ESSAI 2024 course: Logic-based specification and verification of multi-agent systems Lecture 5: How to be both rich and happy? A logic for combined qualitative and quantitative strategic reasoning

Valentin Goranko Stockholm University

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Based on:

Nils Bulling and Valentin Goranko: Combining quantitative and qualitative reasoning in concurrent multi-player games, Journal of Autonomous Agents and Multiagent Systems, 2022, 36:2, 1–33.

- Introduction: strategic abilities in multi-player games – quantitative and qualitative aspects
- \blacktriangleright Multi-player concurrent game models
- \triangleright Concurrent game models with payoffs and guards
- \triangleright QATL^{*}: a quantitative extension of the logic ATL^{*}
- \triangleright Model checking of QATL^{*}: some (un)decidability results
- \triangleright Concluding remarks

Introduction: strategic abilities of agents in multi-player games

Two traditions:

Game theory: study of rational behavior of players aiming to achieve quantitative objectives: optimizing payoffs or, more generally, preferences on outcomes.

Typical models: normal form games, repeated games, extensive games.

Logic (and CS): study of strategic abilities of players for achieving qualitative objectives: reaching or maintaining outcome states with desired properties, e.g., winning states, or safe states, etc.

Typical models:

multi-agent transition systems, a.k.a. concurrent game models.

In a slogan:

the game theory tradition is concerned with how a player can become maximally rich, or how to pay as little cost as possible,

while the logic tradition – with how a player can achieve a state of 'happiness', e.g. winning, or avoid a state of 'unhappiness' (losing).

So, rich or happy?

Rich or happy? Preferably, both!

In a slogan:

the game theory tradition is concerned with how a player can become maximally rich, or how to pay as little cost as possible,

while the logic tradition – with how a player can achieve a state of 'happiness', e.g. winning, or avoid a state of 'unhappiness' (losing).

Our objective: to bring these two perspectives together within a unifying logical framework.

Wide spectrum of related work:

- \triangleright resource-bounded reasoning;
- \triangleright concurrent games with omega-regular objectives;
- \triangleright mean-payoff and energy parity games;
- \triangleright counter automata, Petri nets and VASS, timed games; etc.

Concurrent game models recalled

 $(A, St, \{Act_{a}\}_{a\in A}, \{act_{a}\}_{a\in A}, out, Prop, L)$

- $A = \{1, \ldots, k\}$ is a fixed finite set of agents (players)
- ► a set of actions $Act_{a} \neq \emptyset$ for each $a \in \mathbb{A}$. For any $A \subseteq \mathbb{A}$ we denote $\mathsf{Act}_A := \prod_{\mathsf{a} \in A} \mathsf{Act}_{\mathsf{a}}$.
- \triangleright St is a set of system states.
- \triangleright act_a : St \rightarrow P(Act_a) for each **a** ∈ A. $act_{a}(s)$ is the set of actions available to **a** at *s*.
- out : $S \times Act_A \rightarrow S$ is a transition function. $\textsf{out}(s, \overrightarrow{\alpha}_\mathbb{A})$ is the outcome state for every $q \in \mathsf{St}$ and action profile $\overrightarrow{\alpha}_{\mathbb{A}} = \langle \alpha_1, \ldots, \alpha_{\mathsf{k}} \rangle$ s.t. $\alpha_{\mathsf{a}} \in \text{act}_{\mathsf{a}}(s)$ for each $\mathsf{a} \in \mathbb{A}$.
- \triangleright Prop is the set of atomic propositions.
- \blacktriangleright L : St $\rightarrow \mathcal{P}(\mathsf{Prop})$ is the labeling function.

Towards quantitative reasoning: Concurrent game models with payoffs and guards

Concurrent game models with payoffs and guards (GGMPG): extend concurrent game models by associating with every state a strategic game with payoffs, which can also be interpreted as resources.

– at every state each player chooses an action; all actions are applied simultaneously and determine transition to successor state;

- the collective action also determines each player's payoff;
- same happens at the successor state, etc., thus eventually generating an infinite play;
- so, players accumulate utilities in the course of the play;
- the players' current utility values determine their available actions at the current state, through guards – arithmetical constraints over the current utilities.

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Thus, CGMPGs are games with qualitative and quantitative objectives.

We need a simple formal language for dealing with payoffs/resources.

