



Coalitional Games

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Part 2. Reasoning about Coalitions

Reasoning about Coalitions

- 2.1 Modal Logic
- 2.2 ATL
- 2.3 Rational Play (ATLP)
- 2.4 Imperfect Information
- 2.5 Model Checking
- 2.6 References



Outline

- In the previous chapter, we showed how coalitions can be rationally formed



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- In the previous chapter, we showed how coalitions can be rationally formed
- In this chapter, we show how one can use modal logic to reason about their play and their outcome.



2.1 Modal Logic



Why logic at all?

- framework for **thinking** about systems,
- makes one **realise** the implicit **assumptions**,
- ... and then we can:
- **investigate** them, **accept or reject** them,
- **relax** some of them and still use a part of the formal and conceptual machinery;



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- reasonably expressive but simpler and more rigorous than the full language of mathematics.



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- **Verification**: check specification against implementation
- Executable specifications
- Planning as model checking



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- **Game solving, mechanism design, and reasoning about games** have natural interpretation as logical problems



Modal logic is an extension of classical logic by new connectives \Box and \Diamond : **necessity** and **possibility**.



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- “ $\Box p$ is true” means **p is necessarily true**, i.e. true in every possible scenario,
- “ $\Diamond p$ is true” means **p is possibly true**, i.e. true in at least one possible scenario.



Various modal logics:

- knowledge → **epistemic logic**,
- beliefs → **doxastic logic**,
- obligations → **deontic logic**,
- actions → **dynamic logic**,
- time → **temporal logic**,

- and combinations of the above
Most famous multimodal logic: **BDI logic** of beliefs, desires, intentions (and time)



Definition 2.1 (Kripke Semantics)

Kripke model (possible world model):

$$M = \langle \mathcal{W}, R, \pi \rangle,$$

- \mathcal{W} is a set of **possible worlds**
- $R \subseteq \mathcal{W} \times \mathcal{W}$ is an **accessibility relation**
- $\pi : \mathcal{W} \rightarrow \mathcal{P}(\Pi)$ is a **valuation of propositions**.



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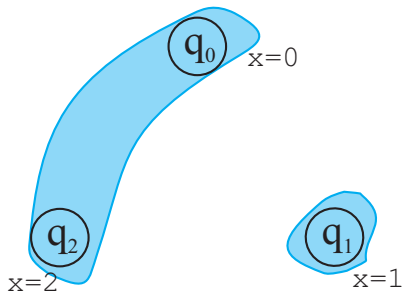
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$M, w \models \Box\varphi$ iff for every $w' \in \mathcal{W}$ with wRw' we have that
 $M, w' \models \varphi$.

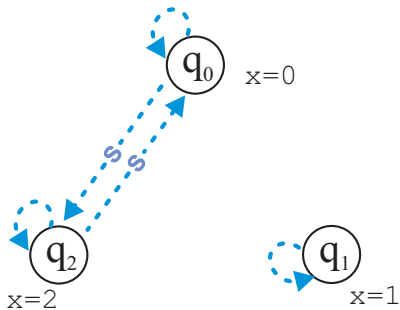


An Example



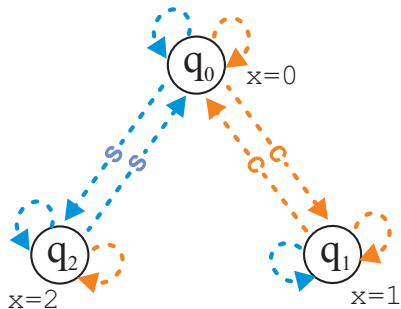


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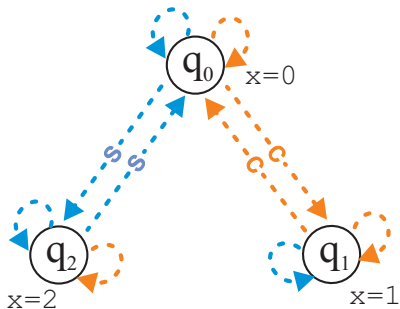


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$$x \doteq 1 \rightarrow K_s x \doteq 1$$



2.2 ATL



ATL: What Agents Can Achieve

- **ATL: Agent Temporal Logic** [Alur et al. 1997]
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$\langle\langle A \rangle\rangle\Phi$: coalition A has a collective strategy to **enforce** Φ



- $\langle\langle jamesbond \rangle\rangle \diamond win$:
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“James Bond and his girlfriend are able to have fun until someone shoots at them”
- “Vanilla” ATL: every temporal operator preceded by exactly one cooperation modality;
- ATL*: no syntactic restrictions;



ATL Models: Concurrent Game Structures

- Agents, actions, transitions, atomic propositions
- Atomic propositions + interpretation
- Actions are abstract



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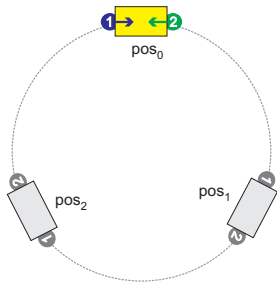
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- St : a set of **states**
- π : a **valuation** of propositions
- Act : a finite set of (atomic) **actions**
- $d : \mathbb{A}gt \times St \rightarrow \mathcal{P}(Act)$ defines actions **available** to an agent in a state
- o : a deterministic **transition function** that assigns outcome states $q' = o(q, \alpha_1, \dots, \alpha_k)$ to states and tuples of actions

