

# Strategies: A logic - automata study

## Lecture 5: Dynamics of large games

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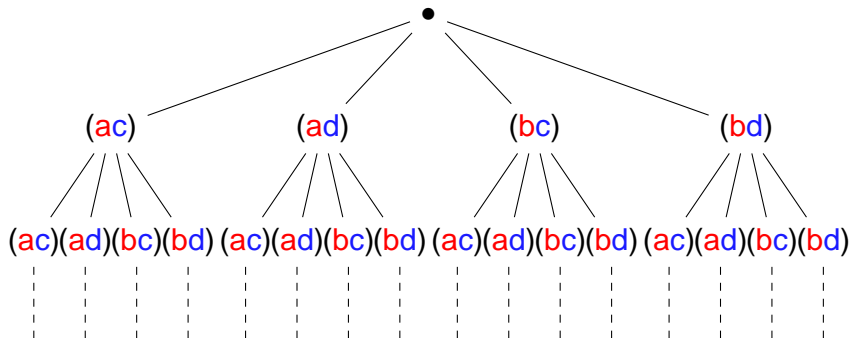
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- ▶ Dynamic game forms.
- ▶ Algebraic theory of strategy composition.

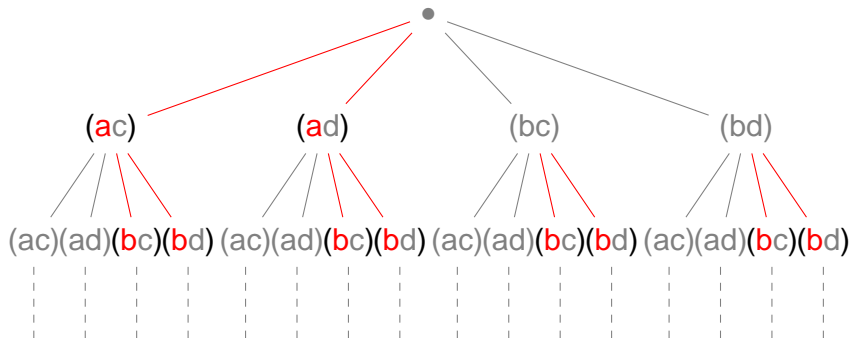
# Strategy switching and stability

# Concurrent game structures



$$A = \{a, b\}, B = \{c, d\}$$

# Strategies - Subtrees



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- ▶ They **compose/switch** to devise new strategies.

# A switch operator

$$\Omega_i ::= \sigma \in \Sigma_i \mid \mathbf{St}_1 \cup \mathbf{St}_2 \mid \mathbf{St}_1 \cap \mathbf{St}_2 \mid \mathbf{St}_1 \wedge \mathbf{St}_2 \mid (\mathbf{St}_1 + \mathbf{St}_2) \mid \psi ? \mathbf{St}'$$

where  $\psi$  is a **past time formula** of a simple tense logic over an atomic set of observables and  $\Sigma_i$  is the set of all atomic (partial) strategies of player  $i$ .

# Strategy Specifications[2]

Intuitively

$St_1 \cup St_2$  choose  $St_1$  or  $St_2$  and play accordingly.

$St_1 \cap St_2$  play according to  $St_1$  if defined else play according to  $St_2$  if defined.

$St_1 \hat{\ } St_2$  play according to  $St_1$  and after some point switch to playing according to  $St_2$ .

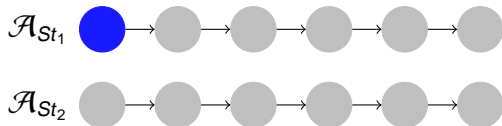
$(St_1 + St_2)$  at every point play either according to  $St_1$  or  $St_2$ .

$\psi ? St'$  test if  $\psi$  holds at a point. If yes, play according to  $St'$ .

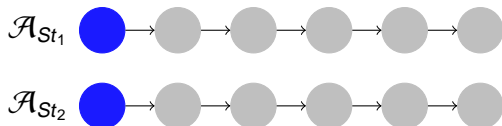
Each specification defines a set of **total strategy trees**. The semantics is given in terms of the strategy trees.

# Transducers for operators

$St_1 \cup St_2$

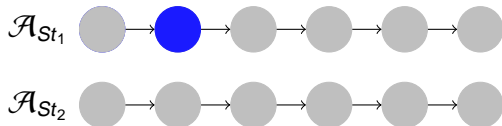


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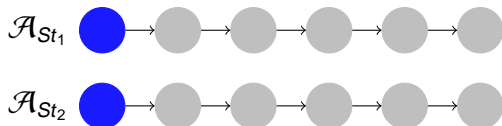


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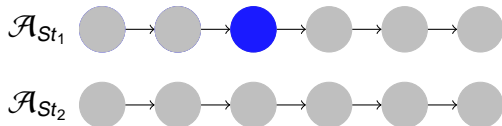


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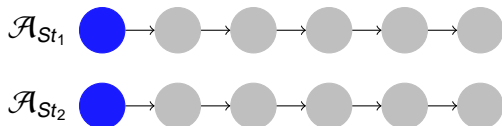


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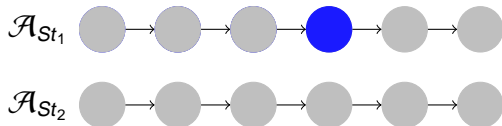


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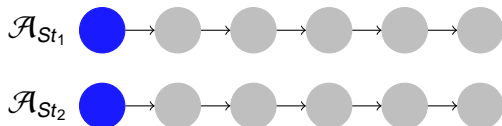


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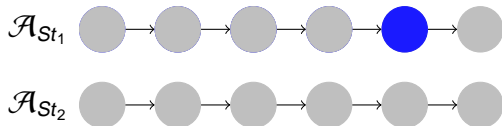


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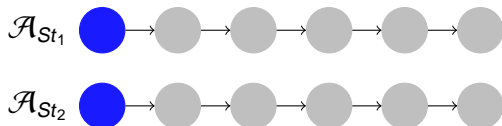


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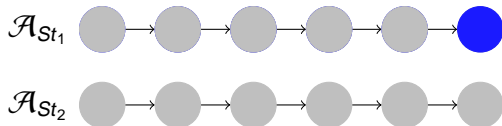


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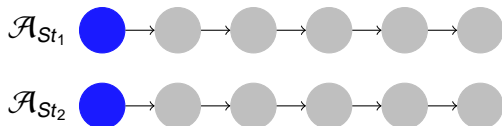


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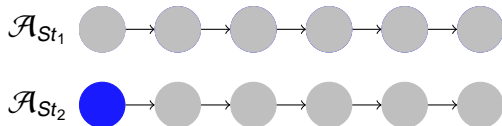


