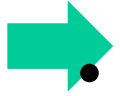


Lecture 15

Logic Intro and PDCL

Lecture Overview



- Intro to Logic
 - Propositional Definite Clauses:
 - Syntax
 - Semantics
 - Proof procedures (time permitting)

Where Are We?

Environment

Representation

Problem Type

Deterministic

Arc

Stochastic

Reasoning Technique

Consistency

Constraint Satisfaction

Vars Constraints+

Search

Static *Belief Nets*

Query

Logics

Variable

Search
Elimination

Sequential

STRIPS

Decision Nets Variable

Planning

Search

Elimination

First Part of *Markov Processes* Value the Course

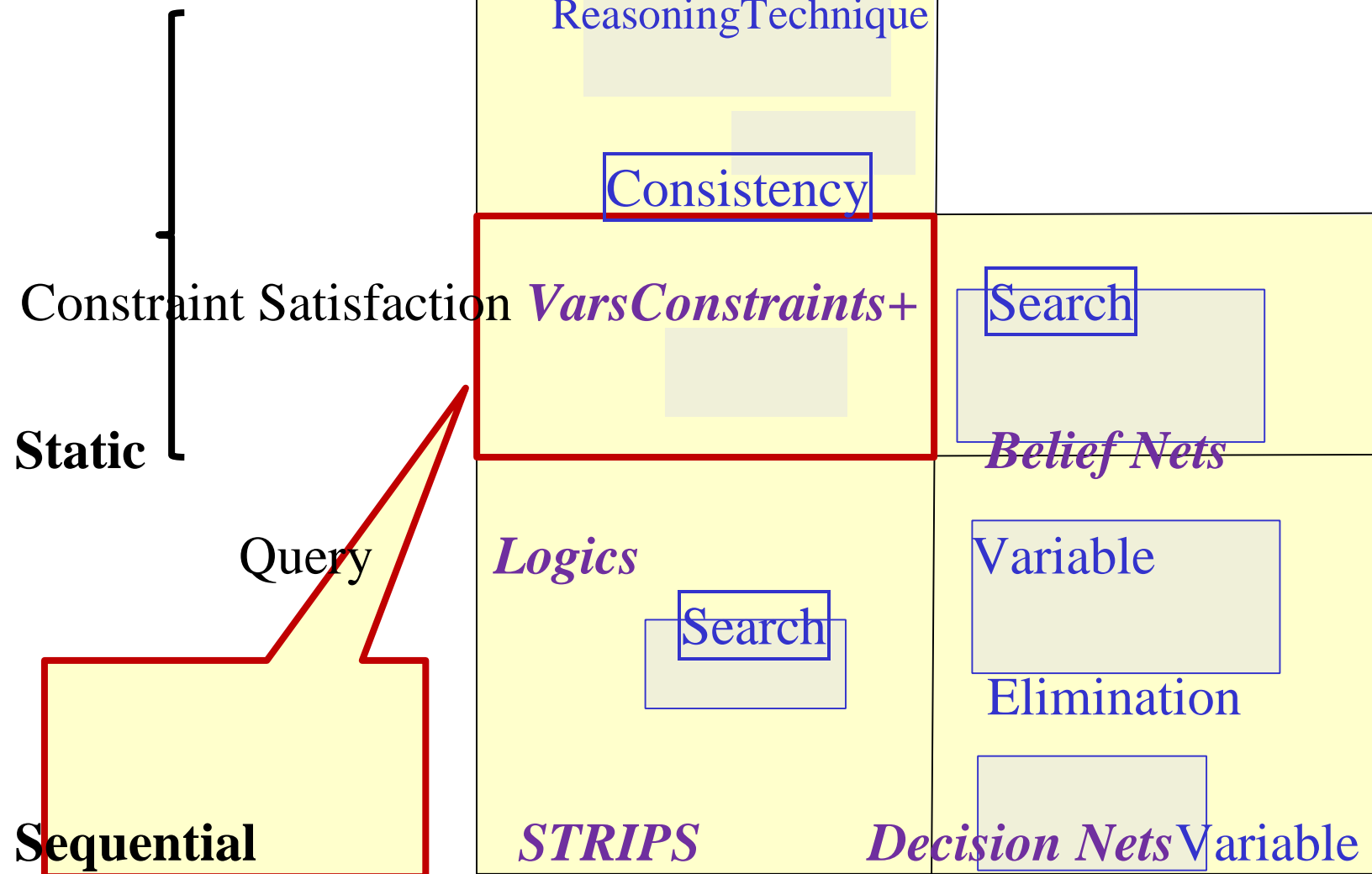
Iteration

Where Are We?

