## Sequential Games and Optimal Strategies

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# Outline



Quantifiers and Selection Functions

O Playerless Games

Computing Optimal Strategies



# Outline



Quantifiers and Selection Functions

3 Playerless Games

4 Computing Optimal Strategies



# Single-player Games

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Player-based Games

Two-player Games

#### Two players: Black and White





### Two-player Games

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Possible outcomes:

- Black wins
- White wins
- Draw





Player-based Games

### Two-player Games

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**Strategy**: Choice of move at round k given previous moves





Two players: John and Julia







Two players: John and Julia

John splits a cake. Julia chooses one of the two pieces



# Another Game



Two players: John and Julia

John splits a cake. Julia chooses one of the two pieces

#### Possible outcomes:

- John gets N% of the cake (John's payoff)
- Julia gets (100 N)% of the cake (Julia's payoff)



# Another Game



Two players: John and Julia

John splits a cake. Julia chooses one of the two pieces

#### Possible outcomes:

- John gets N% of the cake (John's payoff)
- Julia gets (100 N)% of the cake (Julia's payoff)

Best strategy for John is to split cake into half

It is not a "winning strategy" but it is an **optimal strategy** It maximises his payoff Player-based Games

### Traditional Game Theory

Game defined via:

- $\bullet$  Set of players P
- Sets of **moves**  $X_i$  for each player  $i \in P$
- Set of **outcomes** *R*
- **Preference relations** on R for each player  $i \in P$
- Outcome function mapping plays to outcomes

# Set of Players vs Number of Rounds

Number of players is not essential

It is important what the "goal" at each round is

Rounds with "same goal" mean played by "same player"



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#### How to describe the goal at a particular round?

You could say: The goal is to win!

But maybe this is not possible (or might not even make sense) Instead, the goal should be described as

a choice of outcome from each set of possible outcomes

### As in...

#### Q: How much would you like to pay for your flight?





# As in...

# Q: How much would you like to pay for your flight? A: As little as possible!





# Target function

If R = set of outcomes and X = set of possible moves then

$$\phi \in (X \to R) \to R$$

describes the desired outcome  $\phi p \in R$  given that the outcome

of the game  $px \in R$  for each move  $x \in X$  is given.



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In the example:

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- X = possible flights
- R = real number
- $X \rightarrow R = price of each flight$ 
  - = minimal value functional



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Quantifiers and Selection Functions

#### **Generalised quantifiers**

$$\phi : (X \to R) \to R$$



Quantifiers and Selection Functions

#### **Generalised quantifiers**

$$\phi : \ (X \to R) \to R$$

#### For instance

Operation	$\phi$	:	$(X \to R) \to R$
Quantifiers	$\forall_X, \exists_X$	:	$(X \to \mathbb{B}) \to \mathbb{B}$
Double negation	$\neg \neg X$	:	$(X \to \bot) \to \bot$
Integration	$\int_0^1$	:	$([0,1] \to \mathbb{R}) \to \mathbb{R}$
Supremum	$\sup_{[0,1]}$	:	$([0,1] \to \mathbb{R}) \to \mathbb{R}$
Limit	lim	:	$(\mathbb{N} \to R) \to R$
Fixed point operator	$\operatorname{fix}_X$	:	$(X \to X) \to X$

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#### **Generalised quantifiers**

$$\phi: (X \to R) \to R \qquad (\equiv K_R X)$$

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Operation	$\phi$	:	$(X \to R) \to R$
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#### Theorem (Mean Value Theorem)

For any  $p \in C[0,1]$  there is a point  $a \in [0,1]$  such that

$$\int_0^1 p = p(a)$$

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#### Theorem (Maximum Value Theorem)

For any  $p \in C[0,1]$  there is a point  $a \in [0,1]$  such that  $\sup p = p(a)$ 



#### Theorem (Witness Theorem)

For any  $p: X \to \mathbb{B}$  there is a point  $a \in X$  such that

$$\exists x^X p(x) \iff p(a)$$

(similar to Hilbert's  $\varepsilon$ -term).



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(similar to Hilbert's  $\varepsilon$ -term).

