

# A Collusion-Proof Efficient Dynamic Mechanism

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## Motivation

**Efficiency and Dominant Strategy Incentive Compatibility**  
in **dynamic settings**:

*In general, it is impossible to implement the efficient allocation rule in dominant strategies in dynamic setting*

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(Perfect) Bayesian Nash equilibria:

- **Multiple equilibria**
- **Dynamic coordination/collusion undermines efficiency**
- We show that in most celebrated dynamic mechanisms **efficient eq might not survive Iterated Elimination of Weakly Dominated Strategies (IEWDS)...**

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We also construct

**a modified mechanism that approximately achieves the same property in environments without transfers.**

## Related Literature

Collusion-proof **static** mechanisms: **Che and Kim (2006)**,  
Laffont and Martimort (1997, 2000),  
Cremer and Riordan (1985), **Safronov (2017)**

Efficient **dynamic** mechanisms: Skrzypacz and Toikka (2015),  
**Bergemann and Välimäki (2010)**, **Athey and Segal (2013)**

Optimal **dynamic** mechanisms: Pavan, Segal and Toikka (2014),  
Bergemann and Välimäki (2019)

Collusion with **persistent private info**:  
Athey and Bagwell (2001, 2008), Miller (2012)

Repeated **implementation**: **Jackson and Sonnenschein (2007)**,  
**Ball et al. (2022)**, Lee and Sabourian (2009, 2013),  
Renou and Mezzetti (2017), Renou and Tomala (2015)

## Dynamic Pivot (BV10), BTM (AS13), and Guaranteed Utility Mechanism (GUM)

	BV10 DP	AS13 BTM	GUM
<b>Incentive Compatibility</b>			
efficient PBE	YES	YES	
efficient PBE survive IEWDS	NO	NO	
all PBEs/BNEs are efficient	NO	NO	

- Dynamic Pivot extends AGV
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<b>Collusion</b>			
collusion-proof	NO	NO	YES
<b>Properties, Robustness, Extensions</b>			
balanced budget	NO	YES	YES
IR (exiting and re-entering)	YES	NO	YES

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Agents:  $\mathcal{I} = \{1, \dots, N\}$

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A (pure) strategy  $s^i = \{s_t^i\}_{t=1}^T$ :

$$s_t^i : (\Theta^i)^t \times \mathcal{H}_{t-1} \rightarrow \Theta^i.$$

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① **decision policy**

$$\chi : \{0, 1, \dots, T\} \times \Theta \rightarrow \mathbf{X}$$

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② **transfer rule**

$$y_t^i = y_t^i(h_t)$$

as a function of public history.

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[Updating reports]

Every period  $t$ , **agents simultaneously report their types;**  
**but reports are updated as if they were arriving one by one,**  
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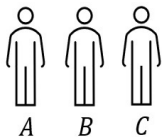
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## [Transfers]

Externality payments are **bilateral**:

- every agent  $j$  receives the transfer from  $i$ , which compensates  $j$  by the externality imposed on  $j$  by  $i$ .

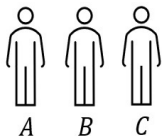
## GUM: Example



$$\begin{aligned} & (\hat{\theta}_1^A, \hat{\theta}_1^B, \hat{\theta}_1^C) \\ & (\hat{\theta}_2^A, \hat{\theta}_2^B, \hat{\theta}_2^C) \end{aligned}$$

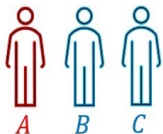
Two sets of parameter estimates are shown, with curved arrows indicating a transition from the first set to the second. The subscripts 1 and 2 are in blue, while the superscripts A, B, and C are in red.

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A large curved arrow points from the top row of parameters to the bottom row.



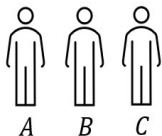
“effect” of  $\hat{\theta}_2^A$ :

$$(\hat{\theta}_1^A, \hat{\theta}_1^B, \hat{\theta}_1^C)$$

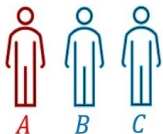
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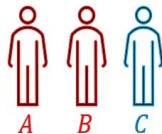


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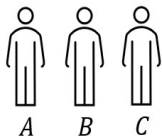
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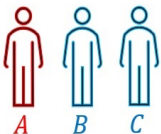


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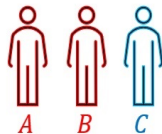


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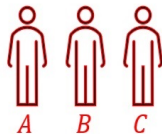


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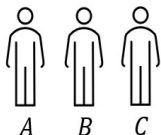
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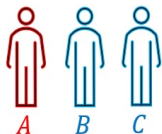
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$$(\hat{\theta}_1^A, \hat{\theta}_1^B, \hat{\theta}_1^C)$$

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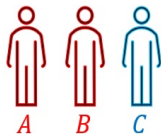


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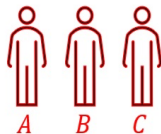


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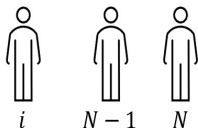
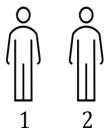
$$(\hat{\theta}_2^A, \hat{\theta}_2^B, \hat{\theta}_2^C)$$

