Lecture 5

Herbrand Models, Unification, Resolution

Overview

Where are we with classical logic?

- Repitition of FOL, models, interpretation, satisfiability
- We learned a proof method called natural deduction
- We saw that it is hard to automatize... (completeness proof)

Today:

- Automated Theorem proving, Logic Programming
- Herbrand Interpretations & Herbrand Models
- An automatic proof method: Resolution
 - Transformation to clausal form
 - Substitutions
 - Unification
 - Resolution

Motivation: We want to build an automatic proof procedure...

- For proofing a goal *G* from a set of formula S in a special normal form called clausal form
- We will see, that we can do this by showing: $S \cup \{\neg G\}$ is unsatisfiable.
- Problem: remember, for doing this automatically, we would need to consider ALL possible interpretations
- Furthermore: If G or S are not in clausal form, we need to transform them to clausal form.

Automated theorem proving?

- Imagine a (set of) logical formula(e):
 - Program clauses:

 $\phi = father(Sepp, Hans) \land$

 $father(Hans, Karl) \land$

 $\forall x \forall y \forall z \ (grandpa(x,y) \leftarrow father(x,z) \land father(z,y))$

- Goal:

 $\psi = \exists x \ grandpa(sepp, x)$

- Finding a solution for the question
- "Who is Sepp's grandpa?" amounts to finding a proof for:

$$\phi \models \psi$$

But: Usual proof procedures do not return the substitutions, we need slight modifications.

Clauses

 Universally closed disjunctions of literals are called clauses:

 $\forall x_1 \dots \forall x_n (L_1 \lor \dots \lor L_m)$

(no other variables except x_1, \ldots, x_n occur!)

- Special notation for clauses: The clause $\forall x_1 \dots \forall x_n (A_1 \lor \dots \lor A_k \lor \neg B_1 \lor \dots \lor \neg B_l)$ (where A_i , B_j are atoms) is written: $A_1, \dots, A_k \leftarrow B_1, \dots, B_l$ head body
 - universal quantification is implicit in this notation
 - "," in the head stands for disjunction
 - "," in the body stands for conjunction

We will deal a lot with formulae in clausal form!

Clauses and Logic Programming:

- Clauses with exactly one positive literal (i.e. one head literal) are called definite clauses.
- Clauses with at most one positive literal (i.e. at most one head literal) are called **Horn clauses**.
- A logic program is a set of clauses.
- A **Horn program** (or definite logic program) is a program which consists only of Horn clauses (or only definite clauses).
- A clause with an empty body

 $A \leftarrow$

is also called **unit clause** (or **fact**).

A clause with an empty head (this is also a Horn clause, but not definite!)

$$\leftarrow B_l, \ \dots, \ B_n$$

is also called **goal** (sometimes also "constraint", or "query").

• The empty clause, written \emptyset , stands for contradiction.

Logic Programming, what is this?

- Basically based on Kowalsky, Colmerauer, 1972:
- "Logic can be used as a programming Language" by interpreting clauses of the form

$$\mathsf{A} \leftarrow \mathsf{B}_1, \mathsf{B}_2, \dots, \mathsf{B}_n$$

as "procedures"... how?

Logic Programming in one slide:

• A logic program is a set of clauses (\approx rules):



• A program run is given an initial goal:

$$\leftarrow C_1, C_2, \dots, C_m$$

- If the current goal is $\leftarrow C_1, C_2, \dots, C_m$ a computation step involves
 - unifying some C_i with the head A of some clause $A \leftarrow B_1, B_2, \dots, B_n$ and
 - Reducing the current goal to

 $\leftarrow (C_1, ..., C_{i-1}, B_1, B_2, ..., B_n, C_{j+1}, ..., C_m)\theta$

where θ is the unifying substitution.

- The computation ends when the empty goal is produced.
- Variable substitutions for the variables in the original goal mark "solutions".

A proof for our simple example:

Program clauses:

 c_1 : father(sepp,hans) \leftarrow c_2 : father(hans,franz) \leftarrow c_3 : grandpa(x_1, y_1) \leftarrow father(x_1, z_1),father(z_1, y_1)

Goal: ← *grandpa(sepp, x)*

	\leftarrow grandpa(sepp, x)	$\theta = {}$
<i>C</i> ₃	\leftarrow father(sepp, z_1), father(z_1, x)	$\theta = \{x_1 / \text{sepp }, y_1 / x\}$
C ₁	\leftarrow father(hans, x)	$\theta = \{z_1 / hans\}$
C ₂	\leftarrow	$\theta = \{x/franz\}$

Solution: franz

Motivation: We want to build an automatic proof procedure...

