

Benjamin Sperisen and Stefano Barbieri  
Tulane University  
Department of Economics

K. Brent Venable<sup>1,2</sup> and Zizhan Zheng<sup>1</sup>  
Tulane University<sup>1</sup> and IHMC<sup>2</sup>  
Department of Computer Science

## Motivation

Governments sometimes must develop policy in the presence of agents who cooperate with each other (or would like to) despite conflicts of interest

Examples:

- Procurement auctions
- Antitrust
- Organized criminals/drug tracking organizations
- Coalitions fighting terrorism (e.g. Syria)
- Private sector auctions (e.g. Google)

How to design policy that maximizes the government's objectives in the presence of collusion?

## Description

Model:

- Government and players play a repeated game (same stage game throughout)
- Government announces its strategy ("policy") prior to start of the game
- Policy effectively specifies a dynamic game (where stage game depends on history)

Collusion: assume players play the player-optimal (strongly symmetric) equilibrium of that dynamic game

Which policy maximizes government payoff, given players play the most collusive equilibrium?

## Simple Example

Players play prisoner's dilemma. Government's payoff is directly opposed to players': negative of sum of players' payoffs

		Player 2					
		C	D				
Player 1	C	-6, 3, 3	-4, 0, 4	Player 1	C	-4, 2, 2	-2, -1, 3
	D	-4, 4, 0	-2, 1, 1		D	-2, 3, -1	0, 0, 0
		Reward				Attack	
		Government				Government	

If the government uses the simple policy of either "always retreat" or "always attack",  $\delta \geq 1/3$  is sufficient to enforce grim trigger

- suppose the government chooses "always attack". For  $\delta = 0.4$ , the most conclusive (symmetric) equilibrium: "always (C,C)", average payoff 2

## Game Model

Player 1, 2, ..., n, have actions  $a_i \in A_i$ , government ("player 0") has action  $a_0 \in A_0$ .  $A = \prod_{i \geq 0} A_i$

Symmetric stage game with payoffs  $u_i(a_0, a_1, \dots, a_n)$

- $A_1 = A_2 = \dots = A_n$
- $u_i(a_0, a_i, a'_{-i}) = u_j(a_0, a_j, a'_{-j})$  if  $a_i = a_j$  and  $a'_{-i} \in A_{-i}$  and  $a'_{-j} \in A_{-j}$  are permutations of each other

Public monitoring: players observe the public history of previous actions and a public correlation device

- $H$ : set of public histories
- strategy:  $\sigma_i: H \rightarrow A_i$

Discounted average payoff

$$V_i(\sigma) = (1 - \delta)[u_i(a^0) + \delta u_i(a^1) + \delta^2 u_i(a^2) + \dots]$$

Government announces its strategy  $\sigma_0: H \rightarrow A_0$  before the start of the game

Given  $\sigma_0$ ,  $\sigma_{-0}$  is a **subgame perfect Nash Equilibrium (SPNE)** if  $\sigma_{-0|h}$  specifies a NE for any history  $h \in H$ . An SPNE is **strongly symmetric** if  $\sigma_i(h) = \sigma_j(h)$  for all  $i, j$

## Policy Design Problem

Assumption: Given  $\sigma_0$ , non-government players play "the most conclusive equilibrium," the highest payoff strongly symmetric SPNE

An optimal government policy  $\sigma_0$  is given by

$$\max_{\sigma_0} V_0(\sigma_0, \sigma_{-0}) \text{ such that } \sigma_{-0} \in C(\sigma_0)$$

