

# **Logical Agents**

Slides adopted from Dr. Surangika Ranathunga

Week 6: Introduction to logical agents

Week 7: Logical reasoning

Week 8: Knowledge representation

Week 9: Planning

### Outline

Fundamental concepts

## Agents

Problem solving agent Solution is given, the agent executes it Might not face dynamic problems well

Knowledge based / Planning agents
Given explicit goals
Can achieve competence quickly by being told or learning
Adapt to changes in environment

An Intelligent Agent is a much broader cotegory. It's any system that perceives its environment and takes actions. The "mathematician" is one type of intelligent agent, but so is a self-driving car, a dog, a

k of it this way. All Logical Agents are Intelligent Agents, but not all Intelligent Agents are Logical

## Knowledge-based Agents

Maintain a representation of the world infer new representations of the world Use the representation to decide what to do

representation -> reason -> take action

Summary Table			
Representation	Description	Exemple	Proser
Altomic	Whole state = 1 unit, no structure		
Factored		Tomp-10, Raile-True	
Stratured	Objects + Relations	Farnet(Sales, Rary)	

# Representations

Atomic:

State considered as a whole, No internal structure available to the agent

② Factored:

Assignment of values to variables

Objects and relations Facts: knowledge about relations

# Knowledge?

"Knowing things which helps to reach goals efficiently"

Example: How to go from San Francisco to Marin County?

How to go from University of Moratuwa to Indigaha Thotupola

Procedural Declarative



Learning Agents?

# Knowledge Base (KB)

Where the representation of the world is maintained Consists of a set of "sentences" -> written in a knowledge representation language Base -> a set of axioms

Axiom: ?

Think: knowing how to do something

he KB: You can add new facts to the KB. For example, you can TELL it."Socrates is a human" act is not an axiom; it's a specific piece of information based on the state of the world, the KB: Once the KB has its axioms and its new facts, you can ASK it questions. Using logical

### ΚB

### Need to

Add new info to the KB (TELL)

Retrieve info from KB (ASK)

both involve inference -> derive new info from old

knowledge level (world representation, agents goals) vs implementation level

ne the fundamental properties and relationships of things.

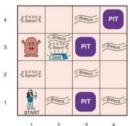
function KB-AGENT(percept) returns an action persistent: KB, a knowledge base t, a counter, initially 0, indicating time

Tell(KB, Make-Percept-Sentence(percept, t)) $action \leftarrow Ask(KB, Make-Action-Query(t))$ Tell(KB, Make-Action-Sentence(action, t))

 $t \leftarrow t + 1$ return action

Real-world applications of the Wumpus World : Designing intelligent agents for autonomous vehicles, robotics, and game creation.

# The Wumpus World



- : You feel a breeze in a room adjacent to a pit.
- er: You see a glitter in the room where the gold is. (This is a direct perception

### Describing the Environment

- Properties of the Wumpus World
  Partially observable: The Wumpus world in AI is partially observable because the agent can only sense the immediate surroundings, such as an adjacent room.
  Deterministic: It is deterministic because the result and end of the world are already known.
  Sequential: It is sequential because the order is essential.
  Static: It is motionless because Wumpus and Pits are not moving.
  Discrete: The surroundings are distinct.
  One agent: The environment is a single agent because we only have one agent, and Wumpus is not regarded as an agent.

### Agent's initial KB

Rules of the environment

		(a)					(b)	
A OK	2,1 OK	3,1	4,1		t,1 V OK	2,1 A B OK	3,1 P?	4,1
ок					ок	2.2 P?		
1,2	2,2	3.2	4,2	V = Visited W = Wumpus	1,2	2.2	3,2	4.2
1,3	2,3	3,3	4,3	OK = Safe square P = Pit S = Stench	1,3	2,3	3,3	4,3
1,4	2,4	3,4	4,4	B = Breeze G = Glitter, Gold	1,4	2,4	3,4	4,4

