

# Satisfiability for First-order Logic as a Non-Modal Deontic Logic

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**Abstract.** In modal deontic logics, the focus is on inferring logical consequences, for example inferring whether or not an obligation  $\mathbf{O} \text{ mail}$ , to mail a letter, logically implies  $\mathbf{O} [\text{mail} \vee \text{burn}]$ , an obligation to mail or burn the letter. Here I present an alternative approach in which obligations are sentences (such as *mail*) in first-order logic (FOL), and the focus is on satisfying those sentences by making them true in some best model of the world. To facilitate this task and to make it manageable in this alternative approach, models are defined by a logic program (LP) extended by means of action assumptions (A). The resulting combination of FOL, LP and A is a variant of abductive logic programming (ALP).

## 1 Goal satisfaction in FOL

In the abductive logic programming (ALP) approach of [8, 10], candidate assumptions (A), representing actions and other “abducibles”, and logic programs (LP), representing an agent’s beliefs, are combined with first-order logic (FOL), representing an agent’s goals. However, this characterisation of ALP is potentially misleading, because it fails to identify the primary role of goals, and the supporting role of beliefs and assumptions in helping to make goals true. Here is a more abstract characterisation, which is formulated entirely in terms of FOL, and does not mention A or LP at all:

A *goal satisfaction problem* is a tuple  $\langle G, M_0, W \rangle$  where:

$G$  is a set of sentences in FOL, representing goals.

$M_0$  is a classical FOL model-theoretic structure,  
representing a partial history of the world.

$W$  is a set of classical FOL model-theoretic structures,  
representing alternative extensions of  $M_0$ .

$M \in W$  satisfies a goal satisfaction problem  $\langle G, M_0, W \rangle$  if and only if

$G$  is true in  $M$ .

We will see that the models  $M_0$  and  $W$  can be defined constructively, by using a logic program  $P$  to define  $M_0$ , and by using a set of candidate actions  $A$  to specify alternative ways of extending  $M_0$ . We will also see that it is possible to satisfy goals without generating complete models, by using backward reasoning.

There can be many models that satisfy the same goal satisfaction problem, and some models may be better than others. Usual formulations of ALP ignore this fact, and are neutral with respect to the choice between different models satisfying the same goals. In contrast, in deontic logic, an agent is obliged to satisfy its goals in the best way possible.

To capture this normative character of deontic logic in FOL/ALP, we introduce a partial ordering between the models in  $W$ .

A *normative goal satisfaction problem* is a tuple  $\langle G, M_0, W, \prec \rangle$  where:

- $\prec$  is a strict partial ordering over  $W$ ,
- where  $M \prec M'$  represents  $M'$  being *better than*  $M$ .

$M \in W$  satisfies a normative goal satisfaction problem  $\langle G, M_0, W, \prec \rangle$  if and only if

- $M$  satisfies the goal satisfaction problem  $\langle G, M_0, W \rangle$  and
- there does not exist  $M' \in W$  such that  $M'$  satisfies  $\langle G, M_0, W \rangle$  and  $M \prec M'$ .

There is an obvious relationship with the possible world semantics of modal logics:  $W$  is like a frame of possible worlds. The extension of  $M_0$  to  $M$  is like the accessibility relation between possible worlds. The partial ordering  $\prec$  is like the preference relation in preference-based deontic logics, such as those of [5] and [14].

However, whereas preference-based deontic logics build the preference relation into the semantics, complicating the logic, here the partial ordering is external to the logic, which is simply FOL. Moreover, while in modal logics, actions and events are normally represented by labels on the accessibility relation, here they are “reified”, as part of the record of a partial history of the world.

Deontic logic, the logic of obligation, contrasts with alethic logic, the logic of necessity. In alethic logic, a necessary truth cannot be falsified. But in deontic logic, an obligation is a normative ideal. If an obligation is violated, the world does not end, but the resulting world is less than ideal.

The focus on deriving logical consequences in modal logics makes it difficult to deal with violations, conflicting norms, and contrary-to-duty obligations. In contrast, the focus on goal satisfaction in FOL/ALP turns these problems into pragmatic choices between alternative models. Moreover, it makes it possible for an agent, aspiring towards the normative deal, to fall short, but nonetheless succeed in generating a best model possible with the limited resources available.

