

## Chapter-5

Date \_\_\_\_\_ Using predicate logic

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- Here, we begin exploring one way of representing facts (knowledge) i.e. the language of logic.
- The logical formalism is appealing bcoz it immediately suggests a powerful way of deriving new knowledge from old i.e. mathematical deduction.
- We can conclude that a new statement is true by proving that it follows from the statements that are already known.
- The truth of an already believed proposition can be extended to include deduction as a way of deriving answers to questions & solutions to problems.
- The usefulness of some mathematical techniques extends well beyond traditional scope of maths.

### ★ Representing simple facts in logic

- Let's first explore use of propositional logic as a way of representing the world knowledge that an "AI" system might need.
- X → Propositional logic is good, bcoz it is simple to deal with and a decision procedure also exists for it.
- We can easily represent real-world facts as logical proposition written as "well-formed formulas" in propositional logic, as shown in fig.

(Fig. ①)

It is raining.

RAINING

It is sunny.

SUNNY

It is windy.

WINDY

If it is raining, then it is not sunny.

RAINING →  $\neg$  SUNNY  
↑  
NOT

→ From above fig, we can conclude from the fact that "it is raining", then the fact that "it is not sunny".

→ Suppose we want to represent the obvious fact stated by the classical sentence:

"Socrates is a man."

We can write:- "SOCRATESMAN".

Likewise :- "Plato is a man".

We can write :- "PLATOMAN".

This would be a totally separate assertion, & we would not be able to draw any conclusion about similarities betw "Socrates" & "Plato".

→ It would be much better to represent these facts as :

✓	MAN (SOCRATES)
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	MAN (PLATO)
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- Since now the structure of the repr<sup>n</sup> reflects the structure of the knowledge itself. Here, we use predicates applied to arguments.
- We are in even more difficulty if we try to represent the equally classic sentence:-

"All men are mortal."

We could represent this as:

MORTAL MAN

- This fails to capture relationship bet<sup>n</sup> individual being a man & that individual being a mortal. So for this, we really need variables & quantification, if we do not write separate statements about mortality of every man.
- So, we are forced to move to "predicate logic", since example like above is not suitable for "propositional logic" like fig. ①. In predicate logic, we can represent real-world facts that as "statements" are written in "well-formed formulas" (wff's).
- If we use logical statements as a way of representing knowledge, then we have good way of reasoning with that knowledge. So, this is a major motivation to use logic.
- Propositional logic is straightforward; although it is computationally hard.

- Therefore, we are going to adopt "predicate logic". So, before adopting "predicate logic" as a good medium for representing knowledge, we need to ask whether it provides good way of reasoning with knowledge or not. At the first glance, "answer is yes".
- It provides a way of deducing new statements from old one. "Propositional logic" does not possess decision procedure, but "predicate logic" possess decision procedure.
- There exists procedures to find a proof of proposed theorem, but these procedures are not guaranteed to halt. In short, "predicate logic" is not decidable, but it is semi-decidable.
- Though Predicate logic ~~suffers~~ suffers from negative results, like there can exist no decision procedure for it. So, despite the theoretical undecidability of "predicate logic", it can still serve a useful way of representing & manipulating some kinds of knowledge that an AI system might need.
- Let's now explore the use of predicate logic as a way of representing knowledge by looking at a specific example. Consider foll. sentences.
  - (1) Marcus was a man.
  - (2) Marcus was a pompeian.
  - (3) All pompeians were Romans.
  - (4) Caesar was a ruler.
  - (5) All Romans were either loyal to Caesar or hated him.
  - (6) Everyone is loyal to someone.

(7) People only try to assassinate rulers they are not loyal to.

(8) Marcus tried to assassinate Caesar.

→ The facts described by these sentences can be represented as a set of "Wff's" in "predicate logic" as follows.

(1) Marcus was a man.

man(Marcus)

This "repr" captures the critical fact of Marcus being a man. It fails to capture some of the information in English sentence, specially the "past-tense". But, this omission is acceptable.

(2) Marcus was a Pompeian.

Pompeian(Marcus)

(3) All Pompeians were Romans.

$\forall x : \text{Pompeian}(x) \rightarrow \text{Roman}(x)$

(4) Caesar was a ruler.

Ruler(Caesar)

(5) All romans were either loyal to Caesar or hated him.

$\forall x : \text{Roman}(x) \rightarrow (\text{loyal to}(x, \text{Caesar}) \vee$

hated(x, Caesar))

(6) Everyone is loyal to someone.

$$\forall x : \rightarrow y : \text{loyal to}(x, y)$$

There can be more appropriate predicate that, "there exists someone to whom everyone is loyal".

$$\checkmark \exists y : \forall x : \text{loyal to}(x, y)$$

(7) People only try to assassinate rulers they are not loyal to.

People Rulers

$$\forall x : \forall y : \text{person}(x) \wedge \text{ruler}(y) \wedge \text{tryassassinate}(x, y)$$

$$\hookrightarrow \neg \text{loyal to}(x, y)$$

The above sentence is also "ambiguous".

(8) Marcus tried to assassinate Caesar.

$$\text{tryassassinate}(\text{Marcus}, \text{Caesar})$$

→ From this brief attempt to convert English sentences into logical statements.

→ Now suppose that we want to use these statements to answer the question:-

"Was Marcus loyal to Caesar?"

→ It seems that using (7) & (8), we should be able to prove that Marcus was not loyal to Caesar. Now, let's try to produce a formal proof, reasoning backward from desired goal.

$$\neg \text{loyal to}(\text{Marcus}, \text{Caesar})$$

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→ loyal to (Marcus, Caesar)

- In order to prove this goal, we need to use the rules of inference to transform it to another goal that can be transformed, till there are satisfied goals remaining.
- This process may require the search of an AND-OR graph when there are alternative ways of satisfying individual goals.
- Fig. shows an attempt to produce a proof of goal by reducing set of unattained goals. This attempt fails, bcoz there is no way to satisfy the goal "person(Marcus)" with some statement that we have available.
- The problem is that, though we know that "Marcus was a man", we do not have any way to conclude from that "Marcus was a person".

→ loyal to (Marcus, Caesar)

person(Marcus)  $\wedge$  ruler(Caesar)  $\vdash$  (According to rule ②)  
 tryassassinate(Marcus, Caesar)

person(Marcus) (According to rule ④) ruler(Caesar)  
 $= 1$   
 tryassassinate(Marcus, Caesar)

person(Marcus) (According to rule ①)  
 tryassassinate(M, C) = 1

- We need to add the repr' of another fact to our system, that is...

(9) All men are people.

$$\forall x: \text{man}(x) \rightarrow \text{person}(x)$$

Now we can satisfy the last goal & produce a proof that Marcus was not loyal to Caesar.