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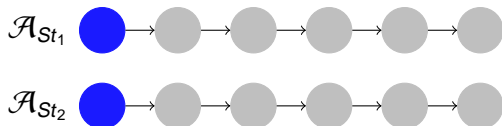


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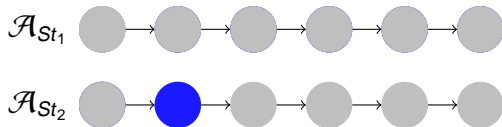


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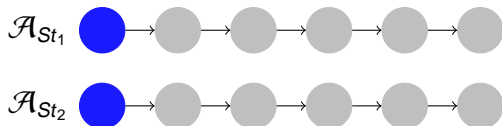


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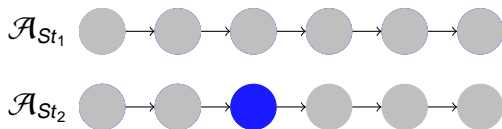


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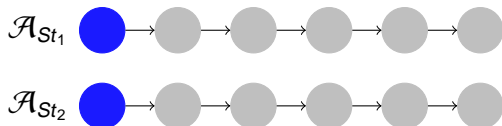


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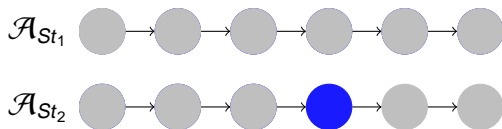


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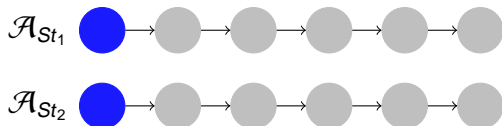


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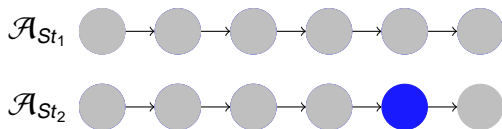


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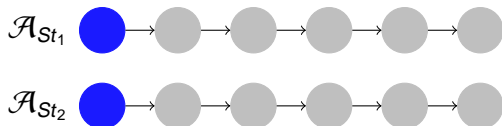


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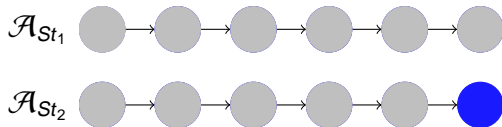


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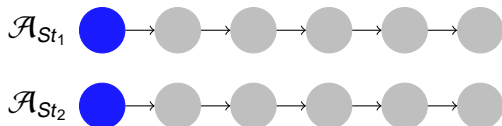


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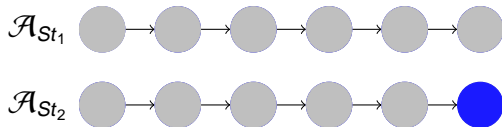


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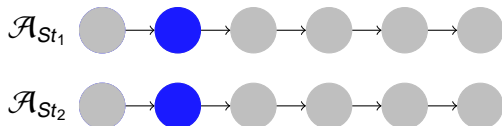


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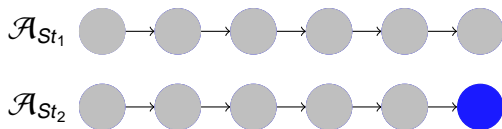


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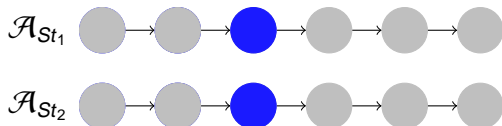


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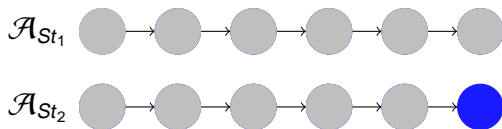


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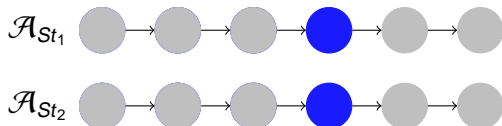


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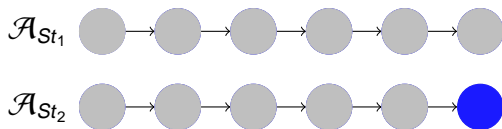


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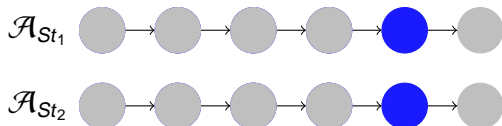


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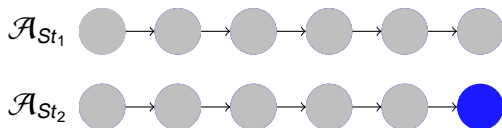


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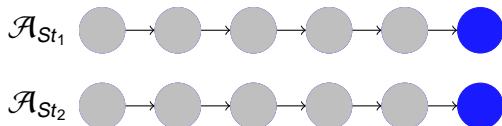


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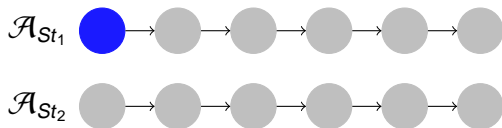


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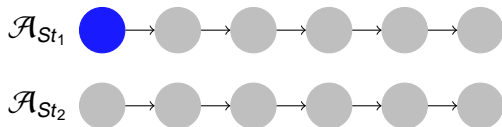


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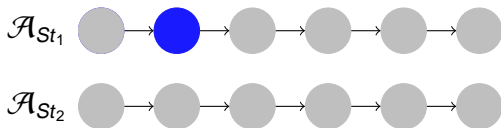


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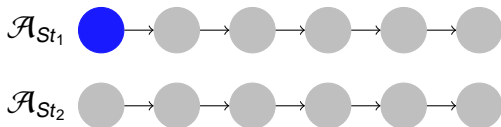


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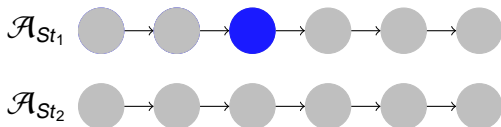


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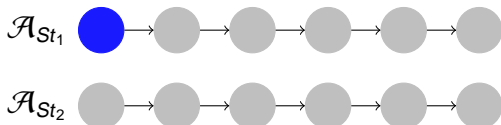


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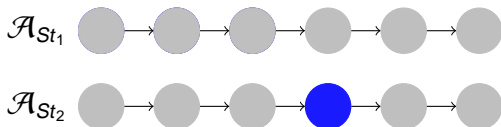


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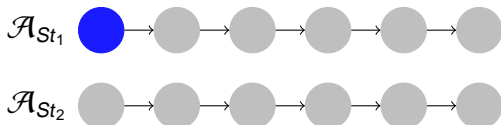