- $\blacktriangleright V_{\mathbb{A}} = \{v_{\mathbf{a}} \mid \mathbf{a} \in \mathbb{A}\}.$ set of special variables to refer to the accumulated utilities;
- ► Given sets X and $A \subseteq A$, the set $T(X, A)$ of terms over X and A is built from $X \cup V_A$ by applying addition.
- \triangleright Terms are evaluated in domain of payoffs D (usually, $\mathbb Z$ or $\mathbb R$).
- \blacktriangleright The set AC(X, A) of arithmetic constraints over X and A:

$$
\{t_1 * t_2 \mid * \in \{<,\leq,=,\geq,>\} \text{ and } t_1, t_2 \in \mathcal{T}(X, A)\}
$$

 \blacktriangleright Arithmetic constraint formulae: ACF(X, A): the set of Boolean formulae over $AC(X, A)$.

Concurrent game models with payoffs and guards

A guarded CGM with payoffs (GCMGP) is a tuple

 $\mathfrak{M} = (\mathcal{S}, \text{payoff}, \{g_{\mathbf{a}}\}_{\mathbf{a}\in \mathbb{A}}, \{d_{\mathbf{a}}\}_{\mathbf{a}\in \mathbb{A}})$

where $S = (A, St, \{Act_a\}_{a \in A}, \{act_a\}_{a \in A}, \text{out}, \text{Prop}, L)$ is a CGM and:

- **►** payoff : $A \times S \times Act$ _{A} \rightarrow D is a payoff function.
- \blacktriangleright d_a \in [0, 1] is a discount factor for each $a \in A$.
- \triangleright accumulated utility of a player **a** at a state of a play: the (discounted) sum of all a's payoffs collected in the play so far. All initial payoffs are assumed 0.
- ► $g_a : S \times Act_a \rightarrow ACF(X, \{a\})$, for $a \in A$, is a guard function such that $g_a(s, \alpha)$ is an ACF for each $s \in$ St and $\alpha \in$ Act_a.

 \triangleright The action α is available to **a** at s iff the current accumulated utility of a satisfies $g_a(s, \alpha)$.

The guard must enable at least one action for **a** at *s*.

CGM with payoffs and guards: a toy game example

The guards for both players are defined at each state so that the player may:

- \triangleright apply any action if she has a positive current accumulated utility,
- only apply action C if she has accumulated utility 0,
- must play an action maximizing her minimum payoff in the current game if she has a negative accumulated utility.

The discounting factors are 1 and the initial payoffs of both players are 0.

Example 2: robots on a mission

Scenario: a team of 3 robots is on a mission. The team must accomplish a certain task, e.g., formalized as 'reaching state goal'.

The robots work on batteries which need to be charged in order to provide the robots with sufficient energy to be able to function.

We assume the robots' energy levels are non-negative integers.

Every action of a robot consumes some of its energy.

Collective actions of all robots may, additionally, increase or decrease the energy level of each of them.

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Robots on a mission: agents and states

For every collective action: an 'energy update table' is associated, representing the net changes – increase or decrease – of the energy level of each agent after that collective action is performed at the given state.

In this example the energy level of a robot may never go below 0.

Here are the detailed descriptions of the components of the model:

- Agents: The 3 robots: **a**, **b**, **c**.
- **States:** The 'base station' state (*base*) and the target state goal.

Robots on a mission: actions and transitions

Actions. The possible actions are:

 $R:$ 'recharge', N: 'do nothing', G: 'go to goal', B: 'return to base'.

All robots have the same functionalities and abilities to perform actions, and their actions have the same effect.

Each robot has the following actions possibly executable at the different states: $\{R, N, G\}$ at state *base* and $\{N, B\}$ at state *goal*.

V Goranko Transitions. The transition function is specified in the figure. NB: since the robots abilities are assumed symmetric, it suffices to specify the action profiles as multisets, not as tuples.

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Robots on a mission: some constraints

 \triangleright The team has one recharging device which can recharge at most 2 batteries at a time and produces a total of 2 energy units in one recharge step.

So if 1 or 2 robots recharge at the same time they receive a pro rata energy increase, but if all 3 robots try to recharge at the same time, the device does not charge any of them.

 \triangleright Transition from one state to the other consumes a total of 3 energy units. If all 3 robots take the action which is needed for that transition (G for transition from *base* to *goal*, and B for transition from *goal* to *base*), then the energy cost of the transition is distributed equally amongst them.

