# Nash Equilibria and Unbounded Games 

Paulo Oliva<br>Queen Mary University of London

CiE 2015
30 June, Bucharest

## Joint work with...



## Plan

1. Players
2. Simultaneous Games
3. Equilibria
4. (Infinite) Sequential Games

## Running Example

## A Simple Game

- Two contestants $\{\mathrm{A}, \mathrm{B}\}$

- Three judges $\left\{\mathrm{J}_{1}, \mathrm{~J}_{2}, \mathrm{~J}_{3}\right\}$
- Judge $J_{1}$ prefers $A>B$
- Judge $\mathrm{J}_{2}$ prefers $B>A$

- Judge $J_{3}$ wants to vote for the winner


## Matrix Representation

| $\boldsymbol{J}_{1} \mathrm{~J}_{2} \backslash \mathrm{~J}_{3}$ | $\mathbf{A}$ | $\mathbf{B}$ |
| :---: | :---: | :---: |
| AA | $1,0,1$ | $1,0,0$ |
| AB | $1,0,1$ | $0,1,1$ |
| BA | $1,0,1$ | $0,1,1$ |
| BB | $0,1,0$ | $0,1,1$ |

## Five Judges

| $J_{1} J_{2} J_{3} \backslash J_{4} J_{5}$ | AA | AB | BA | BB |
| :---: | :---: | :---: | :---: | :---: |
| AAA | $1,1,0,1,1$ | $1,1,0,1,1$ | $1,1,0,0,1$ | $1,1,0,0,1$ |
| AAB | $1,1,0,1,1$ | $1,1,0,1,1$ | $1,1,0,0,1$ | $0,0,1,1,0$ |
| ABA | $1,0,0,1,1$ | $1,0,0,1,1$ | $1,0,0,0,1$ | $0,1,1,1,0$ |
| ABB | $1,0,0,1,1$ | $0,1,1,0,0$ | $0,1,1,1,0$ | $0,1,1,1,0$ |
| BAA | $1,1,0,1,1$ | $1,1,0,1,1$ | $1,1,0,0,1$ | $0,0,1,1,0$ |
| BAB | $1,1,0,1,1$ | $0,0,1,0,0$ | $0,0,1,1,0$ | $0,0,1,1,0$ |
| BBA | $1,0,0,1,1$ | $0,1,1,0,0$ | $0,1,1,1,0$ | $0,1,1,1,0$ |
| BBB | $0,1,1,0,0$ | $0,1,1,0,0$ | $0,1,1,1,0$ | $0,1,1,1,0$ |

## Representation vs Model

- Normal-form matrix representations are good for calculating properties of games, e.g. equilibria
- Not so good for modelling the 'goals' of players


Matrix Representation

| J1 J2 $\mathbf{~ J 3}$ | A | B |
| :---: | :---: | :---: |
| AA | $1,0,1$ | $1,0,0$ |
| AB | $1,0,1$ | $0,1,1$ |
| BA | $1,0,1$ | $0,1,1$ |
| BB | $0,1,0$ | $0,1,1$ |

## Modelling Language

- Formal (precise and subject to manipulation)
- Expressive (can capture different ‘situations')
- Faithful (captures precisely the game)
- High level (we can understand)
- Modular (whole built of individual parts)

Modelling Players

## Concrete Context

- Assume rules of the game are fixed
- If judges 1 and 2 fix their moves, say $A$ and $B$, that defines a concrete context for judge 3
- If judge 3 chooses A then A wins
- If judge 3 chooses B then B wins


## Abstract Context

- Assume a player is choosing moves in $X$ having in mind an outcome in $R$
- Abstract contexts are functions $f: X \rightarrow R$
- Every concrete context determines an abstract one


## Abstract vs Concrete

- Note: In a particular game, for particular opponents, some abstract contexts might not arise

| J1 J2 $\mathbf{~ J 3}$ | $\mathbf{A}$ | $\mathbf{B}$ |
| :---: | :---: | :---: |
| $\mathbf{A A}$ | $1,0,1[A]$ | $1,0,0[A]$ |
| $\mathbf{A B}$ | $1,0,1[A]$ | $0,1,1[B]$ |
| $\mathbf{B A}$ | $1,0,1[A]$ | $0,1,1[B]$ |
| $\mathbf{B B}$ | $0,1,0[B]$ | $0,1,1[B]$ |

- In this game there are three abstract contexts for judge 3 (but four concrete ones)


