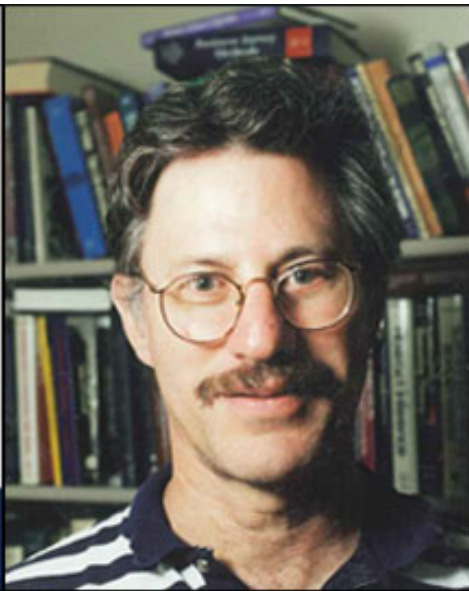


*When Large also is Small*  
*conflicts between Measure Theoretic and Topological senses of a negligible set*  
**Teddy Seidenfeld**

**Collaboration: Jessica Cisewski, Jay Kadane, Mark Schervish, and Rafael Stern**  
**Statistics Depts – Yale, Carnegie Mellon University (x 2), and U. Federal de São Carlos**



**Jessi**



**Jay**



**Mark**



**Rafael**

## Outline

- 1. Review two strong-laws that rely on measure 0 as the sense of a *negligible* set: where the probability-1 law fails.**
- 2. A topological sense of a *negligible* set – *meager* (or *1<sup>st</sup> category*) sets.**
- 3. Oxtoby's (1957, 1980) results – where the two senses of *negligible* conflict.**
- 4. A generalization of Oxtoby's (1957) result.**
- 5. Some concluding thoughts on where these two formal perspectives on *negligible* sets do and do not play well together.**

**1. Two philosophically significant, strong-laws that rely on measure 0 as the sense of a negligible set: where the law fails. [See, e.g. Schervish (1995).]**

- **The *strong law of large numbers* for independent, identically distributed (*iid*) Bernoulli trials – connecting *chance* with limiting relative frequency.**

**Let  $X$  be a Bernoulli variable sample space  $\{0, 1\}$ , with  $P(X = 1) = p$ , for  $0 \leq p \leq 1$ .**

**Let  $X_i$  ( $i = 1, 2, \dots$ ) be a denumerable sequence of Bernoulli variables, with a common parameter  $P(X_i = 1) = p$  and where trials are independent.**

***Independence* is expressed as follows.**

**For each  $n = 1, 2, \dots$ , let  $S_n = \sum_{i=1}^n X_n$ .**

**Then  $P(X_1 = x_1, \dots, X_n = x_n) = p^{S_n} \times (1 - p)^{(n - S_n)}$ .**

**The *weak-law* of large numbers for *iid* Bernoulli trials:**

**For each  $\varepsilon > 0$ ,  $\lim_{n \rightarrow \infty} P(|S_n/n - p| > \varepsilon) = 0$ .**

**The *strong-law* of large numbers for *iid* Bernoulli trials:**

**$P(\lim_{n \rightarrow \infty} S_n/n = p) = 1$ .**

**If  $P$  is countably additive, the strong-law version entails the weak-law version.**

Let  $\langle X, \mathcal{E}, P \rangle$  be the countably additive *measure space* generated by all finite sequences of repeated, probabilistically independent [*iid*] flips of a “fair” coin.

Let 1 denote a “Heads” outcome and 0 a “Tails” outcome for each flip.

Then a point  $x$  of  $X$  is a denumerable sequence of 0s and 1s,

$$x = \langle x_1, x_2, \dots \rangle, \text{ with each } x_n \in \{0, 1\} \text{ for } n = 1, 2, \dots$$

and where  $X_n(x) = x_n$  designates the outcome of the  $n^{\text{th}}$  flip of the fair coin.

$\mathcal{E}$  is the Borel  $\sigma$ -algebra generated by *rectangular* events, those determined by specifying values for finitely many coordinates in  $\Omega$ .