#### Theorem (Counter-example Theorem)

For any  $p: X \to \mathbb{B}$  there is a point  $a \in X$  such that

 $\forall x^X p(x) \iff p(a)$ 

(a is counter-example to p if one exists).

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Quantifiers and Selection Functions

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#### Definition (Selection Functions)

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holds for all  $p: X \to R$ 



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#### Definition (Attainable Quantifiers)

A generalised quantifier  $\phi : KX$  is called **attainable** 

if it has a selection function  $\varepsilon\colon JX$ 



### For Instance

•  $\sup\colon K_{\mathbb{R}}[0,1]$  is an attainable quantifier as  $\sup(p) = p(\mathrm{argsup}(p))$ 

where argsup:  $J_{\mathbb{R}}[0,1]$ 





#### For Instance

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• fix:  $K_X X$  is an attainable quantifier as

$$\label{eq:fix} \begin{split} \mathsf{fix}(p) &= p(\mathsf{fix}(p)) \end{split}$$
 where  $\mathsf{fix} \colon J_X X \; (= K_X X)$ 

Quantifiers and Selection Functions

### Selection Functions and Generalised Quantifiers



Every selection function  $\varepsilon \colon JX$  defines a quantifier  $\overline{\varepsilon} \colon KX$ 

$$\overline{\varepsilon}(p) = p(\varepsilon(p))$$



### Selection Functions and Generalised Quantifiers





Not all quantifiers are attainable, e.g.  $R=\{0,1\}$ 

$$\phi(p) = 0$$



### Selection Functions and Generalised Quantifiers





Different  $\varepsilon$  might define same  $\phi,$  e.g. X=[0,1] and  $R=\mathbb{R}$ 

$$\varepsilon_0(p) = \mu x \cdot \sup p = p(x)$$
  

$$\varepsilon_1(p) = \nu x \cdot \sup p = p(x)$$

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Playerless Games

# Finite Sequential Games

#### Definition (A tuple $(R, (X_i)_{i < n}, (\phi_i)_{i < n}, q)$ where)

- R is the set of **possible outcomes**
- $X_i$  is the set of **available moves** at round i
- $\phi_i \colon (X_i \to R) \to 2^R$  is the **goal quantifier** for round *i*
- $q: \prod_{i=0}^{n-1} X_i \to R$  is the outcome function



Playerless Games

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#### Definition (Strategy)

Family of mappings

$$\operatorname{next}_k \colon \prod_{i=0}^{k-1} X_i \to X_k$$



# **Optimal Strategies**

#### Definition (Strategic Play)

Given strategy next<sub>k</sub> and partial play  $\vec{a} = a_0, \ldots, a_{k-1}$ , the strategic extension of  $\vec{a}$  is  $\mathbf{b}^{\vec{a}} = b_k^{\vec{a}}, \ldots, b_{n-1}^{\vec{a}}$  where

$$b_i^{\vec{a}} = \mathsf{next}_i(\vec{a}, b_k^{\vec{a}}, \dots, b_{i-1}^{\vec{a}})$$

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#### Definition (Optimal Strategy)

Strategy next<sub>k</sub> is **optimal** if for any partial play  $\vec{a}$ 

$$q(\vec{a}, \mathbf{b}^{\vec{a}}) \in \phi_k(\lambda x_k.q(\vec{a}, x_k, \mathbf{b}^{\vec{a}, x_k}))$$



Examples

#### Example (Nash Equilibrium with common payoff)

Moves  $X_i$ Outcomes RGoal quantifier  $\phi_i$ Outcome function q Sets of moves Payoff  $\mathbb{R}$ Maximal value function Payoff function  $q: \prod_{i=0}^{n-1} X_i \to \mathbb{R}$ 



## Examples

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#### **Optimal strategy**

 $\mathsf{next}_k(x_0,\ldots,x_{k-1}) = \operatorname{argsup}_{x_k} \operatorname{sup}_{x_{k+1}} \ldots \operatorname{sup}_{x_{n-1}} q(\vec{x})$ 



# Examples

#### Example (Satisfiability)

Moves  $X_i$ Outcomes RGoal quantifier  $\phi_i$ Outcome function q Booleans  $\mathbb{B}$ Boolean  $\mathbb{B}$ Existential quantifier  $\exists : K_{\mathbb{B}}\mathbb{B}$ Formula  $q(x_0, \ldots, x_{n-1})$ 



