EVENT EXCHANGEABILITY: PROBABILISTIC SOPHISTICATION WITHOUT CONTINUITY OR MONOTONICITY

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Building on the Ramsey-de Finetti idea of event exchangeability, we derive a characterization of probabilistic sophistication without requiring any of the various versions of monotonicity, continuity, or comparative likelihood assumptions imposed by Savage (1954), Machina and Schmeidler (1992), and Grant (1995). Our characterization identifies a unique and finitely-additive subjective probability measure over an algebra of events.

 $\label{eq:Keywords} \textbf{KEYWORDS: Uncertainty, risk, ambiguity, decision theory, nonexpected utility, probabilistic sophistication.}$

1. INTRODUCTION

In their pioneering studies, Ramsey (1926) and de Finetti (1937) originated the idea of distinguishing events according to whether they are "exchangeable" or "ethically neutral," providing the basis for their construction of a decision maker's subjective probability over events. Savage's (1954) subsequent formulation departs from this direction and nevertheless yields an overall subjective probability on a σ -algebra of events. Building on Savage's approach, Machina and Schmeidler (1992) and, subsequently, Grant (1995) provided more parsimonious characterizations of what is termed probabilistic sophistication, in which the choice behavior of a decision maker reflects her probabilistic belief in the sense that events are distinguished only by their subjective probabilities.

Their contributions notwithstanding, some of the axioms employed by Machina and Schmeidler (1992) and Grant (1995) are arguably too strong for the notion of probabilistic sophistication. Consider, for instance, a decision maker with preferences over mappings from finite partitions of the state space [0, 1] to an outcome set X (i.e., simple acts). Suppose the decision maker translates each act into a lottery by associating with the ith partition element its measure $p_i \in [0, 1]$ and its assigned outcome $x_i \in X$. Denote such a lottery as, say, $L = (x_1, p_1; \ldots; x_n, p_n)$. As long as the decision maker is indifferent between two acts that induce the same lottery, it seems reasonable to conclude that she is probabilistically sophisticated. For instance, let X be the real line and suppose that the decision maker ranks any simple act according to the expected

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value of the lottery it induces, and if two lotteries have the same mean, the one with a smaller variance is preferred. According to the preceding notion of probabilistic sophistication, the decision maker is probabilistically sophisticated. However, this lexicographic preference satisfies all the axioms of Savage (1954), Machina and Schmeidler (1992), and Grant (1995), except for P6 (continuity).

As another example, suppose X is the two-dimensional positive orthant \mathbb{R}^2_+ . Let $E[L] = \sum_{i=1}^n p_i \mathbf{x}_i$ and $V(L) = \sum_{i=1}^n p_i \|\mathbf{x}_i - E[L]\|$ with $\|\cdot\|$ the Euclidean metric. Suppose the decision maker's preferences can be represented by the utility function

(1)
$$U(L) = \sum_{i=1}^{n} p_i (1 + x_i^1) (1 + x_i^2) - \frac{1}{2} V(L).$$

Here too, the decision maker is probabilistically sophisticated (according to the preceding criteria). We show in the Appendix that (1) is monotonic in payoffs. Thus if $x^1 > y^1$ and $x^2 > y^2$, this decision maker strictly prefers a probability mixture of an arbitrary lottery L and (x^1, x^2) , with probability $p \in [0, 1)$, to a mixture of L and (y^1, y^2) , with the same probability p. In addition, because (1) is continuous, the preferences it represents are arguably unobjectionable on normative grounds. However, as shown in the Appendix, (1) violates axioms P3 and P4 (monotonicity and comparative likelihood) in Machina and Schmeidler (1992), as well as their analogues (P3^{CU}, P3^{CL}, and P4^{CE}) in Grant (1995).²

Say that two events are *exchangeable* if the decision maker is always indifferent to permuting their payoffs. Building on exchangeability as a form of equal likelihood, we develop a notion of comparability to capture the intuition behind a likelihood relation among events. Specifically, two disjoint events are *comparable* when one contains a subevent that is exchangeable with the other. Informally, one is motivated to view one event as "larger" or more likely than the other. When all disjoint events are comparable in this way, we show that conditions weaker than Savage's assumptions of monotonicity (P3), comparative likelihood (P4), and continuity (P6) suffice to deliver probabilistic sophistication on the part of the decision maker. Indeed, the example of the mean-variance lexicographic ranking and the ranking implied by (1) satisfy our axioms.

The next section introduces preliminary notions, including formal definitions of event exchangeability and comparability, presents our main result concerning probabilistic sophistication, and relates our result to the existing literature. Proofs, when not in the main text, are in the Appendix.

 $^{^2}$ We thank Uzi Segal for suggesting this example, calling attention to the fact that P3 is synonymous with monotonicity in payoffs *only* if X is one-dimensional (e.g., monetary payoffs). Rostek (2005) also explores probabilistic sophistication using modified versions of P3, P4, and P6.

2. A PARSIMONIOUS AXIOMATIZATION FOR SUBJECTIVE PROBABILITIES

2.1. Exchangeability and Comparability

Let Ω be a space whose elements correspond to all states of the world. Let X be a set of payoffs and let Σ be an algebra on Ω . Elements of Σ are events. If $e, E \in \Sigma$, and $e \subseteq E$, then we say that e is a *subevent* of E. The set of simple acts \mathcal{F} comprises all Σ -adapted and X-valued functions over Ω that have a finite range. As is customary, $x \in X$ is identified with the *constant act* that pays x in every state. Throughout the paper we assume that the decision maker has a nondegenerate binary preference relation \succeq on \mathcal{F} as in Savage's P1 and Grant's P5.³

For any collection of pairwise disjoint events, $E_1, E_2, \ldots, E_n \subset \Omega$ and $f_1, f_2, \ldots, f_n, g \in \mathcal{F}$, let $f_1E_1f_2E_2\cdots f_nE_ng$ denote the act that pays $f_i(\omega)$ if the true state, $\omega \in \Omega$, is in E_i and pays $g(\omega)$ otherwise. We say that $E \in \Sigma$ is *null* if $fEh \sim gEh \ \forall f, g, h \in \mathcal{F}$.

