## Lazy improvement in sequential games

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Nash equilibrium (stable strategy combo) in a large class of games.

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- 2. Why would players play NE?

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Finite convergence to pure NE in finite sequential games.

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We generalize 2002 for finite and infinite sequential games.

## Finite sequential games



a,b,c are players

x, y, z are outcomes.

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A preference is a binary relation over the outcomes.

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Classical outcome (2,7,4): player *a* gets 2, player *b* gets 7...

Classical preference:  $(0, 2, 1) \prec_{b} (9, 3, 0)$ .

## Strategies and strategy profiles

Double lines represent strategical choices.

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Definition by example

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Game  $\neg NE$  a a  $2,2 \ b$   $2,2 \ b$  $0,0 \ 3,1$   $0,0 \ 3,1$ 

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Definition by example

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Game	$\neg NE$	$\neg NE$	NE	NE
а	а	а	а	а
/ \	/	/ \\	/	/ \
2,2 Ь	<mark>2</mark> ,2 b	2,2 b	2,2 b	2,2 b
/ \	/ \	/	/	/ \
$0, 0 \ 3, 1$	0,0 <mark>3</mark> ,1	0, <mark>0</mark> 3,1	$0, 0 \ 3, 1$	0,0 3,1

1953 Kuhn: all finite sequential games have NE.

1995 Aumann: in some games, some NE correspond to common knowledge of rationality.

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How about the other games?

Definition by example

Game	$\neg NE$	$\neg NE$	NE	NE
а	а	а	а	а
/ \	$\mathbb{Z}$	/ \\	/	/ \
2,2 Ь	<mark>2</mark> ,2 b	2,2 b	2,2 b	2,2 b
/ \	/ \\	/ \	/	/ \
$0, 0 \ 3, 1$	0,0 <mark>3</mark> ,1	0, <mark>0</mark> 3,1	$0, 0 \ 3, 1$	$0, 0 \ 3, 1$

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  - What if some players are not rational?

► For all non-NE, the better-response lets one player improve it.

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## Lazy convertibility

Restricting how players change strategies





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lazy

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#### Lazy convertibility

Restricting how players change strategies



If a player can convert and reach a leaf, she can do so lazily.

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## Theorem (Kukushkin, 2002)

For games with  $\mathbb{R}$ -valued payoffs, LI terminates.

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For games with  $\mathbb{R}$ -valued payoffs, LI terminates.

### Theorem (New)

Consider a game with n nodes.

► If no player has a preference path longer than h, LI terminates within h · n steps.

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The NE are the sinks of lazy improvement (LI).

$$\Rightarrow$$
  $LI \subseteq BR$  so every NE is a sink of  $LI$ .

If a player can improve, she can do it lazily.

#### Theorem (Kukushkin, 2002)

For games with  $\mathbb{R}$ -valued payoffs, LI terminates.

#### Theorem (New)

Consider a game with n nodes.

- ► If no player has a preference path longer than h, LI terminates within h · n steps.
- If a player has no preference path longer than h, she makes less than h · n steps in any LI sequence.



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Which player avoids which outcomes (multiset):

	X	у	z	t
а	1	0	1	3
b	0	2	1	0



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- LI by a player decreases her multiset (wrt her preference).
- $\blacktriangleright$   $\Rightarrow$  self-stabilization of players with acyclic preference.

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1. No probability.



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8. A new proof technique for existence of NE.

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Lazy improvement in infinite sequential games

## Infinite sequential games

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- No leaf: outcomes are attached to infinite paths.
- Strategy and NE are defined as in the finite case.

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## Infinite sequential games



- No leaf: outcomes are attached to infinite paths.
- Strategy and NE are defined as in the finite case.

#### Proposition

If the player preferences are all acyclic, so is lazy improvement.

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The limit of the sequence is its first element.

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The limit of the sequence is its first element.

In the remainder, the game has finite branching, finitely many players, and continuous real-valued payoffs.

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Theorem Lazy  $\epsilon$ -improvement terminates on  $\epsilon$ -NE.

## Deepening lazy improvement

Algorithm:

- 1. n := 1;
- 2. Let s be any strategy profile;
- 3. Repeat  $\{$
- Let the players improve s by lazy convertibility above depth n, until some stable s<sub>n</sub>;

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5. 
$$s := s_n;$$

6.  $n := n + 1; \}$ 

#### Theorem

All accumulation points of  $(s_n)_{n \in \mathbb{N}}$  are NE.

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## Conclusion

Existence of randomized NE (1950) raised two issues: randomization and convergence.

Kukushkin (2002) addressed these issues partially: LI in finite sequential games with  $\mathbb{R}$ -valued payoffs terminates on NE.

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We contributed on

- ► Finite games: termination bounds + self-stablization.
- Infinite games: several directions, assuming continuity, finite branching and number of players.

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A sequence of improvements is fair if the following holds: for all positive reals r, if improvements by more than r are possible infinitely often during the sequence, they also occur infinitely often.

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Open question: are all accumulation points of fair LI NE?

## Ordinal lazy improvement

Algorithm:

- 1. Let s be any strategy profile;
- 2. Repeat {
- 3. Let the players improve s lazily;
- 4. Let s be an accumulation point of the sequence;}

A  $\Delta^0_2$  set is a countable union of closed sets and is also a countable intersection of open sets.

### Proposition

If the players have  $\Delta_2^0$  boolean objectives, the sequence reaches an NE after a countable ordinal of steps.