

# Subgame perfect $\epsilon$ -equilibrium in games of perfect information: a review

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GAMENET WORKSHOP  
Theory and Algorithms in Graph and Stochastic Games  
Mons, March 14–15, 2019

## A meeting point for

- Computer science
- Game theory
- Economics

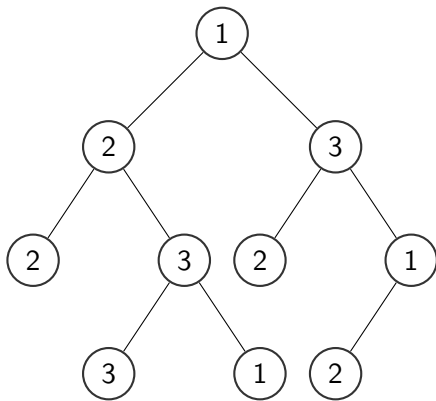
## The plan

- 1 Preliminaries
- 2 Weak subgame perfect  $\epsilon$ -equilibrium
- 3 Games with semicontinuous payoffs
- 4 Extensions
- 5 Mixed strategies
- 6 Open questions

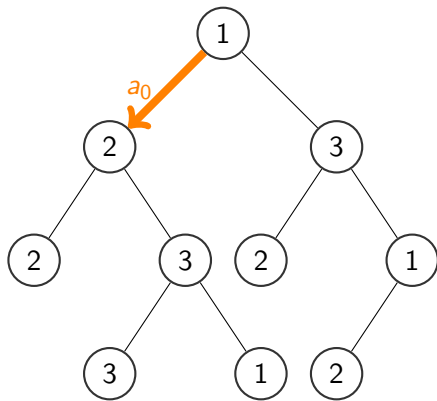
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## Perfect information games

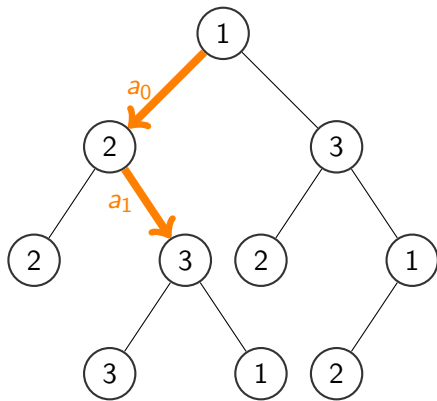


## Perfect information games



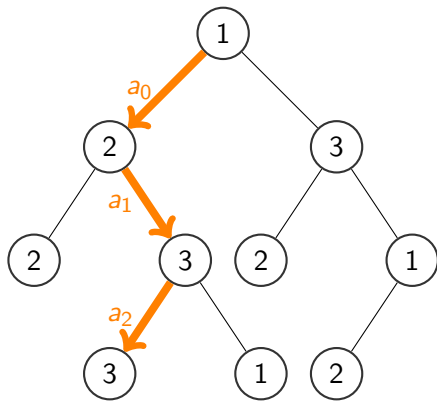
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## Perfect information games



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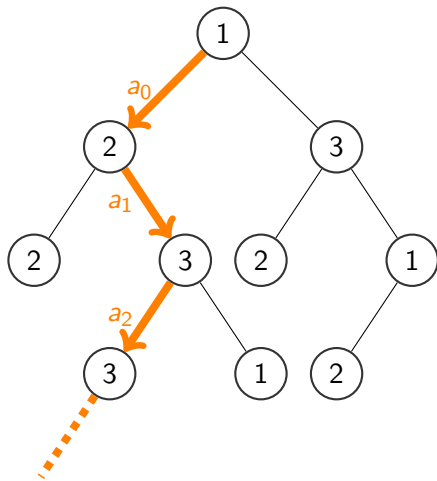
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- Player 3 chooses action  $a_2$ , and so on.



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- Player 2 chooses action  $a_1$ .
- Player 3 chooses action  $a_2$ , and so on.
- This gives an infinite sequence  $p = (a_0, a_1, \dots)$  called a **play**. Player  $i$  receives payoff  $u_i(p)$ .