→ From this simple example, we see that three imp. issues must be addressed in process of "converting english sentences into logical statements & then using those statements to deduce new ones!"

(1) Many english sentence's are ambiguous like 5, 6 & 7. Choosing correct interpretation may be difficult.

(2) Even in very simple situation, a set of sentences is unlikely to contain all info. necessary to reason about the topic at hand.

→ An additional problem arises in situations, where we don't know in advance which statement to deduce. For ex., "Was Marcus loyal to Caesar?" How to decide that the answer is,

loyal to (Marcus, Caesar)

OR

$\neg \text{loyal to } (\text{Marcus}, \text{Caesar})$

→ It could deny the strategy we have used of reasoning backward from a proposed truth to axioms & see which ans. to get.

→ The problem with this approach is that, the branching factor going forward from the axioms is good

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that it would be probably not yet to answer in any reasonable amount of time.

### \* Representing instance & is-a relationships

- We had studied "instance" & "is-a" in a useful form of reasoning, i.e. "property inheritance".
- But we did not use these atoms like "instance" & "is-a" in the example of "Marcus" & "Caesar". Though we have not used the predicates "instance" & "is-a" explicitly, then also we have captured the relationships they are used to express specially "class membership" & "class inclusion".

- Fig. shows first five sentences of last section represented in logic in three diff. ways.

(1) The first part of fig. contains the repre<sup>n</sup> that we have already discussed. Here, class mem<sup>n</sup> membership is represented with unary predicates each of which corresponds to class. Assertion  $P(x) = \text{true}$  is equivalent to assertion that  $x$  is an instance of  $P$ .

(2) The second part of the fig. contains repre<sup>n</sup> that use "instance" predicate explicitly. It's a binary predicate, whose first arg. is an object & 2<sup>nd</sup> arg. is a class to which object belongs. But, these repre<sup>n</sup> do not use an explicit "is-a" predicate. But instead of "is-a", subclass relationship is also there b/w "Pompeians" & "Romans" in sentence-3. The implication

rule states that if an obj. is an instance of the subclass "Pompeian", then it's also an instance of superclass "Roman".

- ③ The third part contains "repre" that use both "instance" & "is-a" predicates. The use of the "is-a" predicate simplifies "repre" of sentence ②, but it requires one additional axiom to be provided. The additional axiom describes how an "instance" rela & an "is-a" rela can be combined to derive a new "instance" rela.

- ①

  - 1. man (Marcus)      (Without "is-a" &  
"instance" attr.)
  - 2. Pompeian (Marcus)
  - 3.  $\forall x: \text{Pompeian}(x) \rightarrow \text{Roman}(x)$
  - 4. ruler (Caesar)
  - 5.  $\forall x: \text{Roman}(x) \rightarrow \text{loyal\_to}(x, \text{Caesar}) \vee \text{hate}(x, \text{Caesar})$

- (2) Using "instance"

  1.  $\text{instance}(\text{Marcus}, \text{man})$
  2.  $\text{instance}(\text{Marcus}, \text{Pompeian})$
  3.  $\forall x: \text{instance}(x, \text{Pompeian}) \rightarrow \text{instance}(x, \text{Roman})$
  4.  $\text{instance}(\text{Caesar}, \text{ruler})$
  5.  $\forall x: \text{instance}(x, \text{Roman}) \rightarrow \text{loyalty}(x, (\text{Caesar})) \vee \text{hate}(x, (\text{Caesar}))$

- (3) ~~the below~~

  1.  $\text{instance}(\text{Marcus}, \text{man})$
  2.  $\text{instance}(\text{Marcus}, \text{Pompeian})$
  3.  $\text{isa}(\text{Pompeian}, \text{Roman})$
  4.  $\text{instance}(\text{Caesar}, \text{ruler})$
  5.  $\forall x: \text{instance}(x, \text{Roman}) \rightarrow \text{loyalto}(x, \text{Caesar}) \quad \checkmark$   
 $x: \text{any}$
  6.  $\forall x: \forall y: \forall z: \text{instance}(x, y) \wedge \text{isa}(y, z) \rightarrow \text{instance}(x, z)$   
 $y = \text{Pompeian}$        $\text{hate}(x, \text{Caesar})$   
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## Computable func's & predicates

→ Let's consider a simple fact, which was expressed as comb' of individual predicates, such as:-

tryassassinate(Marcus, Caesar)

→ This is fine if no. of facts is not very large or if facts themselves are not sufficiently structured. But, suppose we want to express simple facts, such as foll. "greater-than" & "less-than" relationships.

gt(1, 0)      lt(0, 1)

gt(2, 1)      lt(1, 2)

gt(3, 2)      lt(2, 3)

{                }

→ Clearly we don't want to write out repres' of these fact individually. They are infinite.

→ But even if we only consider the finite no. of them that can be represented using a single machine word per number, then it would be really inefficient to store explicitly large set of statements.

→ Thus, we have to use "computable predicates". In this, whatever proof procedures we use when it comes upto one of these predicates, then instead of searching for it in DB or deducing it by further reasoning, we

can simply call a procedure, which we will specify in our regular rules, that will evaluate it and return true or false.

→ "Computable func's" are also useful like "computable predicates". Thus, we might want to be able to evaluate the truth of,

$gt(2+3, 1)$

For this, we first compute the value of plus func' and then send arguments 5 and 1 to "gt".

→ Example-2 To show how these ideas of computable func's & predicates can be useful:-

Consider following set of facts involving Marcus:-

(1) Marcus was a man.

$\text{man}(\text{Marcus})$

(2) Marcus was a Pompeian.

$\text{Pompeian}(\text{Marcus})$

(3) Marcus was born in 40 A.D.

$\text{born}(\text{Marcus}, 40)$

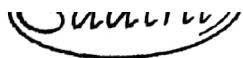
(4) All men are mortal

$\forall x : \text{man}(x) \rightarrow \text{mortal}(x)$

(5) All pompeian died when the volcano erupted in 79 A.D.

~~erupted~~ (Volcano, 79)  $\wedge \forall x : [\text{Pompeian}(x) \rightarrow \text{died}(x, 79)]$

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(6) No mortal lives longer than 150 years

$\forall x : \forall t_1 : \forall t_2 : \text{mortal}(x) \wedge \text{born}(x, t_1) \wedge$   
 $\text{gt}((t_2 - t_1), 150) \rightarrow \text{dead}(x, t_2)$

dead year      born year

(7) It is now 1991.

now = 1991

(8) Alive means not dead.