We introduce a binary relation over events via \succeq :

DEFINITION 1 —Event Exchangeability: For any pair of disjoint events $E, E' \in \Sigma$, $E \approx E'$ if for any $x, x' \in X$ and $f \in \mathcal{F}$, $xEx'E'f \sim x'ExE'f$.

Whenever $E \approx E'$ we will say that E and E' are exchangeable. Note that all null events are exchangeable. Exchangeability can be viewed as expressing a notion of equal likelihood: two events are equally likely if the decision maker is indifferent to a permutation of their payoffs. As the next example demonstrates, \approx is not necessarily transitive and, therefore, is not an equivalence relation.

EXAMPLE 1: Consider the partition $\{A, B_1, B_2, C\}$ of Ω . Let $X \equiv [0, 1]$ and let the utility representation over acts $xAy_1B_1y_2B_2z$ be given by

$$V(x, y_1, y_2, z) = x + z + \frac{y_1 + y_2}{2} + \frac{y_1 - y_2}{4}x.$$

It is straightforward to check that the representation satisfies first order dominance. It should also be clear that $A \approx B_1 \cup B_2$ and $C \approx B_1 \cup B_2$. On the other hand, it is certainly not the case that $A \approx C$ due to the asymmetry between x and z arising in the last term of the utility function.

Intuitively, an event is "at-least-as-likely" as any of its subevents. Exchangeability motivates a similar comparison across disjoint events, $E, E' \in \Sigma$: if a

³As usual, \succ (resp. \sim) is the asymmetric (resp. symmetric) part of \succeq . Under Savage's P1, \succeq is a weak order on \mathcal{F} , while Grant's P5 asserts that there exists $f, g \in \mathcal{F}$ such that $f \succ g$. Savage's version of P5 is slightly stronger, requiring the existence of $x, y \in X$ such that $x \succ y$.

subevent of E is exchangeable with E', then it is also natural to view E as atleast-as-likely as E'. Building on this, we define the following exchangeability-based relation between any two events.

DEFINITION 2—Exchangeability-Based Comparative Likelihood: For any events $E, E' \in \Sigma$, $E \succeq^C E'$ whenever $E \setminus E'$ contains a subevent e that is exchangeable with $E' \setminus E$. Moreover, e is referred to as a *comparison event*.

Just as the symbol \approx represents a notion of equal likelihood among events, the symbol \succeq^C intuitively represents an at-least-as-likely relation. The event E is at-least-as-likely as E' if outside their intersection the more likely event (i.e., $E \setminus E'$) contains a copy (i.e., the comparison event) of the less likely event (i.e., $E' \setminus E$). Whereas \emptyset is a subevent of any event and \emptyset is exchangeable with itself, $E' \subseteq E$ implies $E \succeq^C E'$.

For any $E, E' \in \Sigma$, we say that E and E' are *comparable* whenever $E \succeq^C E'$ or $E' \succeq^C E$. Finally, define $E \succ^C E'$ whenever $E \succeq^C E'$ and it is not the case that $E' \succeq^C E$. Likewise, define \sim^C as the symmetric part of \succeq^C .

We also need the following definitions:

DEFINITION 3: The symbol \succeq° is a *likelihood relation* over Σ if the following conditions hold:

- (i) \succeq° is a weak order over Σ ;
- (ii) $\Omega \succ^{\circ} \emptyset$ and for every $A \in \Sigma$, $A \succeq^{\circ} \emptyset$ and $\Omega \succeq^{\circ} A$;
- (iii) for every $A, B, C \in \Sigma$ such that $C \cap (A \cup B) = \emptyset$, $A \succeq^{\circ} B \Leftrightarrow A \cup C \succeq^{\circ} B \cup C$.

Note that the second requirement is satisfied by \succeq^C by virtue of the non-triviality of \succeq , whereas the last requirement is satisfied by the definition of \succeq^C . Thus establishing that \succeq^C is a likelihood relation reduces to demonstrating that condition (i) holds.

DEFINITION 4: The variable μ is an *agreeing probability measure* for \succeq° if it is a probability measure over Σ and for every $A, B \in \Sigma, A \succeq^{\circ} B \Leftrightarrow \mu(A) \geq \mu(B)$.

For any probability measure μ on Σ and act $f \in \mathcal{F}$, refer to $\{(\mu(f^{-1}(x)), x) \mid x \in X\}$ as the lottery induced by the act $f \in \mathcal{F}$ with respect to μ . An *atom* is an event that cannot be partitioned into two or more nonnull subevents. We say that μ is *purely and uniformly atomic* whenever the union of all atoms has unit measure and all atoms have equal measure. Measure μ is *convex-ranged* if for every $\alpha \in [0,1]$ and $A \in \Sigma$ there is a subevent $a \subseteq A$ with $\mu(a) = \alpha \mu(A)$. Finally, we say that μ is *solvable* if for every $A, B \in \Sigma$, $\mu(A) \ge \mu(B)$ implies the existence of a subevent $a \subseteq A$ with $\mu(a) = \mu(B)$. Note that requiring μ to be solvable is weaker than requiring it to be convex-ranged.

2.2. Axioms and Main Result

Given a nonnull event e_0 , consider asking a decision maker to identify a disjoint event (say e_1) that is exchangeable with e_0 , then find another event (say e_2) disjoint from $e_0 \cup e_1$ and exchangeable with e_1 , then find another event (say e_3) disjoint from $e_0 \cup e_1 \cup e_2$ and exchangeable with e_2 , and so on. Then the following Archimedean condition asserts that this procedure must end after a finite number of steps:

AXIOM A—Event Archimedean Property: Any sequence of pairwise disjoint and nonnull events $\{e_i\}_{i=0}^n \subseteq \Sigma$, such that $e_i \approx e_{i+1}$ for every $i=0,\ldots$ is necessarily finite.

