

# Using Bisimulations in Analysis of Stochastic Games

Roland Glück



Universität Augsburg

27.09.2011

Raesfeld

# Overview

- stochastic games
- bisimulations
- synthesis
- conclusion and outlook

# Definition

## Definition

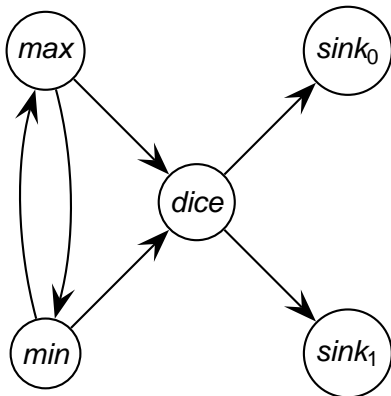
A *stochastic game* is a graph  $G = (V, E)$  with

- $V = V_{max} \dot{\cup} V_{min} \dot{\cup} V_{dice} \dot{\cup} \{sink_0\} \dot{\cup} \{sink_1\}$
- $\forall v \in V, v \notin \{sink_0, sink_1\} : deg_{out}(v) \in \{1, 2\}$
- $deg_{out}(sink_0) = deg_{out}(sink_1) = 0$

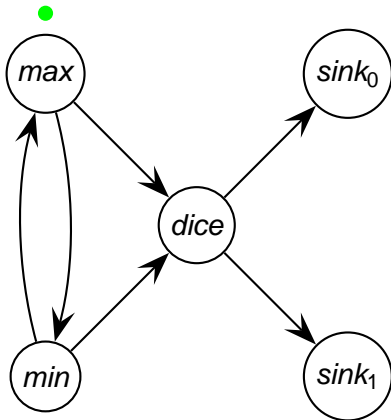
# Rules

- token placed on a start node and moved along edges
- on min(max)-node, min(max)-player chooses one edge
- on dice-nodes one edge is chosen arbitrarily
- games ends if tokens reaches sink-node
- at  $sink_0$  ( $sink_1$ ) min(max)-player wins

