

# Propositional Definite Clause Logic: Syntax, Semantics, R&R and Proofs

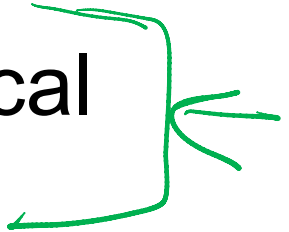
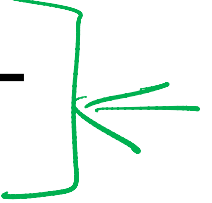


Computer Science cpssc322, Lecture 7

*(Textbook Chpt 5.1- 5.2 )*

May, 29, 2012



# Lecture Overview

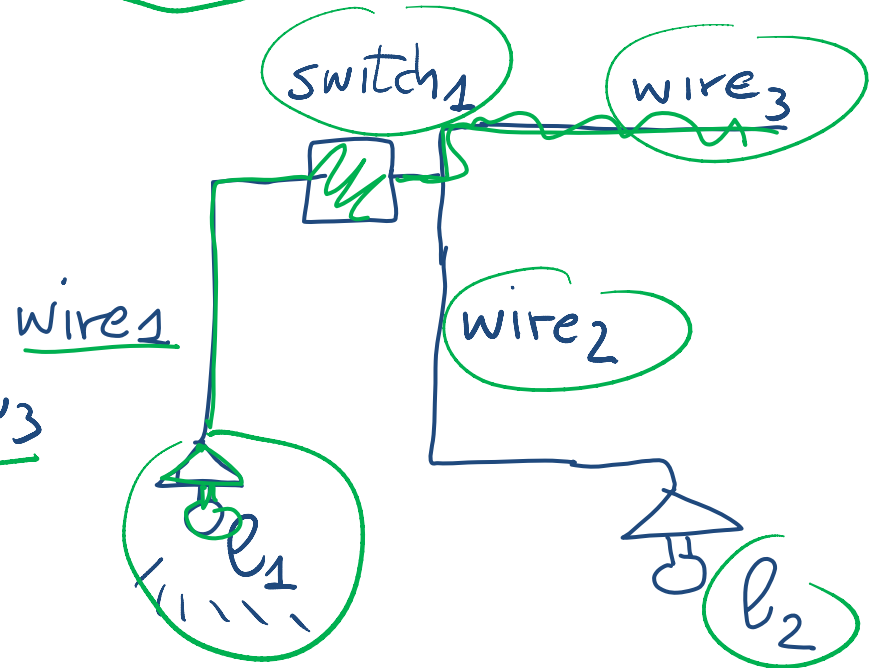
- **Recap:** Logic intro and Propositional Definite Clause (PDCL)
- **Semantics** (interpretation, model, logical consequence) 
- **Bottom-up Proof Procedure for PDCL** 
  - Soundness and Completeness
- Using PDCL for **R&R** in a domain (Electrical System) 
- **Top-Down Proof Procedure for PDCL** 

# Logics as a R&R system

Represent

- formalize a domain

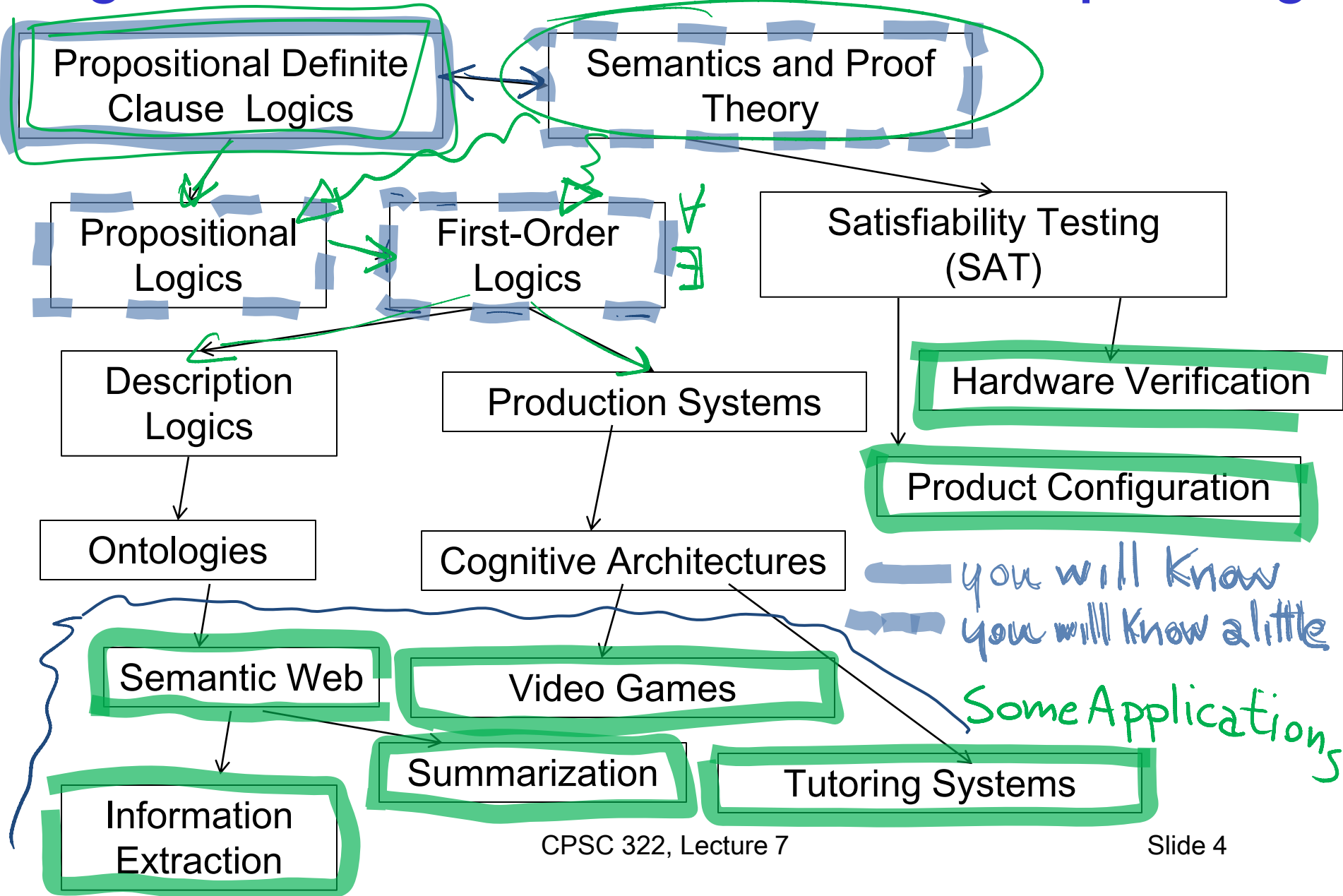
$on\_l_1 \leftarrow IF \text{ } live\_w_1$   
 $live\_w_1 \leftarrow IF \text{ } on\_sw_1 \wedge live\_w_3$   
.....



- reason about it

if the agent knows  $on\_sw_1$  and  $live\_w_3$   
it should be able to infer  $on\_l_1$

# Logics in AI: Similar slide to the one for planning





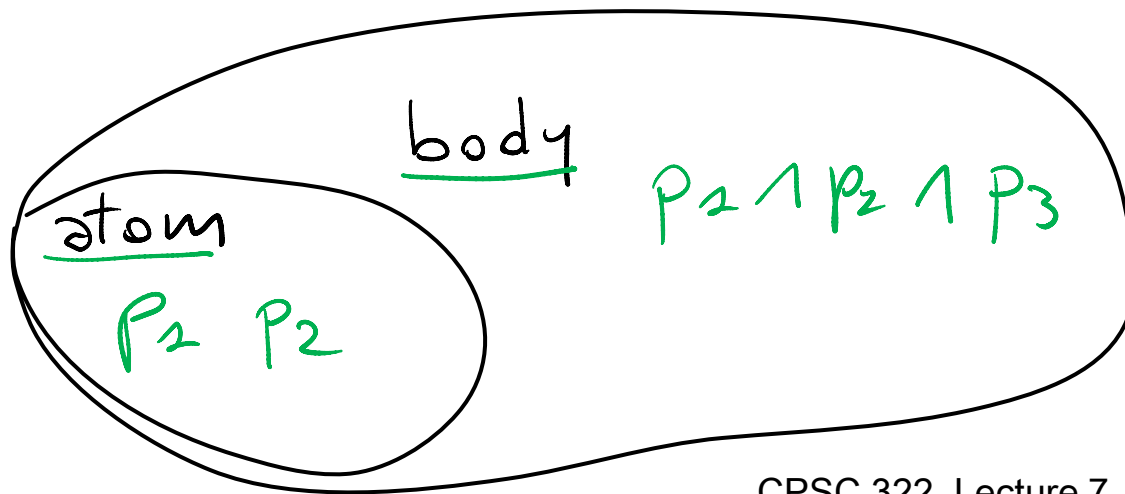
# Propositional (Definite Clauses) Logic: Syntax

We start from a restricted form of Prop. Logic:

$$\neg (p_1 \vee p_2) \Leftrightarrow (p_3 \vee \neg p_3)$$

Only two kinds of statements

- that a proposition is true
- that a proposition is true if one or more other propositions are true



definite clause is  
either an atom  
or atom  $\leftarrow$  body

$$p_3 \leftarrow p_1 \wedge p_2$$

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# Propositional Definite Clauses Semantics: Interpretation

Semantics allows you to relate the symbols in the logic to the domain you're trying to model. An **atom** can be.....  $T$   $F$

## Definition (interpretation)

An **interpretation**  $I$  assigns a truth value to each atom.

If your domain can be represented by four atoms (propositions):

$q$	$p$	$s$	$r$
$T$	$T$	$F$	$F$

$2^4$

So an interpretation is just a..... *possible world*.....