- For proofing a **goal** *G* from a **set of formula S** in a special normal form called clausal form
- We will see, that we can do this by showing: $S \cup \{\neg G\}$ is unsatisfiable.
- Problem: remember, for doing this automatically, we would need to consider ALL possible interpretations
- Furthermore: If G or S are not in clausal form, we need to transform them to clausal form.

Observation:

- The notions of interpretations, models, satifiability and validity, discussed in Lecture 2 can be expanded to sets of (closed) formulae (i.e. to sets of clauses) straightforwardly:
- A set of closed formulae $S = \{F_1, ..., F_n\}$ is then simply viewed as the conjunction

$$F_1 \wedge \ldots \wedge F_n$$

Crucial Idea behind the evaluation of Logic Programs: Proof by refutation!

in our case: a set of clauses...

• **Proposition 1:** Let S be a set of closed formulae. Then F is a logical consequence of S iff $S \cup \{\neg F\}$ is unsatisfiable, i.e.

 $S \vDash F$ iff $S \cup \{\neg F\}$ has no model.

Recall the example from the beginning:



Proof of Proposition 1:

 $S \vDash F$ iff $S \cup \{\neg F\}$ is unsatisfiable.

- ⇒ Suppose *F* is a logical consequence of *S*. Now let *I* be an interpretation and suppose *I* is a model for *S*. Then *I* is also a model for *F*. Hence, *I* is not a model of $S \cup \{\neg F\}$. Therefore, no model for $S \cup \{\neg F\}$ can exist and thus $S \cup \{\neg F\}$ is unsatisfiable.
- ⇐ Suppose $S \cup \{\neg F\}$ is unsatisfiable. Now let \mathcal{I} be any interpretation. Suppose \mathcal{I} is a model for S, then, since $S \cup \{\neg F\}$ is unsatisfiable it cannot be a model for $\neg F$. Thus, \mathcal{I} is a model for F and therefore F is a logical consequence of S

Problem:

- Showing unsatisfiability is not easy: We have to consider EVERY possible interpretation!
- However, it turns out that for showing unsatisfiability, we only have to consider a subset of all possible interpretations: Socalled Herbrand Interpretations

Motivation: We want to build an automatic proof procedure...

- For proofing a goal *G* from a set of formula S in a special normal form called clausal form
- We will see, that we can do this by showing: $S \cup \{\neg G\}$ is unsatisfiable.
- Problem: remember, for doing this automatically, we would need to consider ALL possible interpretations
 ... or can we restrict ourselves to special interpretations?
- Furthermore: If G or S are not in clausal form, we need to transform them to clausal form.

Jacques Herbrand



(1908-1931)

 Idea: only consider interpretations where each constant and each ground term is interpreted as itself...

Ground Terms, ground atoms and the Herbrand Universe

- terms not containing any variables ar called ground terms
- Similarly, a ground atom is an atom not containing variables

For a first order language (alphabet) L, the Herbrand Universe U_L is the set of all ground terms which can be formed out of the constants and function symbols appearing in L.

For a first order language (alphabet) *L*, the Herbrand Base B_L is the set of all ground atoms which can be build from the predicate symbols in *L* using ground terms from U_L as arguments.

Example:

 Language/alphabet *L*: Function symbols and constants: f/2, g/1,a/0.
 Predicate symbols: p/1, q/2, variable symbols *x*,*y*,*z*.

How does U_L look like?

How does B_L look like?

