

# The Complexity of Nash Equilibria in Simple Stochastic Multiplayer Games

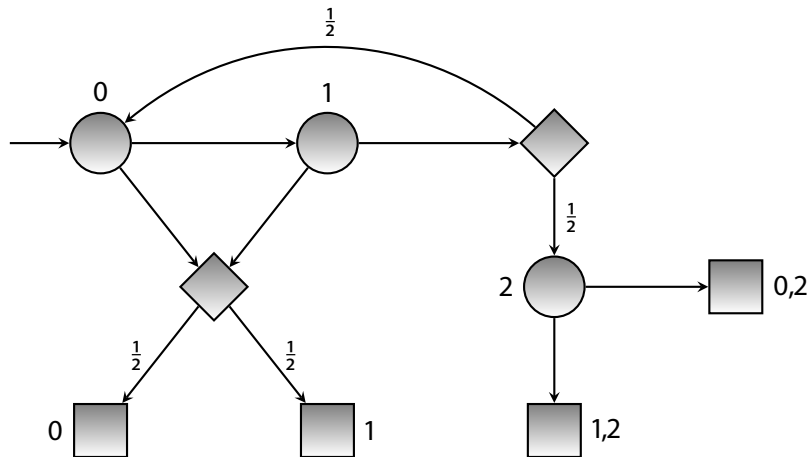
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GASICS 2009  
(Joint Work with Dominik Wojtczak)

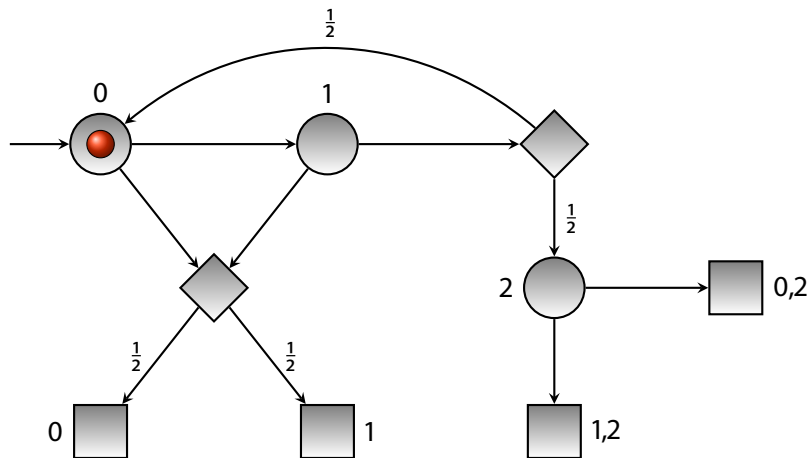
# Simple Stochastic Games

What is a simple multiplayer stochastic game (SSMG)? [Let's play!](#)



