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#### Representing Defaults

A General Strategy for Representing Defaults Knowledge Bases with Null Values Simple Priorities between Defaults Inheritance Hierarchies with Defaults Indirect Exceptions to Defaults

## Reading

#### ▶ Read Chapter 5, *Representing Defaults*, in KRR book.

## What Is a Default?

- default a statement of natural language containing words such as "normally," "typically," or "as a rule."
- Example: "Normally, birds can fly."
- ▶ We use them all the time. Well, we normally use them.
- The fact that something is a default implies that there are exceptions.
- Therefore, any conclusions based on the default are tentative.

## Example: Uncaring John

- Let's consider our family story where John and Alice are Sam and Bill's parents.
- You are Sam's teacher and he is doing poorly in class.
- > You tell John that Sam needs some extra help to pass.
- You're thinking:
  - 1. John is Sam's parent.
  - 2. Normally, parents care about their children.
  - 3. Therefore, John cares about Sam and will help him study.
- How do we represent the default?

Why Can't We Just Use a Strict Rule?

```
If we add a strict rule
cares(X,Y) :- parent(X,Y).
```

and later find out that John doesn't care about his kids: -cares(john,X) :- child(X,john).

then we get a contradiction!

## A General Way of Representing Defaults

In ASP a default, d, stated as "Normally elements of class C have property P," is often represented by a rule:

$$p(X) \leftarrow c(X),$$
  
 $not ab(d(X)),$   
 $not \neg p(X).$ 

- ► ab(d(X)) is read "X is abnormal with respect to d" or "a default d is not applicable to X"
- not  $\neg p(X)$  is read "p(X) may be true."
- This works regardless of the arity of p.

Example: Normally parents care about their children.

Note that we have no problem when we add

```
-cares(john,C) :- parent(john,C).
```

The new program is consistent and entails  $\neg cares(john, sam)$  and cares(alice, sam).

## Two Types of Exceptions

- Weak exceptions make the default inapplicable. They keep the agent from jumping to a conclusion.
- Strong exceptions allow the agent to derive the opposite of what the default would have them believe.

## General Implementation of Exceptions

When encoding a weak exception, add the cancellation axiom:

$$ab(d(X)) \leftarrow not \neg e(X).$$

which says that d is not applicable to X if X may be a weak exception to d.

When encoding a strong exception, add the cancellation axiom and the rule that defeats the default's conclusion.

$$eg p(X) \leftarrow e(X)$$

## Example: Weak Exception

- Suppose our agent doesn't want to assume too much about folks caring about their children if they haven't ever been seen at school.
- Notice that doesn't mean that the agent assumes the worst
   only that it doesn't know and wants to be cautious.
- So, it doesn't want to apply the cares(P,C) default to anyone that is "absent."
- ▶ What *should* it assume about Alice caring for Sam if it knows:
  - ▶ that Alice has been seen at school (¬*absent*(*alice*))?
  - that Alice has never been seen at school (absent(alice))?
  - nothing about Alice's absence?

Example: Adding a Cancellation Axiom

Following our general method for defaults, we'll add the cancellation axiom

$$ab(d(X)) \leftarrow not \neg e(X).$$

for default d\_cares as follows:

ab(d\_cares(P,C)) :- not -absent(P).

"A person P is abnormal w.r.t. the default about caring for child C if P may be absent."

## Example: What does the agent know about Alice?

Let's put the default together with the cancellation axiom:

ab(d\_cares(P,C)) :- not -absent(P).

What does the agent conclude given

- -absent(alice)?
- absent(alice)?
- no information about Alice's absence?
- What if it knew cares(alice, sam)?
- How about -cares(alice,sam)?

## Example: Strong Exception — General Methodology

We already represented uncaring John in our program as follows:

-cares(john,C) :- parent(john,C).

How would we implement the strong exception of uncaring John using the general methodology?

It says to add two rules:

$$eg p(X) \leftarrow e(X).$$
  
 $ab(d(X)) \leftarrow not 
eg e(X).$ 

In our case,

- e(X) is parent(john, C), and
- d(X) is  $d_cares(john, C)$ .