Environment

Representation

Problem Type



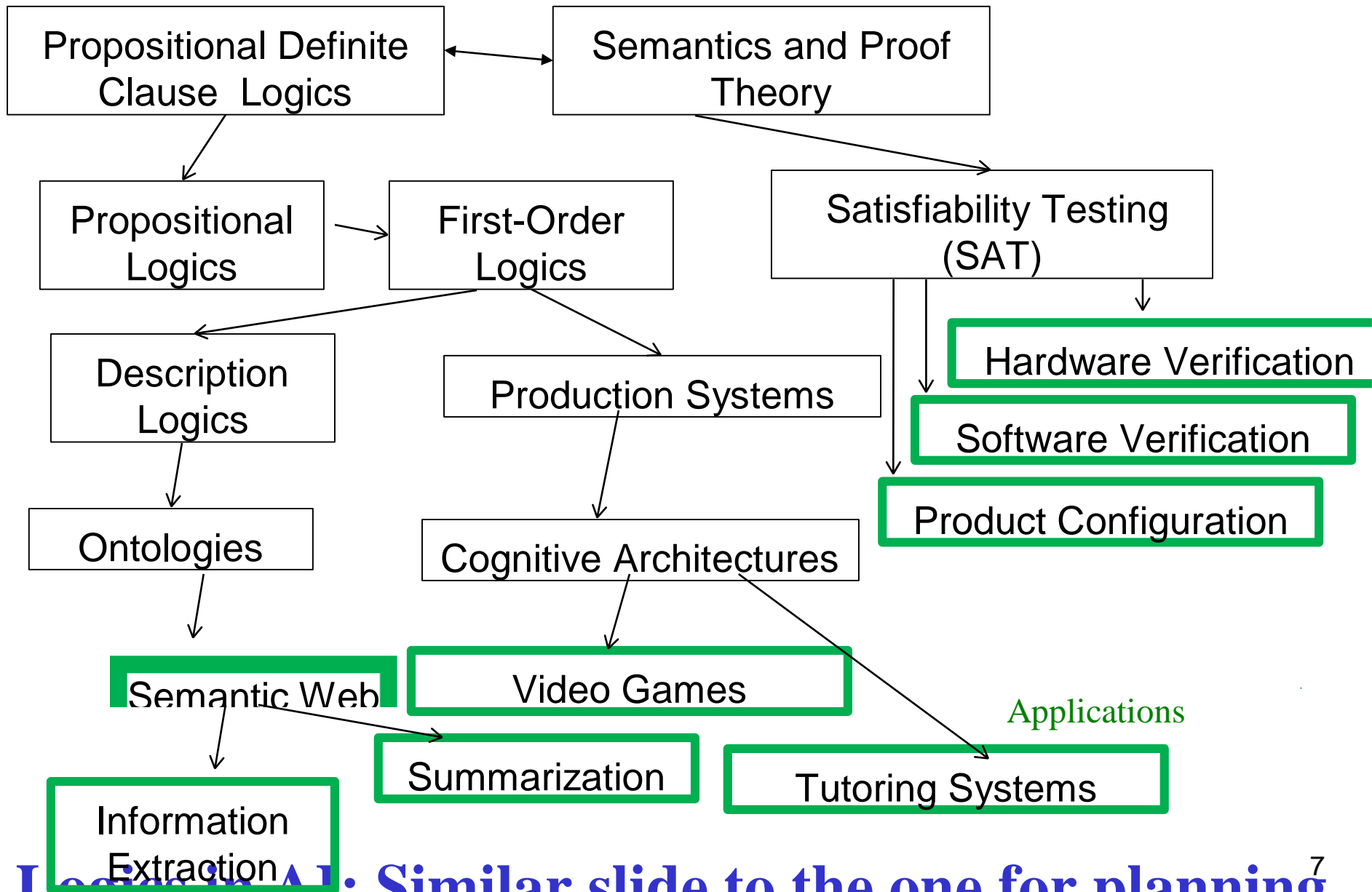
Planning

Search

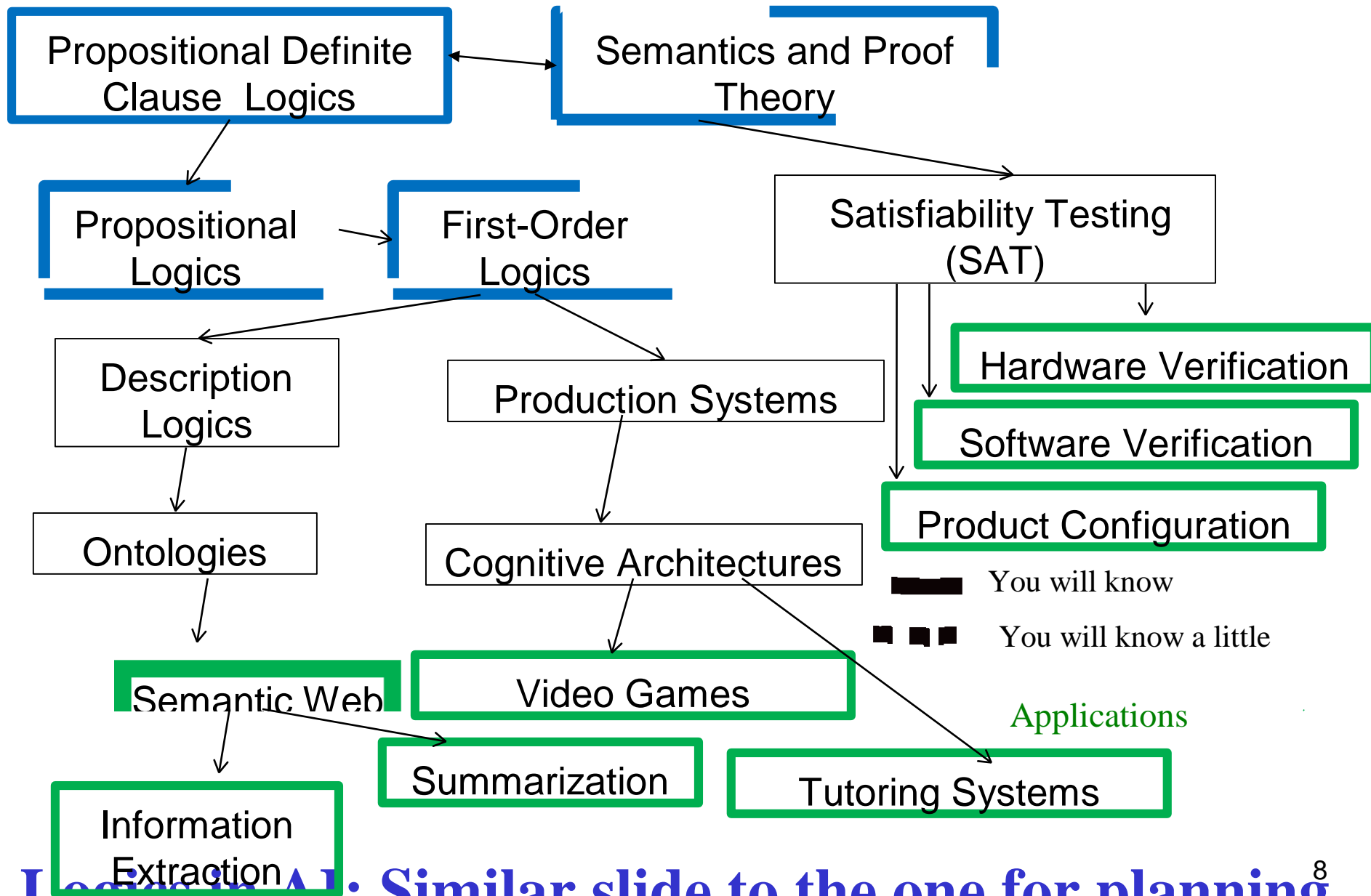
Elimination

Back to static
problems, but with *Markov Processes* richer
representation

Value
Iteration



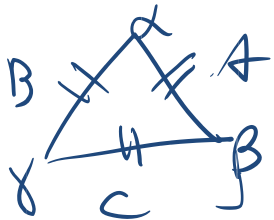
Logics in AI: Similar slide to the one for planning⁷



Logics in AI: Similar slide to the one for planning⁸

What you already know about logic...

Logic is the language of Mathematics. To define formal structures (e.g., sets, graphs) and to prove statements about those



$$\forall(x)triangle(x) \longrightarrow [A = B = C \longleftrightarrow \alpha = \beta = \gamma]$$

- From programming: Some logical operators
- If ((amount > 0) && (amount < 1000)) || !(age < 30) • ...

You know what they mean in a “procedural” way

We use logic as a **Representation and Reasoning System** that can be used to formalize a domain and to reason about it

Logic: a framework for representation & reasoning

- When we **represent a domain** about which we have only partial (but certain) information, we need to represent....

Logic: a framework for representation & reasoning