$P$  is the countably additive *iid* product *fair-coin* probability that is determined by

$$P(X_n = 1) = 1/2 \quad (n = 1, 2, \dots)$$

and where each finite sequence of length  $n$  is equally probable,

$$P(X_1 = x_1, \dots, X_n = x_n) = 2^{-n}.$$

Let  $L^{1/2}$  be the set of infinite sequences of 0s and 1s with limiting relative frequency  $1/2$  for each of the two digits: a set belonging to  $\mathfrak{E}$ .

Specifically, let  $S_n = \sum_{i=1}^n X_i$ . Then  $L^{1/2} = \{x: \lim_{n \rightarrow \infty} S_n/n = 1/2\}$ .

- The *strong-law of large numbers* asserts that  $P(L^{1/2}) = 1$ .

What is excused with the *strong law*, what is assigned probability 0, is the null set  $N (= [L^{1/2}]^c)$  consisting of

the complement to  $L^{1/2}$  among all denumerable sequences of 0s and 1s.

- It is an old story within Philosophy that the Strong Law of Large Numbers offers a probabilistic link between *chance* and *limiting relative frequency*.

- **The Blackwell-Dubins (1962) strong-law for consensus among Bayesian investigators with increasing shared evidence.**

Let  $\langle X, \mathfrak{B} \rangle$  be a measurable Borel product-space as follows.

Consider a sequence of sets  $X_i$  ( $i = 1, \dots$ ) each with an associated  $\sigma$ -field  $\mathfrak{B}_i$ .

The Cartesian product  $X = X_1 \times \dots$  of sequences  $(x_1, \dots) = x \in X$ , for  $x_i \in X_i$ .

That is, each  $x_i$  is an atom of its algebra  $\mathfrak{B}_i$ .

$\mathfrak{B}$  be the  $\sigma$ -field generated by the measurable rectangles.

**Definition:** A measurable rectangle  $(A_1 \times \dots) = A \in \mathfrak{B}$  is one where

$A_i \in \mathfrak{B}_i$  and  $A_i = X_i$  for all but finitely many  $i$ .

**Blackwell and Dubins (1962) consider the idealized setting where:**

**Two Bayesian agents consider a common product space and share evidence of the growing sequence of *histories*  $\langle x_1, x_2, \dots, x_k \rangle$ .**

**Each has her/his own countably additive personal probability, with regular conditional probabilities for the future given the past.**

- **Two measure spaces  $\langle X, \mathcal{Z}, P_1 \rangle$  and  $\langle X, \mathcal{Z}, P_2 \rangle$ .**
- **Assume  $P_1$  and  $P_2$  agree on which events in  $\mathcal{Z}$  have probability 0.**

**In order to index how much these two are in probabilistic disagreement, use the total-variation distance.**

$$\text{Define } \rho( P_1( \cdot | X_1=x_1, \dots, X_n=x_n ), P_2( \cdot | X_1=x_1, \dots, X_n=x_n ) ) = \\ \sup_{E \in \mathcal{E}} | P_1(E | X_1=x_1, \dots, X_n=x_n) - P_2(E | X_1=x_1, \dots, X_n=x_n) | .$$

**The index  $\rho$  focuses on the greatest differences between the two agents' conditional probabilities.**

**The B-D (1962) strong-law about asymptotic consensus: For  $i = 1, 2$**

$$P_i [ \lim_{n \rightarrow \infty} \rho( P_1( \cdot | X_1=x_1, \dots, X_n=x_n ), P_2( \cdot | X_1=x_1, \dots, X_n=x_n ) ) = 0 ] = 1 .$$

- **Almost surely, increasing shared evidence creates consensus.**



2. *A topological sense of a negligible set – meager (or 1<sup>st</sup> category) sets.*

A topology  $\mathcal{T}$  for a set  $X$  is a class of *open* subsets of  $X$  that

includes  $X$  and  $\emptyset$

is closed under arbitrary unions and finite intersections.

The pair  $X = (X, \mathcal{T})$  is called a *topological space*.

