

Rationality

Lecture 7

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- ▶ the capacity to recognize or make correct judgements about reasons and other normative facts or truths
- ▶ the capacity to *reason* well — to engage in valid forms of reasoning, to have one's reflections and deliberations proceed in ways that satisfy various formal constraints.

Key Issues

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normative vs. prescriptive vs. descriptive

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Accuracy and rationality are linked, they are not the same: a fool may hold a belief irrationally — as a result of a lucky guess or wishful thinking — yet it might happen to be correct. Conversely, a detective might hold a belief on the basis of a careful and exhaustive examination of all the evidence and yet the evidence may be misleading, and the belief may turn out to be wrong.

Theoretical Reasoning

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But, what is **good thinking**?

- ▶ classical logic (modus ponens, modus tollens, etc.)
- ▶ non-monotonic/default logic
- ▶ closed-world reasoning
- ▶ induction (induction from examples)
- ▶ Bayesian inference
- ▶ case-reasoning/reasoning by analogy
- ▶ fast and frugal heuristics

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what *makes* an act rational is that it bears the **right relationship** to the actor's beliefs and desires.

- ▶ Maximize expected utility

$$\sum_{o \in Out} [\text{how likely the act will lead to } o] \times [\text{how much the agent desires } o]$$

- ▶ Dominance reasoning
a rational agent will not choose an action that *guarantees* a “sub-optimal outcome”

Instrumental Reasoning

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3. I shall go to the bar *intention*

Intentions

Important distinctions:

1. (Present-directed) The intention with which someone acts
2. (Present-directed) Intentional action
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► Unifying account of *intentions*

“Where we are tempted to speak of ‘different senses’ of a word which is clearly not equivocal, we may infer that we are pretty much in the dark about the character of the concept which it represents”

- G.E.M. Anscombe, *Intention*, pg. 1

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- ▶ Intention as a *mental state*

pro-attitude (vs. informational attitude), direction of fit,
conduct-controlling

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- ▶ Intentions are (always) directed towards *actions*
“Although we sometimes report intention as a propositional attitude — ‘I intend that p ’ — such reports can always be recast as ‘intending to ...’ as when I intend to bring about that p . By contrast, it is difficult to rephrase such mundane expressions as ‘I intend to walk home’ in propositional terms”

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An extensive literature:

K. Setiya. *Intention*. Stanford Encyclopedia of Philosophy (2010).

Functional Description of Intentions

M. Bratman. *Intentions, Plans and Practical Reason*. Harvard University Press (1987).

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“intention is a distinctive practical attitude marked by its pivotal role in planning for the future. Intention involves desire, but even predominant desire is insufficient for intention, since it need not involve a commitment to act: intentions are conduct-controlling pro-attitudes, ones which we are disposed to retain without reconsideration, and which play a significant role as inputs to [means-end] reasoning” (pg. 20)

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3. our capacity to coordinate with others

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plans **normally** resist reconsideration: *“an agent’s habits and dispositions concerning the reconsideration or nonreconsideration of a prior intention or plan determine the stability of that intention or plan”*. *“The stability of [the agent’s] plans will generally not be an isolated feature of those plans but will be linked to other features of [the agent’s] psychology”* (pg. 65)

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3. *Agglomeration*: “Intending A and Intending B implies Intending (A and B)”

M. Bratman. *Intention, Belief, Practical, Theoretical*. in *Spheres of Reason* (2009).

Reasoning

“Reasoning is not the conscious rehearsal of argument; it is a process in which antecedent beliefs and intentions are minimally modified, by addition and subtraction, in the interests of explanatory coherence and the satisfaction of intrinsic desires.”
(G. Harman, pg. 56, “Practical Reasoning”)

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- ▶ How do we make sense of the fact that deliberative reflection can directly give rise to action?
- ▶ Which norms for the assessment of action are binding on us as agents? What about *moral norms*?
- ▶ Which normative attitude is “primary”? (ought, reason)

Philosophy of Normativity: Two Issues

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1. Internal vs. external reasons: there is a reason for A to φ :
 - 1.1 *Internal*: A has some motive which will be served furthered by his φ -ing. and if this turns out not to be so the sentence is false
 - 1.2 *External*: there is no such condition, and the reason-sentence will not be falsified by the absence of an appropriate motive.

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2. The problem of *bootstrapping*

Rational Constraints on Beliefs

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Conceptions of Beliefs

- ▶ **Binary:** “all-out” belief. For any statement p , the agent either does or does not believe p . It is natural to take an *unqualified* assertion as a statement of belief of the speaker.
- ▶ **Graded:** beliefs come in degrees. We are *more confident* in some of our beliefs than in others.

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Savage's Representation Theorem

If an agent satisfies certain postulates (including some technical ones not discussed), then the agent acts *as if* she is maximizing an expected utility.

These axioms (along with a few others) guarantee the existence of a unique probability P and utility u , unique up to the arbitrary choice of a unit and zero-point, whose associated expectation represents the agent's preferences.

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For all acts α, β, γ and events X, Y

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4. **Wagers** For consequences O_1 and O_2 and any event X , there is an act [O_1 if X , O_2 else] that produces O_1 in any state that entails X and O_2 in any state that entails $\neg X$

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5. **Savage's P4** If the agent prefers $[O_1 \text{ if } X, O_2 \text{ else}]$ to $[O_1 \text{ if } Y, O_2 \text{ else}]$ when O_1 is more desirable than O_2 , then she will also prefer $[O_1^* \text{ if } X, O_2^* \text{ else}]$ to $[O_1^* \text{ if } Y, O_2^* \text{ else}]$ for any other outcomes such that O_1^* is more desirable than O_2^* .