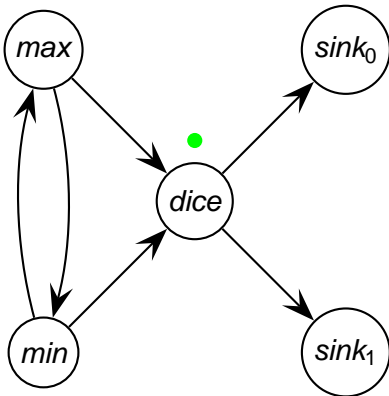
# Example Game



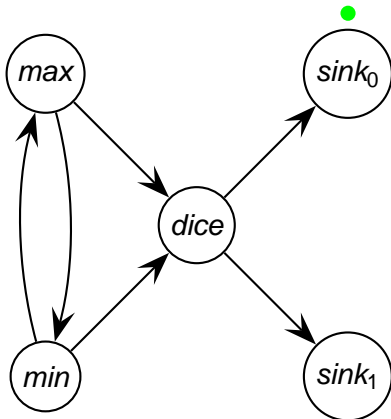
# Example Game



# Example Game

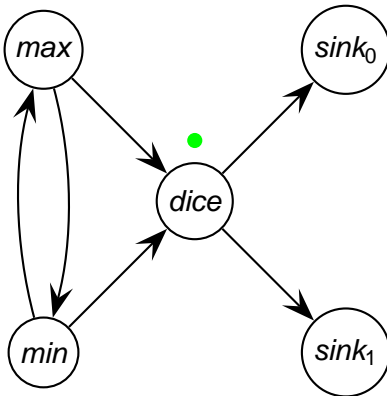


# Example Game

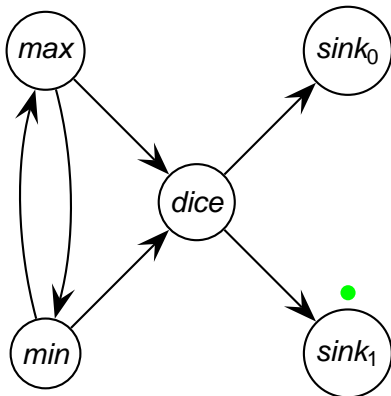




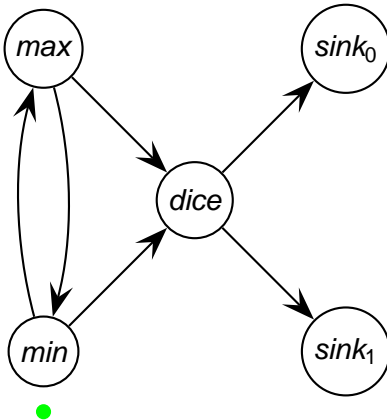
# Example Game



# Example Game



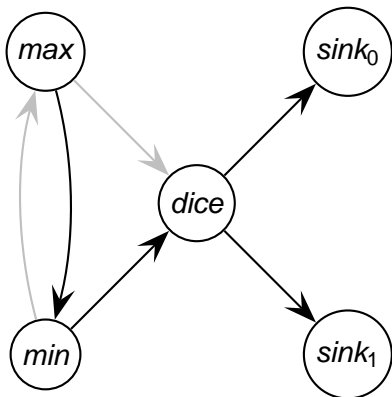
# Example Game



# Strategy

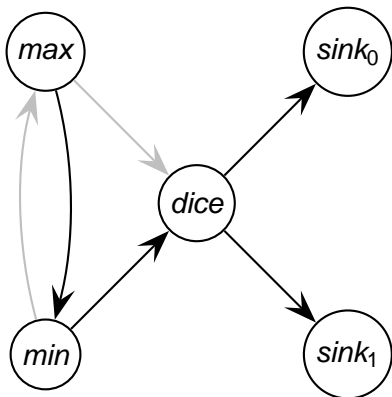
- *max-strategy*  $\sigma$ :  $\sigma \subseteq V_{max} \times V : \forall v \in V_{max} : deg_{out}^{\sigma}(v) = 1$
- *min-strategy*  $\tau$ :  $\tau \subseteq V_{min} \times V : \forall v \in V_{min} : deg_{out}^{\tau}(v) = 1$
- pair  $(\sigma, \tau)$  corresponds to Markov process
- $val_{\sigma, \tau}(v) = P(\text{max-player wins under strategies } \sigma \text{ and } \tau \text{ if game starts in node } v)$
- refinement of given graph

## Example Game



$$\sigma = \{(max, min)\}, \tau = \{(min, dice)\}$$

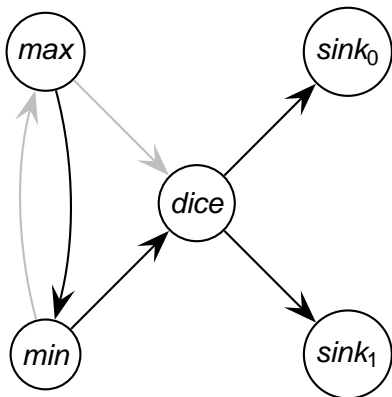
## Example Game



$$val_{\sigma, \tau}(sink_0) = 0$$

$$\sigma = \{(max, min)\}, \tau = \{(min, dice)\}$$

## Example Game

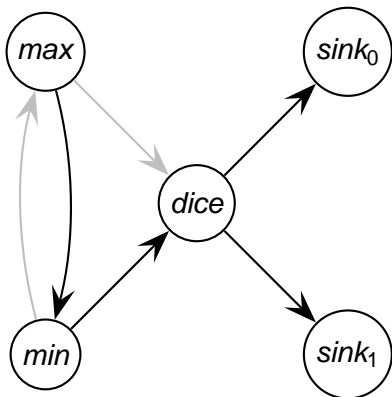


$$val_{\sigma, \tau}(sink_0) = 0$$

$$val_{\sigma, \tau}(sink_1) = 1$$

$$\sigma = \{(max, min)\}, \tau = \{(min, dice)\}$$

## Example Game



$$val_{\sigma, \tau}(sink_0) = 0$$

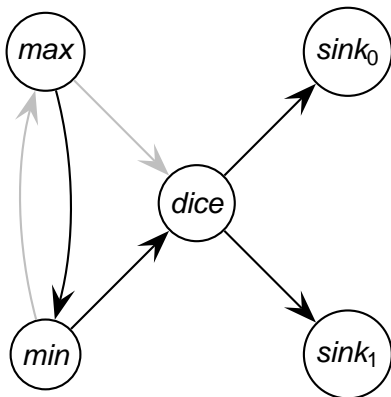
$$val_{\sigma, \tau}(sink_1) = 1$$

$$val_{\sigma, \tau}(dice) = 0.5$$

$$\sigma = \{(max, min)\}, \tau = \{(min, dice)\}$$



# Example Game



$$val_{\sigma, \tau}(sink_0) = 0$$

$$val_{\sigma, \tau}(sink_1) = 1$$

$$val_{\sigma, \tau}(dice) = 0.5$$

$$val_{\sigma, \tau}(max) = 0.5$$

$$val_{\sigma, \tau}(min) = 0.5$$

$$\sigma = \{(max, min)\}, \tau = \{(min, dice)\}$$

## optimal value

- given  $\sigma$  and  $\tau$ ,  $val$  can be computed easily (and is unique)
- $val_{opt}(v) = \max_{\sigma} \min_{\tau} val_{\sigma, \tau}(v)$
- $\max_{\sigma} \min_{\tau} val_{\sigma, \tau}(v) = \min_{\tau} \max_{\sigma} val_{\sigma, \tau}(v)$
- computation of optimal value is in  $NP \cap coNP$  (as decision problem)
- key idea: optimality of given strategy can be checked easily
- no provably polynomial algorithm known

# Definition

## Definition

$B \subseteq V_1 \times V_2$  is a *bisimulation* between two graphs  $(V_1, E_1)$  and  $(V_2, E_2)$  iff