A subset  $Y \subseteq X$  is dense (in  $X$ ) provided that,

$Y$  has non-empty intersection with each (non-empty) open set in  $\mathcal{T}$ .

A subset  $Y \subseteq X$  is nowhere dense (in  $X$ ) provided that

for each (non-empty) open set  $O$ , there is a (non-empty) open  $O' \subseteq O$

where

$$Y \cap O' = \emptyset.$$

*Topologically negligible (meager) and large (residual) sets*

A set  $M$  is meager (or 1<sup>st</sup> Category) iff

$M$  is the denumerable union of nowhere dense sets.

A set  $R$  is residual (or comeager) iff  $R = M^c$ .

$R$  is the complement of a meager set  $M$ .

**3. Oxtoby's (1957, 1980) results – where the two senses of *negligible* conflict.**

**There are some evident similarities between**

**the measure theoretic sense of a *negligible* set – a P-null set**

**and**

**the topological sense of a *negligible* set – a meager set.**

**A trivial example:**

**If  $X$  is uncountable with  $P(\{x\}) = 0$  for each  $x \in X$ , and**

**the topology  $\mathcal{T}$  on  $X$  has makes each point *nowhere dense* in  $X$ ,**

**then a denumerable set of points is *negligible* in both senses simultaneously.**

More significantly (Oxtoby, 1980, *T. 19.4*) establishes an important *duality*.  
Relative to Lebesgue measure and Euclidean topology on the real line –

*Duality Theorem*: Assume the *Continuum Hypothesis*.

Let  $\varphi$  be a proposition involving only the concepts of:  
measure 0 set, meager set, and pure set theory.

Let  $\varphi^*$  be the proposition that results by interchanging  
'measure 0' and 'meager' wherever these appear in  $\varphi$ .

Then,  $\varphi$  *if and only if*  $\varphi^*$ .

However, this *duality* does not establish the same sets are judged negligible  
in both perspectives.

- ***Old News:*** The real line can be decomposed into two complementary sets  $N$  and  $M$  where  $N$  has Lebesgue measure 0, and  $M$  is meager.

Existence of a radically opposed decomposition of *negligible* sets is captured, more generally, by Oxtoby's [1980, p. 64] Theorem 16.5.

If the measure space  $\langle X, \mathfrak{B}, P \rangle$ , satisfies

- $P$  is nonatomic,
- $X$  has a metrizable topology  $\mathcal{T}$  with a base whose cardinality is less than the first weakly inaccessible,
- and, the  $\sigma$ -field  $\mathfrak{B}$  includes the Borel sets of  $\mathcal{T}$ ,

then  $X$  can be partitioned into a set of  $P$ -measure 0 and a meager set.

***But are any of these problematic decompositions of practical significance?***

**Return to the setting of the *Law of Large Numbers*.**

**Let  $X_i$  ( $i = 1, 2, \dots$ ) be a denumerable sequence of Bernoulli  $\{0,1\}$  variables.**

**Let  $\langle X, \mathcal{E}, P \rangle$  be the *measure space* with  $\mathcal{E}$  the Borel  $\sigma$ -algebra generated by all finite sequences of flips, and  $P$  is the *iid* “fair coin” measure on sequences.**

**Topologize this space using the product of the *discrete* topology on each  $X_i$ ,**

$$\mathcal{T}'_i(X_i) = \{\emptyset, \{0\}, \{1\}, \{0,1\}\} \quad \text{and then} \quad \mathcal{T}^\infty = \mathcal{T}'_1 \times \mathcal{T}'_2 \times \dots$$

**Topology  $\mathcal{T}^\infty$  is (homeomorphic to) the *Cantor Space*.**

**Let  $L^{1/2}$  be the set of binary sequences with limiting relative frequency  $1/2$  for each of the two digits: a set belonging to  $\mathcal{E}$ .**

**Specifically, let  $S_n = \sum_{i=1}^n X_n$  and then  $L^{1/2} = \{x: \lim_{n \rightarrow \infty} S_n/n = 1/2\}$ .**

- **The *strong-law of large numbers* asserts that  $P(L^{1/2}) = 1$ .**
- **BUT (Oxtoby, 1957) the set  $L^{1/2}$  is a meager set in the topology  $\mathcal{T}^\infty$  (!!)**

