1

3 Till Gruene-Yanoff

4

University of Helsinki, Helsinki, Finland

5	Introduction	2
6	Rational Choice Theory	2
7	Normative Validity and the Role of Paradox in RCT	4
8	The Notion of Paradox	6
9	The Paradoxes	7
10	Preferences	7
11	Belief	10
12	Expected Utility	10
13	Strategic Interaction	13
14	Further Research	16

S. Roeser (ed.), *Handbook of Risk Theory*, DOI 10.1007/978-94-007-1433-5\_27, © Springer Science+Business Media B.V. 2011

Abstract: Rational choice theory (RCT) is beset with paradoxes. Why, then, bother with a 15 theory that raises numerous counterexamples, contradictions, and a seemingly endless stream 16 of mutually conflicting remedies? In contrast to this impression, I argue in this chapter that 17 RCT paradoxes play much more productive roles. Eight paradoxes are described in detail, 18 19 some of their proposed solutions are sketched out, and they are classified according to the kind of paradox they pose. At their example I argue that RCT paradoxes, rather than providing 20 evidence for straightforward rejections of the theory, play important roles in education and in 21 normative research. 22

## Introduction

2

23

Rational choice theory (RCT) is beset with paradoxes. Why, then, bother with a theory that raises numerous counterexamples, contradictions and a seemingly endless stream of mutually conflicting remedies? That, at least, may be the impression of a novice student of RCT. In contrast, I argue in this chapter, RCT paradoxes play a much more productive role. Rather than suggesting straightforward rejections of the theory, or repellents to any newcomer, paradoxes play important roles in education and in normative research.

RCT has a clear normative function: it offers tools for judging how people *ought* to form 30 their preferences – and by extension, how they ought to choose. A major problem is that there is 31 no hard basis against which to test normative theoretical claims - one cannot seek to falsify 32 such a theory with controlled experiments. Instead, researchers have to rely on normative 33 intuitions about assumptions and conclusions, and use theory to check whether these intui-34 tions can be held consistently. This is where RCT paradoxes play a crucial role: they elicit 35 normative intuitions that pitch RCT assumptions and conclusions against each other. If a 36 paradox leads to a revision of the theory, it serves a research purpose. If it leads to a better 37 38 understanding of the assumptions and their conclusions, it serves an educational purpose. Thus, many RCT paradoxes have proved, and continue, to be productive. 39

The chapter continues with a brief overview of RCT in Sect. 2, recalling the normative claims it really makes. Section 3 discusses how its normative validity can be examined, and the roles paradoxes play in that. Section 4 offers a classification of different kinds of paradoxes. Eight selected paradoxes are surveyed in Sect. 5, sub-sectioned into paradoxes of preference, belief, expected utility, and strategic interaction. Each one is explained, some of its proposed solutions are sketched out, and it is classified according to the scheme proposed in Sect. 4. Section 6 concludes the chapter.

## **Rational Choice Theory**

47

48 RCT is the dominant theoretical approach in microeconomics (although economists rarely 49 use the term "rational choice theory"). It is also widely used in other social-science disciplines, 50 in particular political science. In this context, the term rational choice theory is often associated 51 with the notion of economic "imperialism," implying that its use extends economics method-52 ology into their fields.

Explicit theories of rational economic choice were first developed in the late nineteenth century, and commonly linked the choice of an object to the increase in happiness an additional increment of this object would bring. Early neoclassical economists (e.g., William Stanley Jevons) held that agents make consumption choices so as to maximize their own happiness. In contrast, twentieth-century economists disassociated RCT and the notion of happiness: they presented rationality merely as maintaining a consistent ranking of alternatives. Such a ranking is commonly interpreted as agents' desires or values.

Having no foundation in an ultimate end, the notion of rationality is reduced to the 60 consistent ranking of choice alternatives, the consistent derivation of this ranking from 61 evaluations of possible outcomes, and a consistency of beliefs employed in this derivation. 62 Thus, "rationality" explicated in RCT is considerably narrower and possibly sometimes at odds 63 64 with colloquial or philosophical notions. In philosophical contexts it often includes judgments about ends, the prudent weighting of long-term versus short-term results, and insights into 65 purportedly fundamental moral principles. Nothing of this sort is invoked in RCT, which 66 simply claims that a rational person chooses actions in a manner consistent with his or her 67 beliefs and evaluations. Accordingly, a person considered "rational" in this sense may believe 68 that the moon is made of green cheese, may desire to waste his or her life, or may intend to 69 bring widespread destruction. 70

At the core of RCT is a formal framework that (1) makes the notion of preference consistency precise and (2) offers formal proof that "maximizing one's utility" is identical to "choosing according to a consistent preference ranking." A brief sketch of this framework follows. (The framework presented here is based on von Neumann and Morgenstern (1947). Alternative formal frameworks are to be found in Savage (1954) and Jeffrey (1990).)

Let  $A = \{X_1, \ldots, X_n\}$  be a set of alternatives. Alternatives are either pure prospects or 76 lotteries. A pure prospect is a future event or state of the world that occurs with certainty. 77 For example, when purchasing a sandwich from a well-known international restaurant chain 78 I may expect certain taste experiences with near certainty. Lotteries, also called prospects under 79 risk, are probability distributions over events or states. For example, when consuming "pick-80 your-own" mushrooms an agent faces the lottery  $(X_1,p; X_2,1-p)$ , where  $X_1$  denotes the 81 compound outcome (which has probability p) of falling ill due to poisoning and  $X_2$  (with 82 probability 1-p) the compound outcome of not doing so. More generally, a lottery X consists of 83 a set of prospects  $X_1, \ldots, X_n$  and assigned probabilities  $p_1, \ldots, p_n$ , such that  $X = (X_1, p_1; \ldots, X_n p_n)$ . 84 Obviously, the prospects  $X_1, \ldots, X_n$  can be lotteries in themselves. 85

RCT takes preferences over actions to be evaluations of lotteries over action outcomes. Its main contribution is to specify the relationship between preferences over actions, and preferences as well as beliefs over the compound outcomes of the respective lottery. It does so by proving *representation theorems*. Such theorems show that, under certain conditions, all of an agent's preferences can be represented by a numerical function, the so-called utility function. Furthermore, the utility numbers of an action (i.e., lottery)  $X = (X_1, p_1; \dots X_m p_n)$  and its compound outcomes  $X_1, \dots, X_n$  are related to each other through the following principle:

$$u(X) = \sum_{i} p_i \times u(X_i) \tag{1}$$

In other words, the utility of a lottery is equal to the sum of the utilities of its compound outcomes, weighted by the probability with which each outcome comes about. This is an important result that significantly constrains the kind of preferences an agent can have. Of course, because the representation result is a formal proof, all the constraining information must already be present in the theorem's assumptions. I will sketch the main features of these

#### Paradoxes of Rational Choice Theory

assumptions here. (For a detailed discussion, see the references in footnote 2. For more indepth overviews, see textbooks such as Luce and Raiffa (1957), Mas-Colell et al. (1995,
Chaps. 1 and ● 6) and Resnik (1987). Hargreaves Heap et al. (1992, pp. 3–26) give an

101 introductory treatment.)

