

# Fast Equational Reasoning with WALDMEISTER

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• RTA organizers:

"... would be nice to show how a combination of the theory of rewriting, implementation techniques, heuristics, ideas ... whatever else ... lead to a design of the fastest equational reasoner in the world"

 Some *evidence* of "fastest" from performance in the CADE ATP System Competitions. A.D. 2007 (100 problems attempted):

	WM V	AMPIRE	E	Otter	Μετις Ε	QUINOX	Geo
solved	91	63	59	27	15	2	2
av. time	18.2	42.3	16.7	21.6	38.3	13.4	255.8

• What are the *underlying concepts?* 



- Foundations
- Prover engineering
- Controlling redundancy
- Applications



## **I** Foundations

#### **Equational Logic**



• *Example:* group axiomatization

$$E: (x + y) + z = x + (y + z)$$
  $x + 0 = x$   $x + (-x) = 0$ 

*Word problem:* Does  $E \models x = --x$  hold? (Birkhoff 1935): replace *equals by equals* 

- Confluent and terminating theory presentation: Apply equations non-deterministically and in one direction only Word problem decidable by computation of normal forms
- If terminating: confluence = *local* confluence (Newman 1942), effective test via *Critical Pair Lemma* (Knuth, Bendix 1970): Check if critical pairs rewrite into tautologies

#### Completion



- In the *negative* case:
  - enrich presentation with rewritten critical pairs
  - perform mutual simplification
  - *iterate* the procedure!

essence of
Knuth-Bendix
completion

- Fails if non-orientable equations encountered
   Ordered completion takes orientable instances into account, produces ground confluent system in the limit (Lankford 1975)
- Limit normal form reached in *finite* approximation already Semi-decision procedure for word problem with *drastically reduced* search space (Hsiang, Rusinowitch 1987)



 Proof-theoretic framework (Bachmair, Dershowitz, Hsiang 1986): Completion as transformation of proofs, contained in well-founded proof ordering where rewrite proofs are minimal Proof steps weighted according to

 $s \longleftrightarrow_{u \Rightarrow_m v} t \longmapsto (\{s\}, u, m, t) \text{ if } s \succ t$ 

- Deduction of new facts must ensure *fairness:* eventually smaller proof for every persistent *ground peak s* ← t → u in Σ<sup>e</sup>
   Equation *redundant* if every ground instance has smaller proof
- WALDMEISTER as an implementation of ordered completion: performs *fully automated* proof search, returns *proof log* in case of success ....

#### WALDMEISTER Searching for a Proof



FAST EQUATIONAL REASONING – p.8





#### Consider the following set of axioms:

Axiom 1: x + 0 = xAxiom 2: x + (-x) = 0Axiom 3: (x + y) + z = x + (y + z)

#### This theorem holds true:

Theorem 1: x = - - x

#### **Proof:**

Lemma 1: 
$$0 + (- - x) = x$$
  
 $0 + (- - x)$   
= by Axiom 2 RL  
 $(x + (-x)) + (- - x)$   
= by Axiom 3 LR  
 $x + ((-x) + (- - x))$   
= by Axiom 2 LR  
 $x + 0$   
= by Axiom 1 LR  
 $x$ 

Lemma 2: x + (- - y) = x + y x + (- - y)= by Axiom 1 RL (x + 0) + (- - y)= by Axiom 3 LR x + (0 + (- - y))= by Lemma 1 LR x + y

Lemma 3: 0 + x = x 0 + x= by Lemma 2 RL 0 + (- - x)= by Lemma 1 LR x Theorem 1: x = --x

= by Lemma 3 RL 
$$0 + x$$

= by Lemma 2 RL  
$$0 + (- - x)$$

= by Lemma 3 LR --x



- Ordered / unfailing completion: given as set of *calculus rules* expanding:  $\frac{l=r \quad s[l']=t}{(s[r]=t)\sigma}$  critical pairing contracting: rewrite-based simplification rules
- Additional *control constraint:* fairness
   *Parameter:* reduction ordering
- How to turn this into a *deterministic algorithm?* Common solutions:
  - given-pair algorithm (Wos, Carson, Robinson 1964)
  - Huet's algorithm (Huet 1981)
  - given-clause algorithm (Overbeek 1971)



- Approach: incrementally precompute *all* expansion steps *assess* candidate equations heuristically by weighting function  $\varphi$
- Active facts A for rewriting and superposition
   Passive facts P: critical pairs descending from A



