

---

## ECS 20 — Lecture 19 — Fall 2013 — 3 Dec 2013

Phil Rogaway

---

**Today:**

- Probability

**Announcements:**

- Please work out the old final for Thursday
- Final's week OH are online. Unfortunately, I am out of town. I will check the chat room as often as I can.
- Final: you may not leave during the last 30 mins.

**Poker examples and first use of probability**

Let's introduce probability informally

**straight flush** = five consecutive cards: A2345, 23456, 34567, ..., 89AJQ, 9AJQK, AJQKA in any suit.  
So 40 possible.

**royal flush** = AJQKA of one suit. So 4 possible

**four of a kind** = four cards of one value, eg., four 9's

**full house** = 3 cards of one value, 2 cards of another value. Eg, three 10's and two 4's.

**flush** = five cards of a single suit

**three of a kind** = three cards of one value, a fourth card of a different value,  
and a fifth card of a third value

**two pairs** = two cards of one value, two more cards of a second value, and the remaining  
card of a third value

**one pair** = two cards of one value, but not classified above

1. **How many poker hands** are there?

Answer:  $C(52,5)=2,598,960$

2. How many poker hands are **full houses**?

Answer: A full house can be **partially** identified by a pair, like (J,8), where the first component of the pair is what you have **three** of, the second component is what you have **two** of. So there are  $P(13,2)=13*12$  such pairs. For each there are  $C(4,3)=4$  ways to choose the first component, and  $C(4,2)=6$  ways to choose the second component. So all together there are

$$13*12*4*6=3,744 \text{ possible full houses.}$$

The probability of being dealt a full house is therefore  
 $3,744/2,598,960 \approx .001441 \approx 0.14\%$

$$P[\text{FullHouse}] \approx .001441$$

The probability of an event is a real number between 0 and 1 (inclusive). If asked what's the probability of something, don't answer with a "percent", and don't answer with something outside of [0,1]. When we give something in "percent's", we are giving a probability multiplied by 100.

### 3. How many poker hands are **two pairs**?

Answer: We can partially identify two pairs as in {J, 8}. Note that now the pair is now **unordered**. There are  $C(13,2)$  such sets. For each there are  $C(4,2)$  ways to choose the larger card and  $C(4,2)$  ways to choose the smaller card. There are now 52 – 8 remaining cards one can choose as the fifth card (to avoid a full house, there are 8 "forbidden" cards). So the total is

$$C(13,2)*C(4,2)*C(4,2)*44 = 123,552.$$

The chance of being dealt two pairs is therefore

$$C(13,2)*C(4,2)*C(4,2)*44 / C(52,5) = 123,552/2,598,960 \approx 0.047539 \approx 4.75\%$$

$$P[\text{TwoPairs}] \approx 0.047539$$

## Basic definitions / theory

Schaum's, chapter 7.

Probability does not appear at all in Biggs.

**Def:** A (finite) **probability space**  $(S, P)$  is

- a finite set  $S$  (*the sample space*) and
- a function  $P: S \rightarrow [0,1]$  (*the probability measure*) such that that

$$\sum_{x \in S} P(x) = 1 \quad (\text{alternative notation: } \omega, \mu, \Omega \text{ for } x, P, S)$$

In general, whenever you hear *probability* make sure that you are clear **what** is the probability space is: what is the sample space and what is the probability measure on it.

An **outcome** is a point in  $S$ .

**Def:** Let  $(S, P)$  be a probability space.

An **event** is a subset of  $S$ .

**Def:** Let  $A$  be an event of probability space  $(S, P)$ .

$$P(A) = \sum_{a \in A} P(a) \quad (\text{I'm used to using Pr, will probability slip})$$

*The probability of event A. By convention,  $P(\emptyset)=0$*

**Def:** The **uniform** distribution is the one where  $P(a) = 1/|S|$  —ie, all points are equiprobable.

**Def:** Events  $A$  and  $B$  are **independent** if  $P(A \cap B) = P(A) P(B)$ .

**Def:** A **random variable** is a function  $X: S \rightarrow \mathbf{R}$  from the sample space to the reals.

**Def:**  $\mathbf{E}[X] = \sum_{s \in S} P(s) X(s)$  // expected value of  $X$  ("average value")

**Def:** if  $B \neq \emptyset$  then  $P(A|B) = P(A \cap B) / P(B)$

### Propositions:

- $P(\emptyset) = 0$  // by definition
- $P(S) = 1$
- $P(A) + P(A^c) = 1$ , or  $P(A) = 1 - P(A^c)$

- If  $A$  and  $B$  are disjoint events (that is, disjoint sets) then

$$P(A \cup B) = P(A) + P(B)$$

- ("sum bound")

$$P(A \cup B) \leq P(A) + P(B)$$

- In general,

$$P(A \cup B) = P(A) + P(B) - P(A \cap B) \text{ // inclusion-exclusion principle}$$

- If  $B_1, B_2$  disjoint, nonempty events whose union is  $S$  then

$$P(A) = P(A | B_1) P(B_1) + P(A | B_2) P(B_2)$$

- $\mathbf{E}(X+Y) = \mathbf{E}(X) + \mathbf{E}(Y)$  // expectation is linear.

