Introduction and Decision Theory

## **Game Theory**

Frédéric KOESSLER

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#### Outline

(September 3, 2007)

- Introduction
- Static Games of Complete Information: Normal Form Games
- Incomplete Information and Bayesian Games
- Behavioral Game Theory and Experimental Economics
- Dynamic Games: Extensive Form Games

#### Game Theory

- Dynamic Games: Extensive Form Games
- Repeated Games
- Negotiation: Non-Cooperative Approach
- Cooperative Game Theory
- Equilibrium Refinement and signaling
- Strategic Information Transmission



Introduction and Decision Theory

## Bibliography

- Camerer (2003) : "Behavioral Game Theory: Experiments on Strategic Interaction"
- Gibbons (1992) : "Game Theory for Applied Economists"
- Myerson (1991) : "Game Theory: Analysis of Conflict"
- Osborne (2004) : "An Introduction to Game Theory"
- Osborne and Rubinstein (1994) : "A Course in Game Theory"

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Non-technical:

- Dixit and Nalebuff (1991) : "Thinking Strategically"
- Nalebuff and Brandenburger (1996) : "Co-opetition"

Interactive decision theory

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- Analysis of conflicts

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Economic, social, political, military, biological situations

Game Theory

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➡ Not necessarily strictly competitive, win-loose situations; zero-sum vs. non-zero-sum games ... image ("loose-loose situation") ...

Introduction and Decision Theory



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(1) ➡ Independent players, strategies, preferences / detailed description, equilibrium concept

(2) coalitions, values of coalitions, binding contracts / axiomatic approach

(3) ➡ we modify the games (rules, transfers, ...) in order to get solutions satisfying some properties like Pareto-optimality, anonymity, .... Contracts, full commitment



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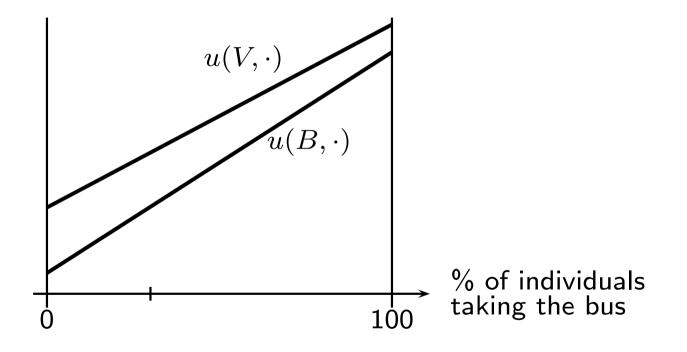
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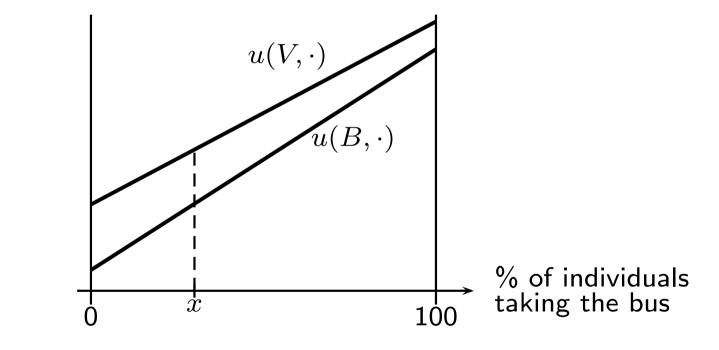
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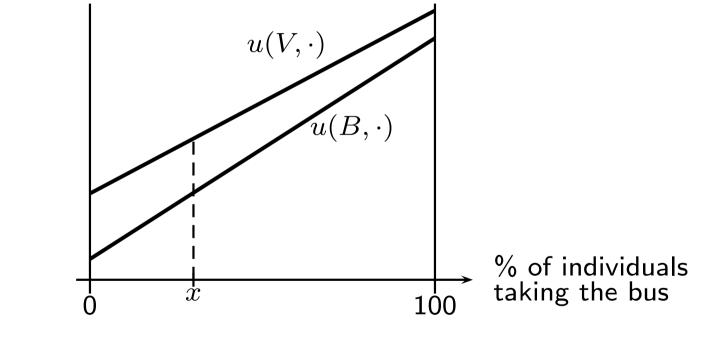


