

# Formal Aspects of Strategic Reasoning and Game Playing

## Strategic Reasoning with Quantitative Goals

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# Content

## 1 Strategic Reasoning with Quantitative Goals

- Logics with Quantitative Goals
- Model checking
- Module checking

## 2 Application

- Mechanism Design
- Incentive Engineering

## 3 Temporal Discounting

- Logics with Temporal Discounting
- Model Checking

## 4 Future Work

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# Strategic Reasoning with Quantitative Goals

- Boolean verification
  - ▶ Either the system satisfies a logic specification or it does not
  - ▶ `cleanRiver` is either true or false in a given state
- Quantitative verification
  - ▶ Assessing the *quality* of Multi-Agent Systems (MAS)
  - ▶ Levels of *quality* represented with weights
  - ▶ `cleanRiver` may be *partially* true in a state

# Quantitative Logics for MAS

## Logics with quantitative satisfaction

- Goals are expressed as a fuzzy temporal constraint:
  - ▶ Boolean satisfaction  $\rightsquigarrow$  quantitative satisfaction;
  - ▶ Specification language  $\rightsquigarrow$  LTL[ $\mathcal{F}$ ]<sup>1</sup>, ATL\* [ $\mathcal{F}$ ]/ATL [ $\mathcal{F}$ ]<sup>2</sup>, SL [ $\mathcal{F}$ ]<sup>3</sup>
  - ▶ System model  $\rightsquigarrow$  Weighted Game Structure.

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<sup>1</sup>Almagor, Boker, and Kupferman (2016). “Formally Reasoning about Quality”. In: *Journal of the ACM*

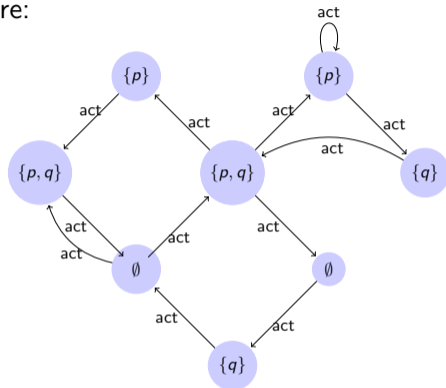
<sup>2</sup>Jamroga, Mittelmann, Murano, and Perelli (2024). “Playing Quantitative Games Against an Authority: On the Module Checking Problem”. In: *AAMAS 2024*

<sup>3</sup>Bouyer, Kupferman, Markey, Maubert, Murano, and Perelli (2019). “Reasoning about Quality and Fuzziness of Strategic Behaviours”. In: *IJCAI*

# Concurrent Game Structures (CGS)

A CGS is a tuple  $\mathcal{G} = (A_p, A_g, A_c, V, d, o, \ell)$ , where:

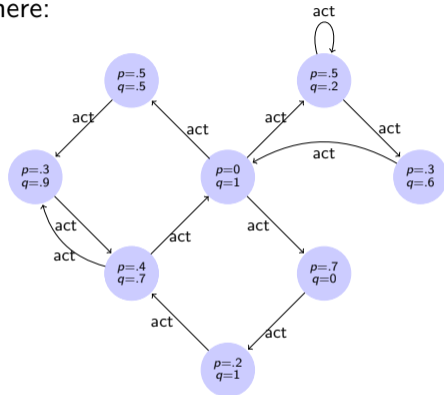
- $A_p$         *propositions* (relevant facts)
- $A_g$         *agents*
- $A_c$         *agents' actions*
- $V$          *states*
- $d : A_g \times V \rightarrow 2^{A_c}$     *available actions*
- $o : V \times A_c^{A_g} \rightarrow V$     *transition function*
- $\ell : V \rightarrow 2^{A_p}$         *labelling function*



# Weighted CGS (wCGS)

A wCGS is a tuple  $\mathcal{G} = (Ap, Ag, Ac, V, d, o, \ell)$ , where:

- $Ap$         *propositions (relevant facts)*
- $Ag$         *agents*
- $Ac$         *agents' actions*
- $V$          *states*
- $d : Ag \times V \rightarrow 2^{Ac}$     *available actions*
- $o : V \times Ac^{Ag} \rightarrow V$  *transition function*
- $\ell : V \times Ap \rightarrow [0, 1]$     *weight function*



Weight function instead of labeling function to model **degrees of truth**.      (fuzzy satisfaction)



# Quantitative logics for MAS

The logics are parametrized over a set of functions  $\mathcal{F}$ <sup>4</sup>:

$$f : [0, 1]^n \rightarrow [0, 1] \in \mathcal{F}$$

Example:

- $x \vee y := \max(x, y)$  (disjunction)
- $x \wedge y := \min(x, y)$  (conjunction)
- $\neg x := 1 - x$  (negation)

We assume that some standard functions belong to  $\mathcal{F}$ :  $\leq$  (Boolean),  $=$  (Boolean), bounded sum, etc.

