The effect of exchange rates on (Statistical) decisions Philosophy of Science, 80 (2013): 504-532

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Part 1: What do fair prices reveal about subjective probabilities?

Part 2: What does elicitation by a (strictly) proper scoring rule reveal?

Part 1: Introduction – subjective probability as fair betting rates.

Consider bets where the stakes are monetary.

Assume that Smith's preferences over bets,

when formulated in dollars and with modest stakes, satisfy (de Finetti's) structural assumptions for fair-prices – *previsions*.

Here are the formal details of de Finetti's prevision theory.

Let $\chi = \{X_i: S \rightarrow \Re; i = 1, ...\}$ be variables measureable w.r.t algebra \mathcal{E} over S.

(Unconditional) COHERENCE₁ as *fair-prices* The 2-person, 0-sum sequential *prevision* game

Bookie moves first and sets a fair (buy/sell) price P(X) for each $X \in \chi$,

The *Gambler* then acts on the *Bookie*'s offers. The *Gambler* – may make *finitely* many (non-trivial) contracts at the *Bookie*'s announced prices.

For finitely many X, Gambler fixes a non-zero real number, β_X , which determines a contract.

In state s, a contract has an *outcome* to the *Bookie* (with negative outcome to the *Gambler*) of $\beta_X[X(s) - P(X)]$.

The *Bookie*'s net *outcome* in state ω is the sum of the payoffs from the finitely many non-zero contracts: $\sum_{X \in \mathcal{X}} \beta_X [X(s) - P(X)]$.

<u>Coherence</u>₁: The <u>Bookie</u>'s previsions are <u>incoherent</u>₁ if there is an acceptable <u>finite</u> combination of gambles with <u>uniformly negative</u> netpayoff.

Otherwise the previsions are *coherent*₁.

"Book" Theorem (de Finetti, 1937):

A set of previsions $\{P(X)\}\$ are coherent₁ if and only if

There exists a (finitely additive) probability P on Ω such that the previsions are the P-Expected values of the corresponding variables $\mathcal{E}_P[X] = P(X).$

The Dollar-Yen puzzle

For simplicity, consider two states of interest: s_1 and s_2 .

Bet B pays \$1.00 if s_1 obtains, and -\$1.00 if s_2 obtains.

Suppose Smith finds Bet B is fair; hence,

$$P^{\$}(s_1) = P^{\$}(s_2) = 1/2.$$

In detail, let $I_1(\omega)$ be the indicator function for state ω_1 :

$$I_1(s) = 1 \text{ if } s = s_1$$

$$I_1(s) = 0 \text{ if } s = s_2$$

Bet B in US dollars:

$$\beta \left[\mathbf{I}_1(s) - \mathbf{P}^{\$}(s_1) \right]$$

$$= 2[I_1(s) - 1/2]$$

Next, we offer Smith bets on the same two states but this time with monetary payoffs in Yen.

Again, we suppose Smith's preferences for bets in Yen satisfy de Finetti's structural assumptions – she/he has *previsions* for contracts in Yen

Bet B' pays 100¥ if s_1 obtains, and -125¥ if s_2 obtains.

Smith finds bet B' is fair; hence,

$$P^{4}(s_1) = 5/9$$
 and $P^{4}(s_2) = 4/9$.

Bet B' in Japanese Yen:
$$\beta [I_1(s) - P^{*}(s_1)]$$

$$= 225[I_1(s) - 5/9]$$

<u>Question</u>: As $P^{\$}(s_i) \neq P^{\$}(s_i)$, are Smith's combined previsions incoherent?

Answer: NO!

Let the states indicate the rate of exchange between the two currencies:

- in state s_1 , \$1 ≈ 100 \fm\;
- in state s_2 , \$1 ≈ 125 \\;

Then Bet B is equivalent to Bet B'.

The one bet is fair if and only if the other is.

Resolution of the puzzle

Decisions (acts) as functions from states to outcomes

The canonical decision matrix: **decisions** \times **states**

	S 1	S 2			S j			S n	
d ₁	O 11	O 12			O 1j			O 1n	
d ₂	0 21	0 22			O 2j			O 2n	
d _k	O k1	0 k2			O _{kj}			O _{kn}	
	$d_{i}(s_{j}) = \text{outcome } \mathbf{o_{ij}}.$								

What are "outcomes"?

That depends upon which version of expected utility. Allow arbitrary outcomes, providing that they admit a von Neumann-Morgenstern cardinal utility $U(\bullet)$.

A central theme of Subjective Expected Utility [SEU] is this:

• axiomatize (weak) preference < over decisions so that

$$d_1 \leq d_2 \quad iff \quad \Sigma_j P(s_j) U(o_{1j}) \leq \Sigma_j P(s_j) U(o_{2j}),$$

for one subjective (personal) probability $P(\bullet)$ defined over *states* and one cardinal utility $U(\bullet)$ defined over *outcomes*.

