- Assignment 4 is due Tomorrow.
- "Bad reasoning as well as good reasoning is possible; and this fact is the foundation of the practical side of logic."

Charles Sanders Peirce, 1877

Done:

- Syntax and semantics of propositional definite clauses
- Model a simple domain using propositional definite clauses
- Bottom-up proof procedure computes a consequence set using modus ponens.
- Top-down proof procedure answers a query using resolution.
- The box model provides a way to procedurally understand the top-down proof procedure with depth-first search.

Today:

• Logical variables and Datalog

# **Clicker** Question

In the top-down proof procedure, answer clause

yes :- happy, green, good.

can be resolved with which clause(s) in a KB

Click on:

- A (i), (ii), (iv) and (v) only
- B all of the clauses
- C(v) only
- D none of the clauses, and so the proof fails

E A-D are all incorrect



Try in Prolog:

?- trace.



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## Example: backeg.pl



:- dynamic f/0. a :- b, c, d. a :- e. b. c :- s. c :- t. d :- f. e :- t. e :- s. s. t.

Given Box diagram for a



which of the following is not true

- A a := b must be a clause in the knowledge base
- B c is called when b fails
- C a exits when b exits
- D a fails when c fails
- E one of the above is false.

Propositional definite clauses extended to have

- A variable starts with upper-case letter or with underscore ('\_')
- A constant is a sequence of letters, digits or underscore ('\_') and starts with lower-case letter or is a sequence of digits (numeral) or is any sequence of characters between single quotes.
- A predicate symbol starts with lower-case letter.
- A term is either a variable or a constant.
- An atomic symbol (atom) is of the form p or  $p(t_1, \ldots, t_n)$  where p is a predicate symbol and  $t_i$  are terms.

