CS344: Introduction to Artificial Intelligence (associated lab: CS386)

> Pushpak Bhattacharyya CSE Dept., IIT Bombay Lecture 17, 18: Predicate Calculus 15<sup>th</sup> and 16<sup>th</sup> Feb, 2011

# Predicate Calculus: well known examples

Man is mortal : rule

 $\forall x[man(x) \rightarrow mortal(x)]$ 

- shakespeare is a man man(shakespeare)
- To infer shakespeare is mortal mortal(shakespeare)

#### Inferencing: Forward Chaining

- $\blacksquare man(x) \rightarrow mortal(x)$ 
  - Dropping the quantifier, implicitly Universal quantification assumed
  - man(shakespeare)
- Goal mortal(shakespeare)
  - Found in one step
  - x = shakespeare, unification

## **Backward Chaining**

- $\blacksquare man(x) \rightarrow mortal(x)$
- Goal mortal(shakespeare)
  - x = shakespeare
  - Travel back over and hit the fact asserted
  - man(shakespeare)

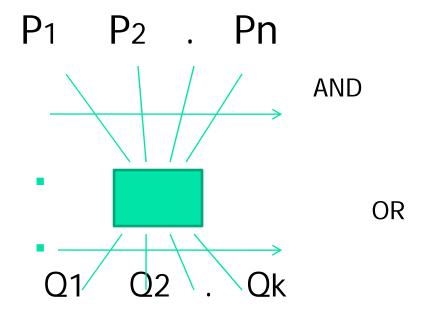
# Factors influencing Forward and Backward chaining

- Is the goal precisely known?
- Fan-in and Fan-out of rules.

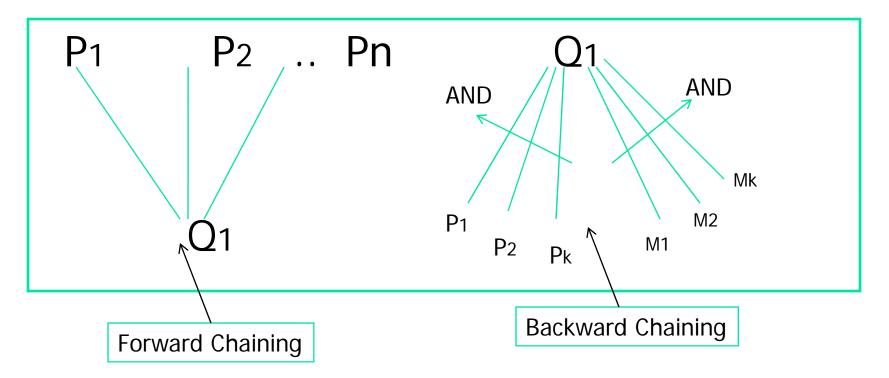
#### **Rule Structure**

- R1:
   P1 ^ P2 ^ P3 ^ .... ^ Pn
   Q1

   R2:
   P1 ^ P2 ^ P3 ^ .... ^ Pn
   Q2
- Rk: P1 ^ P2 ^ P3 ^ . . . . . ^ Pn Qk

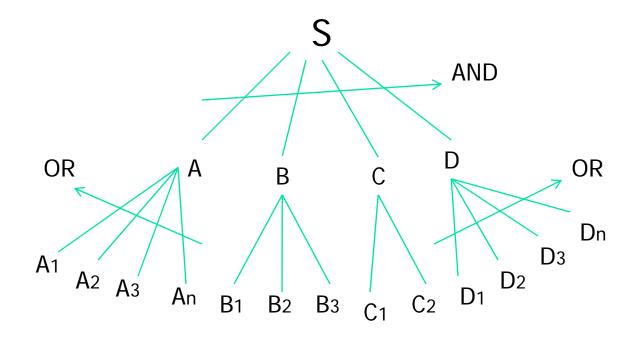


#### Pictorial Representation of Forward and Backward chaining



• If Fan-out is less Forward chaining is preferable ?

#### Important Data structure: AND-OR Graph



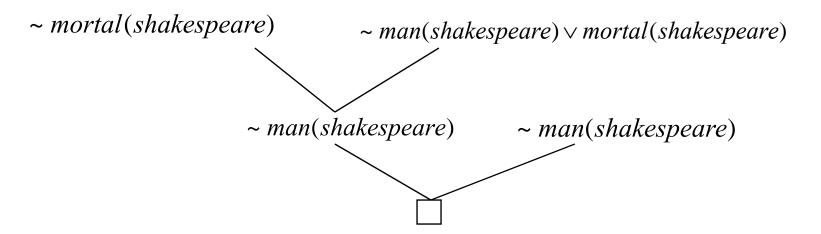
• Structure of AND-OR Graph decides the direction of inferencing.

