#### (Using slides from Peter Flach's lectures for his book Simply Logical)

#### Prolog - Lecture 1

#### Free from Peter Flach: <a href="http://people.cs.bris.ac.uk/~flach/SimplyLogical.html">http://people.cs.bris.ac.uk/~flach/SimplyLogical.html</a>

#### **Simply Logical**

#### **Intelligent Reasoning by Example**

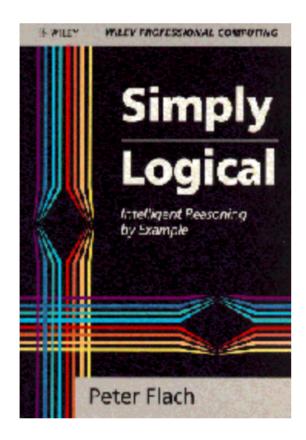
*by <u>Peter Flach</u>, then at <u>Tilburg University</u>, the Netherlands John Wiley 1994, xvi + 240 pages, ISBN 0471 94152 2 Reprinted: December 1994, July 1998.* 

This book is no longer available through John Wiley publishers. You can download a free PDF copy <u>here</u>. The PDF copy has a small number of discrepancies with the print version, including

- different page numbers from Part III (p.129)
- certain mathematical symbols are not displayed correctly, including
  - $\circ \vdash$  displayed as |
  - $\circ \not\vdash$  displayed as I;/
  - $\circ \models$  displayed as =
  - $\nvDash$  displayed as =;/
- the index is currently missing

I am working on fixing these.

- <u>Table of Contents</u>
- Foreword by Bob Kowalski
- Author's Preface
- On-line Prolog programs from the book:
  - compressed tar archive (Unix, 38K)
  - BinHex archive (Macintosh, 149K)
  - plain text files
- Teaching materials:
  - colour overhead transparencies (PowerPoint, HTML, PDF, PostScript)
  - <u>lab exercises</u>



#### **Propositional Programs**

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- A Horn clause is a clause with *at most one* positive literal (e.g.,  $p \lor \neg q \lor \neg r$ ,  $\neg p$ ,  $\neg p \lor \neg r$  are Horn clauses).
- A definite clause is a clause with exactly one positive literal (e.g.,  $p \lor \neg q \lor \neg r$ , p are definite clauses).

• A definite clause  $h \lor \neg b_1 \lor \neg b_2 \lor \ldots \lor \neg b_m$  can be written also as  $h \leftarrow b_1 \land b_2 \land \ldots \land b_m$ . Therefore we will also call definite clauses **rules**.

• A set of definite clauses will be called a **definite program** and we will also treat it, with a slight abuse of notation, as a conjunction of the clauses.

An interpretation will be represented (e.g., {p, q})

... since models are interpretations, likewise for models. That is, for instance, when φ = (a ∨ ¬b) ∧ b ∧ (c ∨ ¬d), the models of φ would be represented as {a, b}, {a, b, c}, {a, b, c, d}.

• An interpretation will be represented as a set of atoms which are true in it

#### What is true in all models...

Recall that  $\phi \models \alpha$  iff the formula  $\alpha$  is true in all models of  $\phi$ .

**Example:** 

 $\varphi = (a \Leftrightarrow (b \lor c)) \land (\neg b \lor \neg c) \land a$ 

The models of  $\varphi$  are  $\{a, b\}, \{a, c\}$ .

Although a is true in all models of  $\varphi$ , the set  $\{a\}$  is not a model of  $\varphi$ ... not that we wanted or needed it to be, but stay with us!

## **Definite Programs Are Nice!**

#### **Example:**

Consider the definite program

 $\mathcal{P} = \{a \leftarrow b, b \leftarrow c, b\}.$ 

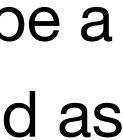
The models of this program are:  $\{a, b\}, \{a, b, c\}$ .

Their intersection  $\{a, b\}$  is a model of  $\mathscr{P}$  too (it is one of the models above after all) — **This is not a coincidence. See next!** 

#### Least Model

• **Proposition:** Let  $\mathscr{M}$  be the set of all models of a given definite program  $\mathscr{P}$ . Let us define  $\omega_{least} = \bigcap_{\omega \in \mathscr{M}} \omega$ . Then  $\omega_{least}$  is a model of  $\mathscr{P}$  (and hence  $\omega_{least} \in \mathscr{M}$ ). We call  $\omega_{least}$  the least model of  $\omega$ .

• Definition ( $T_P$ -operator, aka immediate consequence operator): Let  $\mathscr{P}$  be a definite program and  $\omega$  be an interpretation. Then the  $T_P$ -operator is defined as  $T_P(\omega) = \{ h \mid h \leftarrow b_1 \land \dots \land b_m \in \mathscr{P} \text{ and } b_1, \dots, b_m \in \omega \}.$ 



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## Least Model (Recap)

- A definite program  ${\mathscr P}$  always has a least model.
- The least model can be found using the immediate consequence operator. This is also sometimes called *forward-chaining*.
- Definite programs cannot entail negative literals—therefore the least model tells us everything we need to know about the program and what follows from it (do you see why?)

#### First-Order Programs

 Now we will upgrade definite programs from propositional to first-order. You have already seen first-order logic in the first part of the course.

- **Convention:** Variables in Prolog start with a capital letter (e.g. V), constants with a lower-case letter (e.g. carrot).

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- **Convention:** Variables in Prolog start with a capital letter (e.g. V), constants with a lower-case letter (e.g. carrot).
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• Convention: A definite clause  $h \leftarrow b_1 \land \ldots \land b_m$  will be written in Prolog notation as  $h := b_1, \ldots, b_m$ . All variables that appear in a definite clause are automatically assumed to be universally quantified (recall the definition of

function applied to a tuple of terms (e.g. g(carrot, V)).

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 Definition (Ground Term): A term is ground if it does not contain variables—e.g. carrot is a ground term, but V and g(carrot, V) are not ground.

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- Each instance of a clause is among its logical consequences.

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then the Herbrand universe of  $\mathscr{P}$  is {peter, maria}.

• If  $\mathscr{P} = \{\operatorname{num}(0), \operatorname{num}(\operatorname{suc}(X)) := \operatorname{num}(X) . \}$  then the Herbrand universe is the infinite set  $\{0, suc(0), suc(suc(0)), suc(suc(suc(0))), ...\}$ 

• **Definition (Herbrand Universe):** Given a definite program  $\mathscr{P}$ , its Herbrand *universe* is the set of all ground terms that are either constants appearing in  $\mathscr{P}$ or can be constructed from the constants and function symbols appearing in  $\mathscr{P}$ .