$\forall x : \forall t : [\text{alive}(x, t) \rightarrow \neg \text{dead}(x, t)] \wedge$   
 $[\neg \text{dead}(x, t) \rightarrow \text{alive}(x, t)]$

computable :

$\neg \text{alive}(\text{Marcus}, \text{now})$

$\uparrow$

(8)  $\text{dead}(\text{Marcus}, \text{now})$

$\uparrow$

(6)  $\text{mortal}(\text{Marcus}) \wedge \text{born}(\text{Marcus}, t_1) \wedge$   
 $\text{gt}(\text{now} - t_1, 150)$ .

$\uparrow$

$\text{man}(\text{Marcus}) \wedge \text{born}(\text{Marcus}, t_1) \wedge$   
 $\text{gt}(\text{now} - t_1, 150)$

$\uparrow$

$\text{gt}(\text{now} - t_1, 150)$ .

$\uparrow$

(3)  $\text{gt}(\text{now} - 40, 150)$

$\uparrow$

$\text{gt}(\text{now} - 40, 150)$

$\uparrow$

Compute miny.

$\text{gt}(\underline{1951}, \underline{150})$

$\uparrow$

Compute gt  
nil.

## X → Conclusion from proofs.

- Even very simple conclusions can require many steps to prove.
- A various processes like, matching, substitution are involved in production of proof. It would be worse if we had more than one term on the right or complicated expressions involving "or's" on the left.
- In next section, we introduce a proof procedure called Resolution that reduces some of the complexity, bcoz it operates on statements, which are converted to a single canonical form.

### Resolution

→ Resolution is a procedure, which gains its efficiency from the fact that it operates on statements that have been converted to a very convenient form.

→ Resolution produces proofs by "refutation." That means, to prove any statement, the reso<sup>n</sup> attempts to show that the negation of the statement produces a contradiction with the known statements. (2<sup>nd</sup> method to prove ~~any~~ theorem, i.e reverse will be accepted, then prove it wrong);

or ex. to prove  
 $\sqrt{2}$  is an irrational  
 ., but for that  
 e accept  $\sqrt{2}$  is rational;

Negation of statement produces a contradiction

→ Hence, we are not going to generate proofs by chaining backward from theorem to axioms ~~or~~ like previous techniques.

5.4

Conversion to clause form

- Suppose we know that all Romans who know Marcus will either hate Caesar or think that anyone ~~that~~ who hates anyone is crazy. Let's represent this in (CNF)

$$\forall x : [\text{Roman}(x) \wedge \text{know}(x, \text{Marcus})] \rightarrow [\text{hate}(x, \text{Caesar}) \vee (\forall y : \exists z : \text{hate}(y, z) \rightarrow \text{thinkcrazy}(x, y))]$$

- To use this formula in a proof requires a complex process. Then, having matched one piece of it, such as  $\text{thinkcrazy}(x, y)$ , it is necessary to do the right thing with the rest of the formula including the pieces in which matched part is embedded & those in which it is not. If the formula were in a simple form, this process would be more easier.
- It will be easy to work with formula, if
- It were flatter, i.e. there was less embedding of component
  - The quantifiers were separated from rest of the formula, so that they did not need to be considered.
- Conjunctive normal form has both of these properties. For ex, the formula for feelings of Roman who know Marcus would be represented in conjunctive normal form as,
- $$\neg \text{Roman}(x) \vee \neg \text{know}(x, \text{Marcus}) \vee \neg \text{hate}(x, \text{Caesar}) \vee \neg \text{hate}(y, z) \vee \text{thinkcrazy}(x, z)$$

→ Since there exists an algo. for converting any "wff" into conjunctive normal form, there won't be any problem, if we use "resolution" that operates only in wff.

→ In fact, for resolv'n to work, we need to go one step further. We need to reduce ex: set of wff to a set of "clauses".

→ A clause is defined to be a "wff" in conjunctive normal form but with no instances. To convert a wff into clause form, perform foll. sequence of steps:

#### \* Algo.: Convert to clause form

1. Eliminate  $\rightarrow$ , using the fact that  $a \rightarrow b$  is equivalent to  $\neg a \vee b$ . Performing this trans' on the "wff" given above yields,

$$\begin{aligned} & \forall x : \neg [\text{Roman}(x) \wedge \text{know}(x, \text{Marcus})] \vee \\ & [\text{hate}(x, \text{Caesar}) \vee (\forall y : \neg (\exists z : \text{hate}(y, z)) \vee \\ & \text{think crazy}(x, y))] \end{aligned}$$

2. Reduce ' $\neg$ ' to a single form, using fact that  
 $\neg(\neg p) = p$ ; De-Morgan's law that  $\neg(a \wedge b) = \neg a \vee \neg b$  and  
 $\neg(a \vee b) = \neg a \wedge \neg b$ . And standard correspondences betw  
quantifiers,  $[\neg \forall x : P(x) \equiv \exists x : \neg P(x)$  and  
 $\neg \exists x : P(x) \equiv \forall x : \neg P(x)]$

that means  $\neg \forall x : P(x) = \exists x : \neg P(x)$

$$\neg \exists x : P(x) = \forall x : \neg P(x)$$

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Applying this at step ① yields,

$$\forall x : [\neg \text{Roman}(x) \vee \neg \text{know}(x, \text{Marcus})] \vee$$

$$[\text{hate}(x, \text{Caesar}) \vee (\forall y : (\forall z : (\neg \text{hate}(y, z) \vee \\ \text{thinkcrazy}(x, y)))]$$

3. Standardise variables so that each quantifier binds a unique variable. Since variables are just dummy names, this process can't affect the truth value of wff.  
For ex, the formula,

$\forall x : P(x) \vee \forall x : Q(x)$  } This step is in  
would be converted to prep. for the next.

$$\forall x : P(x) \vee \forall y : Q(y)$$

$\forall$  and  $\exists$

4. Move all quantifiers to the left of formula without changing their relative order. This is possible, since there is no conflict among variable names.

$$\forall x : \forall y : \forall z : [\neg \text{Roman}(x) \vee \neg \text{know}(x, \text{Marcus})] \vee$$

$$[\text{hate}(x, \text{Caesar}) \vee (\neg \text{hate}(y, z) \vee \text{thinkcrazy}(x, y))]$$

This formula is known as prenex normal form. It consists of a "prefix" of quantifiers followed by a matrix.

5. Eliminate existential quantifiers. A formula contains an existentially quantified variable asserts that there's a value that can be substituted for variables makes the formula true.

For ex., the formula

$\exists y : \text{President}(y)$

can be transformed into the formula

$\text{President}(\text{SI})$ ,

where "SI" is a func' with no args that somehow produces a value that satisfies "President". For ex. let's say  $\text{SI} = \text{"India"}$ , then there exists the president of india. These generated func's are called Skolem func's.

