

# Formal Verification of Multi-Agent Systems

Vadim Malvone

Télécom Paris

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# PREFACE

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- A very important problem in safety-critical systems.
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- A very important problem in safety-critical systems.
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## Formal verification

- It studies in depth system correctness.
- It is based on mathematic/logical methods.
- One of the contributions is model checking.

# MODEL CHECKING (1)

$$M \models \varphi$$

There are three fundamental parts:

- $M$  : modeling a system;
- $\varphi$  : specifying a property;
- $\models$  : verifying that the model  $M$  satisfies the property  $\varphi$ .

## MODEL CHECKING (2)

### Model

A Kripke Structure is a tuple  $K = \langle AP, St, S_0, R, L \rangle$ , where:

- $AP$  is a set of atomic propositions;
- $St$  is a set of states;
- $S_0 \subseteq St$  is a set of initial states;
- $R \subseteq St \times St$  is a transition relation;
- $L : St \rightarrow 2^{AP}$  is a labeling function.

## MODEL CHECKING (3)

### Specification

- Temporal logics allow to describe the order of the events without define the time explicitly.
- The main temporal logics:
  - LTL (Linear Temporal Logic), in a computation the events are totally ordered.
  - CTL (Computation Tree Logic), in a computation the events are partially ordered.

## MODEL CHECKING (4)

### Verification

Given a Kripke structure  $K$  and a specification  $\varphi$ , the problem of the model checking consists to verify if  $K, s \models \varphi$ , for each initial state  $s$ .

# MULTI-AGENT SYSTEMS (1)

## Key aspects

- There are many agents interacting among them.
- Each agent has a set of *strategies*.
- A *strategy* is a conditional plan that at each step of the game prescribes an action.
- The composition of strategies induces a computation.



## MULTI-AGENT SYSTEMS (2)

### Model

- A game structure is a tuple  $G = \langle AP, St, s_I, Ac, Ag, tr \rangle$ , where:
  - $AP$  is a set of atomic propositions;
  - $St$  is a set of states;
  - $s_I \in S$  is a designated initial state;
  - $Ac$  is a set of actions;
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  - $tr$  is a transition function.
- It depends on the interaction between the agents:
  - *Turn-based*  $\Rightarrow$  The states of the game are partitioned between the agents, then the owner of a state determines the move to take and thus the next state of the game.
  - *Concurrent*  $\Rightarrow$  The agents choose a move (i.e, actions) simultaneously and independently, and the choices together determine the next state of the game.

## MULTI-AGENT SYSTEMS (3)

### Strategies

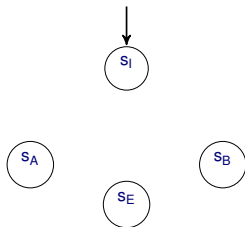
Depending on the memory, we distinguish between:

- *memoryless strategies*  $\Rightarrow \sigma : St \rightarrow Ac$ ; the players take a decision by considering the actual state of the game.
- *bounded strategies*  $\Rightarrow \sigma : St^{<g} \rightarrow Ac$ ; the players take a decision by considering a partial history of the game.
- *memoryfull strategies*  $\Rightarrow \sigma : St^+ \rightarrow Ac$ ; the players take a decision by considering the full history of the game.

## EXAMPLE: PAPER, ROCK, AND SCISSOR

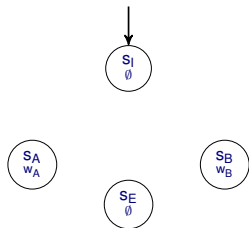
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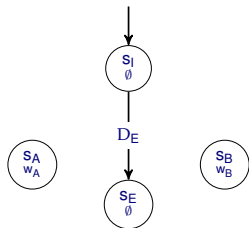
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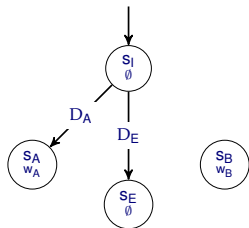
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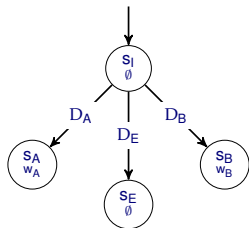
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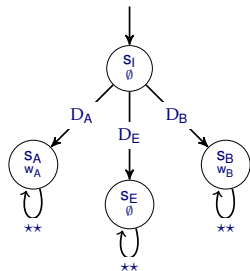


