# Artificial Intelligence

# Horn Clauses and SLD Resolution

Marco Piastra

# Horn Clauses in $L_{FO}$

The definition is very similar to the propositional case

Horn Clauses (of the skolemization of a set sentences)

Each clause contains at most one literal in positive form

```
Facts, rules and goals
  Fact: a clause with just an individual atom
                    \{Human(socrates)\}, \{Pyramid(x)\}, \{Sister(sally, motherOf(paul))\}\}
  Rule: a clause with at least two literals, exactly one in positive form
                    \{Human(x), \neg Philosopher(x)\},\
                    \forall x (Philospher(x) \rightarrow Human(x))
                    \{\neg Female(x), \neg Parent(k(x), x), \neg Parent(k(y), y), Sister(x, y)\}
                    \forall x \forall y ((Female(x) \land \exists z (Parent(z,x) \land Parent(z,y))) \rightarrow Sister(x,y))
                    \{\neg Above(x,y), On(x,k(x))\}, \{\neg Above(x,y), On(j(y),y)\}
                    \forall x \forall y \ (Above(x,y) \rightarrow (\exists z \ On(x,z) \land \exists v \ On(v,y)))
  Goal: a clause containing negative literals only
                    \{\neg Human(socrates)\}
                    \{\neg Sister(sally,x), \neg Sister(x,paul)\}
                    Negation of \exists x (Sorella(sally,x) \land Sorella(x,paul))
```

# SLD Resolution in $L_{FO}$

### ■ Input: a program $\Pi$ and a goal $\phi$

Program  $\Pi$  (i.e. a set of *definite clauses*: rules + facts) in some predefined linear order:

$$\gamma_1, \gamma_2, \dots, \gamma_n$$
 (each  $\gamma_i$  is a definite clause)

Goal  $\phi$  (i.e. a conjunction of facts in negated form), which becomes the current goal  $\psi$ 

### Procedure:

Note: the *selection function* for the *current goal* and *subgoal* will be discussed in the next slide

- 1) Select a negative literal  $\, 
  eg lpha$  (i.e. the subgoal) in the current goal  $\psi$
- 2) Scan the program (in the predefined order) to identify a clause candidate literal  $\gamma_i$
- 3) Try unifying  $\neg \alpha$  and  $std(\alpha')$  (i.e. apply the standardization of variables to  $\alpha'$ )
- 4) If there is a *unifier*  $\sigma$  of  $\neg \alpha$  and  $std(\alpha')$ , replace the current goal with the *resolvent* of  $std(\gamma_i)[\sigma]$  and  $\psi[\sigma]$  (i.e. first apply  $\sigma$  to both  $std(\gamma_i)$  and  $\psi$  and then generate the resolvent)
- 5) Then, if the *resolvent* is the empty clause, terminate with <u>success</u>, otherwise select a new *current goal* and resume from step 1)
- 6) Else, if the unification fails , scan the program and select a new candidate literal  $\gamma_i$  and resume from step 3)
- 7) Else, if there are no further clauses in the program, select a new *current goal* and resume from step 1)
- 8) If all the goals in the tree have been fully explored, terminate with failure

# SLD Resolution in $L_{FO}$

#### ■ Two alternative selection functions:

#### **Depth-first** (which is the most common...)

- Always select the most recent goal, i.e. the resolvent which has been generated last, as the current goal  $\phi$
- Then, in the current goal  $\phi$ , select the leftmost subgoal  $\neg \alpha$  not selected yet
- When the current goal  $\phi$  is fully explored and no new resolvent has been generated, select the next most recent goal in the tree (backtracking)

#### **Breadth-first**

- Always select the <u>least</u> recent goal as the current goal  $\phi$
- Then, in the current goal  $\phi$ , select the leftmost subgoal  $\neg \alpha$  not selected yet
- When the current goal  $\phi$  is fully explored select the next *least recent* goal in the tree

#### Comparison

Breadth-first is a *fair* selection function, in the sense that every possible resolution will be eventually attempted (i.e. 'it leaves nothing behind').

Depth-first tends to save memory and be more efficient, but it is NOT fair (more to follow)

### SLD Trees

Example (depth-first selection function):  $\Pi \equiv \{ \{Human(x), \neg Philosopher(x) \}, \{Mortal(y), \neg Human(y) \}, \}$ {Philosopher(socrates)}, {Philosopher(plato)}, {Philosopher(aristotle)}}  $goal \equiv \{\neg Mortal(x), \neg Human(x)\}\$ "Is there anyone who is both human and mortal?" 1:  $\{\neg Mortal(x)\}$  []  $\{\neg Mortal(x)\}, \{Mortal(y_1), \neg Human(y_1),\}$  [] 2:  $\{\neg Human(y_1)\}\ [x/y_1]$  $\{\neg Human(y_1)\}, \{Human(x_1), \neg Philosopher(x_1)\} [x/y_1]$ 3:  $\{\neg Philosopher(x_1)\}\ [x/y_1][y_1/x_1]$  $\{\neg Philosopher(x_1)\}\ \{Philosopher(socrates)\}\ [x/y_1][y_1/x_1]$ 4: {}  $[x/y_1][y_1/x_1][x_1/socrates]$ 