6. Drop the prefix. At this point, all remaining variables are universally quantified, so that the prefix can just be dropped. & any proof procedure we can simply assume.

$\therefore$  Step ④ appears as :-

$\rightarrow \text{Roman}(x) \vee \neg \text{know}(x, \text{Marcus}) \vee$

$\neg \text{hate}(x, \text{Caesar}) \vee \neg \text{hate}(y, z) \vee \text{thinkcrazy}(x, y)$

7. Convert this expression into conjunction of disjunc's. Since there's no AND opera<sup>n</sup>, so, it will be useful to apply ORs<sup>n</sup> AND. However, it's also frequently necessary to exploit the distributive property [i.e.  $(a \wedge b) \vee c = (a \vee c) \wedge (b \vee c)$ ].

For ex., the formula

$\rightarrow (\text{winter} \wedge \text{wearing boots}) \vee (\text{summer} \wedge \text{wearing sandals})$   
becomes, after one app' of the rule,

$[(\text{winter} \vee (\text{summer} \wedge \text{wearing sandals})) \wedge$

$[(\text{wearing sandals} \wedge \text{boots}) \vee (\text{summer} \wedge \text{wearing sandals})]]$

After 2<sup>nd</sup> app', we can still conjunct this by OR's

$(\text{winter} \vee \text{summer}) \wedge$

$(\text{winter} \vee \text{wearing sandals}) \wedge$

$(\text{wearing boots} \vee \text{summer}) \wedge$

$(\text{wearing boots} \vee \text{wearing sandals})$

8. Create a separate clause corresponding to each conjunction.  
 X For "cuff" to be true, all the clauses that are generated from it must be true.

9. Standardize the variables in the set of clauses generated in step ⑧. That means, "rename" the variables so that no two clauses make reference to same variable. This "trans" relies on the fact that,

$$(\forall x : p(x) \wedge q(x)) \stackrel{\text{conjunction}}{=} \forall x : p(x) \wedge \forall x : q(x)$$

Thus, since each clause is a separate conjunct & since all variables are universally quantified, there won't be any relationships bet" variables of two clauses, even if they were generated from same "cuff".

### ~~S.4.2~~ The Basis of resolution

X → The resolution procedure is a simple iterative process:- at each step, two ~~cuff~~ clauses called as "Parent clauses" will be compared, and obtaining a new clause which is inferred from them.

→ Suppose that there are two clauses in the system:-

winter v summer      These both clauses must be  
                           true. bcz if winter is 1, then  
                           summer is 0, and in 2<sup>nd</sup> clause  
                           if winter is 1, i.e  $\neg \text{winter} = 0$ , but  
                           if  $\text{winter} = 1$ , then  $\text{cold} = 1$ .

→ Thus we see that from these two clauses we can deduce

summer v cold

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QUESTION

- This is the deduction that "resolv" procedure will make. Resolv operates by taking two clauses that each contain same literal, i.e. "winter".
- The literal must occur in positive form in one clause & in negative form in other.
- The "resolvent" is obtained by combining all the literals but the common one is canceled.
- If two the clause is produced is empty set, then a "contradiction" is found. For ex., two clauses,  
 $\begin{array}{c} \text{winter} \\ \neg \text{winter} \end{array}$   
will produce the empty clause.
- If a contradiction exists, "then nil will be found." Of course, if no contradiction exists, then it is possible that procedure will never terminate.

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## \* Resolution in propositional logic

- To make clear that how "resolv" works, we first present the "resolv" procedure for propositional logic. We then expand it to include predicate logic.
- In propositional logic, the procedure for producing a proof by "resolv" of proposition  $P$  with set of axioms  $F$  by foll.

### X\* Algo : Propositional resolv

1. Convert all propositions of  $F$  to clause form.
2. Negate  $P$  & convert result to clause form. Add it to set of clauses obtained in step 1.
3. Repeat until either a contradiction is found or no progress can be made.

(a) Select two clauses. Call these the parent clauses.

(b) Resolve them together. The resulting clause is called "resolvent", will be the disjunction(V-OR) of all literals of parent clauses.

(c) If the resolvent is empty clause, then contradiction is found. If it's not, then add it to the set of clauses available to the procedure.

Suppose we are given the axioms in fig. ① & are want to prove ②

- Let's look at an example. First we convert axioms to clause form as shown in second column of fig.

Given Axiom | Converted to clause form

$P$   
 $(P \wedge Q) \rightarrow R$

$(S \vee T) \rightarrow Q$   
 $T$

$P$   
 $\neg P \vee \neg Q \vee R$  ( $\because a \rightarrow b = \neg a \vee b$ )  
 $\neg S \vee T \vee Q$   
 $\neg S \vee Q$   $\neg T \vee Q$

(Fig. ②)

$$\neg P \vee \neg Q \vee R$$

OR operation

$$\neg P \vee \neg Q$$

OR operation

$$P$$

$$\neg T \vee Q$$

OR operation

$$\neg Q$$

$$\neg T$$

OR operation

$$N\perp$$

- First we negate R by producing  $\neg R$ .
- Then, we begin selecting pairs of clauses to resolve together.
- Although any pair ~~①~~ of clauses can be resolved, but only pairs containing complementary literals (like P and  $\neg P$ ) will lead to the goal of producing empty set clause.
- As shown in fig. ② we start by resolving with clause  $\neg R$ , since that is one of the clause that must be involved in contradiction.
- Here, main process is that, it takes a set of clauses that are assumed to be true & info. provided by others, it generates new clauses based on.
- A contradiction occurs when a clause becomes so restricted that there's no way it can be true.

Atom converted to clause form

①	P	P
②	$(P \wedge Q) \rightarrow R$	$\neg P \vee \neg Q \vee R$
③	$(S \vee T) \rightarrow Q$	$\neg S \vee Q$
④		$\neg T \vee Q$
⑤	T	T

→ A contradiction occurs when a clause becomes so restricted that there's no way it can be true. This is indicated by generation of "empty" clause.

→ Let's look again at that tree, to see how it works.

(1) In order for  $\text{prop}^n \textcircled{2}$  to be true, one from  $\neg P$ ,  $\neg Q$  or  $R$  must be true.

(2) But if we assume that  $\neg R$  is true.

(3) Now,  $\text{prop}^n \textcircled{2}$  is true if one from  $\neg P$  or  $\neg Q$  is true.

(4) But,  $\text{prop}^n \textcircled{1}$  says that  $P$  is true, which means  $\neg P$  can't be true; which leaves only one way for  $\text{prop}^n \textcircled{2}$  to be true, that is " $\neg Q$ " to be true.

(5)  $\text{prop}^n \textcircled{4}$  can be true if either  $\neg T$  or  $Q$  is true.