If  $\mathscr{P} = \{ \text{teacherOf}(\text{peter}, \text{maria}) . \text{ isStudentOf}(X, T) :- \text{teacherOf}(T, X) . \}$ 







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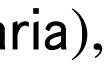
If  $\mathscr{P} = \{ \text{teacherOf}(\text{peter}, \text{maria}) . \text{ isStudentOf}(X, T) :- \text{teacherOf}(T, X) . \}$ teacherOf(peter, maria), teacherOf(maria, peter) }.

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• **Definition (Herbrand Base):** Given a definite program  $\mathscr{P}$ , its Herbrand base is the set of all ground atoms that can be constructed using the terms from the Herbrand universe of  $\mathscr{P}$ .

- then the Herbrand base of  $\mathcal{P}$  is {teacherOf(maria, maria), teacherOf(peter, peter), teacherOf(peter, maria), teacherOf(maria, peter), studentOf(peter, peter), studentOf(maria, maria),





#### **Remember:**

Herbrand universe ~ ground terms

Herbrand base ~ ground atoms

#### Setting, Notation and Terminology (6)

- Definition (Herbrand Interpretation and Herbrand Model): Given a definite program  $\mathscr{P}$ , let  $\mathscr{B}$ be its Herbrand base. A Herbrand interpretation is a subset of  $\mathscr{B}$ . A Herbrand model of  $\mathscr{P}$  is a Hebrand interpretation which is also a model of  $\mathscr{P}$ .
- **Definition (Least Herbrand Model):** Given a definite program  $\mathscr{P}$ , its least Herbrand model (LHM) is the intersection of all of its models.
- **Example:**

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- then the least Herbrand model of  $\mathscr{P}$  is {teacherOf(peter, maria), studentOf(maria, peter)}.



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  - 4.  $\omega_3 = T_P(\omega_2) = \omega_2$  (fixpoint -> we have the LHM).



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- $a \lor \neg b \lor \neg c$  b  $c \lor \neg b$

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- When we know what we want to "ask about", we can use resolution.

impractical (as we will see, in the first-order case sometimes even impossible).

• Example:  $\mathcal{P} = \{a \leftarrow b \land c, d \leftarrow e \land f, b, c \leftarrow b\}$ . We want to know whether  $\mathcal{P} \models a$ . For that we negate a (with resolution, we use proof by contradiction) and add it to  $\mathscr{P}$  and convert the implications to clauses:  $\mathscr{P} = \{ \neg a, a \lor \neg b \lor \neg c, d \lor \neg e \lor \neg f, b, c \lor \neg b \}$  and perform resolution.  $a \lor \neg b \lor \neg c \qquad b \qquad c \lor \neg b$ '**¬***C* **\_***C* 



#### **Propositional Resolution**

- Propositional resolution is
  - $\checkmark$  sound: it derives only logical consequences.
  - $\checkmark$  incomplete: it cannot derive arbitrary tautologies like  $a \Rightarrow a$ .
  - …but refutation-complete: it derives the empty clause from any
     … inconsistent set of clauses.

#### An Example (1): Full Program

likes(peter,S):-student of(S,peter)

student of(S,T):-follows(S,C),teaches(T,C)

follows(maria,ai\_techniques)

teaches(peter,ai\_techniques)

- Herbrand universe: { peter, maria, ai\_techniques }
- Herbrand base:  $\bullet$ {likes(peter, peter), likes(maria, maria), likes(peter, maria), teaches(...,..),...,

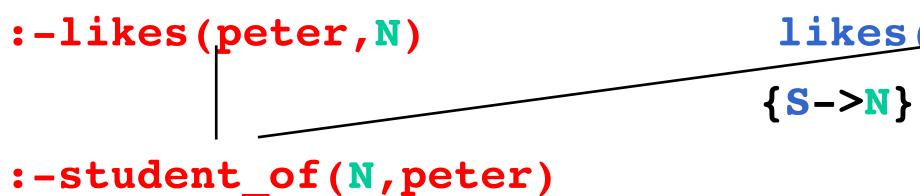
likes(maria, peter), likes(ai\_techniques, peter), ..., student\_of(peter, peter), student\_of(maria, maria), student\_of(peter, maria), student\_of(maria, peter), student\_of(ai\_techniques, peter), ...

:-likes(peter,N)

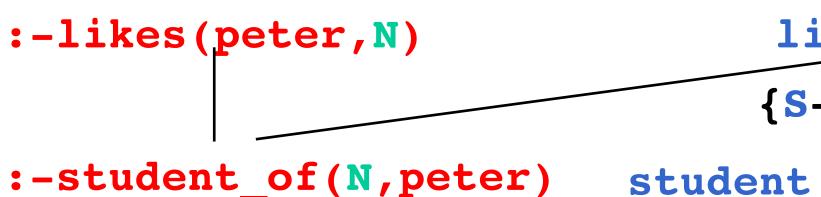
We want to query whether someone likes Peter (as a bonus we will also learn who that is!)

:-likes(peter,N)

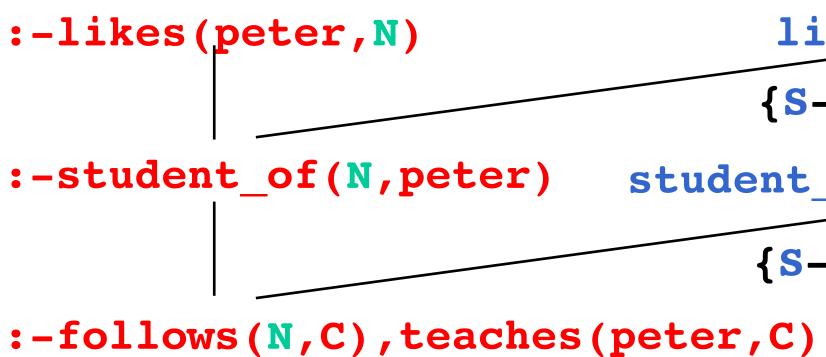
likes(peter,S):-student\_of(S,peter)



