### Sequential Games and Optimal Strategies

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#### (based on joint work with M. Escardó)

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Loughborough University Wednesday, 17 November 2010









• Program verification and separation logic B Cook, P O'Hearn, H Yang, D Distefano





- Program verification and separation logic B Cook, P O'Hearn, H Yang, D Distefano
- Verification of continuous dynamical systems U Martin, P Oliva





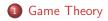
- Program verification and separation logic B Cook, P O'Hearn, H Yang, D Distefano
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- Mathematical logic and proof theory E Robinson, P Oliva





- **Program verification and separation logic** *B Cook, P O'Hearn, H Yang, D Distefano*
- Verification of continuous dynamical systems U Martin, P Oliva
- Mathematical logic and proof theory E Robinson, P Oliva
- Concurrency, complexity theory, information theory K Honda, S Riis, P Malacaria

## Outline

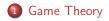








### Outline



Quantifiers and Selection Functions

#### 3 Generalisation

- Early development in the 19th century
- Formal approach with von Neumann (1930's)



#### John von Neumann



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- Formal approach with von Neumann (1930's)
- n players
- n strategy sets  $X_1, \ldots, X_n$
- payoff function  $q \colon \vec{X} \to \mathbb{R}^n$



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John von Neumann

How should players choose their strategies in order to maximise their individual payoffs?



Sequential Games and Optimal Strategies

Game Theory

### Game Theory





## Game Theory



#### Penalties

Two players

Strategy sets 
$$X_1 = X_2 = \{L, R\}$$

Payoff function



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- No winning strategy!
- What about strategies in equilibrium?



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#### Definition (Nash)

Strategy profile  $\vec{x}$  is in equilibrium if no player has an incentive to unilaterally change his strategy.



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#### Definition (Nash)

Strategy profile  $\vec{x}$  is in equilibrium if no player has an incentive to unilaterally change his strategy.

The "penalty" example shows that strategy profiles in equilibrium not necessarily exist either.



What if players choose "mixed" strategies

 player chooses probability distribution on strategies



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Mixed strategies in equilibrium always exist.



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#### Theorem (Nash)

Mixed strategies in equilibrium always exist.

The "penalty" example is again an illustration of this: Players randomly choosing left or right is best they can do.

### Simultaneous versus Sequential Games

- That's all in the case of simultaneous games
- With sequential games things are simpler and nicer
- Strategies: mappings from previous moves to current move
- Similar definition of Nash equilibrium



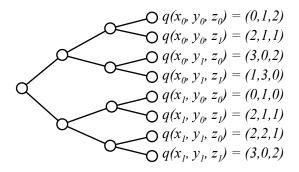
### Simultaneous versus Sequential Games

- That's all in the case of simultaneous games
- With sequential games things are simpler and nicer
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But equilibrium always exists and can be computed by a technique called **backward induction** 

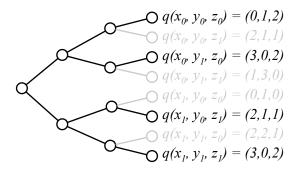
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### **Backward Induction**



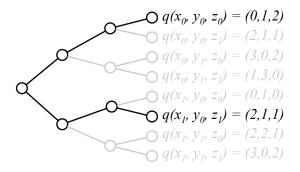


### **Backward Induction**



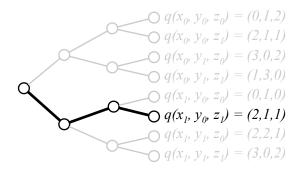


### **Backward Induction**





### **Backward Induction**





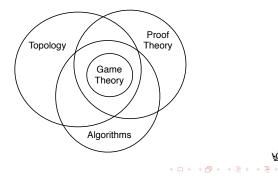
### Our Recent Work

1. Generalised notions of sequential game, Nash equilibrium and backward induction



### Our Recent Work

- 1. Generalised notions of sequential game, Nash equilibrium and backward induction
- 2. Showed how general notions appear in topology, proof theory, and algorithms, amongst others