Axiom A can also be restated to say that if $\{e_i\}_{i=0}^{\infty} \subseteq \Sigma$ is a sequence of pairwise disjoint events with $e_i \approx e_{i+1}$ for every $i = 0, \ldots$ then e_0 is null.

Suppose that the decision maker behaves as if she assigns a unique probability measure to each event and that the measure of events along with their assigned payoffs are the only relevant characteristics for the purpose of her decision making. Clearly, if two events are equally likely, then their set differences are also equally likely and thus exchangeable. Thus, if Σ is sufficiently fine, any event will contain a subevent with arbitrary yet smaller likelihood and, therefore, any two events in the decision maker's world are comparable. The next assumption asserts this by requiring completeness of \succeq^C .

AXIOM C—Completeness of \succeq^C : Given any disjoint pair of events, one of the two must contain a subevent that is exchangeable with the other.

Although completeness of \succeq^C may be appealing, added to Axiom A it is not sufficient for the existence of a likelihood relation, let alone a unique agreeing probability measure that represents \succeq^C . Consider the following condition, which appears much weaker than Savage's P3 and P4:⁴

AXIOM N—Event Nonsatiation: For any pairwise disjoint $E, A, E' \in \Sigma$, if $E \approx E'$ and A is nonnull, then no subevent of E' is exchangeable with $E \cup A$.

Axiom N is equivalent to requiring that whenever two events are exchangeable, adding a disjoint nonnull event to one of them makes the combined event strictly more likely (i.e., $E \cup A \succ^C E'$). How minimal is Axiom N? The next result establishes that it is necessary for any exchangeability-based likelihood

⁴ Savage's P3 states that for any nonnull event $E \subseteq \Omega$, act $f \in \mathcal{F}$, and any $x, y \in X, x \succeq y \Leftrightarrow xEf \succeq yEf$. Savage's P4 states that for any events $E, E' \in \Sigma$ and $x^*, x_*, y^*, y_* \in X$ with $x^* \succ x_*, y^* \succ y_*, x^*Ex_* \succeq x^*E'x_*$ implies $y^*Ey_* \succeq y^*E'y_*$. Machina and Schmeidler's (1992) more restrictive P4* requires that for any $f, g \in \mathcal{F}$ and whenever $E \cap E' = \emptyset$, $x^*Ex_*E'f \succeq x^*E'x_*Ef$ implies $y^*Ey_*E'g \succeq y^*E'y_*Eg$.

relation in which nonnull sets are strictly more likely than the empty set. Thus to the extent that the latter is desirable, Axiom N is a minimal requirement for any theory of probabilistic sophistication in which exchangeable events are equally likely.

LEMMA 1: Assume that \succeq° is a likelihood relation over Σ with (i) a symmetric part that agrees with \approx on disjoint sets and (ii) $A \succ^{\circ} \emptyset$ for all nonnull $A \in \Sigma$. Then for any pairwise disjoint $E, E', A \in \Sigma$ such that A is not null, $E \approx E'$ implies that $E \cup A \succ^{\circ} E'$.

PROOF: Assume that $E, E', A \in \Sigma$ are pairwise disjoint, A is not null, and $E \approx E'$ (meaning that $E \sim^{\circ} E'$). Note that $A \succeq^{\circ} \emptyset \Leftrightarrow E \cup A \succeq^{\circ} E$. Transitivity of \succeq° implies that $E \cup A \succeq^{\circ} E'$. If $E \cup A \sim^{\circ} E'$, then $E \cup A \sim^{\circ} E$. In particular, the cancellation property (Definition 3(iii)) of a likelihood relation means that $A \sim^{\circ} \emptyset$ —a contradiction. Thus, $E \cup A \succ^{\circ} E'$.

Q.E.D.

We refer to the following results in Section 2.3.1, where we sketch the proof of our theorem.

LEMMA 2: Axioms C and N imply for any $E, E', E'' \in \Sigma$, and E and E' disjoint, $E \succeq^C E'$ and $E'' \subseteq E' \Rightarrow \exists \hat{e} \subseteq E$ with $\hat{e} \approx E''$. Moreover, $E \setminus \hat{e}$ is not null whenever $E' \setminus E''$ is not null.

PROOF: Let $e \subseteq E$ be the comparison event for $E \succeq^C E'$. If E'' contains a subevent $e'' \approx e$ with $E'' \setminus e''$ not null, then $e'' \cup (E' \setminus e'') \approx e$, in violation of Axiom N. Thus, by Axiom C, $e \succeq^C E''$ and $\exists \hat{e} \subseteq e \subseteq E$ with $\hat{e} \approx E''$. If $E' \setminus E''$ is not null, then $e \setminus \hat{e}$ cannot be null (and thus $E \setminus \hat{e}$ is not null); otherwise, $e \approx E''$ and $e \approx (E' \setminus E'') \cup E''$, in violation of Axion N. *Q.E.D.*

LEMMA 3: Axiom N implies, for any disjoint $E, E' \in \Sigma$, that $E \sim^C E' \Leftrightarrow E \approx E'$.

PROOF: Assume $E \sim^C E' \Rightarrow \exists e \subseteq E$ with $e \approx E'$. Then $E \setminus e$ must be null (in which case $E \approx E'$); otherwise, $E' \sim^C e \cup (E \setminus e)$ implies that E' contains a subevent exchangeable with $e \cup (E \setminus e)$ in violation of Axiom N. Now, $E \approx E'$ implies $E \succeq^C E'$ and $E' \succeq^C E$, thus implying $E \sim^C E'$.

Q.E.D.

LEMMA 4: For any pairwise disjoint $a, b, c, d \in \Sigma$, $a \approx b$ and $c \approx d$ imply $a \cup c \approx b \cup d$.