## 2 Logic programs as constructive definitions of models.

These definitions of goal satisfaction imply that, for an agent to satisfy its goals  $G$ , whether in some best way or not, the agent needs to search the space of alternative world histories  $W$ , to find some model  $M \in W$  of  $G$ . For this to be feasible in practice, the models  $M \in W$  must be constructible, and the space  $W$  itself must be searchable. This is where ALP comes in. Logic programs in ALP provide a constructive representation of models, and an efficient way to guarantee truth in a model without necessarily generating the model in its totality.

In our variant of ALP, the given model  $M_0$  is defined by a logic program  $P$ , and the space of candidate models  $M \in W$  is defined by logic programs  $P \cup \Delta$ , where  $\Delta \subseteq A$  and  $A$  is a set of ground atomic sentences representing candidate assumptions.

In ordinary abduction, the goals  $G$  represent observations, and  $A$  represents candidate, hypothetical external events that can be used to explain  $G$ . In default reasoning,  $A$  represents assumptions that conditions are normal, and  $G$  represents constraints that ensure conditions are not assumed to be normal if they are exceptional. In deontic applications,  $G$  represents obligations and prohibitions, and  $A$  represents candidate actions that can be used to satisfy  $G$ .

In the simplest case, a logic program is a set of definite clauses of the form  $conclusion \leftarrow condition_1 \wedge \dots \wedge condition_n$ , where  $conclusion$  and each  $condition_i$  is an atomic formula. All variables are universally quantified with scope the entire clause. Every such set of definite clauses  $P$  has a unique minimal model  $M$  [3]. The minimal model  $M$  can be viewed as the intended model of  $P$ , and  $P$  can be regarded as a constructive definition of  $M$ .

In LP, it is convenient to represent models  $M$  as *Herbrand interpretations*, which are sets of atomic sentences representing all the atomic sentences that are true in  $M$ . A Herbrand interpretation  $M$  of a logic program  $P$  is then a *minimal model* of  $P$  if

and only if  $M \subseteq M'$  for any other Herbrand model  $M'$  of  $P$ . Minimal models can be constructed by *forward reasoning*: using *modus ponens* to exhaustively derive atomic sentences that are instances of the *conclusions* of clauses from atomic sentences that are instances of the *conditions* of clauses.

Forward reasoning can also be used to satisfy a goal: guessing a set of candidate assumptions  $\Delta \subseteq A$ , adding them to  $P$ , generating the minimal model  $M$  of  $P \cup \Delta$ , and then checking whether  $M$  is also a model of  $G$ . However, this kind of reasoning is not computationally feasible. It is not feasible to generate candidate  $\Delta$  blindly and independently of  $G$ ; nor is it feasible to generate models in their totality.

In contrast, backward reasoning using SLD resolution [9] is computationally feasible. It reasons backwards from  $G$ , reducing goals that match the *conclusion* of a clause in  $P$  to subgoals that are the instantiated *conditions* of the clause. It continues this process of goal-reduction, until all subgoals are solved directly either by atomic sentences in  $P$  or by assumptions in  $A$ . In this way, backward reasoning generates only assumptions  $\Delta$  that are relevant to satisfying  $G$ . Moreover, backward reasoning does not generate a complete model, but generates only the assumptions  $\Delta$ , which together with  $P$  determine the minimal model of  $P \cup \Delta$ .

In the following three, simple examples, the logic program  $P$  is either an empty set of clauses {} or a singleton set containing the clause  $X = X$ . Backward reasoning only identifies those assumptions/actions in  $A$  or those instances of  $X = X$  that are needed to satisfy the goal. Moreover, in the first two examples, the preference relation {} is empty. So all models are equally good.

### 3 Map colouring as goal satisfaction

The classic map colouring problem illustrates the use of FOL/ALP for goal satisfaction. However, it can also be formulated in deontic terms:

- It is *obligatory* that every country is painted with a colour.
- It is *forbidden* to paint the same country two different colours.
- It is *forbidden* to paint two adjacent countries the same colour.