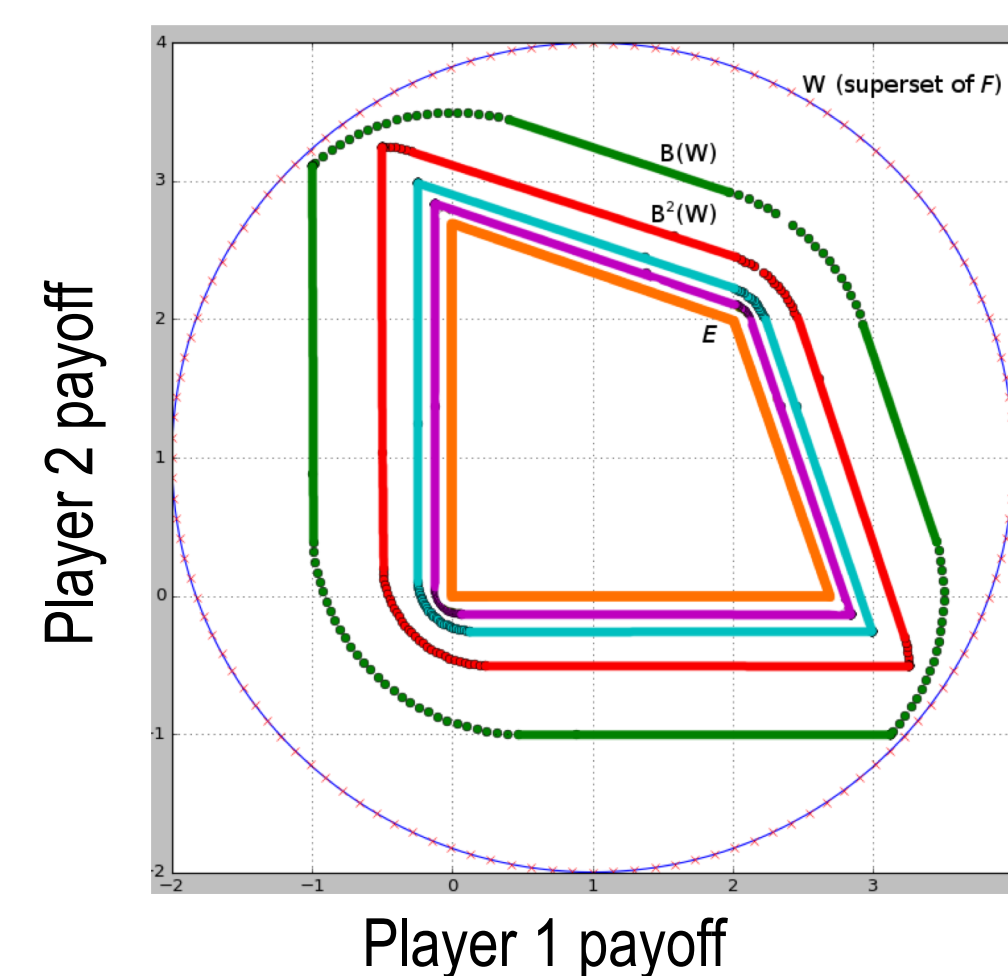
- $V_0(\sigma) = -\sum_{i \geq 1} V_i(\sigma)$
- $C(\sigma_0)$ : set of most conclusive equilibrium under  $\sigma_0$

## Related Work

Abreu, Pearce, and Stachetti (1990) (APS) recursive characterization of repeated game equilibrium payoffs as "largest self-generating set"

Computational implementation due to Judd, Yeltekin, and Conklin (2003) (JYC), using polygon approximations of sets at each iteration

	C	D
C	2, 2	-1, 3
D	3, -1	0, 0



## Recursive Characterization

An interval  $W = [\underline{W}, \overline{W}]$  is (government-) generated by a collection of intervals  $\mathbf{W}$  if there exist government action  $a_0$  and continuation payoff sets specified by  $\Gamma: A \rightarrow \mathbf{W}$  such that for each  $w \in W$ , there exist a symmetric player action profile  $a_{-0}$  and continuation payoffs  $\gamma: A \rightarrow \mathbb{R}$  such that

- payoffs available:  $\gamma(a) \in \Gamma(a) \forall a \in A$
- incentive compatibility:
 
$$w = (1 - \delta)u_i(a) + \delta\gamma(a) \geq (1 - \delta)u_i(a'_i, a_{-i}) + \delta\gamma(a'_i, a_{-i}) \forall i, a'_i$$

## Self-generating Collections

Generating Operator:

- $\mathbf{B}_P(\mathbf{W})$ : collection of intervals generated by  $\mathbf{W}$
- $\mathbf{B}(\mathbf{W}) = \text{co}(\mathbf{B}_P(\mathbf{W}))$
- $\mathbf{W}$  is **self-generating** if  $\mathbf{W} \in \mathbf{B}(\mathbf{W})$ 
  - $\mathbf{W}$  is a contraction of  $\mathbf{W}'$  ( $\mathbf{W} \subseteq \mathbf{W}'$ ) if for every  $W \in \mathbf{W}$ , there is  $W' \in \mathbf{W}'$  such that  $W \subset W'$
- Theorem**: generating operators coverage to equilibrium collection:  $\mathbf{F} \supseteq \mathbf{B}(\mathbf{F}) \supseteq \mathbf{B}^2(\mathbf{F}) \supseteq \dots \supseteq \mathbf{E}$
- $\mathbf{F} = \{F\}$ ,  $F = [\min_{a,i} u_i(a), \max_{a,i} u_i(a)]$  interval of feasible payoffs
- $\mathbf{E}$ : set of all strongly symmetric SPNE payoffs

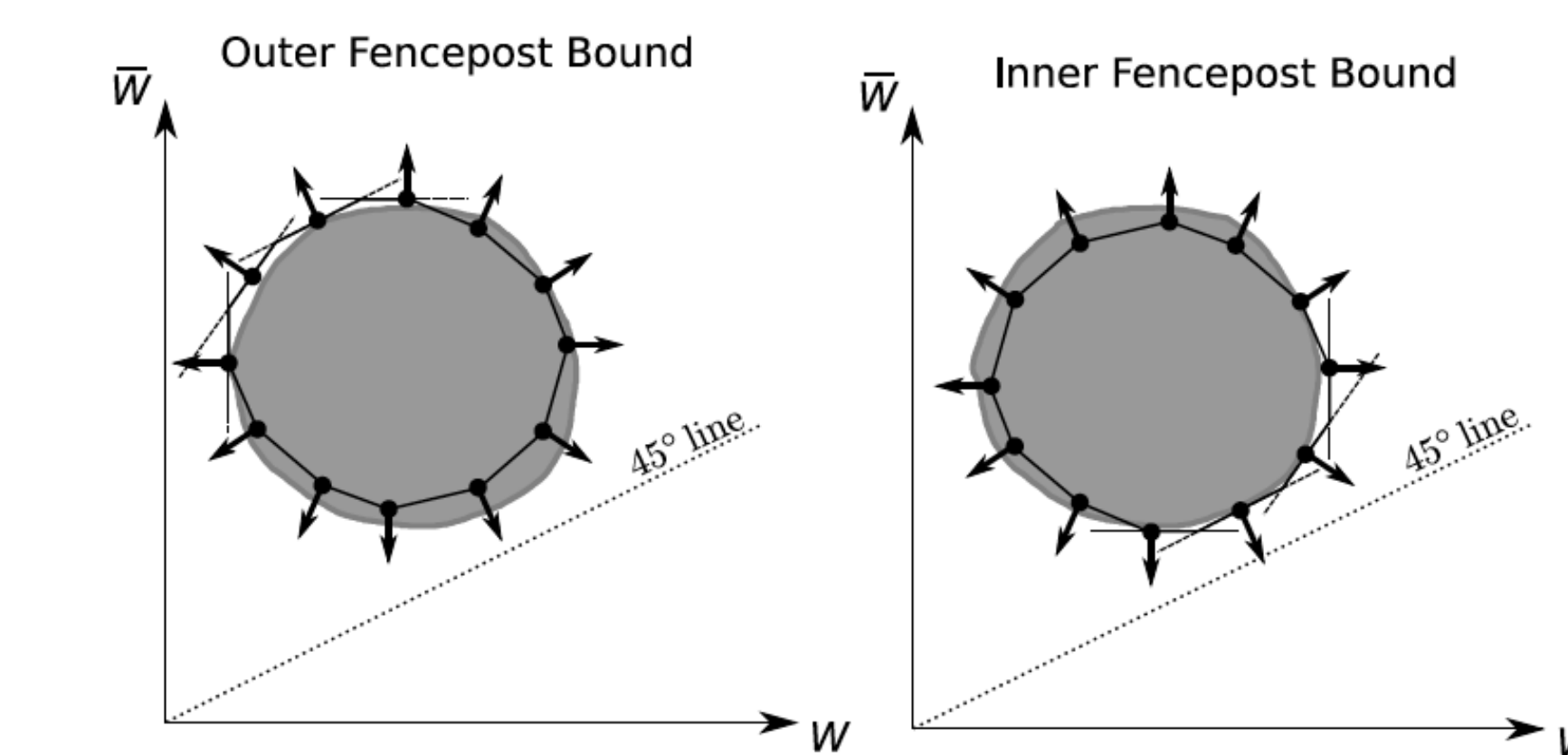
## Trace out Optimal Policy

Given  $\mathbf{E}$ , possible to trace out optimal policy:

- choose  $E \in \mathbf{E}$  that maximizes government payoff
- find government action  $a_0$  and payoff sets  $\Gamma: A \rightarrow \mathbf{E}$  that generates  $E$ 
  - set initial govt policy  $\sigma_0$  (empty history) =  $a_0$
- For each action  $a' \in A$ , find action  $a'_0$  and payoff sets  $\Gamma': A \rightarrow \mathbf{E}$  that generates  $\Gamma(a)$ 
  - set  $\sigma_0(a) = a'_0$
- and so on...