#### ***4. A generalization of Oxtoby's (1957) result.***

**In our (2017) we show (*Theorem A1*) that the tension over rival senses of *negligible* generalizes in a dramatic way to sequences of random variables relative to a large class of infinite product topologies. A *Corollary* applies to Bernoulli sequences.**

**Let  $\chi$  be a set with topology  $\mathcal{T}$  and Borel  $\sigma$ -field,  $\mathcal{B}$ , i.e., the  $\sigma$ -field generated by the open sets in  $\mathcal{T}$ . Let  $\chi^\infty$  be the countable product set with the product topology  $\mathcal{T}^\infty$  and product  $\sigma$ -field,  $\mathcal{B}^\infty$ , which is also the Borel  $\sigma$ -field for the product topology (because it is a countable product).**

**Let  $\langle \Omega, \mathcal{A}, P \rangle$  be a probability space.**

**Relate these two spaces with a sequence of random quantities**

**$\{X_n\}_{n=1}^\infty$ , where, for each  $n$ ,  $X_n: \Omega \rightarrow \chi$  is ( $\mathcal{A}$  and  $\mathcal{B}$ ) measurable.**

**Define  $X: \Omega \rightarrow \chi^\infty$  by  $X(\omega) = \langle X_1(\omega), X_2(\omega), \dots \rangle$ .**

**Let  $S_X = X(\Omega)$  be the image of  $X$ , i.e., the set of sample paths of  $X$ .**

**We denote elements of  $S_X$  as  $y = \langle y_1, y_2, \dots \rangle$ .**

**As  $S_X$  is a subset of  $\chi^\infty$  we endow  $S_X$  with the subspace topology.**

**We require a degree of *logical independence* between the  $X_n$ 's.**

**In particular, we need the sequence  $\{X_n\}_{n=1}^\infty$  to be capable of moving to various places in  $\chi^\infty$  regardless of where it has been so far.**

**We express this as *Condition 1*, below, in terms of the interior of a set.**

- **The *interior* of a set  $B$  is the union of all open subsets of  $B$ .**



**Condition 1:** For each  $j$ , let  $B_j \in \mathfrak{B}$  be a set with nonempty interior  $B_j^o$ .

Require that, for each  $n$ , for each  $x = \langle x_1, \dots, x_n \rangle \in \langle X_1, \dots, X_n \rangle(\Omega)$ ,

and for each  $j$ , there exists a positive integer  $c(n, j, x)$  such that

$$\langle X_1, \dots, X_n, X_{n+c(n,j,x)} \rangle^{-1}(\{x\} \times B_j^o) \neq \emptyset.$$

**Condition 1** asserts that, no matter where the sequence of random variables has been up to time  $n$ , there is a finite time,  $c(n, j, x)$ , after which it is possible that the sequence reaches the set  $B_j^o$ .

For each sample path  $y \in S_X$ , define  $\tau_0(y) = 0$ , and for  $j > 0$ , define

$$\tau_j(y) = \begin{cases} \min \{n > \tau_{j-1}(y) : y_n \in B_j\}, & \text{if the minimum is finite,} \\ \infty & \text{if not.} \end{cases}$$

Let  $B = \{y \in S_X : \tau_j(y) < \infty \text{ for all } j\}$ ,

And let  $A = S_X \setminus B = B^c \cap S_X$ .

- $A$  is the set of sample paths each of which fails to visit at least one of the  $B_j$  sets, in the order specified.

*Aside:* Because we do not require that the sets  $B_j$  are nested, it is possible that the sequence reaches  $B_k$  for all  $k > j$  without ever reaching  $B_j$ .

- **Theorem:**  $A$  is a meager set. (!!)

The following *Corollary* generalizes Oxtoby's (1957) result that the *Strong Law* for *iid* Bernoulli variables provides a *measure 1* set that is *meager*.

