

# Automated Theorem Proving

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# Motivation

everybody loves my baby  
but my baby don't love nobody but me

(Doris Day)

# Mechanised Reasoning

**past:** different systems/communities

- interactive theorem provers (Coq, HOL, Isabelle, Agda, Epigram, . . . )
- automated theorem provers (Prover9, Vampire, E, Spass, . . . )
- SAT/SMT solvers and other special purpose tools

**future:** mechanised reasoning environments that integrate these tools

**this lecture:** automated theorem proving (ATP)

- how they work
- when they are useful
- what they can't do (currently)

# Overview

**main topics:** we will discuss

- solving equations: term rewriting and Knuth-Bendix completion
- first-order reasoning: ordered resolution and saturation-based ATP
- some ATP modelling examples

**tools used:** Prover9, Mace4

# Term Rewriting

**example:** Consider the following rules for monoids

$$(xy)z \rightarrow x(yz) \quad 1x \rightarrow x \quad x1 \rightarrow x$$

**questions:**

- does this yield normal forms?
- can we decide whether two monoid terms are equivalent?

# Term Rewriting

**examples:** consider the following rules for the stack

$$\text{top}(\text{push}(x, y)) \rightarrow x$$

$$\text{pop}(\text{push}(x, y)) \rightarrow y$$

$$\text{empty?}(\perp) \rightarrow \text{T}$$

$$\text{empty?}(\text{push}(x, y)) \rightarrow \text{F}$$

**question:** what about the rule

$$\text{push}(\text{top}(x), \text{pop}(x)) \rightarrow x$$

which applies if  $\text{empty?}x = \text{F}$  ?

# Terms and Term Algebras

**terms:**  $T_{\Sigma}(X)$  denotes set of terms over signature  $\Sigma$  and variables from  $X$

$$t ::= x \mid f(t_1, \dots, t_n)$$

constants are functions of arity 0

**ground term:** term without variables

**remark:** terms correspond to labelled trees

# Terms and Term Algebras

**example:** Boolean algebra

- signature  $\{+, \cdot, \bar{\phantom{x}}, 0, 1\}$
- $+$ ,  $\cdot$  have arity 2;  $\bar{\phantom{x}}$  has arity 1;  $0, 1$  have arity 0
- terms

$$+(x, y) \approx x + y \qquad \cdot(x, +(y, z)) \approx x \cdot (y + z)$$

**intuition:** terms make the sides of equations

$$(x + y) + z = x + (y + z) \qquad x + y = y + x \qquad x = \overline{\overline{x} + \overline{y}} + \overline{\overline{x} + \overline{y}}$$
$$x \cdot y = \overline{\overline{x} + \overline{y}}$$



# Terms and Term Algebras

## substitution:

- partial map  $\sigma : X \rightarrow T_{\Sigma}(X)$  (with finite domain)
- all occurrences of variables in  $\text{dom}(\sigma)$  are replaced by some term
- “homomorphic” extension to terms, equations, formulas, . . .

**example:** for  $f(x, y) = x + y$  and  $\sigma : x \mapsto x \cdot z, y \mapsto x + y$ ,

$$f(x, y)\sigma = f(x \cdot z, x + y) = (x \cdot z) + (x + y)$$

**remark:** substitution is different from replacement:

replacing term  $s$  in term  $r(\dots s \dots)$  by term  $t$  yields  $r(\dots t \dots)$

# Terms and Term Algebras

$\Sigma$ -algebra: structure  $(A, (f_A : A^n \rightarrow A)_{f \in \Sigma})$

**interpretation** (meaning) of terms

- assignment  $\alpha : X \rightarrow A$  gives meaning to variables
- homomorphism  $I_\alpha : T_\Sigma(X) \rightarrow A$ 
  - $I_\alpha(x) = \alpha(x)$  for all variables
  - $I_\alpha(c) = c_A$  for all constants
  - $I_\alpha(f(t_1, \dots, t_n)) = f_A(I_\alpha(t_1), \dots, I_\alpha(t_n))$

**equations:**  $A \models s = t \Leftrightarrow I_\alpha(s) = I_\alpha(t)$  for all  $\alpha$ .

# Terms and Term Algebras

## examples:

- BA terms can be interpreted in BA  $\{0, 1\}$  via truth tables; row gives  $I_\alpha$
- operations on finite sets can be given as Cayley tables

$\cdot$	0	1	2	3
0	0	0	0	0
1	0	1	2	3
2	0	2	0	2
3	0	3	2	1

( $\mathbb{N} \bmod 4$ )

# Deduction and Reduction

**equational reasoning:** does  $E$  imply  $s = t$  ?

- Proofs:
  1. use rules of **equational logic**  
(reflexivity, symmetry, transitivity, congruence, substitution, Leibniz, . . . )
  2. use **rewriting** (orient equations, look for canonical forms)
- Refutations: Find model  $A$  with  $A \models E$  and  $A \models s \neq t$

