# Logical reasoning and programming First-order resolution

Karel Chvalovský

CIIRC CTU

### Our problem

Let  $\Gamma=\{\psi_1,\ldots,\psi_n\}$  be a set of senteces and  $\varphi$  be a sentence. We know that

$$\begin{split} \Gamma \models \varphi \\ & \text{iff} \\ \Gamma \cup \{\neg \varphi\} \text{ is unsatisfiable} \\ & \text{iff} \\ \forall \psi_1' \cup \cdots \cup \forall \psi_n' \cup \forall (\neg \varphi)' \text{ is unsatisfiable,} \\ & \text{where } \psi_1', \dots, \psi_n', (\neg \varphi)' \text{ are } \psi_1, \dots, \psi_n, \neg \varphi \text{ in CNF (=clauses) and} \\ & \forall \Delta = \{\forall \chi \mid \chi \in \Delta\} \text{ for a set of clauses } \Delta. \end{split}$$

We say that  $\Delta$  is a set of clauses assuming that it is implicitly universally quantified.

### Instances

#### Lemma

Let  $\varphi$  be a clause and  $\sigma$  be a substitution, then  $\forall \varphi \models \varphi \sigma$ .

We say that  $\varphi\sigma$  is an *instance* of  $\varphi$ . If an instance contains no variable, then we call it a *ground instance*.

#### Example

From  $\forall X \forall Y(p(X) \lor \neg q(X,Y))$ , for example, follows  $p(a) \lor \neg q(a,f(Z))$ .

# Herbrand models

We can restrict the types of interpretations that have to be considered. Let  $\Gamma$  be a set of clauses.

#### Herbrand universe

The Herbrand universe of  $\Gamma$ , denoted  $HU(\Gamma)$ , is the set of all ground terms in the language of  $\Gamma$ . If  $\Gamma$  contains no constant, we add a fresh constant c to the language.

### Herbrand base

The Herbrand base of  $\Gamma$ , denoted  $HB(\Gamma)$ , is the set of all ground atomic formulae in the language of  $\Gamma$ , where only terms from  $HU(\Gamma)$  are allowed.

### Herbrand interpretation

A Herbrand interpretation of  $\Gamma$  is a subset of  $HB(\Gamma)$ .

### Herbrand model

A Herbrand model  $\mathcal{M}$  of  $\Gamma$  is a Herbrand interpretation of  $\Gamma$  such that  $\mathcal{M} \models \Gamma$ .

# Herbrand's theorem

#### Theorem

Let  $\Gamma$  be a set of clauses. The following conditions are equivalent:

- 1.  $\Gamma$  is unsatisfiable,
- 2. the set of all ground instances of  $\Gamma$  is unsatisfiable,
- 3. a finite subset of the set of all ground instances of  $\Gamma$  is unsatisfiable.

Note that  $\Gamma$  has a model, if it has a Herbrand model.

Herbrand's theorem provides a propositional criterion for unsatisfiability of a set of clauses  $\Gamma$ , because a ground atomic formula can be seen as a propositional atom.

Several early approaches (Gilmore; David and Putnam in 1960) work as follows—generate ground instances and use propositional resolution. If you fail, then produce more instances and repeat.

However, such an approach is generally very inefficient (but it works for ASP).

# Lifting lemma

A technique to prove completeness theorems for the non-ground case using completeness for a ground instance.

For example, we have clauses

 $\{q(Y,f(X)),p(X,a)\} \text{ and } \{\neg p(U,V),r(U,V)\}.$ 

We want to represent infinitely many ground instances and possible resolution steps by a single non-ground instance.

$$\frac{\{q(Y, f(X), p(X, a)\} \{\neg p(U, V), r(U, V)\}}{\{q(Y, f(X)), r(X, a)\}}$$

Use unification!

# Unifiers

Let s and t be terms. A *unifier* of s and t is a substitution  $\sigma$  such that  $s\sigma$  and  $t\sigma$  are identical  $(s\sigma = t\sigma)$ .

A unifier  $\sigma$  of s and t is said to be a most general unifier (or mgu for short), denoted  $\sigma = mgu(s,t)$ , if for any unifier  $\theta$  of s and t there is a substitution  $\eta$  such that  $\theta = \sigma \eta$  that is  $\theta$  is a composition of  $\sigma$  and  $\eta$ .

We can easily extend our definitions to

- a (most general) unifier of a set of terms,
- a (most general) unifier of two formulae,
- a (most general) unifier of a set of formulae.

