

Declarative semantics for incomplete information: *completing incomplete programs*

semantics and proof theory for the not in a general clause will be discussed ~~later~~ NOW

problem

can no longer express

```
married(X); bachelor(X) :- man(X), adult(X).  
man(john). adult(john).
```

characteristic of indefinite clauses

which had two minimal models

```
{man(john), adult(john), married(john)}  
{man(john), adult(john), bachelor(john)}  
{man(john), adult(john), married(john), bachelor(john)}
```

definite clause containing not

general clauses

first model is minimal model of **general** clause

```
married(X) :- man(X), adult(X), not bachelor(X).
```

second model is minimal model of **general** clause

```
bachelor(X) :- man(X), adult(X), not married(X).
```

to prove that someone is a bachelor, prove that he is a man and an adult, and prove that he is not a bachelor

Declarative semantics for incomplete information: *completing incomplete programs*

A program P is "complete" if for every (ground) fact f ,
either $P \models f$ or $P \models \neg f$

unique
minimal
model



Transform an incomplete program into a complete one,
that captures the intended meaning of the original program.

possible transformations

closed world assumption



straightforward

ok for definite clauses
(without negation)

predicate completion



ok for general clauses
(with negation in body)

may lead to inconsistencies if
the program is not stratified

Completing incomplete programs: *closed world assumption*

everything that is not
known to be true,
must be false



motivation: in general, there are
more false statements that can be
made than true statements



do not say something is not true,
simply say nothing about it

Completing incomplete programs: *closed world assumption*

everything that is not
known to be true,
must be false

$$\text{CWA}(P) = P \cup \{:-A \mid A \in B_P \wedge P \not\models A\}$$

the clause "false :-A" is only true
under interpretations in which A
is false

CWA-complement of a program P (i.e., $\text{CWA}(P)-P$):
explicitly assume that every ground atom A that
does not follow from P is false

Completing incomplete programs: *closed world assumption - example*

P `likes(peter,S) :- student_of(S,peter).`
`student_of(paul,peter).`

only the black atoms are relevant for determining whether an interpretation is a model of every ground instance of every clause

B_P `{likes(peter,peter), likes(peter,paul),`
`likes(paul,peter), likes(paul,paul),`
`student_of(peter,peter), student_of(peter,paul),`
`student_of(paul,peter), student_of(paul,paul)}`

models `{student_of(paul,peter), likes(peter,paul)}`
`{student_of(paul,peter), likes(peter,paul), likes(peter,peter)}`
`{student_of(paul,peter), likes(peter,paul),`
`student_of(peter,peter), likes(peter,peter)}`
...

there are still 4 orange atoms remaining which can each be added (or not) freely to the above interpretations

in total: $3 * 2^4 = 48$ models for such a simple program!

P ⊨ A `likes(peter,paul)`
`student_of(paul,peter)`

Completing incomplete programs: *closed world assumption - example*

P likes(peter,S) :- student_of(S,peter).
student_of(paul,peter).

B_P {likes(peter,peter), likes(peter,paul),
likes(paul,peter), likes(paul,paul),
student_of(peter,peter), student_of(peter,paul),
student_of(paul,peter), student_of(paul,paul)}

P ⊨ A
likes(peter,paul)
student_of(paul,peter)

CWA(P) likes(peter,S) :- student_of(S,peter).
student_of(paul,peter).
:- student(paul,paul).
:- student(peter,paul).
:- student(peter,peter).
:- likes(paul,paul).
:- likes(paul,peter).
:- likes(peter,peter).

is a complete program:
every ground atom from B_P
is assigned true or false

has only 1 model: {student_of(paul,peter), likes(peter,paul)}
which is declared the intended model of the program
(also obtained as the intersection of all models)

Completing incomplete programs: *closed world assumption - inconsistency*

P `bird(tweety).`
`flies(X); abnormal(X) :- bird(X).`

when applied to indefinite and general clauses

B_P `{bird(tweety), abnormal(tweety), flies(tweety)}`

models

`{bird(tweety), flies(tweety)}`
`{bird(tweety), abnormal(tweety)}`
`{bird(tweety), abnormal(tweety), flies(tweety)}`