## Player

- Assume players are choosing moves in X having in mind an outcome in R
- Players will be modelled as mappings from abstract contexts to good moves

$$
(X \rightarrow R) \rightarrow P(X)
$$

- Slogan: To know a player is to know his optimal moves in any possible abstract context


## Our Three Judges

- $X=R=\{A, B\}$
- Judge 1 is argmax : $(X \rightarrow R) \rightarrow P(X)$ with respect to the ordering $A>B$
- Judge 2 is argmax : $(X \rightarrow R) \rightarrow P(X)$ with respect to the ordering $B>A$
- Judge 3 is fix : $(X \rightarrow R) \rightarrow P(X)$

$$
f i x(p)=\{x: p(x)=x\}
$$

type Player r x = (x -> r) -> [x]
data Cand $=\mathrm{A} \mid \mathrm{B}$ deriving (Eq,Ord,Enum,Show)
type Judge $\mathrm{x}=$ Player Cand x
cand = enumFrom A -- List of candidates [A, B,..]
-- Judge that prefer A > B
argmax1 :: Judge Cand
$\operatorname{argmax} 1 \mathrm{p}=[\mathrm{x} \mid \mathrm{x}<-$ cand, $\mathrm{p} \times==\operatorname{minimum~(map~p~cand)~]~}$
-- Judge that prefer B > A argmax2 :: Judge Cand
$\operatorname{argmax} 2 \mathrm{p}=[\mathrm{x} \mid \mathrm{x}<-$ cand, $\mathrm{p} \times$ == maximum (map p cand) ]
-- Judge that wants to vote for the winner
fix :: Judge Cand
fix $p=[x \mid x<-$ cand, $p \times=x]$
Implementing in Haskell

## Simultaneous Games

## The Outcome Function

- Outcome function = map from moves to outcome

$$
X_{1} \times \ldots \times X_{n} \rightarrow R
$$

- Suppose we change the rules of the game so that the candidate with least votes wins
* If $J_{1}$ wants $A$ to win he better vote for $B$
* If $J_{2}$ wants $B$ to win he better vote for $A$
* No change to selection function representation!


## Higher-order Game

- Number of players: n
- Types: moves ( $X_{1}, \ldots, X_{n}$ ) and outcome ( $R$ )
- Selection functions for each player $\mathrm{i}=1$...n

$$
\varepsilon_{i}:\left(X_{i} \rightarrow R\right) \rightarrow P\left(X_{i}\right)
$$

- An outcome function

$$
q: X_{1} \times \ldots \times X_{n} \rightarrow R
$$

## Example 1

- Number of players: 3
- $X_{1}=X_{1}=X_{3}=R=\{A, B\}$
- Player 1, argmax : $\left(X_{1} \rightarrow R\right) \rightarrow P\left(X_{1}\right)$, with $A>B$
- Player 2, argmax : $\left(\mathrm{X}_{2} \rightarrow \mathrm{R}\right) \rightarrow \mathrm{P}\left(\mathrm{X}_{2}\right)$, with $\mathrm{B}>\mathrm{A}$
- Player 3, fix : $\left(X_{3} \rightarrow R\right) \rightarrow P\left(X_{3}\right)$
- $\mathrm{q}\left(\mathrm{x}_{1}, \mathrm{x}_{2}, \mathrm{x}_{3}\right)=$ majority $\left(\mathrm{x}_{1}, \mathrm{x}_{2}, \mathrm{x}_{3}\right)$


## Example 2

- Number of players: 5
- $X_{1}=X_{1}=X_{3}=X_{4}=X_{5}=R=\{A, B\}$
- Player 1 and 5 are argmax, with $A>B$
- Player 3 is argmax, with $B>A$
- Player 2 and 4 are fix
- $q\left(x_{1}, x_{2}, x_{3}, x_{4}, x_{5}\right)=$ majority $\left(x_{1}, x_{2}, x_{3}, x_{4}, x_{5}\right)$


## Modelling Language

- Formal (precise and subject to manipulation)
- Expressive (can capture different 'situations')
- Faithful (captures precisely the game)
- High level (we can understand)
- Modular (whole built of individual parts)


## Modelling Equilibrium Concepts

## Equilibrium Strategies

- Judge $J_{1}$ prefers $A>B$
- Judge $\mathrm{J}_{2}$ prefers $B>A$
- Judge $J_{3}$ wants to vote for the winner

| $J_{1} J_{2} \backslash \boldsymbol{J}_{3}$ | $\mathbf{A}$ | $\mathbf{B}$ |
| :---: | :---: | :---: |
| $\mathbf{A A}$ | $1,0,1$ | $1,0,0$ |
| $\mathbf{A B}$ | $1,0,1$ | $0,1,1$ |
| BA | $1,0,1$ | $0,1,1$ |
| BB | $0,1,0$ | $0,1,1$ |

