
Interpretation and Model Checking in First Order Logic

Fundamentals of Artificial Intelligence

Slides are mostly adapted from AIMA and MIT Open Courseware

FOL Interpretations

- Interpretation I
 - U set of objects
(called "domain of discourse" or "universe")
 - Maps constant symbols to elements of U
 - Maps predicate symbols to relations on U
(binary relation is a set of pairs)
 - Maps function symbols to functions on U
(function is a binary relation with a single pair for each element in U, whose first item is that element)
-



Holds

When does a sentence hold in an interpretation?

- P is a relation symbol
- t_1, \dots, t_n are terms

holds($P(t_1, \dots, t_n), I$) iff $\langle I(t_1), \dots, I(t_n) \rangle \in I(P)$

Brother(Jon, Joe)??

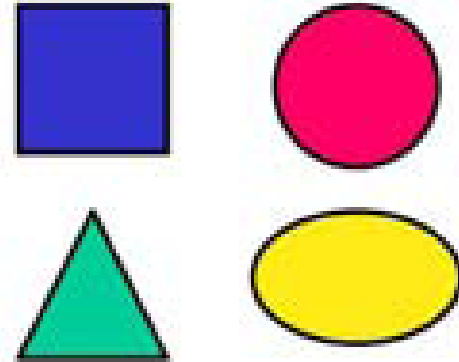
- $I(\text{Jon}) =$  [an element of U]
- $I(\text{Joe}) =$  [an element of U]
- $I(\text{Brother}) = \{ \langle \text{glasses man}, \text{dark hair man} \rangle, \langle \text{dark hair man}, \text{reddish hair man} \rangle, \langle \dots, \dots \rangle, \dots \}$

Extend an interpretation I to bind variable x to element $a \in U$: $I_{x/a}$

- holds($\forall x.\Phi, I$) iff holds($\Phi, I_{x/a}$) for all $a \in U$
- holds($\exists x.\Phi, I$) iff holds($\Phi, I_{x/a}$) for some $a \in U$

Example Domain

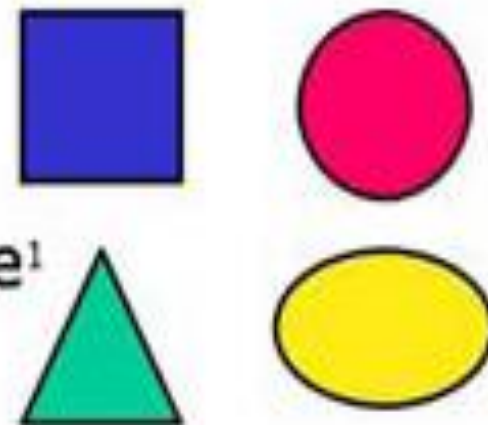
- $U = \{\square, \triangle, \circ, \text{oval}\}$



The Real
World

Example Domain

- $U = \{\blacksquare, \blacktriangle, \bullet, \bullet\}$
- Constants: Fred
- Preds: Above², Circle¹, Oval¹, Square¹
- Function: hat
- $I(\text{Fred}) = \blacktriangle$
- $I(\text{Above}) = \{\langle \blacksquare, \blacktriangle \rangle, \langle \bullet, \bullet \rangle\}$
- $I(\text{Circle}) = \{\langle \bullet \rangle\}$
- $I(\text{Oval}) = \{\langle \bullet \rangle, \langle \bullet \rangle\}$
- $I(\text{hat}) = \{\langle \blacktriangle, \blacksquare \rangle, \langle \bullet, \bullet \rangle, \langle \blacksquare, \blacksquare \rangle, \langle \bullet, \bullet \rangle\}$
- $I(\text{Square}) = \{\langle \blacktriangle \rangle\}$



The Real
World

Example Domain

- $I(\text{Fred}) = \triangle$
- $I(\text{Above}) = \{ \langle \blacksquare, \triangle \rangle, \langle \bullet, \circ \rangle \}$
- $I(\text{Circle}) = \{ \langle \bullet \rangle \}$
- $I(\text{Oval}) = \{ \langle \bullet \rangle, \langle \circ \rangle \}$
- $I(\text{hat}) = \{ \langle \triangle, \blacksquare \rangle, \langle \circ, \bullet \rangle, \langle \blacksquare, \blacksquare \rangle, \langle \bullet, \bullet \rangle \}$
- $I(\text{Square}) = \{ \langle \triangle \rangle \}$

- $\text{holds}(\text{Square}(\text{Fred}), I) ?$ **yes**
- $\text{holds}(\text{Above}(\text{Fred}, \text{hat}(\text{Fred})), I) ?$ **no**
 - $I(\text{hat}(\text{Fred})) = \blacksquare$
 - $\text{holds}(\text{Above}(\triangle, \blacksquare), I) ?$ **no**
- $\text{holds}(\exists x. \text{Oval}(x), I) ?$ **yes**
 - $\text{holds}(\text{Oval}(x), I_{x/\bullet}) ?$ **yes**

