

Math 1070-2: Spring 2008

Lecture 5

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Randomness

- ▶ Simulations of a fair coin (1 = heads; 0 = tails)

- ▶ 0000110011

[0.4=40%]

- ▶ 1110111000

[0.6=60%]

- ▶ 0100001100

[0.3=30%]

- ▶ 0000011010

[0.3=30%]

- ▶ 1000001000

[0.3=30%]

- ▶ 1000100011

[0.4=40%]

- ▶ 1010000011

[0.4=40%]

- ▶ 0111101110

[0.7=70%]

- ▶ 0011010110

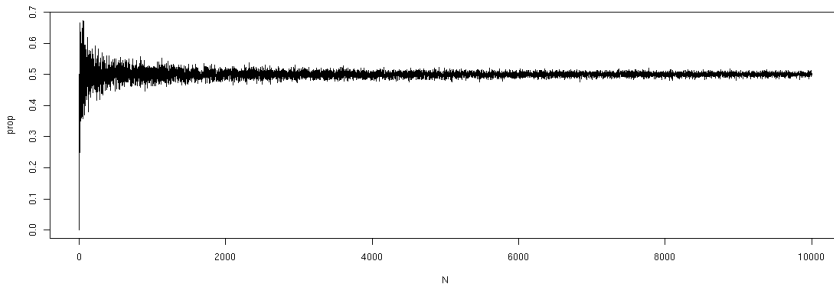
[0.5=50%]

- ▶ Is this random? Is this a fair coin?



Randomness

- ▶ Toss N fair coins; tally the proportion of heads
- ▶ Long-run pattern



Probability

- ▶ Assignment of likelihood
- ▶ Usually has a long-run interpretation
[Law of large numbers; J. Bernoulli, 1689]
 - ▶ Probability of heads in a toss of a fair coin
 - ▶ Probability of rolling two dots in a roll of a fair die
 - ▶ Probability of rain tomorrow (??)
 - ▶ Probability that candidate X wins the next election (??????)



Equally-likely outcomes

- ▶ **Example to have in mind:** Toss a fair coin 3 times. What is the probability of getting 2 heads?
- ▶ To compute probabilities of equally likely events:
 - ▶ Produce [usually in your head] a “sample space”
[this is a list of all possible outcomes of the experiment]
 - ▶ Here, we could choose:
TTT TTH THT THH
HHH HHT HTH HTT
 - ▶ Each element of the sample space is equally likely
[there are other possibilities; this is good enough for us]
 - ▶ Prob=# ways to get the outcome we want /total # possible outcomes
 - ▶ Here,

$$P(\text{two heads}) = \frac{3}{8} = 0.375 = 37.5\%$$



Equally-likely outcomes

- ▶ Had the following sample space:

TTT TTH THT THH
HHH HHT HTH HTT

$$P(\text{two heads}) = \frac{3}{8}$$

- ▶ What if we wrote the sample space unordered?

TTT TTH THH HHH

$$P(\text{two heads}) = \frac{1}{4}$$

- ▶ These can't *both* be right. What is going on?



Independence

- ▶ Events A and B are **independent** if:
 - ▶ $P(B)$ is the same as the probability of B if you were told A
 - ▶ Consider our old sample space
TTT TTH THT THH HHH HHT HTH HTT
 - ▶ Let A be the event **first coin-toss is heads**
 - ▶ Let B be the event **third coin-toss is tails**
 - ▶ Are A and B independent?
 - ▶ The probability of B is $P(B) = \frac{4}{8} = \frac{1}{2}$
 - ▶ If you knew A then the sample space is reduced to
HHH HHT HTH HTT
 - ▶ The [conditional] probability of B [given A] in this case is
 $P(B|A) = \frac{2}{4} = \frac{1}{2}$
 - ▶ Yes! A and B are independent
- ▶ Two draws from a deck of cards. Are the draws independent?



Independence

- ▶ A precise mathematical definition:
 - ▶ A and B are independent if

$$P(A \& B) = P(A)P(B)$$

- ▶ A more-or-less honest verbal definition:
 - ▶ A and B are independent if these outcomes don't affect each other [statistically speaking, whatever that means]



Independence and sampling

- ▶ Sampling with replacement → independent draws
- ▶ Sampling without replacement → draws that are *not* independent
- ▶ If the population is large then both sampling methods → independent draws



Random variables and distributions

- ▶ A **random variable** is the as-yet unseen outcome of a random experiment
- ▶ Its **distribution** is a list of two quantities:
 - ▶ Possible values
 - ▶ Versus probabilities
- ▶ There are also “continuous” random variables [later]



Example: A die

possible value	probability
1	$1/6 \approx 0.17$
2	$1/6 \approx 0.17$
3	$1/6 \approx 0.17$
4	$1/6 \approx 0.17$
5	$1/6 \approx 0.17$
6	$1/6 \approx 0.17$
	sum =1



Example: # of homeruns in a game for the Red Sox

("based on 2004 data")

possible value	probability
0	0.23
1	0.38
2	0.22
3	0.13
4	0.03
5	0.01
6 or more	0.00
	sum = 1

- ▶ What does this mean? How is it computed?



The mean (expectation) of a probability distribution

- ▶ A box has 3 ones and 2 threes. The average value in the box is

$$\frac{1 + 1 + 1 + 3 + 3}{5} = \frac{9}{5} = \left(1 \times \underbrace{\frac{3}{5}}_{P(1)} \right) + \left(3 \times \underbrace{\frac{2}{5}}_{P(3)} \right)$$

- ▶ $\frac{9}{5} = 1.8$ is our best guess for the outcome of this draw [before it happens]
- ▶ **General formula:**

$$\mu = \sum_{x=\text{possible values}} xP(x)$$



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4	$1/6 \approx 0.17$
5	$1/6 \approx 0.17$
6	$1/6 \approx 0.17$
	sum = 1

$$\mu = \left(1 \times \frac{1}{6}\right) + \left(2 \times \frac{1}{6}\right) + \cdots + \left(6 \times \frac{1}{6}\right) = 3.5$$

- ▶ Does this make a good guess? For what? And how?



Example: # of homeruns in a game for the Red Sox

("based on 2004 data")

possible value	probability
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3	0.13
4	0.03
5	0.01
6 or more	0.00
	sum =1



$$\mu = (0 \times 0.23) + (1 \times 0.38) + (2 \times 0.22) + \cdots + (5 \times 0.01) \approx 1.38$$



Law of large numbers (again)

- ▶ **General fact:** Take a large independent sample from a population, and consider a random variable that one would obtain in this way [e.g., weight]
- ▶ Then the sample average [e.g., sample weight] is [with high probab.] close to the mean of the probab. distribution of the random variable [e.g., true average weight of the population]
- ▶ As the sample size $\rightarrow \infty$ this approximation gets better, with increasingly improved probabilities



Expectations and taking bets

- ▶ We all take bets in different settings. Expectations show us how to do this well.
- ▶ **Lottery:** Costs \$1; win \$0 with probab. $\frac{99,999}{100,000}$; win \$10,000 with probab. $\frac{1}{100,000}$

$$\text{expected win} = \left(0 \times \frac{99999}{100000}\right) + \left(10000 \times \frac{1}{100000}\right) - 1 = -0.9$$

- ▶ Lottery 1 \rightarrow expect to lose 90¢
- ▶ Long-run interpretation?

