# GAME THEORY

ysis of Conflict

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OGER B. MYERSON

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materials have been chosen for strength and durability. This book is printed on acid-free paper, and its binding

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> With the hope that a better understanding of conflict For Gina, Daniel, and Rebecca

may help create a safer and more peaceful world

needed later in other sections of interest. Page references for the imsections that seem less portant definitions are indicated in the index. I have provided cross-references to enable a reader to skim or pass over hension. I have not tried to "star" cialized nature that may be omitted without loss of subsequent compreevery chapter, there are some topics of interesting and to return to such sections or paragraphs. Instead, a more advanced or spe them if they are

judgment in deciding which topics to emphasize, which to mention tive and controversial, especially in a field that has been growing and which include Aumann (1987b) and Shubik (1982). some of the other excellent survey references to the vast literature on game theory, the reader may consult changing as rapidly as game theory. For other briefly, and which to omit; but any such judgment is assemble a comprehensive bibliography. I have tried to exercise my best topic in the literature on game theory, and In this introductory text, I have not been able to cover every major articles and books on game theory, I have not attempted perspectives and more necessarily subjec-

and related research have been supported by fellowships from the John Schlag, Keuk-Ryoul Yoo, Gordon Green, and Robert Lapson. This book Simpson, in the Managerial Economics script and gave many valuable comments. In development of this book. Myrna Wooders, Robert Marshall, Dov Mon-Milgrom, and Mark Satterthwaite have also substantially influenced the also benefited from the advice and suggestions of Lawrence Ausubel, derer, Gregory fited greatly from long conversations with Ehud Kalai and Robert Weber us who have followed them into the field of game theory. I have beneto Robert Aumann, John Harsanyi, John Nash, Reinhard Selten, and Simon Raymond Denekere, Itzhak Gilboa, Ehud Lehrer, and other colleagues Akihiko Matsui, Scott Page, and Eun Soo Park basic textbook on game theory. Discussions with Bengt Holmstrom, Paul Northwestern Lloyd Shapley, whose writings and lectures taught and inspired all of note of acknowledgment must begin with an expression of my debt game theory and, specifically, about what should be covered in a Guggenheim Guangsug and was University. The final manuscript was ably edited by Jodi Pollock, Leo Simon, Michael Hahn, proofread by Scott Page, Memorial Jose Luis Ferreira and Decision Foundation and writing the book, I have Sciences department at read parts Chwe, Gordon Green, Ioannis Tournas, Karl Joseph the Alfred P. Riney, Ricard of the manu-Sloan

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#### Preface

some of the most important models, solution concepts, and results of the game theorists to develop these models and solutions. game theory, as game theory and its applications. My goal in this book is to convey both goals or preferences. political, or social situation that involves individuals who have different basic to all of the social sciences. It can offer insights into any economic, herent methodology that underlies the large and growing literature on Game theory has a very general scope, encompassing questions that are generality and the well as However, there is a fundamental unity and cos the methodological principles that have guided unity of game theory. I have tried to present

somewhat more coope primacy of noncooperative game theory but also the essential and comcooperative and cooperative game theory, recognizing the fundamental plementary role of the first course. I have tri and the University of tended for both classroom use and self-study. It is based on courses that This taught at Northwestern University, the University of Chicago, book is written led to set an appropriate balance between nonrative game theory than I can actually cover in a Paris-Dauphine. I have included here, however, cooperative approach. a general introduction to game theory, in-

The mathematical prerequisite for this book is some prior exposure to elementary calculus, linear algebra, and probability, at the basic undergraduate level. It is not as important to know the theorems that may be covered in such mathematics courses as it is to be familiar with the basic ideas and notation of sets, vectors, functions, and limits. Where more advanced mathematics is used, I have given a short, self-contained explanation of the mathematical ideas.

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## Decision-Theoretic Foundations

### 1.1 Game Theory, Rationality, and Intelligence

conflict and cooperation between intelligent rational decision-makers. situations in which two sciences, as well as for practical decision-makers. The situations that influence one another's welfare. As such, game theory offers insights Game theory can be Game theory subject, but the name "game theory" seems to be here to stay. game theorists study decision theory" might be more descriptively game" might unfortunately suggest. "Conflict analysis" or "interactive fundamental importance for scholars in all branches of the social provides general mathematical techniques for analyzing are not merely recreational activities, as the term defined as the study of mathematical models of or more individuals make decisions that will accurate names for the

of von Neumann and Morgenstern (1944). Much of the early work on intellectual community where many leaders of theoretical physics were also working (see Morgenstern, 1976). Viewed from a broader perspec-(1913), Borel (1921), tive of intellectual history, this propinquity does not seem coincidental. game theory was done during World War II at Princeton, in the same position in the mathematical foundations of the social sciences. In this threatens the survival of our civilization. People seem to have learned century, Much of the materials than about branches Modern game theory may be said to begin with the work of Zermelo about how to of the physical sciences have created a nuclear dilemma that appeal advances in the design physical systems for exploiting radioactive and how to create social systems for moderating human von Neumann (1928), and the great seminal book promise of game theory is derived from its most fundamental and theoretical

:

1.1 · Rationality and Intelligence

behavior in conflict. Thus, it may be natural to hope that advances in the most fundamental and theoretical branches of the social sciences might be able to provide the understanding that we need to match our great advances in the physical sciences. This hope is one of the motivations that has led many mathematicians and social scientists to work in game theory during the past 50 years. Real proof of the power of game theory has come in recent years from a prolific development of important applications, especially in economics.