**example:** equations for Boolean algebra

- imply  $x \cdot y = y \cdot x$  (prove it)
- but not  $x + y = x$  (find counterexample)

# Rewriting

**question:** how can we effectively reduce to canonical form?

- reduction sequences must **terminate**
- reduction must be **deterministic**  
(diverging reductions must eventually converge)

**example:** the monoid rules generate canonical forms (why?)

# Abstract Reduction

**abstract reduction system:** structure  $(A, (R_i)_{i \in I})$   
with set  $A$  and binary relations  $R_i$

**here:** one single relation  $\rightarrow$  with

- $\leftarrow$  converse of  $\rightarrow$
- $\rightarrow \circ \rightarrow$  relative product
- $\leftrightarrow = \rightarrow \cup \leftarrow$
- $\rightarrow^+$  transitive closure of  $\rightarrow$
- $\rightarrow^*$  reflexive transitive closure of  $\rightarrow$

**remarks:**

- $\rightarrow^+$  is transitive
- $\rightarrow^*$  is preorder

# Abstract Reduction

## terminology:

- $a \in A$  **reducible** if  $a \in \text{dom}(\rightarrow)$
- $a \in A$  **normal form** if  $a \in \overline{\text{dom}(\rightarrow)}$
- $b$  normal form of  $a$  if  $a \rightarrow^* b$  and  $b$  normal form
- $\rightarrow^* \circ \leftarrow^*$  is called **rewrite proof**

## properties:

- **Church-Rosser**  $\leftrightarrow^* \subseteq \rightarrow^* \circ \leftarrow^*$
- **confluence**  $\leftarrow^* \circ \rightarrow^* \subseteq \rightarrow^* \circ \leftarrow^*$
- **local confluence**  $\leftarrow \circ \rightarrow \subseteq \rightarrow^* \circ \leftarrow^*$
- **wellfounded** no infinite  $\rightarrow$  sequences
- **convergence** is confluence and wellfoundedness

# Abstract Reduction

**theorems:** (canonical forms)

- Church-Rosser equivalent to confluence
- confluence equivalent to local confluence and wellfoundedness

**intuition:** local confluence yields local criterion for Church-Rosser property

**termination proofs:** let  $(A, <_A)$  and  $(B, \leq_B)$  be posets with  $\leq_B$  wf  
then  $\leq_A$  wf if there is monotonic  $f : A \rightarrow B$

**intuition:** reduce termination analysis to “well known” order like  $\mathbb{N}$



# Term Rewriting

**term rewrite system:** set  $R$  of **rewrite rules**  $l \rightarrow r$  for  $l, r \in T_\Sigma(X)$

**one-step rewrite:**  $t(\dots l\sigma \dots) \rightarrow t(\dots r\sigma \dots)$  for  $l \rightarrow r \in R$  and  $\sigma$  substitution  
(if  $l$  **matches** subterm of  $t$  then subterm is **replaced** by  $r\sigma$ )

**rewrite relation:** smallest  $\rightarrow_R$  containing  $R$  and closed  
under contexts (monotonic) and substitutions (fully invariant)

**example:**  $1 \cdot (x \cdot (y \cdot z)) \rightarrow x \cdot (y \cdot z)$  is one-step rewrite with  
monoid rule  $1 \cdot x \rightarrow x$  and substitution  $\sigma : x \mapsto x \cdot (y \cdot z)$

# Term Rewriting

**fact:** convergent TRSs can decide equational theories

**theorem:** (Birkhoff)  $E \models \forall \vec{x}. s = t \Leftrightarrow s \leftrightarrow_E^* t \Leftrightarrow \text{cf}(s) = \text{cf}(t)$

**corollary:** theories of finite convergent sets of equations are decidable

**question:** how can we turn  $E$  into convergent TRS?

# Local Confluence in TRS

## observation:

- local confluence depends on overlap of rewrite rules in terms
- if  $l_1 \rightarrow r_1$  rewrites a “skeleton subterm”  $l'_2$  of  $l_2 \rightarrow r_2$  in some  $t$  then  $l_1\sigma_1$  and  $l_2\sigma_2$  must be subterms of  $t$  and  $l_1\sigma_1 = l'_2\sigma_2$
- if variables in  $l_1$  and  $l'_2$  are disjoint, then  $l_1(\sigma_1 \cup \sigma_2) = l'_2(\sigma_1 \cup \sigma_2)$
- $\sigma_1 \cup \sigma_2$  can be decomposed into  $\sigma$  which “makes  $l_1$  and  $l'_2$  equal” and  $\sigma'$  which further instantiates the result

