

# CS 520: Introduction to Artificial Intelligence

Prof. Louis Steinberg

Lecture 11:

First-order Logic

Proof Algorithms

## Review

### Representing a Domain in FOL

- A domain is a portion of the world about which we wish to express knowledge.
- We can define a set of basic predicates from which all other predicates can be defined.

### An FOL Agent

- Executive tells KB what sensors perceive
- Executive asks KB what it should do

# Review - Types of FOL Agents

- **Reflex agent**
  - Non-FOL: percept --rule--> action
  - FOL:  
percept --inference--> abstract percept --inference--> action
- **FOL agents with state**
  - percept -----inference--> world state --inference--> action
  - world state .....

# Review - Situation Calculus

- **How to represent changeable facts in FOL**
- **Basic idea: time is a sequence of *states***

## States and Predicates

- **Every changeable predicate gets an extra parameter: the state.**
- **Effect, frame, and successor state axioms**

# Inference in FOL

- **Inference in FOL is semi-decidable**
  - **There are algorithms such that:**
    - **If an inference can be proven, the algorithm will produce a proof in finite time**
    - **If the inference cannot be proven, the algorithm may run forever**
  - **And this is the best we can do**
- **One such algorithm is Resolution Refutation**

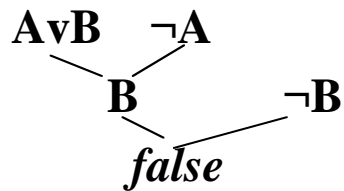
## The key problem in FOL inference is handling universals

$$\forall x \text{ even}(x) \Leftrightarrow \exists y x=2*y$$

$$\Rightarrow \text{even}(324) \Leftrightarrow \exists y 324=2*y$$

# Resolution Refutation

- **Refutation proof:**
  - to prove that KB entails  $\alpha$ ,  
add  $\neg\alpha$  to KB and infer *false*
- **Eg, propositionally,**
  - KB:  $A \vee B, \neg A$ . Prove:  $B$
  - KB +  $\neg\alpha$  :  $A \vee B, \neg A, \neg B$



# Generalized Modus Ponens

- **Generalized Modus Ponens (GMP):**

$$\frac{A_1, \dots, A_n, A_1 \wedge \dots \wedge A_n \Rightarrow B}{B}$$

- **Equivalent Resolution Refutation:**

$$\frac{A_1, \dots, A_n, \neg A_1 \vee \dots \vee \neg A_n \vee B, \neg B}{\textit{false}}$$

# GMP and Quantifiers

- We can get rid of  $\exists$  by Skolemization
  - If we have  $\exists x P(x)$ , make up a name for the object that makes this true.
 
$$\exists x \forall y \text{ loves}(y, x) \text{ ----} \rightarrow \forall y \text{ loves}(y, s)$$
  - Must be a new name.
 
$$\forall y \text{ loves}(y, \text{Raymond})$$
  - If there are  $\forall$  outside the  $\exists$ , use a function
 
$$\forall y \exists x \text{ loves}(y, x) \text{ ----} \rightarrow \forall y \text{ loves}(y, s(y))$$

$$\forall w \forall y \exists x P(w, x) \wedge Q(x, y) \text{ -----} \rightarrow$$

$$\forall w \forall y P(w, s(w, y)) \wedge Q(s(w, y), y)$$

# GMP and $\forall$

## Problem:

Anything a cow eats is a plant  $\forall x \text{ eats}(\text{cow}, x) \Rightarrow \text{plant}(x)$

Everything eats lettuce  $\forall y \text{ eats}(y, \text{lettuce})$

---

Lettuce is a plant  $\text{plant}(\text{lettuce})$

These are not identical!