quantitative models and hypothetical examples. These examples may the fundamental issues of conflict and cooperation easier to see in these be unrealistically simple in many respects, but stand real competitive situations better by studying these hypothetical defined as those studied by game theorists, one can still come to undernever involved in a situation in which people's positions are as clearly one's questions in the context of a simplified course, this is the method of analysis in any examples than in the vastly more complicated Game theorists try to understand conflict and cooperation by studying less important details of reality are ignored. Thus, even if one is model in which this simplicity may make situations of real life. Of field of inquiry: to pose many of

In the language of game theory, a game refers to any social situation involving two or more individuals. The individuals involved in a game may be called the *players*. As stated in the definition above, there are two basic assumptions that game theorists generally make about players: they are rational and they are intelligent. Each of these adjectives is used here in a technical sense that requires some explanation.

decisions that will maximize his expected utility payoff goes back at least some utility scale. maximize the expected value of his own payoff, which is measured in suit of his own objectives. In game theory, building on the fundamental showed that for any rational decision-maker t sumptions about how a rational decision-maker should behave, they von Neumann and Morgenstern (1947). Using cares about, such that he would always choos of assigning utility numbers A decision-maker is rational if he makes decisions consistently in pur-Bernoulli (1738), but the modern justification of this idea is due to decision theory, we assume that each player's objective is The idea that a rational decision-maker should make රි the the option that maximizes here must exist some way remarkably weak asoutcomes that he

is expected utility. We call this result the expected-utility maximization

It should be emphasized here that the logical axioms that justify the expected-utility maximization theorem are weak consistency assumptions. In derivations of this theorem, the key assumption is generally a sure-thing or substitution axiom that may be informally paraphrased as follows: "If a decision-maker would prefer option 1 over option 2 when event A occurs, and he would prefer option 1 over option 2 when before he learns whether event A will occur or not." Such an assumption, together with a few technical regularity conditions, is sufficient to guarantee that there exists some utility scale such that the decision-maker always prefers the options that give the highest expected utility value.

ducing themselves. Thus, an evolutionary-selection argument suggests in a way that tends to that individuals may evolutionary Maynard Smith, 1982). measure of general broadly speaking, social organizations) can physical law, complex Consistent maximizing behavior can also be derived from models of selection. survival and reproductive fitness or success increase their probability of surviving and reprotend to maximize organisms (including human beings and, more In a universe where increasing disorder is a the expected value of some persist only if they behave

ual may get more incremental utility from an extra dollar when he is are not necessarily measured in dollars and cents. A risk-averse individear function of monetary worth. For example, one model that is comvation suggests that, poor than he would get from the same dollar were he rich. This obsermonly used in decision analysis stipulates that a decision-maker's utility besides his own monetary worth (including even the monetary worths ally, the c that represents his index of risk aversion (see Pratt, 1964). More generpayoff from getting xIn general, maximizing expected utility payoff is not necessarily the other people for whom he feels some sympathy or antipathy). as maximizing utility payoff of an individual may depend on many variables expected monetary payoff, because utility values for many decision-makers, utility may be a nonlindollars would be  $u(x) = 1 - e^{-cx}$ . , for some number

When there is uncertainty, expected utilities can be defined and computed only if all relevant uncertain events can be assigned probabilities,

which

1.2 · Basic Concepts

(1926) and Savage (1954) showed that, even where objective probabilities cannot be assigned to some events, a rational decision-maker should be able to assess all the subjective probability numbers that are needed quantitatively measure the likelihood of each event. Ramsey

individual 1 is the action to be chosen by some other individual 2. To cial difficulty arises in the assessment of subjective probabilities. For ımagine assess the probability of each of individual 2's possible choices, individual choices. Indeed, and that, to do so, she must assess the probabilities of each of 1's possible realize that 2 is trying to rationally solve a decision problem of her own example, suppose that one of the factors that is solution to each individual's decision problem depends on the solution out understanding the solution to the other. Thus, when rational decito the other individual's problem. Neither problem can be solved withl needs to understand like a system of equations. Such analysis is the sion-makers interact, their decision problems m In situations involving two or more decisioncompute these expected values. in I's position, to figure out what I himself in 2's position. In this thought experiment, 1 may 1 may realize that 2's decision-making behavior, so 1 may try to is pro subject of game theory. ust be analyzed together, will do. So the rational bably trying to imagine unknown to some given makers, however, a spe-

ation that we can make. In know about the game and he can make any inferences about the situthat a player in the game is intelligent if he knows everything that we describes the behavior of intelligent players in some game and we believe players are intelligent in this sense. game will also understand this theory and its predictions. that this theory is correct, then we must assume that each player in the When we analyze a game, as game theorists or social scientists, we say game Thus, theory, we generally assume that if we develop a theory that

model of price theory, it is assumed that every individual is a rational utility-maximizing decision-maker, but it is not assumed that individuals and respond to some intermediating price signals, and each individual theorist is studying. In price-theoretic models, understand the whole structure of the economic model that the price willing to make such trades with him prices, supposed to believe an example of a theory that assumes even though there may not be price theory in economics. In that he trade anyone arbitrary rationality but not intelliindividuals only perceive the general equilibrium in the amounts economy actually at these

> and intelligent may never be satisfied in any real-life situation. On the individuals will be systematically fooled or led into making are not consistent with other hand, we should takes, then this theory will tend to lose its validity when these individuals the social sciences is largely derived from this fact. to better understand the situation. learn (from experience Of course, the assumption that all individuals are perfectly rational or from a published version of the theory itself) this assumption. If a theory predicts that some be suspicious of theories and predictions that The importance of game theory in costly

