

# The Metis Theorem Prover

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# Talk Plan

- 1 Motivation
- 2 First Order Logic
- 3 Proof Techniques
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# A Familiar Beginning

## Code (Reverse.hs)

```
import Test.QuickCheck(quickCheck)

rev :: [a] -> [a]
rev [] = []
rev (h:t) = rev t ++ [h]

prop :: [Int] -> Bool
prop l = rev (rev l) == l

quickCheck prop
```

## Shell

```
$ ghc -package QuickCheck -o reverse Reverse.hs
$ ./reverse
OK, passed 100 tests.
```

# From Bug-Finding to Assurance

- *“Program testing can be a very effective way to show the presence of bugs, but is hopelessly inadequate for showing their absence”* [Dijkstra, The Humble Programmer]
- How can we do better?
- Formal verification:
  - ① Model the Haskell program in a logic.
  - ② Prove that it satisfies the property.
  - ③ Machine check the proof.
- Perhaps a library of verified functions could be built this way?

# A Logic for Haskell Programs

Finding a suitable logic for Haskell programs is a whole other talk.

- For the sake of an example, will use Higher Order Logic of Computable Functions (a.k.a. HOLCF, a.k.a. domain theory).

## Axioms

- $\text{rev } [] = []$
- $\forall h, t. \text{rev } (h : t) = \text{rev } t ++ [h]$

## Goal

$$\forall l. \text{finite } l \implies \text{rev } (\text{rev } l) = l$$

# Automation Hazard: Creative Step Required!

First need to generalize the goal to make it inductively provable:

Goal (Generalized goal)

$$\forall l, k. \text{finite } l \wedge \text{finite } k \implies \\ \text{rev } (l ++ k) = \text{rev } k ++ l$$

*(Instantiate  $k$  to  $[]$  to recover the original goal.)*

- Automatic generalization is hard.
- To have a reliable QuickCheck-like interface, the programmer would need to provide generalizations as hints.

# List Induction Step

Now a standard induction over finite lists can be applied:

Goal (Base case)

$$\forall k. \text{finite } k \implies \text{rev } (\text{rev } [] ++ k) = \text{rev } k ++ []$$

Goal (Step case)

$$\begin{aligned} \forall t. \text{finite } t \implies \\ (\forall k. \text{finite } k \implies \text{rev } (\text{rev } t ++ k) = \text{rev } k ++ t) \implies \\ \forall h, k. \text{finite } k \implies \text{rev } (\text{rev } (h : t) ++ k) = \text{rev } k ++ (h : t) \end{aligned}$$

# Include Relevant Facts

Some extra facts need to be included to prove the goals:

## Axioms

- $\text{finite } []$
- $\forall h, t. \text{finite } (h : t) \iff \text{finite } t$
- $\forall l_1, l_2. \text{finite } (l_1 ++ l_2) \iff \text{finite } l_1 \wedge \text{finite } l_2$
- $\forall l. [] ++ l = l$
- $\forall h, t, l. (h : t) ++ l = h : (t ++ l)$
- $\forall l. l ++ [] = l$
- $\forall l_1, l_2, l_3. l_1 ++ (l_2 ++ l_3) = (l_1 ++ l_2) ++ l_3$

These would be previously proved properties in the library.



# Applying Metis

We are now in a position to apply the Metis 'automatic' prover:

## Shell

```
$ ./metis rev_rev.tptp
```

```
-----
Problem: rev_rev.tptp
```

Goal:

```
finite [] ^ (!H T. finite (H : T) <=> finite T) ^
(!L1 L2. finite (L1 ++ L2) <=> finite L1 ^ finite L2) ^
(!L. [] ++ L = L) ^ (!H T L. (H : T) ++ L = H : T ++ L) ^
rev [] = [] ^ (!H T. rev (H : T) = rev T ++ H : []) ^
(!L. L ++ [] = L) ^ (!L1 L2 L3. L1 ++ L2 ++ L3 = (L1 ++ L2) ++ L3) ==>
(!K. finite K ==> rev (rev [] ++ K) = rev K ++ []) ^
!T.
  finite T ==> (!K. finite K ==> rev (rev T ++ K) = rev K ++ T) ==>
    !H K. finite K ==> rev (rev (H : T) ++ K) = rev K ++ H : T
```

```
Size: 19 clauses, 34 literals, 149 symbols, 149 typed symbols.
```

```
Category: non-propositional, equality, non-horn.
```

```
SZS status Theorem for rev_rev.tptp
```

# Term Syntax

Here is the BNF for the *terms* of first order logic:

$$\begin{array}{l} \text{Term} \leftarrow \text{Var} \\ \quad | \quad f(\text{Term}_1, \dots, \text{Term}_m) \end{array}$$

Terms with no variables are called *ground terms*.