PROOF: The result is a direct consequence of Definition 1. *Q.E.D.*

LEMMA 5: Given Axioms C and N, and any pairwise disjoint $a, b, c, d \in \Sigma$, $a \cup b \approx c \cup d$ and $a \approx c$ imply $b \approx d$.

PROOF: If $b \not\approx d$, then Axiom C implies, without loss of generality, there is some $b' \subset b$ such that $b' \approx d$ and $b \setminus b'$ is not null. By Lemma 4, $a \cup b' \approx c \cup d$, which violates Axiom N because $a \cup b \setminus a \cup b'$ is not null. Q.E.D.

Our main result delivers exchangeability-based probabilistic sophistication as necessary and sufficient for Axioms A, C, and N.

THEOREM 1: Axioms A, C, and N are satisfied if and only if there exists a unique, solvable, and finitely additive agreeing probability measure μ for \succeq^C . Moreover, μ is either atomless or purely and uniformly atomic, any two events have the same measure if and only if they are exchangeable, and the decision maker is indifferent between any two acts that induce the same lottery with respect to μ .

2.3. Discussion

We now turn to a discussion of Theorem 1. We begin by examining the intuition behind the derivation. We then compare our axioms with their counterparts in the literature.

2.3.1. Sketch of Proof of Theorem 1

The proof proceeds by first establishing that \succeq^C is a likelihood relation that can be represented by a unique finitely additive measure μ . The nontrivial steps involve demonstrating that \succeq^C is transitive and that either Σ is generated by finitely many equal mass atoms or \succeq^C is fine and tight—both cases known to be associated with a unique representing measure. To see how probabilistic sophistication follows, consider two acts that induce the same lottery with respect to μ . Then the equivalence between \sim^C and \approx for two disjoint events (Lemma 3) ensures that the payoffs of f can be permuted to establish indifference between f and g.

To get a better sense of how Axioms A, C, and N imply transitivity of \succeq^C , consider $E \succeq^C E' \succeq^C E''$ and assume for simplicity that $E, E', E'' \in \Sigma$ are pairwise disjoint. The general idea is to establish that if $E'' \succ^C E$, then one can construct an infinite sequence of nonnull pairwise disjoint events in violation of Axiom A. To do this, we first note a simple implication of Lemmas 2 and 5: $E'' \succeq^C E$ implies that for any subevent $e \subseteq E$ there exists $e'' \subseteq E''$ such that $e'' \approx e$ and $E'' \setminus e'' \succeq^C E \setminus e$. Essentially, comparability and event nonsatiation enable one to cleave equally sized pieces from E'' and E, while maintaining the ordering between the residual events.

If $E'' >^C E$, then one can find a nonnull subevent of E'', say e_1 , such that $E'' \setminus e_1 \approx E$. Thus, $E'' \setminus e_1 \succeq^C E \succeq^C E'$. Next, since $E' \succeq^C E''$, one can cleave a

⁵ A relation on Σ is fine if it contains no atoms and for any event E there exists a partition of Σ where no partition element is strictly more likely than E. The relation is tight whenever $E \succ^C E'$, and there are $A, B \in \Sigma$ where $A \cap E' = \emptyset$ and $B \subset E$ such that $E \succ^C A \cup E'$ and $E \setminus B \succ^C E'$.

piece, say e_2 , from E' such that $e_2 \approx e_1$, giving $E' \setminus e_2 \succeq^C E'' \setminus e_1 \succeq^C E$. This can be continued (e.g., cleave $e_3 \subset E$ such that $e_3 \approx e_2$, etc.) and yields the infinite sequence of nonnull events. The contradiction with Axiom A forces $E \succeq^C E''$ and the desired transitivity of \succeq^C . The proof makes use of such a construction, albeit in the more involved case where E, E', and E'' are not pairwise disjoint.

If Σ is atomless, tightness follows from Axiom N; fineness relative to a nonnull event, E, can be established by cleaving pairwise disjoint pieces from $\Omega \setminus E$ that are exchangeable with E. By Axiom A this can only be done a finite number of times before one ends up with a remainder event that is less likely than E. This construction leads to a finite partition whose elements are no more likely than E. The fact that \succeq^C is a fine and tight likelihood relation can then be used to deduce the existence of a unique agreeing probability measure (see Wakker (1981)). We emphasize that, for probabilistic sophistication, Σ need not be a σ -algebra and μ need not be convex-ranged. Axiom C, however, requires μ to be solvable. Kopylov (2004) derives probabilistic sophistication on event domains in which μ may not be solvable and thus violates Axiom C, but requires stronger axioms reminiscent of P3, P4*, and P6 (see also Abdellaoui and Wakker (2005)).

If Σ contains an atom, then completeness requires that every other event contain a subevent that is exchangeable with the atom. Thus completeness of \succeq^C implies that all events are unions of equiprobable atoms (details are in the proof). In turn, Axiom A implies that the set of atoms is finite. Other cases that involve atoms require a relaxation or at least a reexamination of the structure imposed. Moreover, additional assumptions will be required to pin down a unique representing measure for \succeq^C when it is atomic. This issue is not unique to our work—the majority of papers in this literature tend to focus on atomless state spaces and those that do not require considerably more structure than we do; see Wakker (1984), Chateauneuf (1985), Nakamura (1990), Gul (1992), Chew and Karni (1994), and Köbberling and Wakker (2003).

2.3.2. Relationship to the Literature

Comparison with Machina and Schmeidler (1992): Machina and Schmeidler (1992) show that the existence of a continuous probabilistically sophisticated utility representation of \succeq that agrees with first degree stochastic dominance is equivalent to P1, P3, P4*, P5, and P6.⁶ This result delivers a unique convex-ranged probability measure where the measures of two events coincide if and only if the events are exchangeable. It is straightforward to show that P3 implies

⁶See footnote 3 for definitions of P1 and P5, and footnote 4 for definitions of P3, P4, and P4*. First degree stochastic dominance, as used by Machina and Schmeidler, is essentially an expression of P3 in terms of lotteries and, in the case of multidimensional outcomes, is more restrictive than monotonicity in outcomes (see footnote 2). Savage's P6 requires that whenever f > g, then for any $x \in X$ there is a sufficiently fine finite partition of Ω , say $\{E_i\}_{i=1}^n \subset \Sigma$, such that $xE_if > g$ and $f > xE_ig$ for every $i = 1, \ldots, n$.

