

☞ Default rules are typically true, but may have exceptions

```
default((flies(X):-bird(X))).
```

Birds **typically** fly

```
rule((not flies(X):-penguin(X))).
```

Penguins don't fly

```
rule((bird(X):-penguin(X))).
```

Penguins are birds

```
rule((penguin(tweety):-true)).
```

Tweety is a penguin

```
rule((bird(opus):-true)).
```

Opus is a bird

```
explain(true,E,E):-!.
explain((A,B),E0,E):-!,
    explain(A,E0,E1),
    explain(B,E1,E).
explain(A,E0,E):-
    prove_e(A,E0,E).                % explain by rules only
explain(A,E0,[default((A:-B))|E]):-
    default((A:-B)),                % explain by default
    explain(B,E0,E),
    not contradiction(A,E).        % A consistent with E

contradiction(not A,E):-!,
    prove_e(A,E,_).
contradiction(A,E):-
    prove_e(not A,E,_).
```

Meta-interpreter for default rules

```
default(mammals_dont_fly(X),      (not flies(X):-mammal(X))).
default(bats_fly(X),              (flies(X):-bat(X))).
default(dead_things_dont_fly(X), (not flies(X):-dead(X))).

rule((mammal(X):-bat(X))).
rule((bat(dracula):-true)).
rule((dead(dracula):-true)).

% Cancellation rules:

% bats are flying mammals
rule((not mammals_dont_fly(X):-bat(X))).

% dead bats don't fly
rule((not bats_fly(X):-dead(X))).
```

Does Dracula fly or not?

```
explain(true,E,E):-!.
explain((A,B),E0,E):-!,
    explain(A,E0,E1),
    explain(B,E1,E).
explain(A,E0,E):-
    prove_e(A,E0,E).           % explain by rules only
explain(A,E0,[default(Name)|E]):-
    default(Name,(A:-B)),      % explain by default rule
    explain(B,E0,E),
    not contradiction(Name,E), % default should be applicable
    not contradiction(A,E).    % A should be consistent with E
```

Extended meta-interpreter for named defaults

```
default(mammals_dont_fly(X),(not flies(X):-mammal(X))).
default(bats_fly(X),(flies(X):-bat(X))).
default(dead_things_dont_fly(X),(not flies(X):-dead(X))).
rule((mammal(X):-bat(X))).
rule((bat(dracula):-true)).
rule((dead(dracula):-true)).
rule((not mammals_dont_fly(X):-bat(X))).
rule((not bats_fly(X):-dead(X))).
```

```
?-explain(flies(dracula),[],E).
```

No

```
?-explain(not flies(dracula),[],E).
```

```
E = [ default(dead_things_dont_fly(dracula)),
      rule((dead(dracula):-true)) ]
```

Dracula doesn't fly after all

- ➡ For each **default name**, introduce a **predicate introducing the opposite** ('abnormality predicate')

`bats_fly(X)` becomes `nonflying_bat(X)`

- ➡ Add this predicate as a **negative condition**

```
default(bats_fly(X), (flies(X) :- bat(X)))
```

becomes

```
flies(X) :- bat(X), not nonflying_bat(X)
```

- ➡ Introduce **new predicate** for negated conclusions

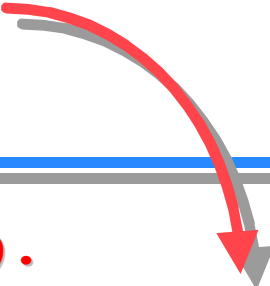
```
default(dead_things_don't_fly(X), (not flies(X) :- dead(X)))
```

becomes

```
notflies(X) :- dead(X), not flying_deadthing(X)
```

Defaults using negation as failure

```
default(mammals_dont_fly(X),(not flies(X):-mammal(X))).
default(bats_fly(X),(flies(X):-bat(X))).
default(dead_things_dont_fly(X),(not flies(X):-dead(X))).
rule((mammal(X):-bat(X))).
rule((bat(dracula):-true))).
rule((dead(dracula):-true))).
rule((not mammals_dont_fly(X):-bat(X))).
rule((not bats_fly(X):-dead(X))).
```



```
notflies(X):-mammal(X),not flying_mammal(X).
flies(X):-bat(X),not nonflying_bat(X).
notflies(X):-dead(X),not flying_deadthing(X).
```