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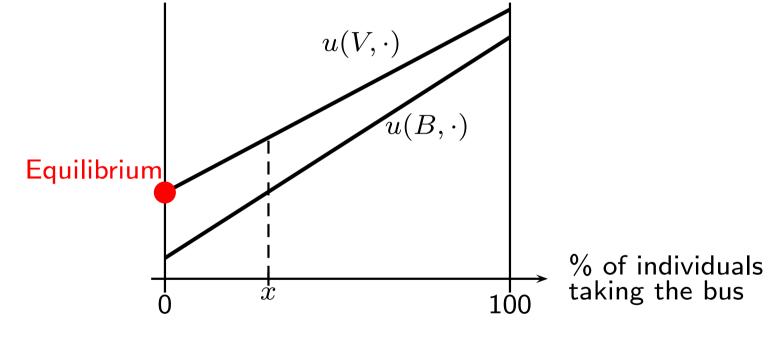
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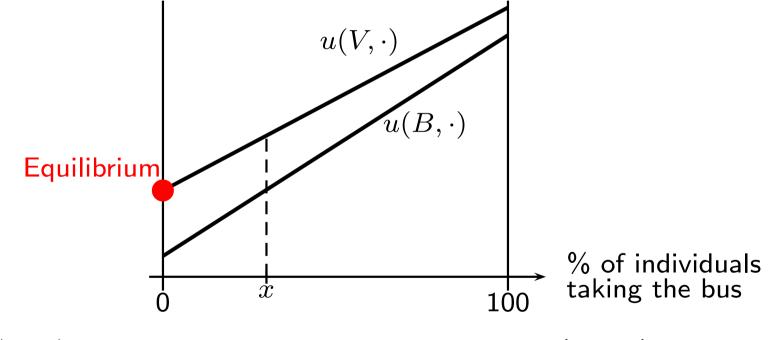
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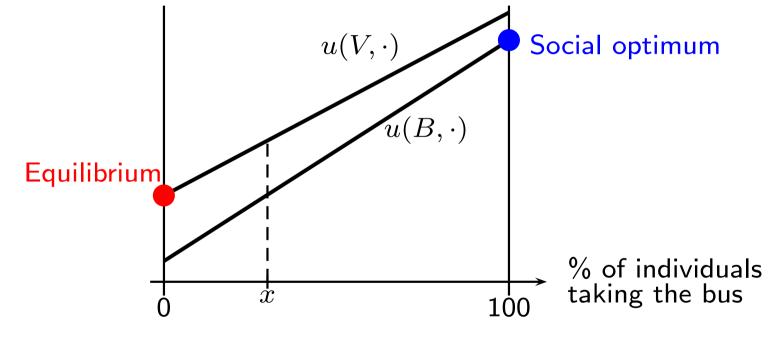
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### First example: Bus vs. Car

N = [0, 1] = population of individuals in a town (players) Possible choices for each individual: "take the car" or "take the bus" (actions) x % take the bus  $\Rightarrow$  payoffs (utilities) u(B, x), u(V, x) (preferences)



u(V,x) > u(B,x) for every  $x \Rightarrow$  everybody takes the car (x = 0) $\Rightarrow u(V,0)$  for everybody  $\Rightarrow$  inefficient comparing to x = 100 Game Theory New policy (taxes, toll, bus lines, ...) Game Theory

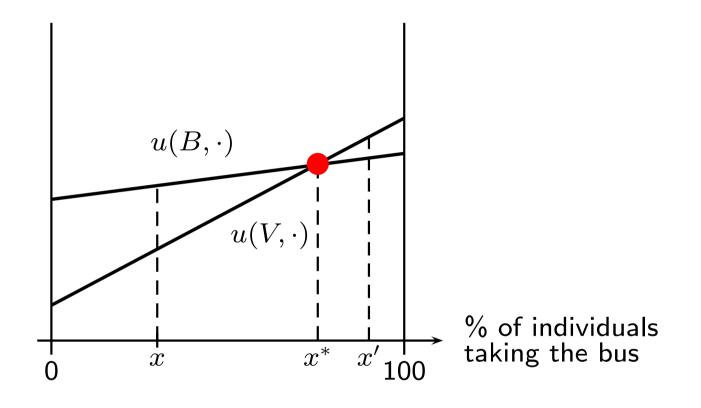
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new setting

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Game Theory New policy (taxes, toll, bus lines, ...)

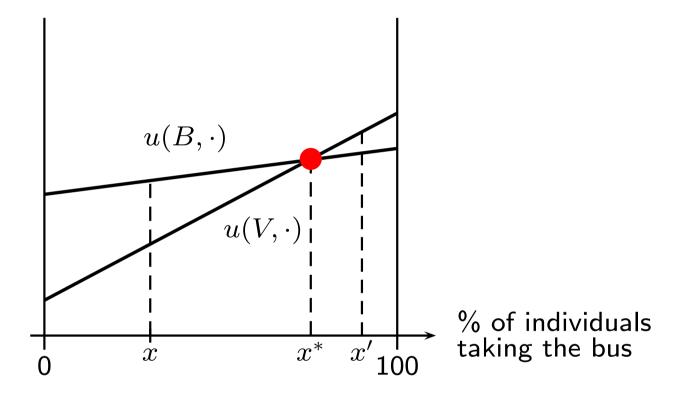
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Introduction and Decision Theory