# PDC Semantics: Body

We can use the **interpretation** to determine the truth value of **clauses** and **knowledge bases**:

**Definition** (truth values of statements): A **body**  $b_1 \wedge b_2$  is true in  $I$  if and only if  $b_1$  is true in  $I$  and  $b_2$  is true in  $I$ .

	p	q	r	s	$p \wedge r$	$p \wedge r \wedge s$
$I_1$	true	true	true	true	T	T
$I_2$	false	false	false	false	F	F
$I_3$	true	true	false	false	F	F
$I_4$	true	true	true	false	T	F
$I_5$	true	true	false	true	F	F

# PDC Semantics: definite clause

**Definition** (truth values of statements cont'): A rule  $h \leftarrow b$  is false in  $I$  if and only if  $b$  is true in  $I$  and  $h$  is false in  $I$ .

	p	q	r	s	$p \leftarrow s$	$s \leftarrow q \wedge r$
$I_1$	<u>true</u>	true	true	<u>true</u>	T	T
$I_2$	<u>false</u>	false	false	<u>false</u>	T	T
$I_3$	true	<u>true</u>	false	<u>false</u>	T	T
$I_4$	<u>true</u>	<u>true</u>	<u>true</u>	<u>false</u>	T	F
.....	<u>F</u>	.....	.....	<u>T</u>	F	

In other words: "if  $b$  is true I am claiming that  $h$  must be true, otherwise I am not making any claim"

# PDC Semantics: Knowledge Base (KB)

- A **knowledge base KB** is true in  $I$  if and only if every clause in KB is true in  $I$ .

	p	q	r	s
$I_1$	<i>true</i>	<i>true</i>	<i>false</i>	<i>false</i>

$KB_1$

$p$   
 $r$   
 $s \leftarrow q \wedge p$

$KB_2$

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

$KB_3$

$p$   
 $q \leftarrow r \wedge s$

Which of the three KB above are True in  $I_1$

# PDC Semantics: Knowledge Base (KB)

- A **knowledge base KB** is true in  $I$  if and only if every clause in KB is true in  $I$ .

	p	q	r	s
$I_1$	<i>true</i>	<i>true</i>	<i>false</i>	<i>false</i>

**$KB_1$**

$p$   
 $r$   
 $s \leftarrow q \wedge p$

**$KB_2$**

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

**$KB_3$**

$p$   
 $q \leftarrow r \wedge s$

Which of the three KB above are True in  $I_1$  ?  **$KB_3$**

# Models

## Definition (model)

A **model** of a set of clauses (a KB) is an interpretation in which all the clauses are *true*.





# Example: Models

$$KB = \begin{cases} p \leftarrow q. \\ q. \\ r \leftarrow s. \end{cases}$$

	p	q	r	s	
$\rightarrow I_1$	true	true	true	true	M
$I_2$	false	false	false	false	X
$I_3$	true	true	false	false	M
$I_4$	true	true	true	false	M
$I_5$	true	true	false	true	X

*Which interpretations are models?*

# Logical Consequence

## Definition (logical consequence)

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  $KB$ .

- we also say that  $G$  **logically follows** from  $KB$ , or that  $KB$  **entails**  $G$ .
- In other words,  $KB \models G$  if there is no interpretation in which  $KB$  is *true* and  $G$  is *false*.

# Example: Logical Consequences

	p	q	r	s
I <sub>1</sub>	true	true	true	true
I <sub>2</sub>	true	true	true	false
I <sub>3</sub>	true	true	false	false
I <sub>4</sub>	true	true	false	true
I <sub>5</sub>	false	true	true	true
I <sub>6</sub>	false	true	true	false
I <sub>7</sub>	false	true	false	false
I <sub>8</sub>	false	true	false	true
...	...	...	...	...

*Models*

$$KB = \begin{cases} p \leftarrow q. \checkmark \\ \underline{q}. \\ r \leftarrow s. \checkmark \end{cases}$$

$2^4 = 16$  interpretations in total, only 3 are models

remaining 8 cannot be models because q is false

Which of the following is true?

- $KB \models q$ ,  $KB \models p$ ,  $KB \not\models s$ ,  $KB \not\models r$

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# One simple way to prove that $G$ logically follows from a KB

- Collect all the models of the KB
- Verify that  $G$  is true in all those models

→ a set of atoms

$P_1, P_2, \dots$

*Any problem with this approach?*

intractable time complexity

you have to check all the  $2^n$  interpretations

- The goal of proof theory is to find **proof procedures** that allow us to prove that a logical formula follows from a KB avoiding the above  
*is logically entailed by*

# Soundness and Completeness

- If I tell you I have a proof procedure for PDCL
- What do I need to show you in order for you to trust my procedure?
- $KB \vdash G$  means  $G$  can be derived by my proof procedure from  $KB$ .
- Recall  $KB \models G$  means  $G$  is true in all models of  $KB$ .

## Definition (soundness)


A proof procedure is **sound** if  $KB \vdash G$  implies  $KB \models G$ .

## Definition (completeness)

A proof procedure is **complete** if  $KB \models G$  implies  $KB \vdash G$ .

# Bottom-up Ground Proof Procedure

One **rule of derivation**, a generalized form of *modus ponens*:

  
If “ $h \leftarrow b_1 \wedge \dots \wedge b_m$ ” is a clause in the knowledge base, and each  $b_i$  has been derived, then  $h$  can be derived.

You are **forward chaining** on this clause.  
(This rule also covers the case when  $m=0$ .)

# Bottom-up proof procedure

$KB \vdash G$  if  $G \subseteq C$  at the end of this procedure:

$C := \{\}$ ;

repeat

select clause " $h \leftarrow b_1 \wedge \dots \wedge b_m$ " in  $KB$  such  
that  $b_i \in C$  for all  $i$ , and  $h \notin C$ ;

$C := C \cup \{h\}$

until no more clauses can be selected.



# Bottom-up proof procedure: Example

BU

$z \leftarrow f \wedge e \leftarrow$

$C = \{+, r, b, a, e, z\}$

$q \leftarrow f \wedge g \wedge z \leftarrow$

$e \leftarrow a \wedge b \leftarrow$

$a \leftarrow$

$b \leftarrow$

$r \leftarrow$

$f \leftarrow$

$C := \{\};$

repeat

select clause " $h \leftarrow b_1 \wedge \dots \wedge b_m$ " in  $KB$  such that  $b_i \in C$  for all  $i$ , and  $h \notin C$ ;

$C := C \cup \{h\}$

until no more clauses can be selected.

BU can derive  
 $r \wedge z$

$KB \vdash_{BU} r \wedge z$   $q? z?$

BU cannot derive

$KB \not\vdash_{BU} q$

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# Soundness of bottom-up proof procedure

Generic Soundness of proof procedure:

If G can be proved by the procedure ( $KB \vdash G$ )  
then G is logically entailed by the KB ( $KB \models G$ )

For Bottom-Up proof

if  $G \subseteq C$  at the end of procedure  
then G is logically entailed by the KB

So BU is sound, if all the atoms in... $C$ ..

are logically entailed by the KB

# Soundness of bottom-up proof procedure

Suppose this is not the case. 

1. Let  $h$  be the first atom added to  $C$  that is not entailed by  $KB$  (i.e., that's *not true* in every model of  $KB$ )
2. Suppose  $h$  isn't true in model  $M$  of  $KB$ .
3. Since  $h$  was added to  $C$ , there must be a clause in  $KB$  of form:  $h \leftarrow b_1 \wedge \dots \wedge b_m$
4. Each  $b_i$  is true in  $M$  (because of 1.).  $h$  is false in  $M$ .  
So..... *the clause is false in  $M$*
5. Therefore  *$M$  is not a model*
6. Contradiction! thus no such  $h$  exists.

# Learning Goals for today's class – part1

**You can:**

- Verify whether an **interpretation** is a **model** of a PDCL KB.
- Verify when a conjunction of atoms is a **logical consequence** of a knowledge base.
- Define/read/write/trace/debug the **bottom-up proof procedure**.
- Prove that BU proof procedure is **sound**

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30 mins  
BREAK

# Completeness of Bottom Up

**Generic Completeness of proof procedure:**

If  $G$  is logically entailed by the KB ( $KB \models G$ )  
then  $G$  can be proved by the procedure ( $KB \vdash G$ )

$$G \subseteq C$$

**Sketch of our proof:**

1. Suppose  $KB \models G$ . Then  $G$  is true in all models of  $KB$ .
2. Thus  $G$  is true in any particular model of KB
3. We will define a model so that if  $G$  is true in that model,  $G$  is proved by the bottom up algorithm.  $G \subseteq C$
4. Thus  $KB \vdash_{BU} G$ .

## Let's work on step 3

3. We will define a model so that if  $G$  is true in that  
⇒ model,  $G$  is proved by the bottom up algorithm.

$$G \subseteq C$$

3.1 We will define an interpretation  $I$  so that if  $G$  is  
⇒ true in  $I$ ,  $G$  is proved by the bottom up algorithm.

$$G \subseteq C$$

3.2 We will then show that .....  $I$  ..... is a model



# Let's work on step 3.1

3.1 Define interpretation  $I$  so that if  $G$  is true in  $I$ ,  
Then  $G \subseteq C$ .

Let  $I$  be the interpretation in which every element  
of  $C$  is *true* and every other atom is *false*.