### Eg 1: Dice

The singular, the students assure me, is *die*.

Like *mice* and *me*. I guess.

- You roll a fair die six times:

$$S = \{1, 2, 3, 4, 5, 6\}$$

$$P(1) = P(2) = \dots = P(6) = 1/6$$

"you roll an even number" is an event.

$$\text{Event is } A = \{2, 4, 6\}. \quad P(A) = 3 * (1/6) = 1/2.$$

- Pair of dice.

$$S = \{1, 2, 3, 4, 5, 6\} \times \{1, 2, 3, 4, 5, 6\}$$

$$P((a,b)) = 1/36 \text{ for all } (a,b) \text{ in } S$$

Illustrate independence.

$$\begin{aligned} P(\text{left die even and right die even}) &= P(\text{left die even}) P(\text{right die even}) \\ &= (1/2) (1/2) = 1/4 \end{aligned}$$

- Pair of dice, what's the chance of rolling an "8"?

$$\text{Event } E = \{(2,6), (3,5), (4,4), (5,3), (6,2)\}$$

$$P(E) = 5/36$$

Be careful:  $P(E) = |E|/|S|$  only if we are assuming the **uniform** distribution.

- Pair of dice, what's the chance of rolling an "8" if I tell you that both numbers came out even?

**Method 1:** Imagine the new probability space:

$$(2,2), (2,4), (2,6), (4,2), \underset{***}{(4,4)}, \underset{****}{(4,6)}, (6,2), (6,4), (6,6)$$

So probability is  $3/9 = 1/3$

**Method 2:** A little more mechanically

$A$  = "rolled an 8"

$B$  = "both die are even"

$$\begin{aligned} P(A | B) &= P(A \cap B)/P(B) \\ &= (3/36) / (9/36) = 1/3 \end{aligned}$$

### Eg 2. Back to the Poker examples

What's the probability space?

Sample space has  $|S| = C(52,5)$

We can regard the points of  $S$  as **5-elements subsets**

of  $\{2C, 2D, 2H, 2S, 3C, 3D, 3H, 3S, \dots, KC, KD, KH, KS, AC, AD, AH, AS\}$  or  $\{1, \dots, 52\}$

Probability measure is uniform:  $P(a) = 1/|S|$ .

### Eg 3: Fair coin

Flip a fair coin 100 times.

What is the probability space?

$$S = \{0,1\}^{100}$$

$$P(s) = 2^{-100} \text{ for all } s \text{ in } S.$$

What is the chance of getting **exactly 50 out of the 100 coin flips land heads?**

$$P(50\text{Heads}) = C(100,50) / 2^{100} \approx 0.07959 \quad // \text{ note "100 choose 50" to Google}$$

$$P(51\text{Heads}) = C(100,51) / 2^{100} \approx 0.07803$$

### Eg 4: Biased coin

Now, what if the coin is biased?

Say that the coin lands **heads** with probability  $p = .51$  and **tails** with probability  $1-p = .49$ . each flip independent of the rest.

You flip the unfair coin 100 times. The coin lands heads a fraction  $p=0.51$  of the time:

$$S = \{0,1\}^{100} \quad (\text{same as before, but now})$$

$P(x) = p^{\#1(x)} (1-p)^{\#0(x)}$  where  $\#1(x)$  = the number of 1-bits in the string  $x$  and  
 $\#0(x)$  = the number of 0-bits in the string  $x$ .

What's the Probability of 50 and 51 heads now?

$$P(50\text{Heads}) = C(100,50)(.51^{50})(.49^{50}) \approx 0.07801$$

$$P(51\text{Heads}) = C(100,51)(.51^{51})(.49^{49}) \approx 0.07906$$

Makes sense -- 51 heads should now be the most likely number, and things should fall off from there. Before, 50 heads was the most likely outcome.

### Eg 5: Birthday phenomenon

$n=23$  people gather in a room.

What's the chance that some two have the same birthday?

Assume nobody born 2/29, all other birthdays equiprobable.

$$S = [1..365]^{23}$$

$$\begin{aligned} P(\text{SameBirthday}) &= 1 - \Pr(\text{AllBirthdaysDifferent}) \\ &= 1 - (1-1/365)(1-2/365) \dots (1-22/365) \end{aligned}$$

$$= 1 - \prod_{i=1}^{22} (1-1/i) \approx 0.507$$

That's as far as we got in lecture. See

[http://en.wikipedia.org/wiki/Birthday\\_problem#Calculating\\_the\\_probability](http://en.wikipedia.org/wiki/Birthday_problem#Calculating_the_probability)  
if you didn't follow.