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<sup>4</sup>We assume the functions in  $\mathcal{F}$  to be computable in polynomial time

# Quantitative ATL\* and ATL

## ATL\*[ $\mathcal{F}$ ] Syntax

$$\varphi ::= p \mid f[\varphi, \dots, \varphi] \mid \mathbf{X}\varphi \mid \varphi \mathbf{U}\varphi \mid \varphi \mathbf{R}\varphi \mid \langle\langle A \rangle\rangle\varphi$$

where  $p$  is a proposition,  $A$  is a coalition, and  $f \in \mathcal{F}$

## ATL[ $\mathcal{F}$ ] Syntax

(no temporal nesting allowed)

$$\varphi ::= p \mid f[\varphi, \dots, \varphi] \mid \langle\langle A \rangle\rangle\mathbf{X}\varphi \mid \langle\langle A \rangle\rangle\varphi \mathbf{U}\varphi \mid \langle\langle A \rangle\rangle\varphi \mathbf{R}\varphi$$

## ATL\*[ $\mathcal{F}$ ] and ATL[ $\mathcal{F}$ ] Semantics

- “ $f[\varphi, \dots, \varphi]$ ” - compute the function over the satisfaction values of its inputs
- “ $\langle\langle A \rangle\rangle\varphi$ ” - coalition  $A$  maximizes the satisfaction value of  $\varphi$
- Abbreviations:  $\llbracket A \rrbracket\varphi := \neg\langle\langle A \rangle\rangle\neg\varphi$        $\mathbf{F}\varphi := \top \mathbf{U}\varphi$        $\mathbf{G}\varphi := \perp \mathbf{R}\varphi$

## Relation with Boolean ATL\*

*Can we capture  $ATL^*$  with  $ATL^*[F]$ ?*



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*Can we capture  $ATL^*$  with  $ATL^*[F]$ ?*



Yes, when atomic propositions can only take values 0 and 1, and  $F$  contains only negation and disjunction.

## Example: Drone battle

Two carrier drones  $a$  and  $b$  cooperate trying to bring an artifact to a rescue point and keep it away from the “villain” drone  $v$ :

- rescued denotes whether the artifact is at the rescue point
- $dis$  computes the distance between two (normalized) positions
- $pos_x$  denote the position of drone  $x$
- Level of safety: minimum distance between any carrier and the villain

$$\varphi_{\text{safe}} := \langle\langle a, b \rangle\rangle \min[dis[pos_a, pos_v], dis[pos_b, pos_v]] \mathbf{U} \text{rescued}$$

What does the formula  $\varphi_{\text{safe}}$  captures?



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Carriers  $a$  and  $b$  best-performing joint strategy to keep the villain as far as possible from the carriers, until the artifact is rescued.



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*What if the artifact is never rescued?*



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*What if the artifact is never rescued?*

The satisfaction value of  $\varphi_{\text{safe}}$  would be 0.





## Example: Drone battle (cont.)

*Can we express that there is a strategy for the drone  $a$  such that for all strategies of the villain ( $v$ ), the drone  $b$  has a response strategy?*



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No, we cannot capture alternation of strategy quantification (each strategic quantifier resets previously assigned strategies).

We need a more expressive logic...

# Quantitative SL

## SL[ $\mathcal{F}$ ] Syntax

$$\varphi ::= p \mid \exists s. \varphi \mid (a, s)\varphi \mid f[\varphi, \dots, \varphi] \mid \mathbf{X}\varphi \mid \varphi \mathbf{U}\varphi$$

where  $p$  is a proposition,  $s$  is a variable,  $a$  is an agent, and  $f \in \mathcal{F}$

## SL[ $\mathcal{F}$ ] Semantics

- Defined over assignments of strategies to variables and agents
- “ $\exists s. \varphi$ ” - the maximal satisfaction value of  $\varphi$  for the possible assignments of strategy to  $s$
- “ $(a, s)\varphi$ ” - the satisfaction value of  $\varphi$  when agent  $a$  is assigned to the str. assigned to  $s$
- Abbreviations:  $\forall s. \varphi := \neg \exists s. \neg \varphi$      $\mathbf{F}\varphi := \top \mathbf{U}\varphi$      $\mathbf{G}\varphi := \neg \mathbf{F}\neg \varphi$      $\varphi \mathbf{R}\psi := \neg(\neg \varphi \mathbf{U} \neg \psi)$
- We call LTL[ $\mathcal{F}$ ] the fragment without strategic operators and bindings

## Example: Drone battle (cont.)

There is a strategy for drone  $a$  such that for all strategies of the villain  $v$ ,  $b$  has a response strategy to keep the villain as far as possible, until the artifact is rescued:

$$\exists s. \forall t. \exists s'. (a, s)(v, t)(b, s') \min[dis[pos_a, pos_v], dis[pos_b, pos_v]] \mathbf{U} \text{rescued}$$

## Example: Nash equilibrium

Assume each agent  $a$  has an LTL[ $\mathcal{F}$ ] goal  $\varphi_a$ .

Let  $\mathbf{s} = (s_a)_{a \in \text{Ag}}$  denote a strategy profile.

$\text{Ag}_{-a}$  denotes the set of agents without  $a$ .

$\mathbf{s}_{-a}$  denotes the strategies of  $\text{Ag}_{-a}$  in the profile  $\mathbf{s}$ .

