Machine-Oriented Reasoning

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Logic

Calculus

Formally

Metatheorical

Properties

Notes

The unavoidable slide

Semantics

The Early Days

DPLL

Resolution

Logic

Logic

D Logic

▶ Logic

Calculus

Formally

Metatheorical

Properties

Notes

The unavoidable slide

Semantics

The Early Days

DPLL

Resolution

Logic is a formal language together with a relationship, often denoted by " \models ", between a set of formulae and a formula:

$$\Gamma \models \varphi$$

☐ Formulae related by this relationship to the empty set are of special interest. If

$$\emptyset \models \varphi \text{ or } \models \varphi$$

we say φ is valid.

☐ For classical logic, the deduction theorem ensures that if

$$\{\gamma_1,\ldots,\gamma_n\} \models \varphi$$

then

$$\models (\gamma_1 \to \dots (\gamma_{n-1} \to (\gamma_n \to \varphi)))$$

Calculus

Logic

Calculus

Formally

Metatheorical

Properties

Notes

The unavoidable slide

Semantics

The Early Days

DPLL

Resolution

□ A logic language together with a syntactically defined relation, often denoted by "⊢", is called a calculus.

$$\Gamma \vdash \varphi$$

☐ Again, formulae related by this relationship to the empty set are of special interest. If

$$\emptyset \vdash \varphi \text{ or } \vdash \varphi$$

we say φ is a theorem.

Formally

▶ Logic

Logic Calculus

▶ Formally

Metatheorical Properties Notes

The unavoidable slide

The Early Days

DPLL

Resolution

Semantics

- \square Formally, a calculus is defined as a pair $\langle \mathcal{A}, \mathcal{R} \rangle$, where \mathcal{A} is a set of formulae and \mathcal{R} is a set of inference rules.
- ☐ An inference rule is usually given as:

$$\gamma_1$$
 \vdots
 γ_n

where γ_i are the premises and φ is the conclusion. The application of the inference rule to the premises *produces* the conclusion. We also say that the conclusion is *derived* from the premises (by the inference rule).

Metatheorical Properties

▶ Logic

Logic Calculus Formally

Metatheorical

Properties
Notes

The unavoidable slide Semantics

The Early Days

DPLL

Resolution

☐ Strong soundness:

if
$$\Gamma \vdash^C_{\mathcal{L}} \varphi$$
 then $\Gamma \models_{\mathcal{L}} \varphi$

☐ Weak soundness:

if
$$\vdash^{C}_{\mathcal{L}} \varphi$$
 then $\models_{\mathcal{L}} \varphi$

☐ Strong completeness:

if
$$\Gamma \models_{\mathcal{L}} \varphi$$
 then $\Gamma \vdash^{C}_{\mathcal{L}} \varphi$

☐ Weak completeness:

if
$$\models_{\mathcal{L}} \varphi$$
 then $\vdash^{C}_{\mathcal{L}} \varphi$

 \square Consistency: if there is no φ such that both $\vdash^C_{\mathcal{L}} \varphi$ and $\vdash^C_{\mathcal{L}} \neg \varphi$.

Notes

Logic
Logic
Calculus
Formally
Metatheorical
Properties
Notes
The unavoidable slide
Semantics
The Early Days
DPLL
Resolution

- Because of the deduction theorem, weak properties are often enough to show a calculus has good properties. This is why automated reasoning is often referred to as *theorem proving*.
- Those good properties are not enough to ensure that a calculus is suitable for implementation.

The unavoidable slide

▶ Logic

Logic

Calculus

Formally

Metatheorical

Properties

Notes

The unavoidable

> slide

Semantics

The Early Days

DPLL

Resolution

The set of logical symbols is given by the union of the following sets:

- 1. $\mathcal{P} = \{P^{n_P}, Q^{n_Q}, R^{n_R}, \dots, P_1^{n_{P_1}}, Q_1^{n_{Q_1}}, R_1^{n_{R_1}}, \dots\};$ 2. $\mathcal{F} = \{f^{n_f}, g^{n_g}, h^{n_h}, \dots, f_1^{n_{f_1}}, g_1^{n_{g_1}}, h_1^{n_{h_1}}, \dots\};$
- 3. $C = \{a, b, c, \dots, a_1, b_1, c_1, \dots\};$
- 4. $\mathcal{V} = \{x, y, z, \dots, x_1, y_1, z_1, \dots\};$
- $5. \{ \forall, \exists \}$
- 6. $\{\neg, \lor, \land, \rightarrow, \leftrightarrow\};$
- 7. (,), and ,.

The set of well-formed formulae in the first-order language, denoted by WFF_{\mathcal{L}_{FO}}, is the least set obtained by recursively applying the following:

- \square $P^n(t_1,\ldots,t_n)\in\mathsf{WFF}_{\mathcal{L}_{FO}}$, where $P^n\in\mathcal{P}$, for $t_i\in\mathcal{T}$, $0\leq i\leq n$, $n \in \mathbb{N}$:
- \Box if $\varphi, \psi \in \mathsf{WFF}_{\mathcal{L}_{FO}}$ and $x \in \mathcal{V}$, then $\neg \varphi$, $(\varphi \lor \psi)$, $(\varphi \land \psi)$, $(\varphi \to \psi)$, $(\varphi \leftrightarrow \psi)$, $\forall x \varphi$ and $\exists x \varphi \in \mathsf{WFF}_{\mathcal{L}_{FQ}}$.

Obs.: We'll restrict ourselves to sentences, that is, well-formed formulae with no free variables.

Semantics

▶ Logic

Logic

Calculus

Formally

Metatheorical

Properties

Notes

The unavoidable slide

▶ Semantics

The Early Days

DPLL

Resolution

An *interpretation* \mathbb{M} for $(\mathcal{P}, \mathcal{F})$ consists of:

- \Box a non-empty set \mathcal{A} (universe);
- \square a function $f^{\mathbb{M}}:A^{n}\longrightarrow A$, for each $f^{n}\in\mathcal{F}$;
- \square a relation $P^{\mathbb{M}} \subseteq A^n$, for each $P^n \in \mathcal{P}$.

Let $\mathbb{M} = (\mathcal{A}, \{f^{\mathbb{M}}\}_{f \in \mathcal{F}}, \{P^{\mathbb{M}}\}_{P \in \mathcal{P}})$ be an interpretation for $(\mathcal{P}, \mathcal{F})$, $x \in \mathcal{V}$ and φ, ψ in $\mathsf{WFF}_{\mathcal{L}_{FO}}$:

- 1. $\mathbb{M} \models P(t_1, \dots, t_n) \text{ iff } (t_1, \dots, t_n) \in P^{\mathbb{M}};$
- 2. $\mathbb{M} \models \neg \varphi \text{ iff } \mathbb{M} \not\models (\varphi);$
- 3. $\mathbb{M} \models \varphi \wedge \psi \text{ iff } \mathbb{M} \models \varphi \in \mathbb{M} \models \psi$;
- 4. $\mathbb{M} \models \varphi \lor \psi$ iff $\mathbb{M} \models \varphi$ or $\mathbb{M} \models \psi$;
- 5. $\mathbb{M} \models \varphi \rightarrow \psi \text{ iff } \mathbb{M} \models \neg \varphi \vee \psi;$
- 6. $\mathbb{M} \models \forall x \varphi \text{ iff } \mathbb{M} \models \varphi[a \backslash x] \text{ for all } a \in \mathcal{A};$
- 7. $\mathbb{M} \models \exists x \varphi \text{ iff } \mathbb{M} \models \varphi[a \backslash x] \text{ for some } a \in \mathcal{A}.$

Logic

The Early Days

In the beginning there was darkness...

Presburger Procedure

The Great Triumph

The Logic Theory

Machine

Example -

Substitution Method

Example -

Detachment Method

Example - Chaining

Comparing LTM with

the British Museum

Performance and

Completeness

Wang and Gao

Example

Success?

Paul Gilmore and

Herbert Gelernter

Dag Prawitz

Example:

 $\forall x P(x) \rightarrow \exists y P(y)$

Some notes

DPLL

Resolution

The Early Days

In the beginning there was darkness...

Logic The Early Days In the beginning there was darkness... Presburger Procedure The Great Triumph The Logic Theory Machine Example -Substitution Method Example -Detachment Method Example - Chaining Comparing LTM with the British Museum Performance and Completeness Wang and Gao Example Success? Paul Gilmore and Herbert Gelernter Dag Prawitz Example: $\forall x P(x) \rightarrow \exists y P(y)$ Some notes **DPLL** Resolution

- The development of automated reasoning tools started shorter after computers were available: the first Turing-complete programmable digital computer, the ENIAC, was operational in 1946; in 1954, a program written by Martin Davis produces a proof for the Presburger arithmetic (published in 1957).
- □ George Collins implemented parts of Tarski's decision procedure for elementary algebra on an IBM 704. Also published in 1957.
- Most procedures relied on (naive) enumerations of proofs and/or models.
- □ First results were not encouraging: even short proofs for known theorems could not be carried out by computers. In the words of Martin Davis on his program: "Its great triumph was to prove that the sum of two even numbers is even."

Presburger Procedure

Logic

The Early Days
In the beginning there
was darkness...

Presburger

▶ Procedure

The Great Triumph

The Logic Theory

Example -

Substitution Method

Example -

Detachment Method

Example - Chaining

Comparing LTM with

the British Museum

Performance and

Completeness

Wang and Gao

Example

Success?

Paul Gilmore and

Herbert Gelernter

Dag Prawitz

Example:

 $\forall x P(x) \to \exists y P(y)$

Some notes

DPLL

Resolution

- □ In 1929, Presburger shows that the first order theory of addition on the natural numbers is decidable [Pre29].
 - \square Axioms for the Presburger arithmetic are:

1.
$$\neg (0 = x + 1)$$

2.
$$x + 1 = y + 1 \rightarrow x = y$$

3.
$$x + 0 = x$$

4.
$$x + (y + 1) = (x + y) + 1$$

5.
$$P(0) \land \forall x (P(x) \rightarrow P(x+1)) \rightarrow \forall y P(y)$$

□ The procedure consists of quantifier elimination on formulae in antiprenex disjunctive normal form, whose implementation on a JOHNNIAC was reported in [Dav57].

The Great Triumph

Logic

▶ The Early Days
In the beginning there

Presburger Procedure

The Great

was darkness...

▷ Triumph

The Logic Theory Machine

Example -Substitution Method

Example -

Detachment Method

Example - Chaining

Comparing LTM with the British Museum Performance and

Completeness

Wang and Gao

Example

Success?

Paul Gilmore and Herbert Gelernter

Dag Prawitz

Example:

 $\forall x P(x) \rightarrow \exists y P(y)$

Some notes

DPLL

- ☐ The JOHNNIAC at Princeton:
 - John von Neumann Numerical Integrator and Automatic Computer, Rand Corp.
 - Vacuum tube machine.
 - 1024 40-bit word machine (yes, this is only 5KB!).
 - MFTBF (Mean Flight Time Between Failures) of 10 minutes.
 - Add time: 50ms (that's about 0.02 MIPS).
- Fischer and Rabin showed that complexity is double-exponential [FR74].
 Upper bound is triple-exponential [Opp78].

The Logic Theory Machine

Logic

The Early Days
In the beginning there
was darkness...
Presburger Procedure
The Great Triumph

The Logic Theory
Machine
Example Substitution Method
Example -

Detachment Method
Example - Chaining

Comparing LTM with the British Museum Performance and Completeness

Wang and Gao

Example Success?

Paul Gilmore and Herbert Gelernter

Dag Prawitz

Example:

 $\forall x P(x) \rightarrow \exists y P(y)$

Some notes

DPLL

- □ It was devised and implemented by Newell, Shaw, and Simon [NS56, NS57, NSS57].
- □ It was implemented on a JOHNNIAC at the Rand Corporation, using a programming language devised by the authors.
- The calculus was based on that of the Principia: five axioms together with substitution and modus ponens. It also includes a rule for replacement of definitions. The proof is based on the construction of a tree, which handles space by using heuristics associated to detachment, backward and forward chaining. If we want to prove φ :
 - find a sentence ψ such that $\psi \to \varphi$ is provable; reduce the proof of φ to the proof of ψ (detachment);
 - if φ is of the form $\psi \to \chi$, find $\psi \to \chi'$ which is provable; reduce the proof of φ to the proof of $\chi' \to \chi$ (chaining);
 - if φ is of the form $\psi \to \chi$, find $\chi' \to \chi$ which is provable; reduce the proof of φ to the proof of $\psi \to \chi'$ (chaining).

Logic

The Early Days

In the beginning there was darkness...

Presburger Procedure

The Great Triumph

The Logic Theory

Machine

Example -

Substitution

▶ Method

Example -

Detachment Method

Example - Chaining

Comparing LTM with

the British Museum

Performance and

Completeness

Wang and Gao

Example

Success?

Paul Gilmore and

Herbert Gelernter

Dag Prawitz

Example:

 $\forall x P(x) \rightarrow \exists y P(y)$

Some notes

DPLL

$$1.01 \quad (p \to q) = (\neg p \lor q)$$

1.2
$$(p \lor p) \to p$$

1.3
$$p \rightarrow (q \lor p)$$

1.4
$$(p \lor q) \to (q \lor p)$$

1.5
$$((p \lor q) \lor r) \to ((q \lor p) \lor r)$$

1.6
$$(p \rightarrow q) \rightarrow ((r \lor p) \rightarrow (r \lor q))$$

Logic

The Early Days

In the beginning there was darkness...

Presburger Procedure

The Great Triumph

The Logic Theory

Machine

Example -Substitution

Example -

Detachment Method

Example - Chaining

Comparing LTM with

the British Museum

Performance and

Completeness

Wang and Gao

Example

Success?

Paul Gilmore and

Herbert Gelernter

Dag Prawitz

Example:

 $\forall x P(x) \rightarrow \exists y P(y)$

Some notes

DPLL

$$1.01 \quad (p \to q) = (\neg p \lor q)$$

1.2
$$(p \lor p) \to p$$

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$$(p \rightarrow q) \rightarrow ((r \lor p) \rightarrow (r \lor q))$$

$$2.01 \quad ?(p \rightarrow \neg p) \rightarrow \neg p$$

Logic

The Early Days

In the beginning there was darkness...

