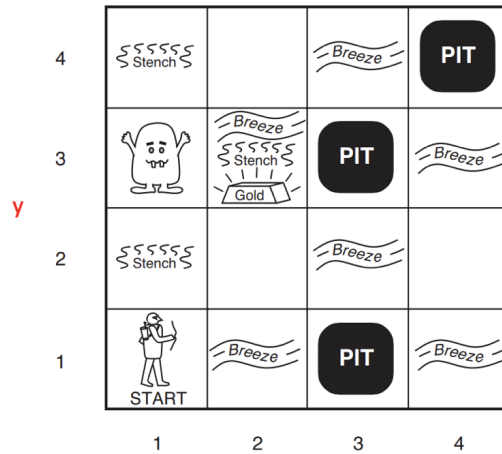


Logic II

1. Review

a. Example World

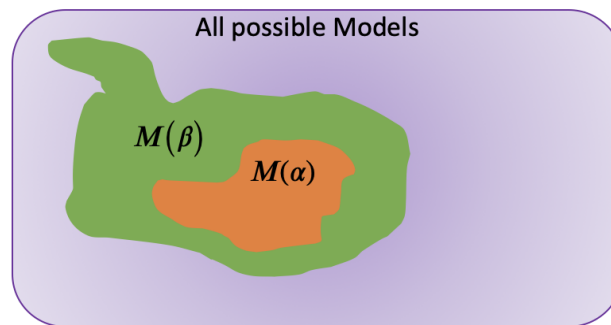


- i.
- ii. Performance Measure:
 1. +1000 when escaping w/ gold
 2. -1000 for dying (falling into pit / eaten)
 3. -1 for each action taken
 4. -10 using your only arrow
- iii. Environment:
 1. 4x4 grid
 2. Agent always starts in (1,1)
 3. Gold + Wumpus chosen randomly (uniformly) from squares not (1,1)
 4. Pit appears in each square with prob 0.2
- iv. Actions:
 1. Go forward 1 square
 2. Turn left/right by 90 degrees
- v. Sensing:
 1. Squares adjacent to Wumpus have stench
 2. Squared adjacent to pits have breezes
 3. Square with gold in it is glittery
 4. Bump when agent walks into a wall
 5. Wumpus emits a scream when killed (heard anywhere)
- vi. Percept(t) = [Stench, Breeze, Glitter, Bump, Scream]

b. Reasoning

- i. Now we have a notion of “truth”
 1. Can execute the sentence on a hypothetical world (model) \rightarrow and check whether a sentence is true or false
- ii. Want to relate two sentences to each other
- iii. If sentence α logically follows from sentence β :
 $\alpha \models \beta$
 1. For example, if $x = 0$, then $x * y = 0 \rightarrow$ true
 2. $x = 0$ entails $x * y = 0$
- iv. Every model in which α is true, β is also true

$$\alpha \models \beta \text{ iff } M(\alpha) \subseteq M(\beta)$$



v.

1. In the example above, $M(\beta)$ is $x = 0$ and $M(\alpha)$ is $x * y = 0$

c. Entailment & Inference

- i. Goal:
 1. Find sentences that are entailed by our KB
 2. Add them to our KB
 3. How?
 - a. Algorithm from the previous slide is called model-checking
 - i. Enumerate every possible model & check!
 - ii. Calculate if $M(KB) \subseteq M(\alpha)$ by brute force
 - iii. Brute force guarantees that it finds all possible sentences and also the correctness of those
- ii. Inference algorithm tries to derive sentences that are entailed by KB
 1. Let's differentiate entailment from derivation
 - a. If inference algorithm A can derive α from KB:
 $KB \vdash_A \alpha$ now check the quality of the inference algorithm
- iii. Properties of Inference algorithms:
 1. Soundness
 - a. Only derive entailed sentences (do not make things up)
 2. Completeness
 - a. Can derive every entailed sentences

2. Sentence Structure: Propositional Logic

a. Two kinds of propositional logic sentences:

i. Atomic sentences:

1. A single propositional symbol

- True/False
- Variable

ii. Complex sentences:

1. Atomic sentences connected via operators (and parantheses):

- Not \neg
- And \cap
- Or \cup
- Implies \Rightarrow
- Iff \Leftrightarrow

3. Propositional Logic

a. Semantics

i. Each model fixed truth value (True/False) for every variable

1. Is there a wumpus at (1,1) \rightarrow False

2. Is there a wumpus at (2,2) \rightarrow Can be True or False \rightarrow put variable

ii. Can evaluate truth value of sentences for a model

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

iii.

