

Complexity Results for Some Classes of Strategic Games

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Outline

1. Problem: Games, Solutions, and Complexity
2. Results: An Overview
3. Example: Pure Nash Equilibria of Anonymous Games

Game Theory

- ▶ A mathematical theory of strategic interaction
- ▶ John von Neumann, Oskar Morgenstern: Theory of Games and Economic Behavior (1944)
- ▶ Non-cooperative game theory
 - ▶ Different outcomes depending on choices of several individuals (players)
 - ▶ Disagreement about quality of the outcomes
- ▶ Applications in economics, political science, biology, . . .
- ▶ In computer science: analysis of electronic markets, the Internet, social networks, . . .

Normal-form Games

- ▶ Normal-form game $\Gamma = (N, (A_i)_{i \in N}, (p_i)_{i \in N})$

- ▶ N a (finite) set of *players*

- ▶ A_i a (finite) set of *actions* for player i

- ▶ $p_i : \prod_{j \in N} A_j \rightarrow \mathbb{R}$ a *payoff function* for player i

	O	F
O	(2, 1)	(0, 0)
F	(0, 0)	(1, 2)

- ▶ Rational players: maximize their own payoff
- ▶ Strategy of player i : probability distribution $s_i \in S_i = \Delta(A_i)$
- ▶ Strategy profile: vector $s \in S = \prod_{j \in N} S_j$ of strategies

From Games to Solutions

- ▶ Solution concepts single out “interesting” strategy profiles
- ▶ Nash equilibrium: profile of strategies that are mutual best responses
- ▶ Formally: $s \in S$ such that for all $i \in N$, $a \in A_i$, $p_i(s) \geq p_i(s_{-i}, a)$

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	<i>H</i>	<i>T</i>
<i>H</i>	(1, -1)	(-1, 1)
<i>T</i>	(-1, 1)	(1, -1)

- ▶ Existence guaranteed (Nash, 1950); not so for *pure* equilibrium

Towards Algorithmic Game Theory

- ▶ Nobel laureate Robert Aumann: “A solution concept must be calculable, otherwise you are not going to use it.”
- ▶ Still, computational complexity of finding solutions has received fairly little attention in traditional game theory
- ▶ Possible reason: the right tools were missing

Towards Algorithmic Game Theory

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- ▶ Still, computational complexity of finding solutions has received fairly little attention in traditional game theory
- ▶ Possible reason: the right tools were missing
- ▶ Computational complexity theory
 - ▶ Classes of problems with similar resource requirements
 - ▶ P (efficiently solvable) vs. NP (efficiently verifiable)
 - ▶ NP-hard: not in P if $P \neq NP$

The Complexity of Nash Equilibrium

- ▶ Pure Nash equilibrium: decision problem
 - ▶ decidable by enumeration of action profiles, complexity depends on *representation*
 - ▶ in P when games are given explicitly
 - ▶ potentially NP-hard given succinct description of games with many players
- ▶ Nash equilibrium: search problem, solution guaranteed to exist
 - ▶ PPAD-complete, even for $|N| = 2$ (Chen and Deng, 2005)
 - ▶ known algorithms (*e.g.*, Lemke's algorithm) have exponential worst-case running time

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- ▶ Maybe real-world games are not “general”
- ▶ Evidence: number of outcomes in general games may be exponential in $|N|$, even if $|A| = 2$
- ▶ Could not even be *played* efficiently

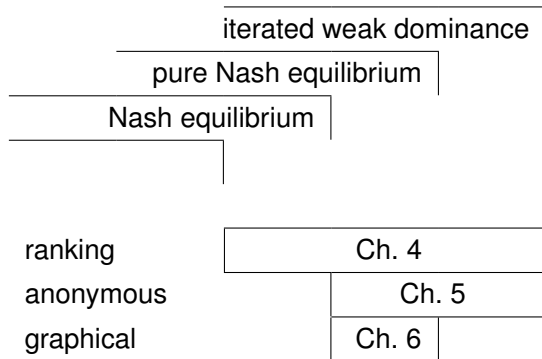
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- ▶ Maybe real-world games are not “general”
- ▶ Evidence: number of outcomes in general games may be exponential in $|N|$, even if $|A| = 2$
- ▶ Could not even be *played* efficiently
- ▶ Consider restricted classes of (multi-player) games with properties found in the real world

