

Mining Human Proofs from Machine Proofs

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<http://www.lemma-one.com/papers/papers.html>

Overview

- ▶ Studying logics in or near the space between Intuitionistic Affine Logic \mathbf{AL}_i and Classical Łukasiewicz logic $\mathbf{\text{Ł}L}_c$:

$$\begin{array}{ccc} \mathbf{AL}_c & \longrightarrow & \mathbf{\text{Ł}L}_c \\ \uparrow & & \uparrow \text{ and beyond, e.g., } \mathbf{CL} \\ \mathbf{AL}_i & \longrightarrow & \mathbf{\text{Ł}L}_i. \end{array}$$

- ▶ Using Mace4 to find semantic data (finite models)
- ▶ Using Prover9 to find proof-theoretic data (i.e. proofs!), e.g.,
 - ▶ To study translations of classical systems into intuitionistic ones.
- ▶ Making proofs readable and meaningful by an iterative process:
 - ▶ Use human insight to look for abstractions and decompose proofs into smaller steps.
 - ▶ If the smaller steps are still too complex, use Prover9 to prove them, and re-analyse the results.

Outline

The Logics and their Algebraic Semantics

Finding Proofs

Case Study: Double Negation Translations

Understanding the Machine Proofs

Prover9 in Action

Concluding Remarks

The Logics and their Algebraic Semantics

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Affine Logic: Language

- ▶ Intuitionistic affine logic **AL_i** has formulas built using:
 - ▶ Variables: $P, Q, R \dots$
 - ▶ Falsehood: \perp
 - ▶ Conjunction: $A \otimes B$
 - ▶ Implication: $A \multimap B$.
- ▶ Negation: A^\perp abbreviates $A \multimap \perp$.
- ▶ Sequents: $\Gamma \vdash A$ where Γ is a *multiset* of formulas.
- ▶ No disjunction:
 - ▶ For simplicity ...
 - ▶ ... and it is definable in **LL_C**.

Affine Logic: Deductive System

- ▶ Axiom schemata:

$$\frac{}{\Gamma, A \vdash A} [\text{ASM}] \quad \frac{}{\Gamma, \perp \vdash A} [\text{EFQ}].$$

- ▶ Introduction and elimination for \multimap and \otimes :

$$\frac{\Gamma, A \vdash B}{\Gamma \vdash A \multimap B} [\multimap\text{I}] \quad \frac{\Gamma \vdash A \quad \Delta \vdash A \multimap B}{\Gamma, \Delta \vdash B} [\multimap\text{E}]$$

$$\frac{\Gamma \vdash A \quad \Delta \vdash B}{\Gamma, \Delta \vdash A \otimes B} [\otimes\text{I}] \quad \frac{\Gamma \vdash A \otimes B \quad \Delta, A, B \vdash C}{\Gamma, \Delta \vdash C} [\otimes\text{E}].$$

- ▶ Weakening is admissible: $\frac{\Gamma \vdash B}{\Gamma, A \vdash B} [\text{WK}]$.

- ▶ Contraction is not admissible: $P \vdash P \otimes P$ is unprovable.

The Other Three Logics

- ▶ Classical Affine Logic $\mathbf{AL}_c = \mathbf{AL}_i + [\text{DNE}]$:

$$\Gamma, A^{\perp\perp} \vdash A. \quad [\text{DNE}]$$

- ▶ Intuitionistic Łukasiewicz Logic $\mathbf{tL}_i = \mathbf{AL}_i + [\text{CWC}]$:

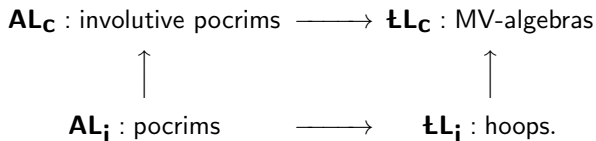
$$\Gamma, A \otimes (A \multimap B) \vdash B \otimes (B \multimap A). \quad [\text{CWC}]$$

