



Completeness



Completeness Proof



Any set of sentences S is representable in clausal form



Assume S is unsatisfiable, and in clausal form



Herbrand's theorem



Some set S' of ground instances is unsatisfiable



Ground resolution theorem



Resolution can find a contradiction in S'



Lifting lemma



There is a resolution proof for the contradiction in S





- **Herbrand Universe:** Given S set of clause, then H_S — **Herbrand Universe of S** — is the set of all ground terms for S

Example:

$$S = \{ \neg P(x, f(x, A)) \vee \neg Q(x, A) \neg R(x, B) \}$$

$$H_S = \{ A, B, f(A, A), f(A, B), f(B, A), f(A, f(A, A)), \dots \}$$

- **Herbrand base for S :** Given S and H_S , then $H_S(S)$ is the set of all ground clauses for S wrt. H_S — the **Herbrand base for S** —

Example:

$$\{ \neg P(A, f(A, A)) \vee \neg Q(A, A) \neg R(A, B),$$

$$\neg P(B, f(B, A)) \vee \neg Q(B, A) \neg R(B, B),$$

$$\neg P(f(A, A), f(f(A, A), A)) \vee \neg Q(f(A, A), A) \neg R(f(A, A), B),$$

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$$\neg P(f(A, f(A, A)), f(f(A, f(A, A)), A)) \vee \neg Q(f(A, f(A, A)), A) \neg R(f(A, f(A, A)), B),$$

Herbrand's Theorem



[Herbrand, 1930]

If a set S of clauses is unsatisfiable, then there exists a finite subset of $H_S(S)$ that is also unsatisfiable.



Lifting Lemma



Let C_1 and C_2 be two clauses, and C'_1 and C'_2 be two ground instances of C_1 and C_2 .

If C' is a resolvent (prop. logic) of C'_1 and C'_2 , then there exists a clause C , such that

- C is a resolvent of C_1 and C_2 .
- C' is a ground instance of C

Resolvent = 1 resolution step + arbitrary many factorization steps



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Dealing with Equality



How to deal with Equality?



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 - ▶ $\forall x, y, z \ (x = y \wedge y = z) \Rightarrow x = z$
 - ▶ For each function symbol f or arity n that occurs in KB , add
$$\forall x_1, \dots, x_n, y_1, \dots, y_n \ .$$
$$(x_1 = y_1 \wedge \dots \wedge x_n = y_n) \Rightarrow f(x_1, \dots, x_n) = f(y_1, \dots, y_n)$$



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- ▶ For each predicate symbol P or arity n that occurs in KB , add

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- **Problem:** This creates a huge search space!!
- You want to make equality a primitive concept and therefore have specialised rules for it.





- The paramodulation rule:

$$\frac{s = t \vee l_1 \vee \dots \vee l_n \quad m_1 \vee \dots \vee m_i[u] \vee \dots \vee m_n}{(l_1 \vee \dots \vee l_n \vee m_1 \vee \dots \vee m_i[t] \vee \dots \vee m_n)\theta}$$

where θ is the unifier of s and u .

- Example:

$$\neg(K = \text{sort}(L)) \vee \text{sort}([x|L]) = \text{insert_sort}(x, K)$$

$$\text{Sorted}(\text{sort}(y)) \vee \neg(y = \text{nil})$$

$$\frac{\neg(K = \text{sort}(L)) \vee \text{sort}([x|L]) = \text{insert_sort}(x, K) \quad \text{Sorted}(\text{sort}(y)) \vee \neg(y = \text{nil})}{\neg(K = \text{sort}(L)) \vee \text{Sorted}(\text{insert_sort}(x, K)) \vee \neg([x|L] = \text{nil})}$$

where $\theta = [y/[x|L]]$



Strategien





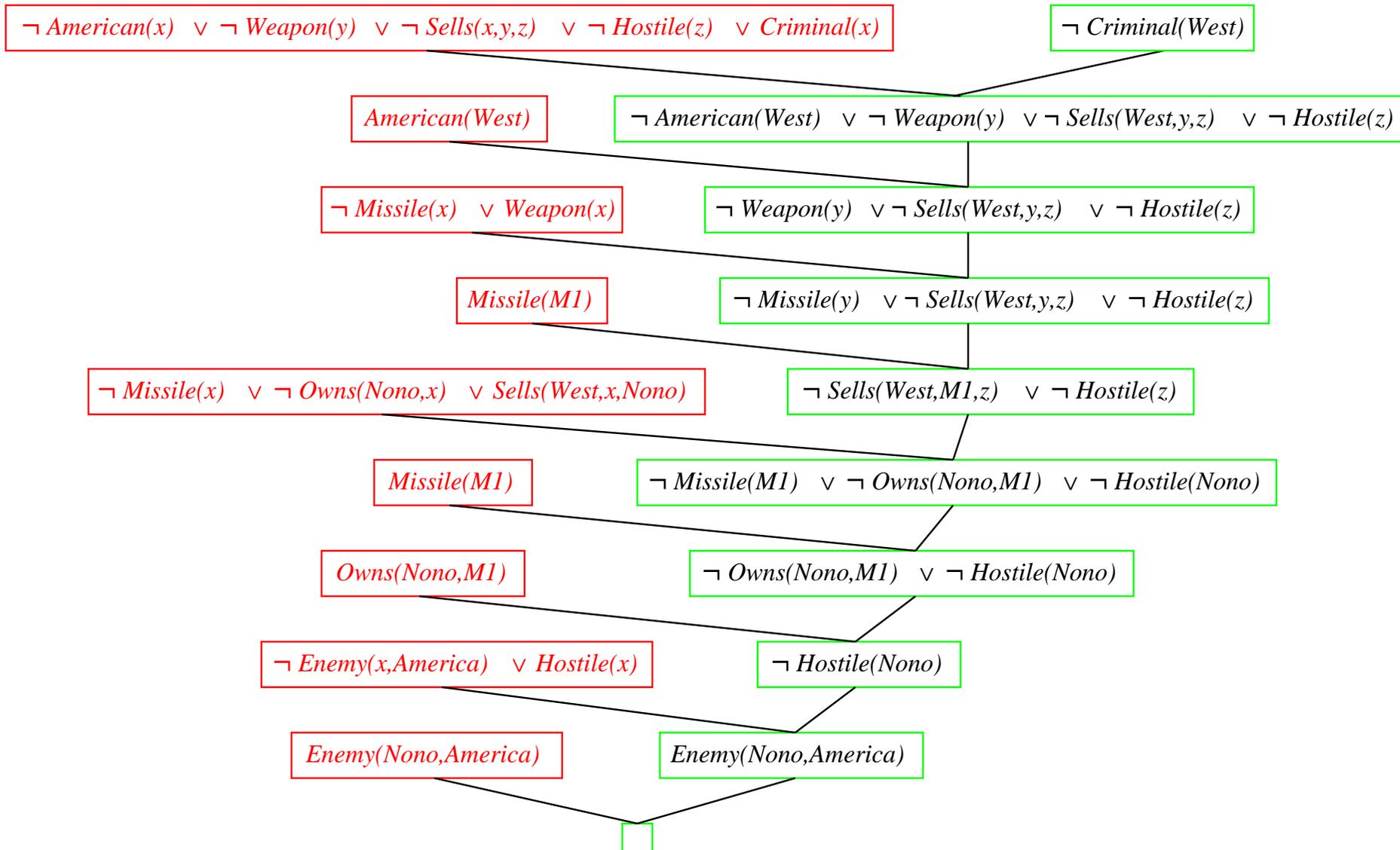
- **Unit preference:** Only allow resolutions if at least one of the clauses is a **unit clause** — contains only one literal
 - ▶ Idea: Using unit clauses will allow result in clauses with strictly less literals
 - ▶ Incomplete in general
 - ▶ Complete for Horn clauses (each clause contains at most one positive literal)
- **Set of support:**
 - ▶ Procedure
 - ▶ Select a subset SoS of the set of clauses
 - ▶ Allow only resolution steps where one partner is from SoS
 - ▶ Resolvent is again in SoS
 - ▶ Not complete for every choice of SoS
 - ▶ Common approach: Take initial SoS be clauses obtained from negated conjecture





