

Games on Graphs

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Reasoning Agents Seminar

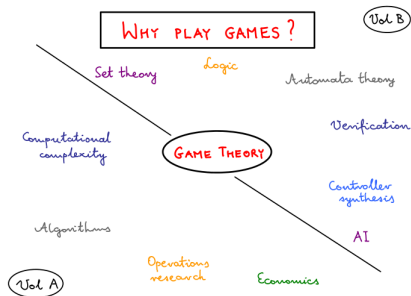
Where do games come from?

Games on graphs are a useful **mathematical model** of many phenomena in computer science, economics, biology, that involve **dynamic interaction** among two or more **agents**.

Main idea: Capture strategic interaction

Model: Two players moving a token along the edges of a graph, resulting in a infinite (sometime finite) path called a play. Player **0** is trying to ensure the play satisfies a given property, and player **1** is trying to fail such property.

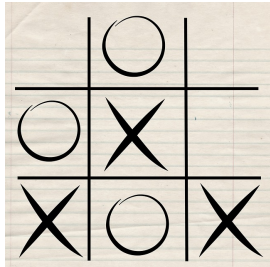
No playing around: game theory is serious business!



- ▷ It's fun!
- ▷ Model reactive systems
- ▷ Solve synthesis problems
- ▷ Evaluate logic formulas

Image credits: Martin Zimmerman

Examples of games



Examples of games



Examples of games



Examples of games





Synthesis

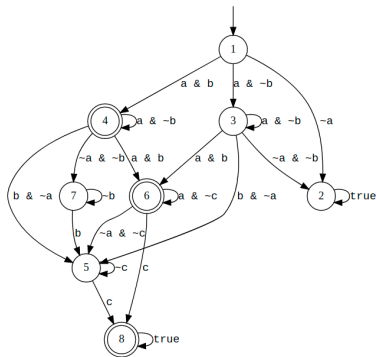


Image credits: itlf2dfa.diag.uniroma1.it

Players

- 1 player;
- 2 players;
- multi-players.

Classification of games

Players	Interaction
1 player;	Turn-based;
2 players;	Concurrent.
multi-players.	

Classification of games

Players	Interaction	Information
1 player;	Turn-based;	Perfect;
2 players;	Concurrent.	Imperfect.
multi-players.		

Classification of games

Players	Interaction	Information	Nature
1 player;	Turn-based;	Perfect;	Deterministic;
2 players;	Concurrent.	Imperfect.	Stochastic.
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Players	Interaction	Information	Nature	Objective
1 player; 2 players; multi-players.	Turn-based; Concurrent.	Perfect; Imperfect.	Deterministic; Stochastic.	Reachability; Safety; Buchi; co-Buchi; ...

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Today

2-player turn-based perfect information games.

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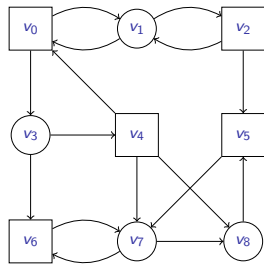
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				...

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Possible projects

See the blue and red.

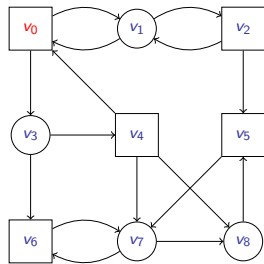


A **Game** is played over a (finite) **graph** (V, E) , whose vertexes are under the control of the two players $V = V_0 \cup V_1$.

A **token** moves along the vertexes and sent to a successor by the controlling player.

The outcome or **play** is an infinite sequence of vertexes in the graph.

A **winning condition/objective** is a subset $Obj \subseteq V^\omega$ of plays that Player 0 wants to occur.



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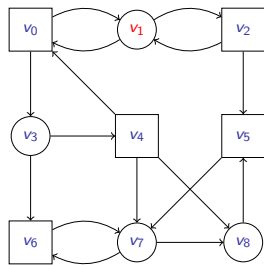
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Sample play

$\pi = v_0$



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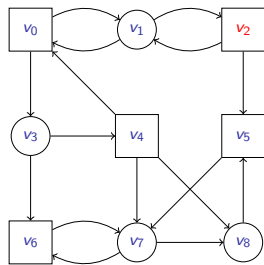
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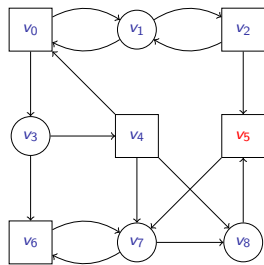
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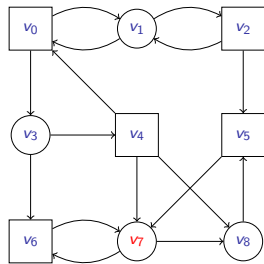
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Sample play

$$\pi = v_0 \cdot v_1 \cdot v_2 \cdot v_5 \cdot v_7 \cdot \dots \in V^\omega$$

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Question: what if we have more alternations of existential and universal quantifiers?