# Examples

#### Example (Satisfiability)

Moves  $X_i$ Outcomes RGoal quantifier  $\phi_i$ Outcome function q Booleans  $\mathbb{B}$ Boolean  $\mathbb{B}$ Existential quantifier  $\exists : K_{\mathbb{B}}\mathbb{B}$ Formula  $q(x_0, \ldots, x_{n-1})$ 

#### **Optimal strategy**

next<sub>k</sub> $(x_0, ..., x_{k-1}) = x_k$  such that  $\exists x_{k+1} ... \exists x_{n-1}q(\vec{x})$ (if possible)



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Three players, payoff function  $q: X \times Y \times Z \to \mathbb{R}^3$ Each player is trying to maximise their own payoff



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Let  $\operatorname{argmax}_i : (X_i \to \mathbb{R}^n) \to X_i$  find a point  $x \in X_i$ 

at which the function  $p: X_i \to \mathbb{R}^n$  has maximal *i*-value

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$$\mathsf{BI}(s) \stackrel{\Pi_{j=|s|}^{n-1}X_j}{=} \begin{cases} [] & \text{if } n = |s| \\ c_s * \mathsf{BI}(s * c_i) & \text{otherwise} \end{cases}$$

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where  $c_s = \operatorname{argmax}_{|s|}(\lambda x.q(s * x * \mathsf{BI}(s * x)))$ 

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where  $c_s = \operatorname{argmax}_{|s|}(\lambda x.q(s * x * \mathsf{BI}(s * x)))$ 

Each player's optimal strategy can be described as

$$\mathsf{next}_i(s) = \operatorname{argmax}_{|s|}(\underbrace{\lambda x.q(s * x * \mathsf{BI}(s * x))}_{p: X_{|s|} \to \mathbb{R}^n}))$$

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Let

 $s: X^* \qquad q: X^* \to R \qquad \varepsilon_s: J_R X$ 



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Given  $s, \omega$  and  $\varepsilon_s$  define

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where  $c = \varepsilon_s(\lambda x.q(s * x * \mathsf{BR}(s * x)))$ 

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$$s: X^* \qquad q: X^* \to R \qquad \boxed{\varepsilon_s: J_R X}$$

Given  $s, \omega$  and  $\varepsilon_s$  define

$$\mathsf{BR}(s) \stackrel{X^*}{=} \begin{cases} [] & \text{if } n = |s| \\ c * \mathsf{BR}(s * c) & \text{otherwise} \end{cases}$$

where  $c = \varepsilon_s(\lambda x.q(s * x * \mathsf{BR}(s * x)))$ 

Spector actually defined a much more general recursion scheme where stopping condition depends on the play *s* 

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### Main Theorem

#### Theorem (Escardó/O.'2011)

Given game  $(R, X_i, \phi_i, q)$ , if  $\phi_i$  are attainable with selection functions  $\varepsilon_i$  then

$$\mathsf{next}(s) \stackrel{X}{=} (\mathsf{BR}(s))_0$$

is an optimal strategy, i.e.

$$q(s * \mathbf{b}^s) \in \phi_{|s|}(\lambda x.q(s * x * \mathbf{b}^{s*x}))$$

where  $\mathbf{b}^s$  is the strategic extension of partial play s

Computing Optimal Strategies

# Summary and Further Connections

• New notion of sequential game based on quantifiers



- Computing Optimal Strategies

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#### - Computing Optimal Strategies

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- New notion of sequential game based on quantifiers
- Generalisation of backward induction, based on selection functions, calculates **optimal strategies**
- Relates Nash equilibrium, backtracking, Bekič's lemma
- Connection to proof theory

 $KA \rightarrow A$  corresponds to **double negation elimination** 

 $JA \to A$  corresponds to  $\mbox{Peirce's law}$ 



#### - Computing Optimal Strategies

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 $K\!A \to A$  corresponds to double negation elimination

 $JA \to A$  corresponds to  $\mbox{Peirce's law}$ 

• Calculation of strategies in general corresponds to Spector's bar recursion, used in the proof of **consistency of classical analysis** 



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