



Hannes Strass (based on slides by Michael Thielscher)
Faculty of Computer Science, Institute of Artificial Intelligence, Computational Logic Group

# **Negation: Model Theory**

Lecture 9, 12th Dec 2022 // Foundations of Logic Programming, WS 2022/23

### Previously ...

- For every normal logic program P, its completion comp(P) replaces the logical implications of clauses by equivalences.
- SLDNF resolution w.r.t. *P* is **sound** for entailment w.r.t. *comp(P)*.
- SLDNF resolution is only **complete** (for entailment w.r.t. *comp(P)*) for certain combinations of classes of programs, queries, and selection rules.
- For a normal program P, its **dependency graph**  $D_P$  explicitly shows positive and negative dependencies between predicate symbols.
- A normal program P is **stratified** iff  $D_P$  has no cycle with a negative edge.

$$P: \qquad p \leftarrow q, \sim r$$

$$q \leftarrow r$$

$$p/0 \stackrel{+}{\longleftarrow} q/0 \stackrel{+}{\longleftarrow} r/0$$

Completion of P:

$$p \leftrightarrow (q \land \neg r)$$
$$q \leftrightarrow r$$
$$r \leftrightarrow false$$





### **Overview**

**Extended Consequence Operator** 

Standard Models

Perfect Models and Local Stratification

Well-Supported Models





# **Extended Consequence Operator**





# **Extended Consequence Operator**

#### Definition

Let *P* be a normal program and *l* be a Herbrand interpretation. Then

$$T_P(I) := \{H \mid H \leftarrow \vec{B} \in ground(P), I \models \vec{B}\}$$

In case *P* is a definite program, we know that

- T<sub>P</sub> is monotonic,
- T<sub>P</sub> is continuous,
- $T_P$  has the least fixpoint  $\mathfrak{M}(P)$ ,
- $\mathfrak{M}(P) = T_P \uparrow \omega$ .

For normal programs, all of these properties are lost.





### Extended $T_P$ -Characterization (1)

#### Lemma 4.3

Let *P* be a normal program and *I* be a Herbrand interpretation. Then

$$I \models P$$
 iff  $T_P(I) \subseteq I$ 

#### Proof.

```
I \models P

iff for every H \leftarrow \vec{B} \in ground(P): I \models \vec{B} implies I \models H

iff for every H \leftarrow \vec{B} \in ground(P): I \models \vec{B} implies H \in I

iff for every ground atom H: H \in T_P(I) implies H \in I

iff T_P(I) \subseteq I
```





### Extended $T_P$ -Characterization (2)

#### Definition

Let F and  $\Pi$  be ranked alphabets of function symbols and predicate symbols, respectively, let  $= \notin \Pi$  be a binary predicate symbol (equality), and let I be a Herbrand interpretation for F and  $\Pi$ . Then

$$I_{=} := I \cup \{=(t,t) \mid t \in HU_{F}\}$$

is called a **standardized** Herbrand interpretation for *F* and  $\Pi \cup \{=\}$ .

#### Lemma 4.4

Let *P* be a normal program and *I* a Herbrand interpretation. Then

$$I_{=} \models comp(P)$$
 iff  $T_{P}(I) = I$ 





### Extended $T_P$ -Characterization (3)

#### Proof Idea of Lemma 4.4:

```
I_{=} \models comp(P)
```

iff (since  $I_{=}$  is a model for standard axioms of equality and inequality)

for every ground atom 
$$H: I \models \left(H \leftrightarrow \bigvee_{(H \leftarrow \vec{B}) \in ground(P)} \vec{B}\right)$$

iff for every ground atom 
$$H: H \in I$$
 iff  $I \models \bigvee_{(H \leftarrow \vec{B}) \in ground(P)} \vec{B}$ 

iff for every ground atom 
$$H: H \in I$$
 iff  $I \models \vec{B}$  for some  $H \leftarrow \vec{B} \in ground(P)$ 

iff for every ground atom 
$$H: H \in I$$
 iff  $H \in T_P(I)$ 

iff 
$$T_P(I) = I$$





## **Completion may be Inadequate**

Consider the following normal logic program *P*:

Its completion  $comp(P) \supseteq \{ill \leftrightarrow (\neg ill \land infection), infection \leftrightarrow true\}$  is unsatisfiable (it has no models).

