

CSE 473

Chapter 9

Reasoning with First-Order Logic



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What's on our menu today?

- Reasoning with FOL
 - Unification
 - Forward/Backward Chaining
 - Resolution
 - Compilation to SAT

Motivation for Unification

- What if we want to use modus ponens?

Propositional Logic:

$$\frac{a \wedge b, \quad a \wedge b \Rightarrow c}{c}$$

- In First-Order Logic?

Monkey(x) \Rightarrow Curious(x)

Monkey(George)

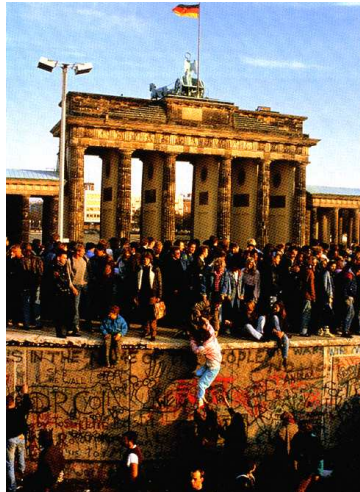
????

- Must "*unify*" x with George:

Need to substitute {x/George} in Monkey(x) \Rightarrow Curious(x) to infer Curious(George)

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What is Unification?



Not this kind of unification...

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What is Unification?

- Match up expressions by *finding variable values that make the expressions identical*
- **Unify**(x, y) returns most general unifier (MGU). Examples:

Unify(city(x), city(kent)) returns { x /kent}

Unify(PokesInTheEyes(Moe, x), PokesInTheEyes(y , z))
returns { y /Moe, x / z }

- { y /Moe, x /Moe, z /Moe} possible but not MGU
- MGU places fewest restrictions on values of variables

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Unification and Substitution

Unification produces a mapping from variables to values (e.g., { x /kent, y /seattle})

Substitution: Subst(mapping,sentence)
returns new sentence with variables replaced by values

Subst({ x /kent, y /seattle }, connected(x, y))
returns connected(kent, seattle)

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Unification Examples I

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

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Unification Examples II

- $\text{Unify}(\text{f}(\text{g}(x, \text{dog}), y), \text{f}(\text{g}(\text{cat}, y), \text{dog}))$
 $\{x / \text{cat}, y / \text{dog}\}$
- $\text{Unify}(\text{f}(\text{g}(x)), \text{f}(x))$
Fails: no substitution makes them identical.
E.g. $\{x / \text{g}(x)\}$ yields $\text{f}(\text{g}(\text{g}(x)))$ and $\text{f}(\text{g}(x))$
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:

Monkey(x)	Curious(x)
Monkey(George)	
<hr/>	
	Curious(George)

Unify and then use modus ponens =
generalized modus ponens
("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.

- Sound? Complete? Decidable?

Yes; yes for definite KB; no (see p. 283 in text)

- Speed concerns? Inefficiencies due to:

Unification via exhaustive pattern matching; premise
rechecking; irrelevant fact generation.

(see p. 283-287 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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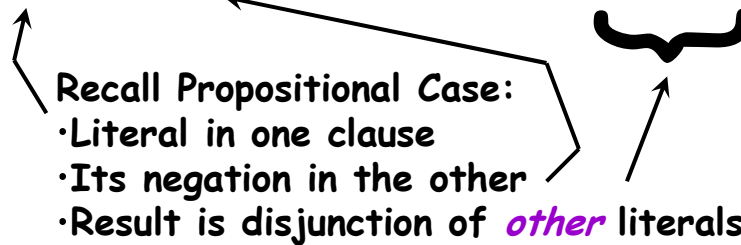
Inference III: Resolution

[Robinson 1965]

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

Recall Propositional Case:

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



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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 $KB \models a$, show $KB \wedge \neg a$ unsatisfiable

- Method

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

Convert S to clausal form

- Standardize apart variables
- Move quantifiers to front, skolemize to remove \exists
- Replace \Rightarrow with \vee and \neg
- 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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FOL Resolution Example

- Much More Difficult Exercise:
Prove human(MJ)

What about me?



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FOL Resolution Example 2

Given

Prove

$\forall x \exists y \text{ Twin}(x) \Rightarrow \text{Twin}(y)$
 $\text{Twin}(\text{Ashley})$

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

$\forall x \text{ Twin}(x) \Rightarrow \text{Twin}(F(x))$ Skolemization

$[(\neg T(x), T(F(x))) \quad (T(A)) \quad (\neg T(D))]$

$(T(F(A)))$

$(T(F(F(A))))$

$(T(F(F(F(A)))))$

May not terminate!

...

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Inference IV: Compilation to Prop. Logic

- Sentence S:
 $\forall_{\text{city}} a,b \text{ Connected}(a,b)$
- Universe
Cities: seattle, tacoma, enumclaw
- Equivalent propositional formula?

$$C_{st} \wedge C_{se} \wedge C_{ts} \wedge C_{te} \wedge C_{es} \wedge C_{et}$$

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Compilation to Prop. Logic (cont)

- Sentence S:
 $\exists_{\text{city}} c \text{ Biggest}(c)$
- Universe
Cities: seattle, tacoma, enumclaw
- Equivalent propositional formula?

$$B_s \vee B_t \vee B_e$$

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Compilation to Prop. Logic (cont again)

- Universe
 - Cities: seattle, tacoma, enumclaw
 - Firms: IBM, Microsoft, Boeing
- First-Order formula
$$\forall_{\text{firm}} f \exists_{\text{city}} c \text{HeadQuarters}(f, c)$$
- Equivalent propositional formula
$$\left[\begin{array}{l} (\text{HQis} \vee \text{HQit} \vee \text{HQie}) \wedge \\ (\text{HQms} \vee \text{HQmt} \vee \text{HQme}) \wedge \\ (\text{HQbs} \vee \text{HQbt} \vee \text{HQbe}) \end{array} \right]$$

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Hey!

- You said FO Inference is semi-decidable
- But you compiled it to SAT
 - Which is NP Complete
- So now we can always do the inference?!?
 - (might take exponential time but still decidable?)
- Something seems wrong here....????
 - Something to ponder over the weekend...

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