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1. In the Last Lecture

In the last lecture we saw that

- A Prolog program can include *meta-level* clauses about itself.
- Three commonly used predefined meta-level predicates are ‘clause/2’, ‘assertz/1’ and ‘retract/1’.
- The ‘clause/2’ predicate can be used in *meta-interpreters* that refine or adapt Prolog’s search strategy for specific problems.
- The meaning of Prolog programs in terms of classical logic is not always straightforward, partly because Prolog includes *Uniqueness-of-names* and *Closed World Assumptions*.

2. Prolog and Resolution

For a Prolog program in which all the predicates have arity 0 (i.e. no arguments) and that does not use negation-by-failure, a successful branch in the search tree of a query is equivalent to a propositional calculus proof by contradiction using resolution.

Reminder: the general resolution inference rule is:

$$\frac{(L_1 \vee \dots \vee L_i \vee \textcolor{red}{p} \vee L_{i+1} \vee \dots \vee L_m), \quad (L'_1 \vee \dots \vee L'_j \vee \neg \textcolor{red}{p} \vee L'_{j+1} \vee \dots \vee L'_n)}{(L_1 \vee \dots \vee L_m \vee L'_1 \vee \dots \vee L'_n)}$$

For example:

$$\frac{(big \vee \textcolor{red}{soft} \vee \neg red), \quad (\neg \textcolor{red}{soft} \vee \neg new)}{(big \vee \neg red \vee \neg new)} \quad \frac{(\textcolor{red}{soft}), \quad (\neg \textcolor{red}{soft})}{\perp}$$

3. Reminder: Resolution Proof By Contradiction

The general theorem (from Lecture 3, Slide 12):

Resolution Calculus Soundness and Completeness

For any CNF knowledge base KB and formula F

$$KB \models F \text{ if and only if } KB \cup \text{cnfset}[\neg F] \vdash_{res} \perp$$

... and a special (simpler) case if F is a single proposition p :

For any CNF knowledge base KB and proposition p

$$KB \models p \text{ if and only if } KB \cup \{\neg p\} \vdash_{res} \perp$$

For example: $\{(\neg \text{raining} \vee \text{wet}), (\text{raining})\} \models \text{wet}$ if and only if
 $\{(\neg \text{raining} \vee \text{wet}), (\text{raining}), (\neg \text{wet})\} \vdash_{res} \perp$

4. Example Resolution Proof By Contradiction

- Finish the following proof of

$$\{(\neg \text{raining} \vee \text{wet}), (\text{raining}), (\neg \text{wet})\} \vdash_{res} \perp$$

by adding the final two steps (4) and (5):

- | | | |
|-----|---|-------------------------|
| (1) | $(\neg \text{raining} \vee \text{wet})$ | by assumption |
| (2) | (raining) | by assumption |
| (3) | (wet) | by (1), (2), resolution |

5. An Example Prolog Proof

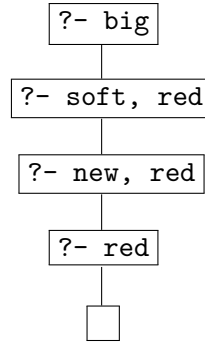
Prolog program:

```
big :- soft, red.
soft :- new.
new.
red.
```

Query:

```
?- big.
```

Search tree:



6. Transforming Programs Into CNF Theories

Prolog program:

```
big :- soft, red.
soft :- new.
new.
red.
```

In logic:

```
big ← (soft ∧ red)
soft ← new
new
red
```

In CNF:

```
(big ∨ ¬soft ∨ ¬red)
(soft ∨ ¬new)
(new)
(red)
```

$$\begin{aligned}
 & big \leftarrow (soft \wedge red) \\
 \equiv & big \vee \neg (soft \wedge red) && [\text{implication}] \\
 \equiv & big \vee (\neg soft \vee \neg red) && [\text{De Morgan}] \\
 \equiv & (big \vee \neg soft \vee \neg red) && [\vee \text{ associativity}]
 \end{aligned}$$

7. An Example Resolution Proof

CNF Knowledge Base KB :

- (1) $(big \vee \neg soft \vee \neg red)$
- (2) $(soft \vee \neg new)$
- (3) (new)
- (4) (red)

Proposition to prove:

big

Resolution proof:

- | | | |
|-----|-----------------------------|--------------|
| (5) | $(\neg big)$ | [assumption] |
| (6) | $(\neg soft \vee \neg red)$ | [by (1),(5)] |
| (7) | $(\neg new \vee \neg red)$ | [by (2),(6)] |
| (8) | $(\neg red)$ | [by (3),(7)] |
| (9) | \perp | [by (4),(8)] |

So by resolution soundness:

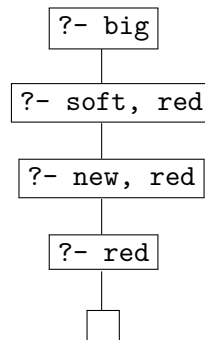
$KB \models big$

8. Comparing Resolution and Prolog Proofs

Resolution proof (from Slide 7):

- (5) $(\neg big)$
- (6) $(\neg soft \vee \neg red)$
- (7) $(\neg new \vee \neg red)$
- (8) $(\neg red)$
- (9) \perp

Prolog search tree (from Slide 5):



9. The Meaning of Prolog Programs with Negation-as-Failure

Negation-as-failure (“ $\backslash +$ ”) cannot be directly translated as classical logic negation (“ \neg ”). A simple example shows why:

Prolog program:

```
:- dynamic new/0, soft/0, red/0.
```

```
soft :- \+ new, red.  
red.
```

Query:

```
?- soft.  
true.
```

Equivalent knowledge base
 $KB?$

```
soft  $\leftarrow (\neg new \wedge red).$   
red.
```

No equivalent entailment:

$KB \not\models soft$

10. A Prolog Search Tree with Negation-as-Failure

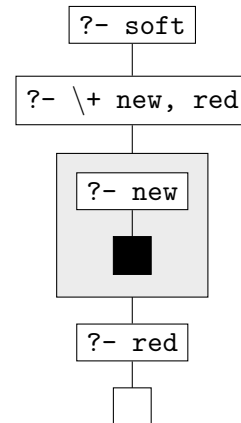
Prolog program:

```
:- dynamic new/0, soft/0, red/0.
```

```
soft :- \+ new, red.  
red.
```

Query:

```
?- soft.  
true.
```



11. Models of $\{soft \leftarrow (\neg new \wedge red), red\}$

Reminders:

- In propositional logic, the models of a formula are the lines in the formula's truth table that make the formula true.
- If F and G are formulas, then " $F \models G$ " means "every model of F is also a model of G ".

$soft$	new	red	$(soft \leftarrow (\neg new \wedge red)) \wedge red$									
t	t	t	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	t	\cancel{f}
t	t	f	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	f	\cancel{f}
t	f	t	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	t	\cancel{f}
t	f	f	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	f	\cancel{f}
\Rightarrow	f	t	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	t	\Leftarrow
	f	t	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	f	
	f	f	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	f	
	f	f	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	\cancel{f}	f	

So, $\{soft \leftarrow (\neg new \wedge red), red\} \not\models soft$ because line 5 is not a model of $soft$.

12. Clark Completion for Propositional Programs

Given a proposition ' p ' appearing in a propositional program PR :

1. If ' p ' does not appear as a fact or as the head of a clause in PR then $\mathbf{COMP}(p, PR) = \neg p$.
2. If ' p ' appears as a fact in PR then $\mathbf{COMP}(p, PR) = p$.
3. If ' p ' does not appear as a fact in PR and has a definition

$$p :- \text{Body}_1. \quad \dots \quad p :- \text{Body}_n.$$

then $\mathbf{COMP}(p, PR) = [p \leftrightarrow (B_1 \vee \dots \vee B_n)]$, where each B_i is the same as ' Body_i ' but with ' \vee ' replaced by ' \neg ', and ' \wedge ' replaced by ' \wedge '.

Clark Completion: $\mathbf{COMP}(PR) = \{\mathbf{COMP}(p, PR) \mid p \text{ appears in } PR\}$.

13. Clark Completion: Propositional Examples

PR	$COMP(PR)$
<pre>soft :- \+ new, red. red.</pre>	<pre>soft \leftrightarrow ($\neg new \wedge red$), red, $\neg new$</pre>
<pre>big :- soft, red. big :- \+ new. red.</pre>	<pre>big \leftrightarrow ((soft \wedge red) \vee $\neg new$), red, $\neg new$, $\neg soft$</pre>
<pre>big :- soft.</pre>	<pre>big \leftrightarrow soft, $\neg soft$</pre>

14. Clark Completion: Another Example

What is $COMP(PR)$ if PR is the following program?

```
happy :- on_holiday, has_money.  
happy :- work_done, \+ has_lectures.  
has_money :- \+ student.  
has_lectures :- term_time, student.  
work_done.
```

15. Prolog Soundness and Completeness

Let ‘ p ’ be a proposition appearing in the propositional Prolog program PR .

Soundness:

If PR returns ‘true’ for the query ‘?- p ’ then $\mathbf{COMP}(PR) \models p$.

If PR returns ‘false’ for the query ‘?- p ’ then $\mathbf{COMP}(PR) \models \neg p$.