Presburger Procedure

The Great Triumph

The Logic Theory

Machine

Example -Substitution

Example -

Detachment Method

Example - Chaining

Comparing LTM with the British Museum

the Dritish Musel

Performance and

Completeness

Wang and Gao

Example

Success?

Paul Gilmore and

Herbert Gelernter

Dag Prawitz

Example:

 $\forall x P(x) \rightarrow \exists y P(y)$

Some notes

DPLL

Resolution

$$1.01 \quad (p \to q) = (\neg p \lor q)$$

1.2
$$(p \lor p) \to p$$

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$$(p \rightarrow q) \rightarrow ((r \lor p) \rightarrow (r \lor q))$$

$$2.01 \quad ?(p \rightarrow \neg p) \rightarrow \neg p$$

$$1.2 \quad !(A \lor A) \to A$$

[1.2, similarity]

Logic

The Early Days

In the beginning there was darkness...

Presburger Procedure

The Great Triumph

The Logic Theory

Machine

Example -

Substitution

Example -

Detachment Method

Example - Chaining

Comparing LTM with

the British Museum

Performance and

Completeness

Wang and Gao

Example

Success?

Paul Gilmore and

Herbert Gelernter

Dag Prawitz

Example:

 $\forall x P(x) \rightarrow \exists y P(y)$

Some notes

DPLL

Resolution

$$1.01 \quad (p \to q) = (\neg p \lor q)$$

1.2
$$(p \lor p) \to p$$

1.3
$$p \rightarrow (q \lor p)$$

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$$((p \lor q) \lor r) \to ((q \lor p) \lor r)$$

1.6
$$(p \rightarrow q) \rightarrow ((r \lor p) \rightarrow (r \lor q))$$

$$2.01 \quad ?(p \rightarrow \neg p) \rightarrow \neg p$$

$$1.2 \quad !(A \lor A) \to A$$

$$1.2' \quad !(\neg B \lor \neg B) \to \neg B$$

[1.2, similarity]

[1.2, substitution]

Logic

The Early Days

In the beginning there was darkness...

Presburger Procedure

The Great Triumph

The Logic Theory

Machine

Example Substitution

> Method

Example -

Detachment Method

Example - Chaining

Comparing LTM with

the British Museum

Performance and

Completeness

Wang and Gao

Example

Success?

Paul Gilmore and

Herbert Gelernter

Dag Prawitz

Example:

 $\forall x P(x) \rightarrow \exists y P(y)$

Some notes

DPLL

$$1.01 \quad (p \to q) = (\neg p \lor q)$$

1.2
$$(p \lor p) \to p$$

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$$p \rightarrow (q \lor p)$$

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$$((p \lor q) \lor r) \to ((q \lor p) \lor r)$$

1.6
$$(p \rightarrow q) \rightarrow ((r \lor p) \rightarrow (r \lor q))$$

$$2.01 \quad ?(p \rightarrow \neg p) \rightarrow \neg p$$

$$1.2 \quad !(A \lor A) \to A$$

$$1.2' \quad !(\neg B \lor \neg B) \to \neg B$$

$$1.2''$$
 $!(B \rightarrow \neg B) \rightarrow \neg B$

- [1.2, substitution]
- [1.2', replacement]

Logic

The Early Days

In the beginning there was darkness...

Presburger Procedure

The Great Triumph

The Logic Theory

Machine

Example -Substitution

> Method

Example -

Detachment Method

Example - Chaining

Comparing LTM with

the British Museum

Performance and

Completeness

Wang and Gao

Example

Success?

Paul Gilmore and

Herbert Gelernter

Dag Prawitz

Example:

 $\forall x P(x) \rightarrow \exists y P(y)$

Some notes

DPLL

$$1.01 \quad (p \to q) = (\neg p \lor q)$$

1.2
$$(p \lor p) \to p$$

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1.5
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$$(p \rightarrow q) \rightarrow ((r \lor p) \rightarrow (r \lor q))$$

$$2.01 \quad ?(p \rightarrow \neg p) \rightarrow \neg p$$

$$1.2 \quad !(A \lor A) \to A$$

$$1.2' \quad !(\neg B \vee \neg B) \rightarrow \neg B$$

$$1.2''$$
 $!(B \rightarrow \neg B) \rightarrow \neg B$

$$1.2'''$$
 $!(p \rightarrow \neg p) \rightarrow \neg p$

- [1.2, substitution]
- [1.2', replacement]
- [1.2'', replacement]

$$2.01 \quad ?(p \rightarrow q) \rightarrow ((q \rightarrow r) \rightarrow (p \rightarrow r))$$

$$2.01 \quad ?(p \to q) \to ((q \to r) \to (p \to r))$$

$$2.04 \quad !(A \rightarrow (B \rightarrow C)) \rightarrow (B \rightarrow (A \rightarrow C))$$

[theorem]

$$\begin{array}{ll} 2.01 & ?(p \rightarrow q) \rightarrow ((q \rightarrow r) \rightarrow (p \rightarrow r)) \\ \\ 2.04 & !(A \rightarrow (B \rightarrow C)) \rightarrow (B \rightarrow (A \rightarrow C)) \\ \\ 2.04' & !((q \rightarrow r) \rightarrow ((p \rightarrow q) \rightarrow (p \rightarrow r))) \rightarrow ((p \rightarrow q) \rightarrow ((q \rightarrow r) \rightarrow (p \rightarrow r))) \\ \\ & [2.04, \text{substitution}] \end{array}$$

$$\begin{array}{cccc} 2.01 & ?(p \rightarrow q) \rightarrow ((q \rightarrow r) \rightarrow (p \rightarrow r)) \\ \\ 2.04 & !(A \rightarrow (B \rightarrow C)) \rightarrow (B \rightarrow (A \rightarrow C)) & [theorem] \\ \\ 2.04' & !((q \rightarrow r) \rightarrow ((p \rightarrow q) \rightarrow (p \rightarrow r))) \rightarrow ((p \rightarrow q) \rightarrow ((q \rightarrow r) \rightarrow (p \rightarrow r))) & [2.04, substitution] \\ \\ 2.04'L & ?(q \rightarrow r) \rightarrow ((p \rightarrow q) \rightarrow (p \rightarrow r)) & \end{array}$$

Logic

The Early Days

In the beginning there was darkness...

Presburger Procedure

The Great Triumph

The Logic Theory

Machine

Example -

Substitution Method

Example -

Detachment Method

Example -

○ Chaining

Comparing LTM with

the British Museum

Performance and

Completeness

Wang and Gao

Example

Success?

Paul Gilmore and

Herbert Gelernter

Dag Prawitz

Example:

 $\forall x P(x) \rightarrow \exists y P(y)$

Some notes

DPLL

 ${\sf Resolution}$

$$((A \to B) \land (B \to C)) \to (A \to C)$$

Logic

The Early Days
In the beginning there
was darkness...

Presburger Procedure

The Great Triumph

The Logic Theory

Machine Example -

Substitution Method

Example -

Detachment Method

Example -

○ Chaining

Comparing LTM with

the British Museum

Performance and

Completeness

Wang and Gao

Example

Success?

Paul Gilmore and

Herbert Gelernter

Dag Prawitz

Example:

 $\forall x P(x) \rightarrow \exists y P(y)$

Some notes

DPLL

Resolution

$$((A \to B) \land (B \to C)) \to (A \to C)$$

1.2
$$(p \lor p) \to p$$

$$2.08 \quad ?p \rightarrow p$$

Logic

The Early Days
In the beginning there
was darkness...

Presburger Procedure

The Great Triumph

The Logic Theory

Machine

Example -Substitution Method

Example -

Detachment Method

Example -

▶ Chaining

Comparing LTM with

the British Museum

Performance and

Completeness

Wang and Gao

Example

Success?

Paul Gilmore and

Herbert Gelernter

Dag Prawitz

Example:

 $\forall x P(x) \rightarrow \exists y P(y)$

Some notes

DPLL

Resolution

$$((A \to B) \land (B \to C)) \to (A \to C)$$

1.2
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$$2.08 \quad ?p \rightarrow p$$

$$2.07 \quad !A \rightarrow (A \lor A) \quad [\text{theorem}]$$

Logic

The Early Days
In the beginning there
was darkness...

Presburger Procedure

The Great Triumph

The Logic Theory

Machine

Example -Substitution Method

Example -

Detachment Method

Example -

▶ Chaining

Comparing LTM with

the British Museum

Performance and

Completeness

Wang and Gao

Example

Success?

Paul Gilmore and

Herbert Gelernter

Dag Prawitz

Example:

 $\forall x P(x) \rightarrow \exists y P(y)$

Some notes

DPLL

Resolution

$$((A \to B) \land (B \to C)) \to (A \to C)$$

1.2
$$(p \lor p) \to p$$

$$2.08 \quad ?p \rightarrow p$$

$$2.07 \quad !A \rightarrow (A \lor A) \quad [\text{theorem}]$$

$$2.07'$$
 $!p \rightarrow (p \lor p)$ [2.07, substitution]

Logic

The Early Days
In the beginning there
was darkness...

Presburger Procedure

The Great Triumph

The Logic Theory

Machine

Example -

Substitution Method

Example -

Detachment Method

Example -

▶ Chaining

Comparing LTM with

the British Museum

Performance and

Completeness

Wang and Gao

Example

Success?

Paul Gilmore and

Herbert Gelernter

Dag Prawitz

Example:

 $\forall x P(x) \rightarrow \exists y P(y)$

Some notes

DPLL

Resolution

$$((A \to B) \land (B \to C)) \to (A \to C)$$

1.2
$$(p \lor p) \to p$$

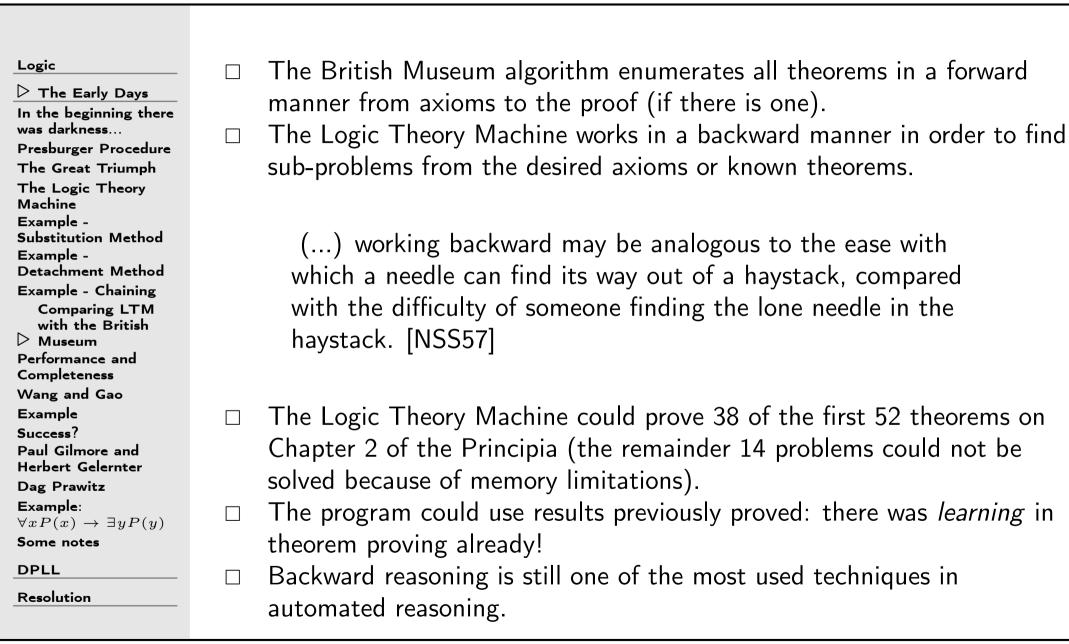
$$2.08 \quad ?p \rightarrow p$$

$$2.07 \quad !A \rightarrow (A \lor A) \quad [\text{theorem}]$$

$$2.07'$$
 $!p \rightarrow (p \lor p)$ [2.07, substitution]

$$2.07''$$
 $!p \rightarrow p$ $[2.07', 1.2, \text{chaining}]$

Comparing LTM with the British Museum



Performance and Completeness

Logic

The Early Days
In the beginning there
was darkness...

Presburger Procedure The Great Triumph

The Logic Theory Machine Example -

Substitution Method

Example -

Detachment Method

Example - Chaining

Comparing LTM with the British Museum

Performance and

Completeness

Wang and Gao

Example

Success?

Paul Gilmore and Herbert Gelernter

Dag Prawitz

Example:

$$\forall x P(x) \rightarrow \exists y P(y)$$

Some notes

DPLL

Resolution

- The JOHNNIAC at Rand: by 1956, tubes had already been replaced by transistors, main memory had been expanded to 4096 words and a drum, the external storage device, of 12K had been added; MFTBF was around 100 hours.
- ☐ It took ten seconds to prove:

$$(2.01) \qquad (p \to \neg p) \to \neg p.$$

□ It took 12 minutes, using all 38 theorems already proved, to prove

$$(2.45) \qquad \neg (p \lor q) \to \neg p.$$

□ Failure to produce a proof was reported after 23 minutes for:

$$(2.31) p \lor (q \lor r) \to (p \lor q) \lor r.$$

The Logic Theory Machine is not a complete procedure (because of the way it deals with substitution and how it uses heuristics to guide the search for a proof).

Wang and Gao

Logic The Early Days In the beginning there was darkness... Presburger Procedure The Great Triumph The Logic Theory Machine Example -Substitution Method Example -Detachment Method Example - Chaining Comparing LTM with the British Museum Performance and Completeness Wang and Gao Example Success? Paul Gilmore and Herbert Gelernter Dag Prawitz Example: $\forall x P(x) \rightarrow \exists y P(y)$ Some notes

- It must be emphasised that the Logic Theory Machine was not designed for efficiency: it tries to mimic the way humans produce proofs.
 A calculus designed for efficiency was that of Wang: it's a two-sided sequent system, whose inference rules remove one operator each time.
- □ In the case of a split, both sequents must be proved.
- □ This work started at IBM in the Summer of 1958 and then moved to the Bell Labs in 1959-1960 [Wan60a, Wan60b, Wan61].
- ☐ Three programs were developed:
 - One for propositional logic;
 - One for the decidable part of predicate logic;
 - One for all predicate logic.

DPLL

Logic

The Early Days

In the beginning there was darkness...