**unifier** of  $s$  and  $t$ : a substitution  $\sigma$  such that  $s\sigma = t\sigma$

## facts:

- if terms are unifiable, they have **most general unifiers**
- mgus are unique and can be determined by efficient algorithms

# Unification

**naive algorithm:** (exponential in size of terms)

$$E, s = s \Rightarrow E$$

$$E, f(s_1, \dots, s_n) = f(t_1, \dots, t_n) \Rightarrow E, s_1 = t_1, \dots, s_n = t_n$$

$$E, f(\dots) = g(\dots) \Rightarrow \perp$$

$$E, t = x \Rightarrow E, x = t \quad \text{if } t \notin X$$

$$E, x = t \Rightarrow \perp \quad \text{if } x \neq t \text{ and } x \text{ occurs in } t$$

$$E, x = t \Rightarrow E[t/x], x = t \quad \text{if } x \text{ doesn't occur in } t$$

# Unification

**example:**

$$f(g(x, b), f(x, z)) = f(y, f(g(a, b), c))$$

⇓

...

⇓

$$y = g(g(a, b), b), \quad x = g(a, b), \quad z = c$$

# Critical Pairs

**task:** establish local confluence in TRS

**question:** how can rewrite rules overlap in terms?

- disjoint redexes (automatically confluent)
- variable overlap (automatically confluent)
- skeleton overlap (not necessarily confluent)

. . . see diagrams

**conclusion:** skeleton overlaps lead to equations that may not have rewrite proofs

# Critical Pairs

**critical pairs:**  $l_1\sigma(\dots r_2\sigma \dots) = r_1\sigma$  where

- $l_1 \rightarrow r_1$  and  $l_2 \rightarrow r_2$  rewrite rules
- $\sigma$  mgu of  $l_2$  and subterm  $l'_1$  of  $l_1$
- $l'_1 \notin X$

**example:**  $x + (-x) \rightarrow 0$  and  $x + ((-x) + y) \rightarrow y$  have cp  $x + 0 = -(-x)$

**theorem:** A TRS is locally confluent iff all critical pairs have rewrite proofs

**remark:** confluence decidable for finite wf TRS  
(only finitely many cps must be inspected)

# Wellfoundedness/Termination

**fact:** proving termination of TRSs requires complex constructions

**lexicographic combination:** for posets  $(A_1, <_1)$  and  $(A_2, <_2)$  define  $<$  of type  $A_1 \times A_2$  by

$$(a_1, a_2) > (b_1, b_2) \Leftrightarrow a_1 >_1 b_1, \text{ or } a_1 = b_1 \text{ and } a_2 > b_2$$

**fact:**  $(A_1 \times A_2, <)$  is a poset and  $<$  is wf iff  $<_1$  and  $<_2$  are



# Wellfoundedness/Termination

**multiset** over set  $A$ : map  $m : A \rightarrow \mathbb{N}$

**remark:** consider only finite multisets

**multiset extension:** for poset  $(A, <)$  define  $<$  of type  $(A \rightarrow \mathbb{N}) \times (A \rightarrow \mathbb{N})$  by

$$m_1 > m_2 \Leftrightarrow m_1 \neq m_2 \text{ and}$$

$$\forall a \in A. (m_2(a) > m_1(a) \Rightarrow \exists b \in A. (b > a \text{ and } m_1(b) > m_2(b)))$$

**fact:** this is a partial order; it is wellfounded if the underlying order is

# Reduction Orderings

**idea:** for finite TRS, inspect only finitely many rules for termination

**reduction ordering:** wellfounded partial ordering on terms  
such that all operations and substitutions are order preserving

**fact:** TRS terminates iff  $\rightarrow$  is contained in some reduction ordering

**in practice:** reduction orderings should have computable approximations  
(halting problem)

**interpretation:** reduction orderings are wf iff all ground instantiations are wf

# Reduction Orderings

## polynomial orderings:

- associate function terms with polynomial weight functions with integer coefficients
- checking ordering constraints can be undecidable (Hilbert's 10th problem)
- restrictions must be imposed

# Reduction Orderings

**simplification orderings:** monotonic ordering on terms that contain the (strict) subterm ordering

**theorem:** simplification orderings over finite signatures are wf but not all wf orderings are simplification orderings

**example:**  $ffx \rightarrow fgfx$  terminates and induces reduction ordering  $>$

1. assume  $>$  is simplification ordering
2.  $fx$  is subterm of  $gfx$ , hence  $gfx > fx$
3. then  $fgfx > ffx$  by monotonicity
4. so  $ffx > ffx$ , a contradiction
5. conclusion: wf not always captured by simplification ordering

