKM/Calculemus/DML*, volume 7961 of *Lecture Notes in Computer Science*, pages 152–167. Springer, 2013.