- **Input resolution:** Only allow resolutions between C and C' if at least one of C or C' is an **input clause**
 - ▶ Incomplete in general
 - ▶ Complete for Horn clauses (each clause contains at most one positive literal)
 - ▶ Variant **Linear resolution:** Also allow resolution between C and C' if C is an ancestor of C'
 - ▶ Linear resolution is complete
- **Subsumption:** Eliminate all redundant clauses.
 - ▶ A clause C is redundant, if there exists a clause C' which is more general than P .
 - ▶ $P(x)$ is more general than $P(A)$
 - ▶ $P(x)$ is more general than $P(x) \vee Q(y, x)$

Input Resolution Proof





Theorem Provers





- Automated theorem provers: OTTER [McCune92]
- Interactive proof assistants: Ω MEGA [Siekman et.al since 1990]

OTTER

- **Set of support SoS**
- Set of **usable** axioms.
 - ▶ Background knowledge of the problem (i.e. KB)
 - ▶ Boundaries between **usable** and **SoS** can be initially defined by the user
- Set of **rewrites** $u = v$,
 - ▶ always applied from left to right
 - ▶ used for simplification: $x + 0 = x$.
- Set of parameters and clauses that define the strategy





```
procedure OTTER(sos, usable)
```

```
  inputs:  sos, a set of support---clauses defining the problem (a global variable)  
          usable, background knowledge potentially relevant to the problem
```

```
  repeat
```

```
    clause ← the lightest member of sos
```

```
    move clause from sos to usable
```

```
    PROCESS(INFER(clause, usable), sos)
```

```
  until sos = [] or a refutation has been found
```

```
function INFER(clause, usable) returns clauses
```

```
  resolve clause with each member of usable
```

```
  return the resulting clauses after applying FILTER
```

```
procedure PROCESS(clauses, sos)
```

```
  for each clause in clauses do
```

```
    clause ← SIMPLIFY(clause)
```

```
    merge identical literals
```

```
    discard clause if it is a tautology
```

```
    sos ← [clause | sos]
```

```
    if clause has no literals then a refutation has been found
```

```
    if clause has one literal then look for unit refutation
```

```
  end
```



- Nonsense inferences blow up search space
⇒ **Sorts, Types, Dependent Types, ...**



- Nonsense inferences blow up search space
 \implies **Sorts, Types, Dependent Types, ...**
- Some formulas introduced are bad for proof search
 \implies **Integrate theory reasoning into unification algorithm**





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- FOL sufficient to represent about Wumpus-like worlds, but still too restricted
Example: For induction axioms need at least second-order logic
⇒ **Lecture Introduction to CL, Semantics of Higher-Order logics**



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- Other calculi, more restrictions of the search space:
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- Other calculi, more restrictions of the search space:
⇒ **Lecture Automated Reasoning**
- Efficient procedures for fragments
⇒ **rewriting, BDDs, decision procedures, ...**



Even More Further Issues

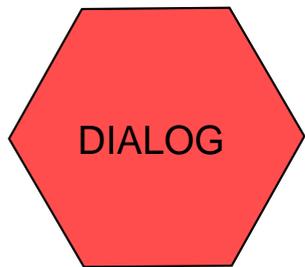


Even if we have all that, we still

only can prove conjectures from a knowledge base.

- Sufficient for the Wumpus world agent, but. . . (Compiler for a PL)
- need much more for doing software verification or mathematics (IDE for a PL)
- What is missing for doing software verification or mathematics?

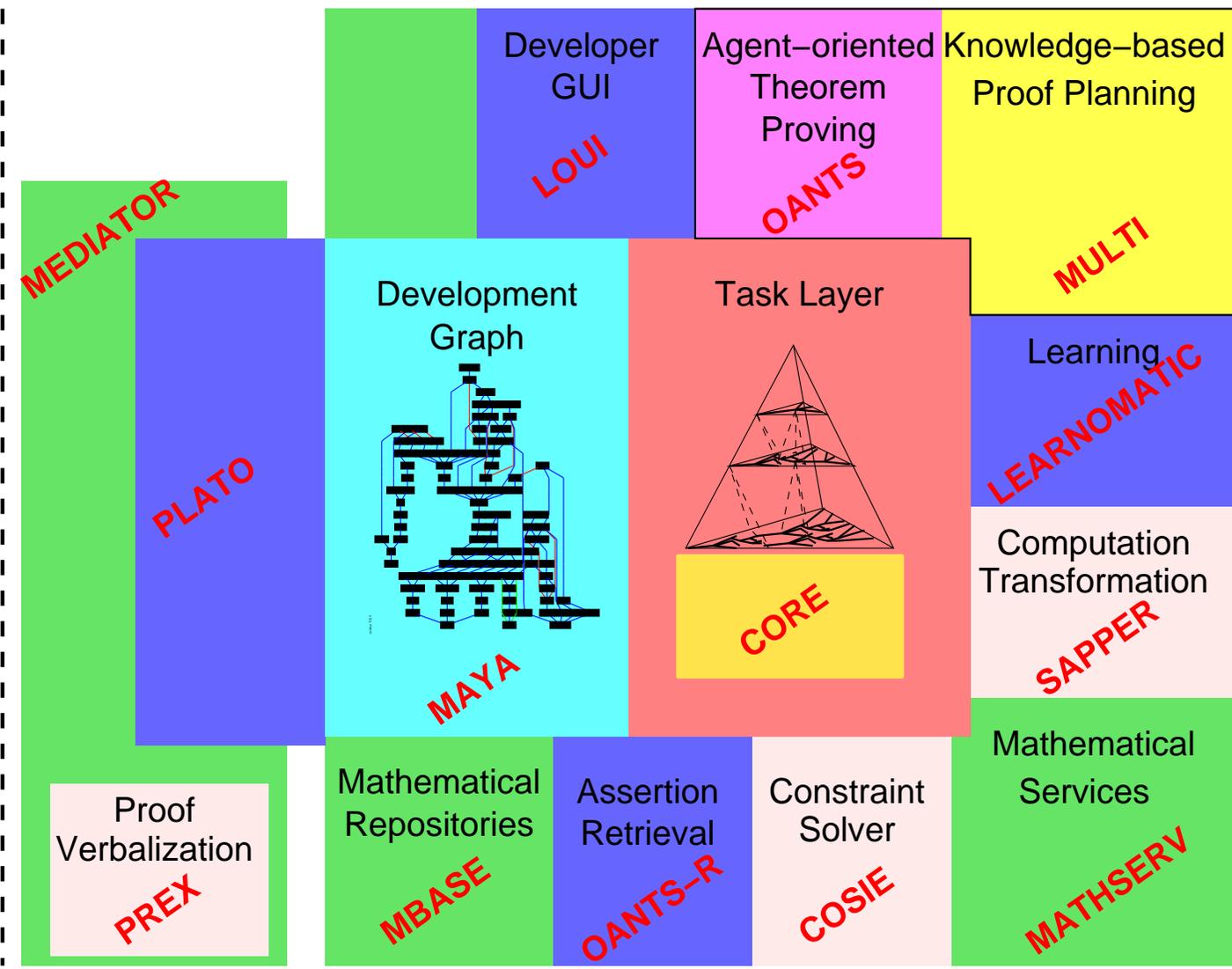




TeXmacs Document

Theorem 1. $\sqrt{2}$ is irrational

Proof. Assume $\sqrt{2}$ is rational, that is, there exist natural numbers n and m with no common divisor such that $\sqrt{2} = \frac{m}{n}$. Then $n\sqrt{2} = m$, and thus $2n^2 = m^2$. Hence m^2 is even and, since odd numbers square to odds, m is even; say $m = 2k$. Then $2n^2 = (2k)^2 = 4k^2$, that is, $n^2 = 2k^2$. Thus, n^2 is even too, and so is n . That means that both n and m are even, contradicting the fact that they do not have a common divisor.