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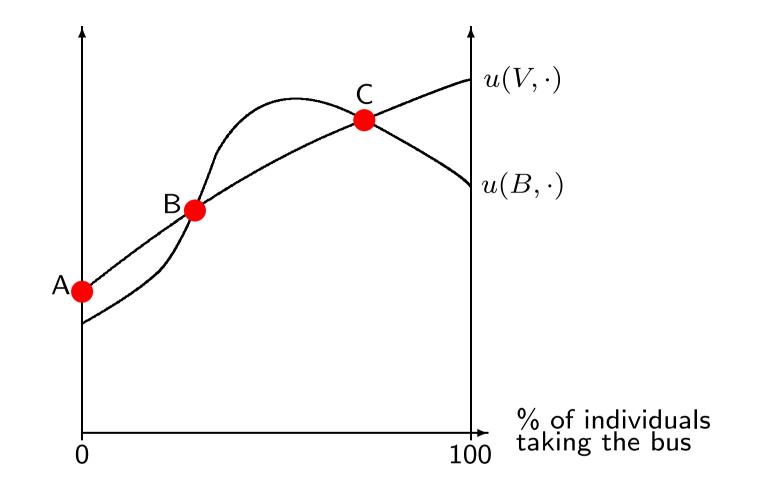
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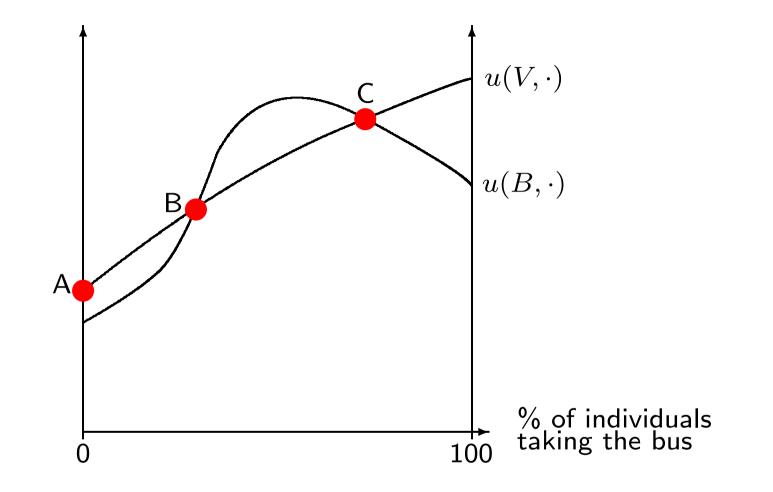
Mew (Nash) equilibrium, more efficient (but still not Pareto optimal)

#### Game Theory Alternative configuration: multiplicity of equilibria

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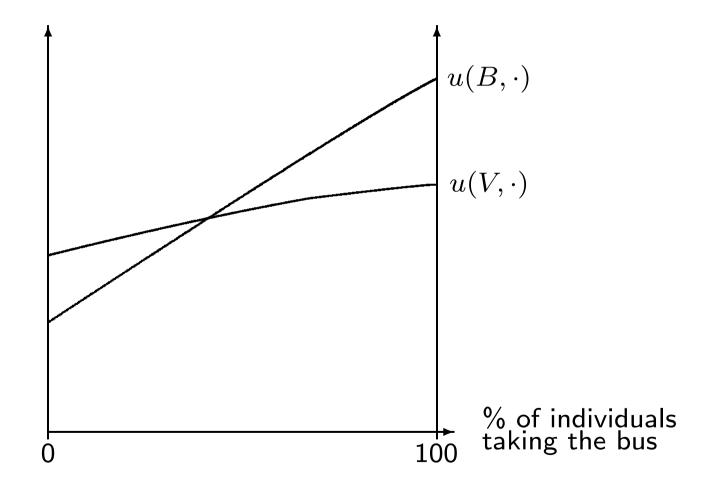
#### Game Theory Alternative configuration: multiplicity of equilibria



- A : stable and inefficient (Pareto dominated) equilibrium
- B : unstable and inefficient equilibrium
- C : stable and efficient equilibrium

Game Theory

A Find the Nash equilibria in the following configuration. Which one is stable? Pareto efficient?