Thus, our two rules are

## Example: General Methodology

Sometimes, we can do better than the general methodology. It's a one-size-fits-all, and we can make it tailor made. Here is the default plus the two rules again:

```
-cares(john,C) :- parent(john,C). %rule 1
```

ab(d\_cares(john,C)) :- not -parent(john,C). %rule 2

Check that we don't need rule 2 in this case.

# Example: Sometimes We Need Rule 2 (The Cancellation Axiom)

- ► Let's consider another strong exception to *d*\_*cares*.
- Suppose the is a mythical country, called u, whose inhabitants don't care about their children.
- Suppose our knowledge base contains information about the national origin of most but not all recorded people.
- Pit and Kathy are Jim's parents. Kathy was born in Moldova, but we don't know there Pit is from. He could have been born in u.
- Let's assume that both parents have been seen at school, so the absence thing doesn't come into play.

## Representing the Strong Exception

Assume we have all necessary sorts and predicates. Does Kathy care about Jim? Does Pit? What if the last rule were missing?

```
father(pit,jim).
mother(kathy,jim).
born_in(kathy,moldova).
%% A person can only be born in one country
-born_in(P,C1) := born_in(P,C2),
                  C1 = C2.
%% The original default
cares(X,Y) :- parent(X,Y),
              not ab(d_cares(X,Y)),
              not -cares(X,Y).
%% Representing the strong exception
-cares(P,C) :- parent(P,C),
               born in(P.u).
ab(d_cares(P,C)) :- not -born_in(P,u).
```

## Example: Cowardly Students

- 1. Normally, students are afraid of math.
- 2. Mary is not.
- 3. Students in the math department are not.
- 4. Those in CS may or may not be afraid.

The first statement corresponds to a default. The next two can be viewed as strong exceptions to it. The fourth is a weak exception.

Let's look at the implementation in s\_cowardly.sp on the book webpage: http://pages.suddenlink.net/ykahl.

## What does the program assume?

- > ? afraid(john,math)
- > ? afraid(mary,math)
- > ? afraid(pat,math)
- ? afraid(bob,math)
- Let's add a new person, Jake, whose department is unknown. What does the agent assume?

## Defaults with Known Information

- Let d be a default "Elements of class C normally have property P" and e be a set of exceptions to this default.
- If our information about membership in e is complete, then its representation can be substantially simplified.
- If e is a weak exception to d then the Cancellation Axiom can be written as

$$ab(d(X)) \leftarrow e(X).$$

If e is a strong exception then the cancellation axiom can be omitted altogether. Example: Defaults with Known Information

- Suppose we had a complete list of students in the CS and math departments.
- The cancellation axiom for CS students could be simplified to ab(d(X)) :- in(S,cs).
- The one for the math students could simply be dropped. Remember, we still have

-afraid(S,math) :- in(S,math\_dept).

## Knowledge Bases with Null Values

Consider a database table representing a tentative summer schedule of a Computer Science department.

Professor	Course
mike	pascal
john	С
staff	prolog

Here "staff" is a null value.

## Course Catalog Implementation

```
#prof = {mike, john}.
#prof_values = #prof + {staff}.
#course = {pascal, c, prolog}.
#default = d(#prof_values, #course).
```

```
teaches(#prof_values, #course).
ab(#default).
```

# Course Catalog Implementation, cont.

```
teaches(mike,pascal).
teaches(john,c).
teaches(staff,prolog).
```

```
-teaches(P,C) :- not ab(d(P,C)),
not teaches(P,C).
```

ab(d(P,C)) :- teaches(staff,C).

How does the agent answer queries:

- ? teaches(mike,c)
- ? teaches(mike,prolog)

# Another Type of Incompleteness

Professor	Course
mike	pascal
john	с
{mike, john}	prolog

In this case, we simply add:

teaches(mike,prolog) | teaches(john,prolog).