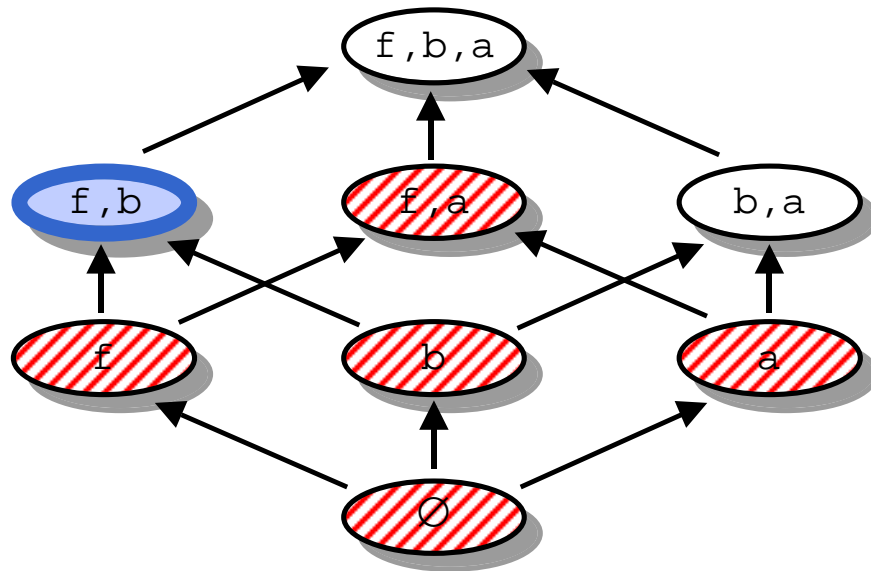
```
mammal(X):-bat(X).
bat(dracula).
dead(dracula).
```

```
flying_mammal(X):-bat(X).
nonflying_bat(X):-dead(X).
```

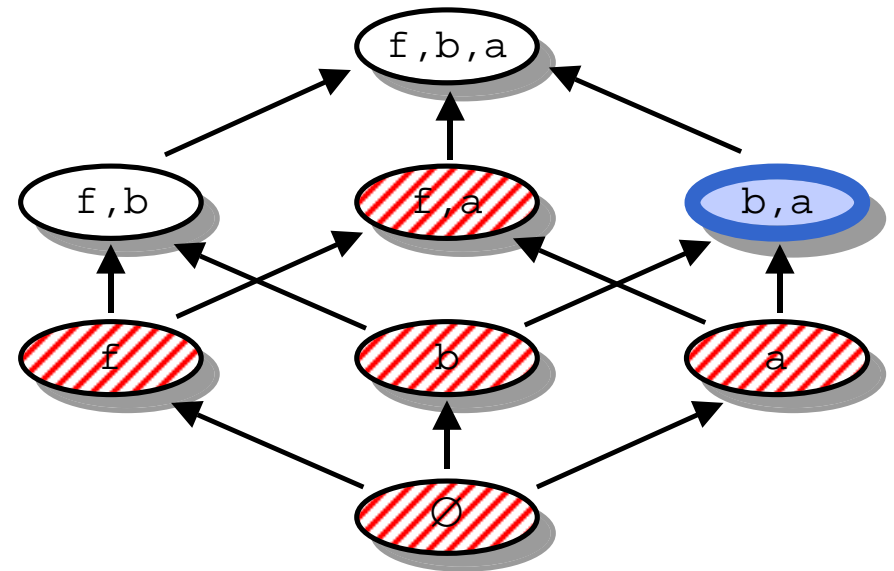
Dracula again

- ☞ Incompleteness arises when assumptions regarding a domain are not explicitly represented in a logic program *P*.
- ☞ There are several ways to make these assumptions explicit:
 - ✓ by selecting one of the models of *P* as the *intended model*
 - ✓ by transforming *P* into the *intended program*
 - Closed World Assumption
 - Predicate Completion
- ☞ New information can invalidate previous conclusions if they were based on assumptions
 - ✓ non-monotonic reasoning


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



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



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

Selecting an intended model

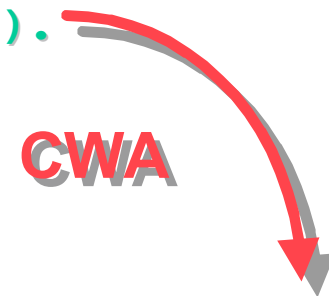
$CWA(P) = P \cup \{ :-A \mid A \in \text{Herbrand base, } A \text{ is not a logical consequence of } P \}$