Presburger Procedure

The Great Triumph

The Logic Theory

Machine

Example -

Substitution Method

Example -

Detachment Method

Example - Chaining

Comparing LTM with

the British Museum

Performance and

Completeness

Wang and Gao

Example

Success?

Paul Gilmore and

Herbert Gelernter

Dag Prawitz

Example:

 $\forall x P(x) \rightarrow \exists y P(y)$

Some notes

DPLL

$$\begin{array}{ccc} p, \neg q \wedge r & \Rightarrow \\ p, \neg q, r & \Rightarrow \\ p, r & \Rightarrow \end{array}$$

$$p, r \rightarrow q, p$$
 [Right conjunction removal]

$$p \wedge r$$
 [Initial Sequent]
 $p \wedge q$ [Left conjunction removal]
 $q, p \wedge r$ [Left negation removal]

$$p, r \rightarrow q, r$$
[Right conjunction removal]

Success?

Logic

The Early Days In the beginning there was darkness... Presburger Procedure The Great Triumph The Logic Theory Machine Example -Substitution Method Example -Detachment Method Example - Chaining Comparing LTM with the British Museum Performance and Completeness Wang and Gao Example Success? Paul Gilmore and Herbert Gelernter Dag Prawitz Example: $\forall x P(x) \rightarrow \exists y P(y)$

☐ The first program, the one dedicated to propositional logic, took 37 minutes to prove the 220 theorems from the Principia.

Techniques, based on pattern matching, were used during enumeration of substitutions (somewhat anticipating the results from Prawitz).

It is also worth noting that other authors have responded heavily to the heuristics proposed by Newell, Shaw, and Simon. See, for instance,

□ B. Dunham and R. Fridshal and G. L. Sward: "A non-heuristic program for proving elementary logical theorems" [DFS59].

☐ The procedure used rules as splitting and pure literal reduction, which is later used by Davis and Putnam in their satisfiability procedure.

published under the chapter "Pattern recognition and machine learning" in the First International Conference on Information Processing, in Paris.

Some notes

Resolution

DPLL

Paul Gilmore and Herbert Gelernter

Logic

The Early Days In the beginning there was darkness... Presburger Procedure The Great Triumph The Logic Theory Machine Example -Substitution Method Example -Detachment Method Example - Chaining Comparing LTM with the British Museum

Completeness Wang and Gao

Performance and

Example

Success?

Paul Gilmore and ▶ Herbert Gelernter

Dag Prawitz

Example:

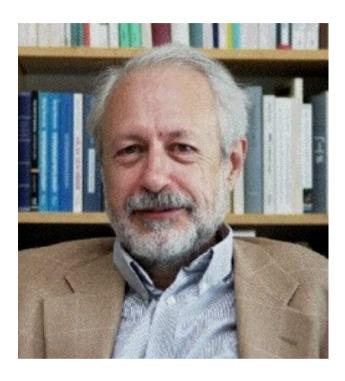
 $\forall x P(x) \rightarrow \exists y P(y)$

Some notes

DPLL

- IBM Research at the Lamb Estate in Croton-on-Hudson, NY.
- Implemented Beth's semantic tableaux for first-order logic (although it was actually closer to Hintikka's method) in 1958 [Gel59, Gil60, Gil70].
- They lately got to know and acknowledge the fact that theirs were not the first implementation of a procedure for first-order logic (IBM 704).
 - Take as input a negated first-order formula in prenex form with matrix in disjunctive normal form.
 - Search for constants is about the same that the one proposed by Prawitz.

Dag Prawitz



- Prawitz developed a general calculus for predicate logic based on contradiction.
 - A derivation is a sequence of pairs: $(\phi, F), \ldots$
 - Each pair in the sequence is derived from the previous by application of "usual" inference rules for formulae without quantifiers.
 - A derivation from a quantified formula relies on some enumeration of the constants.
 - If the derivation contains two pairs (ψ,T) and (ψ,F) , then a contradiction is found. Thus, the original formula is valid.

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▶ The Early Days
In the beginning there

was darkness...

Presburger Procedure

The Great Triumph

The Logic Theory

Machine Example -

Substitution Method

Example -

Detachment Method

Example - Chaining

Comparing LTM with

the British Museum

Performance and

Completeness

Wang and Gao

Example

Success?

Paul Gilmore and

Herbert Gelernter

Dag Prawitz

Example:

$$\triangleright \exists y P(y) \rightarrow$$

 $r \supset g_1(y)$

Some notes

DPLL

Resolution

 $\Box \quad (\forall x P(x) \to \exists y P(y), F)$

Logic

The Early Days

In the beginning there was darkness...

Presburger Procedure

The Great Triumph

The Logic Theory

Machine Example -

Substitution Method

Example -

Detachment Method

Example - Chaining

Comparing LTM with

the British Museum

Performance and

Completeness

Wang and Gao

Example

Success?

Paul Gilmore and

Herbert Gelernter

Dag Prawitz

Example:

$$\forall x P(x) \rightarrow$$

 $\triangleright \exists y P(y)$

Some notes

DPLL

Resolution

 $\Box \quad (\forall x P(x) \to \exists y P(y), F)$

 $\Box \quad (\forall x P(x) \to \exists y P(y), F), (\forall x P(x), T), (\exists y P(y), F)$

Logic

The Early Days
In the beginning there
was darkness...

Presburger Procedure
The Great Triumph
The Logic Theory
Machine
Example -

Substitution Method Example -

Detachment Method

Example - Chaining

Comparing LTM with the British Museum Performance and

Completeness

Wang and Gao

Example

Success?

Paul Gilmore and Herbert Gelernter

Dag Prawitz

Example:

$$\triangleright \exists y P(y) \rightarrow \exists y P(y)$$

Some notes

DPLL

- $\Box \quad (\forall x P(x) \to \exists y P(y), F)$
- $\Box \quad (\forall x P(x) \to \exists y P(y), F), (\forall x P(x), T), (\exists y P(y), F)$
- By the semantics of the universal operator, then for any constant c, we have that (P(c), T). We consider an enumeration of all constants, c_1, c_2, \ldots , and take any constant:

Logic

The Early Days
In the beginning there
was darkness...

Presburger Procedure
The Great Triumph
The Logic Theory
Machine
Example -

Substitution Method

Example -

Detachment Method

Example - Chaining

Comparing LTM with the British Museum Performance and Completeness

Wang and Gao

- I

Example Success?

Paul Gilmore and

Herbert Gelernter

Dag Prawitz

Example:

$$\triangleright \exists y P(y) \rightarrow \exists y P(y)$$

Some notes

DPLL

- $\Box \quad (\forall x P(x) \to \exists y P(y), F)$
- $\Box \quad (\forall x P(x) \to \exists y P(y), F), (\forall x P(x), T), (\exists y P(y), F)$
- By the semantics of the universal operator, then for any constant c, we have that (P(c), T). We consider an enumeration of all constants, c_1, c_2, \ldots , and take any constant:
- \Box $(P(c_1),T)$

Logic

The Early Days
In the beginning there
was darkness...

Presburger Procedure
The Great Triumph
The Logic Theory
Machine

Example -Substitution Method

Example Detachment Method
Example - Chaining

Comparing LTM with the British Museum Performance and

Completeness
Wang and Gao

Example

Success?

Paul Gilmore and Herbert Gelernter

Dag Prawitz

Example:

$$\triangleright \exists y P(y) \rightarrow \exists y P(y)$$

Some notes

DPLL

- $\Box \quad (\forall x P(x) \to \exists y P(y), F)$
- $\Box \quad (\forall x P(x) \to \exists y P(y), F), (\forall x P(x), T), (\exists y P(y), F)$
- By the semantics of the universal operator, then for any constant c, we have that (P(c), T). We consider an enumeration of all constants, c_1, c_2, \ldots , and take any constant:
- \Box $(P(c_1),T)$
- By the semantics of the existential operator, $(\exists y P(y), F)$ implies that for any constant c, we have that P(c) is false. We select a constant that has been used before:

Logic

The Early Days
In the beginning there
was darkness...

Presburger Procedure
The Great Triumph
The Logic Theory
Machine
Example -

Substitution Method

Example -

Detachment Method

Example - Chaining

Comparing LTM with the British Museum Performance and

Completeness

Wang and Gao

Example

Success?

Paul Gilmore and Herbert Gelernter

Dag Prawitz

Example:

$$\Rightarrow \forall x P(x) \rightarrow \exists y P(y)$$

Some notes

DPLL

- $\Box \quad (\forall x P(x) \to \exists y P(y), F)$
- $\Box \quad (\forall x P(x) \to \exists y P(y), F), (\forall x P(x), T), (\exists y P(y), F)$
- By the semantics of the universal operator, then for any constant c, we have that (P(c), T). We consider an enumeration of all constants, c_1, c_2, \ldots , and take any constant:
- \Box $(P(c_1),T)$
- By the semantics of the existential operator, $(\exists y P(y), F)$ implies that for any constant c, we have that P(c) is false. We select a constant that has been used before:
- \Box $(P(c_1), F)$

Some notes

Logic The Early Days In the beginning there was darkness... Presburger Procedure The Great Triumph The Logic Theory Machine Example -Substitution Method Example -Detachment Method Example - Chaining Comparing LTM with the British Museum Performance and Completeness Wang and Gao Example Success? Paul Gilmore and Herbert Gelernter Dag Prawitz Example: $\forall x P(x) \rightarrow \exists y P(y)$ Some notes **DPLL** Resolution

This is a tableau!
Constant selection is slightly more complicated than what was outlined
in the example.
Prawitz coded the procedure in a programming language he devised.
His father, Håkan Prawtiz, hand-translated the code into machine code
in 1957: FACIT EDB (transistorised computer), 2049 40-bits machine
words, 8192 words drum.
In 1958, Neri Voghera tested the procedure in a number of examples.
 Outlined at the first IFIP, in Paris, 1960.
 Published in 1960 [PPV60].
The search for constants in Prawitz procedure were far from optimal.
Prawitz introduced the use of <i>unification</i> in 1960: the method relied on

the use of meta-variables which were replaced when needed, instead of

using a fixed sequence.

Logic

The Early Days

DPLL

Davis-Putnam

Davis-Putnam-

Logemann-Loveland

Prenex Normal Form

Skolem Functions

Example

Herbrand Universe

Examples

Herbrand Base

Herbrand

Interpretations

Formally

Example

Ground Instances of

Clauses

Satisfiability of

Ground Clauses

Unsatisfiability

Saturation

Saturation and

Herbrand

Interpretations

Herbrand's Theorems

DPLL

Example

Checking for

consistency

Examples

DPLL

More examples
Only using rule III
Nafon
First-Order Example

DPLL

Davis-Putnam

Logic

The Early Days

DPLL

Davis-Putnam Davis-Putnam-Logemann-Loveland Prenex Normal Form

Skolem Functions Example

Herbrand Universe

Examples

Herbrand Base

Herbrand

Interpretations

Formally

Example

Ground Instances of

Clauses

Satisfiability of

Ground Clauses

Unsatisfiability

Saturation

Saturation and

Herbrand Interpretations

Herbrand's Theorems

DPLL

Example

Checking for

consistency

Examples

More examples Only using rule III Nation First-Order Example **DPLL**

None of the mentioned procedures allowed functional symbols. Davis-Putnam, 1960, introduces Skolem functions and the Herbrand universe into the world of automated deduction. It also introduces clausal form. Finally, they proposed the unit resolution rule (which is there called "rule for the elimination of one-literal clauses") [DP60, DLL62].





Davis-Putnam-Logemann-Loveland

Logic

The Early Days

DPLL

Davis-Putnam
Davis-PutnamLogemann-

Prenex Normal Form

Skolem Functions

Example

Herbrand Universe

Examples

Herbrand Base

Herbrand

Interpretations

Formally

Example

Ground Instances of

Clauses

Satisfiability of

Ground Clauses

Unsatisfiability

Saturation

Saturation and

Herbrand

Interpretations

Herbrand's Theorems

DPLL

Example

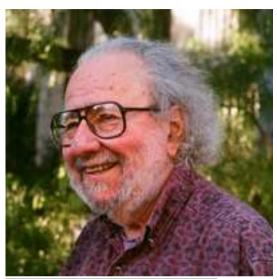
Checking for

consistency

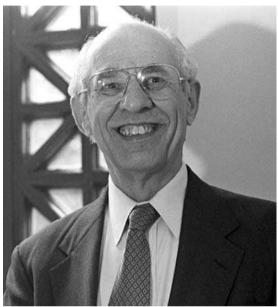
Examples

More examples Nalon Only using rule III

First-Order Example









Prenex Normal Form

Logic

The Early Days

DPLL

Davis-Putnam
Davis-PutnamLogemann-Loveland

Prenex Normal

⊳ Form

Skolem Functions

Example

Herbrand Universe

Examples

Herbrand Base

Herbrand

Interpretations

Formally

Example

Ground Instances of

Clauses

Satisfiability of

Ground Clauses

Unsatisfiability

Saturation

Saturation and

Herbrand

Interpretations

Herbrand's Theorems

DPLL

Example

Checking for consistency

Examples

More examples
Nalon
Only using rule III
First-Order Example

$$\varphi \stackrel{\mathsf{def}}{=} Q_1 x_1 \dots Q_n x_n \psi$$

where

- $\longrightarrow \varphi$ is a sentence: no free variables.
- \longrightarrow Each Q_i , $1 \le i \le n$, is a quantifier.
- $\longrightarrow \psi$ is in Negation Normal Form (NNF).
- $\longrightarrow \psi$ is the matrix of φ .
- $\longrightarrow x_i$, $1 \le i \le n$, is free in ψ .

Skolem Functions

Logic

The Early Days

DPLL

Davis-Putnam
Davis-PutnamLogemann-Loveland
Prenex Normal Form

hildrapsize Skolem Functions

Example

Herbrand Universe

Examples

Herbrand Base

Herbrand

Interpretations

Formally

Example

Ground Instances of

Clauses

Satisfiability of Ground Clauses

Unsatisfiability

Saturation

Saturation and

Herbrand Interpretations

Herbrand's Theorems

DPLL

Example

Checking for

consistency

<u>Examples</u>

More examples
Only using rule III
I Naion
First-Order Example
DPLL

Let

$$\varphi \stackrel{\mathsf{def}}{=} Q_1 x_1 \dots Q_n x_n \psi$$

be a formula in Prenex Normal Form where Q_i is the leftmost existential quantifier. If φ is satisfiable, then

$$\varphi' \stackrel{\mathsf{def}}{=} Q_1 x_1 \dots Q_{i-1} x_{i-1} Q_{i+1} x_{i+1} \dots Q_n x_n \psi[x_i \mapsto f^{i-1}(x_1, \dots, x_{i-1})]$$

where f^{i-1} is a new functional symbol, is satisfiable.