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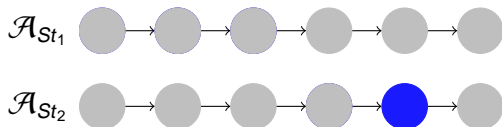


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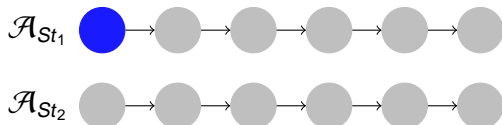


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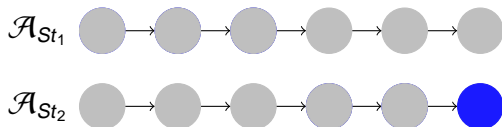


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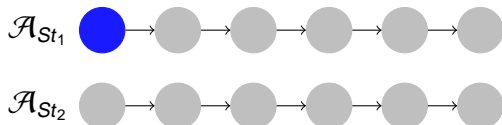


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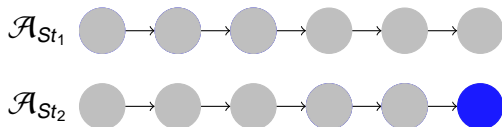


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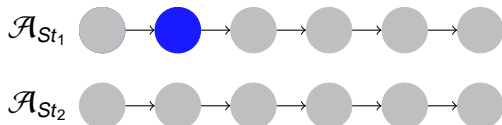


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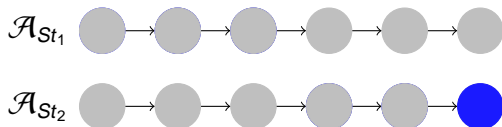


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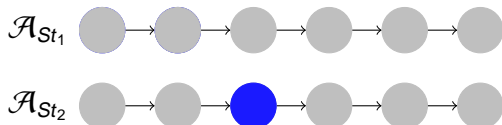


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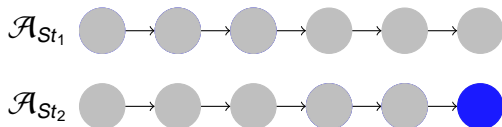


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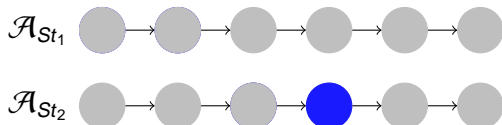


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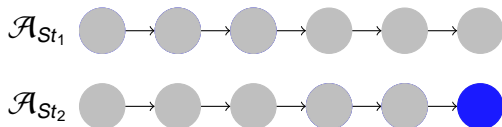


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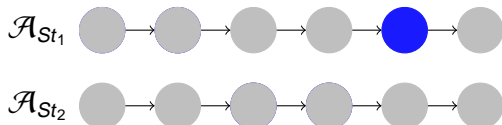


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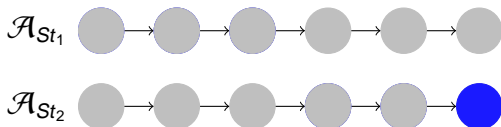


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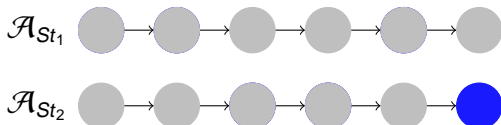


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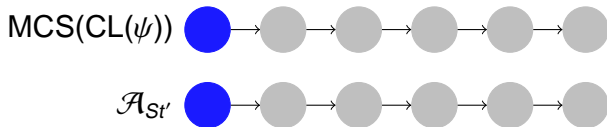


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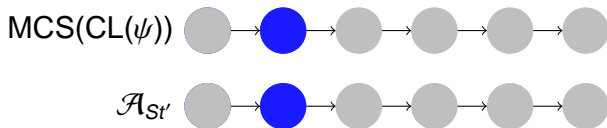
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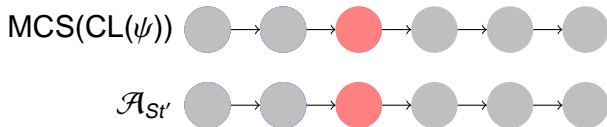
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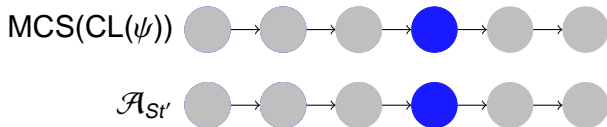
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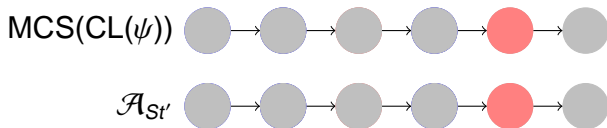
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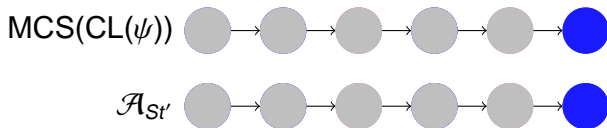
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# Questions

$St$  is **switch-free** if it does not have any of the  $\neg$  or the  $+$  constructs.

Questions:

- ▶ Does the game eventually settle down to some subarena? (the equilibrium subset)
- ▶ In the equilibrium subset, can a player keep the game in that subset with a strategy that does not involve switching?

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# Results

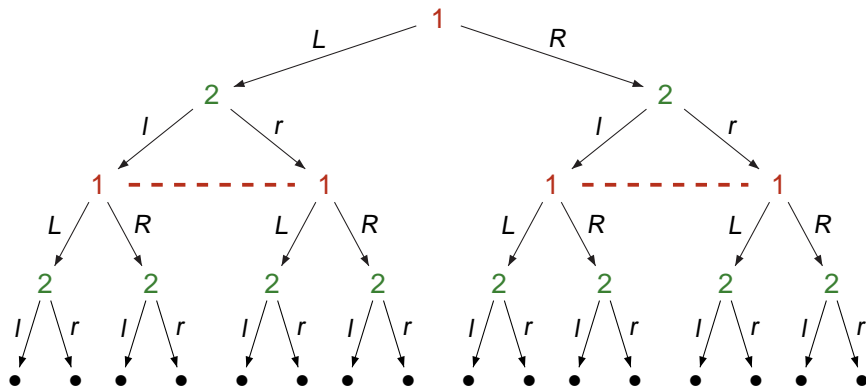
## Theorem

*Given a game arena  $\mathcal{G}$ , a valuation  $Val$  of the atomic observables on the arena, a subarena  $\mathcal{G}'$  and strategy specifications  $St_1, \dots, St_n$  for the players, the following questions are decidable:*

- ▶ *Do all plays conforming to these specification eventually settle down to the subarena?*
- ▶ *If all plays conforming to these specifications converge to the subarena, does the strategy of a player become eventually stable with respect to switching?*