1,3 W!	2,3	3,3	4,3	G = Glitter, Gold OK = Safe square P = Pit	1,3 WI	2,3 A	3,3 p?	4,3
				S = Stench V = Visited W = Wumaus	- 538	S G B		
1,2 S OK	2,2	3,2	4,2	Walland	1,2 s v OK	2,2 V OK	3,2	4,2
v ok	2,1 B V OK	3,1 Pt	4,1		1,1 V OK	2,1 B V OK	3,1 P!	4,1

### Logic

Fundamental concepts of logical representation and reasoning

### Logical Languages

A KB has sentences

Expression of sentences should be syntactically correct

+2+= v

Svntax??

whax is the rulebook for writing sentences that the computer's reasoning engine can actually pro-fehout strict syntax, a Knowledge Base would be filled with incomprehensible garbage, and logical ference would be impossible. The sentence  $x_i + y_i = y_i$  follows the rulebook. The sentence  $x_i + y_i = y_i$ 

### Semantics

Define the truth of sentences wrt each possible world

Possible world = model = an abstraction where each sentence is either true or

x+y = 9 ???

If a sentence s is true in a model  $m \Rightarrow m$  satisfies s / m is a model of s

 $\alpha \vdash \beta$  if and only if, in every model in which  $\alpha$  is true,  $\beta$  is also true

Set of m which are models of s: M(s)

Logical entailment between sentences

 $\alpha \vdash \beta \text{ if and only if } M(\alpha) \subseteq M(\beta)$ 

x=0 ⊢ xy =0

Logical Reasoning

### The Big Idea: Syntax vs. Semantics

- true in a given situation?\*

- Think of a model as a single, specific, and complete configuration of the universe. It's one pos-scenario where everything has a defined value.
- Model 1 (m<sub>1</sub>): x 5, y α
- Model 3 (m<sub>a</sub>): x = 2, y = 3

## What is Logical Entailment?

other sentence must necessarily also be true.

way to say it is: "Sentence  $\alpha$  entails sentence  $\beta$ " or " $\beta$  is a logical consequence of  $\alpha$ ."

- 1. In Words:  $\alpha \vdash \beta$  if and only if, in every model (possible world) where  $\alpha$  is true,  $\beta$  is also true.
- This means that the truth of a forces the truth of B. There is no possible scenario where a is true but
- 2. In Set Theory:  $a \mapsto B$  if and only if  $M(a) \subseteq M(B)$ .
- n(α) is the set of all models where α is true.  $H(\beta)$  is the set of all models where  $\beta$  is true.
- $P(\alpha) = M(\beta)$  means that every model in  $M(\alpha)$  is also inside  $M(\beta)$ . This is just the set version of the

- Now, let's check its truth in our r
- In m<sub>2</sub> (x=2, y=3): 2 + 3 5 is not 9. This is False, m<sub>2</sub> does not satisfy the sentence

### "m is a model of s" / "m satisfies s"

### N(s) - The Set of All Models of s

- For our sentence \$1 x + y = 9, the set M(s) is infinitely large! It contains every single pair of
- $M(5) = \{ \ w_1 \ (5,4) \ , \ w_2 \ (9,6) \ , \ w_4 \ (6,3) \ , \ w_2 \ (10,-1) \ , \ w_4 \ (4.5,4.5) \ , ... \ and so on forever \}$

ce β (The conclusion): x \* y = a

Imagine all possible models (worlds) where x = 0 is TRUE.

- In all these worlds, x is zero. The value of y can be anything—1, 5, -188, x—it doesn't mat

- Now, check if x \* y = e is TRUE in every single one of these models.
- In the model  $\{x:0,\ y:1\}:0$  \* 1=0 -> True
- in the model  $\{x=0, y=180\}$  ; 8 \* (-180) = 0 -> True
- In ANY model where x-e, multiplying it by any y will always result in o
- ion: Since x \* y = 0 is true in every single model where x = 0 is true, we can say entails x \* y = 0.

ory:  $a \vdash \beta$  if and only if  $M(a) \subseteq M(\beta)$ 

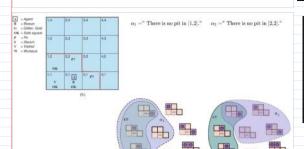
- $H(\beta)$  is the set of all models where  $\beta$  is true
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mples: P, Q, NampusAlive. Each is a complete, "atomic

e Literal: P ("It is raining")

ive Literal: 🐷 ("It is not raining")

- ale model where x = e is true, we can save x - 8 entails x \* y - 8.