# Simplification Orderings

**lexicographic path ordering:** for precedence  $\succ$  on  $\Sigma$  define relation  $>$  on  $T_\Sigma(X)$

- $s > x$  if  $x$  proper subterm of  $s$ , or
- $s = f(s_1, \dots, s_m) > g(t_1, \dots, t_n) = t$  and
  - $s_i > t$  for some  $i$  or
  - $f \succ g$  and  $s > t_i$  for all  $i$  or
  - $f = g$ ,  $s > t_i$  for all  $i$  and  $(s_1, \dots, s_m) > (t_1, \dots, t_m)$  lexicographically

**fact:** lpo is simplification ordering, it is total if the precedence is

**variations:**

- **multiset path ordering:** compare subterms as multisets
- **recursive path ordering:** function symbols have either lex or mul status
- **Knuth-Bendix ordering:** hybrid of weights and precedences

# Knuth-Bendix Completion

**idea:** take set of equations and reduction ordering

- orient equations into decreasing rewrite rules
- inspect all critical pairs and add resulting equations
- delete trivial equations
- if all equations can be oriented, KB-closure contains convergent TRS

**extension:** delete **redundant** expressions, e.g.

if  $r \rightarrow s, s \rightarrow t \in R$ , then adding  $r \rightarrow t$  to  $R$  makes  $r \rightarrow s$  redundant

**therefore:**

- KB-completion combines deduction and reduction
- this is essentially **basis construction**

# Knuth-Bendix Completion

**rule based algorithm:** let  $<$  be reduction ordering

- delete:  $E, t = t, R \Rightarrow E, R$
- orient:  $E, s = t, R \Rightarrow E, R, s \rightarrow t$  if  $s > t$
- deduce:  $E, R \Rightarrow E, s = t, R$  if  $s = t$  is cp from  $R$
- simplify:  $E, r = s, R \Rightarrow E, r = t, R$  if  $s \rightarrow_R t$
- compose:  $E, R, r \rightarrow s \Rightarrow E, R, r \rightarrow t$  if  $s \rightarrow_R t$
- collapse:  $E, R, r \rightarrow s \Rightarrow E, s = t, R$  if  $r \rightarrow_R t$  rewrites strict subterm

**remark:** permutations in  $s = t$  are implicit

**strategy:**  $((\textit{simplify} + \textit{delete})^*; (\textit{orient}; (\textit{compose} + \textit{collapse})^*))^*; \textit{deduce})^*$

# Knuth-Bendix Completion

**properties:** the following facts can be shown

- **soundness:** completion doesn't change equational theory
- **correctness:** if process is **fair** (all cps eventually computed) and all equations can be oriented, then limit yields convergent TRS "KB-basis"

**main construction:** use complex wf order on proofs to show that all completion steps decrease proofs, hence induce rewrite proofs

**observation:** completion need not succeed

- it can fail to orient persistent equations
- it can loop forever

**fact:** if completion succeeds, it yields **canonical** TRS (convergent and interreduced)



# Knuth-Bendix Completion

## observation:

- KB-completion always succeeds on ground TRSs (congruence closure)
- KB-completion wouldn't fail when  $<$  is total
- but rules  $xy = yx$  can never be oriented

**unfailing completion:** only rewrite with equations when this causes decrease

- let  $l_1 \rightarrow r_1$  and  $l_2 \rightarrow r_2$
- let  $l'_1$  be “skeleton” subterm of  $l_1$
- let  $\sigma$  be mgu of  $l'_1$  and  $l_2$
- let  $\mu$  be substitution with  $l_1\sigma\mu \not\leq r_1\sigma\mu$  and  $l_1\sigma\mu \not\leq l_1\sigma(\dots r_2\sigma \dots)\mu$

then  $l_1\sigma(\dots r_2\sigma \dots) = r_1\sigma$  is ordered cp for deduction

# Knuth-Bendix Completion

## remarks:

- unfailing completion is a complete ATP procedure for pure equations
- this has been implemented in the Waldmeister tool

# Knuth-Bendix Completion

**example:** groups

- input: appropriate ordering and equations

$$1 \cdot x = x \quad x^{-1} \cdot x = 1 \quad (x \cdot y) \cdot z = x \cdot (y \cdot z)$$

- output: canonical TRS

$$\begin{aligned} 1^{-1} &\rightarrow 1 & x \cdot 1 &\rightarrow x & 1 \cdot x &\rightarrow x & (x^{-1})^{-1} &\rightarrow x \\ x^{-1} \cdot x &\rightarrow 1 & x \cdot x^{-1} &\rightarrow 1 & x^{-1} \cdot (x \cdot y) &\rightarrow y \\ x \cdot (x^{-1} \cdot y) &\rightarrow y & (x \cdot y)^{-1} &\rightarrow y^{-1} \cdot x^{-1} & (x \cdot y) \cdot z &\rightarrow x \cdot (y \cdot z) \end{aligned}$$