In FOL, the problem has the form  $\langle G, M_0, W, \prec \rangle$  where:

$$\begin{aligned} G &= \{ \forall X [\text{country}(X) \rightarrow \exists C [\text{colour}(C) \wedge \text{paint}(X, C)]], \\ &\quad \forall X C1 C2 [\text{paint}(X, C1) \wedge \text{paint}(X, C2) \rightarrow C1 = C2], \\ &\quad \forall X Y C \neg [\text{adjacent}(X, Y) \wedge \text{paint}(X, C) \wedge \text{paint}(Y, C)] \} \\ W &= \{M_0 \cup \Delta \mid \Delta \subseteq A\} \text{ where } A = \{\text{paint}(X, C) \mid \text{country}(X), \text{colour}(C)\} \\ \prec &= \{ \}. \text{ i.e. all models are equally good.} \end{aligned}$$

The initial model  $M_0$  is given by a logic program that specifies the countries, the colours, the adjacency relation, and the identity relation. For a simple problem with two adjacent countries and two colours, this is given by the program  $P$  and its minimal model  $M_0$ :

$$\begin{aligned} P &= \{ \text{country}(iz), \text{country}(oz), \text{adjacent}(iz, oz), \text{colour}(red), \text{colour}(blue), X = X \} \\ M_0 &= \{ \text{country}(iz), \text{country}(oz), \text{adjacent}(iz, oz), \text{colour}(red), \text{colour}(blue), \\ &\quad iz = iz, oz = oz, red = red, blue = blue \} \end{aligned}$$

Because the program  $P$  is so simple, the only difference between  $P$  and  $M_0$  is that  $P$  contains a general clause  $X = X$ , whereas  $M_0$  contains all variable free instances of the clause.

There are exactly two models that satisfy the goals  $G$ , and both are equal good:

$$M1 = M_0 \cup \{ \text{paint}(iz, red), \text{paint}(oz, blue) \} \text{ and}$$

$$M2 = M_0 \cup \{ \text{paint}(iz, blue), \text{paint}(oz, red) \}$$

The map colouring problem can also be expressed in modal deontic logic, formalising the English statement of the problem. It would then be possible to infer the following logical consequence:

$$\mathbf{O} [\text{paint}(iz, red) \wedge \text{paint}(oz, blue)] \quad \vee$$

$$\mathbf{O} [\text{paint}(iz, blue) \wedge \text{paint}(oz, red)]$$

which describes all solutions of the problem. It is not obvious how to infer a single solution, which would be more useful in practice.

#### 4 Ross's Paradox

SDL (Standard Deontic Logic) is commonly used as a basis for comparison between different deontic logics. It is a propositional logic with a modal operator **O** representing obligation. Among the many problems of SDL, which also affects many other deontic logics, is Ross's Paradox [12].

It is obligatory that the letter is mailed.  
 If the letter is mailed, then the letter is mailed or the letter is burned.  
 i.e.  $\mathbf{O} \text{mail}, \quad \text{mail} \rightarrow \text{mail} \vee \text{burn}.$

In SDL it is a logical consequence of **O mail** that **O [mail  $\vee$  burn]**.

As McNamara [11] puts it, “it seems rather odd to say that an obligation to mail the letter entails an obligation that can be fulfilled by burning the letter (something presumably forbidden), and one that would appear to be violated by not burning it if I don't mail the letter”.

The “Paradox” can be understood as another example of the inadequacy of logical consequence for dealing with problems of satisfying obligations. Here is a formulation of the paradox as a goal satisfaction problem  $\langle G, M_0, W, \prec \rangle$ :

$$\begin{aligned} G &= \{\text{mail}, \neg \text{burn}\} \\ M_0 &= \{\} \\ W &= \{M_0 \cup \Delta \mid \Delta \subseteq A\} \text{ where } A = \{\text{mail}, \text{burn}\} \\ &= \{\{\}, \{\text{mail}\}, \{\text{burn}\}, \{\text{mail}, \text{burn}\}\} \\ \prec &= \{\}. \end{aligned}$$

$P = \{\}$  and  $M_0$  is the minimal model of  $P$ .