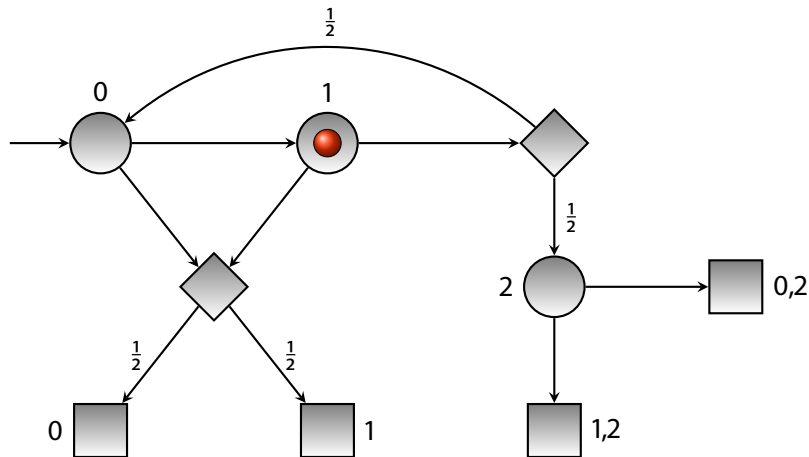
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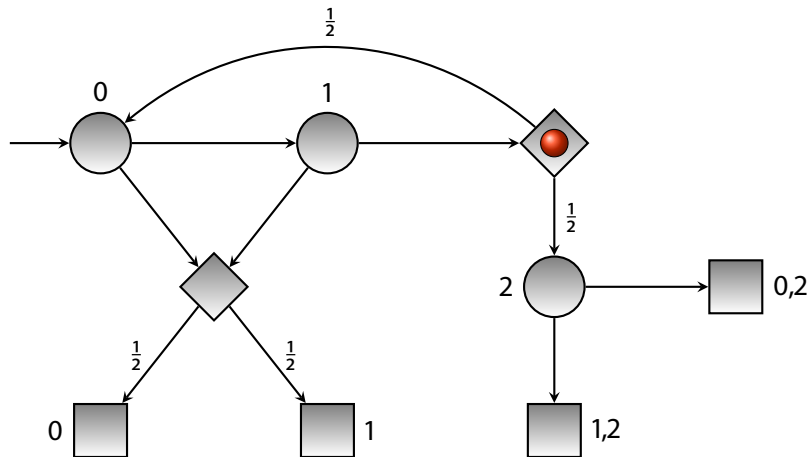
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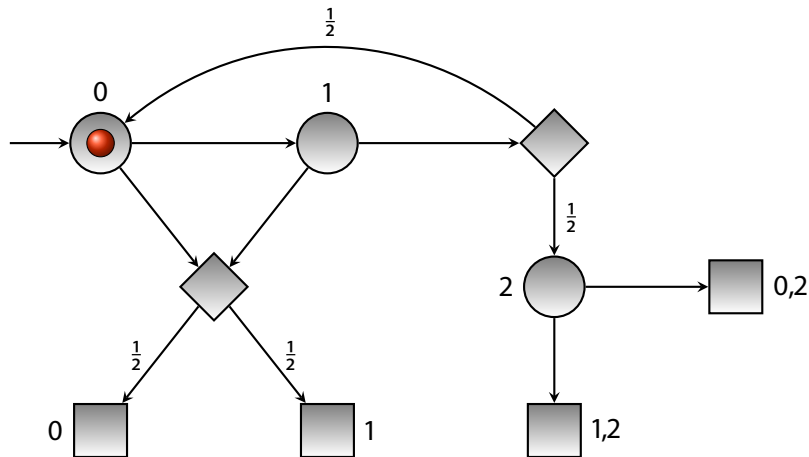
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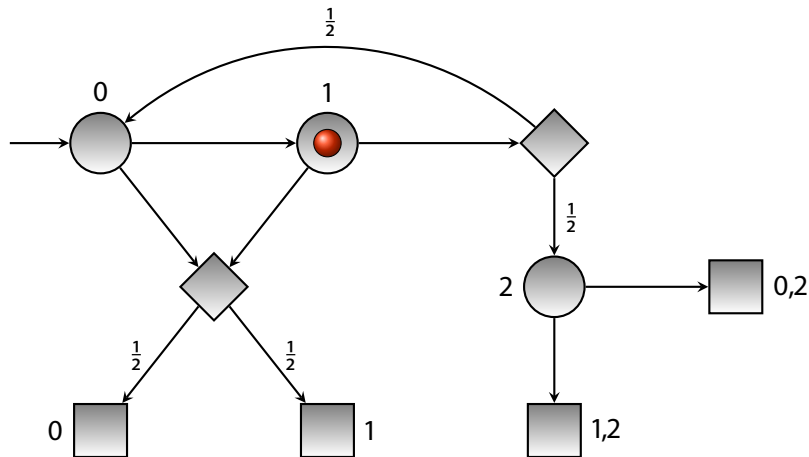
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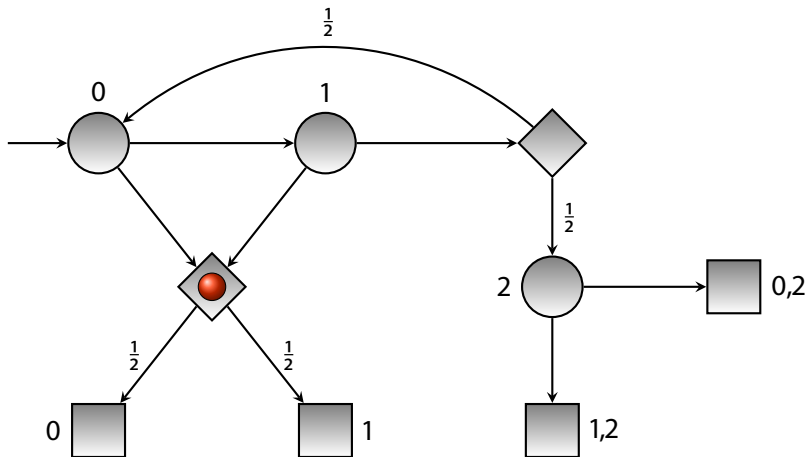