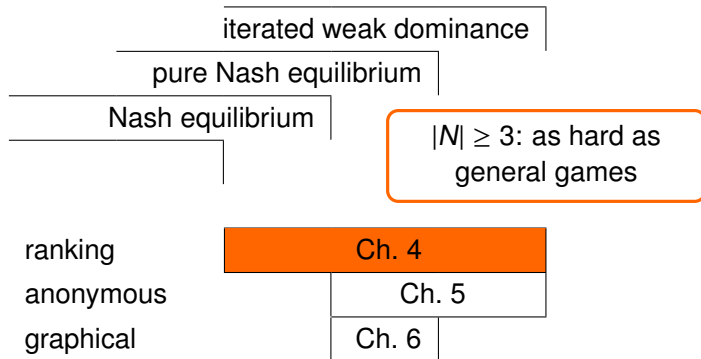
Some Classes of Strategic Games

- ▶ Ranking Games
 - ▶ outcomes are rankings of the players
 - ▶ only performance *relative to the others* matters
 - ▶ examples: parlor games, economic scenarios
- ▶ Anonymous Games
 - ▶ other players are similar, cannot be distinguished
 - ▶ payoff only depends on *how many* of them play each action
 - ▶ example: large open systems (e.g., the Internet)
- ▶ Graphical Games
 - ▶ payoff depends only on players in a local neighborhood
 - ▶ examples: networks (computer or social)

Overview of Results

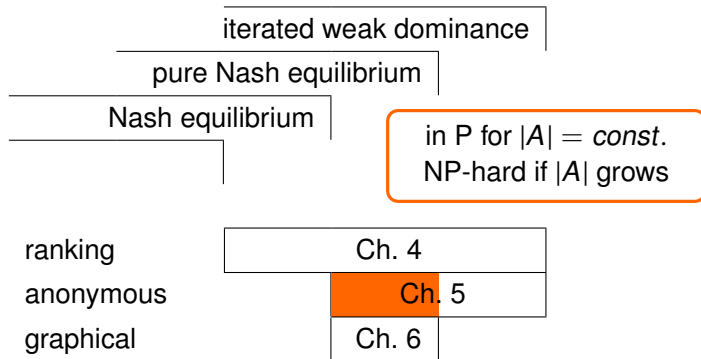


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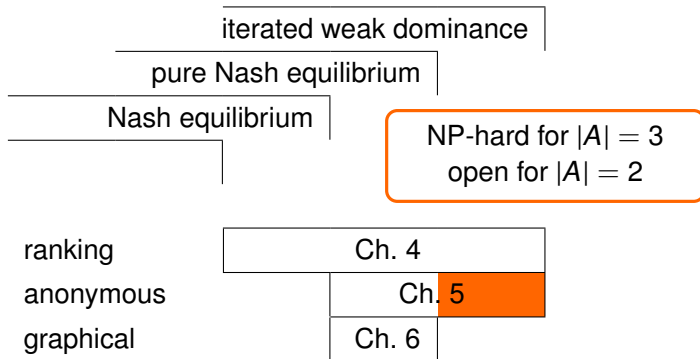
Brandt, Fischer, Harrenstein, Shoham: *Ranking Games*, Artificial Intelligence, 2009 (also 21st AAAI, 2006, and 20th IJCAI, 2007)

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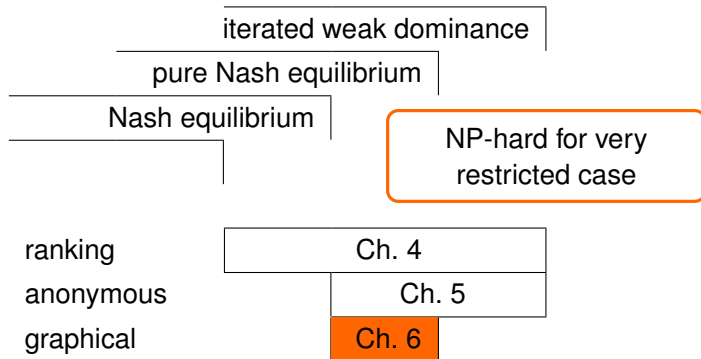
Brandt, Fischer, Holzer: *Symmetries and the complexity of pure Nash equilibrium*, JCSS, 2009 (also 24th STACS, 2007)

