



Verifying Resource Bounded Agents

From Resource-Bounded Agents towards a General Framework for Quantitative and Qualitative Strategic Reasoning

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Outline

- 1 Introduction
- 2 Resource Agent Logics
- 3 Verification of Resource-Bounded Systems
 - Problem and Overview
 - Undecidability
 - Decidability
- 4 General Quantitative Reasoning Framework
- 5 Conclusion

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Motivation

Logics for MAS: **specification** and **verification**

- **Strategic logics**

- What can **teams of agents** achieve?
- Can a set of interacting processes ensure correct functioning?

⇒ **alternating-time temporal logic** (ATL)[Alur et al., 2002]

- **Resources**

present in and crucial for many multi-agent systems

- Do agents have **sufficient energy** to achieve a task?
- Can a team of **robots defend the base** with the given **energy** status?
- Do agents have enough **resources and capabilities** to complete a task?

⇒ many variants with resources: **Resource Agent Logics** (RAL)

Be careful with resources:

- RAL + unbounded production/consumption of resources
 - (model checking over) Petri nets
 - (model checking over) vector addition systems
- rule of thumb: often undecidability if **zero-test** can be encoded
- but: **decidable model checking** possible... when?

Today's talk:

- 1 introduce general resource-bounded framework
- 2 review some undecidability results
- 3 review some decidable cases
- 4 motivate general quantitative, game theoretic setting \rightsquigarrow Valentin

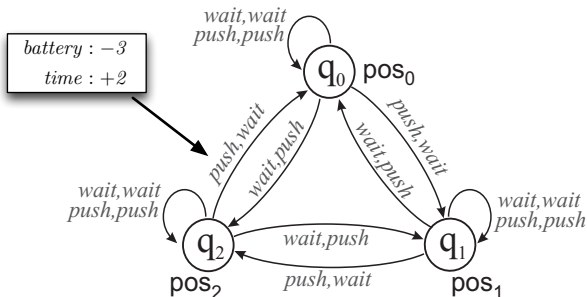
focus of talk: **key concepts and techniques**

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Resource-Bounded Models

- Computational systems often need a notion of resource.
- **Resource-bounded agents**
- Actions **consume** / **produce** resources.
- Non-empty set $\mathcal{R} = \{r_1, \dots, r_\rho\}$ of **resources**.

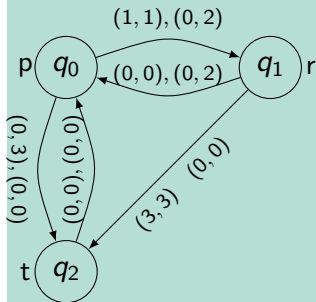


A Single Agent Example

Example (Resource-Bounded Tree Logic [Bulling and Farwer, 2010a])

RTL replaces CTL's path operator: $E\gamma \rightsquigarrow \langle \rho \rangle \gamma$

$\mathfrak{M}, q \models \langle \rho \rangle \varphi$ iff \exists **ρ -feasible path** λ such that $\mathfrak{M}, \lambda \models \varphi$



- feasible path:
 $(q_0, (\infty, 1))(q_1, (\infty, 2))(q_0, (\infty, 4)) \dots$
- resources ≥ 0
- $\mathfrak{M}, q_0 \models \langle (\infty, 1) \rangle \mathbf{G} \mathbf{T}$
- $\mathfrak{M}, q_0 \models \langle (1, \infty) \rangle \mathbf{G}(p \vee t)$
- Note: nested operators re-set resources $\langle \rho_1 \rangle \mathbf{F} \langle \rho_2 \rangle \mathbf{F} p$.

Main result: **Model checking RTL is decidable** (open for RTL*)
(reduction to **Petri net** reachability)

Related Work on Resource Agent Logics

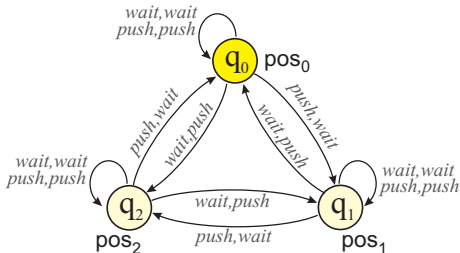
- Resource-Bounded Coalition Logic [Alechina et al., 2009]
↪ only consumption, Coalition Logic
- Resource-Bounded Alternating Time Temporal Logic [Alechina et al., 2014, Alechina et al., 2010]
↪ only consumption (**RB-ATL**), axiomatization, model checking, consumption & production, resource flat, proponent restricted, (**RB+-ATL**) ATL -based
- Resource Agent Logic [Bulling and Farwer, 2010b, Alechina et al., 2015]
↪ consumption & production **RAL**, undecidability & decidability, shared resources, ATL -based
- Resources and money [Della Monica et al., 2011]
↪ decidability, bounded shared resources, ATL -based

What makes settings (un)decidable?

