



Logical Agents

EECS 492  
February 3rd, 2011

## Administrative

- PS2 due today
- PS3 team assignments will occur at 11:59p tonight!
  - ▣ Update your team preferences!

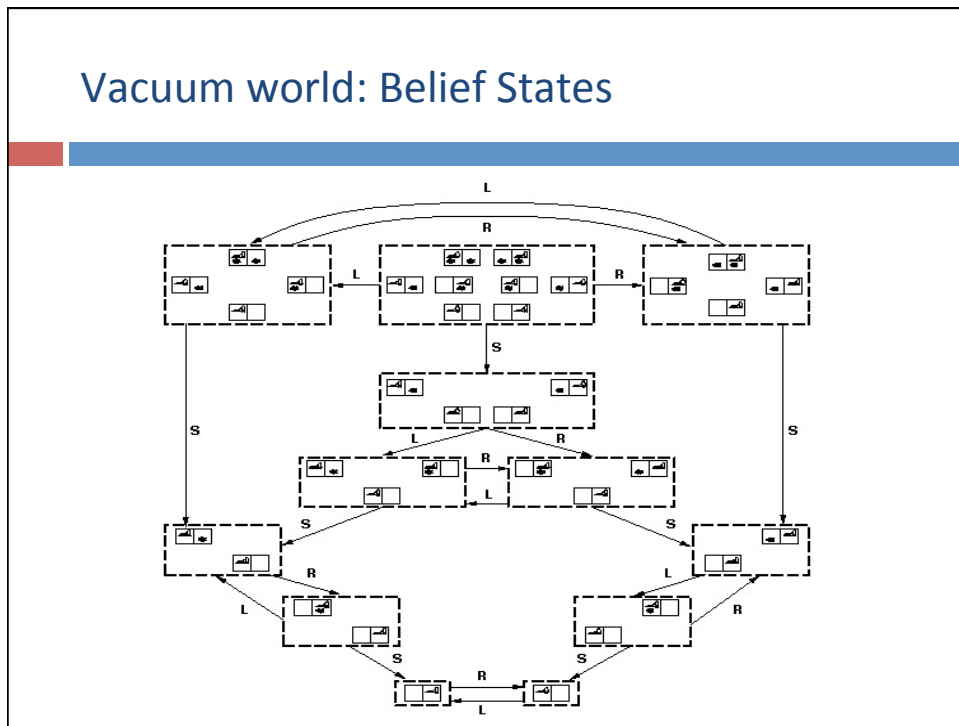
## Today

- An approach for dealing with incomplete knowledge
  
- Introduce an important problem domain: Wumpus

## Incomplete Knowledge

- We don't always know the actual world state
  
- Leads to two questions:
  - ▣ How do we *represent* incomplete knowledge?
  - ▣ How do we *reason* about incomplete knowledge?
  
- Previously mentioned: Belief state
  - ▣ Representation:
    - set of possible states
  - ▣ Reasoning:
    - our search methods from before.

## Vacuum world: Belief States



## Incomplete Knowledge

- Consider  $n$  room version of vacuum-world
  - ▣ Assume no dirt sensors
  - ▣ How many states?
    - $2^n$  possible world states
  - ▣ Search space: all *subsets* of world states

$$2^{2^n}$$

Much simpler (in this case): *reasoning*  
Just go to every room and *Suck!*

## Describing Knowledge

- Often can be much more concise than enumerating possible states
- Idea: construct and manipulate *descriptions* of knowledge
- Some descriptions implicit in others:
  - ▣ At least one room is dirty. Rm B is clean.
  - ▣ Is room A dirty?
  - ▣ How many rooms are dirty?

## Hunt the Wumpus

- Let's see how knowledge and reasoning can help us
- Today:
  - ▣ Focus on concepts and terminology
  - ▣ Use human intuition to solve problems



## Wumpus world: rules

### □ 4x4 grid

- ▣ Pits (P)
- Breeze (B)

	B		
B	<b>P</b>	B	
	B		B
		B	<b>P</b>

Entering a pit is fatal. Can always sense a breeze from an adjoining room.