But if we substitute lettuce for y and cow for x

$\text{eats}(\text{cow}, \text{lettuce}) \Rightarrow \text{plant}(\text{lettuce})$

$\text{eats}(\text{cow}, \text{lettuce})$

$\text{plant}(\text{lettuce})$

# GMP and $\forall$

If there is a substitution  $\theta$  such that

$$\text{SUBST}(\theta, P_i) = \text{SUBST}(\theta, P_i')$$

$$\text{SUBST}(\theta, Q) = \text{SUBST}(\theta, Q')$$

$$\frac{\text{Then } P'_1, \dots, P'_n, P_1 \wedge \dots \wedge P_n \Rightarrow Q}{Q'}$$

## Example

John loves his mother

Everyone's mother loves them

To love one who loves you is to be happy

---

John is happy

$P_1'$ : loves (John, mother-of (John))

$P_2'$ :  $\forall x$  loves (mother-of (x), x)

$P_1 \wedge P_2 \wedge \dots \wedge P_n \Rightarrow Q$ :

$\forall x, y$  loves (y, z)  $\wedge$  loves(z, y)  $\Rightarrow$  happy(y)

---

$Q'$ : happy (John)

# P's and Q's and $\theta$

$P_1' = \text{loves}(\text{John}, \text{mother-of}(\text{John}))$   
 $P_1 = \text{loves}(y, z)$

$P_2' = \text{loves}(\text{mother-of}(x), x)$   
 $P_2 = \text{loves}(z, y)$

$\theta = \{y/\text{John}, z/\text{mother-of}(\text{John}), x/\text{John}\}$

$Q' = \text{happy}(\text{john})$   
 $Q = \text{happy}(y)$

How?

## Unification

- **Make variables in each sentence unique**  
Already ok.

- **For each pair of atomic sentences:**

$\text{loves}(\text{John}, \text{mother-of}(\text{John}))$   
 $\text{loves}(y, z)$

➡ **Predicates must be the same**

➡ **Unify each pair of corresponding terms**

# Unifying Terms

- If either term is a variable:

John                    y

add the substitution variable / other-term to  $\theta$  :

{ y / John }

# Unifying Terms

- If either term is a variable:

John                    y

add the substitution variable / other-term to  $\theta$  :

{ y / John }

apply to all sentences:

loves (John,    mother-of (John))

loves (y,    z)

loves (mother-of (x), x)

loves (z, y)



# Unifying Terms

- If either term is a variable:

John                      y

add the substitution variable / other-term to  $\theta$  :

{ y / John }

apply to all sentences:

loves (John, mother-of (John))

loves (John, z)

loves (mother-of (x), x)

loves (z, John)

## Again

- Unify next pair of terms

mother-of (John)      z

$\theta = \{ y / \text{John}, z / \text{mother-of}(\text{John}) \}$

loves (John, mother-of (John))

loves (John, mother-of (John))

loves (mother-of (x), x)

loves (mother-of (John), John)

## Next Pair of Atomic Sentences

loves (mother-of (x), x)  
loves (mother-of (John), John)

- **Predicates match**  
loves loves
- **Match terms, first**  
mother-of (x)  
mother-of (John)

## To match Function Terms:

mother-of (x)  
mother-of (John)

- **Functions must be the same**  
mother-of mother-of
- **Then match arguments**  
x  
John  
 $\theta = \{y / \text{John}, x / \text{mother-of}(\text{John}), x / \text{John}\}$   
loves (John, mother-of (John))  
loves (John, mother-of (John))  
loves (mother-of (John), John)  
loves (mother-of (John), John)

# Final Pair of Terms

**John**

**John**

- **Two constants only match if they are the same.**

## Final $\theta$

$$\theta = \{ y / \text{John}, \\ z / \text{mother-of}(\text{John}), \\ x / \text{John} \}$$

- **Note: “Occurs check”**
  - **Can’t unify  $x$  with  $f(x)$**

# Summary of Unification

- **Unify-Sentences(A, B)**
  - Unify corresponding atomic sentences
- **Unify-Atomic Sentences (A, B)**
  - If either A or B is a variable, add substitution **var /** other term to  $\theta$  and apply to A and B
  - If predicates differ, fail
  - Unify corresponding terms
- **Unify-terms**
  - If both A and B are constants  
if  $A=B$  succeed else fail
  - If both A and B are function terms
    - If not same function, fail
    - Unify-terms on corresponding arguments

