

STA 711: Probability & Measure Theory

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2 Construction & Extension of Measures

For any finite set $\Omega = \{\omega_1, \dots, \omega_n\}$, the “power set” $\mathfrak{P}(\Omega)$ is the collection of all subsets of Ω , including the empty-set \emptyset and Ω itself. It has $|\mathfrak{P}| = 2^n$ elements; it can also be identified with the set of all possible *functions* $a : \Omega \rightarrow \{0, 1\}$ by the relation $A = \{\omega : a(\omega) = 1\}$. Set theorists denote the power set by $\mathfrak{P}(\Omega) = \{0, 1\}^\Omega$ or more simply by 2^Ω , even for infinite sets Ω . The function $a := \mathbf{1}_A$ equal to one if $a \in A$ and otherwise zero is the “indicator” function of A .

Recall that a *probability measure* on some σ -algebra \mathcal{F} on a set Ω is a function $P : \mathcal{F} \rightarrow \mathbb{R}$ with the three properties:

$$P_1 : (\forall A \in \mathcal{F}) P(A) \geq 0$$

$$P_2 : P(\Omega) = 1$$

$$P_3 : (\forall A_j \in \mathcal{F}, i \neq j \Rightarrow A_i \cap A_j = \emptyset), \quad P(\cup A_j) = \sum P(A_j)$$

We will want to assign probabilities to as many subsets of Ω as possible (so we can find probabilities of a wide range of events) while actually *specifying* probabilities on as small a class of sets as possible (to minimize how much work we do). For a finite probability space Ω with $n \in \mathbb{N}$ elements, for example, we will see below that we need specify only the n probabilities $\{P[\{\omega\}] : \omega \in \Omega\}$ of the singletons (one-element sets $\{\omega\}$) to determine $P(A)$ uniquely for all 2^n elements $A \in 2^\Omega$. Since $n \ll 2^n$ for big n , this is a bargain.

Let's consider a number of properties that classes of sets $\mathcal{A} \subset 2^\Omega$ might have. A class \mathcal{A} of subsets of Ω is called a:

FIELD	if	$F_1 : \Omega \in \mathcal{A}$
		$F_2 : E \in \mathcal{A} \Rightarrow E^c \in \mathcal{A}$
		$F_3 : E_1, E_2 \in \mathcal{A} \Rightarrow E_1 \cup E_2 \in \mathcal{A}$.
σ-FIELD	if	$\sigma_1 : \Omega \in \mathcal{A}$
		$\sigma_2 : E \in \mathcal{A} \Rightarrow E^c \in \mathcal{A}$
		$\sigma_3 : \{E_i\} \subset \mathcal{A} \Rightarrow \cup E_i \in \mathcal{A}$.
π-SYSTEM	if	$\pi_1 : E_1, E_2 \in \mathcal{A} \Rightarrow E_1 \cap E_2 \in \mathcal{A}$.
λ-SYSTEM	if	$\lambda_1 : \Omega \in \mathcal{A}$
		$\lambda_2 : E \in \mathcal{A} \Rightarrow E^c \in \mathcal{A}$
		$\lambda_3 : \{E_i\} \subset \mathcal{A}, E_i \cap E_j = \emptyset \Rightarrow \cup E_i \in \mathcal{A}$.

Note that if \mathcal{A}_α is a (F, σ F, π S, resp. λ S) for each α in any index set (even an uncountable one), then $\cap_\alpha \mathcal{A}_\alpha$ is also a (F, σ F, π S, resp. λ S) (Exercise: show that this is not true for even finite unions). Since also 2^Ω is a (F, σ F, π S, resp. λ S), it follows that for any collection $\mathcal{A}_0 \subset 2^\Omega$ there exists a *smallest* (F, σ F, π S, resp. λ S) that contains \mathcal{A}_0 : namely, the intersection of all (F, σ F, π S, resp. λ S)s containing \mathcal{A}_0 . We denote the smallest (F, σ F, π S, resp. λ S) containing \mathcal{A}_0 by $\mathcal{F}(\mathcal{A}_0)$, $\sigma(\mathcal{A}_0)$, $\pi(\mathcal{A}_0)$, and $\lambda(\mathcal{A}_0)$, respectively.

For example, if Ω is arbitrary and $\mathcal{A}_0 = \{\{\omega\} : \omega \in \Omega\}$, all singletons, then $\mathcal{F}(\mathcal{A}_0) = \sigma(\mathcal{A}_0) = 2^\Omega$ if Ω is finite. If Ω is infinite, however, then $\mathcal{F}(\mathcal{A}_0)$ is the collection of finite and co-finite sets; $\sigma(\mathcal{A}_0)$ and $\lambda(\mathcal{A}_0)$ are both the collection of countable and co-countable sets; and $\pi(\mathcal{A}_0)$ is just $\{\mathcal{A}_0 \cup \{\emptyset\}\}$.

For probability and measure theory we would like for probabilities $P(A)$ to be defined on all the sets $A \subset \Omega$ that we encounter. For finite or countable Ω we can usually define $P(A)$ sensibly for *all* subsets A , but for uncountable Ω this typically isn't possible (see free on-line Appendices B or C of Frank Burk's text *Lebesgue Measure and Integration: An Introduction* for a nice account). If we can't define $P(A)$ on all of 2^Ω , we still need probabilities to be defined for all sets in a sigma field \mathcal{F} , so we can compute probabilities for countable unions and intersections. We'd like the luxury of having to *specify* measures on a much smaller collection, like a field \mathcal{F}_0 or a collection of sets \mathcal{C} that generates a field $\mathcal{F}_0 := \mathcal{F}(\mathcal{C})$. That's our goal for the next week or so.

To do this we need to know that we can always *extend* a probability assignment μ_0 defined on a field \mathcal{F}_0 to *exactly one* measure μ on the sigma field $\mathcal{F} = \sigma(\mathcal{F}_0)$ — *i.e.*, that (a) there exists *at least one* such extension, and that (b) any two must agree on all of \mathcal{F} .