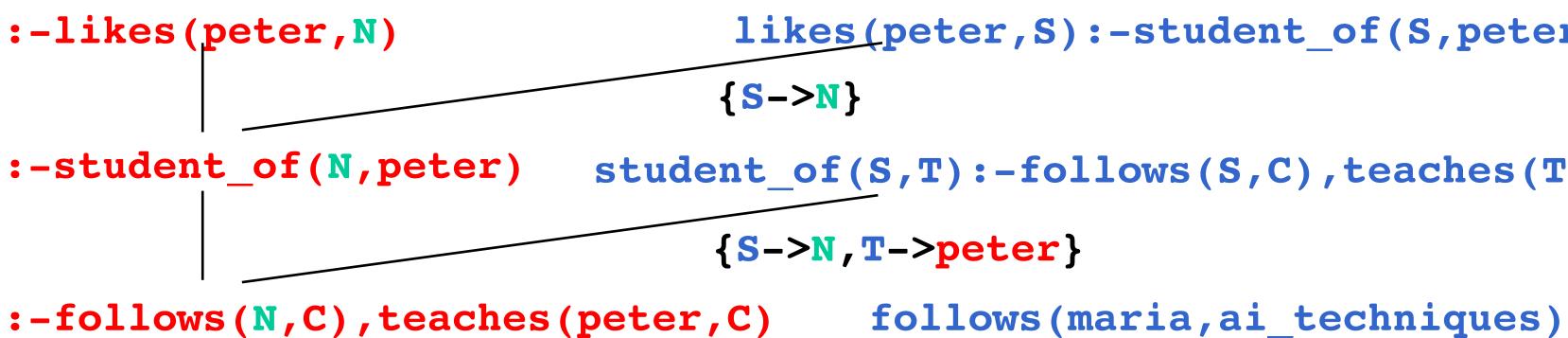
likes(peter,S):-student\_of(S,peter)



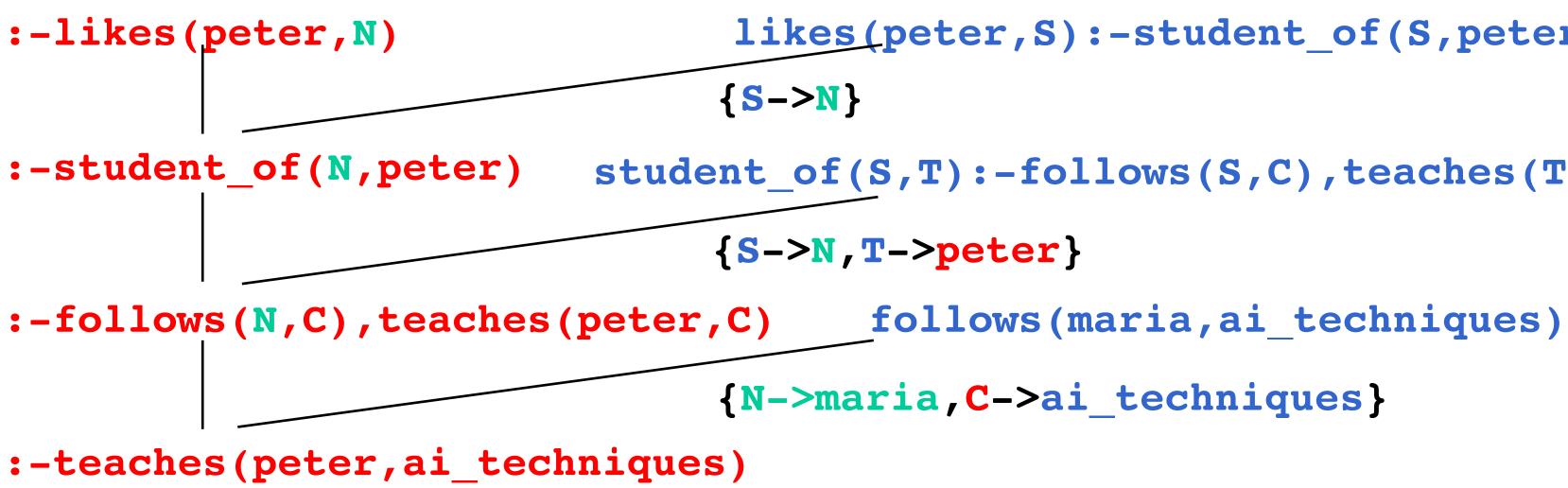
- likes(peter,S):-student\_of(S,peter)
- {**S->N**}
- student\_of(S,T):-follows(S,C),teaches(T,C)



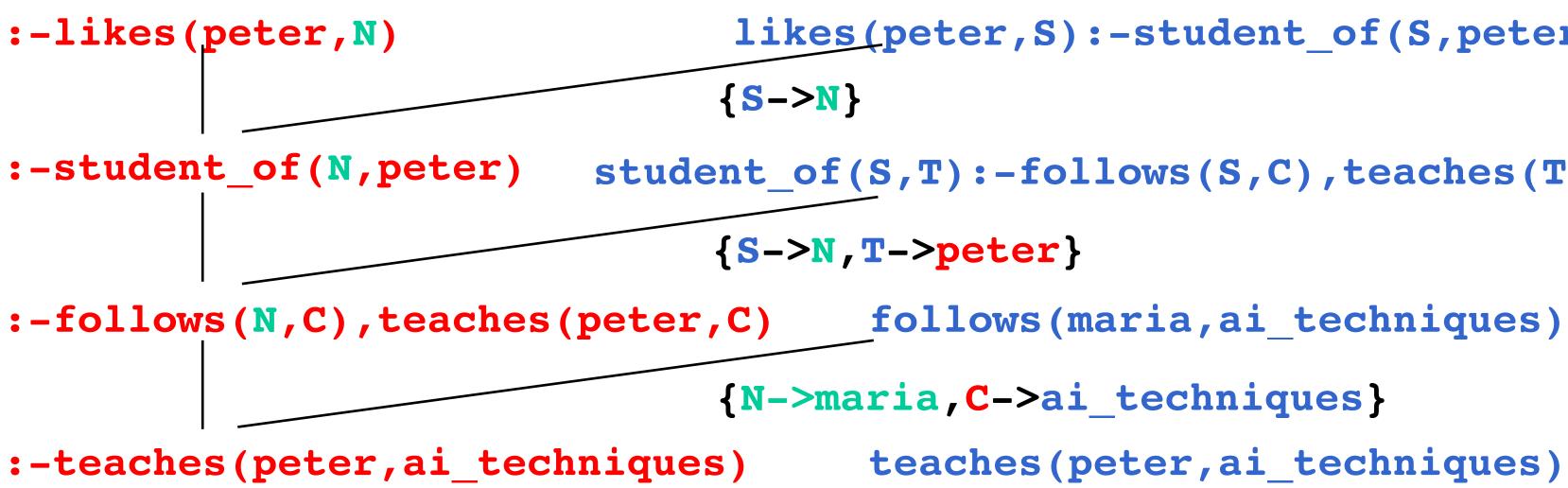
- likes(peter,S):-student\_of(S,peter)
- {**S->N**}
- student\_of(S,T):-follows(S,C),teaches(T,C)
  - {**S**->**N**,**T**->**peter**}