Integrating Texteditors and Proof Assistants



The screenshot shows a text editor window with the following content:

example.tm

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————— Theory [Distributivity in Simple Sets] —————

Context :
We refer to the definitions and axioms of the theory \leftrightarrow [Simple Sets] .

Theorem [Distributivity of intersection] :
It holds that $\forall A, B, C. (A \cap (B \cup C)) = ((A \cap B) \cup (A \cap C))$.

Proof :
We prove the equality of these sets by proving the following two subset relations :
(1) $((A \cap (B \cup C)) \subset ((A \cap B) \cup (A \cap C)))$
(2) $((A \cap B) \cup (A \cap C) \subset (A \cap (B \cup C)))$
We start by proving the first subgoal.
By the \rightarrow [Definition of subset] we need to prove
 $\forall x. x \in (A \cap (B \cup C)) \Rightarrow x \in ((A \cap B) \cup (A \cap C))$.
Assume $x \in (A \cap (B \cup C))$.

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Assume

Apply Definition of subset
Apply Definition of set=
Apply Definition of union -
Apply Definition of union +
Apply Definition of intersection - : Arguments: Compute Results
Apply Definition of intersection +

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start



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It follows that $x \in A \wedge x \in (B \cup C)$.

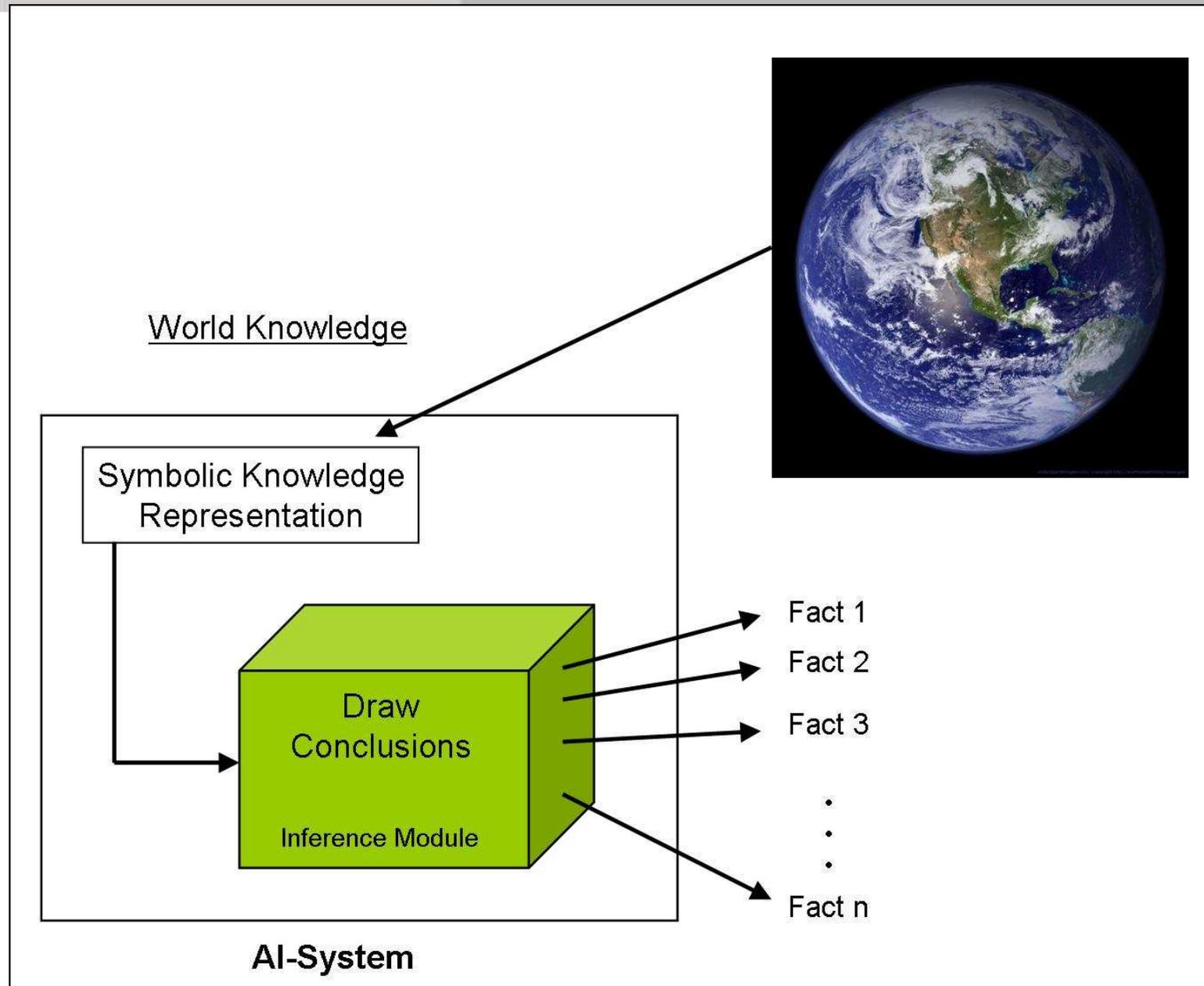
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Fast First-Order Unification







A COMMON OPERATION in (almost all) AI-SYSTEMS:

1.

AUTOMATED THEOREM PROVING^x
"BUILT-IN EQUATIONS"

LOGIC PROGRAMMING
• FEATURES • DATA STRUCTURES

PATTERN INVOKED
PROCEDURES^x

2.

NATURAL LANGUAGE PROCESSING
• UNIFICATION GRAMMARS

VISION^x

3.