### Nash equilibrium (NE)

The strategy profile  $\mathbf{s}$  is a *Nash equilibrium* if for each agent  $a$ , no alternative strategy  $t$  for  $a$  leads to a better utility than her strategy  $s_a$  (while all other agent's strategies play  $\mathbf{s}_{-a}$ ).

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How can we express whether  $\mathbf{s}$  is a NE in SL[ $\mathcal{F}$ ]?



$$\text{NE}(\mathbf{s}) \stackrel{\text{def}}{=} \bigwedge_{a \in \text{Ag}} \forall t. [(\text{Ag}_{-a}, \mathbf{s}_{-a})(a, t)\varphi_a \leq (\text{Ag}, \mathbf{s})\varphi_a]$$



## Example: Nash equilibrium (cont)

We can also measure *how much* agent  $a$  can benefit from a selfish deviation using formula:

$$\exists t. \text{diff} [(Ag_{-a}, \mathbf{s}_{-a})(a, t)\varphi_a, (Ag, \mathbf{s})\varphi_a]$$

where  $\text{diff}(x, y) = \max\{0, x - y\}$ .

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# Model checking

## Model checking problem

Given an  $SL[\mathcal{F}]$  (similarly  $ATL^*[\mathcal{F}]$  or  $ATL[\mathcal{F}]$ ) formula  $\varphi$ , a wCGS  $\mathcal{G}$ , a state  $v$ , and a predicate  $P \subseteq (0, 1]$ , decide whether the satisfaction value of  $\varphi$  in  $v$  is a subset or equal to  $P$ , denoted

$$\llbracket \varphi \rrbracket^{\mathcal{G}}(v) \subseteq P$$

The predicate can be the set of values above a threshold  $\epsilon \in (0, 1]$ :  
Decide whether  $\llbracket \varphi \rrbracket^{\mathcal{G}}(v) \geq \epsilon$ .

# Complexity of Model Checking

Using automata-theoretic approaches:

Theorem 1 (Bouyer et al., 2019)

*Model-checking*  $SL[\mathcal{F}]$

*(where  $k$  is the number of alternations of strategic operators )*

*in  $(k+1)$  EXPTIME*

Theorem 2 (Jamroga et al., 2024)

*Model-checking*  $ATL^*[\mathcal{F}]$

*$2$ EXPTIME-complete*

# Complexity of Model Checking

Algorithmic solution:

Theorem 3 (Jamroga et al., 2024)

*Model-checking*  $\text{ATL}[\mathcal{F}]$

*P*TIME-complete

Theorem 4 (Maubert et al., 2021)

*Model checking*  $\text{SL}[\mathcal{F}]$  with *memoryless* agents

*P*SPACE-complete

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# Module Checking

For a given weighted module  $\mathcal{G}$ :

- $\mathcal{T} \in \text{exec}(\mathcal{G})$  is a possible wCGS resulting from the choices of  $e$  in  $\mathcal{G}$ .

Given an  $\text{ATL}^*[\mathcal{F}]$  formula  $\varphi$ , a module  $\mathcal{G}$ , a position  $v$ :

- $\llbracket \varphi \rrbracket_r^{\mathcal{G}}(v) = \{ \llbracket \varphi \rrbracket^{\mathcal{T}}(v) \mid \mathcal{T} \in \text{exec}(\mathcal{G}) \}$  all possible values in  $v$  according to  $\mathcal{T}$

## Definition 5 (Module Checking)

Deciding whether  $\llbracket \varphi \rrbracket_r^{\mathcal{G}}(v) \subseteq P$ , for a given predicate  $P \subseteq [0, 1]$ .



# Complexity of Module Checking

Automata-theoretic approach

Theorem 6 (Jamroga et al., 2024)

- *Module-checking*  $ATL^*[F]$
- *Module-checking*  $ATL[F]$

$3EXPTIME$ -complete

$EXPTIME$ -complete

## Relation with Boolean Module Checking and Model Checking

- $ATL^*[F]$  module checking is not subsumed by  $ATL^*$  module checking over weighted modules
- $ATL^*[F]$  *module* checking is not subsumed by  $ATL^*[F]$  *model* checking.

# Contents

- Quantitative extensions of SL, ATL\*, and ATL
- Model and module checking problems have the **same computational complexity** as the corresponding logics with Boolean semantics
- MAS with quantitative goals: application to **mechanism design**