Obs.: The transformation is *satisfiability preserving*: if there is a model \mathbb{M} for φ , then there is a model \mathbb{M} ' for φ' .

Note that this is enough for proof methods based on contradiction: if there is no model \mathbb{M} ' for φ' , then there is no model \mathbb{M} for φ .

Logic The Early Days **▷** DPLL Davis-Putnam Davis-Putnam-Logemann-Loveland Prenex Normal Form Skolem Functions **▶** Example Herbrand Universe Examples Herbrand Base Herbrand Interpretations Formally Example Ground Instances of Clauses Satisfiability of Ground Clauses Unsatisfiability Saturation Saturation and Herbrand **Interpretations** Herbrand's Theorems **DPLL** Example Checking for consistency

$$\neg(\forall x (P(x) \to Q(x)) \to (\forall x P(x) \to \forall x Q(x)))$$

More examples
Only using rule III
I Naion
First-Order Example
DPLL

Examples

Logic

The Early Days

DPLL

Davis-Putnam
Davis-PutnamLogemann-Loveland

Prenex Normal Form

Skolem Functions

Herbrand Universe

Examples

Herbrand Base

Herbrand

Interpretations

Formally

Example

Ground Instances of

Clauses

Satisfiability of

Ground Clauses

Unsatisfiability

Saturation

Saturation and

Herbrand

Interpretations

Herbrand's Theorems

DPLL

Example

Checking for

consistency

Examples

More examples
Only using rule III
Nafon
First-Order Example

DPLL

 $\neg(\forall x (P(x) \to Q(x)) \to (\forall x P(x) \to \forall x Q(x))) \\ \neg(\forall x (P(x) \to Q(x)) \to (\forall y P(y) \to \forall z Q(z)))$

CADE-27, Natal, 2019 - 32 / 82

Logic

The Early Days

DPLL

Davis-Putnam Davis-Putnam-Logemann-Loveland

Prenex Normal Form

Skolem Functions

Example

Herbrand Universe

Examples

Herbrand Base

Herbrand

Interpretations

Formally

Example

Ground Instances of

Clauses

Satisfiability of

Ground Clauses

Unsatisfiability

Saturation

Saturation and

Herbrand

Interpretations

Herbrand's Theorems

DPLL

Example

Checking for

consistency

Examples

More examples Only using rule III Nation First-Order Example

DPLL

$\neg(\forall x (P(x) \to Q(x)) \to (\forall x P(x) \to \forall x Q(x)))$ $\neg(\forall x (P(x) \to Q(x)) \to (\forall y P(y) \to \forall z Q(z)))$ $\forall x (\neg P(x) \lor Q(x)) \land \forall y P(y) \land \neg \forall z Q(z)$

Logic

The Early Days

DPLL

Davis-Putnam
Davis-PutnamLogemann-Loveland

Prenex Normal Form

Skolem Functions

Example
Herbrand Universe

Examples

Herbrand Base

Herbrand

Interpretations

Formally

Example

Ground Instances of

Clauses

Satisfiability of

Ground Clauses

Unsatisfiability

Saturation

Saturation and

 ${\sf Herbrand}$

Interpretations

Herbrand's Theorems

DPLL

Example

Checking for

consistency

Examples

More examples
Only using rule III
Nafon
First-Order Example

DPLL

 $\neg(\forall x (P(x) \to Q(x)) \to (\forall x P(x) \to \forall x Q(x)))$ $\neg(\forall x (P(x) \to Q(x)) \to (\forall y P(y) \to \forall z Q(z)))$ $\forall x (\neg P(x) \lor Q(x)) \land \forall y P(y) \land \neg \forall z Q(z)$ $\forall x (\neg P(x) \lor Q(x)) \land \forall y P(y) \land \exists z \neg Q(z)$

Logic

The Early Days

DPLL

Davis-Putnam
Davis-PutnamLogemann-Loveland

Prenex Normal Form

Skolem Functions

Herbrand Universe

Examples

Herbrand Base

Herbrand

Interpretations

Formally

Example

Ground Instances of

Clauses

Satisfiability of

Ground Clauses

Unsatisfiability

Saturation

Saturation and

Herbrand

Interpretations

Herbrand's Theorems

DPLL

Example

Checking for

consistency

<u>Examples</u>

DPLL

More examples
Only using rule III
Nafon
First-Order Example

 $\neg(\forall x (P(x) \to Q(x)) \to (\forall x P(x) \to \forall x Q(x)))$ $\neg(\forall x (P(x) \to Q(x)) \to (\forall y P(y) \to \forall z Q(z)))$ $\forall x (\neg P(x) \lor Q(x)) \land \forall y P(y) \land \neg \forall z Q(z)$ $\forall x (\neg P(x) \lor Q(x)) \land \forall y P(y) \land \exists z \neg Q(z)$ $\forall x \forall y \exists z ((\neg P(x) \lor Q(x)) \land P(y) \land \neg Q(z))$

Logic

The Early Days

DPLL

Davis-Putnam
Davis-PutnamLogemann-Loveland

Prenex Normal Form

Skolem Functions

▷ Example

Herbrand Universe

Examples

Herbrand Base

Herbrand

Interpretations

Formally

Example

Ground Instances of

Clauses

Satisfiability of

Ground Clauses

Unsatisfiability

Saturation

Saturation and

Herbrand

Interpretations

Herbrand's Theorems

DPLL

Example

Checking for

consistency

<u>Examples</u>

DPLL

More examples
Only using rule III
L. Naion
First-Order Example

 $\neg(\forall x(P(x) \to Q(x)) \to (\forall xP(x) \to \forall xQ(x)))$ $\neg(\forall x(P(x) \to Q(x)) \to (\forall yP(y) \to \forall zQ(z)))$ $\forall x(\neg P(x) \lor Q(x)) \land \forall yP(y) \land \neg \forall zQ(z)$ $\forall x(\neg P(x) \lor Q(x)) \land \forall yP(y) \land \exists z\neg Q(z)$ $\forall x\forall y\exists z((\neg P(x) \lor Q(x)) \land P(y) \land \neg Q(z))$ $\forall x\forall y((\neg P(x) \lor Q(x)) \land P(y) \land \neg Q(f^{2}(x,y)))$

Herbrand Universe

Logic

The Early Days

DPLL

Davis-Putnam
Davis-PutnamLogemann-Loveland

Prenex Normal Form

Skolem Functions
Example

▶ Herbrand Universe

Examples

Herbrand Base

Herbrand

Interpretations

Formally

Example

Ground Instances of

Clauses

Satisfiability of

Ground Clauses

Unsatisfiability

Saturation

Saturation and

Herbrand Interpretations

Herbrand's Theorems

DPLL

DPLL

Example

Checking for

consistency Examples

More examples
Only using rule II

Only using rule III Nation First-Order Example Let S be a set of clauses. The Herbrand Universe \mathcal{H} associated with S is a set of ground terms constructed as follows:

- \square if there is f^0 which occurs in \mathcal{S} , then $f^0 \in \mathcal{H}$; otherwise, let $\mathcal{H} = \{a\}$;
- \square if t_1, \ldots, t_n are terms in \mathcal{H} and f^n occurs in \mathcal{S} , then $f^n(t_1, \ldots, t_n) \in \mathcal{H}$.

That is, the Herbrand Universe (for a set) is the set of all ground terms (based on that set).

Logic

The Early Days

DPLL

Davis-Putnam
Davis-PutnamLogemann-Loveland

Prenex Normal Form

Skolem Functions

Example

Herbrand Universe

Examples

Herbrand Base

Herbrand

Interpretations

Formally

Example

Ground Instances of

Clauses

Satisfiability of Ground Clauses

Unsatisfiability

Saturation

Saturation and

Herbrand

Interpretations

Herbrand's Theorems

DPLL

Example

Checking for

consistency

<u>Examples</u>

More examples
Only using rule III
I Naion
First-Order Example
DPLL

 \square No functions: $S = \{P(x) \lor Q(x), P(x), \neg Q(x)\}$

$$\mathcal{H} = \{a\}$$

 \square One function: $S = \{P(x) \lor Q(x), P(x), \neg Q(f(x))\}$

$$\mathcal{H} = \{a, f(a), f(f(a)), f(f(f(a))), \ldots\}$$

☐ One function (our working example):

$$\mathcal{S} = \{ P(x) \lor Q(x), P(y), \neg Q(f(x,y)) \}$$

$$\mathcal{H} = \{a, f(a, a), f(a, f(a, a)), f(f(a, a), a), f(f(a, a), f(a, a)), \ldots\}$$

 \square Two functions: $S = \{P(x) \lor Q(x), P(f(x)), \neg Q(g(x))\}$

$$\mathcal{H} = \{a, f(a), g(a), f(f(a)), f(g(a)), g(f(a)), g(g(a)), \ldots\}$$

Herbrand Base

Let S be a set of clauses and H its Herbrand universe. The Herbrand base B for S is the set of all ground atoms $P^n(t_1, \ldots, t_n)$, where P^n occurs in S and t_i is in H, for $i = 1, \ldots, n$.

Examples:

- \Box No functions: $\mathcal{S} = \{P(x) \lor Q(x), P(x), \neg Q(x)\}, \mathcal{H} = \{a\}$ $\{P(a), Q(a)\}$
- □ One function:

$$S = \{P(x) \lor Q(x), P(x), \neg Q(f(x))\}, \mathcal{H} = \{a, f(a), f(f(a)), f(f(f(a))), \ldots\}$$
$$\{P(a), Q(a), P(f(a)), Q(f(a)), P(f(f(a))), Q(f(f(a))), \ldots\}$$

Herbrand Interpretations

Logic

The Early Days

DPLL

Davis-Putnam
Davis-PutnamLogemann-Loveland

Prenex Normal Form

Skolem Functions

Example

Herbrand Universe

Examples

Herbrand Base

▶ Interpretations

Formally

Example

Ground Instances of

Clauses

Satisfiability of

Ground Clauses

Unsatisfiability
Saturation

Saturation and

Herbrand

Interpretations

Herbrand's Theorems

DPLL

Example

Checking for

consistency

<u>Examples</u>

More examples
Only using rule III
Line Nation
First-Order Example
DPLL

Let \mathcal{S} be a set of clauses and \mathcal{H} be its Herbrand universe.

- □ A *Herbrand interpretation* provides:
 - A domain: \mathcal{H}
 - An assignment for constants to an element of the domain;
 - An assignment for functional symbols to an element of the domain;
 - An assignment for predicate symbols to $\{\bot, \top\}$

Formally

Logic

The Early Days

DPLL

Davis-Putnam Davis-Putnam-Logemann-Loveland

Prenex Normal Form

Skolem Functions

Example

Herbrand Universe

Examples

Herbrand Base

Herbrand

Interpretations

Formally

Example

Ground Instances of

Clauses

Satisfiability of

Ground Clauses

Unsatisfiability

Saturation

Saturation and

Herbrand

Interpretations

Herbrand's Theorems

DPLL

Example

Checking for

consistency

Examples

More examples

Only using rule III Nation First-Order Example **DPLL**

Let S be a set of clauses. H be its Herbrand universe and B be a Herbrand base for S. Let $\mathcal{I} = \langle \mathcal{H}, \mathcal{B} \rangle$. We say that \mathcal{I} is a Herbrand interpretation if $t^{\mathcal{B}} = t$ for all terms t.

That is,

- If c is a constant, then $c^{\mathcal{I}} = c$;
- If f is a n-ary functional symbol, then $f^{\mathcal{I}}(h_1,\ldots,h_n)=f(h_1,\ldots,h_n)$.
- There are no restrictions for predicate symbols.

If $\mathcal{B} = \{P_1, \dots, P_n, \dots\}$, then take $\mathcal{I} = \{m_1, \dots, m_n, \dots\}$, where $m_i = P_i$ or $m_i = \neg P_i$.

$$\mathcal{S} = \{P(x) \lor Q(x), P(y), \neg Q(f^{2}(x,y))\}$$

$$\mathcal{H} = \{a, f^{2}(a, a), f^{2}(a, f^{2}(a, a)), f^{2}(f^{2}(a, a), a), f^{2}(f^{2}(a, a), f^{2}(a, a)), \ldots\}$$

$$\{P(a), Q(a), P(f^{2}(a, a)), Q(f^{2}(a, a)), P(f^{2}(a, f(a))), P(f^{2}(f(a), a)), P(f^{2}(f(a), a)), P(f^{2}(f(a), a)), P(f^{2}(f(a), a)), \ldots\}$$

Possible interpretations:

$$\mathcal{I}_{1} = \{P(a), Q(a), P(f^{2}(a, a)), Q(f^{2}(a, a)), P(f^{2}(a, f^{2}(a, a))), P(f^{2}(f^{2}(a, a), a)), \ldots\}$$

$$\mathcal{I}_{2} = \{\neg P(a), Q(a), P(f^{2}(a, a)), Q(f^{2}(a, a)), P(f^{2}(a, f^{2}(a, a))), P(f^{2}(f^{2}(a, a), a)), \ldots\}$$

$$\mathcal{I}_{3} = \{P(a), \neg Q(a), P(f^{2}(a, a)), Q(f^{2}(a, a)), P(f^{2}(a, f^{2}(a, a))), P(f^{2}(f^{2}(a, a), a)), \ldots\}$$

Ground Instances of Clauses

Logic

The Early Days

DPLL

Davis-Putnam
Davis-PutnamLogemann-Loveland
Prenex Normal Form

Skolem Functions
Example

Herbrand Universe Examples

Herbrand Base

Herbrand

Interpretations

Formally

Example

Ground Instances

ightarrow of Clauses

Satisfiability of Ground Clauses

Unsatisfiability

Saturation

Saturation and

Herbrand

Interpretations

Herbrand's Theorems

DPLL

Example

Checking for consistency

_ '

Examples

More examples

DPLL

Only using rule III
C. Naion
First-Order Example

Let \mathcal{S} be a set of clauses and \mathcal{H} its Herbrand universe. A ground instance of a clause C, $C \in \mathcal{S}$, for a Herbrand Base \mathcal{H} (of \mathcal{S}) is the clause $C' = C[t_{ji} \backslash x_i]$, for all x_i occurring in C and $t_{ji} \in \mathcal{H}$. Examples:

- \square No functions: $\mathcal{S}=\{P(x)\vee Q(x),P(x),\neg Q(x)\},\mathcal{H}=\{a\},\mathcal{B}=\{P(a),Q(a)\}$
 - $P(a) \vee Q(a), P(a), \neg Q(a)$ are the only ground instances for \mathcal{B}
- - $P(a) \vee Q(a)$
 - $P(f^2(a,a)) \vee Q(f^2(a,a))$
 - $P(f^2(a, f^2(a, a))) \vee Q(f^2(a, f^2(a, a)))$
 - ...