- Then the decision rule is to choose that (an) option that maximizes SEU.
- The Representation theorem promises a *unique* decomposition into a pair {P, U} where P is the agent's subjective probability over the states and U is her/his cardinal (state-independent) utility for outcomes.

Note: In this version of SEU:

- (1) decisions and states are probabilistically independent, $P(s_j) = P(s_j \mid d_i)$. Reminder: This is sufficient for a fully general *dominance* principle.
- (2) Utility is state-independent, $U_j(o_{ij}) = U_h(o_{gh})$, if $o_{ij} = o_{gh}$. Here, $U_j(o_{\bullet j})$ is the conditional utility for outcomes, given state s_j .
- (3) (Cardinal) Utility is defined up to positive linear transformations, $U'(\bullet) = aU(\bullet) + b \ (a > 0)$ is also the same utility function for purposes of *SEU*.

Note: Under these circumstances with act/state prob. independence, utility is defined up to a similarity transformation: $U_j'(\bullet) = aU_j(\bullet) + b_j$. So, maximizing SEU and Maximizing Subjective Expected Regret-Utility are equivalent decision rules.

On the structural assumptions for the Representation Theorem

• *Act-state independence*: no cases of "moral hazards" are considered – so strict dominance is valid.

Reminder: Consider the following binary state, two act decision problem, with outcomes ordinally (or cardinally) ranked so that more is better.

	ω_1	ω_2
Act ₁	3	1
Act ₂	4	2

Act2 strictly dominates Act1. Nonetheless, if

$$Prob(\omega_i \mid Act_i) \approx 1 \quad (i = 1, 2),$$

then dominance carries no force. A rational agent prefers Act1 to Act2.

• State-independent utility: no cases where the value of a prize depends upon the state in which it is received.

Reminder: Once we entertain, generalized state-dependent utilities for prizes, there is maximal under-determination (= up to mutual absolute continuity of probability) of probability/utility pairs that represent the very same preference ranking of acts. Then, elicitation is hopeless!

Matrix of *m*-many acts on the partition of *n*-many uncertain states

	ω_1	ω_2	ω_{j}		ω_n
Act ₁	011	012	O _{1j}		O _{1n}
Act ₂	021	02	O _{2j}		02n
Act _i	O _{i1}	O _{i2}	O _{ij}		O _{in}
Act _m	O _{m1}	Om	Omj		O _{mn}

In accord with generalized (possibly state dependent) SEU preferences:

Act₁ is dispreferred to Act₂ if and only if $\sum_{j} P(s_j) U_j(o_{1j}) \leq \sum_{j} P(s_j) U_j(o_{2j})$.

- The probability P has no subscript no moral hazard.
- Utility U has a subscript for states: possible state-dependent utility.

Choose P* mutually absolutely continuous with P and define the constants

$$c_j = P(S_j)/P^*(S_j)$$

$$U^*_i(\bullet) = c_iU_i(\bullet) \qquad (j = 1, ..., n).$$

and let

Then, trivially,

$$\sum_{j} P(s_j) U_j(o_{1j}) \leq \sum_{j} P(s_j) U_j(o_{2j})$$

if and only if

$$\sum_{j} P^{*}(S_{j}) U^{*}_{j}(o_{1j}) \leq \sum_{j} P^{*}(S_{j}) U^{*}_{j}(o_{2j}).$$

- So, in the presence of state-dependent utilities, elicitation of the decision maker's degrees of belief using only her/his preferences over acts is entirely impossible!
- <u>Note well</u>: This impossibility arises even when one of the representations is by a state-independent utility!

The Dollar-Yen example – <u>Diagnosis</u>

We have constructed a partition with two states that precludes a state-independent utility over <u>both</u> US \$ and Japanese Yen ¥ simultaneously.

With the deFinetti "Book" theorem in \$-bets, Smith constructs a state-independent utility for dollars that is state-dependent for Yen.

Similarly, when we use the Ψ -bets, Smith constructs a state-independent utility for Yen that is state-dependent for US dollars.

• The relations between these to pairs $\{P^\$, U_\$\}$ and $\{P^\$, U_\$\}$ is that each successfully represents Smith's preferences. Each is "correct."

Principal Claim:

Whether or not Smith holds a state-independent utility for Yen or for Dollars is <u>underdetermined</u> by the entirety of his/her betting behavior!

Part 2: Lessons for elicitation with (strictly) proper scoring rules.

• De Finetti was fully aware that the *prevision-game* admits strategic play on the part of the Bookie, who might have opinions about the Gambler's personal previsions for the same events.

COHERENCE₂ & COHERENCE₂₊

Coherence₂ for the one-person <u>Forecasting Game</u> with Brier Score:

There is only the one player in the *Forecasting Game*, the *Forecaster*, who announces a forecast F(X) for each X in χ .