### Why This is the Heart of Logical Reasoning

- ices (facts and rules). This KB corresponds to a large set of models ing the KB know
- n you ASK(KB, β), the KB checks: "Is β true in every single model in N(KB)?"
  - If the answer is was then IRI in R. The KR can prove that R must be true based on what it knows it
- If there is even one model in M(KB) where  $\beta$  is false, then  $KB \neq \beta$ . The KB cannot be sure  $\beta$  is all

### Logical Inference

Derive conclusions using entailment

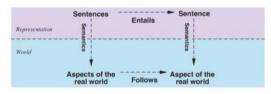
Model checking - enumerates all possible models to check that a sentence is true in all the models where the KB is true 
Brute force method

i - inference algorithm, should be sound, truth preserving and complete Model checking works if your space of models is finite

Later..... Theorem proving Smart method

is the process of using known facts to derive or prove new facts. It's the "thinking" step

### Grounding



if KB is true in the real world, then any sentence derived from KB by a sound inference procedure is also true in the real world

### Propositional Logic - syntax

Propositional symbols - stands for a proposition that can be true or false

 $P,Q,R,W_{1,2}$  and FacingEast, True, False

Atomic sentences - Consists of s single propositional symbol

Literal - atomic sentence or its negation (negative literal)

Complex sentences are constructed from simpler sentences, using parentheses and operators called logical connectives

¬. ∧ . ∨ . ⇒ . ⇔

 $Sentence \rightarrow AtomicSentence \mid ComplexSentence$ 

 $AtomicSentence \rightarrow True \mid False \mid P \mid Q \mid R \mid \dots$ 

Operator Precedence :  $\neg, \land, \lor, \Rightarrow, \Leftrightarrow$ 

nal Symbols (The Basic Facts)

P (Could mean "It is raining")

g (Could mean "The sprinkler is on")

- Example: -P ("not P"), -(P v q) ("not (P or Q)")
- ation: You can connect two sentences with an "and" (A).
- lec P A Q ("P and Q"), (A V B) A -C ("(A or B) and not C")

- slation: You can connect two sentences with an "implies" ( ) or "if-then
- Example: P -> Q ("If P then Q")
- ces with an "if and only if" ( 🌝 )
- ple:  $P \leftrightarrow Q$  ("P if and only if Q")

ling with logic, a "situation" is called a model.

What is a Model?

# ComplexSentence → (Sentence) ¬ Sentence Sentence ∧ Sentence Sentence ∨ Sentence Sentence ⇒ Sentence Sentence ⇔ Sentence

### Propositional Logic - semantics

Defines the rules for determining the truth of a sentence with respect to a particular model

Models in propositional logic - simply sets the truth value—true or false— for every proposition symbol

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Models in propositional logic - simply sets the truth value—true or false— for every proposition symbol

E.g. proposition symbols P,Q, R

One possible model m, = {P= true, Q=true, R=false}

### What is a Model?

- The slide's example has three symbols: ₱, ℚ, ℝ.

models for these three symbols could be:

- m, (P True, Q False, H True)

### Computing the Truth Value of Sentences

The semantics for propositional logic must specify how to compute the truth value of any sentence, given a model

¬Р

QAP

PVQ

 $P \Rightarrow Q$ 

P⇔ Q

P	Q
false	false
false	true
true	false
true	true

P	Q	$\neg P$	$P \wedge Q$	$P \lor Q$	$P \Rightarrow Q$	$P \Leftrightarrow Q$
false	false	true	false	false	true	true
false true	true false	true false	false false	true	false	false false
true	true	false	true	true	true	true

### A Simple Knowledge Base

 $P_{x,y}$  is true if there is a pit in [x,y].

 $W_{x,y}$  is true if there is a wumpus in [x,y], dead or alive.

 $B_{x,y}$  is true if there is a breeze in [x,y].