Concurrent Game Structures and ATL

Agents:

- execute actions
- cooperate
- model: **concurrent game structure**



Strategic logic ATL (Alur et al. 1997-2002):

- $\langle\langle A \rangle\rangle\gamma$ “Group A has a strategy to **guarantee** γ ”
- **ATL**: $\varphi ::= p \mid \neg\varphi \mid \varphi \wedge \varphi \mid \langle\langle A \rangle\rangle\mathbf{X}\varphi \mid \langle\langle A \rangle\rangle\mathbf{G}\varphi \mid \langle\langle A \rangle\rangle\varphi\mathbf{U}\varphi$
- **ATL***: Allows **arbitrary combinations** of cooperation and temporal modalities (e.g. $\langle\langle A \rangle\rangle\mathbf{GF}\varphi$).

Example: $\mathfrak{M}, q_0 \models \langle\langle 1 \rangle\rangle\mathbf{G}\neg\text{pos}_1$

$\mathfrak{M}, q_0 \not\models \langle\langle 1 \rangle\rangle\mathbf{F}\text{pos}_1$

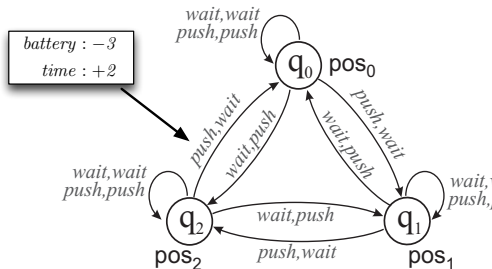
Variants of Resource agent logics

- transitions have costs (or rewards) and the syntax can **express resource requirements for a strategy**, e.g.:

agents A can enforce outcome φ if they have at most b_1 units of resource r_1 and b_2 units of resource r_2

In the following:

- consumption & production
- unbounded resources
- all agents may act under resource constraints



Definition (Resource Agent Logic RAL [Bulling and Farwer, 2010b])

RAL-formulae are defined by:

$$\phi ::= p \mid \neg\phi \mid \phi \wedge \phi \mid \langle\langle A \rangle\rangle_B^\downarrow \mathbf{X}\varphi \mid \langle\langle A \rangle\rangle_B^\eta \mathbf{X}\varphi \mid \langle\langle A \rangle\rangle_B^\downarrow \varphi \mathbf{U}\psi \mid \langle\langle A \rangle\rangle_B^\eta \varphi \mathbf{U}\psi \mid \\ \langle\langle A \rangle\rangle_B^\downarrow \mathbf{G}\varphi \mid \langle\langle A \rangle\rangle_B^\eta \mathbf{G}\varphi$$

where $p \in \Pi$ is a proposition, $A, B \subseteq \text{Agt}$ are sets of agents, and η is a **resource endowment**.

$\langle\langle A \rangle\rangle_B^\eta \varphi$: agents A have a strategy compatible with the endowment η to enforce φ whatever the opponent agents do (opponents in B also act under resource bound η)

$\langle\langle A \rangle\rangle_B^\downarrow \varphi$: agents A have a strategy compatible with the current resource endowment to enforce φ whatever the opponent agents do (opponents in B also act under the current resource bound)

Computational costs: $\rightsquigarrow \langle\langle A \rangle\rangle^{\eta_1} \mathbf{X} \langle\langle A \rangle\rangle^{\eta_2} \gamma$ vs. $\langle\langle A \rangle\rangle^{\eta_1} \mathbf{X} \langle\langle A \rangle\rangle^\downarrow \gamma$