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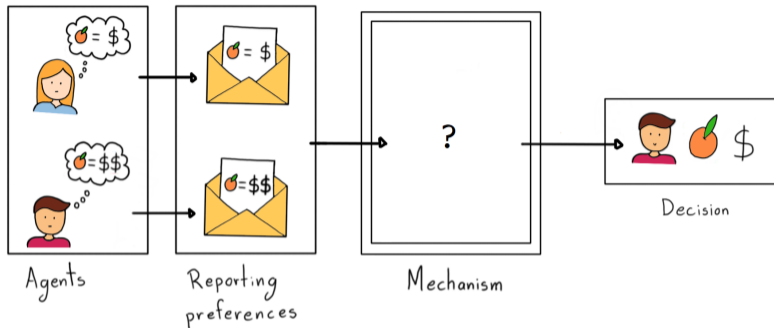
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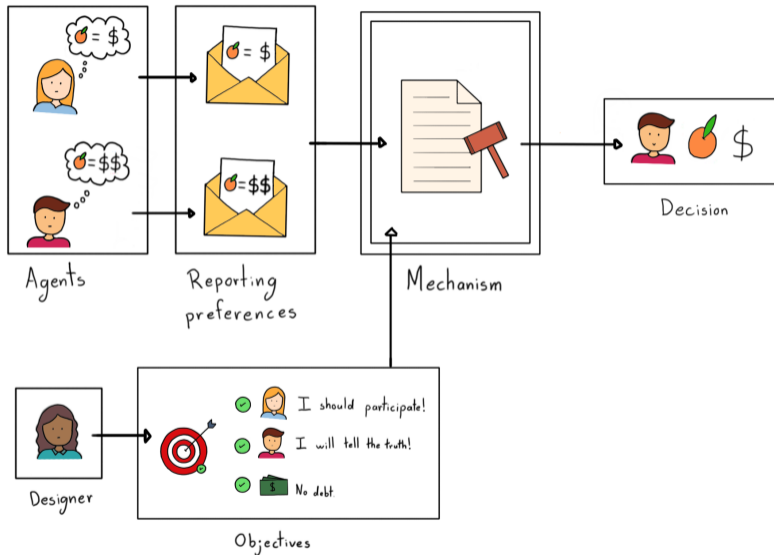
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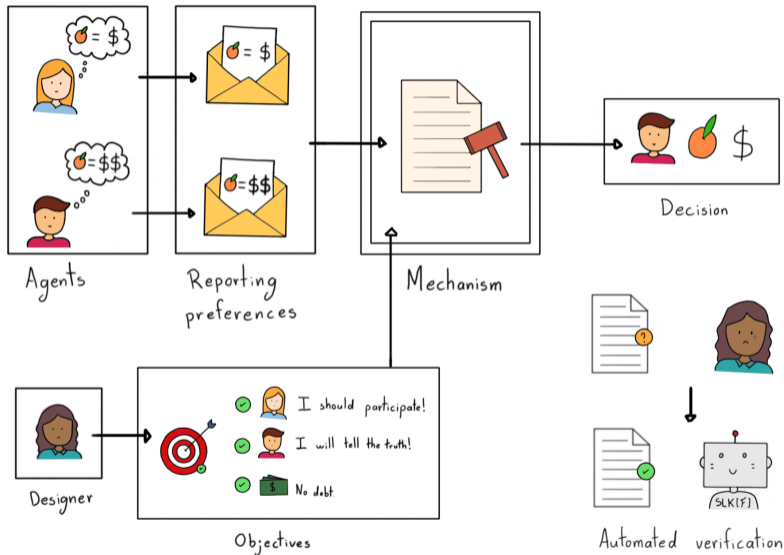
# Mechanism Design



# Mechanism Design



# Mechanism Design





# Motivation

- Preference aggregation problems
  - ▶ Auctions, elections, fair division protocols, etc
- Logic-based approach: verification<sup>5</sup> and synthesis of mechanisms<sup>6</sup>
  - ▶ We use the weights  $[-1, 1]$  for convenience



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<sup>5</sup>Maubert, Mittelmann, Murano, and Perrussel (2021). “Strategic Reasoning in Automated Mechanism Design”. In: *KR 2021*.

<sup>6</sup>Mittelmann, Maubert, Murano, and Perrussel (2022). “Automated Synthesis of Mechanisms”. In: *IJCAI 2022*.

# Mechanisms

- Alternatives Alt

- ▶  $\{(buyer_{Bob}, pays_k), (buyer_{Ann}, pays_k) : 0 \leq k \leq 10\}$  (selling an item)
- ▶  $\{(Ann, Bob), (Ann, Carol), (Bob, Carol)\}$  (choosing two representatives)
- ▶  $\{(\frac{1}{3}, \frac{1}{3}, \frac{1}{3}), (\frac{1}{2}, \frac{1}{2}, 0), (1, 0, 0), \dots\}$  (splitting a resource)

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- ▶  $\{(\frac{1}{3}, \frac{1}{3}, \frac{1}{3}), (\frac{1}{2}, \frac{1}{2}, 0), (1, 0, 0), \dots\}$  (splitting a resource)

- Many mechanisms describe monetary transfers, thus an alternative is in the form  $(x, (p_a)_{a \in Ag})$  where  $x \in X$  is a choice from a finite set of choices, and  $p_a$  is the payment for agent  $a$ .