### SLD Trees

```
Example (depth-first selection function, forcing full exploration of SLD tree):
                                                                                   \Pi \equiv \{ \{Human(x), \neg Philosopher(x)\}, \{Mortal(y), \neg Human(y)\}, \}
                                                                                                                                                                                {Philosopher(socrates)}, {Philosopher(plato)}, {Philosopher(aristotle)}}
                                                                                     goal \equiv \{\neg Mortal(x), \neg Human(x)\}
                                                                                                                                                                                         "Is there anyone who is both human and mortal?"
                                                                                                                                                                                                                                                                                              1: \{\neg Mortal(x)\} [] \{\neg Mortal(x)\}, \{Mortal(y_1), \neg Human(y_1),\} []
                                                                                                                                                                                                                                                                                                                                                                                              2: \{\neg Human(y_1)\}\ [x/y_1]
                                                                                                                                                                                                                                                                                 \{\neg Human(y_1)\}, \{Human(x_1), \neg Philosopher(x_1)\} [x/y_1]
                                                                                                                                                                                                                                                                                                                                                  3: \{\neg Philosopher(x_1)\}\ [x/y_1][y_1/x_1]
\{\neg Philosopher(x_1)\}\ \{Philosopher(socrates)\}\ [x/y_1][y_1/x_1]
                                                                                                                                                                                                                                           \{\neg Philosopher(x_1)\}\ \{Philosopher(plato)\}\ [x/y_1][y_1/x_1]
\{\neg Philosopher(x_1)\}\ \{Philosopher(x_1)\}\ \{Philosopher(x_1)\}\
                                           \left\{ \begin{array}{c|c} & \left\{ \begin{array}{c} \neg Philosopher(x_1) \right\} \left\{ Philosopher(aristotle) \right\} \left[ x/y_1 \right] \left[ y_1/x_1 \right] \\ 4 : \left\{ \left\{ \left[ x/y_1 \right] \left[ y_1/x_1 \right] \left[ x_1/socrates \right] \right. \right. \right. \\ 5 : \left\{ \left\{ \left[ x/y_1 \right] \left[ y_1/x_1 \right] \left[ x_1/plato \right] \right. \right. \right. \right. \\ 6 : \left\{ \left\{ \left[ x/y_1 \right] \left[ y_1/x_1 \right] \left[ x_1/aristotle \right] \right. \right\} \right\} \\ \left\{ \left\{ \left[ x/y_1 \right] \left[ y_1/x_1 \right] \left[ x_1/aristotle \right] \right\} \right\} \\ \left\{ \left\{ \left[ x/y_1 \right] \left[ x_1/aristotle \right] \right\} \right\} \\ \left\{ \left[ x/y_1 \right] \left[ x_1/aristotle \right] \right\} \\ \left\{ \left[ x/y_1 \right] \left[ x_1/aristotle \right] \right\} \\ \left\{ \left[ x/y_1 \right] \left[ x_1/aristotle \right] \right\} \\ \left\{ \left[ x/y_1 \right] \left[ x_1/aristotle \right] \right\} \\ \left\{ \left[ x/y_1 \right] \left[ x_1/aristotle \right] \right\} \\ \left\{ \left[ x/y_1 \right] \left[ x_1/aristotle \right] \right\} \\ \left\{ \left[ x/y_1 \right] \left[ x_1/aristotle \right] \right\} \\ \left\{ \left[ x/y_1 \right] \left[ x_1/aristotle \right] \right\} \\ \left\{ \left[ x/y_1 \right] \left[ x_1/aristotle \right] \right\} \\ \left\{ \left[ x/y_1 \right] \left[ x_1/aristotle \right] \right\} \\ \left[ x/y_1 \right] \left[ x_1/aristotle \right] \\ \left[ x/x_1 \right] \left[ x/x_1 \right] \\ \left[ x/x_1 \right] \left[ x/x_1 \right] \\ \left[ x/x_1
```

### SLD Trees

Another example (depth-first selection function):  $\Pi \equiv \{\{Mortal(felix), \neg Cat(felix)\}, \{Human(x), \neg Philosopher(x)\}, \{Mortal(y), \neg Human(y)\}, \}$ {Philosopher(socrates)}, {Philosopher(plato)}, {Philosopher(aristotle)}}  $goal \equiv \{\neg Mortal(x), \neg Human(x)\}$ "Is there anyone who is both human and mortal?" 1:  $\{\neg Mortal(x)\}$  []  $\{\neg Mortal(x)\}, \{Mortal(felix), \neg Cat(felix)\} [] \{\neg Mortal(x)\}, \{Mortal(y_1), \neg Human(y_1),\} []$ 3:  $\{\neg Human(y_1)\}\ [x/y_1]$ 2:  $\neg Cat(felix)$  [x/felix]  $\{\neg Human(y_1)\}, \{Human(x_1), \neg Philosopher(x_1)\} [x/y_1]$ goal 2: cannot be resolved 4:  $\{\neg Philosopher(x_1)\}\ [x/y_1][y_1/x_1]$  $\{\neg Philosopher(x_1)\}\ \{Philosopher(socrates)\}\ [x/y_1][y_1/x_1]$ 