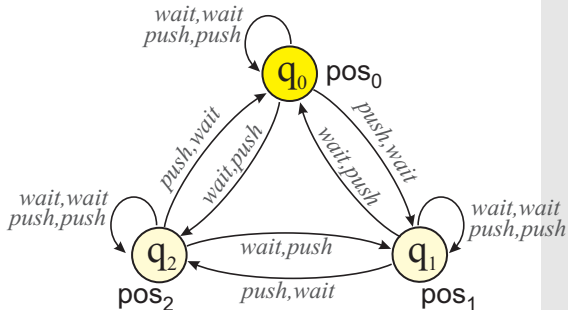
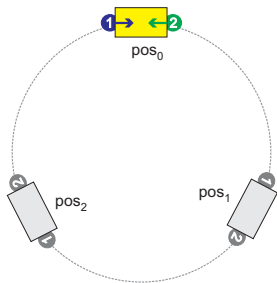


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Function **out**(q, S_A) returns the **set of all paths** that may result from agents A executing strategy S_A from state q onward.



Definition 2.4 (Semantics of ATL)

$M, q \models \langle\langle A \rangle\rangle \Phi$ iff there is a collective strategy S_A such that, for every path $\lambda \in out(q, S_A)$, we have $M, \lambda \models \Phi$.



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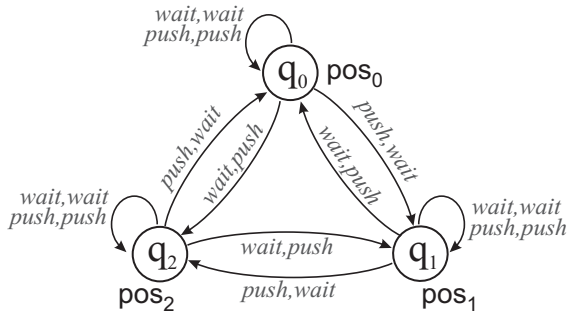
$M, \lambda \models \varphi \mathcal{U} \psi$ iff $M, \lambda[i] \models \psi$ for some $i \geq 0$, and $M, \lambda[j] \models \varphi$ for all $0 \leq j \leq i$.

**Definition 2.4 (Semantics of ATL)**

$M, q \models p$	iff p is in $\pi(q)$;
$M, q \models \varphi \wedge \psi$	iff $M, q \models \varphi$ and $M, q \models \psi$;
$M, q \models \langle\langle A \rangle\rangle \Phi$	iff there is a collective strategy S_A such that, for every path $\lambda \in \text{out}(q, S_A)$, we have $M, \lambda \models \Phi$.
$M, \lambda \models \bigcirc \varphi$	iff $M, \lambda[1] \models \varphi$;
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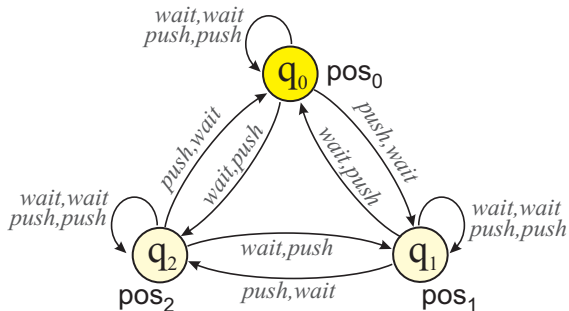
Example: Robots and Carriage



$$\text{pos}_0 \rightarrow \langle\langle 1 \rangle\rangle \square \neg \text{pos}_1$$



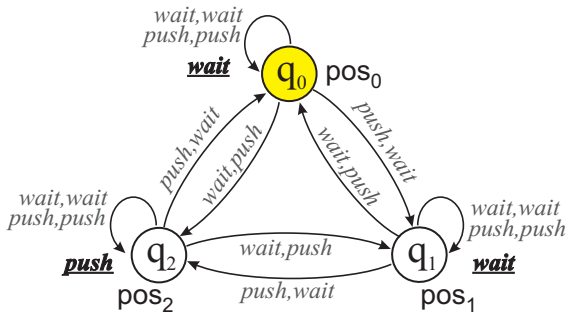
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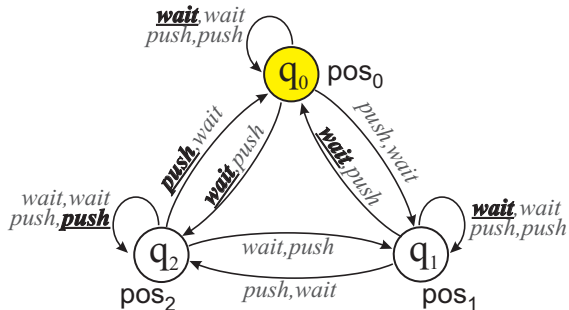
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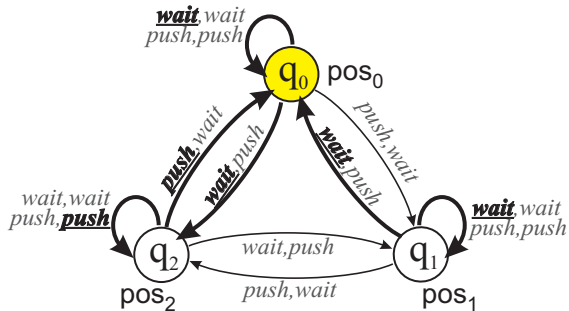
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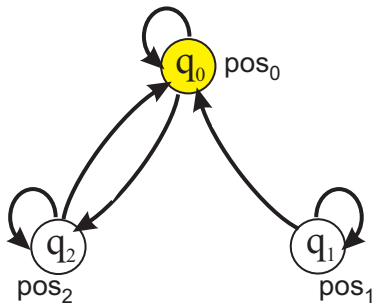
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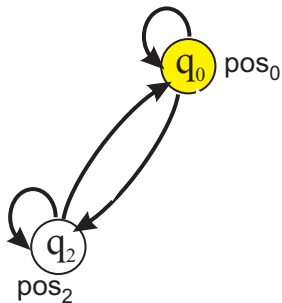
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- safety properties
- liveness properties
- fairness properties



