

CRASH-COURSE IN ELEMENTARY PROBABILITY

- **Sample space** S : the set of all possible outcomes of an experiment (where one decides what counts as an outcome in advance)
 - Elementary event: an element of S
 - Event: a subset of S
 - Example: pick a person from the class and ask them their age (in years); elem events are positive whole numbers; events include "between 20 and 22" (i.e., the set {class members between 20 and 22 years old}), etc.
 - Example: toss a coin and see how far away it lands from some marked spot; elem events are non-neg reals; events include "more than 3 meters" (i.e., $\{x \in \mathbb{R} \mid x > 3.0 \text{ m}\}$), etc.
 - Example: toss two coins and see whether each lands heads or tails; elem events are HH HT TH TT; events include "at least one head" (i.e., $\{HH, HT, TH\}$), which can also be written as " $\geq 1H$ ". Using that notation, $1H = \{HT, TH\}$.
 - Example: we could redefine the previous experiment so that we don't keep track of which coin is which, but only how many give heads; elem events now are 0H (same as 2T), 1H (same outcome as 1T), and 2H (same as 0T); events include "at least one head" (which now is $\{1H, 2H\}$), etc. Note that now 1H is not the same thing as in the previous example; it is not a two-element event but rather is a single elementary event.
- **Axioms**: given a sample space S , Prob (or P , or a "probability distribution") is a real-valued function on the set of events
 $P: \text{Events} \rightarrow [0,1]$ such that for all events A, B (subsets of S)
 - (i) $P(S) = 1$
 - (ii) if $(A \cap B) = \text{emptyset}$, then $P(A \cup B) = P(A) + P(B)$
- Consequences of the axioms
 - (iii) $P(S - A) = 1 - P(A)$
 - (iv) $P(\text{emptyset}) = 0$
 - (v) $P(A \cup B) = P(A) + P(B) - P(A \cap B)$
- **Uniform prob distributions**: each elem event e has the same prob
 - $\rightarrow P(e) = 1/|S|$ for each elem event e
 - $\rightarrow P(E) = |E|/|S|$ for each event E

- **Conditional probability:** we have some partial information about an outcome (we know event E happened) and want to compute the prob that another event E' also happened.

- Definition: $P(E'|E) = P(E' \text{ int } E) / P(E)$

- Example of a fair coin F and a biased coin B (B always comes up heads)

- Experiment: one coin (F or B) is picked at random (each is equally likely) and tossed twice.

Here the sample space consists of five elem events: BHH, FHH, FHT, FTH, FTT, of probs $1/2, 1/8, \dots, 1/8$ resp.

We see the two tosses are both head: event HH occurs. What is the probability that coin B was picked?

That is, what is $P(B|HH)$?

We are given $P(HH|B) = 1$, and $P(B) = P(F) = P(BHH) = 0.5$

So $P(B|HH) = P(B \text{ int } HH) / P(BHH) = P(BHH) / P(HH) = 0.5 / P(HH)$.

But what is $P(HH)$? $HH = BHH \cup FHH$, so $P(HH) = P(FHH) + P(BHH) = 1/8 + 1/2 = 5/8$

So $P(B|HH) = 0.5 / 5/8 = 4/5 = 0.80 = 80\%$

- Bayes Theorem: $P(E'|E) = P(E|E') P(E') / P(E)$

Proof: $P(E'|E) = P(E' \text{ int } E) / P(E)$ and $P(E|E') = P(E' \text{ int } E) / P(E')$, so

$P(E' \text{ int } E) = P(E) P(E'|E) = P(E') P(E|E')$ and thus

$P(E'|E) = P(E') P(E|E') / P(E)$

- **Random Variables:** functions $X:S \rightarrow R$

- Idea is that associated with an outcome there may be additional quantities of interest.

- Example: Suppose a social scientist suspects that a student's age plus their GPA is significant for their getting a summer job. This suggests considering the random variable $X(e) = \text{age}(e) + \text{gpa}(e)$ for each e in S . Here the "experiment" could just be picking a person e (and recording their name and age and gpa, say). Here not only $\text{age} + \text{gpa}$ but also age and gpa individually are random variables, but name is not.

- Example: toss two fair coins and record which elem event (HH, HT, TH, or TT) occurs as above. Let $X = -2$ if no Ts, $+2$ if equal number of T's and H's, and $+4$ if 2 Ts. (That is, let a T "count" as $+2$ and H as -1). Then X is a random variable.

- **Expected value** (aka mean value, aka expectation) of a random variable.

Definition: Given a sample space S , a prob dist P , and a random var X , we define $E[X] = \langle X \rangle = \sum_{x \in R} x P(X=x)$

where $P(X=x)$ means the prob of the event $\{e | X(e)=x\}$

- Example: the two-coins just above. Then

- $\langle X \rangle = -2 P(X=-2) + 2 P(X=2) + 4 P(X=4)$

- $= -2 (1/4) + 2(2/4) + 4 (1/4)$

- $= -1/2 + 1 + 1 = 1.5$

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Note that $\langle X \rangle$ does not have to be a value that X can actually have. It is essentially the notion of average value; e.g., the average of 3 and 4 is 3.5.

- **Standard deviation:** this complicated sounding idea is described like this: the square root of the expected value of the square of the deviation from the expected value, or “the root-mean-square-deviation”. One computes the mean $\langle X \rangle$ as above; and then we form the new random var which is the square of the deviation (difference) of X from $\langle X \rangle$: $(X - \langle X \rangle)^2$; then we calculate the mean of that: $\langle (X - \langle X \rangle)^2 \rangle$ – this is called the “variance” of X – and finally the square root of the variance is the standard deviation.

- Example: For the two-coin problem above, we compute $P((X - \langle X \rangle = x)^2)$ for each possible value of x . But X can be -2, 2, or 4, so $X - \langle X \rangle$ can be any of: $-2 - 1.5 = -3.5$; $2 - 1.5 = 0.5$; and $4 - 1.5 = 2.5$; and their squares are $49/4$, $1/4$, and $25/4$.

for these we get

$P(49/4) = 1/4$; $P(1/4) = 2/4$; and $P(25/4) = 1/4$. So the variance is $49/4 \times 1/4 + 1/4 \times 2/4 + 25/4 \times 1/4 = 49/16 + 2/16 + 25/16 = 76/16 = 4.75$. Finally, the standard deviation is $\sqrt{4.75}$, which is approximately 2.18.

A rough interpretation of this is that outcomes for the X -value tend to lie within the range from 2.18 below $\langle X \rangle$ to 2.18 above $\langle X \rangle$, i.e., in the range from $1.5 - 2.18 = -0.68$ to $1.5 + 2.18 = 2.68$.