$a \leftarrow e \wedge g.$

$b \leftarrow f \wedge g.$

$c \leftarrow e.$

$f \leftarrow c \wedge e.$

$e.$

$d.$

$F \quad F \quad T \quad T \quad T \quad T \quad F$   
 $\{a, b, c, d, e, f, g\}$

$C$

- $\{\}$
- $\{e\}$
- $\{e, d\}$
- $\{e, d, c\}$
- $\{e, d, c, f\}$

## Let's work on step 3.2

**Claim:**  $I$  is a model of  $KB$  (we'll call it the minimal model).

**Proof:** Assume that  $I$  is not a model of  $KB$ .

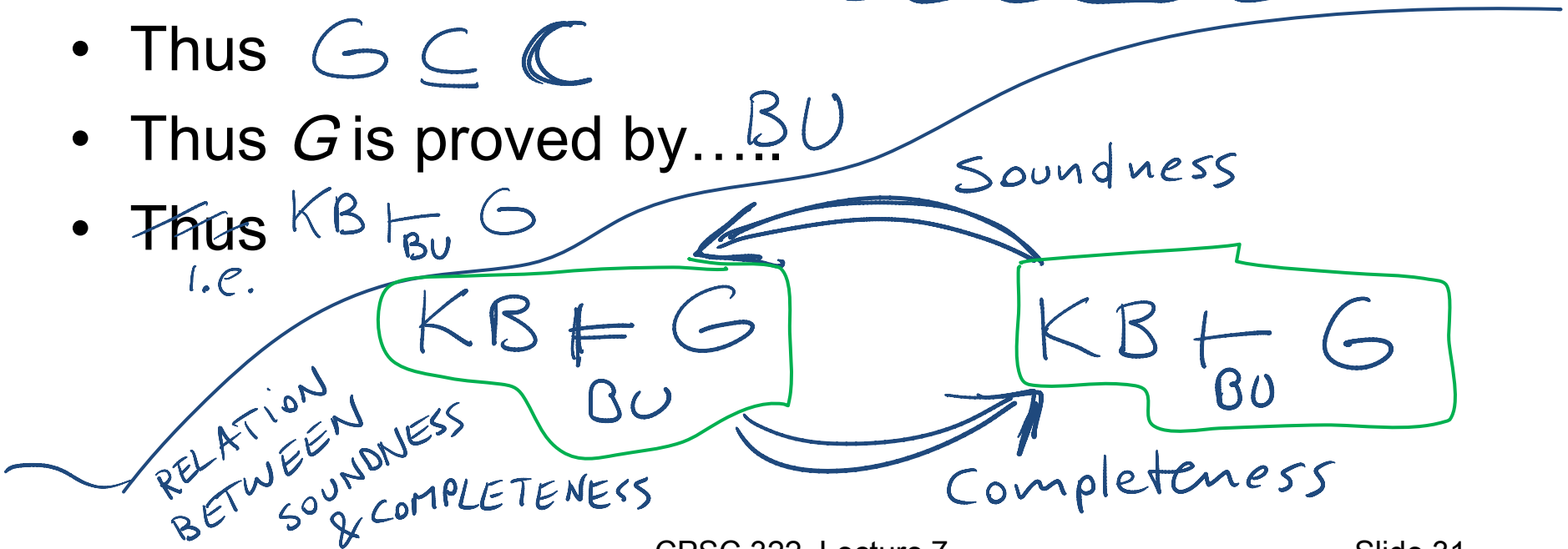
- Then there must exist some clause  $h \leftarrow b_1 \wedge \dots \wedge b_m$  in  $KB$  (having zero or more  $b_i$ 's) which is false in  $I$ .
- The only way this can occur is if  $b_1 \dots b_m$  are true in  $I$  (i.e., are in  $C$ ) and  $h$  is false in  $I$  (i.e., is not in  $C$ ).
- But if each  $b_i$  belonged to  $C$ , Bottom Up would have added  $h$  to  $C$  as well.
- So, there can be no clause in the  $KB$  that is false in interpretation  $I$  (which implies the claim :-)

# Completeness of Bottom Up

(proof summary)

If  $KB \models G$  then  $KB \vdash_{BU} G$

- Suppose  $KB \models G$ .
- Then  $G$  is true in all the models
- Thus  $G$  is true in the minimal model
- Thus  $G \subseteq C$
- Thus  $G$  is proved by....  $BU$
- Thus  $KB \vdash_{BU} G$   
i.e.



# Soundness & completeness of proof procedures

- A proof procedure X is sound ...

$$KB \vdash_X G \Rightarrow KB \models G$$

- A proof procedure X is complete....

$$KB \models G \Rightarrow KB \vdash_X G$$

- BottomUp for PDCL is  $\leftarrow$   
sound & complete

- We proved this in general even for domains represented by thousands of propositions and corresponding KB with millions of definite clauses !

# An exercise for you $BU C = \{d, e, c, f\}$

Let's consider these two alternative proof procedures for PDCL

A.  $C_A = \{\text{All clauses in KB with empty bodies}\}$   
 $= \{e, d\}$

B.  $C_B = \{\text{All atoms in the knowledge base}\}$   
 $\{e, d, f, c, g, a\}$

**KB**

$a \leftarrow e \wedge g.$

$b \leftarrow f \wedge g.$

$c \leftarrow e.$

$f \leftarrow c$

$e.$

$d.$

**Both A and B are sound and complete**

**Both A and B are neither sound nor complete**

**A is sound only and B is complete only**



**A is complete only and B is sound only**

# Can you think of a proof procedure for PDCL....

A:  $\underline{C_A} = \{\text{all clauses with empty bodies}\}$

$$KB \vdash_A G \quad G \subseteq \underline{C_A} \subseteq C_{BU}$$

B:  $C_B = \{\text{all atoms of } KB\}$

$$KB \vdash_B G \quad G \subseteq \underline{C_B} \quad C_{BU} \subseteq C_B$$

• That is sound but not complete?

$$\{KB \vdash_A G\} \Rightarrow KB \models G$$

$$\{ \Rightarrow G \subseteq \underline{C_A} \subseteq C_{BU} \Rightarrow KB \vdash_{BU} G \} \Rightarrow KB \models G$$

• That is complete but not sound?

$$KB \models G \Rightarrow KB \vdash_B G$$

$$KB \models G \Rightarrow KB \vdash_{BU} G \Rightarrow G \subseteq C_{BU} \Rightarrow G \subseteq C_B \Rightarrow KB \vdash_B G$$

$$\begin{array}{l} a \leftarrow e \wedge g. \\ b \leftarrow f \wedge g. \\ c \leftarrow e. \\ f \leftarrow c \wedge e. \end{array}$$

KB

e.

d.