### Unification algorithm

A set of equations  $\{X_1 \doteq t_1, \ldots, X_n \doteq t_n\}$  is said to be in *solved* form if  $X_1, \ldots, X_n$  are distinct variables that do not appear in terms  $t_1, \ldots, t_n$ .

Given a finite set of pairs of terms  $T = \{s_1 \doteq t_1, \ldots, s_n \doteq t_n\}$ . The following algorithm either produces a set of equations in solved form that defines an mgu  $\sigma$  such that  $s_i \sigma = t_i \sigma$ , for  $1 \le i \le n$ , or it fails. If it fails, then there is no unifier for the set.

$$\begin{array}{l} S \cup \{ u \doteq u \} \rightsquigarrow S, \\ S \cup \{ f(u_1, \dots, u_k) \doteq f(v_1, \dots, v_k) \} \rightsquigarrow \\ S \cup \{ f(u_1, \dots, u_k) \doteq f(v_1, \dots, v_k) \} \rightsquigarrow \\ S \cup \{ f(u_1, \dots, u_k) \doteq g(v_1, \dots, v_l) \} \rightsquigarrow \\ \text{fail, if } f \neq g \text{ or } k \neq l, \\ S \cup \{ f(u_1, \dots, u_k) \doteq X \} \rightsquigarrow S \cup \{ X \doteq f(u_1, \dots, u_k) \}, \\ S \cup \{ X \doteq u \} \rightsquigarrow S \{ X \mapsto u \} \cup \{ X \doteq u \}, \text{ if } X \notin u \text{ and } X \in S, \\ S \cup \{ X \doteq u \} \rightsquigarrow \\ \text{fail, if } X \in u, \end{array}$$

where  $u, u_j, v_j$  are terms and S is a finite set of pairs of terms. Moreover,  $S\{X \mapsto u\}$  means that we substitute a term u for all occurrences of a variable X in S.

# Properties of the unification algorithm

### Termination

The algorithm always terminates. Assume the following triplet

- 1. the number of distinct variables that occur more than once in  $\boldsymbol{S}$  ,
- 2. the number of function (and constant) symbols that occur on the left hand sides in  ${\cal S}$  ,
- 3. the number of pairs in S.

Clearly, under the lexicographic order, the triple decreases after an application of any rule.

### It produces an mgu

A routine induction proof on the number of steps of the algorithm proves that

- it finds an mgu, if there is a unifier of the set,
- it fails, if there is no unifier of the set.

### Resolution

Let  $l_1, \ldots, l_m, l_{m+1}, \ldots, l_{m+n}$  be literals and p and q be atomic formulae.

$$\frac{\{l_1, \dots, l_m, p\}}{\{l_1, \dots, l_m, l_{m+1}, \dots, l_{m+n}\}\sigma}$$

where  $\sigma = mgu(p,q)$  and  $\{l_1, \ldots, l_m, l_{m+1}, \ldots, l_{m+n}\}\sigma$  is equal to  $\{l_1\sigma, \ldots, l_m\sigma, l_{m+1}\sigma, \ldots, l_{m+n}\sigma\}$ . The clause  $\{l_1, \ldots, l_m, l_{m+1}, \ldots, l_{m+n}\}\sigma$  produced by the (binary) resolution rule is called the *resolvent* of the two *input* clauses. We assume that the input clauses do not share variables (renaming away).

### Theorem (correctness)

$$\{l_1, \ldots, l_m, p\}, \{\neg q, l_{m+1}, \ldots, l_{m+n}\} \models \\ \{l_1, \ldots, l_m, l_{m+1}, \ldots, l_{m+n}\}\sigma, \text{ where } \sigma = mgu(p, q).$$

Hence the resolution rule preserves satisfiability.

# Factoring

We need to add the factoring rule. Let  $l_1, \ldots, l_m, l_{m+1}, l, k$  be literals.

$$\frac{\{l_1,\ldots,l_m,\boldsymbol{l},\boldsymbol{k}\}}{\{l_1,\ldots,l_m,\boldsymbol{l}\}\sigma}$$

where  $\sigma = mgu(l, k)$ . Note that l and k are either both positive, or both negative. Moreover,  $\{l_1, \ldots, l_m, l, k\} \models \{l_1, \ldots, l_m, l\}\sigma$ .

In propositional logic we avoided this problem completely by using sets as clauses.

