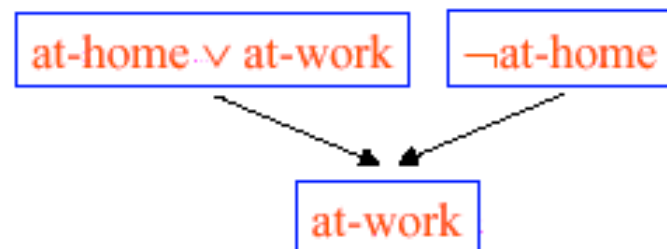


Resolution in propositional and first-order logic

- **Next time:**
 - More on resolution & theorem proving systems (Chapter 10 of R&N)
 - Read chapter 6 in Luger/Stubblefield about Prolog

Resolution in First-Order Logic

In propositional logic:

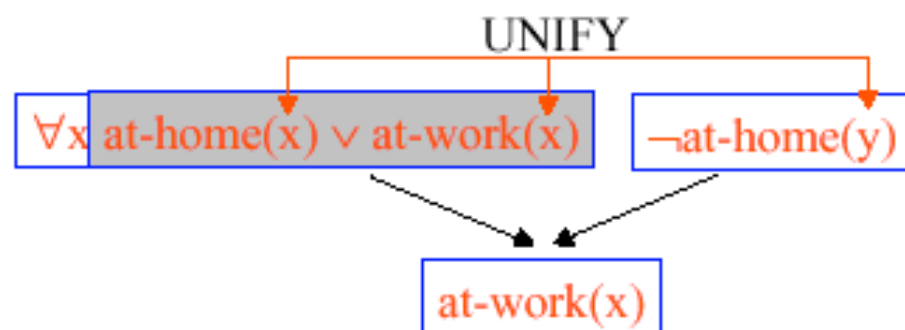


In first-order logic:

To generalize resolution proofs to FOL:
we must account for

- Predicates
- Unbound variables
- Existential & universal quantifiers

Idea: First convert sentences to clause form
Then unify variables



Outline

- Resolution in first-order logic
 - Proving logic sentences using resolution
 - Answering questions using resolution
 - Extensions to basic resolution
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- Logic programming

Basic steps for proving a conclusion **S** given premises

Premise₁; ..., Premise_n

(all expressed in FOL):

1. Convert all sentences to CNF
2. Negate conclusion **S** & convert result to CNF
3. Add negated conclusion **S** to the premise clauses
4. Repeat until contradiction or no progress is made:
 - a. Select 2 clauses (call them parent clauses)
 - b. Resolve them together, performing all required unifications
 - c. If resolvent is the empty clause, a contradiction has been found (i.e., **S** follows from the premises)
 - d. If not, add resolvent to the premises

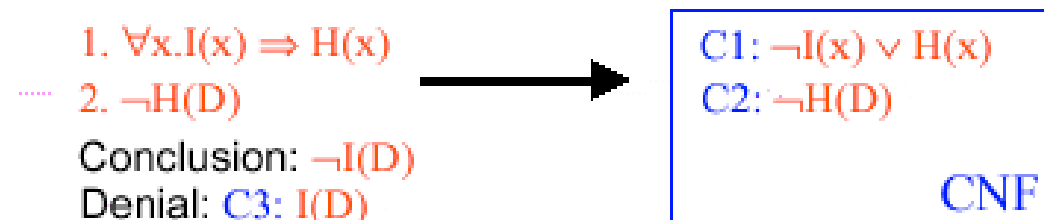
If we succeed in Step 4, we have proved the conclusion