Hence,  $comp(P) \models healthy$ .

But  $I = \{infection, ill\}$  is the only Herbrand model of P:

 $\{ill \leftarrow (\neg ill \land infection), infection\} \equiv \{ill \lor \neg \neg ill \lor \neg infection, infection\}$ 

Hence,  $P \not\models healthy$ .





### **Non-Intended Minimal Herbrand Models**

$$P_1: \quad p \leftarrow \sim q$$

 $P_1$  has three Herbrand models:

$$M_1 = \{p\}, M_2 = \{q\}, \text{ and } M_3 = \{p, q\}.$$

 $P_1$  has no least, but two minimal Herbrand models:  $M_1$  and  $M_2$ 

However:  $M_1$ , and not  $M_2$ , is the "intended" model of  $P_1$ .





## **Supported Herbrand Interpretations**

#### Definition

A Herbrand interpretation *I* of *P* is **supported** 

 $:\iff$  for every  $H \in I$  there exists some  $H \leftarrow \vec{B} \in ground(P)$  such that  $I \models \vec{B}$ .

If additionally  $l \models P$ , we say that l is a **supported model** of P.

(Intuitively:  $\vec{B}$  is an explanation for H.)

### Example

- $M_1$  is a supported model of  $P_1$ . (Literal  $\sim q$  is a support for p.)
- $M_2$  is no supported model of  $P_1$ . (Atom  $q \in M_2$  has no support.)
- Note (cf. Lemma 4.3) that  $T_{P_1}(M_2) = \emptyset \subsetneq M_2$ , but in contrast  $T_{P_1}(M_1) = M_1$ .
- The definite (therefore normal) program  $\{p \leftarrow q, q \leftarrow p\}$  has two supported models:  $\emptyset$  and  $\{p,q\}$ . In the second supported model, p is an explanation for q and vice versa. Thus "support" can be cyclic.





### Extended $T_P$ -Characterization (4)

#### Lemma 6.2

Let *P* be a normal program and *I* be a Herbrand interpretation. Then  $I \text{ is a supported model of } P \text{ iff } T_P(I) = I$ 

#### Proof Idea.

```
I \models P \text{ and } I \text{ supported}

iff for every (H \leftarrow \vec{B}) \in ground(P): I \models \vec{B} \text{ implies } I \models H

and for every H \in I: I \models \bigvee_{(H \leftarrow \vec{B}) \in ground(P)} \vec{B}

iff for every ground atom H: I \models \left(H \leftarrow \bigvee_{(H \leftarrow \vec{B}) \in ground(P)} \vec{B}\right)

and I \models \left(H \rightarrow \bigvee_{(H \leftarrow \vec{B}) \in ground(P)} \vec{B}\right)

iff for every ground atom H: I \models \left(H \leftrightarrow \bigvee_{(H \leftarrow \vec{B}) \in ground(P)} \vec{B}\right)

iff I_{=} \text{ model for } comp(P)

iff (Lemma 4.4) I_{P}(I) = I
```





### **Standard Models**





## **Non-Intended Supported Models**

$$P_2: p \leftarrow \sim q$$
 $q \leftarrow q$ 

 $P_2$  has three Herbrand models:

$$M_1 = \{p\}, M_2 = \{q\}, \text{ and } M_3 = \{p, q\}$$

 $P_2$  has two supported Herbrand models:

 $M_1$  and  $M_2$ 

However:  $M_1$ , and not  $M_2$ , is the "intended" model of  $P_2$ .