 $\{\} [x/y_1][y_1/x_1][x_1/socrates]$ 

### The world of lists

• Lists of items [a, b, c, ...]

```
cons/2
it's \ a \ function \ that \ associates \ items \ (e.g. \ a) \ to \ a \ list \ (e.g. \ [b, c])
cons(a,cons(b,cons(c,nil))) is the list [a,b,c]
Append/3
it's \ a \ predicate: each pair of lists x and y is associated to their concatenation \ z
nil
it's \ a \ constant, the empty \ list.

Shorthand notation (Prolog): [] \Leftrightarrow nil
[a] \Leftrightarrow cons(a,nil)
[a,b] \Leftrightarrow cons(a,cons(b,nil))
[a/[b,c]] \Leftrightarrow cons(a,[b,c])
```

```
Axioms (AL)
\forall x \, Append(nil,x,x)
\forall x \, \forall y \, \forall z \, (Append(x,y,z) \rightarrow \forall s \, Append([s,x],y,[s,z]))
```

### The world of lists

```
Problem: \forall x \ Append(nil, x, x) \models \exists y \ \forall x \ Append(nil, cons(y, x), cons(a, x))
  1: \forall x \, Append(nil, x, x), \, \neg \exists y \, \forall x \, Append(nil, cons(y, x), cons(a, x)) (refutation)
  2: \forall x \ Append(nil, x, x), \ \forall y \ \exists x \ \neg Append(nil, cons(y, x), cons(a, x)) (prenex normal form)
  3: \{Append(nil, x, x)\}, \{\neg Append(nil, cons(y, k(y)), cons(a, k(y)))\}
                                           (k/1) is a Skolem function, clausal form)
                             (N.B. there is no skolemization in Prolog: the programmer does it)
The pair of literals
  Append(nil, x, x), \neg Append(nil, cons(y, k(y)), cons(a, k(y))))
... contains the same predicate Append/3 but the arguments are different
There is however an MGU \sigma = [x/cons(a, k(a)), y/a] that yields
  \{Append(nil, cons(a,k(a)), cons(a,k(a)))\}, \{\neg Append(nil, cons(a,k(a)), cons(a,k(a)))\}\}
From this, the resolvent is the empty clause.
```

# The world of lists in Prolog

```
% Identical to built-in predicate append/3, although it uses "cons"
% as a defined predicate, thus allowing trace-ability.

append(cons(S,X),Y,cons(S,Z)) :- append(X,Y,Z).

append(nil,X,X).

% WARNING: express your queries with cons. Examples:
% ?- append(cons(a,nil), cons(b,cons(c, nil)),cons(a,cons(b,cons(c, nil)))).
% ?- append(X,Y,cons(a,cons(b,cons(c, nil)))).
```

## Infinite SLD Trees (fairness of SLD)

### A first example:

$$\Pi \equiv \{ \{ P(x), \neg P(x) \} \}$$
$$\neg \phi \equiv \{ \neg P(x) \}$$

goal: 
$$\neg P(x)$$
 []
$$\{\neg P(x)\}, \{P(x_1), \neg P(x_1), \}$$
 []
$$\{\neg P(x_1)\} [x/x_1]$$

$$\{\neg P(x_1)\}, \{P(x_2), \neg P(x_2), \} [x/x_1]$$

$$\{\neg P(x_2)\} [x/x_1] [x_1/x_2]$$
...

### Since $\Pi \not\models \phi$ , the method can *diverge*

(although a divergence of this kind can be easily spotted and avoided ...)

## Infinite SLD Trees (fairness of SLD)

A second example:

$$\Pi \equiv \{ \{ P(x), \neg P(x) \}, \{ P(a) \} \}$$
$$\neg \phi \equiv \{ \neg P(x) \}$$

goal: 
$$\neg P(x)$$
 []  $\{\neg P(x)\}, \{P(x_1), \neg P(x_1), \}$  []  $\{\neg P(x)\}, \{P(a)\} [x/a]$   $\{\neg P(x_1)\} [x/x_1]$   $\{\} [x/a]$   $\{\neg P(x_1)\}, \{P(x_2), \neg P(x_2), \} [x/x_1]$   $\{\neg P(x_2)\} [x/x_1] [x_1/x_2]$  ...

In this case  $\Pi \models \phi$ , so the method should *not* diverge.

However, when a *depth-first* selection function is used, the infinite branch in the SLD-tree makes the method diverge anyway.

A <u>fair</u> selection function is such that no possible resolution will be postponed indefinitely: that is, <u>any</u> possible resolution will be performed, eventually.