

# Accuracy & Coherence II

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<sup>1</sup>This talk includes joint work with Rachael Briggs (Sydney/ANU), Fabrizio Cariani (Northwestern), Kenny Easwaran (USC) & David McCarthy (Edinburgh).

- Recall our definition of “inaccuracy”/“accuracy dominance” for a (complete) set of comparative judgments  $\mathcal{C}$ .
  - Comparative.** Let  $\mathcal{C}$  be the full set of  $S$ ’s comparative judgments over  $\mathcal{B} \times \mathcal{B}$ . The *innaccuracy* of  $\mathcal{C}$  at a world  $w$  is given by the number of incorrect judgments in  $\mathcal{C}$  at  $w$ .
    - $p \sim_S q$  is (in)correct at  $w$  iff  $p \equiv q$  is true (false) at  $w$ .
    - $p >_S q$  is (in)correct at  $w$  iff  $p \ \& \ \sim q$  is true (false) at  $w$ .
  - $\mathcal{C}'$  *accuracy-dominates*  $\mathcal{C}$  iff  $\mathcal{C}'$  contains *strictly fewer* incorrect judgments than  $\mathcal{C}$  at *some*  $w$ ’s, and  $\mathcal{C}'$  contains *at most as many* incorrect judgments as  $\mathcal{C}$  at *every*  $w$ .
- This simple, 2-valued scoring scheme may seem overly simplistic. It is based on the following underlying norm:
  - ( $\dagger$ )  $S$  should be more confident in truths than falsehoods.
- So, if  $p$  is T and  $q$  is F, then the judgments  $q >_S p$  and  $p \sim_S q$  are in violation of this basic underlying norm ( $\dagger$ ).
- But, ( $\dagger$ ) *alone* does not justify our choice of 2-valued scheme. Indeed, other scoring schemes seem plausible.

- Let’s use “+1” to denote *best* epistemic status, “-1” to denote *worst* epistemic status, and “0” to denote “middling” epistemic status. Our simplest, 2-valued scheme is:

	$P$	$Q$	$P >_S Q$	$Q >_S P$	$Q \sim_S P$
$w_1$	T	T	-1	-1	+1
$w_2$	T	F	+1	-1	-1
$w_3$	F	T	-1	+1	-1
$w_4$	F	F	-1	-1	+1

- If we’re going to use only 2-values (“correct/incorrect”), then it seems to me that this scheme is *forced* on us, by ( $\dagger$ ).
- But, one might think that a 3-valued scheme makes more sense. David Christensen makes the following observation.
 

Suppose I’m going to flip a coin. Can I rationally be indifferent between heads ( $H$ ) and tails ( $T$ )? It seems that  $H \sim_S T$  would be dominated by  $H >_S T$  (or  $T >_S H$ ), since  $H \sim_S T$  is guaranteed to be “incorrect” and the latter aren’t.
- Christensen is right. And, he suggests a 3-valued scheme.

	$P$	$Q$	$P >_S Q$	$Q >_S P$	$Q \sim_S P$
$w_1$	T	T	0	0	+1
$w_2$	T	F	+1	-1	0
$w_3$	F	T	-1	+1	0
$w_4$	F	F	0	0	+1

- I agree that D.C.’s scheme does seem superior (intuitively) to our simplest 2-valued scoring scheme (in various ways).
- If we use this (or some other) 3-valued scheme, the obvious way to calculate the score of  $\mathcal{C}$  (at  $w$ ) is to take the *sum* of these 3-valued scores for all the propositions in  $\mathcal{C}$  (at  $w$ ).
- Then, we would define accuracy-dominance as follows:
  - $\mathcal{C}'$  *accuracy-dominates*  $\mathcal{C}$  iff  $\mathcal{C}'$  has a *higher* score than  $\mathcal{C}$  at *some*  $w$ , and  $\mathcal{C}'$  doesn’t have a lower score than  $\mathcal{C}$  at *any*  $w$ .
- In any event, moving to a 3-valued scheme can *not* fill the gap in de Finetti’s justification/grounding of subjective probability theory. Indeed, we have an *impossibility result*.