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“something bad will not happen”

“something good will always hold”



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In ATL:

$\langle\langle os \rangle\rangle \Box \neg \text{crash}$



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In ATL:

$\langle\langle$ alice, bob $\rangle\rangle \diamond$ paperAccepted



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In ATL* (!):

$\langle\langle\text{prod}, \text{dlr}\rangle\rangle\square(\text{carRequested} \rightarrow \diamond\text{carDelivered})$



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 \rightsquigarrow **infinite** 2-player, binary, zero-sum game
- Flexible and compact specification of winning conditions



- Solving a game \approx checking if $M, q \models \langle\langle A \rangle\rangle \gamma$



- Solving a game \approx checking if $M, q \models \langle\langle A \rangle\rangle \gamma$
- But: do we really want to consider all the possible plays?



2.3 Rational Play (ATLP)



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- *Solution concepts* define rationality of players



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 - Nash equilibrium
 - subgame-perfect Nash
 - undominated strategies
 - Pareto optimality



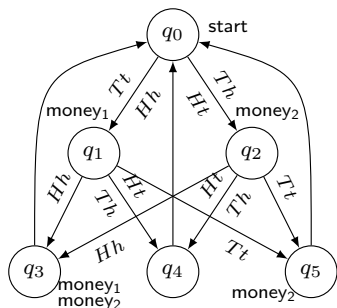
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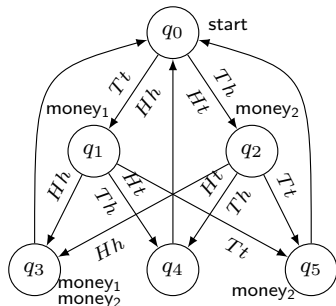
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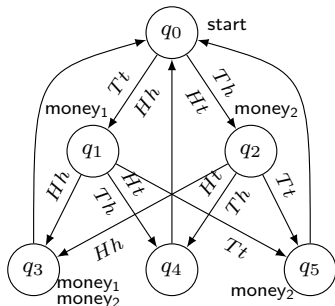
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- Role of rationality criteria: **constrain the possible game moves** to “sensible” ones



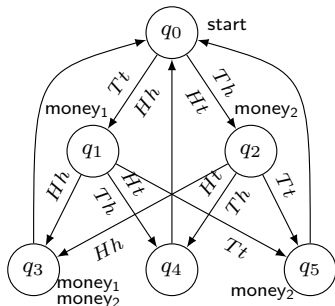


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$\langle\langle A \rangle\rangle\varphi$: agents A have a *plausible* collective strategy to enforce φ against any *plausible* response of their opponents.

Important

The possible strategies of both A and $\text{Agt} \setminus A$ are restricted.



New in ATLP:

(**set-pl** ω) : the set of plausible profiles is **set/reset** to the strategies described by ω .

Only **plausible strategy profiles** are considered!



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Example: (**set-pl** *greedy*₁) $\langle\langle 2 \rangle\rangle \diamond$ *money*₂



Concurrent game structures with plausibility

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- $\Upsilon \subseteq \Sigma$: set of (plausible) strategy profiles

	Deny	Confess
Deny	-2, -2	-5, -1
Confess	-1, -5	-4, -4

Diagram illustrating a concurrent game structure with plausibility. The game is represented by a 2x2 payoff matrix. The strategies are Deny and Confess. The payoffs are as follows:

- Deny, Deny: -2, -2
- Deny, Confess: -5, -1
- Confess, Deny: -1, -5
- Confess, Confess: -4, -4

The set of plausible strategy profiles, Υ , is indicated by blue arrows pointing to the cells (-2, -2) and (-4, -4).



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Diagram illustrating a 2x2 game matrix. The columns are labeled 'Deny' and 'Confess', and the rows are labeled 'Deny' and 'Confess'. The payoffs are: (Deny, Deny) = (-2, -2), (Deny, Confess) = (-5, -1), (Confess, Deny) = (-1, -5), and (Confess, Confess) = (-4, -4). Blue boxes highlight the cells (-2, -2) and (-4, -4). Blue arrows point from a symbol Υ to these two cells.