#### **Proof Procedure**



**FUNCTION** WALDMEISTER( $\Sigma, \mathcal{E}, \mathcal{C}, >, \varphi$ ) : BOOL 1:  $(\mathcal{A}, \mathcal{P}) := (\emptyset, \mathcal{E})$ 2: WHILE  $\neg$ trivial(C)  $\land P \neq \emptyset$  DO  $e := \min_{\varphi}(\mathcal{P}); \ \mathcal{P} := \mathcal{P} \setminus \{e\}$ 3: 4:  $e := \text{Normalize}_{A}^{>}(e)$ 5: **IF**  $\neg$  redundant(*e*) **THEN**  $(\mathcal{A}, P_1) := \mathsf{Interred}^{>}(\mathcal{A}, e)$ 6:  $\mathcal{A} := \mathcal{A} \cup \{\mathsf{Orient}^{>}(e)\}$ 7:  $P_2 := \mathsf{CP}^{>}(e, \mathcal{A})$ 8:  $\mathcal{P} := \mathsf{Update}(\mathcal{P} \cup P_1 \cup P_2)$ 9:  $\mathcal{C} := \operatorname{Normalize}_{4}^{>}(\mathcal{C})$ 10: END 11: 12: **END** 

13: **RETURN** trivial(C)

Normalize...

#### **Proof Procedure**



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#### **Proof Procedure**



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13: **RETURN** trivial(C)



## **II Prover Engineering**



- For actual *realization* of proof procedure: Design / adapt appropriate *algorithms* and *data structures!* Functionality, time efficiency, space efficiency
- Time-space tradeoffs frequent in CS Additionally: take modern memory hierarchies into account! Can quickly access only a small part of memory
- Entitities to represent: active facts, passive facts, conjecture
- Control parameters of proof procedure: reduction ordering and weighting function Pragmatic approach of *automating control*



- Essentially: incrementally constructed *data base* of term( pair)s Inferencing, simplifying = *complex retrieval* from data base
- Retrieval conditions: more general / unifiable / less general terms Major part of system's work: normalizing new critical pairs, requires retrieval of generalizations
- Inference rate soon sharply decreases if retrieval handled 1:1 "Performance degradation" (Wos 1992)
- Remedy: retrieval in *set-based* fashion
   Process at a time one query against a *compiled* data base!
   *"Term indexing"*, indispensable in today's ATP systems

### **Discrimination Trees (1)**



- Term as *string* of its symbols, indexed in *trie* data structure Sharing of *common prefixes* (Christian 1989)
- Example: Index for term set

 $f(x_1, x_1)$   $f(x_1, b)$   $f(a, g(x_1))$   $f(g(x_1), g(x_2))$ f(g(b), a)

• Retrieval typically via *backtracking* due to *non-determinism* in descent



#### **Discrimination Trees (2)**



- Optimization: *collapse* subtrees with only one leaf node May cut away *more than half* of the nodes
   Data structure *more compact*, retrieval *faster*
- Query terms traversed *"from left to right"* Hard-wired into term representation: ...



#### **Discrimination Trees (2)**



- Optimization: collapse subtrees with only one leaf node May cut away more than half of the nodes Data structure more compact, retrieval faster
- Query terms traversed *"from left to right"* Hard-wired into term representation:

*Flatterms* (Christian 1989)



instead of *tree-like* 





- Complexity analysis of indexing techniques difficult (Graf 1996)
- COMPIT initiative (Nieuwenhuis, H., Riazanov, Voronkov 2001): Compare *implementations* of different techniques on *benchmarks* corresponding to real runs of real provers
- Speed in 2000: code trees : discr. trees : context trees 1.91 : 1.37 : 1.00
- Participants have *improved* their implementations since
   DTs: nearly twice as fast just by more compact node format
- Careful coding counts!



- $\mathcal{P}$  ordered under  $\varphi$ : functionality of priority queue
- Typically |P| exceeding |A| by three orders of magnitude
   Space can become a problem!
   Standard solution: discard heavy equations completeness lost
- DISCOUNT loop: no rewriting on passive facts! Successively more compact representations:

flatterms 
$$f - \underline{x_1} - f - \underline{a} - \underline{x_2} - f - \underline{x_1} - \underline{x_2}$$
  
stringterms  $f x_1 f a x_2 f x_1 x_2$   
implicit  $\langle S[I]_p = t, I = r \rangle$ 







- Group together elements generated during same loop iteration: themselves ordered by  $\varphi$ , occasional removal of *lightest* element
- If *re-generation* + *re-normalization* available and weights unique: only need to store the *next minimal weight* retrievable from group! *Priority queue* on top of these entries as before
- Crucial issue in *reproduction:* need same weights, hence same normal forms
   Nice: whole history of A fits into one DT with age constraints
   Prerequisite for practicality: cache for lightweight entries
- All in all: space for *P linear* in |*A*|. *Laziness works!* Besides: *proof objects* for free, *parallelization* possible







- Instead of *termpair*, consider sets of rewrite successors in order to join left- and right-hand side earlier
- *Example:* GRP141-1 when 0 rewrite rules derived