Important fragments

rfRAL: **resource-flat RAL**, each nested ATL operator has a fresh assignment of resources ($\langle\langle A \rangle\rangle_B^\downarrow \varphi$ is not allowed):

given their initial fuel, rescue robots A can safely get to a position from which they can refuel and perform rescue while in visual contact with the base

$$\langle\langle A \rangle\rangle_A^{\eta_{\text{init}}} (\text{safe } \mathbf{U} (\langle\langle A \rangle\rangle_A^{\eta_{\text{refuel}}} (\text{visual } \mathbf{U} \text{ rescue})))$$

contrast: $\langle\langle A \rangle\rangle_A^{\eta_{\text{init}}} (\text{safe } \mathbf{U} (\langle\langle A \rangle\rangle_A^\downarrow (\text{visual } \mathbf{U} \text{ rescue})))$

prRAL: **proponent-restricted RAL**, only the strategy of the proponent agents is resource bounded—the opponent agents have no resource bound $\langle\langle A \rangle\rangle_A^\eta \varphi$, $\langle\langle A \rangle\rangle_A^\downarrow \varphi$

rfprRAL: combination

Strategies and Their Outcome

- Perfect information perfect recall strategy for agent a (**IR-strategy**):

$$s_a : Q^+ \rightarrow Act .$$

- Perfect information memoryless strategy for agent a (**Ir-strategy**):

$$s_a : Q \rightarrow Act$$

- **ATL**: it is known that **memory does not matter** [Alur et al., 2002]

if agents can win with memory they can also do so without!

- **RAL**: **memory does (usually) matter!**

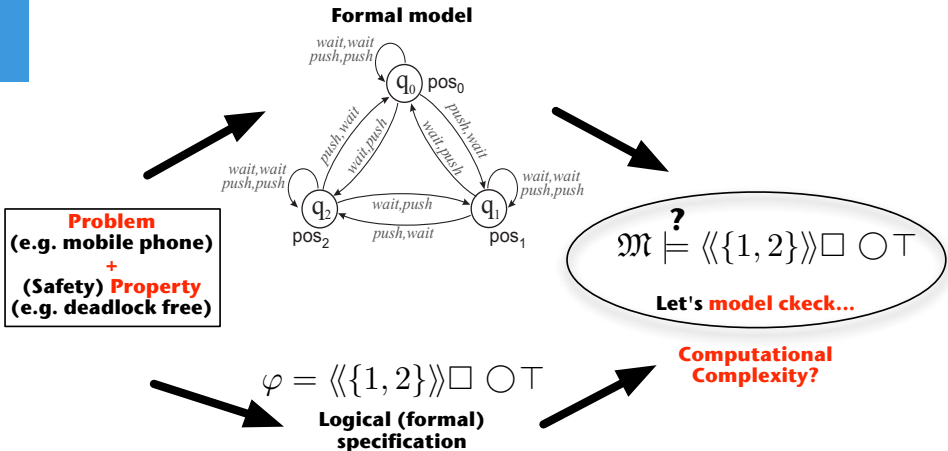
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Model Checking



Overview: (Un)Decidability

- variants of RTL: language, memory, models
- **unbounded production** \Rightarrow mostly undecidable
- overview results of [Bulling and Farwer, 2010b]:

	\mathcal{L}_{RAL^*}	\mathcal{L}_{RAL^+}	\mathcal{L}_{RAL}	$pr\text{-}\mathcal{L}_{RAL^*}$	$pr\text{-}\mathcal{L}_{RAL^+}$	$pr\text{-}\mathcal{L}_{RAL}$
\models_R	U^1	U^1	U^1	U^1	U^1	U^1
\models_r	U^1	U^1	U^1	U^2	U^2	U^2
$rf+\models_R / \models_R^\infty$	U^2	U^2	U^2	U^2 / U_∞^2	$? / U_\infty^2$	$? / U_\infty^2$
$rf+\models_r$	$?$	$?$	$?$	$?$	$?$	$?$
$\models_{R'}^k, \models_r^k$	D	D	D	D	D	D

- Decidability with **unbounded production**:
 - **RB \pm ATL** [Alechina et al., 2014]:
 - (1) resource-flat, (2) proponent restricted, (3) idle action
 - **prRAL r** [Alechina et al., 2015]:
 - (1) proponent restricted, (2) idle action, (3) positive fragment
 - 1-shared unbounded resource [Bulling and Nguyen, 2015]