Satisfiability of Ground Clauses

Logic

The Early Days

DPLL

Davis-Putnam
Davis-PutnamLogemann-Loveland
Prenex Normal Form

Skolem Functions

Example

Herbrand Universe

Examples

Herbrand Base

Herbrand

Interpretations

Formally

Example

Ground Instances of Clauses

Satisfiability of

Ground Clauses
Unsatisfiability

Saturation

Saturation and

Herbrand

Interpretations

Herbrand's Theorems

DPLL

Example

Checking for

consistency

<u>Examples</u>

DPLL

More examples
Only using rule III
Valon
First-Order Example

Let S be a set of clauses and a \mathcal{I} be a Herbrand interpretation for S.

- Let C' be a ground instance of a clause C in S. We say that \mathcal{I} satisfies C', denoted by $\mathcal{I} \models C'$, if $C' \cap \mathcal{I} \neq \emptyset$ (note that clauses are regarded as set of literals).
- \square We say that \mathcal{I} satisfies C in \mathcal{S} if, and only if, for all ground clauses C' of C, we have that $\mathcal{I} \models C'$.

Example: $S = {\neg P(x) \lor Q(f(x))}$

$$\mathcal{I} = \{ P(a), \neg Q(a), P(f(a)), Q(f(a)), \neg Q(f(f(a))), \ldots \}$$

$$\mathcal{I} \models \neg P(a) \lor Q(f(a))$$
$$\mathcal{I} \not\models \neg P(f(a)) \lor Q(f(f(a)))$$

Unsatisfiability

Logic

The Early Days

DPLL

Davis-Putnam Davis-Putnam-Logemann-Loveland Prenex Normal Form

Skolem Functions

Example

Herbrand Universe

Examples

Herbrand Base

Herbrand

Interpretations

Formally

Example

Ground Instances of

Clauses

Satisfiability of

Ground Clauses

Unsatisfiability

Saturation

Saturation and

Herbrand

Interpretations

Herbrand's Theorems

DPLL

Example

Checking for

consistency

Examples

DPLL

Only using rule III Nation First-Order Example

Let S be a set of clauses. S is unsatisfiable if and only if for every Herbrand interpretation $\mathcal I$ for $\mathcal S$ there is a ground clause C' of C in $\mathcal S$ such that $\mathcal{I} \not\models C'$.

Example: $\{\neg P(x), P(a)\}$

There are only two possible Herbrand interpretations:

- \Box $\mathcal{I}_1 = \{P(a)\}$: does not satisfy the first clause;
- $\mathcal{I}_2 = {\neg P(a)}$: does not satisfy the second clause.

Saturation

Logic

The Early Days

DPLL

Davis-Putnam
Davis-PutnamLogemann-Loveland

Prenex Normal Form

Skolem Functions

Example

Herbrand Universe

Examples

Herbrand Base

Herbrand

Interpretations

Formally

Example

Ground Instances of

Clauses

Satisfiability of

Ground Clauses

Unsatisfiability

▷ Saturation

Saturation and

Herbrand

Interpretations

Herbrand's Theorems

DPLL

Example

Checking for

consistency

<u>Examples</u>

DPLL

More examples
Only using rule III
Nation
First-Order Example

Let S be a set of clauses. Let T be a set of terms. By T(S), we denote the saturation of S over T, which is the set of all ground clauses obtainable from S by (uniformly) replacing variables by members of T.

Saturation

Logic

The Early Days

DPLL

Davis-Putnam
Davis-PutnamLogemann-Loveland
Prenex Normal Form

Skolem Functions

Example

Herbrand Universe

Examples

Herbrand Base

Herbrand

Interpretations

Formally

Example

Ground Instances of

Clauses

Satisfiability of Ground Clauses

Unsatisfiability

▷ Saturation

Saturation and

Herbrand Interpretations

Herbrand's Theorems

DPLL

Example

Checking for

consistency

<u>Examples</u>

More examples
Only using rule III
I Naion
First-Order Example
DPLL

Let S be a set of clauses. Let T be a set of terms. By T(S), we denote the saturation of S over T, which is the set of all ground clauses obtainable from S by (uniformly) replacing variables by members of T.

Example:
$$S = {\neg P(x) \lor Q(x), P(y), \neg Q(f^2(x,y))}$$

$$\mathcal{H} = \{a, f^2(a, a), f^2(a, f^2(a, a)), f^2(f^2(a, a), a), f^2(f^2(a, a), f^2(a, a)), \ldots\}$$

$$\mathcal{H}(\mathcal{S}) = \{ \neg P(a) \lor Q(a), P(a), \neg Q(f^{2}(a, a)), \\ \neg P(a) \lor Q(a), P(f^{2}(a, a)), \neg Q(f^{2}(a, f^{2}(a, a))), \\ \neg P(f^{2}(a, a)) \lor Q(f^{2}(a, a)), P(a), \neg Q(f^{2}(f^{2}(a, a), a)), \\ \neg P(f^{2}(a, a)) \lor Q(f^{2}(a, a)), P(f^{2}(a, a)), \neg Q(f^{2}(f^{2}(a, a), f^{2}(a, a))), \\ \dots \}$$

Saturation

Logic

The Early Days

DPLL

Davis-Putnam
Davis-PutnamLogemann-Loveland
Prenex Normal Form

Skolem Functions

Example

Herbrand Universe

Examples

Herbrand Base

Herbrand

Interpretations

Formally

Example

Ground Instances of

Clauses

Satisfiability of

Ground Clauses

Unsatisfiability

Saturation Saturation

Herbrand

Interpretations

Herbrand's Theorems

DPLL

Example

Checking for

More examples

consistency

<u>Examples</u>

DPLL

Only using rule III
C. Naion
First-Order Example

Let S be a set of clauses. Let T be a set of terms. By T(S), we denote the saturation of S over T, which is the set of all ground clauses obtainable from S by (uniformly) replacing variables by members of T.

Example: $S = {\neg P(x) \lor Q(x), P(y), \neg Q(f^2(x,y))}$

$$\mathcal{H} = \{a, f^2(a, a), f^2(a, f^2(a, a)), f^2(f^2(a, a), a), f^2(f^2(a, a), f^2(a, a)), \ldots\}$$

$$\mathcal{H}(S) = \{ \neg P(a) \lor Q(a), P(a), \neg Q(f^{2}(a, a)), \\ \neg P(a) \lor Q(a), P(f^{2}(a, a)), \neg Q(f^{2}(a, f^{2}(a, a))), \\ \neg P(f^{2}(a, a)) \lor Q(f^{2}(a, a)), P(a), \neg Q(f^{2}(f^{2}(a, a), a)), \\ \neg P(f^{2}(a, a)) \lor Q(f^{2}(a, a)), P(f^{2}(a, a)), \neg Q(f^{2}(f^{2}(a, a), f^{2}(a, a))), \\ \dots \}$$

Saturation and Herbrand Interpretations

Logic
The Early Days
DPLL
Davis-Putnam
Davis-Putnam-
Logemann-Loveland
Prenex Normal Form
Skolem Functions
Example
Herbrand Universe
Examples
Herbrand Base
Herbrand Interpretations
Formally
Example
Ground Instances of
Clauses
Satisfiability of
Ground Clauses
Unsatisfiability
Saturation
Saturation and
Herbrand .
Interpretations
Herbrand's Theorems
DPLL
Example
Checking for
consistency
Examples

- \Box A set of ground literals which does not include a complementary pair is called a *model* (or interpretation).
- \square If \mathcal{I} is a model and \mathcal{S} is a set of ground clauses, then \mathcal{I} is a model of \mathcal{S} if, for all clauses C in \mathcal{S} , C contains a member of \mathcal{I} .
- In general, if S is any set of clauses and H is the Herbrand universe of S, then I is a model of S just in case I is a model of H(S).

More examples
Only using rule III
I Naion
First-Order Example
DPLL

Herbrand's Theorems

Logic

The Early Days

DPLL

Davis-Putnam Davis-Putnam-Logemann-Loveland Prenex Normal Form Skolem Functions

Example

Herbrand Universe

Examples

Herbrand Base

Herbrand

Interpretations

Formally

Example

Ground Instances of Clauses

Satisfiability of

Ground Clauses

Unsatisfiability

Saturation

Saturation and

Herbrand Interpretations

Herbrand's

▶ Theorems

DPLL

Example

Checking for consistency

Examples

First-Order Example

More examples Nalon Only using rule III

If S is any finite set of clauses and H is its Herbrand Universe, then S is unsatisfiable if and only if some finite subset of $\mathcal{H}(S)$ is unsatisfiable.

Note that this theorem suggests the following refutation procedure:

- 1. Select $\mathcal{P}_0, \mathcal{P}_1, \mathcal{P}_2, \ldots$ as finite subsets of the Herbrand universe \mathcal{H} of \mathcal{S} , such that $\mathcal{P}_i \subseteq \mathcal{P}_{i+1}$, for all $i \geq 0$ and such that $\bigcup_{i=0}^{\infty} \mathcal{P}_i = \mathcal{H}$.
- Check $\mathcal{P}_0(\mathcal{S}), \mathcal{P}_1(\mathcal{S}), \mathcal{P}_2(\mathcal{S}), \ldots$ for satisfiability.
- By Herbrand's theorem, for some i, $\mathcal{P}_i(\mathcal{S})$ is unsatisfiable.

Level saturation procedures take $\mathcal{H}_0, \mathcal{H}_1, \mathcal{H}_2, \dots$ to be the finite sets over which the set of clauses is saturated, where each \mathcal{H}_{i+1} contains all the terms in \mathcal{H}_i or whose arguments are in \mathcal{H}_i .

Finding proof sets, i.e. finite unsatisfiable subsets which are minimal (in the sense that every proper subset is satisfiable) requires guidance (heuristics).

DPLL

Logic The Early Days DPLL Davis-Putnam Davis-Putnam-Logemann-Loveland Prenex Normal Form Skolem Functions Example Herbrand Universe Examples Herbrand Base Herbrand Interpretations Formally Example Ground Instances of Clauses Satisfiability of Ground Clauses Unsatisfiability Saturation Saturation and Herbrand Interpretations Herbrand's Theorems DPLL Example Checking for consistency Examples

In order to prove φ

- Take the Skolemised prenex normal form of φ , where the matrix is in Conjunctive Normal Form, obtaining φ'
- Generate the Herbrand sets by level and check for unsatisfiability until a contradiction has been found.

More examples
Only using rule III
I Nation
First-Order Example
DPLL

Example

Logic
The Early Days
DPLL
Davis-Putnam Davis-Putnam-
Logemann-Loveland
Prenex Normal Form
Skolem Functions
Example
Herbrand Universe
Examples
Herbrand Base Herbrand
Interpretations
Formally
Example
Ground Instances of
Clauses
Satisfiability of Ground Clauses
Unsatisfiability
Saturation
Saturation and
Herbrand
Interpretations Herbrand's Theorems
DPLL
Example
Checking for
consistency
Examples

$$\forall x_1 \exists x_2 \forall x_3 R(x_1, x_2, x_3)$$

$$\forall x_1 \forall x_3 R(x_1, f(x_1), x_3)$$

$$R(a, f(a), a)$$

$$R(a, f(a), f(a))$$

$$R(f(a), f(f(a)), a)$$

$$R(f(a), f(f(a)), f(a))$$

$$\vdots$$

More examples
Only using rule III
Only IV Alon
First-Order Example
DPLL

Checking for consistency

Logic

The Early Days

DPLL

Davis-Putnam
Davis-PutnamLogemann-Loveland

Prenex Normal Form

Skolem Functions

Example

Herbrand Universe

Examples

Herbrand Base

Herbrand

Interpretations

Formally

Example

Ground Instances of

Clauses

Satisfiability of

Ground Clauses

Unsatisfiability

Saturation

Saturation and

Herbrand

Interpretations

Herbrand's Theorems

DPLL

Example

Checking for

<u>Examples</u>

More examples
Only using rule III
Nation
First-Order Example
DPLL

- Unit resolution (which is there called "Rule for the Elimination of One-Literal Clauses"):
 - (a) if p, $\neg p$ are in \mathcal{S} , $\mathcal{S} = \{\bot\}$.
 - (b) if p in \mathcal{S} , then $\mathcal{S} = \mathcal{S} \setminus \{C \mid p \in C\} \setminus \{D \mid \neg p \in D\} \cup \{D \mid D \cup \{\neg p\} \in \mathcal{S}\}.$
 - (c) $\neg p \text{ in } \mathcal{S}$, then $\mathcal{S} = \mathcal{S} \setminus \{C \mid \neg p \in C\} \setminus \{D \mid p \in D\} \cup \{D \mid D \cup \{p\} \in \mathcal{S}\}.$
- 2. Pure Literal Elimination (which is there called "Affirmative-Negative Rule"): if l occurs only positively or negatively, then $S = S \setminus \{D \mid l \in D\}.$
- 3. Rule for Eliminating Atomic Formulas: if we can obtain (by factoring) $S = \{(\varphi \lor p), (\psi \lor \neg p), R\}$, where R is free of p, then $S = \{(\varphi \lor \psi), R\}$

