# PURE NASH EQUILIBRIA IN ONLINE FAIR DIVISION

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In online fair division, items arrive one by one and are allocated to agents via two simple mechanisms: LIKE and BALANCED LIKE. We study pure Nash equilibria of these two mechanisms.

## Model and mechanisms

Allocation Instance I: agents  $a_1$  to  $a_n$ , indivisible items  $o_1$  to  $o_m$ , utility  $u_{ii} \in \mathbb{Q}^{\geq 0}$ for each  $a_i$  and  $o_i$ , ordering  $o = (o_1, \ldots, o_m)$  and mechanism M

**Setting:** At moment *j*, item  $o_i$  arrives according to *o*, each  $a_i$  reports (or *bids*) a value  $v_{ij} \in \mathbb{Q}^{\geq 0}$  for  $o_j$  and M allocates  $o_j$  to an agent that is considered *feasible*.

Let  $\pi_i$  be an allocation of  $o_1$  to  $o_{i-1}$ . Given  $\pi_i$ , the probability  $p_i(o_i)$  of agent  $a_i$ for item  $o_j$  is  $\frac{1}{n_i}$  where  $n_j$  is the number of feasible agents.

The LIKE mechanism: given  $\pi_i$ , agent  $a_i$  is feasible for  $o_i$  if  $v_{ij} > 0$ . The BALANCED LIKE mechanism: given  $\pi_i$ , agent  $a_i$  is feasible for  $o_i$  if  $v_{ii} > 0$ and has received fewest items in  $\pi_i$  among those agents with positive bids for  $o_i$ .

# **Strategy-proofness**

**Online Strategy-Proofness**: For each round *j* and  $\pi_i$ , no agent  $a_i$  can increase their outcome of  $u_i(\pi_i) + p_i(o_j) \cdot u_{ij}$  supposing  $\pi_j$  is *fixed* and **no** information about future items is known.

**Strategy-Proofness**: For each round *j* and  $\pi_i$ , no agent  $a_i$  can increase their outcome of  $u_i(\pi_j) + \sum_{k=j}^m p_i(o_k) \cdot u_{ik}$  supposing  $\pi_j$  is *fixed* and all information about future items is known.

**Online Group Strategy-Proofness**: For each round *j* and  $\pi_i$ , no group *G* can increase

# **Computing equilibria**

(Online) Group Pure Nash Equilibrium Input: instance I, mechanism  $\mathcal{M}$  and groups  $G_1, \ldots, G_k$ Output: a (online) group pure Nash equilibrium of  $\mathcal{A}$  with  $\mathcal{M}$ 

**Theorem 1**: With the BALANCED LIKE mechanism and 0/1 utilities, computing (online) PNE is in NP-hard.

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Unique weak PNE [3].	Unique strict PNE [3].					
$O O_1 O_2$	<i>o o</i> <sub>1</sub> <i>o</i> <sub>2</sub> <i>o</i> <sub>3</sub>					
$\frac{a_1 a_1}{a_1} \frac{1}{2}$	$a_1   1   1   1$					
$\begin{vmatrix} a_1 \\ a_2 \end{vmatrix} \begin{vmatrix} a_2 \\ 2 \end{vmatrix} \begin{pmatrix} a_1 \\ a_2 \end{vmatrix}$	$a_2 0 1 0$					
	a3 1 0 1					

**Proof main steps:** 

1. Deciding if an agent receives an item with > 0 probability is NP-hard [1].

2. Computing a weak (strict) PNE is at least as hard as deciding if an agent gets an item with 0 (> 0) expected probability.

**Theorem 2**: With the LIKE mechanism and general utilities, computing (online) GPNE is in P.

**Proof main steps**: We present a simple iterative algorithm in which agents commit to their optimal strategies at earliest iterations.

their outcome of  $\sum_{a_i \in G} u_i(\pi_j) + p_i(o_j) \cdot u_{ij}$  supposing past bids are *fixed* and no information about future items is known.

**Group Strategy-Proofness**: For each round *j* and  $\pi_i$ , no group *G* can increase their outcome of  $\sum_{a_i \in G} u_i(\pi_j) + \sum_{a_i \in G} p_i(o_j) \cdot u_{ij}$  supposing past bids are *fixed* and all information about future items is known.

**Example (Online vs offline strategic behavior):** Agents  $a_1, a_2$ , items  $o_1, o_2$ , utilities  $u_{11} = 1, u_{12} = 2, u_{21} = 2, u_{22} = 1, o = (o_1, o_2)$  and BALANCED LIKE.