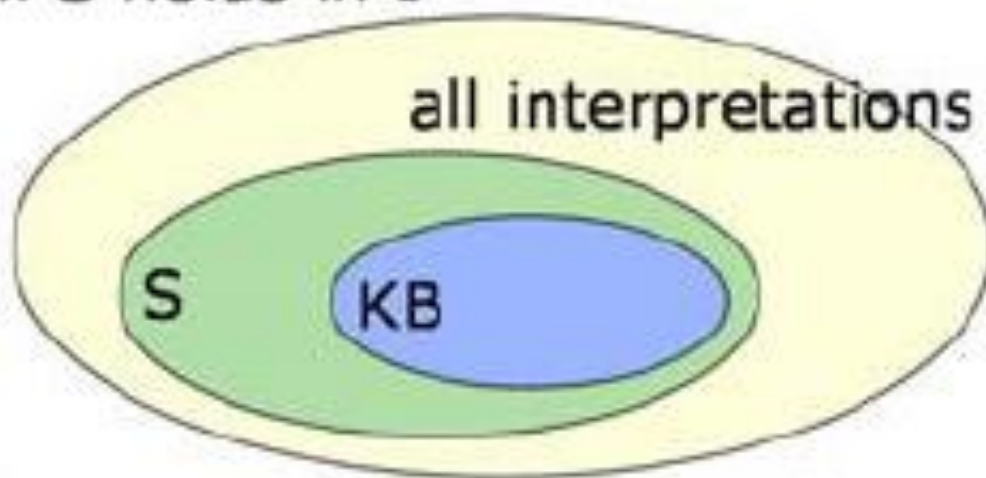
Example Domain

- $I(\text{Fred}) = \triangle$
- $I(\text{Above}) = \{ \langle \blacksquare, \blacktriangle \rangle, \langle \bullet, \bullet \rangle \}$
- $I(\text{Circle}) = \{ \langle \bullet \rangle \}$
- $I(\text{Oval}) = \{ \langle \bullet \rangle, \langle \bullet \rangle \}$
- $I(\text{hat}) = \{ \langle \blacktriangle, \blacksquare \rangle, \langle \bullet, \bullet \rangle, \langle \blacksquare, \blacksquare \rangle, \langle \bullet, \bullet \rangle \}$
- $I(\text{Square}) = \{ \langle \blacktriangle \rangle \}$

- $\text{holds}(\forall x. \exists y. \text{Above}(x,y) \vee \text{Above}(y,x), I) ?$ **yes**
 - $\text{holds}(\exists y. \text{Above}(x,y) \vee \text{Above}(y,x), I_{x/\blacktriangle}) ?$ **yes**
 - $\text{holds}(\text{Above}(x,y) \vee \text{Above}(y,x), I_{x/\blacktriangle, y/\blacksquare}) ?$ **yes**
 - verify for all other values of x
- $\text{holds}(\forall x. \forall y. \text{Above}(x,y) \vee \text{Above}(y,x), I) ?$ **no**
 - $\text{holds}(\text{Above}(x,y) \vee \text{Above}(y,x), I_{x/\blacksquare, y/\bullet}) ?$ **no**

Entailment in First Order Logic

- KB entails S: for every interpretation I , if KB holds in I , then S holds in I



- Computing entailment is impossible in general, because there are infinitely many possible interpretations
 - Even computing holds is impossible for interpretations with infinite universes
-

Intended Interpretations

KB : $(\forall x. \text{Circle}(x) \rightarrow \text{Oval}(x)) \wedge (\forall x. \text{Square}(x) \rightarrow \neg \text{Oval}(x))$

S : $\forall x. \text{Square}(x) \rightarrow \neg \text{Oval}(x)$

- We know $\text{holds}(\text{KB}, I)$
- We wonder whether $\text{holds}(S, I)$
- We could ask:
Does KB entail S?
- Or we could just try to check whether $\text{holds}(S, I)$

- $I(\text{Fred}) = \triangle$
- $I(\text{Above}) = \{ \langle \blacksquare, \blacktriangle \rangle, \langle \bullet, \bullet \rangle \}$
- $I(\text{Circle}) = \{ \langle \bullet \rangle \}$
- $I(\text{Oval}) = \{ \langle \bullet \rangle, \langle \bullet \rangle \}$
- $I(\text{hat}) = \{ \langle \blacktriangle, \blacksquare \rangle, \langle \bullet, \bullet \rangle, \langle \blacksquare, \blacksquare \rangle, \langle \bullet, \bullet \rangle \}$
- $I(\text{Square}) = \{ \langle \blacktriangle \rangle \}$