P ⊨ A `bird(tweety)`

CWA(P)

`bird(tweety).`
`flies(X); abnormal(X) :- bird(X).`
`:-abnormal(tweety).`
`:-flies(tweety)`

CWA(P) is inconsistent

no longer has a model because, in order for the second clause to be true under an interpretation, its head needs to be true given that its body is already true due to the first clause

Completing incomplete programs: *predicate completion - idea*

regard each clause as part of the complete definition of a predicate

turn implications (if) into equivalences (iff) by completing clauses (with their and-only-if part)



only clause defining likes/2:

```
P likes(peter,S) :- student(S,peter).
```

its completion:

```
 $\forall X \forall S \text{ likes}(X,S) \leftrightarrow X = \text{peter} \wedge \text{student}(S,\text{peter})$ 
```

in clausal form:

```
Comp(P) likes(peter,S) :- student(S,peter).  
X=peter :- likes(X,S).  
student(S,peter) :- likes(X,S)
```


Completing incomplete programs: *predicate completion - algorithm*

```
likes(peter,S) :- student_of(S,peter).  
student_of(paul,peter).
```

- 1 ensure each argument of each clause head is a distinct variable

add literals
Var=Term to body

```
likes(X,S) :- X=peter,student_of(S,peter).  
student_of(X,Y) :- X=paul,Y=peter
```

- 2 if there are several clauses for a predicate, combine them into a single formula

use disjunction in implication's body if there are multiple clauses for a predicate

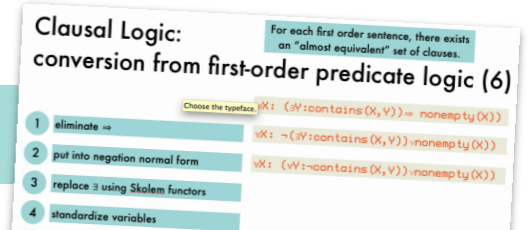
$$\forall X \forall Y \text{ likes}(X,Y) \leftarrow X=\text{peter} \wedge \text{student_of}(Y,\text{peter})$$
$$\forall X \forall Y \text{ student_of}(X,Y) \leftarrow X=\text{paul} \wedge Y=\text{peter}$$

- 3 turn the implication into an equivalence

$$\forall X \forall Y \text{ likes}(X,Y) \leftrightarrow X=\text{peter} \wedge \text{student_of}(Y,\text{peter})$$
$$\forall X \forall Y \text{ student_of}(X,Y) \leftrightarrow X=\text{paul} \wedge Y=\text{peter}$$

if a predicate without definition is used in a body (e.g. $p/1$), add $\forall X \neg p(X)$

- 4 convert to clausal form



Completing incomplete programs: *predicate completion - algorithm*

```
likes(peter,S) :- student_of(S,peter).
student_of(paul,peter).
```

3 turn the implication into an equivalence

$$\forall X \forall Y \text{ likes}(X,Y) \leftrightarrow X=\text{peter} \wedge \text{student_of}(Y,\text{peter})$$

$$\forall X \forall Y \text{ student_of}(X,Y) \leftrightarrow X=\text{paul} \wedge Y=\text{peter}$$

4 convert to clausal form

```
likes(peter,S) :- student_of(S,peter).
X=peter :- likes(X,S).
student_of(S,peter) :- likes(X,S).
student_of(paul,peter).
X=paul :- student_of(X,Y).
Y=peter :- student_of(X,Y).
```

if a predicate without definition is used in a body (e.g. p/1), add $\forall X \neg p(X)$

Clausal Logic: For each first order sentence, there exists an "almost equivalent" set of clauses.

conversion from first-order predicate logic (6)

Choose the typeface: $\forall X: (\exists Y: \text{contains}(X,Y)) \rightarrow \text{nonempty}(X)$