## Perfect information games

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- Nodes (vertices) of  $T$  are called (decision) **histories**.  
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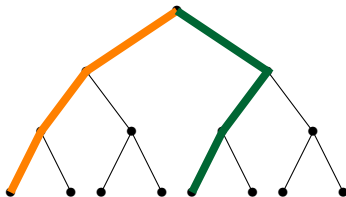
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- Elements of  $P$  are called **plays**.
- The set  $P$  is endowed with its usual distance.
- Each player  $i$  has a **payoff function**  $u_i : P \rightarrow \mathbb{R}$ .

## The distance on $\mathcal{P}$

$d(p, q) = 2^{-m}$  where  $m$  is the length of the longest common prefix of  $p$  and  $q$ .

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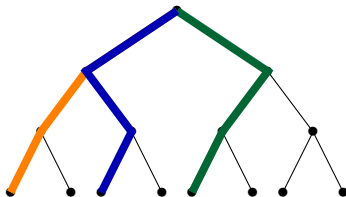
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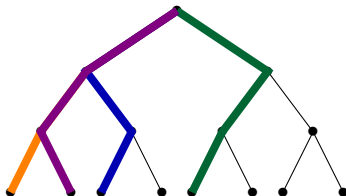


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## $\epsilon$ -Equilibria

- A joint strategy  $\sigma$  is an  $\epsilon$ -equilibrium if a player can gain at most  $\epsilon$  from a unilateral deviation.

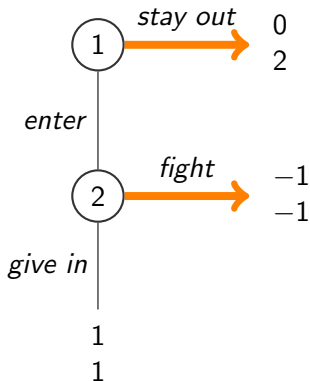
**Theorem (Mertens and Neyman [1987], Le Roux and Pauly [2014]):** Consider a game with a finite or a countable set of players where each player's payoff function  $u_i : P \rightarrow \mathbb{R}$  is bounded and Borel-measurable. Then for each  $\epsilon > 0$  the game has an  $\epsilon$ -equilibrium in pure strategies.

- This result builds on Borel determinacy (**Martin [1975]**).

## Subgame perfect $\epsilon$ -equilibria

- **Selten [1965, 1975]**
- A joint strategy  $\sigma$  is a **subgame perfect  $\epsilon$ -equilibrium** ( $SP_{\epsilon}E$ ) if it induces an  $\epsilon$ -equilibrium in each subgame.
- Equivalently,  $\sigma$  is a  $SP_{\epsilon}E$  if **in any subgame** a player can gain at most  $\epsilon$  from a unilateral deviation.

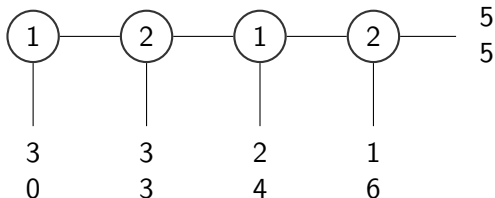
## SPE versus equilibrium



- (*stay out*, *fight*) is an equilibrium, but not a SPE.
- Would player 2 actually fight if given a chance?
- SPE eliminates **non-credible threats**

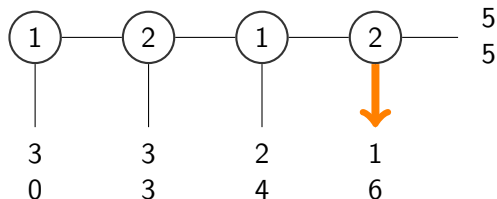
## Finite games

**Zermelo's Theorem (Kuhn [1953]):** *A finite game has a SPE. All SPE can be found by the process of backward induction.*