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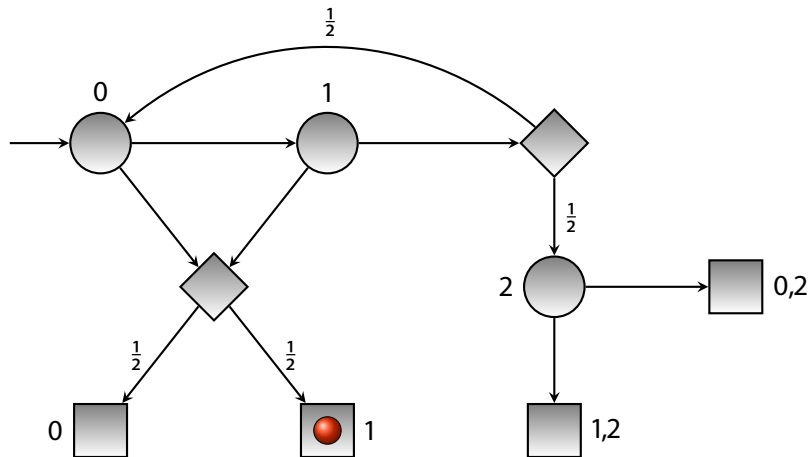
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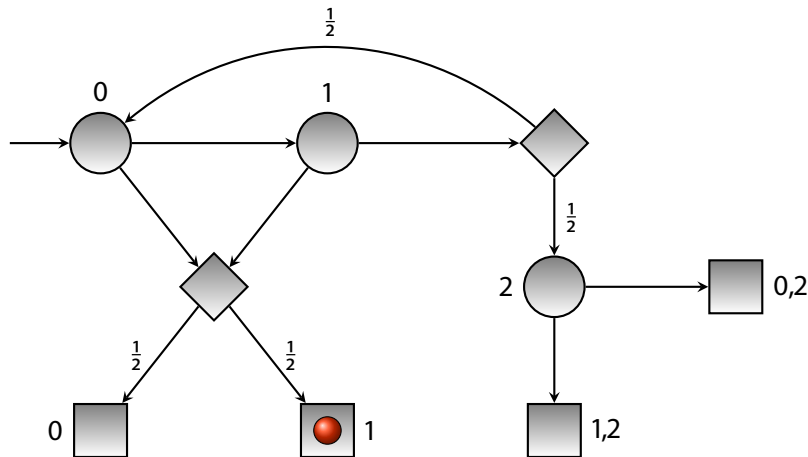
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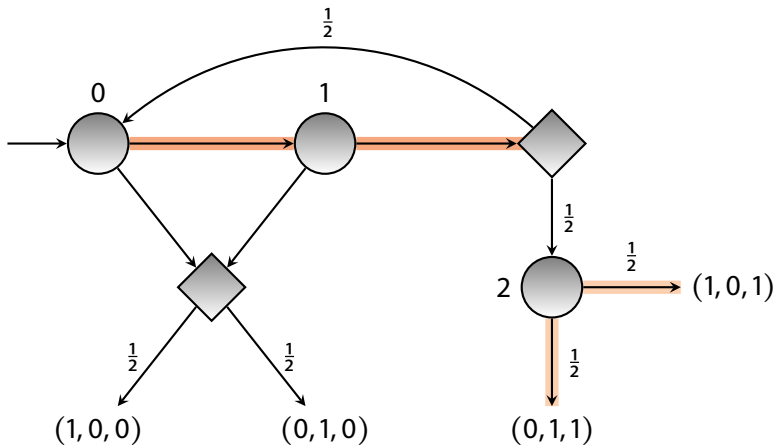
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Winners are decided at terminal vertices. Infinite plays are *bad*.