## Normal Forms

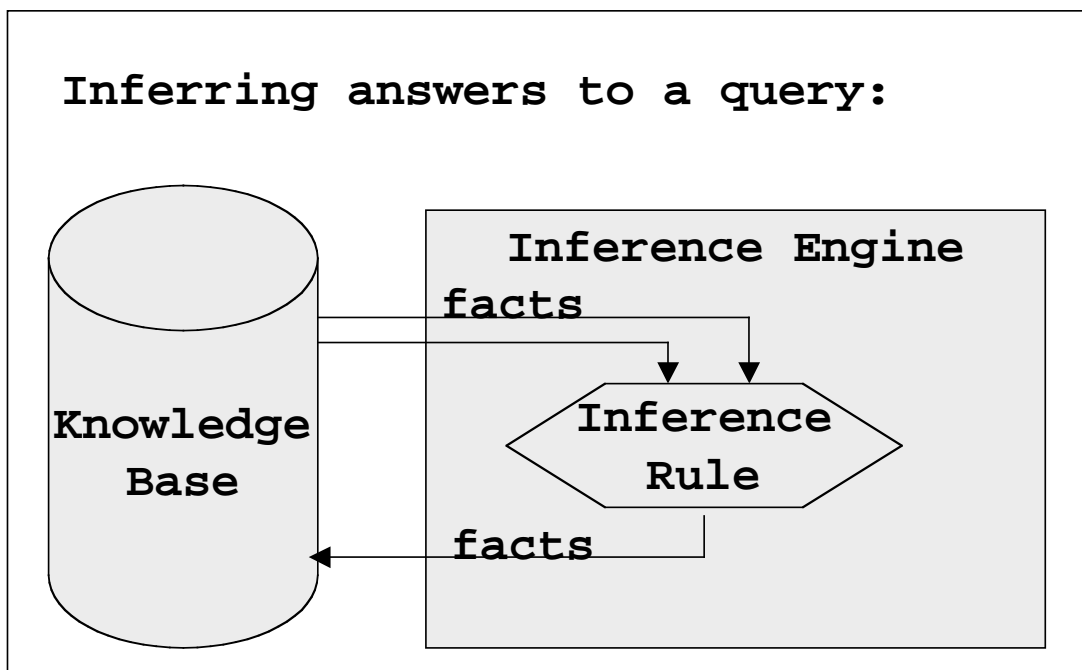
- **We have discussed two proof methods involving two different inference rules:**
  - **Generalized Modus Ponens**
  - **Resolution refutation**
- **Each requires the KB in a certain form**
  - **GMP: implicative normal form (inf)**  
 $A(x) \wedge B(x) \wedge \dots \wedge C(x) \Rightarrow D(x)$
  - **RR: conjunctive normal form (cnf)**  
 $A(x) \vee B(x) \vee \dots \vee D(x)$

# Conjunctive Normal Form

- **Eliminate implications**
- **Move  $\neg$  inwards**
- **Standardize variables**
- **Move quantifiers left**
- **Skolemize  $\exists$**
- **Distribute  $\wedge$**