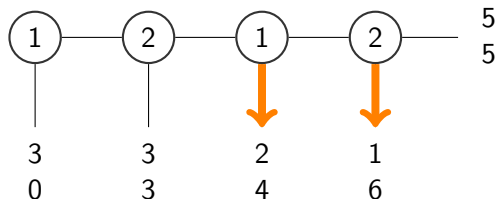
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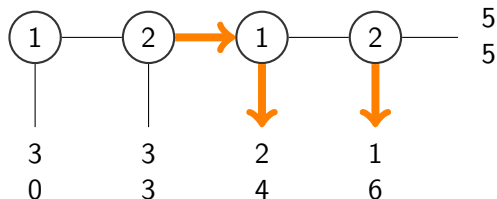
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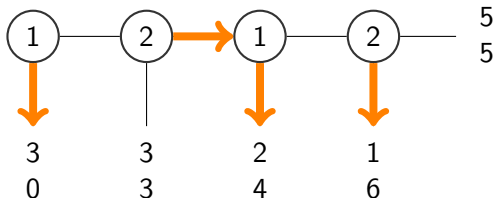
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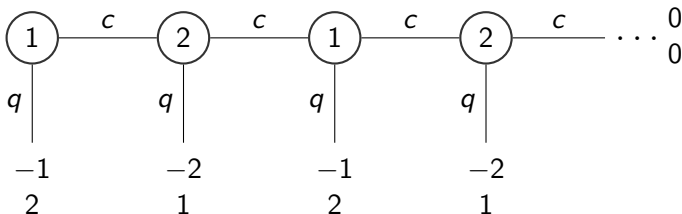




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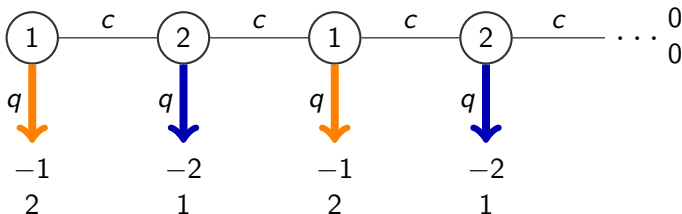
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## An example by Solan and Vieille [2003]



- Always playing  $q$  is an equilibrium, but not a SPE.
- The game has no SP $\epsilon$ E in **pure strategies**.

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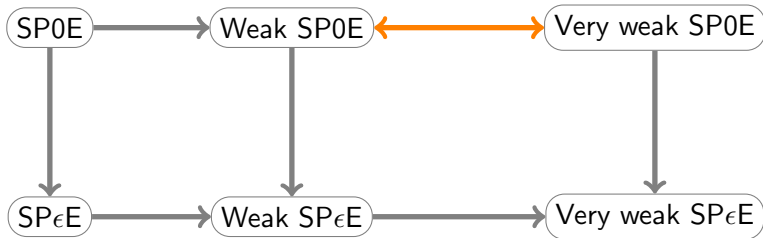


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## Weak and very weak $SP_{\epsilon}E$

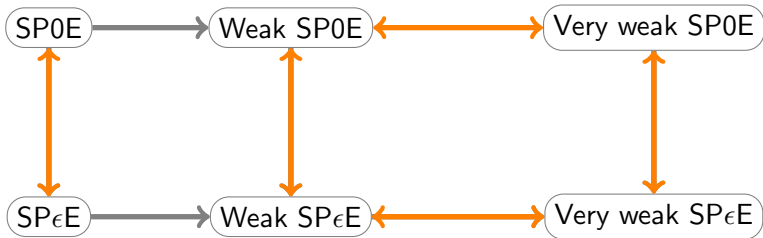
- **Brihaye, Bruyère, Meunier, Raskin [2015]**
- A joint pure strategy  $\sigma$  is a **weak  $SP_{\epsilon}E$**  if in any subgame a player can gain at most  $\epsilon$  by deviating from  $\sigma$  at **finitely many histories only**.
- A joint pure strategy  $\sigma$  is a **very weak  $SP_{\epsilon}E$**  if in any subgame a player can gain at most  $\epsilon$  by deviating from  $\sigma$  at a **single history only**.

## Weak and very weak $SP_{\epsilon}E$

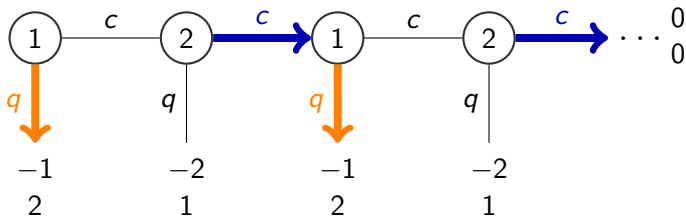


## Weak and very weak $SP_{\epsilon}E$

**Remark:** If there are **finitely many players**, and each player's payoff function only takes **finitely many values**, then for  $\epsilon > 0$  small enough:



## In Solan–Vieille's example



- **Very weak SP0E = weak SP0E:** Player 1 always playing  $q$ , player 2 always playing  $c$ .