# Knuth-Bendix Completion

**example:** groups (cont.)

proof of  $(x^{-1} \cdot (x \cdot y))^{-1} = (x^{-1} \cdot y)^{-1} \cdot x^{-1}$

$$\begin{aligned}(x^{-1} \cdot (x \cdot y))^{-1} &\rightarrow_R y^{-1} \\ &\leftarrow_R y^{-1} \cdot 1 \\ &\leftarrow_R y^{-1} \cdot ((x^{-1})^{-1} \cdot x^{-1}) \\ &\leftarrow_R (y^{-1} \cdot (x^{-1})^{-1}) \cdot x^{-1} \\ &\leftarrow_R (x^{-1} \cdot y)^{-1} \cdot x^{-1}\end{aligned}$$

# Propositional Resolution

**literals** are either

- propositional variables  $P$  (positive literals) or
- negated propositional variables  $\neg P$  (negative literals)

**clauses** are disjunctions (multisets) of literals

**clause sets** are conjunctions of clauses

**property:** every propositional formula is equivalent to a clause set  
(linear structure preserving algorithm)

# Propositional Resolution

**orders:** let  $S$  be clause set

- consider total wf order  $<$  on variables
- extend lexicographically to pairs  $(P, \pi)$  on literals where  $\pi$  is 0 for positive literals and 1 for negative ones
- compare clauses with the multiset extension of that order

**consequence:**  $<$  total wf order on  $S$

# Propositional Resolution

**building models:** **partial model**  $H$  is set of positive literals

- inspect clauses in increasing order
- if clause is false and maximal literal  $P$ , throw  $P$  into  $H$
- if clause is true, or false and maximal literal negative, do nothing

**question:** does this yield model of  $S$ ?

**first reason for failure:** clause set  $\{\Gamma \vee P \vee P\}$  has no model if  $P$  maximal

**remedy:** merge these literals (ordered factoring)

$$\frac{\Gamma \vee P \vee P}{\Gamma \vee P} \quad \text{if } P \text{ maximal}$$

# Propositional Resolution

**second reason for failure:** literals ordered according to indices

clauses	partial models
$P_1$	$\{P_1\}$
$P_0 \vee \neg P_1$	$\{P_1\}$
$P_3 \vee P_4$	$\{P_1, P_4\}$

$\{P_1, P_4\} \not\models P_0 \vee \neg P_1$ , but  $\{P_0, P_1, P_4\} \models P_0 \vee \neg P_1$

**remedy:** add clause  $P_0$  to set (it is entailed)

**more generally:** (ordered resolution)

$$\frac{\Gamma \vee P \quad \Delta \vee \neg P}{\Gamma \vee \Delta} \quad \text{if } (\neg)P \text{ maximal}$$



# Propositional Resolution

**resolution closure:** (saturation)  $R(S)$

**theorem:** If  $R(S)$  doesn't contain the empty clause then the construction yields model for  $S$

**proof:** by wf induction

1. failing construction has minimal counterexample  $C$
2. either positive maximal literal occurs more than once, then factoring yields smaller counterexample
3. or maximal literal is negative, then resolution yields smaller counterexample
4. both cases yield contradiction

**corollary:**  $R(S)$  contains empty clause iff  $S$  inconsistent

# Propositional Resolution

**resolution proofs:** (refutational completeness) empty clause can be derived from all finite inconsistent clause sets

**proof:** by closure construction, empty clause is derived after finitely many steps

**theorem:** (compactness)  $S$  is unsatisfiable iff some finite subset is

**proof:** use the hypotheses from refutation

**theorem:** resolution decides propositional logic

**proof:** the maximal clause  $C$  in  $S$  is the maximal clause in  $R(S)$  and there are only finitely many clauses smaller than  $S$

# A Resolution Proof

```
1 -A | B. [assumption].
2 -B | C. [assumption].
3 A | -C. [assumption].
4 A | B | C. [assumption].
5 -A | -B | -C. [assumption].
6 A | B. [resolve(4,c,3,b),merge(c)].
7 A | C. [resolve(6,b,2,a)].
8 A. [resolve(7,b,3,b),merge(b)].
9 -B | -C. [back_unit_del(5),unit_del(a,8)].
10 B. [back_unit_del(1),unit_del(a,8)].
11 -C. [back_unit_del(9),unit_del(a,10)].
12 $F. [back_unit_del(2),unit_del(a,10),unit_del(b,11)].
```

# First-Order Resolution

## idea:

- transform formulas in prenex form  
(quantifier prefix followed by quantifier free formula)
- Skolemise existential quantifiers  $\forall \vec{x} \exists y. \phi \Rightarrow \forall \vec{x}. \phi[f(\vec{x})/y]$
- drop universal quantifiers
- transform in CNF