# Strategies and Probabilities

A strategy profile induces a probability distribution on sets of plays.



Payoff of this strategy profile:  $(\frac{1}{2}, \frac{1}{2}, 1)$

# Nash Equilibria

**Definition:** A strategy profile is a **Nash equilibrium** if no player can gain from unilaterally switching to a different strategy.

**Question:** Do Nash equilibria always exist?

**Theorem (Chatterjee & al., 2004)**

Any SSMG has a Nash equilibrium (in pure finite-state strategies).

**Next Question:** Can we compute one?

**Proposition**

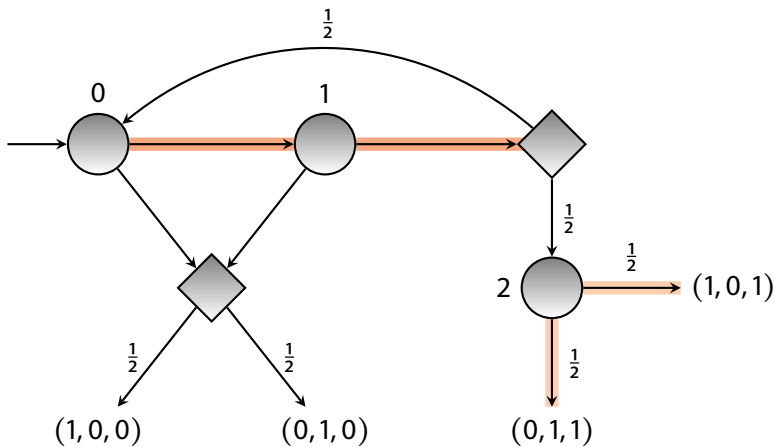
The problem of computing a (pure finite-state) Nash equilibrium of an SSMG is in FNP.

**Open Problem:** Can one compute a Nash equilibrium in polynomial time?

But there may be many Nash equilibria (with different payoffs)...

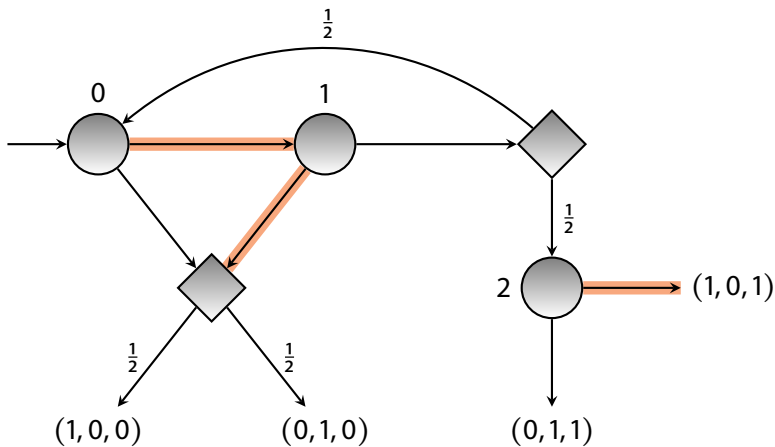
# Example

Nash Equilibrium where Player 2 wins (with probability 1):



