

# Consequence-Finding

CS 157 Computational Logic

Lecture 18

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# Proof-finding vs. Consequence-finding

## Proof-finding:

Given premises and a goal, determine whether the premises entail the goal.

## Consequence-finding:

Given premises, find the sentences which the premises entail.

# Uses of Consequence-finding

Finding novel theorems

Knowledge Compilation

Predicting program behavior (specification generation)

Abduction

- Residues
- Diagnostics
- Requirements generation
- ...

...

# Abduction - Generating hypotheses

Given a set of premises  $\Sigma$  and a goal  $\varphi$ ,  
for which sentences  $\delta$  is it the case that  
 $\Sigma \cup \{\delta\} \models \varphi$  ?

Equivalently,  
for which sentences  $\delta$  is it the case that  
 $\Sigma \cup \{\sim\varphi\} \models \sim\delta$  and

We saw this in generating residues

# Consequence-finding

Given a set of sentence:

$$\{ p \mid q, \\ \sim q \}$$

find all consequences.

How many consequences are there?

Ans: **Infinitely many**

How many non-tautological consequences are there?

Ans: **Infinitely many**

# Consequence-finding: definition

Given a set of sentences  $\Sigma$ , normalized in clausal form, find a set of sentences  $\Pi$  such that:

$$\Sigma \models \Pi$$

for any clause  $c$  such that  $\Sigma \models c$  and  $c$  is not a tautology, there exists a clause  $d$  in  $\Pi$  such that  $d$  subsumes  $c$ .

We denote such a set  $\Pi$  as  $\text{Con}[\Sigma]$

Example:

For  $\Sigma = \{ p \mid q, \sim q \}$ , which sets qualify as  $\text{Con}[\Sigma]$ ?

$\{ p \mid q, \sim q \}$

$\{ p \mid q, \sim q, p \}$

$\{ p \mid q, \sim q, p, p \mid \sim q \}$

$\{ p \mid q, \sim q, p, q \}$

$\{ p, \sim q \}$

Example:

For  $\Sigma = \{ p(X) \mid q(X), \sim q(a) \}$ , which sets qualify as  $\text{Con}[\Sigma]$ ?

$\{ p(X) \mid q(X), \sim q(a) \}$

$\{ p(X) \mid q(X), p(a), \sim q(a) \}$

$\{ p(a), \sim q(a) \}$

$\{ p(X) \mid q(X), p(X), \sim q(a) \}$

# Finiteness

Given a finite set of clauses  $\Sigma$ , does there always a finite  $\text{Con}[\Sigma]$ ?

In propositional logic?

yes

# Finiteness

In first-order logic?

not always.

$\Sigma = \{ \sim p(X1,X2) \mid \sim p(X2,X3) \mid p(X1,X3) \}$   
(rule form:  $p(X1,X2) \ \& \ p(X2,X3) \Rightarrow p(X1,X3)$  )

$\text{Con}[\Sigma] = \{$   
 $\sim p(X1,X2) \mid \sim p(X2,X3) \mid p(X1,X3)$   
 $\sim p(X1,X2) \mid \sim p(X2,X3) \mid \sim p(X3,X4) \mid p(X1,X4)$   
 $\sim p(X1,X2) \mid \sim p(X2,X3) \mid \sim p(X3,X4) \mid \sim p(X4,X5) \mid p(X1,X5)$   
 $\dots \dots \}$

# Finiteness

Given an input  $\Sigma$ , if there is a finite set  $\text{Con}[\Sigma]$ , we expect to find that finite set as output.

If  $\text{Con}[\Sigma]$  cannot be finite, we may want to enumerate it.

# Method for consequence finding

Truth table?