Introduction and Decision Theory



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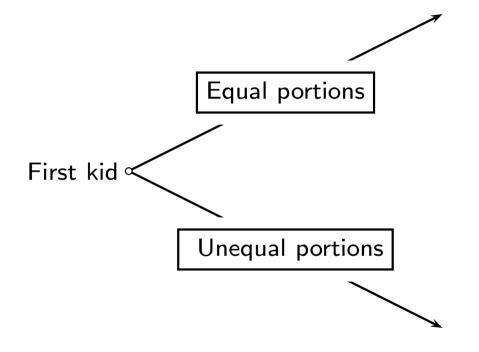
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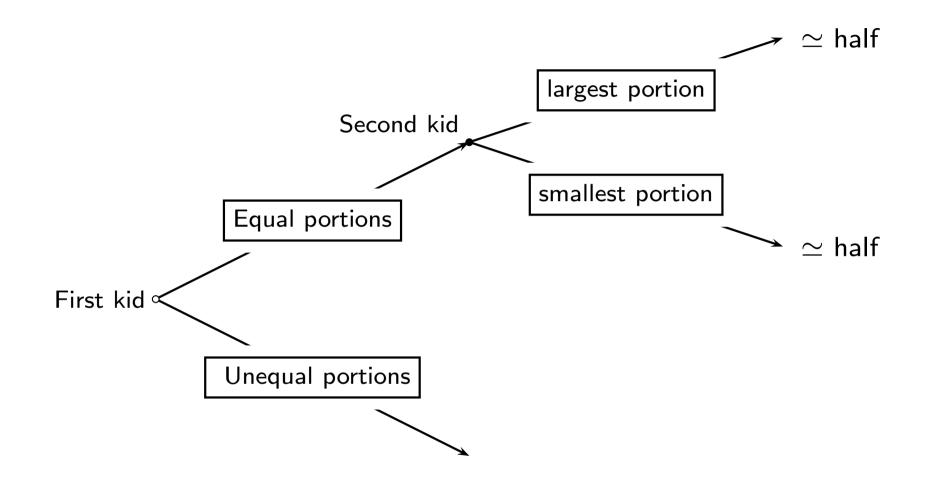
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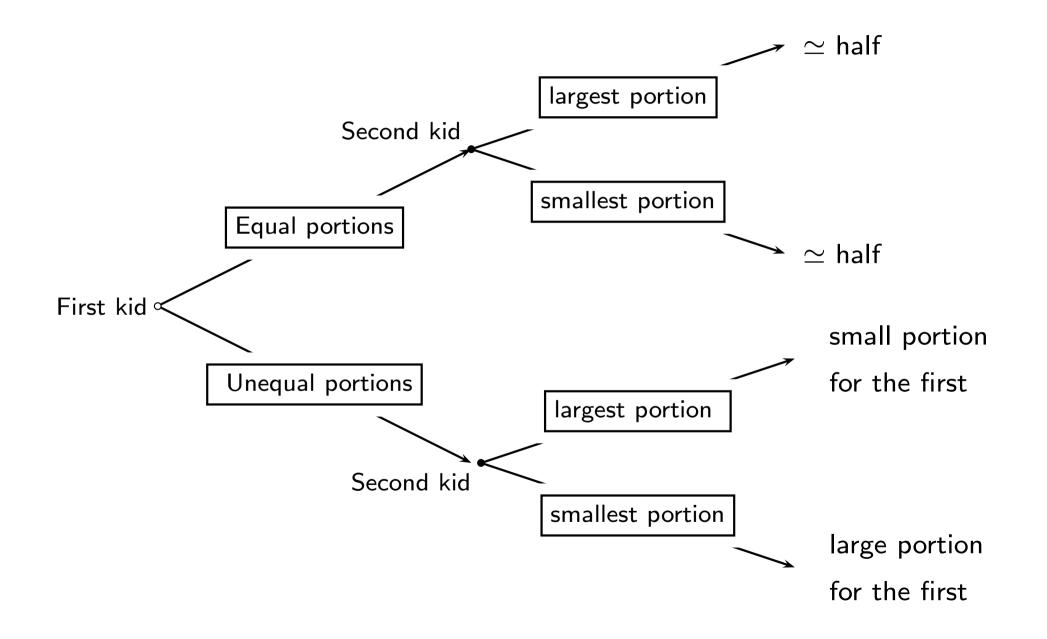
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**Extensive form game** 







Game Theory

Best strategy for the first kid: divide the cake into equal portions

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Fair solution, even if players are egoist, do not care about altruism or equity

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#### $2^{\mathsf{nd}} \mathsf{kid}$

	G	P	$(P \mid E, \ G \mid I)$	$(G \mid E, P \mid I)$
$1^{\sf st}$ kid ${}^E$	$\simeq$ half	$\simeq$ half	$\simeq$ half	$\simeq$ half
	small portion	large portion	small portion	large portion

A Other simple example (except for Charlie Brown) of backward induction:

### image

- Represent this situation into an extensive form game (decision tree) and find players' optimal strategies
- Represent this situation into a normal form game (table of outcomes)





Two firms



Two firms

Two possible projects: a and b

# Third Example: The Strategic Value of Information

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Firm 1 chooses one of the two projects. Firm 2 chooses one of the two projects after having observed firm 1's choice

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Two equally likely states/situations ( $\Pr[\alpha] = \Pr[\beta] = 1/2$ ):

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# Third Example: The Strategic Value of Information