Axiom N. Hence, given their remaining axioms, Machina and Schmeidler's P4* and P6 imply Axioms A and C. Note that P3, P4*, and P6 are not implied by Axioms A, C, and N because the latter are consistent with the representation in (1), whereas the former are not (this is demonstrated in the Appendix).

The next proposition establishes two things: given a weak ordering that satisfies P3, Machina and Schmeidler's P4* is implied by completeness of \succeq^C . Moreover, \succeq^C is, in this case, the comparative likelihood relation represented in their probabilistically sophisticated setting.

PROPOSITION 1: Assume Savage's P3 and Axiom C. Then for any x^* , $x_* \in X$ with $x^* > x_*$, disjoint $E, E' \in \Sigma$, and $f \in \mathcal{F}$, $x^*Ex_*E'f \succeq x^*E'x_*Ef \Leftrightarrow E \succeq^C E'$.

In other words, to arrive at Machina and Schmeidler's representation theorem, one need only replace Axiom N with P3 and add a stronger form of continuity to our list of conditions.

Comparison with Grant (1995): The following highlights the limitations of an exchangeability based approach to probabilistic sophistication.

EXAMPLE 2: Consider the "mother" example supplied by Grant (1995). Suppose there are only two outcomes in the world of the decision maker: receipt of an indivisible good by child 1 or by child 2. A plausible representation for the mother's preferences is the utility function U(p) = p(1-p), where p is the probability that child 1 receives the indivisible good and is subjectively generated by some device deemed by the mother to be uniform. According to the definition of exchangeable events, any event with probability $p \in [0, 0.5]$ is exchangeable with its complement.

In the example, \approx fails to deliver a notion of likelihood, because given three disjoint events E, E', and A such that $\mu(E) = \mu(E') = 0.4$ and $\mu(A) = 0.2$, the mother's preference behavior leads to the conclusion that $E \approx E'$ while $E \cup A \approx E'$, in violation of Axiom N. Failure of the latter to deliver what is clearly probabilistically sophisticated behavior can be attributed to the highly restricted nature of the outcome space. If the good is divisible, say chocolate, or there is an outcome in which nothing is given to either child, then it will likely no longer be the case that any event is exchangeable with its complement; for instance, if E is a probability 0.6 event, then it is reasonable to suppose that the mother is not indifferent between giving *each* child a piece of chocolate if E is realized and nothing otherwise, versus giving each child a piece of chocolate if the complement of E is realized and nothing otherwise.

As stated, our axioms do not encompass those of Grant (1995), whose approach, in particular, can accommodate Example 2. Grant (1995) weakens P3 to either one of two variants: conditional upper (or lower) eventwise monotonicity ($P3^{CU}$ or $P3^{CL}$, formally stated in the proof to the next proposition). However, the preceding discussion suggests that the peculiarities of the

mother example may not arise when the outcome set is slightly enlarged.⁷ The following result provides a condition under which either one of Grant's P3^{CU} and P3^{CL} axioms implies Axiom N.

PROPOSITION 2: Assume that for every nonnull $A \in \Sigma$ there exist $z, z', y, y' \in X$ such that $z \succ yAz$ and $y'Az' \succ z'$. Then either one of Grant's P3^{CU} or P3^{CL} axioms implies Axiom N.

The condition "for every nonnull $A \in \Sigma$ there exist $z, z', y, y' \in X$ such that $z \succ yAz$ and $y'Az' \succ z'$ " is a form of nonsatiation in outcomes. It can therefore be viewed as a richness assumption on both \succeq and the outcome set X.

Under the conditions in Proposition 2, Grant's unique measure that represents probabilistic sophistication agrees with \succeq^C , and his axioms (taken together) imply both completeness of \succeq^C and Axiom A. In other words, probabilistically sophisticated preferences that satisfy Grant's axioms also satisfy ours provided that the outcome space is sufficiently rich to ensure that Axiom N is also satisfied. In practice, Grant's axioms are more demanding than ours in the sense that they require a form of continuity and monotonicity not needed in Theorem 1, and rule out many probabilistically sophisticated functional forms that are admissible under our axioms.

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APPENDIX

PROOFS OF CLAIMS FOR THE PREFERENCE SPECIFICATION IN EQUATION (1):

Monotonicity in Payoffs: To show that for any lottery $L = (\mathbf{x}_1, p_1; ...; \mathbf{x}_n, p_n)$, U(L) is increasing in x_i^j for arbitrary i = 1, ..., n and j = 1, 2, differentiate to get

$$\frac{\partial U(L)}{\partial x_i^j} = p_i(x_i^j + 1) - \frac{p_i}{2} \frac{(x_i^j - E[L]^j)}{\|\mathbf{x}_i - E[L]\|} + \frac{p_i}{2} \sum_{k=1}^n p_k \frac{(x_k^j - E[L]^j)}{\|\mathbf{x}_k - E[L]\|} > 0.$$

 7 To emphasize the importance of the outcome space, we note that whenever X contains only two outcomes, Σ is atomless, and \succeq can be represented via a continuous and probabilistically sophisticated utility function, Axiom N is satisfied if and only if the representation is monotonic in the sense of P3. We thank I. Gilboa for pointing this out.