- $\Omega = \{\omega_1, \omega_2, \dots\}$: set of plausibility terms

Example: ω_{NE} may stand for all Nash equilibria



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- $\|\cdot\| : St \rightarrow (\Omega \rightarrow \mathcal{P}(\Sigma))$: plausibility mapping

Example: $\|\omega_{NE}\|_q = \{(\text{confess}, \text{confess})\}$



Outcome = Paths that may occur when agents A perform

s_A



Outcome = Paths that may occur when agents A perform s_A when only plausible strategy profiles from Υ are played



Outcome = Paths that may occur when agents A perform s_A when only plausible strategy profiles from Υ are played

$out_{\Upsilon}(q, s_A) =$

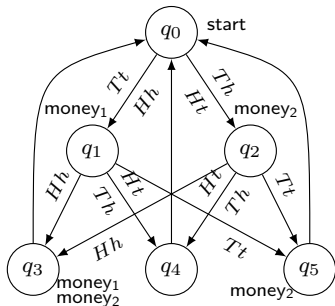
$$\{\lambda \in St^+ \mid \exists t \in \Upsilon(s_A) \forall i \in \mathbb{N} (\lambda[i+1] = \delta(\lambda[i], t(\lambda[i])))\}$$



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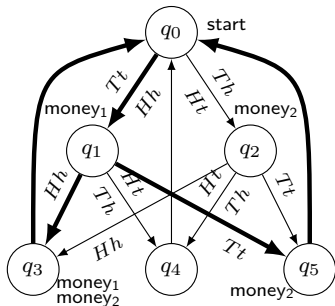




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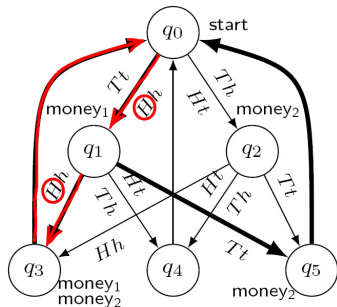
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P : the players always show same sides of their coins

s_1 : always show “heads”



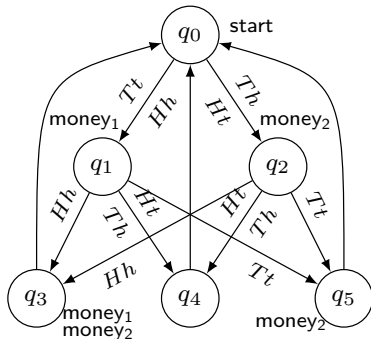
Semantics of ATLP

$M, q \models \langle\langle A \rangle\rangle \gamma$ iff there is a strategy s_A consistent with Υ such that $M, \lambda \models \gamma$ for all $\lambda \in \text{out}_\Upsilon(q, s_A)$

$M, q \models (\text{set-pl } \omega)\varphi$ iff $M^\omega, q \models \varphi$ where the new model M^ω is equal to M but the new set Υ^ω of plausible strategy profiles is set to $\|\omega\|_q$.



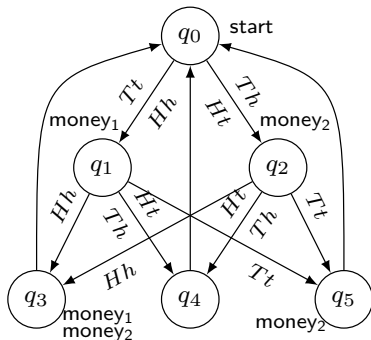
Example: Pennies Game



$$M, q_0 \models (\mathbf{set-pl} \ \omega_{NE}) \langle\langle 2 \rangle\rangle \diamond \text{money}_2$$



Example: Pennies Game



$M, q_0 \models (\text{set-pl } \omega_{NE}) \langle\langle 2 \rangle\rangle \diamond \text{money}_2$

What is a Nash equilibrium in this game?

We need some kind of winning criteria!



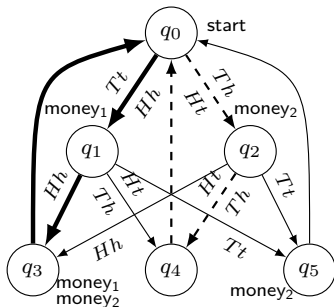
Agent 1 “wins”, if $\gamma_1 \equiv \Box(\neg\text{start} \rightarrow \text{money}_1)$ is satisfied.

Agent 2 “wins”, if $\gamma_2 \equiv \Diamond\text{money}_2$ is satisfied.



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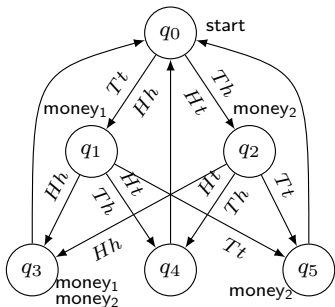
Agent 2 “wins”, if $\gamma_2 \equiv \Diamond \text{money}_2$ is satisfied.





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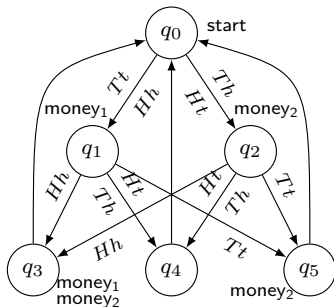


$\gamma_1 \backslash \gamma_2$	hh	ht	th	tt
HH	1, 1	0, 0	0, 1	0, 1
HT	0, 0	0, 1	0, 1	0, 1
TH	0, 1	0, 1	1, 1	0, 0
TT	0, 1	0, 1	0, 0	0, 1



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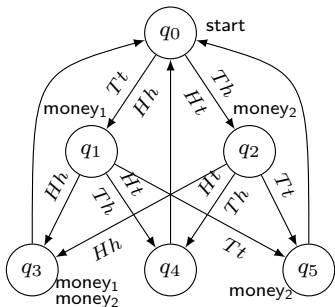
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Now we have a **qualitative** notion of success.