**U U** 

V



- Instead of *termpair*, consider sets of rewrite successors in order to join left- and right-hand side earlier
- *Example:* GRP141-1 when 2 rewrite rules derived





- Instead of *termpair*, consider sets of rewrite successors in order to join left- and right-hand side earlier
- *Example:* GRP141-1 when 13 rewrite rules derived





- Instead of *termpair*, consider sets of rewrite successors in order to join left- and right-hand side earlier
- *Example:* GRP141-1 when 19 rewrite rules derived





- Instead of *termpair*, consider sets of rewrite successors in order to join left- and right-hand side earlier
- *Example:* GRP141-1 when 30 rewrite rules derived





- Proofs are found
  - in many cases with *less steps* of saturating the axiomatization
  - at least with no more steps
- Some proofs *only* found with enlarging
- Focus of completion-based proving slightly shifts from axioms to conjecture
- Extension: consider (some) rewrite predecessors as well Danger of combinatorical explosion – strict limit needed



• Comparison of *weighting functions*  $\varphi$  in various domains

t/s [SPARC]	addweight	gtweight
BOO003-2	>300	0.1
BOO007-2	>300	81.8
BOO008-4	61.1	7.0
LCL153-1	2.1	>300
LCL154-1	2.0	>300
LCL155-1	1.2	>300
$\Sigma$ Boolean	22 / 29	29 / 29
	25.4	4.5
Σ Wajsberg	21 / 25	17 / 25
	0.9	0.9

• Must employ *different weighting functions* on different structures!



• Lexicographic path ordering: lifts operator precedence to terms Knuth-Bendix ordering: orders terms according to their length

t/s [SPARC]	LPO	KBO
COL063-4	223.0	0.0
COL063-6	>300	0.0
COL064-6	>300	0.0
$\Sigma$ BT fragment	21 / 27	25 / 27
	16.6	0.5
Σ non-associa-	21 / 38	11 / 38
tive rings	3.0	1.4
	A>C>*>->+>0	
$\Sigma$ lattice-ordered	98 / 102	90 / 102
groups	12.7	23.8
	$+>\wedge>->\vee>0$	

Must employ different orderings on different structures!

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## **Control Component (1)**



- Recognize known axiomatizations within input specification  $\mathcal{E}$
- Stage 1: extract known axioms

 $\mathcal{E}: +(x, +(y, z)) = + (+(x, y), z) +(x, 0) = x +(x, -(x)) = 0$ 

Table 1:  $F(x, F(y, z)) = F(F(x, y), z) \Longrightarrow Ass(F)$   $F(x, E) = x \Longrightarrow Neut_r(F, E)$  $F(x, I(x)) = E \Longrightarrow Inv_r(F, I, E)$ 

- Stage 2: match known structures on extracted axiom set extracted axioms: {Ass(+), Neut<sub>r</sub>(+, 0), Inv<sub>r</sub>(+, -, 0)}
   Table 2: {Neut<sub>r</sub>(F, E), Ass(F), Inv<sub>r</sub>(F, I, E)} \$\implies\$ Group(F, I, E)
- Similarly staged: theory directory in (Kirchner, Kirchner 1994–)

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### **Control Component (2)**



 Stage 2: match known structures on extracted axiom set extracted axioms:
 Table 2:

 $\{Ass(+), Neut_r(+, 0), Inv_r(+, -, 0)\}$ 

 $\{\operatorname{Neut}_{r}(F, E), \operatorname{Ass}(F), \operatorname{Inv}_{r}(F, I, E)\} \implies \operatorname{Group}(F, I, E)$ 

• Stage 3: instantiate strategy

detected axiomatization:

Group(+, -, 0)

Table 3:  $Group(F, I, E) \Longrightarrow$  $>:= LPO(I > F > E), \varphi := gtweight$ 

 Start proof search with reduction ordering LPO(->+>0) and weighting function gtweight



# **III Controlling Redundancy**



- Efficiency of completion depends on number of rules and critical pairs generated: *Prune the search space!*
- Simplification and redundancy elimination: Safely cut off possiby infinite bands of derivable facts
   Occasionally completion finite, then word problem decidable
- Particular interest in techniques *beyond* comparing normal forms In the spirit of *critical pair criteria* like
  - connectedness (Winkler, Buchberger 1983)
  - compositeness (Kapur, Musser, Narendran 1985)
- Revisit redundancy criteria realized in WALDMEISTER



- *Caveat:* not every criterion speeds up proof search! Even if so: mind *trade-off* between cost and benefit
- Working horse: an equation s = t redundant wrt. E if every ground instance has a smaller proof in E (since ordered completion only strives for ground confluence)
- Different ground instances may enjoy *different* proofs. Hence often *stronger* than comparing normal forms
- Approach here: establish ground joinability sσ↓<sub>E</sub>>tσ
   Then proof complexity dominated by first step on greater side
   Need only compare say sσ →<sup>p</sup><sub>u⇒v</sub> s' and sσ →<sup>λ</sup><sub>s⇒t</sub> tσ



