### Structure of the set of equilibria

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#### Aim

Understand the structure of the set of Nash equilibria, of correlated equilibria, and also of equilibrium payoffs, in FINITE games.

- Natural mathematical question
- May allow to build games with interesting properties or to show that no such game exist

The aim is that YOU understand, not the old guys.

### Outline

- Nash equilibria
  - Zero-sum games
  - Bimatrix games
  - N-player games
- Correlated equilibria and links with Nash equilibria
- Evolution of equilibrium set as payoffs vary

Rk: highly personal choice of topics.

# Notation for sets of equilibria

NE: set of Nash equilibria

NEP: set of Nash equilibrium payoffs

NEP(G): of game G

CE: set of correlated equilibria

CEP, CEP(G): set of correlated equilibrium payoffs.

 $\ensuremath{\mathsf{NE}}$  /  $\ensuremath{\mathsf{CE}}$  also used as abbreviations of Nash / correlated equilibrium.

# Notation for bimatrix games

- Payoff matrices: A, B
- Pure strategies:  $i \in I$ ,  $j \in J$
- Mixed strategies:  $x \in \Delta(I)$ ,  $y \in \Delta(J)$
- Supports:  $Supp(x) := \{i \in I, x_i > 0\}$
- Payoff for player 1:  $x \cdot Ay = \sum_{i,j} x_i y_j a_{ij}$ .
- Best-replies:  $BR_1(y) \subset \Delta(I)$ ,  $BR_2(x) \subset \Delta(J)$

# Preliminaries - bimatrix games

Let 
$$g_1(i,j) = a_{ij}$$
. Then  $g_1(i,y) = \sum_{j \in J} y_j a_{ij} = (Ay)_i$  with  $A = (a_{ij})$ 

Thus, 
$$g_1(x,y) = \sum_i x_i g_1(i,y) = \sum_i x_i (Ay)_i = x \cdot Ay$$

So  $\max_{x} g_1(x, y) = \max_{i} g_1(i, y)$ . Moreover:

x best-reply to  $y \Leftrightarrow$  for all  $i \in I$ ,  $x_i = 0$  or i best-reply to y. Thus:

$$(x,y) \in NE \Leftrightarrow \left\{ egin{array}{l} \sum_i x_i = 1 \ \mathrm{and} \ \forall i \in I, x_i \geq 0 \ \\ \forall i \in I, [x_i = 0 \ \mathrm{or} \ \forall i' \in I, (Ay)_i \geq (Ay)_{i'}] \ \\ \mathrm{similar \ conditions \ for \ player \ 2} \end{array} \right.$$

Set NE given by unions and intersections of sets defined by LINEAR conditions on x, y.



# Why 2 is different from 3?

3-player game with pure strategy sets I, J, K.

Pure strategies: i, j, k; mixed strategies: x, y, z.

Then  $g_1(i, y, z) = \sum_{j,k} y_j z_k a_{ijk}$ : quadratic expression.

So best-reply condition:  $g_1(i,y,z) \ge g_1(i',y,z)$  for all i', now given by quadratic conditions. For n-player game, polynomial of degree n-1.

Set NE still semi-algebraic (and moreover nonempty, bounded, compact), but we expect way more complications than for bimatrix games.

# Zero-sum games: reminder

Player 1 maximizes  $g(x, y) = x \cdot Ay$ , player 2 minimizes.

#### Proposition 1 (von Neumann)

 $\min_{y \in \Delta(J)} \max_{x \in \Delta(I)} x \cdot Ay = \max_{x} \min_{y} x \cdot Ay = value v$ 

#### Definition 2

A strategy x of player 1 is optimal if for all y,  $g(x,y) \ge v$ .

A strategy y of player 2 is optimal if for all x,  $g(x, y) \le v$ .

Rk: If both x and y are optimal, then g(x, y) = v.