(6) But, since we know that " $\neg Q$ " must be true, the only way for  $\text{prop}^n \textcircled{4}$  to be true is  $\neg T$  is true.

(7) But,  $\text{prop}^n \textcircled{5}$  says that  $T$  is true. Thus, there is no way for all clauses to be true in a single interpretation.

### Solved The unification algo

→ In propositional logic, it is easy to determine that two literals can't both be true at the same time. For ex., for  $L$  and  $\neg L$  in predicate logic, this matching process is more complicated, since args must be considered of predicate.

→ For ex.,  $\text{man(John)}$  &  $\neg \text{man(John)}$  is a "contradiction", but  $\text{man(John)}$  &  $\neg \text{man(Spot)}$  is not, since args are different.

→ The main idea for "unification algo" is to determine contradiction. We need a matching procedure that compares two literals & discovers whether there exists a set of

substitution that makes them identical. This is known as a recursive procedure called the "unification algo".

- The basic idea of unifica" is very simple. To attempt to unify two literals, we first check if their predicate symbols are same. If so, we can proceed. Otherwise, there's no way they can be unified.

- For ex., the two literals,

tryassassinate (Marcus, Caesar)

hate (Marcus, Caesar)

- These two can't be unified. If the predicate symbols match, then we must check the args, one pair at a time. If first matches, then we can continue with second and so on.
- To test each arg. pair, we can simply call the unification procedure recursively. For each arg. pair, we can simply call the unifica" procedure recursively.

#### \* Algo: Unify(L<sub>1</sub>, L<sub>2</sub>)

1. If L<sub>1</sub> or L<sub>2</sub> are both variables or constants, then-
  - a) If L<sub>1</sub> & L<sub>2</sub> are identical, then return NIL.
  - b) Else if L<sub>1</sub> is a variable, then if L<sub>1</sub> occurs in L<sub>2</sub> then return {FAIL}, else return (L<sub>2</sub>/L<sub>1</sub>).
  - c) Else if L<sub>2</sub> is a variable, then if L<sub>2</sub> occurs in L<sub>1</sub> then return {FAIL}; else return (L<sub>1</sub>/L<sub>2</sub>).
  - d) Else return {Fail}.

2. If initial predicate symbols in  $L_1$  &  $L_2$  are not identical, then return {FAIL}.
3. If  $L_1$  &  $L_2$  have a different no. of args, then return {FAIL}.
4. Set SUBST to NIL. (SUBST at end of procedure will contain all substitutions used to identify  $L_1$  &  $L_2$ ).
5. For  $i=2$  to no. of args in  $L_1$  :-  
 (a) Call Unify with the  $i^{th}$  arg. of  $L_1$  &  $i^{th}$  arg. of  $L_2$ , putting result in  $S$ .  
 (b) If  $S = \text{FAIL}$  then return FAIL.  
 (c) If  $S$  is not equal to NIL; then  
    (i) Apply  $S$  to remainder of both  $L_1$  &  $L_2$ .  
    (ii)  $\text{SUBST} = \text{APPEND } (S, \text{SUBST})$ .
6. Return SUBST.

\* Example of above algo

- (1) Suppose we want to unify the expression  
 $P(x, x)$   
 $P(y, z)$
- (2) The two instances of  $P$  matches. Next we compare  $x$  and  $y$ , and decide that to substitute  $y$  for  $x$ ; they could match. We can write it  $y/x$ . (See algo point (1-b))
- (3) If we simply continue and match  $y$  and  $z$ , we produce the substitution  $z/x$ . But we can't substitute both  $y$  &  $z$  for  $x$ , since after that we have not produced a consistent substitution.
- (4) After finding the first substitution  $y/x$  is to make that substitution throughout the literals by giving,  
 $P(y, y) \leftarrow$  Both  $x$  substituted by  $y$ .  
 $P(y, z)$

- (5) The obj. of the unification procedure is to discover at least one substitution that causes two literals to match.  
For ex., the literals.

$\text{hate}(x, y)$

$\text{hate}(\text{Marcus}, z)$

This could be unified with any of the foll. substitution:

$(\text{Marcus}/x, z/y)$

$(\text{Marcus}/x, y/z)$

### Resolution in predicate logic Q-11

- We have an easy way of determining that two literals are contradictory, if they one of them can be unified with the negation of the other.
- For ex,  $\text{man}(x)$  and  $\neg \text{man}(\text{spot})$  are contradictory, if  $\text{man}(x)$  and when  $x = \text{spot}$ , then  $\text{man}(x)$  is false.  
Thus, in order to use resolution for expressions in predicate logic, we use the "unification algo." to locate pairs of literals that cancel out.
- Suppose we want to resolve two clauses -  
 (1)  $\text{man}(\text{Marcus})$   
 (2)  $\neg \text{man}(x_i) \vee \text{mortal}(x_i)$
- The literal  $\text{man}(\text{Marcus})$  can be unified with literal  $\text{man}(x_i)$  with the substitution  $\text{Marcus}/x_i$ , since if  $x_i = \text{Marcus}$ , then  $\neg \text{man}(\text{Marcus}) = \text{false}$ .

- Clause-2 says that for given  $x_1$ , either  $\neg \text{man}(x_1)$  or  $\text{mortal}(x_1)$ . If  $\text{man}(\text{Marcus}) = \text{true}$  in clause-1, then  $\neg \text{man}(\text{Marcus})$  is false in clause-2. So, we can conclude that  $\text{mortal}(\text{Marcus})$  must be true for clause-2 to be true.
- It's not necessary that  $\text{mortal}(x_1)$  be true for all  $x_1$ , since for some values of  $x_1$ ,  $\neg \text{man}(x_1)$  might be true, so,  $\text{mortal}(x_1)$  is irrelevant to the truth of complete clause.
- So, the resolvent generated by clause-1 & clause-2 must be  $\text{mortal}(\text{Marcus})$ . So, resolution process can then proceed to discover whether  $\text{mortal}(\text{Marcus})$  leads to a contradiction with other available clauses.

### \* Alg - Resolution

1. Convert all the statements of F to clause form.
2. Negate P & convert the result to clause form.
3. Repeat until either a contradiction is found, or no progress is made, or a pre-determined amount of effort has been expended.
  - (a) Select two clauses. Call these the parent clauses.
  - (b) Resolve them together. The resolvent will be the disjunction of all literals of both parent clauses with appropriate substitutions performed.
  - (c) If resolvent is the empty clause, then a contradiction has been found.

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~~Xample~~ Let's now return to our discussion of Marcus & show how resolution can be used to prove new things about it. To use them in resolution proofs, we must convert them to clause form as described ~~in~~ here. The fig. shows that conversion.