# Imperfect information and distributed games

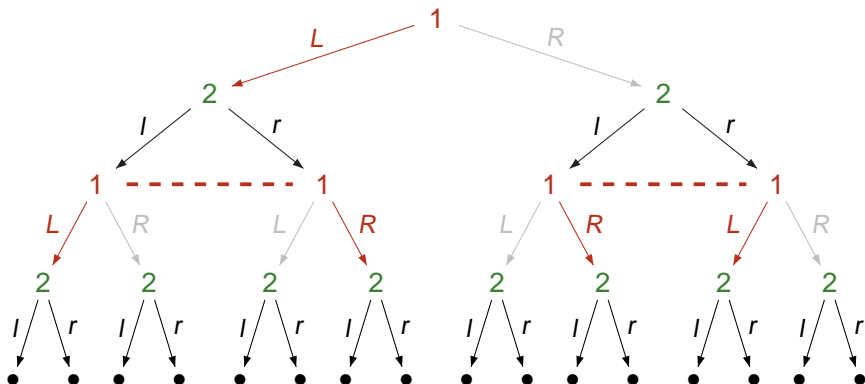
# Imperfect information



Game tree + uncertainty relation:  $T = (T_{PI}, (\sim_i)_i)$ .

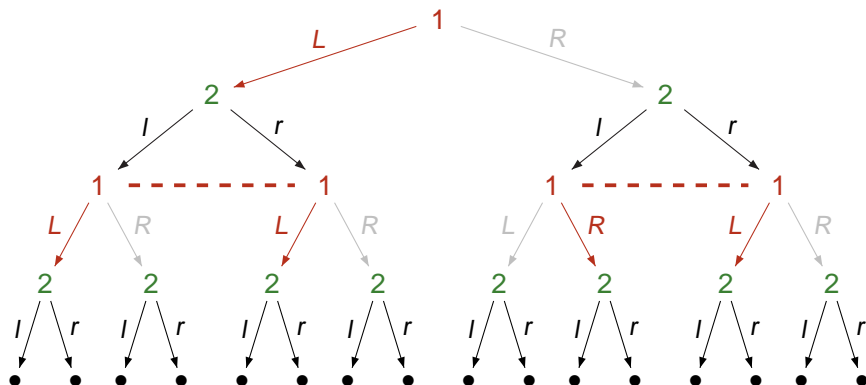
The uncertainty relation defines players' **information sets**.

# Strategy with imperfect information



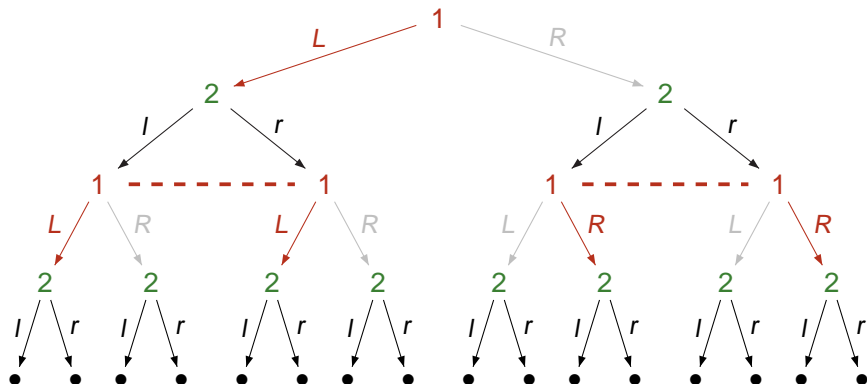
Strategy needs to respect the uncertainty relation.

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# Information sets

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strategy: information sets  $\rightarrow$  actions.
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**Question:** Are two player zero sum imperfect information games **determined**?

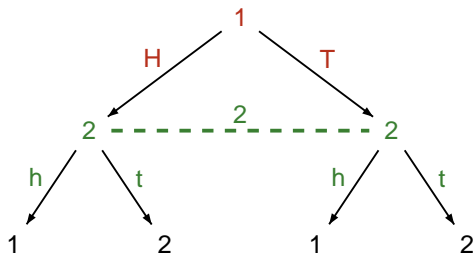
# Information sets

- ▶ Imperfect information:  
strategy: information sets  $\rightarrow$  actions.
- ▶ Perfect information:  
all information sets are singletons.

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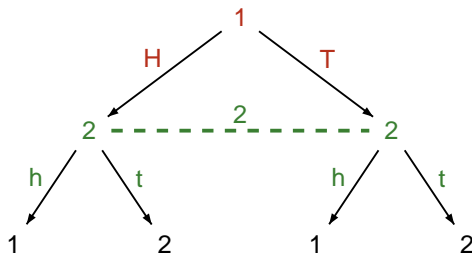
**Answer:** No (matching pennies).

# Matching pennies



- ▶ If the outcomes match then player 1 wins else player 2 wins.

# Matching pennies



- ▶ If the outcomes match then player 1 wins else player 2 wins.

Neither player has a winning strategy.

# Three players

Players 1 and 2 have common winning condition  $\Phi$ .

Player 3 is indifferent.

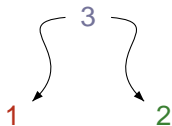
**Strategy question:** Are there strategies  $(\sigma_1, \sigma_2)$  such that for all  $\sigma_3$  the outcome lies in  $\Phi$ .

# Undecidability

It is possible to reduce the **halting problem** to the strategy problem.

The game:

- ▶ Players 1 and 2 cannot “talk” to each other.
- ▶ Player 3 has perfect information about the game.
- ▶ Player 3 can create an **information fork**.

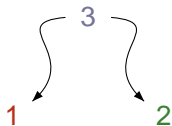


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The knowledge hierarchy can become **unbounded**.

# Undecidability

Is the strategy question **decidable**?

# Undecidability

Is the strategy question **decidable**?

Answer: No, it is **undecidable**.

- ▶ Reachability objectives [Bernet and Janin 05].
- ▶ Safety objectives [Bernet 06, Berwanger and Kaiser 10].
- ▶ Decidable subclasses [Gastin, Sznajder and Zeitoun 09].

# An alternative model

Arbitrary uncertainty relations can code up information forks.

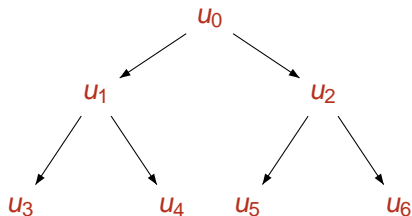
- ▶ We propose a subclass where the uncertainty relation reflects the game structure.
- ▶ **Communication:** Information sets are generated in terms of players' ability to communicate.

What is a model for such games ?