- ▶ Classical Łukasiewicz Logic $\mathbf{tL}_c = \mathbf{AL}_c + [\text{CWC}] = \mathbf{tL}_i + [\text{DNE}]$:

$$\begin{array}{ccc} \mathbf{AL}_c & \longrightarrow & \mathbf{tL}_c \\ \uparrow & & \uparrow \\ \mathbf{AL}_i & \longrightarrow & \mathbf{tL}_i. \end{array}$$

Semantics

- ▶ Algebraic semantics over algebras with signature $(0, 1, +, \rightarrow)$ called *(dual) pocrim*s:
 - ▶ Order by: $x \geq y \equiv x \rightarrow y = 0$;
 - ▶ $(0, +, \geq)$ becomes an ordered commutative monoid;
 - ▶ 0 is least element: $x \geq 0$, i.e., $x \rightarrow x = 0$;
 - ▶ 1 is an annihilator: $1 + x = 1$;
 - ▶ implication is residuated: $x + y \rightarrow z = x \rightarrow y \rightarrow z$.
- ▶ The logics are sound and complete for subclasses of pocrim



where:

- ▶ involutive pocrim
- satisfy $\neg\neg x = x$, where $\neg x = x \rightarrow 1$;
- ▶ hoops satisfy $x + (x \rightarrow y) = y + (y \rightarrow x)$;
 - ▶ MV-algebra = involutive hoop.

Remarks on Hoops and \mathbf{HL}_i

- ▶ Hoops and \mathbf{HL}_i have been studied from various points of view.
- ▶ Hoops were first studied by Büchi and Owens.
- ▶ Bosbach gave an equational axiomatisation of hoops.
- ▶ Ferreirim studied hoops from the point of view of universal algebra.
- ▶ Can usefully view [CWC] as a weak form of contraction.
- ▶ \mathbf{HL}_i may be viewed as Hajek's Basic Logic **without** the intuitionistically unacceptable axiom of *arrow prelinearity*:

$$(A \multimap B) \multimap C, (B \multimap A) \multimap C \vdash C. \quad [\text{PREL}]$$

Exploiting the Semantics

- ▶ Semantics give a powerful handle on the theories.
- ▶ Finite counter-examples are important for many results.
- ▶ Checking associativity is tedious and error-prone.
- ▶ Had a lot of success with Mace4.
 - ▶ E.g., classify pocrimms with 4 elements:
 - ▶ 2 MV-algebras
 - ▶ 5 hoops
 - ▶ 3 involutive pocrimms
 - ▶ 7 pocrimms
 - ▶ Mace4 finds the examples in a few minutes.
 - ▶ Proving the classification is a short “homework” exercise.
- ▶ Combined with some POFM, get some nice general results.
- ▶ We found a heuristic test which allows us to test many simple formulas.
- ▶ But no data to satisfy a hungry proof-theorist.

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Decision Problem in \mathbf{AL}_i , \mathbf{AL}_c , \mathbf{tL}_i and \mathbf{tL}_c

- ▶ \mathbf{AL}_i and \mathbf{AL}_c admit cut-elimination.
 - ▶ Resulting decision procedure is EXPTIME
 - ▶ NP-complete?
- ▶ \mathbf{tL}_c is equivalent to the equational theory of MV-algebras:
 - ▶ Known to be decidable by a reduction to (linear) real arithmetic.
 - ▶ NP-complete
- ▶ \mathbf{tL}_i was shown to be decidable by Ferreirim & Blok.
 - ▶ Bova & Montagna's work on GBL-algebras imply decision problem is PSPACE-complete.
 - ▶ Their algorithm is justified by abstract algebra, and
 - ▶ doesn't produce proofs
 - ▶ We have a heuristic which works well on simple formulas.
 - ▶ Our heuristic is justified by abstract algebra, and
 - ▶ doesn't produce proofs

Aside: Continuous Logic

- ▶ The continuous logic **CL** of Ben Yaacov et al. is classical Łukasiewicz logic **ŁL_C** extended with
 - ▶ a unary logical connective called *halving* and written $A/2$.
 - ▶ the axiom schemata:

$$A/2 \multimap A \vdash A/2$$
$$A/2 \vdash A/2 \multimap A.$$

- ▶ Algebraic semantics: *continuous hoops*, aka *coops* (see <http://arxiv.org/abs/1212.2887>)
- ▶ We had already decomposed **ŁL_C** as the combination of:
 - ▶ the classical principle axiomatizing **AL_C**:

$$A^{\perp\perp} \vdash A$$

- ▶ and the intuitionistic principle axiomatizing **ŁL_i**:

$$A, A \otimes (A \multimap B) \vdash B \otimes (B \multimap A).$$

- ▶ Wanted to understand halving in **ŁL_i** alone

Putting Prover9 to work in \mathbf{tL}_i ;