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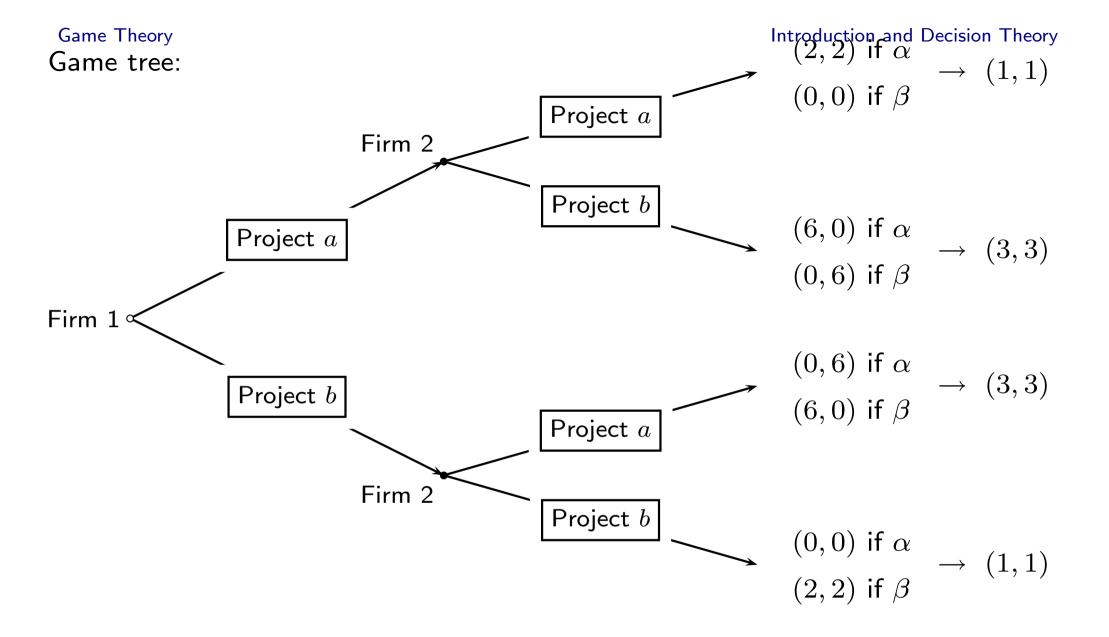
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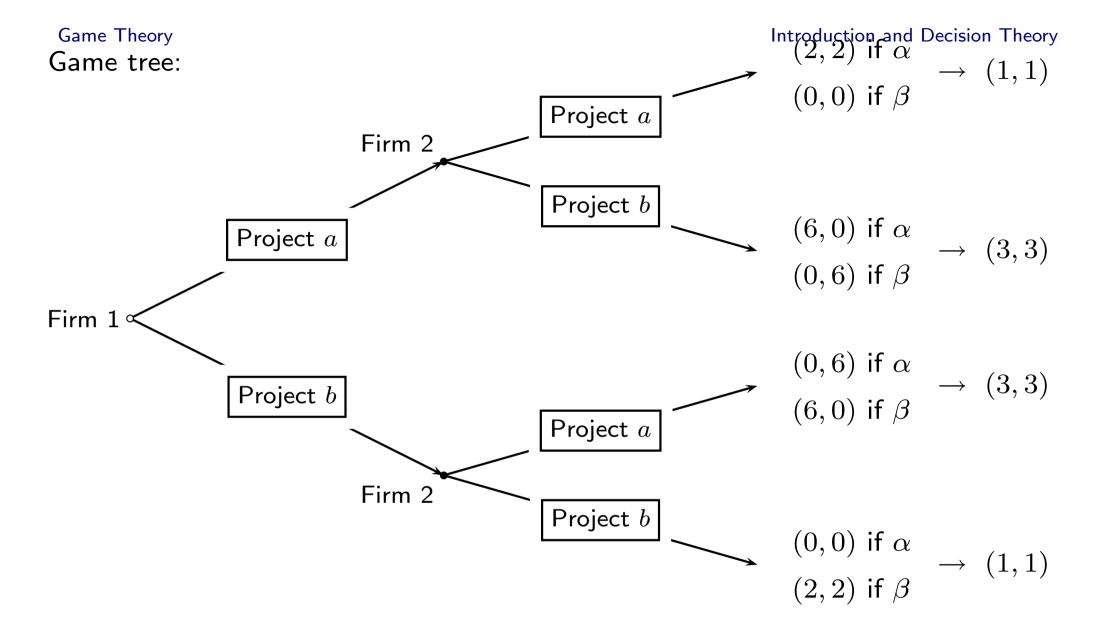
Two equally likely states/situations ( $\Pr[\alpha] = \Pr[\beta] = 1/2$ ):

 $\alpha$ : Only project a is profitable

 $\beta$ : Only project *b* is profitable

• Neither firm 1 nor firm 2 is informed.



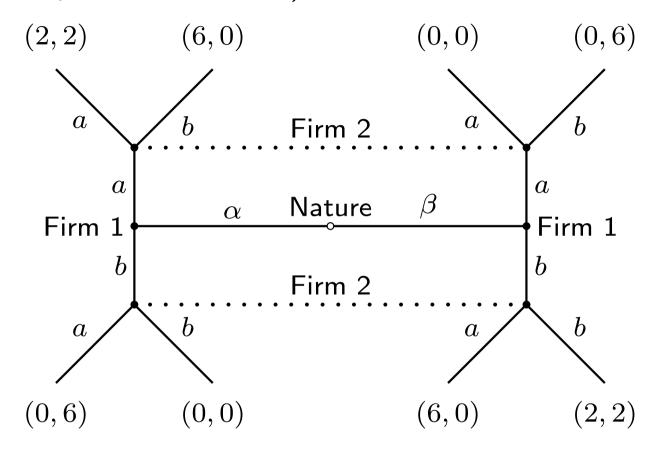


Firm 2 always chooses a project different from firm 1, so each firm's expected payoff is 3

• Firm 1 informed and Firm 2 uninformed.