Fig. Axioms in clause form:

1. man(Marcus)
2. Pompeian(Marcus)
3.  $\neg \text{Pompeian}(x_1) \vee \text{Roman}(x_1)$
4. ruler(Caesar)
5.  $\neg \text{Roman}(x_2) \vee \text{loyal to}(x_2, \text{Caesar}) \vee \text{hate}(x_2, \text{Caesar})$
6.  $\text{loyal to}(x_3, f(x_3))$
7.  $\neg \text{man}(x_4) \vee \neg \text{ruler}(y_1) \vee \neg \text{tryassassinate}(x_4, y_1)$   
(Not)  $\vee \text{loyal to}(x_4, y_1)$
8. tryassassinate(Marcus, Caesar)

→ Next: fig. shows resolution proof of the statement:

Prove:  $\text{hate}(\text{Marcus}, \text{Caesar})$

Proof:

~~Goal~~

$\neg \text{hate}(\text{Marcus}, \text{Caesar})$

②

Marcus/x<sub>2</sub>

③  $\neg \text{Roman}(\text{Marcus}) \vee \text{loyal to}(\text{Marcus}, \text{Caesar})$

⑥ OR Marcus/x<sub>4</sub>

$\neg \text{Pompeian}(\text{Marcus}) \vee \text{loyal to}(\text{Marcus}, \text{Caesar})$

⑦

loyal to(Marcus, Caesar)

Marcus/x<sub>4</sub>, Caesar/y<sub>1</sub>

①  $\neg \text{man}(\text{Marcus}) \vee \neg \text{ruler}(\text{Caesar}) \vee \neg \text{tryassassinate}(\text{M}, \text{C})$

OR

$\neg \text{ruler}(\text{Caesar}) \vee \neg \text{tryassassinate}(\text{M}, \text{C})$

④

$\neg \text{tryassassinate}(\text{M}, \text{C})$

OR

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→ Suppose our actual goal in proving 'the assertion',

hate(Marcus, Caesar)

was to answer the question: "Did Marcus hate Caesar?"

→ In that case, we attempted to prove the statement,

→ hate(Marcus, Caesar).

→ To do so, we would have added

hate(Marcus, Caesar)

→ If we have attempted to prove  $\neg$ hate, then we have to consider " $\neg$ hate", but there are no clause that contains " $\neg$ hate".

→ Since the resolv<sup>n</sup> process can only generate new clauses that are composed of comb<sup>n</sup> of literals from existing clauses, we know that hate(Marcus, Caesar) will not produce a contradiction with the known statements.

→ This is an example of a situation in which the resolv<sup>n</sup> procedure ~~does not~~ detect any contradiction.

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Topic-2 Que-2

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1.  $\forall x : \text{likes}(\text{Rama}, x) \vee \text{vegfood}(x) \rightarrow \text{likes}(\text{Rama}, x)$

2. food (ORANGES)

3. food (Mutton)

$\neg (\text{a } \cdot \cdot ) \rightarrow b$

4.  $(\forall x)(\exists y) : \text{eats}(y, x) \wedge \neg \text{killed by}(y, x) \rightarrow \text{food}(x)$

$\rightarrow (x \wedge y) = \neg x \vee \neg y$

5. eats (like<sub>x</sub>, peanuts)

6. alive (like<sub>x</sub>)

7.  $\forall x : \text{eats}(\text{like}_x, x) \rightarrow \text{eats}(\text{love}_x, x)$

$\rightarrow$

8.  $\forall x : \forall y : \text{alive}(x) \rightarrow \neg \text{killed}(x, y)$

\* Now let's apply all these sentences into  $\phi$  clause form.

1.  $\neg \text{vegfood}(x) \vee \text{likes}(\text{Rama}, x)$

2. food (ORANGES)

3. food (Mutton)

4.  $\neg \text{eats}(y, x) \vee \neg \text{killed by}(y, x) \vee \text{food}(x)$

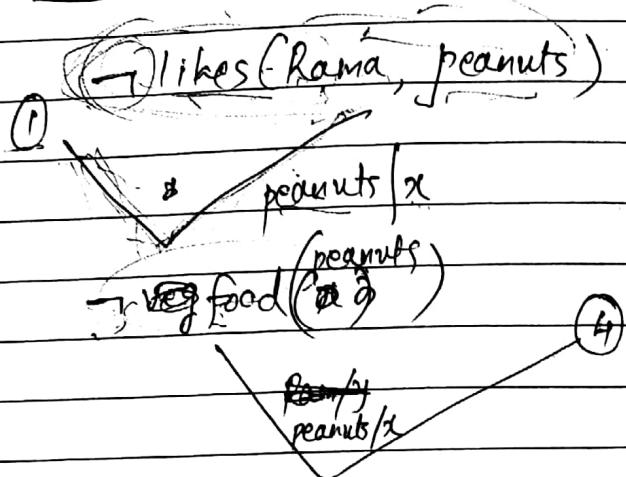
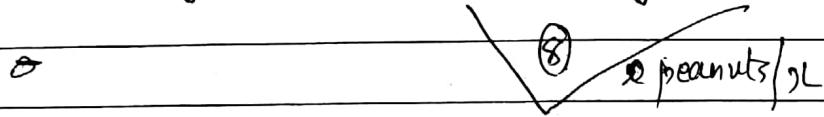
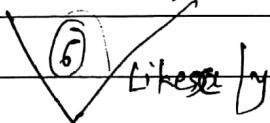
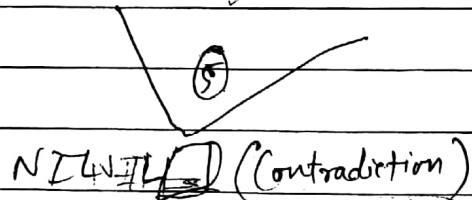
5. eats (like<sub>x</sub>, peanuts)

6. alive (like<sub>x</sub>)

7.  $\neg \text{eats}(\text{like}_x, x) \vee \text{eats}(\text{love}_x, x)$

8.  $\neg \text{alive}(x) \vee \neg \text{killed}(x, y)$

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~~Ch 1~~Prove Rama likes peanuts using Resolution. $\neg \text{eats}(\text{Rama}, \text{peanuts}) \vee \neg \text{killed by}(\text{Rama}, \text{peanuts})$  $\neg \text{eats}(y, \text{peanuts}) \vee \neg \text{alive}(y)$  $\neg \text{eats}(\text{Likes by}, \text{peanuts})$ N I L V I T U (Contradiction)Hence proved that Rama likes peanuts $\text{Rama likes (Rama, peanuts)}$  $\text{food (peanuts)}$  $\text{eats}(y, \text{peanuts}) \wedge \neg \text{killed by}(y, \text{peanuts})$  $\text{Likes by}$  $\text{eats}(\text{Likes by}, P) \wedge \neg \text{killed by}(\text{Likes by}, P)$

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(2) (10.B)

- Conversion to classical predicate logic

1.  $\forall x: \text{food}(x) \rightarrow \text{likes}(\text{Ram}, x)$

2.  $\text{food}(\text{Orange})$

3.  $\text{food}(\text{Mutton})$

4.  $\forall x: \exists y: \neg(\text{eats}(y, x) \wedge \neg \text{killed by}(y, x)) \rightarrow \text{food}(x)$

5.  $\text{eats}(\text{Likes}_x, \text{peanuts}) \rightarrow \text{alive}(\text{Likes}_x)$

6.  $\forall x: \text{eats}(\text{Likes}_x, x) \rightarrow \text{eats}(\text{Love}_x, x)$

- Prove that Rama likes peanut using backward chaining.