- When we **represent a domain** about which we have only partial (but certain) information, we need to represent....
- Objects, properties, sets, groups, actions, events, time, space, ...
- All these can be represented as
 - Objects
 - Relationships between objects
- Logic is the language to express knowledge about the world this way
- http://en.wikipedia.org/wiki/John_McCarthy (1927 - 2011) Logic and AI “The Advice Taker”
 - Coined “Artificial Intelligence”. Dartmouth W’shop (1956)

Why Logics?

- “Natural” way to express knowledge about the world

e.g. “Every 101 student will pass the course”

Course (c1)

Name-of (c1, 101)

$$\forall (z) student(z) \& registered(z, c1) \rightarrow will_pass(z, c1)$$

- It is easy to incrementally add knowledge
- It is easy to check and debug knowledge
- Provides language for asking complex queries

- Well understood formal properties

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Logic: A general framework for reasoning

General problem: Query answering

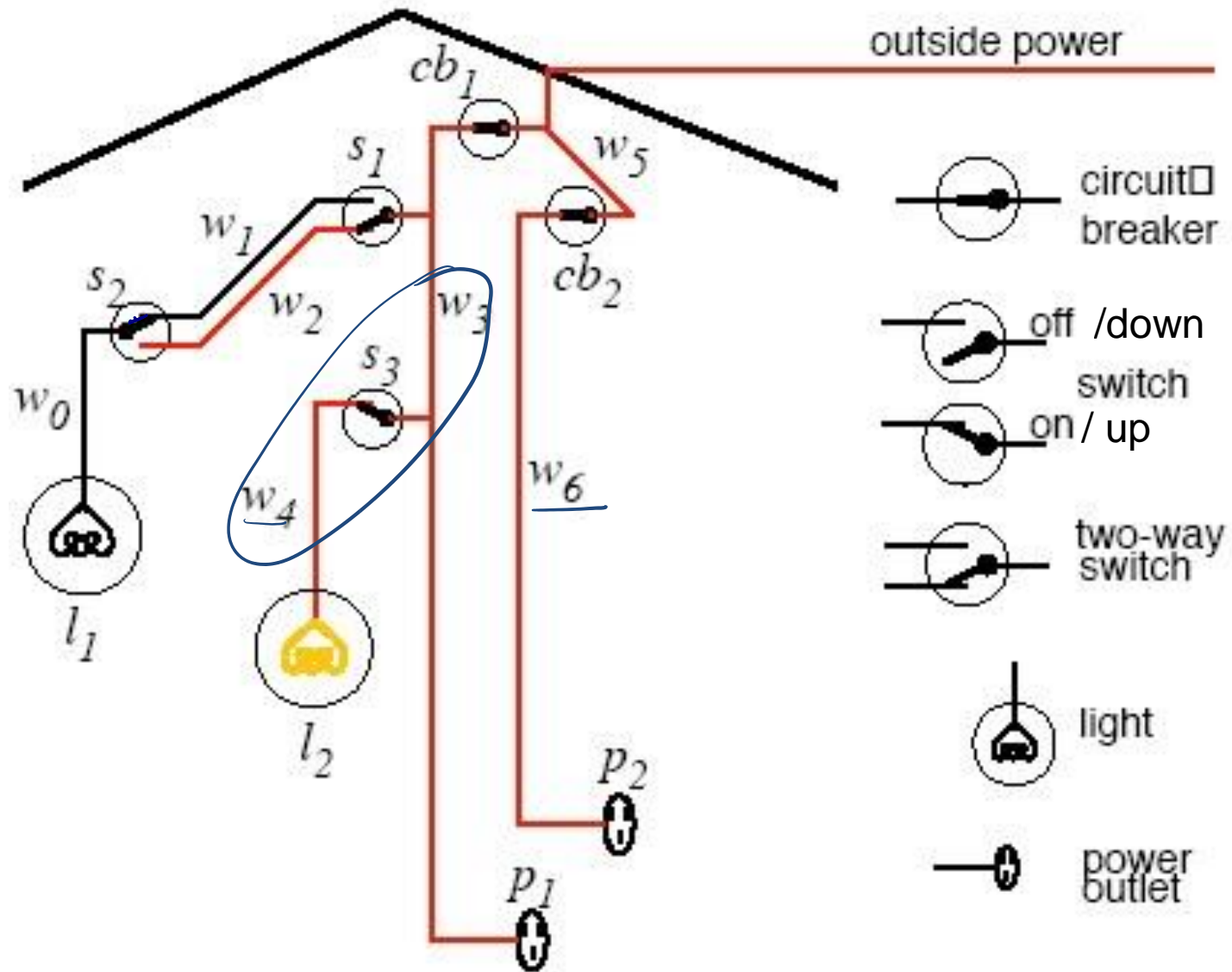
- tell the computer how the world works
- tell the computer some facts about the world
- ask a yes/no question about whether other facts must be true