## (Classic) Nash Equilibrium

- Let the payoff function of player i be

$$
q_{i}: X_{1} \times \ldots \times X_{n} \rightarrow \text { Real }
$$



- A choice of moves is in equilibrium if no player has an incentive to deviate from his/her choice
- Player i has no incentive to deviate if

$$
q_{i}\left(x_{1}, \ldots, x_{n}\right) \geq q_{i}\left(x_{1}, \ldots, y, \ldots, x_{n}\right) \text {, for all } y \text { in } x_{i}
$$

## Nash Going High

- Player i has no incentive to deviate if

$$
q_{i}\left(x_{1}, \ldots, x_{n}\right) \geq q_{i}\left(x_{1}, \ldots, y_{1}, \ldots, x_{n}\right), \text { for all } y \in x_{i}
$$

- Equivalent to

$$
x_{i} \in \operatorname{argmax}\left(\lambda y . q_{i}\left(x_{1}, \ldots, y, \ldots, x_{n}\right)\right)
$$

- (Higher-order) player i has no incentive to deviate if

$$
x_{i} \in \varepsilon_{i}\left(\lambda y \cdot q\left(x_{1}, \ldots, y_{1}, \ldots, x_{n}\right)\right)
$$

## Equilibrium Checker

-- Unilateral context
cont :: ([Cand] -> Cand) -> [Cand] -> Int -> Cand -> Cand cont q xs $\mathrm{i} \mathrm{x}=\mathrm{q}$ \$ (take i xs ) $++[\mathrm{x}]++(\mathrm{drop}(\mathrm{i}+1) \mathrm{xs})$
-- Equilibrium checking = Global player
global :: [Judge Cand] -> Judge [Cand]
global js q = [ xs | xs <- plays, all (good xs) (zip [0..] js) ]
where

```
n = length js
plays = sequence (replicate n cand)
good xs (i,e) = elem (xs !! i) (e (cont q xs i))
```


## Sequential Games

## Player's Strategy

- Player's description

$$
(X \rightarrow R) \rightarrow P(X)
$$

- Player's strategy

$$
(X \rightarrow R) \rightarrow X
$$

## Selection Monad

- Fix R. The type mapping

$$
J X=(X \rightarrow R) \rightarrow X
$$

is a strong monad

```
data J r x = J { selection :: (x -> r) -> x }
monJ :: J r x -> (x -> J r y) -> J r y
monJ e f = J (\p -> b p (a p))
    where
    a p=selection e $(\x -> p (b p x))
instance Monad (J r) where
    return x = J(\p >> x)
    e >>= f = monJ e f
```


## Product of Selection Functions

- Strong monads support two operations

$$
(T X) \times(T Y) \rightarrow T(X \times Y)
$$

- So we have two "products" of type

$$
(J X) \times(J Y) \rightarrow J(X \times Y)
$$

- Game theoretic interpretation: Sequentially combining players' strategies!


## Iterated Product

## sequence :: Monad m => [m a] -> m [a]

base Prelude, base Control.Monad
Evaluate each action in the sequence from left to right, and collect the results.

- One product $(J X) \times(J Y) \rightarrow J(X \times Y)$ can be iterated

$$
\Pi_{\mathrm{i}} \mathrm{~J} \mathrm{X}_{\mathrm{i}} \rightarrow \mathrm{~J} \Pi_{\mathrm{i}} \mathrm{X}_{\mathrm{i}}
$$

- Backward induction: Calculates sub-game perfect equilibria of sequential games (Escardó/O'2012)


## References

- Escardó and Oliva Selection functions, bar recursion and backward induction. Mathematical Structures in Computer Science, 20(2):127-168, 2010
- Escardó and Oliva Sequential games and optimal strategies. Proceedings of the Royal Society A, 467:1519-1545, 2011
- Escardó and Oliva Computing Nash equilibria of unbounded games Proc. of Turing Centenary Conference, EPiC Series, vol. 10, 53-65, 2012
- Hedges, Oliva, Sprits, Zahn, and Winschel A higher-order framework for decision problems and games ArXiv, http://arxiv.org/abs/1409.7411, 2014