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**Theorem.** No 2 or 3-valued scoring scheme is such that:

- (0)  $S$  entails (at least *some* instances of) *both* transitivity and additivity as (weak) dominance norms.

and, the the following eight (8) scoring *desiderata* are met:

- (1) Having a subset of judgments  $\{p \succ_S q, p \succ_S r, q \sim_S r\}$  should not — *in and of itself* — ensure “incoherence”.
- (2) *Ditto* for subsets of the form  $\{p \succ_S q, p \succ_S r, q \succ_S r\}$ .
- (3)  $p \succ_S q$  should get a “worst” score when  $p$  is F and  $q$  is T.
- (4)  $p \succ_S q$  should get the same score when  $p$  and  $q$  are both T as it does when  $p$  and  $q$  are both F.
- (5)  $p \sim_S q$  should get the same score when  $p$  and  $q$  are both T as it does when  $p$  and  $q$  are both F.
- (6)  $p \sim_S q$  should get the same score when  $p$  is T and  $q$  is F as it does when  $p$  is F and  $q$  is T.
- (7) The score of  $p \succ_S q$  when  $p$  is T and  $q$  is F should not be strictly worse than the score of  $p \succ_S q$  when  $p, q$  are both T.
- (8) The score of  $p \succ_S q$  when  $p$  is T and  $q$  is F should be strictly better than the score of  $p \succ_S q$  when  $p$  is F and  $q$  is T.

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- These eight *desiderata* seem to be sacrosanct (Christensen and everyone else I’ve talked to seems to accept all of them).
- The upshot of our Theorem is that — *it doesn’t matter which scoring scheme you use*. No scoring scheme can ground *all* of de Finetti’s axioms for comparative probability.
  - In fact, our simplest 2-valued scheme *gets as close as any 2 or 3-valued scheme* to grounding all of de Finetti’s axioms. [This is why I introduced it first. It is *simple*, and *maximally charitable* to de Finetti (with respect to his project).]
- So, it seems there is no accuracy-dominance justification of all of de Finetti’s intuitive axioms (much less the *unintuitive* Scott Axiom — see Extras slides). This *re-raises* a question:
  - ☞ Why should we think  $\succ_S$  has a numerical Pr-representation?
- There seems to be no compelling reason to suppose that our comparative confidence orderings are (numerically) probabilistically representable. This is an important *lacuna*.
- Next: Quantitative judgments (*viz.*, numerical credences).

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- Let’s suppose (*arguendo*) that  $S$  has a numerical credence function  $b : \mathcal{B} \mapsto \mathbb{R}$  (these  $b$ ’s are *opinionated*, of course, and so we’re ignoring suspension of judgment here, once again).
- As usual, we need to settle on a way of *scoring*  $b$ ’s for inaccuracy at each possible world  $w$  — call this  $I(b, w)$ .
- For simplicity, I’ll assume  $I(b, w)$  is an *additive* function, which *sums-up* the inaccuracies of  $b$ , for each  $p \in \mathcal{B}$  at  $w$ .
- If we associate the number 1 with T and the number 0 with F (at each world  $w$ ), then the inaccuracy of  $b(p)$  at world  $w$  will be  $b$ ’s “distance ( $d$ ) from the 0/1-truth-value of  $p$ ” at  $w$ .
- **Example.** Suppose  $S$  has just two (contingent) propositions  $\{P, \sim P\}$  in their doxastic space. Then, there are two salient possible worlds ( $w_1$  in which  $P$  is T, and  $w_2$  in which  $P$  is F).
  - $I(b, w_1) = d(b(P), 1) + d(b(\sim P), 0)$ .
  - $I(b, w_2) = d(b(P), 0) + d(b(\sim P), 1)$ .

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- Various measures ( $d$ ) of “distance from 0/1-truth-value” have been proposed/defended in the historical literature.
- The most popular choice (for giving an accuracy-dominance justification of probabilism) has been the *squared-difference* measure of “distance from 0/1-truth-value”, which is:
  - $s(x, y) = (x - y)^2$ .
- The distance measure  $s$  gives rise to a measure of inaccuracy ( $I_s$ ), which is known as the Brier Score. In our toy example, the Brier Scores of  $b$  in worlds  $w_1$  and  $w_2$  are:
  - $I_s(b, w_1) = s(b(P), 1) + s(b(\sim P), 0) = (b(P) - 1)^2 + b(\sim P)^2$ .
  - $I_s(b, w_2) = s(b(P), 0) + s(b(\sim P), 1) = b(P)^2 + (b(\sim P) - 1)^2$ .
- If one adopts the Brier Score as one’s measure of  $b$ ’s inaccuracy, then one can give an accuracy-dominance argument for the axioms of the probability calculus.
- de Finetti [1] was the first to prove such a *Brier-dominance* theorem. Joyce [6, 5] interprets this as *accuracy-dominance*.

