



Negation and Datalog

In some cases, mixing recursion and negation leads to ambiguous Datalog programs.

Consider program P

```
Avail(jenny, 2pm).
```

```
Teach(I, T) :- Avail(I, T), ¬Advise(I, T).
```

```
Advise(I, T) :- Avail(I, T), ¬Teach(I, T).
```

If we start with the one fact and apply I_p , we get
 $M =$

```
Avail(jenny, 2p).
```

```
Teach(jenny, 2p).
```

```
Advise(jenny, 2p).
```

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Problem

Model M is not minimal. Here are two smaller models

$M1 =$

```
Avail(jenny, 2p)
```

```
Teach(jenny, 2p)
```

$M2 =$

```
Avail(jenny, 2p).
```

```
Advise(jenny, 2p).
```

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If We Have Recursion and Negation

1. Intersection of models might not be a model
 $M1 \cap M2 = M3 \quad \{Avail(jenny, 2p) .\}$
2. Minimal model might not be unique
See M1 and M2
3. I_p is not necessarily monotone ($I_p(f) \subseteq f$)
 $I_p(M) = M3$ and $M \not\subseteq M3$

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Negative Cycles

The problem here is we have a recursive loop that has a negative dependency

Avail

Teach Advise

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Not All Negation is Bad

Recursive programs without negative cycles are relatively well behaved

- Can define a model that is preferable to others
- Can compute this model in a way similar to Naïve evaluation

A program without negative cycles can be stratified.

- Predicates are partitioned into *strata*
- If predicate p depends negatively on predicate q , then q is in a lower stratum.



Example

`Flight(A1, A2, C)` . There is a flight from airport A1 to Airport A2 with cost C .

```
Route(A1, A2, C, 1) :- Flight(A1, A2, C).
Route(A1, A2, C, S) :- Flight(A1, A3, C1),
    Route(A3, A2, C2, S2), Sum(C1, C2, C),
    Sum(S2, 1, S), ¬Same(A1, A2), LessEq(S, 5).
```

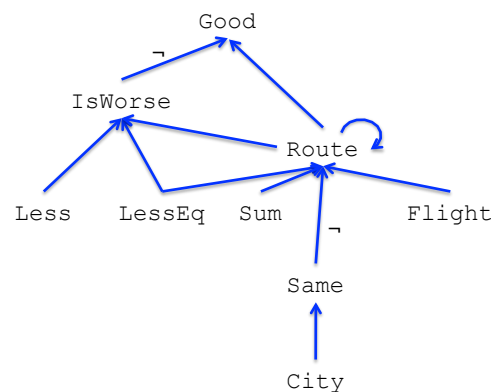
```
Same(C, C) :- City(C).
```

```
IsWorse(A1, A2, C, S) :- Route(A1, A2, C, S),
    Route(A1, A2, C1, S1), Less(C1, C), LessEq(S1, S).
IsWorse(A1, A2, C, S) :- Route(A1, A2, C, S),
    Route(A1, A2, C1, S1), LessEq(C1, C), Less(S1, S).
```

```
Good(A1, A2, C, S) :- Route(A1, A2, C, S),
    ¬IsWorse(A1, A2, C, S).
```



One Stratification for the Example



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More Precisely

Given Datalog program P , a stratification of P is an assignment of an integer *stratum* to each predicate p in P such that

- If there is a clause

$$h(\dots) \text{ :- } \dots, q(\dots), \dots$$
then $\text{stratum}(h) \geq \text{stratum}(q)$
- If there is a clause

$$h(\dots) \text{ :- } \dots, \neg q(\dots), \dots$$
then $\text{stratum}(h) > \text{stratum}(q)$

P is *stratifiable* if P has a stratification.