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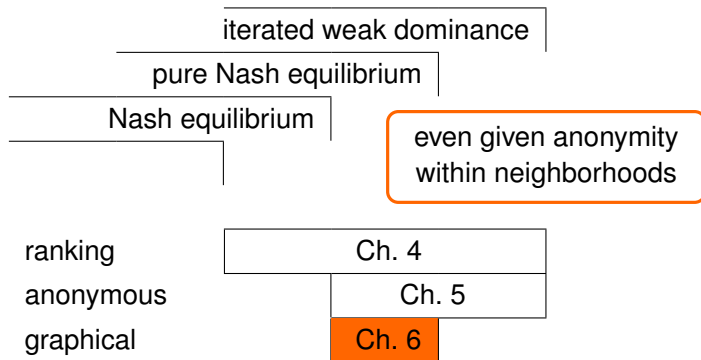
Brandt, Fischer, Holzer: *On iterated dominance, matrix elimination, and matched paths*, 2008

Overview of Results



Fischer, Holzer, Katzenbeisser: *The influence of neighbourhood and choice on the complexity of finding pure Nash equilibria*, IPL, 2006

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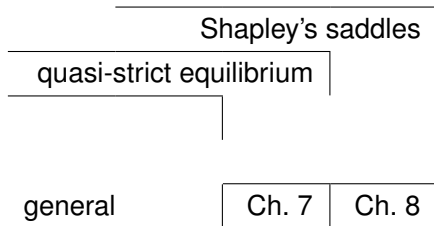
Brandt, Fischer, Holzer: *Equilibria of graphical games with symmetries*, 4th WINE, 2008

Two More Solution Concepts

- ▶ Nash equilibrium commonly criticized
- ▶ Indifference between actions played and not played
- ▶ Requires randomization (with irrational weights if $|N| \geq 3$)

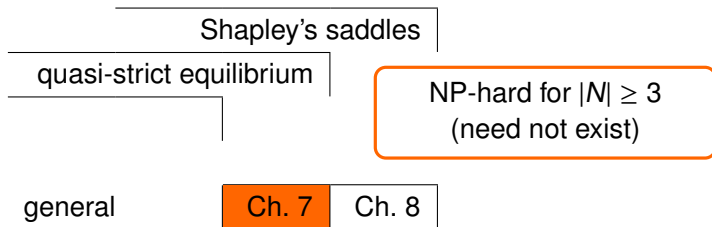
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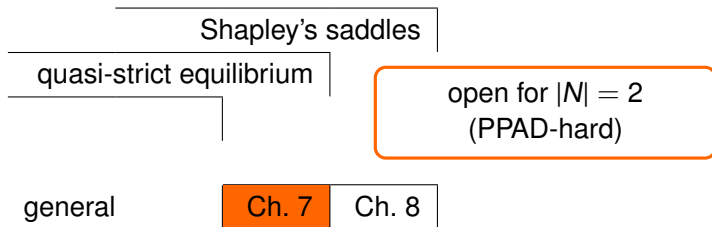
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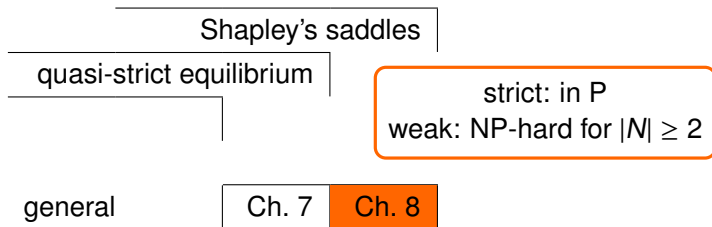
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Brandt, Brill, Fischer, Harrenstein: *Computational aspects of Shapley's saddles*, 8th AAMAS, 2009