### Zero-sum games: properties

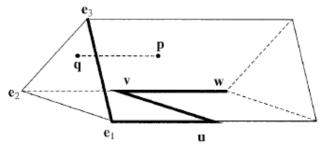
Let  $O_i$  denote the set of optimal strategies of player i. E.g.:

$$O_1 = \{x \in \Delta(I) \mid \forall y \in \Delta(J), x \cdot Ay \ge v\}$$

#### Proposition 3

- $O_1$  and  $O_2$  are convex polytopes
- $NE = O_1 \times O_2 = \{(x, y), x \in O_1, y \in O_2\}$
- Nash equilibria are exchangeable: if (x, y),  $(x', y') \in NE$ , then  $(x, y') \in NE$
- In any Nash equilibrium, the payoffs are (v, -v).
- (normal-form) generically, unique Nash equilibrium

# Bimatrix games: an example



Picture from Raghavan (02)

Consider bimatrix game 
$$\begin{pmatrix} 2,1 & 1,0 & 1,1 \\ 2,0 & 1,1 & 0,0 \end{pmatrix}$$

Picture represents  $\Delta(I) \times \Delta(J)$ . In bold: equilibria.

We see a "special structure". What can be said in general?



# Bimatrix games I - Exchangeability

#### Proposition 4 (Equilibria with the same support are exchangeable)

If (x,y) and (x',y') are equilibria with same support, then  $(x,y') \in NE$ .

#### Proof:

- i) Since x' best-reply to y', any pure strategy in Supp(x') best-reply to y'.
- ii) So any mixed strategy with support in Supp(x') best-reply to y'
- iii) So x best-reply to y', and similarly, y' best-reply to x.

# Bimatrix games - polyhedral structure

#### Proposition 5

NE is a finite union of products of convex polytopes

Proof. Let NE(I', J') denote the set of equilibria with support  $I' \times J'$ .

Let 
$$\hat{NE}(I',J') = NE_1(I',J') \times NE_2(I',J')$$
 where

$$\mathit{NE}_1(\mathit{I'},\mathit{J'}) = \{x \in \Delta(\mathit{I'}) : \Delta(\mathit{J'}) \subset \mathit{BR}_2(x)\}, \ \mathit{NE}_2(\mathit{I'},\mathit{J'}) \ \mathsf{symmetric}$$

We have:

i) 
$$NE(I', J') \subset \hat{NE}(I', J') \subset NE$$
, hence  $NE = \bigcup_{I' \subset I, J' \subset J} \hat{NE}(I', J')$ 

ii)  $NE_i(I', J')$  convex polytope.

Note also: equilibria in  $\hat{NE}(I', J')$  are exchangeable.



# Bimatrix games - Extreme Nash equilibria

#### Definition 6

A set  $S \subset NE$  is a Nash subset if equilibria in S are exchangeable. A Nash subset is maximal if not properly contained in another Nash subset.

#### Proposition 7 (e.g., Jansen, 1981a)

- a) A maximal Nash subset is a product of convex polytopes.
- b) NE is the union of finitely many maximal Nash subsets.

Proof of b): each  $\hat{NE}(I', J')$  contained in a maximal Nash subset.

#### Definition 8

Extreme Nash equilibria are extreme points of maximal Nash subsets.

Such extreme points may be characterized, and allow to recover all NE.



# Bimatrix games IV - Payoffs

A subset E of  $\mathbb{R}^2$  is a nice rectangle if E of the form  $[a,b] \times [c,d]$ Recall notation: NEP, NEP(G)

#### Proposition 9

- a) NEP is a finite union of nice rectangles
- b) for any nonempty finite union of rectangles U, there is a bimatrix game G with NEP(G) = U.
- a) set of payoffs associated to each subset of NE which is a product of compact convex sets (hence to each set  $\hat{NE}(I', J')$ ) is a nice rectangle.
- b) constructive, idea later.

# N-player games

(Normal-form) generic case: finite and odd number of equilibria.

But structure may be much richer... Any bound?

A closed subset E of  $\mathbb{R}^n$  is semi-algebraic if  $\exists$  integers A, B, and polynomials in n variables  $P_{ab}$  so that:

$$E = \bigcup_{a=1}^{A} \cap_{b=1}^{B} \{ x \in \mathbb{R}^{n}, P_{ab}(x) \leq 0 \}$$

#### Proposition 10

For any finite game G, NE(G) and NEP(G) are nonempty compact semi-algebraic sets.

#### Corollary 11

The sets of Nash equilibria and Nash equilibrium payoffs have a finite number of connected components



# Richness of the set of possible equilibria

Datta (03): Any real algebraic variety is *isomorphic* to the set of *completely mixed* Nash equilibria of a 3-player game (and of a *N*-player game with 2 actions per player)

Balkenborg & Vermeulen (14): any nonempty connected compact semi-algebraic set is *homeomorphic* to a connected *component* of the set of Nash equilibria of a "binary" game

Levy (16), Vigeral & V. (16): any nonempty, compact, semi-algebraic set in  $[0,1]^n$  is the *projection* of the set of equilibria of a finite game with 2 actions per player on its first n coordinates.