#### **Resolution - Refutation**

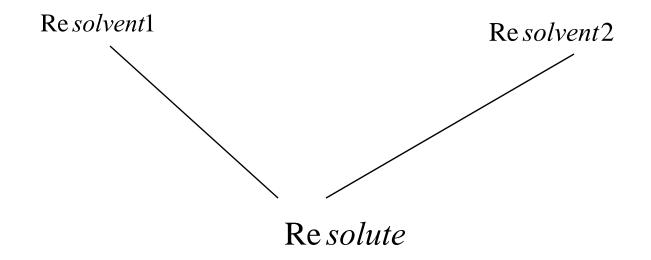
- $\blacksquare man(x) \rightarrow mortal(x)$ 
  - Convert to clausal form
  - ~man(shakespeare) \/ mortal(x)
- Clauses in the knowledge base
  - ~man(shakespeare) \/ mortal(x)
  - man(shakespeare)
  - mortal(shakespeare)

#### Resolution – Refutation contd

- Negate the goal
  - ~man(shakespeare)
- Get a pair of resolvents







#### Search in resolution

#### Heuristics for Resolution Search

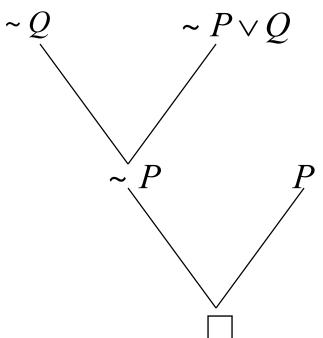
- Goal Supported Strategy
  - Always start with the negated goal
- Set of support strategy
  - Always one of the resolvents is the most recently produced resolute

#### Inferencing in Predicate Calculus

- Forward chaining
  - Given P,  $P \rightarrow Q$ , to infer Q
  - P, match *L*.*H*.*S* of
  - Assert Q from *R*.*H*.*S*
- Backward chaining
  - Q, Match R.H.S of  $P \rightarrow Q$
  - assert P
  - Check if P exists
- Resolution Refutation
  - Negate goal
  - Convert all pieces of knowledge into clausal form (disjunction of literals)
  - See if contradiction indicated by null clause a be derived

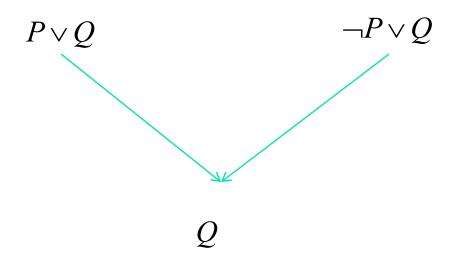
- 1. P
- 2.  $P \rightarrow Q$  converted to  $\sim P \lor Q$
- 3. **~** Q

Draw the resolution tree (actually an inverted tree). Every node is a clausal form and branches are intermediate inference steps.



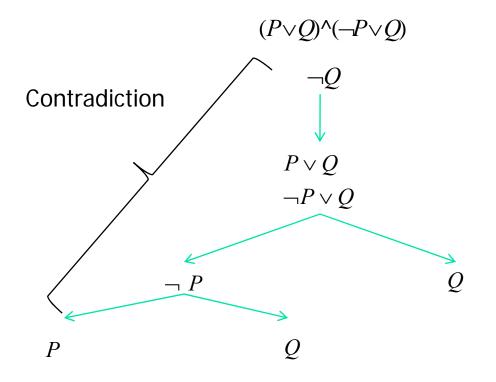
#### Theoretical basis of Resolution

- Resolution is proof by contradiction
- resolvent1 .AND. resolvent2 => resolute is a tautology



#### **Tautologiness of Resolution**

Using Semantic Tree



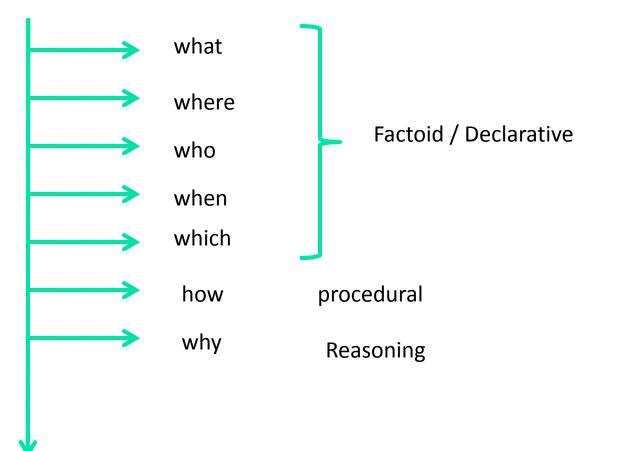
# Theoretical basis of Resolution (cont ...)