### Basic Concepts of Decision Theory

is devoted to an introduction to the basic ideas of Bayesian decision fulfillment. Thus, to understand the fundamental ideas of game theory, the case of two or more deed, game theory can one should begin by studying decision theory. The rest of this chapter The logical roots of game theory are in Bayesian decision theory. Inimization theorem and theory, beginning with related results. a general derivation of the expected utility maxbe viewed as an extension of decision theory (to decision-makers), or as its essential logical

quantitative model can give a reasonable description of people's behavsciences should ask the question, Why should I expect that any simple question, by showing tuitive axioms should always behave so as to maximize the mathematical characterization of his should be describable probability distribution. That is, any rational decision-maker's behavior expected value of some utility function, with respect to some subjective revised in accordance available to such a decision-maker, his subjective probabilities should be vant unknown factors. tive probability distribution, which characterizes his beliefs about all rele-At some point, anyone who is The fundamenta that any decision-maker who satisfies certain inl results of decision theory directly address this with Bayes's formula. preferences for outcomes or prizes, and a subjecby a utility function, which gives a Furthermore, interested in the mathematical social when new information becomes quantitative

Savage (1954). Other ning with Ramsey (1926), von Neumann and Morgenstern (1947), and probability, expected-utility maximization, and Bayes's formula, begin-There is a vast literature on axiomatic derivations of the subjective Herstein and notable derivations of these Milnor (1953), Luce and Raiffa (1957), results have

scombe and Aumann (1963), and Pratt, Raiffa, and Schlaiffer (1964); for a general overview, see Fishburn (1968). The axioms used here are mainly borrowed from these earlier papers in the literature, and no attempt is made to achieve a logically minimal set of axioms. (In fact, a number of axioms presented in Section 1.3 are clearly redundant.)

Decisions under uncertainty are commonly described by one of two models: a *probability model* or a *state-variable model*. In each case, we speak of the decision-maker as choosing among *lotteries*, but the two models differ in how a lottery is defined. In a probability model, lotteries are probability distributions over a set of prizes. In a state-variable model, lotteries are functions from a set of possible states into a set of prizes. Each of these models is most appropriate for a specific class of applications

the of Knight (1921). For example, gambles that depend on the toss of cision-making purposes. For example, if we describe a lottery by saying unknowns with the same probability are model. An important assumption being used here is that two objective of an urn containing a known population of fair coin, the spin of a roulette that it "offers a prize of \$100 or \$0, each wit ferently colored balls all could be adequately tossing a fair coin or by drawing a ball from prizes will depend on events that have obvious objective probabili-"roulette lotteries" probability model is appropriate for describing gambles in which we refer to such and 50 black balls. that it does not matter whether the events as objective unknowns. These gambles are of Anscombe and Aumann (1963) or the "risks" wheel, or the completely equivalent for deh probability ½," identically sized but difblind draw of a ball out lescribed in a probability an urn that contains 50 prize is determined by we

tainties" of Knight (1921). They are more the "horse lotteries" of Anscombe and Aumann (1963) or the "uncerknowns. Gambles the result of a future sports variable model, because these models allow us market are will be determined by the unpredictable events, without our having to other hand, many events do not have obvious probabilities; good examples. We refer probabilities for these events. that depend on subjective unknowns correspond to event or to suc the readily described in a statefuture course to describe how the prize h events as subjective unof the stock

Here we define our lotteries to include both the probability and the state-variable models as special cases. That is, we study lotteries in which

the prize may depend on both objective unknowns (which may be directly described by probabilities) and subjective unknowns (which must be described by a state variable). (In the terminology of Fishburn, 1970, we are allowing extraneous probabilities in our model.)

Let us now develop some basic notation. For any finite set Z, we let  $\Delta(Z)$  denote the set of probability distributions over the set Z. That is,

(1.1) 
$$\Delta(Z) = \{q: Z \to \mathbb{R} | \sum_{y \in Z} q(y) = 1 \text{ and } q(z) \ge 0, \forall z \in Z \}.$$

(Following common set notation, "|" in set braces may be read as "such that.")

Let X denote the set of possible *prizes* that the decision-maker could ultimately get. Let  $\Omega$  denote the set of possible *states*, one of which will be the *true state of the world*. To simplify the mathematics, we assume that X and  $\Omega$  are both finite sets. We define a *lottery* to be any function f that specifies a nonnegative real number f(x|t), for every prize x in X and every state t in  $\Omega$ , such that  $\sum_{x \in X} f(x|t) = 1$  for every t in  $\Omega$ . Let L denote the set of all such lotteries. That is,

$$L = \{f: \Omega \to \Delta(X)\}.$$

For any state t in  $\Omega$  and any lottery f in L,  $f(\cdot|t)$  denotes the probability distribution over X designated by f in state t. That is,

$$f(\cdot|t) = (f(x|t))_{x \in X} \in \Delta(X).$$

Each number f(x|t) here is to be interpreted as the objective conditional probability of getting prize x in lottery f if t is the true state of the world. (Following common probability notation, "|" in parentheses may be interpreted here to mean "given.") For this interpretation to make sense, the state must be defined broadly enough to summarize all subjective unknowns that might influence the prize to be received. Then, once a state has been specified, only objective probabilities will remain, and an objective probability distribution over the possible prizes can be calculated for any well-defined gamble. So our formal definition of a lottery allows us to represent any gamble in which the prize may depend on both objective and subjective unknowns.