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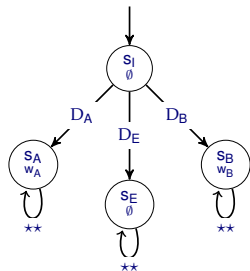
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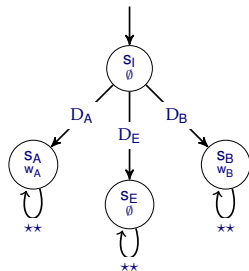
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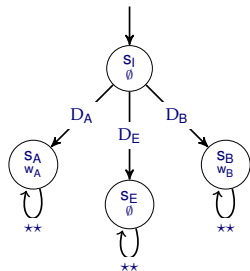
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- A strategy for B is  $\sigma_B(h) = R, \forall h \in S^+$
- $\sigma_A$  and  $\sigma_B$  induce the path  $s_I \cdot (s_A)^\omega$

## MULTI-AGENT SYSTEMS (4)

### Visibility of the agents

- Depending on the visibility of the players, we distinguish between:
  - *perfect information games (PI)*;
  - *imperfect information games (II)*.
- In **PI** case, the players have full knowledge of the evolution of the game, in every moment.
- In **II** case, the players often have to come to decisions without having all relevant information at hand.

## MULTI-AGENT SYSTEMS (5)

### Specification

- *Internal*  $\Rightarrow$  directly over the game structure (Examples: Reachability, Safety, Nash Equilibrium).
- *External*  $\Rightarrow$  specific logics under the strategic reasoning (Examples: ATL, Strategic Logic).

## SPECIFICATIONS (1)

### Alternating-Time Temporal Logic (ATL\*)

- ATL\* generalizes CTL\* by replacing the path quantification with strategy quantification over coalition of agents.
- It uses the strategy modality  $\langle\langle A \rangle\rangle$  and  $\llbracket A \rrbracket$ , with  $A$  set of agents.
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### Example

$\langle\langle \alpha, \beta \rangle\rangle \mathbf{G}\neg\text{fail}$ : the agents  $\alpha$  and  $\beta$  have a collective strategy such that the system does not reach the failure state, independently with the strategies of the other agents.

# ATL MODEL CHECKING COMPLEXITIES

Strategies \ Visibility	perfect information	imperfect information
memoryless	<i>P</i> TIME-complete	$P^{NP}$ -complete
memoryfull	<i>P</i> TIME-complete	undecidable

# ATL\* MODEL CHECKING COMPLEXITIES

Strategies \ Visibility	perfect information	imperfect information
memoryless	<i>PSPACE</i> -complete	<i>PSPACE</i> -complete
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## SPECIFICATIONS (2)

### Strategy Logic (SL)

- SL treats the strategies as **first-order objects**.
- SL extends LTL with:
  - *strategy quantifiers*  $\langle\langle x \rangle\rangle$  and  $[[x]]$  read respectively as “*there exists a strategy  $x$* ” and “*for all strategies  $x$* ”;
  - *agent binding*  $(a, x)$  that links an agent  $a$  to a strategy associated with a variable  $x$ .
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### Example

$\langle\langle x \rangle\rangle \langle\langle y \rangle\rangle \llbracket z \rrbracket (\alpha, x)(\beta, y)(\gamma, z)(\mathbf{G}\neg\text{fail})$ :  $\alpha$  and  $\beta$  have strategies  $x$  and  $y$ , respectively, that guarantee to not reach a failure state, independently with the strategy  $z$  of  $\gamma$ .