Resolution in First- Order Logic

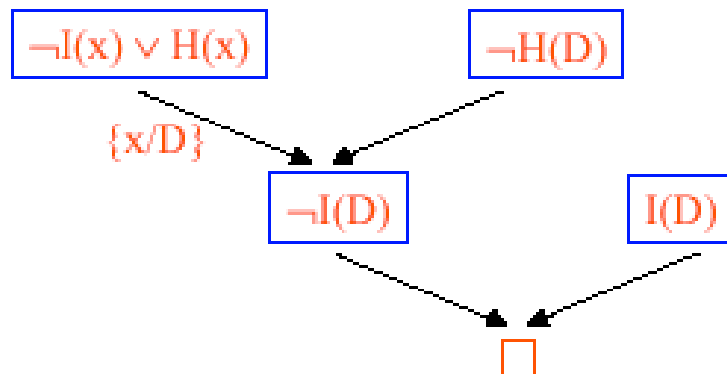
Resolution Examples

Example 1:

- If something is intelligent, it has common sense
- Deep Blue does not have common sense
- Prove that Deep Blue is not intelligent



A resolution proof of $\neg I(D)$:



Proof also written as:

C4: $\neg I(D)$

C5: \square

$r[C1b, C2]$

$r[C3, C4]$

2nd literal,
1st clause

Resolution Examples (cont.)

Example 2:

Premises:

$Mother(Lulu, Fifi)$

$Alive(Lulu)$

$\forall x \forall y. Mother(x,y) \Rightarrow Parent(x,y)$

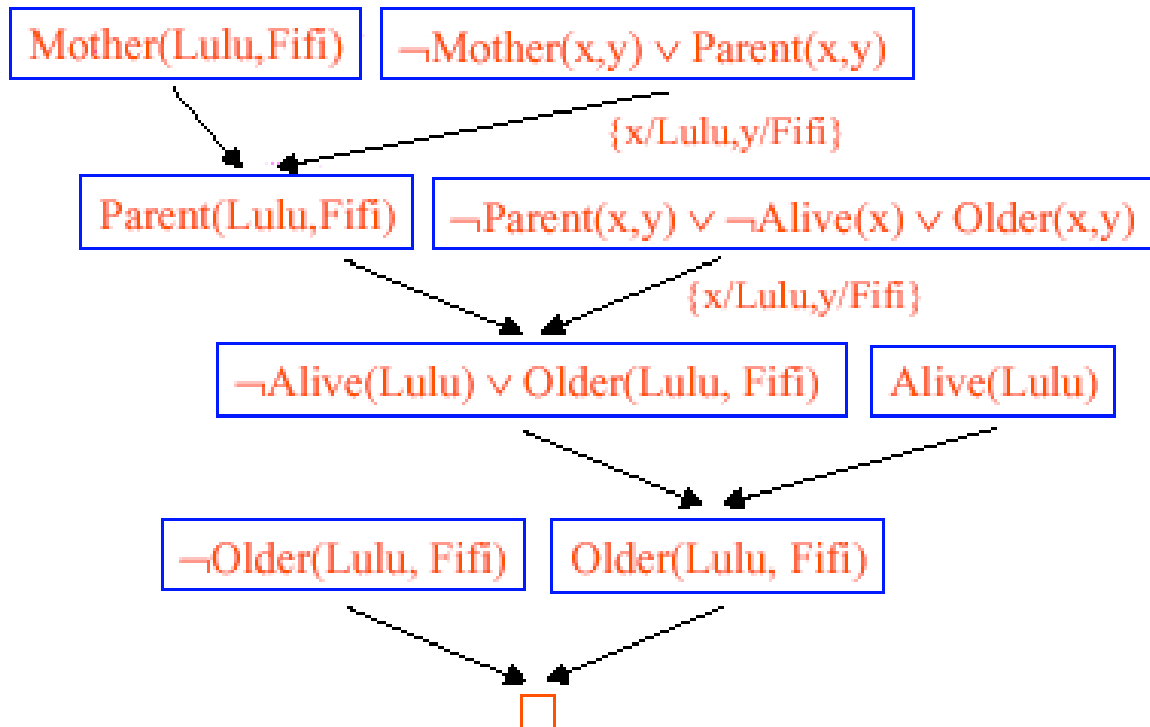
$\forall x \forall y. (Parent(x,y) \wedge Alive(x)) \Rightarrow Older(x,y)$

Prove:

$Older(Lulu, Fifi)$

Denial:

$\neg Older(Lulu, Fifi)$



Resolution Examples (cont.)