4

RCT assumes that, at any time, there is a fixed set of alternatives  $A = \{X_1, \ldots, X_n\}$  for any agent. With respect to the agent's evaluation of these prospects, it assumes that agents can always say that they prefer one prospect to another or are indifferent between them. More specifically, it assumes that the agent has a preference ordering  $\succeq$  over A, which satisfies the following conditions. First, the ordering is assumed to be *complete*, that is,

either 
$$X_i \succeq X_j$$
 or  $X_j \succeq X_i$  for all  $X_i, X_j \in A$ . (2)

107 Second, the ordering is assumed to be *transitive*, that is,

if  $X_i \succeq X_j$  and  $X_j \succeq X_k$ , then also  $X_i \succeq X_k$  for all  $X_i, X_j, X_k \in A$ . (3)

Completeness and transitivity together ensure that the agent has a so-called weak ordering over all prospects.

The second domain in which RCT makes consistency assumptions concerns beliefs. In 110 particular, it assumes that each rational agent has a coherent set of probabilistic beliefs. Coher-111 ence here means that beliefs can be represented as probability distributions that satisfy certain 112 properties. In particular, it is assumed that there is a probability function p over all elements 113 of A, and that this function satisfies the following assumptions: first, for any X,  $1 \ge p(X) = p(X$ 114 0; second, if X is certain, then p(X) = 1; third, if two alternatives X and Y are mutually 115 exclusive, then p(X or Y) = p(X) + p(Y); finally, for any two alternatives X and Y, p(X and Y)116  $Y = p(X) \times P(Y|X) - in other words the probability of the alternative "X and Y" is identical to$ 117 the probability of X multiplied by the probability of Y given that X is true. 118

The third domain in which rational choice theory makes consistency assumptions concerns preferences over lotteries. In particular, it assumes the *independence condition*. If a prospect X is preferred to a prospect Y, then a prospect that has X as one compound outcome with a probability p is preferred to a prospect that has Y as one compound with a probability p and is identical otherwise: that is, for all X,Y,Z: if  $X \succeq Y$  then  $(X,p;Z,1-p) \succeq (Y,p;Z,1-p)$ .

These assumptions (together with a few others that are not relevant here) imply that preferences over lottery prospects  $X = (X_1, p_1; ..., X_m p_n)$  are represented by a utility function such that for all *X*, *Y*:

$$X \succeq Y \Leftrightarrow \sum_{i} [p_i \times u(X_i)] \ge \sum_{i} [p_i \times u(Y_i)].$$
(4)

127 This formal result has been given different interpretations. My focus in the following is on 128 the *normative* interpretation of RCT.

## Normative Validity and the Role of Paradox in RCT

129

RCT is often interpreted as a theory of how people *ought* to form their preferences – and by
extension, how they ought to choose (for a history of this approach, see Guala 2000). Although
the normative content of the theory is limited to the norms of a consistent ranking of choice

alternatives, I showed in the previous section that this notion of consistency depends on
a number of substantial axioms. This raises the question of the *normative validity* of these
axioms: why ought people to choose in accordance with them?

Various attempts have been made to defend the normative validity of RCT and its axioms.
The most prominent justifications are pragmatic: they seek to show that agents who fail to
retain RCT-consistency will incur certain losses. Two well-known examples are the *money pump* and the *Dutch book* arguments (for more on this and other normative justifications, see
Hansson and Grüne-Yanoff 2009, Sect. 1).

Interpreted literally, neither the money pump nor the Dutch book is very convincing. 141 142 An agent could simply refuse to accept money-pumping trades or Dutch-booking bets. Thus, rationality does not literally require one to be willing to wager in accordance with RCT. 143 Defenders of pragmatic justifications may argue that money pumps or Dutch books reveal 144 possible vulnerability from RCT-violations: a RCT violator might have an incentive to accept 145 a money pump trade or a Dutch book bet, while a RCT-abider does not. However, even such 146 a hypothetical interpretation is problematic. For example, one could deny that the situations 147 considered are normatively relevant to actual preferences. Consequently, it could be argued 148 that norms of preference consistency are primitive in the sense that they are not derived from 149 anything, and in particular not from pragmatic considerations. 150

Instead, some argue that normative judgments arise directly through human intuition, 151 guided by reflection. These judgments are grounded in characteristic human responses of 152 an emotional or motivating kind. (Such a view does not presuppose a non-cognitivist account 153 of normative judgment. At least on the epistemological level, even cognitivist theories of 154 normativity are likely to appeal to something like natural human responses - no doubt refined 155 by education and reason - to explain how we identify moral facts and evaluate moral claims.) 156 While considerations such as the money pump or the Dutch book may elicit such intuitions, it 157 would be misguided to assume that pragmatic considerations form their basis. Rather, nor-158 159 mative intuitions themselves are basic, and form the basis of normative validity judgments of RCT, in this view. 160

So much the worse for the normative validity of RCT axioms, one might be tempted to reply. To be sure, our emotional or motivating responses to questions of preference consistency often differ and are contradictory. Hence, it seems to follow that any proposed set of axioms is nothing more than the expression of a subjective intuition, fuelled at best by positional or rhetorical power.

