The power of mediators: Price of anarchy and stability in Bayesian games with submodular social welfare

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Resources chosen by multiple players are partitioned in a prespecified way



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Resources chosen by multiple players are partitioned in a prespecified way

Example: 💿 is prioritized over 🧕



No player can benefit from deviations ⊲介

Worst **Nash equilibrium** = 1



Resources chosen by multiple players are partitioned in a prespecified way

Example: 😨 is prioritized over 👮



Optimal social welfare = 2



Resources chosen by multiple players are partitioned in a prespecified way Example: o is prioritized over oNo player can benefit from deviations  $\triangleleft \textcircled{o}$ PoA :=  $\frac{\text{Worst Nash equilibrium}}{\text{Optimal social welfare}} = \frac{1}{2}$ 



Resources chosen by multiple players are partitioned in a prespecified way Example: o is prioritized over oNo player can benefit from deviations  $\triangleleft \textcircled{o}$ PoA  $\coloneqq \frac{\text{Worst Nash equilibrium}}{\text{Optimal social welfare}} = \frac{1}{2}$ 

## Theorem [Vetta 2002]

 $\mathrm{PoA} \geq 0.5$  in any valid utility game

# Example of valid utility games

# How good or bad social welfare can be achieved by mediators



Q



# Example of valid utility games

# How good or bad social welfare can be achieved by mediators



Q

A mediator 🤮 sends recommendations ( 🧝 realizes correlated equilibrium)



# Example of valid utility games





## **Theorem** [Roughgarden 2015]

 $PoA \ge 0.5$  in any valid utility game for **correlated equilibria** 

The set of actions for each player changes depending on their type



Q How do mediators 🤬 work in Bayesian games?

The set of actions for each player changes depending on their type





## The set of actions for each player changes depending on their type





# Various Bayes correlated equilibria [Forges'93] 5/ 23

Bayes correlated equilibria (= correlated eq. in Bayesian games) have many variants with various communication protocols

**Bayesian solution** 

Agentnormalform CE **Strategic-form CE** 

Bayes Nash equilibria Communi -cation equilibria

# Communication equilibria [Myerson'82, Forges'86]

Equilibria realized by 🤮 with bidirectional communication

Each player privately tells their types to the mediator 🧝



2 The mediator 🧝 privately sends a recommendation to each player



# Communication equilibria [Myerson'82, Forges'86]

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 $\leftarrow$  No incentive to tell an untrue type



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The mediator 🧝 privately sends a recommendation to each player

← No incentive to disobey the recommendation





The mediator 🧝 privately sends a recommendation to each player



# Mediator A knows the true types in advance 1 Each player privately tells their true types to the mediator A knows Each player privately tells their true types to the mediator A knows I prefer I prefer I prefer I prefer I prefer 2 The mediator A privately sends a recommendation to each player

 $\leftarrow$  No incentive to disobey the recommendation



# **Our results**

## For various equilibrium concepts, we provide PoA and PoS bounds



under the basic utility assumption

We also obtained PoA and PoS bounds for the correlated prior case

# Our setting: Bayesian valid utility games

Our technique: Strategy-representability gap

**Other results** 

# **Notations for Bayesian games**

$$\begin{split} N &= \{1, 2, \dots, n\} \text{ players} & N &= \{\widehat{\underline{a}}, \widehat{\odot}\} \\ \Theta_i \text{ finite set of types for player } i \in N & \Theta_{\widehat{\underline{a}}} &= \Theta_{\widehat{\underline{o}}} &= \{\widehat{\underline{\bullet}}, \widehat{\underline{\bullet}}\} \\ A_i^{\theta_i} \text{ finite set of actions for player } i \in N \text{ with type } \theta_i \in \Theta_i & A_{\widehat{\underline{o}}}^{\widehat{\underline{o}}} &= \{\overline{\underline{m}}, \widehat{\underline{\bullet}}\} \\ \Theta &= \prod_{i \in N} \Theta_i \text{ type profiles} \\ \rho \in \Delta(\Theta) \text{ prior distribution over type profiles} & \rho(\widehat{\underline{\bullet}}, \widehat{\underline{\bullet}}) &= 1/4 \end{split}$$

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# **Notations for Bayesian games**