## Wumpus world: rules

### □ 4x4 grid

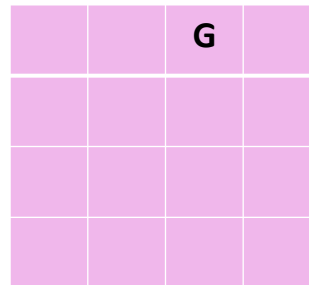
- ▣ Pits (P)
- Breeze (B)
- ▣ Wumpus (W)
- Stench (S)

	S		
S	<b>W</b>	S	
	S		

Encountering a wumpus is fatal. Can always sense a stench from an adjoining room.

## Wumpus world: rules

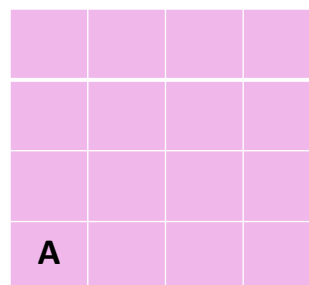
- 4x4 grid
  - ▣ Pits (P)
    - Breeze (B)
  - ▣ Wumpus (W)
    - Stench (S)
  - ▣ Gold (G)



We want to find the gold. We can only detect it when we're on top of it.

## Wumpus world: rules

- 4x4 grid
  - ▣ Pits (P)
    - Breeze (B)
  - ▣ Wumpus (W)
    - Stench (S)
  - ▣ Gold (G)
  - ▣ Agent (A) starts at (1,1)



## Wumpus world: encoding

□ Knowledge Representation:

- $Z_{x,y}$  means "Z" at (x,y)
- $\neg Z_{x,y}$  means "Z" not at (x,y)

S	W	SB	P
	SB	G	B
B	P	B	
A	B		

- Wish to discover location of G and safe squares that let us get there!

## Wumpus world: Example

□ Percepts (Knowledge)

- $A_{1,1}$
- $\neg B_{1,1}$
- $\neg S_{1,1}$

Rules of the game



P,W			
A	P,W		

A yellow arrow points from the 'A' in the bottom-left cell to the 'P,W' in the bottom-middle cell.

- $\neg P_{1,2}, \neg P_{2,1}$
- $\neg W_{1,2}, \neg W_{2,1}$

## Wumpus world: Example

□ Knowledge

from before	<ul style="list-style-type: none"> <li>□ <math>A_{1,1}, \neg B_{1,1}, \neg S_{1,1}</math></li> <li>□ <math>\neg P_{1,2}, \neg P_{2,1}</math></li> <li>□ <math>\neg W_{1,2}, \neg W_{2,1}</math></li> </ul>
new	<ul style="list-style-type: none"> <li>□ <math>S_{2,1}, \neg B_{2,1}</math></li> </ul>

Rules of the game

Inference

□  $\neg P_{2,2}, \neg P_{3,2}$

## Wumpus world: Example

□ Knowledge

from before	<ul style="list-style-type: none"> <li>□ <math>A_{1,1}, \neg B_{1,1}, \neg S_{1,1}</math></li> <li>□ <math>\neg P_{1,2}, \neg P_{2,1}</math></li> <li>□ <math>\neg W_{1,2}, \neg W_{2,1}</math></li> <li>□ <math>S_{2,1}, \neg B_{2,1}</math></li> <li>□ <math>\neg P_{2,2}, \neg P_{3,2}</math></li> </ul>
new	<ul style="list-style-type: none"> <li>□ <math>S_{1,2}, \neg B_{1,2}</math></li> </ul>