$C_A$

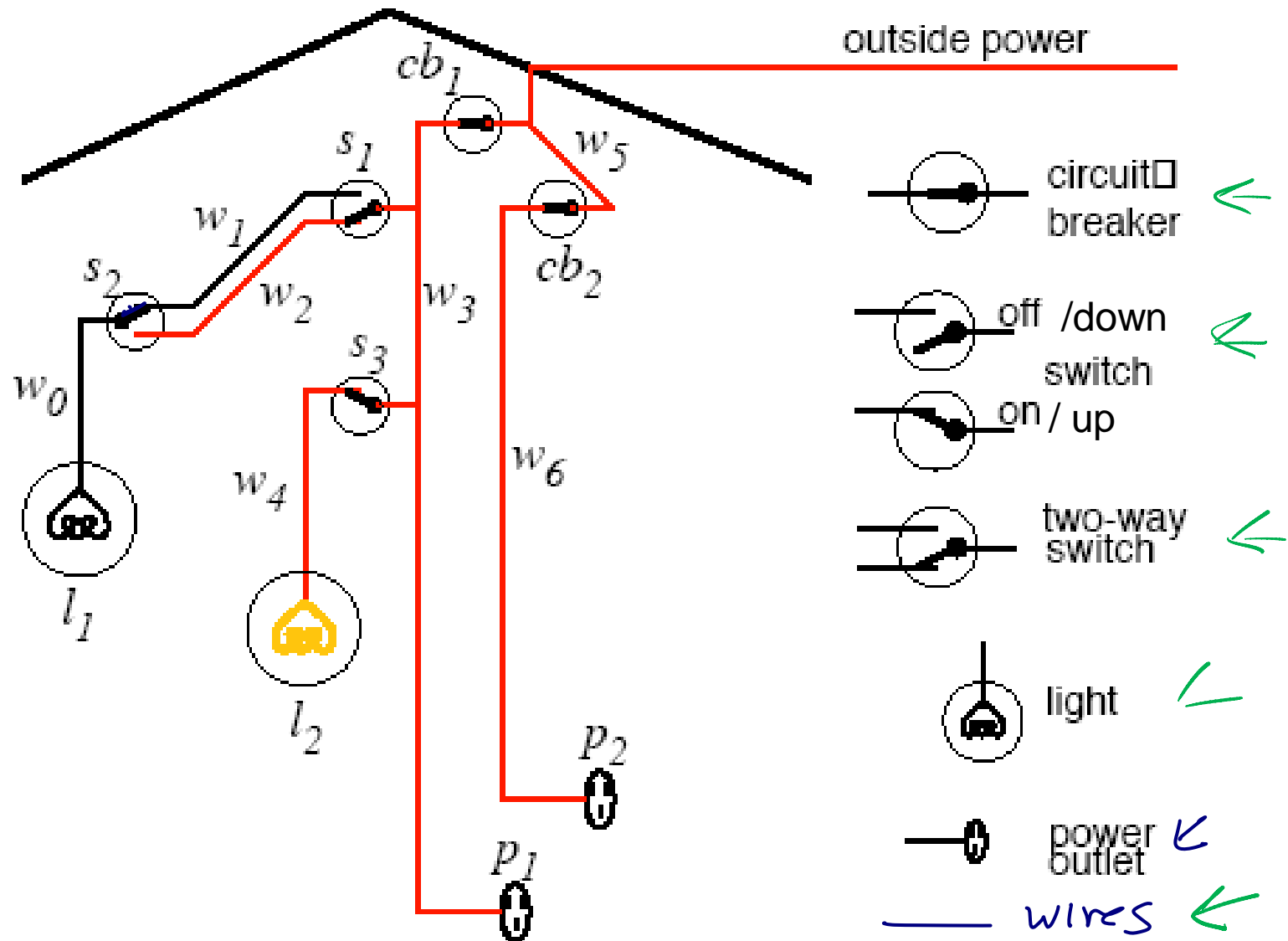
$$C_B \{a, b, c, d, e, f, g\}$$

↑  
soundness of BU

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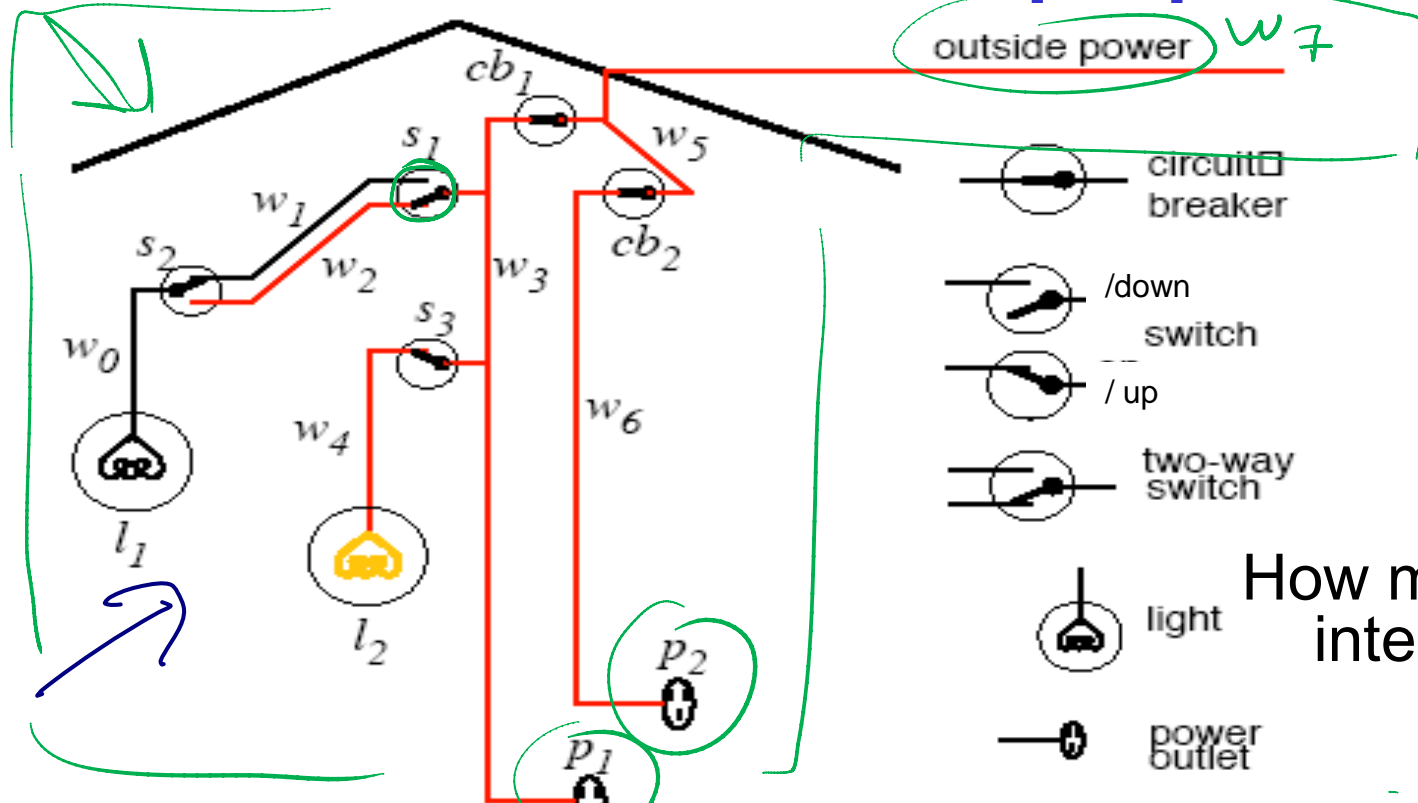
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# Electrical Environment





# Let's define relevant propositions



- For each wire  $w$  *live- $w_i$*
- For each circuit breaker  $cb$  *ok- $cb_i$*
- For each switch  $s$  *up- $s_i$ , down- $s_i$*
- For each light  $l$  *live- $l_i$*
- For each outlet  $p$  *live- $p$*

outside power  $w_7$

circuit breaker

/down  
switch

/up

two-way switch

light

power outlet

How many interpretations?

$$2^{19}$$

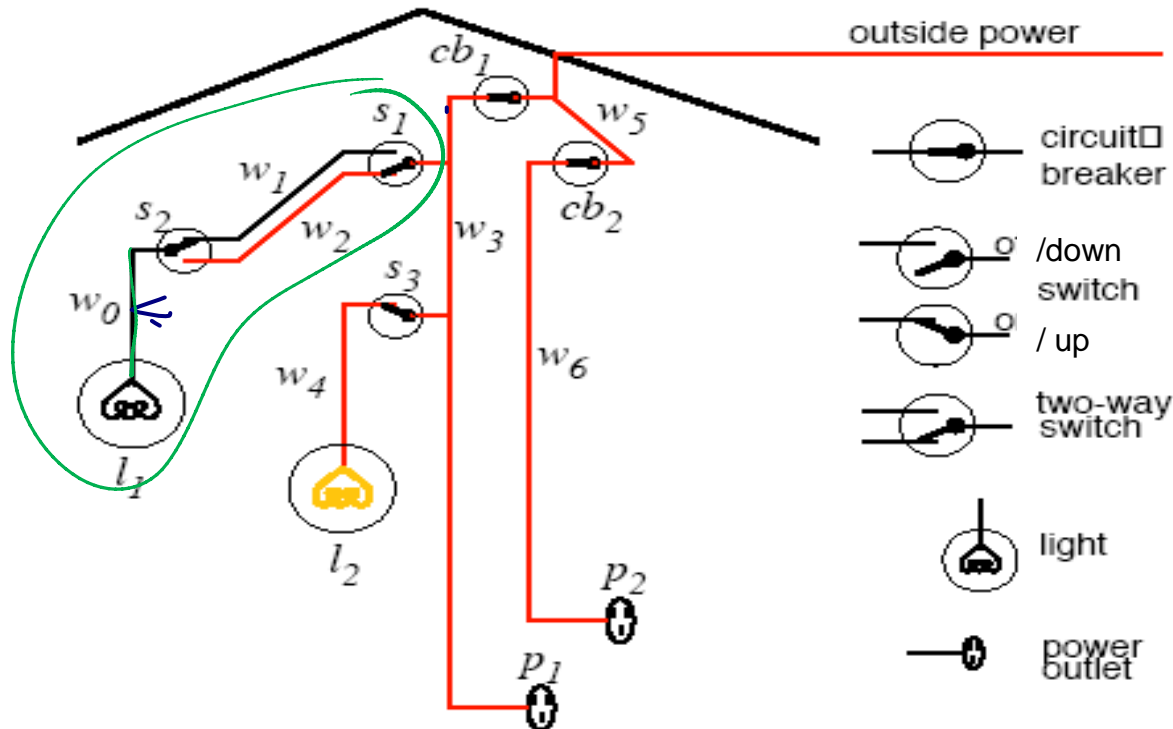
$\sim 5 \times 10^5$

19

$$\begin{array}{r} \cdot 7 \\ \cdot 2 \\ \cdot 3 \times 2 \\ \cdot 2 \\ \cdot 2 \end{array}$$

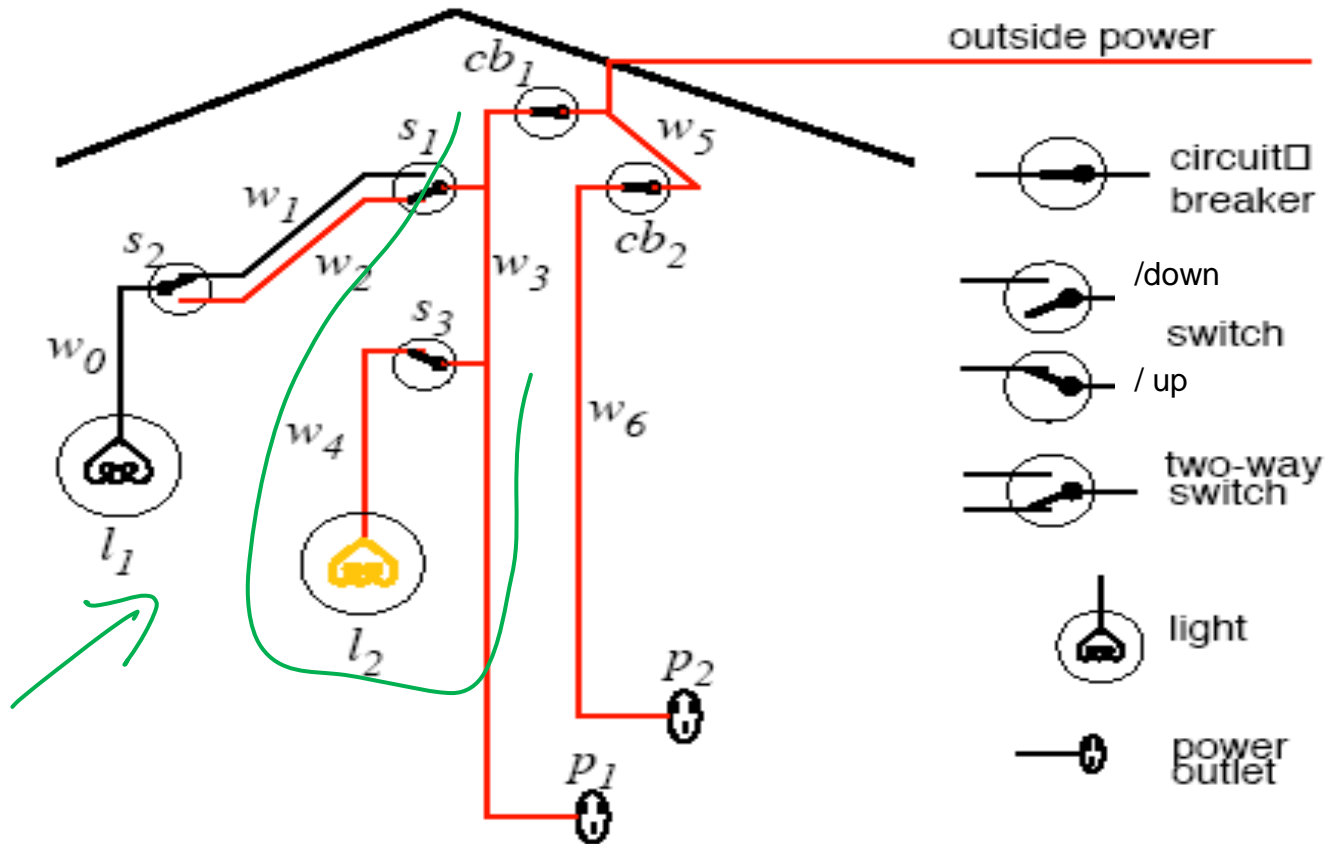
Slide 37

# Let's now tell system knowledge about how the domain works



$live\_l_1 \leftarrow live\_w_0$   
 $live\_w_0 \leftarrow up_{s_2} \wedge live\_w_1$   
 $live\_w_0 \leftarrow down_{s_2} \wedge live\_w_2$   
 $live\_w_1 \leftarrow up_{s_1} \wedge live\_w_3$