- Many presentations *confluent* only on the *ground* level, e.g. for:
  - AC, ACI, Boolean rings (Martin, Nipkow 1990)
  - Abelian groups, rings (WM)
- Improvements in presence of AC axioms *pressing:* From these alone, *infinite* band of equations ... Grows 1, 3, 11, 53, 313, ... =  $\frac{1}{2}(I(n-1) + (n-1)(n-1)!) \in O(n!)$
- As reduction ordering, fix an arbitrary KBO or LPO Then ACC' = AC  $\cup \{x + (y + z) = y + (x + z)\}$  ground confluent
- Thm.: Every AC-valid  $s =_m t$  outside ACC' redundant

**Ground Convergent Subsystems (1)** 

AC, ACI, Boolean rings (I – Abelian groups, rings (WI
Improvements in presence From these alone, *infinite* b Grows 1, 3, 11, 53, 313, ... =

Many presentations conflue

- As reduction ordering, fix a Then  $ACC' = AC \cup \{x + (y)\}$
- Thm.: Every AC-valid  $s =_m$

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 $(x_1 + x_2) + x_3 = x_1 + (x_2 + x_3)$  $x_1 + x_2 = x_2 + x_1$  $x_1 + (x_2 + x_3) = x_2 + (x_1 + x_3)$  $x_1 + (x_2 + x_3) = x_3 + (x_1 + x_2)$  $x_1 + (x_2 + x_3) = x_3 + (x_2 + x_1)$  $x_1 + (x_2 + (x_3 + x_4)) = x_2 + (x_1 + (x_4 + x_3))$  $x_1 + (x_2 + (x_3 + x_4)) = x_2 + (x_4 + (x_1 + x_3))$  $x_1 + (x_2 + (x_3 + x_4)) = x_3 + (x_1 + (x_2 + x_4))$  $(x_1 + (x_2 + (x_3 + x_4))) = x_3 + (x_2 + (x_1 + x_4))$  $x_1 + (x_2 + (x_3 + x_4)) = x_3 + (x_2 + (x_4 + x_1))$  $(x_1 + (x_2 + (x_3 + x_4))) = x_3 + (x_4 + (x_1 + x_2))$  $x_1 + (x_2 + (x_3 + x_4)) = x_4 + (x_1 + (x_2 + x_3))$  $x_1 + (x_2 + (x_3 + x_4)) = x_4 + (x_1 + (x_3 + x_2))$  $x_1 + (x_2 + (x_3 + x_4)) = x_4 + (x_2 + (x_3 + x_1))$  $x_1 + (x_2 + (x_3 + x_4)) = x_4 + (x_3 + (x_1 + x_2))$  $x_1 + (x_2 + (x_3 + x_4)) = x_4 + (x_3 + (x_2 + x_1))$ 





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- Proof steps:
  - $-s\sigma \downarrow_{ACC'} t\sigma$  only by skeleton rewrites, by ground confluence
  - applies in particular to crucial first step  $s\sigma[u\rho] \longrightarrow_{u \Rightarrow_n v} s\sigma[v\rho]$
  - complexities:  $({s\sigma}, s, m, t\sigma)$  undercut by  $({s\sigma}, u, n, s\sigma[v\rho])$ provided labels in ACC' are minimal Works *the same* for ACI etc.
- Empirical finding: better *extend* ACC' with x + (y + z) = z + (x + y) and x + (y + z) = z + (y + x)
- CPs/problem ROB005-1 RNG027-5 LAT023-1 RNG035-7 GRP180-1

WM	305 000	418000	130 000	237 000	83 000
WM-AC	33 000	49 000	66 000	161 000	88 000



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- Empirical finding: better *extend* ACC' with x + (y + z) = z + (x + y) and x + (y + z) = z + (y + x)
- Proof problems with AC operators become *feasible Low-budget* technology: easy to implement (High budget: completion modulo AC (Lankford, Ballantyne 1977; Peterson, Stickel 1981; ...))