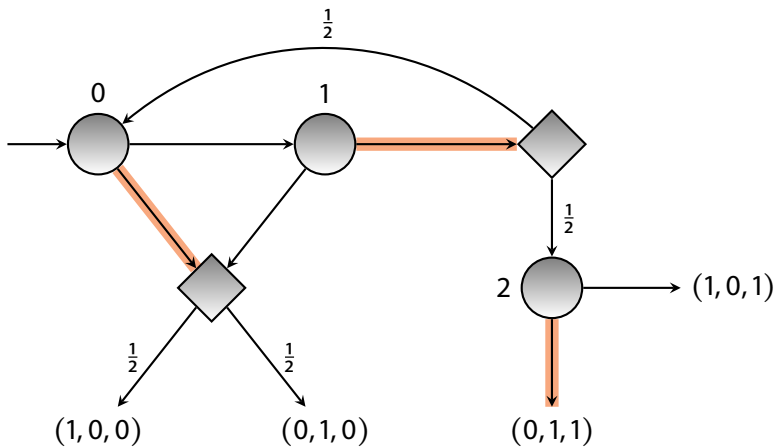
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Nash Equilibrium where Player 2 loses:



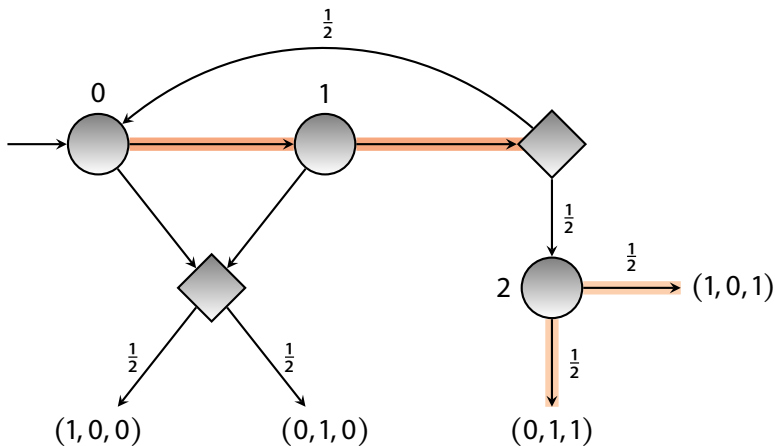
# Example

Nash Equilibrium where Player 2 loses:



# Example

Nash Equilibrium where Player 2 wins (with probability 1):



**Observation:** Mixed strategies are more powerful...



# The Problem NE

**Goal:** Compute a Nash equilibrium that meets certain requirements on the payoff.

**The problem NE:** Given an SSMG  $\mathcal{G}$ , two payoff thresholds  $\bar{x}, \bar{y} \in [0, 1]^k$ , decide whether the game has a Nash equilibrium with payoff  $\geq \bar{x}$  and  $\leq \bar{y}$ .

**Special case:** Given an SSMG  $\mathcal{G}$ , decide whether the game has a Nash equilibrium where Player 0 wins almost surely.

## Variants of the Problem:

- ▶ Mixed strategies
- ▶ Pure strategies
- ▶ Mixed, memoryless strategies
- ▶ Pure, memoryless strategies

# Our Results

The Complexity of NE (and the special case):

	Pure	Mixed
Arbitrary	Undecidable	?
Memoryless	NP-complete	PSPACE *

\* NP-hard and at least as hard as SQRT-SUM

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# Pure, memoryless Nash equilibria

Deciding the existence of a pure, memoryless NE with payoff  $\geq \bar{x}$  and  $\leq \bar{y}$ :

- ▶ Guess a pure, memoryless strategy profile  $\bar{\sigma}$ .
- ▶ For each player  $i$ :
  1. Compute the payoff  $r_i$  of  $\bar{\sigma}$  for player  $i$ .
  2. Compute the maximal payoff  $z_i$  player  $i$  can achieve by herself.
  3. Check whether  $x_i \leq r_i \leq y_i$  and  $z_i \leq r_i$ .