It turns out to be easier to show that μ_0 extends uniquely to the λ -system $\lambda(\mathcal{A}_0)$ than it is to show unique extension to the sigma field $\sigma(\mathcal{A}_0)$; luckily, when \mathcal{A}_0 is a *field* (or even just a π -system), these are the same. This will follow from:

2.1 Dynkin's Theorem

Theorem 1 (Dynkin's π - λ) *Let \mathcal{P} be a π -system; then $\lambda(\mathcal{P}) = \sigma(\mathcal{P})$.*

Proof. The proof is in two parts. First we show that $\lambda(\mathcal{P})$ is not only a λ -system, it's also a π -system; then, we show that any collection $\mathcal{L} \subset 2^\Omega$ that is both a λ -system and a π -system is also a σ -algebra. Thus $\sigma(\mathcal{P}) \subseteq \lambda(\mathcal{P}) \subseteq \sigma(\mathcal{P})$, proving the theorem.

I. $\mathcal{L} := \lambda(\mathcal{P})$ is a π -system

We must show that \mathcal{L} is closed under intersections, *i.e.*, that $A \cap B \in \mathcal{L}$ whenever $A, B \in \mathcal{L}$. First we do this for $A \in \mathcal{P}, B \in \mathcal{L}$. Fix any $A \in \mathcal{P}$ and set

$$\mathcal{A} := \{B \in \mathcal{L} : A \cap B \in \mathcal{L}\}.$$

As a step on the way, let's show that: **\mathcal{A} is a λ -system containing \mathcal{P} .**

There are three things to show for all $B, \{B_i\} \subset \mathcal{A}$:

$$\begin{aligned} \lambda_1 : \quad \Omega \in \mathcal{A} : \quad & A \cap \Omega = A \in \mathcal{P} \subset \mathcal{L}. \\ \lambda_2 : \quad B \in \mathcal{A} \Rightarrow B^c \in \mathcal{A} : \quad & A \cap B^c = A \cap (A \cap B)^c = [A^c \cup (A \cap B)]^c \in \mathcal{L} \text{ by } \lambda_2, \lambda_3. \\ \lambda_3 : \quad B_i \cap B_j = \emptyset \Rightarrow \cup B_i \in \mathcal{A} : \quad & A \cap (\cup B_i) = \cup (A \cap B_i) \in \mathcal{A} \text{ by } \lambda_3. \end{aligned}$$

Also $\mathcal{P} \subset \mathcal{A}$ by π_1 , so \mathcal{A} is a λ -system containing \mathcal{P} and hence containing $\mathcal{L} = \lambda(\mathcal{P})$.

We have just shown that $A \cap B \in \mathcal{L}$ for every $A \in \mathcal{P}$ and $B \in \mathcal{L}$. So, for every $B \in \mathcal{L}$, the class

$$\mathcal{B} = \{A \in \mathcal{L} : A \cap B \in \mathcal{L}\}$$

contains each $A \in \mathcal{P}$. Also $\Omega \in \mathcal{B}$ (by λ_1) and \mathcal{B} is closed under complements (as before: $A^c \cap B = (A \cap B)^c \cap B = [(A \cap B) \cup B^c]^c \in \mathcal{L}$) and disjoint unions ($(A \cup A') \cap B = (A \cap B) \cup (A' \cap B)$), so \mathcal{B} is a λ -system containing \mathcal{P} and hence containing $\mathcal{L} := \lambda(\mathcal{P})$.

This completes the proof that $A \cap B \in \mathcal{L}$ for every $A, B \in \mathcal{L}$, *i.e.*, that \mathcal{L} is a π -system.

II. If \mathcal{L} is a π -system *and* a λ -system, then \mathcal{L} is a σ -algebra.

Since any λ -system satisfies conditions $\sigma_1 = \lambda_1$ and $\sigma_2 = \lambda_2$, it remains only to show σ_3 . Let $\{A_i\} \subset \mathcal{L}$, and for $n \in \mathbb{N}$ let B_n be “what’s new in A_n ,” *i.e.*, define

$$B_n := A_n \cap \left(\bigcup_{i < n} A_i \right)^c = A_n \cap \left(\bigcup_{i < n} B_i \right)^c = A_n \cap \bigcap_{i < n} B_i^c. \quad (1)$$

The $\{B_n\}$ are disjoint (since each B_n is in B_i^c for each $i < n$) and, since $\bigcup_{i \leq n} A_i = \bigcup_{i \leq n} B_i$ for every $n \in \mathbb{N}$, the $\{B_n\}$ have the same union as $\{A_n\}$. Thus

$$\bigcup_i A_i = \bigcup_n B_n \in \mathcal{L}$$

by λ_3 , and \mathcal{L} is a σ -algebra. This completes the proof of Dynkin’s π - λ theorem. \square

How can this help us to extend uniquely a probability assignment or “pre-measure” (defined in Section (2.3)) μ_0 from a π -system \mathcal{P} (for example, a field) to the σ -field $\mathcal{F} = \sigma(\mathcal{P})$ it generates? First, note that λ -systems are just perfect for uniqueness:

Proposition 1 *Let P and Q be two probability measures on a space (Ω, \mathcal{F}) . The class*

$$\mathcal{L} = \{A \in \mathcal{F} : P(A) = Q(A)\}$$

is a λ -system.

Can you prove that? By Dynkin’s π - λ theorem, there is at most one extension of a “pre-measure” P_0 from any π -system \mathcal{P} to the σ -algebra $\sigma(\mathcal{P}) = \lambda(\mathcal{P})$ it generates, because if P and Q were two different ones, the collection of events on which they agree would be a λ -system containing \mathcal{P} and hence containing $\lambda(\mathcal{P}) = \sigma(\mathcal{P})$. Let’s look at examples:

1. $\mathcal{P} := \{\{a\}\}$ on $\Omega = \{a, b, c\}$. To illustrate that uniqueness of extensions to all of 2^Ω can fail, consider a probability assignment μ on the π -system \mathcal{P} that assigns probability $\mu(\{a\}) = 1/2$. For any number $0 \leq p \leq \frac{1}{2}$ there exists a distinct extension μ_p of μ to the σ -algebra $\mathcal{F} = 2^\Omega$ that assigns probabilities $\mu_p(\{b\}) = p$, $\mu_p(\{c\}) = (\frac{1}{2} - p)$. For $p \neq q$, the collection of events L for which $\mu_p(L) = \mu_q(L)$ is $\mathcal{L} = \{\emptyset, \{a\}, \{b, c\}, \Omega\}$, a λ -system (and σ -algebra) strictly smaller than \mathcal{F} .