Herbrand Interpretation

- Recall: interpretation consists of domain *D*, assignments to *D* for each constant, mappings for each function symbol and relations for each predicate symbol.
- A Herbrand Interpretation for a FO language *L* is an interpretation as follows:
 - The domain of a Herbrand interpretation is the Herbrand Universe U_L
 - Constants are assigned themselves
 - If f is an n-ary function symbol (n>0) in L then the mapping from $(U_L)^n$ to U_L defined by

 $(t_1, ..., t_n) \rightarrow f(t_1, ..., t_n)$ is assigned to f

- Basically, each Herbrand Interpretation 1 can be viewed as a subset of the Herbrand base, where each predicate symbol p is interpreted as the subset of 1 corresponding to p.
- Herbrand Models are defined analogously to normal Models for a set S of closed Formulae, i.e. a Herbrand interpretation which is a model is called Herbrand Model

For unsatisfiability it is enough to consider Herbrand interpretations:

Proposition 2: Let S be a set of clauses and suppose S has a model. Then S has a Herbrand model.

• **Proof:** Let 1 be an interpretation of S. We define a Herbrand interpretation 1' of S as follows:

 $\mathcal{I}' = \{ p(t_1, ..., t_n) \in B_S | p(t_1, ..., t_n) \text{ is true wrt } \mathcal{I} \}$

It is obvious that if I is a model, so is I'

From this and Proposition 1 it follows immediately that:

Proposition 3: A set of clauses S is unsatisfiable iff S has no Herbrand models

Attention!

Note that this only follows if the formulae in S are clauses!!

Example: $S = \{p(a), \exists x \neg p(x)\}$

Has clearly a model, e.g. take *D* the natural numbers *p* for "odd" and 1 assigned to *a*.
However, the only Herbrand interpretations are Ø and {p(a)}, but neither is a model.

We'll hear more about this when we speak about skolemization...

Logical equivalence vs. equi-satisfiability

- We say two formulae F and G are logically equivalent iff $(\forall) F \leftrightarrow G$ is valid.
- In other words: Two formulae are logically equivalent iff they have the same models.
- We say that two (sets of) formulae *F* and *G* are equi-satisfiable, written $F \sim_e G$, iff whenever *F* has a model then also *G* has a model.
- Our goal: Given a set S of arbitrary closed FO formulae, construct an equisatisfiable set of clauses.
- Remember: Since we want to prove UNSATISFIABILITY, this is sufficient.

Note: It is not always possible to create a logically equivalent set of clauses:

Example:
$$S = \{p(a), \exists x \neg p(x) \\ S' = \{p(a), \neg p(f(a))\} \\ But: S \sim_e S'$$

Motivation: We want to build an automatic proof procedure...

- For proofing a goal *G* from a set of formula S in a special normal form called clausal form
- We will see, that we can do this by showing: $S \cup \{\neg G\}$ is unsatisfiable.
- For doing this automatically, we need to consider Herbrand interpretations
- If G or S are not in clausal form, we need to transform them to equi-satisfiable clausal form.

Transformation to clausal form

- Given a closed Formula *F*:*
- **Step 1:** Transform *F* in a (logically equivalent) form *F*' where
 - variables are renamed to avoid ambiguities
 - \neg occurs only in front of atoms
 - \leftarrow , \rightarrow and \leftrightarrow are eliminated
- **Step 2:** Transform *F*′ into an equisatisfiable form *F*′′, eliminating all ∃-quantifiers by introducing constant and function symbols (Skolemization)
- **Step 3:** Transform *F*" into quantor-free conjunctive normal form, i.e. a set of clauses

^{*} For sets of formulae we proceed by taking the conjunction of the formulae

Step 1a: Rename variables

- Transform *F* such that no different occurrences of Quantifiers *F* in bind the same variable
- This can always be achieved through simple variable renaming...

Examples:

$$\forall x p(x) \leftarrow \exists x q(x) \Rightarrow \forall x_1 p(x_1) \leftarrow \exists x_2 q(x_2) \forall y \exists x (s(x,y) \land \forall x p(x)) \Rightarrow \forall x_1 \exists x_2 (s(x_2,x_1) \land \forall x_3 p(x_3))$$

Again equivalence obviously retains...

Step 1b: Eliminate implications and "push" negation in front of atoms $\neg \neg F \Rightarrow F$ $\neg \exists F \Rightarrow \forall \neg F$ $\neg \forall F \Rightarrow \exists \neg F$ $\neg (F \lor G) \Rightarrow \neg F \land \neg G$ (de Morgan) $\neg (F \land G) \Rightarrow \neg F \lor \neg G$ (de Morgan) $F \to G \Rightarrow \neg F \lor G$ $F \leftrightarrow G \Rightarrow (F \rightarrow G) \land (G \rightarrow F)$

Only basic logic transformations which retain equivalence. Obviously, by iterative application you reach a form where \neg only occurs in front of atoms.