 $N = \{1, 2, ..., n\}$  players  $N = \{ 0, 0 \}$  $\Theta_i$  finite set of types for player  $i \in N$  $\Theta_{\textcircled{a}} = \Theta_{\textcircled{a}} = \{\textcircled{b}, \textcircled{b}\}$  $A^{\textcircled{2}} = \{\blacksquare, \textcircled{3}\}$  $A_i^{\theta_i}$  finite set of actions for player  $i \in N$  with type  $\theta_i \in \Theta_i$  $\Theta = \prod_{i \in N} \Theta_i$  type profiles  $\rho \in \Delta(\Theta)$  prior distribution over type profiles  $\rho(\textcircled{2}, \textcircled{2}) = 1/4$ Two settings in this study •  $\rho$  is **independent** ( $\exists \theta_i \in \Delta(\Theta_i)$  for each  $i \in N$  s.t.  $\rho(\theta) = \prod \rho_i(\theta_i)$  for all  $\theta \in \Theta$ )

 $i \in N$ 

•  $\rho$  is **correlated** (no assumption on  $\rho$ )

# Submodular social welfare functions

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# Let $E = \bigcup_{i \in N} \bigcup_{\theta_i \in \Theta_i} A_i^{\theta_i}$ be the set of all possible actions

Let 
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 be the set of all possible actions

## Assumption [Vetta 2002]

The social welfare function  $f: 2^E \to \mathbb{R}$  is assumed to be

- **non-negative**:  $f(X) \ge 0$  for any  $X \subseteq E$
- **monotone**:  $f(X \cup \{v\}) \ge f(X)$  for any  $X \subseteq E$  and  $v \in E$
- submodular:  $f(X \cup \{v\}) f(X) \ge f(Y \cup \{v\}) f(Y)$

for any  $X \subseteq Y \subseteq E$  and  $v \in E \setminus Y$ 

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The marginal contribution to social welfare of each action decreases as other actions are added

decreases as other actions are added

$$f(\{\square_{\textcircled{2}}\}) - f(\{\})$$

The increase in social welfare when no one attended yet

decreases as other actions are added

 $f(\{ \square_{\textcircled{2}}\}) - f(\{\})$ 

The increase in social welfare when no one attended yet



The increase in social welfare when other players already attended

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The increase in social welfare when no one attended yet



The increase in social welfare when other players already attended

decreases as other actions are added





The increase in social welfare when no one attended yet



The increase in social welfare when other players already attended

Intuitively, this assumption is **substitutability** among players' actions

\* Note that we assume this property even among the same player's actions

$$v_i \colon A \to \mathbb{R}_{\geq 0}$$
 utility function for each player  $i \in N$ ,  
where  $A = \prod_{i \in N} \left( \bigcup_{\theta_i \in \Theta_i} A_i^{\theta_i} \right)$  is the set of all possible action profiles

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## Assumption [Vetta 2002]

• 
$$\sum_{i \in N} v_i(a) \le f(\{a_1, \dots, a_n\})$$
 for any  $a \in A$  (total utility condition)

• 
$$v_i(a) \ge f(\{a_1, \ldots, a_n\}) - f(\{a_j \mid j \in N \setminus \{i\}\})$$
 for any  $i \in N$  and  $a \in A$ 

(marginal contribution condition)

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(marginal contribution condition)



The contribution of  $\frac{1}{2}$  is at least  $f(\square) - f(\square) = 0$ 

🖻 Example: 💿 gets all, 🚊 gets all, two players share equally, or both get 0

Our setting: Bayesian valid utility games

# Our technique: Strategy-representability gap

**Other results** 

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For an equilibrium class  $\Pi \subseteq \Delta(A)^{\Theta}$ , PoA is defined as



**Challenge** optimal action  $a_i^*$  depends on the other players' types  $\theta_{-i}$ 

# Strategy-representability gap (SR gap)



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For each player, one block is chosen according to a known distribution



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 $SRgap \stackrel{\triangle}{=} \frac{Choose \text{ one element from each block, and then blocks are selected}}{Blocks are selected, and then choose one element from each block}$ 



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# SR gap lower bound (independent case)

### Theorem

If  $\rho$  is independent,  $\operatorname{SRgap} \geq 1 - 1/e$ , and this bound is tight

Lower bound based on the correlation gap bound [Vondrák'07]

### Upper bound



### Optimal social welfare: n

 $\therefore$  There exists a perfect matching w.h.p.