$\text{likes}(\text{Ram}, \text{Peanuts})$

$\uparrow$   
 $\text{food}(\text{peanuts})$

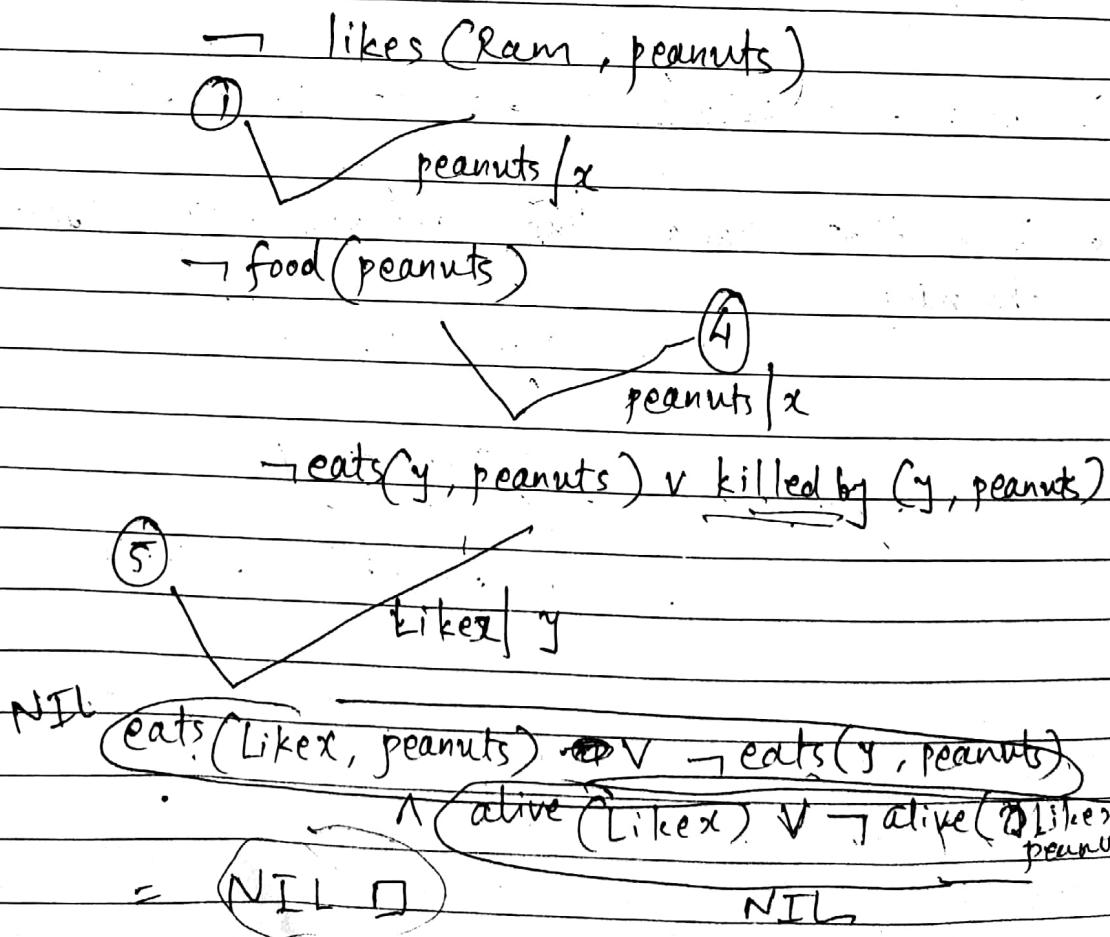
$\uparrow$   
 $\text{eats}(y, \text{peanuts}) \wedge \neg \text{killed by}(y, \text{peanuts})$

$\uparrow$   
 $\text{eats}(\text{Likes}_x, \text{peanuts}) \wedge \text{alive}(\text{Likes}_x)$

$\uparrow$   
 $\text{NIL (Proved)}$

• Conversion to clause form

1.  $\neg \text{food}(x) \vee \text{likes}(\text{Ram}, x)$
  2.  $\text{food}(\text{Orange})$
  3.  $\text{food}(\text{Mutton})$
  4.  $\neg \text{eats}(y, x) \vee \text{killed by}(y, x) \vee \text{food}(x)$
  5.  $\text{eats}(\text{Likes}_x, \text{peanuts}) \wedge \text{alive}(\text{Likes}_x)$
  6.  $\neg \text{eats}(\text{Likes}_x, x) \vee \text{eats}(\text{Loves}_x, x)$
- Prove Rama likes peanuts using resolution



## Conversion to predicate logic

1. mega-star (Prince)