Strategies

A **strategy** maps partial outcomes (i.e., finite sequences of vertexes) into successors and it is of the form

Player 0 strategy

$$\sigma_0 : V^* \cdot V_0 \rightarrow V$$

Player 1 strategy

$$\sigma_1 : V^* \cdot V_1 \rightarrow V$$

Consistent plays

Strategies “**restricts**” the game only to those play π that are **consistent** with σ_0 , that is such that $\pi_{i+1} = \sigma_0(\pi_0 \cdot \pi_1 \cdot \dots \cdot \pi_i)$, if $\pi_i \in V_0$.

For given strategies σ_0, σ_1 , there is **only one consistent play** starting from v .

Winning strategies

A strategy σ_0 is **winning** for Player 0 in v if every consistent path π starting from v **belongs** to **Obj**.
(Winning set $\text{Win}_0 \subseteq V$)

A strategy σ_1 is **winning** for Player 1 in v if every consistent path π starting from v **does not belong** to **Obj**.
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Solving a game

The **solution** of a game G is the set Win_0 of vertexes that are winning for Player 0.

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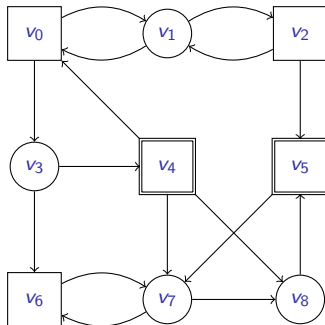
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The **solution** of a game G is the set Win_0 of vertexes that are winning for Player 0.

Warning! While $\text{Win}_0 \cap \text{Win}_1 = \emptyset$, it is not always the case that $V = \text{Win}_0 \cup \text{Win}_1$.

Consider again the arena below and let $T = \{v_4, v_5\}$ (the double bordered nodes).



What is the winning set of **G**?

Consider the function force_0 defined as follows:

$$\text{force}_0(X) = \{v \in V_0 : E(v) \cap X \neq \emptyset\} \cup \{v \in V_1 : E(v) \subseteq X\}$$

Player 0 has a move to enter the region X ;

Player 1 cannot avoid to enter the region X .

The function computes the vertexes from which Player 0 can **enforce the token to move** in the subset X of vertexes.

Constrained problem

$\text{Reach}^n(\mathbf{G}) :=$ “Player 0 can reach T in at most n moves”.

$n = 0$: T I have to be in T already.

$$\text{Reach}^0(\mathbf{G}) = T$$

$n > 0$: either I am or can force to a vertex winning in at most $n - 1$ moves.

$$\text{Reach}^n(\mathbf{G}) = \text{Reach}^{n-1}(\mathbf{G}) \cup \text{force}_o(\text{Reach}^{n-1}(\mathbf{G}))$$

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Fix-point calculation

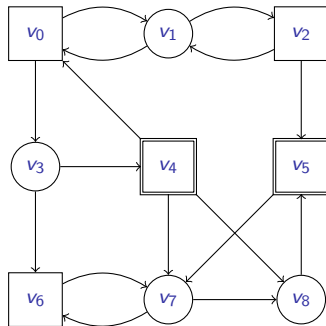
$$\mu X. (T \cup \text{force}_0(X))$$

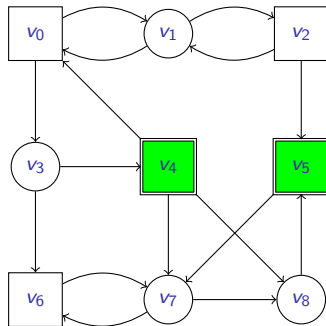
Algorithm 1 Reachability game

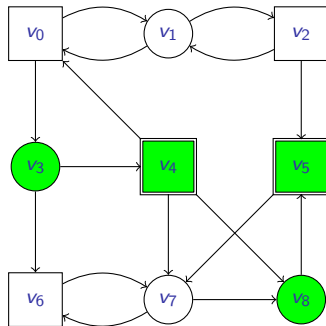
```
1:  $Win := \mathcal{T}$   
2: while  $Win \neq Win \cup \text{force}_o(Win)$  do  
3:    $Win := Win \cup \text{force}_o(Win)$   
4: end while  
5: return  $Win$ 
```

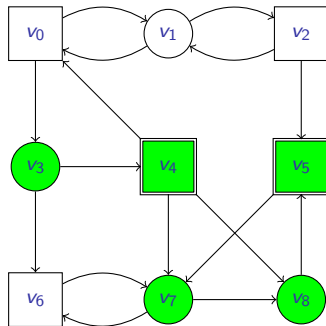
Question: What is the complexity this procedure?