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



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

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



```
:-student_of(paul,paul).
:-student_of(peter,paul).
:-student_of(peter,peter).
[Redacted]
:-likes(peter,peter).
```

- ☞ Step 1: rewrite clauses such that the head contains only distinct variables, by adding literals **Var=Term** to the body
- ☞ Step 2: for each head predicate, **combine its clauses** into a single universally quantified implication with disjunctive body
 - ✓ take care of existential variables
- ☞ Step 3: turn all implications into **equivalences**
 - ✓ undefined predicates p are rewritten to $\forall x: \neg p(x)$
- ☞ (Step 4: rewrite as **general clauses**)

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

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

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

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

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

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

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).

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

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

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

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

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) .

Completion with existential variables

bird(tweety).

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

bird(X):-X=tweety.

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

$\forall X:\text{bird}(X) \leftarrow X=\text{tweety}$

$\forall X:\text{flies}(X) \leftarrow (\text{bird}(X) \wedge \neg\text{abnormal}(X))$

$\forall X:\text{bird}(X) \leftrightarrow X=\text{tweety}$

$\forall X:\text{flies}(X) \leftrightarrow (\text{bird}(X) \wedge \neg\text{abnormal}(X))$

$\forall X:\neg\text{abnormal}(X)$

bird(tweety).

X=tweety:-bird(X).

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

bird(X):-flies(X).

:-flies(X),abnormal(X).

:-abnormal(X).

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

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

```
∀X:wise(X) ← ¬teacher(X)
∀X:teacher(X) ← ( X=peter ∧ wise(peter) )
```

```
∀X:wise(X) ↔ ¬teacher(X)
∀X:teacher(X) ↔ ( X=peter ∧ wise(peter) )
```

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

inconsistent!

Abduction: given a *Theory* and an *Observation*, find an *Explanation* such that the *Observation* is a logical consequence of $Theory \cup Explanation$

```
% abduce(O,E0,E) <-    E is abductive explanation of O, given E0
abduce(true,E,E):-!.
abduce((A,B),E0,E):-!,
    abduce(A,E0,E1),
    abduce(B,E1,E).
abduce(A,E0,E):-
    clause(A,B),
    abduce(B,E0,E).
abduce(A,E,E):-        % already assumed
    element(A,E).
abduce(A,E,[A|E]):-    % A can be added to E
    not element(A,E),  % if it's not already there,
    abducible(A).      % and if it's abducible
abducible(A):-not clause(A,_).
```



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

```
?-abduce(likes(peter,paul),[],E).
```

```
E = [student_of(paul,peter)] ;
```

```
E = [friend(paul,peter)]
```

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

```
?-abduce(flies(tweety),[],E).
```

```
E = [not abnormal(tweety),penguin(tweety)] ; % WRONG!!!
```

```
E = [not abnormal(tweety),sparrow(tweety)]
```

Abduction: examples

```

abduce(true,E,E):-!.
abduce((A,B),E0,E):-!,
    abduce(A,E0,E1),
    abduce(B,E1,E).
abduce(A,E0,E):-
    clause(A,B),
    abduce(B,E0,E).
abduce(A,E,E):-
    element(A,E). % already assumed
abduce(A,E,[A|E]):-
    not element(A,E), % A can be added to E
    abducible(A), % if it's not already there,
    not abduce_not(A,E,E). % if it's abducible,
                                % and E doesn't explain not(A)
abduce(not(A),E0,E):- % find explanation for not(A)
    not element(A,E0), % should be consistent
    abduce_not(A,E0,E).

```

```

% abduce_not(O,E0,E) <- E is abductive explanation of not(O)
abduce_not((A,B),E0,E):-!,
    abduce_not(A,E0,E);           % disjunction
    abduce_not(B,E0,E).

abduce_not(A,E0,E):-
    setof(B,clause(A,B),L),
    abduce_not_1(L,E0,E).

abduce_not(A,E,E):-
    element(not(A),E).           % not(A) already assumed

abduce_not(A,E,[not(A)|E]):-    % not(A) can be added to E
    not element(not(A),E),      % if it's not already there,
    abducible(A),               % if A is abducible
    not abduce(A,E,E).          % and E doesn't explain A

abduce_not(not(A),E0,E):-       % find explanation for A
    not element(not(A),E0),     % should be consistent
    abduce(A,E0,E).