Solving it with Logic

1. Begin with a task domain.
2. Distinguish those things you want to talk about (the ontology)

3. Choose symbols in the computer to denote elements of your ontology
4. Tell the system knowledge about the domain

Example: Electrical Circuit




```

live_l1 ← live_w0.
live_w0 ← live_w1 ∧ up_s2.
live_w0 ← live_w2 ∧ down_s2.
live_w1 ← live_w3 ∧ up_s1.
live_w2 ← live_w3 ∧ down_s1.
live_l2 ← live_w4.
live_w4 ← live_w3 ∧ up_s3.
live_p1 ← live_w3.
live_w3 ← live_w5 ∧ ok_cb1.
live_p2 ← live_w6.
live_w6 ← live_w5 ∧ ok_cb2.
live_w5 ← live_outside.
lit_l1 ← light_l1 ∧ live_l1 ∧ ok_l1.
lit_l2 ← light_l2 ∧ live_l2 ∧ ok_l2.

```



Logic: A general framework for reasoning

General problem: **Query answering**

- tell the computer how the world works
- tell the computer some facts about the world
- ask a yes/no question about whether other facts must be true

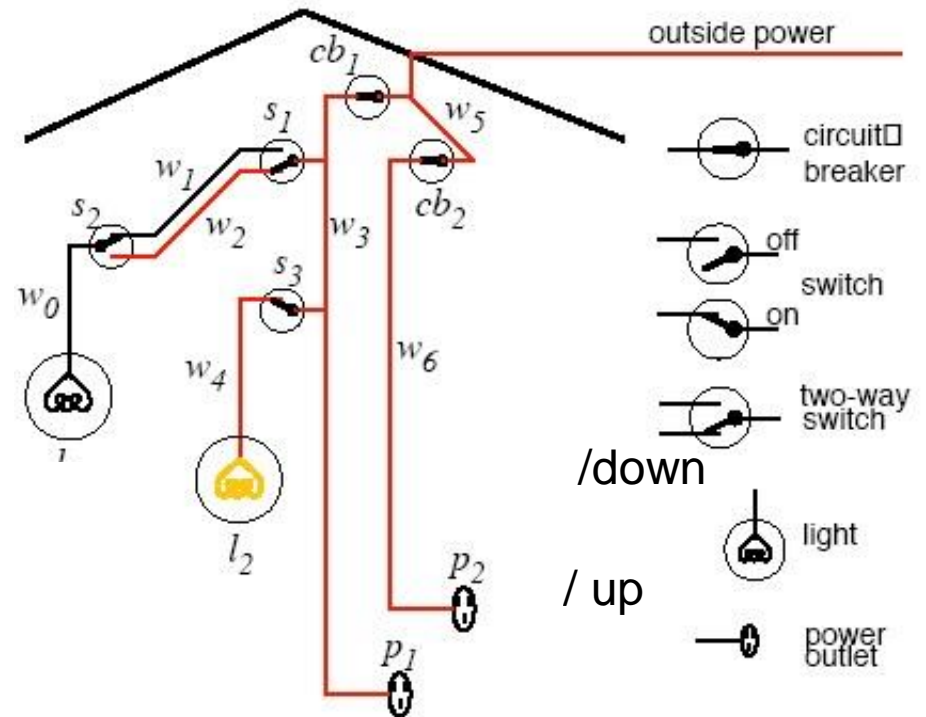
Solving it with Logic

1. Begin with a task domain.
2. Distinguish those things you want to talk about (the **ontology**)
3. Choose symbols in the computer to denote elements of your ontology
4. Tell the system knowledge about the domain

5. Ask the system whether new statements about the domain are true or false

$light_l1.$
 $light_l2.$
 $ok_l1.$
 $ok_l2.$
 $ok_cb1.$
 $ok_cb2.$
 $live_outside.$

$live_l1 \leftarrow live_w0.$
 $live_w0 \leftarrow live_w1 \wedge up_s2.$
 $live_w0 \leftarrow live_w2 \wedge down_s2.$
 $live_w1 \leftarrow live_w3 \wedge up_s1.$
 $live_w2 \leftarrow live_w3 \wedge down_s1.$
 $live_l2 \leftarrow live_w4.$
 $live_w4 \leftarrow live_w3 \wedge up_s3.$
 $live_p1 \leftarrow live_w3.$
 $live_w3 \leftarrow live_w5 \wedge ok_cb1.$
 $live_p2 \leftarrow live_w6.$
 $live_w6 \leftarrow live_w5 \wedge ok_cb2.$
 $live_w5 \leftarrow live_outside.$
 $lit_l1 \leftarrow light_l1 \wedge live_l1 \wedge ok_l1.$
 $lit_l2 \leftarrow light_l2 \wedge live_l2 \wedge ok_l2.$



$live_w4?$
 $lit_l2?$



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 ¹⁷

Propositional Definite Clauses

We will start with a simple logic

- Primitive elements are **propositions**: Boolean variables that can be {true, false}

Two kinds of statements:

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

Why only propositions?