- ▶ This led us to ask if the following rule is admissible in \mathbf{tL}_i :

$$\frac{H \multimap A \vdash H \quad H \vdash H \multimap A \quad H' \multimap A \vdash H' \quad H' \vdash H' \multimap A}{H \vdash H'}$$

- ▶ I.e., does every model of \mathbf{tL}_i admit at most one halving operator?
- ▶ Answer: Yes!
 - ▶ Proof found (in about 3 minutes) using Prover9.
 - ▶ Subsequently massaged into human-readable form by us.
 - ▶ Less than 2 pages, but involves subtle applications of [CWC].
 - ▶ The de Bruijn factor is 1.09 after compression ...
and about the same on paper ...

The Machine Proof

Appendix

Formal proof of Theorem 3 as output by Prover9

```
x 1 x > y & y > z -> z > x # label(non_clause). [assumption].
2 x > y & z > z -> z > y # label(non_clause). [assumption].
3 z > x > y <-> z > x > y # label(non_clause). [assumption].
4 z > y -> z > x > y # label(non_clause). [assumption].
5 x > y -> y > z > x > y # label(non_clause). [assumption].
6 z > y -> z > x > y # label(non_clause). [assumption].
7 y > y > z > x > z > z > z > y > z
      # label(non_clause) # label(goal). [goal].
8 (x > y) & z > x > (y > z). [assumption].
9 x > y > y > z. [assumption].
10 z > z > z. [assumption].
11 z > z. [assumption].
12 (x > y) | (y > z) | z > x. [classify(1)].
13 (x > y) | (y > z) | y > z. [classify(2)].
14 (x > y > z) | y > z > z. [classify(3)].
15 z > y > z | (y > z > z). [classify(4)].
16 z > z. [assumption].
17 (x > y) | z > z > y > z. [classify(4)].
18 (x > y) | y > z > z > z. [classify(5)].
19 (x > y) | z > z > z > z. [classify(6)].
20 z > (z > y) > y > (y > z). [assumption].
21 z > z > z > z. [simplify].
22 z > z > z > z. [simplify].
23 z > z > z. [simplify].
24 z > (y > z) > y > (z > z). [para(9(a),1),8(a),1,1),rewrite(8(2))].
27 0 > z > z. [para(10(a),1),8(a),1),flip(a)].
28 z > y > z > (y > z). [hyper(14,a,11,a)].
30 (z > y > z) | z > y > z. [para(9(a),1),14(a),1)].
31 (z > y) | 0 > z > z. [para(10(a),1),14(a),1)].
32 z > (z > y) > y. [hyper(15,b,11,a)].
33 z > y > y. [hyper(14,a,16,a)].
34 z > y > y. [hyper(17,a,16,a),rewrite(27(3))].
35 0 > z > y > z. [hyper(18,a,16,a)].
36 z > (z > y > z) > z > y > (y > z) > z. [para(20(a),1),8(a),1,1),rewrite(8(2))].
41 z > z > z > z | (z > z). [para(20(a),1),15(b),2)].
43 z > (y > z) > z > z | z > z > y > z. [para(20(a),1),14(a),1)].
46 0 > z > z > z > z > (z > z > 0). [para(27(a),1),20(a),1)].
52 z > z > 0 > 0. [hyper(19,a,16,a,b,20,a),flip(a)].
53 0 > z > z > z. [back_rewrite(6),rewrite(12(a),16(4))].
54 z > y > z > z. [back_rewrite(8),rewrite(13(2))].
55 z > (y > z) > z > z > z. [hyper(19,a,34,a)].
70 z > y > z > (z > y). [para(9(a),1),20(a),2)].
81 z > z > z. [para(21(a),1),5(a),2)].
82 z > z > z. [para(21(a),1),5(a),2)].
86 z > z > z. [hyper(12,a,34,a,b,81,a)].
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89 z > z > z > z > z > z. [hyper(19,a,82,a)].
127 z > z > z > z. [hyper(23,a,86,a)].
171 z > z > z > 0. [hyper(13,a,16,a,b,127,a),flip(a)].
180 z > z > z.
      [para(171(a),1),20(a),2)],rewrite(9(2),27(3),21(5)),flip(a)].
205 z > (z > z) > z > z. [para(180(a),1),8(a),2,2)],rewrite(9(4)),1].
271 z > (z > z) > y > (y > z) > z > z > y > (z > z > y > z)].
275 (z > z) > y > z > z > z > (y > z > z > z). [para(26(a),1),20(a),2,2)].
418 z > z > z > z. [para(21(a),1),8(a),1)].
419 0 > z > z > z > z. [hyper(21,a,418,a)].
609 z > (z > (z > z)) > z > z. [hyper(41,b,22,a)].
896 z > z > (z > z) > z. [para(20(a),1),5(a),2)].
996 z > z > z > z > 0. [hyper(13,a,16,a,b,418,a),flip(a)].
5220 z > z > (z > (z > z)) > z. [para(20(a),2),8(a),1,2)].
12380 z > (z > z) > z > z > z. [hyper(42,a,408,a)].
16713 z > ((z > z) > z) > ((z > z) > z) > z.
      [para(9(a),1),271(a),2,2)],rewrite(9(1),271(5),180(4))].
20050 z > ((z > z) > z) > z. [hyper(13,a,275,a,b,5220,a),rewrite(9(3))].
20066 z > z > z > z > z. [hyper(14,a,20050,a)].
20068 z > (z > z) > z > z. [para(21(a),1),10380(a),2)].
20070 z > z > z > z > z > z. [hyper(14,a,20068,a)].
20074 z > z > z > z > z > z > z. [hyper(13,a,20068,a,b,20070,a),flip(a)].
20076 z > z > z > z.
      [back_rewrite(16713),rewrite(12061(a),20101,994(7),8(4),27(4),8(3))].
20078 z > z. [para(20025(a),1),20(a),2,2)],rewrite(121(4))].
20087 z > z > z. [para(20025(a),1),70(a),2,2)],rewrite(122(4))].
20793 (z > z) > z > z. [sur(13,b,16034,a,c,23,a)].
20794 0. [rewrite(20793,a,20637,a)].
```

