

# Symbolic Verification of Epistemic Properties in Programs

Ioana Boureanu (Univ. of Surrey, SCCS)

joint work @ IJCAI 2017,  
with N. Gorogiannis (Middlesex, Facebook) and F. Raimondi  
(Middlesex, Amazon)

# Asking you...



**Motivation & Aim**

**Program-Epistemic Logic**

**Verification of Program-Epistemic Logic**

**Practical Experimentation**

**Conclusions**

# Motivation

- ▶ epistemic logics, i.e., logics of knowledge – “knowing logical facts” → expressions of rich properties (e.g., unlinkability, anonymity)
- ▶ widely used in verification of general-purpose concurrent & distributed SYSTEMS (e.g., Byzantine agreement) via epistemic model checkers such as MCMAS, Verics, MCK, etc....

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The screenshot shows a Google Scholar search interface. The search bar contains the text "epistemic model checking" and shows "About 63,600 results (0.09 sec)". Below the search bar, there are two article entries. The first entry is titled "Verifying epistemic properties of multi-agent systems via bounded model checking" by W. Penczek and A. Lomuscio, published in Fundamenta Informaticae, 2003. The second entry is titled "MCMAS: A model checker for the verification of multi-agent systems" by A. Lomuscio, H. Qu, and F. Raimondi, published in International conference on computer ..., 2009. Both entries include a brief description of the work and links for citation and related articles.

Google Scholar

epistemic model checking

Articles About 63,600 results (0.09 sec)

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Verifying **epistemic** properties of multi-agent systems via bounded **model checking**  
W. Penczek, A. Lomuscio - Fundamenta Informaticae, 2003 - content.iopress.com  
We present a framework for verifying temporal and **epistemic** properties of multi-agent systems by means of bounded **model checking**. We use interpreted systems as underlying semantics. We give details of the proposed technique, and show how it can be applied to ...  
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MCMAS: A **model checker** for the verification of multi-agent systems  
A. Lomuscio, H. Qu, F. Raimondi - International conference on computer ..., 2009 - Springer ... now enables the user to write code that naturally generates smaller **models**, eg. by using ... BMC based approaches for **epistemic** modalities have also been presented [6]: a comparison with [8 ... F., Lomuscio, A.: Automatic verification of multi-agent systems by **model check**-ing via ...  
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- ▶ epistemic logics widely used in systems' model checkers systems BUT...



- ▶ :( these are not epistemic specifications on program code
- ▶ :( it is hard to capture rich (e.g., first-order) state specifications, since the base logic of most temporal-epistemic verifiers is propositional
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- ▶ be able to verify epistemic properties of programs
- ▶ agents can OBSERVE certain program variables
- ▶ the program (i.e., state-transition relation) is KNOWN to all agents
- ▶ focus on *S5-like epistemic properties about program states*

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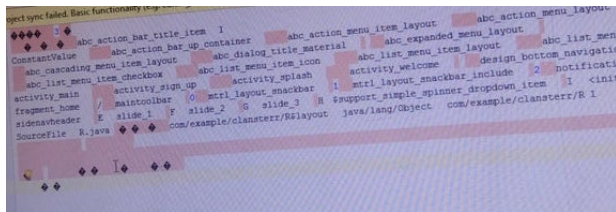
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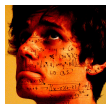
**Verification of Program-Epistemic Logic**

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- ▶  $\mathcal{A}$  a finite set of *agents* or program-observers
- ▶  $\mathcal{V}$  a countable set of variables
- ▶  $\mathbf{p} \subseteq \mathcal{V}$  a non-empty set of *program variables*
- ▶  $\mathbf{o}_A \subseteq \mathbf{p}$  the variables the agent  $A \in \mathcal{A}$  can *observe*
- ▶  $\mathbf{n}_A = \mathbf{p} \setminus \mathbf{o}_A$  variables agent  $A \in \mathcal{A}$  *cannot observe*





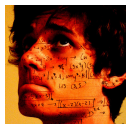
- ▶  $\mathcal{L}_{QF}$       *base language* = a quantifier-free, FO language
- ▶  $\mathcal{L}_{FO}$       extension of  $\mathcal{L}_{QF}$  with quantifiers

$$\phi ::= \pi \mid \neg\phi \mid \phi_1 \wedge \phi_2 \mid \phi_1 \vee \phi_2 \mid \phi_1 \Rightarrow \phi_2 \mid \forall x. \phi \mid \exists x. \phi$$

- ▶  $\mathcal{L}_K$       extension of  $\mathcal{L}_{QF}$  with epistemic modalities  $K_A$

$$\alpha ::= \pi \mid \neg\alpha \mid \alpha_1 \wedge \alpha_2 \mid \alpha_1 \vee \alpha_2 \mid \alpha_1 \Rightarrow \alpha_2 \mid K_A \alpha$$