- We can exploit the Boolean nature for efficient reasoning
- Starting point for more complex logics

We need to specify: **syntax, semantics, proof procedure**

Lecture Overview

- Intro to Logic
- ➡ • Propositional Definite Clauses:
 - Syntax

- Semantics
- Proof Procedures

To Define a Logic We Need

- **Syntax**: specifies the symbols used, and how they can be combined to form legal sentences
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- **Sound**: only generates correct answers with respect to the semantics
- **Complete**: Guaranteed to find an answer if it exists

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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 ”.)

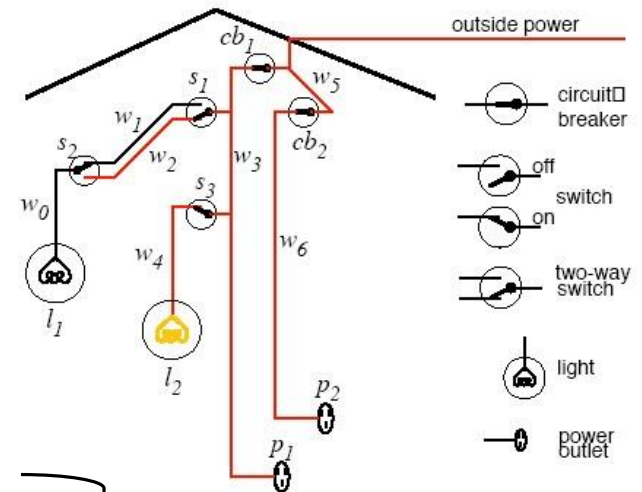
Examples: $p_1 \leftarrow p_2$; $\text{live_w}_0 \leftarrow \text{live_w}_1$
 $\wedge \text{up_s}_2$

Definition (KB)

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

light_l1.
light_l2.
ok_l1.
ok_l2.
ok_cb1.
ok_cb2.
live_outside.

atoms



definite
clauses,
KB

live_l1 \leftarrow *live_w0*.
live_w0 \leftarrow *live_w1* \wedge *up_s2*.
live_w0 \leftarrow *live_w2* \wedge *down_s2*.
live_w1 \leftarrow *live_w3* \wedge *up_s1*.
live_w2 \leftarrow *live_w3* \wedge *down_s1*.
live_l2 \leftarrow *live_w4*.
live_w4 \leftarrow *live_w3* \wedge *up_s3*.
live_p1 \leftarrow *live_w3*.
live_w3 \leftarrow *live_w5* \wedge *ok_cb1*.
live_p2 \leftarrow *live_w6*.
live_w6 \leftarrow *live_w5* \wedge *ok_cb2*.
live_w5 \leftarrow *live_outside*.
lit_l1 \leftarrow *light_l1* \wedge *live_l1* \wedge *ok_l1*.
lit_l2 \leftarrow *light_l2* \wedge *live_l2* \wedge *ok_l2*.

rules

PDCL Syntax: more examples

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 .')

How many of the clauses below are legal PDCL clauses?

- a) *Sunny_today*
- b) *sunny_today* \vee *cloudy_today*
- c) *vdjhsaekwrq*
- d) *high_pressure_system* \leftarrow *sunny-today*
- e) *sunny_today* \leftarrow *high_pressure_system* \wedge *summer*

f) $\text{sunny_today} \leftarrow \text{high_pressure-system} \wedge \neg \text{winter}$

g) $\text{ai_is_fun} \leftarrow f(\text{time_spent}, \text{material_learned})$

h) $\text{summer} \leftarrow \text{sunny_today} \wedge \text{high_pressure_system}$

PDCL Syntax: more examples

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 .')

How many of the clauses below are legal PDCL clauses?

a) Sunny_today

b) $\text{sunny_today} \vee \text{cloudy_today}$

c) $vdjhsaekwrq$ A. 3

d) $high_pressure_system \leftarrow sunny_today$ B. 4

e) $sunny_today \leftarrow high_pressure_system \wedge summer$

C. 5

f) $sunny_today \leftarrow high_pressure_system \wedge \neg winter$

g) $ai_is_fun \leftarrow f(time_spent, material_learned)$ D. 6

h) $summer \leftarrow sunny_today \wedge high_pressure_system$

PDC Syntax: more examples

Legal PDC clause

Not a legal PDC clause

a) $Sunny_today$



b) $\text{sunny_today} \vee \text{cloudy_today}$



c) vdjhsaekwrq



d) $\text{high_pressure_system} \leftarrow \text{sunny_today}$

B. 4



e) $\text{sunny_today} \leftarrow \text{high_pressure_system} \wedge \text{summer}$



f) $\text{sunny_today} \leftarrow \text{high_pressure_system} \wedge \neg \text{winter}$



g) $\text{ai_is_fun} \leftarrow f(\text{time_spent}, \text{material_learned})$



h) $\text{summer} \leftarrow \text{sunny_today} \wedge \text{high_pressure_system}$



Do any of these statements **mean** anything?
Syntax doesn't answer this question!

To Define a Logic We Need

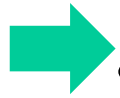
- **Syntax**: specifies the symbols used, and how they can be combined to form legal sentences
- **Knowledge base** is a set of sentences in the language
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- **Reasoning theory** or **proof procedure**: a specification of how an answer can be produced.