### Example

Using only the binary resolution rule, we cannot derive  $\Box$  from clauses  $\{p(X), p(Y)\}$  and  $\{\neg p(U), \neg p(V)\}.$ 

# Resolution calculus

The resolution calculus has no axioms and the only deduction rules are the binary resolution rule and the factoring.

### Resolution proof

A (resolution) proof of clause  $\varphi$  from clauses  $\psi_1, \ldots, \psi_n$  is a finite sequence of clauses  $\chi_1, \ldots, \chi_m$  such that

- every  $\chi_i$  is
  - among  $\psi_1, \ldots, \psi_n$ , or
  - derived by the binary resolution rule from input clauses  $\chi_j$  and  $\chi_k$ , for  $1 \le j < k < i \le m$ , or
  - derived by the factoring rule from an input clause  $\chi_j$ , for  $1 \le j < i \le m$ .

 $\blacktriangleright \varphi = \chi_m.$ 

We say that a clause  $\varphi$  is *provable* (derivable) from a set of clauses  $\{\psi_1, \ldots, \psi_n\}$ , we write  $\{\psi_1, \ldots, \psi_n\} \vdash \varphi$ , if there is a proof of  $\varphi$  from  $\psi_1, \ldots, \psi_n$ .

# Resolution proof

Example

We prove  $\Box$  from a set of clauses

 $\{\{\neg p(X),q(X),r(X)\},\{p(a),p(b)\},\{\neg q(Y)\},\{\neg r(a)\},\{\neg r(b)\}\}.$ 



Strictly speaking the presented derivation is not a sequence, but it is easy to produce a sequence from it. For example,  $\{\neg p(X), r(X)\}$  is derived only once in the sequence.

Unlike in propositional logic, it is possible to resolve two clauses in multiple ways and still obtain useful resolvents.

### Example

From  $\{p(a),p(b)\}$  and  $\{\neg p(X),q(X)\}$  we can derive both  $\{p(b),q(b)\}$  and  $\{p(a),q(X)\}.$ 

# Completeness of resolution calculus

It is not true that we can derive every valid formula in the resolution calculus, e.g., from the empty set we derive nothing. However, it is so called *refutationally complete*.

### Theorem (completeness)

Let  $\Gamma$  be a set of clauses. If  $\Gamma$  is unsatisfiable, then  $\Gamma \vdash \Box$ .

Note that from the correctness theorem we already know the converse implication.

#### Theorem

Let  $\Gamma$  be a set of clauses. If  $\Gamma \vdash \Box$ , then  $\Gamma$  is unsatisfiable.

# Subsumption

A clause  $\varphi$  subsumes a clause  $\psi$ , denoted  $\varphi \sqsubseteq \psi$ , if there is a substitution  $\sigma$  such that  $\varphi \sigma \subseteq \psi$ .

```
If \varphi \sqsubseteq \psi, then \varphi \models \psi.
```

Let  $\Gamma$  and  $\Delta$  be sets of clauses. We write  $\Gamma \sqsubseteq \Delta$  if for every clause  $\psi \in \Delta$  exists a clause  $\varphi \in \Gamma$  such that  $\varphi \sqsubseteq \psi$ .

#### Lemma

```
If \Delta \vdash \Box and \Gamma \sqsubseteq \Delta, then \Gamma \vdash \Box and this proof is no longer than \Delta \vdash \Box.
```

#### Example

 $\begin{aligned} \{p(X)\} &\sqsubseteq \{p(f(a))\}, \ \{p(X)\} \sqsubseteq \{p(Y), q(Y)\}, \text{ and} \\ \{p(X), q(Y)\} &\sqsubseteq \{p(Z), q(Z)\}, \text{ but } \{p(Z), q(Z) \not\sqsubseteq \{p(X), q(Y)\}. \end{aligned}$ 

### Subsumption example

Assume we have the following resolution refutation

$$\frac{p(f(X)), q(X, Y), r(X) \qquad \neg p(f(f(c)))}{q(f(c), Y), r(f(c))} \qquad \neg q(U, V)$$

$$r(f(c)) \qquad \neg r(f(c))$$

Then after deriving  $\{p(Y),r(Z)\},$  we can simplify the previous proof into

$$\frac{p(Y), r(Z) \quad \neg p(f(f(c))))}{r(Z) \quad \neg r(f(c))}$$
  
thanks to  $\{p(Y), r(Z)\} \sqsubseteq \{p(f(X)), q(X, Y), r(X)\}.$ 

17 / 25

### Forward subsumption

If we derive a clause  $\psi$  and we already have a clause  $\varphi$  such that  $\varphi \sqsubseteq \psi$ , then we can remove  $\psi$ , because  $\varphi$  is stronger.