A prize in our sense could be any commodity bundle or resource allocation. We are assuming that the prizes in X have been defined so that they are mutually exclusive and exhaust the possible consequences of the decision-maker's decisions. Furthermore, we assume that each

prıze Thus, the decision-maker should be able to assess a preference ordering decision-maker cares about in the situation resulting from his decisions. the state of the world. over the set of lotteries, given any information ij X represents a complete specification of all aspects that the that he might have about

subset of Ω. We let Ξ denote the set of all such state of the The information that the decision-maker might have about the true world can be described by an event, which is a nonempty h events, so that

$$\Xi = \{ S | S \subseteq \Omega \text{ and } S \neq \emptyset \}.$$

 $f \gtrsim_{\rm S} g$  iff the lottery f would be decision-maker would be willing to choose the in the set S. (Here iff of the decision-maker, if he learned that the true state of the world was choose between f and g and he knows only that the event S has occurred. Given this relation ( $\approx_s$ ), we define relations (> any two lotteries f and g in L and any means "if at least as desirable as g, in the opinion and only if.") That is,  $f \approx_s g$  iff the -s) and ( $\sim s$ ) so that lottery f when he has to event S in \(\vec{\varksigma}\), we write

$$f \sim_S g$$
 iff  $f \gtrsim_S g$  and  $g \gtrsim_S f$ ;  
 $f >_S g$  iff  $f \gtrsim_S g$  and  $g \not\sim_S f$ .

and  $f >_S g$  means that he would strictly prefer between fThat is, and g, if he had to choose between them after learning S; g means that the decision-maker would be indifferent f over g in this situation.

are referring to prior preferences before any when no conditioning event is mentioned, it should be assumed that we We may write  $\approx$ , >, and  $\sim$  for  $\approx \Omega$ ,  $> \Omega$ , and states in  $\Omega$  are ruled out  $\sim_{\Omega}$ , respectively. That is,

by observations. defined preferences over lotteries conditionally on any possible event such derivations cannot generate rankings of lotteries conditionally on omission is not as innocuous as it may seem. Kreps and Wilson (1982) events that have prior probability 0. In tional preferences are derived (using Bayes's crucial in the analysis of a game. have shown that the characterization of a rati preferences that he would assess before making any observations; but Notice the assumption here that the decision-maker would have welland preferences after he observes a zero some expositions of decision theory, game-theoretic contexts, this a decision-maker's condi--probability event may be onal decision-maker's beformula) from the prior

and g in L,  $\alpha f + (1$ any number  $\alpha$  such that  $0 \le \alpha$ a)g denotes the lottery in L such that nd for any two lotteries f

> $(\alpha f + (1 - \alpha)g)(x|t) = \alpha f(x|t) + (1 - \alpha)g(x|t),$  $\forall x \in X$ ,

the proportion of white balls. Suppose that if the ball is black then the decision-maker will get to decision-maker will get to play lottery f and if the ball is white then the ultimate probability of from an urn in which is built up from f and g by this random lottery-selection process.  $(1-\alpha)g(x|t)$ . Thus,  $\alpha f+(1-\alpha)g$  represents the compound lottery that To interpret this definition, suppose that a ball is going to be drawn  $\alpha$  is the proportion of black balls and 1 getting prize x if t is the true state is  $\alpha f(x|t) +$ play lottery ò Then the decision-maker's

for sure. That is, for every state t, For any prize x, we let [x] denote the lottery that always gives prize x

(1.2) 
$$[x](y|t) = 1$$
 if  $y = x$ ,  $[x](y|t) = 0$  if  $y \neq x$ .

prize y, with probabilities  $\alpha$  and 1-Thus,  $\alpha[x] + (1 \alpha$ )[y] denotes the lottery that gives either prize x or α, respectively.

#### Axioms

all events S and T in  $\Xi$ , and for all numbers  $\alpha$  and  $\beta$  between 0 and 1. stated, these axioms are to hold for all lotteries e, f, g, and h in L, for Basic properties that a rational decision-maker's preferences expected to satisfy can be presented as a list of axioms. Unless of be presented as a list of axioms. Unless otherwise may be

complete transitive order over the set of lotteries. Axioms 1.1A and 1.1B assert that preferences should always form a

AXIOM 1.1A (COM) PLETENESS).  $f \gtrsim_S g$  or  $g \gtrsim_S f$ .

AXIOM 1.1B (TRANSITIVITY). If  $f \geq_S g$  and  $g \geq_S h$  then  $f \geq_S h$ .

if  $f >_S g$  and  $g \ge_S h$  then  $f >_S h$ . other transitivity results, such as if  $f \sim_s g$  and  $g \sim_s h$  then  $f \sim_s h$ ; and It is straightforward to check that Axiom 1.1B implies a number of

two lotteries that differ only in states outside S. decision-maker, so, given an event S, he would be indifferent between Axiom 1.2 asserts that only the possible states are relevant to the

AXIOM 1.2 (RELEVANCE).  $If f(\cdot|t) = g(\cdot|t)$  $\forall t \in S, then f \sim_S g$ .

is always better. Axiom 1.3 asserts that a higher probability of getting a better lottery

AXIOM 1.3 (MONOTONICITY).  $+ (1 - \alpha)h >_S \beta f + (1 - \beta)h$ If  $f >_S h$  and  $0 \le \beta < \alpha \le 1$ , then

f and h. ranked between f and h is just as good as some randomization between better in a continuous Building on Axiom 1.3, Axiom 1.4 asserts manner as increases, so that  $\gamma f$  + any lottery that is  $(1 - \gamma)h$  gets

some number  $\gamma$  such that  $0 \le \gamma \le 1$  and  $g \sim_s \gamma f$ AXIOM 1.4 (CONTINUITY). If  $f \geq_S g$  an  $^{-}$  + (1  $d g \geq_S h$ , then there exists γ)*h*.

selection process, as discussed in the preceding section. In Axioms 1.6A after learning which of these events be expressing a preference that he would be alternative before he learns which event occurs. (Otherwise, he would maker must choose between two alternatives and if there are two muthat they generate strong restrictions on what t axioms) are probably the most important in our system, in the and 1.6B, these events are subjective unknowns, subsets of  $\Omega.$ he would prefer the first alternative, then he must prefer the first tually exclusive events, one of which must occur, such that in each event erences must look like even without the other axioms. They should also The substitution axioms (also known as ind very intuitive axioms. They express the idea that, if the decisionthese events are objective randomizations in a random lotterywas true!) In Axioms 1.5A and he decision-maker's prefependence or sure-thing sure to want to reverse