Propositional Definite Clauses: Semantics

- **Sound**: only generates correct answers with respect to the semantics
- **Complete**: Guaranteed to find an answer if it exists ²⁶

Lecture Overview

- Intro to Logic
- Propositional Definite Clauses:
- Syntax



• Semantics

- Proof Procedures
- Semantics allows one to relate the symbols in the logic to the domain to be modeled.

Definition (interpretation)

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

- If our domain has 8 atoms, how many interpretations are there?

Propositional Definite Clauses: Semantics

A. $8+2$

B. $8*2$

C. 8^2

D. 2^8

Propositional Definite Clauses: Semantics

- Semantics allows one to relate the symbols in the logic to the domain to be modeled.

Definition (interpretation)

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

- If our domain has 8 atoms, how many interpretations are there?
- 2 values for each atom, so 2^8 combinations

Propositional Definite Clauses: Semantics

- Similar to possible worlds in CSPs
- Semantics allows one to relate the symbols in the logic to the domain to be modeled.

Definition (interpretation)

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

We can use the interpretation to determine the truth value of clauses

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.
- A **rule** $h \leftarrow b$ is false in I if and only if b is true in I and h is false in I.

PDC Semantics: Example

Truth values under different interpretations

F=false, T=true

a_1 a_2 $a_1 \wedge a_2$

h b $h \leftarrow b$

Propositional Definite Clauses: Semantics

I_1	F	F	F
I_2	F	T	F
I_3	T	F	F
I_4	T	T	T

I_1	F	F	T
I_2	F	T	F
I_3	T	F	T
I_4	T	T	T

PDC Semantics: Example

Truth values under different interpretations

F=false, T=true

	h	b	$h \leftarrow b$	h ← b is false only
I_1	F	F	T	
I_2	F	T	F	
I_3	T	F	T	
I_4	T	T	T	

when b is true and h is false

	h	a_1	a_2	$h \leftarrow a_1 \wedge a_2$
I_1	F	F	F	
I_2	F	F	T	
I_3	F	T	F	
I_4	F	T	T	
I_5	T	F	F	
I_6	T	F	T	
I_7	T	T	F	
I_8	T	T	T	

PDC Semantics: Example for truth values

Truth values under different interpretations

F=false, T=true

	h	b	$h \leftarrow b$	Body of the clause is $a_1 \wedge a_2$
l_1	F	F	T	
l_2	F	T	F	
l_3	T	F	T	
l_4	T	T	T	

Body is true only if both a_1 and a_2 are true in l

	h	a_1	a_2	$h \leftarrow a_1 \wedge a_2$
l_1	F	F	F	T
l_2	F	F	T	T
l_3	F	T	F	T
l_4	F	T	T	F
l_5	T	F	F	T
l_6	T	F	T	T
l_7	T	T	F	T
l_8	T	T	T	T

Propositional Definite Clauses: Semantics

Semantics allows you to relate the symbols in the logic to the domain you're trying to model.

Definition (interpretation)

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

We can use the interpretation to determine the truth value of clauses

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.
- A **rule $h \leftarrow b$** is false in I if and only if b is true in I and h is false in I.

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

Propositional Definite Clauses: Semantics

Definition (interpretation)

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

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 .
- A **rule $h \leftarrow b$** is false in I if and only if b is true in I and h is false in I .

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

Definition (model)

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

Similar to CSPs: a **model** of a set of clauses is an interpretation that makes all of the clauses true

PDC Semantics: Knowledge Base (KB)

$$\begin{array}{l} r \\ s \leftarrow p \ q \\ \leftarrow p \wedge s \end{array}$$

- 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	false	true	true	false

iclicker.

A. KB_1 **B. KB_3** **C. KB_2**

p
 r
 $s \leftarrow q \wedge p$

$r \ q \ s$
 $\leftarrow q$

Which of the three KB above is 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	false	true	true	false

C. KB₂

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

Which of the three KB above is True in I_1

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.

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

Which of the interpretations below are models of

A. I_1

	p	q	r	s	B. I_1, I_2
I_1	T	T	T	T	C. I_1, I_2, I_5
I_2	F	F	F	T	
I_3	T	T	F	F	D. All of them
I_4	T	T	T	F	
I_5	T	T	F	T	

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.

KB = { s

Which of the interpretations below are models of KB?
All interpretations where KB is true

	p	q	r	s	$p \leftarrow q$	s	$s \leftarrow r$	KB
I_1	T	T	T	T				
I_2	F	F	F	T				
I_3	T	T	F	F				
I_4	T	T	T	F				
I_5	T	T	F	T				

$p \leftarrow q$

$s \leftarrow r$

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.

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

All interpretations where KB is true: I_1 , I_2 , and I_5

C. I_1, I_2, I_5

	p	q	r	s	$p \leftarrow q$	s	$s \leftarrow r$	KB
I_1	T	T	T	T	T	T	T	T
I_2	F	F	F	T	T	T	T	T
I_3	T	T	F	F	T	F	T	F
I_4	T	T	T	F	T	F	T	F
I_5	T	T	F	T	T	T	T	T

$$p \leftarrow q$$

Which of the interpretations below are models of KB?

OK but....

.... Who cares? Where are we going with this?

Remember what we want to do with Logic

- 1) Tell the system **knowledge** about a task domain.
 - This is your **KB**
 - which expresses **true statements** about the world
- 2) **Ask the system** whether new statements about the domain are true or false.
 - We want the system responses to be
 - **Sound**: only generates correct answers with respect to the semantics

- **Complete**: Guaranteed to find an answer if it exists

For Instance,...

- 1) Tell the system **knowledge** about a task domain.