4. Propositional Sentences + Wumpus World

a. Need lots of variables:

i. Variables for percepts:

1. $S_{1,1}, S_{1,2}, \dots, S_{4,4}$ (is there a stench at (x,y))

2. $B_{1,1}, B_{1,2}, \dots, B_{4,4}$ (is there a breeze at (x,y))

3. $Glitter_{1,1}, Glitter_{1,2}, \dots, Glitter_{4,4}$ (is there a glitter at (x,y))

4. ... (continue)

ii. Variables for Unknowns

1. $W_{1,1}, W_{1,2}, \dots, W_{4,4}$ (is there a wumpus at (x,y))

2. $P_{1,1}, P_{1,2}, \dots, P_{4,4}$ (is there a pit at (x,y))

3. $Gold_{1,1}, Gold_{1,2}, \dots, Gold_{4,4}$ (is there a gold at (x,y))

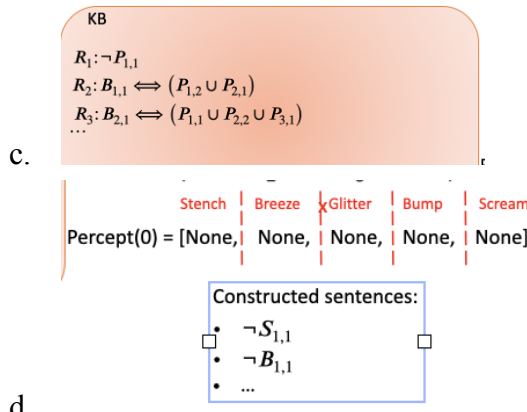
iii. Complex sentences:

1. Axioms:

- a. $B_{1,1} \iff (P_{1,2} \cup P_{2,1}), \dots$
 - i. Breeze is at (1,1) if and only if there is a pit at (1,2) or (2,1)
- b. $S_{1,1} \iff (W_{1,2} \cup W_{2,1}), \dots$
 - i. Stench is at (1,1) if and only if there is a wumpus at (1,2) or (2,1)
- c. ... (can make a lot of these)

5. KB + Wumpus World

- a. KB starts off with axioms inside it (axioms are rules not derived, but it is assumed to be true)
- b. Also know $\neg P_{1,1}$ and $\neg W_{1,1}!$ \rightarrow starting point is safe



- d.
 - i. Can make many sentences from perceptions \rightarrow add them to KB

6. Inference

- a. The goal is to derive some new sentences 'a' to add to our KB
 - i. Want to derive 'a's that are entailed from our KB!
- b. How?
 - i. Model checking = truth table enumeration (we can make a big true table)
 - ii. Tree search?
 - 1. Exponential for propositional logic (co-NP-complete)

c. Theorem proving!

- i. Math on logic sentences
- ii. Two sentences α, β are logically equivalent iff true in the same models:

$$\alpha \models \beta \iff \alpha \models \beta \cap \beta \models \alpha$$

- 1. Two sentences are equivalent if they entail each other

iii. A sentence is valid iff it is true in all models (i.e. tautology)

iv. A sentence 'a' is satisfiable iff $\exists m \in |M(\alpha)| > 0$ (at least one)

7. Theorem Proving

a. For any α, β :

$\alpha \models \beta \iff (\alpha \implies \beta)$ is valid

i. Does ' α ' imply β ?

ii. We can check if $\alpha \models \beta$ by checking that $(\alpha \implies \beta)$ is true in every model!

b. For any α, β :

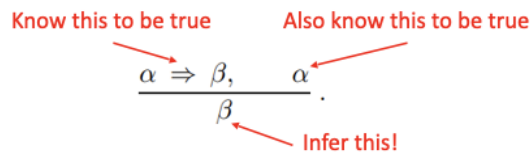
$\alpha \models \beta \iff (\alpha \cap \neg\beta)$ is unsatisfiable

i. We can check if $\alpha \models \beta$ by checking that there is no model that satisfies $(\alpha \cap \neg\beta)$

ii. Proof by contradiction

8. Inference Rules

a. Modus Ponens:



i. If ' α ' implies β and ' α ' is true, then β can be implied (β is true)

b. And-Elimination:

$$\frac{\alpha \wedge \beta}{\alpha}$$

i. If we know two sentences, one of them is always true

ii. If ' α ' and β is true, then ' α ' is true

c. These two rules are Sound!

i. If I only know these two rules, I can check entail sentences

ii. Avoid enumerating models!