Rules of the game

Inference

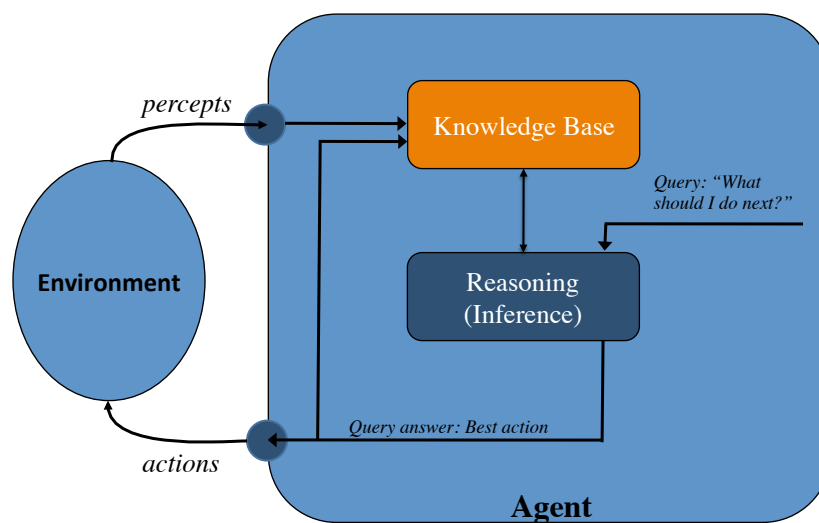
□  $\neg P_{1,3}, W_{2,2}$



## What have we learned?

- We can do well in Hunt the Wumpus without enumerating belief states.
- We can reason about knowledge directly.
  
- But we (humans) were doing the reasoning! How do we get autonomous agents to do the reasoning?

## Knowledge-Based Agent



## Encoding knowledge

- Wumpus: we encoded *some* of our knowledge (the presence/absence of certain features)
- How do we encode the rules of the game?
  - e.g.: “The Wumpus emits a stench that can be detected from adjacent cells”
- We need a more powerful way of encoding knowledge!

## Knowledge Representation

- Knowledge representation **language**: notation for expressing a KB
- Consists of
  - ▣ **Syntax**: defines the legal sentences
  - ▣ **Semantics**: *facts* in the world to which sentences correspond
- **Logic**: KR language with *well-defined* syntax and semantics

## Sentence Syntax

Sentence	→ AtomicSentence   ComplexSentence
AtomicSentence	→ <b>True</b>   <b>False</b>   Symbol
Symbol	→ <b>P</b>   <b>Q</b>   <b>R</b>   ...
ComplexSentence	→ ¬Sentence   (Sentence ∧ Sentence)   (Sentence ∨ Sentence)   (Sentence ⇒ Sentence)   (Sentence ⇔ Sentence)

BNF (Backus-Naur Form) grammar

## Semantics

- Defines an **interpretation** for symbols in the logic
- Example:
  - ▣ Sentence " $D_X$ " interpreted as fact that there is dirt in room  $X$ .
  - ▣ Sentence is **true** if, in the real world, there actually is dirt in room  $X$ .
- **Model** (aka *possible world*)
  - ▣ Specifies truth or falsity of every sentence

## Logical Connectives

- Given boolean value(s), compute a new boolean value.
- Think: digital logic gates!

## Logical Connectives: $\neg$

- Standard boolean “NOT”

A	$\neg A$
0	1
1	0

## Logical Connectives: $\wedge$

- Standard boolean “AND”

A	B	$A \wedge B$
0	0	0
0	1	0
1	0	0
1	1	1

## Logical Connectives: $\vee$

- Standard boolean “OR”
- Not Exclusive

A	B	$A \vee B$
0	0	0
0	1	1
1	0	1
1	1	1

## Remembering $\wedge$ vs. $\vee$

- Helpful mnemonics:
  - $\wedge$  looks like “A” for “And”
  - $\vee$  looks like “V” for “Vel”
- Imagine rain falling from above:
  - $\vee$  collects more  $\rightarrow$  OR
  - $\wedge$  collects less  $\rightarrow$  AND

## Logical Connectives: $\Rightarrow$

- Implication:  $A \Rightarrow B$
- NOT the same as entailment,  $A \models B$
- Note behavior when  $\neg A$

A	B	$A \Rightarrow B$
0	0	1
0	1	1
1	0	0
1	1	1

## Logical Connectives: $\Rightarrow$

- Implication:  $A \Rightarrow B$
- Equivalent expression?