If  $\hat{\theta}_2^B \uparrow U_A$  by 20 and  $\downarrow U_C$  by 5,  
transfers are  $(-20, 15, 5)$ :

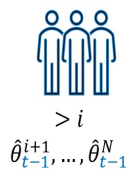
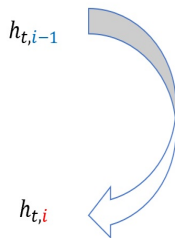
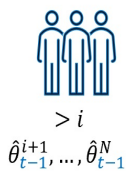
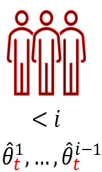
**A** pays 20 to **B**

**B** pays 5 to **C**.

# GUM



$$h_{t-1} = (\hat{\theta}_{t-1}^1, \dots, \hat{\theta}_{t-1}^N)$$



## GUM: Transfers

**anticipated payoff** of agent  $j$  is:

$$\gamma_{t,j}^j = \mathbb{E}^{\mu(h_{t,i}, \chi^*)} \left[ \sum_{t'=0}^T u^j(\tilde{\theta}_{t'}^j, x(\tilde{\theta}_{t'})) \right].$$

recall  $h_{t,i} = (\hat{\theta}_0, \hat{\theta}_1, \dots, \hat{\theta}_{t-1}, (\hat{\theta}_t^0, \hat{\theta}_t^1, \dots, \hat{\theta}_t^i))$

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*budget-balanced* as every payment is from one agent to another.

## Why "Guaranteed Utility Mechanism"?

Mechanism satisfies the *Guaranteed Utility Property* (GUP) if there exists a strategy profile  $s_* \in \mathcal{S}^{\mathcal{I}}$  and a vector  $C \in \mathbb{R}^N$  such that:

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*Intuition:* In  $i - j$  bilateral interaction, if either is truthful, he is unaffected (in expectation) by the dishonesty of the other.

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### Proposition

*All BNEs (PBEs) in GUM are efficient and utility-equivalent.*

## Collusion-Proofness

For  $L \subseteq \mathcal{I}$ , a side contract is  $\bar{s}^L = \{\bar{s}_t^L\}_{t=1}^T$ , where

$$\bar{s}_t^L : (\Theta^L)^t \times \mathcal{H}_t \rightarrow \Theta^L \times \mathbb{R}^{|L|}.$$

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$\bar{s}^{*\mathcal{I}} \in \bar{\mathcal{S}}^{\mathcal{I}}$  is a **weak equilibrium** if:

$$\forall i \in \mathcal{I}, \forall s^i \in \mathcal{S}^i, \exists \bar{s}^{\mathcal{I} \setminus \{i\}} \in \bar{\mathcal{S}}^{\mathcal{I} \setminus \{i\}} \quad \mathbb{E}[U^i(s^i, \bar{s}^{\mathcal{I} \setminus \{i\}})] \leq \mathbb{E}[U^i(\bar{s}^{*\mathcal{I}})]$$

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*Ex:* Bayesian Nash Equilibrium is a weak equilibrium.

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Ex: Bayesian Nash Equilibrium is a weak equilibrium.

A mechanism is **collusion-proof** if  
all weak equilibria are utility-equivalent.

# The Main Result

## Theorem

*Guaranteed Utility Mechanism is collusion-proof.*

## Further Properties and Extensions

- Participation constraint: allowing exiting and re-entering
- Results hold verbatim if agents can observe true past types
- Can extend to allow agents to take private actions
- Easy to achieve symmetry by averaging over orderings
- (in progress, separate paper)  
agents' initial types are **private**: tendering model extension

## Allocation Decisions without Transfers

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Our transfer-free GUM **achieves efficiency with an error that does not depend on the type space size** unlike in JS07.

## Related Literature: A Closer Look

	BV10 DP	AS13 BTM	GUM
Incentive Compatibility			
efficient PBE	YES	YES	YES
efficient PBE survive IEWDS	NO	NO	YES
all PBEs/BNEs are efficient	NO	NO	YES
Collusion			
collusion-proof	NO	NO	YES
Properties, robustness, extensions			
balanced budget	NO	YES	YES
exiting and re-entering	YES	NO	YES
observing past types	YES	NO	YES
observing same-period types	YES	NO	NO
private actions	NO	YES	YES

## Additive Externality (if time permits...)

(recall) **externality**  $i$ 's report  $\hat{\theta}_t^i$  imposes on  $j$  is:

$$\gamma_t^{i \rightarrow j} = \Upsilon_{t,i}^j - \Upsilon_{t,i-1}^j.$$

**total externality** *simultaneous* updating of all the agent's reports at period  $t$  imposes on the agent's  $j$  payoff is

$$\gamma_t^{\mathcal{I} \rightarrow j} = \Upsilon_{t,N}^j - \Upsilon_{t-1,N}^j.$$

externality is **additive** if the sum of the externalities across all the agents is equal to the total externality:

$$\sum_{i \in \mathcal{I}} \gamma_t^{i \rightarrow j} = \gamma_t^{\mathcal{I} \rightarrow j} \quad \forall j, \forall t.$$