If only 2 of them take that action, then each consumes 2 units and the extra unit is transferred to the 3rd robot.

 \triangleright An attempt by a single robot to reach the other state fails and costs that robot 1 energy unit.

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Resource updates. Resource updates are given below as vectors with components that correspond to the order of the actions in the triple, not to the order of the agents who have performed them.

From state *base*: From state goal:

Robots on a mission: guards

Guards. The same for each robot. The variable v denotes the current resource of the respective robot. Some explanations:

- \triangleright Action B is disabled at state base and actions R and G are disabled at state goal.
- \triangleright No requirements for the 'do nothing' action N.
- \triangleright R can only be attempted if the current energy level is \leq 2.
- \triangleright For a robot to attempt a transition to the other state, that robot must have a minimal energy level 2.
- V Goranko Any set of at least two robots can ensure transition from one state to the other, but no single robot can do that.

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Configurations, plays and histories in a GCMGP

Hereafter we ignore accumulated utilities and discounting.

Configuration in $\mathfrak{M} = (\mathcal{S}, \mathsf{payoff}, \{g_a\}_{a \in \mathbb{A}}, \{d_a\}_{a \in \mathbb{A}})$: a pair (s, \overrightarrow{u}) of a state s and a vector $\overrightarrow{u} = (u_1, \ldots, u_k)$ of currently accumulated utilities of the agents at that state.

The set of possible configurations: $\mathsf{Con}(\mathfrak{M}) = \mathcal{S} \times \mathrm{D}^{|\mathbb{A}|}.$

Partial configuration transition function:

$$
\widehat{\text{out}} : \text{Con}(\mathfrak{M}) \times \text{Act}_{\mathbb{A}} \dashrightarrow \text{Con}(\mathfrak{M})
$$

where $\widehat{\text{out}}((s, \overrightarrow{u}), \overrightarrow{\alpha}) = (s', \overrightarrow{u'})$ iff $\text{out}(s, \overrightarrow{\alpha}) = s'$ and:

(i) the value u_a assigned to v_a satisfies $g_a(s, \alpha_a)$ for each $a \in \mathbb{A}$ (ii) $u'_a = u_a + \text{payoff}_a(s, \overrightarrow{\alpha})$ for each $a \in \mathbb{A}$

The configuration graph on $\mathfrak M$ with an initial configuration $(s_0,\overrightarrow{u_0})$ consists of all configurations in \mathfrak{M} reachable from $(s_0, \overrightarrow{u_0})$ by out. A play in \mathfrak{M} : an infinite sequence $\pi = c_0\overrightarrow{\alpha_0}, c_1\overrightarrow{\alpha_1}, \dots$ from $(\text{Con}(\mathfrak{M}) \times \text{Act})^{\omega}$ such that $c_n \in \widetilde{\text{out}}(c_{n-1}, \overrightarrow{\alpha}_{n-1})$ for all $n > 0$. A history: any finite initial sequence of a play in Plays $_m$.

Some configurations and plays in the toy example

 \triangleright $(s_1, 0, 0)$ $(C, C)(s_1, 2, 2)$ $(C, C)(s_1, 4, 4)$, ... \triangleright $(s_1, 0, 0)$ (C, C) $(s_1, 2, 2)$ (D, D) $(s_2, 1, 1)$ (D, C) $(s_2, 0, -1)$ (C, D) $(s_2, 0, 1)$, $(s_2, 0, 3)$... \triangleright (s₁, 0, 0)(C, C)(s₁, 2, 2)(D, C)(s₃, 5, -2)(D, C)(s₃, 4, -3)(C, D)(s₃, 3, -4)... $(s_3, 0, -7)$ $(C, D)(s_3, -1, -8)$, ...

V Goranko NB: If player II has enough memory or can observe the accumulated utilities of I, she, ω_0 can coordinate with I at the round where $v_1 = 0$ by cooperating, thus escaping the trap at s_3 and making a sure transition to s_2 . 19 of 33

Some configurations and plays in the robots example

Initial configuration: $(base, (0, 0, 0))$.

1. The robots do not coordinate and keep trying to recharge forever. The mission fails:

 $(base; 0, 0, 0)$ (RRR) , $(base; 0, 0, 0)$ (RRR) , $(base; 0, 0, 0)$ (RRR) , ...