A	B	$A \Rightarrow B$
0	0	1
0	1	1
1	0	0
1	1	1

## Logical Connectives: $\Leftrightarrow$

- Biconditional  $A \Leftrightarrow B$ 
  - ▣ True if  $A \Rightarrow B$  and  $B \Rightarrow A$

A	B	$A \Leftrightarrow B$
0	0	1
0	1	0
1	0	0
1	1	1

## Five Logical Connectives

P	Q	$\neg P$ (not)	$P \wedge Q$ (and)	$P \vee Q$ (or)	$P \Rightarrow Q$ (implies)	$P \Leftrightarrow Q$ (if and only if)
false	false	1	0	0	1	1
false	true	1	0	1	1	0
true	false	0	0	1	0	0
true	true	0	1	1	1	1

## Return of the Wumpus

- We can now encode the rules of the game!

“The Wumpus emits a stench that can be detected from adjacent cells”

~~□  $S_{x,y} \Rightarrow W_{x-1,y} \vee W_{x+1,y} \vee W_{x,y-1} \vee W_{x,y+1}$~~

(right?)

$$\square S_{x,y} \Leftrightarrow W_{x-1,y} \vee W_{x+1,y} \vee W_{x,y-1} \vee W_{x,y+1}$$



## Order of Operations

- What does  $\neg A \wedge B \vee C$  mean?
  - ▣ 1.  $\neg((A \wedge B) \vee C)$
  - ▣ 2.  $\neg(A \wedge (B \vee C))$
  - ▣ 3.  $((\neg A) \wedge B) \vee C$
  - ▣ 4.  $(\neg(A \wedge B)) \vee C$
  
- Always safe to use extra parentheses!
  
- Otherwise, order of operations:
  - ▣ Highest to lowest
  - ▣  $\neg, \wedge, \vee, \Rightarrow, \Leftrightarrow$

## Properties of Sentences

- True or False:
  - ▣ Value of expression (with respect to a particular model)
- Valid:
  - ▣ True in *all* models
- Satisfiable:
  - ▣ True in some model
- Examples:
  - ▣  $D_x \vee \neg D_x$
  - ▣  $D_x \vee D_y$
  - ▣  $D_x \wedge \neg D_x$

## Knowledge Base

- KB is the set of all known true sentences for the actual world model.
  - Contains generalizations (“game rules”) applicable to all instances of “Hunt the Wumpus”
  - Contains percepts applicable to the particular instance we’re playing.

## Entailment

- Suppose we want to know if  $W_{2,2}$  is true, given KB. (does  $KB \models W_{2,2}$ ?)
- We better make sure that there isn’t a model satisfying KB but where  $W_{2,2}$  is false.
  - I.e., is  $(KB \wedge (\neg W_{2,2}))$  unsatisfiable?
  - I.e., is  $(\neg KB \vee W_{2,2})$  valid?
  - I.e., is  $(KB \Rightarrow W_{2,2})$  valid?
- How is that different from the value of  $(KB \Rightarrow W_{2,2})$ ?

A	B	$A \Rightarrow B$
0	0	1
0	1	1
1	0	0
1	1	1

## Entailment

- Relation between sentences, says whether one is implicit in other(s).
  - ▣ KB: a set of sentences
  - ▣  $\alpha$ : a sentence

$$\text{KB} \models \alpha$$

- KB **entails**  $\alpha$
- In every **model of KB** (i.e., a model in which KB is true),  $\alpha$  is true.
- Truth of  $\alpha$  is contained in KB.

## Deduction Theorem

- Entailment and Implication are *different*, but are related to each other via the Deduction Theorem.
- Deduction Theorem:
  - ▣ For any sentences A and B:  
 $((A \Rightarrow B) \text{ is valid}) \text{ iff}$

$$A \models B$$

## Implication vs. Entailment

$$A \models B$$

- Entailment: For all world models in which A is true, B is true. ( $A \Rightarrow B$  is *valid*).

$$A \Rightarrow B$$

- Implication: Compute a boolean value as a function of A and B equal to  $(\neg A \vee B)$ . If  $\neg A$ , we're not saying anything about B.

## Next Time

- Propositional Logic
  - ▣ More ways to manipulate our knowledge
  - ▣ Inference without enumerating all states