- Approximate ground joinability by case split on ordering relationships between variables (Martin, Nipkow 1990)
- Implementation simple: map variables to constants LPO: ordering relationships mirrored in precedence KBO: plus restriction on number of constants' occurences Then run through case and check ><sub>enc</sub> in first step
- Number of cases necessary for *n* variables: grows 1, 3, 13, 75, 541, ... =  $\sum_{k=1}^{n} \langle \binom{n}{k-1} \rangle 2^{k-1} \in O(n!)$ *Escalation:* split only on subset of variables Last resort: abort at some limit



- Experimental finding: proof search often blurred! However beneficial if redundant equations kept for rewriting, but not for critical pairing: all descendants redundant
- CPs/problem ROB005-1 RNG027-5 LAT023-1 RNG035-7 GRP180-1

WM	305 000	418000	130 000	237 000	83000
WM-AC	33 000	49000	66 000	161 000	88 000
WM-AC-GJ	18000	54 000	54000	148 000	65 000

• Criterion *not limited* to fixed theories, but most useful for AC Ground convergent systems for *Abelian groups* and *rings* 



- Decision procedure for ground confluence if > is LPO (Comon, Narendran, Nieuwenhuis, Rusinowitch 1998) LPO constraint solver of (Nieuwenhuis, Rivero 2002)
- Tree nodes marked with equation and ordering constraint Branching wrt. *arbitrary terms* if ordered rewriting (im)possible *Ground joinability* if all leaves tautologies, *redundancy* if ><sub>enc</sub>
- Computationally *expensive:* constraint solving NP-hard already Trees *not unique:* one may fail, another succeed Implementation effort *tremendous*

•	t/s [PIII 1GHz]	BOO023-1 B	00026-1 (	GRP181-3 R	NG028-5 R	OB006-1
	WM-GJ	> 600	2.7	127.8	13.9	44.9
	WM-CT	5.9	144.2	92.9	68.7	35.0



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- Computationally *expensive:* constraint solving NP-hard already Trees *not unique:* one may fail, another succeed Implementation effort *tremendous*
- Effect on proof search: rather *mixed* May help on *individual* problems

#### **AC Ground Reducibility**



- Aim: stronger criterion for AC case without computational effort of confluence trees Idea: from AC class of s = t distill subset w/o redundancy
- Check (permutations of) s and t for ground reducibility wrt. CC' Restricted to skeleton: expressible by usual ordering constraints
- Necessary criterion for constraint satisfiability, *polynomial* cost Closes constraint under some ordering-specific consequences
- t/h [PIII 1GHz] ROB020-1 ROB007-1 LAT018-1 RNG036-7

WM-GJ	6.0	39.4	> 300	888.2
WM-GR	2.6	13.4	13.2	291.2



- Superposition provers E (Schulz 2001) and PROVER9 (McCune 2008): Discard  $C \lor s = t$  outside ACC' if AC  $\models s = t$
- No correctness proof so far impossible the standard way say of (Nieuwenhuis, Rubio 2001 HAR): > as LPO(+>a>b>c) ACC' |= a + (c + b) = c + (b + a) needs a + (c + b) = c + (a + b) total at least a + (c + b), c + (b + a) 
  but {a + (c + b), c + (b + a)} < {a + (c + b), c + (a + b)} Hence not redundant, incompleteness possible</li>
- Remedy: *refine* definition of literal complexity. For  $s\sigma > t\sigma$ :

$$(s \bowtie_m t) \sigma \longmapsto (\{s\sigma\}, \bowtie, s, m, t\sigma)$$

Now superposition redundancy *subsumes* completion redundancy! Cf. framework of *canonical inference* (Dershowitz, Kirchner 2006)



# **IV** Applications



#### WALDMEISTER in Practice

- Foremost: educational, reference implementation ...
- User-reported *application areas:* 
  - reasoning in specific algebraic structures
  - program transformation
  - modelling of agent systems
  - hardware verification
  - knowledge representation
  - protocol synthesis
  - disambiguation in language processing
  - modelling of bible interpretations
- Integration into *interactive systems*:

Ilf –  $\Omega$ mega – Theorema – Mathematica

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- Small conflict clauses for theory reasoners in equality with UIF Algebra of equality proofs (Stump, Tan 2005 RTA)  $\cong$  free groups *Proof mining:* canonical forms hint at *minimal* assumptions
- Adding k congruence proof rules gives theory CGE<sub>k</sub>
   WALDMEISTER delivers k 2 3 4 5
   *ground* convergent size 24 70 566 11910
   system for small k: CPs 320 2676 229371 118887623
- Normal forms *difficult* to characterize. But for k=2: With APROVE-ordering system *orientable* and *convergent* Leads to: *generic* description (Stump, Löchner 2006), completion with termination checking (SLOTHROP 2006 RTA)



- (Phillips, Stanovský 2008) at upcoming *ESARM* workshop: Automated reasoning tools of *increasing impact* on *loop theory!* Survey *LT contributions* obtained with AR support
- Selection of 80 representative proof problems (QPTP)
   Compare performance of various automated theorem provers
   Finding: on equational problems WALDMEISTER performs best
- *Example:* Is every F-quasigroup isotopic to a Moufang loop?