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Now we have a **qualitative** notion of success.

$$M, q_0 \models (\mathbf{set-pl} \ \omega_{NE}) \langle\langle 2 \rangle\rangle \Box(\neg\text{start} \rightarrow \text{money}_1)$$

where $\|\omega_{NE}\|_{q_0} =$ “all profiles belonging to grey cells”.



How to obtain plausibility terms?



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Idea

Formulae that describe plausible strategies!

$(\mathbf{set-pl} \sigma.\theta)\varphi$: “suppose that θ characterizes rational strategy profiles, then φ holds”.



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Formulae that describe plausible strategies!

$(\mathbf{set-pl} \ \sigma.\theta)\varphi$: “suppose that θ characterizes rational strategy profiles, then φ holds”.

Sometimes quantifiers are needed...

E.g.: $(\mathbf{set-pl} \ \sigma.\forall\sigma' \textit{ dominates}(\sigma, \sigma'))$



Characterization of Nash Equilibrium

σ_a is a 's best response to σ (wrt $\vec{\gamma}$):

$$BR_a^{\vec{\gamma}}(\sigma) \equiv (\mathbf{set-pl} \sigma[\mathbb{A}gt \setminus \{a\}])(\langle\langle a \rangle\rangle \gamma_a \rightarrow (\mathbf{set-pl} \sigma) \langle\langle \emptyset \rangle\rangle \gamma_a)$$



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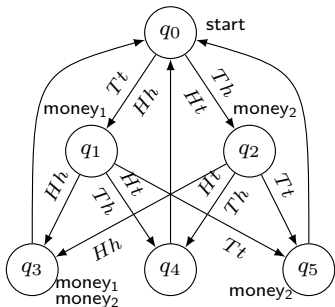
σ is a Nash equilibrium:

$$NE^{\vec{\gamma}}(\sigma) \equiv \bigwedge_{a \in \mathbb{Agt}} BR_a^{\vec{\gamma}}(\sigma)$$



Example: Pennies Game revisited

$\gamma_1 \equiv \Box(\neg \text{start} \rightarrow \text{money}_1)$; $\gamma_2 \equiv \Diamond \text{money}_2$.



$\gamma_1 \setminus \gamma_2$	hh	ht	th	tt
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$M_1, q_0 \models (\mathbf{set-pl} \sigma.NE^{\gamma_1, \gamma_2}(\sigma)) \ll 2 \gg \Box(\neg \text{start} \rightarrow \text{money}_1)$

...where $NE^{\gamma_1, \gamma_2}(\sigma)$ is defined as on the last slide.



Characterizations of Other Solution Concepts

σ is a **subgame perfect Nash equilibrium**:

$$SPN^{\vec{\gamma}}(\sigma) \equiv \langle\langle \emptyset \rangle\rangle \square NE^{\vec{\gamma}}(\sigma)$$

σ is **Pareto optimal**:

$$PO^{\vec{\gamma}}(\sigma) \equiv \forall \sigma' \left(\bigwedge_{a \in \text{Agt}} ((\mathbf{set-pl} \sigma') \langle\langle \emptyset \rangle\rangle \gamma_a \rightarrow (\mathbf{set-pl} \sigma) \langle\langle \emptyset \rangle\rangle \gamma_a) \vee \bigvee_{a \in \text{Agt}} ((\mathbf{set-pl} \sigma) \langle\langle \emptyset \rangle\rangle \gamma_a \wedge \neg (\mathbf{set-pl} \sigma') \langle\langle \emptyset \rangle\rangle \gamma_a) \right).$$



σ is **undominated**:

$$\begin{aligned} \text{UNDOM}^{\vec{\gamma}}(\sigma) \equiv & \forall \sigma_1 \forall \sigma_2 \exists \sigma_3 \\ & \left(\left((\text{set-pl } \langle \sigma_1^{\{a\}}, \sigma_2^{\text{Agt} \setminus \{a\}} \rangle) \langle \emptyset \rangle \gamma_a \rightarrow \right. \right. \\ & \quad \left. \left. (\text{set-pl } \langle \sigma^{\{a\}}, \sigma_2^{\text{Agt} \setminus \{a\}} \rangle) \langle \emptyset \rangle \gamma_a \right) \right. \\ & \left. \vee \left((\text{set-pl } \langle \sigma^{\{a\}}, \sigma_3^{\text{Agt} \setminus \{a\}} \rangle) \langle \emptyset \rangle \gamma_a \wedge \right. \right. \\ & \quad \left. \left. \neg (\text{set-pl } \langle \sigma_1^{\{a\}}, \sigma_3^{\text{Agt} \setminus \{a\}} \rangle) \langle \emptyset \rangle \gamma_a \right) \right). \end{aligned}$$



Theorem 2.5

*The characterizations coincide with game-theoretical solution concepts in the class of **game trees**.*



2.4 Imperfect Information



How can we reason about extensive games with **imperfect information**?