KNOWLEDGE REPRESENTATION
EXPERT SYSTEMS



Matching of Descriptions



- **Expert Systems:**
OPS-5; Rete algorithm Forgy 1981; 1982
- **Language Processing:**
Feature Unification Ait-Kaci 1984; Smolka, Ait-Kaci 1987
- **Knowledge Representation:**
KL-ONE; Feature Unification WINO since 1989
- **Vision:**
Graph-Matching Rastall; 1969
- **Pattern Directed Programming Languages:**
Planner; Matchless Hewitt 1972; Stickel 1975





- **Term Rewriting Systems:**

T-Unification

Peterson; Stickel 1981

- **Deduction Systems:**

Modal-, Temporal, Epistemologische Operatoren in \diamond -Unification

Ohlbach 1988; 1989

- **Logical Programming:**

Unification, WAM

D. Warren 1983

The Race for the Fastest (the Earliest) Unification Algorithm



- Exponential: $\mathcal{O}(2^n)$ Robinson
- Quadratic: $\mathcal{O}(n^2)$ Robinson
- Logarithmic: $\mathcal{O}(n \log n)$ Martelli-Montanari
- Linear: $\mathcal{O}(n)$ Paterson-Wegman
- Quasi-linear: \longrightarrow today

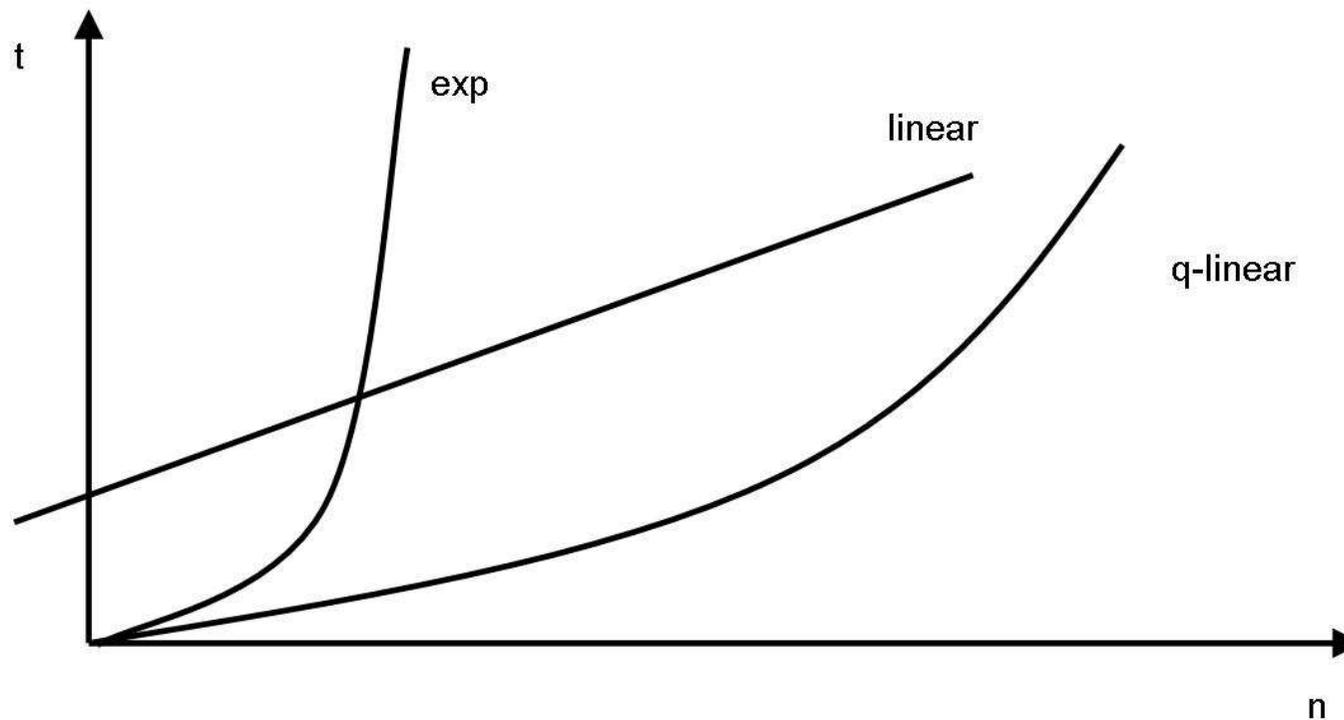
QUADRATIC (instead of exponential)
UNIFICATION
↑↑
 n^2 instead of 2^n





Robinson's Algorithm is exponential

- linear
- quasi linear algorithms





Unsorted Signatures

1920	Emil Post	Unification
1930	J. Herbrand	Unification Algorithm
1960	D. Prawitz	Most General Unifier
1963	M. Davis	'Linked Conjunctions'
1964	J. Guard	Unification
→ 1965	A. Robinson	Most General Unifier
1970	D. Knuth	Unification in T. R.
1971	A. Robinson	Fast Implementation



Unification of Free Terms (cont.)



Unsorted Signatures

	1973	L. D. Baxter	Fast Unification
	1975	M. Venturini-Zille	Fast Unification
→	1976	Martelli-Montanari	(Linear)
	1976	G. Huet	Almost linear
→	1977	Paterson-Wegman	!Linear!
	1982	Kapur et al.	Improvement
	1983	Bidoit and Corbin	Improvement
	1987	Escalade + Ghallap	Improvement





THE

MARTELLI-MONTEFALCONE-

ALGORITHM

(DECOMPOSITION)



- $x_1 = x_2 = \dots = x_n = t_1 = t_2 = \dots = t_n$

- represented as:

$$M: \{\{x_1, \dots, x_n\} = \{t_1, \dots, t_n\}\} = \{V = T\}$$

where x_1, \dots, x_n variables and t_1, \dots, t_n terms.

- Unifier for that representation:

$$\begin{array}{l} \sigma \text{ solves } \{\{x_1, \dots, x_n\} = \{t_1, \dots, t_n\}\}, \\ \text{iff} \\ \sigma x_1 = \dots = \sigma x_n = \sigma t_1 = \dots = \sigma t_n \end{array}$$

- Example: $\{\{x, y\} = \{f(a), f(z)\}\}$

Martelli-Montanari Algorithm



- MM-Input: $G = \{s = t\}$.

- **Init**($s = t$):

$$\{\}, \{\{x\} = \{s, t\}, \{x_1\} = \{\}, \dots, \{x_n\} = \{\}\}$$

where x_i are all variables of s, t and x is a new variable

- **Occurs-in-check:**

$$\frac{T, \{x_1, \dots, x_n\} = \{t\} \star U}{\perp}$$

If some x_i occurs in t

- **Clash:**

$$\frac{T, V = \{f(s_1, \dots, s_n), g(t_1, \dots, t_m)\} \cup M \star U}{\perp}$$





■ Decomposition:

$$\frac{T, V = \{f(s_1^1, \dots, s_n^1), \dots, f(s_1^k, \dots, s_n^k)\} \star U}{[T, V = \{k(x_1, \dots, x_n)\}], \{\text{Norm}(\{x_i\} = \{s_1^i, \dots, s_n^i\}) \mid 1 \leq i \leq n\} \cup \sigma(U)}$$

for $0 \leq n \leq M$, the x_i are new and $\sigma = \{x \leftarrow f(x_1, \dots, x_n) \mid \forall x \in V\}$.

$$\begin{aligned} \text{Norm}(V = T) &\equiv V \cup \text{Vars}(T) = T \setminus \text{Vars}(T) \\ \text{Vars}(x \star T) &\equiv x \star \text{Vars}(T) \text{ (x variable)} \\ \text{Vars}(s \star T) &\equiv \text{Vars}(T) \text{ (s not a variable)} \end{aligned}$$

■ Merge:

$$\frac{T, \{V_1 = T_1, V_2 = T_2\} \cup U}{\{V_1 \cup V_2 = T_1 \cup T_2\}}$$

if $V_1 \cap V_2 \neq \{\}$, i.e. some $x \in V_1$ and $x \in V_2$.

Output of M.-M-Algorithm



- A list of multiequations of the form:

$$[V_1 = \{t_1\}, \dots, V_n = \{t_n\}]$$

- Compute the most general unifier from left to right!
- Example: $[\{x\} = \{g(y)\}, \{y\} = \{h(z)\}]$
mgu: $\sigma = \{x \leftarrow g(h(a)), y \leftarrow h(z)\}$



Example: Unification using M.-M.