E.g.,  $x = buyer_{Bob}, p_{Bob} = 10, p_{Ann} = 0$

## Mechanisms for social choice

- Agent's type (preference)  $\theta_a \in \Theta_a$
- Valuation function  $v_{ag} : X \times \Theta_a \rightarrow \mathbb{R}$
- Utility function  $u_{ag} : \text{Alt} \times \Theta_a \rightarrow \mathbb{R}$ 
  - ▶ E.g., Possible types in a single-item auction  $\Theta_{Bob} = \{0, \dots, 10\}$
  - ▶  $\theta_{Bob} = 2$  means Bob value to the item is 2 euros

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  - ▶ E.g., Possible types in a single-item auction  $\Theta_{Bob} = \{0, \dots, 10\}$
  - ▶  $\theta_{Bob} = 2$  means Bob value to the item is 2 euros
  - ▶ The valuation of Bob is

$$v_{Bob}(buyer_{Bob}, \theta_{Bob}) = \theta_{Bob}$$

$$v_{Bob}(buyer_{Ann}, \theta_{Bob}) = 0$$

- ▶ The (quasi-linear) utility is

$$u_{Bob}((buyer_{Bob}, (p_{Bob}, p_{Ann})), \theta_{Bob}) = v_{Bob}(buyer_{Bob}, \theta_{Bob}) - p_{Bob}$$

$$u_{Bob}((buyer_{Bob}, (5, 0)), 2) = 2 - 5 = -3$$

## Mechanisms for social choice

- Types  $\Theta = \prod_{a \in \text{Ag}} \Theta_a$
- Strategies  $S = \prod_{a \in \text{Ag}} S_a$
- Mechanism  $\mathcal{M} : S \rightarrow \text{Alt}$ 
  - ▶ English auction: the agents increase the price until there are no other buyers interested
  - ▶ Dutch auction: the price decreases until one agent accepts to buy

## Example: wCGS representing the Dutch auction

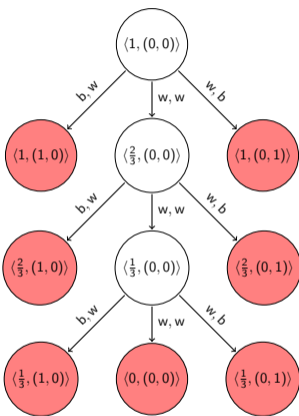


Figure 2: Part of the mechanism for the Dutch auction with two agents and decrement  $\text{dec} = \frac{1}{3}$ .

# Mechanisms for social choice

Evaluation of a mechanism with rational agents: solution concepts



# Mechanisms for social choice

Evaluation of a mechanism with rational agents: solution concepts

Example of properties:

- Budget-balance
- Strategyproof
- Individual rationality
- Efficiency
- ...

## Solution concepts

- Nash equilibrium (NE): considers (unilateral) deviations of individual agents
- Dominant strategy equilibrium (DSE): the strategy associated with each agent weakly maximizes her utility, for all possible strategies of other agents
- $m$ -resilient equilibrium ( $RE_m$ ): considers deviations by coalitions of agents rather than individuals, it tolerates deviations of up to  $m$  agents

# Mechanism Properties

Individual Rationality (IR):

$$\text{IR} \stackrel{\text{def}}{=} \bigwedge_{a \in \text{Ag}} 0 \leq \text{util}_a$$

The Dutch auction is IR

# Mechanism Properties

Strong Budget Balance (SBB):

$$\text{SBB} \stackrel{\text{def}}{=} 0 = \sum_{a \in \text{Ag}} \text{pay}_a$$

Weak Budget Balance (WBB):

$$\text{WBB} \stackrel{\text{def}}{=} 0 \leq \sum_{a \in \text{Ag}} \text{pay}_a$$

The Dutch auction is WBB and not SBB

# Mechanism Properties

Strategyproofness (SP)

Let  $\hat{\theta}_a$  be the truth-revealing strategy for  $a$

DSE( $\mathbf{s}$ ) where  $\mathcal{A}(s_a) = \hat{\theta}_a$  for each  $a$

The Dutch auction is not SP

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The Dutch auction is not SP

Efficiency, Pareto optimality, ...

## Model-checking $SL[\mathcal{F}]$

Model checking mechanism properties with  $SL[\mathcal{F}]$  when agents are strategic:  
For a given property  $\varphi$  and solution concept  $\zeta$ , we check

$$\exists \sigma. [\zeta(\sigma) \wedge (Ag, \sigma)\varphi]$$

### More complex mechanisms

By changing the specification language, we can also verify mechanisms with imperfect information <sup>7</sup> and probabilistic features <sup>8</sup>

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<sup>7</sup>Maubert, Mittelmann, Murano, and Perrussel (2021). “Strategic Reasoning in Automated Mechanism Design”. In: *KR 2021*

<sup>8</sup>Mittelmann, Maubert, Murano, and Perrussel (2023). “Formal Verification of Bayesian Mechanisms”. In: *AAAI*

# Synthesis of Mechanisms

- Creating mechanisms from a logical specification in  $SL[\mathcal{F}]$
- Satisfiability of SL (thus,  $SL[\mathcal{F}]$ ) is undecidable in general
- Decidable cases



# Synthesis of Mechanisms

Given a finite set  $\mathcal{V} \subset [-1, 1]$  such that  $\{-1, 1\} \subseteq \mathcal{V}$ , the  $\mathcal{V}$ -satisfiability problem for  $SL[\mathcal{F}]$  is the restriction of the satisfiability problem to  $\mathcal{V}$ -weighted wCGS.