Completeness:

If $\mathbf{COMP}(PR) \models p$ and PR is *stratified* (i.e. does not contain loops) then PR will return ‘true’ for the query ‘?- p ’.

If $\mathbf{COMP}(PR) \models \neg p$ and PR is *stratified* (i.e. does not contain loops) then PR will return ‘false’ for the query ‘?- p ’.

16. Clark Completion for Predicate Prolog Programs

Clark completion can be applied to predicate Prolog programs as well, but extra steps and conditions must be applied:

- Programs must be *safe* – written in such a way that negative sub-goals (i.e. sub-goals with ‘ \neg ’) are evaluated only after the variables in them have all been *ground* (i.e. substituted with terms containing no variables).
- Clauses must be re-written in *general form*, i.e. including quantifiers and with only universally quantified variables in their head, before the **COMP** procedure is applied.
- *Clark equality theory* must be added to the completion to ensure that the ‘=’ predicate corresponds to Prolog unification.

17. Safe and Unsafe Prolog Programs

An unsafe Prolog program:

```
happy(X) :-
    \+ sad(X).
sad(mani).
hungry(nina).
```

Queries:

```
?- happy(X).
false.
?- happy(nina).
true.
```

A safe Prolog program:

```
happy(X) :-
    person(X),
    \+ sad(X).
sad(mani).
hungry(nina).
person(mani).
person(nina).
```

Query:

```
?- happy(X).
X=nina.
```

18. Example General Form and Completion

Prolog program PR :

```
likes(X, partner_of(X)).
likes(nina, X) :- polite(X).
polite(partner_of(mani)).
```

PR in general form:

```
 $\forall x_1 \forall x_2. [likes(x_1, x_2) \leftarrow \exists x. (x_1 = x \wedge x_2 = partner\_of(x))],$ 
 $\forall x_1 \forall x_2. [likes(x_1, x_2) \leftarrow \exists x. (x_1 = nina \wedge x_2 = x \wedge polite(x))],$ 
 $\forall x_1. [polite(x_1) \leftarrow x_1 = partner\_of(mani)]$ 
```

$COMP(PR)$:

```
 $\forall x_1 \forall x_2. [likes(x_1, x_2) \leftrightarrow [\exists x. (x_1 = x \wedge x_2 = partner\_of(x)) \vee$ 
 $\quad \exists x. (x_1 = nina \wedge x_2 = x \wedge polite(x))]],$ 
 $\forall x_1. [polite(x_1) \leftrightarrow x_1 = partner\_of(mani)],$ 
– plus the Clark equality theory for  $PR$ .
```

19. Example Completion with Equality Theory

Prolog program PR :

```
likes(X, partner_of(X)).  
likes(nina, X) :- polite(X).  
polite(partner_of(mani)).
```

$COMP(PR)$:

```
 $\forall x_1 \forall x_2. [likes(x_1, x_2) \leftrightarrow [\exists x. (x_1 = x \wedge x_2 = partner\_of(x)) \vee$   
 $\exists x. (x_1 = nina \wedge x_2 = x \wedge polite(x))]]],$   
 $\forall x_1. [polite(x_1) \leftrightarrow x_1 = partner\_of(mani)],$ 
```

Clark equality theory for PR :

```
 $mani \neq nina \wedge \forall x. [partner\_of(x) \neq mani \wedge partner\_of(x) \neq nina],$   
 $\forall x_1 \forall x_2. [x_1 \neq x_2 \rightarrow partner\_of(x_1) \neq partner\_of(x_2)],$   
plus for any structured term  $\tau[x]$  containing any variable  $x$ :  
 $\tau[x] \neq x$  [e.g.  $partner\_of(partner\_of(x)) \neq x$ ]
```

20. Summary

- A query execution with a stratified (i.e. non-looping) propositional Prolog program without negation-as-failure corresponds to a search for a resolution proof by contradiction.
- For “sensibly written” (i.e. safe, stratified) Prolog programs with negation-as-failure, their logical meaning can be understood as their Clark completion.
- For predicate Prolog programs, the Clark completion must include Clark equality theory, because of the way Prolog unifies terms and variables.
- In A.I. terms, Clark completion is related to the “closed world assumption”, and Clark equality theories are examples of “uniqueness-of-names axioms”.

21. Further Reading for Technical Details

- Marek Sergot’s notes on negation as failure are available at: https://www.doc.ic.ac.uk/~mjs/teaching/KnowledgeRep491/NBF_491-2x1.pdf (Marek Sergot is a professor in the Computer Science Department at Imperial College London.)
- Keith Clark’s original paper “Negation as Failure”, first published in: Logic and Data Bases, (eds Gallaire and Minker), 1978, can be found at: <https://www.doc.ic.ac.uk/~klc/NegAsFailure.pdf>