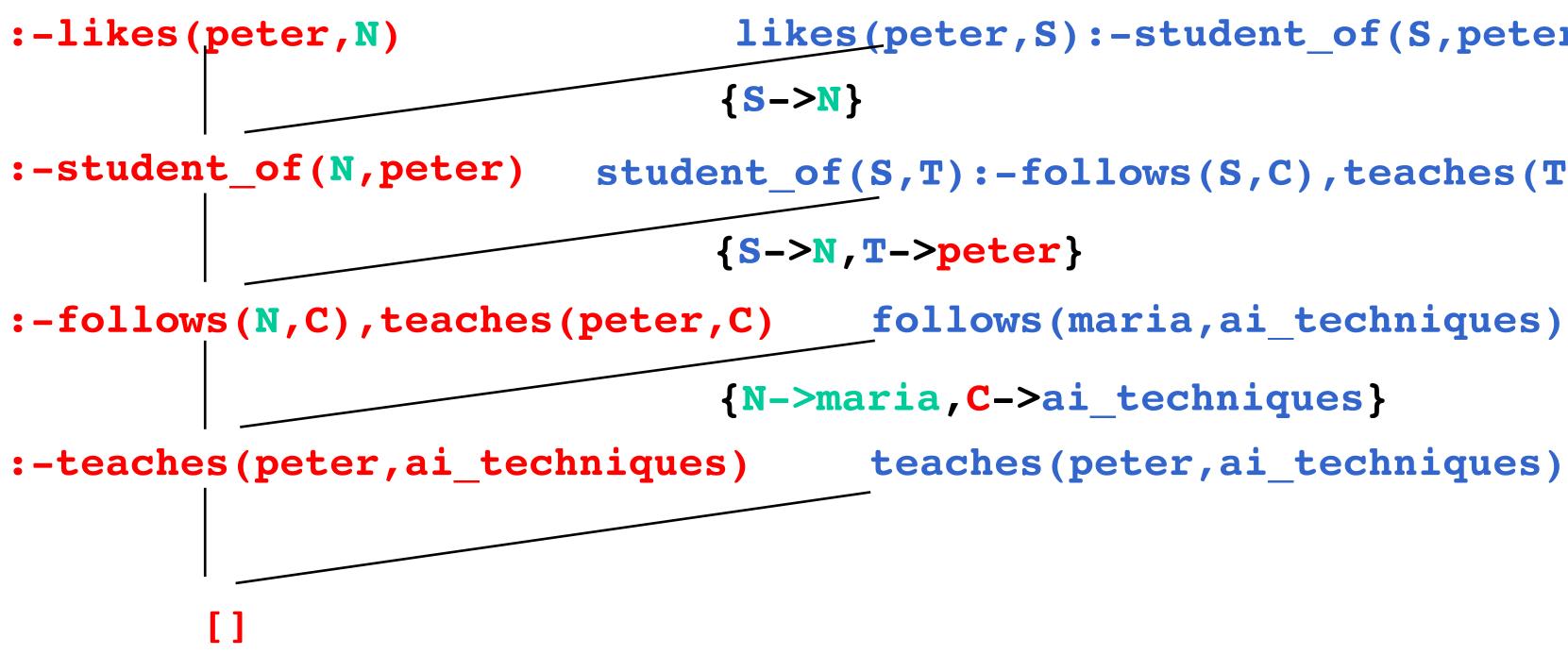
- likes(peter,S):-student\_of(S,peter)
- $\{S \rightarrow N\}$
- student\_of(S,T):-follows(S,C),teaches(T,C)
  - {**S**->**N**,**T**->**peter**}



- likes(peter,S):-student\_of(S,peter)
- {**S**->**N**}
- student\_of(S,T):-follows(S,C),teaches(T,C)
  - $\{S \rightarrow N, T \rightarrow peter\}$
  - {N->maria,C->ai\_techniques}



- likes(peter,S):-student\_of(S,peter)
- student\_of(S,T):-follows(S,C),teaches(T,C)
  - $\{S \rightarrow N, T \rightarrow peter\}$
  - {N->maria,C->ai\_techniques}
    - teaches(peter,ai\_techniques)



**N->maria** is the **answer substitution**.

- likes(peter,S):-student\_of(S,peter)
- {**S**->**N**}
- student\_of(S,T):-follows(S,C),teaches(T,C)
  - $\{S \rightarrow N, T \rightarrow peter\}$
  - {N->maria,C->ai\_techniques}
    - teaches(peter,ai\_techniques)