2. $\mathcal{P} := \{ \{\omega\} : \omega \in \Omega \} \cup \{\emptyset\}$: Given any finite or countable set $\Omega = \{\omega_i\}$ and positive numbers $\{p_i \geq 0\}$ with unit sum $\sum_i p_i = 1$, define μ_0 on \mathcal{P} by setting $\mu_0(\{\omega_i\}) = p_i$ and $\mu_0(\emptyset) = 0$. Then by countable additivity the only possible probability measure on 2^Ω that extends μ_0 is $\mu(A) := \sum [p_i : \omega_i \in A]$. Every probability measure on 2^Ω for any finite or countable set Ω is of this form.
3. $\mathcal{P} := \{ (-\infty, b], b \in \mathbb{R} \}$ on $\Omega = (-\infty, \infty)$. The *field* generated by \mathcal{P} consists of finite disjoint unions of left-open intervals $(a, b]$, including semi-infinite intervals of the form $(-\infty, b]$ and (a, ∞) , and $\Omega = (-\infty, \infty)$. The sigma field $\sigma(\mathcal{A})$ is *not* just countable unions of such sets; it is the “Borel” σ -algebra $\mathcal{B}(\mathbb{R})$ generated by the open sets in the real line and includes all open and closed sets, the Cantor set, and many others. It can be constructed explicitly by transfinite induction (!), see Section (4), and hence includes only $c := \#(\mathbb{R})$ elements (while the power set $2^\mathbb{R}$ contains $2^c > c$), but it is not easily described. It is *not* every possible subset of \mathbb{R} , but it includes every set of real numbers we’ll need in this course.

A “Distribution Function” (or “DF”) is a right-continuous non-decreasing function on \mathbb{R} with limits $\lim_{x \rightarrow -\infty} F(x) = 0$ and $\lim_{x \rightarrow +\infty} F(x) = 1$ at $\pm\infty$. For any DF $F(x)$, we can define a pre-pm μ_0 on \mathcal{P} by setting $\mu_0((-\infty, b]) := F(b)$. If $F = F_d$ is purely discontinuous this just assigns probability $p_i = F(x_i) - F(x_i^-)$ to each x_i where $F(x)$ jumps; if $F(x) = F_{ac} = \int_{-\infty}^x f(t) dt$ is absolutely continuous this just assigns probability $\mu(A) = \int_A f(t) dt$ to A (and in fact this is the usual *definition* of that integral!)

2.2 Extension 1: π -System to Field

Call \mathcal{S} a “semi-algebra” if it is a π -system with the property that whenever $A \in \mathcal{S}$ also its complement $A^c = \cup B_j$ can be written as a finite disjoint union of elements $B_j \in \mathcal{S}$. In this section we show that any finitely-additive pre-measure defined on a semi-algebra \mathcal{S} can be extended uniquely to the field $\mathcal{F}(\mathcal{S})$ it generates.

Let μ_0 be a pre-pm defined on a π -system \mathcal{S} , and let $\mathcal{F}_0 := \mathcal{F}(\mathcal{S})$ be the field generated by \mathcal{S} . For example, if we have an assignment of μ_0 to all sets in

$$\mathcal{S} = \{(0, b] : 0 \leq b \leq 1\}$$

in the unit interval $\Omega = (0, 1]$, say, $\mu_0((0, b]) := F(b)$ for some increasing function $F : \Omega \rightarrow \mathbb{R}_+$. Then by additivity we must have

$$\mu_0((a, b]) = \mu_0((0, b]) - \mu_0((0, a]) = F(b) - F(a)$$

for $0 \leq a \leq b \leq 1$, and, for the disjoint union of such intervals,

$$\mu_0\left(\bigcup_{j=1}^J (a_j, b_j]\right) = \sum_{j=1}^J [F(b_j) - F(a_j)]$$

for $0 \leq a_1 \leq b_1 \leq a_2 \leq \cdots \leq b_J \leq 1$. But the field $\mathcal{F}_0 := \mathcal{F}(\mathcal{S})$ consists precisely of sets of that form, finite disjoint unions of left-open intervals, so μ_0 has a unique extension to \mathcal{F}_0 . Similarly, any pre-pm μ_0 defined only on rectangles $(0, b] \times (0, d]$ in the unit square with the origin as the south-west corner (given perhaps by a function $F(b, d) = \mu_0((0, b] \times (0, d])$ on $\Omega := (0, 1]^2$) has a unique extension to the disjoint union of all rectangles $(a, b] \times (c, d] \in \Omega$; can you find an explicit expression for $\mu_0((a, b] \times (c, d])$? Hint: First find $\mu_0((a, b] \times (0, d])$.

In a week-2 homework exercise you will show that for *any* collection of sets $\mathcal{C} \subset 2^\Omega$ the field $\mathcal{F}_0 := \mathcal{F}(\mathcal{C})$ consists precisely of sets of the form

$$\mathcal{F}_0 = \left\{ B : B = \bigcup_{i=1}^m B_i, \quad B_i = \bigcap_{j=1}^{n_i} A_{ij} \text{ for some } m \in \mathbb{N}, \{n_i\} \subset \mathbb{N} \right\}$$

with each $A_{ij} \in \mathcal{C}$ or $A_{ij}^c \in \mathcal{C}$, and with the m sets $\{B_i\}$ disjoint. By induction on the number of A_{ij} with $A_{ij}^c \in \mathcal{C}$ and finite additivity, you can show that μ_0 is well defined on each B_i ; by finite additivity again, it is a well-defined pre-pm on all of \mathcal{F}_0 . In more detail:

If \mathcal{C} is a π -system \mathcal{S} , then each set B_i above can be written in the form

$$B_i = \bigcap_{1 \leq j \leq n_i} A_{ij} \tag{2}$$

with $A_{i1} \in \mathcal{S}$ and $A_{ij}^c \in \mathcal{S}$ for each $j > 1$. Obviously $\mu_0(B_i)$ is well-defined if $n_i = 1$, since then $B_i = A_{i1} \in \mathcal{S}$. Suppose by induction that μ_0 has a unique extension to each set of this form for each $n_i < n$ for $n > 1$, and let $B_i = \bigcap_{1 \leq j \leq n} A_{ij}$. Then

$$\begin{aligned} \mu_0(B_i) &= \mu_0 \left\{ A_{i1} \cap A_{in} \cap \bigcap_{1 < j < n} A_{ij} \right\} \\ &= \mu_0 \left\{ A_{i1} \cap \Omega \cap \bigcap_{1 < j < n} A_{ij} \right\} - \mu_0 \left\{ A_{i1} \cap A_{in}^c \cap \bigcap_{1 < j < n} A_{ij} \right\} \\ &= \mu_0 \left\{ A_{i1} \cap \bigcap_{1 < j < n} A_{ij} \right\} - \mu_0 \left\{ (A_{i1} \cap A_{in}^c) \cap \bigcap_{1 < j < n} A_{ij} \right\}, \end{aligned}$$

with each term well-defined by induction, so μ_0 extends uniquely to \mathcal{F}_0 . To go further we must insist that $\mu_0(B_i) \geq 0$ for each B_i of form (2), and hence $\mu_0(B) \geq 0$ for all $B \in \mathcal{F}_0$.

2.3 Extension 2: Field to σ -Algebra

Let μ_0 be a pre-pm defined on a field \mathcal{F}_0 , *i.e.*, a function $\mu_0 : \mathcal{F}_0 \rightarrow \mathbb{R}$ that satisfies the conditions:

1. $A \in \mathcal{F}_0 \Rightarrow \mu_0(A) \geq 0$;
2. $\mu_0(\Omega) = 1$;
3. $\{A_i\} \subset \mathcal{F}_0$ and $A_i \cap A_j = \emptyset$ and $\cup A_i \in \mathcal{F}_0 \Rightarrow \mu_0(\cup A_i) = \sum \mu_0(A_i)$.

Define two new set functions μ^* and μ_* on *all* subsets of Ω , *i.e.*, on 2^Ω , by:¹

$$\begin{aligned}\mu^*(E) &:= \inf \left[\sum_{i \in \mathbb{N}} \mu_0(F_i) : E \subset \bigcup_{i \in \mathbb{N}} F_i, F_i \in \mathcal{F}_0 \right] \\ \mu_*(E) &:= 1 - \mu^*(E^c) \\ &= \sup \left[1 - \sum_{j \in \mathbb{N}} \mu_0(G_j) : E^c \subset \bigcup_{j \in \mathbb{N}} G_j, G_j \in \mathcal{F}_0 \right]\end{aligned}$$

On reflection it's clear that $\mu_*(E) \leq \mu^*(E)$ (or, equivalently, that $\mu^*(E) + \mu^*(E^c) \geq 1$) for each set $E \in 2^\Omega$, since $\Omega \subset \bigcup_{i \in \mathbb{N}} F_i \cup \bigcup_{j \in \mathbb{N}} G_j$, and $\mu_*(E) = \mu_0(E) = \mu^*(E)$ for each set $E \in \mathcal{F}_0$. Thus there is an obvious well-defined extension of μ_0 to a set function μ defined on the μ -completion of $\mathcal{F} := \sigma(\mathcal{F}_0)$,

$$\begin{aligned}\overline{\mathcal{F}}^\mu &= \{E \in 2^\Omega : \mu_*(E) = \mu^*(E)\} \\ &= \{E \in 2^\Omega : \mu^*(E) + \mu^*(E^c) = 1\}.\end{aligned}$$

It remains to show three things:

1. The extension μ is nonnegative on $\overline{\mathcal{F}}^\mu$, with $\mu(\Omega) = 1$, and is countably additive. Showing that $\mu(\cup E_n) \leq \sum \mu(E_n)$ for disjoint $\{E_n\}$ is a simple $\epsilon/2^n$ argument, but it's harder to show that $\mu(\cup E_n) \geq \sum \mu(E_n)$. It's spelled out in Section (3) on page 12 of these notes, or in Resnick (1999) §2.4 or Billingsley (1995), pp. 38–41.
2. $\overline{\mathcal{F}}^\mu$ is a σ F that contains \mathcal{F}_0 , and hence also contains $\mathcal{F} := \sigma(\mathcal{F}_0) = \lambda(\mathcal{F}_0)$.
3. The extension to \mathcal{F} is unique (show that for any two extensions μ_1 and μ_2 , $\{E \in \mathcal{F} : \mu_1(E) = \mu_2(E)\}$ is a λ -system containing the π -system \mathcal{F}_0 , and apply Dynkin's π - λ).

Warning: the appealing idea of defining $\mu_*(E)$ by approximating E from inside *doesn't work*— consider the inner Borel measure of the irrationals in $(0, 1]$ with $\mathcal{F}_0 = \{\cup_i (a_i, b_i]\}$. What's the μ -completion for a discrete measure μ on \mathbb{R} ?

¹Why do we need infinitely-many F_i s? Why not just $\inf [\mu_0(F) : E \subset F]$? See “Examples” below.

2.4 Completions

It is possible that the σ -algebra \mathcal{F} generated by \mathcal{F}_0 will not be “complete”, in the sense that there may exist null sets N (*i.e.*, events $N \in \mathcal{F}$ with $\mu(N) = 0$) that have *subsets* $E \subset N$ that are not events, *i.e.*, $E \notin \mathcal{F}$. The “ μ -completion” $\overline{\mathcal{F}}^\mu$ of \mathcal{F} is the smallest μ -complete σ -algebra containing \mathcal{F} , and is the largest σ -algebra to which μ may be extended unambiguously. Four characterizations of the μ -completion $\overline{\mathcal{F}}^\mu$ of a σ -field \mathcal{F} for a probability (or σ -finite) measure μ on \mathcal{F} are sometimes useful (you can prove their equivalence):

$$\begin{aligned} \overline{\mathcal{F}}^\mu &:= \{E \in 2^\Omega : \mu_*(E) = \mu^*(E)\} \\ &= \{A \cup B : A \in \mathcal{F}, B \subset N \in \mathcal{F}, \mu(N) = 0\} \\ &= \{E \in 2^\Omega : \exists A, B \in \mathcal{F}, \text{ s.t. } A \subset E \subset B, \mu(B \setminus A) = 0\} \\ &= \{E \in 2^\Omega : \exists A, N \in \mathcal{F}, \text{ s.t. } A \Delta E \subset N, \mu(N) = 0\}. \end{aligned}$$

The σ -algebra \mathcal{F} will be our main focus, and not its completion $\overline{\mathcal{F}}^\mu$. One reason is that $\overline{\mathcal{F}}^\mu$ depends on μ while \mathcal{F} is intrinsic. For example, the ν -completion of the Borel sets \mathcal{B} on the unit interval $\Omega = (0, 1]$ for any discrete probability measure ν is $\overline{\mathcal{B}}^\nu = 2^\Omega$. The completion of the Borel sets on Ω for Lebesgue measure μ is the “Lebesgue sets” $\overline{\mathcal{B}}^\mu$, which (under the axiom of choice) satisfy the strict inclusions $\mathcal{B} \subsetneq \overline{\mathcal{B}}^\mu \subsetneq 2^\Omega$.