1. and 2. are doable in polynomial time (via linear programming).

## Theorem

NE for pure, memoryless strategies is in NP.

**Remark:** NP-hardness is shown by a reduction from SAT and even holds for games with only two players (and also for mixed strategies).

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# Memoryless Nash Equilibria

Deciding the existence of a memoryless NE with payoff  $\geq \bar{x}$  and  $\leq \bar{y}$ :

- ▶ Guess the support  $S$  of a memoryless strategy profile  $\bar{\sigma}$ .
- ▶ For each player  $i$ , compute the set  $R_i$  of vertices from where the set of winning terminal vertices is reachable when playing  $\bar{\sigma}$ .
- ▶ Evaluate an existential first-order sentence  $\psi$  (which is polynomial-time computable from  $\mathcal{G}, \bar{x}, \bar{y}, S$  and  $(R_i)_{i \in \text{Players}}$ ) over  $\mathfrak{R} = (\mathbb{R}, +, \cdot, 0, 1)$ .

$\psi$  states that there exists a memoryless Nash equilibrium  $\bar{\sigma}$  with payoff  $\geq \bar{x}$  and  $\leq \bar{y}$  whose support is precisely  $S$ .

**Note:** The existential theory of  $\mathfrak{R}$  is decidable in PSPACE.

## Theorem

NE is in NPSPACE, and hence in PSPACE, for memoryless strategies.

# The Square-Root-Sum Problem

**Square-Root-Sum Problem (SQRT-SUM):** Given  $d_1, \dots, d_n \in \mathbb{N}$  and  $k \in \mathbb{N}$ , decide whether  $\sum_{i=1}^n \sqrt{d_i} \geq k$ .

The precise complexity of SQRT-SUM is not known:

- ▶ Known to be in PSPACE (actually in the 4th level of the counting hierarchy).
- ▶ No non-trivial lower bounds known.

**Open Problem (since 1970s):** Does SQRT-SUM lie inside the polynomial hierarchy? Is it in NP?

## Theorem

There is a polynomial-time reduction from SQRT-SUM to NE for memoryless strategies.

# Our Results

The Complexity of NE (and the special case):

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# Undecidability

Undecidability is shown by a reduction from the non-halting problem for two-counter machines.

## Theorem

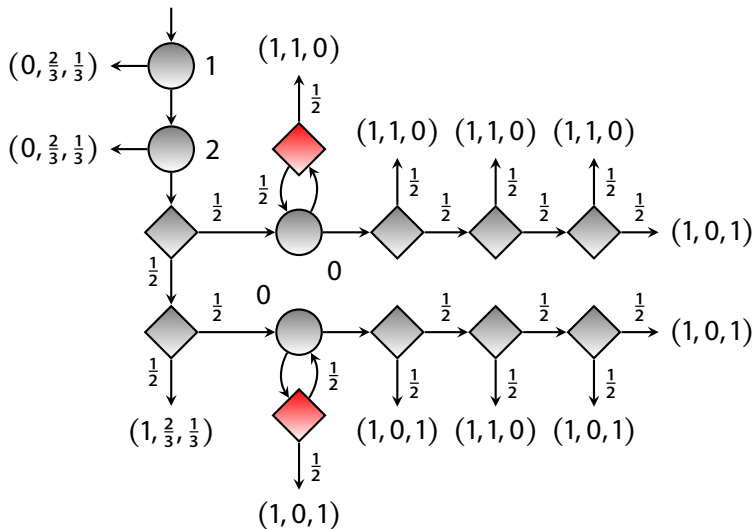
For every two-counter machine  $\mathcal{M}$  one can (algorithmically) construct a nine-player SSMG  $\mathcal{G}$  such that the computation of  $\mathcal{M}$  is infinite iff  $\mathcal{G}$  has a pure Nash equilibrium where player 0 wins almost surely.