- eliminate \Rightarrow $\forall X: \neg(\exists Y: \text{contains}(X,Y)) \rightarrow \text{nonempty}(X)$
- put into negation normal form $\forall X: (\forall Y: \neg \text{contains}(X,Y)) \rightarrow \text{nonempty}(X)$
- replace \exists using Skolem functors
- standardize variables
- move \forall to the front $\forall X,Y: \neg \text{contains}(X,Y) \rightarrow \text{nonempty}(X)$
- convert to conjunctive normal form
- split the conjuncts in clauses
- convert to clausal syntax $\text{nonempty}(X) \leftarrow \text{contains}(X,Y)$

for definite clauses, CWA(P) and Comp(P) have same model

has the single model
{student_of(paul,peter), likes(peter,paul)}

Completing incomplete programs: *predicate completion - existential variables*

3 turn the implication into an equivalence

careful with variables in a body that do not occur in the head

if a predicate without definition is used in a body (e.g. $p/1$), add $\forall X \neg p(X)$

$ancestor(X, Y) :- parent(X, Y).$
 $ancestor(X, Y) :- parent(X, Z), ancestor(Z, Y).$

$\forall X \forall Y \ ancestor(X, Y) \leftrightarrow (parent(X, Y) \vee (\exists Z \ parent(X, Z) \wedge ancestor(Z, Y)))$

use second form because all clauses must have the same head

$\forall X \forall Y \forall Z \ ancestor(X, Y) \leftarrow parent(X, Z) \wedge ancestor(Z, Y)$
 $\forall X \forall Y \ ancestor(X, Y) \leftarrow \exists Z \ parent(X, Z) \wedge ancestor(Z, Y)$

$\forall Z: q \leftarrow p(Z)$
 $\forall Z: q \vee \neg p(Z)$
 $q \vee \forall Z: \neg p(Z)$
 $q \vee \exists Z: p(Z)$

Completing incomplete programs: *predicate completion - existential variables*

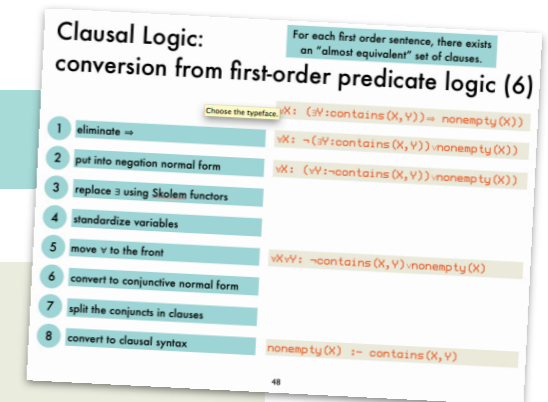
3 turn the implication into an equivalence

$$\forall X \forall Y \text{ ancestor}(X, Y) \leftrightarrow (\text{parent}(X, Y) \vee (\exists Z \text{ parent}(X, Z) \wedge \text{ancestor}(Z, Y)))$$

4 convert to clausal form

```
ancestor(X, Y) :- parent(X, Y).  
ancestor(X, Y) :- parent(X, Z), ancestor(Z, Y).  
parent(X, Y); parent(X, pa(X, Y)) :- ancestor(X, Y).  
parent(X, Y); ancestor(pa(X, Y), Y) :- ancestor(X, Y).
```

Skolem functor
 $\forall X \exists Y : \text{loves}(X, Y)$
 $\forall X : \text{loves}(X, \text{person_loved_by}(X))$



Completing incomplete programs: *predicate completion - negation*

```
bird(tweety).  
flies(X):-bird(X),not(abnormal(X)).
```

- 1 ensure each argument of each clause head is a distinct variable

```
bird(X):-X=tweety.  
flies(X):-bird(X),not(abnormal(X)).
```

- 2 if there are several clauses for a predicate,
combine them into a single formula

```
 $\forall X \text{ bird}(X) \leftarrow X=\text{tweety}.$   
 $\forall X \text{ flies}(X) \leftarrow \text{bird}(X) \wedge \neg \text{abnormal}(X)$ 
```

- 3 turn the implication into an equivalence

```
 $\forall X \text{ bird}(X) \leftrightarrow X=\text{tweety}.$   
 $\forall X \text{ flies}(X) \leftrightarrow \text{bird}(X) \wedge \neg \text{abnormal}(X).$   
 $\forall X \neg \text{abnormal}(X)$ 
```

if a predicate without
definition is used in a
body (e.g. $p/1$),
add $\forall X \neg p(X)$