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Stratification Partitions the Rules

Can think of a stratification dividing the clauses in P into

$P_1, P_2, \dots, P_k$

where

$h(\dots) :- L_1, L_2, \dots, L_m.$

is in P_i if $\text{stratum}(h) = i.$



Stratified Evaluation

Stratified($P_1, P_2, \dots, P_k, g$)

$M = \emptyset$

for $i = 1 \dots k$

$M = \text{Naïve}(P_i \cup M)$

return $\text{match}(M, g)$



Example

Consider the following facts for our program

```
City(pdx).      Flight(sea, sfo, 500).  
City(sfo).      Flight(sea, pdx, 200).  
City(sea).      Flight(pdx, sfo, 180).  
City(eug).      Flight(sea, eug, 280).  
                Flight(eug, sfo, 250).
```



Stratum 1

Will do Naïve on City, Same.

```
City(pdx).  
City(sfo).  
City(sea).  
City(eug).  
  
Same(pdx, pdx).  
Same(sfo, sfo).  
Same(sea, sea).  
Same(eug, eug).
```



Stratum 2 (additional facts)

Add Flight, Route, IsWorse and computable

```
Flight(sea, sfo, 500). IsWorse(sea, sfo, 530, 2).  
Flight(sea, pdx, 200).  
Flight(pdx, sfo, 180).  
Flight(sea, eug, 280).  
Flight(eug, sfo, 250).  
Route(sea, sfo, 500, 1).  
Route(sea, pdx, 200, 1).  
Route(pdx, sfo, 180, 1).  
Route(sea, eug, 280, 1).  
Route(eug, sfo, 250, 1).  
Route(sea, sfo, 380, 2).  
Route(sea, sfo, 530, 2).
```

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Stratum 3 (additional facts)

Add Good

```
Good(sea, sfo, 500, 1).  
Good(sea, pdx, 200, 1).  
Good(pdx, sfo, 180, 1).  
Good(sea, eug, 280, 1).  
Good(eug, sfo, 250, 1).  
Good(sea, sfo, 380, 2).
```

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What if We Expand Stratum 1?

```
City(pdx) .  
City(sfo) .  
City(sea) .  
City(eug) .  
  
Same(pdx, pdx) .  
Same(sfo, sfo) .  
Same(sea, sea) .  
Same(eug, eug) .  
Same(sea, sfo) .
```



Stratum 2 Gets Smaller

```
Flight(sea, sfo, 500) . IsWorse(sea, sfo, 530, 2) .  
Flight(sea, pdx, 200) .  
Flight(pdx, sfo, 180) .  
Flight(sea, eug, 280) .  
Flight(eug, sfo, 250) .  
Route(sea, sfo, 500, 1) .  
Route(sea, pdx, 200, 1) .  
Route(pdx, sfo, 180, 1) .  
Route(sea, eug, 280, 1) .  
Route(eug, sfo, 250, 1) .  
Route(sea, sfo, 380, 2) .  
Route(sea, sfo, 530, 2) .
```




As Does Stratum 3

Add Good

```
Good(sea, sfo, 500, 1).
Good(sea, pdx, 200, 1).
Good(pdx, sfo, 180, 1).
Good(sea, eug, 280, 1).
Good(eug, sfo, 250, 1).
Good(sea, sfo, 380, 2).
```

Both these models are minimal, but intuitively, we prefer the one that makes fewer things true at the lower stratum



Stratify the Model

First of these models is the *perfect* model.

Assume a model M for $P =$

$P_1, P_2, \dots, P_k$

is stratified the same way

$M_1, M_2, \dots, M_k$

That is, M_i contains the facts for predicates defined in P_i .



Perfect Model

$M = M_1, M_2, \dots, M_k$ is a *perfect model* for P if for any other model $N = N_1, N_2, \dots, N_k$

1. $M_1 \subseteq N_1$
2. If $M_1 = N_1, M_2 = N_2, \dots, M_{i-1} = N_{i-1}$ then $M_i \subseteq N_i$

M is minimal at each stratum relative to the strata below.

For a stratifiable program P , there is a unique perfect model and that model is minimal.