Examples

Logic

The Early Days

▷ DPLL

Davis-Putnam
Davis-PutnamLogemann-Loveland

Prenex Normal Form

Skolem Functions

Example

Herbrand Universe

Examples

Herbrand Base

Herbrand

Interpretations

Formally

Example

Ground Instances of

Clauses

Satisfiability of

Ground Clauses

Unsatisfiability

Saturation

Saturation and

Herbrand

Interpretations

Herbrand's Theorems

DPLL

DPLL

Example

Checking for

consistency

Examples

More examples
Only using rule III
Nation
First-Order Example

$$p \vee q \vee \neg r, p \vee \neg q, \neg p, r$$

$$p \vee q \vee \neg r, p \vee \neg q, \neg p, r$$

$$p \vee q, p \vee \neg q, \neg p$$

$$q, \neg q$$

 \perp

$$p \vee q, \neg q, \neg p \vee q \vee \neg r$$

$$p \lor q, \neg q, \neg p \lor q \lor \neg r$$

$$p \lor q, \neg q$$

$$p \vee q, \neg q$$

p

 \emptyset

More examples

Logic

The Early Days

DPLL

Davis-Putnam Davis-Putnam-Logemann-Loveland

Prenex Normal Form

Skolem Functions

Example

Herbrand Universe

Examples

Herbrand Base

Herbrand

Interpretations

Formally

Example

Ground Instances of

Clauses

Satisfiability of

Ground Clauses

Unsatisfiability

Saturation

Saturation and

Herbrand

Interpretations

Herbrand's Theorems

DPLL

Example

Checking for

consistency

Examples

▶ More examples

Only using rule III Nation First-Order Example **DPLL**

$$p \vee \neg q, \neg p \vee q, q \vee \neg r, \neg q \vee \neg r$$

$$p \vee \neg q, \neg p \vee q, q \vee \neg r, \neg q \vee \neg r$$

$$p \vee \neg q, \neg p \vee q$$

$$q \vee \neg q$$

 \emptyset

Only using rule III

Logic	

The Early Days

DPLL

Davis-Putnam

Davis-Putnam-Logemann-Loveland

Prenex Normal Form

Skolem Functions

Example

Herbrand Universe

Examples

Herbrand Base

Herbrand

Interpretations

Formally

Example

Ground Instances of

Clauses

Satisfiability of

Ground Clauses

Unsatisfiability

Saturation

Saturation and

Herbrand

Interpretations

Herbrand's Theorems

DPLL

Example

Checking for

consistency

Examples

More examples

Only using rule III
First-Order Example

DPLL

$$p \lor r, p \lor \neg s, \neg p \lor s, \neg p \lor \neg r, s \lor \neg r, \neg s \lor r$$

$$(r \land \neg s) \lor p, (\neg r \land s) \lor \neg p, s \lor \neg r, \neg s \lor r$$

$$(r \land \neg s) \lor (\neg r \land s), s \lor \neg r, \neg s \lor r$$

$$s \lor r, \neg s \lor \neg r, s \lor \neg r, \neg s \lor r$$

$$(s \land \neg s) \lor r, (s \land \neg s) \lor \neg r$$

$$(s \land \neg s)$$

$$s, \neg s = \bot$$

First-Order Example

Logic

The Early Days

DPLL

Davis-Putnam Davis-Putnam-Logemann-Loveland

Prenex Normal Form

Skolem Functions

Example

Herbrand Universe

Examples

Herbrand Base

Herbrand

Interpretations

Formally

Example

Ground Instances of

Clauses

Satisfiability of

Ground Clauses

Unsatisfiability

Saturation

Saturation and

Herbrand

Interpretations

Herbrand's Theorems

DPLL

Example

Checking for

consistency

Examples

More examples

Only using rule III Nation First-Order ▶ Example

```
\exists x \exists y \forall z ((F(x,y) \rightarrow (F(y,z) \land F(z,z)))
\wedge ((F(x,y) \wedge G(x,y)) \rightarrow (G(x,z) \wedge G(z,z))))
```

$$F(x,y),$$

$$\neg F(y,f(x,y)) \lor \neg F(f(x,y),f(x,y)) \lor G(x,y),$$

$$\neg F(y,f(x,y)) \lor \neg F(f(x,y),f(x,y)) \lor \neg G(x,f(x,y)) \lor \neg G(f(x,y),f(x,y))$$

It took 25 lines of instantiation using the enumeration procedure described before, where nesting of functional symbols goes up to 25. Then, unit resolution can be repeatedly applied and a contradiction is found.

DPLL

Lc	gic

The Early Days

DPLL

Davis-Putnam
Davis-PutnamLogemann-Loveland

Prenex Normal Form

Skolem Functions

Example

Herbrand Universe

Examples

Herbrand Base

Herbrand

Interpretations

Formally

Example

Ground Instances of

Clauses

Satisfiability of Ground Clauses

Unsatisfiability

Saturation

Saturation and

Herbrand

Interpretations

Herbrand's Theorems

DPLL

Example

Checking for

consistency

<u>Examples</u>

DPLL

More examples
Only using rule III
Nafon
First-Order Example

- Rule for Eliminating Atomic Formulas: if we can obtain (by factoring) $S = \{(\varphi \lor p), (\psi \lor \neg p), R\}$, where R is free of p, then $S = \{(\varphi \lor \psi), R\}$ (1960).
- Splitting (Rule for Eliminating Atomic Formulas)*: if we can obtain (by factoring) $\mathcal{S} = \{(\varphi \lor p), (\psi \lor \neg p), R\}$, where R is free of p, then $\mathcal{S} = \{(\varphi \land R), (\psi \land R)\}$ (1962).
- One of the formulae is put on the tape and processed; if it is not satisfiable, then the other formula is tested for satisfiability.
- ☐ The formula

 $\exists x \exists y \forall z ((F(x,y) \to (F(y,z) \land F(z,z))) \land ((F(x,y) \land G(x,y)) \to (G(x,z) \land G(z,z)))$

was proved under two minutes after 60 instantiation lines.

Logic The Early Days DPLL Resolution John Alan Robinson Argonne 1962-1963 ... and then came light! The Resolution Principle Resolution, at last Unification Another Example The upshot Literal Unification Occurs Check Most General Unifier Unification - Example **Propositional** Resolution The algorithm Tautology Elimination First-Order Resolution

Resolution

Resolution Method Soundness and Completeness Subsumption

John Alan Robinson



- "Theories of Meaning Implicit in the British Empiricists Locke, Berkeley and Hume" (Cambridge, 1952).
- "Causality, Probability and Testimony" (PhD, University of Oregon, University of Princeton, 1956).
- □ DuPont, operations research.

- In 1960, while holding a postdoc at the University of Pittsburgh, he accepts a tenure from Rice University, but decides to take a Summer research position at the Applied Mathematics Division of the Argonne National Laboratory (Chicago).
- His appointment at Argonne was to implement the Davis-Putnam procedure on an IBM 704.
- □ This work is described in a report (1961) which is in revised form in a paper from the Journal of the ACM [Rob63].

Argonne

Logic

The Early Days

DPLL

Resolution

John Alan Robinson

Argonne 1962-1963

... and then came

light!

The Resolution Principle

Resolution, at last

Unification

Another Example

The upshot

Literal Unification

Occurs Check

Most General Unifier

Unification - Example

Omnication - Example

Propositional

Resolution
The algorithm

Tautology Elimination

First-Order

Resolution

Resolution Method

Soundness and

Completeness

completenes.

Subsumption

Historical References

In 1960, he implements the DP procedure in FORTRAN (together with George Robinson).

I spent the summer [of 1961] happily... running this thing. Yes, it worked just like they [Davis and Putnam] said. However, the examples that one would like to try next blew it up, and we ran into combinatorial explosion of the instantiation, 'try all the instances, enumerate all the instances.' So I learnt that summer that was not exactly an elegant way to go.

In 1961, he implements Prawitz procedure in FORTRAN.

The work at Argonne really was dominating my life, because I started looking at other ways to go in this first-order procedure stuff, and stumbled across the work of Prawitz, who was the one who reached some form of unification, calculating instances rather than trying them all.

Logic

The Early Days

DPLL

Resolution

John Alan Robinson

Argonne

1962-1963

.. and then came

light!

The Resolution Principle

Resolution, at last

Unification

Another Example

The upshot

Literal Unification

Occurs Check

Most General Unifier

Unification - Example

Propositional

Resolution

The algorithm

Tautology Elimination

First-Order

Resolution

Resolution Method

Soundness and

Completeness

Subsumption

Historical References





William F. Miller, the boss at the Applied Mathematics Division in Argonne, sets up a team for the theorem-proving research project:

- John Alan Robinson.
- ☐ George Robinson, who earlier had helped with the implementation of the DP procedure.
- □ Larry Wos, a mathematician at the Lab.
- □ During those two summer projects, Robinson rediscovered unification and the resolution rule, which was submitted in 1963, sitting on the desk of some reviewer for a year, and finally published in 1965.

... and then came light!

Logic The Early Days **DPLL** Resolution John Alan Robinson Argonne 1962-1963 ... and then came □ light! The Resolution Principle Resolution, at last Unification Another Example The upshot Literal Unification Occurs Check Most General Unifier Unification - Example Propositional Resolution The algorithm Tautology Elimination First-Order Resolution Resolution Method Soundness and Completeness Subsumption Historical References

- On the unification procedure, Robinson says that he was "absolutely inspired by Prawitz". He uses a version similar to that of Herbrand's unification algorithm in his paper. Herbrand's procedure is definitional rather than the one devised by Prawitz, which is algorithmic.
- □ Prawitz and Robinson were not aware of this part of Herbrand's paper (although both cite the paper).
- ☐ The resolution rule had also appeared before:
 - it was first discovered in 1937, by Blake [Bla37];
 - then rediscovered by Quine (there called "consensus rule"), in 1955
 [vOQ55];
 - and it was proposed for theorem proving in 1962 at Harvard University by Dunham and North [DN63].

The Resolution Principle

Logic

The Early Days

DPLL

Resolution

John Alan Robinson

Argonne

1962-1963

... and then came

light!

The Resolution

▶ Principle

Resolution, at last

Unification

Another Example

The upshot

Literal Unification

Occurs Check

Most General Unifier

Unification - Example

Propositional

Resolution

The algorithm

Tautology Elimination

First-Order

Resolution

Resolution Method

Soundness and

Completeness

Subsumption

Historical References

Traditionally, a single step in deduction has been required, for pragmatic and psychological reasons, to be simple enough, broadly speaking, to be apprehended as correct by a human being in a single intellectual act. No doubt this custom originated in the desire that each single step of a deduction should be indubitable, even though the deductions as whole may consist of a long chain of such steps.

Resolution was far more complex, as it "condones single inferences which are often beyond the ability of human to grasp (other than discursively)." Resolution is *machine-oriented*: it was shown to be complete and it was designed for efficiency. Thus, although indubitable, resolution wasn't meant for human reading.

Resolution, at last

Logic
The Early Days
DPLL
John Alan Robinson
Argonne
1962-1963
and then came light!
The Resolution
Principle
Resolution, at last
Unification
Another Example
The upshot
Literal Unification
Occurs Check
Most General Unifier
Unification - Example
Propositional
Resolution
The algorithm
Tautology Elimination
First-Order Resolution
Resolution Method
Soundness and
Completeness
Subsumption

$$\begin{array}{cccc} [\mathsf{CUT}] & \varphi & \Rightarrow & \psi \\ & \psi & \Rightarrow & \chi \\ \hline & \varphi & \Rightarrow & \chi \end{array}$$

Resolution, at last

Logic
The Early Days
DPLL
▶ Resolution
John Alan Robinson
Argonne
1962-1963
and then came light!
The Resolution
Principle
Resolution, at last
•
Another Example
The upshot Literal Unification
Occurs Check
Most General Unifier
Unification - Example
<u>-</u>
Propositional Resolution
The algorithm
Tautology Elimination
First-Order
Resolution
Resolution Method
Soundness and
Completeness
Subsumption

$$[CUT] \qquad \begin{array}{ccc} \varphi & \Rightarrow & \psi \\ \hline \psi & \Rightarrow & \chi \\ \hline \varphi & \Rightarrow & \chi \end{array}$$

$$\begin{array}{cccc} [{\sf RESOLUTION}] & (\varphi & \vee & \psi) \\ \hline & (\neg \psi & \vee & \chi) \\ \hline & (\varphi & \vee & \chi) \\ \hline \end{array}$$

Resolution, at last

Logic
The Early Days
DPLL
Resolution
John Alan Robinson
Argonne
1962-1963
and then came light!
The Resolution
Principle
Resolution, at last
Unification
Another Example
The upshot
Literal Unification
Occurs Check
Most General Unifier
Unification - Example
Propositional
Resolution
The algorithm
Tautology Elimination
First-Order Resolution
Resolution Method
Soundness and
Completeness
Subsumption

Unification

Logic

The Early Days

DPLL

Resolution

John Alan Robinson

Argonne

1962-1963

... and then came

light!

The Resolution

Principle

Resolution, at last

○ Unification

Another Example

The upshot

Literal Unification

Occurs Check

Most General Unifier

Unification - Example

Propositional

Resolution

The algorithm

Tautology Elimination

First-Order

Resolution

Resolution Method

Soundness and

Completeness

Subsumption

Historical References

[RESOLUTION] $(\varphi \lor \psi)$ $\frac{(\neg \psi' \lor \chi)}{(\varphi \lor \psi)\sigma}$

where $\sigma = \text{unifier}(\psi, \psi')$

Example:

- 1. $\neg Rich(x) \lor Happy(x)$
- 2. Rich(Bill)
- $3. \quad Happy(Bill)$

 $[RES, 1, 2, Bill \backslash x]$

Another Example

```
1. F(x,y)
 2. \neg F(z, f_1(w, z)) \vee \neg F(f_1(w, z), f_1(w, z)) \vee G(w, z)
 3. \neg F(t, f_1(u, t)) \lor \neg F(f_1(u, t), f_1(u, t)) \lor \neg G(u, f_1(u, t)) \lor \neg G(f_1(u, t), f_1(u, t))
 4. \neg F(f_1(w,z), f_1(w,z)) \lor G(w,z)
       [Res, 1, 2, z \backslash x, f_1(w, z) \backslash y]
 5. G(w,z)
       [Res, 1, 5, z \backslash x, f_1(w, z) \backslash y]
 6. \neg F(f_1(w,z), f_1(w,z)) \lor \neg G(w, f_1(w,z)) \lor \neg G(f_1(x,y), f_1(x,y))
       [Res, 1, 3, z \backslash x, f_1(w, z) \backslash y]
 7. \neg G(t, f_1(u,t)) \lor \neg G(f_1(u,t), f_1(u,t))
       [Res, 1, 6, t \backslash x, f_1(u, t) \backslash y]
 8. \neg G(t, f_1(u,t)) \lor \neg G(f_1(u,t), f_1(u,t))
       [Res, 1, 7, t \backslash x, f_1(u, t) \backslash y]
 9. \neg G(f_1(u,t), f_1(u,t))
       [Res, 8, 5, t \backslash w, f_1(u, t) \backslash z]
10.
       [Res, 9, 5, f_1(u, t) \backslash w, f_1(u, t) \backslash z]
```

The upshot

Logic The Early Days **DPLL** Resolution John Alan Robinson Argonne 1962-1963 ... and then came light! The Resolution Principle Resolution, at last Unification Another Example > The upshot Literal Unification Occurs Check Most General Unifier Unification - Example Propositional Resolution The algorithm Tautology Elimination First-Order Resolution Resolution Method Soundness and Completeness Subsumption

- □ Argonne was then the world champion in theorem-proving!
 □ Refinements were mostly introduced by Robinson and Wos.
- □ From 1967 till 1970, Robinson publishes around 90 papers on theorem-proving.