### Backward subsumption

If we derive a clause  $\varphi$  and we already have a clause  $\psi$  such that  $\varphi \sqsubseteq \psi$ , then we can remove  $\psi$ , because  $\varphi$  is stronger. We can remove all such  $\psi$ s.

We have already seen a saturated set in the propositional case—we systematically process a set of clauses in such a way that if there is no clause to be processed, then it is impossible to derive  $\Box$  from the original set. It is also called ANL loop.

The next slides are from the presentation by Stefan Schultz, the author of the E prover, at the SAT/SMT/AR Summer School 2018.



We represent the proof state S by two sets of clauses:

- P holds the processed clauses (originally empty)
- ► U holds the unprocessed clauses (originally all clauses in S)







 Aim: Move everything from U to P





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- Aim: Move everything from U to P
- Invariant: All generating inferences with premises from P have been performed





- Aim: Move everything from U to P
- Invariant: All generating inferences with premises from *P* have been performed
- Invariant: P is interreduced



- Aim: Move everything from U to P
- Invariant: All generating inferences with premises from P have been performed
- Invariant: P is interreduced
- Clauses added to U are simplified with respect to P

22 20 / 25

## The Given-Clause Loop in Fewer Words

```
while U \neq \{\}
  g = delete_best(U)
  g = simplify(g, P)
  if g == \Box
     SUCCESS, Proof found
  if g is not subsumed by any clause in P (or otherwise redundant w.r.t. P)
     P = P \setminus \{c \in P \mid c \text{ subsumed by (or otherwise redundant w.r.t.) } g\}
     T = \{c \in P \mid c \text{ can be simplified with } g\}
     P = (P \setminus T) \cup \{g\}
     T = T \cup \text{generate}(g, P)
     foreach c \in T
        c = \text{cheap}_{simplify}(c, P)
        if c is not trivial
           U = U \cup \{c\}
SUCCESS, original U is satisfiable
```

# Compare and Contrast



while  $U \neq \{\}$  $g = \text{delete\_best}(U)$ g = simplify(g, P)if  $q == \Box$ SUCCESS, Proof found if g is not redundant w.r.t. P  $P = P \setminus \{ c \in P \mid c \text{ redundant w.r.t. } g \}$  $T = \{ c \in P \mid c \text{ simplifiable with } g \}$  $P = (P \setminus T) \cup \{g\}$  $T = T \cup \text{generate}(q, P)$ foreach  $c \in T$  $c = \text{cheap}_{\text{simplify}}(c, P)$ if c is not trivial  $U = U \cup \{c\}$ SUCCESS, original U is satisfiable

# "You can't handle the truth!"



The TPTP (Thousands of Problems for Theorem Provers) is a library of test problems for ATP systems. The TSTP (Thousands of Solutions from Theorem Provers) is a library of solutions to TPTP problems.

#### Language

Prolog like language both for input (problems) and output (solutions). For details see TPTP and TSTP Quick Guide.

### **TPTP** example

fof(usa,axiom,( country(usa) )).

```
fof(country_big_city,axiom,( ! [C] : ( country(C)
          => ( big_city(capital_of(C))
          & beautiful(capital_of(C)) ) ))).
fof(usa_capital_axiom,axiom,( ? [C] : ( city(C)
          & C = capital_of(usa) ) )).
fof(crime_axiom,axiom,( ! [C] : ( big_city(C)
```

=> has\_crime(C) ) )).

# TPTP roles (official definitions)

- <u>axioms</u> are accepted, without proof. There is no guarantee that the axioms of a problem are consistent.
- hypothesiss are assumed to be true for a particular problem, and are used like <u>axiom</u>s.
- definitions are intended to define symbols. They are either universally quantified equations, or universally quantified equivalences with an atomic lefthand side. They can be treated like <u>axiom</u>s.
- assumptions can be used like axioms, but must be discharged before a derivation is complete.
- lemmas and theorems have been proven from the axioms. They can be used like axioms in problems, and a problem containing a non-redundant lemma or theorem is ill-formed. They can also appear in derivations. theorems are more important than lemmas from the user perspective.
- conjectures are to be proven from the <u>axiom</u>(-like) formulae. A problem is solved only when all conjectures are proven.
- negated\_conjectures are formed from negation of a conjecture (usually in a FOF to CNF conversion).
- plains have no specified user semantics.