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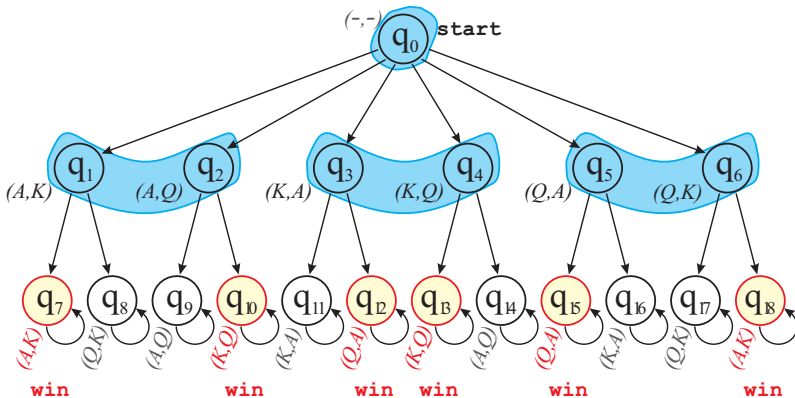
Let's put **ATL** and **epistemic logic** in one box.

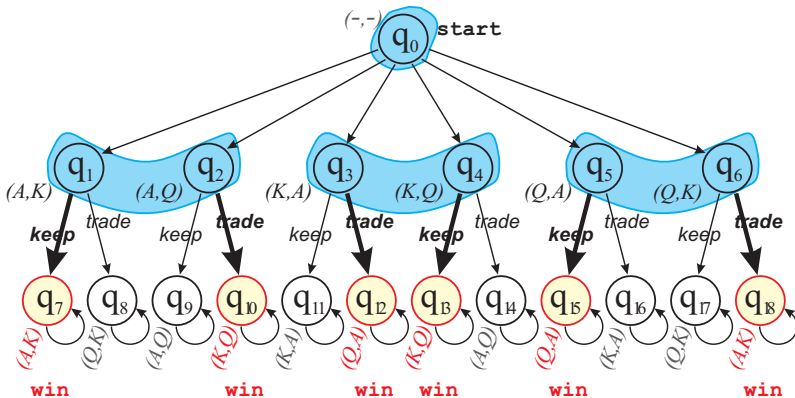


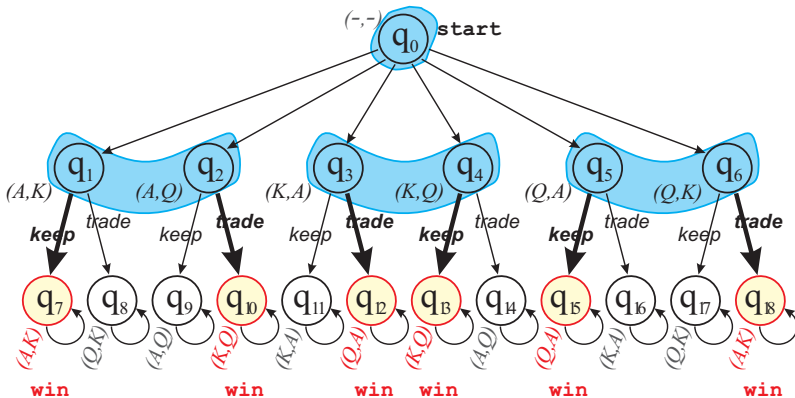
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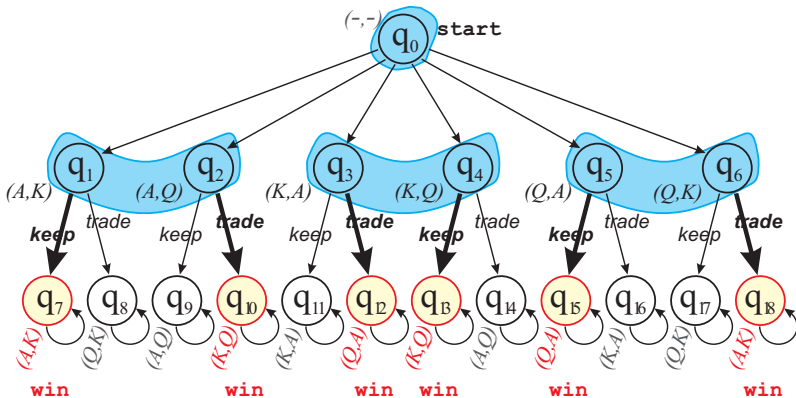
⇒ **Problems!**





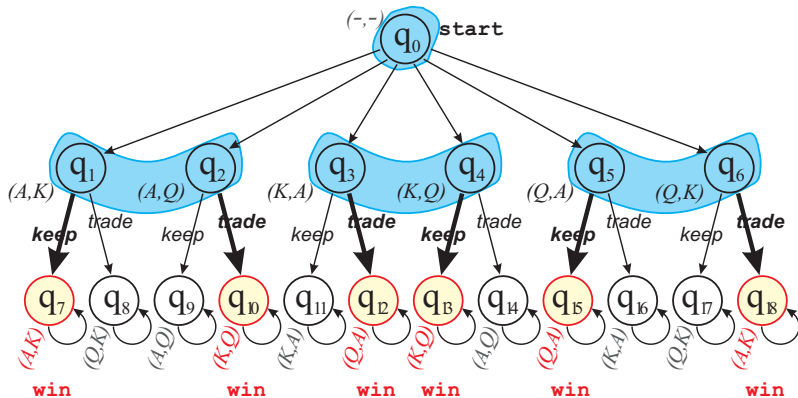


$$start \rightarrow \langle\langle a \rangle\rangle \diamond win$$



$$\text{start} \rightarrow \langle\langle a \rangle\rangle \diamond \text{win}$$

$$\text{start} \rightarrow K_a \langle\langle a \rangle\rangle \diamond \text{win}$$



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Does it make sense?