Generate and test  
"min terms"

Karnaugh maps

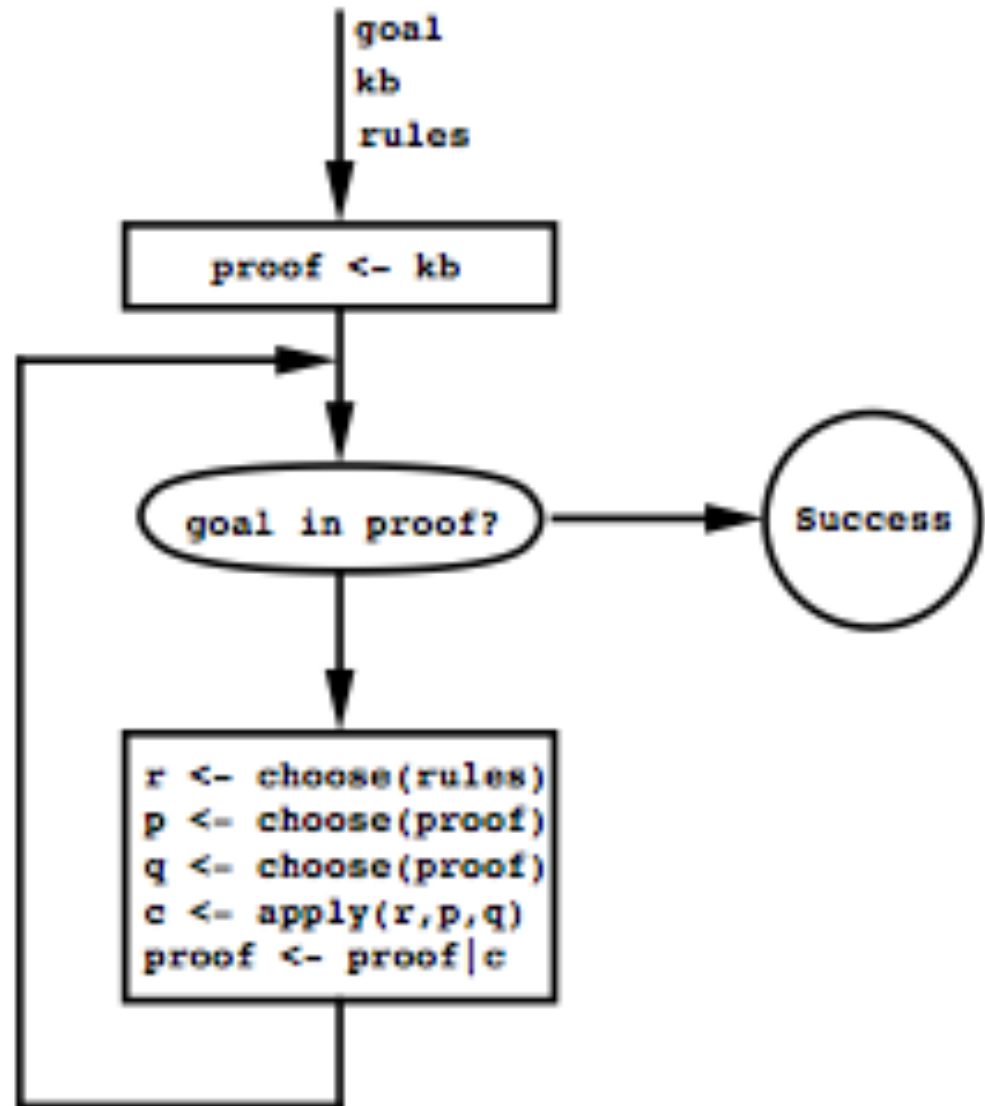
Does not work for FOL in general

# Method for consequence finding

Formal proofs?

Hard to mechanize

termination on  
finite  $\text{Con}[\Sigma]$ ?



# Method for consequence finding

Resolutions method?

Generate and test

How to systematically generate FOL clauses?

# Consequence-finding using resolution

$$\Sigma = \{ p \mid q, \sim q \}$$

$$1. \{ p, q \}$$

$$2. \{ \sim q \}$$

$$3. \{ p \}$$

Res 1,2

We write  $\Sigma \vdash_{\text{Res}}^* \varphi$  to denote that  $\varphi$  can be derived from  $\Sigma$  in a finite number of resolution steps.