Anonymous Games

- ▶ No distinction between other players
- ▶ All players have same set A of actions
- ▶ Payoff determined by
 - ▶ own action
 - ▶ number of other players playing each action
- ▶ Useful concept: *commutative image* of action profile s

$$\#(s) = (|\{i \in N \mid s_i = a\}|)_{a \in A}$$

An Example

$$p_1: \begin{array}{cccc} & 0 & 1 & 2 \\ \hline 0 & 0 & 0 & 0 \\ 1 & 1 & 0 & 1 \\ \hline \end{array}$$
$$p_2: \begin{array}{cccc} & 0 & 1 & 2 \\ \hline 0 & 1 & 1 & 1 \\ 1 & 0 & 0 & 0 \\ \hline \end{array}$$
$$p_3: \begin{array}{cccc} & 0 & 1 & 2 \\ \hline 0 & 1 & 1 & 0 \\ 1 & 0 & 0 & 1 \\ \hline \end{array}$$

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- ▶ Equilibrium property not determined by commutative image

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Pure Nash Equilibria of Anonymous Games

Theorem: In anonymous games with a constant number of actions, existence of a pure Nash equilibrium can be decided in polynomial time.

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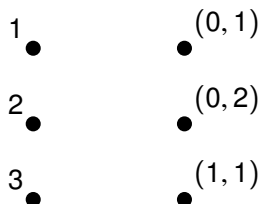
Proof: by reduction to perfect matchings of a bipartite graph

- ▶ Fix a commutative image x (only polynomially many)
- ▶ Left side of the graph: players
- ▶ Right side: actions with multiplicities according to x
- ▶ Edge to (all copies of) action if it is *potential* best response
- ▶ Claim: perfect matchings correspond to pure equilibria

Pure Nash Equilibria of Anonymous Games

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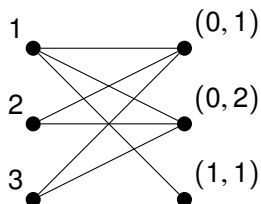
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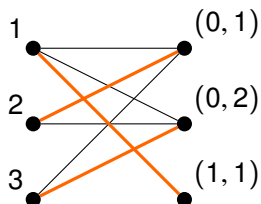
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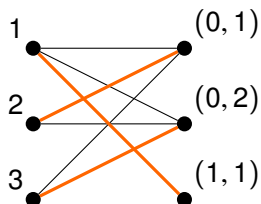
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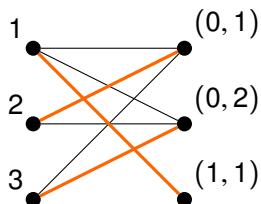
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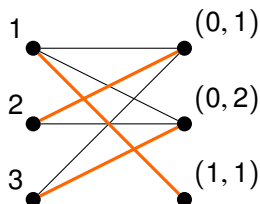
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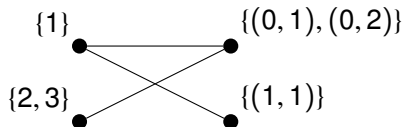
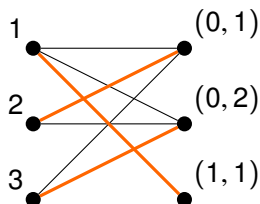
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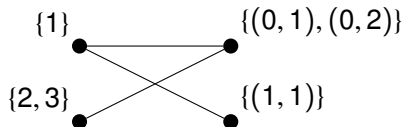
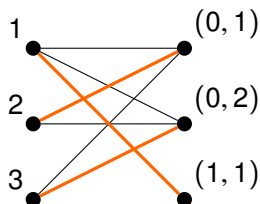
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- ▶ Collapse nodes with same neighborhood
- ▶ Graph of constant size, condition can be checked in $TC^0 \subseteq NL$



We Have Only Just Begun

- ▶ Most interesting open problems:
 - ▶ quasi-strict equilibria of 2-player games
 - ▶ iterated weak dominance in 2-action anonymous games
- ▶ Quasi-strict equilibria and Shapley's saddles in restricted classes of games
- ▶ More restricted classes of games

Brandt, Brill, Fischer, Harrenstein: *On the complexity of iterated weak dominance in constant-sum games*, 2nd SAGT, 2009

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