Handling Negation in General Deductive Databases: A Program Transformation Method

Weiling Li, Komal Khabya, Ming Fang and Raj Sunderraman

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# Handling Negation in General Deductive Databases: A Program Transformation Method

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# Outline

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## Introduction

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• General deductive databases contain rules with arbitrary negation (negation-recursion) in their bodies.

```
move(1,2).
move(2,3).
move(3,2).
move(1,4).
win(X) :- move(X,Y), not win(Y).
```

- Two popular semantics
  - 3-valued well-founded models
  - 2-valued stable models
- We present a program transformation approach to compute (weak) well-founded model
- Our transformed program eliminates the complex "negation-recursion"
- We then use the (weak) well-founded model as a starting point to compute stable models

## Some Deductive Database Terminology

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- A term is either a variable or a constant.
- An *atom* is of the form  $p(t_1, ..., t_n)$  where p is a predicate symbol and the  $t_i$ 's are terms.
- A *literal* is either a *positive literal* A or a *negative literal* ¬A, where A is an atom.

## Definition

A general deductive database is a finite set of clauses of the form:  $a \leftarrow l_1, l_2, \ldots, l_m$ .

# Terminology continued...

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- A term, atom, literal, or clause is called *ground* if it contains no variables.
- A ground instance of a term, atom, literal, or clause Q is the term, atom, literal, or clause, respectively, obtained by replacing each variable in Q by a constant.
- *P*<sup>\*</sup> denotes the set of all ground instances of clauses of general deductive database *P*.
- The *Herbrand Base* of database *P* is the set of all ground atoms.
- Any subset of the Herbrand Base is termed a *Herbrand interpretation* (atoms in the interpretation are assumed to be true and those outside the interpretation are assumed to be false).
- A Herbrand interpretation is a *model* of the database if all the facts and rules evaluate to true in the interpretation.
- A model is a *minimal model* if none of its proper subsets is a model.

# The (weak) well-founded semantics (Fitting model)

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- Fitting introduced a semantics for general deductive databases (also called the **weak well-founded semantics**)
- The Fitting semantics is a three-valued semantics
- Fitting was the first to define a semantics that assigned a unique least (partial) model to general deductive databases
- The Fitting semantics is based on partial interpretations

## Definition

A partial interpretation is a pair  $I = \langle I^+, I^- \rangle$ , where  $I^+$  and  $I^-$  are any subsets of the Herbrand base.

# The Fitting Model

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### Definition

Let *I* be a partial interpretation and *P* be a general dedcutive database. Then  $T_P^F(I)$  is the partial interpretation given by

 $T_{P}^{F}(I)^{+} = \{a \mid \text{ for some clause } a \leftarrow l_{1}, l_{2}, \dots, l_{m} \in P^{*}, \text{ for each} \\ 1 \leq i \leq m \\ \text{ if } l_{i} \text{ is positive } l_{i} \in I^{+} \text{ and,} \\ \text{ if } l_{i} \text{ is negative } l_{i}^{\prime} \in I^{-} \} \\ T_{P}^{F}(I)^{-} = \{a \mid \text{ for every clause } a \leftarrow l_{1}, l_{2}, \dots, l_{m} \in P^{*}, \text{ there is some} \\ 1 \leq i \leq m \\ \text{ if } l_{i} \text{ is positive } l_{i} \in I^{-} \text{ and,} \\ \text{ if } l_{i} \text{ is negative } l_{i}^{\prime} \in I^{+} \} \\ \text{where } l_{i}^{\prime} \text{ is the complement of the literal } l_{i}.$ 

The least fixed point (lfp) of the above operator is the meaning of P.

## Example: Fitting model

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Let P be the following general deductive database:

```
move(1,2).
move(2,3).
move(3,2).
move(1,4).
win(X) :- move(X,Y), not win(Y).
```

We start with the empty partial interpretation:  $\langle \emptyset, \emptyset \rangle$ . Then,

Iteration	<i>I</i> <sup>+</sup>	1-
1	move(1,2), move(2,3), move(3,2), move(1,4)	move(1,1), move(1,3), move(2,1), move(2,2), move(2,4), move(3,1) move(3,3), move(3,4), move(4,1) move(4,2), move(4,3), move(4,4)
2		win(4)
3	win(1)	

Note that in the Fitting model the atom win(1) is *true* and the atom win(4) is *false*. No truth value is assigned to the atom win(2) and win(3).

# Stable Model Semantics

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- The stable model semantics is a two-valued model for general deductive databases.
- In general, there can be more than one stable model for a given general deductive database.
- Stable models have applications in database repairs as well as search problems.

## Definition

For any set S of atoms from the Herbrand base of a general deductive database P, let  $P^S$  be the program obtained from  $P^*$  by deleting:

- **()** each rule with a negative literal **not**  $B_i$  in body with  $B_i \in S$ , and
- **2** all negative literals from bodies of remaining rules.