Violation of P3: Consider $\mathbf{x} = (1,0)$ and $\mathbf{y} = (1/3,1/3)$. Then $U(\mathbf{x}) > U(\mathbf{y})$. On the other hand, $U((\mathbf{x},1/2;\mathbf{0},1/2)) < U((\mathbf{y},1/2;\mathbf{0},1/2))$, thus violating P3. Violations of P3^{CU} and P3^{CL}: Consider $L \equiv ((6,1/2),1/10;(6,3),9/10)$ and $L' \equiv ((1,6),1/10;(6,3),9/10)$. Let $L'' \equiv \frac{1}{2}L + \frac{1}{2}L'$ denote the even probabilistic mixture of L and L'. Then it is straightforward to calculate that U(L'') > U(L') > U(L), in violation of P3^{CL} in Grant (1995). On the other hand, setting L equal to the degenerate lottery (0,9) and setting L' equal to the degenerate lottery (0,9) and setting L' equal to Grant's P3^{CU}.

Violations of P4 and Its Variants: Let $x^* = (8,0)$ and $x_* = (3/2,3/2)$. Then $U(x^*) > U(x_*)$ and it is easy to check that $U((x^*,1/2;x_*,1/2)) < U((x^*,1/20;x_*,19/20))$. On the other hand, letting $y^* = (2,2)$ and $y_* = x_*$, dominance necessitates $U(y^*) > U(y_*)$ and $U((y^*,1/2;y_*,1/2)) > U((y^*,1/20;y_*,19/20))$, in violation of P4 (and consequently P4* in Machina and Schmeidler (1992)).

Grant (1995) uses a variant of P4, which he calls $P4^{CE}$, stating that for any $x, y, z, w \in X$, $g, h \in \mathcal{F}$, and $E, E' \in \Sigma$, $xE \cup E'g \succ xEyE'g \sim yExE'g \succ yE \cup E'g$ implies $wEzE'h \sim zEwE'h$. The example used to demonstrate that $U(\cdot)$ violates P4 can be slightly modified to show that $U(\cdot)$ also violates $P4^{CE}$. Specifically, find p for which $U((x^*, 1/2; x_*, 1/2)) \sim U((x^*, p; x_*, 1-p))$ (this turns out to be approximately 0.088) and note that dominance implies $U((y^*, 1/2; y_*, 1/2)) > U((y^*, p; y_*, 1-p))$.

Consistency with Axioms A, C, and N: First note that because $U(\cdot)$ in (1) is monotonic in payoffs, two events are exchangeable if and only if their measure coincides. Consequently, the uniform measure on events is an agreeing probability measure for \succeq^C . Hence, Axioms A and C are trivially satisfied. Next, monotonicity in payoffs implies that for any nonnull event A, it must be that $A \succ^C \emptyset$. By identifying \succeq° in Lemma 1 with \succeq^C , one establishes that Axiom N is satisfied. The same argument can be applied to demonstrate that the lexicographic example of the Introduction also satisfies Axioms A, C, and N.

Q.E.D.

PROOF OF THEOREM 1: We prove the theorem in several steps:

STEP A: If E, E', and E'' are pairwise disjoint events, then $E \approx E'$ and $E' \approx E''$ imply $E \approx E''$.

PROOF: This is trivial if any of the events are null, so assume otherwise. If $E \not\approx E''$, then without loss of generality, there is some nonnull event $e_1 \subset E$ such that $E \setminus e_1 \approx E''$. Lemma 2 implies the existence of a nonnull event $e_2 \subset E'$ such that $E' \setminus e_2 \approx E \setminus e_1$. The events e_1 and e_2 are disjoint, so Lemma 5 gives $e_1 \approx e_2$. The fact that $E'' \approx E'$ can be similarly used to establish the existence of a set $e_3 \subset E''$ disjoint from e_1 and e_2 such that $e_3 \approx e_2$. Similarly, $E \setminus e_1 \approx E''$ leads to $e_4 \subset E \setminus e_1$ such that $e_4 \approx e_3$, etc. Clearly this can be continued

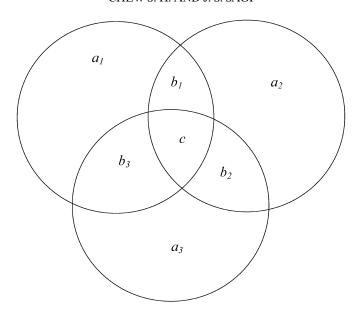


FIGURE 1.—Venn diagram useful in proving Theorem 1.

to construct an infinite sequence of nonnull events that are disjoint such that $e_{i+1} \approx e_i$, in violation of Axiom A. Q.E.D.

STEP B: Let $a_1, a_2, a_3, b_1, b_2, b_3$ be pairwise disjoint events in Σ (see Figure 1). Then $a_1 \cup b_3 \approx a_2 \cup b_2$ and $a_2 \cup b_1 \approx a_3 \cup b_3$ imply $a_1 \cup b_1 \approx a_3 \cup b_2$.

PROOF: The idea is to demonstrate the existence of events a'_1 , a'_3 , b'_1 , and b'_2 , where $a'_1 \subseteq a_1$, $a'_3 \subseteq a_3$, $b'_1 \subseteq b_1$, and $b'_2 \subseteq b_2$, such that $a'_1 \approx a'_3$, $a_1 \setminus a'_1 \approx b'_2$, $a_3 \setminus a'_3 \approx b'_1$, and $b_1 \setminus b'_1 \approx b_2 \setminus b'_2$. This enables one to write, using Lemma 4, $a_1 \cup b_1 = a'_1 \cup (a_1 \setminus a'_1) \cup b'_1 \cup (b_1 \setminus b'_1) \approx a'_3 \cup b'_2 \cup (a_3 \setminus a'_3) \cup (b_2 \setminus b'_2) = a_3 \cup b_2$, which is the desired result.