A possible solution

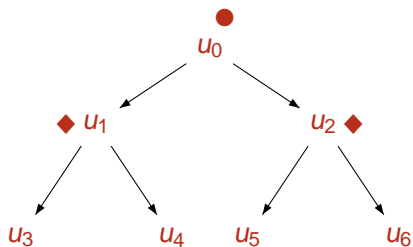
- ▶ Local game arena for each player.

# Local arena



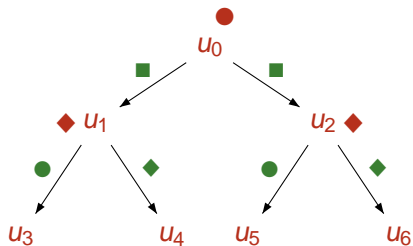
Player 1's local arena

# Local arena



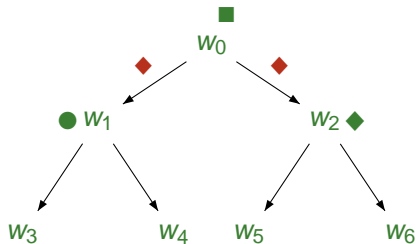
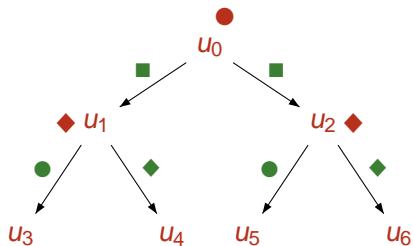
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# Distributed games

## MiMaze: Multicast Internet Maze

- ▶ Each player sees only a part of the maze.
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WWW: The internet itself can be seen as a distributed game.

# Local arena

A finite set of announcement symbols  $\Gamma^i$ .

- ▶  $\Gamma^1 = \{\blacksquare, \bullet, \blacklozenge\}$ ,  $\Gamma^2 = \{\blacksquare, \bullet, \blacklozenge\}$ .

**Local arena:**  $\mathcal{G}^i = (W^i, \rightarrow_i, w_0^i, \chi^i)$  where

- ▶  $W^i$  - set of local game positions.
- ▶  $w_0^i$  - initial game position.
- ▶  $\chi^i : W^i \rightarrow \Gamma^i$ .  $\chi^1(u_1) = \blacklozenge$ .
- ▶  $\rightarrow_i : W^i \times \widehat{\Gamma} \rightarrow 2^{W^i}$ .

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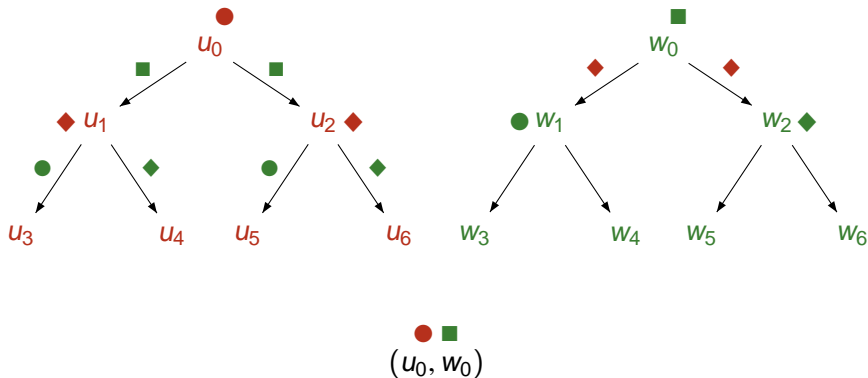
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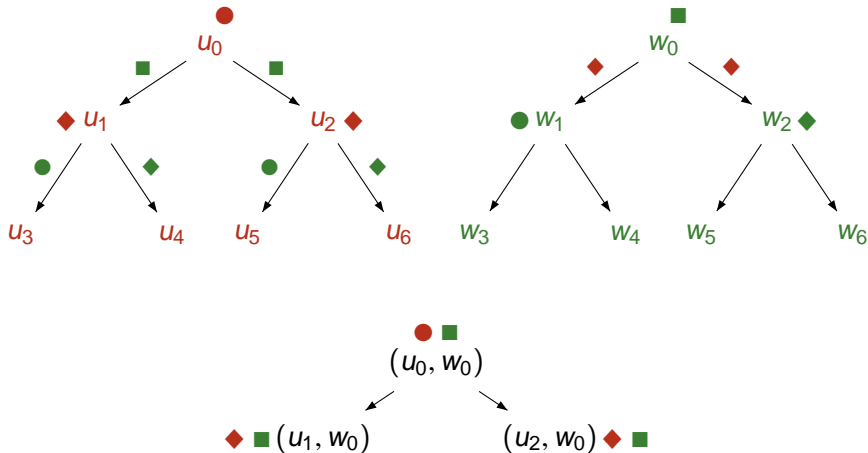
Global arena:

- ▶ Product of the local arenas.
- ▶ Only enabled moves appear.

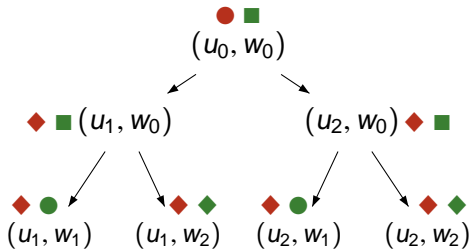
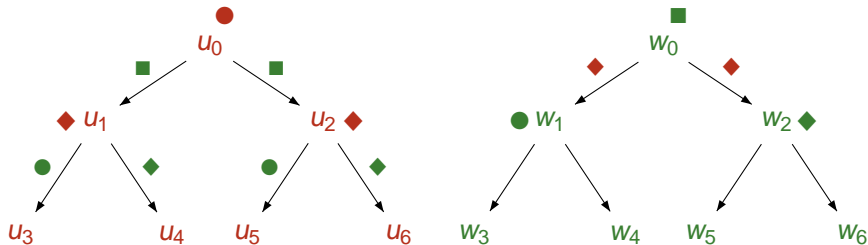
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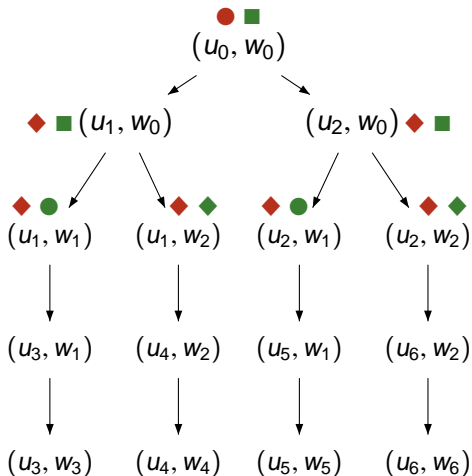
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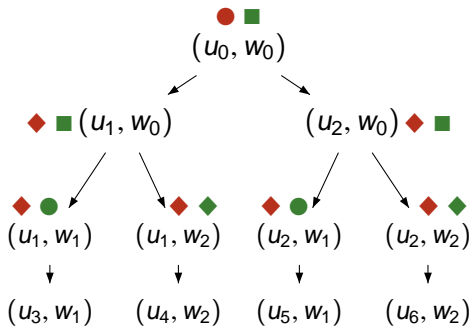
# Information sets

## Assumptions:

- ▶ Communication by means of public announcement.
- ▶ Existence of unique initial state.