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Strategic and epistemic abilities are *not* independent!



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Executable strategies = **uniform strategies**



Definition 2.6 (Uniform strategy)

Strategy s_a is uniform iff it specifies the same choices for indistinguishable situations:

- (no recall:) if $q \sim_a q'$ then $s_a(q) = s_a(q')$
- (perfect recall:) if $\lambda \approx_a \lambda'$ then $\Rightarrow s_a(\lambda) = s_a(\lambda')$, where $\lambda \approx_a \lambda'$ iff $\lambda[i] \sim_a \lambda'[i]$ for every i .



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A collective strategy is uniform iff it consists only of uniform individual strategies.



Note:

Having a successful strategy does not imply knowing that we have it!



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Knowing that a successful strategy exists does not imply knowing the strategy itself!



Levels of Strategic Ability

From now on, we restrict our discussion to **uniform memoryless strategies**.



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Case [4]: knowing how to play



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- Single agent case: we take into account the paths starting from indistinguishable states (i.e.,

$$\bigcup_{q' \in \text{img}(q, \sim_a)} \text{out}(q, s_A))$$



Case [4]: knowing how to play

- Single agent case: we take into account the paths starting from indistinguishable states (i.e.,

$$\bigcup_{q' \in \text{img}(q, \sim_a)} \text{out}(q, s_A)$$

- What about coalitions?
- Question: in what sense should they know the strategy? Common knowledge (C_A), mutual knowledge (K_A), distributed knowledge (D_A)?



Given strategy σ , agents A can have:

- **Common knowledge** that σ is a winning strategy. This requires the least amount of additional communication (agents from A may agree upon a total order over their collective strategies at the beginning of the game and that they will always choose the maximal winning strategy with respect to this order)



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- **“Consulting company”**: the strategy can be identified by some other group B



Many subtle cases...



Many subtle cases...

↪ Solution: **constructive knowledge** operators



Constructive Strategic Logic (CSL)

- $\langle\langle A \rangle\rangle\Phi$: A have a uniform memoryless strategy to enforce Φ



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- $\mathbb{K}_a\langle\langle a \rangle\rangle\Phi$: a has a strategy to enforce Φ , and knows that this is a winning strategy
- For groups of agents: $\mathbb{C}_A, \mathbb{E}_A, \mathbb{D}_A, \dots$



Non-standard semantics:

- Formulae are evaluated in **sets of states**
- $M, Q \models \langle\langle A \rangle\rangle \Phi$: A have a **single** strategy to enforce Φ **from all states in Q**



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- $img(Q, \mathcal{R}) = \bigcup_{q \in Q} img(q, \mathcal{R})$
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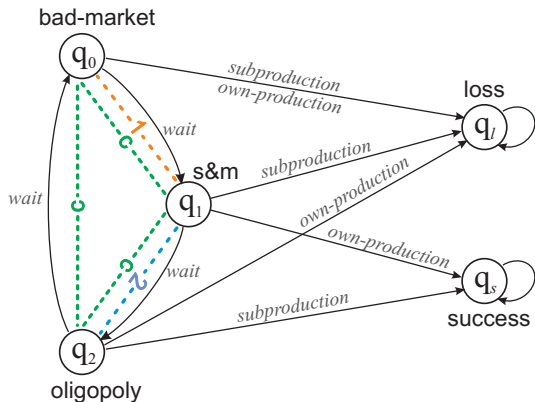


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$M, Q \models \hat{\mathcal{K}}_A \varphi$ iff $M, \text{img}(Q, \sim_A^{\mathcal{K}}) \models \varphi$ (where $\hat{\mathcal{K}} = \mathbb{C}, \mathbb{E}, \mathbb{D}$ and $\mathcal{K} = C, E, D$, respectively).



Example: Simple Market

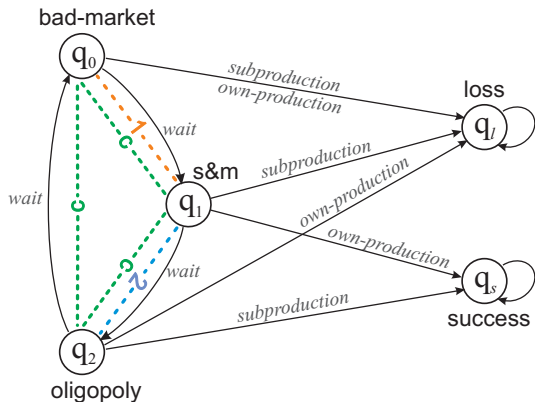


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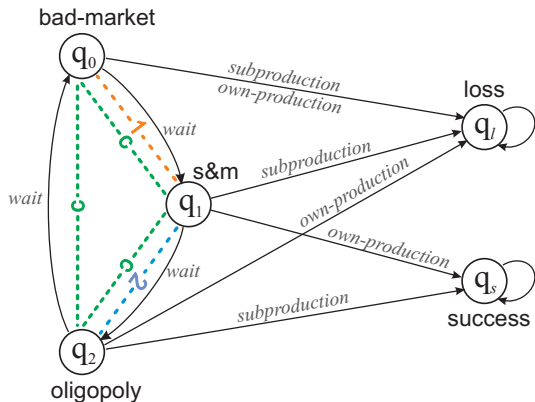
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Theorem 2.8 (Expressivity)

CSL is strictly more expressive than most previous proposals.