An Infinite Interpretation

$KB : (\forall x. \text{Circle}(x) \rightarrow \text{Oval}(x)) \wedge (\forall x. \text{Square}(x) \rightarrow \neg \text{Oval}(x))$

$S : \forall x. \text{Square}(x) \rightarrow \neg \text{Oval}(x)$

- Does KB hold in I_1 ?
- Yes, but can't answer via enumerating U
- S also holds in I_1
- No way to verify mechanically

$U_1 = \{1, 2, 3, \dots\}$

$I_1(\text{circle}) = \{4, 8, 12, 16, \dots\}$

$I_1(\text{oval}) = \{2, 4, 6, 8, \dots\}$

$I_1(\text{square}) = \{1, 3, 5, 7, \dots\}$

An Argument for Entailment

$KB : (\forall x. \text{Circle}(x) \rightarrow \text{Oval}(x)) \wedge (\forall x. \text{Square}(x) \rightarrow \neg \text{Oval}(x))$

$S_1 : \forall x, y. \text{Circle}(x) \wedge \text{Oval}(y) \wedge \neg \text{Circle}(y) \rightarrow \text{Above}(x, y)$

- $I(\text{Fred}) = \triangle$
- $I(\text{Above}) = \{ \langle \blacksquare, \blacktriangle \rangle, \langle \bullet, \bullet \rangle \}$
- $I(\text{Circle}) = \{ \langle \bullet \rangle \}$
- $I(\text{Oval}) = \{ \langle \bullet \rangle, \langle \bullet \rangle \}$
- $I(\text{hat}) = \{ \langle \blacktriangle, \blacksquare \rangle, \langle \bullet, \bullet \rangle, \langle \blacksquare, \blacksquare \rangle, \langle \bullet, \bullet \rangle \}$
- $I(\text{Square}) = \{ \langle \blacktriangle \rangle \}$

- $U_1 = \{1, 2, 3, \dots\}$
- $I_1(\text{Circle}) = \{4, 8, 12, 16, \dots\}$
- $I_1(\text{Oval}) = \{2, 4, 6, 8, \dots\}$
- $I_1(\text{Square}) = \{1, 3, 5, 7, \dots\}$
- $I_1(\text{Above}) = \>$

- $\text{holds}(KB, I)$
- $\text{holds}(S_1, I)$

- $\text{holds}(KB, I_1)$
- $\text{fails}(S_1, I_1)$

KB doesn't entail S_1 !

Proof and Entailment

- Entailment captures general notion of “follows from”
 - Can't evaluate it directly by enumerating interpretations
 - So, we'll do proofs
 - In FOL, if S is entailed by KB , then there is a finite proof of S from KB
-

Axiomatization

- What if we have a particular interpretation, I , in mind, and want to test whether $\text{holds}(S, I)$?
 - Write down a set of sentences, called *axioms*, that will serve as our KB
 - We would like KB to hold in I , and as few other interpretations as possible
 - No matter what,
 - If $\text{holds}(\text{KB}, I)$ and KB entails S ,
 - then $\text{holds}(S, I)$
 - If your axioms are weak, it might be that
 - $\text{holds}(\text{KB}, I)$ and $\text{holds}(S, I)$, but
 - KB doesn't entail S
-

Axiomatization Example

Above(A, C)

KB₂

Above(B, D)