Use representation: $x_1 = \dots = x_n = t_1 = \dots = t_m$ for $\{x_1, \dots, x_n\} = \{t_1, \dots, t_m\}$

$\{, \{k(f(x, g(a, y)), g(x, h(y))) = k(f(h(y), g(y, a)), g(z, z))\}$



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$$[], \{k(f(x, g(a, y)), g(x, h(y))) = k(f(h(y), g(y, a)), g(z, z))\}$$

$$\rightarrow \underbrace{[x_0 \leftarrow f(x_1, x_2)]}_{\sigma_1},$$

(Decomposition)

$$\{x_1 = f(x, g(a, y)) = f(h(y), g(y, a)), x_2 = g(x, h(y)) = g(z, z)\}$$



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$$\{x_1 = f(x, g(a, y)) = f(h(y), g(y, a)), x_2 = g(x, h(y)) = g(z, z)\}$$

$$\rightarrow \underbrace{[x_3 \leftarrow f(x_4, x_5), x_6 = g(x_7, x_8)]}_{\sigma_2} \circ \sigma_1, \quad (2 \times \text{Decomposition})$$

$$\{x_4 = x = h(y), x_5 = g(a, y) = g(y, a), x_7 = x = z, x_8 = z = h(y)\}$$



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$$\{x_1 = f(x, g(a, y)) = f(h(y), g(y, a)), x_2 = g(x, h(y)) = g(z, z)\}$$

$$\rightarrow \underbrace{[x_3 \leftarrow f(x_4, x_5), x_6 = g(x_7, x_8)]}_{\sigma_2} \circ \sigma_1, \quad (2 \times \text{Decomposition})$$

$$\{x_4 = x = h(y), x_5 = g(a, y) = g(y, a), x_7 = x = z, x_8 = z = h(y)\}$$

$$\rightarrow \sigma_2, \{x = z = x_7 = x_8 = x_4 = h(y), x_5 = g(a, y) = g(y, a)\} \quad (2 \times \text{Merge})$$



Example: Unification using M.-M.



Use representation: $x_1 = \dots = x_n = t_1 = \dots = t_m$ for $\{x_1, \dots, x_n\} = \{t_1, \dots, t_m\}$

$$[], \{k(f(x, g(a, y)), g(x, h(y))) = k(f(h(y), g(y, a)), g(z, z))\}$$

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$$\rightarrow \underbrace{[\{x, z, x_7, x_8, x_4\} \leftarrow h(y)]}_{\sigma_3} \circ \sigma_2, \{a = y, y = a\} \quad (2 \times \text{Decomposition})$$

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$$\rightarrow \underbrace{[\{x, z, x_7, x_8, x_4\} \leftarrow h(y)]}_{\sigma_3} \circ \sigma_2, \{a = y, y = a\} \quad (2 \times \text{Decomposition})$$

$$\rightarrow \sigma_3, \{y = a = a\} \quad \text{(Merge)}$$

Example: Unification using M.-M.



Use representation: $x_1 = \dots = x_n = t_1 = \dots = t_m$ for $\{x_1, \dots, x_n\} = \{t_1, \dots, t_m\}$

$\rightarrow \sigma_3, \{y = a = a\}$

(Merge)



Example: Unification using M.-M.



Use representation: $x_1 = \dots = x_n = t_1 = \dots = t_m$ for $\{x_1, \dots, x_n\} = \{t_1, \dots, t_m\}$

$\rightarrow \sigma_3, \{y = a = a\}$ (Merge)

$\rightarrow [y \leftarrow a] \circ \sigma_3, \{\}$ (Decomposition)



Example: Unification using M.-M.



Use representation: $x_1 = \dots = x_n = t_1 = \dots = t_m$ for $\{x_1, \dots, x_n\} = \{t_1, \dots, t_m\}$

$\rightarrow \sigma_3, \{y = a = a\}$ (Merge)

$\rightarrow [y \leftarrow a] \circ \sigma_3, \{\}$ (Decomposition)

\Downarrow Extraction

Most general unifier: $\{x \leftarrow h(a), z \leftarrow h(a), y \leftarrow a\}$

$$k(f(x, g(a, y)), g(x, h(y))) = k(f(h(y), g(y, a)), g(z, z))$$



Theorems about M.-M.'s algorithm



- The Martelli-Montanari unification algorithm is:

- ▶ Sound and
- ▶ Complete

Proof: (invariant)

Every rule contains $\cup(G)$ (as in the usual rule syntax)

- The algorithm terminates
(standard proof procedure for many unification algorithms)





- Example Multisets:

$$\begin{aligned}\{3, 3, 3, 4, 0, 0\} &= \{3, 0, 0, 3, 4, 3\} \\ &\neq \{0, 3, 4\}\end{aligned}$$

- **Definition:** for a partially ordered set $(S, <)$ the corresponding multiset order is defined as:

$M \gg M'$ iff

1. $M' = (M - X) \cup Y$ for multisets X, Y
2. $\forall y \in Y$ there exists $x \in X$ with $X > Y$

- Example:

$$\begin{aligned}\{3, 3, 4, 0\} &\gg \{3, 4\} \\ &\gg \{3, 2, 2, 1, 1, 1, 4, 0\} \\ &\gg \{3, 3, 3, 3, 2, 2\}\end{aligned}$$

Theorem



A wellfounded order on a set S defines a wellfounded order on the set of multisets on S .





- **Complexity Measure** $\mu = (\mu_1, \mu_2)$
 $\mu_1 :=$ Multiset of depth of all (sub-)terms
 $\mu_2 :=$ Number of multisets
 $\mu = (\mu_1, \mu_2)$ is lexicographically well founded
- **Theorem 1:** The Martelli-Montanari algorithm terminates.
- **Proof:** For every rule $\frac{T, U}{T', U'}$ we have:

$$(\mu_1, \mu_2)_{T', U'} < (\mu_1, \mu_2)_{T, U}$$

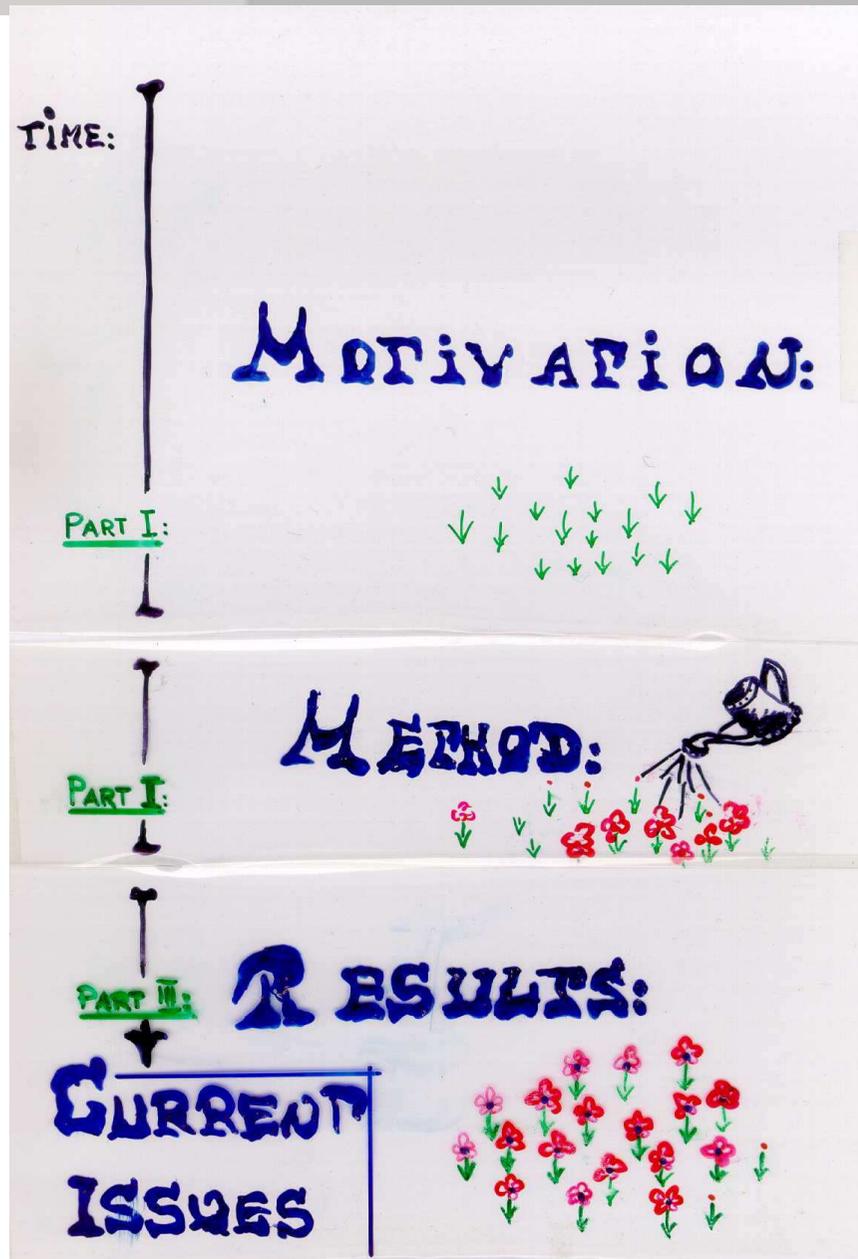
- **Theorem 2:** The Martelli-Montanari algorithm is quasi-linear, i. e.
 $n \cdot \log(n)$





First-Order Unification Theory

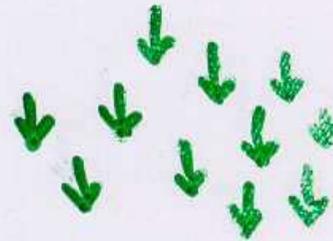






PART I:

MOTIVATION





- Equality-reasoning difficult despite **paramodulation** rule
- **Enhancement:** Build specific equalities into unification procedure
- **Examples:** $g(x, y) = g(y, x)$ (commutativity)
 - ▶ First possibility





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- **Examples:** $g(x, y) = g(y, x)$ (commutativity)
 - ▶ First possibility

$$\frac{P(g(a, b)) \quad \neg P(g(b, a))}{\text{contradiction}}$$





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$$\frac{P(g(a, b)) \quad \neg P(g(b, a))}{\text{contradiction}}$$

- ▶ or





- Equality-reasoning difficult despite **paramodulation** rule
- **Enhancement:** Build specific equalities into unification procedure
- **Examples:** $g(x, y) = g(y, x)$ (commutativity)
 - ▶ First possibility

$$\frac{P(g(a, b)) \quad \neg P(g(b, a))}{\text{contradiction}}$$

▶ or

$$\frac{P(g(x, y)), Q(x, y) \quad \neg P(g(a, b))}{Q(a, b) \quad Q(b, a)}$$



Theorieunifikation (cont.)



- Third possibility





- Third possibility

$Q(h(a), a), R(a, h(a))$

$Q(h(y), y), R(y, h(y))$



■ Third possibility

$$\frac{\begin{array}{l} P(y, k(f(x, g(a, y)), g(x, h(y))))), \quad Q(x, y) \\ \neg P(y', k(f(h(y'), g(y', a)), g(z, z))), \quad R(y', z) \end{array}}{\begin{array}{l} Q(h(a), a), R(a, h(a)) \\ Q(h(y), y), R(y, h(y)) \end{array}}$$



- Third possibility

$$\frac{\begin{array}{l} P(y, k(f(x, g(a, y)), g(x, h(y))))), \quad Q(x, y) \\ \neg P(y', k(f(h(y'), g(y', a)), g(z, z))), \quad R(y', z) \end{array}}{\begin{array}{l} Q(h(a), a), R(a, h(a)) \\ Q(h(y), y), R(y, h(y)) \end{array}}$$

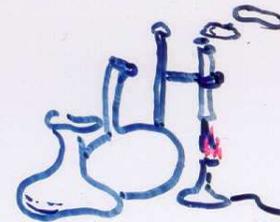
- Requirements to obtain new resolvents:
Algorithm for Unification for commutativity





THE UNIFICATION LABORATORY

EXPERIMENT 1:



GIVEN:

$$f(g(a, y), x)$$

U1:

$$f(x, g(a, z))$$

SOLUTION:

$$\sigma_1 = \{x \mapsto g(a, y), z \mapsto y\}$$

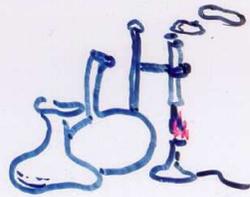


Unification under Commutativity



UNIFICATION LABORATORY

EXPERIMENT 1:



U1: $f(g(a, y), x)$

$f(x, g(a, z))$

SOLUTION:

$$\sigma_1 = \{x \mapsto g(a, y), z \mapsto y\}$$

EXPERIMENT 2:

GIVEN:

U1 as before

AND C: $f(x, y) = f(y, x)$

SOLUTION:

$$\sigma_2 \text{ AND } \sigma_2 = \{z \mapsto y\}$$

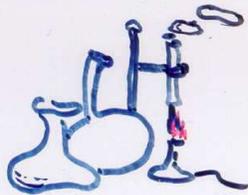


Unification under Associativity



UNIFICATION LABORATORY

EXPERIMENT 1:



U1:

U1:

$$f(g(a, y), x)$$

$$f(x, g(a, z))$$

SOLUTION:

$$G_1 = \{x \mapsto g(a, y), z \mapsto y\}$$

EXPERIMENT 3:

GIVEN:

U1 as before

AND A: $f(x, f(y, z)) = f(f(x, y), z)$

SOLUTION:

$$G_1 \text{ AND } G_3 = \{x \mapsto f(g(a, y), g(a, y)), z \mapsto y\}$$

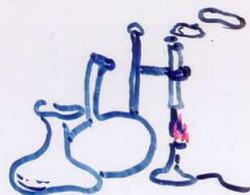


Unification under Assoc. and Commutativity



UNIFICATION LABORATORY

EXPERIMENT 1:



U1:

$$\frac{f(g(a, y), x)}{f(x, g(a, z))}$$

SOLUTION:

$$G_1 = \{x \mapsto g(a, y), z \mapsto y\}$$

EXPERIMENT 1:

GIVEN: U1 as before

AND C: $f(x, y) = f(y, x)$

AND A: $f(x, f(y, z)) = f(f(x, y), z)$

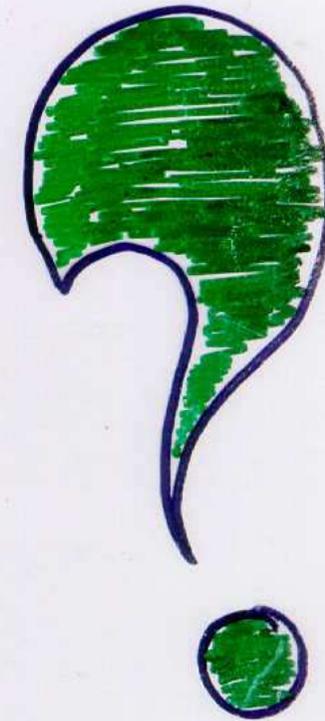
SOLUTION:





WHAT ARE

WE DOING





Excursion 1:

SOLVING

EQUATIONS

$$\begin{aligned}3x^2 + 4y &= 16 \\ x + y &= 3\end{aligned}$$





SOLVING OF EQUATIONS

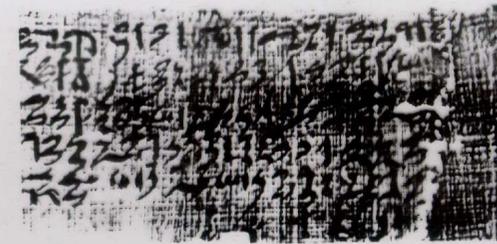
▶ **DIOPHANTOS OF ALEXANDRIA** (~250 B.C.)

▶ **BABYLONIAN MATHEMATICIANS:**

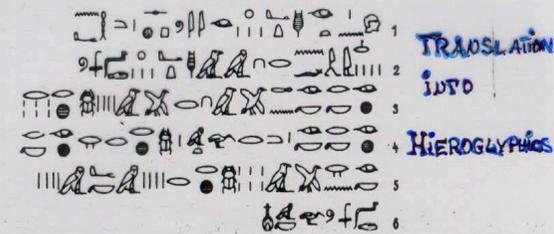
STONE PLATE with CUNEIFORM CHARACTERS;
about 2000 to 3000 B.C.:



**2500
B.C.**



PAPYRUS TEXT, ~ **1800 B.C.**
(demotic language)



**FORM DER BERECHNUNG EINES
HAUFENS, GERECHNET $1\frac{1}{2}$ MAL
ZUSAMMEN MIT 4. ER IST GE-
KOMMEN BIS 10. DER HAUFE NUN
NENNT SICH?**

$$1\frac{1}{2}x + 4 = 10$$



▶ CUBIC EQUATIONS: $a_1x^3 + a_2x^2 + a_3x + a_4 = 0$



Gerolamo Cardano
(1501-1576)



Nicolo
TARTAGLIA
(1500-1557)

▶ EQUATIONS OF THE 4th DEGREE:

L. FERRARI (1522-1565)

▶ ALGEBRAIC EQUATIONS and
TRANSCENDENTAL EQUATIONS:

LEONARD EULER
(1707-1783)



FRANCOIS VIETA
(1540 - 1603)

"aequare"

THE WHETSTONE
OF WITTE

ROBERT RECORDE
; 1557

To brevit, for ease alteration of equations, I will propounde a few crâples, because the extraction of their rootes, make the more aptly bee wroughte. And to avoid the tedious repetition of these wordes; is equalle to: I will sette as I doe often in booke use, a paire of paralelles, or Gemowe lines of one lengthe, thus: =====, because noe. 2. thynges, can be moare equalle. And so to marke these numbers.

1. 14.20. + 15.9. = 71.9.
 2. 20.20. - 18.9. = 102.9.
- ↳ 26.8. + 1020. = 98. + 1020. + 211.9.

Aus dem „Wetstein des Wisses“, 1557, des Engländers R. Recorde. Erstes Auftreten des Gleichheitszeichens. Unmittelbar über den Formeln die Begründung für die Wahl dieses Symbols.

RENÉ DESCARTES
(1596-1650)

"x", "y", "z"





BUT: How To SOLVE IT?

▶ EUCLID (300 B.C.), ELEMENTE, Book I
however based on Geometric

Indian Maths

ADAM RIESE

▶ HAS EVERY EQUATION:

$$a_n x^n + a_{n-1} x^{n-1} + \dots + a_1 x + a_0 = 0$$

A SOLUTION?

- ▶ RENÉ DESCARTES (1596-1650)
- ▶ JEAN D'ALEMBERT (1717-1783)
- ▶ C. F. GAUSS (1777-1855)

MAIN THEOREM OF ALGEBRA

▶ 1799



▶ CAN EVERY SOLUTION BE EXPRESSED AS A RADICAL?

NIELS HENRIK ABEL (1802-1829)

E. GALOIS (1811-1832)





THERE ARE STILL A FEW
THINGS TO DO !!



PIERRE DE
FERMAT
(1601-1665)

$$X^n + Y^n = Z^n$$

For $n > 2$:

$\exists x, y, z$?



D. HILBERT:



IS IT DECIDABLE IF

$$P(x) = 0$$

HAS A SOLUTION IN \mathbb{N} ?

PARIS, 1900

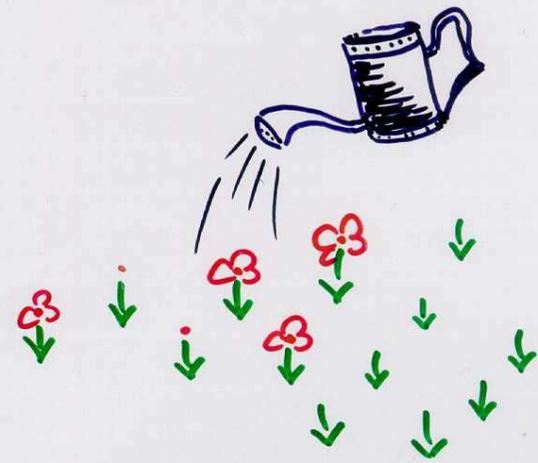


D. HILBERT
(1862-1943)



PART 2.

METHOD





THEORY

UNIFICATION

- TERMINOLOGY

- E-UNIFICATION:

- C-UNIFICATION

$$f(x, y) = f(y, x)$$

- A-UNIFICATION

$$f(x, f(y, z)) = f(f(x, y), z)$$

- AC-UNIFICATION

T-UNIFICATION





EQUATIONAL LOGIC

1. FREE ALGEBRA OF TERMS

2. EQUATIONAL THEORY:

$$T := \{ s_1 = t_1; s_2 = t_2; \dots; s_n = t_n \}$$

$s_i, t_i \in \text{TERM (FOPC)}$

G. Birkhoff, "On the Structure of Abstract Algebras" (1935)

A. Tarski, "Equational Logic and Equational Theories of Algebra" (1968)

W. Taylor, "Equational Logic" (1979)

3. COMPUTATIONAL LOGIC:

- Term Rewriting
- Paramodulation





■ Definition:

Let E be a set of Σ -Equations.

$$E \models s = t \quad \text{iff} \quad \mathcal{A} \models E \text{ then } \mathcal{A} \models s = t$$

i. e. all Σ -models of E are also models of $s = t$.

■ Definition:

E is an equational theory over Σ :

$$s = t \in E \quad \text{if and only if} \quad E \models s = t$$

i. e. $E := \{s = t \mid E \models s = t\}$

■ Definition:

Every (finite) subset $AX \subseteq E$ with

$$E := \{s = t \mid AX \models s = t\}$$





- **Rewriting step:**

$s \longrightarrow_{\pi, l=r, \sigma} t$ (or $s \longrightarrow_E t$ for short)

if π position in s ,
 σ substitution,
 $l = r / r = l$ axiom in E ,
 $\sigma(l) = \sigma(s|_{\pi})$, and
 $t = s|_{\pi \leftarrow \sigma r}$.

