

CSE 473

# Lecture 13

Chapter 9

## Reasoning with First-Order Logic

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## Today's Agenda

Reasoning with First-Order Logic

**Chaining**



**Resolution**



**Compilation to SAT**



## Recall: Unification

- Match up expressions by *finding variable values that make the expressions identical*  
Unify  $\text{city}(x)$  and  $\text{city}(\text{seattle})$  using  $\{x/\text{seattle}\}$
- **Unify**( $x, y$ ) returns most general unifier (MGU)



- MGU = unifier that places *fewest restrictions* on values of variables

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## Unification Examples I

- **Unify**( $\text{road}(x, \text{kent}), \text{road}(\text{seattle}, y)$ )  
Returns  $\{x / \text{seattle}, y / \text{kent}\}$   
When substituted in both expressions, the resulting expressions match:  
Each is **(road(seattle, kent))**
- **Unify**( $\text{road}(x, x), \text{road}(\text{seattle}, \text{kent})$ )  
Not possible - Fails!  
 $x$  can't be seattle and kent at the same time!

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## Unification Examples II

- Unify( $f(g(x, \text{dog}), y)$ ),  $f(g(\text{cat}, y), \text{dog})$   
 $\{x / \text{cat}, y / \text{dog}\}$
- Unify( $f(g(x))$ ),  $f(x)$   
Fails: no substitution makes them identical.  
E.g.  $\{x / g(x)\}$  yields  $f(g(g(x)))$  and  $f(g(x))$   
which are not identical!
- Thus: A variable value may not *contain*  
itself in a substitution  
Directly or indirectly

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## Unification Examples III

- Unify( $f(g(\text{cat}, y), y)$ ),  $f(x, \text{dog})$   
 $\{x / g(\text{cat}, \text{dog}), y / \text{dog}\}$
- Unify( $f(g(y))$ ),  $f(x)$   
 $\{x / g(y)\}$
- Back to curious monkeys:

$$\frac{\text{Monkey}(x) \rightarrow \text{Curious}(x) \quad \{x / \text{George}\}}{\text{Monkey}(\text{George})}$$

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Curious(George)

Unify and then use modus ponens =  
*generalized modus ponens (GMP)*  
("Lifted" version of modus ponens)

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## Inference I: Forward Chaining

- The algorithm:
  - Start with the KB
  - Add any fact you can generate with GMP (i.e., unify expressions and use modus ponens)
  - Repeat until: goal reached or generation halts.

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## Example

- It is a crime for an American to sell weapons to hostile nations. The country Nono, an enemy of America, has some missiles. All of its missiles were sold to it by Colonel West, who is American.
- Is Col. West a criminal?
- KB of definite clauses (exactly 1 positive literal):
  - $American(x) \wedge Weapon(y) \wedge Sells(x,y,z) \wedge Hostile(z) \Rightarrow Criminal(x)$
  - $Owns(Nono,M_1) \wedge Missile(M_1)$
  - $Missile(x) \wedge Owns(Nono,x) \Rightarrow Sells(West,x,Nono)$
  - $Missile(x) \Rightarrow Weapon(x)$
  - $Enemy(x,America) \Rightarrow Hostile(x)$
  - $American(West)$
  - $Enemy(Nono,America)$

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## Forward chaining example

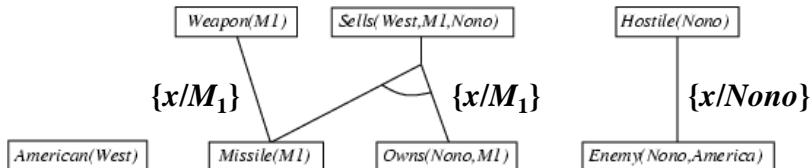
$Missile(x) \Rightarrow Weapon(x)$   
 $Missile(x) \wedge Owns(Nono, x) \Rightarrow Sells(West, x, Nono)$   
 $Enemy(x, America) \Rightarrow Hostile(x)$

$American(West)$        $Missile(M1)$        $Owns(Nono, M1)$        $Enemy(Nono, America)$

Initial facts in KB

## Forward chaining example

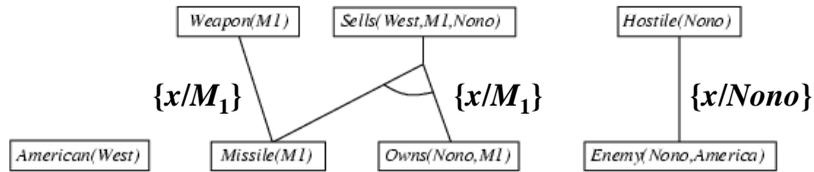
$Missile(x) \Rightarrow Weapon(x)$   
 $Missile(x) \wedge Owns(Nono, x) \Rightarrow Sells(West, x, Nono)$   
 $Enemy(x, America) \Rightarrow Hostile(x)$