Are the Axioms Requirements of Practical Rationality?

I. Gilboa. *Questions in Decision Theory*. Annual Reviews in Economics, 2010.

- ▶ The decision makers expected utility calculations should be sensitive to an agent's judgements about the probable causal consequences of the available options.
- ▶ Decision makers are sensitive to *risk* and *ambiguity* in ways that contradict standard expected utility calculations
- ▶ Decision makers are sensitive to *framing effects*

Newcomb's Paradox

Two boxes in front of you, *A* and *B*.

Box *A* contains \$1,000 and box *B* contains either \$1,000,000 or nothing.

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Two boxes in front of you, A and B .

Box A contains \$1,000 and box B contains either \$1,000,000 or nothing.

Your choice: either open both boxes, or else just open B . (You can keep whatever is inside any box you open, but you may not keep what is inside a box you do not open).

Newcomb's Paradox



A very powerful being, who has been invariably accurate in his predictions about your behavior in the past, has already acted in the following way:

1. If he has predicted that you will open just box B , he has in addition put \$1,000,000 in box B
2. If he has predicted you will open both boxes, he has put nothing in box B .

What should you do?

R. Nozick. *Newcomb's Problem and Two Principles of Choice*. 1969.

Newcomb's Paradox

	$B = 1M$	$B = 0$
1 Box	1M	0
2 Boxes	$1M + 1000$	1000



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J. Collins. *Newcomb's Problem*. International Encyclopedia of Social and Behavioral Sciences, 1999.

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What the Predictor did yesterday is *probabilistically dependent* on the choice today, but *causally independent* of today's choice.

Newcomb's Problem: Causal Decision Theory

$$V(A) = \sum_w V(w) \cdot P_A(w)$$

(the expected value of act A is a probability weighted average of the values of the ways w in which A might turn out to be true)

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Orthodox Bayesian Decision Theory: $P_A(w) := P(w | A)$

(Probability of w given A is chosen)

Causal Decision theory: $P_A(w) = P(A \square \rightarrow w)$ (Probability of *if A were chosen then w would be true*)

Newcomb's Problem: Causal Decision Theory

Suppose 99% confidence in predictors reliability.

B_1 : one-box (open box B)

B_2 : two-box choice (open both A and B)

N : receive nothing

K : receive \$1,000

M : receive \$1,000,000

L : receive \$1,001,000

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$$V(B_1) = V(M)P(M | B_1) + V(N)P(N | B_1)$$

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$$V(B_1) = V(M)P(M | B_1) + V(N)P(N | B_1) = \\ 1000000 \cdot 0.99 + 0 \cdot 0.01 = 990,000$$

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B_2 : two-box choice (open both A and B)

N : receive nothing

K : receive \$1,000

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L : receive \$1,001,000

$$V(B_1) = V(M)P(M | B_1) + V(N)P(N | B_1) = \\ 1000000 \cdot 0.99 + 0 \cdot 0.01 = 990,000$$

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Newcomb's Problem: Causal Decision Theory

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Allais Paradox

M. Allais. *Le comportement de l'homme rationnel devant le risque: critique des postulats et axiomes de l'école Américaine*. *Econometrica* 21, 503-546, 1953.

Allais Paradox

Suppose there are three possible outcomes:

1. O_1 you receive \$0
2. O_2 you receive \$1M
3. O_3 you receive \$5M

A lottery is a triple (p_1, p_2, p_3) meaning the player wins O_i with probability p_i .

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Which lottery do you prefer?

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Which lottery do you prefer?

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2. $L_3 = (0.90, 0.00, 0.10)$ or $(0.89, 0.11, 0.00)$?

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Why does this contradict standard expected utility calculations?
(Explanation on the next slide)

Allais Paradox

If $L_1 \succ L_2$ and the decision maker is maximizing expected utility, then we have

$$0.00 \cdot u_0 + 1.00 \cdot u_{1M} + 0.00 \cdot u_{5M} > 0.01 \cdot u_0 + 0.89 \cdot u_{1M} + 0.10 \cdot u_{5M}.$$

So, (after some algebraic manipulations)

$$0.11 \cdot u_{1M} > 0.01 \cdot u_0 + 0.10 u_{5M}$$

If $L_3 \succ L_4$ and the decision maker is maximizing expected utility, then we have

$$0.90 \cdot u_0 + 0.00 \cdot u_{1M} + 0.10 \cdot u_{5M} > 0.89 \cdot u_0 + 0.11 \cdot u_{1M} + 0.00 \cdot u_{5M}.$$

So, (after some algebraic manipulations)

$$0.01 \cdot u_0 + 0.10 \cdot u_{5M} > 0.11 \cdot u_{1M}$$

Putting these inequalities together, we have

$$0.11 \cdot u_{1M} > 0.01 \cdot u_0 + 0.10 u_{5M} > 0.11 \cdot u_{1M}$$

which implies $0.11 \cdot u_{1M} > 0.11 \cdot u_{1M}$, which is a contradiction.

Next Week: No Class (Break). **See the website for the midterm exam.**