**(For INF: gather negative literals and convert to implication)**

## What's Wrong With This Picture?



# Forward vs Backward Chaining

**Forward:**

- I have
  - $P_1'$
  - $P_2'$
  - $P_1 \wedge P_2 \Rightarrow Q$
- I get Q

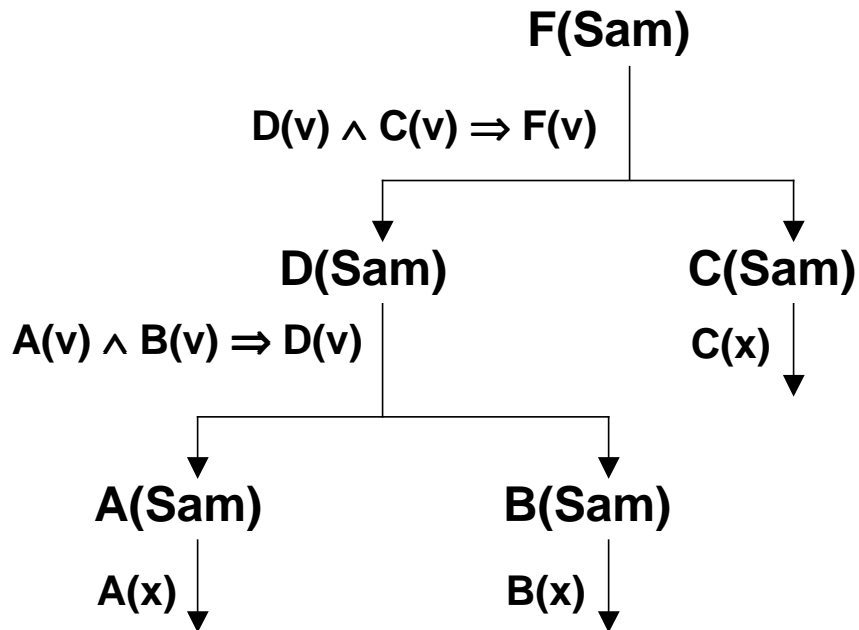
**Backward:**

- I want Q'
- I have
  - $P_1 \wedge P_2 \Rightarrow Q$
- So now I want
  - $P_1'$
  - $P_2'$

## Example

- **KB:**
  - A(x)
  - B(y)
  - C(z)
  - $A(w) \wedge B(w) \Rightarrow D(w)$
  - $D(v) \wedge C(v) \Rightarrow F(v)$
- **Query:**
  - F(Sam)