As before, let  $X_i = \{0,1\}$ ,  $i = 1, 2, \dots$ , be a sequence of Bernoulli  $\{0, 1\}$  variables.

Let  $\langle X, \mathfrak{B}, P \rangle$  be the *measure space* with  $\mathfrak{B}$  the Borel  $\sigma$ -algebra generated by all finite sequences of flips, and  $P$  is the *iid* “fair coin” measure on sequences.

Topologize the measurable space  $\langle X, \mathfrak{B} \rangle$  using the product of the *discrete* topology

on each  $X_i$ ,  $\mathcal{T}_i(X_i) = \{\emptyset, \{0\}, \{1\}, \{0,1\}\}$  and then  $\mathcal{T}^\omega(X) = \mathcal{T}_1 \times \mathcal{T}_2 \times \dots$ .

Let  $L^{1/2}$  be the set of binary sequences with limiting relative frequency  $1/2$  for each of the two digits: a set belonging to  $\mathfrak{B}$ .

- The *strong-law of large numbers* asserts that  $P(L^{1/2}) = 1$ .
- BUT (Oxtoby, 1957) the set  $L^{1/2}$  is a meager set in the topology  $\mathcal{T}^\omega$

Now, consider the set of sequences:

$OM = \{x: \text{the observed relative frequency of 1 oscillates } \underline{\text{maximally}}\}$

Specifically, for each  $x = \langle x_1, x_2, \dots \rangle \in OM$ ,

$$\liminf. \sum_{j=1}^n x_j/n = 0 \text{ and } \limsup. \sum_{j=1}^n x_j/n = 1.$$

$OM$  is a  $\mathcal{B}$ -measurable set.

The complement to  $OM$ ,  $OM^c = L^{<0,1>}$ , is the measurable set of binary sequences whose observed relative frequencies *fail* to oscillate maximally.

$$L^{<0,1>} = \{x: \liminf. \sum_{j=1}^n x_j/n > 0 \text{ or } \limsup. \sum_{j=1}^n x_j/n < 1\}.$$

- **Corollary:**  $L^{<0,1>}$  is a *meager* set in  $\mathcal{T}^\infty$ . See also Calude and Zamfirescu (1999).

**Challenge:** What stochastic process  $P$  treats  $L^{<0,1>}$  as a  $P$ -null event?

**The conflict between the two senses of *negligible* runs deeper still.**

**Build a hierarchy of events by considering the *sojourn times* for relative frequencies, and then relative frequencies of frequencies, *etc.* .**

**Let the sequence of Bernoulli outcomes  $x = \langle x_1, x_2, \dots \rangle$  count as the sequence of 0<sup>th</sup> *tier* events – the sequence of 0s and 1s.**

- **Define the 1<sup>st</sup> tier event  $F_{[.2,.4]}^1$  as occurring whenever the relative frequency of 1 in the sequence  $x$  falls in the interval  $[.2, .4]$ .**

**Even though OM is a residual set of sequences, the subset of OM for which the relative frequency of  $F_{[.2,.4]}^1$  *fails to oscillate maximally* is a *meager* set.**

**2<sup>nd</sup> tier events are defined by intervals of frequencies of 1<sup>st</sup> tier events.**

**Since the countable union of *meager* sets is *meager*:**

- **The set of sequences that have relative frequencies of events that oscillate maximally at each countable tier is residual!**

**5. Some concluding thoughts on where the two formal perspectives on *negligible* sets do, and do not play well together.**

***Q:* What roles can these two different senses of negligible play together?**

***Tentative Answer:***

**Use a topological sense of “negligible” for sets that are *not* within the domain of the measure – where probability does not apply.**

***Example:***

**Regarding Blackwell-Dubins asymptotic  $\rho$ -consensus among Bayesian agents who share evidence,**

**use topology to investigate the size of the community for which the shared evidence creates asymptotic merging.**

**Or, as convergence is a topological notion,**

**use a different topology than the one induced by sup-norm,  $\rho$ , to define asymptotic merging.**

**But do not let the measure and the topology compete over the same family of sets as to which are *negligible*.**

**That way lies conflict!**

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