 $S_{x,y}$  is true if there is a stench in [x,y].

 $L_{x,y}$  is true if the agent is in location [x,y].

New sentences  $R_1R_2R_3$ There is no pit in [1,1]  $R_1$  =

A square is breezy if and only if there is a pit in a neighboring square(consider [1,1]) R<sub>2</sub>: ??

R<sub>3</sub>:??

 $R_4: \neg B_{1,1}$  $R_5: B_{2,1}.$ 



### Inferencing

Is a sentence  $\alpha$  entailed by the KB??

KB⊢α

One way to implement an inference algorithm is model checking

Enumerate all the models

Check if a is true when KB is true

 $\mathsf{B}_{1,1}\,\mathsf{B}_{2,1}\,\mathsf{P}_{1,1}\,\mathsf{P}_{1,2}\,\mathsf{P}_{2,1}\,\mathsf{P}_{2,2}\,\mathsf{P}_{3,1}$ 

the agent has detected nothing in [1,1] and a breeze in [2,1]



$B_{1,1}$	$B_{2,1}$	$P_{1,1}$	$P_{1,2}$	$P_{2,1}$	$P_{2,2}$	$P_{3,1}$	$R_1$	$R_2$	$R_3$	$R_4$	$R_5$	KB
false	false	false	false	false	false	false	true	true	true	true	false	false
false	false	false	false	false	false	true	true	true	false	true	false	false
:	:	:	:	:	:	:	:	:	:	:	:	:
false	true	false	false	false	false	false	true	true	false	true	true	false
false false false	true true true	false false false	false false false	false false false	false true true	true false true	true true true	true true true	true true true	true true true	true true true	true true
false	true	false	false	true	false	false	true	false	false	true	true	false
:	:	:	:	:	:	:	:	:	:	:	:	:
true	true	true	true	true	true	true	false	true	true	false	true	false

### Theorem Proving

applying rules of inference directly to the sentences in our knowledge base to construct a proof of the desired sentence without consulting models

Beneficial over model checking if there are a large number of models

### Logical Equivalence

Two sentences are logically equivalent if they are true in the same set of models

### Validity

sentence is valid if it is true in all models

Valid sentences are also known as tautologies

Useful in developing deduction theorems

### Satisfiability

A sentence is satisfiable if it is true in, or satisfied by, some model

Satisfiability can be checked by enumerating the possible models until one is found that satisfies the sentence

Validity and satisfiability are connected:

 $\alpha$  is valid if  $\neg\alpha$  is unsatisfiable; contrapositively,  $\alpha$  is satisfiable iff  $\neg\alpha$  is not valid

### Monotonicity

The set of entailed sentences can only increase as information is added to the knowledge base

$$KB \models \alpha$$
 then  $KB \land \beta \models \alpha$ 

### Inference and Proofs

inference rules that can be applied to derive a proof —a chain of conclusions that leads to the desired goal

Modes Ponens

$$\alpha \Rightarrow \beta, \alpha$$

And elimination

$$\alpha \wedge \beta$$

All of the logical equivalences can be used as inference rules

$$(\alpha \Leftrightarrow \beta) \equiv ((\alpha \Rightarrow \beta) \land (\beta \Rightarrow \alpha))$$

This biconditional elimination yields the following inference rules

$$\frac{\alpha \Leftrightarrow \beta}{(\alpha \Rightarrow \beta) \land (\beta \Rightarrow \alpha)} \qquad \text{and} \qquad \frac{(\alpha \Rightarrow \beta) \land (\beta \Rightarrow \alpha)}{\alpha \Leftrightarrow \beta}$$