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- **Theorem** (de Finetti).  $b$  is non-probabilistic if and only if there exists a probabilistic credence function  $b'$  such that (a)  $b'$  has a strictly lower Brier Score than  $b$  at some worlds, and (b)  $b'$  never has a greater Brier Score than  $b$  at any world.
- And, the proof of de Finetti's theorem is *constructive* — it tells us *precisely which functions*  $b'$  “Brier-dominate”  $b$ .
- Joyce [6, 5] uses de Finetti's Theorem (and generalizations of it) to ground an (epistemic) *probabilistic coherence norm*.

(PC)  $S$ 's credences  $b$  should be *probabilistic* — on pain of being Brier-dominated by (specific) credence functions  $b'$ .

- Because Joyce thinks that Brier Score is a good measure of “credal inaccuracy”, he thinks this provides incoherent agents with some “*epistemic reason*” to be Pr-coherent.
- Maher [10] points out that other *prima facie* plausible measures of “inaccuracy” do *not* undergird (PC). I'll return to that issue below. But, first, a *concrete* toy example.

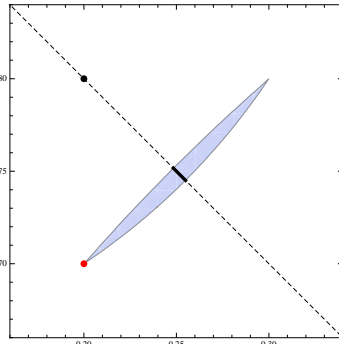
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- Suppose  $S$  adopts the Brier Score as their  $I$ -measure, and that  $S$ 's  $b$  is non-probabilistic. Then, there are alternative (coherent) credence functions  $b'$  that accuracy-dominate  $b$ .
- Intuitively, these  $b'$  functions should “look epistemically better” (in a precise sense) than  $S$ 's current credences  $b$ .
- But, our “evidentialist” (“Kolodny's revenge”) worry lingers.
- Consider a very simple toy agent  $S$  with one sentence  $P$  in their language. And, suppose  $S$ 's credence function assigns  $b(P) = 0.2$  and  $b(\sim P) = 0.7$ . So,  $S$ 's  $b$  is non-probabilistic.
- It follows from de Finetti/Joyce's theorems that there is a *specific set of* credence functions  $b'$  that Brier-dominate  $b$ .
- The figure on the next slide depicts this situation. The red dot is  $S$ 's credence function  $b$ . And, the shaded region depicts the credence functions  $b'$  that Brier-dominate  $b$ . [The black dot at  $\langle 0.2, 0.8 \rangle$  depicts the *only probabilistic* credence function that is compatible with  $b(P) = 0.2$ .]

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- Suppose that  $S$  has good reason to assign  $b(P) = 0.2$  (e.g.,  $S$  knows that the objective chance of  $P$  is 0.2).
- Here, *all* the Brier-dominating functions  $b'$  are s.t.  $b'(p) \neq 0.2$ .
- So, *all* the Brier-dominating functions  $b'$  may be “ruled-out” by  $S$ 's evidence.
- Perhaps,  $b'$  needn't “look better” than  $b$ .

- I don't have the space to delve into the various other worries I have about Joyce's argument(s) for probabilism. [But, in my lecture next week, I will discuss *another* worry.]
- For now, I have a *suggestion* re the quantitative case.
- Based on our experience from the qualitative and comparative cases, *we should not expect* an AD-justification of the *full* probabilistic norm(s) in the quantitative case...

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- Rather than trying to “justify” the use of  $s$  (or some other “distance measure” that yields the *full* probabilistic norms), why not start with *desiderata* for distance measures  $d$ ? E.g.,
  - $d(x, x) = 0$ .
  - $d(x, y) = d(y, x)$ .
  - $d(x, y) \leq d(x, z) + d(z, y)$ .
- Once we settle on desiderata ( $\mathbb{D}$ ) for adequate measures of distance (in this context), then we could ask the following:
 

(Q) What accuracy-dominance norms are entailed by  $\mathbb{D}$ ?
- In other words, (Q) is asking what accuracy-dominance norms are *agreed upon* by *all* inaccuracy measures  $I_d(b, w)$ , where *all* we assume about  $d$  is that it satisfies desiderata  $\mathbb{D}$ .
- I don't have an answer to (Q). But, I conjecture that this *will* lead to norms for  $b$  that are similar to those we saw in the *comparative* case — e.g., if  $p \vDash q$ , then  $b(p) \leq b(q)$ , etc.
  - Idea: start with  $s(x, y)$  and Maher's  $\delta(x, y) = |x - y|$ .

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[1] B. de Finetti, *The Theory of Probability*, Wiley, 1974.