#### You can try to solve the previous example using the $T_P$ -operator (it is still possible here).

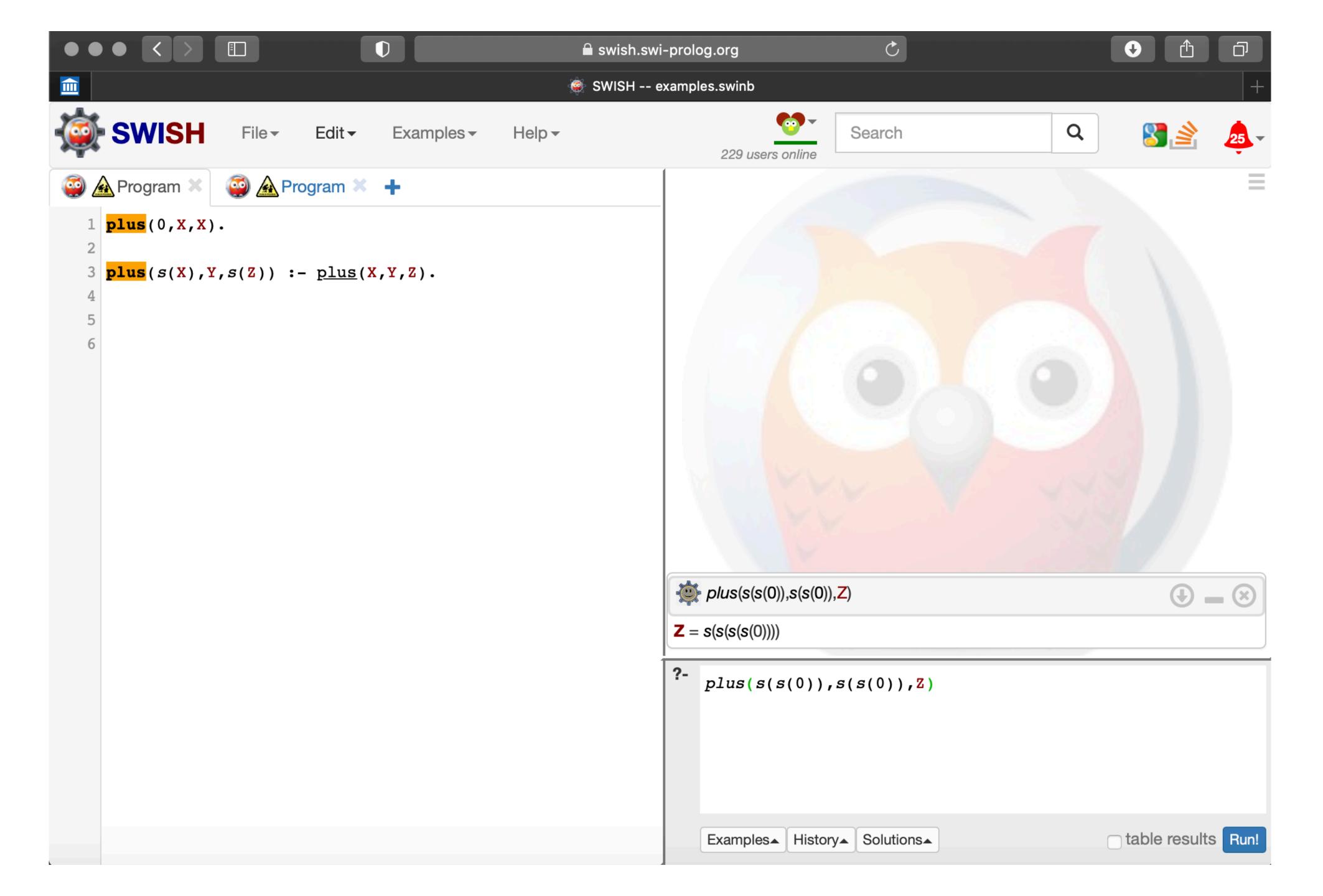
#### Some Programs Have Infinite LHMs

- chaining (using resolution) is our only hope.
- Example:

plus(0,X,X).plus(s(X), Y, s(Z)):-plus(X, Y, Z).

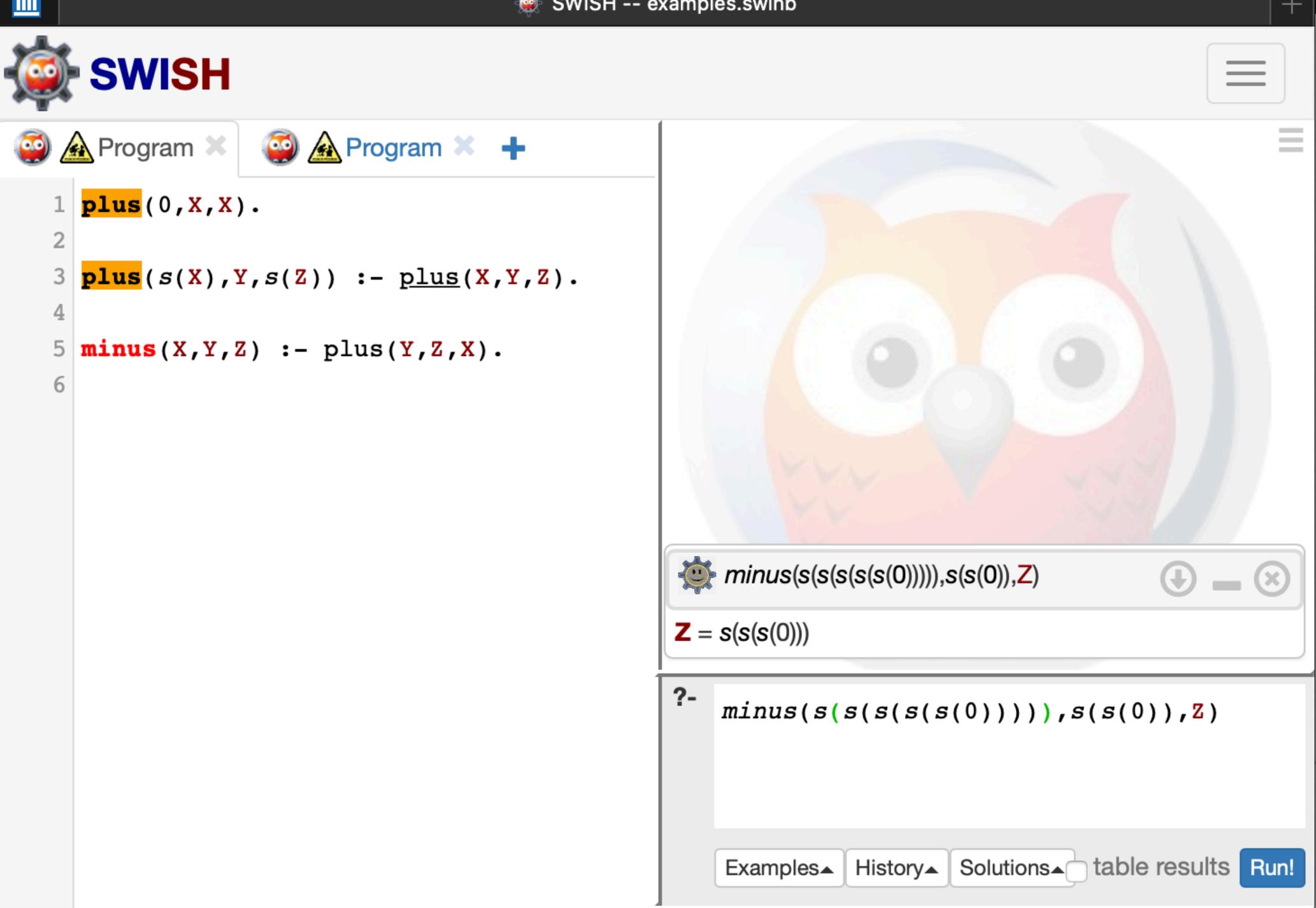
- Herbrand universe: set of ground terms  $\{0, s(0), s(s(0)), s(s(s(0))), \ldots\}$
- Herbrand base: {plus(0,0,0), plus(s(0),0,0), ..., ... }
- LHM: ... try yourself.