# More on how the domain works....



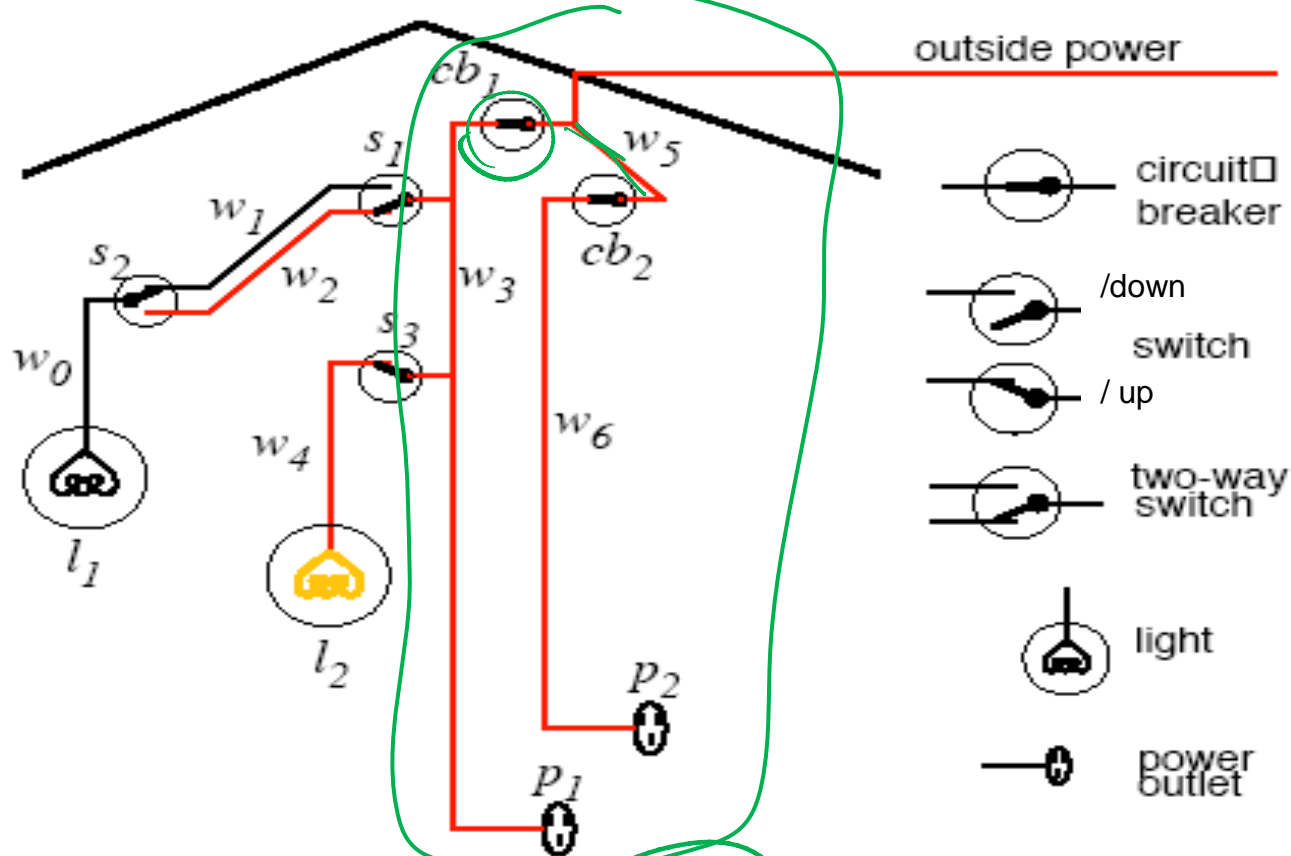
$live\_w_2 \leftarrow live\_w_3 \wedge down\_s_1.$

$live\_l_2 \leftarrow live\_w_4.$

$live\_w_4 \leftarrow live\_w_3 \wedge up\_s_3.$

$live\_p_1 \leftarrow live\_w_3.$

# More on how the domain works....



$live\_w_3 \leftarrow live\_w_5 \wedge ok\_cb_1.$

$live\_p_2 \leftarrow live\_w_6.$

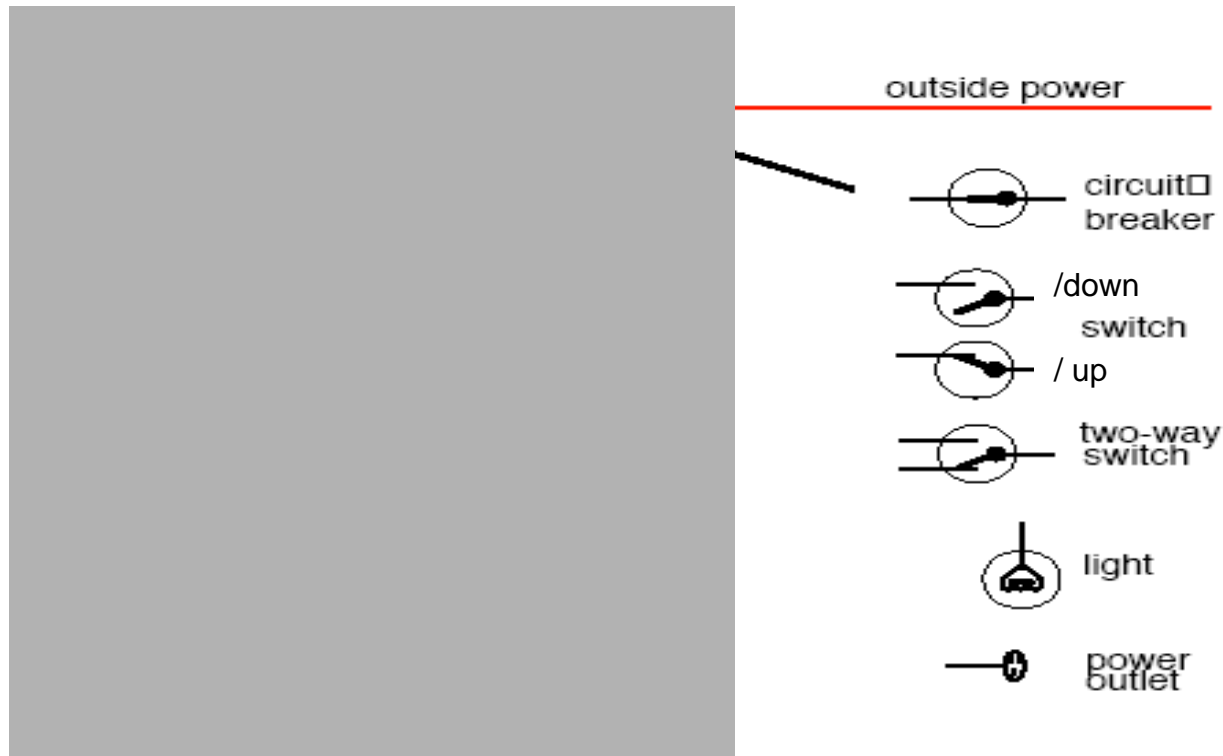
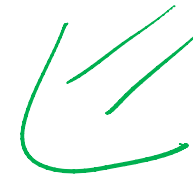
$live\_w_6 \leftarrow live\_w_5 \wedge ok\_cb_2.$

$live\_w_5 \leftarrow live\_outside.$

# What else we may know about this domain?

- That some simple propositions are true

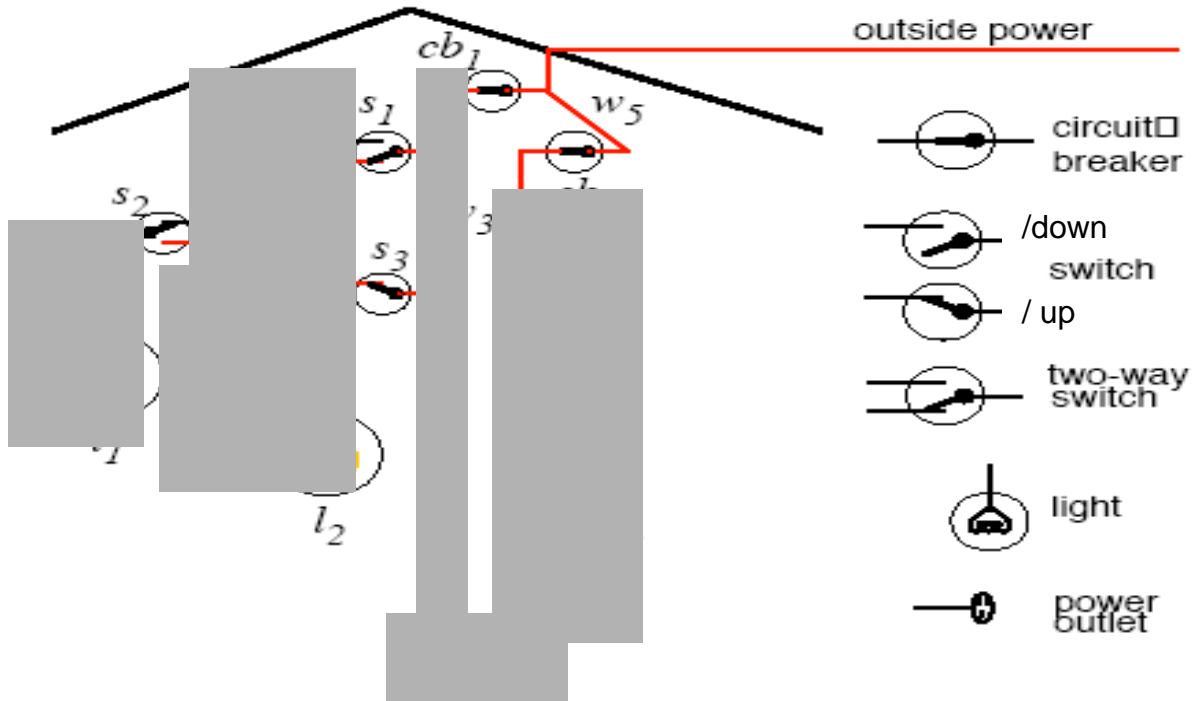
live\_outside.