1. Just simply use the mathematical rules

2. Apply rules (no need to search through all the models)

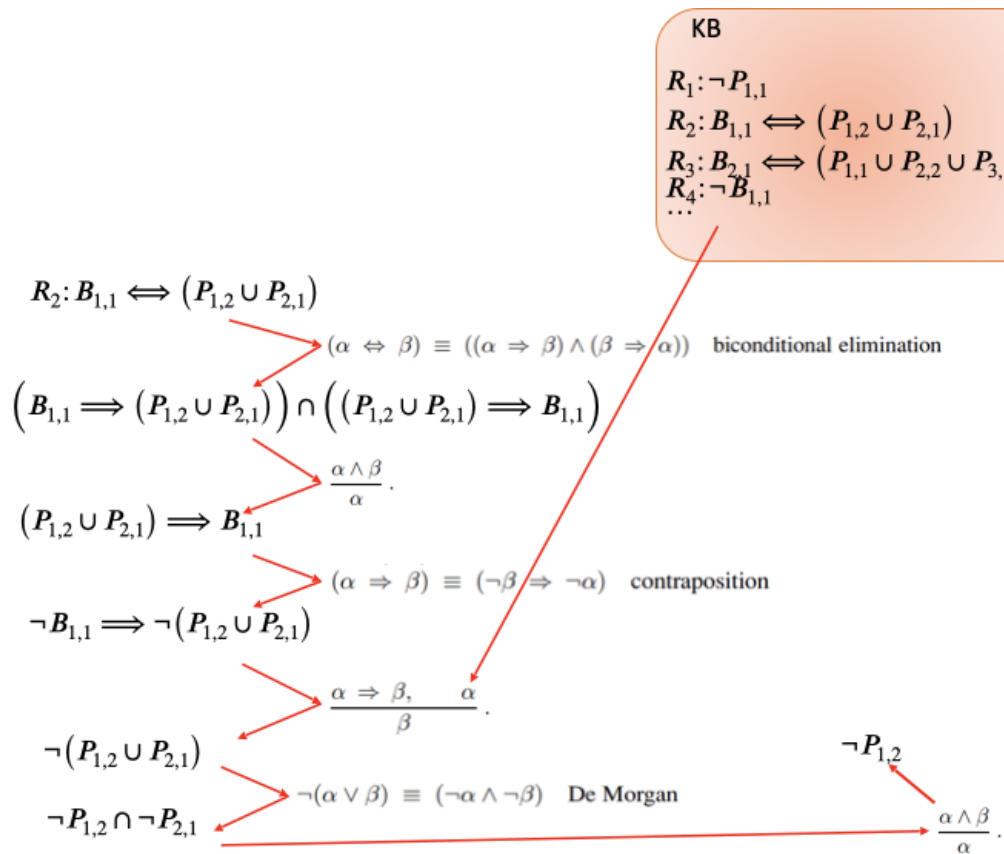
Logical equivalence

$$\begin{aligned}
 (\alpha \wedge \beta) &\equiv (\beta \wedge \alpha) && \text{commutativity of } \wedge \\
 (\alpha \vee \beta) &\equiv (\beta \vee \alpha) && \text{commutativity of } \vee \\
 ((\alpha \wedge \beta) \wedge \gamma) &\equiv (\alpha \wedge (\beta \wedge \gamma)) && \text{associativity of } \wedge \\
 ((\alpha \vee \beta) \vee \gamma) &\equiv (\alpha \vee (\beta \vee \gamma)) && \text{associativity of } \vee \\
 \neg(\neg\alpha) &\equiv \alpha && \text{double-negation elimination} \\
 (\alpha \Rightarrow \beta) &\equiv (\neg\beta \Rightarrow \neg\alpha) && \text{contraposition} \\
 (\alpha \Rightarrow \beta) &\equiv (\neg\alpha \vee \beta) && \text{implication elimination} \\
 (\alpha \Leftrightarrow \beta) &\equiv ((\alpha \Rightarrow \beta) \wedge (\beta \Rightarrow \alpha)) && \text{biconditional elimination} \\
 \neg(\alpha \wedge \beta) &\equiv (\neg\alpha \vee \neg\beta) && \text{De Morgan} \\
 \neg(\alpha \vee \beta) &\equiv (\neg\alpha \wedge \neg\beta) && \text{De Morgan} \\
 (\alpha \wedge (\beta \vee \gamma)) &\equiv ((\alpha \wedge \beta) \vee (\alpha \wedge \gamma)) && \text{distributivity of } \wedge \text{ over } \vee \\
 (\alpha \vee (\beta \wedge \gamma)) &\equiv ((\alpha \vee \beta) \wedge (\alpha \vee \gamma)) && \text{distributivity of } \vee \text{ over } \wedge
 \end{aligned}$$

d.

9. Using Inference Rules

a. Is there a pit in (1,2)?



b.

c. Round 1: try to derive every sentences I can and continue

d. If you cannot come up with any more sentences, you stop

10. Inference Algorithms

- a. Use any search algorithm
- b. Proof problem:
 - i. Initial state = initial KB
 - ii. Actions = all inference rules applied to all sentences that match the top half of inference rule
 - iii. Result of applying an action = add the sentence in the bottom half of the inference rule to the KB
 - iv. Goal: state that contains the sentence we are trying to prove! (stop search)
- c. Searching for proof = enumerating all possible models!
 - i. More efficient
 - 1. Ignoring irrelevant variables
 - 2. Skipping over the things that are false