# Program-Epistemic Specifications $\mathcal{L}_{\square K}$



- ▶  $\mathcal{C}$  a (possibly infinite) set of *commands*
- ▶  $\mathcal{L}_{\square K}$  extends  $\mathcal{L}_K$  with every formula  $\beta = \square_C \alpha$ , meaning “at all final states of  $C$ ,  $\alpha$  holds”

## Example

“at the end of the vote-counting, a partial observer (who can see certain aspects of the program) does not know that voter 1 vote for candidate 1”:

$$\square_{EVotingProgram} \neg K_{public-observer} V_{1,1},$$

where  $V_{1,1}$  is a formula in  $\mathcal{L}_{QF}$  which here is linear integer arithmetic.

# First-order Semantics

▶ *state*

$s : \mathcal{V} \rightarrow \mathcal{D}$ .

▶ set of all states

$\mathcal{U}$

$s \models \pi \iff$  in accordance to interpretation  $I$

$s \models \phi_1 \circ \phi_2 \iff (s \models \phi_1) \circ (s \models \phi_2)$

$s \models \neg\phi \iff s \not\models \phi$

$s \models \exists x.\phi \iff \exists c \in \mathcal{D}. s[x \mapsto c] \models \phi$

$s \models \forall x.\phi \iff \forall c \in \mathcal{D}. s[x \mapsto c] \models \phi.$

where  $\circ$  is  $\wedge$ ,  $\vee$  or  $\Rightarrow$ , and  $I$  is an interpretation of constants, functions and predicates in  $\mathcal{L}_{\text{QF}}$  over the domain  $\mathcal{D}$ .

The *interpretation*  $\llbracket \phi \rrbracket$  of a first-order formula  $\phi$  is the set of states satisfying it, i.e.,  $\llbracket \phi \rrbracket = \{s \in \mathcal{U} \mid s \models \phi\}$

# Towards a Program-Epistemic Semantics

- ▶ Indistinguishability relation  $\sim_X$  over states

$$s \sim_X s' \iff \forall x \in X. (s(x) = s'(x)),$$

where  $X \subseteq \mathcal{V}$

- ▶ *Transition relation (over states) of any command  $C$*

$$R_C(s) = \{s' \mid (s, s') \in R_C\} \quad R_C(W) = \bigcup_{s \in W} R_C(s)$$

- ▶ *strongest postcondition operator* is a partial function  
 $SP(-, -) : \mathcal{L}_{FO} \times \mathcal{C} \rightarrow \mathcal{L}_{FO}$

$$SP(\phi, C) = \psi \quad \text{iff} \quad \llbracket \psi \rrbracket = R_C(\llbracket \phi \rrbracket)$$

# Interpretation of a program specification $\beta$

The satisfaction relation  $W, s \Vdash \beta$

$$\begin{aligned}W, s \Vdash \pi &\iff s \models \pi \\W, s \Vdash \neg\alpha &\iff W, s \not\Vdash \alpha \\W, s \Vdash \alpha_1 \circ \alpha_2 &\iff (W, s \Vdash \alpha_1) \circ (W, s \Vdash \alpha_2) \\W, s \Vdash K_A\alpha &\iff \forall s' \in W. (s \sim_{o_A} s' \implies W, s' \Vdash \alpha) \\W, s \Vdash \Box_C\alpha &\iff \forall s' \in R_C(s). (R_C(W), s' \Vdash \alpha)\end{aligned}$$

where  $\circ$  is  $\wedge$ ,  $\vee$ , or  $\implies$ , and  $C \in \mathcal{C}$  is a command.

- ▶ **Validity of program specifications  $\phi \Vdash \beta$**   
for all  $s \in \llbracket \phi \rrbracket$ , we have that  $\llbracket \phi \rrbracket, s \Vdash \beta$ .

$\phi \Vdash K_A\pi$  means that in all states satisfying  $\phi$ , agent  $A$  knows  $\pi$

$\phi \Vdash \Box_C\neg K_A\pi$  means: if command  $C$  starts at a state satisfying  $\phi$ , then in all states where the execution finishes, agent  $A$  does not know  $\pi$

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# Reducing to First-Order Validity



- ▶ Recall: *strongest postcondition operator* is a partial function  $SP(-, -) : \mathcal{L}_{FO} \times \mathcal{C} \rightarrow \mathcal{L}_{FO}$

$$SP(\phi, C) = \psi \quad \text{iff} \quad \llbracket \psi \rrbracket = R_C(\llbracket \phi \rrbracket)$$

If the *strongest postcondition operator* is computable for the chosen base logic/programming language, then **validity of program-epistemic specifications reduces to validity in first-order fragments** (such as QBF and Presburger arithmetic).