Question: Are non-trivial information sets generated?

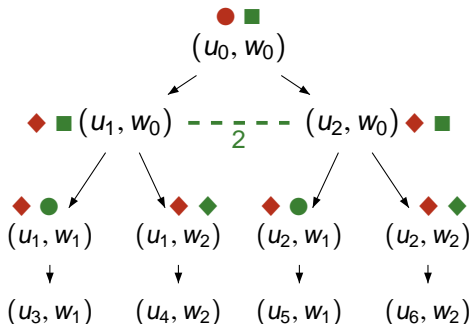
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**View of a player:** local state + announcements received.

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## Consequence: For all players $i, j, k$ ,

- ▶ player  $i$ 's uncertainty about  $j$  = players  $k$ 's uncertainty about  $j$ .

## Corollary: Knowledge hierarchy collapses.

# Objectives

Strategy question: Decidable.

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Non-zero sum objectives: With each player  $i$  we have:

- ▶ a **reachability** set,  $\mathcal{R}^i \subseteq W^i$ .
  - ▶  $\mathcal{R}^i$  constitutes sink nodes.
  - ▶ players announce the entire local state.
- ▶ preference ordering:  $\leq^i \subseteq \mathcal{R}^i \times \mathcal{R}^i$ .

# Observable behaviour

**Task:** We need to define best response in terms of observable behaviour of players.

**Announcement plan:** An announcement plan for player  $i$ ,  $\xi_i : W^* \rightarrow \Gamma^i$  which respects the information partition.

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**Bounded memory announcement plan** - representable by a finite state transducer.

# Solution concept

**Local best response:** A strategy  $\sigma_i$  is a local best response for an announcement plan profile  $\xi_{-i}$  if

- ▶ for all  $\sigma'_i$  and for all  $\sigma_{-i} \in \llbracket \xi_{-i} \rrbracket$ ,  $\rho(\sigma'_i, \sigma_{-i}) \leq^i \rho(\sigma_i, \sigma_{-i})$ .

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## Perfect information games

- ▶ Local best response = Best response.
- ▶ Locally consistent equilibrium = Nash equilibrium.

# A new notion

In general LCE (Locally consistent equilibrium) is distinct from NE (Nash equilibrium) in distributed games.

- ▶ We have games for which NE exists but not LCE, and vice versa.
- ▶ We have games for which both exist and coincide, as well as games for which both exist and are different.

# Algorithmic questions

Questions of interest:

- ▶ **Verification:** Is it decidable to check if a **local best response** strategy exists for  $\xi_{-i}$  ?
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**Problem:** Given a game  $G = (\{\mathcal{G}^i\}_{i \in N}, \{\leq^i\}_{i \in N})$  and an announcement profile  $\xi_{-1}$  synthesize the local best response for player 1.

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**Proposition:** Player 1 has a local best response in  $\mathcal{G}$  iff she has a dominant strategy in  $\mathcal{G}^K$ .

# Equilibrium computation

**Question:** Given a game  $G = (\{\mathcal{G}^i\}_{i \in N}, \{\leq^i\}_{i \in N})$ ,

- ▶ check whether  $G$  has a locally consistent equilibrium profile.
- ▶ synthesize an equilibrium profile (when it exists).

**Task:** Construct a finite structure which preserves the equilibrium behaviour of players.

**Core issue:** Identify the **knowledge set** (or memory) that players need to keep track of in the game.

**Bounded memory:** We show that bounded memory strategies suffice and construct automata for this.

# Private communication

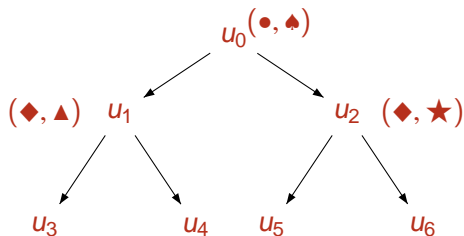
Communication by means of private channels

Extend the communication alphabet:  $\Gamma^i \rightsquigarrow \Gamma_j^i$  for each player  $j$ .

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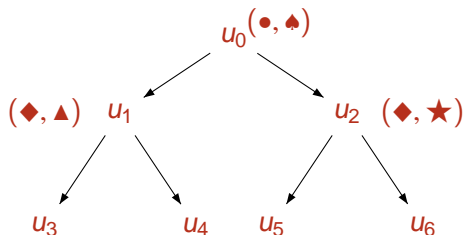
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Three player games: Strategy problem is **undecidable**.

# Remarks

**Folklore wisdom:** Multiplayer imperfect information games are **intractable**.

**Main message:** Does not imply that imperfect information games are always uninteresting.

- ▶ More careful analysis of how imperfect information arises in games.
- ▶ Uncertainty due to structural reasons - solvable by communication.

# Remarks

- ▶ Communication is a strategic concern.
- ▶ Public and private communication constitute extremes in the model.
  - ▶ Card games.
  - ▶ Bounded revelation games.
- ▶ Asynchronous communication.
- ▶ Complexity of locally consistent equilibria.

# Large games

# Infrastructure questions

Recently Singapore decided to make the entire city Wi-Fi enabled. How is it decided that a facility be provided as infrastructure ?

- ▶ Typically such analysis involves determining when usage crosses a threshold.
- ▶ But then understanding why usage of one facility increases vastly, despite the presence of several alternatives, is tricky.

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# The invisible traffic

Similar situations occur in the management of the Internet.

- ▶ Policies for bandwidth allocation are not static.
- ▶ They are dynamic, based on studying both volumes of traffic and type of traffic.
- ▶ The popularity of an application like YouTube dramatically changes such usage, calling for changes in Internet policies.
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# Lost in the arena

These are generic examples of games with structure and involving a large population of players.

- ▶ A player does not even know the number of players in the game, let alone the identity of every other player.
- ▶ Payoffs are not determined by strategy profiles but by *how many* players play a particular strategy.
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# Type distributions

In large games, payoffs are associated not with strategy profiles, but with type distributions.

- ▶ Suppose there are  $k$  strategies used in the population. Then the outcome is specified as a map  $\mu : \Pi_k(n) \rightarrow P^k$ .
- ▶ Typically there is usually a small number  $t$  of types such that  $t \ll n$  where  $n$  is the number of players.
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# Rationale for reductions

Why should such an analysis be possible ?