# What else we may know about this domain?

- That some additional simple propositions are true

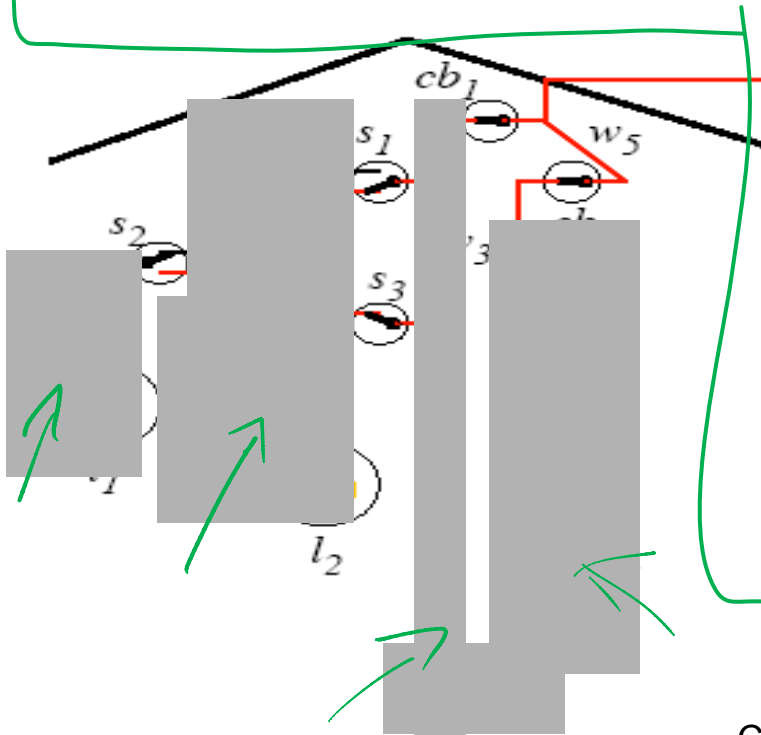
*down\_s<sub>1</sub>. up\_s<sub>2</sub>. up\_s<sub>3</sub>. ok\_cb<sub>1</sub>. ok\_cb<sub>2</sub>. live\_outside.*



# All our knowledge.....

KB

$down_{s_1}.$   
 $up_{s_2}.$   
 $up_{s_3}.$   
 $ok_{cb_1}.$   
 $ok_{cb_2}.$   
 $live_{outside}$



$live_{l_1} \leftarrow live_{w_0}$   
 $live_{w_0} \leftarrow live_{w_1} \wedge up_{s_2}.$   
 $live_{w_0} \leftarrow live_{w_2} \wedge down_{s_2}.$   
 $live_{w_1} \leftarrow live_{w_3} \wedge up_{s_1}.$   
 $live_{w_2} \leftarrow live_{w_3} \wedge down_{s_1}.$   
 $live_{l_2} \leftarrow live_{w_4}.$   
 $live_{w_4} \leftarrow live_{w_3} \wedge up_{s_3}.$   
 $live_{p_1} \leftarrow live_{w_3}.$   
 $live_{w_3} \leftarrow live_{w_5} \wedge ok_{cb_1}.$   
 $live_{p_2} \leftarrow live_{w_6}.$   
 $live_{w_6} \leftarrow live_{w_5} \wedge ok_{cb_2}.$   
 $live_{w_5} \leftarrow live_{outside}.$

# What Semantics is telling us

- Our KB (all we know about this domain) is going to be true only in a subset of all possible  
 $2^{19}$  interpretations
- What is **logically entailed** by our KB are all the propositions that are true in all those models
- This is what we should be able to derive given a **sound and complete proof procedure**



# If we apply the bottom-up (BU) proof procedure

$down\_s_1.$

$up\_s_2.$

$up\_s_3.$

$ok\_cb_1.$

$ok\_cb_2.$

$live\_outside$

BU

generates  $\uparrow$

all the atoms added to  $C$  are in green

$live\_l_2$  ?  $\checkmark$

$live\_l_1$   $\times$

procedure

$live\_l_1 \leftarrow live\_w_0$

$live\_w_0 \leftarrow live\_w_1 \wedge up\_s_2.$

$live\_w_0 \leftarrow live\_w_2 \wedge down\_s_2.$

$live\_w_1 \leftarrow live\_w_3 \wedge up\_s_1.$

$live\_w_2 \leftarrow live\_w_3 \wedge down\_s_1.$

$live\_l_2 \leftarrow live\_w_4.$

$live\_w_4 \leftarrow live\_w_3 \wedge up\_s_3.$

$live\_p_1 \leftarrow live\_w_3.$

$live\_w_3 \leftarrow live\_w_5 \wedge ok\_cb_1.$

$live\_p_2 \leftarrow live\_w_6.$

$live\_w_6 \leftarrow live\_w_5 \wedge ok\_cb_2.$

$live\_w_5 \leftarrow live\_outside.$

$live\_l_2 \in C \Rightarrow KB \vdash_{BU} live\_l_2 \Rightarrow KB \models live\_l_2$   
which is not the case for  $live\_l_1$

# Lecture Overview

- **Recap:** Logic intro and Propositional Definite Clause (PDCL)
- **Semantics** (interpretation, model, logical consequence)
- **Bottom-up Proof Procedure for PDCL**
  - Soundness and Completeness
- Using PDCL for **R&R in a domain** (Electrical System)
- **Top-Down Proof Procedure for PDCL**

# Bottom-up vs. Top-down

## Bottom-up



$G$  is proved if  $G \subseteq C$

When does BU look at the query?  $g$

In every loop iteration

Never

At the end

At the beginning

# Bottom-up vs. Top-down

- **Key Idea of top-down:** search backward from a query  $g$  to determine if it can be derived from  $KB$ .

## Bottom-up

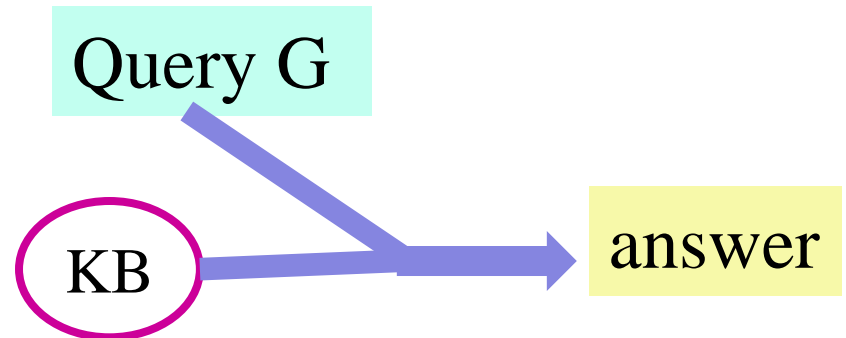


$g$  is proved if  $G \subseteq C$

When does BU look at the query  $G$ ?

- At the end

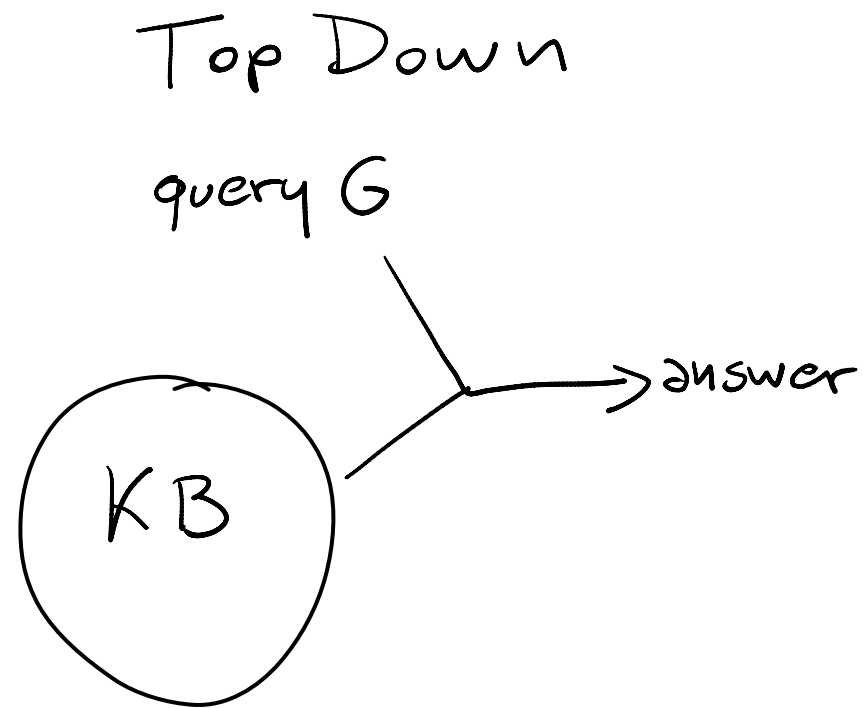
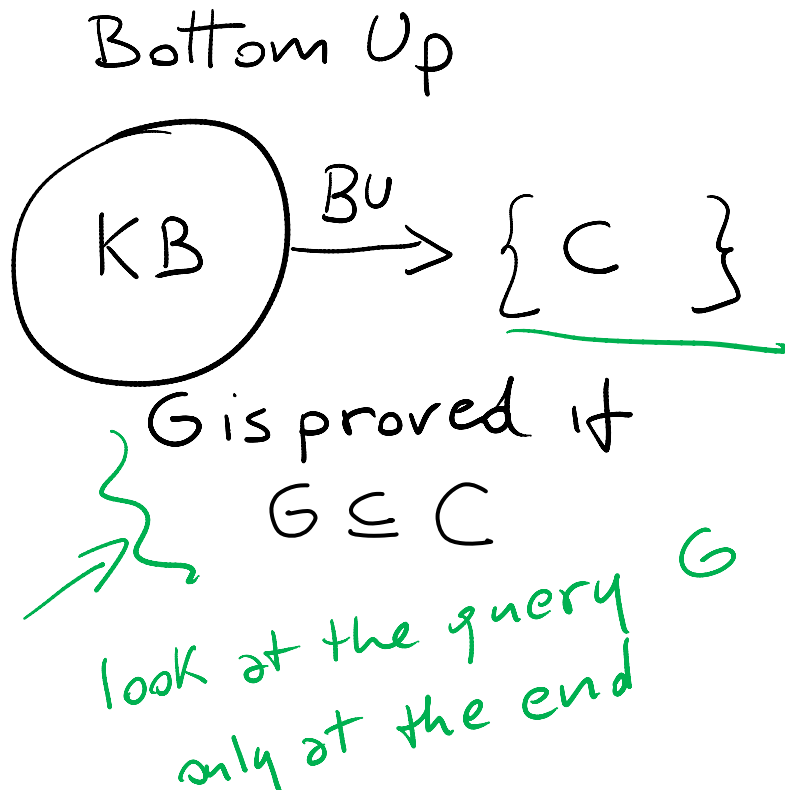
## Top-down