 $\begin{array}{c|c} o & o_1 & o_2 \\ \hline a_1 & 1 & 2 \end{array}$ *a*<sub>2</sub> 2 1

1. With knowledge of  $o_1$  and  $o_2$ ,  $a_1$  increases their outcome from  $\frac{3}{2}$  to 2 if they bid strategically 0 for  $o_1$ .

2. With knowledge of  $o_1$  only, each agent bids their sincere utility for  $o_1$ .

mechanism	SP	OSP	GSP	OGSP					
	general utilities								
Like	$\checkmark$	$\checkmark$	X	Х					
BALANCED LIKE	Х	$\checkmark$	Х	Х					
	binary utilities								
Like	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$					
BALANCED LIKE	×	$\checkmark$	×	$\checkmark$					

Table 1: Axiomatic results.

## Pure Nash equilibria

#### 1. For each item $o_i$ ,

For each group  $G_i$  with an agent whose strategy for  $o_j$  is not computed, compute the set  $S \subseteq G_l$  of agents that maximize  $\frac{\sum_{a_i \in S} u_{ij}}{|S| + r_{il}}$ .

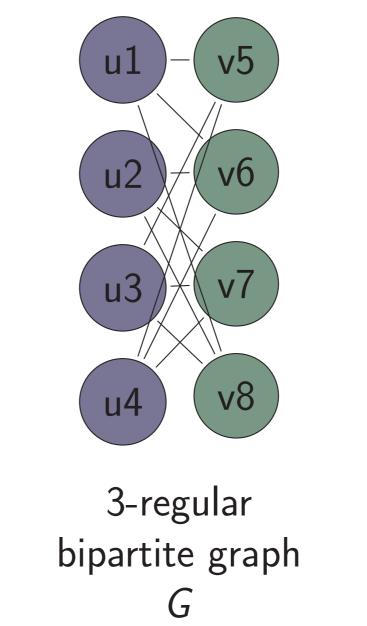
2. The computed profile for  $o_i$  and  $G_1, \ldots, G_k$  is a (online) GPNE.

3. The collection of computed (online) GPNE for items  $o_1$  to  $o_m$  is a (online) GPNE because LIKE is Markovian.

# **Counting equilibria** [2]

#(Online) Group Pure Nash Equilibrium
Input: instance I, mechanism $\mathcal{M}$ and groups $G_1, \ldots, G_k$
Output: number of (online) GPNE of ${\mathcal A}$ with ${\mathcal M}$

### **Theorem 3**: With the BALANCED LIKE mechanism and 0/1 utilities, counting (online) GPNE is in #P-hard.



 $o v_1 v_2 v_3 v_4 a_1 b_1 a_2 b_2 a_3 b_3 a_4 b_4$ 0 0 0 1 1 0 0 0 0 0 0 0 1 0 0 1 1 0 0 0 0 0 0 0 0 1 1 1 0 0 0 0 0 0 1 0 0 0 0 1 1 0 0 0 0 $u_2^2 \ 0 \ 0 \ \mathbf{1} \ 0 \ 0 \ \mathbf{1} \ \mathbf{1} \ 0 \ 0 \ \mathbf{0}$ 

**Group PNE**: For each  $j, \pi_i$ , no group G of agents has an incentive to misreport their bids for  $o_j$  to  $o_m$  and increase  $\sum_{a_i \in G} u_i(\pi_j) + \sum_{a_i \in G} \sum_{k=i}^m p_i(o_k) \cdot v_{ik}$  supposing all bids of agents of all other groups are fixed.

**Online Group PNE**: For each  $j, \pi_i$ , no group G of agents has an incentive to misreport their bids for  $o_j$  and increase  $\sum_{a_i \in G} u_i(\pi_j) + \sum_{a_i \in G} p_i(o_j) \cdot v_{ij}$  supposing all bids of agents of all other groups are fixed.

**Note:** Competitive PNE and Online PNE suppose each agent is in a group alone.

$u_2$	U	U	U	L	U	U	1	L	U	U	U	U	
$u_{3}^{1}$	1	0	0	0	0	0	0	0	1	1	0	0	
$u_{3}^{2}$	0	0	1	0	0	0	0	0	1	1	0	0	
$u_{3}^{3}$													
$u_4^1$													
$u_4^2$	0	1	0	0	0	0	0	0	0	0	1	1	
$u_{4}^{3}$													

#### instance $I_G$

**Theorem 4**: With the LIKE mechanism and general utilities, counting (online) GPNE is in #P-hard.

#### FOR FURTHER INFORMATION

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