Step 2: Eliminate \exists quantifiers



Thoralf Skolem (1887-1963)

Step 2: Eliminate \exists quantifiers

while F' contains \exists quantifiers, repeat:

pick the first (from left to right) existential quantifier $\exists x$:

- **Case 1:** $\exists x$ is in not the scope of any all-quantifiers:
 - Replace $\exists x G$ by (G[x/a]) where a is a **new** constant symbol, not occurring in F
- **Case 2:** $\exists x$ is in the scope of all-quantifiers $\forall y_1 \dots \forall y_k$:
 - Replace $\exists x \ G$ by $G[x/f(y_1, ..., y_k)]$ where f is a **new** k-ary function symbol, not occurring in F'

Remark: This elimination is called "Skolemization" after its inventor Thoralf Skolem, a and f are often called Skolem-constant or Skolem-function, respectively.

The \exists -free formula *F*" obtained in this step is called Skolemform of *F*"

G[x/t] ... stands for the formula obtained from G by substituting the variable x with the term t

Properties of Skolemization:

• Skolemization does not preserve logical equivalence, but preserves equi-satisfiability:

Proposition 4: If *F*' is a closed formula obtained from **Step 1** and *F*'' is the Skolemform of *F*', then $F' \sim_e F''$

Proof (sketch): Enough to show that each step in the Skolemization preserves equi-satisfiability, since \sim_{e} is an equivalence relation.

Let us consider the (more interesting) Case 2:

Since F' is in the form of Step 1 (no negation in front of quantifiers, no implications, variables renamed), quantifiers can be moved in front.

So, if $\exists x G$ is in the scope of all-quantifiers $\forall y_1 \dots \forall y_k$ we can rewrite F' to

 $\forall y_1 \dots \forall y_k \exists x F.$

Now informal: This stands for "for all $y_1 \dots y_k$ there exists an x, such that F is valid" So, for any model, we chose a respective function $\phi : D^k \to D$ which makes exactly the assignment from $y_1 \dots y_k$ to x.

Now extend the model *M* to *M'* such that a new function symbol *f* is assigned this function ϕ . Then *M'* is a model for *F''* which is obtained from *F'* by replacing $\exists x \ G \ with \ G[x/f(y_1, ..., y_k]]$

Step 3:

Since F" does not contain ∃ quantors, negation only occurs in front of atoms, and variables have been renamed, ∀ quantors can be moved to the front.
 We obtain a formula of the form:

 $\forall y_1 \; \forall y_k G$

• Finally, by applying the distributive laws on ∧ and ∨ bring the formula *G* to conjunctive normal form.

 \rightarrow we obtain a conjunction of Clauses!

Example:

 $\begin{array}{l} \neg(((\forall x \exists y \ p(x, y) \land \forall x \ \forall y \ (p(x, y) \rightarrow r(y))) \rightarrow \forall z R(z)) \\ \text{After Step 1a: }^{*} \\ \neg(((\forall x \exists y \ p(x, y) \land \forall u \ \forall v \ (p(u, v) \rightarrow r(v))) \rightarrow \forall z R(z)) \\ \text{After Step 1b:} \\ (\forall x \exists y \ p(x, y) \land \forall u \ \forall v \ (\neg p(u, v) \lor r(v))) \land \exists z \ \neg r(z) \\ \text{After Step 2:} \\ (\forall x \ p(x, f(x)) \land \forall u \ \forall v \ (\neg p(u, v) \lor r(v))) \land \neg r(a) \\ \text{After Step 3:} \\ \forall(p(x, f(x)) \land (\neg p(u, v) \lor r(v))) \land \neg r(a)) \end{array}$

This corresponds to a set of clauses:

$$S = \{p(x, f(x)) \leftarrow, r(v) \leftarrow p(u, v)), \leftarrow r(a)\}$$

* A mechanical translation would maybe rather create something like: $\neg(((\forall x_1 \exists x_2 \ p(x_1, x_2) \land \forall x_3 \ \forall x_4 \ (p(x_3, x_4) \rightarrow r(x_4))) \rightarrow \forall x_5 R(x_5)))$

Automatic Proof Generation for sets of clauses by resolution

- A proof system needs inference rules
- Idea: We will prove a goal G from a set of clauses S by proving contradiction (i.e. unsatisfiability) from S ∪ {¬G}.
- Assume that your goal has the form:
 G = ∃(A) where A is an atom:
 Then ¬ G is the clause ← A
- We will now learn some inference rule which can allows to prove contradiction, called resolution.