### Outline





Quantifiers and Selection Functions





Quantifiers and Selection Functions

## Single-player Games

| SUDOKU 数独 Time: 19:09 |   |   |   |     |     |   |        |   |
|-----------------------|---|---|---|-----|-----|---|--------|---|
| 8                     |   | 4 |   | 2   | 9   | 4 |        | 6 |
| 2                     | 5 | 7 | 4 | 1   | 4   |   | 9      | 7 |
| 9                     |   |   | 1 | 5   | 8   |   | 3      | 4 |
| 5                     | 2 | 6 | 7 | 7   |     | 2 | 1      | 3 |
| 4                     |   | 6 |   | 9   |     | 7 |        | 8 |
| 1                     | 1 | 3 | 2 | 4 3 | 4 3 | 7 |        | 5 |
|                       | 9 | 2 | 3 |     | 4   | 5 | 3<br>7 | 6 |
| 3<br>7                | 6 |   |   |     | 1   | 3 | 2      | 1 |
| 3<br>7                | 1 | 4 | 7 |     | 9   | 4 | 3<br>7 | 2 |







Quantifiers and Selection Functions

Two-player Games

#### Two players: Black and White





### Two-player Games

Two players: Black and White

Possible outcomes:

- Black wins
- White wins
- Draw





Two-player Games

Two players: Black and White

Possible outcomes:

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





Two players: John and Julia



### Another Game



Two players: John and Julia

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



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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



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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

# Number of Player 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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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"

#### 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

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# 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!





# Quantifiers

- $R = \mathsf{set} \mathsf{ of outcomes}$
- $X = \mathsf{set}$  of possible moves

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

describes the desired outcome  $\phi p \in R$  given  $p \in X \rightarrow R$ 



# Quantifiers

- $R = {\rm set} \ {\rm of} \ {\rm outcomes}$
- X = set of possible moves

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

describes the desired outcome  $\phi p \in R$  given  $p \in X \rightarrow R$ In the example:

- R = prices (real numbers)
- X = possible flights
- $X \rightarrow R = price of each flight$
- $\phi$  = minimal value functional

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Sequential Games and Optimal Strategies

Quantifiers and Selection Functions

#### Quantifiers

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



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## **Other Examples**

| $2) \rightarrow R$         |
|----------------------------|
| $) \rightarrow \mathbb{R}$ |
| $) \rightarrow \mathbb{R}$ |
| $(2) \to R$                |
| $) \to \mathbb{B}$         |
| $) \rightarrow \perp$      |
| $) \to X$                  |
|                            |

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#### Quantifiers

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

## **Other Examples**

| $\phi$                 | :   | $(X \to R) \to R$                       |
|------------------------|---|---|
| $\sup_{[0,1]}$         | :   | $([0,1] \to \mathbb{R}) \to \mathbb{R}$ |
| $\int_0^1$             | :   | $([0,1] \to \mathbb{R}) \to \mathbb{R}$ |
| lim                    | :   | $(\mathbb{N} \to R) \to R$              |
| $\forall_X, \exists_X$ | :   | $(X \to \mathbb{B}) \to \mathbb{B}$     |
| $\neg \neg X$          | :   | $(X \to \bot) \to \bot$                 |
| $\operatorname{fix}_X$ | :   | $(X \to X) \to X$                       |
|                        | $ \begin{array}{c} & \\ \sup_{[0,1]} \\ & \int_0^1 \\ \lim \\ \forall_X, \exists_X \\ & \neg \neg X \end{array} $ | $\sup_{[0,1]}$ :                        |

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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

 $\sup p = p(a)$ 



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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

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



#### 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).



#### Theorem (Witness Theorem)

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

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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).

Let  $JX \equiv (X \to R) \to X$ .



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#### Definition (Selection Functions)

 $\varepsilon$ : JX is called a **selection function** for  $\phi$ : KX if

$$\phi(p) = p(\varepsilon p)$$

holds for all  $p: X \to R$ .



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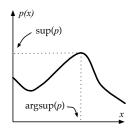
#### Definition (Attainable Quantifiers)

A quantifier  $\phi$ : KX is called **attainable** if it has a selection function  $\varepsilon$ : JX.