## Outer/Inner Bounds

Analogous to JYC, construct outer bound  $\mathbf{B}_O(\mathbf{W})$  and inner bound  $\mathbf{B}_I(\mathbf{W})$  such that  $\mathbf{B}_I(\mathbf{W}) \subseteq \mathbf{B}(\mathbf{W}) \subseteq \mathbf{B}_O(\mathbf{W})$



## Boundary Point Problem

For simplicity, assume two players. Let  $a_{mn}$  denote the profile where player 1 plays  $m$ -th action and player 2 plays  $n$ -th action

To find a boundary point  $(\check{\psi}, \hat{\psi})$  in search direction  $g_q$ , solve the following optimization problem:

$$\Psi(q) \equiv \sup_{a_0, \Gamma: A \rightarrow \mathbf{W}} g_q \cdot (\check{\psi}(a_0, \Gamma), \hat{\psi}(a_0, \Gamma))$$

s. t.  $\Gamma(a_{mn}) = \Gamma(a_{nm}) \forall m, n$

where the inner optimization problems are

$$\check{\psi}(a_0, \Gamma) = \min_{i, \tilde{w}} (1 - \delta)u_1(a_0, a_{ii}) + \delta\tilde{w}(a_0, a_{ii})$$

s. t.  $\tilde{w}(a') = \Gamma(a') \forall a' \in A$

$$(1 - \delta)u_1(a_0, a_{ii}) + \delta\tilde{w}(a_0, a_{ii}) \geq (1 - \delta)u_1(a_0, a_{ki}) + \delta\tilde{w}(a_0, a_{ki}) \forall k$$

$$\hat{\psi}(a_0, \Gamma) = \max_{i, \tilde{w}} (1 - \delta)u_1(a_0, a_{ii}) + \delta\tilde{w}(a_0, a_{ii})$$

s. t. ...analogous constraints...

**Theorem**: Let  $a_0, \Gamma$  be given, the optimization problem  $\check{\psi}_{ii}(a_0, \Gamma)$  and  $\hat{\psi}_{ii}(a_0, \Gamma)$  are feasible iff

$$\max_k \{(1 - \delta)u_1(a_0, a_{ki}) + \delta\bar{\Gamma}(a_{ki})\} \leq (1 - \delta)u_1(a_0, a_{ii}) + \delta\bar{\Gamma}(a_{ii})$$

