

# A Game-Theoretic Analysis of Strictly Competitive Multiagent Scenarios

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## Alice, Bob, and Charlie raise hands

- ▶ Alice, Bob, and Charlie simultaneously decide whether to raise their hand or not
- ▶ Number of players that raise their hand is ...
  - ... odd: Alice wins
  - ... even and positive: Bob wins
  - ... zero: Charlie wins
- ▶ What should Alice do?

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3	1
1	2

1	2
2	1

# Outline

Ranking Games

Nash Equilibria in Ranking Games

Comparative Ratios: Nash Equilibria, Maximin Strategies, and Correlated Equilibria

Conclusions

# Ranking Games

- ▶ A class of strategic (*i.e.*, normal-form) games
- ▶ A model for *strictly competitive multi-agent* situations
  - ▶ Parlor games
  - ▶ Competitive economic scenarios
  - ▶ Social choice settings
  - ▶ ...
- ▶ Outcomes identified with rankings of the players
- ▶ Agents have preferences over ranks such that
  - ▶ higher ranks are weakly preferred
  - ▶ being first is strictly preferred over being last
  - ▶ agents are indifferent w.r.t. other agents' ranks

## Ranking Games (More Formally)

- ▶ Definition: The *rank payoff* of player  $i$  is defined as a vector  $r_i = (r_i^1, r_i^2, \dots, r_i^n)$  such that
  - ▶  $r_i^k \geq r_i^{k+1}$  for all  $1 \leq k \leq n - 1$  and
  - ▶  $r_i^1 > r_i^n$
- ▶ For convenience,  $r_i^1 = 1$  and  $r_i^n = 0$
- ▶ Definition: A *ranking game* is a game where for any strategy profile  $s \in S$  there is a permutation  $(\pi_1, \pi_2, \dots, \pi_n)$  of the players such that the payoff  $p_i(s) = r_i^{\pi_i}$  for each player  $i \in N$

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- ▶ *Binary* ranking games:  $r_i^k \in \{0, 1\}$  for all  $i, k$
- ▶ *Single-winner* games:  $r_i = (1, 0, \dots, 0)$  for all  $i$

# Nash Equilibria in Ranking Games

3	1
1	2

1	2
2	1

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- ▶ Nash equilibrium: strategies are mutual best responses to each other
- ▶ Often very weak in ranking games (pure ones in particular)
- ▶ Quasi-strict Nash equilibrium (Harsanyi, 1973): every best response is played with positive probability

## Nash Equilibria in Ranking Games

- ▶ Do all ranking games possess quasi-strict equilibria?

# Nash Equilibria in Ranking Games

- Do all ranking games possess quasi-strict equilibria? **No**

2	1
1	2

  

3	1
1	1

The second table illustrates a ranking game where the top-right and bottom-left cells (both containing '1') are highlighted with red dashed boxes, indicating they are part of a set of best responses for both players.

## Nash Equilibria in Ranking Games

- ▶ Do all ranking games possess quasi-strict equilibria? **No**

2	1	3	1
1	2	1	1

The second table has red dashed boxes around the '1' in the top-right cell, the '1' in the bottom-left cell, and the '1' in the bottom-right cell.

- ▶ It seems as if all *single-winner* games possess a *non-pure* equilibrium. Proven for:
  - ▶ Two-player ranking games (using a result by Norde, 1999)
  - ▶  $2 \times 2 \times 2$  single-winner games (nice combinatorial argument)
  - ▶ Single-winner games where at least two players have a positive security level

# The Price of Cautiousness

3	1
1	2

1	2
2	1

- ▶ Nash equilibrium, quasi-strict Nash equilibrium

# The Price of Cautiousness

$\frac{1}{2}$	3	1
$\frac{1}{2}$	1	2

1	2
2	1

- ▶ Nash equilibrium, quasi-strict Nash equilibrium
- ▶ Security level (maximin): guaranteed minimum payoff

# The Price of Cautiousness

3	1
1	2

1	2
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- ▶ Nash equilibrium, quasi-strict Nash equilibrium
- ▶ Security level (maximin): guaranteed minimum payoff
- ▶ How much worse can a player be off when playing maximin instead of a Nash equilibrium?
- ▶ Price of cautiousness: Ratio between minimum payoff in a Nash equilibrium and (strictly positive) security level

## The Price of Cautiousness in Ranking Games

Consider a game with at least 3 players, a player with  $k$  actions and strictly positive security level

- ▶ General ranking games: unbounded (involves taking limits)
- ▶ Binary ranking games:  $k$  (also w.r.t. quasi-strict equilibria)
  - ▶ Positive security level, hence for every opponent action profile there is some action that guarantees positive payoff, *i.e.*, payoff 1 in binary ranking games
  - ▶ Randomization over all  $k$  actions guarantees payoff  $1/k$

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  - ▶ Randomization over all  $k$  actions guarantees payoff  $1/k$
  - ▶ Lower bound

$\frac{1}{2}$	2	1		3	1
$\frac{1}{2}$	1	2		1	1

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- ▶ Single-winner games, w.r.t. quasi-strict equilibria:  $k - 1$

# The Value of Correlation

3	1
1	2

1	2
2	1

- ▶ Correlated equilibrium: actions drawn according to joint distribution, no player can gain by deviating

# The Value of Correlation

3	1	1	2
1	2	2	1

- ▶ Correlated equilibrium: actions drawn according to joint distribution, no player can gain by deviating
- ▶ Value of correlation (Ashlagi et al., 2005): By how much can correlation improve *social welfare*?
  - ▶ Mediation value: Ratio between maximum social welfare in correlated vs. Nash equilibrium
  - ▶ Enforcement value: Ratio of maximum social welfare in any outcome vs. correlated equilibrium

# The Value of Correlation in Ranking Games

Consider a game with  $n$  players

- ▶ Symmetric rank payoffs: identical social welfare in every outcome, both mediation and enforcement value are 1
- ▶ Mediation value:  $n - 1$ 
  - ▶ Upper bound is trivial
  - ▶ Lower bound

(1, 1, 0)	(1, 0, 0)
(0, 1, 0)	(0, 1, 1)

(0, 1, 1)	(0, 1, 0)
(1, 0, 0)	(1, 1, 0)

(1, 0, 0)	(0, 0, 1)
(0, 0, 1)	(1, 0, 0)

- ▶ Enforcement value:  $n - 1$

## Conclusions

- ▶ Ranking games: a model for *strict competitiveness* in the *multi-agent* case
- ▶ Nash equilibrium solutions: often very weak
- ▶ Maximin
  - ▶ Guarantees a certain payoff against indifferent (even irrational) opponents
  - ▶ Limited price of cautiousness (if there are few actions)
- ▶ Correlated equilibrium
  - ▶ Substantial increase in social welfare possible in scenarios with many players and asymmetric preferences over ranks
- ▶ Computational aspect
  - ▶ Maximin strategies and correlated equilibria computable in polynomial time
  - ▶ Nash equilibria just as hard to compute as in general games (Brandt et al., 2006)

Thank you for your attention!