## Corollary

NE is undecidable for pure strategies.

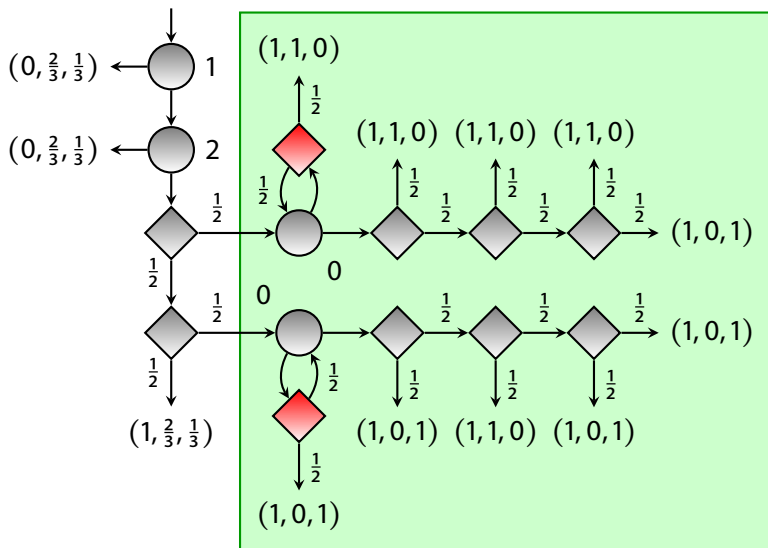
**Remark:** The reduction is similar to one used by Brázdil et al. (2006) for showing that stochastic games with *branching-time* winning conditions are undecidable.

# Simulating a Counter



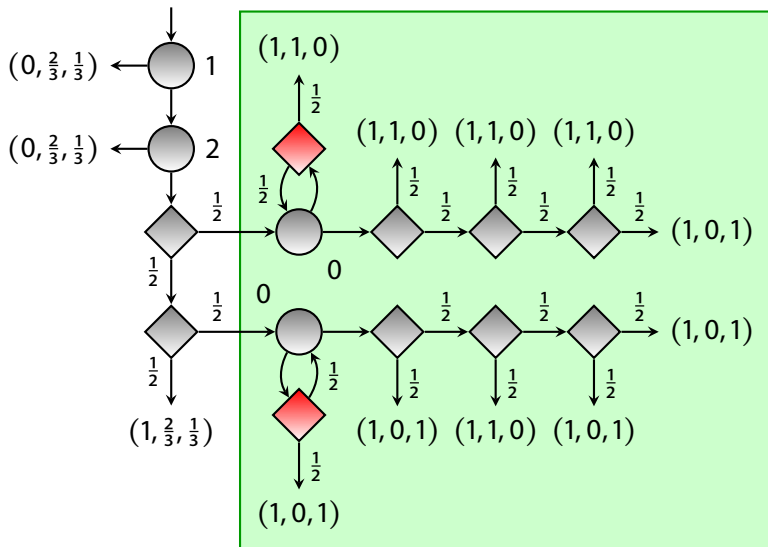
**Encoding of the counter:** (Maximal) number of visits to the red vertex.

# Simulating a Counter



Payoff for player 1 in NE where player 0 wins almost surely:  $p + \frac{1}{4} \cdot \frac{2}{3}$ .