2. Now the robots coordinate on recharging, two at a time, until they each reach energy levels at least 3.

Then they all take action G and the team reaches state $goal$ and then succeeds to return to base:

 $(base, 0, 0, 0)$ (RRN) , $(base, 1, 1, 0)$ (NRR) , $(base, 1, 2, 1)$ (RNR) , $(base, 2, 2, 2)$ (RRN) $(base, 3, 3, 2)(NNR), (base, 3, 3, 4)(GGG)(goal, 2, 2, 3)(BBB), (base, 1, 1, 2) \ldots$

More configurations and plays in the robots example

3. Again the robots coordinate on recharging, but after the first recharge Robot a goes out of order. Thereafter a does nothing while the other two robots try to accomplish the mission by each recharging as much as possible and then both taking action G. The team reaches state goal but cannot return to base and remains stuck at state goal forever, for one of the two functioning robots does not have enough energy to apply B :

 $(base, 0, 0, 0)$ (RRN) , $(base, 1, 1, 0)$ (NRR) , $(base, 1, 2, 1)$ (NRR) , $(base, 1, 3, 2)$ (NRR) , $(base, 1, 3, 4) (NGG), (goal, 2, 1, 2) (NNB), (goal, 2, 1, 1) (NNN), \ldots$

4. As above, but now **b** and **c** apply a cleverer plan and succeed together to reach goal and then return to base:

V Goranko $(base, 0, 0, 0)$ (RRN) , $(base, 1, 1, 0)$ (NRR) , $(base, 1, 2, 1)$ (NRR) , $(base, 1, 3, 2)$ (NGR) $(base, 1, 2, 4)(NRN), (base, 1, 4, 4)(NGG), (goal, 2, 2, 2)(NBB), (base, 3, 0, 0).$ 21 of 33

Strategies

A strategy of a player **a** is a function s_a : Hist \rightarrow Act that respects the guards, i.e., if $s_a(h) = \alpha$ then $h^u[last]_a \models g_a(h^s[last], \alpha)$.

NB: strategy is based on histories of configurations and actions.

Typically considered in the study of repeated games, e.g., $TIT-FOR-TAT$ or GRIM-TRIGGER in repeated Prisoners Dilemma.

Strategies depend on players' information, memory, observations.

Some natural restrictions: state-, action-, or configuration-based; memoryless, bounded memory, of perfect recall strategies.

We assume that two classes of strategies S^p and S^o are fixed as parameters, resp. for the proponents and opponents to select from.

A unique outcome play $M(c,(s_A,s_A\setminus A))$ emerges from the execution of any strategy profile $(s_A, s_{A \setminus A})$ from configuration c.

Effective strategies: bounded memory strategies determined by transducers with transitions defined by arithmetical constraints on the current configurations.

QATL*: Quantitative extension of ATL*

The Alternating-time Temporal Logic involves:

- \triangleright Coalitional strategic path operators: $\langle A \rangle$ for any coalition of agents A. We will write $\langle\langle \mathbf{i}\rangle\rangle$ instead of $\langle\langle \{\mathbf{i}\}\rangle\rangle$.
- \triangleright Temporal operators: X (next time), G (forever), U (until)

Formulae:

$\varphi := p \mid \neg \varphi \mid \varphi_1 \vee \varphi_2 \mid \langle \langle A \rangle \rangle \varphi \mid \mathcal{X} \varphi \mid \mathcal{G} \varphi \mid \varphi_1 \mathcal{U} \varphi_2$

Semantics: in concurrent game models. Extends the semantics for LTL with the clause:

 $\langle\langle A \rangle\rangle\varphi$: "The coalition A has a collective strategy to guarantee the satisfaction of the goal φ " on every play enabled by that strategy.

The Quantitative ATL*: syntax and semantics

State formulae $\varphi ::= p \mid ac \mid \neg \varphi \mid \varphi \wedge \varphi \mid \langle \langle A \rangle \rangle \gamma$ Path formulae: $\gamma ::= \varphi \mid \text{apc} \mid \neg \gamma \mid \gamma \wedge \gamma \mid \mathcal{X} \gamma \mid \mathcal{G} \gamma \mid \gamma \mathcal{U} \gamma$ where $A \subseteq \mathbb{A}$, ac \in AC, apc \in APC, and $p \in$ Prop.