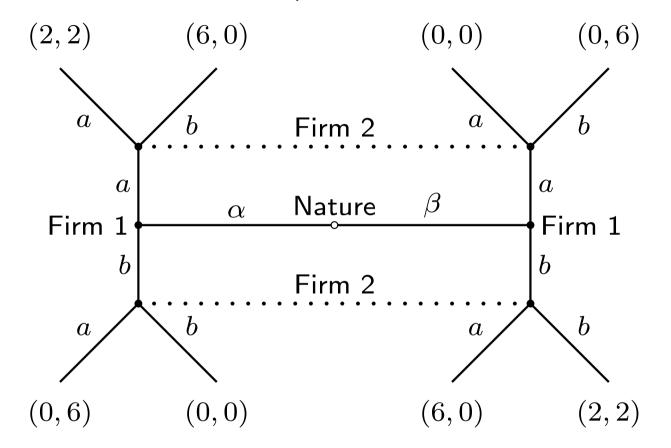
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Game tree (with imperfect information):



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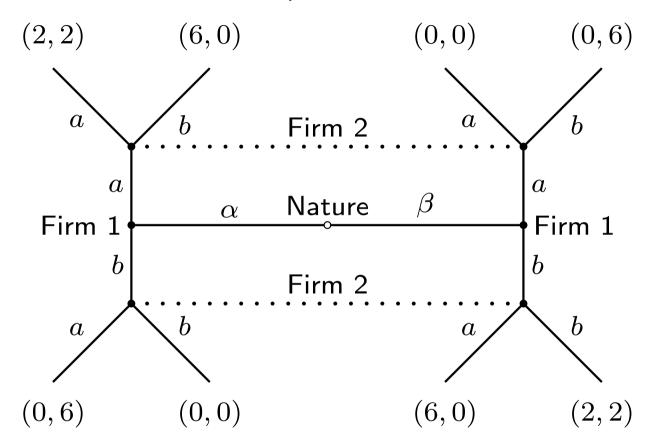
Game tree (with imperfect information):



Firm 2 chooses the same project as firm 1, so each firm expected payoff is 2 < 3

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Game tree (with imperfect information):



Firm 2 chooses the same project as firm 1, so each firm expected payoff is 2 < 3The strategic value of information is **negative** for firm 1! ( $\neq$  **individual** decision problem). But Firm 2 knows that Firm 1 knows ...

Other examples: à

M. Shubik (1954) "Does the fittest necessarily survive" | pdf |

- Understand the resolution of the game
- Do the example with other abilities
- Think about applications (e.g., elections, diplomacy, ...)

See also "The Three-Way Duel" from Dixit and Nalebuff (1991) pdf



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General Definition of a Game

• Set of **players** 

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- **Rules** of the game (who can do what and when)

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Game theory  $\neq$  decision theory, optimization

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- The problem of iterated knowledge
- $\Rightarrow$  which solution concept is appropriate, "reasonable"?



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- Lewis (1969), Aumann (1976): common knowledge

Introduction and Decision Theory



## **Reminder: Decision Theory**

Decision under certainty: Preference relation  $\succeq$  over consequences C

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Example of a lottery (roulette "game"):

# **Reminder: Decision Theory**

Decision under certainty: Preference relation  $\succeq$  over consequences C

Decision under uncertainty: Preference relation  $\succeq$  over lotteries  $\mathcal{L} = \Delta(C)$ 

Example of a lottery (roulette "game"):

Set of outcomes =  $\{00, 0, 1, ..., 36\}$  (probability 1/38 each)

Consider the two following alternatives:

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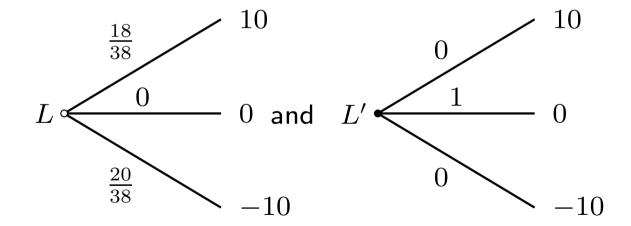
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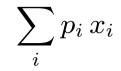
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Lotteries induced by a and a':



Introduction and Decision Theory

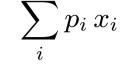
Possible decision criterion: mathematical expectation:

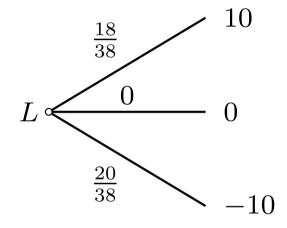


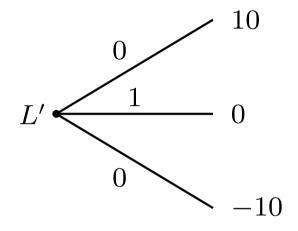
Game Theory

Introduction and Decision Theory

Possible decision criterion: mathematical expectation:







$$E(L) = \frac{18}{38} \, 10 - \frac{20}{38} \, 10 = -\frac{20}{38} \qquad \qquad E(L') = 0$$

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However, most people would not pay more than 100 and even 10 euros for such a bet. . .