 $R_1 : \neg P_{1,1}$ 

$$P_2: B_{1,1} \Leftrightarrow (P_{1,2} \vee P_{2,1})$$
  $R_6: (B_{1,1} \Rightarrow (P_{1,2} \vee P_{2,1})) \wedge ((P_{1,2} \vee P_{2,1}) \Rightarrow B_{1,1})$ 

$$R_3: B_{2,1} \Leftrightarrow (P_{1,1} \vee P_{2,2} \vee P_{3,1})$$

 $R_1: G_{1,1}$   $R_2: G_{1,1} \Leftrightarrow (P_{1,2} \vee P_{2,1})$   $R_3: G_{2,1} \Leftrightarrow (P_{1,1} \vee P_{2,2} \vee P_{3,1})$  $R_4: \neg B_{1,1}$  $R_7: ((P_{1,2} \vee P_{2,1}) \Rightarrow B_{1,1})$  $R_5: B_{2,1}$ .  $R_8: (\neg B_{1,1} \Rightarrow \neg (P_{1,2} \lor P_{2,1}))$ 

$$R_{10}: \neg P_{1,2} \land \neg P_{2,1}$$
 $R_{0}: \neg (P_{1,2} \lor P_{2,1})$ 

INITIAL STATE: the initial knowledge base.

ACTIONS: the set of actions consists of all the inference rules applied to all the sentences that match the top half of the inference rule.

RESULT: the result of an action is to add the sentence in the bottom half of the

GOAL: the goal is a state that contains the sentence we are trying to prove

$$\frac{\alpha \Rightarrow \beta, \quad \alpha}{\beta}$$

# Proof by Resolution

 $egin{array}{ll} R_{11}: & \neg B_{1,2}. \\ R_{12}: & B_{1,2} \Leftrightarrow (P_{1,1} \lor P_{2,2} \lor P_{1,3}) \\ R_{13}: & \neg P_{2,2} \end{array}$  $R_2 : B_{1,1} \Leftrightarrow (P_{1,2} \vee P_{2,1})$ .  $R_3: B_{2,1} \Leftrightarrow (P_{1,1} \vee P_{2,2} \vee P_{3,1})$  $R_{14}: \neg P_{1,3}$  $R_4: \neg B_{1,1}$   $R_5: B_{2,1}$  $R_{15}: P_{1,1} \lor P_{2,2} \lor P_{3,1}$   $R_{16}: P_{1,1} \lor P_{3,1}$  $R_6: (B_{1,1} \Rightarrow (P_{1,2} \vee P_{2,1})) \wedge ((P_{1,2} \vee P_{2,1}) \Rightarrow B_{1,1})$  $R_7: ((P_{1,2} \vee P_{2,1}) \Rightarrow B_{1,1})$  $R_{17}: P_{3,1}$ 

 $R_8: (\neg B_{1,1} \Rightarrow \neg (P_{1,2} \vee P_{2,1}))$  $R_9: \neg (P_{1,2} \vee P_{2,1})$  $R_{10}: \neg P_{1,2} \wedge \neg P_{2,1}$ 

### CNF

Resolution rule applies only to disjunctions of literals (clauses)

Every sentence of propositional logic is logically equivalent to a conjunction of clauses

$$B_{1,1} \Leftrightarrow (P_{1,2} \vee P_{2,1})$$

Eliminate the biconditional  $(B_{1,1} \Rightarrow (P_{1,2} \lor P_{2,1})) \land ((P_{1,2} \lor P_{2,1}) \Rightarrow B_{1,1})$ 

 $\text{Eliminate} \Rightarrow \qquad \left(\neg B_{1,1} \vee P_{1,2} \vee P_{2,1}\right) \wedge \left(\neg \left(P_{1,2} \vee P_{2,1}\right) \vee B_{1,1}\right)$ 

### CNF

CNF requires the negation to appear only in literals

 $\neg(\neg\alpha) \equiv \alpha \text{ (double-negation elimination)} \\ \neg(\alpha \land \beta) \equiv (\neg\alpha \lor \neg\beta) \text{ (De Morgan)}$ 

 $\neg(\alpha \lor \beta) \equiv (\neg\alpha \land \neg\beta)$  (De Morgan)

 $(\neg B_{1,1} \lor P_{1,2} \lor P_{2,1}) \land ((\neg P_{1,2} \land \neg P_{2,1}) \lor B_{1,1})$ 

Apply Distributive Law  $(\neg B_{1,1} \lor P_{1,2} \lor P_{2,1}) \land (\neg P_{1,2} \lor B_{1,1}) \land (\neg P_{2,1} \lor B_{1,1})$