Given: $\mathfrak M$ be a GCMGP, c a configuration, φ state formula, $\gamma, \gamma_1, \gamma_2$ path formulae, S^p and S^o two classes of strategies.

$$
\mathfrak{M}, c \models p \text{ iff } p \in L(c^s);
$$
\n
$$
\mathfrak{M}, c \models ac \text{ iff } c^u \models ac,
$$
\n
$$
\mathfrak{M}, c \models \langle \mathcal{A} \rangle \rangle \gamma \text{ iff there is a } S^p\text{-strategy } s_A \text{ such that for all } S^o\text{-strategies}
$$
\n
$$
s_{\mathbb{A}\setminus A}: \mathfrak{M}, \text{outcome_play}^{\mathfrak{M}}(c, (s_A, s_{\mathbb{A}\setminus A})) \models \gamma.
$$
\n
$$
\mathfrak{M}, \pi \models \varphi \text{ iff } \mathfrak{M}, \pi[0] \models \varphi,
$$
\n
$$
\mathfrak{M}, \pi \models 2\gamma \text{ iff } \mathfrak{M}, \pi[1] \models \gamma,
$$
\n
$$
\mathfrak{M}, \pi \models \mathcal{G}\gamma \text{ iff } \mathfrak{M}, \pi[i] \models \gamma \text{ for all } i \in \mathbb{N},
$$
\n
$$
\mathfrak{M}, \pi \models \gamma_1 \mathcal{U}\gamma_2 \text{ iff there is } j \in \mathbb{N}_0 \text{ such that } \mathfrak{M}, \pi[j] \models \gamma_2 \text{ and}
$$
\n
$$
\mathfrak{M}, \pi[i] \models \gamma_1 \text{ for all } 0 \leq i < j.
$$
\n
$$
\text{Ultimately, we define } \mathfrak{M}, c \models \varphi \text{ iff } \mathfrak{M}, c, 0 \models \varphi.
$$

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Expressing specifications in QATL*

. QATL[∗] extends ATL[∗] , so it can express all purely qualitative ATL[∗] properties, like

$\langle\langle A\rangle\rangle$ (Gp \wedge qUr)

. QATL[∗] can also express quantitative properties, e.g.:

 $\langle\langle \{a\}\rangle\rangle \mathcal{G}(\nu_a > 0)$

"Player a has a strategy to maintain his accumulated utility positive",

or

 $\langle\langle A\rangle\rangle$ $(w_{\rm a} > 3)$

"The coalition A has a strategy to guarantee the value (i.t., limit payoff) of the play for player a to be at least 3''.

. Moreover, QATL[∗] can naturally express combined qualitative and quantitative properties, e.g.

 $\langle\!\langle \{\mathbf{a}\}\rangle\!\rangle\!((\mathbf{a} \text{ is happy}) \; \mathcal{U} \; (\mathsf{v}_{\mathbf{a}} \geq 10^6))$

or

 $\langle \langle \{\mathbf{a},\mathbf{b}\}\rangle \rangle ((v_{\mathbf{a}} + v_{\mathbf{b}} > 0) \mathcal{U} \mathcal{G} \text{safe}))$

Expressing properties in QATL* for the toy example

In the examples below p_i is true only at s_i , for each $i = 1, 2, 3$.

- 1. $\langle \langle \{I, I\} \rangle \rangle \mathcal{F}(p_1 \wedge v_1 > 100 \wedge v_1 > 100)$
- 2. $\langle \langle \{I, I\} \rangle \rangle \chi \chi \langle \langle \{II\} \rangle \rangle (G(p_2 \wedge v_1 = 0) \wedge \mathcal{F} v_{II} > 100).$
- 3. $\neg\langle\langle \{1\}\rangle\rangle\mathcal{G}(p_1 \vee v_1 > 0)$
- 4. $\neg \langle \langle \{I, II\} \rangle \rangle \mathcal{F}(p_3 \wedge \mathcal{G}(p_3 \wedge v_1 + v_1 > 0)).$

 $u > 0 \Rightarrow$ any action $u = 0 \Rightarrow C$ $u < 0 \Rightarrow$ max min p