Introduction and Decision Theory

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$$= (\ln 2) \left[\sum_{k=0}^{\infty} (k+1) \left(\frac{1}{2}\right)^k - \sum_{k=1}^{\infty} k \left(\frac{1}{2}\right)^k\right]$$
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 $\Rightarrow$  Value of a certain payoff equal to 4 euros

## Critics of Bernoulli's suggestion:

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1944: von Neumann and Morgenstern give a rigorous axiomatics for the solution proposed by Bernoulli



Figure 1: John von Neumann (1903–1957)

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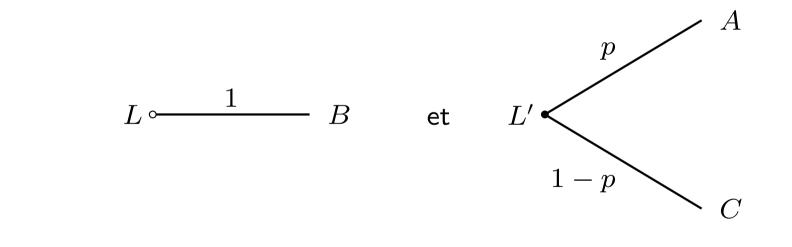
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Consider the bets



and assume  $L \succeq L' \Leftrightarrow p \ge 2/3$ 

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These differences of utilities from one consequence to another one represent the individual's attitude towards risk, not a scale of satisfaction

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• Independence axiom. For all L, L',  $L'' \in \mathcal{L}$  and  $\alpha \in (0,1)$  we have

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Theorem of von Neumann and Morgenstern.

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If the preference relationship  $\succeq$  over the set of lotteries  $\mathcal{L}$  is rational, continuous and satisfies the independence axiom, then it admits an VNM expected utility representation

That is, there exist values u(c) for the consequences  $c \in C$  such that for all lotteries  $L = (p_1, \ldots, p_C)$  and  $L' = (p'_1, \ldots, p'_C)$  we have

$$L \succeq L' \Leftrightarrow \underbrace{\sum_{c \in C} p_c u(c)}_{U(L)} \ge \underbrace{\sum_{c \in C} p'_c u(c)}_{U(L')}$$

Introduction and Decision Theory

**Property. (Cardinality)** Let  $U : \mathcal{L} \to \mathbb{R}$  be a VNM expected utility function for  $\succeq$  over  $\mathcal{L}$ . The function  $\widetilde{U} : \mathcal{L} \to \mathbb{R}$  is another VNM expected utility function for  $\succeq$  if and only if there exist  $\beta > 0$  and  $\gamma \in \mathbb{R}$  such that

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Introduction and Decision Theory

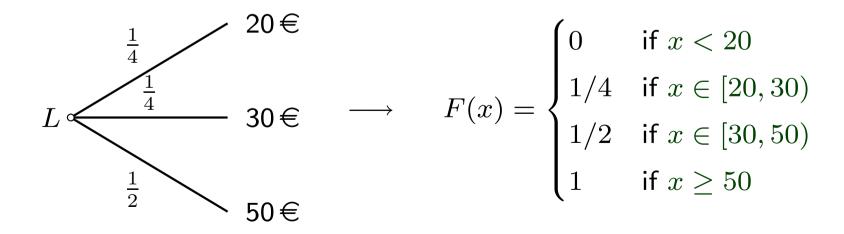
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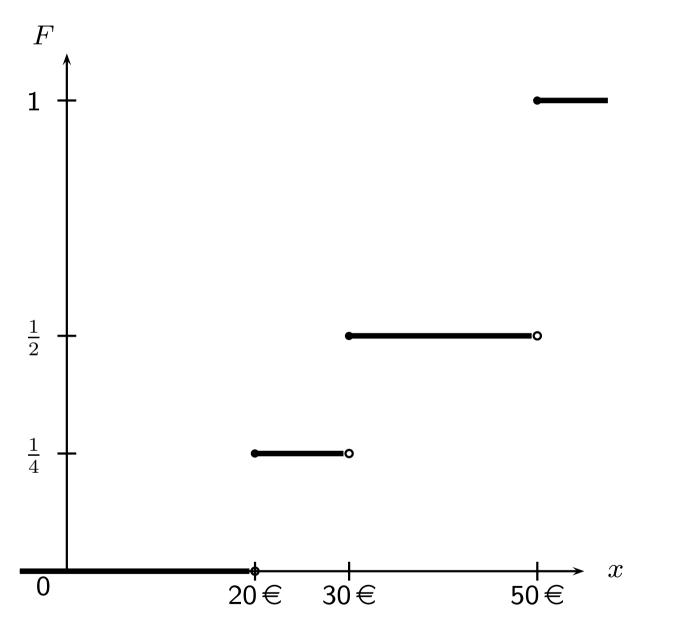
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**Monetary consequences**: Lottery = random variable represented by a distribution function F