## Theorem 7 (Mittelmann, Maubert, et al., 2022)

*The satisfiability of  $SL[\mathcal{F}]$  is decidable in the following cases:*

- *wCGS with bounded actions*
  - *Turn-based wCGS*
- 
- Algorithms for the satisfiability  $\rightarrow$  return a satisfying wCGS when one exists (see Pnueli and Rosner, 1989)

# Optimal mechanism synthesis

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## Algorithm 2 Optimal mechanism synthesis

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**Data:** A  $SL[\mathcal{F}]$  specification  $\Phi$  and a set of possible values for atomic propositions  $\mathcal{V}$

**Result:** A wCGS  $\mathcal{G}$  such that  $\llbracket \Phi \rrbracket^{\mathcal{G}}$  is maximal

Compute  $\widetilde{\text{Val}}_{\Phi, \mathcal{V}}$  Let  $\nu_1, \dots, \nu_n$  be a decreasing enumeration of  $\widetilde{\text{Val}}_{\Phi, \mathcal{V}}$  **for**  $i=1 \dots n$  **do**  
    Solve  $\mathcal{V}$ -satisfiability for  $\Phi$  and  $\varepsilon = \nu_i$  **if** there exists  $\mathcal{G}$  such that  $\llbracket \Phi \rrbracket^{\mathcal{G}} \geq \nu_i$  **then**  
        | **return**  $\mathcal{G}$   
    **end**  
**end**

---

# Advantage

- Optimal mechanism synthesis
- Synthesis from auction rules (e.g. ADL-like<sup>9</sup>) and strategic requirements (e.g. strategyproofness)

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<sup>9</sup>Mittelmann, Bouveret, and Perrussel (2022). “Representing and reasoning about auctions”. In: *Autonomous Agents and Multi-Agent Systems* 36.1, p. 20.

## Example Auction rules

- **AG**(( $\neg$ sold  $\wedge$  price + inc < 1)  $\rightarrow$  (price + inc = **X**price  $\wedge$   $\neg$ **X**terminal))
- **AG**((sold  $\vee$  price + inc  $\geq$  1)  $\rightarrow$  (price = **X**price  $\wedge$  **X**terminal))
- **AG**(choice = wins<sub>a</sub>  $\leftrightarrow$  bid<sub>a</sub>  $\wedge$   $\bigwedge_{b \neq a} \neg$ bid<sub>a</sub>)
- **AG**( $\bigwedge_{a \in \text{Ag}}$ (choice = wins<sub>a</sub>  $\rightarrow$  pay<sub>a</sub> = price))

- Logic-Based Mechanism Design
  - ▶ Verifying properties under strategic behaviour  $\rightarrow$  MC SL[ $\mathcal{F}$ ]-formulas
  - ▶ Generating mechanisms  $\rightarrow$  synthesis from SL[ $\mathcal{F}$ ]-formulas

# Contents

- Logic-Based Mechanism Design
  - ▶ Verifying properties under strategic behaviour  $\rightarrow$  MC SL[ $\mathcal{F}$ ]-formulas
  - ▶ Generating mechanisms  $\rightarrow$  synthesis from SL[ $\mathcal{F}$ ]-formulas
- Correctness of the encoding for classic mechanism design

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- Logic-Based Mechanism Design
  - ▶ Verifying properties under strategic behaviour  $\rightarrow$  MC SL[ $\mathcal{F}$ ]-formulas
  - ▶ Generating mechanisms  $\rightarrow$  synthesis from SL[ $\mathcal{F}$ ]-formulas
- Correctness of the encoding for classic mechanism design
- Logics for MAS allows us to go further

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## 1 Strategic Reasoning with Quantitative Goals

- Logics with Quantitative Goals
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## Partially redesigning a system

- We can design new mechanisms with *nice* properties when agents act rationally...

## Partially redesigning a system

- We can design new mechanisms with *nice* properties when agents act rationally...
- What if we already have a mechanism (or a *system*) but it doesn't have those properties?
- What if we cannot redesign it from scratch?

Existing environmental legislation fails to reach sustainability targets.  
How can we change the *system* to address this issue?

- How can we change the system to satisfy desirable properties?

## Partially redesigning a system

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- What if we already have a mechanism (or a *system*) but it doesn't have those properties?
- What if we cannot redesign it from scratch?

Existing environmental legislation fails to reach sustainability targets.  
How can we change the *system* to address this issue?

- How can we change the system to satisfy desirable properties?
  - ▶ norms, incentives, ...

# Partially redesigning a system

How can we convince agents to act on behalf of the environment?

- Laws prohibiting the use of disposable plastic bags
  - Taxes based on companies' pollution rates
  - Subsidizing public transportation fees
- 
- Norm design<sup>10</sup>
  - Incentive design<sup>11</sup>

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<sup>10</sup>Alechina, De Giacomo, Logan, and Perelli (2022). “Automatic Synthesis of Dynamic Norms for Multi-Agent Systems”. In: *KR*.

<sup>11</sup>Hyland, Mittelmann, Murano, Perelli, and Wooldridge (2024). “Incentive Design for Rational Agents”. In: *KR (to appear)*.

