

H250: Honors Colloquium – Introduction to Computation  
Resolution in Predicate Logic

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## Review: Resolution in propositional logic

Resolution is an *inference rule* that produces a *new clause* from two clauses with *complementary literals* ( $p$  and  $\neg p$ ).

$$\boxed{\begin{array}{c} p \vee A \quad \neg p \vee B \\ \hline A \vee B \end{array} \quad \text{resolution}}$$

“From clauses  $p \vee A$  and  $\neg p \vee B$  we derive clause  $A \vee B$ ”

New clause = *resolvent* of the two clauses with respect to  $p$

Example:  $res_p(p \vee q \vee \neg r, \neg p \vee s) = q \vee \neg r \vee s$

*Resolution is a valid inference rule:*

any assignment making premises true also makes conclusion true

$$\{p \vee A, \neg p \vee B\} \models A \vee B$$

*Corollary:* if  $A \vee B$  is a contradiction, so is  $(p \vee A) \wedge (\neg p \vee B)$   
if resolution reaches contradiction, we started from a contradiction

## Resolution For Predicates

In predicate logic, a *literal* is a (possibly negated) predicate:  
not  $p$  and  $\neg p$ , but  $P(arg1)$  and  $\neg P(arg2)$  (different args)

To derive a new clause from  $A \vee P(arg1)$  and  $B \vee \neg P(arg2)$  must bring args to common form.

Variables in clauses will be (implicitly) universally quantified  
can take any value  $\Rightarrow$  can *substitute* with any *terms*

Is there a substitution bringing the arguments to a common form?

Ex. 1:  $P(x, g(y))$  and  $P(a, z)$

Ex. 2:  $P(x, g(y))$  and  $P(z, a)$

Ex. 1:  $x \mapsto a, z \mapsto g(y)$  yields  $P(a, g(y)), P(a, g(y)) \Rightarrow$  same

Ex. 2: can't substitute *constant*  $a$  with  $g(y)$  ( $a$  is not a variable)  
 $g$  is an arbitrary function, don't know if  $y$  exists with  $g(y) = a$

# Substitution and Term Unification

A *substitution* is a *function* that associates *terms* to *variables*

$$\{x_1 \mapsto t_1, \dots, x_n \mapsto t_n\}$$

Two terms can be *unified* if there is a substitution that makes them equal

$$f(x, g(y, z), t) \{x \mapsto h(z), y \mapsto h(b), t \mapsto u\} = f(h(z), g(h(b), z), u)$$

## *Unification Rules*

A *variable*  $x$  may be unified with any *term*  $t$  (substitution)  
if  $x$  *does not occur* in  $t$  (otherwise, we'd get an infinite term)  
can't unify:  $x$  with  $f(h(y), g(x, z))$ ; but can trivially unify  $x$  with  $x$

Two *terms*  $f(\dots)$  can be unified if they have the same function  $f$   
and the *arguments* (terms) can be unified one by one

$\Rightarrow$  two *constants* (0-arg functions): unified if equal

# Implementing Unification: Union-Find

Unification defines equivalence classes:

If we unify  $x$  with  $y$  and then  $y$  with  $f(z, a)$ ,  
then  $x$  is also unified with  $f(z, a) \Rightarrow$  *equivalence*

Must track equivalent variables.

*Union-Find*: data structure for building equivalence classes

Operations:

*find*(element): finds representative of equivalence class

*union*(elem1, elem2): makes elements equivalent (will stay so)

## Union-Find Example

One implementation: set of *trees* with links up to parent

*find*: returns root of tree

*union*: links one root to the other

$g(Z)$



$Y$



$X$

$find(X) = find(Y) = g(Z)$

$g(Z)$



$Y$



$X$

$T$



$S$

$union(Y, S)$

links  $find(S)$  with  $find(Y)$

We maintain a *map* of variables to *terms*.