The Human Proof

```

a ==> b = a.           % assumption 1
c ==> b = c.           % assumption 2
end_of_list.
formula(goal).
a = c.
end_of_list.

```

To our surprise Prover9 took just a few seconds to produce the proof shown in the appendix. The proof that Prover9 found seems perplexingly intricate at first glance, but after studying it for a little while, we found we could add it into a form file for human consumption. From a human perspective, the proof involves the 9 intermediate claims given in the following lemma. Once these are proved, we will see that the desired result is an easy consequence of claim (9).

Lemma 2 Let $M = \{M, 0, +, \geq\}$ be a hoop and let $a, b, c, x, y \in M$. Assume that, (i), $a \rightarrow b = a$ and, (ii), $c \rightarrow b = c$. Then the following hold:

- (1) $b \geq a$ and $b \geq c$,
- (2) $a + a = b$,
- (3) $a \rightarrow (a \rightarrow c) = 0$,
- (4) $(x \rightarrow y) + z \geq x \rightarrow (y + (y \rightarrow x) + z)$,
- (5) $c \rightarrow (a + a + x) \geq c$,
- (6) $c \rightarrow a \geq a \rightarrow c$,
- (7) $c \rightarrow a = a \rightarrow c$,
- (8) $c + (c \rightarrow a) + ((a \rightarrow c) \rightarrow a) = b$,
- (9) $a + c = b$

Proof: In the proof below (in)equalities which are not labelled as following from one of the assumptions (i) and (ii) or an earlier part of the lemma follow immediately from the axioms of a hoop.