Completing incomplete programs: *predicate completion - negation*

```
bird(tweety).  
flies(X):-bird(X),not(abnormal(X)).
```

3 turn the implication into an equivalence

$$\forall X \text{ bird}(X) \leftrightarrow X = \text{tweety}.$$
$$\forall X \text{ flies}(X) \leftrightarrow \text{bird}(X) \wedge \neg \text{abnormal}(X).$$
$$\forall X \neg \text{abnormal}(X)$$

4 convert to clausal form

```
bird(tweety).  
X=tweety:-bird(X).  
flies(X);abnormal(X):-bird(X).  
bird(X):-flies(X).  
:-flies(X),abnormal(X).  
:-abnormal(X).
```

if a predicate without definition is used in a body (e.g. $p/1$), add $\forall X \neg p(X)$

Clausal Logic: conversion from first-order predicate logic (6)

For each first order sentence, there exists an "almost equivalent" set of clauses.

Choose the typeface: $\forall X: (\exists Y: \text{contains}(X, Y)) \Rightarrow \text{nonempty}(X)$

- 1 eliminate \Rightarrow $\forall X: \neg(\exists Y: \text{contains}(X, Y)) \vee \text{nonempty}(X)$
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- 3 replace \exists using Skolem functors
- 4 standardize variables
- 5 move \forall to the front $\forall X \forall Y: \neg \text{contains}(X, Y) \vee \text{nonempty}(X)$
- 6 convert to conjunctive normal form
- 7 split the conjuncts in clauses
- 8 convert to clausal syntax $\text{nonempty}(X) \text{ :- contains}(X, Y)$

has the single model
 $\{\text{bird}(\text{tweety}), \text{flies}(\text{tweety})\}$

Completing incomplete programs: *predicate completion - inconsistency*

Comp(P) is inconsistent for certain **unstratified** P

```
wise(X):-not(teacher(X)).  
teacher(peter):-wise(peter).
```

3 turn the implication into an equivalence

$$\forall X \text{ wise}(X) \leftrightarrow \neg \text{teacher}(X)$$
$$\forall X \text{ teacher}(X) \leftrightarrow X = \text{peter} \wedge \text{wise}(\text{peter})$$

4 convert to clausal form

```
wise(X); teacher(X).  
:-wise(X), teacher(X).  
teacher(peter):-wise(peter).  
X=peter:-teacher(X).  
wise(peter):-teacher(X).
```

if a predicate without definition is used in a body (e.g. p/1), add $\forall X \neg p(X)$

Clausal Logic: For each first order sentence, there exists an "almost equivalent" set of clauses.

Choose the typeface: $X: (\forall Y: \text{contains}(X, Y)) \Rightarrow \text{nonempty}(X)$

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- 7 split the conjuncts in clauses
- 8 convert to clausal syntax $\text{nonempty}(X) \text{ :- contains}(X, Y)$

inconsistent!

Completing incomplete programs: *stratified programs*

if P is stratified then
 $\text{Comp}(P)$ is consistent

sufficient but not necessary:
there are non-stratified P 's for
which $\text{Comp}(P)$ is consistent



organize the program in layers (strata);
do not allow the programmer to negate a predicate
that is not yet completely defined (in a lower stratum)

A program P is stratified if its predicate symbols can be partitioned into disjoint sets S_0, \dots, S_n
such that for each clause $p(\dots) \leftarrow L_1, \dots, L_i$ where $p \in S_k$, any literal L_j is such that
if $L_j = q(\dots)$ then $q \in S_0 \cup \dots \cup S_k$
if $L_j = \neg q(\dots)$ then $q \in S_0 \cup \dots \cup S_{k-1}$

Completing incomplete programs: *soundness result for SLDNF-resolution*

$$P \vdash_{\text{SLDNF}} q \Rightarrow \text{Comp}(P) \vDash q$$

completeness result only holds for a subclass of programs