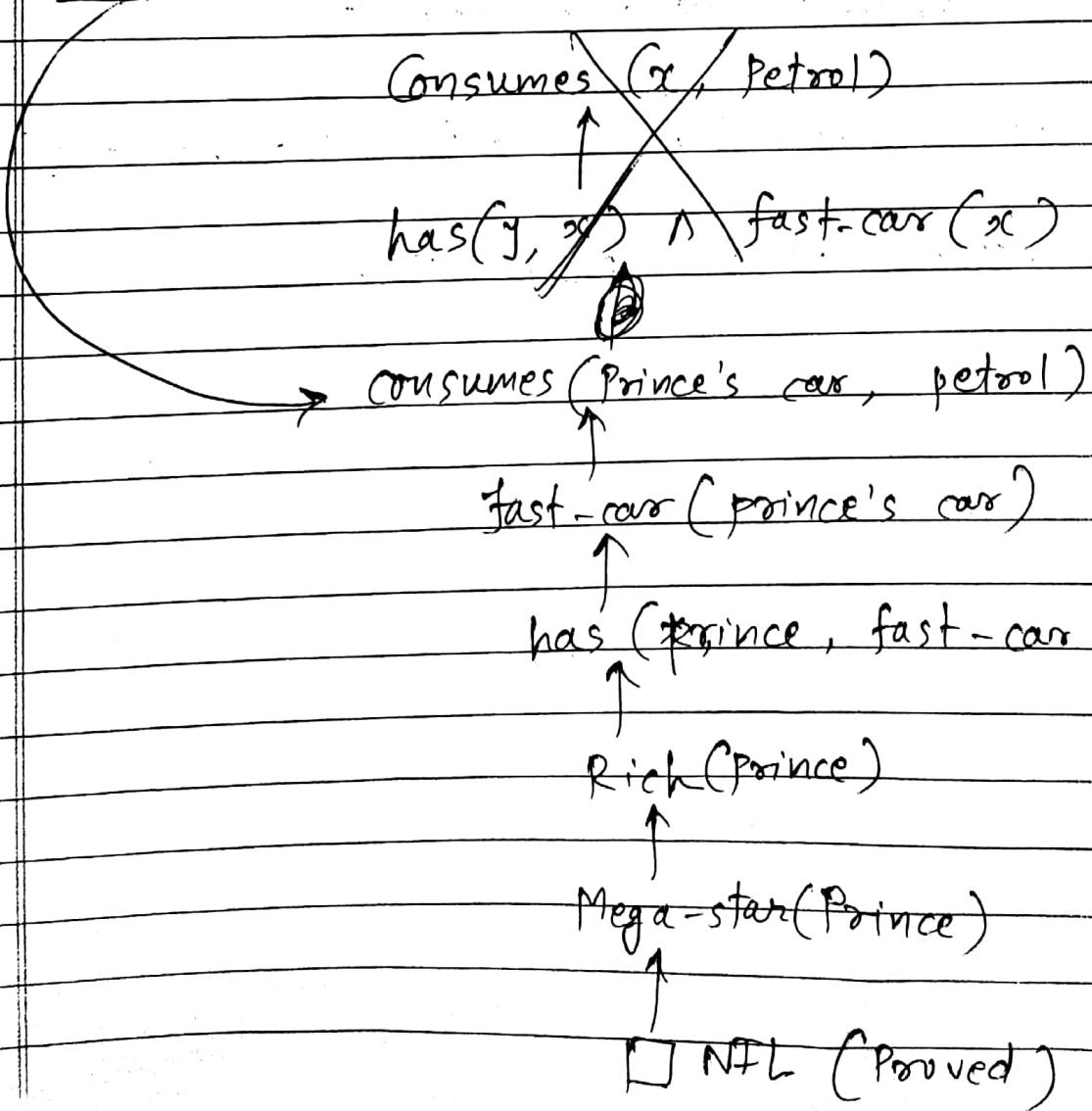
2.  $\forall x : \text{Mega-star}(x) \rightarrow \text{Rich}(x)$

3.  $\forall x : \text{Rich}(x) \rightarrow \exists y \text{ has}(fx, fy \wedge \text{fast-car}(x)) \text{ has}(y, \text{fast-car})$

4.  $\forall x : \text{fast-car}(x) \rightarrow \text{consumes}(x, \text{petrol})$

• Translate these sentences

• Prove that Prince's car consumes a lot of petrol.



Consider following facts.

Use resolution and prove: If John is a child, then John carves some pumpkin.

1. Every child loves Santa.

$$\forall x : \text{child}(x) \rightarrow \text{loves}(x, \text{Santa})$$

clause :  $\neg \text{child}(x) \vee \text{loves}(x, \text{Santa})$   
form

2. Every child loves every candy.

$$\forall x, \forall y : \text{child}(x) \wedge \text{candy}(y) \rightarrow \text{loves}(x, y)$$

clause :  $\neg \text{child}(x) \vee \neg \text{candy}(y) \vee \text{loves}(x, y)$   
form

3. Anyone who loves some candy is not a nutrition fanatic.

$$\forall x, \exists y : \text{candy}(y) \wedge \underset{\text{loves}}{\text{eats}}(x, y) \rightarrow \neg \text{fanatic}(x)$$

clause :  $\neg \text{candy}(y) \vee \neg \text{eats}(x, y) \vee \neg \text{fanatic}(x)$   
form

4. Anyone who eats any pumpkin is a nutrition fanatic.

$$\forall x, \exists y : \text{pumpkin}(y) \wedge \text{eats}(x, y) \rightarrow \text{fanatic}(x)$$

clause :  $\neg \text{pumpkin}(y) \vee \neg \text{eats}(x, y) \vee \text{fanatic}(x)$   
form

5. Anyone who buys any pumpkin either carves it or eats it.

$$\forall x, \forall y : \text{pumpkin}(y) \wedge \text{buy}(x, y) \rightarrow \text{carves}(x, y) \vee \text{eats}(x, y)$$

clause :  $\neg \text{pumpkin}(y) \vee \neg \text{buy}(x, y) \vee \text{carves}(x, y) \vee \text{eats}(x, y)$   
form

6. John buys a pumpkin.

$$\text{pumpkin}(x) \wedge \text{buy}(\text{John}, x)$$

7. Lifesavers is a candy.

$$\text{candy}(\text{lifesaver})$$

prove:  $\text{child}(\text{John}) \rightarrow \exists x : \text{pumpkin}(x) \wedge \text{carves}(\text{John}, x)$ .

Opposite  $\neg \text{child}(\text{John}) \rightarrow \neg \exists x : \text{pumpkin}(x) \wedge \text{carves}(\text{John}, x) \rightarrow \neg \text{child}(\text{John})$

$$\neg \text{pumpkin}(x) \vee \neg \text{carves}(\text{John}, x) \vee \neg \text{child}(\text{John})$$

⑤  $\neg \text{Pumpkin}(x) \vee \neg \text{Conves}(John, x) \vee \text{child}(John)$

①  $\neg \text{conves}(John, x) \vee \text{child}(John)$

⑥  $\neg \text{Candy}(y) \vee \text{love}(x, y) \vee \neg \text{Conves}(John, x)$

②  $\text{love}(John, \text{lifesaver}) \vee \text{conver}(John, x)$

⑥  $\neg \text{Candy}(\text{lifesaver}) \vee \neg \text{fanatic}(\text{lifesaver}) \vee \text{Conver}(John, x)$

③  $\neg \text{fanatic}(\text{lifesaver}) \vee \neg \text{Conves}(John, x)$

④  $\neg \text{Pumpkin}(y) \vee \neg \text{ent}(John, y) \vee \neg \text{conve}(John, y)$

⑤  $\neg \text{pumpkin}(y) \vee \neg \text{buy}(John, y)$

□ NLL