- (1) We have $b \geq a \rightarrow b$ and, by (i), $a \rightarrow b = a$. So $b \geq a$ and similarly $b \geq c$ using (ii).
- (2) By (1) we have $b \rightarrow a = 0$. Therefore

$$\begin{aligned} a + a &= a + (a \rightarrow b) && \text{(i)} \\ &= b + (b \rightarrow a) && \text{[cwc]} \\ &= b. \end{aligned}$$

- (3) By (i) and (1) we have $a = a \rightarrow b \geq a \rightarrow c$ and hence $0 \geq a \rightarrow (a \rightarrow c)$, which implies (3).
- (4) By [cwc] $x + (x \rightarrow y) + z = y + (y \rightarrow x) + z$, whence (4) follows.
- (5) We have

$$\begin{aligned} c \rightarrow (b + x) &\geq c \rightarrow b \\ &= c \end{aligned} \quad \text{(ii)}$$

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and then using (2) we obtain (5).

(6) By (5), as $(c \rightarrow a) + a \geq c \rightarrow (a + a)$, we have $(c \rightarrow a) + a \geq c$ and hence (6).

(7) Our assumptions are symmetric in a and c . Hence, (6) holds with a and c interchanged, i.e., $a \rightarrow c \geq c \rightarrow a$, which taken with (6) gives (7).

(8) We have

$$\begin{aligned} c + (c \rightarrow a) + ((a \rightarrow c) \rightarrow a) &= a + (a \rightarrow c) + ((a \rightarrow c) \rightarrow a) && \text{[cwc]} \\ &= a + a + (a \rightarrow (a \rightarrow c)) && \text{[cwc]} \\ &= b + (a \rightarrow (a \rightarrow c)) && \text{(2)} \\ &= b. \end{aligned} \quad \text{(8)}$$

(9) We have

$$\begin{aligned} b &= c + (c \rightarrow a) + ((a \rightarrow c) \rightarrow a) && \text{(8)} \\ &= c + (a \rightarrow c) + ((a \rightarrow c) \rightarrow a) && \text{(7)} \\ &= c + a + (a \rightarrow (a \rightarrow c)) && \text{[cwc]} \\ &= c + a. \end{aligned} \quad \text{(9)}$$

This completes the proof of the lemma. ■

It is interesting to note the complexity of the proof in terms of uses of [cwc] (used 6 times) and the important sub-lemma (2) (used twice) as depicted in the outline proof tree shown in Figure 5.

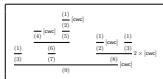


Fig. 5: Outline of the Proof of Lemma 2

Finally, from part (9) of Lemma 2 we have the theorem that the equation $a \rightarrow b = a$ uniquely determines a in terms of b .

Theorem 3 In any hoop, if $a \rightarrow b = a$ and $c \rightarrow b = c$ then $a = c$.

Proof: Since the assumptions are symmetric in a and c it is enough to show $c \geq a$, from which we can immediately conclude $a \geq c$ and hence $a = c$. By Lemma 2 (9) we have $c \geq a \rightarrow b$ and hence $c \geq a$. ■

We already have the part of Theorem 1 that gives soundness and completeness of $\mathbb{L}\mathbb{Q}$ for bounded hoops. Theorem 3 now gives us that the continuous logic

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Fun with Prover9 and TL_i

- ▶ Tried the Prover9 approach on range of conjectures
- ▶ Still had conjectures that we could prove with the heuristic but not with Prover9
 - ▶ More on this later in the talk
- ▶ With the kind assistance of Geoff Sutcliffe contributed a batch of problems to TPTP
 - ▶ LCL882+1.p to LCL903+1.p
 - ▶ Mix of counter-example generation and proof problems

See *(Dual) Hoops have Unique Halving* Essays in Memory of Bill McCune.
LNCS 7788 or <http://arxiv.org/abs/1203.0436>