# Formula Syntax

And now the *formulas*:

Formula	←	True	
		False	
		$p(\text{Term}_1, \dots, \text{Term}_n)$	<i>/* atoms */</i>
		$\neg$ Formula	
		Formula $\wedge$ Formula	
		Formula $\vee$ Formula	
		Formula $\implies$ Formula	
		Formula $\iff$ Formula	
		$\forall$ Var. Formula	
		$\exists$ Var. Formula	

As usual, a *closed formula* is one with no free variables.

# Signatures and Interpretations

- A first order *signature* is a set of possible function  $f/m$  and predicate  $p/n$  symbols (together with their arity).
- An *interpretation* of a signature is a pair  $(D, I)$ .
  - $D$  is any non-empty set, called the *domain* of elements.
  - $I$  maps the functions and predicate symbols in the signature to domain functions and predicates:

$$I(f/m) : D^m \rightarrow D \quad I(p/n) : D^n \rightarrow \mathbb{B}$$

- **Special case:** First order logic with equality always interprets the equality predicate symbol ( $=/2$ ) to be the equality relation on the domain.

# Semantics

- Given a fixed interpretation, every (closed) formula either evaluates to true or false.
- An interpretation that makes a formula true is called a model.
  - A formula with no models is called *unsatisfiable*.
  - A formula with some models is called *satisfiable*.
  - If every interpretation is a model, the formula is called a *tautology*.
- In verification we normally have a correctness formula that we'd like to prove is a tautology.

# The Bad News: Undecidability

There is no algorithm to decide whether a first order logic formula is a tautology:

$$\begin{aligned}
 & (\forall x, y. ((k . x) . y) \rightarrow x) && \wedge \\
 & (\forall x, y, z. (((s . x) . y) . z) \rightarrow (x . z) . (y . z)) && \wedge \\
 & (\forall x, x', y. x \rightarrow x' \implies (x . y) \rightarrow (x' . y)) && \wedge \\
 & (\forall x, y, y'. y \rightarrow y' \implies (x . y) \rightarrow (x . y')) && \wedge \\
 & (\forall x. (\neg \exists y. x \rightarrow y) \implies \text{terminating } x) && \wedge \\
 & (\forall x, y. x \rightarrow y \wedge \text{terminating } y \implies \text{terminating } x) \\
 & \implies \\
 & \text{terminating (big s and k expression)}
 \end{aligned}$$

**The slightly better news:** The problem is semi-decidable.

# Metis Overview

Metis uses the following program to compute whether a closed formula  $F$  is a tautology:

- 1 Convert  $\neg F$  to an equi-satisfiable set of clauses.
- 2 Deduce more clauses from the current set until one of the following conditions is met:
  - If the empty clause (i.e., False) is ever deduced, then  $\neg F$  is unsatisfiable. Report that  $F$  is a tautology and terminate.
  - If no new clauses can be deduced, then  $\neg F$  is satisfiable. Report that  $F$  is not a tautology and terminate.

Because the problem is semi-decidable, we know there are non-tautologies that will cause the program to loop forever.

# Normalization to Clauses

- A *clause* is a disjunction of literals:  $L_1 \vee \dots \vee L_n$ .
  - A *literal* is either an atom or a negation of an atom.
- How to convert an an arbitrary formula to an equi-satisfiable set of clauses?
  - 1 Convert all logical operations to  $\neg$ ,  $\vee$  and  $\wedge$ .
  - 2 Push the  $\neg$  operations to the leaves.
  - 3 Lift the  $\exists$  and  $\forall$  quantifiers to the top.
  - 4 Push the  $\vee$  operations beneath the  $\wedge$ .
  - 5 Introduce Skolem constants to eliminate the  $\exists$  quantifiers.
  - 6 Drop the  $\forall$  quantifiers and  $\wedge$  operations.
- Introducing formula definitions avoids exponential blow-up in Steps 1 and 4.