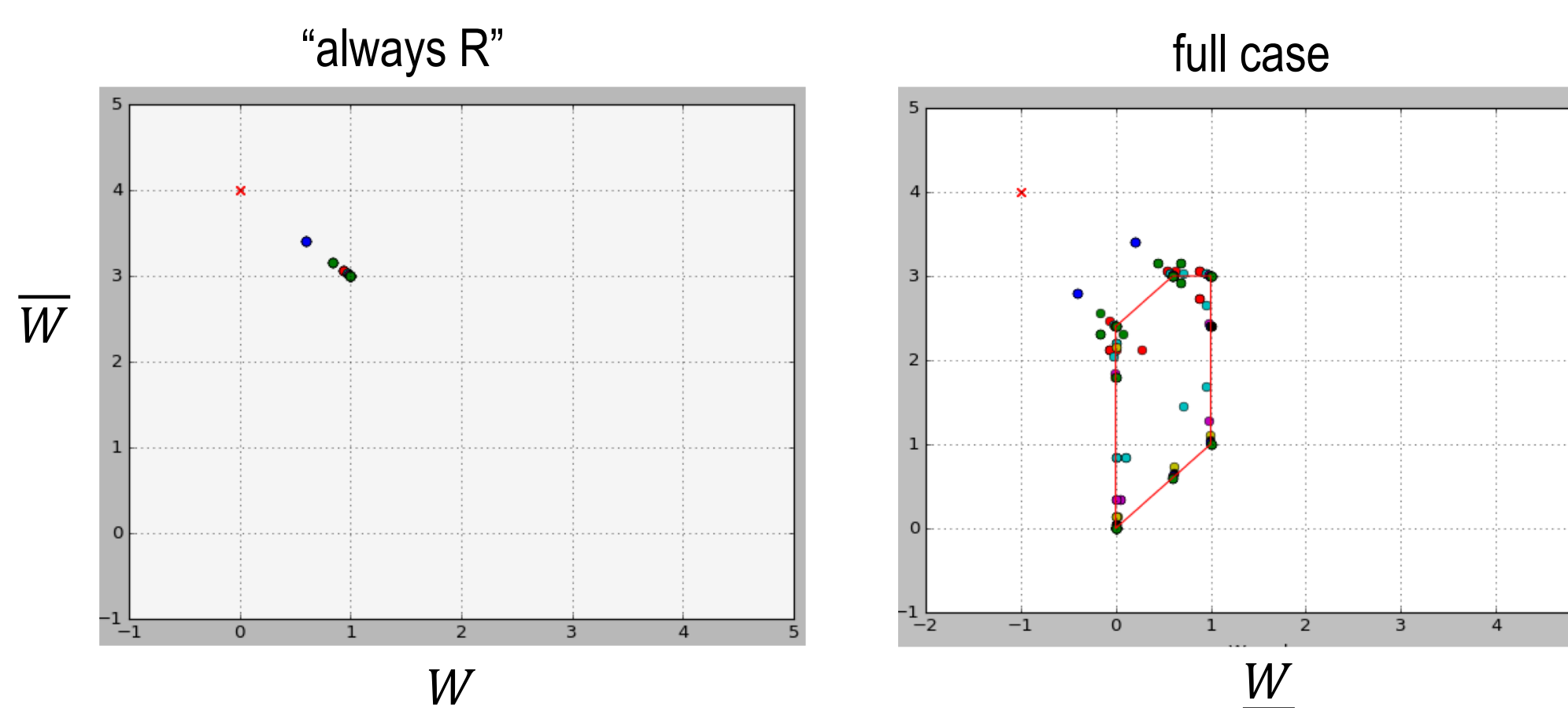
- MIPs formulated accordingly to solve  $\Psi(q)$

## Simple Example (Cont.)

For  $\delta = 0.4$ , best possible payoff for government is 0, obtained by the following policy:

$$\sigma_0(h) = \begin{cases} R & h \text{ contains } (D, C) \text{ or } (C, D) \\ A & \text{otherwise} \end{cases}$$

- Reward players permanently for deviating, otherwise punish
- When not too patient, stops collusion (where simple "always A" policy would fail)
- (Vulnerable to players colluding on asymmetric strategies)



## Ongoing Work

- Algorithm for tracing out optimal policy
- General government payoff
- Imperfect monitoring