Facts inferred after 1<sup>st</sup> iteration

# Forward chaining example

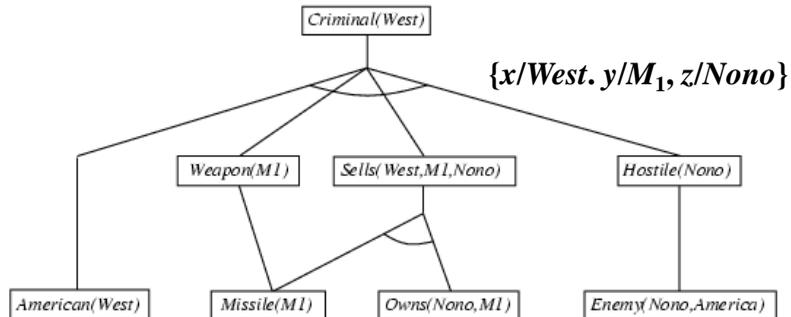
$American(x) \wedge Weapon(y) \wedge Sells(x, y, z) \wedge Hostile(z) \Rightarrow Criminal(x)$



Facts inferred after 1<sup>st</sup> iteration

# Forward chaining example

Col. West is a criminal



## Inference I: Forward Chaining

- **Sound? Complete? Decidable?**  
Yes; yes for definite KB; no (see p. 331 in text)
- **Speed concerns?** Inefficiencies due to:  
Unification via exhaustive pattern matching; premise rechecking on every iteration; irrelevant fact generation.  
(see Section 9.3.3 for strategies to increase speed)

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## Inference II: Backward Chaining

- **The algorithm:**  
Start with KB and goal.  
Find all rules whose *results* unify with goal:  
Add the *premises* of these rules to the goal list  
Remove the corresponding result from the goal list  
Stop when:  
Goal list is empty (SUCCEED) or  
Progress halts (FAIL)

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## Backward chaining example

*Goal*

$Criminal(West)$

## Backward chaining example

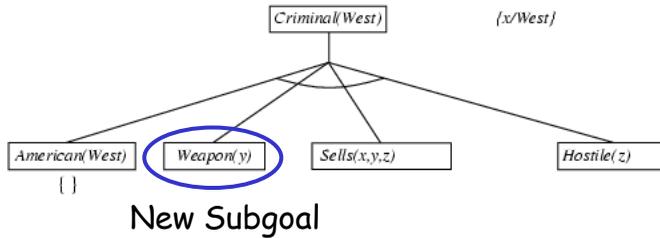
$American(x) \wedge Weapon(y) \wedge Sells(x, y, z) \wedge Hostile(z) \Rightarrow Criminal(x)$

$Criminal(West)$

$\{x/West\}$

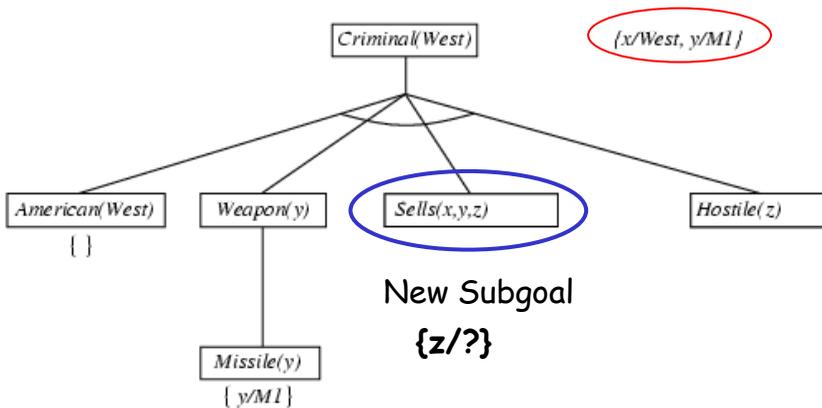
# Backward chaining example

Depth-first traversal



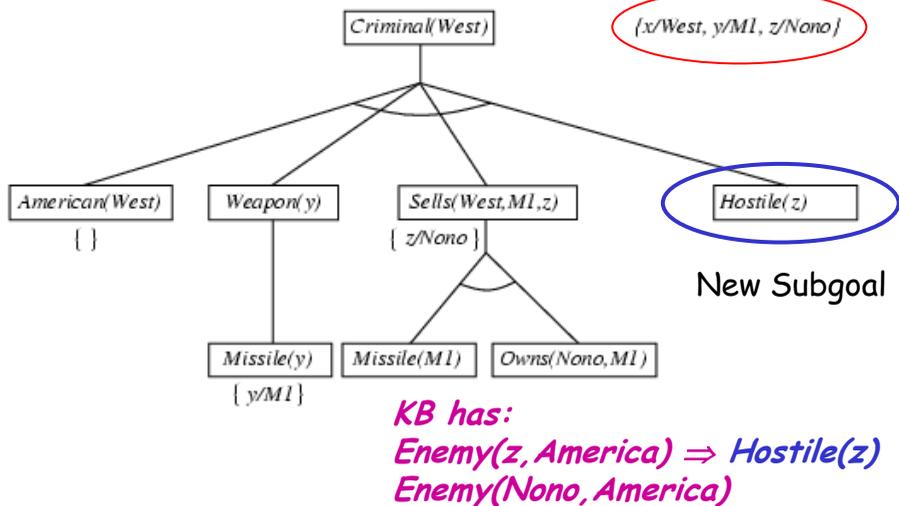
*KB has:*  
*Missile(y) ⇒ Weapon(y)*  
*Missile(M<sub>1</sub>)*