Literal Unification

Lo	gic

The Early Days

DPLL

- Resolution

 John Alan Robinson
- Argonne
- 1962-1963 ... and then came
- light!
- The Resolution Principle
- Resolution, at last
- Unification
- Another Example
- The upshot
- Occurs Check
- Most General Unifier
- Unification Example
- Propositional
- Resolution
- The algorithm
- Tautology Elimination
- First-Order
- Resolution
- Resolution Method
- Soundness and
- Completeness
- Historical References
- Subsumption

- Let φ be a literal. We denote by φ^i the symbol at the i-th position of φ . If $i > |\varphi|$, then φ^i is undefined.
- Let φ and ψ be literals with $\varphi \neq \psi$. Let i be the least number such that both φ^i and ψ^i are defined and such that $\varphi^i \neq \psi^i$. The pair (φ^i, ψ^i) is called the *disagreement pair* of φ and ψ .

Example:

$$\varphi = P(g_1(c), f_1(a, g_1(x), g_2(a, g_1(b))))
\psi = P(g_1(c), f_1(a, g_1(x), g_2(f_2(x, y), z)))$$

Disagreement pair: $(a, f_2(x, y))$

Occurs Check

Lo	gi	C

The Early Days

DPLL

Resolution

John Alan Robinson

Argonne

1962-1963

... and then came light!

The Resolution

Principle Resolution, at last

Unification

Another Example

The upshot

Literal Unification

Occurs Check

Most General Unifier

Unification - Example

Propositional Resolution

The algorithm

Tautology Elimination

First-Order

Resolution

Resolution Method

Soundness and

Completeness

Subsumption

Historical References

 \square A substitution $[t \setminus x]$ satisfies the occurs check iff x does not occur in t.

 \square A disagreement pair D=(x,t) satisfies the occurs check if the variable x does not occur in t.

Examples:

$$\varphi = P(a, x, f(g(y)))
\psi = P(z, h(z, w), f(w))$$

D = (a, z) satisfies the occurs check.

$$\varphi = P(z, h(z, w), f(w))
\psi = P(f(z), h(z, w), f(w))$$

D = (z, f(z)) does not satisfy the occurs check.

Most General Unifier

```
Logic
The Early Days
DPLL
Resolution
John Alan Robinson
Argonne
1962-1963
... and then came
light!
The Resolution
Principle
Resolution, at last
Unification
Another Example
The upshot
Literal Unification
Occurs Check
  Most General
○ Unifier
Unification - Example
Propositional
Resolution
The algorithm
Tautology Elimination
First-Order
Resolution
Resolution Method
Soundness and
Completeness
```

```
Input: a pair of expressions \chi_1 and \chi_2.

Output: m.u.g. \sigma, if \chi_1 and \chi_2 are unifiable; "no", otherwise. \sigma \leftarrow \emptyset; W \leftarrow \{\chi_1, \chi_2\}; D \leftarrow is the disagreement pair of W; while |W| > 1 and D satisfies the occurs check: select a variable x and a term t in D (x does not occur in t) \sigma \leftarrow \sigma \circ \{t \setminus x\} W = \{\chi_1, \chi_2\} \leftarrow \{\chi_1[t \setminus x], \chi_2[t \setminus x]\} D \leftarrow \text{disagreement pair of } W end while if |W| = 1 then return \sigma else return "no"
```

Historical References

Subsumption

ட	ogic
_	- 6

The Early Days

DPLL

Resolution

John Alan Robinson

Argonne

1962-1963

... and then came

light!

The Resolution

Principle

Resolution, at last

Unification

Another Example

The upshot

Literal Unification

Occurs Check

Most General Unifier

Unification -

Example

Propositional

Resolution

The algorithm

Tautology Elimination

First-Order

Resolution

Resolution Method

Soundness and

Completeness

Subsumption

Historical References

 $\chi_1 = P(a, x, f(y)) \in \chi_2 = P(u, v, w)$

Logic

The Early Days

DPLL

Resolution

John Alan Robinson

Argonne

1962-1963

... and then came

light!

The Resolution

Principle

Resolution, at last

Unification

Another Example

The upshot

Literal Unification

Occurs Check

Most General Unifier

Unification -

Example

Propositional

Resolution

The algorithm

Tautology Elimination

First-Order

Resolution

Resolution Method

Soundness and

Completeness

C. Nalon

Subsumption

Historical References

 $\chi_1 = P(a, x, f(y)) \in \chi_2 = P(u, v, w)$ $\sigma \leftarrow \emptyset$; $W \leftarrow \{P(a, x, f(y)), P(u, v, w)\}$; $D \leftarrow (a, u)$

Logic

The Early Days

DPLL

Resolution

John Alan Robinson

Argonne

1962-1963

... and then came

light!

The Resolution

Principle

Resolution, at last

Unification

Another Example

The upshot

Literal Unification

Occurs Check

Most General Unifier

Unification -

Example

Propositional

Resolution

The algorithm

Tautology Elimination

First-Order

Resolution

Resolution Method

Soundness and

Completeness

Subsumption

Historical References

 $\chi_1 = P(a,x,f(y)) \text{ e } \chi_2 = P(u,v,w)$ $\sigma \leftarrow \emptyset; \ W \leftarrow \{P(a,x,f(y)),P(u,v,w)\}; \ D \leftarrow (a,u)$ |W| > 1 and D satisfies the occurs check

Logic

The Early Days

DPLL

Resolution

John Alan Robinson

Argonne

1962-1963

... and then came

light!

The Resolution

Principle

Resolution, at last

Unification

Another Example

The upshot

Literal Unification

Occurs Check

Most General Unifier

Unification -

Example

Propositional

Resolution

The algorithm

Tautology Elimination

First-Order

Resolution

Resolution Method

Soundness and

Completeness

C. Nalon

Subsumption

Historical References

 $\chi_1 = P(a, x, f(y)) \in \chi_2 = P(u, v, w)$ $\sigma \leftarrow \emptyset$; $W \leftarrow \{P(a, x, f(y)), P(u, v, w)\}$; $D \leftarrow (a, u)$ |W| > 1 and D satisfies the occurs check $\sigma \leftarrow \emptyset \circ \{a \backslash u\} = \{a \backslash u\}$

Logic

The Early Days

DPLL

Resolution

John Alan Robinson

Argonne

1962-1963

... and then came

light!

The Resolution

Principle

Resolution, at last

Unification

Another Example

The upshot

Literal Unification

Occurs Check

Most General Unifier

Unification -

Propositional

Resolution

The algorithm

Tautology Elimination

First-Order

Resolution

Resolution Method

Soundness and

Completeness

Subsumption

Historical References

$$\begin{split} \chi_1 &= P(a,x,f(y)) \text{ e } \chi_2 = P(u,v,w) \\ \sigma &\leftarrow \emptyset; \ W \leftarrow \{P(a,x,f(y)),P(u,v,w)\}; \ D \leftarrow (a,u) \\ &|W| > 1 \text{ and } D \text{ satisfies the occurs check} \\ &\sigma \leftarrow \emptyset \circ \{a \backslash u\} = \{a \backslash u\} \\ &W \leftarrow \{P(a,x,f(y))[a \backslash u],P(u,v,w)[a \backslash u]\} \end{split}$$

Logic

The Early Days

DPLL

Resolution

John Alan Robinson

Argonne

1962-1963

... and then came

light!

The Resolution

Principle

Resolution, at last

Unification

Another Example

The upshot

Literal Unification

Occurs Check

Most General Unifier

Unification -

Propositional

Resolution

The algorithm

Tautology Elimination

First-Order

Resolution

Resolution Method

Soundness and

Completeness

C. Nalon

Subsumption

Historical References

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Logic

The Early Days

DPLL

Resolution

John Alan Robinson

Argonne

1962-1963

... and then came

light!

The Resolution

Principle

Resolution, at last

Unification

Another Example

The upshot

Literal Unification

Occurs Check

Most General Unifier

Unification -

Propositional

Resolution

The algorithm

Tautology Elimination

First-Order

Resolution

Resolution Method

Soundness and

Completeness

Subsumption

Historical References

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Logic

The Early Days

DPLL

Resolution

John Alan Robinson

Argonne

1962-1963

... and then came

light!

The Resolution

Principle

Resolution, at last

Unification

Another Example

The upshot

Literal Unification

Occurs Check

Most General Unifier

Unification -

Propositional

Resolution

The algorithm

Tautology Elimination

First-Order

Resolution

Resolution Method

Soundness and

Completeness

Subsumption

Historical References

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Logic

The Early Days

DPLL

Resolution

John Alan Robinson

Argonne

1962-1963

... and then came

light!

The Resolution

Principle

Resolution, at last

Unification

Another Example

The upshot

Literal Unification

Occurs Check

Most General Unifier

Unification -

Propositional

Resolution

The algorithm

Tautology Elimination

First-Order

Resolution

Resolution Method

Soundness and

Completeness

Subsumption

Historical References

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Logic

The Early Days

DPLL

Resolution

John Alan Robinson

Argonne

1962-1963

... and then came

light!

The Resolution

Principle

Resolution, at last

Unification

Another Example

The upshot

Literal Unification

Occurs Check

Most General Unifier

Unification -

Propositional

Resolution

The algorithm

Tautology Elimination

First-Order

Resolution

Resolution Method

Soundness and

Completeness

Subsumption

C. Nalon

Historical References

$$\begin{split} \chi_1 &= P(a,x,f(y)) \text{ e } \chi_2 = P(u,v,w) \\ \sigma &\leftarrow \emptyset; \ W \leftarrow \{P(a,x,f(y)),P(u,v,w)\}; \ D \leftarrow (a,u) \\ &|W| > 1 \text{ and } D \text{ satisfies the occurs check} \\ \sigma &\leftarrow \emptyset \circ \{a \backslash u\} = \{a \backslash u\} \\ &W \leftarrow \{P(a,x,f(y))[a \backslash u],P(u,v,w)[a \backslash u]\} \\ &W = \{P(a,x,f(y)),P(a,v,w)\}, \ D \leftarrow (x,v) \\ &|W| > 1 \text{ and } D \text{ satisfies the occurs check} \\ &\sigma \leftarrow \{a \backslash u\} \circ \{v \backslash x\} = \{a \backslash u,v \backslash x\} \\ &W \leftarrow \{P(a,x,f(y))[v \backslash x],P(a,v,w)[v \backslash x]\} \\ &W = \{P(a,v,f(y)),P(a,v,w)\}, \ D \leftarrow (f(y),w) \end{split}$$

Logic

The Early Days

DPLL

Resolution

John Alan Robinson

Argonne

1962-1963

... and then came

light!

The Resolution

Principle

Resolution, at last

Unification

Another Example

The upshot

Literal Unification

Occurs Check

Most General Unifier

Unification -

▷ Example

Propositional

Resolution

The algorithm

Tautology Elimination

First-Order

Resolution

Resolution Method

Soundness and

Completeness

Subsumption

Historical References

$$\begin{split} \chi_1 &= P(a,x,f(y)) \text{ e } \chi_2 = P(u,v,w) \\ \sigma &\leftarrow \emptyset; \ W \leftarrow \{P(a,x,f(y)),P(u,v,w)\}; \ D \leftarrow (a,u) \\ &|W| > 1 \text{ and } D \text{ satisfies the occurs check} \\ \sigma &\leftarrow \emptyset \circ \{a \backslash u\} = \{a \backslash u\} \\ W \leftarrow \{P(a,x,f(y))[a \backslash u],P(u,v,w)[a \backslash u]\} \\ W &= \{P(a,x,f(y)),P(a,v,w)\}, \ D \leftarrow (x,v) \\ &|W| > 1 \text{ and } D \text{ satisfies the occurs check} \\ \sigma &\leftarrow \{a \backslash u\} \circ \{v \backslash x\} = \{a \backslash u,v \backslash x\} \\ W &\leftarrow \{P(a,x,f(y))[v \backslash x],P(a,v,w)[v \backslash x]\} \\ W &= \{P(a,v,f(y)),P(a,v,w)\}, \ D \leftarrow (f(y),w) \\ &|W| > 1 \text{ and } D \text{ satisfies the occurs check} \end{split}$$

Logic

Soundness and

Completeness

Subsumption

Historical References

The Early Days **DPLL** Resolution John Alan Robinson Argonne 1962-1963 ... and then came light! The Resolution Principle Resolution, at last Unification Another Example The upshot Literal Unification Occurs Check Most General Unifier Unification -**Example** Propositional Resolution The algorithm Tautology Elimination First-Order Resolution Resolution Method

 $\chi_1 = P(a, x, f(y)) \text{ e } \chi_2 = P(u, v, w)$ $\sigma \leftarrow \emptyset$; $W \leftarrow \{P(a, x, f(y)), P(u, v, w)\}$; $D \leftarrow (a, u)$ |W| > 1 and D satisfies the occurs check $\sigma \leftarrow \emptyset \circ \{a \setminus u\} = \{a \setminus u\}$ $W \leftarrow \{P(a, x, f(y))[a \setminus u], P(u, v, w)[a \setminus u]\}$ $W = \{P(a, x, f(y)), P(a, v, w)\}, D \leftarrow (x, v)$ |W|>1 and D satisfies the occurs check $\sigma \leftarrow \{a \setminus u\} \circ \{v \setminus x\} = \{a \setminus u, v \setminus x\}$ $W \leftarrow \{P(a, x, f(y))[v \setminus x], P(a, v, w)[v \setminus x]\}$ $W = \{P(a, v, f(y)), P(a, v, w)\}, D \leftarrow (f(y), w)$ |W|>1 and D satisfies the occurs check $\sigma \leftarrow \{a \setminus u, v \setminus x\} \circ \{f(y) \setminus w\} = \{a \setminus u, v \setminus x, f(y) \setminus w\}$

Logic

The Early Days

DPLL

Resolution

John Alan Robinson

Argonne

1962-1963

... and then came

light!