## Existence of weak $SP_{\epsilon}E$

**Theorem (Flesch, Kuipers, Mashiah–Yaakovi, Schoenmakers, Solan, Vrieze [2010] and Bruyère, Le Roux, Pauly, Raskin [2017]):** *Let  $\epsilon > 0$ . A game with finitely many players and bounded payoff functions admits a weak  $SP_{\epsilon}E$ .*



## Existence of weak $SP_{\epsilon}E$

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- The result leads to several sufficient conditions for the existence of  $SP_{\epsilon}E$ .
- One such condition is lower semicontinuity of the payoff functions.

## Existence of weak $SP_{\epsilon}E$ : the proof

- A transfinite procedure of elimination of plays/outcomes.
- Start with all plays
- Fix a history and consider the active player's **guarnatee level**: maximizing the utility of the worst possible continuation play after his move.
- Eliminate the plays that do not meet the guarantee levels.
- Repeat...

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## Semicontinuous payoff functions: very informally

- A payoff function is **lower semi-continuous** if the payoff can suddenly jump **downwards** (but not upwards).
- A payoff function is **upper semi-continuous** if the payoff can suddenly jump **upwards**.

## Semicontinuous payoff functions

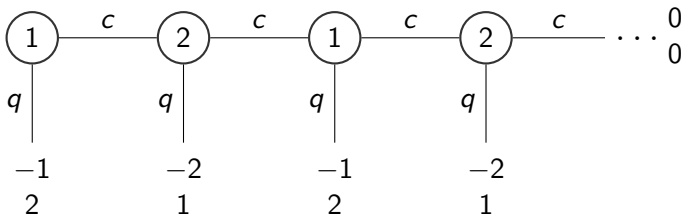
- The function  $u_i$  is **lower semi-continuous** if

$$p_n \rightarrow p \quad \implies \quad \liminf_{n \rightarrow \infty} u_i(p_n) \geq u_i(p).$$

- The function  $u_i$  is **upper semi-continuous** if

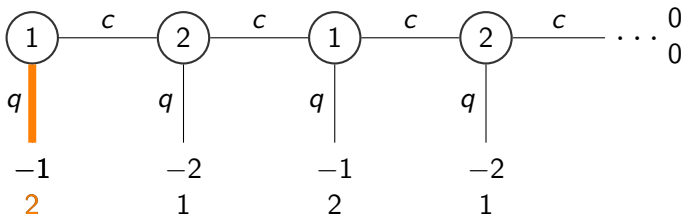
$$p_n \rightarrow p \quad \implies \quad \limsup_{n \rightarrow \infty} u_i(p_n) \leq u_i(p).$$

## Semicontinuous payoff functions



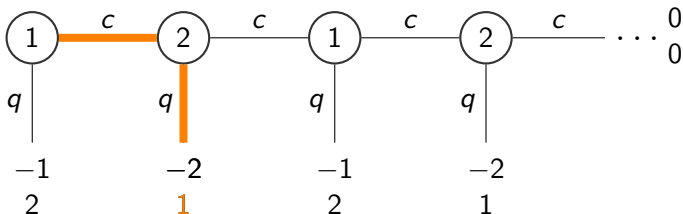
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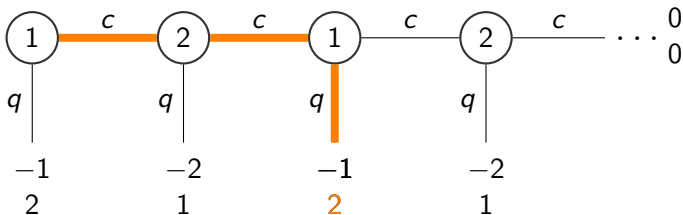
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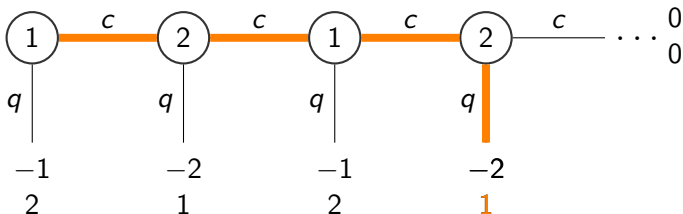