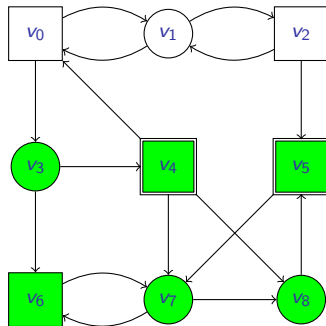
Question: Can we do (theoretically) better?











Memoryless strategy

A strategy σ_0 is **memoryless** if it is of the form

$$\sigma_0 : \cancel{V^*}.V_0 \rightarrow V$$

that is, at every vertex v , the next move does not depend on the past history (and thus it is always the same).

Memoryless strategy

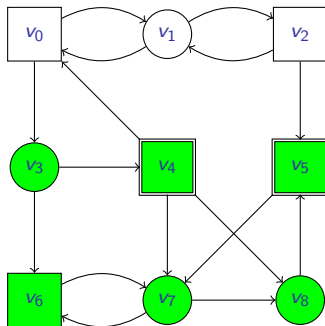
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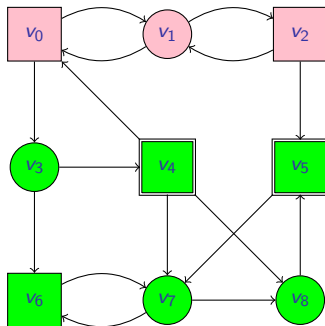
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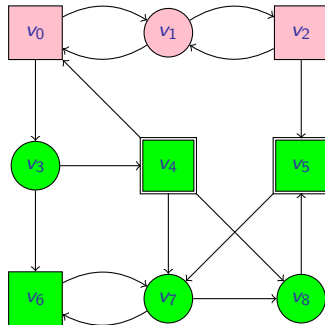
that is, at every vertex v , the next move does not depend on the past history (and thus it is always the same).

Theorem (Memoryless)

If $v \in \text{Win}_0$, then there exists a **memoryless** strategy σ_0 that is winning from v .







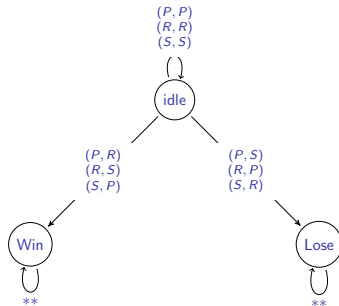
It holds that $\text{Win}_0 \cup \text{Win}_1 = V$. When this is the case, we say that the game is **determined**.

Theorem (determinacy)

Every 2-player turn-based reachability game is determined.

An excursion to other games

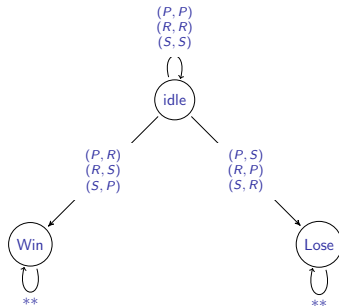
Concurrent games



A **Concurrent Game** is played over a **structure** (V, Ac, tr) a set of **actions** Ac and a **transition function** $tr : V \times (Ac \times Ac) \rightarrow V$

The token is sent to a successor by a **coordinated action**, following the transition function.

Plays and objectives are as for turn-based games.



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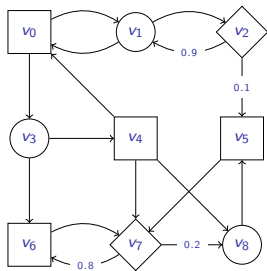
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Plays and objectives are as for turn-based games.

Concurrent games are not determined!

An excursion to other games

Stochastic games

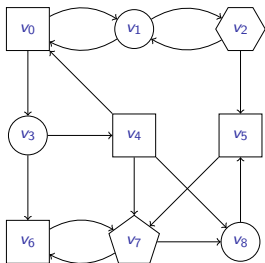


A **Stochastic Game** is played by 2 players over (V, E) but $V = V_0 \cup V_1 \cup V_s$.

Player 0 has to **maximize** the probability of winning its objective.

An excursion to other games

Multi-player games



A **Multi-player Game** is played by n players over (V, E) with $V = V_0 \cup \dots \cup V_{n-1}$.

Player i is assigned an objective $\text{Obj}_i \subseteq V^\omega$.

Rather than winning strategies, we are interested in finding **equilibria**.

Project ideas

Implement, and validate algorithms for solving extensions of 2-player turn-based reachability games towards different directions

Objective: Buchi, co-Buchi,

Interaction: Concurrent games;

Number of players: Multi-player games;

Nature: Stochastic games.

Feel free to get in touch with me to discuss details of this

perelli@diag.uniroma1.it