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Undecidability of rfRAL over iRBMs

Models	RAL	rfRAL	prRAL	rfprRAL
RBM	U [1]	U [1]	U [1]	U [1]
iRBM	U [1]	U[3]	U [1, 3]	D [2]

RBM Resource Bounded Models (infinite semantics)

iRBM Resource Bounded Models with **idle actions**

We also show undecidability wrt. 1 resource type

[1] Bulling & Farwer 2010

[2] Alechina et al. 2014

[3] Alechina et al. 2015

An aside: **RBM** + finitary semantics = **iRBM** + std. semantics

High-Level Idea of Reduction

- 1 reduce halting problem for **two counter machines** (pushdown automaton with two stacks)
- 2 encode transition table as an **iRBM**
two counters simulated by two resource types
- 3 two agents:
 - (1) **simulator agent** selects transitions of the automaton
 - (2) the **spoiler** agent is used to ensure that only **valid transitions** are selected by the simulator agent

spoiler agent used to encode **zero-test**

Observation

Proponent restrictedness is essential for decidability, even over **iRBMs**

Two-counter automaton [Hopcroft and Ullman, 1979]

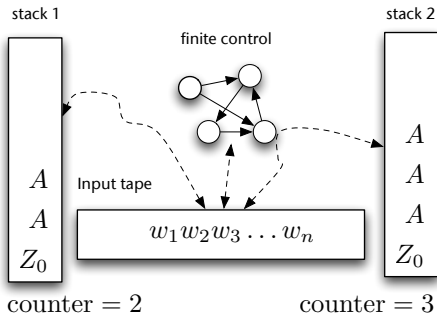
Two-counter automaton is essentially a PDA with 2 stacks.

Transitions depend on

- state,
- symbol read,
- counters **zero or non-zero**.

Counters:

- +1
- -1



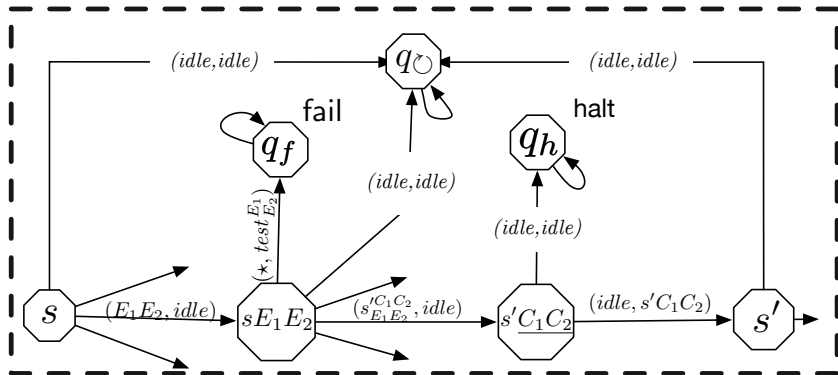
Crucial: The logic is used to implement the **zero/emptiness test**

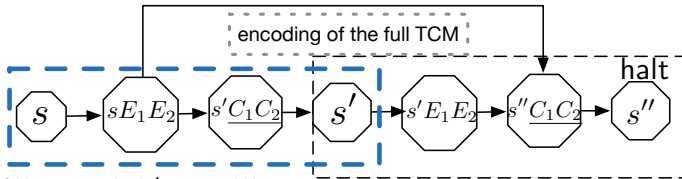
Does \mathcal{A} halt on empty input? \rightsquigarrow **undecidable**

Counters	\rightsquigarrow	Resource types
Transitions	\rightsquigarrow	Actions
Runs	\rightsquigarrow	strategies/paths + validity condition
Accepting run	\rightsquigarrow	strategies which ensure Fhalt