# Characterization of the set of equilibrium payoffs

#### Proposition 12 (Vigeral, 2015, unpublished)

For any  $n \ge 3$ , any nonempty compact semi-algebraic subset of  $\mathbb{R}^n$  is the set of Nash equilibrium payoffs of a n-player game.

Proof: constructive, lots of "gadget games".

Remark: for n = 2, not true. NEP then finite union of rectangles.

# Correlated equilibria and links with Nash equilibria

#### CHANGE OF NOTATION!

- N-player finite game;
- pure strategies:  $s_i$ ,  $t_i \in S_i$ ; pure strategy profile  $s \in S = \prod_i S_i$ .
- $\mu \in \Delta(S)$  is a correlated equilibrium (distribution) if for all i,  $s_i$ ,  $t_i$ ,

$$\sum_{s_{-i} \in S_{-i}} \mu(s_i, s_{-i}) \left[ u_i(s_i, s_{-i}) - u_i(t_i, s_{-i}) \right] \ge 0$$

(incentive contraint for not defecting from  $s_i$  to  $t_i$ )

recommandation interpretation

(Product distributions induced by) Nash equilibria are correlated equilibria The sets of correlated equilibria and of correlated equilibrium payoffs are  $convex\ polytopes$ . Notation: CE(G), CEP(G).



# Correlated equilibria in zero-sum games

#### Proposition 13

Let  $\mu$  be a correlated equilibrium,  $s_1 \in S_1$ ,  $g(\cdot)$  payoff of player 1:

- a)  $g(\mu) = \sum_{s} \mu(s)g(s) = v$
- b) If  $\mu(s_1 \times S_2) > 0$ , then  $\mu(\cdot|s_1)$  is an optimal strategy of player 2.
- c) A zero-sum game with a unique NE has a unique CE.
- d) Normal-form generically, zero-sum games have a unique CE.

### Bimatrix games

Recall: NE union of maximal Nash subsets, which are convex polytopes Extreme points of these polytopes called "extreme Nash equilibria" In what follows, we see  $\Delta(S_1) \times \Delta(S_2)$  as a subset of  $\Delta(S)$ .

#### Proposition 14 (Cripps; Evangelista & Raghavan; Gomez-Canovas et al.)

Extreme Nash equilibria are extreme points of the CE polytope.

Rk: not true in payoff space ; all Nash equilibrium payoffs may be in the interior of the polytope of correlated equilibrium payoffs (see later).

# N-player games

A game is *tight* if in any CE, all incentive constraints concerning two strategies with positive probability in a CE are satisfied with equality.

#### Proposition 15 (Nau et al., 03)

- a) If the correlated equilibrium polytope has the dimension of the simplex, then all Nash equilibria belong to its boundary.
- b) If there is a Nash equilibrium in the relative interior of the CE polytope, then the game is tight.

#### Proposition 16 (V., 04)

- c) All tight games have NE in the relative interior of the CE polytope
- d) 2-player tight games include and "generalize" zero-sum games.

# Correlated equilibrium payoffs

Recall sets CE and CEP convex polytopes. Below, polytope means nonempty convex polytope.

#### Proposition 17

For any polytope  $P \subset \mathbb{R}^N$ , there exists a N-player game G such that:

$$P = CEP(G) = Conv(NEP(G))$$

Idea: consider game with dominant strategy

$$\begin{pmatrix} x_1, y_1 & 0, 0 & 0, 0 & 0, y_1 \\ 0, 0 & x_2, y_2 & 0, 0 & 0, y_2 \\ 0, 0 & 0, 0 & x_3, y_3 & 0, y_3 \\ x_1, 0 & x_2, 0 & x_3, 0 & x_4, y_4 \end{pmatrix}.$$

Then  $CEP(G) = Conv\{(x_i, y_i), 1 \le i \le 4\} = Conv(NEP(G))$ 



# Flash back on Nash equilibrium payoffs

How to get any finite union of nice rectangles as set of NEP?

