Hintikka's World: scalable higher-order knowledge

 $\textbf{Tristan Charrier}^{1*}\,,\,\,\textbf{S\'ebastien Gamblin}^2\,,\,\,\textbf{Alexandre Niveau}^{2,3}\,\,\,\text{and}\,\,\,\textbf{François Schwarzentruber}^4$

¹First Affiliation

²Second Affiliation

³Third Affiliation

⁴Fourth Affiliation

{first, second}@example.com, third@other.example.com, fourth@example.com

Abstract

Hintikka's World is a tool that shows how artificial agents can reason about higher-order knowledge (agent a knows that agent b knows that...). In this demonstration paper, we present symbolic models that enables to implement in Hintikka's World large examples such as real card games.

1 Introduction

The current trend is to construct programs that play games with imperfect information, for instance Hanabi [Bard et al., 2019], but also video games such as Starcraft 2 [Hu et al., 2018] An important ingredient is to reason about higher-order knowledge (an agent knows that another agents knows that...). That is why we claim that epistemic logic and its dynamic extension, Dynamic epistemic logic ([Baltag et al., 1998], [van Ditmarsch et al., 2008]), may offer a formal tool to provide explanation in such AI programs. needs to be understood is relevant in AI, especially in strategic reasoning [Aumann, 1999].

The only tool we are aware of that enables to see and explore mental states of agents is *Hintikka's world* and was presented at ECAI-IJCAI 2018 [Schwarzentruber, 2018]. *Hintikka's world* is a proof of concept of a graphical user interface that represent Kripke models by comic strips, as shown in Figure 1. The tool is available at the following address: http://hintikkasworld.irisa.fr/.

Kripke models are graphs and they were represented explicitly in memory in the first version of the tool. Explicit models are useful to learn how dynamic epistemic logic works by means of toy examples: muddy children, Sally and Anne [Wimmer and Perner, 1983], etc. However, in real card games, such as Hanabi, there are possible configurations of cards. Thus, it is impossible to represent the full graph in memory: the first version of Hintikka's world does not *scale*.

That is why, we proposed to represent Kripke models symbolically by means of Binary Decision Diagrams as it was done in the tool DEMO¹ [van Benthem *et al.*, 2015].

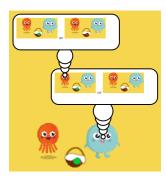


Figure 1: Graphical user interface of Hintikka's world

2 Symbolic models

TODO TIRSTAN

3 Demonstration Outline

TODO expliquer Hanabi et comment on peut y jouer

3.1 Already Implemented Examples

3.2 User Interaction

The tool adopts the point of view of Halpern and Vardi for modeling an epistemic situation: model checking is more suitable than theorem proving [Halpern and Vardi, 1991]. In other words, the current situation is modeled as a pointed Kripke model. By clicking on a given agent a, the interface opens a thought bubble that displays the possible worlds for agent a. Actually, the comic strips shows the unfolding of the current pointed Kripke model that represents the current situation.

On the left, the software shows buttons for possible actions (public announcement, public actions, private actions, etc.). Actions are modeled by pointed event models of Dynamic epistemic logic [Baltag *et al.*, 1998]. By clicking on a button, the corresponding action is executed: the product of the pointed Kripke model and the pointed event model becomes the current pointed Kripke model.

3.3 Building New Examples

The tool also allows the final user to building their own examples. They are two ways to specify a new epistemic situation.

^{*}Contact Author

¹The current implementation does not rely on DEMO since their work is not well-suited for a web application.

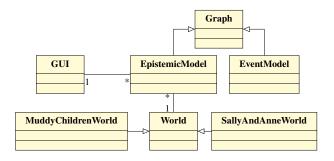


Figure 2: Architecture for the symbolic approach in *Hintikka's* world

First, the user can describe the initial pointed Kripke model in JavaScript, by giving the list of worlds, their valuations and the epistemic relations. Second, the user can specify the initial situation by a formula ϕ epistemic logic. The BNF is:

$$\phi := p \mid (\mathtt{not} \ \phi) \mid (\phi \ \mathtt{and} \ \phi) \mid (\phi \ \mathtt{or} \ \phi) \\ \mid (\mathtt{K} \ \mathtt{a} \ \phi) \mid (\mathtt{Kpos} \ \mathtt{a} \ \phi) \mid (\mathtt{CK} \ \mathtt{G} \ \phi) \mid (\mathtt{CKpos} \ \mathtt{G} \ \phi)$$

where p is an atomic proposition, a is an agent and G is a group of agents. E.g. 'p does not holds but agent a imagines that it is possible that p holds' (((Kpos a p) and (not p))), agent a and b commonly know that agent c does not know the value of p ((CK (a b) ((not (K b p)) and (not (K b (not p))))), etc. The user writes a set of formulas, one formula per line. Then the system solves the satisfiability problem and generates a pointed epistemic model.

4 System Description

TODO Expliquer comment c'est FAIT

4.1 Class Architecture

Figure 2 shows the main part of the architecture of *Hintikka's world*. The interesting part is the fact that the graphical user interface (GUI) is independent from the current example that is running (muddy children, Sally and Anne, etc.). In particular, adding a new example only requires to add a new class that inherits from World and to implement the method for drawing the scene from data (valuations, numbers, etc.) that are members of the class.

4.2 Model Checking

The tool highly rely on model checking. Indeed, for instance, performing the public announcement of ϕ requires to compute the subset of worlds in which ϕ holds and to prune the current Kripke model. We chose to write the model checking procedure in Javascript. Since model checking is in PTIME – thus is an easy task – and is used intensively, it suitable to run run it on the client-side for performance reasons.

4.3 Satisfiability Problem

5 Future Work

TODO implémzenter d'autres exemples etc.

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