## Union-Find Example

Unify  $f(x, g(x, s(z)), t)$  with  $f(h(z), g(h(b), u), z)$

$x$  with  $h(z) \Rightarrow \{x \mapsto h(z)\}$

$g(x, s(z))$  with  $g(h(b), u) \Rightarrow$

$x$  with  $h(b) \Rightarrow h(z)$  with  $h(b) \Rightarrow \{x \mapsto h(z), z \mapsto b\}$

$s(z)$  with  $u \Rightarrow \{x \mapsto h(z), z \mapsto b, u \mapsto s(z)\}$

$t$  with  $z \Rightarrow t$  with  $b \Rightarrow \{x \mapsto f(z), z \mapsto b, u \mapsto s(z), t \mapsto b\}$

Substituting all the way:

$\{x \mapsto f(b), z \mapsto b, u \mapsto s(b), t \mapsto b\}$

This substitution is the *most general unifier* of the given terms.

## Resolution in Predicate Logic

Take clauses  $A$  with  $P(\dots)$  (*positive*) and  $B$ , with  $\neg P(\dots)$  (*negated*)

$A: P(x, g(y)) \vee P(h(a), z) \vee Q(z)$        $B: \neg P(h(z), t) \vee R(t, z)$

Choose *some* ( $\geq 1$ )  $P(\dots)$  from  $A$  and *some*  $\neg P(\dots)$  from  $B$

*Rename* common variables ( $A$  and  $B$  are independent clauses)

$A: P(x, g(y)) \vee P(h(a), z) \vee Q(z)$        $B: \neg P(h(z_2), t) \vee R(t, z_2)$

*Unify all chosen*  $P(\dots)$  from  $A$  and  $\neg P(\dots)$  from  $B$

$\{P(x, g(y)), P(h(a), z), P(h(z_2), t)\}$      $x \mapsto h(a); z_2 \mapsto a; z, t \mapsto g(y)$

*Eliminate* chosen  $P(\dots)$  and  $\neg P(\dots)$  from  $A \vee B$ .

*Apply* resulting substitution and *add* new clause to list

$Q(g(y)) \vee R(g(y), a)$

*Keep* original clauses for unification with other predicates

# Transforming the Formula for Resolution

We proceed similarly to CNF transformation, but with extra steps.

- ▶ rewrite  $\rightarrow$ ,  $\leftrightarrow$ , etc., keep only  $\wedge$ ,  $\vee$ ,  $\neg$
- ▶ push negation inwards to predicates (negation normal form)
- ▶ rename to get unique variable names (we'll remove quantifiers)

$\forall x P(x) \vee \forall x \exists y Q(x, y)$  becomes  $\forall x P(x) \vee \forall z \exists y Q(z, y)$

## Skolemization: Removing Existential Quantifiers

We want to only keep universally quantified variables, and make quantification implicit.

⇒ use Instantiation for existential quantifiers

In  $\forall x_1 \dots \forall x_k \exists y : (\dots)$ , the choice of  $y$  *depends* on  $x_1, \dots, x_k$ ;  
introduce a new *Skolem function*  $y = f(x_1, \dots, x_k)$ , eliminating  $y$   
i.e., instantiate  $y$  with  $f(x_1, \dots, x_k)$

In particular ( $k = 0$ ),  $\exists y$  outside any  $\forall$  is instantiated with a new *Skolem constant*

*New* function or constant names for *each* existential quantifier.

## Transformation Steps (cont'd.)

- ▶ Bring all  $\forall$  quantifiers to the front (prenex normal form)

$$\forall x P(x) \wedge \forall y Q(y) \quad \leftrightarrow \quad \forall x \forall y (P(x) \wedge Q(y))$$

$$\forall x P(x) \vee \forall y Q(y) \quad \leftrightarrow \quad \forall x \forall y (P(x) \vee Q(y))$$

- ▶ Remove all quantifiers (implicit universal quantification)
- ▶ Bring  $\wedge$  outside  $\vee$  (convert to clausal form)

## A Resolution Exercise

<https://www.cs.utexas.edu/users/novak/reso.html>,

Exercise 9:

Every investor bought [something that is] stocks or bonds.

$A_1: \forall X(inv(X) \rightarrow \exists Y(buy(X, Y) \wedge (share(Y) \vee bond(Y))))$

If the Dow-Jones Average crashes, then all stocks that are not gold stocks fall.

$A_2: crash \rightarrow \forall X(share(X) \wedge \neg gold(X) \rightarrow falls(X))$

If the T-Bill interest rate rises, then all bonds fall.