 $M_1$  will be called the standard model of  $P_2$  (cf. slide 19).





### **Stratifications**

#### Definition

Let P be a normal program with dependency graph  $D_P$ .

- A predicate symbol p is **defined** in P :  $\iff P$  contains a clause  $p(t_1, \ldots, t_n) \leftarrow \vec{B}$ .
- $P_1 \cup ... \cup P_n = P$  is a **stratification** of P  $:\Longleftrightarrow$ 
  - 1.  $P_i \neq \emptyset$  for every  $i \in [1, n]$
  - 2.  $P_i \cap P_j = \emptyset$  for every  $i, j \in [1, n]$  with  $i \neq j$
  - 3. for every p defined in  $P_i$  and edge  $q \stackrel{+}{\longrightarrow} p$  in  $D_p$ : q is not defined in  $\bigcup_{j=i+1}^n P_j$
  - 4. for every p defined in  $P_i$  and edge  $q \xrightarrow{-} p$  in  $D_p$ : q is not defined in  $\bigcup_{j=i}^n P_j$

#### Lemma 6.5

A normal program *P* is stratified iff there exists a stratification of *P*.

Note: A stratified program may have different stratifications.





## Example (1)

The normal logic program *P* is the following:

```
zero(0) \leftarrow positive(x) \leftarrow num(x), \sim zero(x) \\ num(0) \leftarrow num(s(x)) \leftarrow num(x)
```

 $P_1 \cup P_2 \cup P_3$  is a stratification of P, where

```
P_1 = \{num(0) \leftarrow, num(s(x)) \leftarrow num(x)\}

P_2 = \{zero(0) \leftarrow\}

P_3 = \{positive(x) \leftarrow num(x), \sim zero(x)\}
```





### Example (1)

The normal logic program *P* is the following:

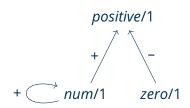
```
 zero(0) \leftarrow \\ positive(x) \leftarrow num(x), \sim zero(x) \\ num(0) \leftarrow \\ num(s(x)) \leftarrow num(x)
```

 $P_1 \cup P_2 \cup P_3$  is a stratification of P, where

```
P_1 = \{num(0) \leftarrow, num(s(x)) \leftarrow num(x)\}

P_2 = \{zero(0) \leftarrow\}

P_3 = \{positive(x) \leftarrow num(x), \sim zero(x)\}
```







## Example (2)

```
\begin{array}{ll} num(0) & \leftarrow \\ num(s(x)) & \leftarrow & num(x) \\ even(0) & \leftarrow \\ even(x) & \leftarrow & \sim odd(x), \ num(x) \\ odd(s(x)) & \leftarrow & even(x) \end{array}
```

P admits no stratification.





## Example (2)

```
\begin{array}{ccc} num(0) & \leftarrow \\ num(s(x)) & \leftarrow & num(x) \\ even(0) & \leftarrow \\ even(x) & \leftarrow & \sim odd(x), \ num(x) \\ odd(s(x)) & \leftarrow & even(x) \end{array}
```

#### P admits no stratification.







### **Quiz: Stratifications**

#### Quiz

Consider the normal logic program P where x is the only variable: ...





## **Standard Models (Stratified Programs)**

#### Definition

Let I be an Herbrand interpretation,  $\Pi$  be a set of predicate symbols.

$$I \mid \Pi := I \cap \{p(t_1, \dots, t_n) \mid p \in \Pi, t_1, \dots, t_n \text{ ground terms}\}$$

Let  $P_1 \cup ... \cup P_n$  be a stratification of the normal program P.

```
M_1 := least Herbrand model of P_1 such that M_1 \mid \{p \mid p \text{ not defined in } P\} = \emptyset
```

$$M_2$$
 := least Herbrand model of  $P_2$  such that

$$M_2 \mid \{p \mid p \text{ defined nowhere or in } P_1\} = M_1$$

:

$$M_n := \text{least Herbrand model of } P_n \text{ such that}$$

$$M_n \mid \{p \mid p \text{ defined nowhere or in } P_1 \cup \ldots \cup P_{n-1}\} = M_{n-1}$$

We call  $M_P = M_n$  the **standard model** of P.