**fact:** Skolemisation preserves satisfiability

**example:**  $\forall x. R(x, x) \wedge (\exists y. P(y) \vee \forall x. \exists y. R(x, y) \vee \forall z. Q(z))$  becomes  
 $\forall x. R(x, x) \wedge (P(a) \vee \forall x. R(x, f(x)) \vee \forall z. Q(z))$

# First-Order Resolution

## motivation:

- the premises  $P(f(x, a))$  and  $\neg P(f(y, z) \vee \neg P(f(z, y)))$  imply  $\neg P(f(a, x))$
- this conclusion is **most general** with respect to instantiation
- it can be obtained from the mgu of  $f(x, a)$  and  $f(z, y)$  etc

## first-order resolution:

- don't instantiate, unify (less junk in resolution closure)
- unification instead of identification

$$\frac{\Gamma \vee P \quad \Delta \vee \neg P'}{(\Gamma \vee \Delta)\sigma} \quad \frac{\Gamma \vee P \vee P'}{(\Gamma \vee P)\sigma} \quad \sigma = mgu(P, P')$$

# Lifting

**question:** are all ground inferences instances of non-ground ones?

**theorem:** (lifting lemma)

- let  $\text{res}(C_1, C_2)$  denote the resolvent of  $C_1$  and  $C_2$
- let  $C_1$  and  $C_2$  have no variables in common
- let  $\sigma$  be substitution

then  $\text{res}(C_1\sigma, C_2\sigma) = \text{res}(C_1, C_2)\rho$  for some substitution  $\rho$

**remark:** similar property for factoring

**consequences:** (refutational completeness)

- if clause set is closed then set of all ground instances is closed
- resolution derives the empty clause from all inconsistent inputs

# Redundancy

## question:

- KB-completion allows the deletion of redundant equations
- is this possible for resolution?

## idea: basis construction

- compute resolution closure
- then delete all clauses that are entailed by other clauses
- but model construction “forgets” what happened in the past
- clauses entailed by smaller clauses need not be inspected
- they can never contribute to model or become counterexamples
- can deletion of redundant clauses be stratified?
- can that be formalised?

# Redundancy

**idea:** approximate notion of redundancy with respect to clause ordering

**definition:**

- clause  $C$  is **redundant** with respect to clause set  $\Gamma$  if for some finite  $\Gamma' \subseteq \Gamma$

$$\Gamma' \models C \quad \text{and} \quad C > \Gamma'$$

- resolution inference is **redundant** if its conclusion is entailed by one of the premises and smaller clauses (more or less)

**fact:** it can be shown that resolution is refutationally complete up to redundancy

**intuition:** construction of ordered resolution bases



# Redundancy

## examples:

- tautologies are redundant (they are entailed by the empty set of clauses)
- clause  $C'$  is subsumed by clause  $C$  if

$$C\sigma \subseteq C'$$

clauses that are subsumed are redundant

# ATP in First-Order Logic with Equations

## naive approach:

- equality is a predicate; axiomatise it
- . . . not very efficient

**but** KB-completion is very similar to ordered resolution deduction and reduction techniques are combined

## idea:

- integrate KB-completion/unfailing completion into ordered resolution
- this yields **superposition calculus**

# Superposition Calculus

**assumption:** consider equality as only predicate (predicates as Boolean functions)

**inference rules:** (ground case)

- equality resolution

$$\frac{\Gamma \vee t \neq t}{\Gamma}$$

- positive and negative superposition

$$\frac{\Gamma \vee l = r \quad \Delta \vee s(\dots l \dots) = t}{\Gamma \vee \Delta \vee s(\dots r \dots) = t}$$

$$\frac{\Gamma \vee l = r \quad \Delta \vee s(\dots l \dots) \neq t}{\Gamma \vee \Delta \vee s(\dots r \dots) \neq t}$$

- equality factoring

$$\frac{\Gamma \vee s = t \vee s = t'}{\Gamma \vee t \neq t' \vee s = t'}$$

# Superposition Calculus

## operational meaning of rules:

- **red** terms must be “maximal” in respective equations and clauses
- equality resolution is resolution with “forgotten” reflexivity axiom
- superpositions are resolution with “forgotten” transitivity axiom
- equality factoring is resolution and factoring step with “forgotten” transitivity

**consequence:** equality axioms replaced by focused inference rules

**property:** equality factoring not needed for Horn clauses

**model construction:** adaptation of resolution case, integrating critical pair criteria

# Model Construction

## idea:

- force canonical TRS in resolution model construction
- this effectively constructs a congruence with respect to input equations
- the model constructed is the resulting quotient algebra