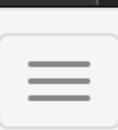
• ...for such programs we cannot construct the LHM using the  $T_P$ -operator in practice (it still works well as a theoretical construct, though) and backward



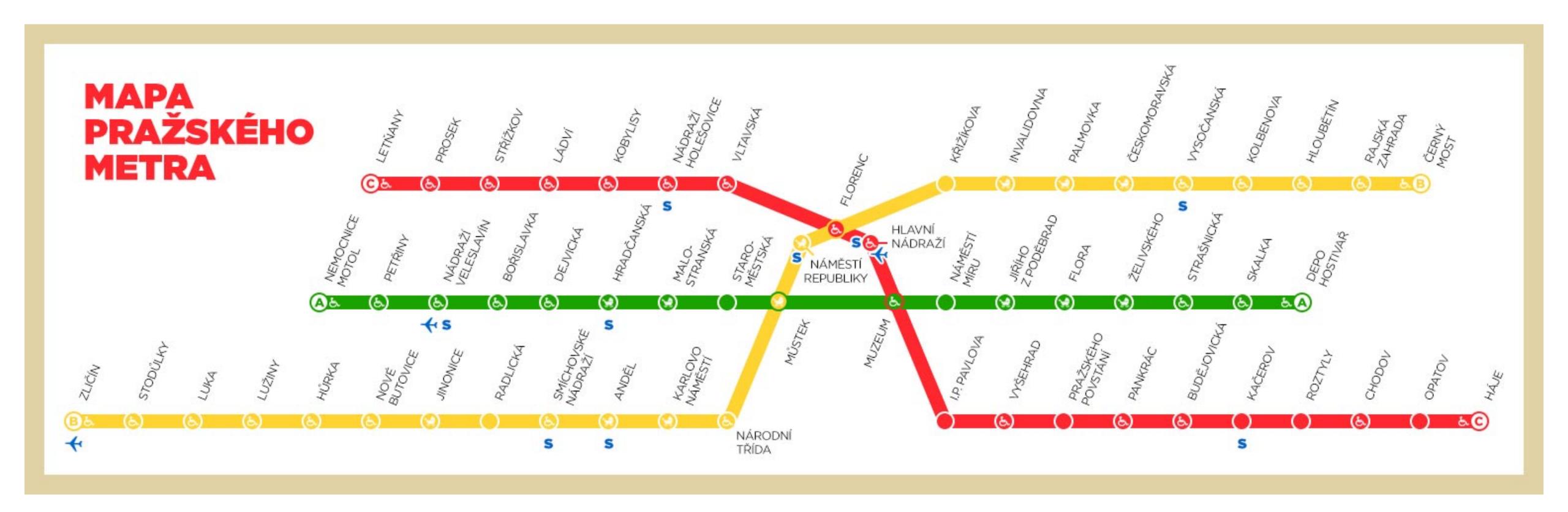
#### Now we can also get subtraction from addition (using X-Y=Z iff X=Y+Z):

minus(X,Y,Z):-plus(Y,Z,X).





#### Another Example



# A Prolog DB (1)

connected (nemocnice motol, petriny, green). connected (petriny, nadrazi veleslavin, green). connected (nadrazi veleslavin, borislavka, green). connected (borislavka, dejvicka, green). connected (dejvicka, hradcanska, green). connected (hradcanska, malostranska, green). connected (malostranska, staromestska, green). connected (staromestska, mustek, green). connected (mustek, muzeum, green). connected (muzeum, namesti miru, green). connected (namesti miru, jiriho z podebrad, green). connected (jiriho z podebrad, flora, green). connected (flora, zelivskeho, green). connected (zelivskeho, strasnicka, green). connected (strasnicka, skalka, green). connected(skalka,depo hostivar,green).

# A Prolog DB (2)

connected (letnany, prosek, red). connected (prosek, strizkov, red). connected(strizkov,ladvi,red). connected (ladvi, kobylisy, red). connected (kobylisy, nadrazi holesovice, red). connected (nadrazi holesovice, vltavska, red). connected (vltavska, florenc, red). connected(florenc,hlavni nadrazi,red). connected(hlavni nadrazi,muzeum,red). connected (muzeum, i p pavlova, red). connected(i p pavlova,vysehrad,red). connected (vysehrad, prazskeho povstani, red). connected (prazskeho povstani, pankrac, red). connected (pankrac, budejovicka, red). connected (budejovicka, kacerov, red). connected (kacerov, roztyly, red). connected (roztyly, chodov, red). connected (chodov, opatov, red). connected (opatov, haje, red).

# A Prolog DB (3)

connected(zlicin, stodulky, yellow). connected (stodulky, luka, yellow). connected (luka, luziny, yellow). connected (luziny, hurka, yellow). connected (hurka, nove butovice, yellow). connected (nove butovice, jinonice, yellow). connected (jinonice, radlicka, yellow). connected (radlicka, smichov, yellow). connected (smichov, andel, yellow). connected (andel, karlovo namesti, yellow). connected(karlovo\_namesti,narodni trida,yellow). connected(narodni trida,mustek,yellow). connected (mustek, namesti republiky, yellow). connected(namesti republiky,florenc,yellow). connected(florenc,krizikova,yellow). connected (krizikova, invalidovna, yellow). connected (invalidovna, palmovka, yellow). connected (palmovka, ceskomoravska, yellow). connected(ceskomoravska,vysocanska,yellow). connected (vysocanska, kolbenova, yellow). connected (kolbenova, hloubetin, yellow). connected (hloubetin, rajska zahrada, yellow). connected(rajska zahrada,cerny most,yellow).

## "Nearby"

Two stations are nearby if they are on the same line with at most one other station in between:

## "Nearby"

Two stations are nearby if they are on the same line with at most one other station in between:

nearby(zlicin,luka).
nearby(luka,zlicin).
nearby(zlicin,stodulky).
nearby(stodulky,zlicin).
nearby(luka,luziny).
nearby(luziny,luka).

## "Nearby"

Two stations are nearby if they are on the same line with at most one other station in between:

```
nearby(zlicin,luka).
nearby(luka,zlicin).
nearby(zlicin,stodulky).
nearby(stodulky,zlicin).
nearby(luka,luziny).
nearby(luziny,luka).
```

• • •

#### or better

nearby(X,Y):-connectedS(X,Y,L).
nearby(X,Y):-connectedS(X,Z,L),connectedS(Z,Y,L).
connectedS(X,Y,W) :- connected(X,Y,W).
connectedS(X,Y,W) :- connected(Y,X,W).

#### Compare

nearby (X, Y): -connectedS (X, Y, L).

nearby (X, Y): -connectedS (X, Z, L), connectedS (Z, Y, L).

#### with

not too far(X, Y):-connectedS(X, Y, L).

### "Not too far"

- not too far(X,Y):-connectedS(X,Z,L1),connectedS(Z,Y,L2).