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

- 2) **Ask the system** whether new statements about the domain are true or false

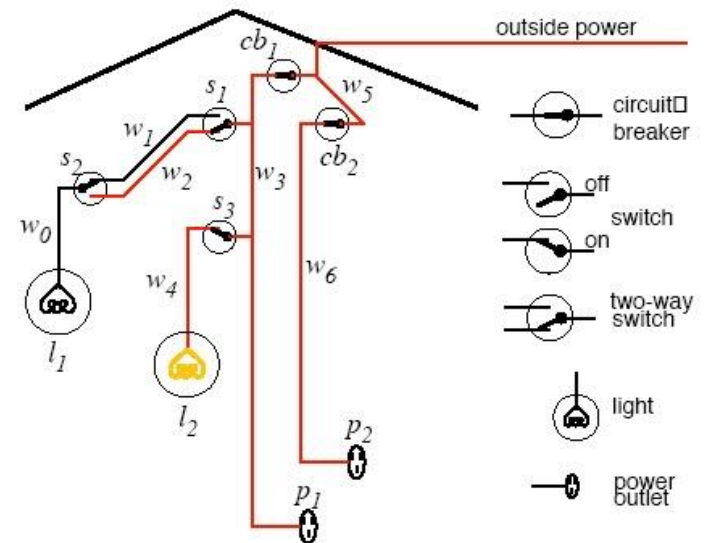
p? r?
s?

Or, More Interestingly

1) Tell the system **knowledge** about a task domain.

light_l1.
light_l2.
ok_l1.
ok_l2.
ok_cb1.
ok_cb2.
live_outside.

live_l1 \leftarrow *live_w0*.
live_w0 \leftarrow *live_w1* \wedge *up_s2*.
live_w0 \leftarrow *live_w2* \wedge *down_s2*.
live_w1 \leftarrow *live_w3* \wedge *up_s1*.
live_w2 \leftarrow *live_w3* \wedge *down_s1*.
live_l2 \leftarrow *live_w4*.
live_w4 \leftarrow *live_w3* \wedge *up_s3*.
live_p1 \leftarrow *live_w3*.
live_w3 \leftarrow *live_w5* \wedge *ok_cb1*.
live_p2 \leftarrow *live_w6*.
live_w6 \leftarrow *live_w5* \wedge *ok_cb2*.
live_w5 \leftarrow *live_outside*.
lit_l1 \leftarrow *light_l1* \wedge *live_l1* \wedge *ok_l1*.
lit_l2 \leftarrow *light_l2* \wedge *live_l2* \wedge *ok_l2*.



2) **Ask the system** whether new statements about the domain are true or false

live_w4?

lit_{I_2} ?

To Obtain This We Need One More Definition

To Obtain This We Need One More Definition

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.
- **when KB is TRUE, then G must be TRUE**
- We want a reasoning procedure that can find all and only the logical consequences of a knowledge base

Example of Logic Entailment

$$KB = \Box \Box p \leftarrow q \wedge r.$$

$$\Box q.$$

How many models
are there?

$$KB = \Box \Box p \leftarrow q \wedge r.$$

$$\Box q.$$

A. 1 B. 2 C. 3 D.

4

E. 5

Ex

Entailment

How many
models are

interpretations

there?

A. 1 B. 2

C. 3

D. 4

E. 5

r	q	p
T	T	T
T	T	F
T	F	T
T	F	F
F	T	T
F	T	F
F	F	T
F	F	F

Example of Logic Entailment

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

Interpretations

r	q	p
T	T	T
T	T	F
T	F	T
T	F	F
F	T	T
F	T	F
F	F	T
F	F	F

Models

C. 3

Example of Logic Entailment

Interpretations

- We want a reasoning procedure that can find all and only the 49

Example of Logic Entailment

Interpretations

logical consequences of a knowledge base

Which atoms are logically entailed?

Example of Logic Entailment

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

Interpretations

r	q	p
T	T	T
T	T	F
T	F	T
T	F	F
F	T	T
F	T	F
F	F	T
F	F	F

Models

C. 3

Which atoms are logically entailed?

Example: Logical Consequences

q

- We want a reasoning procedure that can find all and only the logical consequences of a knowledge base

Example: Logical Consequences

	p	q	r	s
I ₁	true	true	true	true
I ₂	true	true	true	false
I ₃	true	true	false	false
I ₄	true	true	false	true
I ₅	false	true	true	true
I ₆	false	true	true	false
I ₇	false	true	false	false
I ₈	false	true	false	true
I ₉	true	false	true	true
I ₁₀	true	false	true	false
I ₁₁	true	false	false	false

Example: Logical Consequences

I₁₂

true false false false

$\Box p \leftarrow q. KB = \Box$

.....

.....



$q.$

\Box

$\Box r \leftarrow s.$

D. $KB \models r, KB \models s,$

Example: Logical Consequences

Which of the following is true?

A. $KB \models q$ and $KB \models r$

B. $KB \models q$, and $KB \models s$

C. $KB \models q$, and $KB \models p$

E. None of the above⁵¹

Example: Logical Consequences

	p	q	r	s
I₁	true	true	true	true
I₂	true	true	true	false
I₃	true	true	false	false
I ₄	true	true	false	true
I ₅	false	true	true	true
I ₆	false	true	true	false
I ₇	false	true	false	false
I ₈	false	true	false	true
I ₉	true	false	true	true

Example: Logical Consequences

I_{10}	true false	true false	$\Box p \leftarrow q. KB = \Box q.$
I_{11}	true false	false false	$\Box \Box r \leftarrow s.$
I_{12}	true false	false false	
.....	

Which of the following is true?

- $KB \models q,$
- $KB \models p,$
- $KB \models s,$

Example: Logical Consequences

- $KB \models r$

Example: Logical Consequences

	p	q	r	s
I_1	true	true	true	true
I_2	true	true	true	false
I_3	true	true	false	false
I_4	true	true	false	true
I_5	false	true	true	true
I_6	false	true	true	false
I_7	false	true	false	false
I_8	false	true	false	true
I_9	true	false	true	true

I_{10}	true false	true	false	$\neg p \leftarrow q.$
I_{11}	true false	false	false	$KB = \{ \neg q. \text{ models } \neg \neg r \leftarrow s. \}$
I_{12}	true false	false	false	
.....	