AXIOM 1.5A (OBJECTIVE SUBSTITUTION). If  $e \approx_S f$  and  $g \approx_S h$  and  $0 \leq \alpha \leq 1$ , then  $\alpha e + (1 - \alpha)g \approx_S \alpha f + (1 - \alpha)h$ .

and  $g \geq_S h$  and  $0 < \alpha \leq 1$ , then  $\alpha e + (1 - \alpha) \leq_S h$ AXIOM 1.5B (STRICT OBJECTIVE SUBS ><sub>S</sub>  $\alpha f + (1 - \alpha)h$ . If  $e >_S f$ 

AXIOM 1.6A (SUBJECTIVE  $\emptyset$ , then  $f \geq_{S \cup T} g$ SUBSTITUTION). If  $f \approx_S g$  and  $f \approx_T$ 

and  $f >_T g$  and  $S \cap T$ AXIOM 1.6B (STRICT SUBJECTIVE SUBSTITUTION). If  $f >_S g$ 

> that he would consider better than .5[x] + .5[z] and worse than .5[y] +would prefer x over y, when we try to drop them. find it helpful to consider the difficulties that arise in decision theory .5[z], in violation of s .5[z]. That is, To fully appreciate the importance of the substitution axioms, we may ubstitution. Suppose that w is some but he would also prefer .5[y]+.5[z] over .5[x] + For a simple example, suppose an individual other

x > y but .5[y]+ .5[z] > [w] > .5[x] + .5[z].

a coin will be tossed. If it comes up Heads, then he will get prize z; and if it comes up Tails, then he will get a choice between prizes x and y. decide whether to take Now consider the foll lowing situation. The decision-maker must first prize w or not. If he does not take prize w, then

w and take y if Tails. If he follows the first strategy, then he lottery [w]; if he follows the second, then he gets the lottery sion that he should have taken w in the first place. lottery .5[x] + .5[z] is worse than w. So we get the contradictory concluerences stipulate that he should choose x instead of y. strategy would be best .5[z]; and if he follows the third, then he gets the lottery .5[y] +making strategies: (1) However, if he refuses w and the coin comes up Tails, then his pref-Because he likes .5[y] +What should this decision-maker do? He has three possible decisionthen he will actually end up with z if Heads or x if Tails. But this take w, (2) refuse w and take x if Tails, (3) refuse for him, so it may seem that he should refuse w. .5[z] best among these lotteries, the third gets the lottery So if he refuses .5[x] +

then we must also specify whether they can foresee their future inconto .5[y] + .5[z] in this example). If they cannot make such commitments, sequently want to change (in which case "rational" behavior would lead stitution axioms, then we must specify whether rational decision-makers stancy (in which case the outcome of this example should be [w]) or not are able to commit themselves to follow strategies that they would subwe must accept substitution axioms as a part of our definition of rationnone of these assumptions seem reasonable, then to avoid this dilemma (in which case the outcome of this example should be .5[x]+.5[z]). If Thus, if we are to talk about "rational" decision-making without sub-

there is something of all prizes. Axiom 1.7 asserts that the decision-maker is never indifferent between This axiom interest that could happen in each state. is just a regularity condition, to make sure

**AXIOM 1.7 (INTEREST).** For every state t in  $\Omega$ , there exist prizes y and z in X such that  $[y] >_{\{i\}} [z]$ .

Axiom 1.8 is optional in our analysis, in the sense that we can state a version of our main result with or without this axiom. It asserts that the decision-maker has the same preference ordering over objective gambles in all states of the world. If this axiom fails, it is because the same prize might be valued differently in different states.

AXIOM 1.8 (STATE NEUTRALITY). For any two states r and t in  $\Omega$ , if  $f(\cdot|r) = f(\cdot|t)$  and  $g(\cdot|r) = g(\cdot|t)$  and  $f \gtrsim_{\{r\}} g$ , then  $f \gtrsim_{\{i\}} g$ .

### 1.4 The Expected-Utility Maximization Theorem

A conditional-probability function on  $\Omega$  is any function  $p:\Xi\to \Delta(\Omega)$  that specifies nonnegative conditional probabilities p(t|S) for every state t in  $\Omega$  and every event S, such that

$$p(t|S) = 0$$
 if  $t \notin S$ , and  $\sum_{r \in S} p(r|S) = 1$ .

Given any such conditional-probability function, we may write

$$p(R|S) = \sum_{r \in R} p(r|S), \quad \forall R \subseteq \Omega, \quad \forall S \in \Xi.$$

A utility function can be any function from  $X \times \Omega$  into the real numbers **R**. A utility function  $u:X \times \Omega \to \mathbf{R}$  is state independent iff it does not actually depend on the state, so there exists some function  $U:X \to \mathbf{R}$  such that u(x,t) = U(x) for all x and t.

Given any such conditional-probability function p and any utility function u and given any lottery f in L and any event S in  $\Xi$ , we let  $E_p(u(f)|S)$  denote the expected utility value of the prize determined by f, when  $p(\cdot|S)$  is the probability distribution for the true state of the world. That is

$$E_p(u(f)|S) = \sum_{t \in S} p(t|S) \sum_{x \in X} u(x,t) f(x|t).$$

**THEOREM 1.1.** Axioms 1.1AB, 1.2, 1.3, 1.4, 1.5AB, 1.6AB, and 1.7 are jointly satisfied if and only if there exists a utility function  $u:X \times \Omega \to \mathbb{R}$  and a conditional-probability function  $p:\Xi \to \Delta(\Omega)$  such that

- (1.3)  $\max_{x \in X} u(x,t) = 1 \text{ and } \min_{x \in X} u(x,t) = 0, \quad \forall t \in \Omega;$
- (1.4) p(R|T) = p(R|S)p(S|T),  $\forall R, \forall S, and \forall T such that$   $R \subseteq S \subseteq T \subseteq \Omega \text{ and } S \neq \emptyset;$
- (1.5)  $f \geq_S g$  if and only if  $E_p(u(f)|S) \geq E_p(u(g)|S)$ ,  $\forall f \in S$ .