#### Compare

nearby (X, Y): -connectedS (X, Y, L). nearby (X, Y): -connectedS (X, Z, L), connectedS (Z, Y, L). with

not too far(X, Y):-connectedS(X, Y, L). This can be rewritten with don't cares: not too far(X, Y):-connectedS(X, Y, ).

### "Not too far"

- not too far(X,Y):-connectedS(X,Z,L1),connectedS(Z,Y,L2).
- not too far(X,Y):-connectedS(X,Z, ),connectedS(Z,Y, ).

?-nearby(mustek,W)

?-nearby(mustek,W)

#### nearby(X1,Y1):-connected(X1,Y1,L1)





#### nearby(X1,Y1):-connected(X1,Y1,L1)

 $\{X1 \rightarrow mustek, Y1 \rightarrow W\}$ 

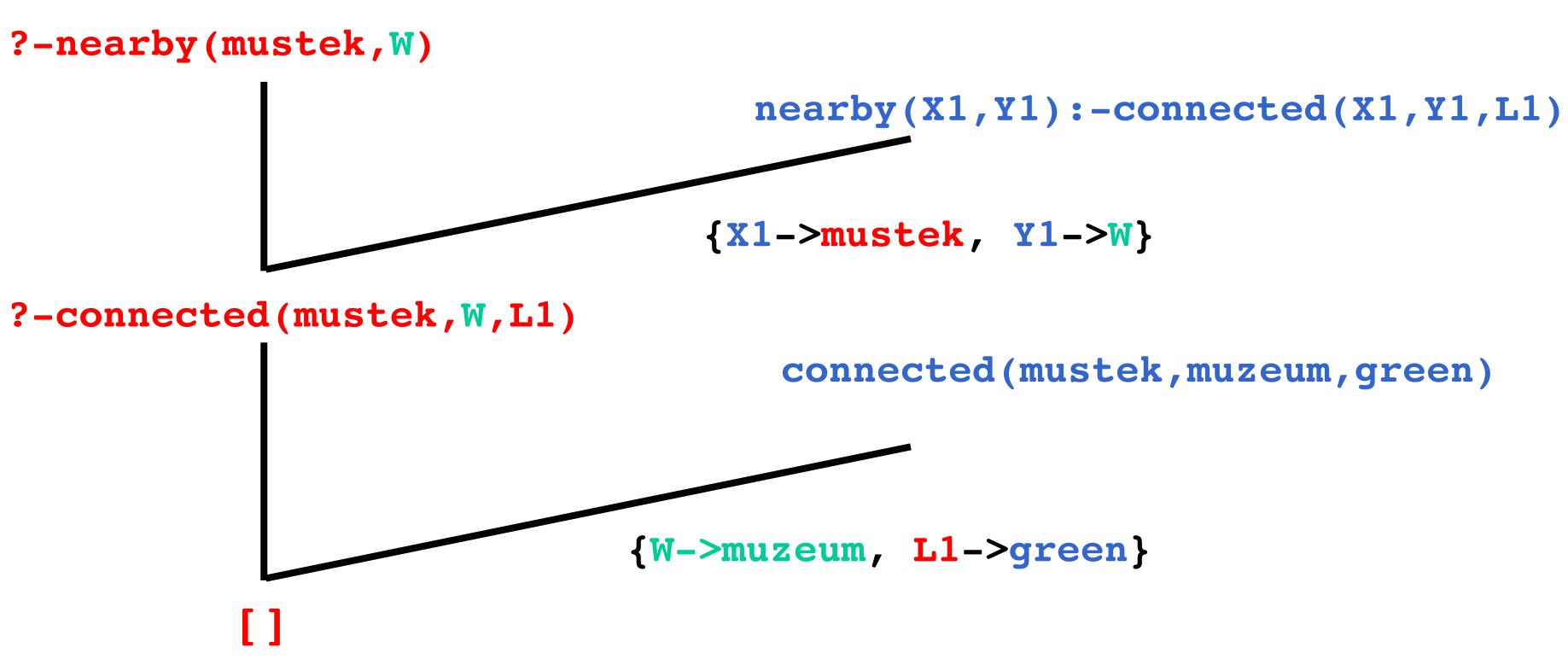




#### nearby(X1,Y1):-connected(X1,Y1,L1)

 ${X1 -> mustek, Y1 -> W}$ 

connected(mustek,muzeum,green)



### "Reachable"

A station is reachable from another if they are on the same line, or with one, two, ... changes:

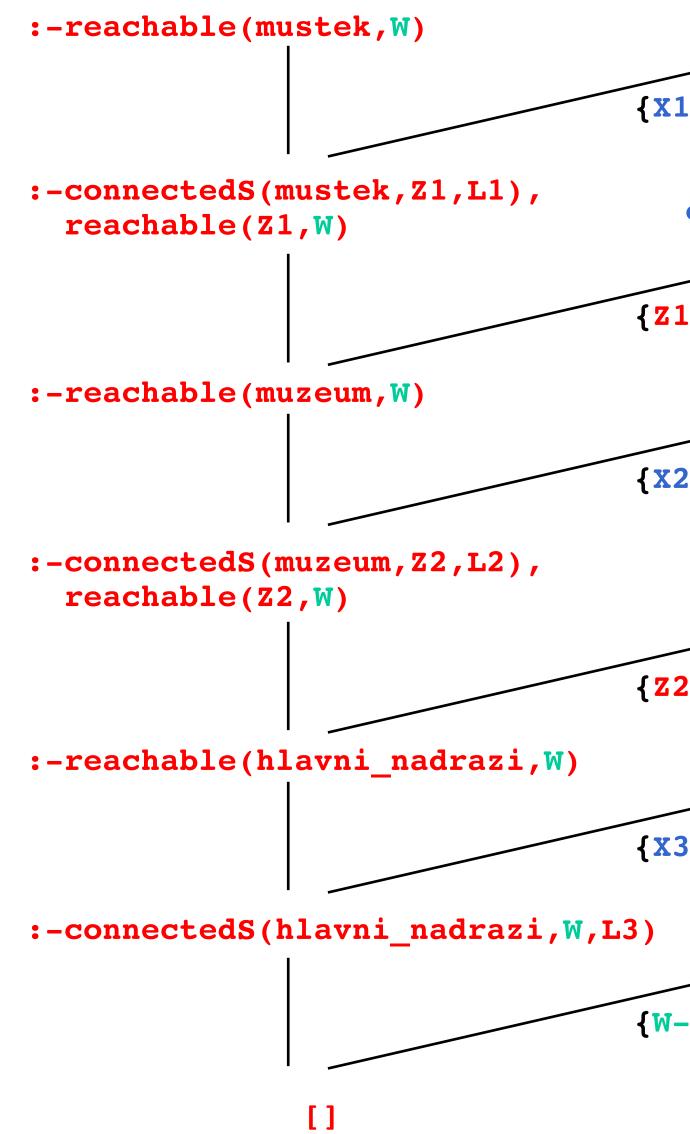
reachable (X, Y): -connectedS (X, Y, L). reachable (X, Y): -connectedS (X, Z, L1), connectedS (Z, Y, L2). reachable(X,Y):-connectedS(X,Z1,L1),connectedS(Z1,Z2,L2), connectedS(Z2,Y,L3).