2.5 Examples

2.5.1 Countable Probability Spaces

Suppose Ω has only finitely-many or countably-many elements, and let $\mathcal{F} := 2^\Omega$ be the power set. Any probability measure \mathbb{P} on (Ω, \mathcal{F}) is completely determined by the numbers $\{p_\omega := \mathbb{P}(\{\omega\})\}$, the probabilities of singletons, since property P_3 of Section (2) then gives

$$\mathbb{P}[A] = \sum_{\omega \in A} p_\omega \quad (3)$$

for every (countable!) set $A \subset \Omega$. Conversely, for any finite or countable set $\{p_\omega\} \in \mathbb{R}_+$ that satisfies $\sum_{\omega \in \Omega} p_\omega = 1$, (3) determines a probability assignment satisfying properties P_1, P_2, P_3 .

2.5.2 Borel Measures on \mathbb{R}

Let \mathcal{F}_0 be the π -system of semi-infinite intervals $(-\infty, b]$ for $b \in \mathbb{R}$. Any probability measure \mathbb{P} on the Borel sets \mathcal{F} of the real line \mathbb{R} is completely determined by its *distribution function* (DF) $F : \mathbb{R} \rightarrow [0, 1]$ given by

$$F(x) := \mathbb{P}((-\infty, x]) \quad (4)$$

since (by P_3) this determines $\mathbb{P}((a, b]) = F(b) - F(a)$ on left-open intervals $(a, b]$ and so (again by P_3) on \mathcal{F}_0 . Since this π -system generates the Borel sets, the DF (4) determines \mathbb{P} on all of \mathcal{F} . Conversely, for any function $F : \mathbb{R} \rightarrow [0, 1]$ satisfying the three rules

$$\begin{aligned} \text{DF}_1 : \quad & x < y \Rightarrow F(x) \leq F(y) && \text{(non-decreasing)} \\ \text{DF}_2 : \quad & F(x) = \lim_{y \searrow x} F(y) && \text{(right continuity)} \\ \text{DF}_3 : \quad & \lim_{x \rightarrow -\infty} F(x) = 0, \quad \lim_{x \rightarrow +\infty} F(x) = 1 && \text{(0, 1 limits at } \mp\infty) \end{aligned}$$

there is a unique Borel measure \mathbb{P} on \mathbb{R}, \mathcal{F} satisfying (4).

If $F(x) = \int_{-\infty}^x f(t) dt$ for some nonnegative Borel-measurable function with integral $1 = \int_{\mathbb{R}} f(t) dt$, we call the DF F *absolutely continuous* (with respect to Lebesgue measure) and notice that the relation

$$\mathbb{P}[(a, b]] = F(b) - F(a) = \int_a^b f(t) dt = \int_{(a, b]} f(t) dt$$

extends from intervals $(a, b]$ to their finite unions and, using limiting arguments we'll study in Week 6, to *all* Borel sets A :

$$\mathbb{P}[A] = \int_A f(t) dt.$$

Explicit Example 1: Ex(1)

The function

$$F(x) := \begin{cases} 0 & x < 0 \\ 1 - e^{-x} & x \geq 0 \end{cases}$$

is a continuous DF (sketch a plot of it!), and so induces a unique probability measure on the Borel sets of \mathbb{R} that satisfies

$$\mu((a, b]) = e^{-a} - e^{-b} \quad \text{for } 0 \leq a \leq b < \infty$$

or, more generally,

$$\mu(A) = \int_0^{\infty} \mathbf{1}_A(x) e^{-x} dx.$$

As we'll see next week, this is the unit-rate Exponential Distribution Ex(1).

Explicit Example 2: Bi(1, p)

For any $p \in [0, 1]$, the function

$$F(x) := \begin{cases} 0 & x < 0 \\ 1 - p & 0 \leq x < 1 \\ 1 & 1 \leq x \end{cases}$$

is a discrete DF, constant-valued except for jumps of size $(1 - p)$ at $x = 0$ and p at $x = 1$, where it is right-continuous (sketch a plot of it!). It induces a unique probability measure on the Borel sets of \mathbb{R} given by

$$\mu(A) = \begin{cases} 0 & \text{if } 0 \notin A \text{ and } 1 \notin A \\ 1 - p & \text{if } 0 \in A \text{ and } 1 \notin A \\ p & \text{if } 0 \notin A \text{ and } 1 \in A \\ 1 & \text{if } 0 \in A \text{ and } 1 \in A \end{cases}$$

As we'll see next week, this is the Bernoulli distribution $\text{Bi}(1, p)$.

2.5.3 Uniform Distribution on $(0, 1]^n$

Earlier (Example 3 on page 4) we constructed a measure μ on the σ -algebra $\mathcal{F} = \sigma(\mathcal{F}_0)$ generated by a field \mathcal{F}_0 of subsets of the real line $\Omega = \mathbb{R}$ based on a DF $F(x)$. The same approach works more generally, starting with a set assignment μ_0 on any field \mathcal{F}_0 or, slightly more generally, on any π -system. Any set function $\mu_0 : \mathcal{A} \rightarrow \mathbb{R}$ satisfying (1) $(\forall A \in \mathcal{A}) \mu_0(A) \geq 0$, (2) $\mu_0(\Omega) = 1$, and (3) $\mu_0(\cup A_j) = \sum \mu_0(A_j)$ if $A_j \in \mathcal{A}$, $A_i \cap A_j = \emptyset$, and $\cup A_j \in \mathcal{A}$, has a unique extension to a signed measure $\mu(\cdot)$ on $\sigma(\mathcal{A})$, which will be a probability measure if $\mu(A) \geq 0$ for each $A \in \mathcal{F}(\mathcal{A})$.