$M = \{\text{mail}\}$  is the only minimal model that satisfies  $G$ . But  $\text{mail} \vee \text{burn}$  is true in  $M$ . So satisfying  $G$ , entails satisfying  $\text{mail} \vee \text{burn}$ . But, contrary to suggestions that may be associated with the fact that **O [mail  $\vee$  burn]** is a logical consequence of **O mail**, satisfying the goal  $\text{mail} \vee \text{burn}$  does not satisfy the goal  $\text{mail}$ .

Viewed in this way, Ross's Paradox is not a paradox at all, but rather, as Fox [4] also argues, a confusion between satisfying an obligation and implying that one obligation is a logical consequence of another.

#### 5 Chisholm's Paradox

Ross's Paradox and the map colouring problem do not show the need for preferences between alternative models. However, the need for preferences arises with Chisholm's Paradox [2]:

It *ought* to be that Jones goes to assist his neighbours.  
 It *ought* to be that, if Jones goes, then he tells them he is coming.  
 If Jones doesn't go, then he *ought not* tell them he is coming.  
 Jones doesn't go.

i.e.

<b>O</b>	<i>go</i>
<b>O</b>	$(go \rightarrow tell)$
	$\neg go \rightarrow O \neg tell$
	$\neg go$

Much of the discussion [1] in the deontic logic literature concerns the problems that arise with alternative representations of the conditional obligations in the second and third sentences. I will not repeat this discussion here, but will present the example as a normative goal satisfaction problem  $\langle G, M_0, W, \triangleleft \rangle$ :

$$\begin{aligned}
 G &= \{go \rightarrow tell, \neg go \rightarrow \neg tell\} \\
 M_0 &= \{\} \\
 W &= \{M_0 \cup \Delta \mid \Delta \subseteq A\} \text{ where } A = \{go, tell\} \\
 &= \{\{\}, \{go\}, \{tell\}, \{go, tell\}\} \\
 M &\triangleleft M' \text{ if } go \notin M \text{ and } go \in M'.
 \end{aligned}$$

Here the “obligation” for Jones to *go* is represented by the preference for models in which *go* is true over models in which *go* is false. There are two models  $M_1 = \{\}$  and  $M_2 = \{go, tell\}$  that make  $G$  true. But  $M_2$  is better than  $M_1$ . So only  $M_2$  satisfies  $\langle G, M_0, W, \triangleleft \rangle$ . This means that Jones must *go* and *tell*.

Now suppose that Jones doesn't go. We can represent this simply by removing *go* from the candidate actions  $A$ , updating the problem to  $\langle G, M_0, W', \triangleleft \rangle$  where  $W' = \{\{\}, \{tell\}\}$ . The only (and best) candidate model that now satisfies the updated problem is the less than ideal model  $M_1 = \{\}$ , which means that Jones must *not tell*, as is intuitively correct.

In a more realistic representation with explicit time, when we discover that Jones doesn't go, we would update  $M_0$  to a new world history in which *going* is no longer an option. Notice that, in any case, whether we update  $M_0$ ,  $W$  or both, the solution of the updated problem changes, even though the goals remain the same. This gives the satisfiability problem for FOL a non-monotonic character, even though logical consequence itself is monotonic.

## 6 LPS (Logical Production System)

The logic and computer language LPS [6, 7], is a scaled-down implementation of ALP, intended for practical applications of goal satisfaction. Goals in LPS have the simplified logical form of rules *antecedent*  $\rightarrow$  *consequent*, which are similar to condition-action rules in production systems [13]. All variables in the *antecedent* of a rule are universally quantified with scope the entire rule, and all variables in the *consequent* but not in the *antecedent* are existentially quantified with scope the *consequent* of the rule. Variables include time variables, and all times in the *consequent* are later than or equal to all times in the *antecedent*.