- ▶ We confine our attention to finite memory players.
- ▶ For  $n$  players, the strategy space is the  $n$ -fold product of these memory states.
- ▶ What we wish to do is to map this space into a  $t$ -fold product, whereby we wish to identify two players of the same type.
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We need notions of equivalence on transducers and game arenas.

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- ▶ We show:  $\alpha$  is stable in  $\mathcal{G} \otimes \mathcal{A}$  iff  $\alpha$  is stable in  $\mathcal{G} \otimes (\mathcal{A} \otimes \mathcal{A})$ .
- ▶  $\alpha$  is stable in  $\mathcal{G} \otimes \mathcal{A}_1 \otimes \mathcal{A}_2$  iff  $\alpha$  is stable in  $\mathcal{G} \otimes \mathcal{A}_2 \otimes \mathcal{A}_1$ .

# Free lunch?

A population of 1000 players with only two types needs to be represented only by pairs of states and not 1000-tuples.

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When is the determinising procedure worthwhile?

- ▶ Suppose we have  $n$  players,  $t$  types, and  $p$  the maximum size of the state space of any **nondeterministic** type FST.
- ▶ We can show that the construction is worthwhile when

$$n > 0.693 \cdot t \cdot \pi(p)$$

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When outcomes are distribution determined, we can consider **quantitative objectives** as well.

- ▶ Every player  $i$  has a function  $f_i : V \rightarrow \mathbb{Q}$  which can be seen as the payoff of  $i$  for a particular distribution.
- ▶ Given an infinite play  $\rho = v_0 \xrightarrow{a_1} v_1 \xrightarrow{a_2} \dots$ , we study the discounted-payoff Player  $i$  gets:

$$p_i(\rho) = \liminf_{n \rightarrow \infty} \frac{1}{n} \sum_{j=1}^n f_i(v_j).$$

- ▶ We add atomic formulas of the form  $p_i < d$  in the syntax.
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# Neighbourhood structures

In large games, it is convenient to think of players arranged in neighbourhoods.

- ▶ A player strategizes locally, observing behaviour and outcomes within her neighbourhood, but may switch to an adjacent neighbourhood.
- ▶ Example of a vegetable seller in India: small player in a large game.
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# Dynamic game forms

# Meta-strategies

Social situations often involve strategies that are generic, (almost) game-independent.

They have some (limited) efficacy in many interaction situations.

- ▶ Threat and punishment.
- ▶ Go with the winner / Follow the leader.
- ▶ Try to take the lead, and if you can't, follow a leader.
- ▶ Imitate someone you think well of.
- ▶ ...

But when a significant proportion of players use such heuristics, it may affect game dynamics significantly.

# Dynamic game changes

## Examples

- ▶ Tailors in India.
- ▶ Tollbooth equipped with RFID.

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# The scenario

## General situation

- ▶ Individual has to **make** choices; making choices has a cost.
- ▶ Society **provides** choices; incurs cost.
- ▶ Society **revises** choices and costs from time to time based on the history and prediction of the future.
- ▶ This effects individual strategies who switch between the available choices.
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# Questions

Questions to ask - eventual patterns dictated by the dynamics:

- ▶ Does the play finally settle down to some subset of the game?
- ▶ Can a player ensure certain objectives using a strategy that doesn't involve switching?
- ▶ Given a subarena, is a particular strategy **live**?
- ▶ Does an action profile eventually become part of the social infrastructure?
- ▶ Do the rules of the society and the behaviour of other players drive a particular player out of the game?

# Questions

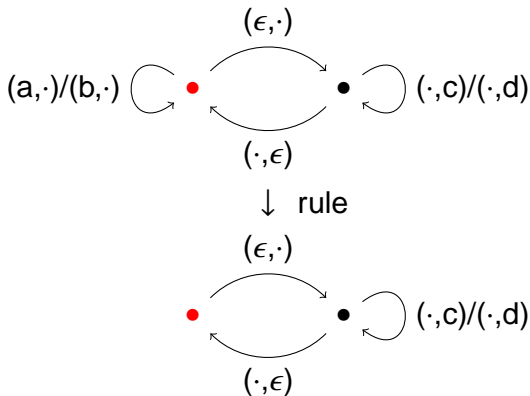
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# Dynamic Game Restriction[2]

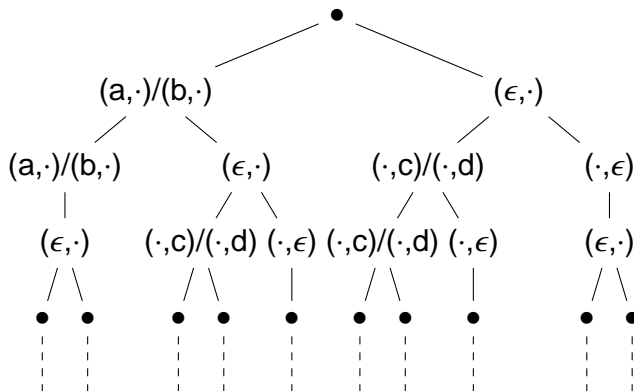
- ▶ Of the form **rule = precondition  $\rightarrow$  new arena  $\mathcal{G}'$** .
- ▶ Rule  $r$  is **enabled** at (old arena  $\mathcal{G}$ , partial play  $t$ ) if
  - ▶  $t$  conforms to the precondition of  $r$ .
  - ▶  $\mathcal{G}'$  is a subarena of the old arena.
  - ▶  $last(t) \in \mathcal{G}'$ .

# Dynamic Game Restriction[3]



# Dynamic Game Restriction[4]

## Induced Game Tree



# Logical Specifications

- ▶ Homomorphisms
  - ▶  $h : A \cup \{\epsilon\} \rightarrow A \cup \{\epsilon\}$  such that  $h(a) = a/\epsilon$ ,  $h(\epsilon) = \epsilon$
  - ▶  $\mathbf{a} = (a_1, \dots, a_n)$  implies  $h(\mathbf{a}) = (h(a_1), \dots, h(a_n))$
- ▶ A **restriction specification** is of the form  $\varphi \supset h$  where  $\varphi$  is a **restriction precondition** and  $h$  is a **homomorphism specification**. Restriction precondition:

$$\varphi ::= p \in \mathcal{P} \mid \neg\varphi \mid \varphi_1 \vee \varphi_2 \mid \langle \mathbf{a} \rangle^- \varphi \mid \langle \mathbf{a} \rangle^+ \varphi \mid \boxplus \varphi$$

Evaluated on the tree unfolding  $\mathcal{T}_{\mathcal{G}}$  of the arena.