$A_3: tbrise \rightarrow \forall X(bond(X) \rightarrow falls(X))$

Every investor who bought something that falls is not happy.

$A_4: \forall X(inv(X) \rightarrow (\exists Y(buy(X, Y) \wedge falls(Y)) \rightarrow \neg happy(X)))$

## Resolution Example (cont'd.)

If the Dow-Jones Average crashes and the T-Bill interest rate rises, then any investor who is happy bought some gold stock.

$C: crash \wedge tbrise \rightarrow$

$\forall X(inv(X) \wedge happy(X) \rightarrow \exists Y(buy(X, Y) \wedge share(Y) \wedge gold(Y)))$

We negate the conclusion *before* transforming quantifiers!

$\neg C: \neg(crash \wedge tbrise \rightarrow$

$\forall X(inv(X) \wedge happy(X) \rightarrow \exists Y(buy(X, Y) \wedge share(Y) \wedge gold(Y))))$

## Example in Negation Normal Form

$A_1: \forall X(\neg inv(X) \vee \exists Y(buy(X, Y) \wedge (share(Y) \vee bond(Y))))$

$A_2: \neg crash \vee \forall X(\neg share(X) \vee gold(X) \vee falls(X))$

$A_3: \neg tbrise \vee \forall X(\neg bond(X) \vee falls(X))$

$A_4: \forall X(\neg inv(X) \vee \forall Y(\neg buy(X, Y) \vee \neg falls(Y)) \vee \neg happy(X))$

$\neg C: crash \wedge tbrise \wedge$

$\exists X(inv(X) \wedge happy(X) \wedge \forall Y(\neg buy(X, Y) \vee \neg share(Y) \vee \neg gold(Y)))$

## Example: Skolemization

$A_1: \forall X(\neg inv(X) \vee \exists Y(buy(X, Y) \wedge (share(Y) \vee bond(Y))))$

Item  $Y$  bought depends on investor  $X$ ,  $Y = f(X)$

$\forall X(\neg inv(X) \vee (buy(X, f(X)) \wedge (share(f(X)) \vee bond(f(X))))))$

$X$  in  $\exists X(\dots)$  becomes constant  $b$

$\neg C: crash \wedge tbrise \wedge \exists X(inv(X) \wedge happy(X))$

$\wedge \forall Y(\neg buy(X, Y) \vee \neg share(Y) \vee \neg gold(Y))$

$crash \wedge tbrise \wedge inv(b) \wedge happy(b)$

$\wedge \forall C(\neg buy(b, Y) \vee \neg share(Y) \vee \neg gold(Y))$

## Example: Eliminating Quantifiers

All remaining variables are arbitrary (implicit universal quantification)

$$A_1: \neg \text{inv}(X) \vee (\text{buy}(X, f(X)) \wedge (\text{share}(f(X)) \vee \text{bond}(f(X))))$$

$$A_2: \neg \text{crash} \vee \neg \text{share}(X) \vee \text{gold}(X) \vee \text{falls}(X)$$

$$A_3: \neg \text{tbrise} \vee \neg \text{bond}(X) \vee \text{falls}(X)$$

$$A_4: \neg \text{inv}(X) \vee \neg \text{buy}(X, Y) \vee \neg \text{falls}(Y) \vee \neg \text{happy}(X)$$

$$\neg C: \text{crash} \wedge \text{tbrise} \wedge \text{inv}(b) \wedge \text{happy}(b) \\ \wedge (\neg \text{buy}(b, Y) \vee \neg \text{share}(Y) \vee \neg \text{gold}(Y))$$

Next: apply distributivity of  $\vee$  over  $\wedge$  and write clauses separately

## Example: Clausal Form

- (1)  $\neg \text{inv}(X) \vee \text{buy}(X, f(X))$
- (2)  $\neg \text{inv}(X) \vee \text{share}(f(X)) \vee \text{bond}(f(X))$
- (3)  $\neg \text{crash} \vee \neg \text{share}(X) \vee \text{gold}(X) \vee \text{falls}(X)$
- (4)  $\neg \text{tbrise} \vee \neg \text{bond}(X) \vee \text{falls}(X)$
- (5)  $\neg \text{inv}(X) \vee \neg \text{buy}(X, Y) \vee \neg \text{falls}(Y) \vee \neg \text{happy}(X)$
- (6)  $\text{crash}$
- (7)  $\text{tbrise}$
- (8)  $\text{inv}(b)$
- (9)  $\text{happy}(b)$
- (10)  $\neg \text{buy}(b, Y) \vee \neg \text{share}(Y) \vee \neg \text{gold}(Y)$