Could also have written the proof as:

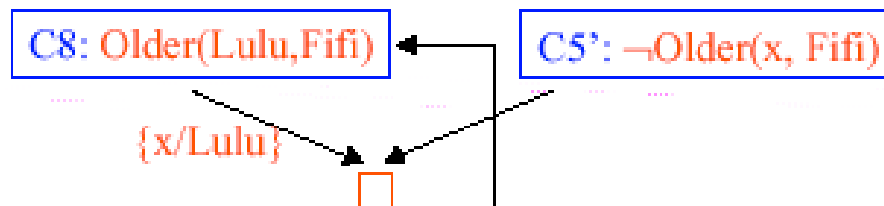
| | |
|--|------------------|
| C1. $\text{Mother}(\text{Lulu}, \text{Fifi})$ | given |
| C2. $\text{Alive}(\text{Lulu})$ | given |
| C3. $\neg \text{Mother}(x, y) \vee \text{Parent}(x, y)$ | given |
| C4. $\neg \text{Parent}(x, y) \vee \neg \text{Alive}(x) \vee \text{Older}(x, y)$ | given |
| C5. $\neg \text{Older}(\text{Lulu}, \text{Fifi})$ | denial of concl. |
| C6. $\text{Parent}(\text{Lulu}, \text{Fifi})$ | r[C1, C3a] |
| C7. $\neg \text{Alive}(\text{Lulu}) \vee \text{Older}(\text{Lulu}, \text{Fifi})$ | r[C6, C4a] |
| C8. $\text{Older}(\text{Lulu}, \text{Fifi})$ | r[C7, C5] |
| C9. \square | |

Proof consists of 4 resolution steps: longer than the proof with GMP, because we can only resolve two clauses at once using this form of resolution

Resolution Examples (cont.)

Example 3:

- Suppose the desired conclusion had been
"Something is older than Fifi"
 $\exists x. \text{Older}(x, \text{Fifi})$
- Denial:
 $\neg \exists x. \text{Older}(x, \text{Fifi})$
also written as: $\forall x. \neg \text{Older}(x, \text{Fifi})$
in clause form: $\neg \text{Older}(x, \text{Fifi})$
- Last proof step would have been



Don't make mistake of first forming clause
from conclusion & then denying it:

- Conclusion:

$\exists x. \text{Older}(x, \text{Fifi})$

clause form: $\text{Older}(C, \text{Fifi})$

denial: $\neg \text{Older}(C, \text{Fifi})$

Cannot unify
Lulu, C!!

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Resolution for Question-Answering

- So far, resolution was used to just prove logic sentences
- Resolution's unification mechanism allows us to answer questions as well:
 - Consider again the proof of “Something is older than Fifi”
 $\exists x. \text{Older}(x, \text{Fifi})$
 - Denial clause:
 $\neg \text{Older}(x, \text{Fifi})$
 - Substitution made in disproof:
 $\{x/\text{Lulu}\}$
 - So Lulu is the “something” that’s older than Fifi.
→Answers question “what is older than Fifi?”

In general, to answer

“what x has such-and-such properties?”

- Prove “there exists an x with such-and-such properties”
- Extract substitution for x

Question-Answering

Example 1:

“Who is Lulu older than?”

- Prove that
“there is an x such that Lulu is older than x”
- In FOL form:
 $\exists x. \text{Older}(\text{Lulu}, x)$
- Denial:
 $\neg \exists x. \text{Older}(\text{Lulu}, x)$
 $\forall x. \neg \text{Older}(\text{Lulu}, x)$
in clause form: $\neg \text{Older}(\text{Lulu}, x)$
- Successful proof gives
 $\{x/\text{Fifi}\}$ [Verify!!]

Example 2:

“What is older than what?”