Transition relation: $(s, E_1, E_2) \Delta (s', C_1, C_2)$

$$E_i \in \{0, 1\} \quad C_i \in \{-1, 0, +1\}$$



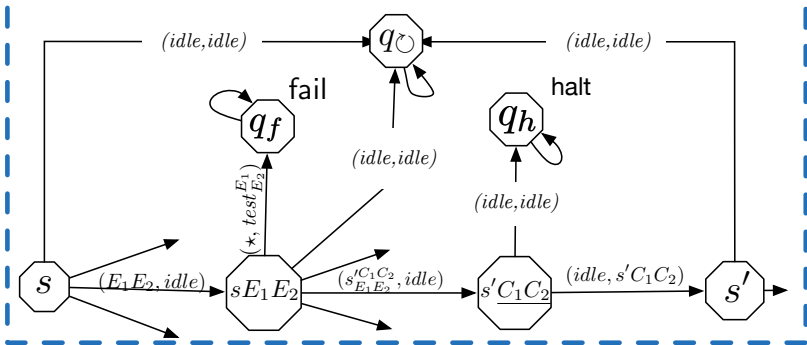


$$\Delta = \{((s, E_1, E_2), (s', C_1, C_2)),$$

$$((s, E_1, E_2), (s'', C_1, C_2)),$$

$$((s', E_1, E_2), (s'', C_1, C_2))\}$$

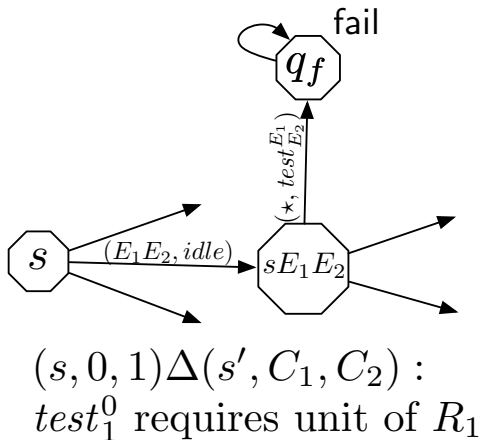
encoding of a single transition of the automaton



Two agents:

- 1: simulate transitions
- 2: 'spoil' execution in states sE_1E_2

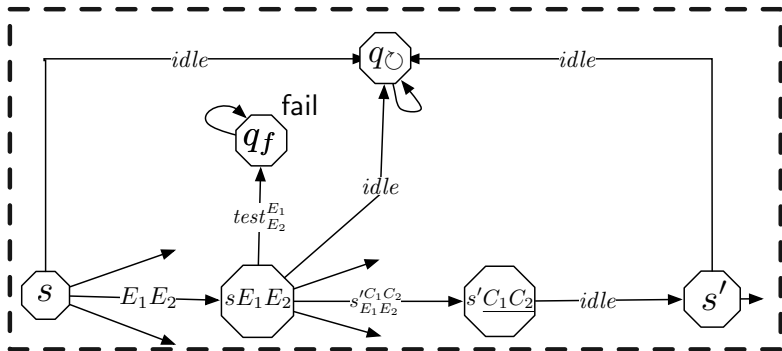
A halts on ε iff
 $\mathfrak{M}^A, s^{\text{init}}, \eta \models_R \langle\langle 1 \rangle\rangle_{\{1,2\}}^{\bar{0}} \text{Fp}$



Theorem

Model checking **rRAL** over **iRBMs** is **undecidable** even with **2 agent** and **2 resource types**.

What about the **single agent** case?



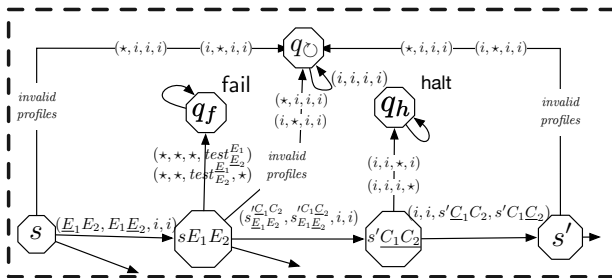
A halts on ε iff $\mathfrak{M}_1^A, s_{\text{init}}, \eta_0 \models_R \langle\langle\{1\}\rangle\rangle^{\bar{0}} \underbrace{((\neg\langle\langle\{1\}\rangle\rangle)^{\downarrow} \mathbf{X} \text{fail})}_{\text{Test in error state}} \mathbf{U} \text{halt}$

Theorem

Model checking **prRAL over iRBMs** is undecidable even with *1 agent* and *2 resource types*.