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### Optimal strategy profile: pprox (1-1/e)n

∴ The expected probability that each resource is chosen can be upper-bounded

# SR gap lower bound (correlated case)

#### Theorem

 $\operatorname{SRgap} = \Omega(1/\sqrt{n})$ , and this bound is tight

#### Lower bound

Upper bound

$$\Theta_1=\dots=\Theta_n=[n]^k$$
, where  $k=\sqrt{n}$   $j\sim [k]$  and  $\ell_1,\dots,\ell_k\sim [n]$ 

Types  $\{(\ell_1, \ldots, \ell_{j-1}, t, \ell_{j+1}, \ldots, \ell_k) \mid t \in [n]\}$  are randomly assigned to n players





 $E = [n] \times [k]$  set of resources The *h*th action of type  $\ell$  is to choose  $(h, \ell_h) \in E$ 

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#### Optimal social welfare: n

Optimal strategy profile:  $\leq k + n/k = 2\sqrt{n}$ 

Our setting: Bayesian valid utility games

Our technique: Strategy-representability gap

**Other results** 

# Improved PoA lower bound for com. eq.

### Proposition

If ho is independent,  $\mathrm{PoA_{Com.Eq.}} \geq 0.5$ , which improves on the SR-gap approach

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Based on the smoothness arguments for Bayes–Nash equilibria [Roughgarden'15, Syrgkanis'12]

The key step of their proof:

Swapping  $\theta_i$  and  $\theta_i'$  in  $\theta \sim \rho$  and  $\theta' \sim \rho$  using the independence of  $\rho$ 

 $\leftarrow$  Incentive constraints for misreporting  $\theta'_i$  instead of  $\theta_i$  can be used



The same result also holds for agent-normal-form CE

### PoA upper bound for Bayesian solutions

### Proposition

 $\mathrm{PoA}_\mathrm{BS} \leq rac{1-1/\sqrt{e}}{3/2-1/\sqrt{e}} pprox 0.4403$  for some example with independent ho



Odd players are connected to all resources Even players are connected to random one Odd players are prioritized over even ones

#### **Bad Bayesian solution**:

Each (2k - 1)th player is recommended to choose the (2k)th player's action

**Optimal**: 
$$\approx \underbrace{n/2}_{\text{even}} + \underbrace{(1 - 1/\sqrt{e})n}_{\text{odd}},$$

Bayesian solution: 
$$\approx (1 - 1/\sqrt{e})n$$

### **Our results**

### For various equilibrium concepts, we provide PoA and PoS bounds



under the basic utility assumption

We also obtained PoA and PoS bounds for the correlated prior case

### Reference

- Françoise Forges. 1986. An approach to communication equilibria. *Econometrica*, 1375–1385.
- Françoise Forges. 1993. Five legitimate definitions of correlated equilibrium in games with incomplete information. *Theory and Decision* 35, 277–310.
- John C. Harsanyi. 1967. Games with Incomplete Information Played by "Bayesian" Players, I–III. *Management Science* 14(3):159–182, 14(5):320–334, 14(7):486–502.
- Tim Roughgarden. 2015a. Intrinsic Robustness of the Price of Anarchy. *Journal of the ACM* 62(5), 32:1–32:42.
- Tim Roughgarden. 2015b. The Price of Anarchy in Games of Incomplete Information. *ACM Transactions* on *Economics and Computation* 3(1), 6:1–6:20.
- Adrian Vetta. 2002. Nash equilibria in competitive societies, with applications to facility location, traffic routing and auctions. In *FOCS 2002*. 416–425.
- Jan Vondrák. 2007. Submodularity in combinatorial optimization. Ph.D. Dissertation.
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Types  $\theta = (\theta_1, \dots, \theta_n)$  are generated from prior distribution  $\rho \in \Delta(\Theta)$ 

- All players know  $\rho$  as common knowledge
- Each player  $i \in N$  knows their own type  $\theta_i$  but not the others'  $\theta_{-i} = (\theta_j)_{j \in N \setminus \{i\}}$

### Two settings in this study

- $\rho$  is **independent** ( $\exists \theta_i \in \Delta(\Theta_i)$  for each  $i \in N$  s.t.  $\rho(\theta) = \prod_{i \in N} \rho_i(\theta_i)$  for all  $\theta \in \Theta$ )
  - Types represent each player's preferences or attributes
- $\rho$  is **correlated** (no assumption on  $\rho$ )
  - Types represent each player's weather or traffic conditions