Morever, there are  $\underline{fi}_{domain}$ ,  $\underline{fi}_{functors}$ ,  $\underline{fi}_{predicates}$ ,  $\underline{type}$ , and  $\underline{unknown}$  roles.

## System before TPTP

System before TPTP is an interface for preprocessing systems.

```
cnf(i_0_4,plain, ( capital_of(usa) = esk1_0 )).
cnf(i_0_1,plain, ( country(usa) )).
cnf(i_0_5,plain, ( city(esk1_0) )).
cnf(i_0_7,plain, ( city(X1) | ~ big_city(X1) )).
cnf(i_0_6,plain, ( has_crime(X1) | ~ big_city(X1) )).
cnf(i_0_3,plain,
```

( big\_city(capital\_of(X1)) | ~ country(X1) )). cnf(i\_0\_2,plain,

( beautiful(capital\_of(X1)) | ~ country(X1) )). cnf(i\_0\_8,negated\_conjecture,

( ~ beautiful(X1) | ~ city(X1) | ~ has\_crime(X1) )).

# System on TPTP

#### System on TPTP is an interface for solvers.

# Proof found!

# SZS status Theorem

# SZS output start CNFRefutation

fof(some\_beautiful crime, conjecture, ?[X1]:((city(X1)&beautiful(X1))&has crime(X1)), file('/tmp/SystemOn' fof(crime\_axiom, axiom, ![X1]:(big\_city(X1)=>has\_crime(X1)), file('/tmp/SystemOnTPTPFormReply111578/SOT\_m fof(country big city, axiom, ![X1]:(country(X1)=>(big city(capital of(X1))&beautiful(capital of(X1)))), f fof(usa\_capital\_axiom, axiom, ?[X1]:(city(X1)&X1=capital\_of(usa)), file('/tmp/SystemOnTPTPFormReply111578 fof(usa, axiom, country(usa), file('/tmp/SystemOnTPTPFormReply111578/SOT mQKyc4', usa)). fof(c 0 5, negated conjecture, ~(?[X1]:((citv(X1)&beautiful(X1))&has crime(X1))), inference(assume negati fof(c\_0\_6, negated\_conjecture, ![X6]:(~city(X6)|~beautiful(X6)|~has\_crime(X6)), inference(variable\_rename fof(c 0 7, plain, ![X4]:(~big\_city(X4)|has\_crime(X4)), inference(variable\_rename,[status(thm)],[inference fof(c 0 8, plain, ![X2]:((big\_city(capital\_of(X2))|~country(X2))&(beautiful(capital\_of(X2))|~country(X2)) fof(c 0 9. plain, (citv(esk1 0)&esk1 0=capital of(usa)), inference(skolemize,[status(esa)],[inference(var cnf(c 0 10, negated conjecture, (~city(X1)|~beautiful(X1)|~has\_crime(X1)), inference(split\_conjunct,[stat cnf(c 0 11, plain, (has crime(X1)|~big city(X1)), inference(split conjunct,[status(thm)],[c 0 7])). cnf(c 0 12, plain, (beautiful(capital of(X1)) | ~country(X1)), inference(split conjunct,[status(thm)],[c 0 ] cnf(c\_0\_13, plain, (esk1\_0=capital\_of(usa)), inference(split\_conjunct,[status(thm)],[c\_0\_9])). cnf(c 0 14, plain, (country(usa)), inference(split\_conjunct,[status(thm)],[usa])). cnf(c 0 15, plain, (big citv(capital of(X1))|~country(X1)), inference(split conjunct,[status(thm)],[c 0 8] cnf(c\_0\_16, negated\_conjecture, (~city(X1)|~beautiful(X1)|~big\_city(X1)), inference(spm,[status(thm)],[c\_ cnf(c 0 17, plain, (city(esk1 0)), inference(split conjunct,[status(thm)],[c 0 9])). cnf(c 0 18, plain, (beautiful(esk1 0)), inference(cn,[status(thm)],[inference(rw,[status(thm)],[inference cnf(c 0 19, plain, (big citv(esk1 0)), inference(cn,[status(thm)],[inference(rw,[status(thm)],[inference( cnf(c 0 20, negated conjecture, (\$false), inference(cn,[status(thm)],[inference(rw,[status(thm)],[inferen

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