## building models: partial model is set of rewrite rules

- inspect equational clauses in increasing order
- if clause is false, maximal equation  $s = t$  ( $s > t$ ), and  $s$  in nf, then throw  $s = t$  into model
- otherwise do nothing

# Model Construction

**ordering:** make negative identities larger than positive ones

- associate  $s = t$  with multiset  $\{s, t\}$
- associate  $s \neq t$  with multiset  $\{s, s, t, t\}$

**consequence:** each stage yields convergent TRS for clauses

- termination holds since all equations are oriented and  $>$  wf
- (local) confluence holds since only reduced lhs are forced into model

# Model Construction

**refutational completeness:** (Horn clauses) if  $R(S)$  doesn't contain the empty clause then construction yields model for  $S$

**proof:** by wf induction

1. failing construction has minimal counterexample  $C$
2.  $C = \Gamma \vee s = s$  impossible since  $C$  must be false
3.  $C = \Gamma \vee s = t$ , hence  $s$  must be reducible by rule  $l \rightarrow r$  generated by clause  $\Delta \vee l = r$  and positive superposition yields smaller counterexample  $\Gamma \vee \Delta \vee s(\dots r \dots) = t$
4.  $C = \Gamma \vee s \neq s$ , then equality resolution yields smaller counterexample  $\Gamma$
5.  $C = \Gamma \vee s \neq t$ , then exists rewrite proof for  $s = t$ , hence  $s$  reducible by rule  $l \rightarrow r$  generated by  $\Delta \vee l = r$  and negative superposition yields smaller counterexample  $\Gamma \vee \Delta \vee s(\dots r \dots) \neq t$

## Example

let  $f \succ a \succ b \succ c \succ d$

Horn clauses	partial models
$c = d$ $f(d) \neq d \vee a = b$ $f(c) = d$	$\{c \rightarrow d\}$
$c = d$ $f(d) \neq d \vee a = b$ $f(c) = d$ $f(d) = d$	$\{c \rightarrow d, f(d) \rightarrow d\}$
$c = d$ $f(d) \neq d \vee a = b$ $f(c) = d$ $f(d) = d$ $d \neq d \vee a = b$	$\{c \rightarrow d, f(d) \rightarrow d, a \rightarrow b\}$



# Model Construction

**non-Horn case:**  $C = \Gamma \vee s = t \vee s = t'$  false,  $t > t'$  and  $t = t'$  has rewrite proof, then equality factoring yields smaller counterexample  $\Gamma \vee t \neq t' \vee s = t'$

**non-ground case:** (lifting)

- do construction at level of ground instances
- for skeleton overlaps use superposition etc
- for variable overlaps, maximal term can be **instantiated** with rhs of reducing rule to obtain smaller counterexample

# Redundancy

**forward redundancy:** simplify new clauses immediately after generation  
(by subsumption, rewriting, . . . )

**backward redundancy:** simplify existing clauses by rewrite rules  
that have been generated at later stage

# Redundancy

**example:** consider lpo with precedence  $f \succ a \succ b$  and equations

$$f(a, x) = x$$

$$f(x, a) = f(x, b)$$

# Redundancy

**example:**

$$f(a, x) = x$$

$$f(x, a) = f(x, b)$$

$$f(a, b) = a$$

is obtained by superposition

# Redundancy

**example:**

$$f(a, x) = x$$

$$f(x, a) = f(x, b)$$

$$f(a, b) = a$$

$$b = a$$

then follows by rewriting the third equation by the first one. . .

# Redundancy

**example:**

$$f(a, x) = x$$

$$f(x, a) = f(x, b)$$

$$a = b$$

. . . and the third equation can be deleted (forward redundancy)

# Redundancy

**example:**

$$f(a, x) = x$$

$$f(x, a) = f(x, b)$$

$$a = b$$

$$f(x, b) = f(x, b)$$

then follows by rewriting the second equation by the third one. . .

# Redundancy

example:

$$f(a, x) = x$$

$$a = b$$

. . . and the second and fourth identity can be deleted



# Redundancy

**example:**

$$f(a, x) = x$$

$$a = b$$

$$f(b, x) = x$$

finally, the first equation can be rewritten by the second one. . .

# Redundancy

example:

$$a = b$$

$$f(b, x) = x$$

. . . and then deleted

# Redundancy

```
assign(order,lpo).
```

```
function_order([b,a,f]). % f>a>b
```

```
formulas(sos).
```

```
f(a,x)=x.
```

```
f(x,a)=f(x,b).
```

```
end_of_list.
```

# Redundancy

given #1 (I,wt=5): 1  $f(a,x) = x$ . [assumption].

given #2 (I,wt=7): 2  $f(x,a) = f(x,b)$ . [assumption].

given #3 (A,wt=3): 3  $a = b$ . [para(2(a,1),1(a,1)),rewrite([1(3)]),flip(a)].

given #4 (T,wt=5): 5  $f(b,x) = x$ . [back\_rewrite(1),rewrite([3(1)])].