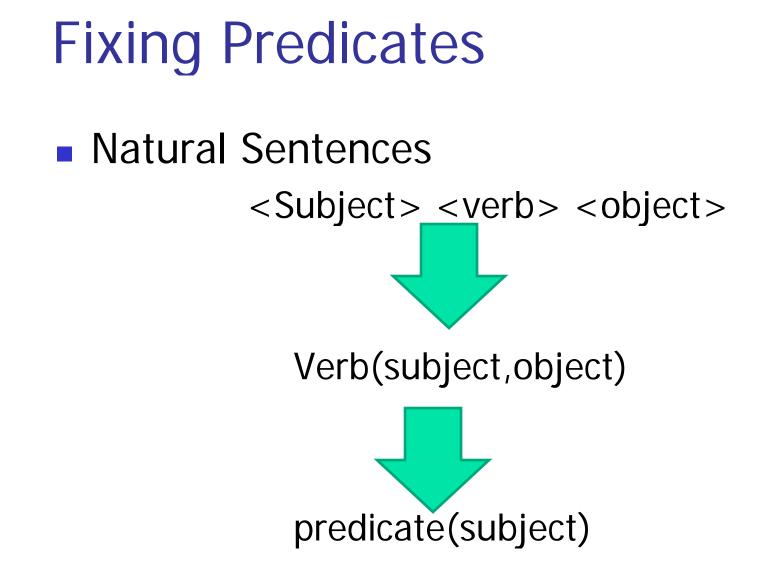
- Monotone Inference
  - Size of Knowledge Base goes on increasing as we proceed with resolution process since intermediate resolvents added to the knowledge base
- Non-monotone Inference
  - Size of Knowledge Base does not increase
  - Human beings use non-monotone inference

#### Terminology

- Pair of clauses being <u>resolved</u> is called the <u>Resolvents</u>. The resulting clause is called the <u>Resolute</u>.
- Choosing the correct pair of resolvents is a matter of search.

#### Wh-Questions and Knowledge





#### Examples

- Ram is a boy
  - Boy(Ram)?
  - Is\_a(Ram,boy)?
- Ram Playes Football
  - Plays(Ram,football)?
  - Plays\_football(Ram)?

## Knowledge Representation of Complex Sentence

In every city there is a thief who is beaten by every policeman in the city"

 $\forall x [city(x) \rightarrow \{ \exists y ((thief(y) \land lives\_in(y, x)) \land \forall z (poleceman(z, x) \rightarrow beaten\_by(z, y))) \} ]$ 

## Himalayan Club example

- Introduction through an example (Zohar Manna, 1974):
  - Problem: A, B and C belong to the Himalayan club. Every member in the club is either a mountain climber or a skier or both. A likes whatever B dislikes and dislikes whatever B likes. A likes rain and snow. No mountain climber likes rain. Every skier likes snow. *Is there a member who is a mountain climber and not a skier?*
- Given knowledge has:
  - Facts
  - Rules

#### Example contd.

- Let *mc* denote mountain climber and *sk* denotes skier.
   Knowledge representation in the given problem is as follows:
  - 1. member(A)
  - 2. member(B)
  - 3. member(C)
  - 4.  $\forall x [member(x) \rightarrow (mc(x) \lor sk(x))]$
  - 5.  $\forall x[mc(x) \rightarrow \sim like(x, rain)]$
  - $6. \quad \forall x[sk(x) \rightarrow like(x, snow)]$
  - $\mathbf{z} \quad \forall \mathbf{x}[like(B, \mathbf{x}) \rightarrow ~like(A, \mathbf{x})]$
  - 8.  $\forall x[\sim like(B, x) \rightarrow like(A, x)]$
  - 9. like(A, rain)
  - *10. like(A, snow)*
  - 11. Question:  $\exists x [member(x) \land mc(x) \land \neg sk(x)]$
- We have to infer the 11<sup>th</sup> expression from the given 10.
- Done through Resolution Refutation.