The Resolution

Principle

Resolution, at last

Unification

Another Example

The upshot

Literal Unification

Occurs Check

Most General Unifier

Unification -

Propositional

Resolution

The algorithm

Tautology Elimination

First-Order

Resolution

Resolution Method

Soundness and

Completeness

Subsumption

Historical References

 $\chi_1 = P(a, x, f(y)) \text{ e } \chi_2 = P(u, v, w)$ $\sigma \leftarrow \emptyset$; $W \leftarrow \{P(a, x, f(y)), P(u, v, w)\}$; $D \leftarrow (a, u)$ |W| > 1 and D satisfies the occurs check $\sigma \leftarrow \emptyset \circ \{a \setminus u\} = \{a \setminus u\}$ $W \leftarrow \{P(a, x, f(y))[a \setminus u], P(u, v, w)[a \setminus u]\}$ $W = \{P(a, x, f(y)), P(a, v, w)\}, D \leftarrow (x, v)$ |W|>1 and D satisfies the occurs check $\sigma \leftarrow \{a \setminus u\} \circ \{v \setminus x\} = \{a \setminus u, v \setminus x\}$ $W \leftarrow \{P(a, x, f(y))[v \setminus x], P(a, v, w)[v \setminus x]\}$ $W = \{P(a, v, f(y)), P(a, v, w)\}, D \leftarrow (f(y), w)$ |W|>1 and D satisfies the occurs check $\sigma \leftarrow \{a \setminus u, v \setminus x\} \circ \{f(y) \setminus w\} = \{a \setminus u, v \setminus x, f(y) \setminus w\}$ $W \leftarrow \{P(a, v, f(y))[f(y) \setminus w], P(a, v, w)[f(y) \setminus w]\}$

Unification - Example

Logic

The Early Days

DPLL

Resolution

John Alan Robinson

Argonne

1962-1963

... and then came

light!

The Resolution

Principle

Resolution, at last

Unification

Another Example

The upshot

Literal Unification

Occurs Check

Most General Unifier

Unification -

Example

Propositional

Resolution

The algorithm

Tautology Elimination

First-Order

Resolution

Resolution Method

Soundness and

Completeness

Subsumption

Historical References

 $\chi_1 = P(a, x, f(y)) \text{ e } \chi_2 = P(u, v, w)$ $\sigma \leftarrow \emptyset$; $W \leftarrow \{P(a, x, f(y)), P(u, v, w)\}$; $D \leftarrow (a, u)$ |W| > 1 and D satisfies the occurs check $\sigma \leftarrow \emptyset \circ \{a \setminus u\} = \{a \setminus u\}$ $W \leftarrow \{P(a, x, f(y))[a \setminus u], P(u, v, w)[a \setminus u]\}$ $W = \{P(a, x, f(y)), P(a, v, w)\}, D \leftarrow (x, v)$ |W|>1 and D satisfies the occurs check $\sigma \leftarrow \{a \setminus u\} \circ \{v \setminus x\} = \{a \setminus u, v \setminus x\}$ $W \leftarrow \{P(a, x, f(y))[v \setminus x], P(a, v, w)[v \setminus x]\}$ $W = \{P(a, v, f(y)), P(a, v, w)\}, D \leftarrow (f(y), w)$ |W|>1 and D satisfies the occurs check $\sigma \leftarrow \{a \setminus u, v \setminus x\} \circ \{f(y) \setminus w\} = \{a \setminus u, v \setminus x, f(y) \setminus w\}$ $W \leftarrow \{P(a, v, f(y))[f(y)\backslash w], P(a, v, w)[f(y)\backslash w]\}$ $W = \{P(a, v, f(y))\}; D \text{ is undefined};$

Unification - Example

Logic

The Early Days

DPLL

Resolution

John Alan Robinson

Argonne

1962-1963

... and then came

light!

The Resolution

Principle

Resolution, at last

Unification

Another Example

The upshot

Literal Unification

Occurs Check

Most General Unifier

Unification -

Propositional

Resolution

The algorithm

Tautology Elimination

First-Order

Resolution

Resolution Method

Soundness and

Completeness

Subsumption

Historical References

 $\chi_1 = P(a, x, f(y)) \text{ e } \chi_2 = P(u, v, w)$ $\sigma \leftarrow \emptyset$; $W \leftarrow \{P(a, x, f(y)), P(u, v, w)\}$; $D \leftarrow (a, u)$ |W| > 1 and D satisfies the occurs check $\sigma \leftarrow \emptyset \circ \{a \setminus u\} = \{a \setminus u\}$ $W \leftarrow \{P(a, x, f(y))[a \setminus u], P(u, v, w)[a \setminus u]\}$ $W = \{P(a, x, f(y)), P(a, v, w)\}, D \leftarrow (x, v)$ |W|>1 and D satisfies the occurs check $\sigma \leftarrow \{a \setminus u\} \circ \{v \setminus x\} = \{a \setminus u, v \setminus x\}$ $W \leftarrow \{P(a, x, f(y))[v \setminus x], P(a, v, w)[v \setminus x]\}$ $W = \{P(a, v, f(y)), P(a, v, w)\}, D \leftarrow (f(y), w)$ |W|>1 and D satisfies the occurs check $\sigma \leftarrow \{a \setminus u, v \setminus x\} \circ \{f(y) \setminus w\} = \{a \setminus u, v \setminus x, f(y) \setminus w\}$ $W \leftarrow \{P(a, v, f(y))[f(y) \setminus w], P(a, v, w)[f(y) \setminus w]\}$ $W = \{P(a, v, f(y))\}; D \text{ is undefined};$ |W|=1, returns $\sigma=\{a\backslash u,v\backslash x,f(y)\backslash w\}$

Propositional Resolution

Logic The Early Days **DPLL** Resolution John Alan Robinson Argonne 1962-1963 ... and then came light! The Resolution Principle Resolution, at last Unification Another Example The upshot Literal Unification Occurs Check Most General Unifier Unification - Example **Propositional** Resolution The algorithm Tautology Elimination First-Order Resolution Resolution Method Soundness and Completeness Subsumption

The method proposed by Robinson in [Rob65b].

- \square There are no axioms.
- ☐ There is only one inference rule:

$$\begin{array}{cccc} [\mathsf{RESOLUTION}] & (\varphi & \vee & l) \\ & & (\psi & \vee & \neg l) \\ \hline & (\varphi & \vee & \psi) \\ \hline \end{array}$$

- \square Premises are called parent clauses (or the resolvends).
- ☐ The conclusion is called the resolvent.
- \Box The literals l and $\neg l$ are known as complementary literals.
- The parent clauses are resolved on the the complementary literals, generating the resolvent.

Historical References

The algorithm

Logic

The Early Days

DPLL

Resolution

John Alan Robinson

Argonne

1962-1963

... and then came

light!

The Resolution

Principle

Resolution, at last

Unification

Another Example

The upshot

Literal Unification

Occurs Check

Most General Unifier

Unification - Example

Propositional

Resolution

> The algorithm

Tautology Elimination

First-Order

Resolution

Resolution Method

Soundness and

Completeness

Subsumption

Historical References

Let φ be a propositional formula and Γ_0 be the set of clauses resulting from the transformation of φ into CNF.

do set $\Gamma = \Gamma_0$

select $l, c_1 \in \Gamma, c_2 \in \Gamma$ such that

compute the resolvent rreplace Γ_0 by $\Gamma_0 \cup \{r\}$

until

 $\square \in \Gamma_0$ or $\Gamma_0 = \Gamma$

 $\left\{egin{array}{ll} l \in c_1,
egliv l \in c_2, \ c_1 & ext{and} & c_2 & ext{have} \ ext{not been resolved} \end{array}
ight\}$

Note that the algorithm is non-deterministic.

Tautology Elimination

```
Logic
The Early Days
DPLL
Resolution
John Alan Robinson
Argonne
1962-1963
... and then came
light!
The Resolution
Principle
Resolution, at last
Unification
Another Example
The upshot
Literal Unification
```

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1: Let \Gamma_i = \Gamma_0

2: repeat

3: Select c_1 e c_2 \in \Gamma_i such that l \in c_1, \neg l \in c_2, where l is a literal and c_1 and c_2 have not been resolved

4: Compute the resolvent r

5: if \operatorname{not}((r \text{ a tautology}) \text{ or } (r \in \Gamma_i)) then

6: Do \Gamma_{i+1} = \Gamma_i \cup \{r\}

7: end if

8: until \square \in \Gamma_0 or \Gamma_{i+1} = \Gamma_i
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Subsumption
Historical References

Resolution Method Soundness and Completeness

Occurs Check

Propositional
Resolution
The algorithm
Tautology
Elimination
First-Order
Resolution

Most General Unifier Unification - Example

First-Order Resolution

Logic

The Early Days

DPLL

Resolution

John Alan Robinson

Argonne

1962-1963

... and then came

light!

The Resolution Principle

Resolution, at last

Unification

Another Example

The upshot

Literal Unification

Occurs Check

Most General Unifier

Unification - Example

Propositional

Resolution

The algorithm

Tautology Elimination

First-Order

Resolution

Resolution Method

Soundness and

Completeness

Subsumption

Historical References

There are two inference rules:

$$\begin{array}{cccc}
D & \vee & L_1 \\
D' & \vee & \neg L_2 \\
\hline
(D & \vee & D') & \sigma
\end{array}$$

where σ is the most general unifier for L_1 and L_2 .

And we also need factoring:

Let $C \stackrel{\mathsf{def}}{=} L_1 \vee \ldots \vee L_n$ be a clause and σ the most general unifier for a subset of C. Then, $C\sigma$ is the factor of C and is added to the set of clauses.

Resolution Method

Logic
The Early Days
DPLL
Resolution
John Alan Robinson
Argonne
1962-1963
and then came
light!
The Resolution
Principle
Resolution, at last Unification
Another Example
The upshot Literal Unification
Occurs Check
Most General Unifier
Unification - Example
Propositional Resolution
The algorithm
Tautology Elimination
First-Order
Resolution
Resolution Method
Soundness and
Completeness

- 1. Let Γ_i be a set of clauses;
- 2. Choose clauses C_1 and C_2 with complementary literals in Γ_i ;
- 3. Compute the resolvent R from C_1 and C_2 , applying factoring;
- 4. If R is the empty clause, then stop and return "unsatisfiable";
- 5. Otherwise, $N_{i+1} \leftarrow N_i \cup \{R\}$;
- 6. If $N_{i+1} = N_i$, then stop and return "satisfiable";
- 7. Otherwise, go back to step 2.

Historical References

Subsumption

Soundness and Completeness

_02	

The Early Days

DPLL

Resolution

John Alan Robinson

Argonne

1962-1963

... and then came

light!

The Resolution

Principle

Resolution, at last

Unification

Another Example

The upshot

Literal Unification

Occurs Check

Most General Unifier

Unification - Example

Propositional

Resolution

The algorithm

Tautology Elimination

First-Order

Resolution

Resolution Method

Soundness and

· completene.

Subsumption

Historical References

1. Resolution for first-order is strongly sound:

if
$$\Gamma \vdash^{Res}_{\mathcal{L}_{fo}} \varphi$$
, then $\Gamma \models_{\mathcal{L}_{fo}} \varphi$

2. Resolution for first-order is refutationally complete:

if
$$\Gamma \models_{\mathcal{L}_{fo}} \bot$$
, then $\Gamma \vdash_{\mathcal{L}_{fo}}^{Res} \bot$

Soundness and Completeness

_0	gic

The Early Days

DPLL

Resolution

John Alan Robinson Argonne

1962-1963

... and then came light!

The Resolution Principle

Resolution, at last

Unification

Another Example

The upshot

Literal Unification

Occurs Check

Most General Unifier

Unification - Example

Propositional

Resolution

The algorithm

Tautology Elimination

First-Order

Resolution

Resolution Method

Soundness and

Completeness

Subsumption

Historical References

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Resolution for first-order is refutationally complete:

if
$$\Gamma \models_{\mathcal{L}_{fo}} \bot$$
, then $\Gamma \vdash_{\mathcal{L}_{fo}}^{Res} \bot$

Binary resolution is also consequence complete:

Lemma 1 ([Lee67]). Let C be a set of propositional clauses. If a clause Dis a consequence of C, then there is a clause D' which is derived by binary propositional resolution from C and D' subsumes D.

Subsumption

Logic

The Early Days

DPLL

John Alan Robinson

Argonne

1962-1963

... and then came

light!

The Resolution

Principle

Resolution, at last

Unification

Another Example

The upshot

Literal Unification

Occurs Check

Most General Unifier

Unification - Example

Propositional

Resolution

The algorithm

Tautology Elimination

First-Order

Resolution

Resolution Method

Soundness and

Completeness

▷ Subsumption

Historical References

Lemma 2. Let Γ be a set of clauses such that clauses $C, C' \in \Gamma$ and $C \models C'$. Γ is unsatisfiable if, and only if, $\Gamma \setminus \{C'\}$ is unsatisfiable.

Obs.: If $C \models C'$, we say that C subsumes C'.

Historical References

Logic

The Early Days

DPLL

Resolution

John Alan Robinson

Argonne

1962-1963

... and then came

light!

The Resolution

Principle

Resolution, at last

Unification

Another Example

The upshot

Literal Unification

Occurs Check

Most General Unifier

Unification - Example

Propositional

Resolution

The algorithm

Tautology Elimination

First-Order

Resolution

Resolution Method

Soundness and

Completeness

Subsumption

Historical

▶ References

C. Nalon

The following is a list of historical accounts, some of which are given by people working in the early years of Automated Reasoning:

[Dav83], [Lov84], [BL84], [Bib07], and [Dav01]

Logic

The Early Days

DPLL

Resolution

▷ References

References

References

References

References

References

References

References

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