  Furthermore, given these Axioms 1.1AB-1.7, Axiom 1.8 is also satisfied if and only if conditions (1.3)-(1.5) here can be satisfied with a state-independent utility function.

that we can choose our utility functions to range between 0 and 1 in (1.4) is a version of Bayes's formula, which establishes how conditional abilities assessed in another. The most important part of the theorem every state. (Recall that X and  $\Omega$  are assumed to be finite.) Condition subjective probabilities the highest expected choice in any decisionwe have assessed u and p, we can predict the decision-maker's optimal prefers lotteries with higher expected utility. By condition (1.5), once is condition (1.5), however, which asserts that the decision-maker always probabilities assessed in one event must be related to conditional probserved. Notice that, with X and  $\Omega$ pletely characterized by finitely many numbers. preferences over all of the infinitely many lotteries in L can be utility and probability In this theorem, condition (1.3) is a normalization condition, asserting utility making situation. He will choose the lottery with numbers to assess. Thus, the decision-maker's conditioned on whatever event in  $\Omega$  he has obamong those finite, there are only finitely many available to him, using his

To apply this result in practice, we need a procedure for assessing the utilities u(x,t) and the probabilities p(t|S), for all x, t, and S. As Raiffa (1968) has emphasized, such procedures do exist, and they form the basis of practical decision analysis. To define one such assessment procedure, and to prove Theorem 1.1, we begin by defining some special lotteries, using the assumption that the decision-maker's preferences satisfy Axioms 1.1AB–1.7.

Let  $a_1$  be a lottery that gives the decision-maker one of the best prizes in every state; and let  $a_0$  be a lottery that gives him one of the worst prizes in every state. That is, for every state t,  $a_1(y|t) = 1 = a_0(z|t)$  for some prizes y and z such that, for every x in X,  $y \geq_{\{i\}} x \geq_{\{i\}} z$ . Such best

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and worst prizes can be found in every state because the preference relation ( $\approx_{\{i\}}$ ) forms a transitive ordering over the finite set X.

For any event S in  $\Xi$ , let  $b_s$  denote the lottery such that

$$b_{S}(\cdot|t) = a_{1}(\cdot|t) \text{ if } t \in S,$$

$$b_S(\cdot|t) = a_0(\cdot|t)$$
 if  $t \notin S$ .

That is,  $b_S$  is a "bet on S" that gives the best possible prize if S occurs and gives the worst possible prize otherwise.

For any prize x and any state t, let  $c_{x,t}$  be the lottery such that

$$c_{x,t}(\cdot|r) = [x](\cdot|r) \text{ if } r = t,$$

$$c_{x,t}(\cdot|r) = a_0(\cdot|r)$$
 if  $r \notin t$ .

That is,  $c_{x,t}$  is the lottery that always gives the worst prize, except in state t, when it gives prize x.

We can now define a procedure to assess the utilities and probabilities that satisfy the theorem, given preferences that satisfy the axioms. For each x and t, first ask the decision-maker, "For what number  $\beta$  would you be indifferent between [x] and  $\beta a_1 + (1 - \beta)a_0$ , if you knew that t was the true state of the world?" By the continuity axiom, such a number must exist. Then let u(x,t) equal the number that he specifies, such that

$$[x] \sim_{\{i\}} u(x,t)a_1 + (1 - u(x,t))a_0.$$

For each t and S, ask the decision-maker, "For what number  $\gamma$  would you be indifferent between  $b_{\{t\}}$  and  $\gamma a_1 + (1 - \gamma)a_0$  if you knew that the true state was in S?" Again, such a number must exist, by the continuity axiom. (The subjective substitution axiom guarantees that  $a_1 \geq_S b_{\{t\}} \geq_S a_0$ .) Then let p(t|S) equal the number that he specifies, such that

$$b_{\{t\}} \sim_S p(t|S)a_1 + (1 - p(t|S))a_0.$$

In the proof of Theorem 1.1, we show that defining u and p in this way does satisfy the conditions of the theorem. Thus, finitely many questions suffice to assess the probabilities and utilities that completely characterize the decision-maker's preferences.

Proof of Theorem 1.1. Let p and u be as constructed above. First, we derive condition (1.5) from the axioms. The relevance axiom and the definition of u(x,t) implies that, for every state r,

$$c_{x,t} \sim_{\{r\}} u(x,t)b_{\{t\}} + (1 - u(x,t))a_0.$$

Then subjective substitution implies that, for every event S

$$c_{x,t} \sim_S u(x,t)b_{\{t\}} + (1 - u(x,t))a_0.$$

Axioms 1.5A and 1.5B together imply that  $f \approx_s g$  if and only if

$$\left(\frac{1}{|\Omega|}\right)f + \left(1 - \frac{1}{|\Omega|}\right)a_0 \gtrsim_s \left(\frac{1}{|\Omega|}\right)g + \left(1 - \frac{1}{|\Omega|}\right)a_0.$$