TD performs a backward search starting at  $G$

# Top-down Ground Proof Procedure

**Key Idea:** search backward from a query  $G$  to determine if it can be derived from  $KB$ .



# Top-down Proof Procedure: Basic elements

**Notation:** An answer clause is of the form:

$$\text{yes} \leftarrow a_1 \wedge a_2 \wedge \dots \wedge a_m$$

Express query as an answer clause (e.g., query  $a_1 \wedge$   
 $a_2 \wedge \dots \wedge a_m$ )

$$\text{yes} \leftarrow a_1 \wedge \dots \wedge a_m$$

**Rule of inference** (called SLD Resolution)

Given an answer clause of the form:

$$\text{yes} \leftarrow a_1 \wedge a_2 \wedge \dots \wedge a_m$$

and the clause:

$$a_i \leftarrow b_1 \wedge b_2 \wedge \dots \wedge b_p$$

You can generate the answer clause

$$\text{yes} \leftarrow a_1 \wedge \dots \wedge a_{i-1} \wedge \underline{b_1 \wedge b_2 \wedge \dots \wedge b_p} \wedge a_{i+1} \wedge \dots \wedge a_m$$

# Rule of inference: Examples

Rule of inference (called SLD Resolution)

Given an **answer clause** of the form:

$$yes \leftarrow a_1 \wedge a_2 \wedge \dots \wedge a_m$$

and the clause:

$$a_i \leftarrow b_1 \wedge b_2 \wedge \dots \wedge b_p$$

You can generate the answer clause

$$yes \leftarrow a_1 \wedge \dots \wedge a_{i-1} \wedge b_1 \wedge b_2 \wedge \dots \wedge b_p \wedge a_{i+1} \wedge \dots \wedge a_m$$

$$yes \leftarrow b \wedge c.$$

KB clause

$$b \leftarrow k \wedge f.$$

$$\Rightarrow yes \leftarrow k \wedge f \wedge c$$

$$yes \leftarrow e \wedge f.$$

KB

$$e \leftarrow$$

$$\Rightarrow yes \leftarrow f$$

# (successful) Derivations

- An answer is an answer clause with  $m = 0$ . That is, it is the answer clause  $yes \leftarrow$ .



- A (successful) derivation of query  $?q_1 \wedge \dots \wedge q_k$  from  $KB$  is a sequence of answer clauses  $\gamma_0, \gamma_1, \dots, \gamma_n$  such that
  - $\gamma_0$  is the answer clause  $yes \leftarrow q_1 \wedge \dots \wedge q_k$
  - $\gamma_i$  is obtained by resolving  $\gamma_{i-1}$  with a clause in  $KB$ , and
  - $\gamma_n$  is an answer.  $yes \leftarrow$ .
- An unsuccessful derivation.....

$yes \leftarrow a \wedge b$




# Example: derivations



$a \leftarrow e \wedge f.$	$a \leftarrow b \wedge c.$	$b \leftarrow k \wedge f.$	KB
$c \leftarrow e.$	$d \leftarrow k.$	$e.$	
$f \leftarrow j \wedge e.$	$f \leftarrow c.$	$j \leftarrow c.$	

Query: a (two ways)

$yes \leftarrow a.$   
 $u \leftarrow b \wedge c$   
 $u \leftarrow k \wedge f \wedge c$


 K cannot be eliminated  
 so will Fail

Query: b (k, f different order)

$yes \leftarrow b.$

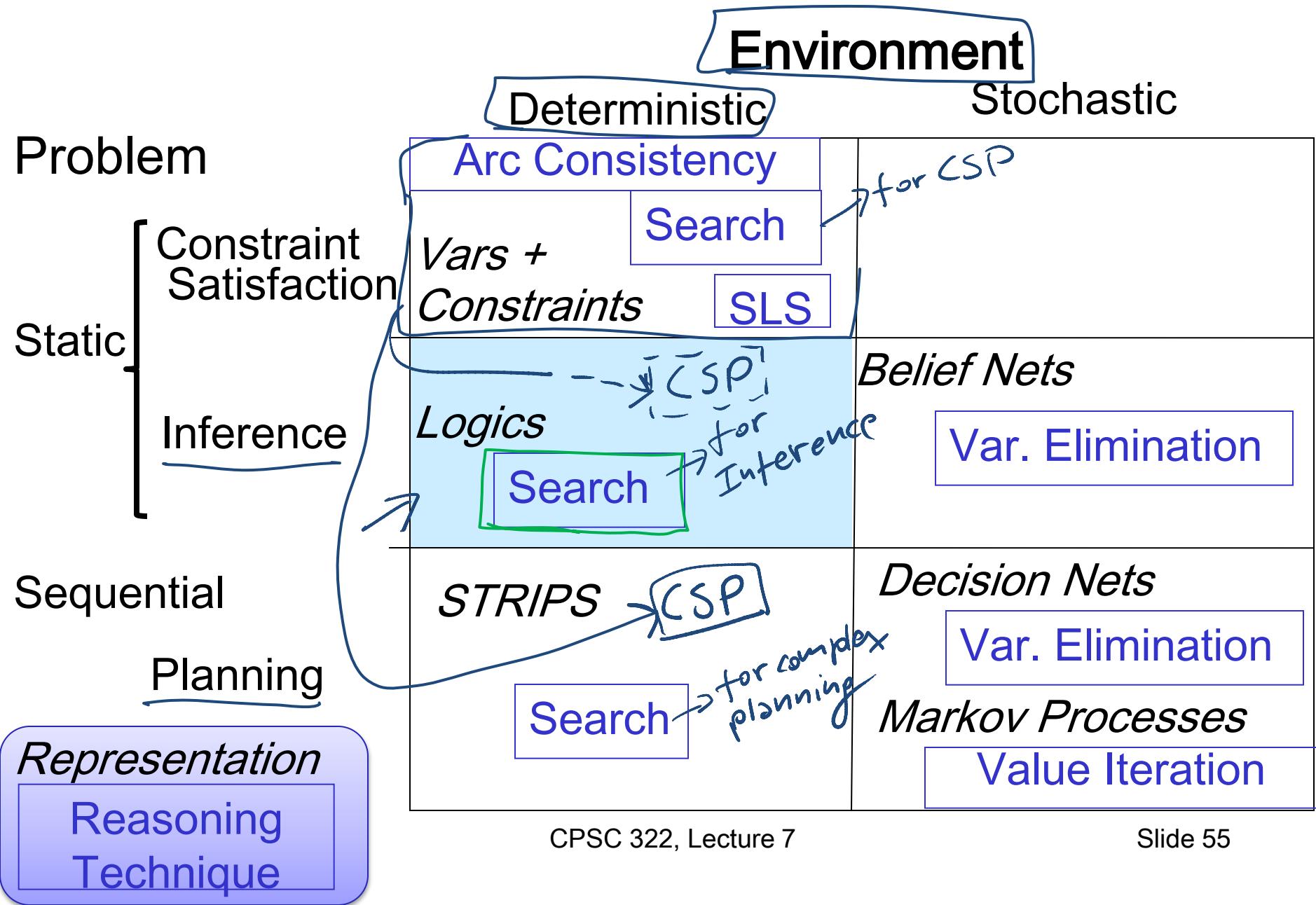
$yes \leftarrow a.$   
 $u \leftarrow e \wedge f$   
 $u \leftarrow f$   
 $u \leftarrow c$   
 $u \leftarrow e$   
 $yes \leftarrow \dots$

# Learning Goals for today's class – part 2

**You can:**

- Prove that BU proof procedure is **complete**
- Model a relatively simple domain with propositional definite clause logic (PDCL)
- Trace query derivation using SLD resolution rule of inference

# Course Big Picture



# Next Class

- Finish Logics (Datalog) (12.3)
- MAJOR TRANSITION

## STOCHASTIC ENVIRONMENTS

- Probability Theory and Conditional Probability (6.1)

# (Propositional) Logic: Key ideas

Given a domain that can be represented with  $n$  propositions you have ..... interpretations (possible worlds)  
 $2^n$

If you do not know anything you can be in any of those

If you know that some logical formulas are true (your KB.....). You know that you can be only in .....  
in which the KB is true (i.e. the models of KB)

It would be nice to know what else is true in all those...  
models what is logically entailed

# PDCL syntax / semantics / proofs

Domain can be represented by three propositions:  $p, q, r$

Interpretations?

$$\overrightarrow{KB} = \begin{cases} q \leftarrow \boxed{\phantom{0}} \\ r \leftarrow \boxed{\phantom{0}} \\ p \leftarrow \underline{q \wedge r} \end{cases}$$

Models?