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CSL is *strictly more expressive* than most previous proposals.

Theorem 2.9 (Verification complexity)

The complexity of model checking CSL is *minimal*.



2.5 Model Checking



Model Checking Formulae of CTL and ATL

- Model checking: Does φ hold in model M and state q ?



Model Checking Formulae of CTL and ATL

- Model checking: Does φ hold in model M and state q ?
- Natural for verification of existing systems; also during design (“prototyping”)
- Can be used for automated planning



function $plan(\varphi)$.

Returns a subset of St for which formula φ holds, together with a (conditional) plan to achieve φ . The plan is sought within the context of concurrent game structure $S = \langle \mathbb{A}gt, St, \Pi, \pi, o \rangle$.

case $\varphi \in \Pi$: **return** $\{ \langle q, - \rangle \mid \varphi \in \pi(q) \}$

case $\varphi = \neg\psi$: $P_1 := plan(\psi)$;

return $\{ \langle q, - \rangle \mid q \notin states(P_1) \}$

case $\varphi = \psi_1 \vee \psi_2$:

$P_1 := plan(\psi_1)$; $P_2 := plan(\psi_2)$;

return $\{ \langle q, - \rangle \mid q \in states(P_1) \cup states(P_2) \}$

case $\varphi = \langle\langle A \rangle\rangle \bigcirc \psi$: **return** $pre(A, states(plan(\psi)))$

case $\varphi = \langle\langle A \rangle\rangle \square \psi$:

$P_1 := plan(\mathbf{true})$; $P_2 := plan(\psi)$; $Q_3 := states(P_2)$;

while $states(P_1) \not\subseteq states(P_2)$

do $P_1 := P_2|_{states(P_1)}$; $P_2 := pre(A, states(P_1))|_{Q_3}$ **od**;

return $P_2|_{states(P_1)}$

case $\varphi = \langle\langle A \rangle\rangle \psi_1 \mathcal{U} \psi_2$:

$P_1 := \emptyset$; $Q_3 := states(plan(\psi_1))$; $P_2 := plan(\mathbf{true})|_{states(plan(\psi_2))}$;

while $states(P_2) \not\subseteq states(P_1)$

do $P_1 := P_1 \oplus P_2$; $P_2 := pre(A, states(P_1))|_{Q_3}$ **od**;

return P_1

end case



Complexity of Model Checking ATL

Theorem (Alur, Kupferman & Henzinger 1998)

ATL model checking is *P*-complete, and can be done in time linear in the size of the model and the length of the formula.



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Not as easy as it seems.



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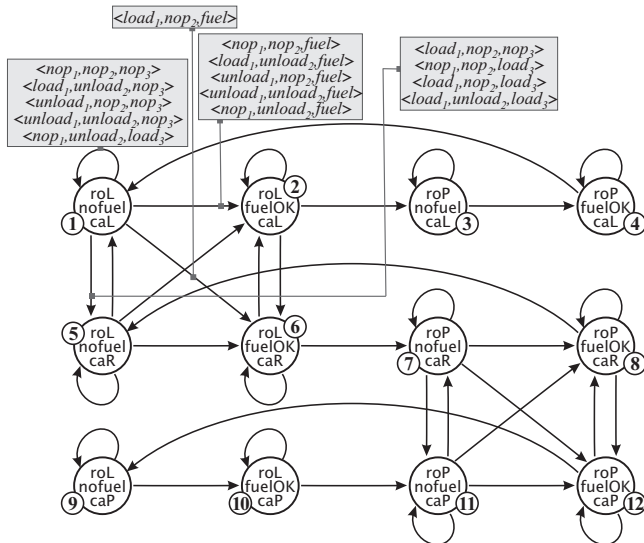
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- But: the result is relative to the size of the model and the formula
- Well known catch: size of models is exponential wrt a higher-level description
- Another problem: transitions are labeled
- So: the number of transitions can be exponential in the number of agents.



3 agents/attributes, 12 states, 216 transitions





Model Checking Temporal & Strategic Logics

	m, l	n, k, l	n_{local}, k, l
CTL			
ATL			
CSL			



Model Checking Temporal & Strategic Logics

	m, l	n, k, l	n_{local}, k, l
CTL	P [1]	P [1]	PSPACE [2]
ATL			
CSL			

[1] Clarke, Emerson & Sistla (1986).

[2] Kupferman, Vardi & Wolper (2000).



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[3] Alur, Henzinger & Kupferman (2002).

[5] Jamroga & Dix (2005).

[6] Laroussinie, Markey & Oreiby (2006).

[8] Hoek, Lomuscio & Wooldridge (2006).



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CTL	P [1]	P [1]	PSPACE [2]
ATL	P [3]	Δ_3^P [5,6]	EXPTIME [8,9]
CSL	Δ_2^P [4,7]	Δ_3^P [7]	PSPACE [9]

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Main message:

- Complexity is **very** sensitive to the context!



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- In particular, the way we define the input, and measure its size, is crucial.



Even if model checking appears very easy, it can be very hard.



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- LTL: SPIN
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Even if model checking is theoretically hard, it can be feasible in practice.



2.6 References



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