(Here,  $|\Omega|$  denotes the number of states in the set  $\Omega$ .) Notice that

$$\left(\frac{1}{|\Omega|}\right)f + \left(1 - \frac{1}{|\Omega|}\right)a_0 = \left(\frac{1}{|\Omega|}\right)\sum_{i \in \Omega}\sum_{x \in X}f(x|i)c_{x,i}.$$

ut, by repeated application of the objective substitution axiom,

$$\left(\frac{1}{|\Omega|}\right) \sum_{t \in \Omega} \sum_{x \in X} f(x|t)c_{x,t}$$

$$\sim_{S} \left(\frac{1}{|\Omega|}\right) \sum_{t \in \Omega} \sum_{x \in X} f(x|t)(u(x,t)b_{\{t\}} + (1 - u(x,t))a_{0})$$

$$\sim_{S} \left(\frac{1}{|\Omega|}\right) \sum_{t \in \Omega} \sum_{x \in X} f(x|t) \left(u(x,t) \left(p(t|S)a_{1}\right) + (1-p(t|S))a_{0}\right) + (1-u(x,t))a_{0}$$

$$= \left(\frac{1}{|\Omega|}\right) \sum_{t \in \Omega} \sum_{x \in X} f(x|t) u(x,t) p(t|S) a_1$$

$$+ \left(1 - \sum_{t \in \Omega} \sum_{x \in X} f(x|t) u(x,t) p(t|S) / |\Omega| \right) a_0$$

$$\left( E_p(u(f)|S) / |\Omega| \right) a_1 + \left(1 - \left( E_p(u(f)|S) / |\Omega| \right) \right) a_0.$$

Similarly,

$$(1/|\Omega|)g + (1 - (1/|\Omega|))a_0$$
  
 
$$\sim_S (E_p(u(g)|S)/|\Omega|)a_1 + (1 - (E_p(u(g)|S)/|\Omega|))a_0.$$

Thus, by transitivity,  $f \approx_S g$  if and only if

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$$(E_{p}(u(f)|S)/|\Omega|)a_{1} + (1 - (E_{p}(u(f)|S)/|\Omega|))a_{0}$$
  
$$\geq_{S} (E_{p}(u(g)|S)/|\Omega|)a_{1} + (1 - (E_{p}(u(g)|S)/|\Omega|))a_{0}.$$

But by monotonicity, this final relation holds if and only if

$$E_p(u(f)|S) \ge E_p(u(g)|S),$$

 $a_1 >_S a_0$ . Thus, condition (1.5) is satisfied because interest and strict subjective sub stitution guarantee that

Next, we derive condition (1.4) from the axioms. For any events R

$$\left(\frac{1}{|R|}\right)b_{R} + \left(1 - \frac{1}{|R|}\right)a_{0} = \left(\frac{1}{|R|}\right)\sum_{r \in R}b_{\{r\}}$$

$$-s\left(\frac{1}{|R|}\right)\sum_{r \in R}\left(p(r|S)a_{1} + (1 - p(r|S))a_{0}\right)$$

$$=\left(\frac{1}{|R|}\right)\left(p(R|S)a_{1} + (1 - p(R|S))a_{0}\right) + \left(1 - \frac{1}{|R|}\right)a_{0},$$

by objective substitution. (|R| is the number of using Axioms 1.5A and 1.5B, we get states in the set R.) Then,

$$b_R \sim_S p(R|S)a_1 + (1 - p(R|S))a_0.$$

So the above function, as defined above. p(r|S) = 0 if  $r \notin S$ , and p(S|S) = 1. Thus, p is a conditional-probability By the relevance axiom,  $b_s \sim_s a_1$  and, for formula implies (using monotonicity any r not in S,  $b_{\{r\}} \sim_S a_0$ . and interest) that

Now, suppose that  $R \subseteq S \subseteq T$ . Using  $b_s \sim_s a_1$  again, we get

$$b_R \sim_S p(R|S)b_S + (1 - p(R|S))a_0.$$

S. relevance also implies Furthermore, because  $b_R$ ,  $b_S$ , and  $a_0$  all give the same worst prize outside

$$b_R \sim_{T \setminus S} p(R|S)b_S + (1 - p(R|S))a_0.$$

(Here  $T \setminus S = \{t | t \in T, t \notin S\}$ .) So, by subjective and objective substitution,

$$b_{R} \sim_{T} p(R|S)b_{S} + (1 - p(R|S))a_{0}$$

$$\sim_{T} p(R|S)(p(S|T)a_{1} + (1 - p(S|T))a_{0}) + (1 - p(R|S))a_{0}$$

$$= p(R|S)p(S|T)a_{1} + (1 - p(R|S))p(S|T))a_{0}.$$

But  $b_R \sim_T p(R|T)a_1 + (1 - p(R|T))a_0$ . Also,  $a_1 >_T a_0$ , so monotonicity implies that p(R|T) = p(R|S)p(S|T). Thus, Bayes's formula (1.4) follows from the axioms.

constructed. and  $[z] \sim_{\{i\}} a_0$ , so that u(y,t) = 1 and u(z,t) = 0 by monotonicity. So the range condition (1.3) is also satisfied by the utility function that we have If y is the best prize and z is the worst prize in state t, then  $[y] \sim_{\{i\}} a_1$ 

other state r (because [x]  $\sim_{\{i\}} \beta a_1 + (1 - \beta)a_0$  implies [x] the same unique). So Axiom 1.8 implies that u is state-independent. If state neutrality is also given, then the decision-maker will give us -  $\beta$ ) $a_0$ , and monotonicity and interest guarantee that his answer is answer when we assess u(x,t) as when we assess u(x,r) for any  $\sim_{\{r\}} \beta a_1$ 

existence of functions utheorem is sufficient to To expected-utility formula, verification of the axioms is straightforward. only for Axiom 1.8). If and leave the rest as an To complete the proof of the theorem, it remains to show that the illustrate, we show the proof of one axiom, subjective substitution, we use the basic mathematical properties of the imply all the axioms (using state independence exercise for the reader. and p that satisfy conditions (1.3)-(1.5) in the