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# Results

## Theorem

*Given an arena  $\mathcal{G}$ , an initial vertex  $v_0$  in  $\mathcal{G}$ , a finite set of restriction rules  $\mathbb{R}$ , finite sets of strategy specifications  $\{St_i\}$  for each player  $i$  and a formula  $\alpha$ , the following question is decidable:*

- ▶ *Is  $\alpha$  stable in  $(\mathcal{G}, \mathbb{R}, \{St_i\})$ ?*

# Results

## Corollary

*Given a game arena  $\mathcal{G}$  and specifications  $\mathbb{R}$  and  $\{St_i\}$ , the following questions are decidable:*

- 1. Does player  $i$  eventually get removed by the dynamics of the game?*
- 2. Does a particular action tuple  $\mathbf{a}$  become the only choice to be available for ever?*
- 3. Does the cost stabilise to a specific amount  $c$ ?*

# Remarks

## Consequences of the Theorem

- ▶ It is possible to compare between game restriction rules in terms of their imposed social cost is possible.
- ▶ For a player, if the game restriction rules are known and the type of the other players are known then she can compare between her strategy specifications.

# Rule synthesis

## When should society intervene ?

- ▶ We associate **social costs** with strategies, and thresholds.
- ▶ With quantitative objectives and strategy specifications for players, we can compute at which strategy distributions society must act so that a given objective is achieved.
- ▶ Synthesis of which action is to be removed when is presented as a finite state transducer.

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# Imitation

# The everyday choice

Why does imitation occur ?

- ▶ Why do you wear what you do ?
- ▶ Weather decides the basic structure of clothing, but beyond that it depends on convention, self-image, etc.
- ▶ We have neither the resources nor the expertise to do a comprehensive study of what is best for us and decide.
- ▶ Following the convention is simple, saves us time and energy. It is indeed *rational*.

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# Examples of Imitation

Is imitation viable?

- ▶ Most important premise of economics: **Rational individuals optimise.**
- ▶ But imitation is a common and sometimes even inevitable phenomenon (eg. choice of language).
- ▶ Is imitation justified?
  - ▶ **Yes:** saves time, uses less resource, doesn't do much worse than optimal in most cases.
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# Basic idea

- ▶ In a large population of players, where resources and computational abilities are asymmetrically distributed, it is natural to consider a population where the players are predominantly of two kinds: optimisers and imitators.
- ▶ Asymmetry in resources and abilities can then lead to different types of imitation and thus ensure that we do not end up with 'herd behaviour'.
- ▶ Mutual reasoning and strategising process between optimizers and imitators leads to interesting questions for game dynamics in these contexts.

# Imitation in Games

- ▶ May yield the optimal outcome: the **tit-for-tat** strategy in a repeated prisoner's dilemma.
- ▶ May be totally stupid: **monkey chess**.

# What we study

- ▶ We consider games of unbounded duration on finite graphs among players with overlapping objectives where the population is divided into players who optimise and others who imitate.
- ▶ Since plays eventually settle down to connected components, players' preferences are given using orderings on Muller sets.

# What we show

- ▶ In this setting we address the following questions and present algorithmic results:
  - ▶ If the optimisers and the imitators play according to certain specifications, is a global outcome eventually attained?
  - ▶ What sort of imitative behaviour (subtypes) eventually survive in the game?
  - ▶ How worse-off are the imitators from an equilibrium outcome?

# Imitator Strategy - Examples

- ▶ Imitate player 1 for 3 moves and then keep imitating player 4 forever.
- ▶ Imitate player 2 till she receives the highest payoff. Otherwise switch to imitating player 3.
- ▶ Nondeterministically imitate player 4 or 5 forever.

# Strategy Specification - Optimiser

- ▶ One of the motivations for an imitator to imitate an optimiser is the fact that an optimiser plays to get best results.
- ▶ To an imitator, an optimiser appears to have the necessary resources to compute and play the best strategy and hence by imitating such a player she cannot be much worse off.
- ▶ However, we show that in our setting it is enough to consider optimiser strategies that are bounded memory.

# Equilibrium

Let the strategy specifications of the  $n$  imitators be given by FSTs  $\mathcal{R}_1, \dots, \mathcal{R}_n$  respectively. We construct a game  $(\mathcal{G}', v'_0, <'_1, \dots, <'_{m+1})$  with  $m + 1$  players from the game  $(\mathcal{G}, v_0, <_1, \dots, <_{m+n})$  in the following steps:

- Step 1** Construct the arena  $\mathcal{G}' = \mathcal{G} \times \mathcal{R}_1 \times \dots \mathcal{R}_n$
- Step 2** Introduce a new player, the  $m + 1$ th player, who owns all nodes  $(v, q_1, \dots, q_n)$  such that  $v$  was an imitator node in  $\mathcal{G}$ .
- Step 3** Lift the preference orders of the players 1 to  $m$  to subsets of  $V'$  as follows. A subset  $W$  of  $V'$  corresponds to the Muller set  $F(W) = \{v \mid (v, q_1, \dots, q_n) \in W\}$  of  $\mathcal{G}$ . For every player  $i : 1 \leq i \leq m$ , for  $W, W' \subseteq V'$ ,  $W <'_i W'$  if and only if  $F(W) <_i F(W')$
- Step 4** Lift the preference order of the  $m + n$ th imitator in  $\mathcal{G}$  to the  $m + 1$ th player (the new player) in  $\mathcal{G}'$ .

# Results

## Theorem

*Let  $(\mathcal{G}, v_0, <_1, \dots, <_{m+n})$  be a game with  $m + n$  players with  $m$  optimisers playing bounded memory strategies  $\sigma_1, \dots, \sigma_m$  and the rest  $n$  imitators playing imitative strategies  $\tau_1, \dots, \tau_n$  where every such strategy is among  $t$  different types. Let  $W$  be a strongly connected component of  $\mathcal{G}$ . The following questions are decidable:*

- (i) Does the game eventually settle down to  $W$ ?*
- (ii) What subtypes of the  $t$  types eventually survive?*
- (iii) How worse-off is imitator  $i$  from an equilibrium outcome?*

# Research questions: large games

- ▶ Fixed set of players to an unbounded set of players.
- ▶ Topological study of neighbourhood structures.
- ▶ Rule synthesis a la mechanism design.
- ▶ Hierarchy of interaction.
- ▶ Study of herd behaviour and runaway phenomena.
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# Thank you!

# Welcome to India!

- ▶ We have an Association for Logic in India ([www.cmi.ac.in/~ali](http://www.cmi.ac.in/~ali)) which organizes:
  - ▶ *Odd years*: Indian Conference on Logic and Applications. Last one at Delhi University, January 5-9, 2011.
  - ▶ *Even years*: Indian School on Logic and Applications. Next one at Manipal University, January 9-20, 2010.
- ▶ The next FSTTCS conference (December 2011) will be held in IIT - Bombay ([www.fsttcs.org](http://www.fsttcs.org), [www.iarcs.org.in](http://www.iarcs.org.in)).

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