## Knowledge Representation and Reasoning

Exercises on Well-Founded Semantics

### 1 Well-Founded Semantics

1. Determine the well-founded model of the following normal logic program:

a :- not b.	c :- not a.	g :- not h.	d :- not e.	i :- g.
b :- not a.	c :- not c.	h :- not g.	f :- d.	i :- h.

#### Answer:

To determine the well-founded model of a program P, we need to iterate  $\Gamma_P^2$ , starting from the empty interpretation, until we reach a fixed point. Let T be such fixed point. Then, the well-founded model of P is

$$M = T \cup not \ \left(H_P - \Gamma_P\left(T\right)\right)$$

In this example, if we iterate  $\Gamma_P$ , we obtain:

$$\Gamma_{P}\left(\{\}\right) = \{a, b, c, d, f, g, h, i\}$$

$$\Gamma_{P}\left(\{a, b, c, d, f, g, h, i\}\right) = \Gamma_{P}^{2}\left(\{\}\right) = \{d, f\}$$

$$\Gamma_{P}\left(\{d, f\}\right) = \{a, b, c, d, f, g, h, i\}$$

$$\Gamma_{P}\left(\{a, b, c, d, f, g, h, i\}\right) = \Gamma_{P}^{2}\left(\Gamma_{P}^{2}\left(\{\}\right)\right) = \{d, f\}$$

Therefore, the iteration of the  $\Gamma_P^2$  results in:

$$\Gamma_P^2(\{\}) = \{d, f\}$$
  
$$\Gamma_P^2(\{d, f\}) = \{d, f\}$$

so, the least fixed point of  $\Gamma_P^2$  is  $\{d, f\}$ . Let T denote this least fixed point, which corresponds to the atoms that are true in the well-founded model.

Now, we need to apply  $\Gamma_P$  to T to obtain the atoms that are true or undefined.

$$\Gamma_P\left(\{d,f\}\right) = \{a, b, c, d, f, g, h, i\}$$

Since  $H_P = \{a, b, c, d, e, f, g, h, i\}$  (the Herbrand base of P), we can now determine the atoms which are false in the well-founded model:

$$H_P - \Gamma_P\left(\{d, f\}\right) = \{e\}$$

We finally obtain the well-founded model:

$$M = T \cup not \ (H_P - \Gamma_P(T)) = \{d, not \ e, f\}$$

2. Determine the well-founded model of the following normal logic program.

winning(X) :- move(X,Y), loosing(Y). loosing(X) :- not winning(X). move(a,b). move(b,d). move(a,c). move(c,c). Answer:

Iterating  $\Gamma_P$  we obtain (with obvious abbreviations):

$$\begin{split} \Gamma_{P}\left(\{\}\right) &= \{m\left(a,b\right), m\left(b,d\right), m\left(a,c\right), m\left(c,c\right), l\left(a\right), l\left(b\right), l\left(c\right), l\left(d\right), w\left(a\right), w\left(b\right), w\left(c\right)\} \\ \Gamma_{P}\left(\Gamma_{P}\left(\{\}\right)\right) &= \Gamma_{P}^{2}\left(\{\}\right) = \{m\left(a,b\right), m\left(b,d\right), m\left(a,c\right), m\left(c,c\right), l\left(d\right), w\left(b\right)\} \\ \Gamma_{P}\left(\Gamma_{P}^{2}\left(\{\}\right)\right) &= \{m\left(a,b\right), m\left(b,d\right), m\left(a,c\right), m\left(c,c\right), l\left(a\right), l\left(c\right), l\left(d\right), w\left(b\right), w\left(c\right)\} \\ \Gamma_{P}\left(\Gamma_{P}^{2}\left(\{\}\right)\right) &= \Gamma_{P}^{2}\left(\Gamma_{P}^{2}\left(\{\}\right)\right) = \{m\left(a,b\right), m\left(b,d\right), m\left(b,d\right), m\left(a,c\right), m\left(c,c\right), l\left(d\right), w\left(b\right)\} \\ \end{split}$$

so the least fixed point of  $\Gamma_P^2$  is  $\{m(a, b), m(b, d), m(a, c), m(c, c), l(d), w(b)\}$ . Let T denote this least fixed-point, which corresponds to the atoms that are true in the well-founded model. Now, we need to apply  $\Gamma_P$  to T to obtain the atoms that are true or undefined.