Defenders of a stronger validity claim may respond in at least two ways to this challenge. 166 First, they may point out that normative intuitions are not merely claimed to be valid 167 individually, but rather that RCT makes a claim about the normative validity of the whole 168 set of assumptions and all the results deduced from it. For example, the maximization of 169 expected utility is a consequence of standard RCT axioms, not an axiom itself. If one has 170 doubts about the normative validity of this conclusion, one has to trace it back to these axioms, 171 re-check their validity, and weight one's doubts in the conclusion against one's confidence in 172 them. This view of normativity thus rests on the idea of a reflective equilibrium: we "test" 173 various parts of our system of normative intuitions against the other intuitions we have made, 174 looking for ways in which some of them support others, seeking coherence among the widest 175 176 set, and revising and refining them at all levels when challenges to some arise from others (for more on the method of reflective equilibrium, see Daniels 2008). 177

6

#### Paradoxes of Rational Choice Theory

Second, the defender may point out that normative intuitions are widely accepted only if they withstand being tested in a communally shared effort of "normative falsification" (Guala 2000). Savage described this effort as follows:

In general, a person who has tentatively accepted a normative theory must conscientiously study
 situations in which the theory seems to lead him astray; he must decide for each by reflection –
 deduction will typically be of little relevance – whether to retain his initial impression of the
 situation or to accept the implications of the theory for it. (Savage 1954, p. 102)

Theorists have to engage in thought experiments in order to elicit these normative intuitions – or "initial impressions," as Savage calls them. Thereby they investigate their normative intuitions in as wide a scope of hypothetical situations as possible, either challenging or confirming particular normative judgments. At the end of this process they only use the intuitions that hold up against normative falsification to challenge the theory:

If, after thorough deliberation, anyone maintains a pair of distinct preferences that are in conflict
 with the sure-thing principle, he must abandon, or modify, the principle; for that kind of
 discrepancy seems intolerable in a normative theory. (Savage 1954, p. 102)

Normative falsification and reflective equilibrium thus go hand in hand: the former generates "corroborated" normative intuitions, and the latter weighs the importance of these intuitions against conflicting intuitions in the theory under scrutiny.

How, then, does one go about normative falsification? How are "situations" constructed in 196 which one obtains "initial impressions" that conflict with the theory? This is where RCT 197 paradoxes come into play. These paradoxes are exemplar narratives of situations that have 198 posed problems for RCT, many of which have been discussed amongst experts for decades. 199 Sometimes agreed-upon solutions exist, and the paradox is used only for pedagogical purposes 200 - to increase understanding of the theory or to illustrate the process of thought experimenta-201 202 tion. At other times, competing solutions are offered, some of which may threaten the current theory. In that case, RCT paradoxes constitute the laboratory equipment of ongoing decision-203 theoretical research. 204

## The Notion of Paradox

205

Philosophers have distinguished between two accounts of paradoxes. The argumentative model, 206 proposed by Quine (1966) and Sainsbury (1988), defines a paradox as an argument that 207 appears to lead from a seemingly true statement or group of statements to an apparent or 208 real contradiction, or to a conclusion that defies intuition. To resolve a paradox, on this 209 account, is to show either (1) that the conclusion, despite appearances, is true, that the 210 argument is fallacious, or that some of the premises are false, or (2) to explain away the 211 deceptive appearances. The non-argumentative model, proposed by Lycan (2010), defines 212 a paradox as an inconsistent set of propositions, each of which is very plausible. To resolve 213 a paradox under this account is to decide on some principled grounds which of the proposi-214 tions to abandon. 215

Consequently, the argumentative model allows distinguishing different kinds of paradoxes.
Quine divides them into three groups. A *veridical paradox* produces a conclusion that is valid,
although it appears absurd. (Quine thought of paradoxes pertaining to the truth of deductive

statements. In contrast, the validity of decision-theoretic assumptions and conclusions concerns normative validity, which may or may not be reducible to truth. I will therefore use "validity" where Quine spoke of "truth.") For example, the paradox of Frederic's birthday in *The Pirates of Penzance* establishes the surprising fact that a 21-year-old would have had only five birthdays had he been born in a leap year on February 29.

A *falsidical paradox* establishes a result that is actually invalid due to a fallacy in the demonstration. DeMorgan's invalid mathematical proof that 1 = 2 is a classic example, relying on a hidden division by zero.

Quine's distinction here is not fine enough for the current purposes. A falsidical paradox in his terminology, so it seems, can be the result of two very different processes. A genuine falsidical paradox, I suggest, identifies the root of the invalidity of the conclusion in the invalidity of one or more of the assumptions. In contrast, what I call an *apparent paradox* establishes the root of the invalidity of the conclusion in the unsoundness of the argument.

A paradox that is in neither class may be an *antinomy*, which reaches a self-contradictory result by properly applying accepted ways of reasoning. Antinomies resist resolutions: the appearances cannot be explained away, nor can the conclusion be shown to be valid, some premises shown to be invalid, or the argument shown to be unsound. Antinomies, Quine says, "bring on the crisis in thought" (1966, p. 5). They show the need for drastic revision in our customary way of looking at things.

The non-argumentative account rejects Quine's classification, pointing out his assump-238 tion of an intrinsic direction in the relationship between "assumptions" and "conclusions." 239 This, so Lycan argues, may give the wrong impression that certain kinds of paradoxes are to 240 be solved in particular ways. Conversely, he points out that two theorists may disagree on 241 whether a paradox is veridical or not: "one theorist may find the argument veridical while 242 the other finds the 'conclusion's' denial more plausible than one of the 'premises'" (Lycan 243 2010, p. 3). In what follows, I will make use of Quine's classification. Nevertheless, I stress -244 245 in agreement with Lycan – that it is only to be understood as an indicator of how the majority of theorists have sought resolution, not as a claim about the intrinsic nature of the 246 paradox itself. 247

## Au1

7

## **The Paradoxes**

248

256

Below I survey a selection of paradoxes that are currently relevant to RCT. By relevant here
I mean that they challenge one or more of the RCT axioms that are currently in wide use. For
more comprehensive literature on paradoxes, also in RCT, see Richmond and Sowden (1985),
Diekmann and Mitter (1986), Sainsbury (1988), and Koons (1992).

The survey is structured according to the aspect of RCT under challenge. As it turns out, it is not always clear which axiom is being challenged. I therefore divide the subsections into paradoxes of preferences, belief, expected utility maximization, and strategic choice.

- Preferences
- 257 Of the many paradoxes challenging assumptions about preferences I will survey two: the Sorites
- <sup>258</sup> Paradox applied to preference transitivity and Allais' paradox.

8

#### Paradoxes of Rational Choice Theory

Sorites paradoxes are arguments that arise from the indeterminacy surrounding the limits of application of the predicates involved (for a general overview, see Hyde 2008). The Sorites scheme has been applied to RCT in order to cast doubt on the rationality of the transitivity of preference. Quinn's (1990) version goes as follows:

A person (call him *the self-torturer*) is strapped to a conveniently portable machine, which administers a continuous electric current. The device has 1,001 settings: 0 (off) and 1 . . . 1,000, of increasing current. The increments in current are so tiny that he cannot feel them. The selftorturer has time to experiment with the device so that he knows what each of the settings feels like. Then, at any time, he has two options: to stay put or to advance the dial one setting. However, he may advance only one step each week, and he may never retreat. At each advance he gets \$10,000.

Since the self-torturer cannot feel any difference in comfort between adjacent settings, he appears to have a clear and repeatable reason to increase the current each week. The trouble is that there are noticeable differences in comfort between settings that are sufficiently far apart. Eventually, he will reach settings that will be so painful that he would gladly relinquish his monetary rewards and return to zero.