$\forall x, y. \text{Above}(x, y) \rightarrow \text{hat}(y) = x$

$\forall x. (\neg \exists y. \text{Above}(y, x)) \rightarrow \text{hat}(x) = x$



S $\text{hat}(A) = A$

- holds(KB₂, I₂)
- fails(S, I₂)
- KB₂ doesn't entail S

• I₂(A) =

• I₂(B) =

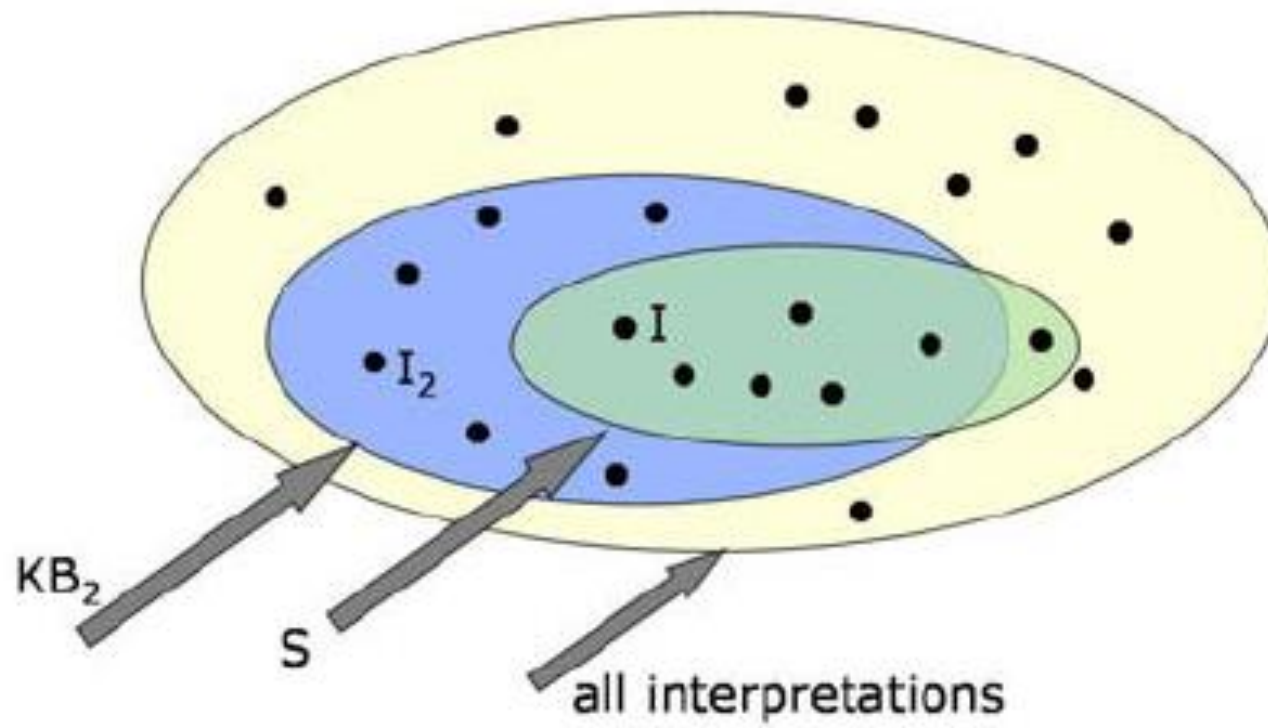
• I₂(C) =

• I₂(D) =

• I₂(Above) = { <, , , ,

• I₂(hat) = { <, , , ,

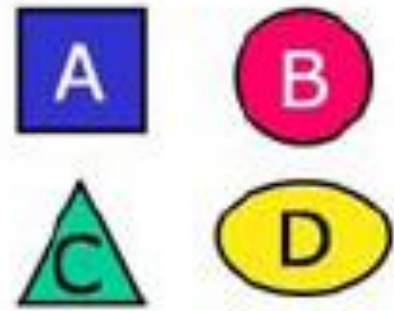
KB₂ is a Weakling!



Axiomatization Example: Another Try

$Above(A, C)$
 $Above(B, D)$
 $\forall x, y. Above(x, y) \rightarrow \hat{y} = x$
 $\forall x. (\neg \exists y. Above(y, x)) \rightarrow \hat{x} = x$
 $\forall x, y. Above(x, y) \rightarrow \neg Above(y, x)$

KB_3



S $\hat{A} = A$

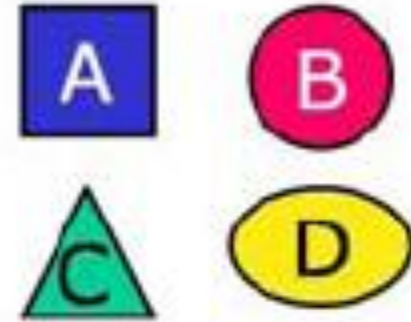
- fails(KB_3, I_2)
- holds(KB_3, I_3)
- fails(S, I_3)
- KB_3 doesn't entail S

- $I_3(A) = \blacksquare$
- $I_3(B) = \bullet$
- $I_3(C) = \blacktriangle$
- $I_3(D) = \circ$
- $I_3(Above) = \{ \langle \blacksquare, \blacktriangle \rangle, \langle \bullet, \circ \rangle, \langle \bullet, \blacksquare \rangle \}$
- $I_3(\hat{}) = \{ \langle \blacktriangle, \blacksquare \rangle, \langle \circ, \bullet \rangle, \langle \bullet, \bullet \rangle, \langle \blacksquare, \bullet \rangle \}$

Axiomatization Example: One last time

$Above(A, C)$
 $Above(B, D)$
 $\neg \exists x. Above(x, A)$
 $\neg \exists x. Above(x, B)$
 $\forall x, y. Above(x, y) \rightarrow \hat{y} = x$
 $\forall x. (\neg \exists y. Above(y, x)) \rightarrow \hat{x} = x$

KB_4



S $\hat{A} = A$

- $\text{fails}(KB_4, I_3)$
- KB_4 entails S

We'll prove S from KB_4 later.