...

SEARCH FAILED

# Redundancy

**redundancy:** same concepts as for ordered resolution

**closure computation:** only irredundant inferences

**model construction:** clause sets have models if they are closed  
(up to redundant inferences) and don't contain the empty clause

**proof:** as previously, but contradictions arising from inferences being redundant  
example: positive superposition

$$\frac{\Gamma \vee l = r \quad \Delta \vee s(\dots l \dots) = t}{\Gamma \vee \Delta \vee s(\dots r \dots) = t}$$

right premise has not been forced into model;  
it is redundant by this inference (entailed by smaller premise and conclusion)

# Redundancy

**example:** demodulation

$$P(f(a))$$

$$f(a) = a$$

# Redundancy

**example:** demodulation

$$P(f(a))$$

$$f(a) = a$$

$$P(a)$$

by rewriting “Leibniz principle”

# Redundancy

**example:** demodulation

$$f(a) = a$$

$$P(a)$$

first literal has been deleted since it is now redundant



## Example

**precedence:**  $P \succ Q \succ f \succ a$

**clause set:** initial clauses

$$Q(a)$$

$$Q(a) \Rightarrow f(a) = a$$

$$\neg P(a)$$

$$P(f(a))$$

## Example

**precedence:**  $P \succ Q \succ f \succ a$

**clause set:** fifth clause by resolution from first and second one

$$Q(a)$$

$$Q(a) \Rightarrow f(a) = a$$

$$\neg P(a)$$

$$P(f(a))$$

$$f(a) = a$$

## Example

**precedence:**  $P \succ Q \succ f \succ a$

**clause set:** fourth clause rewritten by last one

$$Q(a)$$

$$Q(a) \Rightarrow f(a) = a$$

$$\neg P(a)$$

$$P(a)$$

$$f(a) = a$$

## Example

**precedence:**  $P \succ Q \succ f \succ a$

**clause set:** empty clause by resolution from third and fourth one

$$Q(a)$$

$$Q(a) \Rightarrow f(a) = a$$

$$\neg P(a)$$

$$P(a)$$

$$f(a) = a$$

$$\perp$$

# Example

```
assign(order,lpo).
```

```
predicate_order([Q,P]). % P>Q
```

```
function_order([a,f]). % f>a
```

```
formulas(sos).
```

```
Q(a).
```

```
Q(a)->f(a)=a.
```

```
-P(a).
```

```
P(f(a)).
```

```
end_of_list.
```

# Example

```
% Proof 1 at 0.01 (+ 0.00) seconds.
% Length of proof is 8.
% Level of proof is 4.
% Maximum clause weight is 6.
% Given clauses 2.

1 Q(a) -> f(a) = a # label(non_clause). [assumption].
2 Q(a). [assumption].
3 -Q(a) | f(a) = a. [clausify(1)].
4 -P(a). [assumption].
5 P(f(a)). [assumption].
6 f(a) = a. [hyper(3,a,2,a)].
7 P(a). [back_rewrite(5),rewrite([6(2)])].
8 $F. [resolve(7,a,4,a)].
```

# Conclusion

## automated theorem proving:

- integrates deduction, reduction and redundancy elimination
- uses rewriting techniques and complex reduction orderings
- sophisticated heuristics, algorithms, data structures make it very efficient
- powerful tool for first-order reasoning  
(e.g. very good at textbook-level proofs in Boolean algebra)
- cannot deal with induction
- difficult to integrate decision procedures (lists, linear arithmetics, arrays, . . . )
- proofs rather incomprehensible

# Conclusion

## interesting research directions:

- reasoning in large theories ("hypothesis learning")
- integration of decision procedures/higher-order features
- domain-specific provers
- provers for constructive logic
- provers for order-based reasoning
- IO standardisation/exchange formats



# Literature

- A. Robinson and A. Voronkov: Handbook of Automated Reasoning
- F. Baader and T. Nipkow: Term Rewriting and All That
- “Terese” Term Rewriting Systems
- T. Hillenbrand: Waldmeister [www.waldmeister.org](http://www.waldmeister.org)
- W. McCune: Prover9 and Mace4 [www.cs.unm.edu/~mccune/mace4](http://www.cs.unm.edu/~mccune/mace4)
- G. Sutcliffe and C. Suttner: The TPTP Problem Library  
[www.cs.miami.edu/~tptp/](http://www.cs.miami.edu/~tptp/)
- extended version of slides (from Midlands Graduate School 2011) at my web site