- **Theorem:** $s \longleftarrow_E^* t \Leftrightarrow s =_E t$

- **Normalforms:**

Notherian + Confluent \implies Normal Form

- Confluence and Noetherian properties give decision procedure

$s =_T t$ iff $\|s\| = \|t\|$ for s, t terms



■ Birkhoff's Calculus for Equational Logic

- ▶ $E \vdash t = t$
- ▶ $E \vdash s = t$, if $E \vdash t = s$
- ▶ $E \vdash r = t$, if $E \vdash r = s$ and $E \vdash s = t$
- ▶ $E \vdash f(s_1, \dots, s_n) = f(t_1, \dots, t_n)$, if $E \vdash s_1 = t_1, \dots, s_n = t_n$
- ▶ $E \vdash \sigma s = \sigma t$, if $s = t \in E$ and $\sigma \in \Sigma$

With $=_E$ we denote the smallest relation on \mathcal{T}_Σ , that is closed under the upper rules (the smallest substitution invariant congruence relation).

■ Completeness Theorem:

$$E \vDash s = t \Leftrightarrow E \vdash s = t \Leftrightarrow s =_E t$$





- Theory Unification Problem: $\langle s = t \rangle_T$:

$$\exists \sigma \in \Sigma. \sigma s =_T \sigma t \text{ for } T \in \mathcal{T}_=$$

- Theory Matching Problem: $\langle s \leq t \rangle_T$:

$$\exists \mu \in \Sigma. \mu s =_T t \text{ for } T \in \mathcal{T}_=$$

Most General Set of Unifiers



- For $\langle s = t \rangle_T$
 - ▶ Σ : set of substitutions
 - ▶ $\mathbb{U}_T(s = t)$: set of unifiers
 - ▶ $\mu\mathbb{U}_T(s = t)$: minimal set of unifiers
- **Correctness:** $\forall \sigma \in \mu\mathbb{U}_T(s = t). \sigma s =_T \sigma t$
- **Completeness:** $\forall \delta \in \mathbb{U}_T(s = t). \exists \sigma \in \mu\mathbb{U}_T(s = t)$ such that $\sigma \sqsubseteq \delta$
- **Minimality:** $\forall \tau, \sigma \in \mu\Sigma. \sigma \not\sqsubseteq \tau$



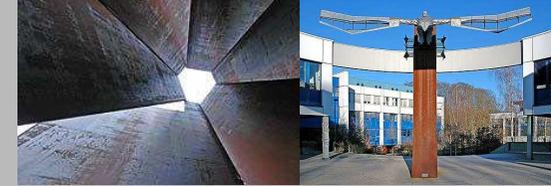
Universal Unification: A Typehierarchy



- For $\langle s = t \rangle_{\mathcal{T}}$
 - ▶ Σ : set of substitutions
 - ▶ $\mathbb{U}_{\mathcal{T}}(s = t)$: set of unifiers
 - ▶ $\mu\mathbb{U}_{\mathcal{T}}(s = t)$: minimal set of unifiers
- Typehierarchy:

(i)	$\mathcal{T} \in \mathcal{U}_1$	is unitary if	$ \mu\mathbb{U}_{\mathcal{T}} \leq 1$
(ii)	$\mathcal{T} \in \mathcal{U}_\omega$	is finitary if	$ \mu\mathbb{U}_{\mathcal{T}} \in \mathbb{N}$
(iii)	$\mathcal{T} \in \mathcal{U}_\infty$	is infinitary if	$\exists \langle s = t \rangle_{\mathcal{T}}$ such that $ \mu\mathbb{U}_{\mathcal{T}} \in \infty$
(iv)	$\mathcal{T} \in \mathcal{U}_0$	nullary type zero	otherwise





- E-Unification-Problem Γ :

$$\langle s_i = t_i : 1 \leq i \leq n \rangle_E$$

- E-Unification-Sets:

$$\mathbb{U}_E(\Gamma) = \{ \sigma \in \Sigma. \sigma s_i =_E \sigma t_i, 1 \leq i \leq n \}$$

Example: $\Gamma = \{ f(g(a, y), x) = f(x, g(a, z)) \}$

$$\mathbb{U}_C(\Gamma) := \{ x \leftarrow g(a, y), y \leftarrow z \}, \quad \{ y \leftarrow z \}$$

- E-Equal on V : $\sigma =_E \tau[V] \Leftrightarrow \sigma x =_E \tau x, \forall x \in V$
- E-Instance on V : $\sigma \geq_E \tau[V] \Leftrightarrow \exists \rho. \sigma =_E \rho \circ \tau[V]$
- E-Equivalent on V : $\sigma \equiv_E \tau[V] \Leftrightarrow \sigma \geq_E \tau[V] \ \& \ \tau \geq_E \sigma[V]$





- **Lemma:**

$\forall \sigma, \tau : \tau \geq_E \sigma[V]$ if $\sigma \in \mathbb{U}_E(\Gamma)$ then $\tau \in \mathbb{U}_E(\Gamma)$

- **Theorem:**

1. $\geq_E [V]$ is a quasi-ordering
2. $\equiv_E [V]$ is an equivalence relation

Basis $\mu\mathbb{U}$ of a Quasi-Ordered Set $(\mathbb{U}, >)$



1. $\mu\mathbb{U} \subseteq \mathbb{U}$
2. $\forall \delta \in \mathbb{U} \exists \sigma \in \mu\mathbb{U} : \delta \geq \sigma$
3. $\forall \sigma, \tau \in \mu\mathbb{U} : \sigma \geq \tau \Rightarrow \sigma = \tau$

Theorem: The basis $\mu\mathbb{U}$ is unique



Basis $\mu\mathcal{U}_E$ of a E-Unification-Problem Γ



$$(1) \mu\mathcal{U}_E(\Gamma) \subseteq \mathcal{U}_E(\Gamma)$$

(Correctness)

$$(2) \forall \delta \in \mathcal{U}_E(\Gamma) \exists \sigma \in \mu\mathcal{U}_E(\Gamma) : \delta \geq_E \sigma [V]$$

(Completeness)

$$(3) \forall \sigma, \delta \in \mu\mathcal{U}_E(\Gamma) : \sigma \geq_E \delta [V] \Rightarrow \sigma \equiv_E \delta$$

(Minimality)

Corollary:

1. The set of most general E-Unifiers is unique (modulo E-Equivalence).
2. The sets of MGUs have same cardinality.
3. Replacement of elements in $\mu\mathcal{U}$ by E-Equivalent ones gives again a basis.



Some special theories



Theory	Type	Unification Decidable?	$\mu\mathcal{U}_T$?
$\{\}$	1	Yes	Yes
A	∞	Yes	Yes
C	ω	Yes	Yes
I	ω	Yes	Yes
A+C	ω	Yes	Yes
A+I	0	Yes	No
C+I	ω	Yes	Yes
A+C+I	ω	Yes	Yes



Some special theories (2)



Theory	Type	Unification Decidable?	$\mu\mathcal{U}_T?$
D	∞	?	Yes
D+A	∞	No	Yes
D+C	∞	?	Yes
D+A+C	∞	No	Yes
D+A+I	?	Yes	No
Hom	1	Yes	Yes
Hom+A	∞	No	Yes
Applications			



Summary



- You can make unification faster using special procedures and special representations
- You can unify modulo a theory, but pay a price (decidable/undecidable, more/infinitely many unifiers)
- Unification theory develops means to study the decidability and (minimal) solution sets.