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For the program
hghg(Xyz,hhd) :-
    bbfj(Xyz,gfgf,Haa),
    hhhh(Haa, ggg).
```

Which of the following is not true of this program.

- A Xyz is a variable
- B hghg is a constant
- C ggg is a constant
- D Haa is a variable
- E hhhh is a predicate symbol

- Variables in a clause mean that the clause is true for all values the variables could take (Universal quantification).
- A query with variables is asking for instances of the variables that logically follow from the knowledge base.

A query is a way to ask if a body is a logical consequence of the knowledge base:

 $b_1, \cdots, b_m$ 

#### An answer is either

- an instance of the query that is a logical consequence of the knowledge base *KB*, or
- no (or false) if no instance is a logical consequence of KB.

$$KB = \begin{cases} in(kim, r123).\\ in(X, Y) :- part_of(Z, Y), in(X, Z).\\ part_of(r123, cs_building). \end{cases}$$

QueryAnswer $?part_of(r123, B)$ . $B = cs\_building$  $?part_of(r023, cs\_building)$ .no?in(kim, r023).no?in(kim, B).B = r123;<br/> $B = cs\_building$ 

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## **Electrical Environment**



% light(L) is true if L is a light  $light(l_1)$ .  $light(l_2)$ . % down(S) is true if switch S is down  $down(s_1)$ .  $up(s_2)$ .  $up(s_3)$ . % ok(D) is true if D is not broken  $ok(l_1)$ .  $ok(l_2)$ .  $ok(cb_1)$ .  $ok(cb_2)$ .

 % connected\_to(X, Y) is true if component X is connected to Y % so electricity will flow from Y to X

$$\begin{array}{c} connected\_to(w_0, w_1) \leftarrow up(s_2).\\ connected\_to(w_0, w_2) \leftarrow down(s_2).\\ connected\_to(w_1, w_3) \leftarrow up(s_1).\\ connected\_to(w_2, w_3) \leftarrow down(s_1).\\ connected\_to(w_4, w_3) \leftarrow up(s_3).\\ connected\_to(p_1, w_3).\\ \end{array}$$

$$\begin{array}{c} ?connected\_to(w_0, W). \implies W = w_1\\ ?connected\_to(w_1, W). \implies no\\ ?connected\_to(Y, w_3). \implies Y = w_2; Y = w_4; Y = p_1\\ ?connected\_to(X, W). \implies X = w_0, W = w_1; \ldots \end{array}$$

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% lit(L) is true if the light L is lit  $lit(L) \leftarrow light(L), ok(L), live(L).$ % live(C) is true if there is power coming into C  $live(Y) \leftarrow$   $connected_to(Y, Z),$  live(Z).live(outside).

This is a recursive definition of *live*.

above(X, Y) := on(X, Y).above(X, Y) := on(X, Z), above(Z, Y).

This can be seen as:

- Recursive definition of *above*: prove *above* in terms of a base case (*on*) or a simpler instance of itself; or
- Way to prove *above* by mathematical induction: the base case is when there are no blocks between X and Y, and if you can prove *above* when there are *n* blocks between them, you can prove it when there are *n* + 1 blocks.

A semantics specifies the meaning of sentences in the language. An interpretation specifies:

- what objects (individuals) are in the world
- the correspondence between symbols in the computer and objects and relations in world
  - constants denote individuals
  - predicate symbols denote relations

An interpretation is a triple  $I = \langle D, \phi, \pi \rangle$ , where

- *D*, the domain, is a nonempty set. Elements of *D* are individuals.
- φ is a mapping that assigns to each constant an element of D. Constant c denotes individual φ(c).
- $\pi$  is a mapping that assigns to each *n*-ary predicate symbol a relation: a function from  $D^n$  into {*TRUE*, *FALSE*}.

#### Constants: phone, pencil, telephone. Predicate Symbol: noisy (unary), left\_of (binary).

• 
$$\phi(\mathsf{phone}) = \mathbf{a}, \, \phi(\mathsf{pencil}) = \mathfrak{B}, \, \phi(\mathsf{telephone}) = \mathbf{a}.$$

• 
$$\pi(noisy)$$
:  $\langle \stackrel{}{\leftarrow} \rangle \quad FALSE \quad \langle \stackrel{}{\Box} \rangle \quad TRUE \quad \langle \stackrel{\otimes}{\leftarrow} \rangle \quad FALSE$   
 $\pi(left\_of)$ :  
 $\langle \stackrel{}{\leftarrow} , \stackrel{\otimes}{\leftarrow} \rangle \quad FALSE \quad \langle \stackrel{}{\leftarrow} , \stackrel{\textcircled{}{\Box} } \rangle \quad TRUE \quad \langle \stackrel{}{\leftarrow} , \stackrel{\otimes}{\leftarrow} \rangle \quad TRUE$   
 $\langle \stackrel{}{\Box} , \stackrel{}{\leftarrow} \rangle \quad FALSE \quad \langle \stackrel{}{\Box} , \stackrel{\textcircled{}{\Box} } \rangle \quad FALSE \quad \langle \stackrel{}{\Box} , \stackrel{\otimes}{\leftarrow} \rangle \quad TRUE$   
 $\langle \stackrel{}{\odot} , \stackrel{}{\leftarrow} \rangle \quad FALSE \quad \langle \stackrel{}{\Box} , \stackrel{\textcircled{}{\Box} } \rangle \quad FALSE \quad \langle \stackrel{}{\Box} , \stackrel{\otimes}{\leftarrow} \rangle \quad FALSE$ 

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- The domain *D* can contain real things (entities, objects). (e.g., a person, a room, a course). *D* can't necessarily be stored in a computer.
- π(p) specifies whether the relation denoted by the *n*-ary predicate symbol p is true or false for each n-tuple of individuals.
- If predicate symbol p has no arguments, then  $\pi(p)$  is either *TRUE* or *FALSE*.

- A constant c denotes in I the individual  $\phi(c)$ .
- Ground (variable-free) atom  $p(t_1, \ldots, t_n)$  is
  - true in interpretation I if  $\pi(p)(\langle \phi(t_1), \dots, \phi(t_n) \rangle) = TRUE$  in interpretation I and
  - false otherwise.
- Ground clause  $h := b_1, \ldots, b_m$  is *false* in interpretation *I* if *h* is *false* in *I* and each  $b_i$  is *true* in *I*, and is *true* in interpretation *I* otherwise.

## Example Truths

A true
B false
C Huh?
true
true
false
true
false
true
true
false
true

- A knowledge base, *KB*, is *true* in interpretation *I* if and only if every clause in *KB* is *true* in *I*.
- A model of a set of clauses is an interpretation in which all the clauses are *true*.
- If KB is a set of clauses and g is a conjunction of atoms, g is a logical consequence of KB, written  $KB \models g$ , if g is *true* in every model of KB.
- That is, KB ⊨ g if there is no interpretation in which KB is true and g is false.

- 1. Choose a task domain: intended interpretation.
- 2. Associate constants with individuals you want to name.
- 3. For each relation you want to represent, associate a predicate symbol in the language.
- 4. Tell the system clauses that are true in the intended interpretation: axiomatizing the domain.
- 5. Ask questions about the intended interpretation.
- 6. If  $KB \models g$ , then g must be true in the intended interpretation.

The computer doesn't know the intended interpretation and meaning of symbols, but it is important to convey the intended interpretation in comments for other people and for you in the future.

When we say "give the intended interpretation" means specify in comments what objects exist and the mappings of steps 2 and 3.

- The computer doesn't have access to the intended interpretation.
- All it knows is the knowledge base.
- The computer can determine if a formula is a logical consequence of KB.
- If  $KB \models g$  then g must be true in the intended interpretation.
- If  $KB \not\models g$  then there is a model of KB in which g is false. This could be the intended interpretation.