# Nash Equilibria in Concurrent Priced Games

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### Battle of the Sexes



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	$\mathbf{F}$	O
$\mathbf{F}$	(1,2)	(4,4)
O	(6,6)	(2,1)

#### Game Characterization

- games on finite graphs with reachability objectives
- turn-based vs. concurrent
  - players take turns vs. take actions simultaneously
  - turn-based can be modelled by concurrent games
- zero-sum vs. non-zero-sum
  - opposite vs. independent objectives
- qualitative vs. quantitative
  - binary objectives vs. payoffs or costs
- object of study
  - who has a winning strategy vs. (pure) Nash equilibria

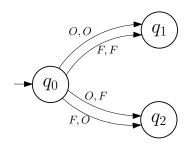
#### Overview

Priced Concurrent Game Structures Nash Equilibria

Algorithm for finding Nash equilibria

3 Complexity results

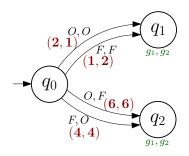
#### Concurrent Game Structure



#### **Concurrent Game Structure**

- K players, set of moves  $\mathbb{M}$
- transition function  $\delta: Q \times \mathbb{M}^K \to Q$
- ullet  $\delta$  total and deterministic for enabled moves
- a computation is a finite or infinite word over  $\mathbb{M}^K$

#### Priced Concurrent Game Structure



#### **Priced Concurrent Game Structure (PCGS)**

- *K*-tuples of nonnegative *prices* on transitions
- goal states (independent for each player)

### **Preliminaries**

#### Strategy

- $(\mathbb{M}^K)^* \to \mathbb{M}$
- history-dependent strategies, observing history of moves

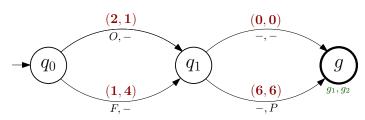
#### Strategy profile

• a strategy profile is a K-tuple of strategies (one for each player)

#### Cost

- $(\mathbb{M}^K)^* \times \{1 \dots K\} \to \mathbb{N} \cup \infty$
- cumulative price of transitions until the first goal state of the player
- ullet if there is no goal state, the cost is  $\infty$

# Example

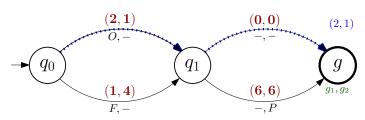


Strategy examples:

$$f_O(\Lambda) = \begin{cases} O & \text{if } \Lambda = \epsilon \\ - & \text{otherwise} \end{cases} \qquad g_P(\Lambda) = \begin{cases} P & \text{if } \Lambda = (F, -) \\ - & \text{otherwise} \end{cases}$$

$$f_F(\Lambda) = \begin{cases} F & \text{if } \Lambda = \epsilon \\ - & \text{otherwise} \end{cases} \qquad g_U(\Lambda) = \begin{cases} - & \text{always} \end{cases}$$

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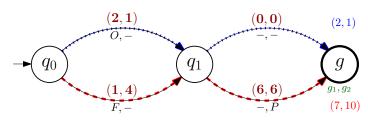
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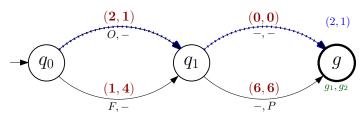
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the outcome of  $(f_O, g_P)$  is (O, -)(-, -) with costs **(2,1)** the outcome of  $(f_F, g_P)$  is (F, -)(-, P) with costs **(7,10)** 

# Nash Equilibrium

- a stable strategy profile: no player can lower her cost by changing her strategy
- not necessarily optimal
- may not exist, or there can be more

- bounds vector  $\mathbb{B} \in (\mathbb{N} \cup \infty)^K$
- ullet the decision problem: is there a Nash equilibrium satisfying bounds  $\mathbb B?$
- ullet main problem: find all Nash equilibria satisfying bounds  ${\mathbb B}$

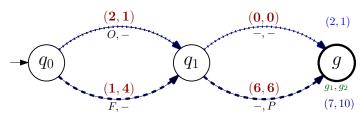


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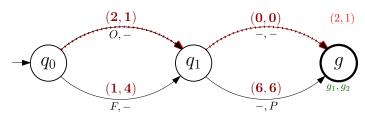
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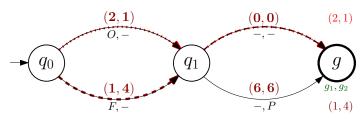


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# Algorithm Overview

#### How to represent equilibria?

- strategies are infinite how to represent and characterize them?
- outcomes of all equilibria form an  $\omega$ -regular set
- we represent those outcomes by a Büchi automaton

#### Outcomes are as good as strategies!

for each equilibrium outcome, we can find a strategy profile

#### Construction outline

- 1 we calculate temptation and punishment values for the game
- 2 we construct a Büchi automaton accepting outcomes of Nash equilibria

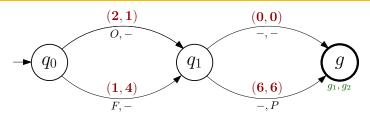
# Temptation and Punishment

#### Why an outcome is not an equilibrium?

• a player betrays if she can do better - temptation

#### How to help players resist the temptation?

- strategies of other players try to make this payoff worse punishment
- the punishment is announced in advance and its role is prevention
- strategies can start punishing one step after the defecting step

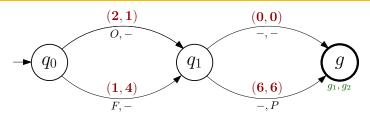


### Punishment - $\pi: Q \times \{1 \dots K\} \to \mathbb{N} \cup \infty$

Given a state and a defecting player, punishment  $\pi$  is the worst cost the remaining players can enforce for her.

