# PHIL 222 Philosophical Foundations of Computer Science Week 11, Tuesday

Nov. 5, 2024

# Epistemology (2) Multi-Agent Systems and AI: The "Problem of Logical Omniscience" (cont'd)

• If  $\varphi_1, \ldots, \varphi_n \Rightarrow \psi$  is provable, then so is

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Thus we have proven this!

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-knows-(*A*-and-*B*),  $\beta$ -knows-(if-(*B*-or-*C*)-then-*D*)  $\Longrightarrow$   $\beta$ -knows-*D*.

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Thus, " $\beta$  knows that  $\psi$ " is true in every possibility where " $\beta$  knows that  $\varphi_1$ ", . . . , " $\beta$  knows that  $\varphi_n$ " are all true.

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## means logical omniscience:

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- E.g.,  $\beta$  knows the optimal solution in the travelling salesman problem (which is at least as hard as SAT!).
- Something even worse may hold in the partition model:  $\beta$  knows all the mathematical truths (e.g. which Turing machine halts on which input), since they are true in all the states.

We usually do not think human agents have such inference power.

The first of famous examples may be the case of geometry we saw in Plato's *Meno* (Socrates in black, Meno in red, a boy in green):

"Tell me now, boy, you know that a square figure is like this?" "I do." "A square then is a figure in which all these four sides are equal?" "Yes indeed." [...] "How many feet is twice two feet? Work it out and tell me." "Four, Socrates." "Now we could have another figure twice the size of this one, with the four sides equal like this one." "Yes." "How many feet will that be?" "Eight." "Come now, try to tell me how long each side of this will be. The side of this is two feet. What about each side of the one which is its double?" "Obviously, Socrates, it will be twice the length." "You see, Meno, that I am not teaching the boy anything, but all I do is question him. And now he thinks he knows the length of the line on which an eight-foot figure is based. Do you agree?" "I do." "And does he know?" "Certainly not." [82b-e]

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This is reflected in the following remark by Herlihy et al.:

Here, too, there are many problems that are not computable, but these computability failures reflect the difficulty of making decisions in the face of ambiguity and have little to do with the inherent computational power of individual participants. [p. 11] The logic of "knows that" we reviewed admits logical omniscience, and therefore does not seem to be a realistic model of either

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Thus, logical omniscience is out of the scope of the theory of distributed computing. — But does it mean that it is not problematic in distributed computing?

Stalnaker (1999), "The Problem of Logical Omniscience, II":

As distributed systems theorists have emphasized, their conception of knowledge is an externalist one in the sense that the content of a knowledge claim is characterized from the point of view of the theorist, and not of the knower. The language of the epistemic logic [logic of "knows that"] talks about what processors know, but it is not intended to model the knower's way of expressing or representing what it knows. The content clause in a knowledge attribution in this language is the attributor's way of expressing the information about the system that, according to the attribution, is reflected in the local state of the knower. [p. 258, emphasis KK]

One might think that the uncompromising externalism that I have been illustrating is one of the features that distinguishes the simplified, perhaps metaphorical, conception of knowledge used in distributed systems theory from a realistic conception [...] and that perhaps this feature explains why, in the distributed systems sense of "know," even simple processors with no computational capacities at all know all the logical consequences of their knowledge, while in the sense of "know" we ordinarily use, even the most brilliant logician does not.

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Nor is it reasonable to take a knowledge attribution to make a claim about the form in which the knowledge is stored. The form in which information is stored — the structure of the local states of knowers in virtue of which they are correctly described as knowing things — will have an effect on the availability of the knowledge, but it is the notion of availability itself, and not what may influence it, that we need to get clear about to understand the problem of logical omniscience.

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[p. 260, emphasis KK]

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Thus, the question of what knowledge is available can be essential when, e.g., designing protocols for distributed computing.

The same has been observed in expected utility theory — a theory that is also essential to distributed computing (cf. Vlassis, Ch. 2).

## Savage 1967:

The analysis should be careful not to prove too much; for some departures from theory are inevitable, and some even laudable. For example, a person required to risk money on a remote digit of  $\pi$ would, in order to comply fully with the theory, have to compute that digit, though this would really be wasteful if the cost of computation were more than the prize involved. For the postulates of the theory imply that you should behave in accordance with the logical implication of all that you know. Is it possible to improve the theory in this respect, making allowances within it for the cost of thinking, or would that entail paradox, as I am inclined to believe but unable to demonstrate?

## (Quoted from

https://plato.stanford.edu/entries/bounded-rationality/)

We saw an example of a logically not omniscient agent in Plato's *Meno* (Socrates in black, Meno in red, a boy in green):

"Come now, try to tell me how long each side of this will be. The side of this is two feet. What about each side of the one which is its double?" "Obviously, Socrates, it will be twice the length." "You see, Meno, that I am not teaching the boy anything, but all I do is question him. And now he thinks he knows the length of the line on which an eight-foot figure is based. Do you agree?" "I do." "And does he know?" "Certainly not."