# Backward chaining example

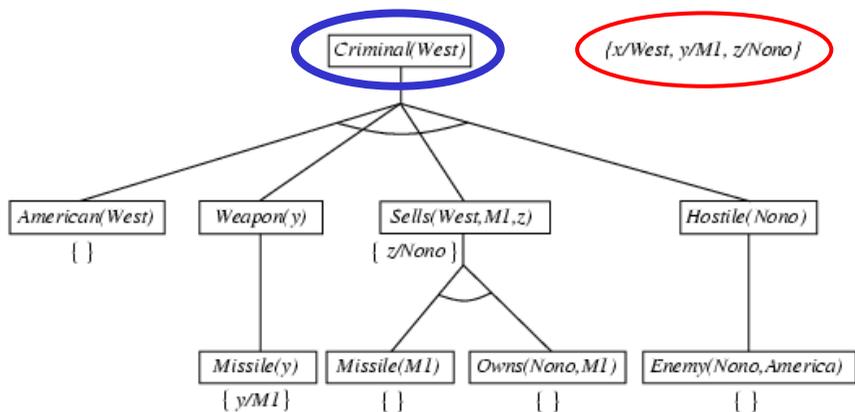


*KB has:*  
*Missile(y) ∧ Owns(Nono, y) ⇒ Sells(West, y, Nono)*  
*Missile(M<sub>1</sub>)*  
*Owns(Nono, M<sub>1</sub>)*

## Backward chaining example



## Backward chaining example



## Properties of backward chaining

- Depth-first recursive search: space is linear in size of proof
- Incomplete due to infinite loops (e.g. repeated states)
  - ⇒ fix by checking current goal against goals on stack
  - ⇒ Can't fix infinite paths though (similar to DFS)
- Inefficient due to repeated computations
  - ⇒ fix using caching of previous results (extra space)
- Widely used for logic programming
  - E.g., Prolog (logic programming language) - see Section 9.4 in text

## Inference III: Resolution

$$\{ (p \vee q), (\neg p \vee r \vee s) \} \vdash_R (q \vee r \vee s)$$

Recall Propositional Case:

- Literal in one clause
- Its negation in the other
- Result is disjunction of *other* literals

## First-Order Resolution

[Robinson 1965]

$\{ (p(x) \vee q(A), \neg p(B) \vee r(x) \vee s(y)) \}$

$\vdash_R$

$(q(A) \vee r(B) \vee s(y))$

Substitute  
MGU  $\{x/B\}$   
in all  
literals

- Literal in one clause
- **Negation** of *something which unifies* in other
- Result is disjunction of all other literals with substitution based on MGU

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## Inference using First-Order Resolution

- As before, use "proof by contradiction"  
To show  $KB \not\models a$ , show  $KB \wedge \neg a$  unsatisfiable

- **Method**

Let  $S = KB \wedge \neg \text{goal}$

Convert  $S$  to clausal form

- Standardize variables (replace  $x$  in all with  $y, z, x_1, \dots$ )
- Move quantifiers to front, skolemize to remove  $\exists$
- Replace  $\Rightarrow$  with  $\vee$  and  $\neg$
- Use deMorgan's laws to get CNF (ands-of-ors)

Resolve clauses in  $S$  until empty clause (unsatisfiable) or no new clauses added

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# First-Order Resolution Example

- Given

$\forall x \text{ man}(x) \Rightarrow \text{human}(x)$

$\forall x \text{ woman}(x) \Rightarrow \text{human}(x)$

$\forall x \text{ singer}(x) \Rightarrow \text{man}(x) \vee \text{woman}(x)$

$\text{singer}(\text{Diddy})$



- Prove

$\text{human}(\text{Diddy})$

CNF representation (list of clauses):

$[\neg m(x), h(x)] \quad [\neg w(y), h(y)] \quad [\neg s(z), m(z), w(z)] \quad [s(D)] \quad [\neg h(D)]$

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# FOL Resolution Example

$[\neg m(x), h(x)] \quad [\neg w(y), h(y)] \quad [\neg s(z), m(z), w(z)] \quad [s(D)] \quad [\neg h(D)]$

$[m(D), w(D)]$

$[w(D), h(D)]$

$[h(D)]$

$[\ ]$



Eh yo homies, dis proves human(Diddy)

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## Next Time

- Wrap up of FOL
- FOL Wumpus Agent
- To Do
  - Project #2 due this Thursday midnight
  - Read chapter 9