The paradox lies in the conclusion that the self-torturer's preferences are intransitive. All things considered, he prefers 1–0, 2–1, 3–2, and so on, but certainly not 1,000–1. Furthermore, there seems to be nothing irrational about these preferences.

The self-torturer's intransitive preferences seem perfectly natural and appropriate given his
 circumstances. (Quinn 1990, p. 80)

If this were correct, the normative validity of the transitivity axiom would be in doubt. Defenders of transitivity argue that there is a mistake either in the conception of the decision situation or in the process of evaluation that leads to the intransitive preferences. Both Arntzenius and McCarthy (1997) and Voorhoeve and Binmore (2006) follow the first option in rejecting the implicit assumption that there is a "least-noticeable difference": a magnitude of physical change so small that human beings always fail to detect a difference between situations in which a change smaller than this magnitude has or has not occurred.

Instead, they argue that it is rational for the self-torturer to take differences in long-run frequencies of pain reports into account. In other words, when repeatedly experimenting with the machine he may well experience different amounts of pain at the same notch. He will represent this information about how a notch feels by means of a distribution over different levels of pain: two notches "feel the same" only if they have the same distribution. Then it is implausible that all adjacent notches feel the same when the self-torturer runs through them in ascending order, and the intransitivity disappears.

Thus, Quinn's paradox has been treated as an apparent paradox: an implicit, illegitimate assumption of the derivation – of a "least-noticeable difference" – is exposed, and the dependency of the deductive conclusion on this assumption is shown.

*Allais' Paradox* (Allais 1953) sets up two specific choices between lotteries in order to challenge the sure-thing principle (an axiom in Savage's decision theory, related to the axiom of independence). This choice experiment is described in **●** *Table 27.1*.

RCT prescribes that agents choose *C* if they have chosen *A* (and vice versa), and that they choose *D* if they have chosen *B* (and vice versa). To see this, simply re-partition the prizes of the two problems as follows: Instead of "2,400 with certainty" in *B*, partition the outcome such that it reads "2,400 with probability 0.66" and "2,400 with probability 0.34." Instead of "0 with

## t1.1 Table 27.1 Allais' two pairs of choices

Choice problem 1 – choose between:					
A:	\$2,500	With probability 0.33	В:	\$2,400	With certainty
	\$2,400	With probability 0.66			
	\$0	With probability 0.01			
Choice problem 2 – choose between:					
С:	\$2,500	With probability 0.33	D:	\$2,400	With probability 0.34
	\$0	With probability 0.67		\$0	With probability 0.66

## t2.1 Table 27.2 The redescribed choice pairs

					the second se	
+ <b>2</b> 2	Choice problem 1* – choose between:					
t2.2	A:	\$2,500	With probability 0.33	B*:	\$2,400	With probability 0.34
t2.4		\$0	With probability 0.01			
10 F	Choice problem 2* – choose between:					
t2.5 t2.6	C*:	\$2,500	With probability 0.33	D:	\$2,400	With probability 0.34
t2.7		\$0	With probability 0.01			

probability 0.67" in *C*, partition the outcome such that it reads "0 with probability 0.66" and "0 with probability 0.01." Of course, these are just redescriptions that do not change the nature of the choice problem. They are shown in  $\bigcirc$  *Table 27.2*.

Through this redescription, we now have an outcome "2,400 with probability 0.66" in both *A* and  $B^*$ , and an outcome "0 with probability 0.66" in both  $C^*$  and *D*. According to the RCT independence condition, these identical outcomes can be disregarded in the deliberation, but once they are disregarded it becomes clear that option *A* is identical to option  $C^*$  and option  $B^*$  is identical to option *D*. Hence, anyone choosing *A* should also choose *C* and anyone choosing *B* should also choose *D*.

This result has been found both empirically and normatively challenging for RCT. (In sharp contrast to the RCT result, in an experiment involving 72 people, 82% of the sample chose *B* and 83% chose *C* (Kahneman and Tversky 1979).) On the normative level, many people seem to have intuitions contradicting the above conclusions:

When the two situations were first presented, I immediately expressed preference for Gamble 1 [A] as opposed to Gamble 2 [B] and for Gamble 4 [D] as opposed to Gamble 3 [C], and I still feel an intuitive attraction to these preferences. (Savage 1954, p. 103)

This empirical and normative challenge has given rise to a number of alternatives, including prospect theory (Kahneman and Tversky 1979), weighted utility (Chew 1983) and

#### Paradoxes of Rational Choice Theory

rank-dependent expected utility (Quiggin 1982). However, the normative validity of these 322 theories is often controversial. Many decision theorists have rather followed Savage, who 323 despite his initial intuitions decided that the sure-thing axiom was, after all, correct. He arrived 324 at this by redescribing Allais' choice situation in yet another form, observing a change of 325 preference from C to D in this case, and concluded that "in revising my preferences between 326 Gambles 3 [C] and 4 [D] I have corrected an error" (Savage 1954, p. 103). Decision theorists 327 following Savage have thus treated Allais' paradox as a veridical paradox: the initial impression 328 that the conclusion is absurd is explained away, and the theoretical conclusion is confirmed 329 to be correct. 330

Belief

331

10

<sup>332</sup> I discuss only one paradox of belief here, namely the *Monty Hall problem*. It is posed as follows:

Suppose you're on a game show, and you're given the choice of three doors: Behind one door is
 a car; behind the others, goats. You pick a door, say No. 1, and the host, who knows what's behind
 the doors, opens another door, say No. 3, which has a goat. He then says to you, "Do you want to
 pick door No. 2?" Is it to your advantage to switch your choice? (vos Savant 1990).

After picking a door at random, it may seem that it is rational to believe that the remaining door holds the car with probability  $\frac{1}{2}$ . After all, either the chosen door or the other one conceals the prize – so should both doors rather be assigned an equal probability of holding the car?

They should not. At first, before the contestant picks a door, it is rational for him or her to believe that the car is behind any of them with probability  $\frac{1}{3}$ , knowing that the host will be able to open a door not holding the prize since at least one of the other doors must conceal a goat. Therefore, when the host opens a door the contestant does not learn anything relevant to his or her belief in having chosen the winning door – it remains at  $\frac{1}{3}$ . Now the offered swap is equivalent to the opportunity of opening both other doors – and he or she should rationally believe that this offers a  $\frac{2}{3}$  probability of winning the car. Hence, it is advantageous to swap.