implies that Suppose that  $f \geq_S g$  a  $E_p(u(g)|S)$  and  $E_p(u(f)|T) \ge E_p(u(g)|T)$ . But Bayes's formula (1.4) and  $f \ge_T g$  and  $S \cap T = \emptyset$ . By (1.5),  $E_p(u(f)|S)$ 

$$E_{p}(u(f)|S \cup T) = \sum_{t \in S \cup T} \sum_{x \in X} p(t|S \cup T) f(x|t) u(x,t)$$

$$= \sum_{t \in S} \sum_{x \in X} p(t|S) p(S|S \cup T) f(x|t) u(x,t)$$

$$+ \sum_{t \in T} \sum_{x \in X} p(t|T) p(T|S \cup T) f(x|t) u(x,t)$$

$$= p(S|S \cup T) E_{p}(u(f)|S) + p(T|S \cup T) E_{p}(u(f)|S)$$

and

 $E_p(u(g)|S \cup T) = p(S|S \cup T)E_p(u(g)|S) + p(T|S \cup T)E_p(u(g)|S).$ 

So  $E_p(u(f)|S \cup T) \ge E_p(u(g)|S \cup T)$  and  $f \ge s \cup T g$ .

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#### 1.5 Equivalent Representations

When we drop the range condition (1.3), there can be more than one pair of utility and conditional-probability functions that represent the same decision-maker's preferences, in the sense of condition (1.5). Such equivalent representations are completely indistinguishable in terms of their decision-theoretic properties, so we should be suspicious of any theory of economic behavior that requires distinguishing between such equivalent representations. Thus, it may be theoretically important to be able to recognize such equivalent representations.

Given any subjective event S, when we say that a utility function v and a conditional-probability function q represent the preference ordering  $\geq_S$ , we mean that, for every pair of lotteries f and g,  $E_q(v(f)|S) \geq E_q(v(g)|S)$  if and only if  $f \geq_S g$ .

**THEOREM 1.2.** Let S in  $\Xi$  be any given subjective event. Suppose that the decision-maker's preferences satisfy Axioms 1.1AB through 1.7, and let u and p be utility and conditional-probability functions satisfying (1.3)–(1.5) in Theorem 1.1. Then v and q represent the preference ordering  $\geq_S$  if and only if there exists a positive number A and a function  $B:S \to \mathbb{R}$  such that

$$q(t|S)v(x,t) = Ap(t|S)u(x,t) + B(t), \quad \forall t \in S, \quad \forall x \in X.$$

*Proof.* Suppose first that A and  $B(\cdot)$  exist as described in the theorem. Then, for any lottery f,

$$E_q(v(f)|S) = \sum_{t \in S} \sum_{x \in X} f(x|t)q(t|S)v(x,t)$$
$$= \sum_{t \in S} \sum_{x \in X} f(x|t)(Ap(t|S)u(x,t) + B(t))$$

$$= A \sum_{t \in S} \sum_{x \in X} f(x|t)p(t|S)u(x,t) + \sum_{t \in S} B(t) \sum_{x \in X} f(x|t)$$

$$= AE_{p} (u(f)|S) + \sum_{t \in S} B(t),$$

because  $\Sigma_{x \in X} f(x|t) = 1$ . So expected v-utility with respect to q is an increasing linear function of expected u-utility with respect to p, because A > 0. Thus,  $E_q(v(f)|S) \ge E_q(v(g)|S)$  if and only if  $E_p(u(f)|S) \ge E_p(u(g)|S)$ , and so v and q together represent the same preference ordering over lotteries as u and p.

Conversely, suppose now that v and q represent the same preference ordering as u and p. Pick any prize x and state t, and let

$$= \frac{E_q(v(c_{x,l})|S) - E_q(v(a_0)|S)}{E_q(v(a_1)|S) - E_q(v(a_0)|S)}.$$

Then, by the linearity of the expected-value operator,

$$E_q(v(\lambda a_1 + (1 - \lambda)a_0)|S) = E_q(v(a_0)|S) + \lambda (E_q(v(a_1)|S) - E_q(v(a_0)|S))$$
  
=  $E_q(v(c_{x,t})|S)$ ,

so  $c_{\mathbf{x},t} \sim_S \lambda a_1 + (1-\lambda)a_0$ . In the proof of Theorem 1.1, we constructed u and p so that

$$c_{x,t} \sim_S u(x,t)b_{\{t\}} + (1 - u(x,t))a_0$$
  
$$\sim_S u(x,t)(p(t|S)a_1 + (1 - p(t|S))a_0) + (1 - u(x,t))a_0$$
  
$$\sim_S p(t|S)u(x,t)a_1 + (1 - p(t|S)u(x,t))a_0.$$

The monotonicity axiom guarantees that only one randomization between  $a_1$  and  $a_0$  can be just as good as  $c_{x,t}$ , so

$$\lambda = p(t|S)u(x,t).$$

But  $c_{x,t}$  differs from  $a_0$  only in state t, where it gives prize x instead of the worst prize, so

$$E_q(v(c_{x,t})|S) - E_q(v(a_0)|S) = q(t|S) \left(v(x,t) - \min_{z \in X} v(z,t)\right).$$

Thus, going back to the definition of  $\lambda$ , we get

$$p(t|S)u(x,t) = \frac{q(t|S)(v(x,t) - \min_{z \in X} v(z,t))}{E_q(v(a_1)|S) - E_q(v(a_0)|S)}.$$

Now let

$$A = E_q(v(a_1)|S) - E_q(v(a_0)|S),$$

and let

$$B(t) = q(t|S) \min_{z \in X} v(z,t).$$

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