B(i): Lemma 2 implies the existence of $\hat{a}_1 \cup \hat{b}_3 \approx a_2$ and $\check{a}_3 \cup \check{b}_3 \approx a_2$, with $\hat{a}_1 \subseteq a_1$, $\check{a}_3 \subseteq a_3$, and \hat{b}_3 , $\check{b}_3 \subseteq b_3$. Similarly, Lemma 2 also implies the existence of $\hat{a}_2 \approx \hat{b}_3$ and $\check{a}_2 \approx \check{b}_3$, where \hat{a}_2 , $\check{a}_2 \subseteq a_2$. Set $a'_2 \equiv a_2 \setminus (\hat{a}_2 \cup \check{a}_2)$ and note that, using Lemma 5, $a'_2 \subseteq a_2 \setminus \hat{a}_2 \approx \hat{a}_1$ and $a'_2 \subseteq a_2 \setminus \check{a}_2 \approx \check{a}_3$. Lemma 2 implies the existence of $a'_1 \subseteq a_1$ and $a'_3 \subseteq a_3$ such that $a'_1 \approx a'_2 \approx a'_3$. Step A gives $a'_1 \approx a'_3$.

B(ii): Defining $b_3' \equiv \hat{b}_3 \cup \hat{b}_3$ gives $a_1' \cup b_3' \approx a_2 \approx a_3' \cup b_3'$ (using Lemma 4). From $a_1 \cup b_3 \approx a_2 \cup b_2$, $a_3 \cup b_3 \approx a_2 \cup b_1$, and B(i), Lemma 5 implies that $(a_1 \setminus a_1') \cup (b_3 \setminus b_3') \approx b_2$ and $(a_3 \setminus a_3') \cup (b_3 \setminus b_3') \approx b_1$. Lemma 2 implies there are $b_2' \subseteq b_2$ and $b_1' \subseteq b_1$ such that $b_2' \approx a_1 \setminus a_1'$ and $b_1' \approx a_3 \setminus a_3'$. By Lemma 5, $b_1 \setminus b_1' \approx b_3 \setminus b_3'$ and $b_3 \setminus b_3' \approx b_2 \setminus b_2'$, thus Step A implies that $b_1 \setminus b_1' \approx b_2 \setminus b_2'$. *Q.E.D.*

STEP C: The relation \succ^C is transitive.

PROOF: Now, given $E, E', E'' \in \Sigma$, suppose that $E \succeq^C E'$ and $E' \succeq^C E''$. Let $e' \subseteq E' \setminus E''$ be a comparison event between E' and E'' (i.e., $e' \approx E'' \setminus E'$). Lemma 2 implies there is some $\hat{e} \subseteq E \setminus (e' \cup (E' \cap E''))$ such that $\hat{e} \approx (e' \cup (E' \cap E'')) \setminus E$. We can now apply Step B as follows. Let the lower circle in Figure 1 correspond to E''. This can be broken up into two pieces: $E'' \setminus E' \equiv a_3 \cup b_3$ and $E'' \cap E' \equiv b_2 \cup c$. Likewise, let e' correspond to $a_2 \cup b_1$, so that $a_2 \cup b_1 \approx a_3 \cup b_3$. Finally, let $a_1 \cup b_3 \equiv \hat{e}$ and set $\xi = (e' \cup (E' \cap E'')) \cap E$. Diagrammatically, ξ corresponds to $b_1 \cup c$. Note that we identify the left and right circles with subevents of E and E', respectively. It follows that $b_1 = \xi \cap e'$, $a_2 = e' \setminus b_1$, $b_3 = \hat{e} \cap E''$, $a_1 = \hat{e} \setminus b_3$, $b_2 = ((e' \cup (E' \cap E'')) \setminus E) \cap E''$, and $a_3 = E'' \setminus (\hat{e} \cup E')$. Now, $\hat{e} \approx (e' \cup (E' \cap E'')) \setminus E$ means that $a_1 \cup b_3 \approx a_2 \cup b_2$. Whereas $a_2 \cup b_1 \approx a_3 \cup b_3$, Step B implies $a_1 \cup b_1 \approx a_3 \cup b_2$. Moreover, because $E'' \setminus E = a_3 \cup b_2$ and $a_1 \cup b_1 \subseteq E \setminus E''$, by definition $E \succeq^C E''$.

STEP D: The relation \succ^C is a likelihood relation.

PROOF: Step C establishes that \succeq^C is a weak order (transitive and complete) over Σ . Condition (ii) in Definition 3 (of a likelihood relation) is satisfied by \succeq^C due to the presence of nonnull events (P5) and Axiom N, while condition (iii) is automatically satisfied by the definition of comparability. *Q.E.D.*

STEP E: The relation \succeq^C is either atomless and tight or purely and uniformly atomic.

PROOF: Assume first that Σ contains an atom a, and denote a^c as its relative complement in Ω . Note that for any $e \in \Sigma$ it cannot be that $a \succ^C e$, because a cannot be partitioned into two or more nonnull events. Thus $a^c \succeq^C a$. If $a \approx a^c$, then, by Axiom N, a^c must also be an atom and Σ therefore consists of two exchangeable atoms. Suppose instead that $a^c \not\approx a$. Then there is some event $a_1 \subset a^c$ with $a_1 \approx a$ and $a^c \setminus a_1$ not null. By Axiom N, a_1 must be an atom in Σ , and by Axiom C, $a^c \setminus a_1 \succeq^C a$. In turn this implies the presence of another atom $a_2 \approx a$ in $a^c \setminus a_1$ with a, a_1 , and a_2 disjoint and pairwise exchangeable. According to Axiom A, this can be continued at most a finite number of times, proving that Σ is generated by a finite set of atoms. Transitivity of \approx (Step A) implies that all atoms are pairwise exchangeable.

Assume now that Σ is atomless. To demonstrate tightness (see footnote 5), consider that $E \succ^C E'$ implies that there is some $e \subset E \setminus E'$ such that $e \approx E' \setminus E$ and $E \setminus (e \cup E')$ is not null. Whereas Σ is atomless, $E \setminus (e \cup E')$ can be split into two disjoint nonnull events, ξ_1 and ξ_2 , both in Σ , that are subsets of E and disjoint from $e \cup E'$. By Axiom N, no subevent of $E' \setminus E$ is exchangeable with $e \cup \xi_2$. Thus Axiom C implies that $E = e \cup \xi_2 \cup (E \cap E') \cup \xi_1 \succ^C (E' \setminus E) \cup (E \cap E')$

 $E') \cup \xi_1 = E' \cup \xi_1$, where $\xi_1 \cap E' = \emptyset$. A similar argument implies $E \setminus \xi_1 \succ^C E'$, implying that \succeq^C is tight. Q.E.D.