[2] ———, *Foresight: Its Logical Laws, Its Subjective Sources*, in H. Kyburg and H. Smokler (eds.), *Studies in Subjective Probability*, Wiley, 1964.

[3] T. Fine, *Theories of Probability*, Academic Press, 1973.

[4] P. Fishburn, *The Axioms of Subjective Probability*, *Statistical Science*, 1986.

[5] J. Joyce, *Accuracy and Coherence: Prospects for an Alethic Epistemology of Partial Belief*, in F. Huber and C. Schmidt-Petri (eds.), *Degrees of Belief*, 2009.

[6] ———, *A Nonpragmatic Vindication of Probabilism*, *Philosophy of Science*, 1998.

[7] J.M. Keynes, *A Treatise on Probability*, MacMillan, 1921.

[8] N. Kolodny, *How Does Coherence Matter?*, *Proc. of the Aristotelian Society*, 2007.

[9] C. Kraft, J. Pratt and A. Seidenberg, *Intuitive Probability on Finite Sets*, *The Annals of Mathematical Statistics*, 1959.

[10] P. Maher, *Joyce's Argument for Probabilism*, *Philosophy of Science*, 2002.

[11] D. Scott, *Measurement Structures and Linear Inequalities*, *Journal of Mathematical Psychology*, 1964.

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- If  $S$  violates *Monotonicity* (4), then  $S$  is accuracy-dominated.
  - (4) If  $p$  entails  $q$ , then  $p \succ_S q$ .

	$P$	$Q$	$P \succ_S Q$	$Q \succ_S P$
$w_1$	T	T	B	B
$w_2$	T	F	—	—
$w_3$	F	T	C	A
$w_4$	F	F	B	B

- Indeed, as this table shows, *any scoring scheme that satisfies our desiderata* [viz.,  $(\dagger) \implies A < C$ ] entails *Monotonicity*.
- To see that de Finetti's additivity axiom (3) does *not* have a dominance justification, one must look at *all* the possible ways of "fixing" a violation of (3), and show that *none* of these lead to a comparison set that dominates the original.
- There aren't that many cases to check. [I won't show them.]
- On the next slides, I'll discuss the Scott Axiom. . .

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- Before stating the Scott Axiom, we'll need one definition:
 

**Definition.** For each state description  $s$  and each *sequence* ( $n$ -tuple) of propositions  $Z = \langle z_1, \dots, z_n \rangle \in \prod_n \mathcal{B}$ , let  $c(s, Z)$  be the number of elements of  $Z$  that are entailed by  $s$ .
- OK, here's the (dreaded) Scott Axiom:
 

(SA) Let  $X, Y \in \prod_n \mathcal{B}$  be (arbitrary) sequences of propositions, each having length  $n > 0$ . Let  $\langle x_1, \dots, x_n \rangle$  denote the members of  $X$ , and  $\langle y_1, \dots, y_n \rangle$  denote the members of  $Y$ . If the following two conditions are satisfied

  - For every state description  $s$ ,  $c(s, X) = c(s, Y)$ .
  - For all  $i \in (1, n]$ ,  $x_i \succ_S y_i$ .

then, the following must also be the case

  - $y_1 \succ_S x_1$ .
- Not only is (SA) *unintuitive*, it is also *quite strong*. It entails *both* de Finetti's "additivity" (3) *and* (full) transitivity of  $\succ_S$ .

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- I think the best way to grasp the content of (SA) is *via* the following illuminating theorem of Fishburn [4, Ch. 4].
 

**Theorem** (Fishburn). (SA) is true *if and only if* there exists a mass function  $m$  on  $\mathcal{B}$  such that, for all propositions  $p$  and  $q$  in  $\mathcal{B}$ , the following *real-valued representation* holds:

$$(\star) \quad p \succ_S q \text{ if and only if } \sum_{s_p=p} m(s_p) > \sum_{s_q=q} m(s_q).$$

And, given de Finetti's axiom (2), there will always be a *probability mass function*  $m$  satisfying  $(\star)$ .
- Fishburn's Theorem reveals that (SA) *alone* ensures a real-valued representation ( $\mathcal{R}_{\succ_S}$ ) of the  $\succ_S$ -ordering.
- Not only does this imply de Finetti's additivity axiom (3), but it also implies axiom (1) as well ( $\succ_{\mathbb{R}}$  is a strict total order).
- Thus, once we have (SA) on board, the only axiom of de Finetti that can do *any* work is his axiom (2), which just ensures that  $\mathcal{R}_{\succ_S}$  is a *probabilistic* representation of  $\succ_S$ .

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