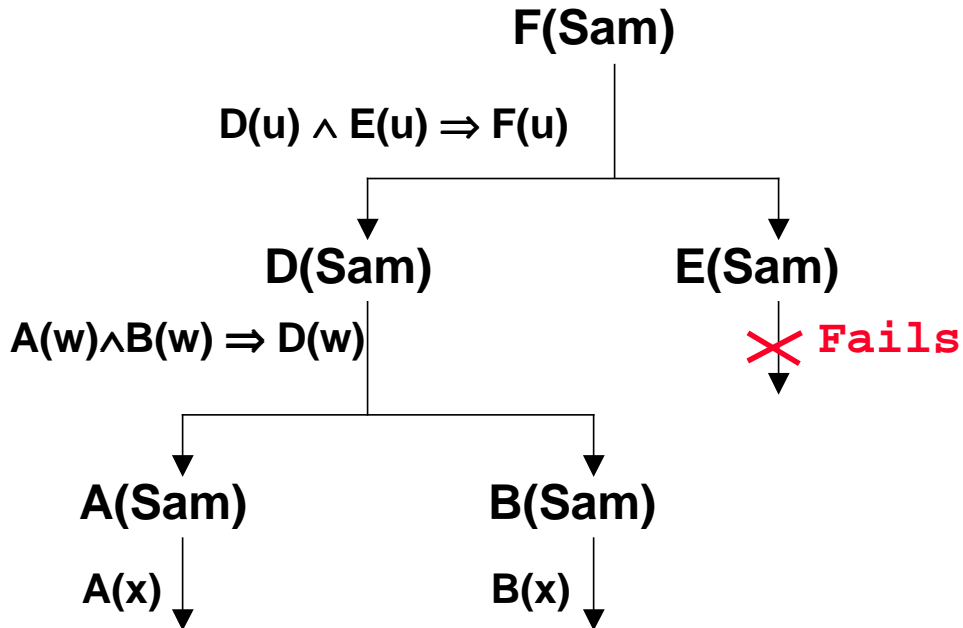
# A Proof Tree



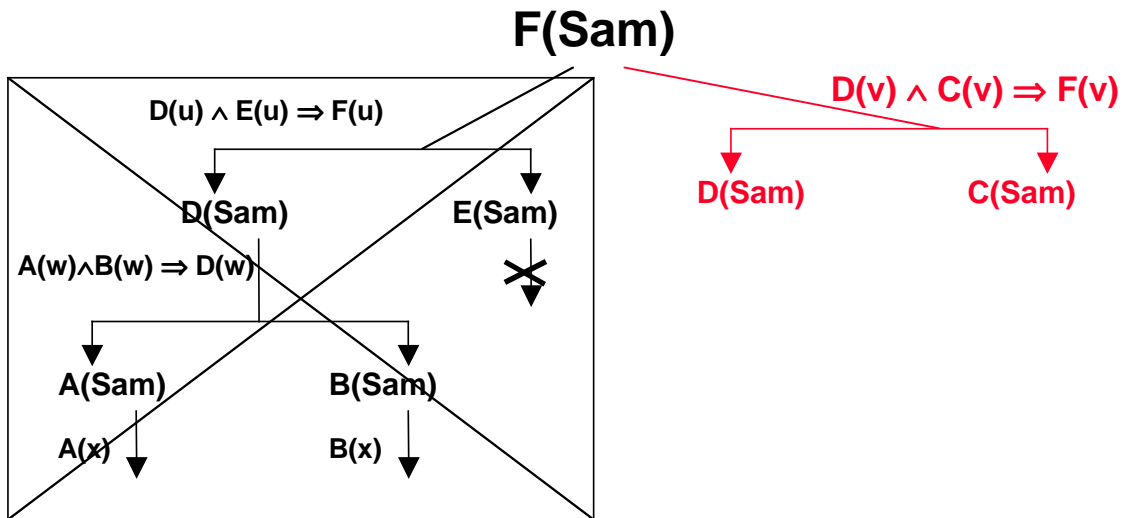
# An Example With a Choice

- **KB:**
  - A(x)
  - B(y)
  - C(z)
  - A(w) ∧ B(w) ⇒ D(w)
  - D(u) ∧ E(u) ⇒ F(u)
  - D(v) ∧ C(v) ⇒ F(v)
- **Query:**
  - F(Sam)

# Searching for a Proof Tree

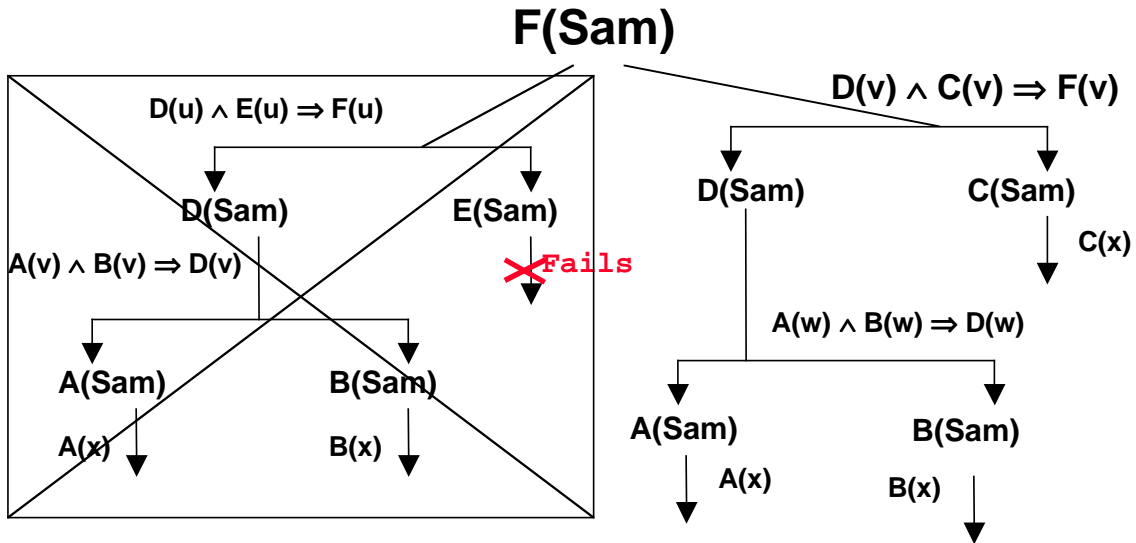


# Find a Choice Point





# And Continue



# Searching a Tree of Search Trees