```

Explaining negative literals

```
flies(X):-bird(X),not abnormal(X).
flies1(X):-not abnormal(X),bird(X).
abnormal(X):-penguin(X).
abnormal(X):-dead(X).
bird(X):-penguin(X).
bird(X):-sparrow(X).
```

```
?-abduce(flies(tweety),[],E).
```

```
E = [not penguin(tweety),not dead(tweety),sparrow(tweety)]
```

```
?-abduce(flies1(tweety),[],E).
```

```
E = [sparrow(tweety),not penguin(tweety),not dead(tweety)]
```

Abduction with negation: example

```
notflies(X):-mammal(X),not flying_mammal(X).
flies(X):-bat(X),not nonflying_bat(X).
notflies(X):-dead(X),not flying_deadthing(X).
mammal(X):-bat(X).
bat(dracula).
dead(dracula).
flying_mammal(X):-bat(X).
nonflying_bat(X):-dead(X).
```

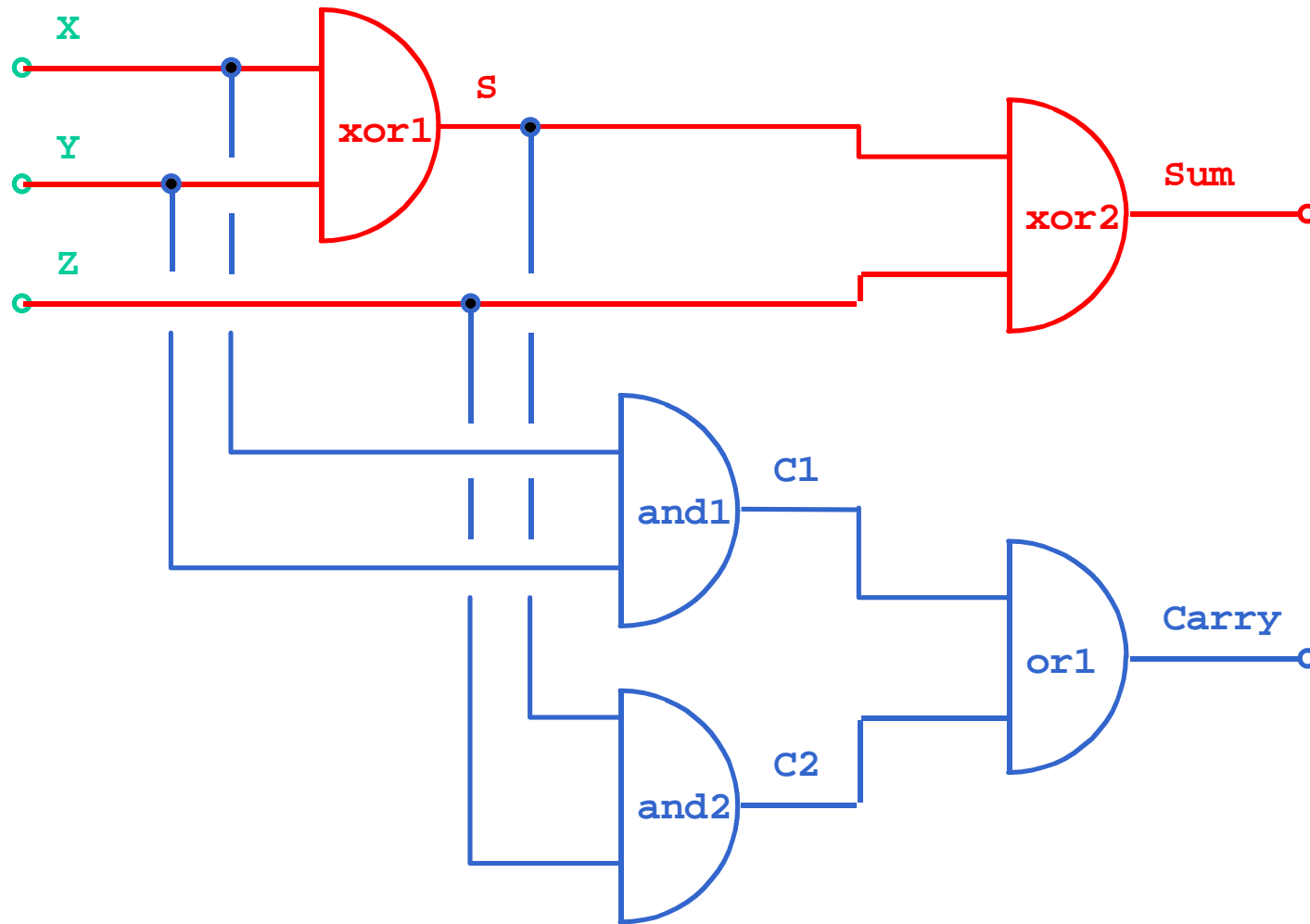
```
?-abduce(flies(X),[],E).
```

No

```
?-abduce(notflies(X),[],E).
```

```
E = [not flying_deadthing(dracula)]
```