STEP F: $If \succeq^C$ is atomless, then it is fine.

PROOF: To show this, for any $E \in \Sigma$ we construct a finite partition of Ω at least as fine as E, $\{e_i\}$, starting with $e_1 \equiv E$. Next, Axiom C implies that either $E \succeq^C E^c$ or $E^c \succeq^C E$. In the former case, let $e_2 \equiv E^c$. Then $\{e_1, e_2\}$ forms a partition that contains events at least as fine as E. In the latter case, define e_2 as the comparison event in E^c that, by definition, is exchangeable with E. Once again, Axiom C implies that either $E \succeq^C (E \cup e_2)^c$ or $(E \cup e_2)^c \succeq^C E$, and we can continue constructing events exchangeable with E and disjoint from each other in the obvious way. By Axiom A, this construction must be finite and constitutes a partition of Ω that consists of events at least as fine as E. Thus \succeq^C is fine.

STEP G—Conclusion: In either the atomic or the fine and tight case, there exists a unique finitely additive probability measure μ that agrees with \succeq^C (see Wakker (1981)). Therefore, μ is solvable; moreover, it is a countably additive convex-ranged measure if Σ is a σ -algebra (as in Savage's original treatment). Finally, whenever the measure of two events E, E' coincides, it must be that $E \succeq^C E'$ and $E' \succeq^C E$; in turn, Lemma 2 implies that $E \approx E'$.

To prove that the decision maker is indifferent between all acts that induce the same distribution, one can use the arguments in Steps 4 and 5 in the proof of Theorem 1 in Machina and Schmeidler (1992) or Step 5 in the proof of Theorem 1 in Grant (1995). Proving necessity of Axioms C and A is trivial; necessity of Axiom N follows from Lemma 1.

Q.E.D.

PROOF OF PROPOSITION 1: Assume $E \succeq^C E'$. For any $x^*, x_* \in X$ with $x^* \succ x_*$ and $f \in \mathcal{F}$, write $x^*Ex_*E'f = x^*\xi \cup \xi'x_*E'f$, where $\xi \cup \xi' = E$ and $\xi' \approx E'$. By definition of \approx , we have that $x^*\xi \cup \xi'x_*E'f \sim x^*\xi \cup E'x_*\xi'f$. By P3, the latter dominates $x^*E'x_*\xi \cup \xi'f = x^*E'x_*Ef$. In summary, $x^*Ex_*E'f \succeq x^*E'x_*Ef$.

If $E' \succ^C E$, then E' contains a nonnull subevent e' such that $E' \setminus e' \approx E$. Using P3: $E' \succ^C E \Rightarrow x^*E'x_*Ef \succ x^*Ex_*E'f$. Axiom C and the contrapositive of the latter give $x^*Ex_*E'f \succeq x^*E'x_*Ef \Rightarrow E \succeq^C E'$. Q.E.D.

PROOF OF PROPOSITION 2: Grant's axioms state that for any $x, y \in X$, $h \in \mathcal{F}$, and disjoint nonnull $E, E' \in \Sigma$,

$$x(E \cup E')f > y(E \cup E')f \Rightarrow xEyE'f > y(E \cup E')f$$
 (P3^{CU}),
 $x(E \cup E')f > y(E \cup E')f \Rightarrow x(E \cup E')f > xEyE'f$ (P3^{CL}).

We first establish the following property under the hypothesis,

PROPERTY †: For any disjoint $E, E', A \in \Sigma$ with $E \cup E' \cup A$ not null, if $x(E \cup A)x'E'f \sim xEx'(E' \cup A)f$ for every $x, x' \in X$ and $f \in \mathcal{F}$, then A is null.

Specializing to acts that have the property $f(\omega) = x'$ for $\omega \notin E \cup E' \cup A$, this becomes $x(E \cup A)x' \sim xEx'$ for every $x, x' \in X$. Note that, under the hypothesis of the proposition, when E is null, A too must be null. Assuming E is not null, there exist $z, z', y, y' \in X$ such that $z > y(E \cup A)z$ and $y'(E \cup A)z' > z'$. If $P3^{CU}$ is satisfied and A is not null, it must be that $zAyEz = yEz > y(E \cup A)z$, a contradiction of $x(E \cup A)x' \sim xEx'$ for every $x, x' \in X$. On the other hand, if $P3^{CL}$ is satisfied and A is not null, it must be that $y'(E \cup A)z > y'Ez = zAy'Ez$, also a contradiction. Thus A is null and Property \dagger is established.

We now demonstrate that Property \dagger implies Axiom N. Suppose $E, A, E' \in \Sigma$ are pairwise disjoint, such that $E \approx E'$ and A is nonnull. Let ξ' be a subevent of E' that is exchangeable with $E \cup A$. By exchanging ξ' for $E \cup A$, we have for any $x, x' \in X$ and $f \in \mathcal{F}$ that $x'(E \cup A)xE'f \sim x'\xi'x((E \cup A) \cup (E' \setminus \xi'))f = x'\xi'x(E \cup (A \cup E' \setminus \xi'))f$. Similarly, by exchanging E with E' it follows that $x'(E \cup A)xE'f \sim x'(E' \cup A)xEf = x'(\xi' \cup (A \cup E' \setminus \xi'))xEf$. Property \dagger implies $A \cup E' \setminus \xi'$ is null, contradicting the fact that A is not null. Avoiding the contradiction requires that no subevent of E' is exchangeable with $E \cup A$.

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