Computation in LPS generates a sequence  $M_0 \subseteq \dots M_{i-1} \subseteq M_i \subseteq \dots$  of partial histories, which in the limit determines a model  $M = M_0 \cup \dots M_{i-1} \cup M_i \cup \dots$  which makes all the goals true. Each history  $M_i$  is obtained from the previous history  $M_{i-1}$  by updating  $M_{i-1}$  with the set of all actions and external events that take place between  $M_{i-1}$  and  $M_i$ . These updates are performed destructively, like change of state in the real world, and like destructive updates in imperative computer languages.

Computation in LPS gives rules both a logical and imperative interpretation. Whenever any instance of an *antecedent* of a rule becomes true in  $M_i$ , forward

reasoning treats the corresponding instance of the *consequent* of the rule as a command to perform actions, to make the instance of the *consequent* true in some future  $M_j$ ,  $j \geq i+1$ .

Clauses  $\text{conclusion} \leftarrow \text{conditions}$  in LP also have both a logical and imperative interpretation. In addition to their purely logical interpretation, they have an imperative interpretation as procedures, which use backward reasoning to decompose a goal of determining whether a *conclusion* is true or of making a *conclusion* true to the subgoal of determining or making the *conditions* true. *Conditions* representing actions are made true by adding them to future histories  $M_j$ .

Preference between models in the current implementation can be indicated only by the order in which clauses are written. This gives preference to models generated by clauses written earlier over models generated by clauses written later. There is also an in-built preference for models that satisfy goals as soon as possible.

An online implementation of LPS is accessible from <http://lps.doc.ic.ac.uk/>. The *LPS examples* notebook in the examples menu contains executable links to the map colouring problem, and to several other examples having a deontic goal satisfaction interpretation. The *first steps* notebook goes through an example in which two agents have conflicting goals. Agent bob wants the light on whenever he is in a room, and agent dad wants the light off in any room where the light is on. It may be natural to think of bob's goal as a personal goal, and dad's goal as an obligation. But LPS makes no distinction between the two kinds of goals.

## 7 Conclusions

In this short paper, I have formulated deontic reasoning in ALP as goal satisfaction in FOL, with the A and LP components of ALP used to define the space of candidate models. I have argued that backward reasoning with LP overcomes the need to generate complete models, and makes it possible to avoid generating candidate actions blindly without relevance to the goals that need to be satisfied. I have also argued that, for philosophical applications, the focus on goal satisfaction in ALP is more useful than the focus on logical consequence in modal deontic logic.

## References

1. Carmo, J. and Jones, A. J. (2002) Deontic logic and contrary-to-duties. *Handbook of philosophical logic*. Springer.
2. Chisholm, R. M. (1963) Contrary-to-Duty Imperatives and Deontic Logic. *Analysis*.
3. van Emden, M. H., & Kowalski, R. A. (1976) The semantics of predicate logic as a programming language. *JACM*.
4. Fox, C. (2015) The Semantics of Imperatives. *The Handbook of Contemporary Semantic Theory*, 3, 433-469.
5. Hansson, B. (1969) An analysis of some deontic logics. *Nous*.
6. Kowalski, R. and Sadri, F. (2014) A logical characterization of a reactive system language. *Proceedings of RuleML 2014*, Springer Verlag.
7. Kowalski, R. and Sadri, F. (2016) Programming in logic without logic programming. *Theory and Practice of Logic Programming*, 16(3), 269-295.
8. Kowalski, R. and Satoh, K. (2017) Obligation as optimal goal satisfaction. *Journal of Philosophical Logic*, Springer.  
<https://link.springer.com/article/10.1007/s10992-017-9440-3>
9. Kowalski, R. (1974) Predicate logic as programming language. In *IFIP congress Vol. 74*, 569-544.
10. Kowalski, R. (2011) *Computational logic and human thinking: how to be artificially intelligent*. Cambridge University Press.

11. McNamara, P. (2006) Deontic logic. *Handbook of the History of Logic*, 7, 197-289.
12. Ross, A. (1941) Imperatives and Logic. *Theoria*, 7, 53–71.
13. Simon, H. (2001) Production systems. In *The MIT encyclopedia of the cognitive sciences*. MIT press.
14. van Benthem, J., Grossi, D. and Liu, F. (2014) Priority structures in deontic logic. *Theoria*