# Search Space

- The search space is all the possible clauses that can be deduced.
- However, it is not necessary to deduce **all** clauses, just enough to generate a proof (if there is one).
- **Example:** It is never useful to keep tautologous clauses

$$L \vee \neg L \vee C$$

- **Warning:** It is valid for a search space reduction strategy to eliminate all short proofs, so long as one proof is still reachable.

# Knuth-Bendix Term Ordering

- Term orderings are commonly used to reduce the search space.
- A *term ordering*  $\preceq$  is a well-founded total order on ground terms, such that if  $s \preceq t$  then  $t$  is not a strict subterm of  $s$ .
- **Note:** If  $s$  or  $t$  contain variables, there might be grounding instantiations  $\sigma_1$  and  $\sigma_2$  with

$$s\sigma_1 \preceq t\sigma_1 \quad t\sigma_2 \preceq s\sigma_2$$

- Metis uses the Knuth-Bendix term ordering, which essentially just counts the number of symbols in the term.

# Ordered Resolution

In the beginning there was enumeration of terms. In 1965 Robinson introduced the resolution rule, which uses unification to combine clauses.

## Inference Rule (Resolution)

$$\frac{C \vee A \quad D \vee \neg B}{C\sigma \vee D\sigma}$$

where

- 1  $\sigma = mgu(A, B)$ .
- 2  $L\sigma \preceq A\sigma$  is satisfiable for every literal  $L$  in  $C \cup D$ .

# Ordered Factoring

Resolution is not complete without factoring.

## Inference Rule (Factoring)

$$\frac{C \vee A \vee B}{C\sigma \vee A\sigma}$$

where

- 1  $\sigma = \text{mgu}(A, B)$ .
- 2  $L\sigma \preceq A\sigma$  is satisfiable for every literal  $L$  in  $C$ .

# Ordered Paramodulation

There is a special rule for equality.

## Inference Rule (Paramodulation)

$$\frac{C \vee s = t \quad D \vee A}{C\sigma \vee D\sigma \vee A[t]_p\sigma}$$

where

- ①  $A|_p$  is not a variable.
- ②  $\sigma = mgu(s, A|_p)$ .
- ③  $s\sigma \neq t\sigma$ .
- ④  $t\sigma \preceq s\sigma$  is satisfiable.
- ⑤  $L\sigma \preceq (s = t)\sigma$  is satisfiable for every literal  $L$  in  $C$ .
- ⑥  $L\sigma \preceq A\sigma$  is satisfiable for every literal  $L$  in  $D$ .

# Simplification

A big advantage of using a term ordering is that we can simplify clauses and completely throw away the original.

## Inference Rule (Simplification)

$$\frac{\mathcal{C} \cup \{s = t\} \cup \{C \vee A\}}{\mathcal{C} \cup \{s = t\} \cup \{C \vee A[t\sigma]_p\}}$$

where

- 1  $\sigma$  is the result of matching  $s$  to  $A|_p$ .
- 2  $s\sigma \neq t\sigma$ .
- 3  $t\sigma \preceq s\sigma$  is valid.

Example:  $\forall x. x + 0 = x$  will always be used to simplify clauses.

# Main Loop

- Maintain an active and passive set of clauses.
- Initialize the active set to be empty, and the passive set to contain the initial clauses.
- On every iteration of the main loop:
  - ① Take one clause out of the passive set.
  - ② Add a copy of the clause to the active set.
  - ③ Rename the clause with fresh variables.
  - ④ Combine the clause with every clause in the active set.
  - ⑤ Simplify and factor all the newly deduced clauses, and add them to the passive set.
- **Invariant:** All pairs of clauses in the active set have been combined.

# Completeness

- Metis implements a complete search strategy, meaning that in principle it will find a proof for every tautology.
- It is reasonable to ask why it bothers, since in practice it will fail to find many proofs.
  - ① When deployed in an interactive prover, it is annoying to users if a tactic cannot prove an easy goal.
  - ② Metis can attempt to discover non-tautologies, because if it fails to find a proof then the formula is definitely not a tautology.



# Indexing

- The main loop consists of combining one clause with a set of clauses.
- The active set maintains literal and term indexes to quickly locate all necessary unifications and matches.
- Indexing makes a big difference to performance.
  - Metis implements discrimination trees.
  - Vampire implements code trees.