The Monty Hall problem clearly falls into the class of veridical paradoxes: the argument is 348 correct and does not rely on implicit illegitimate assumptions, and the conclusion, despite 349 appearances, is valid. Furthermore (unlike in most other paradoxes discussed here), the result 350 can be experimentally confirmed: the frequency of the prize being behind the other door is 351 observed indeed to converge to  $\frac{2}{3}$  (hence there is even a pragmatic confirmation of the 352 normative intuition). The striking thing about this paradox is that the presentation of the 353 correct answer initially created a huge outcry, not least from academically trained mathe-354 maticians and logicians (see http://www.marilynvossavant.com/articles/gameshow.html for a 355 selection). The correct solution appeared to be false, but this appearance was explained away 356 with the help of standard probability theory. 357

## **Expected Utility**

359 I will now discuss three paradoxes that challenge some fundamental assumptions about the

rationality of expected utility maximization: the Ellsberg paradox, Newcomb's problem and the

361 Envelope paradox.

The *Ellsberg paradox* (Ellsberg 1961) goes as follows. An urn contains 30 red balls and 60 other balls that are either black or yellow. You do not know how many black or yellow balls there are, but you do know that the total number of black balls plus the total number of yellow balls equals 60. The balls are well mixed so that each individual one is as likely to be drawn as any other. You are now given a choice between two gambles ( **Table 27.3**).

You are also given the choice between these two gambles with regard to a different draw from the same urn (**)** *Table 27.4*).

Standard (Bayesian) decision theory postulates that when choosing between these gambles, people assume a probability that the non-red balls are yellow versus black, and then compute the expected utility of the two gambles. This leads to the following line of reasoning. The prizes are exactly the same. Hence, according to expected utility theory, a rational agent (weakly) prefers *A* to *B* if and only if he or she believes that drawing a red ball is at least as likely as drawing a black ball. Similarly, a rational agent (weakly) prefers *C* to *D* if and only if he or she believes that drawing a red or yellow ball is at least as likely as drawing a black or yellow ball.

Now, if drawing a red ball is at least as likely as drawing a black ball, then drawing a red or 376 yellow ball is also at least as likely as drawing a black or yellow ball. Thus, supposing that 377 a rational agent (weakly) prefers A to B, it follows that he or she will also (weakly) prefer C to D, 378 whereas supposing instead a weak preference for D over C, it follows that he or she will also 379 weakly prefer B to A. When surveyed, however, most people (strictly) prefer Gamble A to 380 Gamble B and Gamble D to Gamble C. Furthermore, they often insist on this choice, even if the 381 theory is explained to them. Therefore, the normative validity of some assumptions of RCT 382 seems in question. 383

Ellsberg's paradox poses an interesting challenge to RCT. On the one hand, some scholars 384 have insisted that the standard solution is correct, making it a veridical paradox whose 385 paradoxical impression is explained away. Fox and Tversky (1995), for example, offer an 386 empirical explanation of why people may be biased in their decision-making through an 387 388 impression of comparative ignorance. Such bias, of course, has no normative validity: it only explains why people have wrong intuitions about what should be chosen. On the other 389 hand, others have argued that this ambiguity aversion is part of a rational decision, in a similar 390 way as a risk aversion is (Schmeidler 1989). Such a position would suggest that the Ellsberg 391 paradox is falsidical, brought about by assuming away the (rationally relevant) impact of 392 393 ambiguity aversion.

## t3.1 Table 27.3

## Ellsberg's first pair of choices

<del>1</del> 3 2	Gamble A	Gamble B	
13.Z	You receive \$100 if you draw a red ball	You receive \$100 if you draw a black ball	
1.5.5			

## t4.1 Table 27.4

### Ellsberg's pair of choices

t4 2	Gamble C	Gamble D
14.Z	You receive \$100 if you draw a red or yellow ball	You receive \$100 if you draw a black or yellow ball

#### Paradoxes of Rational Choice Theory

Newcomb's Problem (Nozick 1969) involves an agent's choosing either an opaque box 394 or the opaque and a transparent box. The transparent box contains one thousand dollars 395 (\$T) that the agent plainly sees. The opaque box contains either nothing (\$0) or one million 396 dollars (\$M), depending on a prediction already made concerning the agent's choice. If the 397 prediction was that the agent would take both boxes, then the opaque box will be empty, and if 398 it was that the agent would take just the opaque box then the opaque box would contain 399 a million dollars. The prediction is reliable. The agent knows all these features of the decision 400 problem. 401

Table 27.5 displays the agent's choices and their outcomes. A row represents an option,
 a column a state of the world, and a cell an option outcome in a state of the world.

Standard RCT posits that a rational agent should choose the option that maximizes 404 expected utility. This approach recommends taking only one box, for the following reasons. 405 First, the prediction is reliable. In other words, if the agent chooses only one box, then the 406 probability that "take one box" was predicted is high. Similarly, if the agent chooses two boxes, 407 then the probability that "take two boxes" was predicted is high. Hence the probability of 408 outcome M given that the agent chose only one box will be high, and the probability of 409 outcome M + T given that the agent chose two boxes will be low – sufficiently low in most 410 plausible cases for the expected utility of "taking one box" to be higher that that of "taking two 411 boxes." Hence one-boxing is the rational choice according to the principle of expected-utility 412 maximization. 413

414 Yet this recommendation violates two deeply entrenched intuitions. First, it violates 415 the principle of dominance, according to which an agent prefers one action to another if he 416 or she prefers every outcome of the first action to the corresponding outcomes of the second. 417 The normative validity of dominance is widely agreed upon. Yet, two-boxing clearly dominates 418 one-boxing in this sense. Consequently, RCT violates dominance.

419 Second, it violates the intuition that actions should be chosen on the basis of their causal 420 effects rather than their probabilistic correlations to benefits or drawbacks. Because the 421 prediction is made before the agent chooses, the choice has no causal impact on it, and the 422 probabilistic correlation should not matter.

This analysis has motivated a reformulation of decision theory on causal rather than evidential grounds. In various accounts, causal decision theorists seek to represent causal influence with their probability functions rather than with mere probabilistic correlation (see e.g., Gibbard and Harper 1981; Skyrms 1980; Joyce 1999). They clearly see Newcomb's problem as a falsidical paradox based on the misspecification of a decision maker's relevant beliefs.

Some authors opposing the causal approach hold that it yields the wrong choice in Newcomb's problem, in other words two-boxing rather than one-boxing. Horgan (1985)

## t5.1 **Table 27.5**

#### Newcomb's problem

+5 0		Prediction of one-boxing	Prediction of two-boxing
t5.2	Take one box	\$ <i>M</i>	\$0
t5 /	Take two boxes	\$M + \$T	\$T

and Horwich (1987), for example, argue that one-boxers fare better than two-boxers, and that
one-boxing is therefore the rational choice of action. They both see Newcomb's problem as
a veridical paradox, and propose explaining away the conflicting intuition about dominance
and causal influence with reference to pragmatic success. Causal decision theorists, in turn,
reject the relevance of these pragmatic considerations for the validity of the above intuitions.
They insist that Newcomb's problem is an unusual case, which rewards irrationality: oneboxing is irrational even if one-boxers prosper.