Which of the following is true?

- $KB \models q,$
- $KB \models p,$
- $KB \models s,$

Example: Logical Consequences

- $KB \models r$

	p	q	r	s
I_1	true	true	true	true
I_2	true	true	true	false
I_3	true	true	false	false
I_4	true	true	false	true
I_5	false	true	true	true
I_6	false	true	true	false
I_7	false	true	false	false
I_8	false	true	false	true
I_9	true	false	true	true
I_{10}	true	false	true	false

Example: Logical Consequences

I_{11}	true false	false	false	$\Box p \leftarrow q.$
I_{12}	true false	false	false	
.....	

models $KB = \Box \Box \Box r \leftarrow q. s.$

Which of the following is true?

• $KB \models q$, **T**

• $KB \models p$, **T**

• $KB \models s$, **F**

• $KB \models F$

C. $KB \models q$, and $KB \models p$

User's View of Semantics

- Choose a task domain: **intended interpretation.**
- For each proposition you want to represent, associate a proposition symbol in the language.
- Tell the system clauses that are **true** in the intended interpretation: **axiomatize the domain.**
- Ask questions about the intended interpretation.

Example: Logical Consequences

- If $KB \models g$, then g must be true in the intended interpretation.

Computer's View of Semantics

- 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.
- Otherwise, there is a model of KB in which g is false.

Computer's View of Semantics

This could be the intended interpretation.

The computer wouldn't know!

- Otherwise, there is a model of KB in which g is false. This could be the intended interpretation.

The computer wouldn't know

	p	q	r	s
I_1	true	true	true	true
I_2	true	true	true	false

$$\models p \leftarrow q. KB = \models q. \models r \leftarrow s.$$

\models

Computer's View of Semantics

- Otherwise, there is a model of KB in which g is false. This could be the intended interpretation.

The computer wouldn't know

	p	q	r	s
I_1	true	true	true	true
I_2	true	true	true	false

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

Computer's View of Semantics

I_1 and I_2 above are both models for KB, each could be the intended interpretation. The computer cannot know, thus it cannot say anything about the truth value of s

Learning Goals for Logic Up To Here

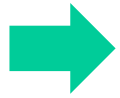
- PDCL syntax & semantics
 - Verify whether a logical statement belongs to the language of propositional definite clauses
 - Verify whether an **interpretation** is a **model** of a PDCL KB.
 - Verify when a conjunction of atoms is a **logical consequence** of a knowledge base

Next: Proof Procedures (5.2.2)

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Lecture Overview

- Intro to Logic
- Propositional Definite Clauses:
- Syntax
- Semantics



Proof Procedures

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

Reasoning theory or **proof procedure**:
a specification of how an answer can
be produced (sound and complete)

- **Semantics**: specifies the meaning of symbols and sentences

-

- Bottom-up and Top-Down Proof Procedure for Finding Logical Consequence

Slide 61

Proof Procedures

- A **proof procedure** is a **mechanically derivable demonstration** that a formula logically follows from a knowledge base.

- Given a proof procedure P , $KB \vdash_P g$ means g can be derived from knowledge base KB with the proof procedure.
- 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?

That is **sound** and **complete**

Soundness and Completeness

Definition (soundness)

A proof procedure P is **sound** if $KB \vdash_P g$ implies $KB \models g$.

sound: every atom derived by P follows logically from KB (i.e. is true in every model)

- Soundness of proof procedure P : need to prove that

If g can be derived by the procedure ($KB \vdash_P g$)
then g is true in all models of KB ($KB \models g$)

Definition (completeness)

A proof procedure P is **complete** if $KB \models g$ implies $KB \vdash_P g$.

complete: every atom that logically follows from KB is derived by P

- Completeness of proof procedure P: need to prove that

If g is true in all models of KB ($KB \models g$) then
 g is derived by the procedure ($KB \vdash_P g$)

Simple Proof Procedure

Simple proof procedure S

- Enumerate all interpretations
- For each interpretation I , check whether it is a model of KB
✓i.e., check whether all clauses in KB are true in I
- $KB \models g$ if g holds in all such models

Simple proof procedure S

- Enumerate all interpretations
- For each interpretation I , check whether it is a model of KB
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Simple Proof Procedure

Simple proof procedure S

- Enumerate all interpretations
- For each interpretation I , check whether it is a model of KB
✓i.e., check whether all clauses in KB are true in I
- $KB \models g$ if g holds in all such models

problem with this approach? problem
with this approach?

- If there are n propositions in the KB, must check all the interpretations!

problem with this approach?

Simple Proof Procedure

- If there are n propositions in the KB, must check all the 2^n interpretations!

Goal of proof theory

- find sound and complete **proof procedures** that allow us to prove that a logical formula follows from a KB avoiding to do the above

Bottom-up 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.
- This rule also covers the case when $m = 0$.

Bottom-up (BU) proof 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.
```

$KB \vdash_{BU} G$ if $G \subseteq C$ at the end of this procedure

The C at the end of BU procedure is a **fixed point**:

- Further applications of the rule of derivation will not change C !

Bottom-up proof procedure: example

$C := \{\};$

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.

$a \leftarrow b \wedge c$

$\{\}$

$a \leftarrow e \wedge f$

$b \leftarrow f \wedge k$

$c \leftarrow e \quad d \leftarrow$

k

$e.$

$f \leftarrow j \wedge$

$e f \leftarrow c$

$j \leftarrow c$

Bottom-up proof procedure: example

$C := \{\};$

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.

$a \leftarrow b \wedge c$

$\{\}$

$a \leftarrow e \wedge f$