Marginal gain of each elem. decreases as elements are obtained

 $f(v|X) \triangleq f(X \cup \{v\}) - f(X)$ 

**marginal gain** of adding  $v \in E$  to  $X \subseteq E$ 



 $f: 2^E \to \mathbb{R}$  is submodular  $\Leftrightarrow$  For all  $X \subseteq Y$  with  $X, Y \subseteq E$  and  $v \in E \setminus Y$ , we have  $f(v|X) \ge f(v|Y)$ 

e.g.) 
$$X = \{ \ge \}, Y = \{ \ge \}, \blacksquare \}$$
 and  $v = \heartsuit$   
 $f(\{ \heartsuit, \ge \}) - f(\{ \ge \}) \ge f(\{ \heartsuit, \ge \}, \blacksquare \}) - f(\{ \ge \}, \blacksquare \})$ 

### The function value is non-decreasing when elements are added

 $f(v|X) \triangleq f(X \cup \{v\}) - f(X)$ 

**marginal gain** of adding  $v \in E$  to  $X \subseteq E$ 

 $f: 2^E \to \mathbb{R}$  is monotone  $\Leftrightarrow$  For all  $X \subseteq E$  and  $v \in E$ , we have  $f(v|X) \ge 0$ 

e.g.) 
$$X = \{ \geq, \blacksquare \}$$
 and  $v =$   $f(\{ \heartsuit, \geq, \blacksquare \}) - f(\{ \geq, \blacksquare \}) \ge 0$ 

### Summary

For various equilibrium	concepts, we prov	vide PoA and PoS bounds

	BNE, SF/ANFCE, ANF/SFCCE	Com.Eq.	BS, ANF/SFCBS
PoA (v, i)	1/2	1/2	$\in \left[rac{1-1/e}{2}, 0.441 ight]$
PoA (v, c)	$\Theta\left(\frac{1}{\sqrt{n}}\right)$	$\Theta\left(\frac{1}{\sqrt{n}}\right)$	$\Theta\left(\frac{1}{\sqrt{n}}\right)$
PoS (b, i)	1-1/e	$\leq 4/5$	1
PoS (b, c)	$\Theta\left(\frac{1}{\sqrt{n}}\right)$	$\Omega\left(\frac{1}{\sqrt{n}}\right)$	1
		/"=valid utility g	ames, "b"=basic utility games,
	"i"=type prior distribut	ion $\rho$ is independent	ndent, "c"= $\rho$ can be correlated
Bayes–Nas	Communication	Devesion	ANFCBS -> SFCBS
equilibria	SFCE — ANFCE		► ANFCCE → SFCCE

# **Communication equilibria**

 $N = \{1, 2, ..., n\}$  players  $N = \{ 2, 0 \}$  $\Theta_i$  finite set of types for player  $i \in N$  $\Theta_{\textcircled{a}} = \Theta_{\textcircled{a}} = \{\textcircled{b}, \textcircled{b}\}$  $A_i^{\theta_i}$  finite set of actions for player  $i \in N$  with type  $\theta_i \in \Theta_i$   $A_{\bullet}^{\textcircled{0}} = \{ \square, \textcircled{w} \}$  $\Theta = \prod_{i \in N} \Theta_i$  type profiles  $\rho \in \Delta(\Theta)$  prior distribution over type profiles  $\rho(\textcircled{O}, \textcircled{O}) = 1/4$ A distribution  $\pi \in \prod_{\theta \in \Theta} \Delta(A^{\theta})$  is a communication equilibrium if for any  $i \in N$ ,  $\theta_i, \theta'_i \in \Theta_i$ , and  $\phi: A_i^{\theta'_i} \to A_i^{\theta_i}$ , it holds that  $\mathbb{E}_{\substack{\theta_{-i} \sim \rho \mid q_{\cdot}}} \left| \mathbb{E}_{a \sim \pi(\theta)} \left[ v_{i}(a) \right] \right| \geq \mathbb{E}_{\substack{\theta_{-i} \sim \rho \mid q_{\cdot}}} \left[ \mathbb{E}_{a \sim \pi(\theta', \theta_{-i})} \left[ v_{i}(\phi(a_{i}), a_{-i}) \right] \right].$