## **Standard Models (Stratified Programs)**

#### Definition

Let I be an Herbrand interpretation,  $\Pi$  be a set of predicate symbols.

$$I \mid \Pi := I \cap \{p(t_1, \dots, t_n) \mid p \in \Pi, t_1, \dots, t_n \text{ ground terms}\}$$

Let  $P_1 \cup ... \cup P_n$  be a stratification of the normal program P.

$$M_1$$
 := least Herbrand model of  $P_1$  such that  $M_1 \mid \{p \mid p \text{ not defined in } P_1 \cup \ldots \cup P_n\} = \emptyset$ 
 $M_2$  := least Herbrand model of  $P_2$  such that  $M_2 \mid \{p \mid p \text{ not defined in } P_2 \cup \ldots \cup P_n\} = M_1$ 
:

 $M_n$  := least Herbrand model of  $P_n$  such that  $M_n \mid \{p \mid p \text{ not defined in } P_n\} = M_{n-1}$ 

We call  $M_P = M_n$  the **standard model** of P.





## Example (1)

Let  $P_1 \cup P_2 \cup P_3$  with

```
P_1 = \{num(0) \leftarrow, num(s(x)) \leftarrow num(x)\}

P_2 = \{zero(0) \leftarrow\}

P_3 = \{positive(x) \leftarrow num(x), \sim zero(x)\}
```

be a stratification of *P*. Then:

```
\begin{array}{ll} M_1 = \{num(t) \mid t \in HU_{\{s,0\}}\} & = \{num(0), num(s(0)), \ldots\} \\ M_2 = \{num(t) \mid t \in HU_{\{s,0\}}\} \cup \{zero(0)\} & = \{zero(0), num(0), num(s(0)), \ldots\} \\ M_3 = \{num(t) \mid t \in HU_{\{s,0\}}\} \cup \{zero(0)\} & = \{zero(0), num(0), num(s(0)), \ldots\} \\ & \cup \{positive(t) \mid t \in HU_{\{s,0\}} \setminus \{0\}\} & \cup \{positive(s(0)), positive(s(s(0))), \ldots\} \end{array}
```

Hence  $M_P = M_3$  is the standard model of P.





## **Properties of Standard Models**

#### Theorem 6.7

Consider a stratified program P. Then:

- M<sub>P</sub> does not depend on the chosen stratification of P,
- M<sub>P</sub> is a minimal model of P,
- $M_P$  is a supported model of P.

#### Corollary

For a stratified program *P*, *comp*(*P*) admits a Herbrand model.





### **Perfect Models and Local Stratification**





# Stratification may be too demanding

Consider the first-order program  $P_1$  over  $\Pi_1 = \{even/1\}$  and  $F_1 = \{s/1, 0/0\}$ :

• *P*<sub>1</sub> is not stratified, since *even/*1 depends negatively on itself.

```
even(0) \leftarrow

even(s(x)) \leftarrow \sim even(x)
```

#### Observation

 $P_1$  has a clear intended model: {even(0), even(s(s(0))), even(s(s(s(0)))), ...}.

Consider, in contrast, the propositional program  $P_0$  over  $\Pi_0 = HB_{\{even\},\{s,0\}} = \{even(0)/0, even(s(0))/0, ...\}$  and  $F_0 = \emptyset$ :

- $P_0$  is stratified.
- The standard model of  $P_0$  is the intended model of  $P_1$ .

```
even(0) \leftarrow
even(s(0)) \leftarrow \sim even(0)
even(s(s(0))) \leftarrow \sim even(s(0))
\vdots
```





### **Perfect Models**

#### **Definition**

Let *P* be a normal program over  $\Pi$  and *F*, and let  $\prec$  be a well-founded ordering on  $HB_{\Pi,F}$ . Further, let *M* and *N* be Herbrand interpretations of *P*.