And we write  $\text{Res}[\Sigma]$  to denote  $\{ \varphi : \Sigma \vdash_{\text{Res}}^* \varphi \}$ .

*Resolution closure*

# Consequence-finding using resolution

So what if we take  
 $\text{Res}[\Sigma]$  as  $\text{Con}[\Sigma]$ ?

The resolution rule of inference is sound.

So all derived clauses are sound consequences

But is it complete?

# Generative Incompleteness

Resolution is refutation complete:

If a set of sentences  $\Gamma$  is unsatisfiable,  $\Gamma \vdash_{\text{Res}}^* \{ \}$

Resolution principle is not generatively complete:

If  $\Gamma \models \varphi$ , it is not necessarily the case that  $\Gamma \vdash_{\text{Res}}^* \varphi$

# Completeness of Resolution for CF

## [Lee 1967]

unrestricted resolution is complete for consequence-finding:  
That is,  $\text{Res}[\Sigma]$  includes every formulae needed for  $\text{Con}[\Sigma]$ .

Given any set of clauses  $\Sigma$ ,  
 $\text{Res}[\Sigma]$  satisfies all the requirements to be  $\text{Con}[\Sigma]$ .

Notice that the resolution principle itself, used for proof finding by refutation, was introduced earlier [Robinson, 1965]

# Resolution Strategies?

In proof-finding, unrestricted resolution involves many redundant steps which may be optimized away using various resolution strategies.

Do the same strategies work for consequence-finding?

# Completeness of elimination strategies

Identical clause elimination

OK

Tautology elimination

OK

Subsumed clause elimination

OK

Pure literal elimination

NO

$\{p, \sim q\}$

$\{q, r\}$

# Completeness of restriction strategies

Set of Support

NO

Empty set of support:

1.  $\{p, q\}$  Background
2.  $\{\sim p\}$  Background

Missing  $\{q\}$

# Completeness of restriction strategies

Linear resolution (unordered)

OK [Minicozzi and Reiter, 1972]

semi-ordered resolution

NO [Minicozzi and Reiter, 1972]

$S = \{$   
 $\langle p, q \rangle$   
 $\langle p, \sim q \rangle$   
 $\}$

Missing:  $\{p\}$

# Skipping

Model elimination is not complete for consequence-finding = (

But variations based on skipping have been shown to be complete for consequence-finding:

1.  $\langle *p, q \rangle$  top clause
2.  $\langle p, *q \rangle$  skip p
3.  $\langle p, *p \rangle$  resolve against  $\langle p, \sim q \rangle$  on  $\sim q$

SOL-resolution [Inoue 1991]

SFK-resolution [del Val 1999]

# Conclusions for consequence-finding

Many applications require consequence-finding rather than simply proof-finding.

Some resolution strategies are sound and complete for consequence-finding.

Unfortunately, semi-ordered resolution is not complete for CF.

Some variations complete for CF at the cost of increased search space.

# Research questions

Targeted consequences:

Given a class of consequences  $Q$ , and set of clauses  $\Sigma$ , find  $\text{Con}[\Sigma] \cap Q$ .

Incremental computation:

Given  $\text{Con}[\Sigma]$  and a new clause  $c$ , find  $\text{Con}[\Sigma \cup \{c\}]$ .

Given  $\text{Con}[\Sigma]$  and a clause  $d$ , find  $\text{Con}[\Sigma - \{d\}]$ .

# References

[Inoue 1991] K. Inoue. Consequence-finding based on ordered linear resolution. IJCAI 1991.

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[del Val 1999] A. del Val. A new method for consequence finding and compilation in restricted languages. AAI 1999.

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[Lee 1967] Lee, C. 1967 *A Completeness Theorem and a Computer Program for Finding Theorems Derivable from Given Axioms*. Doctoral Thesis. UMI Order Number: AAI6810359., University of California, Berkeley.

[Minicozzi and Reiter, 1972] Eliana Minicozzi and Raymond Reiter. A note on linear resolution strategies in consequence-finding. *Artificial Intelligence*, 3: 175-180, 1972. [\[link\]](#)