## Semicontinuous payoff functions



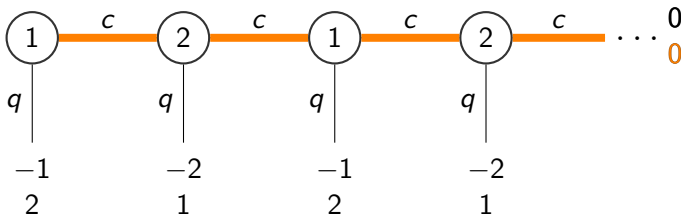
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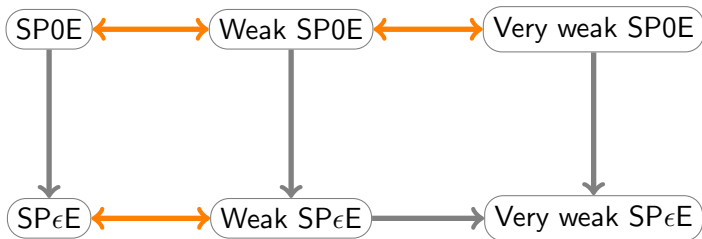
## Semicontinuous payoff functions



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## One-shot deviation principle

**Lemma (One-shot deviation principle):** *If each player's payoff function is bounded and **lower semicontinuous**:*



## One-shot deviation principle

**Corollary (to the existence of weak  $SP_{\epsilon}E$ , Flesch et al [2010], Bruyère et al [2017]):** *Suppose that there are finitely many players, and that each player's payoff function is bounded and lower semicontinuous. Then for each  $\epsilon > 0$  the game admits a  $SP_{\epsilon}E$ .*

## Upper semicontinuous payoffs

**Theorem:** *Suppose that there are finitely many players, and that each player's payoff function is bounded and **lower** semicontinuous. Then for each  $\epsilon > 0$  the game admits a  $SP_{\epsilon}E$ .*

**Theorem (Purves and Sudderth [2011]):** *Suppose that there are finitely many players, and that each player's payoff functions is bounded and **upper** semicontinuous. Then for each  $\epsilon > 0$  the game admits a  $SP_{\epsilon}E$ .*

## Upper semicontinuous payoffs: the proof

- Curiously, the proof of the result for upper semicontinuous payoffs is **essentially different** from that for lower semicontinuous payoffs.
- If  $p$  is any play, then there is a time  $t$  after which  $p$  becomes the best play for everyone.
- Backward induction.

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  - Common preferences at the limit
  - A criterion for existence
  - Infinitely many players
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## Common preferences at the limit

- A generalization/unification of these two results is possible using the concept of common preferences at the limit (**Flesch and P [2016]**).
- The game exhibits **common preferences at the limit** if for any convergent sequence of plays, either
  - each player's payoff jumps downwards,
  - each player's payoff jumps upwards.

## A criterion for preferences that admit SPE

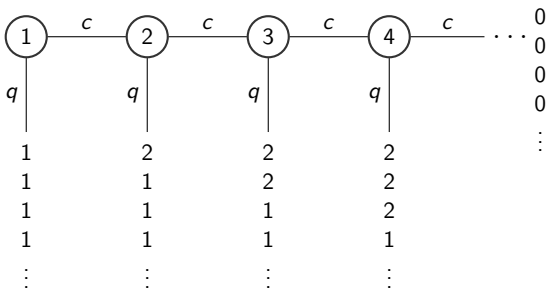
**Theorem (Le Roux [2016]):** Consider some preferences over a set of outcomes. The following are equivalent:

- 1 Any game with the given preferences admits a SPE, provided that the outcomes are assigned to plays in a  $\Delta_2^0$ -measurable fashion.
- 2 There are no two players 1 and 2 and no outcomes  $x$ ,  $y$ , and  $z$  that form a **Solan–Vieille cycle**:

$$z <_1 y <_1 x \text{ and } x <_2 z <_2 y.$$

## Infinitely many players

- Non-existence of **pure** SP $\epsilon$ E in a game with lower semicontinuous functions (**Flesch et al [2010]**):