If S is a minimal model of  $P^S$ , then S is a <u>stable</u> model of P.

## Example : Stable models

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### Consider program *P*:

```
p(1,2).
q(x) :- p(x,y), not q(y).
```

The set of constants (Herbrand Universe) is

```
{1,2}
```

The set of ground atoms (Herbrand Base) is

```
{q(1), q(2), p(1,1), p(1,2), p(2,1), p(2,2)}.
```

The following is  $P^*$ , the ground instances of the rules of P:

```
p(1,2).
q(1) :- p(1,1), not q(1).
q(1) :- p(1,2), not q(2).
q(2) :- p(2,1), not q(1).
q(2) :- p(2,2), not q(2).
```

## Stable Models Example continued...

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et 
$$S_1 = \{p(1,2),q(2)\}$$
. Then  $P^{S_1}$ :  
 $p(1,2)$ .  
 $q(1) := p(1,1), \text{ not } q(1)$ .  
 $q(1) := p(1,2), \text{ not } q(2)$ .  
 $q(2) := p(2,1), \text{ not } q(1)$ .  
 $q(2) := p(2,2), \text{ not } q(2)$ .

The minimal Herbrand model of this program is  $\{p(1,2)\}$ , which is different from  $S_1$ ; thus  $S_1$  is <u>not stable</u>.

```
Let S_2 = \{p(1,2),q(1)\}. In this case, P^{S_1} is

p(1,2).

q(1) := p(1,2).

q(2) := p(2,2).
```

The minimal Herbrand model of this program is  $\{p(1,2), q(1)\}$ , i.e.,  $S_2$ . Hence  $S_2$  is <u>stable</u>.

## Stable Models - win example

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```
move(1,2).
move(2,3).
move(3,2).
move(1,4).
win(X) :- move(X,Y), not win(Y).
```

has 2 stable models:

The win-program:

$$\begin{split} S_1 &= \{ \text{move(1,2),move(2,3),move(3,2),move(1,4),} \\ & \text{win(1),win(2)} \} \end{split}$$

$$S_2 = \{ move(1,2), move(2,3), move(3,2), move(1,4), win(1), win(3) \}$$

Note: In the Fitting model, win(2) and win(3) both were declared to be "unknown".

# **Program Transformation**

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- For each predicate p of P, we introduce two predicates pplus and pminus in the transformed general deductive database tr(P).
- Transformation proceeds in 4 steps.

## Example

```
%% Extensional Database
t0(1).
g(1,2,3).
g(2,5,4).
g(2,4,5).
g(5,3,6).
%% Intensional Database
t(Z) :- t0(Z). %% rule 1
t(Z) :- g(X,Y,Z), t(X). %% rule 2
t(Z) :- g(X,Y,Z), not t(Y). %% rule 3
```

# Transformation Algorithm

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STABLE MODEL COMPUTATION EXPERIMENTS CONCLUSION **Step 1: Domain Predicate:** Introduce a unique unary predicate dom. For each constant symbol, a, present in P, output the fact: dom(a).

Example		
dom(1). dom(2). dom(3). dom(4). dom(5).		

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## Step 2: Extensional Database:

For each fact p(a1, ..., an) in the extensional database, output the fact:

```
pplus(a1,...,an).
```

For each predicate p with arity k in the extensional database, output the rule:

```
pminus(X1,...,Xk) := dom(X1),...,dom(Xk), not
pplus(X1,...,Xk).
```

## Example

```
t0plus(1).
t0minus(X) :- dom(X), not t0plus(X).
gplus(1,2,3).
gplus(2,5,4).
gplus(2,4,5).
gplus(5,3,6).
gminus(X,Y,Z) :- dom(X),dom(Y),dom(Z), not
gplus(X,Y,Z).
```

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## Step 3: Intensional Database:

Consider a rule of the form:

```
p(W1,...,Wl) :- q1(X1),..., qn(Xn), not
r1(Y1),..., not rm(Ym).
```

For each such rule, perform Steps 3a and 3b.