$r$	$q$	$p$
T	T	T
<del>T</del>	<del>T</del>	<del>F</del>
<del>T</del>	<del>F</del>	<del>T</del>
<del>T</del>	<del>F</del>	<del>F</del>
<del>F</del>	<del>T</del>	<del>T</del>
<del>F</del>	<del>T</del>	<del>F</del>
<del>F</del>	<del>F</del>	<del>T</del>
<del>F</del>	<del>F</del>	<del>F</del>

What is logically entailed?

$r, q, p$

Prove

$$\underline{G = (q \wedge p)}$$

$$C = \{q, r, p\} \quad G \subseteq C \quad KB \overset{\uparrow}{\underset{BV}{\vdash}} G$$

# PDCL syntax / semantics / proofs

$$KB = \left\{ \begin{array}{l} p \leftarrow q \wedge r. \\ q. \end{array} \right.$$

## Interpretations

	$r$	$q$	$p$
→	T	T	T
	<del>T</del>	<del>T</del>	<del>F</del>
	<del>T</del>	<del>F</del>	<del>T</del>
	<del>T</del>	<del>F</del>	<del>F</del>
→	F	T	T
→	F	T	F
	<del>F</del>	<del>F</del>	<del>T</del>
	<del>F</del>	<del>F</del>	<del>F</del>

## Models

What is logically entailed?

Prove  $G = (q \wedge p)$

$$C = \{q\}$$

$$G \notin C$$

$$KB \not\models G$$

# To Define a Logic We Need

- **Syntax**: specifies the symbols used, and how they can be combined to form legal sentences
  - **Knowledge base** is a set of sentences in the language
- **Semantics**: specifies the meaning of symbols and sentences
- **Reasoning theory** or **proof procedure**: a specification of how an answer can be produced.
  - **Sound**: only generates correct answers with respect to the semantics
  - **Complete**: Guaranteed to find an answer if it exists





# Propositional Definite Clauses: Syntax

## Definition (atom)

An **atom** is a symbol starting with a lower case letter

Examples:  $p_1$ ;  
 $live\_l_1$

## Definition (body)

A **body** is an atom or is of the form  $b_1 \wedge b_2$  where  $b_1$  and  $b_2$  are bodies.

Examples:  $p_1 \wedge p_2$ ;  
 $ok\_w_1 \wedge live\_w_0$

## Definition (definite clause)

A **definite clause** is

- an atom or
- a **rule** of the form  $h \leftarrow b$  where  $h$  is an atom (“head”) and  $b$  is a body. (Read this as “ $h$  if  $b$ ”.)

Examples:  $p_1 \leftarrow p_2$ ;  
 $live\_w_0 \leftarrow live\_w_1 \wedge up\_s_2$

## Definition (KB)

A **knowledge base (KB)** is a set of definite clauses

# PDC Semantics: Example for models

## Definition (model)

A **model** of a knowledge base KB is an interpretation in which every clause in KB is true.

$$\text{KB} = \left\{ \begin{array}{l} p \leftarrow q \\ q \\ r \leftarrow s \end{array} \right.$$

Which of the interpretations below are models of KB?

	p	q	r	s		
$I_1$	T	T	T	T	yes	no
$I_2$	F	F	F	F	yes	no
$I_3$	T	T	F	F	yes	no
$I_4$	T	T	T	F	yes	no
$I_5$	F	T	F	T	yes	no

# PDC Semantics: Example for models

## Definition (model)

A **model** of a knowledge base KB is an interpretation in which every clause in KB is true.

$$\text{KB} = \begin{cases} p \leftarrow q \\ q \\ r \leftarrow s \end{cases}$$

Which of the interpretations below are models of KB?

	p	q	r	s	$p \leftarrow q$	q	$r \leftarrow s$	Model of KB	
$I_1$	T	T	T	T	T	T	T	yes	no
$I_2$	F	F	F	F		F		yes	no
$I_3$	T	T	F	<del>F</del>	T	T	T	yes	no
$I_4$	T	T	T	F				yes	no
$I_5$	F	T	F	T				yes	no

# PDC Semantics: Example for models

## Definition (model)

A **model** of a knowledge base KB is an interpretation in which every clause in KB is true.

$$\text{KB} = \begin{cases} p \leftarrow q \\ q \\ r \leftarrow s \end{cases}$$

Which of the interpretations below are models of KB?  
All interpretations where KB is true:  $I_1$ ,  $I_3$ , and  $I_4$

	p	q	r	s	$p \leftarrow q$	q	$r \leftarrow s$	Model of KB
$I_1$	T	T	T	T	T	T	T	yes
$I_2$	F	F	F	F	T	F	T	no
$I_3$	T	T	F	F	T	T	T	yes
$I_4$	T	T	T	F	T	T	T	yes
$I_5$	F	T	F	T	F	T	F	no

# PDCL Semantics: Logical Consequence

## Definition (model)

A **model** of a knowledge base KB is an interpretation in which every clause in KB is true.

## Definition (logical consequence)

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

$$KB = \begin{cases} p \leftarrow q \\ q \\ r \leftarrow s \end{cases}$$

Which of the following are true?

$KB \models p$

$KB \models q$

$KB \models r$

$KB \models s$

# PDCL Semantics: Logical Consequence

## Definition (logical consequence)

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

$$KB = \begin{cases} p \leftarrow q \\ q \\ r \leftarrow s \end{cases}$$

Which of the following are true?

$KB \models p$

$KB \models q$

If KB is true, then q is true. Thus  $KB \models q$ .

If KB is true then both q and  $p \leftarrow q$  are true, so p is true (“p if q”). Thus  $KB \models p$ .

There is a model where r is false, likewise for s

# Example: Logical Consequences

	p	q	r	s
$I_1$	<i>true</i>	<i>true</i>	<i>true</i>	<i>true</i>
$I_2$	<i>true</i>	<i>true</i>	<i>true</i>	<i>false</i>
$I_3$	<i>true</i>	<i>true</i>	<i>false</i>	<i>false</i>
$I_4$	<i>true</i>	<i>true</i>	<i>false</i>	<i>true</i>
$I_5$	<i>false</i>	<i>true</i>	<i>true</i>	<i>true</i>
$I_6$	<i>false</i>	<i>true</i>	<i>true</i>	<i>false</i>
$I_7$	<i>false</i>	<i>true</i>	<i>false</i>	<i>false</i>
$I_8$	<i>false</i>	<i>true</i>	<i>false</i>	<i>true</i>
$I_9$	<i>true</i>	<i>false</i>	<i>true</i>	<i>true</i>
$I_{10}$	<i>true</i>	<i>false</i>	<i>true</i>	<i>false</i>
$I_{11}$	<i>true</i>	<i>false</i>	<i>false</i>	<i>false</i>
$I_{12}$	<i>true</i>	<i>false</i>	<i>false</i>	<i>false</i>
.....	.....	.....	.....	.....

$$KB = \begin{cases} p \leftarrow q. \\ q. \\ r \leftarrow s. \end{cases}$$

*Which of the following is true?*

•  $KB \models q$ , T

•  $KB \models p$ , T

•  $KB \models s$ , F

•  $KB \models r$ , F

# An exercise for you

Let's consider these two alternative proof procedures for PDCL

A.  $C_A = \{\text{All clauses in KB with empty bodies}\}$

B.  $C_B = \{\text{All atoms in the knowledge base}\}$

*KB*

$a \leftarrow e \wedge g.$

$b \leftarrow f \wedge g.$

$c \leftarrow e.$

$f \leftarrow c$

$e.$

$d.$

**Both A and B are sound and complete**

**Both A and B are neither sound nor complete**

**A is sound only and B is complete only**

**A is complete only and B is sound only**



# An exercise for you

Let's consider these two alternative proof procedures for PDCL

A.  $C_A = \{\text{All clauses in KB with empty bodies}\}$

B.  $C_B = \{\text{All atoms in the knowledge base}\}$

*KB*

$a \leftarrow e \wedge g.$

$b \leftarrow f \wedge g.$

$c \leftarrow e.$

$f \leftarrow c$

$e.$

$d.$

**A is sound only and B is complete only**

# Bottom-up vs. Top-down

## Bottom-up



$g$  is proved if  $g \in C$

When does BU look at the query?  $g$

In every loop iteration

Never

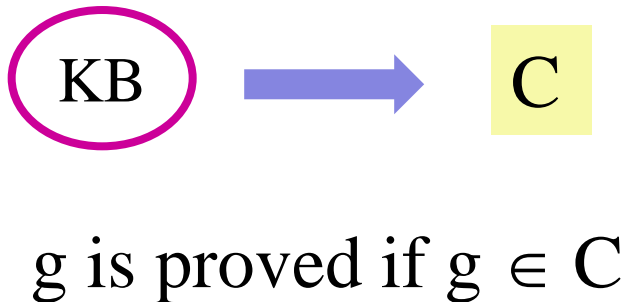
At the end

At the beginning

# Bottom-up vs. Top-down

- **Key Idea of top-down:** search backward from a query  $g$  to determine if it can be derived from  $KB$ .

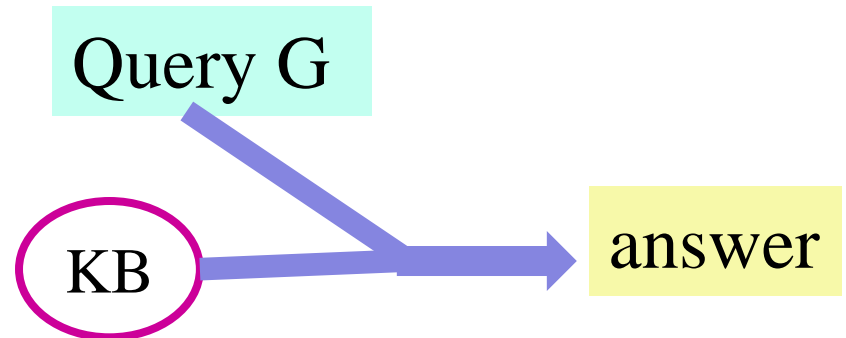
## Bottom-up



When does BU look at the query  $g$ ?

- Never
- It derives the same  $C$  regardless of the query

## Top-down



TD performs a backward search starting at  $g$