or better

. . .

reachable(X,Y):-connectedS(X,Y,L). reachable (X, Y): -connectedS (X, Z, L), reachable (Z, Y).





```
reachable(X1,Y1):-connectedS(X1,Z1,L1),
                         reachable(Z1,Y1)
\{X1 \rightarrow mustek, Y1 \rightarrow W\}
  connectedS(mustek,muzeum,green)
{Z1->muzeum, L1->green}
    reachable(X2,Y2):-connectedS(X2,Z2,L2),
                         reachable(Z2,Y2)
\{X2 \rightarrow muzeum, Y2 \rightarrow W\}
             connectedS(muzeum,
                hlavni_nadrazi,
                             red)
{Z2->hlavni_nadrazi, L2->red}
        reachable(X3,Y3):-connectedS(X3,Y3,L3)
{X3->hlavni_nadrazi, Y3->W}
                connectedS(hlavni_nadrazi,
                                    florenc,
                                         red)
{W->florenc, L3->red}
```

## There is a catch!

We will talk about that next time.

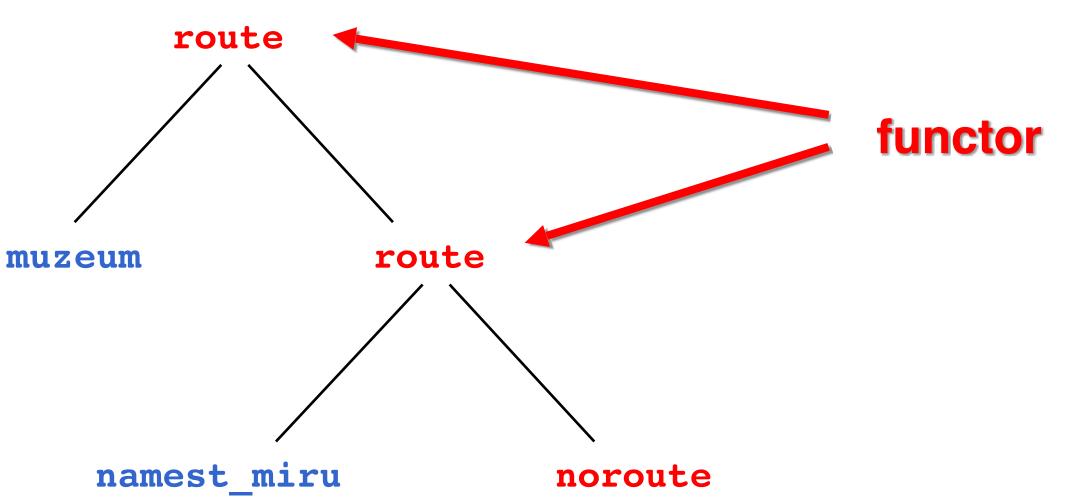
The answers that we get depend on the exact way Prolog works inside.

## "Recording the Path"

reachable(X,Y,**noroute**):-connected(X,Y,L). reachable(X,Y,route(Z,R)):-connected(X,Z,L), reachable( $\mathbb{Z}, \mathbb{Y}, \mathbb{R}$ ).

?-reachable(mustek,jiriho z podebrad,R). R = route(muzeum,route(namesti\_miru,noroute));

•••



# A Digression: Skolemization

"Everybody knows somebody."

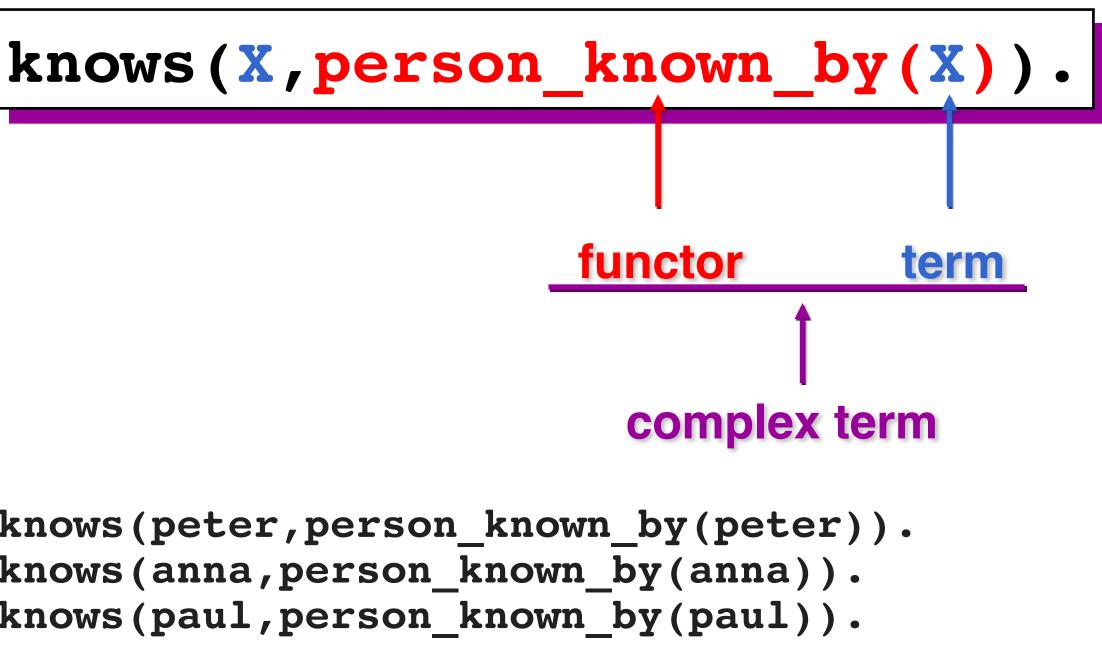
# **A Digression: Skolemization**

"Everybody knows somebody."

Skolemization to avoid an existential quantifier

knows(peter,person\_known\_by(peter)). knows(anna,person\_known\_by(anna)). knows(paul,person\_known\_by(paul)).

•••



To be continued...