## SL MODEL CHECKING COMPLEXITIES

Strategies \ Visibility	perfect information	imperfect information
memoryless	<i>PSPACE</i> -complete	<i>PSPACE</i> -complete
memoryfull	non-elementary	undecidable

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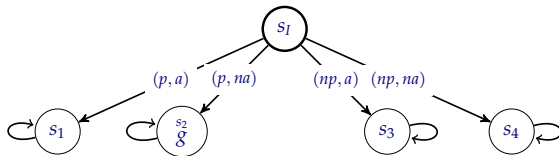
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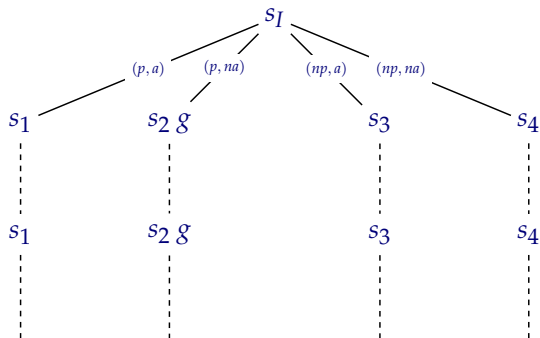
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## UNWINDING OF THE MODEL



## COMPARISON BETWEEN CTL AND ATL (1)

- In the model there is a path where A can pass B but there is no strategy for A to pass B!



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- The formula in ATL  $\langle\langle A \rangle\rangle F g$  is false.

## COMPARISON BETWEEN CTL AND ATL (2)

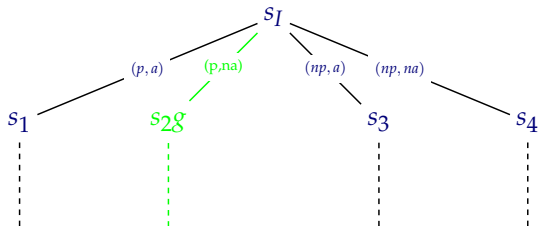
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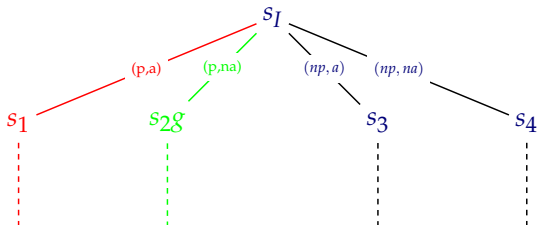


## COMPARISON BETWEEN CTL AND ATL (3)

- The formula in ATL:  $\langle\langle A \rangle\rangle F g$  is not verified. In fact:
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## COMPARISON BETWEEN CTL AND ATL (4)

### Equivalence between CTL and ATL

- $E\psi \equiv \langle\langle Ag \rangle\rangle\psi$
- $A\psi \equiv \langle\langle \emptyset \rangle\rangle\psi$

with  $\psi$  without quantifications.



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### Summary

With CTL we cannot verify the properties on a single agent and on coalitions (subset) of agents.

# RESEARCH TOPICS

IMPERFECT INFORMATION + FULL MEMORY  
*vs*  
DECIDABILITY

# APPROXIMATE MEMORYFULL STRATEGIES

## Our contribution

A partial model checking technique under perfect recall and imperfect information based on  $ATL^*$  3-valued semantics.

## High level idea

- 1 A notion of bounded memory in the context of  $ATL^*$  and  $ATL$  specifications in multi-agent systems with imperfect information.
- 2 A novel 3-valued semantics for  $ATL^*$  and  $ATL$  under bounded memory and imperfect information.
- 3 We proved that 3-valued semantics constitutes an approximation w.r.t. the traditional 2-valued semantics.
- 4 A sound, even if partial, algorithm for the model checking in 2-valued semantics via its approximation as 3-valued semantics.