- In FOL form:
 $\exists x \exists y. \text{Older}(x, y)$
- Denial:
 $\neg \exists x \exists y. \text{Older}(x, y)$
in clause form: $\neg \text{Older}(x, y)$
- Successful proof gives
 $\{x/\text{Lulu}, y/\text{Fifi}\}$ [Verify!!]

Getting Multiple Answers

- Assume additional facts:
 - $\text{Father}(\text{BowWow}, \text{Fifi})$
 - $\neg \text{Father}(x, y) \vee \text{Parent}(x, y)$
 - $\text{Alive}(\text{BowWow})$
- We can then answer $\exists x. \text{Older}(x, \text{Fifi})$ using $\{x/\text{Lulu}\}$ or $\{x/\text{BowWow}\}$ (i.e., 2 distinct proofs exist)

Q: Is it possible to find all answers to a given question using the resolution rule?

Ans: Yes, if the premises in the knowledge base are all Horn clauses

$$\neg A_1 \vee \neg A_2 \vee \dots \vee \neg A_n \vee B$$
$$A_1 \wedge A_2 \wedge \dots \wedge A_n \Rightarrow B$$

Achieved by finding all ways to refute a query

Getting Multiple Answers (cont.)

To find all ways of refuting $\neg\text{Older}(x, \text{Fifi})$:

- Find unit clauses this resolves with (if any), adding substitutions for successful refutations to **Answers**

If $\text{Older}(\text{Fang}, \text{Fifi})$ was in KB, we would have ...

$$\text{Answers} = \text{Answers} \cup \{x/\text{Fang}\}$$

- Find clauses of the form

$$\neg A_1 \vee \neg A_2 \vee \dots \vee \neg A_n \vee \text{Older}(x, \text{Fifi})$$

and resolve

- If successful, with unifier θ , recursively find all refutations of the corresponding antecedent instances $(\neg A_1, \neg A_2, \dots, \neg A_n)$

- “Compose” the substitutions for these refutations with θ and add to **Answers**

Details in (R&N, p. 275)

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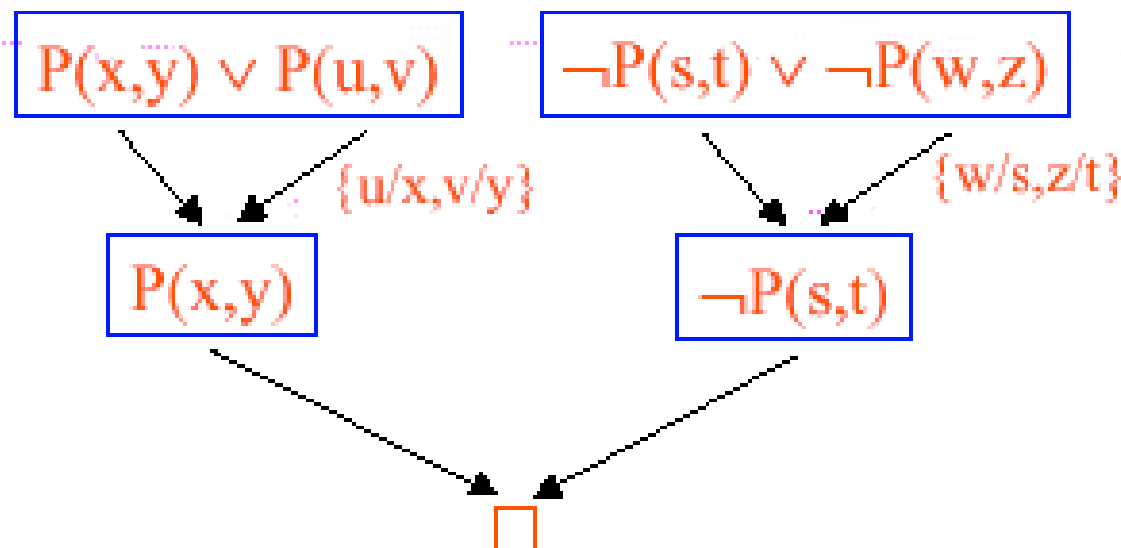
Factoring