- N is **preferable** to M (written N \( \times M \))
   : ← for every B ∈ N \( M \) there exists an A ∈ M \( N \) such that A \( \times B \).
- A Herbrand model *M* of *P* is **perfect** (w.r.t. ≺)
   : there is no Herbrand model of *P* that is preferable to *M*.

Well-founded orderings admit no infinite descending chains ...  $\prec c_2 \prec c_1 \prec c_0$ .

### Example

$$p \leftarrow \sim 0$$
 $q \leftarrow q$ 

For the well-founded ordering  $q \prec p$ , we obtain  $\{p\} \triangleleft \{q\}$ .





### The Standard Model is Perfect

#### Lemma 6.9

Let P be a normal program and  $\prec$  be a well-founded ordering on  $HB_{\Pi,F}$ .

- If  $N \subseteq M$  then  $N \triangleleft M$ .
- Every perfect model of *P* is minimal.
- The relation ⊲ is a partial order on Herbrand interpretations.

#### Theorem 6.10

Let P be a stratified normal program over  $\Pi$  and F and for  $A, B \in HB_{\Pi,F}$  define  $A \prec B :\iff$  the predicate symbol of B depends negatively on the predicate symbol of A.

Then  $M_P$  is a unique perfect model of P.

The standard model  $M_P$  is thus the  $\triangleleft$ -least Herbrand model of P.





### The Standard Model is Perfect

#### Lemma 6.9

Let *P* be a normal program and  $\prec$  be a well-founded ordering on  $HB_{\Pi,F}$ .

- If  $N \subseteq M$  then  $N \triangleleft M$ .
- Every perfect model of *P* is minimal.
- The relation ⊲ is a partial order on Herbrand interpretations.

#### Theorem 6.10

Let P be a stratified normal program over  $\Pi$  and F and for  $A, B \in HB_{\Pi,F}$  define  $A \prec B :\iff$  the predicate symbol of B depends negatively on the predicate symbol of A.

Then  $M_P$  is a unique perfect model of P.

The standard model  $M_P$  is thus the  $\triangleleft$ -least Herbrand model of P.

But how to come up with an ordering ≺ for non-stratified programs?





### **Local Stratification**

#### Definition

Let P be a normal program over  $\Pi$  and F.

- A **local stratification** for *P* is a function *strat* from  $HB_{\Pi,F}$  to the countable ordinals.
- For a given local stratification *strat* and  $A \in HB_{\Pi,F}$ , we define  $strat(\sim A) = strat(A) + 1$ .
- A clause  $c \in P$  is **locally stratified w.r.t.** strat :  $\iff$  for every  $A \leftarrow \vec{K}, L, \vec{M} \in ground(c)$ , we have  $strat(A) \geq strat(L)$ .
- P is locally stratified w.r.t. strat
   : ⇒ all c ∈ P are locally stratified w.r.t. strat.
- P is locally stratified
   : it is locally stratified w.r.t. to some local stratification.
- → A first-order program is locally stratified if its ground version is stratified.





## **Locally Stratified Programs & Perfect Models**

#### Lemma 6.12

Every stratified program is locally stratified.

### Example

The program

$$even(0) \leftarrow$$
  
 $even(s(x)) \leftarrow \sim even(x)$ 

is locally stratified, but not stratified.

#### Theorem 6.13

Let *P* be a normal logic program (over  $\Pi$  and *F*) that is locally stratified (w.r.t. *strat*), and for  $A, B \in HB_{\Pi,F}$  define  $A \prec B :\iff strat(A) < strat(B)$ .

Then *P* has a unique perfect model.