Single Resource Setting

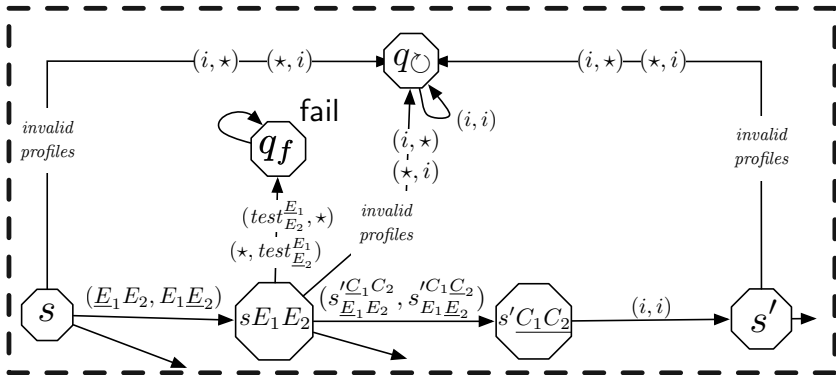
We can adapt the reduction to work with **1 resource type only**.
Introduce **more agents** and **coordinate their actions**.



A halts on ε iff $\mathcal{M}_2^A, s_{\text{init}}, \bar{0} \models_R \langle\langle 1, 2 \rangle\rangle_{\{1,2,3,4\}}^{\bar{0}}$ F_{halt}

Theorem (forthcoming)

Model checking **rRAL** over **iRBMs** is **undecidable** even with **4 agent** and **1 resource type**.



A halts on ε iff $\mathfrak{M}_1^A, s_{init}, \bar{0} \models \langle\langle\{1, 2\}\rangle\rangle^{\bar{0}} ((\neg\langle\langle\{1, 2\}\rangle\rangle)^{\downarrow} \mathbf{X} \text{fail}) \mathbf{U} \text{halt}$

Theorem (forthcoming)

Model checking **prRAL over iRBMs** is undecidable even with 2 agent and 1 resource type.

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Decidable Fragments

Formula used in the reduction of prRAL:

$$\mathfrak{M}_1^A, s_{\text{init}}, \bar{0} \models \langle\langle\{1, 2\}\rangle\rangle^{\bar{0}}((\neg\langle\langle\{1, 2\}\rangle\rangle^{\downarrow} \mathbf{X} \text{ fail}) \mathbf{U} \text{ halt})$$

Definition (prRAL^r)

prRAL^r is the **positive fragment of prRAL**, more precisely, at no coalition modality is under the scope of a negation.

Models	RAL	rfRAL	prRAL	rfprRAL	prRAL ^r	1 shared
RBM	U	U	U	U	U	D [4]
iRBM	U	U	U	D [2]	D [3]	D [4]

[2] Alechina et al. 2014

[3] Alechina et al. 2015 [4] Bulling & Nguyen 2015

prRAL^r vs rfprRAL

- given their initial battery charge, rescue robots A can safely get to a position from which they can perform rescue while in visual contact with the base

$$\langle\langle A \rangle\rangle^{\eta_{\text{init}}}(\text{safe } \mathbf{U}(\langle\langle A \rangle\rangle^{\downarrow}(\text{visual } \mathbf{U} \text{ rescue})))$$

i.e., the robots cannot recharge their batteries after reaching the position from which they can perform rescue

- given their initial fuel and battery, booster (1) & satellite (2) can safely reach a position from which satellite can monitor indefinitely

$$\langle\langle 1, 2 \rangle\rangle^{\eta_{\text{init}}}(\text{safe } \mathbf{U}(\langle\langle 2 \rangle\rangle^{\downarrow} \mathbf{G} \text{ monitor}))$$

i.e., satellite has an action to recharge its batteries

Decidability of prRAL' over iRBMs

The algorithm requires as input \mathfrak{M} , q , η , ϕ and returns true or false

- 1 algorithm performs an **and-or search** of the model
- 2 $\langle\langle A \rangle\rangle^{\downarrow\varphi}$: **propagate the current endowment** to the nested search
- 3 $\langle\langle A \rangle\rangle^{\eta\varphi}$: **start a new search** with endowment η
- 4 **termination**: check for loops with **comparable endowments**
introduce **arb** if there is a **productive loop**, finite but arbitrary amount of resources
 - important that **no negation is allowed**
 $\langle\langle 1 \rangle\rangle^{\mathbf{F}} \neg \langle\langle 1 \rangle\rangle^{\downarrow\mathbf{F}} \mathbf{F}$ p: if **arb** is introduced, 1 has too much power
 - important that only **proponent restricted**
 $\langle\langle A \rangle\rangle_B^{\mathbf{F}} \mathbf{F}$ p: interplay between A and B tricky when introducing **arb**
 - important that **iRBMs** are used
introduction of **arb** not sufficient \rightsquigarrow existence of infinite path

Shared Resources

- we consider **shared resources**: common pool
- opponents **always have priority** (similar to [Della Monica et al., 2011])

Example

Departmental travel budget. All agents **compete** for the same resources.