In state s, the *Forecaster* is penalized $-[X(s) - F(X)]^2$

The *Forecaster*'s net score in state ω from forecasting finitely variables $\{F(X_i): i=1, ..., k\}$ is the sum of the k-many individual losses: $\sum_{X \in \mathcal{X}} -[X_i(s) - F(X_i)]^2.$

Coherence₂: The Forecaster's forecasts $\{F(X): X \in \chi\}$ are coherent₂ provided that there is no <u>finite set</u> of variables, $\{X_1, ..., X_k\}$ and set of rival forecasts $\{F'(X_1), ..., F'(X_k)\}$ that yields a uniformly smaller not loss for the Forecaster in each state

uniformly smaller net loss for the Forecaster in each state.

$$\neg \exists (\{F'(X_l), ..., F'(X_k)\}, \varepsilon > 0), \forall \omega \in \Omega$$

$$\sum_{X \in \mathcal{X}} [X_i(s) - F'(X_i)]^2 \leq \sum_{X \in \mathcal{X}} [X_i(s) - F(X_i)]^2 - \varepsilon.$$

Otherwise, the *Forecaster*'s forecasts are *incoherent*₂.

Elicitation: Brier Score is strictly proper – an SEU decision maker with personal probability P on S (uniquely) maximizes her/his SEU by forecasting her/his subjective expected value of X: $F(X) = \mathcal{E}_P(X)$.

The general form of scoring rule that we will consider is

(1)
$$g(x,q) = \begin{cases} \int_{x}^{q} (v-x) d\lambda(v), & \text{if } x \leq q, \\ \int_{q}^{x} (x-v) d\lambda(v), & \text{if } x > q, \end{cases}$$

where λ is a measure that is mutually absolutely continuous with Lebesgue measure and is finite on every bounded interval. It is helpful to rewrite (1) as

(2)
$$g(x,q) = \int_{q}^{x} (x-v) d\lambda(v),$$

Coherence₂₊: Allow different (strictly) proper scoring rules $S_i[X_i, F(X_i)]$ for each random variable X_i with Total Score in each state equal to the sum of the individual scores in that state.

A (finite) set of forecasts $\{F(X)\}\$ are $incoherent_{2+}$ if there is a rival \underline{finite} \underline{set} of forecasts $\{F'(X)\}\$ that $\underline{uniformly}$ dominates.

• Coherence₂₊ has coherence₂ as a special case.

Thus, with $coherence_{2+}$ both $uniform\ dominance\ and\ elicitation\ are\ addressed$ with the same device: forecasting.

Basic Results Connecting these Two Senses of Coherence

Theorem (de Finetti, 1974):

A set of previsions $\{P(X)\}\$ are coherent₁

if and only if

the same forecasts $\{F(X): F(X) = P(X)\}\$ are coherent₂

if and only if

There exists a (finitely additive) probability P on Ω such that these quantities are the P-Expected values of the corresponding variables

$$\mathcal{E}_P[X] = F(X) = P(X).$$

Theorem (events: Predd et al. 2009) & (SSK 2009); variables (SSK, 2014):

A set of forecasts $\{F(X)\}\$ are coherent₂₊

if and only if

There exists a (finitely additive) P such that $\mathcal{E}_P[X] = F(X)$.

Question: How does a coherent₂₊ agent forecast in the Dollar-Yen puzzle?

Answer (i):

With the proper scoring rules and currency specified extraneously, the coherent₂ Forecaster behaves exactly as the coherent₁ Bookie.

But Answer (ii):

With the proper scoring rules specified extraneously, and where the coherent₂ agent may choose the currencies for scoring the Forecaster has a strict preference for matching the currency against the scoring rule so as to have a high probability for a small loss.

Similarly, with the currency specified extraneously but with the scoring rule(s) determined by a choice of the Forecaster, there is strategic choice of the scoring rules.

Or, with the *Forecaster* having both the choice of the scoring rule(s) and matching currencies, there is strategic choice available to *Forecaster*.

• The Forecaster has strategic choices absent in the *Prevision* game!

Summary

- 1. In the *Prevision* game, the *coherent*₁ agent behaves as though she/he has a state-independent utility in the currency of the contracts. It is impossible to identify a privileged currency in the *Prevision* game that reveals the agent's authentic credences/degrees of belief.
- 2. In the *Forecasting* game, when scoring rules and currencies are specified extraneously, the *coherent*₂₊ agent behaves as though she/he has a state-independent utility in the currencies of the individual contracts. It is impossible to identify a privileged currency for forecasting that reveals the agent's authentic degrees of belief.
- 3. In the *Forecasting* game, when the *Forecaster* may choose either/both of the scoring rule(s) or/and the currencies, the *Forecaster* has additional strategic choices that are absent in the *Prevision* game.
 - But these strategic choices do not reveal the agent's credences!
 - The situation is even worse for non-SEU decision makers.