- Resolution is “not quite” refutation-complete

e.g. $P(x,y) \vee P(u,v)$ and $\neg P(s,t) \vee \neg P(w,z)$ are clearly contradictory, yet we can't derive \square

- Factoring:

Allows us to unify 2 literals of the same clause



Equality

- Suppose we are given:

$\text{Older}(\text{Lulu}, \text{Fifi})$

$\neg\text{Older}(x,x)$

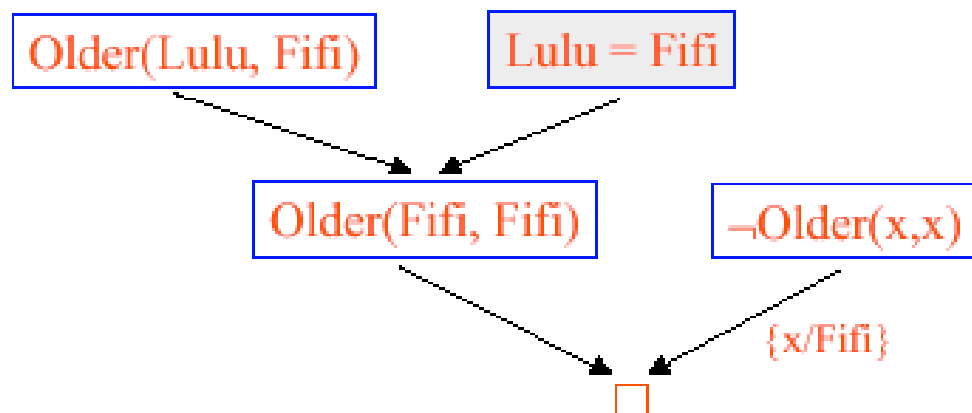
resolution cannot be applied here

- Now, what if we know that Lulu & Fifi refer to the same entity?

Need an additional rule & axioms to treat equality

Paramodulation: essentially, substitution of equals (but with unification)

- Proving $\neg(\text{Lulu} = \text{Fifi})$:

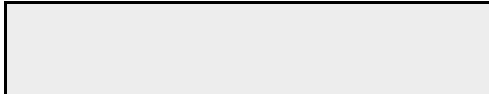
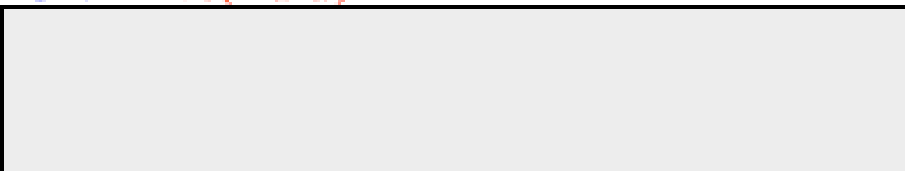


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Resolution Strategies

In a general KB, there may be many resolutions that can be applied at a given step

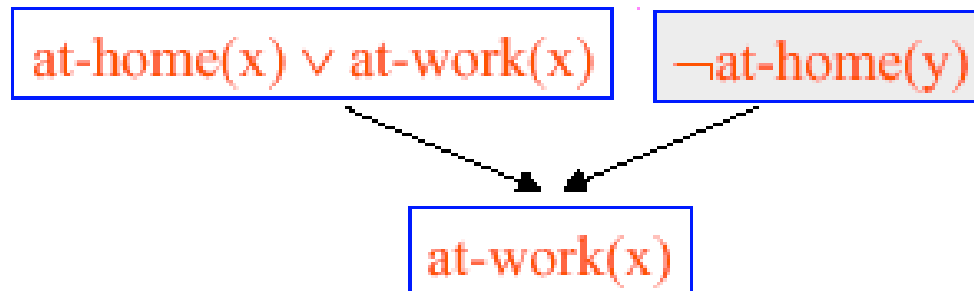
| | |
|--|------------------|
|  | given |
| C2. Alive(Lulu) | given |
|  | given |
| | given |
| C5. \neg Older(Lulu, Fifi) | denial of concl. |
| C6. Parent(Lulu,Fifi) | r[C1,C3a] |
| C7. \neg Alive(Lulu) \vee Older(Lulu, Fifi) | r[C6,C4a] |
| C8. Older(Lulu, Fifi) | r[C8,C5] |
| C9. \square | |