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Indeed, Plato gives two themes that computer scientists incorporate in their approaches to logical omniscience based on their distinction between **explicit** and **implicit knowledge**. Let's observe these themes, the computer scientists' approaches — and Stalnaker's criticisms.

"Watch him now recollecting things in order, as one must recollect. Tell me, boy, [...] Well, let us draw from it four equal lines, and surely that is what you say is the eight-foot square?" "Certainly." [...]

"Does not this line from one corner to the other cut each of these figures in two? "Yes." "So these are four equal lines which enclose this figure? "They are." "Consider now: how large is the figure? "I do not understand." "Within these four figures, each line cuts off half of each, does it not? "Yes." "How many of this size are there in this figure? "Four." "How many in this? "Two." "What is the relation of four to two? "Double." "How many feet in this? "Eight." "Based on what line? "This one." "That is, on the line that stretches from corner to corner of the four-foot figure? "Yes." "Clever men call this the diagonal, so that if diagonal is its name, you say that the double figure would be that based on the diagonal? "Most certainly, Socrates." [85a-85b]

"What do you think, Meno? Has he, in his answers, expressed any opinion that was not his own?" "No, they were all his own." "And yet, as we said a short time ago, he did not know?" "That is true." "So these opinions were in him, were they not?" "Yes." "So the man who does not know has within himself true opinions about the things that he does not know?" "So it appears." "These opinions have now just been stirred up like a dream, but if he were repeatedly asked these same questions in various ways, you know that in the end his knowledge about these things would be as accurate as anyone's." "It is likely." "And he will know it without having been taught but only questioned, and find the knowledge within himself?" "Yes." "And is not finding knowledge within oneself recollection?" "Certainly." [85b-d]

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• Hyp: if-(*B*-or-*C*)-then-*D* 

• Hyp: *A*-and-*B* 

• Hyp: if-(*B*-or-*C*)-then-*D* 

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• *B* • *B*-or-*C* 

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- Hyp:  $\beta$ -knows-(A-and-B)
- Hyp:  $\beta$ -knows-(if-(B-or-C)-then-D)
- $\beta$ -knows-B  $\beta$ -knows-(B-or-C)
- ∴  $\beta$ -knows-D

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• Hyp: A-and-B

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• B • B-or-C

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Plato claims that every person is logically omniscient in the sense of "having within himself", while ordinary knowing is recollecting — computer scientists may see them as implicit & explicit knowledge.

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2 "These opinions have now just been stirred up like a dream, but if he were repeatedly asked these same questions in various ways, you know that in the end his knowledge about these things would be as accurate as anyone's."

Plato argues that questions help turn implicit knowledge explicit.

Computer scientists formalize, e.g.

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ARTIFICIAL INTELLIGENCE

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# Belief, Awareness, and Limited Reasoning\*

### Ronald Fagin and Joseph Y. Halpern

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Recommended by Daniel G. Bobrow

#### ABSTRACT

Several new logics for belief and knowledge are introduced and studied, all of which have the property that agents are not logically omniscient. In particular, in the solicy, the set of beliefs of an articular particular, in the solicy, the set of beliefs of the agent does not necessarily contain all valid formulas. Thus, these logics are more suitable than a readitional logics for modelling beliefs of plumans (or machines) with limited reasoning capabilities. Our first logic is essentially on extension of Lewesque's logic of implicit and explicit belief, where we extend to allow multiple agents and higher-level belief (i. e., beliefs about beliefs). Our excend logic plum the property of the sevent of the property of the pro

The animal knows, of course. But it certainly does not know that it knows.

Teilhard de Chardin

### 1. Introduction

There has long been interest in both philosophy and AI in finding natural semantics for logics of knowledge and belief. The standard approach has been the so-called possible-worlds model. The intuitive idea, which poes back to

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We can then entertain various inference rules: e.g.,

- " $\alpha$ -is-aware-of- $\varphi$ "  $\iff$  " $\alpha$ -is-aware-of-(not- $\varphi$ )",
- " $\alpha$ -is-aware-of-( $\varphi$ -and- $\psi$ )"  $\Longrightarrow$  " $\alpha$ -is-aware-of- $\varphi$ ",
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Then define " $\alpha$  explicitly knows that  $\varphi$ "

 $\iff$  ( $\alpha$ -knows-that- $\varphi$ )-and-( $\alpha$ -is-aware-of- $\varphi$ ).

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So, given any logical truth  $\varphi$ ,  $\alpha$  knows that  $\varphi$ , but maybe only implicitly and not explicitly, since  $\alpha$  may not be aware of  $\varphi$ .