# Picking Passive Clauses

- Probably the important heuristic in a prover like Metis is deciding the order in which to pick clauses out of the passive set.
- Metis weights clauses when they are added to the passive set, and picks the lightest clause on every iteration.
- Clauses are given a heavier weight:
  - The later they are deduced.
  - The greater the number of literals they contain.
  - The greater the number of symbols they contain.

# Logical Kernel

- Metis implements an LCF-style logical kernel.
- All the rules in the logical calculus for inferring clauses are expanded into combinations of 6 primitive inference rules.
- For example, the primitive inference rule for axioms:

$$\frac{}{C} \text{ axiom } C$$

- This simplifies any kind of proof processing, because only the the primitive inferences rules need to be handled.
- For example, this is used when translating first order refutations to higher order logic proofs.

# Logical Kernel: Resolution

- Excluded Middle:

$$\frac{}{L \vee \neg L} \text{ assume } L$$

- Substitution:

$$\frac{C}{C[\sigma]} \text{ subst } \sigma$$

- Resolution:

$$\frac{L \vee C \quad \neg L \vee D}{C \vee D} \text{ resolve } L$$

where the literal  $L$  must occur in the first theorem, and the literal  $\neg L$  must occur in the second theorem.

# Logical Kernel: Equality

- Reflexivity:

$$\frac{}{t = t} \text{ refl } t$$

- Equality:

$$\frac{}{s \neq t \vee \neg L \vee L'} \text{ equality } L \rho t$$

where  $s$  is the subterm of  $L$  at path  $\rho$ , and  $L'$  is  $L$  with the subterm at path  $\rho$  being replaced by  $t$ .

# Semantic Guidance

- Following work by John Slaney, I am currently investigating using semantic properties of clauses to weight them.
- Given an interpretation with a finite domain, clauses can be evaluated as true or false.
- Clauses that are true in the interpretation are less likely to be helpful in generating an empty clause (combining two true clauses must generate another true clause).
- The main difficulty is finding a good interpretation to guide the proof search.
- So far one negative result: random interpretations don't help!

# Metis: The Tool

- Written in Standard ML in a 'purely-functional style'.
  - No destructive rewriting here.
  - Designed to emphasize clarity over performance.
  - 11,000 lines of code (+ 2,500 comment + 3,500 blank).
  - For best results use the MLton whole-program compiler.
- Available for download.
  - <http://www.gilith.com/software/metis>
  - GPL licence: hack at will, patches gratefully received.

# Strengths

- The clear implementation allows Metis to be easily modded to add new kinds of automated reasoning.
- Metis reads problems in TPTP format and outputs proofs in TSTP format, so can be easily hooked up to other tools.
- Metis proofs are easily checkable, consisting of many tiny inference steps.
  - The `rev_rev` proof has 86 steps!
  - This is a result of its LCF-style logical kernel.



# Weaknesses

- The more general the logic, the worse the automation.

SAT < SMT < First Order < Higher Order < ZFC

- Metis tends to be chaotic: small changes to the input can affect whether a proof is found.
  - Good for speculative background proving or easy proofs.
- Metis is not the most powerful first order prover on the market.

# TPTP and CASC

- TPTP = Thousands of Problems for Theorem Provers.
- CASC = CADE Automated System Competition.
- Metis made its debut at CASC in 2007.
- It placed 10 out of 13 provers in the FOF (First Order Formula) division, proving 117 out of 300 problems (the winner, Vampire 9.0, proved 270 problems).
- **Unexpected result:** It solved 28 problems just in its normalization to clauses!

# Deployments

- Metis is used as a proof engine in the HOL interactive theorem prover. The *METIS\_TAC* tactic handles the conversion between higher order logic and first order logic.
- Larry Paulson has made good use of Metis' ability to generate explicit proofs in the Isabelle *sledgehammer* tactic, which attempts to prove your goals in a background process.
- Larry Paulson has a separate project hacking Metis to use it as an inference engine to solve problems in real closed fields.
- Geoff Sutcliffe is making use of Metis' explicit proofs and compliance to standards to extract information from proofs.

# Summary

- This talk has presented the Metis first order prover.
- The 40+ years of work on first order provers have generated quite a bit of background theory.
- And yet despite this, some interesting research problems still remain to make them more robust and powerful.