Example:

- All birds are animals
- All eagles are birds
- Karl loves (all) animals $l(karl,x) \leftarrow a(x)$
- Franzi is a bird
- Hansi is an Eagle

 $a(x) \leftarrow b(x)$ $b(x) \leftarrow e(x)$ $l(karl,x) \leftarrow a(x)$ $b(franz) \leftarrow$ $e(hansi) \leftarrow$

Goal/Query: Does Karl love Hansi?
 ¬ G ≡ ¬ l(karl,hansi)
 ⇒ ← l(karl,hansi)

 \odot let's try it out in Prolog!

Resolution: Cut + Substitution

Resolution is a combination of an inference rule called cut rule ...

$$\frac{\mathcal{C}_{1} \vee A \vee \mathcal{C}_{2} \qquad \mathcal{C}_{3} \vee \neg A \vee \mathcal{C}_{4}}{\mathcal{C}_{1} \vee \mathcal{C}_{2} \vee \mathcal{C}_{3} \vee \mathcal{C}_{4}} \qquad (\mathsf{R})^{*}$$

...and another one called **substitution rule**:

Exercise: Use these two rules to prove contradiction from the example from the last slide!

* Could for clauses also be written as:

$$\frac{A_1, \dots, \mathbf{A}, \dots, A_k \leftarrow B_1, \dots, B_l \qquad C_1, \dots, C_m \leftarrow D_1, \dots, \mathbf{A}, \dots, D_n}{A_1, \dots, A_k, C_1, \dots, C_m \leftarrow B_1, \dots, B_l, D_1, \dots, D_n}$$

Let's try to prove contradiction using (R) and (S)

 $S: a(x) \leftarrow b(x), \ b(x) \leftarrow e(x), \ l(karl, x) \leftarrow a(x), \ b(franz) \leftarrow, \ e(hansi) \leftarrow, \\ G: \leftarrow l(karl, hansi)$

S: $\forall (a(x) \lor \neg b(x)), \forall (b(x) \lor \neg e(x)), \forall (l(karl,x) \lor \neg a(x)), \forall (b(franz)), \forall (e(hansi))$



Resolution rule:

- In the refutation in the last slide, a substitution always served as "preparation step" before the cut rule was applied.
- The derivation is "goal-oriented"
- Idea: Combine substitution and cut rules by using a canonical substitution, the so called most general unifier (mgu), which can be found automatically.
- This combined rule serves as a basis for an automatic refutation procedure.
- First we have to define **substitutions** and **unifiers**...

Subsitutions:

• A substitution is a finite set of the form:

 $\theta = \{v_1/t_1, ..., v_n/t_n\}$ where:

- the v_i are variables and the t_i are terms
- each t_i is distinct from v_i
- the variables v_1, \ldots, v_n are distinct
- If all $t_1, ..., t_n$ are ground terms then θ is called called a *ground substitution*
- If all $t_1, ..., t_n$ are variables then θ is called called a *variable-pure substitution*
- For a quantifier-free formula F

 $F[v_1/t_1, ..., v_n/t_n]$ can be written $F\theta$

Example: $p(x,y,f(a)) = \{x/b, y/x\}$

Subsitutions and Unifiers:

• Composition of substitutions:

 $\theta = \{ u_1 / s_1, ..., u_m / s_m \}$ $\sigma = \{ v_1 / t_1, ..., v_n / t_n \}$

- $\theta \sigma$ is obtained from $\{u_1/s_1\sigma, ..., u_m/s_m\sigma, v_1/t_1, ..., v_n/t_n\}$ by:
 - deleting any binding where $u_i = s_i \sigma$
 - deleting any binding v_i/t_i where $v_j \in \{u_1, ..., u_m\}$
- Two atomic formulae *P* and *Q* with the same predicate symbol are called unifiable if there exists a substitution θ such that

 $P\theta = Q\theta$

• A unifier θ of *P* and *Q* is called **most general unifier** (mgu), if for each unifier σ of *P* and *Q* a substitution γ exists such that $\sigma = \theta \gamma$

Examples:

- p(f(x),a), p(y,f(w)) are not unifiable because the second argument cannot be unified.
- p(f(x),z), p(y,a) are unifiable:
 σ = {y/f(a), x/a, z/a} is a unifier
 θ = {y/f(x), z/a} is a mgu
- How to compute an mgu automatically?