## Another Type of Incompleteness

Here are the rules of the program:

```
teaches(mike,pascal).
teaches(john,c).
teaches(mike, prolog) | teaches(john, prolog).
```

```
-teaches(P,C) :- not teaches(P,C).
```

How does the agent answer queries:

- > ? teaches(mike, c)
- ? teaches(mike, prolog)
- ► ? teaches(mike, prolog) ∧ teaches(john, prolog)

## Simple Priorities between Defaults

- Recall our orphans story.
- Remove the assumption that we have info about every child's parents. (Note that this is more realistic.)
- Add information about some regulations:
  - 1. Orphans are entitled to assistance from government program 1.
  - 2. All children are entitled to program 0.
  - 3. Program 1 is preferable to program 0.
  - 4. No one can receive assistance from more than one program.

#### Orphans Example: Representing the Defaults

```
%% Default d1: An orphan is entitled to program 1:
entitled(X,1) :- record_for(X),
                 orphan(X),
                 not ab(d1(X)),
                 not -entitled(X,1).
%% Default d2: A child is entitled to program 0:
entitled(X,0) :- record_for(X),
                 child(X),
                 not ab(d2(X)).
                 not -entitled(X.O).
%% A person is not entitled to more than one program:
-entitled(X,P2) :- record_for(X),
                   entitled(X,P1),
                   P1 != P2.
```

## Orphans Example: Expressing Preference for Program 1

- Treat orphans as strong exception to the second default.
- (We can use weak exceptions to express preference, too.)
- Recall: We don't have complete info about who is an orphan because we don't have complete info about status of parents.

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Orphans Example: We Have Other Strong Exceptions

Information about *dead* and *child* is complete, so we don't need the cancellation axioms.

# Orphans Example: Verifying Joe

Let's look at the entitlement rules together and check whether all is well.

See s\_orphans2.sp on the book webpage:

http://pages.suddenlink.net/ykahl.

What kind of assistance will living child Joe get if

- he is an orphan?
- he is a child but not an orphan?
- we don't know whether he is an orphan?

Orphans Example: Working with Unknowns

We can detect when we don't know something about a person in our KB.

A query on check\_status(X) will list everyone that we don't have orphan information about.

Orphans Example: Some Sample Records

```
record_for(bob).
father(rich,bob).
mother(patty,bob).
child(bob).
```

```
record_for(rich).
father(charles,rich).
mother(susan,rich).
dead(rich).
```

```
record_for(patty).
dead(patty).
```

```
record_for(mary).
child(mary).
mother(patty,mary).
```

# Orphans Example: CWA's

We know who is a child and who is dead:

```
-dead(P) :- record_for(P),
not dead(P).
```

Only apply to people in the database because we are only asking questions about people with records.

Orphans Example: Defining Orphans Given Incompleteness

- The positive part doesn't change, but CWA not valid for the negative part.
- Use a weaker statement.

```
-orphan(P) :- record_for(P),
not may_be_orphan(P).
```

# Orphans Example: Support Predicates

This time, we have to define when parents are not dead.

Suppose our administrator did her research and found that Mary has a father, Mike, who is alive. She knows that he is not a child and not dead, so she can add a record for him.

```
father(mike,mary).
record_for(mike).
```

Now Mary is entitled to program 0 but not 1.

## Absence of Information vs. Falsity

Why don't we enter records for Charles and Susan (Bob's grandparents)?

In the end we know:

- who is entitled to which program;
- who is not entitled;
- who we don't have enough information about even though they are in our KB and when that's a problem and when it's not.

## Orphans Example: Adding Defaults to SPARC

```
sorts
#person = {mary, bob, rich, patty, charles, susan}.
...
#default1 = d1(#person).
#default2 = d2(#person).
#default = #default1 + #default2.
predicates
ab(#default).
```

. . .

#### Submarines Revisited

Change "all submarines are black"

```
has_color(X,black) :- member(X,sub).
```

to "normally, submarines are black."