Let 
$$U = \cup_{1 \leq k \leq m} [a_k, b_k] \times [c_k, d_k]$$

Let 
$$G_k = (A_k, B_k) = \begin{pmatrix} a_k, c_k & b_k, c_k \\ a_k, d_k & b_k, d_k \end{pmatrix}$$
.

We have:  $NEP(G_k) = [a_k, b_k] \times [c_k, d_k]$ 

Replacing payoffs  $x_k$ ,  $y_k$  and 0 in previous slide by blocks  $A_k$ ,  $B_k$ , and blocks of 0, gives game G with NEP(G) = U and CEP(G) = Conv(U).

# Nash and Correlated equilibrium payoffs

#### Proposition 18

Let G be a N-player game. For any polytope  $P \subset \mathbb{R}^n$  containing CEP(G),  $\exists$  game G' such that NEP(G') = NEP(G) and CEP(G') = P.

ldea: using similar domination trick and auxiliary  $3\times 3$  game, possible to add extreme correlated equilibrium payoffs one by one.

# How to add (x, y) to CE payoffs of game G?

Assume for simplicity x > 1, y > 1. Let:

$$\Gamma = \begin{pmatrix} 0,0 & x+1,y-1 & x-1,y+1 \\ x-1,y+1 & 0,0 & x+1,y-1 \\ x+1,y-1 & x-1,y+1 & 0,0 \\ \hline [x,0] & G \end{pmatrix}$$

where [x,0], [0,y] are appropriate blocks of such payoffs.

#### Proposition 19

$$NEP(\Gamma) = NEP(G)$$
 and  $CEP(\Gamma) = Conv\{CEP(G), (x, y)\}$ 



# A slightly stronger result for bimatrix games

Recall: for any bimatrix game G, NEP(G) nonempty finite union of "nice" rectangles and CEP(G) polytope containing NEP(G). Conversely:

#### Proposition 20 (joint characterization of equilibrium payoffs)

For any nonempty finite union of "nice" rectangles U and polytope  $P \supset U$ ,  $\exists$  bimatrix game G such that U = NEP(G) and P = CEP(G).

Idea: note that  $Conv(U) \subset P$ . Using domination trick, first build game with NEP(G) = U and CEP(G) = Conv(U), then use N-player result.

#### Generic case

Games used for previous results highly non-generic. Normal-form generically, finite number of Nash equilibria.

#### Proposition 21

For any nonempty finite set  $U \subset \mathbb{R}^n$  and polytope P containing U,  $\exists$  open set of games for which NEP  $\varepsilon$ -close to U and CEP  $\varepsilon$ -close to P.

Idea: modification of previously used games, with small bonus to initially dominated equilibria.

# Evolution of the set of Nash equilibria as payoffs vary

Normal-form generically, nothing much happens: finite number of equilibria, all "stable" (existing closeby for small payoff perturbations).

But what may happen in full generality?

A first basic fact: upper-semi continuity of the NE correspondence.

Let  $(G_n)_{n\in\mathbb{N}}$  be a sequence of games of a fixed size.

Assume  $G_n \to G$  as  $n \to +\infty$ .

Let  $\sigma_n \in NE(G_n)$ . Then any limit point of  $\sigma_n$  is in NE(G).

"The set of equilibria may explode at the limit, but not implode."



### An example

Consider the  $2 \times 2$  game  $G_{\varepsilon}$ :

$$\begin{array}{ccc}
 & L & R \\
T & \left( \begin{array}{ccc}
0,0 & \varepsilon, -\varepsilon \\
-\varepsilon, \varepsilon & 0,0
\end{array} \right)$$

$$\text{We have: } \textit{NEP}(\textit{G}_{\varepsilon}) = \left\{ \begin{array}{ll} \{\textit{T},\textit{L}\} & \text{for } \varepsilon > 0 \\ \Delta(\textit{I}) \times \Delta(\textit{J}) & \text{for } \varepsilon = 0 \\ \{\textit{B},\textit{R}\} & \text{for } \varepsilon < 0 \end{array} \right.$$

Rk:  $\varepsilon=0$  "tilting point". Though the set of equilibria does not implode at the limit, it may vary a lot under small perturbations.