A unification algorithm:

The **disagreement** of *P* and *Q* is defined as follows: Find the leftmost position in *P* and *Q* where there is a different symbol and extract from *P* and *Q* the pair of terms (t_p, t_Q) beginning at that position.



Remark: There is also a general unification algorithm for sets of literals, but for our form of resolution this one is sufficient...

An example:

 $P = p(a, x, f(g(y))) \qquad \qquad Q = p(z, h(z, w), f(w))$

 $\begin{array}{l} \theta_{0} = \{\} \\ P \ \theta_{0} = p(a, x, f(g(y)) & Q \ \theta_{0} = p(z, h(z, w), f(w)) \\ \theta_{1} = \theta_{0}\{z/a\} = \{z/a\} \\ P \ \theta_{1} = p(a, x, f(g(y)) & Q \ \theta_{1} = p(a, h(a, w), f(w)) \\ \theta_{2} = \theta_{1}\{x/h(a, w)\} = \{z/a, x/h(a, w)\} \\ P \ \theta_{2} = p(a, h(a, w), f(g(y)) \ Q \ \theta_{2} = p(a, h(a, w), f(w)) \\ \theta_{3} = \theta_{2}\{w/g(y)\} = \{z/a, x/h(a, g/y)), w/g(y)\} \\ P \ \theta_{3} = p(a, h(a, g(y)), f(g(y)) \ Q \ \theta_{3} = p(a, h(a, g(y)), f(g(y))) \end{array}$

 θ_3 is an mgu!

Resolution:

Let C be a Horn clause $A \leftarrow A_{l}, \dots A_{n}$ and G be a goal $\leftarrow B_1, \ldots, B_m$ where G and C have no variables in common. Let further θ be an mgu of A and B_i for some $1 \le i \le m$ Then the goal $\leftarrow B_1 \theta, \dots, B_{i-1} \theta, A_1 \theta, \dots, A_n \theta, B_{i+1} \theta, B_m \theta$ is called resolvent of G and C.

Remark: There is also a general resolution for full Clause logic, but for Horn programs the above is sufficient...

A refutation proof by resolution

 $S = \{a(x) \leftarrow b(x), \ b(x) \leftarrow e(x), \ l(karl, x) \leftarrow a(x), \ b(franz) \leftarrow, \ e(hansi) \leftarrow \}$

Does Karl love Hansi?

 $G: \leftarrow l(karl, hansi) \qquad l(karl, x) \leftarrow a(x)$ $mgu = \{x/hansi\}$ $\leftarrow a(hansi) \qquad a(x) \leftarrow b(x)$ $mgu = \{x/hansi\}$ $\leftarrow b(hansi) \qquad b(x) \leftarrow e(x)$ $mgu = \{x/hansi\}$ $\leftarrow e(hansi) \leftarrow$ $mgu = \{\}$

Attention:

Why goal and clause may not have variables in common:

• try resolving:



This can however always be solved by renaming the variables in the clause to resolve:



Answer Substitutions!

- However: What about more complex questions:
 - Who does Karl love?
 - Which Eagles does Karl love?
- Try resolution! There are possibly several possible refutations, each of which "contains" an answer substitution.
- More: next time!

Exercises:

• See separate sheet! Will be put on the lecture web site today.

Next Lecture:

- How to compute all answer substitutions
- Why does resolution work?
 - Correspondence between consequences and the minimal Herbrand model
 - Soundness & completeness
- SLD-Resolution + Prolog
 - 1. Why is the occur-check so expensive?
 - 2. Problems with termination in Prolog's procedural depth-first search! Left- and right recursion, selection-strategy...
 - Programming with Prolog! ©