In particular this lets us construct Lebesgue measure $\lambda(\cdot)$ on the unit cube in \mathbb{R}^n by extending the pre-pm

$$\lambda_0(A) = \prod_{j=1}^n a_j, \quad A \in \mathcal{P}^n := \left\{ (0, a_1] \times (0, a_2] \times \cdots \times (0, a_n] : (\forall j \leq n) 0 \leq a_j \leq 1 \right\}$$

from the π -system \mathcal{P}^n uniquely to a probability measure $\lambda(\cdot)$ on the Borel σ -algebra $\mathcal{B}^n = \lambda(\mathcal{P}^n)$, so we can explore some of its properties.

Lebesgue Measure of the Dyadic Rationals: $\lambda(\mathbb{Q}_2) = ?$

Consider the unit interval $\Omega = (0, 1]$ and the π -system \mathcal{P} consisting of intervals $(0, q]$ for dyadic rational numbers $q \in \mathbb{Q}_2 := \{i/2^n : i, n \in \mathbb{N}_0 := \{0, 1, 2, \dots\}, i \leq 2^n\}$. The field $\mathcal{F} := \mathcal{F}(\mathcal{P})$ generated by \mathcal{P} consists of all finite disjoint unions $\cup(a_i, b_i]$ of half-open intervals with dyadic rational end-points $0 \leq a_i \leq b_i \leq 1$. One can show (Resnick does so in §2.5.1) that the set function $\mu_0((0, q]) := q$ on \mathcal{P} extends to a countably additive set function μ on \mathcal{F} . What is the outer measure $\mu^*(\mathbb{Q}_2)$? Note here that Ω contains all real numbers, not just the rationals. Any *finite* cover $\cup_{i \leq n} F_i$ of \mathbb{Q}_2 with elements of \mathcal{F} would also cover $\Omega = (0, 1]$ and so would have $\sum \mu(F_i) \geq 1$; does it follow that $\mu^*(\mathbb{Q}_2) \geq 1$????

Well, no. Since \mathbb{Q}_2 is countable, we can enumerate it as $\{q_n : n \in \mathbb{N}\}$ and for any dyadic rational $\epsilon > 0$ we can cover \mathbb{Q}_2 with the countably infinite union $\cup F_n$ where $F_n = (a_n, b_n]$ with $b_n = q_n$ and $a_n = \max(0, q_n - \epsilon/2^n)$, with total length

$$\sum \mu(F_n) = \sum_n [q_n - \max(0, q_n - \epsilon/2^n)] = \sum_n \min(q_n, \epsilon/2^n) \leq \sum_n \epsilon/2^n = \epsilon.$$

Since $\mu(\mathbb{Q}_2) \leq \epsilon$ for every $\epsilon > 0$, necessarily $\mu(\mathbb{Q}_2) = 0$. This example illustrates why we need infinite covers in the definition of μ^* .

Uniform Distribution on \mathbb{N} ?

Is it possible to construct a “uniform distribution on \mathbb{N} ”, that assigns to each set $A \subset \mathbb{N}$ its asymptotic frequency

$$P(A) := \lim_{n \rightarrow \infty} \frac{\#[A \cap \{1, \dots, n\}]}{n},$$

if that limit exists? Obviously the asymptotic frequency does exist for many sets—evens and odds, divisible-by- n for any n , primes, squares, *etc.*, and P is finitely-additive for disjoint sets which each have an asymptotic frequency. If the collection of sets whose asymptotic frequency exists is at least a field, then that might be a suitable model for a uniform distribution on \mathbb{N} . Let’s show that won’t work.

Let $\Omega = \mathbb{N}$ be the natural numbers $\{1, 2, 3, \dots\}$, E and E^c the even and odd integers respectively, and set

$$\begin{aligned} F &:= \cup_{k=0}^{\infty} \{2^{2k}, \dots, 2^{2k+1} - 1\} \\ &= \{1, 4, \dots, 7, 16, \dots, 31, 64, \dots, 127, 256, \dots, 511, \dots\}. \end{aligned}$$

Notice that:

1. For $n = 2^{2k} - 1$, the ratio $P_n(F) := \#[F \cap \{1, \dots, n\}]/n$ is exactly $P_n(F) = 1/3$, while for $n = 2^{2k+1} - 1$ it is $P_n(F) = 2/3$. Thus $P_n(F)$ cannot possibly converge as $n \rightarrow \infty$.
2. The even portion $A := F \cap E$ of F and odd portion $B := F^c \cap E^c$ of F^c both have relative frequencies ranging from $1/6$ to $1/3$, which also cannot converge. In fact, $A = F \cap E$ is exactly the same as the set $2 \times (F^c)$, while $B = F^c \cap E^c$ is exactly the same as the set $2 \times F + 1$.
3. $C := (A \cup B)$ however DOES have an asymptotic frequency— in fact, $|P_n(C) - \frac{1}{2}| \leq \frac{1}{n}$ for all $n \in \mathbb{N}$, so $P_n(C) \rightarrow 1/2$ as $n \rightarrow \infty$.
4. Thus E and C both have well-defined asymptotic frequencies (each is $1/2$), but $A = E \cap C$ does not.

Thus, the collection of sets S for which $\lim_{n \rightarrow \infty} P_n(S)$ converges is not even a *field*, let alone a σ -field, and there does not exist a uniform probability distribution on the integers.

Extensions

So far we have focussed on constructing *probability* measures P on some space (Ω, \mathcal{F}) that satisfy the three rules

1. $P(A) \geq 0$ for each $A \in \mathcal{F}$;
2. $P(\Omega) = 1$;
3. For disjoint $\{A_i \in \mathcal{F}\}$, $P(\cup_i A_i) = \sum_i P(A_i)$.