 $\Gamma_{P}(T) = \{m(a,b), m(b,d), m(a,c), m(c,c), l(a), l(c), l(d), w(a), w(b), w(c)\}$ 

We can now determine the atoms which are false in the well-founded model:

$$H_P - \Gamma_P(T) = \{l(b), w(d)\}$$

And finally obtain the well-founded model:

 $M = T \cup not \ (H_P - \Gamma_P(T)) = \{m(a, b), m(b, d), m(a, c), m(c, c), l(d), w(b), not \ l(b), not \ w(d), not \ m(a, a), not \ m(a, d), not \ m(b, a), not \ m(b, b), not \ m(b, c), not \ m(c, a), not \ m(c, b), not \ m(c, d), not \ m(d, a), not \ m(d, b), not \ m(d, d)\}$ 

- 3. Consider the following taxonomic knowledge expressed by the sentences:
  - Normally, big carnivorous are dangerous.
  - Cats are an exception to the above rule.
  - Felines are carnivorous.
  - Both lions and cats are felines.
  - Lions are big.
  - Normally, tamed animals are not dangerous.
  - King is a tamed lion.
  - Tom is a big cat.
  - (a) Represent the previous taxonomic knowledge using extended logic programming.

# Answer: danaerous(X)

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\begin{aligned} &dangerous\left(X\right) \leftarrow big\left(X\right), carnivorous\left(X\right), bcd\left(X\right), not \neg dangerous(X). \\ & bcd\left(X\right) \leftarrow not \neg bcd\left(X\right). \\ & \neg bcd\left(X\right) \leftarrow cat\left(X\right). \\ & carnivorous\left(X\right) \leftarrow feline\left(X\right). \\ & feline\left(X\right) \leftarrow cat\left(X\right). \\ & feline\left(X\right) \leftarrow lion\left(X\right). \\ & big\left(X\right) \leftarrow lion\left(X\right). \\ & \neg dangerous\left(X\right) \leftarrow tamed\left(X\right), tnd\left(X\right), not \ dangerous(X). \\ & tnd\left(X\right) \leftarrow not \neg tnd\left(X\right). \\ & lion\left(king\right). \\ & big\left(tom\right). \\ & cat\left(tom\right). \end{aligned}
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(b) Compute the extended well-founded model and explain what you can conclude regarding Tom and King.

#### Answer:

To compute the well-founded model, we need to iterate  $\Gamma_P \Gamma_{P_S}$ , starting from the empty interpretation, until we reach a fixed point. Let T be such fixed point. Then, the well-founded model of P is

$$M = T \cup not \ (H_P - \Gamma_{P_S}(T))$$

Recal that  $\Gamma_{P_S}$  operates over the semi-normal version of P, obtained by adding *not*  $\neg L$  to every rule of P with head L (where L is a literal, i.e. A or  $\neg A$ , and  $\neg \neg L = L$ ). You can use a simplified version of the semi-normal program and only modify those rules for literal L such that there exists some rule for  $\neg L$ ). In this example, the simplified semi-normal version is:

 $\begin{array}{l} dangerous\left(X\right)\leftarrow big\left(X\right), carnivorous\left(X\right), bcd\left(X\right), not \neg dangerous\left(X\right).\\ bcd\left(X\right)\leftarrow not \neg bcd\left(X\right).\\ \neg bcd\left(X\right)\leftarrow cat\left(X\right), not \ bcd\left(X\right).\\ carnivorous\left(X\right)\leftarrow feline\left(X\right).\\ feline\left(X\right)\leftarrow cat\left(X\right).\\ feline\left(X\right)\leftarrow lion\left(X\right).\\ big\left(X\right)\leftarrow lion\left(X\right).\\ \neg dangerous\left(X\right)\leftarrow tamed\left(X\right), tnd\left(X\right), not \ dangerous\left(X\right).\\ tnd\left(X\right)\leftarrow not \neg tnd\left(X\right).\\ lion\left(king\right).\\ big\left(tom\right).\\ cat\left(tom\right).\\ \end{array}$ 