- $Dom(B) = X_1$  and  $Cod(B) = X_2$
- $v_1 B v_2 \wedge v_1 E_1 w_1 \Rightarrow \exists w_2 : w_1 B w_2 \wedge v_2 E_2 w_2$
- $v_2 B^\sim v_1 \wedge v_2 E_2 w_2 \Rightarrow \exists w_1 : w_2 B^\sim w_1 \wedge v_1 E_1 w_1$

# Coarsest Bisimulation

- bisimulations between  $G$  and itself are closed under
  - union,
  - composition, and
  - taking the converse
- identity is a bisimulation between  $G$  and itself
- existence of a *coarsest bisimulation equivalence on  $G$*

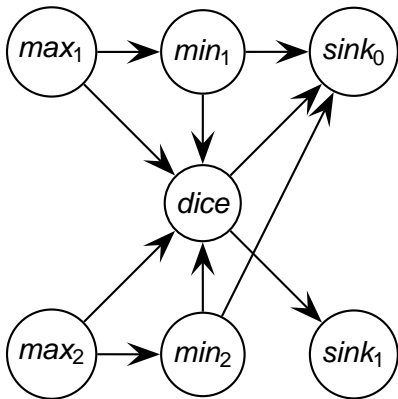
## Compatible Bisimulations

- bisimulation equivalence  $B$  respects partition  $V = \dot{\bigcup}_{i \in I} V_i$  if every  $V_i$  is the union of suitable equivalence classes of  $B$
- for every partition of  $V$  exists a coarsest respecting bisimulation equivalence
- here main interest in bisimulation equivalences respecting  $\{V_{max}, V_{min}, V_{dice}, \{sink_0\}, \{sink_1\}\}$

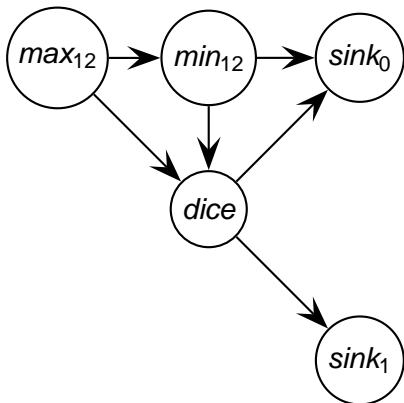
# Quotient Graph

- for a bisimulation equivalence  $B$  and a graph  $G = (V, E)$  the *quotient*  $G/B = (V/B, E/B)$  is defined by
  - $V/B$  is the set of equivalence classes of  $B$
  - $(v/B, w/B) \in E/B \Leftrightarrow \exists v' \in v/B \ w' \in w/B : (v', w') \in E$
- $G/B$  has in general a smaller node set than  $G$
- *coarsest quotient* respecting  $(V_i)_{i \in I}$  induced by coarsest bisimulation respecting  $(V_i)_{i \in I}$

## Example Quotient



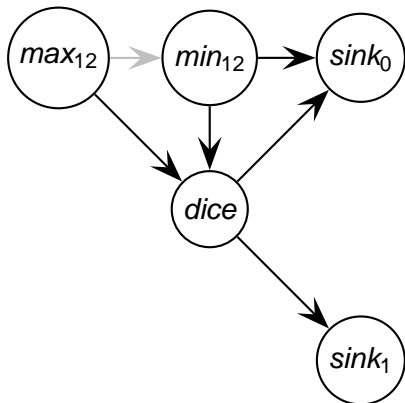
## Example Quotient



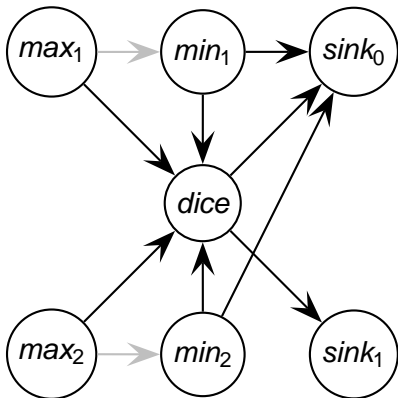


- idea: compute val-function and optimal strategy on the quotient and expand solution
- missing: expansion operation
- solution: for a subgraph  $(G/B)' = (V/B, (E/B)')$  of  $G/B$  define the *expansion*  $(G/B)' \setminus B = (V', E')$  by
  - $V' = V$
  - $(v_1, v_2) \in E' \Leftrightarrow (v_1, v_2) \in E \wedge (v_1/B, v_2/B) \in (E/B)'$

# Optimal Quotient Strategy



# Optimal Strategy



# Conclusion

- computation of the coarsest quotient takes polynomial time
- even diminution by one node can lead to significant runtime speed up
- application to other game classes

# Conjecture

- $val$  can be computed by solving linear equation  $x = Ax + b$  (for given strategies)
- bisimulation approach works also for optimality problems corresponding to Bellman equation
- both compatible with bisimulations
- deeper connection?