# Temptation - $\tau: Q \times \mathbb{M}^K \times \{1 \dots K\} \to \mathbb{N} \cup \infty$

Given a move vector from a state and a player,  $temptation \tau$  for that player is the best cost she can achieve if she defects and chooses another move.



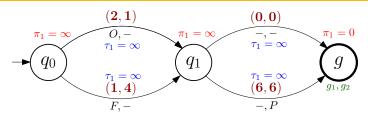
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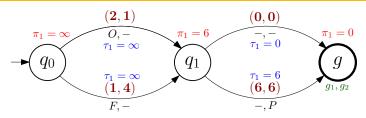
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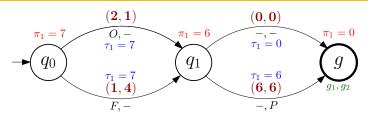
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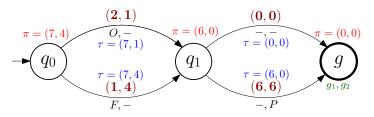
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### **Equilibrium Automaton**

#### Local bounds construction

- with each state, we remember the remaining possible costs
- transitions reduce these costs with their costs and temptations

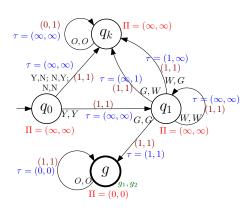
#### Büchi automaton

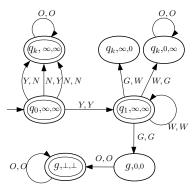
- accepting all equilibria outcomes
- number of states might be exponential

#### From equilibrium outcomes to strategy profiles

- strategies follow the outcome until someone betrays
- · if that happens everybody starts only punishing

# **Equilibrium Automaton Example**





# Complexity of the Decision Variant

#### Recall the decision problem:

• Is there a Nash equilibrium satisfying bounds?

#### We prove that the decision problem is NP-complete

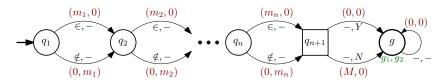
- in NP: Guessing an accepting lasso of polynomial length
- NP-hardness: Reduction from the subset sum problem

#### turn-based PCGS without bounds

a Nash equilibrium always exists

#### NP-hardness

- Reduction from the subset sum problem.
- For input instance  $(\{m_1...m_n\}, m)$  of the Subset sum problem, construct *two-player turn-based* game:

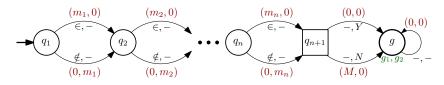


#### Lemma

There is a Nash Equilibrium satisfying the bounds (m, M-m) if and only if there is a solution to the subset sum problem.  $(M=\sum m_i)$ 

#### NP-hardness

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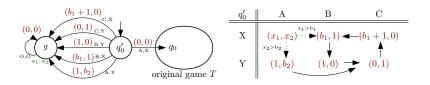
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- Player 1 In  $q_i$ , choose  $\in$  if  $m_i \in S'$ , otherwise choose  $\notin$ .
- Player 2 In  $q_{n+1}$ , choose Y if the accumulated costs so far are (m, M m), otherwise choose N.

# **Omitting Bounds**

- we reduce the decision problem with bounds to the problem with no bounds
- for two-player PCGS and bounds  $(b_1, b_2)$ , construct new PCGS



- equilibria satisfying the bounds are preserved
- equilibria not satisfying the bounds are suppressed by added edges
- ullet no new added edge from  $q_0'$  to g is a part of an equilibrium outcome

# Complexity overview

Complexity results for the problem of deciding an existence of Nash equilibrium:

- ullet PCGS and with/without bounds  $\in$  NP
- $\bullet$  Subset sum  $\leq$  Two-player turn-based games with bounds  $\leq$  PCGS with bounds
- ullet Two-player PCGS with bounds  $\leq$  PCGS without bounds

	full PCGS	turn-based
with bounds	NP-complete	NP-complete
without bounds	NP-complete	Trivial

#### Conclusion

- Priced CGS with individual reachability objectives
  - Non-negative integer prices on transitions for each player
  - Cost for a player is accumulated sum of prices before reaching their goal state
- 2 Characterization of Nash Equilibria in PCGS
  - ullet Set of Nash equilibrium outcomes is  $\omega$ -regular language
  - We can extract strategies for these outcomes
- 3 Complexity of the decision variant of the problem
  - NP-complete problem
- 4 Ideas for future work
  - Mixed (probabilistic) strategies
  - Partial observability
  - Negative costs