# Partially redesigning a system

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# Incentive Design

- Agents try to maximize their utilities, expressed with LTL[ $\mathcal{F}$ ]-goals
- We want to impose *incentive schemes*
- Rationality is defined w.r.t. solution concepts

## Incentive Scheme

It is a function, that assigns new weights to some (or all) atomic propositions

It can be either:

- Static (memoryless)
- Dynamic (history-based)

We assume that incentive schemes have a fixed level of granularity

## Example - River

- Two companies share the usage of a river
- At each moment, the companies can either *discharge waste water* in the river or *treat the waste water* (at a cost)
  - ▶ If both firms discharge, the water quality deteriorates
  - ▶ If only one discharges, the quality is not affected
  - ▶ If both firms clean, the river quality improves

## Example - River

- Two companies share the usage of a river
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  - ▶ If only one discharges, the quality is not affected
  - ▶ If both firms clean, the river quality improves
- A regulator can impose taxes on each company
  - ▶ Company  $a$  goal:  $\mathbf{G}(\text{utility}_a - \text{tax}_a)$
  - ▶ Taxes are initially zero  $\rightarrow$  it motivates the companies to discharge wastewater in the river
  - ▶ Regulator goal:  $\mathbf{G}(\text{quality} \wedge \text{fair})$ .



## Example - River

- With static incentive schemes:
  - ▶ The regulator can set the taxes so that at least one of the firms is worse off by discharging
  - ▶ If only one firm is taxed, it may be seen as unfair
  - ▶ If both firms are taxed, there may be an unnecessary loss of profits to both firms
- With dynamic incentive schemes:
  - ▶ The regulator can alternate between taxing the firms a sufficient amount for discharging, which is more fair and efficient

# Computational Problems

## Incentive Verification

*Check* if an incentive scheme guarantees that the goal  $\varphi$  is satisfied at least  $c$

## Incentive Synthesis

*Find* an incentive scheme, if it exists, that guarantees that the goal  $\varphi$  is satisfied at least  $c$

## Variants of the problems

- $\zeta \in \{\text{DSE}, \text{NE}, \text{RE}_m\}$  denotes the solution concept
- E (similarly, A) indicates that the goal is satisfied in *some* (resp. *all*) equilibrium (fixed  $\zeta$ )
- S (similarly, D) indicates that the incentive scheme is *static* (resp. *dynamic*)

## Static Case

- For verification, we apply the static incentive scheme to the wCGS and then check the corresponding  $SL[\mathcal{F}]$  formulas:

$$\exists \sigma. [\zeta(\sigma) \wedge (Ag, \sigma)\varphi]$$

$$\forall \sigma. [\zeta(\sigma) \rightarrow (Ag, \sigma)\varphi]$$

- For synthesis, we non-deterministically guess an incentive scheme, then proceed with verification

## Complexity - Static Case

### Theorem 8 (Hyland et al., 2024)

For  $\zeta \in \{\text{DSE}, \text{NE}, \text{RE}_m\}$ ,  $m \in \{1, \dots, |\text{Ag}|\}$ , the following problems are **2EXPTIME-complete**:

- $\zeta$ -S-E-INCENTIVE-VERIFICATION
- $\zeta$ -S-A-INCENTIVE-VERIFICATION
- $\zeta$ -S-E-INCENTIVE-SYNTHESIS
- $\zeta$ -S-A-INCENTIVE-SYNTHESIS

# Dynamic Case

- We transform the original  $wCGS$  into a modified one:
  - ▶ We embed the incentive designer into the  $wCGS$  as an agent
  - ▶ Her actions correspond to the application of incentives
  - ▶ The new  $wCGS$  interleaves actions of the incentive designer and the other agents
  - ▶ This requires to *inflate* the runs of the  $wCGS$  and translate formulas
- Then, verification is done similarly to the static case (with adapted  $SL[\mathcal{F}]$  formulas)
- For synthesis, we also check the existence of an incentive designer strategy (which leads to an additional alternation in the  $\zeta$ -D-A case)

## Complexity - Dynamic Case

### Theorem 9 (Hyland et al., 2024)

For  $\zeta \in \{\text{DSE}, \text{NE}, \text{RE}_m\}$ ,  $m \in \{1, \dots, |\text{Ag}|\}$ , the following problems are **2EXPTIME-complete**

- $\zeta$ -D-E-INCENTIVE-VERIFICATION
- $\zeta$ -D-A-INCENTIVE-VERIFICATION
- $\zeta$ -D-E-INCENTIVE-SYNTHESIS

Finally,  $\zeta$ -D-A-INCENTIVE-SYNTHESIS is in **3EXPTIME** and is **2EXPTIME-hard**.

# Contents

- Incentive Design allows the partial redesign of games through incentives
- For the cases considered, the complexity of the problems is not harder than the corresponding Boolean rational verification problems (Abate et al., 2021)

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# Future discounting in MAS

- Satisfying the goal sooner  $>$  after a long wait
- Temporal discounting operators alongside Linear Temporal Logic ( $LTL^{disc}[\mathcal{D}]$ )<sup>12</sup>
- $SL^{disc}[\mathcal{D}]$ : Strategy Logic + future discounting<sup>13</sup>

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<sup>12</sup>Almagor, Boker, and Kupferman (2014). “Discounting in LTL”. In: *TACAS*.