We can use specific resolution strategies to ensure that we do not perform “useless” resolutions

Resolution Strategies

- **Backward chaining strategy:**
Reason backwards from a goal
(used for finding multiple answers to a query)

- **Unit resolution:**
One of the parent clauses is always chosen to contain a single literal



Idea: Length of resolvent **always decreases by 1**
→ gets closer to empty clause
(i.e., unit resolution is a Greedy method)

Caveat: Unit resolution is not complete!

Resolution Strategies (cont.)

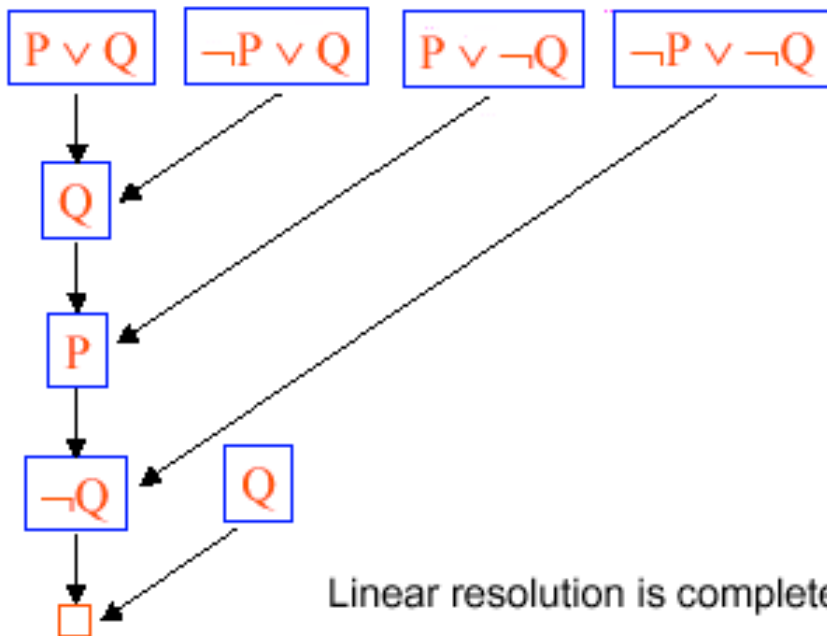
- **Input resolution:**

One of the parent clauses is contained in the original KB

Input resolution is equivalent to unit resolution (and hence also incomplete)

- **Linear resolution:**

Each parent is a linear resolvent, i.e., is either in the initial KB or is an ancestor of the other parent



Linear resolution is complete

Resolution Strategies (cont.)

- Set-of-support resolution:

Given a set of clauses Γ , a set of support resolvent of Γ is a resolvent whose parents are either clauses of Γ or descendants of such clauses

Set-of-support resolution: always use a denial clause or a descendant of a denial clause as one parent

Idea: “Focus” the proof on using the denial clause(s) to derive a contradiction rather than grinding arbitrary KB facts together

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Logic Programming

Robert Kowalski's equation:

Programming = Logic + Control

In logic programming, algorithms are created by augmenting logical sentences with information to control the inference process (Russell & Norvig)

An FOL definition of the list member function:

$\forall x \forall l. \text{Member}(x, [x|l])$

$\forall x \forall y \forall l. \text{Member}(x, l) \Rightarrow \text{Member}(x, [y|l])$

Logic programming can be thought of as a “declarative language”

Program = sequence declarations

Control = implicit

Program execution = proof

e.g., prove `member(3, [2,1,3])`