# APPROXIMATE IMPERFECT INFORMATION

## Our contribution

A partial model checking technique under perfect recall and imperfect information based on  $ATL^*$  specifications.

## High level idea

Given a model  $M$  with imperfect information and an  $ATL^*$  formula  $\varphi$ :

- 1 We build an abstract model  $M_a$  with perfect information from  $M$ ;
- 2 We check whether  $\varphi$  is defined in  $M_a$ ; if that is the case then we are done, otherwise step (3);
- 3 We try to construct a refined model  $M_r$  from  $M_a$ ;
- 4 We check whether  $\varphi$  is defined in  $M_r$ ; if that is the case then we are done, otherwise step (3).

# NATURAL STRATEGIES

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A natural strategy  $s_a$  for agent  $a$  is a list of condition-action rules

$(cond, act)$

such that:

- $cond$  is:
  - Memoryless  $\Rightarrow$  a boolean combination of propositions;
  - With memory  $\Rightarrow$  a regular expression over boolean formulas.
- $act$  is an available action:
  - Memoryless  $\Rightarrow$  such that  $q \models cond$ ;
  - With memory  $\Rightarrow$  such that  $h \models cond$ .

# NATATL

## Variant of ATL

*NatATL* updates ATL by replacing the quantification as follows:

$\langle\langle A \rangle\rangle^{\leq k} \varphi$ : *there is a natural strategy less or equal than  $k$  that satisfies  $\varphi$*



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## *NatATL* Model Checking Complexities

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The above results also hold in the case of imperfect information!

# FIND DECIDABLE AND USEFUL FRAGMENTS IN STRATEGIC LOGICS

## STRATEGY LOGIC WITH SIMPLE GOALS

### Tradeoff: expressivity vs. complexity

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### Theorem (Expressivity)

SL[SG] is strictly more expressive and distinguishing than ATL.

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Theorem (Expressivity)

SL[SG] is strictly more expressive and distinguishing than ATL.

Theorem (Verification Complexity)

Model checking SL[SG] is PTIME-complete wrt the size of the model and the length of the formula  $\rightsquigarrow$  same complexity class as for ATL!

Thank you for the attention! 😊



# APPENDIX

IMPERFECT INFORMATION + FULL MEMORY  
*vs*  
DECIDABILITY

## OTHER WAYS TO FIND DECIDABILITY

### Approximation via Runtime Verification

- Runtime verification is a computing system analysis based on extracting information from a running system.
- Runtime verification avoids the complexity of the model checking by analyzing only a few execution traces.
- Challenge: use Runtime Verification to approximate model checking for multi-agent systems.

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### Approximation via CTL

- Find the decidability via approximation of the specification.
- To be decidable: characterize what we can verify via ATL and what we need to abstract via CTL.

# NATURAL STRATEGIES

# NATURAL STRATEGIES AND SOME APPLICATIONS

## Voting Protocols

- Implementation of *Prêt à Voter* protocol.
- Used for remote voting and voting of handicapped persons in the Australian state of Victoria elections in November 2014.
- Examples of properties:
  - $\langle\langle \text{Voter} \rangle\rangle^{\leq k} F \text{ end\_voting\_procedure}$
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## Auctions

- Natural strategies with memory in repeated auctions.
- Quantitative semantics to handle payoffs.

# FROM ATTACK GRAPHS TO FORMAL METHODS



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# FORMAL VERIFICATION VIA SMT SOLVERS

## ATL MODEL CHECKING VIA SMT SOLVERS

- We introduce a fragment of ATL, called ATL-live, that is suitable to express liveness properties in MAS.
- We introduce a sound translation from ATL-live to First-order Logic (FOL).
- We show how the universal model checking problem for ATL-live can be reduced to semantic entailment in FOL.
- We prove that ATL-live is maximal, i.e. if any other connective is added, non-FOL reasoning techniques would be required.
- These results are meant to be a first step towards the application of FOL reasoners to model check strategic abilities expressed in ATL.