"... the result in [KKP07] was originally derived as a series of results, a number of steps eventually leading to the main theorem... Waldmeister proved it from scratch in 40 minutes."
Had been open since 1967. [KKP07]: 27 pages in J Alg

#### **Single Axioms for the Sheffer Stroke**

- (Wolfram 2002): empirical and systematic study of *computational systems* such as cellular automata, Turing machines, *operator systems* In every class, among *simplest* cases always instances of *great* complexity
- Simplest axiomatizations of Boolean algebra? Thm.: ((x | y) | z) | (x | ((x | z) | x)) = z specifies Sheffer stroke Proved with WALDMEISTER and reprinted ....





#### (Wolfram of *compu* automata In every c instances

Sing

# Simplest Thm.: ((x Proved w

= <u>L42</u> ((ab) (ca)) ((ab) ((ca)b))	= [ <u>133</u> ] a c	(bc))
= <u>[ 144</u> ] ((a b) (c a)) b	[162] (aa) b	=[L63]((bc)(bc))(((bc)(bc))((((bc)a)(ab))(((bc)a)(ab))))
h((ab)(cal)	-[[6]]h(((aa)h)(((aa)(((ac)(ac))d))h)(((aa)(((ac)(ac))d))h)))	-[176] ((((hc)a)(ab))(((hc)a)(ab)))((hc)(ab)))((bc)(bc))
	- [150] b (//aa) b) //ab) /ab) /	
= <u>[ 48</u> ] a D	= <u>[ 150</u> ] D (((aD) (aD)) ((aa) (((aa) D) ((aD) (aD)))))	= [173] ((bc)(bc))(((bc)(bc))(ab))
150 (ab) c	= L45 b(((ab)(ab))((((ab)((bc)a))((ab)((bc)a)))(((aa)b)((ab)(ab)))))	= <u>L63</u> ((ab)(ab))((bc)(bc))
-[143](a((ab)c))((ac)((ab)c))	= [159] b (ab)	= [L47] ((ab) (ab)) ((c((ab) (bc))) (c((ab) (bc))))
		= 1.75 ((ab)(ab))c
= <u>L43</u> (a ((a b) c)/c		
= <u>L42</u> c (a ((a b) c))	$= \lfloor 42 \rfloor a(ba)$	
(51 a (b (a b))	= [L62] (bb) a	U79 a (c ((ab) (ab)))
-[142] a/(ab)b)		= [L42] a (c ((ba) (ba)))
		$=\overline{178}a((hc)(hc))a)$
$= \underbrace{L42}_{([ab]b]a}$	= [L45] ((a(DC)/C)((Ca)(a(DC)))	
= <u>L50</u> a ((ab) (((ab) b) a))	= [L42] ((a(bc))c)((ca)((bc)a))	
= [L42] a ((ba) (((ab)b)a))	= [144] ((a(bc))c)a	= <u>L22</u> (bc) a
= [ _ 44 ] a a	Test a/bc)	[150] a ((b a) c)
(hal/ahl		= [1.70] (c(ba)) a
	= L04  (a(DC)/C)a	$= \overline{[179]} a((ba)((ac)(ac)))$
= [150] (ab) (b((ba)(ab)))	$= [\underline{L42}] a ((a (b c)) c)$	-[/42] a///acl/ac)]/ball
= [L47] (ab) (ab)	= [142] a(c(a(bc)))	= [L42] a (((a c)/(a c)/(b a))
(a)/(b)/(b)/(b)		= [L77] a(((ac)(ac))(DD))
		= <u>L78</u> a (c ((a (bb)) (a (bb))))
= <u>[ [ 44]</u> (a a) ((b a) (((a a) (b a)) ((((a a) (b a)) (a a)) (b a))))	= <u>L59</u> ((ac) (ac)) ((((ac) (ca)) ((ac) (ca))) D)	= L79 ((bb)c)a
= <u>L50</u> (aa) ((((aa) (ba)) (aa)) (ba))	= L52 ((ac) (ac)) ((((ca) (ca)) ((ca) (ca))) b)	[18] ((ca)(ab)) ((ca)(ab))
= [L42] (aa) ((ba) (((aa) (ba)) (aa)))	= [L22] ((ac)(ac)) ((ca)b)	[(40)///(aa)/ab)//(aa)/ab)//(aa)/ab)//(aa)///(aa)///(aa)///(aa)///(aa)///(aa)///(aa)///(aa)///(aa)///(aa)///(aa)///(aa)///(aa)///(aa)///(aa)///(aa)///(aa)///(aa)//(aa)///(aa)///(aa)//(ab)//(aa)//(ab)//(aa)//(ab)//(aa)//(ab)//(aa)//(ab)//(aa)//(ab)//(aa)//(ab)//(aa)//(ab)//(aa)//(ab)//(aa)//(ab)//(aa)//(ab)//(aa)//(ab)//(aa)//(ab)//(aa)//(ab)//(aa)//(ab)//(aa)//(ab)//(aa)//(ab
- [142] (aa) ((ba) ((aa) (ba))))	Ter (ab)(ab)	
	[J50]///abl/abl//abl/abl//////abl/abl//bal//bal///abl/abl	((ca)(ab))))
		= [L75] ((((ca)(ab))((ca)(ab)))(((ca)(ab))((ca)(ab))))((aa)(ca))
= <u>L42</u> (a a) ((b a) (a (a a)))	(ba))))c)	-[122] ((ca)(ab)) ((aa) (ca))
$= \lfloor 47 \rfloor a(aa)$	= [155] (((ab) (ab)) ((ab) (ab))) (((ba) (ba)) c)	