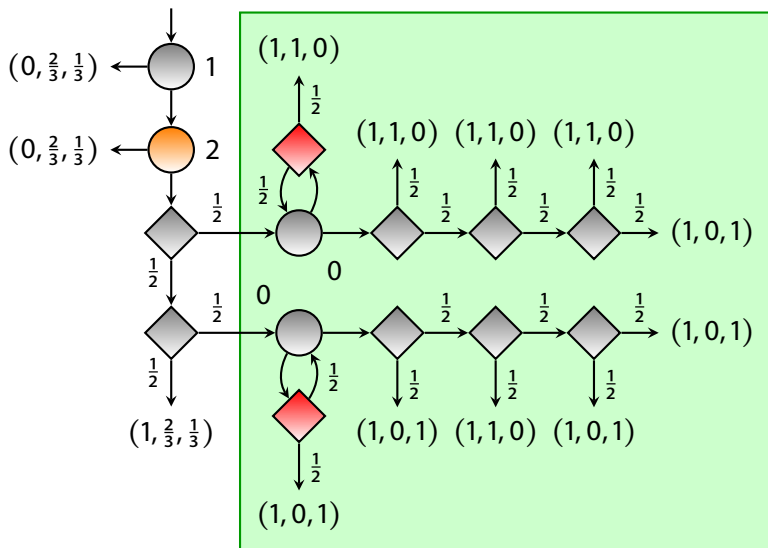
# Simulating a Counter



Payoff for player 1 in NE where player 0 wins almost surely:  $p + \frac{1}{6}$ .



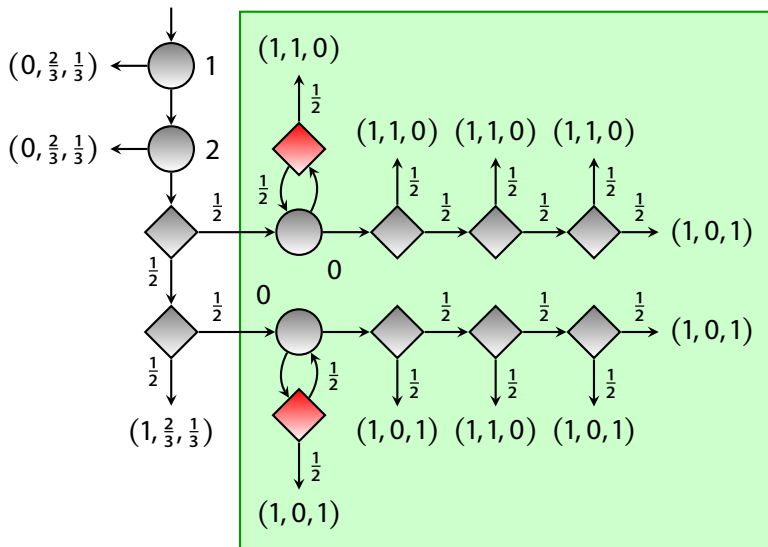
# Simulating a Counter



Payoff for player 1 in NE where player 0 wins almost surely:  $p + \frac{1}{6} = \frac{2}{3}$ .



# Simulating a Counter



Necessary for NE where player 0 wins almost surely: Counter maintained.



# Finite-State Nash Equilibria

A consequence of the proof is:

## Theorem

There exists an SSMG  $\mathcal{G}$  with a pure Nash equilibrium where player 1 wins with probability 1, but in any pure finite-state Nash equilibrium player 1 wins with probability 0.

**Question:** Is NE decidable when restricted to pure finite-state strategies?

**Remark:** NE for pure finite-state strategies is recursively enumerable.

## Theorem

NE is undecidable for pure finite-state strategies.

The proof is by a reduction from the halting problem for two-counter machines (similar to the one before).

# The Qualitative Fragment

**Remark:** All undecidability results rely on the possibility of having a non-binary payoff.

**Question:** What happens if we restrict to Nash equilibria with a binary payoff?

**The problem QualNE:** Given an SSMG  $\mathcal{G}$ , a payoff vector  $\bar{x} \in \{0, 1\}^k$ , decide whether the game has a Nash equilibrium with payoff  $\bar{x}$ .

## Theorem

QualNE is decidable in polynomial time.

**Remark:** Decidability holds for games with arbitrary  $\omega$ -regular winning conditions. Moreover, the problem is invariant under restricting the search space to pure, finite-state Nash equilibria.

What to take home?

*Finding good Nash equilibria in simple stochastic games is hard.*

Future work:

- ▶ Mixed Nash equilibria.
- ▶ Games with few players.
- ▶ Infinite-state games.