... a translation  $\tau : \mathcal{L}_K \rightarrow \mathcal{L}_{FO}$  of epistemic formulas into the first-order language.

$$\begin{array}{ll} \tau(\phi, \pi) = \pi & \tau(\phi, \alpha_1 \circ \alpha_2) = \tau(\phi, \alpha_1) \circ \tau(\phi, \alpha_2) \\ \tau(\phi, \neg\alpha) = \neg\tau(\phi, \alpha) & \tau(\phi, K_A\alpha) = \forall \mathbf{n}_A. (\phi \Rightarrow \tau(\phi, \alpha)) \end{array}$$

# Over-approximation

- ▶ Recall: *strongest postcondition operator* is a partial function  $SP(-, -) : \mathcal{L}_{FO} \times \mathcal{C} \rightarrow \mathcal{L}_{FO}$

$$SP(\phi, C) = \psi \quad \text{iff} \quad \llbracket \psi \rrbracket = R_C(\llbracket \phi \rrbracket)$$

- ▶ a function  $f : \mathcal{L}_{FO} \times \mathcal{C} \rightarrow \mathcal{L}_{FO}$  *over-approximates the strongest postcondition* iff ...  $\llbracket f(\phi, C) \rrbracket \supseteq R_C(\llbracket \phi \rrbracket)$  for all  $\phi \in \mathcal{L}_{FO}$  and  $C \in \mathcal{C}$



When the **strongest postcondition can only be over-approximated** (such as in programming languages with unbounded loops), we show that the validity of *positive* epistemic specifications reduces to that of first-order fragments, in a sound but incomplete way.



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# Simple, Loop-Free Programming Language

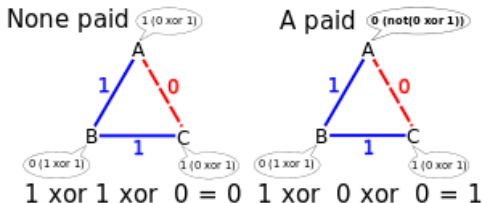
Command $C$	$SP(\phi, C)$
$x := *$	$\exists y. \phi[y/x]$
$x := e$	$\exists y. (x = e[y/x] \wedge \phi[y/x])$
$\text{if}(\pi) C_1 \text{ else } C_2$	$SP(\pi \wedge \phi, C_1) \vee SP(\neg\pi \wedge \phi, C_2)$
$C_1; C_2$	$SP(SP(\phi, C_1), C_2),$

where  $x$  is a program variable and  $y$  is a fresh logical variable.

- ▶  $SP(-, -)$  may only introduce existential quantifiers.
- ▶ If  $x \notin FV(\phi)$ , then  $SP(\phi, x := e) = (\phi \wedge x = e)$ . That is, if  $x$  is unrestricted, no quantifiers are introduced.
- ▶ For a fixed  $C$ , the size of  $SP(\phi, C)$  is polynomial in  $\|\phi\|$ .

# An Example – The Dining Cryptographers

- used as evaluation case-study in verifying epistemic properties



- dinner may have been paid by their employer, or by one of the agents.
- reveal whether one of the agents paid, but without revealing which one.
- each pair of adjacent agents sees a coin
- each announces the result of XORing three Booleans: the two coins observable by her and the status of whether she paid for the dinner.
- the XOR of all announcements is proven to be equal to the disjunction of whether any agent paid.

# Instantiation

*agents*

$$\mathcal{A} = \{0, \dots, n-1\}$$

*program variables*

$$\mathbf{p} = \{x\} \cup \{p_i, c_i \mid 0 \leq i < n\},$$

$x$  is the XOR of announcements;  $p_i$  encodes whether agent  $i$  has paid; and,  $c_i$  encodes the coin shared between agents  $i-1$  and  $i$ .

*observable variables by  $i \in \mathcal{A}$*

$$\mathbf{o}_i = \{x, p_i, c_i, c_{i+1 \bmod n}\},$$
$$\mathbf{n}_i = \mathbf{p} \setminus \mathbf{o}_i.$$

*protocol = an assignment  $C$ :*

$$x := \bigoplus_{i=0}^{n-1} p_i \oplus c_i \oplus c_{(i+1 \bmod n)} \quad (C)$$

*initial states,  $I$  == at most one agent paid*

$$I = \bigwedge_{i=0}^{n-1} \left( p_i \Rightarrow \bigwedge_{j=0, j \neq i}^{n-1} \neg p_j \right)$$

*strongest postcondition*

$$SP(I, C) = I \wedge \left( x \Leftrightarrow \bigoplus_{i=0}^{n-1} p_i \oplus c_i \oplus c_{(i+1 \bmod n)} \right)$$

# Specifications

$$\alpha_1 = \neg p_0 \Rightarrow \left( (K_0 \wedge_{i=0}^{n-1} \neg p_i) \vee (\wedge_{i=1}^{n-1} \neg K_0 p_i) \right)$$

if agent 0 has not paid then she knows that no agent paid, or (in case an agent paid) she does not know which one.

$$\alpha_2 = K_0 \left( x \Leftrightarrow \bigvee_{i=0}^{n-1} p_i \right)$$

agent 0 knows that  $x$  is true iff one of the agents paid.