#### Club example: Inferencing

- 1. *member(A)*
- 2. *member(B)*
- 3. *member(C)*
- 4.  $\forall x[member(x) \rightarrow (mc(x) \lor sk(x))]$ 
  - Can be written as

 $\sim member(x) \bigvee_{mc(x)}^{[member(x)} \bigvee_{sk(x)}^{(mc(x) \lor sk(x))]}$ 

- 5.  $\forall x[sk(x) \rightarrow lk(x, snow)]$ -  $\sim sk(x) \lor lk(x, snow)$
- 6.  $\forall x[mc(x) \rightarrow \sim lk(x, rain)]$ -  $\sim mc(x) \lor \sim lk(x, rain)$

7.  $\forall x[like(A, x) \rightarrow \sim lk(B, x)]$ 

 $\sim like(A,x) \vee \sim lk(B,x)$ 

8. 
$$\forall x [\sim lk(A, x) \rightarrow lk(B, x)]$$
  
-  $lk(A, x) \lor lk(B, x)$ 

- 9. lk(A, rain)
- 10. lk(A, snow)
- 11.  $\exists x [member(x) \land mc(x) \land \thicksim sk(x)]$ 
  - Negate-  $\forall x [\sim member(x) \lor \sim mc(x) \lor sk(x)]$

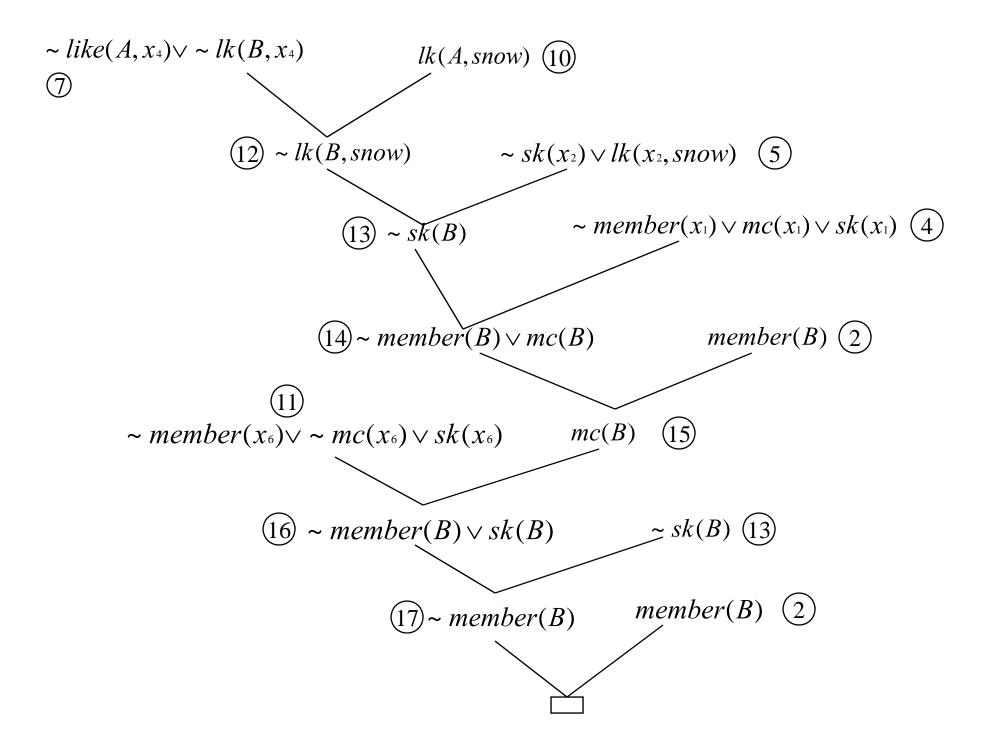
- Now standardize the variables apart which results in the following
- 1. *member(A)*
- 2. *member(B)*
- 3. *member(C)*
- 4. ~ member( $x_1$ )  $\lor$  mc( $x_1$ )  $\lor$  sk( $x_1$ )

5. ~ 
$$sk(x_2) \lor lk(x_2, snow)$$

6. ~ 
$$mc(x_3) \lor \sim lk(x_3, rain)$$

7. ~ 
$$like(A, x_4) \lor \sim lk(B, x_4)$$

- 8.  $lk(A, x_5) \vee lk(B, x_5)$
- 9. lk(A, rain)
- 10. lk(A, snow)
- 11. ~ member( $x_6$ )  $\lor$  ~  $mc(x_6) \lor$   $sk(x_6)$



## Interpretation in Logic

- Logical expressions or formulae are "FORMS" (placeholders) for whom <u>contents</u> are created through interpretation.
- Example:

 $\exists F[\{F(a) = b\} \land \forall x \{P(x) \rightarrow (F(x) = g(x, F(h(x))))\}]$ 

- This is a Second Order Predicate Calculus formula.
- Quantification on 'F' which is a function.

#### Examples

Interpretation:1 D=N (natural numbers) a = 0 and b = 1 $X \in N$ P(x) stands for x > 0q(m,n) stands for  $(m \times n)$ h(x) stands for (x - 1)Above interpretation defines Factorial Examples (contd.)

Interpretation:2

*D*={strings)

$$a = b = \lambda$$

P(x) stands for "x is a non empty string" g(m, n) stands for "append head of m to n"

*h(x)* stands for *tail(x)* 

 Above interpretation defines "reversing a string"