## Infinitely many players

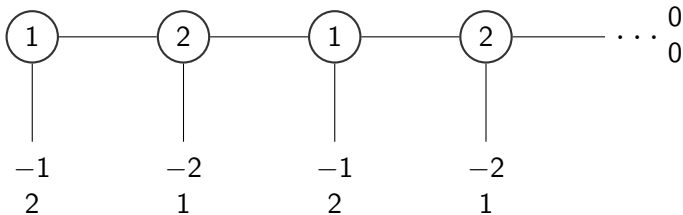
**Theorem (Flesch and P [2017]):** *Suppose that in a game with finitely or **infinitely** many players each player's payoff function is bounded and **upper** semicontinuous. Then for each  $\epsilon > 0$  the game admits a  $SP_{\epsilon}E$ .*

- The proof in Purves and Sudderth [2011] is difficult to extend.
- A transfinite procedure of elimination of plays.
- As a by product: a characterization of subgame perfect plays.

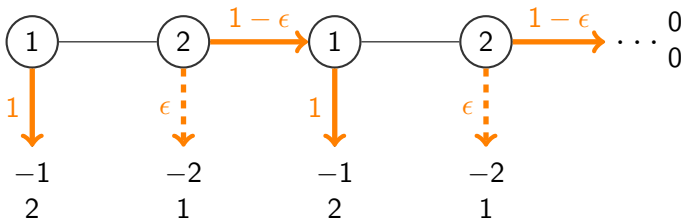
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## Solan Vieille's example: a $SP_{\epsilon}E$ in mixed strategies

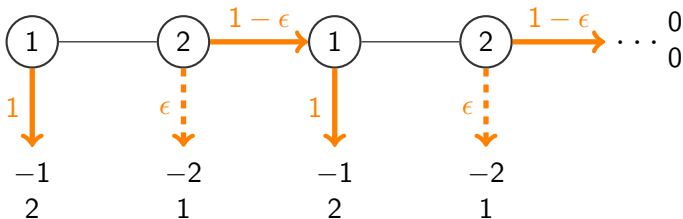


## Solan Vieille's example: a $SP_{\epsilon}E$ in mixed strategies



- Player 1 quits with probability 1, player 2 quits with probability  $\epsilon$ . This works because:
  - Player 1: deviation to "always continue" is not profitable, since then player 2 will stop eventually with probability 1, resulting in the payoff of -2.
  - Player 2: is within  $\epsilon$  of his best possible payoff of 2.

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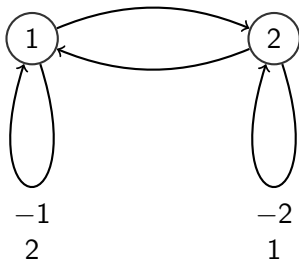


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  - Player 2: is within  $\epsilon$  of his best possible payoff of 2.
- This does not work for  $\epsilon = 0$ .



## Non-existence of $SP_{\epsilon}E$

**Theorem (Flesch, Kuipers, Mashiah–Yaakovi, Schoenmakers, Shmaya, Solan, Vrieze [2014])** *The following game has no  $SP_{\epsilon}E$ , whether in **pure or mixed** strategies:*



The payoffs are

- $(-1, 2)$  if player 2 is active only finitely many times,
- $(-2, 1)$  if player 1 is active only finitely many times,
- $(0, 0)$  if both players are active infinitely many times.

## The main idea behind the non-existence

- The proof of the non-existence is non-trivial. Ultimately it relies on the application of Lèvy's zero-one law.

## Sufficient conditions for $SP_{\epsilon}E$

Positive results are proven for some special classes:

- **Brihaye, Bruyère, De Pril, Gimbert [2012]**: quantitative reachability games.
- **Mashiah-Yaakovi [2014]**: stopping games.
- **Kuipers, Flesch, Schoenmakers, Vrieze [2018]**: recursive perfect information games.
- **Flesch and P [2016]**: games where the set of discontinuity points is sigma-discrete.

## Open questions

- 1 In perfect information games with **chance moves**, is there a weak SP $\epsilon$ E?
- 2 In a game with infinitely many players and lower semicontinuous functions, is there a (mixed) SP $\epsilon$ E?
- 3 Suppose that:
  - for each player  $i$ , the payoff function  $u_i$  only takes finitely many values,
  - for each payoff vector  $v$ , the set  $\{p \in A^{\mathbb{N}} : u(p) = v\}$  is an open set or a closed set.

Is there a (mixed) SP $\epsilon$ E?