The *two-envelope paradox* goes as follows. You are asked to make a choice between two envelopes. You know that one of them contains twice the amount of money as the other, but you do not know which one. You arbitrarily choose one envelope – call it Envelope A – but do not open it. Call the amount of money in that envelope X. Since your choice was arbitrary, there is a 50–50 chance that the other envelope (Envelope *B*) will contain more money, and a 50–50 chance that it will contain less. Would you now wish to switch envelopes?

Calculating the apparent expected value of switching proceeds as follows. Switching to B 444 will give you a 50% chance of doubling your money and a 50% chance of halving it. Thus it 445 seems that the expected value of switching to B is  $E(Y - X) = 0.5^* 1/2X + 0.5^* 2X - X = 0.25X$ . 446 Hence, switching to B will give you a 25% higher expected return than sticking with A. This 447 seems absurd. First, many people have an intuition that one should be indifferent between A 448 and B as long as the envelope remains unopened. Second, once you have switched to B in line 449 with the above argument, a symmetrical calculation could persuade you to switch back to A. 450 Therein lies the paradox. 451

It is now widely agreed that the expected gain from switching, E(Y-X), is mathematically 452 undefined because the value of the infinite sum of all probability-weighted values of Y-X 453 depends on the order of summation (Meacham and Weisberg 2003). However, the conclusions 454 from this observation differ widely. Clark and Shackel (2000) argue that there is a "correct" 455 order of summation, which results in a zero infinite sum, and that this result justifies 456 indifference before opening the envelope. In contrast, Meacham and Weisberg (2003) express 457 reservations about selecting the "correct" order of summation: because the expected gain from 458 switching is undefined, standard decision theory does not rank switching against keeping. 459

Dietrich and List (2005) go along a different route and offer an axiomatic justification for 460 indifference before opening without appeal to infinite expectations. They supplement standard 461 462 decision theory with an additional axiom, the "indifference principle," according to which if two lotteries have identical distributions, a rational agent is indifferent between them. From 463 this they are able to deduce a justification for indifference before opening. All three of these 464 responses, although formulated against each other, consider the two-envelope paradox 465 falsidical: Clark and Shackel and Dietrich and List introduce additional assumptions, which 466 yield the intuitive conclusion, whereas Mechaem and Weisberg insist that the argument is 467 fallacious, and no conclusion is warranted from the given assumptions. 468

Strategic Interaction

469

470 Game theory is closely related to RCT. Although it requires certain assumptions beyond those

471 of the standard RCT axioms, its models give additional significance to those standard RCT

472 axioms that also play a role in game theory. For this reason, I include two game-theoretic

473 paradoxes here: the Prisoners' dilemma and the paradox of common knowledge.

The One-Shot *Prisoners' Dilemma* has attracted much attention because standard gametheoretic solution concepts unanimously advise each player to choose a strategy that will result in a Pareto-dominated outcome. It goes as follows.

Two gangsters who have been arrested for robbery are placed in separate cells. Both care 477 much more about their personal freedom than about the welfare of their accomplice. 478 A prosecutor offers each the following deal: choose to confess or remain silent. If one prisoner 479 confesses and the accomplice remains silent all charges against the former are dropped 480 (resulting in a utility of 3 in ) Table 27.6 – the first number in each cell is the utility of this 481 outcome for the player who chooses between rows, and the second number, the utility for the 482 483 player who chooses between columns). If the accomplice confesses and the first prisoner remains silent however, the latter will do time (utility 0 in S Table 27.6). If both confess, 484 each will get reduced sentences (utility 1), and if both remain silent the prosecutor has to settle 485 for token sentences for firearms possession (utility 2) (for extensive discussion and a literature 486 review, see Kuhn 2009). 487

The choice situation is solved by appeal to a simple dominance argument. For each player, if the other player stays silent it is better to confess than to stay silent. If the other player confesses, it is also better to confess than to stay silent. Hence, no matter what the other player does, it is always better to confess.

This result is often described as paradoxical in the following sense. The outcome obtained 492 when both confess, although it is rational for each to do so, is worse for each than the outcome 493 they would have obtained had both remained silent. Both would prefer to reach the outcome 494 "stay silent, stay silent," but their individually rational actions led them to the inferior result 495 "confess, confess." (To add some more urgency to this example, consider the structurally 496 similar problem of the "tragedy of the commons," according to which multiple individuals 497 acting independently and rationally will ultimately deplete a shared limited resource even when 498 it is clear that it is not in anyone's long-term interest for this to happen (Hardin 1968).) How 499 500 can such an inferior outcome be the result of rational decisions?

Some authors argue that the Prisoners' Dilemma indeed exposes a limitation of RCT rationality. Gauthier (1986), for example, suggests that, instead of always confessing, it would be rational for players to commit to playing cooperatively when faced with other cooperators who are equally committed to not exploiting one another's good will. This argument crucially depends on player confidence in that most players are clearly identifiable as being committed to cooperating or not. Whether such a belief can be rationally justified is questionable, and with it the whole solution to the dilemma.

The majority of authors see no conceptual problem in the Prisoners' Dilemma. The assumptions say nothing about the necessary selfishness of the players (charity organizations may also find themselves in such situations!), and no other illegitimate assumptions are

## t6 1 Table 27.6

#### The Prisoners' dilemma

t6.2		Stay silent	Confess
t6.3	Stay silent	2,2	0,3
t6 /	Confess	3,0	1,1

evident. The argument itself is valid, and the conclusion is not contradicted by normative intuitions. The only problem is terminological: some people chafe against the idea that the conclusion is supposed to be the result of rational decision-making. However, they simply subscribe to a different concept of rationality that RCT does not support. Hence the Prisoners' Dilemma is a veridical paradox, whose paradoxical nature relies on terminological ambiguity.

*Backward induction* is the process of reasoning backward in time, from the end of a problem, to determine a sequence of optimal actions. It proceeds by first considering the latest time a decision can be made and choosing what to do in any situation at that time. One can then use this information to determine what to do at the second-to-last time for the decision. This process continues backward until one has determined the best action for every possible situation at any point in time.