The same approach would let us construct similar but more general objects, including **finite positive measures** μ on a set Ω and σ -algebra \mathcal{F} , by replacing condition 2 with “ $\mu(\Omega) < \infty$ ”, and **σ -finite positive measures**, with condition 2 replaced by “ $\Omega = \cup_i A_i$ with each $A_i \in \mathcal{F}$ and $\mu(A_i) < \infty$.” In particular, we can construct Lebesgue measure $\lambda(dx)$ on all of \mathbb{R}^n .

The m -completion $\overline{\mathcal{F}}^m$ of the Borel σ -algebra \mathcal{F} is called the “Lebesgue σ -algebra” on \mathbb{R}^n ; it contains \mathcal{F} and has the property of *completeness*, *i.e.*, that $N \in \overline{\mathcal{F}}^m$ and $\lambda(N) = 0$ imply that $E \in \overline{\mathcal{F}}^m$ and $\lambda(E) = 0$ for every $E \subseteq N$. The question of whether or not $\overline{\mathcal{F}}^m$ coincides with 2^Ω is delicate (it depends on the Axiom of Choice) and won’t concern us in this course, but you can find more with google (for example, your search should discover Appendices B or C of Frank Burk’s text *Lebesgue Measure and Integration: An Introduction*). You can also ask me outside of class if you’re interested.

3 Countable Additivity of Outer Measure μ^* on $\overline{\mathcal{F}}^\mu$

Let μ_0 be countably additive on a field \mathcal{F}_0 on a space Ω and, for *all* subsets $E \subseteq \Omega$, define the *outer measure* μ^* and *inner measure* μ_* by

$$\mu^*(E) := \inf \left[\sum_{i=0}^{\infty} \mu_0(F_i) : E \subset \bigcup_{i=0}^{\infty} F_i, \{F_i\} \subset \mathcal{F}_0 \right] \quad \mu_*(E) := 1 - \mu^*(E^c)$$

and the μ -completion of \mathcal{F}_0 ,

$$\overline{\mathcal{F}}^\mu = \{E \in 2^\Omega : \mu_*(E) = \mu^*(E)\} = \{E \in 2^\Omega : \mu^*(E) + \mu^*(E^c) = 1\}$$

on which we define $\mu(E) := \mu^*(E) = \mu_*(E)$. Evidently μ “extends” μ_0 in the sense that $\mathcal{F}_0 \subset \overline{\mathcal{F}}^\mu$ and, for any $A \in \mathcal{F}_0$, we have $\mu_0(A) = \mu(A)$. It is also clear that μ is (1) nonnegative on $\overline{\mathcal{F}}^\mu$ and (2) satisfies $\mu(\Omega) = 1$; here we verify that (3) μ is countably additive on $\overline{\mathcal{F}}^\mu$.

Let $\{E_n\} \subset \overline{\mathcal{F}}^\mu$ be disjoint, and set $E := \cup_n E_n$. We will show that $\mu(E) = \sum \mu(E_n)$ in two steps. First, the easy direction:

1. $\mu^*(E) \leq \sum \mu(E_n)$

Fix $\epsilon > 0$ and, for each n , find $\{F_{ni}\} \subset \mathcal{F}_0$ with $E_n \subset \cup_i F_{ni}$ and

$$\mu^*(E_n) \leq \sum_i \mu_0(F_{ni}) < \mu^*(E_n) + 2^{-n}\epsilon \tag{5}$$

Then $E := \cup_n E_n \subset \cup_{n,i} F_{ni}$ and

$$\mu^*(E) \leq \sum_{n,i} \mu_0(F_{ni}) < \sum_n \mu^*(E_n) + \epsilon$$

verifying $\mu^*(E) \leq \sum_n \mu(E_n)$.

$$2. \mu^*(E) \geq \sum \mu(E_n)$$

Still $\{E_n\} \subset \overline{\mathcal{F}}^\mu$ are disjoint, and $E := \cup_n E_n$. Fix $\epsilon > 0$ and $N \in \mathbb{N}$ (suggestion: work through the case $N = 2$ first, and draw pictures). For each $n \leq N$ find $\{F_{nj}\} \subset \mathcal{F}_0$ with $E_n^c \subset \cup_j F_{nj}$ and

$$\mu^*(E_n^c) \leq \sum_j \mu_0(F_{nj}) < \mu^*(E_n^c) + \epsilon/N \quad (6)$$

and, similarly, find $\{G_j\} \subset \mathcal{F}_0$ with $E \subset \cup_j G_j$ and

$$\mu^*(E) \leq \sum_j \mu_0(G_j) < \mu^*(E) + \epsilon. \quad (7)$$

For each fixed n , $\cup_j F_{nj}$ covers every point outside E_n at least once, so $\cup_{n,j} F_{nj}$ covers every point outside $\cup_{n=1}^N E_n$ at least N times, and every point in Ω at least $(N - 1)$ times. Since $\cup_j G_j$ covers every point inside $\cup_{n=1}^N E_n \subset E$ once, the union $(\cup_{n,j} F_{nj}) \cup (\cup_j G_j)$ covers every point in Ω at least N times and, since $\mu^*(\Omega) = 1$, we have

$$\begin{aligned} N &\leq \sum_{n=1}^N \sum_j \mu_0(F_{nj}) + \sum_j \mu_0(G_j) \\ &\leq \sum_{n=1}^N \mu^*(E_n^c) + \epsilon + \mu^*(E) + \epsilon \\ &= N - \sum_{n=1}^N \mu_*(E_n) + \mu^*(E) + 2\epsilon \\ &= N - \sum_{n=1}^N \mu^*(E_n) + \mu^*(E) + 2\epsilon \end{aligned}$$

so

$$\mu^*(E) \geq \sum_{n=1}^N \mu^*(E_n) - 2\epsilon$$

for every $N \in \mathbb{N}$ and every $\epsilon > 0$, hence, since $E_n \in \overline{\mathcal{F}}^\mu$,

$$\mu^*(E) \geq \sum_{n=1}^{\infty} \mu(E_n).$$

Thus $\mu^*(E) = \sum_{n=1}^{\infty} \mu(E_n)$, completing the proof that μ is countably additive on $\overline{\mathcal{F}}^\mu$.