## For Instance

• sup: 
$$K_{\mathbb{R}}[0, 1]$$
 is an attainable quantifier  
 $\sup(p) = p(\operatorname{argsup}(p))$   
where  $\operatorname{argsup}: J_{\mathbb{R}}[0, 1].$ 



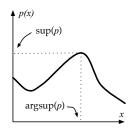


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• fix:  $K_X X$  is an attainable quantifier

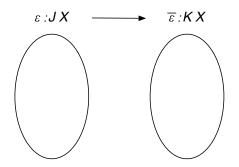
$$\label{eq:fix} \begin{split} \mathsf{fix}(p) &= p(\mathsf{fix}(p)) \end{split}$$
 where  $\mathsf{fix} \colon J_X X \ (= K_X X). \end{split}$ 



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# Selection Functions and Quantifiers

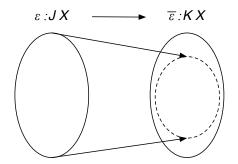


Every selection function  $\varepsilon \colon JX$  defines a quantifier  $\overline{\varepsilon} \colon KX$ 

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



# Selection Functions and Quantifiers

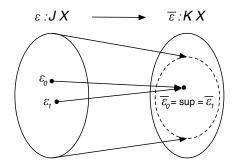


Not all quantifiers are attainable, e.g.  $R=\{0,1\}$ 

$$\phi(p) = 0$$



# Selection Functions and Quantifiers



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

$$\varepsilon_{0}(p) = \mu x. \sup p = p(x)$$

$$\varepsilon_{1}(p) = \nu x. \sup p = p(x)$$

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# Outline



Quantifiers and Selection Functions





# Finite Sequential Games (n rounds)

## 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
- $\phi_i : K_R X_i$  is the **goal quantifier** for round *i*
- $q: \prod_{i=0}^{n-1} X_i \to R$  is the outcome function



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#### Definition (Strategy)

Family of mappings

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



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#### 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  $\vec{a}$ 

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



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A product of selection functions computes optimal strategies



# Standard Game Theory

When quantifiers are  $\max$  or  $\sup$  over finite or compact set Then  $\operatorname{argsup}$  exists (and hence  $\sup$  is attainable)

- ${\sf Generalised} \ {\sf Game} \quad \mapsto \quad {\sf Standard} \ {\sf Game}$
- ${\sf Optimal \ strategy} \quad \mapsto \quad {\sf Strategy \ in \ Nash \ equilibrium} \\$
- Product of  $\operatorname{argsup} \mapsto \mathsf{Backward}$  induction!



## **Fixed Point Theory**

Fixed point operators are their own selection function

- ${\sf Generalised} \ {\sf Game} \quad \mapsto \quad {\sf Operators} \ {\sf on} \ {\sf product} \ {\sf space}$
- Optimal strategy  $\mapsto$  Bekiç's Lemma
- Product of fix's  $\mapsto$  The proof!



# **Proof Theory**

#### Proof interpretation

$$\exists i \leq n \forall x^{X_i} \exists r^R A_i(x, r) \quad \mapsto \quad \forall \varepsilon_{(\cdot)} \exists i \leq n \exists p A_i(\varepsilon_i p, p(\varepsilon_i p))$$



# **Proof Theory**

#### Proof interpretation

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 $\varepsilon{}^{\prime}{\rm s}$  define quantifiers, which partially define a game

Computational interpretation relies on completing the definition of the game so optimal strategy solves problem



# **Proof Theory**

Proof interpretation

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 $\varepsilon$  's define quantifiers, which partially define a game

Computational interpretation relies on completing the

definition of the game so optimal strategy solves problem

Existence of optimal strategy actually implies the consistency of mathematics!



Summary

- Generalised notion of sequential game
- Generalised notion of optimal strategy (equilibrium)
- Product of sel. fct. computes optimal strategies
- Results from fixed point theory, topology, proof theory, etc, can be viewed as optimal strategies in certain games



# References



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