<sup>13</sup>Mittelmann, Murano, and Perrussel (2023). “Discounting in Strategy Logic”. In: *IJCAI*.

# Strategy Logic with Discounting

- Enable to express:
  - ① Strategic abilities of agents with discounted goals
  - ② Solution concepts in discounting games
- Parametrized by a set of discounting functions  $\mathcal{D}$ :
  - ▶ Agents may be affected differently by how long it takes to achieve their goal

## Strategy Logic with Discounting

A **discounting function** is a function that tends to zero and is non-increasing (e.g.,  $d(i) = \frac{1}{i+1}$ )  
We assume the functions in  $\mathcal{D}$  are computable in polynomial time

$\text{SL}^{\text{disc}}[\mathcal{D}]$  syntax

$$\varphi ::= p \mid \neg\varphi \mid \varphi \vee \varphi \mid \exists s. \varphi \mid (a, s)\varphi \mid \mathbf{X}\varphi \mid \varphi \mathbf{U}\varphi \mid \varphi \mathbf{U}_d\varphi$$

where  $p \in \text{Ap}$ ,  $s \in \text{Ap}$ ,  $a \in \text{Ag}$ , and  $d \in \mathcal{D}$ .

$\text{SL}^{\text{disc}}[\mathcal{D}]$  semantics

Quantified semantics defined over Concurrent Game Structures

Discounted-until  $\varphi_1 \mathbf{U}_d\varphi_2$  is weighted by how far in the future  $\varphi_1$  and  $\varphi_2$  occur

## Relation with $LTL^{\text{disc}}[\mathcal{D}]$ , SL and $SL[\mathcal{F}]$

- $LTL^{\text{disc}}[\mathcal{D}] \subset SL^{\text{disc}}[\mathcal{D}]$
- $SL \subset SL^{\text{disc}}[\mathcal{D}]$
- $SL[\mathcal{F}]$  is interpreted over a different class of models  
Functions are independent of *how far* in the play they are being evaluated

## Example - Secretary Problem

- $F_d$   $k$ -hired
- $\exists s \forall t(a, s)(Ag_{-a}, t)(\bigvee_{j \in C} \neg \text{present}_j) \mathbf{U}_d$   $k$ -hired

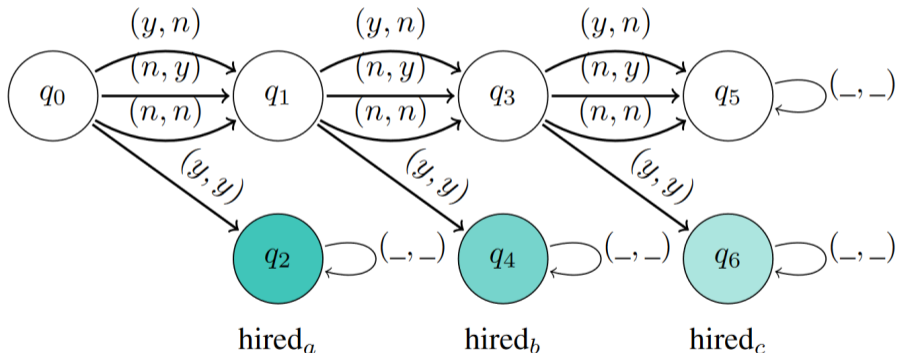


Figure 3: Instance of the secretary problem; the utility decreases the more time is taken to hire one.

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# Model Checking $SL^{disc}[\mathcal{D}]$

Theorem 10 (Mittelmann, Murano, and Perrussel, 2023)

Model checking  $SL^{disc}[\mathcal{D}]$  with *memoryless* agents

**PSPACE-complete**

Theorem 11 (Mittelmann, Murano, and Perrussel, 2023)

Model checking  $SL^{disc}[\mathcal{D}]$  with *memoryfull* agents

(when functions in  $\mathcal{D}$  are exponential-discounting, where  $k$  is the number of quantifiers alternations)

**$(k + 1)$ -EXPTIME**



# Contents

- $SL^{\text{disc}}[\mathcal{D}]$ : reasoning about temporal goals whose satisfaction value decays over time
- More expressive than SL
- Under certain restrictions, it has the same complexity as SL

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# Directions for Future Work

- Synthesis from fragments of  $SL[\mathcal{F}]$
- Partial synthesis
  - ▶ Incentives + Temporal Discounting
  - ▶ Fuzzy Norms
  - ▶ Finding minimal changes in the model
- $SL[\mathcal{F}] + SL^{\text{disc}}[\mathcal{D}]?$
- Extensions of model-checkers
  - ▶ **MCMAS** - <https://sail.doc.ic.ac.uk/software/mcmas/>
  - ▶ **STV** - <https://github.com/blackbat13/stv>
  - ▶ **Vitamin** - <https://arxiv.org/abs/2403.02170>

Thank you for following our course!



# Formal Aspects of Strategic Reasoning and Game Playing

## Strategic Reasoning with Quantitative Goals

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