Let us take a concrete example, the "centipede game." This game progresses from left 523 to right in **O** Fig. 27.1. Player 1 (female) starts at the extreme left node, choosing to end the 524 game by playing *down*, or to continue (giving player 2, male, the choice) by playing *right*. The 525 payoffs are such that at each node it is best for the player whose move it is to stop the game if 526 and only if he or she expects it to end at the next stage if he or she continues (if the other player 527 stops the game or if it is terminated). The two zigzags stand for the continuation of the payoffs 528 along those lines. Now backward induction advises resolving the game by starting at the last 529 node z, asking what player 2 would have done had he ended up there. A comparison of player 530 2's payoffs for the two choices implies that he should have rationally chosen down. Given 531 common knowledge of rationality, the payoffs that result from this choice of down can be 532 substituted for node z. Let us now move backwards to player 1's decision node. What would she 533 have done had she ended up at node y? Given player 2's choice of down, she would have chosen 534 down, too. This line of argument then continues all the way back to the first node. Backward 535 induction thus recommends player 1 to play down at the first node. 536

537 What, then, should player 2 do if he actually found himself at node x? Backward induction 538 tells him to play "down," but backward induction also tells him that if player 1 were rational he 539 would not be facing the choice at node x in the first place. This is not a problem in that 540 Backward induction predicts that player 2 will never find himself at x unless both players 541 are irrational.

Yet what does this imply for the Backward-induction reasoning process itself? Backward induction requires the players to *counterfactually* consider out-of-equilibrium play. For example, player 1, according to Backward induction, should choose *down* at node 1, because she knows that player 2 would have chosen *down* at node 2, which in turn she knows because she would have chosen *down* at node 3, and so on, because ultimately she knows that player 2 would have chosen *down* at *z*. She knows this because she knows that player 2 is rational,



Au3 Fig. 25.1

#### Paradoxes of Rational Choice Theory

and that player 2 knows that she is rational, and so on. In the language of game theory,
because rationality is *common knowledge* amongst the players, backward induction applies
(for more on common knowledge, including a formal treatment of this paradox, see
Vanderschraaf and Sillari 2009).

Given common knowledge of rationality, each player can affirm the counterfactual "A 552 rational player finding himself or herself at any node in the centipede would choose down." Yet 553 we also concluded that if a player *finds* himself or herself at any node with an index number 554 larger than two then both player and opponent know that they are not rational. What if that 555 conclusion also made true the counterfactual "if a player found himself or herself at any node 556 557 with an index larger than two then both player and opponent *would* know that they are not rational"? If it did, Backward induction would break down: it requires (1) common knowledge 558 and (2) counterfactual consideration of how players would choose if they found themselves at 559 nodes with indices larger than two. However, (2) implies that both player and opponent would 560 know that they are not rational, contradicting (1). Herein lies the paradox (Pettit and Sugden 561 1989; Bicchieri 1989). 562

This is an intensely discussed problem in game theory and philosophy. There is space here 563 only to sketch two possible solutions. According to the first, common knowledge of rationality 564 implies backward induction in games of perfect information (Aumann 1995). This position 565 is correct in that it denies the connection between the indicative and the counterfactual 566 conditional. Players have common knowledge of rationality, and they are not going to lose it 567 regardless of the counterfactual considerations they engage in. Only if common knowledge 568 were not immune to evidence, and would be revised in the light of the opponents' moves, 569 might this sufficient condition for backward induction run into the conceptual problem 570 sketched above. However, common knowledge, by definition, is not revisable, and thus the 571 argument has to assume a *common belief* in rationality instead. If one looks more closely at the 572 versions of the above argument (e.g., Pettit and Sugden 1989) it becomes clear that they employ 573 574 the notion of common belief rather than common knowledge. Hence, the backward-induction paradox is only apparent: the argument that led to the seemingly contradictory conclusion 575 is unsound. 576

The second potential solution obtains when one shows, as Bicchieri (1993, Ochap. 4) does, that limited knowledge (and *not* common knowledge) of rationality and of the structure of the game suffice for backward induction. All that is needed is that a player at each information set knows what the next player to move knows. This condition does not get entangled in internal inconsistency, and backward induction is justifiable without conceptual problems. In that case, the backward-induction paradox is falsidical.

## **Further Research**

583

I have surveyed eight paradoxes of RCT. There is considerable divergence among them, under a rather rough classificatory scheme, even in this small selection. First, there are the veridical paradoxes, like the Prisoner's dilemma, the paradoxical nature of which rests merely on terminological ambiguity. Ways of explaining away the paradoxical appearance of other veridical paradoxes such as the Monty Hall problem are obvious, but are baffling to the novice. They can still serve an educational purpose, however, in that studying them clarifies the meaning of the assumptions and the derivation of the conclusion.

591 Second, there are (relatively) clear cases of falsidical paradoxes, such as the two-envelope 592 paradox. Here, there is a clear research result: RCT needs revision.

Third, there are some clear cases of apparent paradoxes, such as the self-torturer, in which the whole bluster is caused by a fallaciously set up argument.

Finally, there are cases on which researchers cannot agree. These include Newcomb's problem, Allais' and Ellsberg's paradox, which vacillates between veridical and falsidical assessment, and the Backward-induction paradox, which vacillates between falsidical and apparent assessment. In all these cases the verdict is still open as to whether they necessitate RCT revision or not. Hence their continuing examination is part of active research in this area.