(abl(abl(abl(abl))	-[122] (ab) (((ba) (ba)) c)	= (L/U) ((aa)(Ca))((ab)(Ca))
		$= \underline{L40} a((ab)(ca))$
= [L52] ((D3)(30))((D3)(30))	168] a (((bc) (ba)) ((bc) (ba)))	= L70 ((ca)(ab))a
= <u>L52</u> ((ab) (ba)) ((ba) (ab))	= [L42] (((bc)(ba))((bc)(ba)))a	= [179] a ((ab) ((a (ca)) (a (ca))))
= L52 ((ab) (ba)) ((ab) (ab))	= [163] a (a ((bc) (ba)))	-[170] a(((a(ca))(a(ca)))(ba))
155 ab	-[122] a (a //h c //h //h a /h)]]]	
		= [277] a ((a (ca)) (a (ca)) (0 0))
= (LZZ) ((ab) (ab) ((ab) (ab))	= L33 a (a ((bc) (((bc) (b ((ba) b))) (bc))))	= (L78) a((ca)((a(DD))(a(DD))))
= <u>L54</u> ((ab)(ba))((ab)(ab))	= [A] a ((((bc)a) (b((ba)b))) ((bc) (((bc) (b((ba)b))) (bc))))	= L79 ((bb)(ca))a
= [L52] ((ba) (ba)) ((ab) (ab))	-[A]a(h((ha)h))	TT ((bb)a)((cc)a)
1 m a/b/bbl		= [142] ((bb)a)(a(cc))
= <u>L53</u> a ((DD) ((aD) (aD)))	= L62 (bb)a	= L42 (a(cc)/(00)a)
= <u>L42</u> a (((ab) (ab)) (bb))	Lee (bc)a	= 122 (((aa)(aa))(cc))((DD)a)
= [140] a (((ab) (ab)) (((bb) (ab)) ((bb) (ab))))	-[122] (((hc)(hc))((hc)(hc)))a	= <u>L80</u> ((bb)a) (((aa) ((bb)a)) (cc))
= 1.53 a((ab)((ab)(ab)))		= [L70] ((cc) ((aa) ((bb)a))) ((bb)a)
-[/ 42] a // (a b)		= [181] (((aa) ((bb)a)) (((bb)a) c)) (((aa) ((bb)a)) (((bb)a) c))
$= L_{42} a (((a b)/(a b)/(a b)/(a b)))$	(((bc)(bc))a)))	
= [132] a(((ab)(ab))(a((ab)(ab))))	-[155] a//(ch)//(hc)/hc))a))/(ch)/((hc)/hc))a)))	
= <u>L51</u> a a		= [180] (((DD)(DD))()a) ((((DD)(DD))()a)
72 a(b(bb))		= <u>L42</u> ((c((bb)(bb)))a) ((c((bb)(bb)))a)
	=[ <u>L69</u> ]a(((cb)(((bc)(bc))a))((cb)(((bc)(bc))a)))	= [L40] ((((c((bb)(bb)))(c((bb)(bb))))((bb)(c((bb)(bb)
= [130] a a	= L67 a(((cb)(cb))((cb)(cb)))	(bb)))(c((bb)(bb))))((bb)(c((bb)(bb)))))a)
L57 ((aa) (((ab) (ab)) c)) ((aa) (((ab) (ab)) c))	- [122] * (ab)	
= [156] ((aa) (((ab) (d (d d))) c)) ((aa) (((ab) (d (d d))) c))		= [ L60 ] ((((C((DD)(DD)))(C((DD)(DD))))D)a) ((((C((DD)(DD)))(C((DD)(D))))) (C((DD)(D)))) (C((DD)(D)))) (C((DD)(D)))) (C((DD)(D)))) (C((DD)(D)))) (C((DD)(D))) (D)) (D
-[156] ((a(d(dd)))(((ab)(d(dd)))c))((a(d(dd)))(((ab)(d(dd)))c))	[17] ((bc) (bc))a	b)))/b)a)
	= <u>L68</u> a ((((bc)(cb))((bc)a))(((bc)(cb))((bc)a)))	-[142] ((b)(c)(bb)(bb)))(c)((bb)(bb))))a)((b)(c)(bb)(bb)))(c)(bb)(b
= [150] ((a(a(a(a)))(((ab)(a(a(a))))))(a(a(a)))	= [L52] a ((((cb) (cb)) ((bc) a)) (((cb) (cb)) ((bc) a)))	
= <u>L42</u> (d (d d)) ((a (d (d d))) (((a b) (d (d d))) c))	=[166]a((cb)(cb))	D)))))a)
= L42 (d (d d)) ((((ab) (d (d d))) c) (a (d (d d))))		= L78 ((((cb)(cb))((bb)(bb)))a)((((cb)(cb))((bb)(bb)))a)
= L42 (((ab)(d(dd)))c)(a(d(dd))))(d(dd))	[1772] (ba) (((bc)a) ((bc)a))	= [L40] ((((cb)(cb))((b((bb)(cb)))(b((bb)(cb))))a) ((((cb)(cb))((b((b
-[146] ((((ab))(d(dd)))(a(d(dd))))(((ab)(d(dd)))((d(dd)))((ab)(d(d	= [L3] (a((ba)(((bc)a)((bc)a))))((aa)(((aa)((ba)(((bc)a)((bc)a))))(aa)))	h1(-h11/h//hb1/ah1111)
	= [133] (a((ba)(((bc)a)((bc)a)))) ((aa)((ba)(((bc)a)((bc)a))))	0/(00/)/0/(00)/00////8/
d)))))	-[[61]/ba)/(aa)/(ba)/(bc)a)/(bc)a)))	= <u>L65</u> ((((cb)(cb))((b((cb)(b((bb)(cb)))))(b((cb)(b((bb)(cb))))))a)
= L33 ((((ab)(d(dd)))c)(a((a(d(dd)))a)))(((ab)(d(dd)))((d(dd))((ab)		((((cb)(cb))((b((cb)(b((bb)(cb)))))(b((cb)(b((bb)(cb))))))a)
(d(dd))))		-[/75]///cbl/cbl/blal////cbl/cbl/blal
		= <u>L/8</u> ((D((CD)(CD)))a) ((D((CD)(CD)))a)
		= L31 ((cb)a) ((cb)a)