Theorem ([Bulling and Nguyen, 2015])

RAL over **k -unbounded iRBMs** is *decidable for $k \leq 1$ and undecidable otherwise.*

Reduction to CTL over **alternating Büchi pushdown systems.**

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The following topics are related (conceptually or technically):

- resource logics
- Petri nets
- vector addition systems
- (infinite) games (with quantitative aspects)
- quantitative reasoning tools

Can a **unified framework** help to understand such systems?

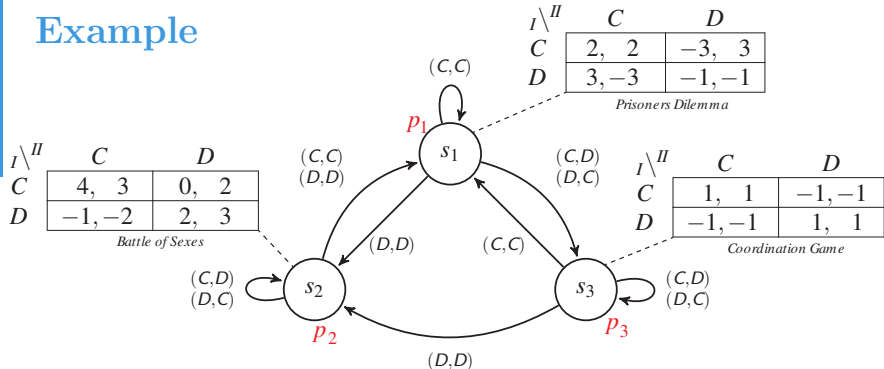
- also: resource consumption/production may depend on action profiles \rightsquigarrow closer to **game theory**

Quantitative Reasoning

Expressing specifications in QATL*[Bulling and Goranko, 2013]:

- QATL* extends **ATL***, **qualitative properties**: $\langle\langle A \rangle\rangle(\mathbf{G}p \wedge q\mathbf{U}r)$
- Purely **quantitative properties**:
 - $\langle\langle \mathbf{a} \rangle\rangle\mathbf{G}(v_a > 0)$ “Player **a** has a strategy to maintain his accumulated payoff positive”,
 - $\langle\langle A \rangle\rangle(w_a \geq 3)$ “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”.
- Combined **qualitative and quantitative properties**:
 - $\langle\langle \mathbf{a} \rangle\rangle((\mathbf{a} \text{ is happy}) \mathbf{U} (v_a \geq 100))$
 - $\langle\langle \mathbf{a}, \mathbf{b} \rangle\rangle((v_a + v_b > v_c) \mathbf{U} \mathbf{G}(\mathbf{a} \text{ is happy}))$
- In general easily **undecidable**

Example



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

① $\langle\langle \{I, II\} \rangle\rangle \mathbf{F}(p_1 \wedge v_I > 100 \wedge v_{II} > 100) \rightsquigarrow$

$(s_1, (0, 0)), (s_1, (2, 2)), (s_1, (4, 4)) \dots$

② $\langle\langle \{I, II\} \rangle\rangle \mathbf{XXX} \langle\langle \{II\} \rangle\rangle (\mathbf{G}(p_2 \wedge v_I = 0) \wedge \mathbf{F} v_{II} > 100) \rightsquigarrow$

$(s_1, (0, 0)), (s_1, (2, 2)), (s_2, (1, 1)), (s_2, (0, -1)), (s_2, (0, 1)), (s_2, (0, 3))$

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Conclusions

- Extensions of **ATL**
- Main Interest: **What can be verified?**
- decidability depends on many **design choices**

Future work:

- **implementation** of prRAL^r in MCMAS
- practical settings
- other **decidable fragments** of RAL
- computational complexity

Thank you for your attention.

Questions?

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