1. $\langle \langle \{I,II\} \rangle \rangle \mathcal{F}(p_1 \wedge v_I > 100 \wedge v_{II} > 100)$ $(s_1,(0,0)),(s_1,(2,2)),(s_1(4,4))\ldots$

2. $\langle \langle \{I,II\} \rangle \rangle \chi \chi \chi \langle \langle \{II\} \rangle \rangle (G(p_2 \wedge v_I = 0) \wedge \mathcal{F} v_{II} > 100)$ $(s_1,(0,0)),(s_1,(2,2)),(s_2,(1,1)),(s_2,(0,-1)),(s_2,(0,1)),(s_2,(0,3))$

Expressing properties in QATL* for the Robots on a mission example

Suppose the objective of the team of robots on mission, starting from state *base* where each robot has energy level 0, is to eventually reach the state goal and then return to the base station.

Below, 'base' is an atomic proposition true only at state base and, 'goal' is an atomic proposition true only at state goal.

The following QATL*-formulae are true at (base, 0, 0, 0):

$$
\blacktriangleright \langle \langle \rangle \rangle \mathcal{G}(r_{\mathbf{a}} \geq 0 \wedge r_{\mathbf{b}} \geq 0 \wedge r_{\mathbf{c}} \geq 0)
$$

- $\triangleright \neg \langle \langle a \rangle \rangle \mathcal{F}$ goal ∧ $\neg \langle \langle b \rangle \rangle \mathcal{F}$ goal ∧ $\neg \langle \langle c \rangle \rangle \mathcal{F}$ goal.
- $\blacktriangleright \langle h, c \rangle \mathcal{F}(\text{goal} \land \langle a, b, c \rangle)(r_a > 0 \land r_b > 0 \land r_c > 0)$ Ubase).
- $\blacktriangleright \langle h, c \rangle \mathcal{F}(\text{goal} \land \langle h, c \rangle)(r_a > 0) \mathcal{U}(\text{base} \land r_a > 0)).$
- $\triangleright \neg \langle \langle \mathbf{b}, \mathbf{c} \rangle \rangle \mathcal{F}(\text{goal} \land \langle \langle \mathbf{b}, \mathbf{c} \rangle \rangle \mathcal{F}(\text{base} \land (r_{\mathbf{b}} > 0 \lor r_{\mathbf{c}} > 0))).$

On model checking in QATL*: reduction from the Halting problem for Minsky machines

The framework of QATL* is very general and easily leads to undecidable model checking (on finite models) even under very weak assumptions.

Lemma (Reduction from the Halting problem for Minsky machines) For any Minsky machine (2-counter automaton) A a finite 2-player GCMGP \mathfrak{M}^A using a proposition halt can be constructed so that:

A halts on empty input iff there is a play π in \mathfrak{M}^A which reaches a halt-state.

- Using that reduction, undecidability of the model checking in QATL* can be proved under quite week assumptions:
- two players,
- simple temporal objectives, only of the type $\mathcal{X}\varphi, \mathcal{G}\varphi$, and $\varphi\mathcal{U}\psi$, for state formulae φ, ψ .
- no nesting of strategic operators,
- simple arithmetical constraints, only comparing players' utilities with constants, not with each other.
- and state-based guards.

Still, there are several practically important decidable cases where the configuration space remains finite, e.g.:

- \triangleright When the possible accumulated amount of payoffs or resource per agent is bounded above and below, with state-based guards.
- \triangleright When resources are not created, but only consumed or re-distributed and cannot become negative.

There are some non-trivial decidable cases with infinite configuration spaces, too, by reduction to VASS reachability and coverability problems or to energy parity games.

For further details, as well as some open problems and conjectures, see the full paper.

Concluding remarks

This is a long-term interdisciplinary project, involving Logic, Game Theory and CS. There is a wide spectrum of related work.

 \triangleright Three perspectives of research agenda:

- \triangleright Game theory: solution concepts, equilibria, extending results from repeated games (e.g., folk theorems), etc.
- \triangleright Logic: Expressiveness, formal reasoning, deduction.
- \triangleright Computation: decidability, algorithms and complexity for model checking and synthesis, incl. solving games, computing winning strategies, optimizing payoffs, etc.
- \triangleright Many still unexplored directions:
	- \triangleright solution concepts and equilibria
	- \blacktriangleright games with imperfect information
	- \triangleright stochastic games with probabilistic strategies, etc.

The end