4 Explicit Construction of Sigma Fields [optional]

Ordinals and Transfinite Induction

Every finite set S (say, with $n < \infty$ elements) can be *totally ordered* $a_1 \prec a_2 \prec a_3 \prec \dots \prec a_n$ in $n!$ ways, but in some sense every one of these is the same— if \prec_1 and \prec_2 are two orderings, there exists a 1–1 order-preserving isomorphism $\varphi : (S, \prec_1) \longleftrightarrow (S, \prec_2)$. Thus *up to isomorphism* there is only one ordering for any finite set.

For countably infinite sets there are many different orderings. The obvious one is $a_1 \prec a_2 \prec a_3 \prec \dots$, ordered just like the positive integers \mathbb{N} ; this ordering is called ω , the first *limit ordinal*. But we could pick any element (say, $b_1 \in S$) and order the remainder of S in the usual way, but declare $a_n \prec b_1$ for every $n \in \mathbb{N}$; one element is “bigger” (in the ordering) than all the others. This is *not* isomorphic to ω , and it is called $\omega + 1$, the *successor* to ω . If we set aside two elements (say, $b_1 \prec b_2$) to follow all the others we have $\omega + 2$, and similarly we have $\omega + n$ for each $n \in \mathbb{N}$. The limit of all these is $\omega + \omega$, or 2ω ... it is the ordering we would get if we lexicographically ordered the set $\{(i, j) : i = 1, 2 \ j \in \mathbb{N}\}$ of the first two rows of integers in the first quadrant, declaring $(1, j) \prec (2, k)$ for every j, k and otherwise $(i, j) \prec (i, k)$ if $j < k$.

We would get the successor to this, $2\omega + 1$, by extending the lexicographical ordering as we add $(3, 1)$ to S ; in an obvious way we get $2\omega + n$ for every $n \in \mathbb{N}$ and eventually the limit ordinals $3\omega, 4\omega, \text{etc.}$, and the successor ordinals $m\omega + n$. The limit of all these is $\omega\omega$ or ω^2 , the lexicographical ordering of the entire first quadrant of integers (i, j) . It too has successors $\omega^2 + n$ (graphically you can think about integer triplets (i, j, k)), and limits like $\omega^2 + \omega$ and ω^3 and ω^ω (which turns out to be the same as 2^ω).

In general an ordinal is a *successor* ordinal if it has a maximal element, and otherwise is a *limit* ordinal. Every ordinal α has a successor $\alpha + 1$, and every set of ordinals $\{\alpha_n\}$ has a limit (least upper bound) λ . Let Ω be the first *uncountable* ordinal.

Proofs and constructions by *transfinite induction* typically have one step at ordinal zero, one at each successor ordinal, and another at each limit ordinal. The *Borel sets* can be defined by transfinite construction as follows.

Let \mathcal{F}_0 be the class of open subsets of some topological space \mathcal{X} (perhaps the real numbers $\mathcal{X} = \mathbb{R}$, for example).

Succ: For any ordinal α , let $\mathcal{F}_{\alpha+1}$ be the class of countable unions of sets $E_n \in \mathcal{F}_\alpha$ and their complements $E_m^c : E_m \in \mathcal{F}_\alpha$.

Lim: For any limit ordinal λ , set $\mathcal{F}_\lambda := \cup_{\alpha < \lambda} \mathcal{F}_\alpha$.

Together these define a nested family \mathcal{F}_α for all ordinals, limit and successor, with $\alpha \prec \beta \Rightarrow \mathcal{F}_\alpha \subset \mathcal{F}_\beta$. The sigma field *generated by* \mathcal{F}_0 is \mathcal{F}_Ω , where Ω is the first uncountable ordinal. It remains to prove that $\mathcal{F}_\Omega = \sigma(\text{open sets in } \mathcal{X})$, *i.e.*, that:

1. $\mathcal{F}_0 \subset \mathcal{F}_\Omega$, *i.e.*, \mathcal{F}_Ω contains the open sets (including \mathcal{X} itself);
2. $E \in \mathcal{F}_\Omega \implies E^c \in \mathcal{F}_\Omega$, *i.e.*, \mathcal{F}_Ω is closed under complements;
3. $\{E_n\} \subset \mathcal{F}_\Omega \implies \bigcup_{n=1}^{\infty} E_n \in \mathcal{F}_\Omega$, *i.e.*, \mathcal{F}_Ω is closed under countable unions;
4. $\mathcal{F}_\Omega \subset \mathcal{G}$ for any sigma field \mathcal{G} containing \mathcal{F}_0 .

Item 1. is trivial since $\mathcal{F}_\Omega := \bigcup_{\alpha < \Omega} \mathcal{F}_\alpha$, and in particular contains \mathcal{F}_0 . Item 2. follows by noting that $E \in \mathcal{F}_\alpha \implies E^c \in \mathcal{F}_{\alpha+1}$. Item 3 follows by noting that $E_n \in \mathcal{F}_\Omega \implies E_n \in \mathcal{F}_{\alpha_n}$ for some $\alpha_n < \Omega$, and $\beta := \sup_{n < \infty} \alpha_n$ is a countable ordinal satisfying $\alpha_n \preceq \beta < \Omega$. Hence $E_n \in \mathcal{F}_\beta$ for all n and $\bigcup_{n=1}^{\infty} E_n \in \mathcal{F}_{\beta+1} \subset \mathcal{F}_\Omega$. Verifying the minimality condition Item 4 is left as an exercise in transfinite induction: show that $\mathcal{F}_\beta \subset \mathcal{G}$ first for $\beta = 0$, then for successor ordinals $\beta = \alpha + 1$, then for limit ordinals $\beta = \{\alpha : \alpha < \lambda\}$, and conclude by induction that $\mathcal{F}_\beta \subset \mathcal{G}$ for all $\beta < \Omega$ and hence $\mathcal{F}_\Omega \subset \mathcal{G}$.

It isn't immediately obvious from the construction that we couldn't have stopped earlier—for example, that \mathcal{F}_2 or \mathcal{F}_ω isn't already the Borel sets, unchanging as we allow successively more intersections and unions. In fact that does happen if the original space \mathcal{X} is countable or finite; in the case of \mathbb{R} , however, one can show that $\mathcal{F}_\alpha \neq \mathcal{F}_{\alpha+1}$ for every $\alpha < \Omega$.

Do you think this explicit construction is clearer or more complicated than the completion argument used in the text?