The iteration is then (omitting the atoms lion(king), tamed(king), big(king), big(tom), cat(tom), feline(king), feline(tom), carnivorous(king), carnivorous(tom), tnd(king), and tnd(tom) which belong to every iteration):

$$\Gamma_{P_{S}}\left(\{\}\right) = \left\{ \begin{array}{c} bcd\left(king\right), bcd\left(tom\right), \neg bcd\left(tom\right), \\ dangerous\left(king\right), dangerous\left(tom\right), \neg dangerous\left(king\right), \\ \Gamma_{P_{S}}\left(\Gamma_{P_{S}}\left(\{\}\right)\right) = \left\{ \begin{array}{c} bcd\left(king\right), \neg bcd\left(tom\right) \\ dangerous\left(king\right), \neg bcd\left(tom\right), \\ dangerous\left(king\right), \neg dangerous\left(king\right) \\ \end{array} \right\} \\ \Gamma_{P_{S}}\left(\Gamma_{P}\left(\Gamma_{P_{S}}\left(\{\}\right)\right)\right) = \left\{ \begin{array}{c} bcd\left(king\right), \neg bcd\left(tom\right), \\ dangerous\left(king\right), \neg dangerous\left(king\right) \\ \end{array} \right\} \\ \Gamma_{P}\left(\Gamma_{P_{S}}\left(\Gamma_{P}\left(\Gamma_{P_{S}}\left(\{\}\right)\right)\right)\right) = \left\{ \begin{array}{c} bcd\left(king\right), \neg bcd\left(tom\right) \\ dangerous\left(king\right), \neg dangerous\left(king\right) \\ \end{array} \right\}$$

Therefore, the iteration of the  $\Gamma_P\Gamma_{P_S}$  results in:

$$\Gamma_{P}\Gamma_{P_{S}}\left(\{\}\right) = \left\{ bcd\left(king\right), \neg bcd\left(tom\right) \right\}$$
$$\Gamma_{P}\Gamma_{P_{S}}\left(\Gamma_{P}\Gamma_{P_{S}}\left(\{\}\right)\right) = \left\{ bcd\left(king\right), \neg bcd\left(tom\right) \right\}$$

so, the least fixed point of  $\Gamma_P \Gamma_{P_S}$  is

 $\{bcd(king), \neg bcd(tom)\}$ 

Let T denote this least fixed-point. Also, we have that

 $\Gamma_{P_{S}}(T) = \left\{ \begin{array}{c} bcd\left(king\right), \neg bcd\left(tom\right), \\ dangerous\left(king\right), \neg dangerous\left(king\right) \end{array} \right\}$ 

Since  $T \subseteq \Gamma_{P_S}(T)$ , this is the well-founded model according to WFSX, i.e.,

$$M = T \cup not (H_P - \Gamma_{P_S}(T))$$

which, in this case, is (omitting explicitly negated literals not present in the program, such as not  $\neg lion(king)$ , not  $\neg tamed(king)$ , as well as negations of atoms not present in the program such as  $\neg lion(tom)$  or  $\neg cat(king)$  etc...):

$$M = \begin{cases} lion (king), tamed (king), big (king), big (tom), cat (tom), feline (king), \\ feline (tom), carnivorous (king), carnivorous (tom), bcd (king), \neg bcd (tom), \\ tnd (king), tnd (tom), not \neg tnd (king), not \neg tnd (tom), not \neg bcd (king), \\ not bcd (tom), not tamed (tom), not dangerous (tom), not \neg dangerous (tom) \end{cases}$$

According to the model, Tom is not known to be dangerous (because *not dangerous* (tom) belongs to the model and *dangerous* (tom) does not). Furthermore, Tom is not known to be (explicitly) not dangerous since *not*  $\neg$ *dangerous* (tom) belongs to the model and  $\neg$ *dangerous* (tom) does not. In other words, there is no evidence that Tom is dangerous, but there is no certainty that Tom is (explicitly) not dangerous. Our knowledge about King is undefined, since neither *dangerous* (king) and  $\neg$ *dangerous* (king) nor their default negations belong to the model.