## References

Au4 600

602	Allais M (1953) Le comportement de l'homme rationnel	Gibbard A, Harper W (1981) Counterfactuals and	641
603	devant le risque: critique des postulats et axiomes de	two kinds of expected utility. In: Harper W,	642
604	l'école Américaine. Econometrica 21:503–546	Stalnaker R, Pearce G (eds) Ifs: conditionals, belief,	643
605	Arntzenius F, McCarthy D (1997) Self torture and group	decision, chance, and time. Reidel, Dordrecht,	644
606	beneficence. Erkenntnis 47(1):129-144	pp 153–190	645
607	Aumann R (1995) Backward induction and common	Guala F (2000) The logic of normative falsification: ratio-	646
608	knowledge of rationality. Game Econ Behav 8:6–19	nality and experiments in decision theory. J Econ	647
609	Bicchieri C (1989) Self refuting theories of strategic	Methodol 7(1):59-93	648
610	interaction: a paradox of common knowledge.	Hansson SO, Grüne-Yanoff T (2009) Preferences. In:	649
611	Erkenntnis 30:69–85	Zalta EN (ed) The stanford encyclopedia of philos-	650
612	Bicchieri C (1993) Rationality and coordination.	ophy, springth edn. The Metaphysics Research	651
613	Cambridge University Press, Cambridge	Lab, Stanford, Available online: http://plato.stanford.	652
614	Campbell R, Sowden L (eds) (1985) Paradoxes of ratio-	edu/entries/preferences/	653
615	nality and cooperation: prisoner's dilemma and	Hardin G (1968) The tragedy of the commons. Science	654
616	Newcomb's problem. University of British Columbia	162(3859):1243–1248	655
617	Press, Vancouver	Hargreaves-Heap S, Hollis M, Lyons B, Sugden R, Weale	656
618	Chew SH (1983) A generalization of the quasilinear mean	A (1992) The theory of choice: a critical guide.	657
619	with application to the measurement of income	Blackwell, Oxford	658
620	inequality and decision theory resolving the Allais	Horgan T (1985) Counterfactuals and Newcomb's prob-	659
621	paradox. Econometrica 51:1065–1092	lem. In: Campbell R, Sowden L (eds) Paradoxes of	660
622	Clark M, Shackel N (2000) The two-envelope paradox.	rationality and cooperation: Prisoner's dilemma and	661
623	Mind 109(435):415-442	Newcomb's problem. University of British Columbia	662
624	Daniels N (2008) Reflective equilibrium. In: Zalta EN	Press, Vancouver, pp 159–182	663
625	(ed) The Stanford encyclopedia of philosophy,	Horwich P (1987) Asymmetries in time. MIT Press,	664
626	fallth edn. The Metaphysics Research Lab, Stanford,	Cambridge, MA	665
627	Available online: http://plato.stanford.edu/archives/	Hyde D (2008) Sorites paradox. In: Zalta EN (ed) The	666
628	fall2008/entries/reflective-equilibrium/	stanford encyclopedia of philosophy, fallth edn.	667
629	Diekmann A, Mitter P (1986) Paradoxical effects of social	The Metaphysics Research Lab, Stanford, Available	668
630	behavior: essays in honor of Anatol Rapoport.	online: http://plato.stanford.edu/archives/fall2008/	669
631	Physica-Verlag, Heidelberg and Vienna, Available	entries/sorites-paradox/	670
632	online: http://www.socio.ethz.ch/vlib/pesb/index	Jeffrey R (1990) The logic of decision, 2nd edn. University	671
633	Dietrich F, List C (2005) The two-envelope paradox: an	of Chicago Press, Chicago	672
634	axiomatic approach. Mind 114:239–248	Joyce J (1999) The foundations of causal decision theory.	673
635	Ellsberg D (1961) Risk, ambiguity, and the savage axioms.	Cambridge University Press, Cambridge	674
636	Q J Econ 75(4):643–669	Kahneman D, Tversky A (1979) Prospect theory: an	675
637	Fox CR, Tversky A (1995) Ambiguity aversion and com-	analysis of decision under risk. Econometrica	676
638	parative ignorance. Q J Econ 110(3):585–603	47:263–291	677
639	Gauthier D (1986) Morals by agreement. Oxford Univer-	Koons R (1992) Paradoxes of belief and strategic ratio-	678
640	sity Press, Oxford	nality. Cambridge University Press, Cambridge	679

- 680 Kuhn S (2009) Prisoner's dilemma. In: Zalta EN (ed) The
- 681 Stanford encyclopedia of philosophy, springth edn.
- The Metaphysics Research Lab, Stanford, Availableonline: http://plato.stanford.edu/archives/spr2009/
- 684 entries/prisoner-dilemma/

- 685 Lewis D (1979) Prisoner's dilemma is a Newcomb prob-
- 686 lem. Philos Public Aff 8:235–240
- Luce RD, Raiffa H (1957) Games and decisions: intro-duction and critical survey. Wiley, New York
- 689 Lycan WG (2010) What, exactly, is a paradox? Analysis
   690 70(4):615–622
- Mas-Colell A, Whinston MD, Green JR (1995) Microeco nomic theory. Oxford University Press, New York
- 693 Meacham CJG, Weisberg J (2003) Clark and Shackel on
- 694 the two-envelope paradox. Mind 112(448):685–689
- 695 Nozick R (1969) Newcomb's problem and two principles
- 696 of choice. In: Rescher N (ed) Essays in honor of Carl
  697 G. Hempel, Reidel, Dordrecht, pp 114–146
- 697 G. Hempel. Reidel, Dordrecht, pp 114–146698 Pettit P, Sugden R (1989) The backward induction para-
- 699 dox. J Philos 86:169–182
- 700 Quiggin J (1982) A theory of anticipated utility. J Econ701 Behav Organ 3(4):323–343
- 702 Quine WVO (1966) The ways of paradox. In: The ways
- 703 of paradox and other essays. Random House,
- 704 New York, pp 3–20, Original published as Paradox
- 705 (1962) in Scientific American 206(4):84–95
- Quinn WS (1990) The puzzle of the self-torturer. PhilosStud 59(1):79–90

- Resnik MD (1987) Choices: an introduction to decision 708 theory. University of Minnesota Press, Minneapolis 709
- Richmond C, Sowden L (eds) (1985) Paradoxes of 710
  rationality and cooperation: Prisoners' dilemma 711
  and Newcomb's problem. University of British 712
  Columbia Press, Vancouver 713
- Sainsbury RM (1988) Paradoxes. Cambridge University 714 Press, Cambridge 715
- Savage LJ (1954) The foundations of statistics. Wiley, 716 New York 717
- Schmeidler D (1989) Subjective probability and expected 718 utility without additivity. Econometrica 57:571–587 719
- Skyrms B (1980) Causal necessity: a pragmatic investiga tion of the necessity of laws. Yale University Press,
   New Haven
   722
- Vanderschraaf P, Sillari G (2009) Common knowledge. 723
  In: Zalta EN (ed) The stanford encyclopedia of 724
  philosophy, springth edn. The Metaphysics Research 725
  Lab, Stanford, Available online: http://plato.stanford. 726
  edu/archives/spr2009/entries/common-knowledge/ 727
- von Neumann J, Morgenstern O (1947) The theory of 728
   games and economic behavior, 2nd edn. Princeton 729
   University Press, Princeton 730
- Voorhoeve A, Binmore K (2006) Transitivity, the Sorites 731 paradox, and similarity-based decision-making. 732
  Erkenntnis 64(1):101–114 733
- vos Savant M (1990) Ask marilyn column. Parade magazine, 9 Sept 1990, p 16 735

## Author Query Form

Handbook of Risk Theory Chapter No.: 27

Query Refs.	Details Required	Author's response
AU1	Please check if insertion of closing quote is okay in extracted text.	
AU2	Please confirm if the inserted in-text citations for Tables 27.3 and 27.4 are correct.	
AU3	Please provide a caption for Figure 1.	
AU4	Kindly cite the following references in text: Campbell and Sowden (eds) 1985; Lewis 1979.	