## Proof: Generating Resolvents

$$(1) \neg \text{inv}(X) \vee \text{buy}(X, f(X))$$

$$(2) \neg \text{inv}(X) \vee \text{share}(f(X)) \vee \text{bond}(f(X))$$

$$(3) \neg \text{crash} \vee \neg \text{share}(X) \vee \text{gold}(X) \vee \text{falls}(X)$$

$$(4) \neg \text{tbrise} \vee \neg \text{bond}(X) \vee \text{falls}(X)$$

$$(5) \neg \text{inv}(X) \vee \neg \text{buy}(X, Y) \vee \neg \text{falls}(Y) \vee \neg \text{happy}(X)$$

$$(6) \text{crash}$$

$$(7) \text{tbrise}$$

$$(8) \text{inv}(b)$$

$$(9) \text{happy}(b)$$

$$(10) \neg \text{buy}(b, Y) \vee \neg \text{share}(Y) \vee \neg \text{gold}(Y)$$

Try to progressively eliminate predicates

$$(11) \neg \text{share}(X) \vee \text{gold}(X) \vee \text{falls}(X) \quad (3, 6)$$

$$(12) \neg \text{buy}(b, Y) \vee \neg \text{share}(Y) \vee \text{falls}(Y) \quad (10, 11, X = Y)$$

$$(13) \neg \text{bond}(X) \vee \text{falls}(X) \quad (4, 7)$$

## Deriving Empty Clause

- (1)  $\neg \text{inv}(X) \vee \text{buy}(X, f(X))$
- (2)  $\neg \text{inv}(X) \vee \text{share}(f(X)) \vee \text{bond}(f(X))$
- (5)  $\neg \text{inv}(X) \vee \neg \text{buy}(X, Y) \vee \neg \text{falls}(Y) \vee \neg \text{happy}(X)$
- (8)  $\text{inv}(b)$
- (9)  $\text{happy}(b)$
- (12)  $\neg \text{buy}(b, Y) \vee \neg \text{share}(Y) \vee \text{falls}(Y)$  (10, 11,  $X = Y$ )
- (13)  $\neg \text{bond}(Y) \vee \text{falls}(Y)$  rename for unification with (2)
- (14)  $\neg \text{inv}(X) \vee \text{share}(f(X)) \vee \text{falls}(f(X))$  (2, 13,  $Y = X$ )
- (15)  $\neg \text{buy}(b, f(X)) \vee \neg \text{inv}(X) \vee \text{falls}(f(X))$  (12, 14,  $Y = f(X)$ )
- (16)  $\neg \text{buy}(b, Y) \vee \neg \text{falls}(Y) \vee \neg \text{happy}(b)$  (5, 8,  $X = b$ )
- (17)  $\neg \text{buy}(b, Y) \vee \neg \text{falls}(Y)$  (9, 16)
- (18)  $\neg \text{buy}(b, f(X)) \vee \neg \text{inv}(X)$  (15, 17,  $Y = f(X)$ )
- (19)  $\neg \text{inv}(b)$  (1, 18,  $X = b$ )
- (20)  $\emptyset$  (proof by contradiction done) (8, 19)

## Revisiting Resolution

We try to prove:

$$A_1 \wedge A_2 \wedge \dots \wedge A_n \rightarrow C$$

by contradiction, negating the conclusion and showing

$$A_1 \wedge A_2 \wedge \dots \wedge A_n \wedge \neg C \quad \text{is a } \textit{contradiction}$$

We repeatedly generate new clauses (*resolvents*) by resolution with unification.

If we get the *empty clause*, the initial formula is *unsatisfiable*

If we *can't find new resolvents*, the formula is *satisfiable*

Resolution in predicate logic is *refutation-complete*

for any unsatisfiable formula, we'll get the empty clause

but can't determine satisfiability of *any* formula

(there are formulas for which the procedure never stops)