Prover9 Performance on TPTP Proof Problems

TPTP Name	Problem Statement	Seconds
LCL888+1.p	Halving is unique: rule for $a = b/2$	3.38
LCL889+1.p	Halving is unique: rule for $a \geq b/2$	229.13
LCL890+1.p	Halving is unique: rule for $a \leq b/2$ (i)	1,216.69
LCL891+1.p	Halving is unique: rule for $a \leq b/2$ (ii)	12,724.08
LCL892+1.p	Halving is unique: rule for $a \leq b/2$ (iii)	51,876.82
LCL893+1.p	$x/2 = x$ implies $x = 0$	0.01
LCL894+1.p	Weak conjunction is l.u.b. in a hoop (Horn)	1.90
LCL895+1.p	Weak conjunction is l.u.b. in a hoop (Equational)	14.41
LCL896+1.p	Associativity of weak conjunction implies CWC	5.95
LCL897+1.p	Weak conjunction is associative in a hoop	0.10
LCL898+1.p	An involutive hoop has CSD	66.30
LCL899+1.p	A bounded pocrim with CSD is involutive	0.01
LCL900+1.p	A bounded pocrim with CSD is a hoop	7.21
LCL901+1.p	An idempotent pocrim with CSD is boolean	0.74
LCL902+1.p	A boolean pocrim is involutive	0.02
LCL903+1.p	A boolean pocrim is idempotent	1.42

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Double Negation Translations

- ▶ Schemes for encoding $\mathbf{L} + [\text{DNE}]$ in \mathbf{L} for some extension \mathbf{L} of \mathbf{AL}_i .
- ▶ **Kolmogorov**: double negate every subformula. E.g.,

$$P \otimes (P \multimap Q) \mapsto (P^{\perp\perp} \otimes (P^{\perp\perp} \multimap Q^{\perp\perp})^{\perp\perp})^{\perp\perp}.$$

- ▶ **Gentzen**: double negate variables. E.g.,

$$P \otimes (P \multimap Q) \mapsto P^{\perp\perp} \otimes (P^{\perp\perp} \multimap Q^{\perp\perp}).$$

- ▶ **Gödel**: rewrite implication using conjunction and negation. E.g.,

$$P \otimes (P \multimap Q) \mapsto P \otimes (P \otimes Q^{\perp})^{\perp}.$$

- ▶ **Glivenko**: double negate outermost formula only. E.g.,

$$P \otimes (P \multimap Q) \mapsto (P \otimes (P \multimap Q))^{\perp\perp}.$$

Double Negation Translations (continued)

- ▶ \mathbf{L} will typically be an intuitionistic extension of \mathbf{AL}_i .
- ▶ Want encoding to reflect in \mathbf{L} the proof theory of “classical \mathbf{L} ”, i.e., $\mathbf{L}_c = \mathbf{L} + [\text{DNE}]$.
- ▶ Following Troelstra, we say an encoding $A \mapsto A^\dagger$ is a *correct double negation translation* if:
 - (DNS1) \mathbf{L}_c proves $A^\dagger \vdash A$ and $A \vdash A^\dagger$,
 - (DNS2) if \mathbf{L}_c proves $\vdash A$ then \mathbf{L} proves $\vdash A^\dagger$,
 - (DNS3) \mathbf{L} proves $(A^\dagger)^{\perp\perp} \vdash A^\dagger$.
- ▶ For short, we just say the encoding “works” in \mathbf{L} .
- ▶ E.g., Kolmogorov and Gödel encodings work in \mathbf{AL}_i and in \mathbf{tL}_i .
(The proofs are fairly routine exercises in induction over derivations.)

Double Negation is a Homomorphism in \mathbf{tL}_i

- ▶ We had proved using semantic methods (with some help from Mace4) that there are extensions of \mathbf{AL}_i where Gentzen works and Glivenko doesn't and vice versa.
- ▶ Do Gentzen and Glivenko encodings work in \mathbf{tL}_i ?
- ▶ We conjectured two homomorphism properties:

$$\begin{aligned}(A \otimes B)^{\perp\perp} &\simeq A^{\perp\perp} \otimes B^{\perp\perp} \\ (A \multimap B)^{\perp\perp} &\simeq A^{\perp\perp} \multimap B^{\perp\perp}\end{aligned}$$

(where $X \simeq Y$ means \mathbf{tL}_i proves $X \vdash Y$ and $Y \vdash X$).

- ▶ Follows easily from these that all four translations are equivalent in \mathbf{tL}_i and hence that Gentzen and Glivenko encodings work in \mathbf{tL}_i .
- ▶ A key intermediate result for the homomorphism properties is:

$$(A^\perp \multimap B)^\perp \simeq A^\perp \otimes B^\perp \tag{*}$$

- ▶ After a two hour search, Prover9 found a proof of (*).