A proof that the axiom system  $\{((b \circ c) \circ a) \circ (b \circ ((b \circ a) \circ b)) = a\}$  given as example (g) on page 808 can reproduce the Sheffer axiom system (c), and is thus a complete axiom system for logic. The proof involves taking the original axiom  $\boxed{A}$  and using it to establish a sequence of lemmas  $\boxed{Ln}$ , from which it is eventually possible to prove the three Sheffer axioms  $\boxed{n}$ . In each part of the proof each line can be obtained from the previous one just as on page 775 by applying the axiom or lemma indicated. Explicit  $\overline{n}$  operators have been omitted to allow expressions to be printed more compactly. The proof shown takes a total of 343 steps, and involves intermediate expressions with as many as 128 NANDS. It is quite possible that the proof could be considerably shortened. Note that any proof can always be recast without lemmas, but will usually then be much longer.

#### Single Axioms for the Sheffer Stroke

- (Wolfram 2002): empirical and systematic study of *computational systems* such as cellular automata, Turing machines, *operator systems* In every class, among *simplest* cases always instances of *great* complexity
- Recognizes *progress in AR* over the decades:

Th. Hillenbrand

"Ever since the 1970s I at various times investigated using automated theorem-proving systems. But it always seemed that extensive human input ... was needed to make such systems actually find non-trivial proofs. In the late 1990s, however, I decided to try the latest systems and was surprised that some of them could routinely produce proofs hundreds of steps long with little or no guidance."







• Consequence of these experiments:

"We are interested in adding theorem proving capabilities to MATHEMATICA." (Oct. 2002)

- Introduced SW engineers of Wolfram, Inc. into WM code System had to become *re-entrant*, danger of *memory leaks* Patent attorneys of MPG worked out *license agreement*
- Functionality available since release of version 6.0 in mid-2007
   Encapsulated within FullSimplify[expr, assum] ...

## Integration i

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#### **Equational Theorem Proving**

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#### Integration into MATHEMATICA



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- Functionality available since release of version 6.0 in mid-2007 Encapsulated within FullSimplify[expr, assum]
- Gives evidence that automated theorem proving is spreading Seize the opportunity!



- Analysis of *proof procedure* leads to smart system design
- *Prover engineering* produces high-performance system
- *Controlling redundancy* is the key to solving difficult problems
- Taking all this together, *applications* are out there somewhere
- *Future work* includes:
  - Horn theories, by the lazy programmer
  - joint efforts on open problems



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