# **Well-Supported Models**





## From Supported to Well-Supported Models

$$p \leftarrow q$$
$$q \leftarrow p$$

has two supported models,  $\emptyset$  and  $\{p, q\}$ .

Only the minimal supported model is intended.



# From Supported to Well-Supported Models

$$p \leftarrow q$$
$$q \leftarrow p$$

$$p \leftarrow \sim q$$
$$q \leftarrow q$$

has two supported models,  $\emptyset$  and  $\{p, q\}$ .

Only the minimal supported model is intended.

has two minimal supported models,  $\{p\}$  and  $\{q\}$ .

Only  $\{p\}$  is intended: the support of q ("q because q") is unfounded.



# From Supported to Well-Supported Models

$$p \leftarrow q$$
$$q \leftarrow p$$

has two minimal supported models,  $\{p\}$  and  $\{q\}$ .

Only the minimal supported model is intended.

Only 
$$\{p\}$$
 is intended: the support of  $q$  (" $q$  because  $q$ ") is unfounded.

$$p \leftarrow \sim q$$
$$q \leftarrow q$$

has two minimal supported models,  $\{p\}$  and  $\{q\}$ .

• The program is not (locally) stratified.

has two supported models,  $\emptyset$  and  $\{p, q\}$ .

• The situation is symmetric, so why should we prefer one model over the other?

$$p \leftarrow \sim q$$
$$q \leftarrow \sim p$$



# **Well-Supported Models**

#### Definition

Let P be a normal logic program over vocabulary  $\Pi$ , F.

A Herbrand interpretation  $I \subseteq HB_{\Pi,F}$  is **well-supported** 

:⇔

there is a well-founded ordering  $\prec$  on  $HB_{\Pi,F}$  such that:

for each  $A \in I$  there is a clause  $A \leftarrow \vec{B} \in ground(P)$  with:

- $l \models \vec{B}$
- for every positive atom  $C \in \vec{B}$ , we have  $C \prec A$ .

If additionally  $l \models P$ , then l is a **well-supported model** of P.

Well-supported models disallow circular justifications.

#### Theorem 6.20

Any locally stratified normal logic program *P* has a unique well-supported model that coincides with its perfect model.





# **Well-Supported Models: Examples**

$$p \leftarrow \sim q$$
 $q \leftarrow q$ 

has  $\{p\}$  as only well-supported model.

$$p \leftarrow \sim q$$
$$q \leftarrow \sim p$$

has two well-supported models,  $\{p\}$  and  $\{q\}$ .

$$p \leftarrow q$$
$$p \leftarrow \sim q$$
$$q \leftarrow p$$
$$q \leftarrow \sim p$$

has no well-supported model.

# Well-Supported Models: Examples

$$p \leftarrow \sim q$$
 $q \leftarrow q$ 

has  $\{p\}$  as only well-supported model.

$$p \leftarrow \sim q$$

has two well-supported models,  $\{p\}$  and  $\{q\}$ .

$$p \leftarrow q$$
 $p \leftarrow \sim$ 

 $p \leftarrow \sim q$ 

 $q \leftarrow p$ 

 $q \leftarrow \sim p$ 

has no well-supported model.

Preview: Well-supported models are also known as stable models.





### **Conclusion**

### Summary

- The immediate consequence operator  $T_P$  for a normal logic program P characterizes the **supported models** of P (= the models of Comp(P)).
- The **stratification** of a program *P* partitions the program in layers (strata) such that predicates in one layer only **negatively**/positively depend on predicates in **strictly lower**/lower or equal layers.
- Programs P that are **stratified** have an intended **standard model**  $M_P$ .
- A program is **locally stratified** iff its "propositional version" is stratified.
- Locally stratified programs allow for a unique perfect model.
- A normal program *P* may have zero or more **well-supported models**.

#### Suggested action points:

• Prove Lemma 6.5; show that every well-supported model is supported.