Abduction generalises negation as failure

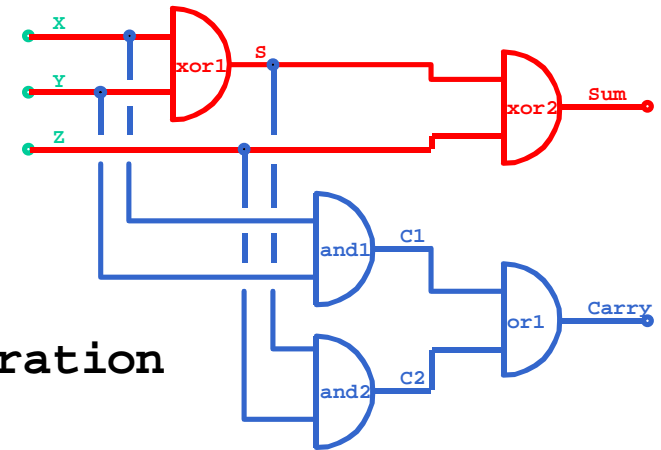


3-bit adder

```

adder(N,X,Y,Z,Sum,Carry):-
  xorg(N-xor1,X,Y,S),           % N-xor1 is the name of this gate
  xorg(N-xor2,Z,S,Sum),
  andg(N-and1,X,Y,C1),
  andg(N-and2,Z,S,C2),
  org(N-or1,C1,C2,Carry).

```



```

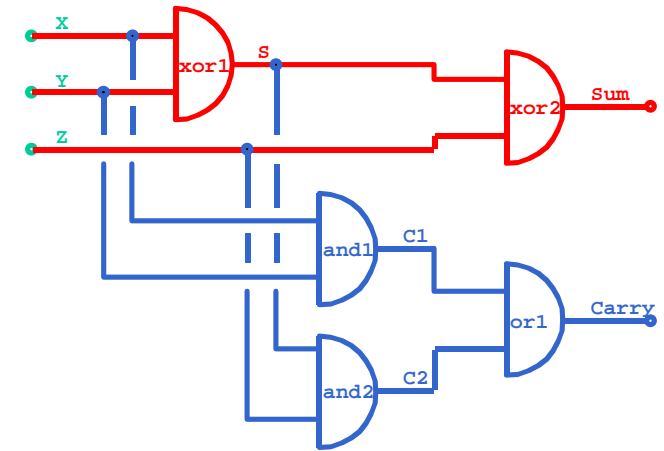
% fault model (similar for andg, org)
xorg(N,X,Y,Z):-xor(X,Y,Z).    % normal operation
xorg(N,1,1,1):-fault(N=s1).  % stuck at 1
xorg(N,0,0,1):-fault(N=s1).  % stuck at 1
xorg(N,1,0,0):-fault(N=s0).  % stuck at 0
xorg(N,0,1,0):-fault(N=s0).  % stuck at 0

```

```

% gates (similar for and, or)
xor(1,0,1).
xor(0,1,1).
xor(1,1,0).
xor(0,0,0).

```



```
?-abduce(adder(a,0,0,1,0,1),[],D).
```

```
D = [fault(a-or1=s1),fault(a-xor2=s0)];
```

```
D = [fault(a-and2=s1),fault(a-xor2=s0)];
```

```
D = [fault(a-and1=s1),fault(a-xor2=s0)];
```

```
D = [fault(a-and2=s1),fault(a-and1=s1),fault(a-xor2=s0)];
```

```
D = [fault(a-xor1=s1)];
```

```
D = [fault(a-or1=s1),fault(a-and2=s0),fault(a-xor1=s1)];
```

```
D = [fault(a-and1=s1),fault(a-xor1=s1)];
```

```
D = [fault(a-and2=s0),fault(a-and1=s1),fault(a-xor1=s1)];
```

```
No more solutions
```

Abductive diagnosis