Consider

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## Membership Revisited

Now we can allow exceptions to an object not belonging to two sibling classes at the same time.

```
member(X,C) := is_a(X,C).
   member(X,C) := is_a(X,C0),
                    subclass(CO,C).
   siblings(C1,C2) :- is_subclass(C1,C),
                         is subclass(C2.C).
                         C1 != C2.
   -member(X,C2) := member(X,C1),
                       siblings(C1,C2),
                       C1 != C2,
                       not member(X,C2). % <-- add this
   So, there is no contradiction with
   is_a(darling, car). % is both a car and a sub
   is_a(darling, sub).
   is_a(narwhal, sub). % still just a sub and not a car
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```

## The Specificity Principle

Here is a classic story that came from the study of inheritance hierarchies.

"Eagles and penguins are types of birds. Birds are a type of animal. Sam is an eagle, and Tweety is a penguin. Tabby is a cat. Animals normally do not fly, birds normally fly, penguins normally don't fly."

Can Sam fly? How do you know?

# The Specificity Principle as Prioritized Defaults

- Our common sense tells us that he can because more specific information overrides less specific information.
- David Touretsky first formalized this idea known as the specificity principle.
- ► Thus, when encoding defaults of classes, we assume that The default "normally elements of class C<sub>1</sub> have property P" is preferred to the default "normally elements of class C<sub>2</sub> have property ¬P" if C<sub>1</sub> is a subclass of C<sub>2</sub>.

Hierarchy with Defaults

See s\_tweety.sp at http://pages.suddenlink.net/ykahl.

## Indirect Exceptions to Defaults

- These are rare exceptions that come into play only as a last resort, to restore the consistency of an agent's world view when all else fails.
- Probably can't be done with straight ASP.
- Can be done with CR-Prolog, an extension of ASP.

# The Contingency Axiom

- The contingency axiom for default d(X) which says that "Any element of class c can be an exception to the default d(X) above, but such a possibility is very rare and, whenever possible, should be ignored."
- This can be expressed by adding rules to ASP which fire only when there is a contradiction which can be resolved by their consequences.
- (CR-Prolog allows us to define preferences between these rules, but we will not cover that now.)

## Example: Restoring Consistency

$$p(a) \leftarrow not q(a).$$
  
 $\neg p(a).$   
 $q(a) \xleftarrow{+} .$ 

The regular part of this program is inconsistent. However, the third rule allows for the resolution of the conflict and the program's answer set is  $\{q(a), \neg p(a)\}$ .

Abductive Support and Answer Sets of CR-Prolog

- Let  $\Pi^r$  denote the regular rules of program  $\Pi$ .
- Let α(R) be the set of regular rules obtained from consistency-restoring rules by replacing <sup>+</sup>/<sub>+</sub> with ←.

## Definition

(Abductive Support)

A minimal (with respect to the preference relation of the program) collection R of cr-rules of  $\Pi$  such that  $\Pi^r \cup \alpha(R)$  is consistent (i.e. has an answer set) is called an **abductive support** of  $\Pi$ .

#### Definition

(Answer Sets of CR-Prolog)

A set A is called an *answer set* of  $\Pi$  if it is an answer set of a regular program  $\Pi^r \cup \alpha(R)$  for some abductive support R of  $\Pi$ .

#### Example: Broken Car

Default: People normally keep their cars in working condition:

$$\neg broken(X) \leftarrow car(X), \\ not \ ab(d(X)), \\ not \ broken(X) \leftarrow car(X). \end{cases}$$

Turning the ignition key starts the car's engine:

$$starts(X) \leftarrow turn_key(X),$$
  
 $\neg broken(X).$   
 $\neg starts(X) \leftarrow turn_key(X),$   
 $broken(X).$ 

#### car(c).

#### $turn_key(c)$ .

Regular rules conclude:  $\neg broken(c)$  and starts(c). What if  $\neg starts(c)$ ?

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## What Is It For?

- planning
- diagnostics
- reasoning about an agent's intentions

- CRModels is a solver for CR-Prolog which includes preferences, etc.