```
Step 3a. Output "plus" rule:
Output the following rule for pplus:
    pplus(W1,...,Wl) :- q1plus(X1),...,qnplus(Xn),
```

```
r1minus(Y1),...,rmminus(Ym).
```

## Example

```
tplus(Z) :- t0plus(Z).
tplus(Z) :- gplus(X,Y,Z), tplus(X).
tplus(Z) :- gplus(X,Y,Z), tminus(Y).
```

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```
Step 3b. Output temporary "minus" rules (j: rule number in P)
Step 3b-1:
For each positive subgoal in rule, qi(Xi), output:
    temp_p_j(V1,...,Vk) :- dom(U1),..., dom(Ua),
    qiminus(Xi).
Step 3b-2:
For each negative subgoal in rule, not ri(Yi), output:
    temp_p_j(V1,...,Vk) :- dom(U1),..., dom(Ua),
    riplus(Yi).
```

Note: V1,...,Vk are variables in body and U1,...Ua are variables present in the body that are not present in the subgoal. Step 3b-3:

Output the following two rules:

```
temp_p_j_2(W1,...,Wl) := dom(V1),..., dom(Vk),
    not temp_p_j(V1,...,Vk).
pminus_j(W1,...,Wl) := dom(W1),..., dom(Wl), not
    temp_p_j_2(W1,...,Wl).
```

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## Example

```
\% rule 1: t(Z) :- t0(Z).
temp_t_1(Z) := tOminus(Z).
temp_t_1_2(Z) := dom(Z), not temp_t_1(Z).
tminus_1(Z) := dom(Z), not temp_t_1_2(Z).
%% rule 2: t(Z) :- g(X,Y,Z), t(X).
temp_t_2(X,Y,Z) := gminus(X,Y,Z).
temp_t_2(X,Y,Z) := dom(Y), dom(Z), tminus(X).
temp_t_2(Z) := dom(X), dom(Y), dom(Z), not
  temp_t_2(X,Y,Z).
tminus_2(Z) := dom(Z), not temp_t_2(Z).
%% rule 3: t(Z) :- g(X,Y,Z), not t(Y).
temp_t_3(X,Y,Z) := gminus(X,Y,Z).
temp_t_3(X,Y,Z) := dom(X), dom(Z), tplus(Y).
temp_t_3_2(Z) := dom(X), dom(Y), dom(Z), not
  temp_t_3(X,Y,Z).
tminus_3(Z) := dom(Z), not temp_t_3_2(Z).
```

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## Step 4. Output "minus" rules:

For each IDB predicate p defined in rules numbered i1,...,in, output the following rule:

```
pminus(W1,...,Wl) :- dom(W1),...,dom(Wl),
    pminus_i1(W1,...,Wl),...,
    pminus_in(W1,...,Wl).
```

Example

```
tminus(Z) :- dom(Z), tminus_1(Z), tminus_2(Z),
tminus_3(Z).
```

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STABLE MODEL COMPUTATION EXPERIMENTS CONCLUSION • A bottom-up evaluation of the output program produces:
 { tplus(1), tplus(3), tminus(2) }

 We introduce unknown values via rules of the form: punknown(X1,...,Xk) :- dom(X1),..., dom(Xk), not pplus(X1,...,Xk), not pminus(X1,...,Xk).

for each IDB predicate.

- For the example, the following "unknown" rule is generated: tunknown(Z) :- dom(Z), not tplus(Z), not tminus(Z).
  - A bottom-up evaluation of the output program produces:
     { tunknown(4), tunknown(5), tunknown(6) }

# Correctness of Algorithm

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### Theorem

Let P be a general deductive database and let tr(P) be the output of the transformation algorithm. Then,

- tr(P) has a complete well-founded model.
- p(a1,..., an) belongs to the positive component of the Fitting model of P if and only if pplus(a1,..., an) belongs to the well-founded model of tr(P).
- p(a1,...,an) belongs to the negative component of the Fitting model of P if and only if pminus(a1,...,an) belongs to the well-founded model of tr(P).

## Computing Stable Models: Naive approach



# Computing Stable Models: Our approach



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## • Database with varying EDBs:

```
%%generate EDB facts of t0
%%generate EDB facts of g
t(Z) :- t0(Z).
t(Z) :- g(X,Y,Z), t(X).
t(Z) :- g(X,Y,Z), not t(Y).
```

- Facts in the EDB are randomly generated from constant values.
- We vary the following parameters:
  - number of constants (#constants).
  - size of EDB (#facts = number of t0\_facts + number of g facts).
- The above two parameters can be used as measures of "problem size" in graph problems; e.g. constants = nodes, facts = edges; node(1), node(2),... edge(1,2), edge(1,3),...

## Experiments continued...

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- Intelligent Grounding: technique used to reduce size of ground program
  - 2 versions of our approach:
    - V1.0 without intelligent grounding
    - V1.1 with intelligent grounding

## Experiment 1

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Vary the number of constants present in the program (with fixed size of EDB).



Figure: Vary number of constants

## Experiment 2

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## Vary the size of EDB (with fixed number of constants).



Figure: Vary number of facts

# **Concluding Remarks**

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- Program transformation method introduced to compute well-founded model
- Transformed program has many desirable properties including the amenability to traditional bottom-up computation.
- Future Work:
  - Compare with "alternating fixed point" and other approaches to compute stable models.
  - Program transformation to detect "positive loops" to compute well-founded model
  - Applications graph problems