# Close games with very different equilibrium payoffs

Let G = (A, B) and G' = (A', B') be bimatrix games of same size. Let:

$$\Gamma_{\varepsilon} = \begin{pmatrix} A, B & A' + \varepsilon, B - \varepsilon \\ A - \varepsilon, B' + \varepsilon & A', B' \end{pmatrix}$$

Then 
$$NEP(\Gamma_{\varepsilon}) = \begin{cases} NEP(G) \text{ for } \varepsilon > 0 \\ NEP(G') \text{ for } \varepsilon < 0 \end{cases}$$

Building on this idea, we get:

#### Proposition 22

Let U and U' be nonempty finite unions of nice rectangles. Let  $P \supset U$  and  $P' \supset U'$  be polytopes in  $\mathbb{R}^2$ . Let EP = (NEP, CEP). We have:  $\forall \varepsilon > 0$ ,  $\exists \ \varepsilon$ -close games  $\Gamma$  and  $\Gamma'$ ,  $EP(\Gamma) = (U, P)$ ,  $EP(\Gamma') = (U', P')$ .

Similar results for *N*-player games.



# Is having a unique equilibrium robust?

Fixing the number of players N and the set of strategy profiles S, a game may be seen as a subset of  $\mathbb{R}^{N|S|}$ .

We may talk, e.g., of open sets of games.

#### Proposition 23 (Jansen, 1981b, V. 08)

- a) The set of bimatrix games with a unique Nash equilibrium is open.
- b) The set of 3-player games with a unique equilibrium is not open, nor is the set of symmetric bimatrix games with a unique symmetric equilibrium.
- c) The set of N-player games with a unique correlated equil. is open.

# Quasi-strict equilibria

Recall:  $\sigma$  is an equilibrium if for any player i, any  $s_i \in S_i$ :

$$\sigma_i(s_i) > 0 \Rightarrow s_i$$
 best-reply to  $\sigma_{-i}$ 

That is:  $Supp(\sigma_i) \subset \{ \text{ Pure best replies to } \sigma_{-i} \}$ 

#### Definition 24

An equilibrium  $\sigma$  is quasi-strict if for any i, any  $s_i \in S_i$ :

$$s_i$$
 best-reply to  $\sigma_{-i} \Rightarrow \sigma_i(s_i) > 0$ 

That is:  $Supp(\sigma_i) \supset \{ \text{ Pure best replies to } \sigma_{-i} \}$ 



### Examples

$$\begin{array}{ccc}
 & & L & R \\
T & & \begin{pmatrix} 1,1 & 0,0 \\ 1,0 & 1,1 \end{pmatrix}
\end{array}$$

(T, L) not quasi-strict; (B,R) quasi-strict, actually strict.

$$\begin{array}{cccc} & & L & R_1 & R_2 \\ T & & \begin{pmatrix} 1,1 & 0,0 & 0,0 \\ 1,0 & 2,0 & 0,2 \\ 1,0 & 0,2 & 2,0 \end{pmatrix} \\ \end{array}$$

 $(\frac{1}{2}B_1 + \frac{1}{2}B_2, \frac{1}{2}R_1 + \frac{1}{2}R_2)$  not strict but quasi-strict.



### Some lemmas

#### Lemma 25 (Jansen, 1981b), Norde)

A unique equilibrium of a bimatrix game is quasi-strict.

#### Lemma 26 (Jansen, 1981b)

If a bimatrix game has two equilibria with the same support, it has a non quasi-strict equilibrium

Let  $\sigma$  be unique NE of bimatrix game G. Consider sequence of games  $G_k \to G$  and of equilibria  $\sigma_k$  of  $G_K$  such that  $\sigma_k \to \sigma$ .

#### Lemma 27 (Jansen, 1981b)

If  $\sigma$  is quasi-strict, then for k large enough,  $\sigma_k$  has the same support as  $\sigma$ , is quasi-strict, and the unique equilibrium of  $G_k$ .



# Summing up

Normal-form generically, finite number of Nash equilibria, with nice properties. In full generality, more complicated.

In zero-sum games and bimatrix games, Nash equilibria have a special structure.

In *n*-player games, seemingly little structure beyond semi-algebraicity.

Correlated equilibria simpler geometrically.

Some relations: Nash equilibria on the boundary of correlated equilibrium polytope, though not true in payoff space.

Sets of equilibria may vary under small perturbations, but some properties robust, e.g., having a unique Nash equilibrium for bimatrix games.

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