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Understanding the Proofs

- ▶ The first proofs of the homomorphism properties were long.
- ▶ But patterns emerge. E.g., certain derived connectives keep appearing:

$A \wedge B \equiv A \otimes (A \multimap B)$	weak conjunction
$A \vee B \equiv (B \multimap A) \multimap A$	strong disjunction
$A \Rightarrow B \equiv A \multimap A \otimes B$	strong implication
$A \Downarrow B \equiv A^\perp \otimes (B \multimap A).$	NOR, Peirce's <i>ampheck</i>

- ▶ Analysed the Prover9 proofs by identifying key lemmas and feeding them back in first as conjectures and then as axioms.
- ▶ Resulting account for humans is about 7 pages containing 17 lemmas and theorems.

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Demo

- ▶ Let's get Prover9 to prove that \mathbf{tL}_i proves:

$$\vdash (A^{\perp\perp} \multimap A)^{\perp\perp}.$$

Improving a Prover9 Proof

Theorem	Length	Depth	Time
(1) $(A^{\perp\perp} \multimap A)^{\perp\perp}$	109 steps	9	1 min
(2) $(A^{\perp} \multimap B)^{\perp} \simeq A^{\perp} \otimes B^{\perp}$	412 steps	22	133 min
(3) $(A \wedge B)^{\perp} \simeq A \Rightarrow B^{\perp}$	147 steps	13	86 min
(2) $(A^{\perp} \multimap B)^{\perp} \simeq A^{\perp} \otimes B^{\perp}$	140 steps*	10	43 sec

(*) using (3)

Further Properties of the Connectives

- ▶ Have De Morgan properties for the various connectives:

$$\begin{aligned}(A \otimes B)^\perp &\simeq A \multimap B^\perp \\(A \multimap B)^\perp &\simeq A^{\perp\perp} \otimes B^\perp \\(A \wedge B)^\perp &\simeq A \Rightarrow B^\perp \\(A \Rightarrow B)^\perp &\simeq A^{\perp\perp} \wedge B^\perp \\(A \wedge B)^\perp &\simeq A^\perp \vee B^\perp \\(A \vee B)^\perp &\simeq A^\perp \wedge B^\perp.\end{aligned}$$

- ▶ The conjunctions \otimes and \wedge and the implications \multimap and \Rightarrow become the usual intuitionistic connectives given contraction ($A \vdash A \otimes A$).
- ▶ N.b., \vee is not the usual intuitionistic disjunction.
- ▶ \downarrow is definable in terms of \wedge and $^\perp$:

$$A \downarrow B \simeq A^\perp \wedge B^\perp.$$

A Challenge Problem

- ▶ A conjecture about the weak conjunction and the strong implication:

$$A \wedge B \Rightarrow C \simeq A \Rightarrow B \Rightarrow C$$

- ▶ Prover9 proofs:
 - ▶ Bob Veroff (242 lines with Horn axiomatization)
Found using Veroff's method of proof sketches
 - ▶ Michael Kinyon (214 lines with equational axiomatization)
Found using Waldmeister first
- ▶ Have not yet teased out a human readable proof

See <http://www.cs.unm.edu/~veroff/H00PS/> for Prover9 proofs

The Logics and their Algebraic Semantics

Finding Proofs

Case Study: Double Negation Translations

Understanding the Machine Proofs

Prover9 in Action

Concluding Remarks

Concluding Remarks

- ▶ Successfully mined human-readable proofs from machine proofs.
- ▶ Results have informed research outside ATP.
- ▶ Human input is identifying the “right” abstractions;
 - ▶ Find useful derived concepts;
 - ▶ Recover an intuitive proof plan.
- ▶ Useful to have interactive support for proof factoring.
- ▶ Interesting AI challenge to automate human aspects.
- ▶ Engineering applications?
 - ▶ *“OK, your system has proved it works . . .”*
 - ▶ *“But what does the proof mean?”*
- ▶ The late Bill McCune was the real star:
 - ▶ Mace4 provided quick returns and good value for a very low entry cost, and then
 - ▶ Prover9 found constructive proofs that we would never have found without it.

Thank you!