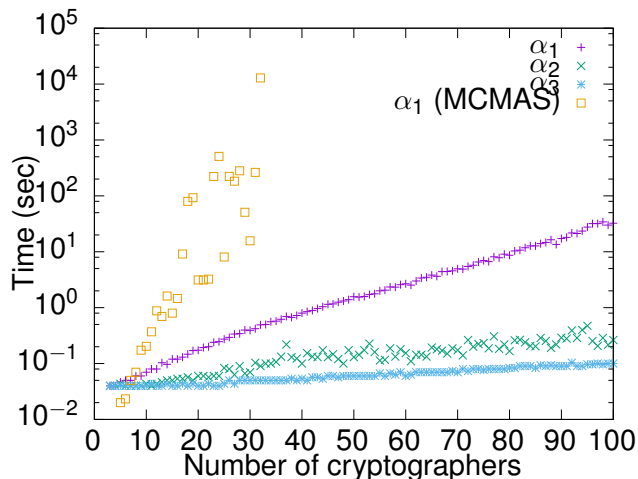
$$\alpha_3 = K_0 p_1$$

agent 0 knows that agent 1 has paid

To verify  $I \models \Box_C \alpha_1$ ,  $I \models \Box_C \alpha_2$  and  $I \not\models \Box_C \alpha_3$

We construct the QBF formula  $SP(I, C) \wedge \neg \tau(SP(I, C), \alpha_j)$ , feed it to Z3, and test for unsatisfiability, as per our results.

# Experimental Results

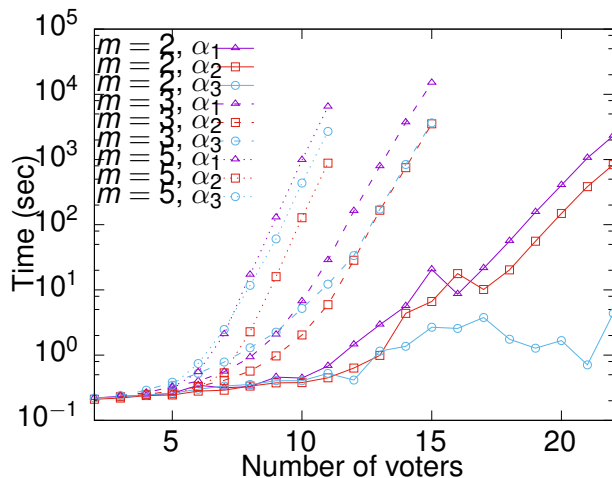


- (i) MCMAS is faster, or equally fast, for  $n \leq 7$ , but slower for all  $n > 7$ ;
- (ii) we can be faster than MCMAS by a factor of  $> 100$  (e.g., when  $n = 32$ ) when checking  $\alpha_1$ , whilst when verifying  $\alpha_3$  our speed-up is of several orders of magnitudes.

exp. specs.: a 4-core 2.4 GHz Intel Core i7 MacBook Pro with 16 GB of RAM running OS X 10.11.6. The version of MCMAS is 1.2.2 and Z3 is 4.5.1; both tools have been compiled from source on the target machine.

## More ...

- ▶ a more complicated example on the ThreeBallot voting protocol (e.g.,  $\mathcal{L}_{FO}$  moved from QBFs to Presburger arithmetics. )



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# Take-home Message

- ▶ we gave *program-epistemic* specifications, expressing requirements that given epistemic properties hold on all final states of the program.
- ▶ we have an efficient method of reducing the validity of program-epistemic specifications to appropriate queries to tools such as SMT solvers
- ▶ we traded off temporal expressivity, to deal with arbitrary programming languages
- ▶ space for improvements... in temporal operators, common knowledge, translations modulo bespoke semantics...

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Thank you

... for listening....



[i.boureau@surrey.ac.uk](mailto:i.boureau@surrey.ac.uk)

# Cheeky Slide...

- ▶ Do you know a British national who wishes to do a **PhD in formal verification of privacy** (GBP 22k/year stipend, NCSC project, with BT and the 5G Innovation Centre)?

<https://www.jobs.ac.uk/job/BTV392/phd-studentship-opportunity-security-analysis-of>

- ▶ Do you know a prospective **postdoc in formal verification of privacy** (EPSRC 3-year project, with Thales and Vector)?

<https://www.jobs.ac.uk/job/BTX925/research-fellow-in-formal-verification-of-privacy>