For example





In this setting F is evaluated by the decisionmaker with

$$\begin{split} U(F) &= \int_C u(c) \, dF(c) \\ &= \int_C u(c) f(c) \, dc \ \text{ if the density } f \text{ exists} \end{split}$$

# **Approximation and Mean/Variance Criterion**

Lottery (random variable)  $\tilde{x}$ 

# Approximation and Mean/Variance Criterion

Lottery (random variable)  $\tilde{x}$ 

Taylor approximation of the (Bernoulli) utility function u around  $\overline{x} = E(\tilde{x})$ :

$$u(x) = u(\overline{x}) + \frac{u'(\overline{x})}{1!}(x - \overline{x}) + \frac{u''(\overline{x})}{2!}(x - \overline{x})^2 + \frac{u'''(\overline{x})}{3!}(x - \overline{x})^3 + \cdots$$

$$\Rightarrow U(\tilde{x}) = E[u(\tilde{x})] =$$

$$= u(\overline{x}) + \frac{u''(\overline{x})}{2!} \underbrace{E[(\tilde{x} - \overline{x})^2]}_{\sigma_x^2} + \frac{u'''(\overline{x})}{3!} E[(\tilde{x} - \overline{x})^3] + \cdots$$

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 $\Rightarrow$  the expected utility of a lottery may incorporate every moment of the distribution

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- Linear utility function  $u(x) = x \Rightarrow$  mathematical expectation criterion  $U(\tilde{x}) = \overline{x}$
- Quadratic utility function  $u(x) = \alpha + \beta x + \gamma x^2 \Rightarrow \frac{\text{mean}}{\text{variance criterion}}$ (Markowitz, 1952)

$$U(\tilde{x}) = \alpha + \beta \overline{x} + \gamma (\overline{x}^2 + \sigma_x^2)$$

used in the CAPM "Capital Asset Pricing Model"



Introduction and Decision Theory





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• An agent is risk neutral if

 $\delta_{E(F)} \sim F \quad \forall F \in \mathcal{L}$ 

If the preference relation  $\succeq$  can be represented by an expected utility function, then the agent is risk adverse if for all lotteries F

$$u[E(F)] \equiv u\left(\int c\,dF(c)\right) \geq \int u(c)\,dF(c) \equiv U(F)$$

(Jensen inequality for concave utility functions)

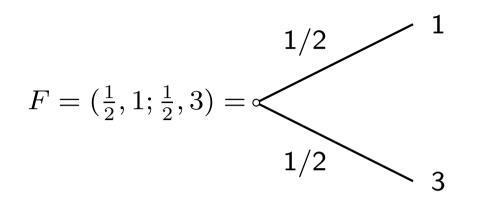
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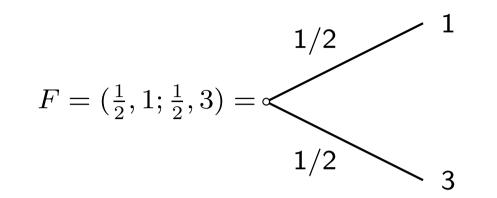
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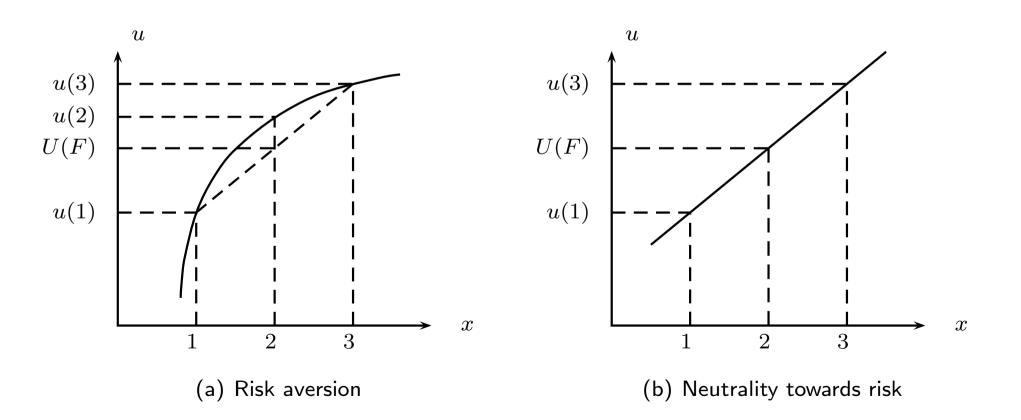
 $\Rightarrow$  An agent is (strictly) risk averse if and only if his utility function u is (strictly) concave. An agent is risk neutral if and only if his utility function u is linear

Game Theory Example:



Game Theory Example:





Further readings:

- Gollier (2001) : "The Economics of Risk and Time", Chapters 1, 2, 3 and 27
- Fishburn (1994) : "Utility and Subjective Probability", in "Handbook of Game Theory" Vol. 2, Chap. 39
- Karni and Schmeidler (1991) : "Utility Theory with Uncertainty", in "Handbook of Mathematical Economics" Vol. 4
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