## **Stat 100a: Introduction to Probability.**

Outline for the day:

- 1. Review list.
- 2. Random walk example.
- 3. Bayes' rule example.
- 4. Conditional probability examples.
- 5. Homework 3 solutions.
- 6. Equity gained example.
- 7. Projects.

OH today will be from 11:10-11:30. None next week! The exams next week are open book, plus 2 pages of notes.

Bring a calculator and a pen or pencil.

Submit your reviews of the course online via my.ucla.edu.

There's no R stuff on the final.

Suggested problems from ch 4-7 to look at are 4.5, 4.6, 4.7, 4.8, 4.9, 4.13, 4.14, 4.16, 5.1, 5.2, 5.5, 5.6, 6.2, 6.4, 6.9, 6.10, 6.11, 6.12, 7.1, 7.2, 7.3, 7.4, 7.5, 7.8, 7.13, 7.14, 7.15.

#### 1. Review list.

- 1) Basic principles of counting.
- 2) Axioms of probability, and addition rule.
- 3) Permutations & combinations.
- 4) Conditional probability.
- 5) Independence.
- 6) Multiplication rules.

P(AB) = P(A) P(B|A) [= P(A)P(B) if ind.]

- 7) Odds ratios.
- 8) Random variables (RVs).
- 9) Discrete RVs, and probability mass function (pmf).
- 10) Expected value.
- 11) Pot odds calculations.
- 12) Luck, skill, and deal-making.
- 13) Variance and SD.
- 14) Bernoulli RV. [0-1.  $\mu = p, \sigma = \sqrt{(pq)}$ .]
- 15) Binomial RV. [# of successes, out of n tries.  $\mu = np, \sigma = \sqrt{(npq)}$ .]
- 16) Geometric RV. [# of tries til 1st success.  $\mu = 1/p$ ,  $\sigma = (\sqrt{q}) / p$ .]
- 17) Negative binomial RV. [# of tries til rth success.  $\mu = r/p, \sigma = (\sqrt{rq}) / p.$ ]
- 18) Poisson RV [# of successes in some time interval. [ $\mu = \lambda, \sigma = \sqrt{\lambda}$ .]
- 19) E(X+Y), V(X+Y) (ch. 7.1).
- 20) Bayes's rule (ch. 3.4).
- 20) Continuous RVs
- 21) Probability density function (pdf)
- 22) Uniform RV
- 23) Normal RV
- 24) Exponential RV
- 25) Moment generating functions
- 26) Markov and Chebyshev inequalities
- 25) Law of Large Numbers (LLN)
- 26) Central Limit Theorem (CLT)
- 27) Conditional expectation.
- 28) Confidence intervals for the sample mean.
- 29) Fundamental theorem of poker
- 30) Random Walks, Reflection Principle, Ballot Theorem, avoiding zero
- 31) Chip proportions and induction.Basically, we've done all of ch. 1-7 except 6.7.

### 2. Another random walk example.

Suppose that a \$10 winner-take-all tournament has  $32 = 2^5$  players. So, you need to double up 5 times to win. Winner gets \$320.

Suppose that on each hand of the tournament, you have probability p = 0.7 to double up, and with probability q = 0.3 you will be eliminated. What is your expected profit in the tournament?

Your expected *return* = (\$320) x P(win the tournament) + (\$0) x P(you don't win)

 $= (\$320) \ge 0.7^5 = \$53.78$ . But it costs \$10.

So expected profit = \$53.78 - \$10 = \$43.78.

### 3. <u>Bayes' rule example.</u>

Your opponent raises all-in before the flop. Suppose you think she would do that 80% of the time with AA, KK, or QQ, and she would do that 30% of the time with AK or AQ, and 1% of the time with anything else.

Given <u>only</u> this, and not even your cards, what's P(she has AK)?

Given nothing, P(AK) = 16/C(52,2) = 16/1326. P(AA) = C(4,2)/C(52,2) = 6/1326. Using Bayes' rule,

$P(AK \mid all-in) =$ .	P(all-in   AK) * P(AK),				
P(	all-inlAK)P(	(AK) + P(all	-inlAA)P(A	A) + P(all-inlKK)P(KK) +	
= <u>. 30% x 16/1326</u>					
[30%x16/1326] + [80%	x6/1326] + [80%)	x6/1326] + [80%:	x6/1326] + [30%)	x16/1326] + [1% (1326-16-6-6-6-16)/1326)]	
(AK)	(AA)	(KK)	(QQ)	(AQ) (anything else)	
$= 13.06\%$ . Compare with $16/1326 \sim 1.21\%$ .					

## 4. Conditional prob. examples.

# Approximate P(SOMEONE has AA, given you have KK)? Out of your 8 opponents?

Note that given that you have KK,

P(player 2 has AA & player 3 has AA)

 $= P(player 2 has AA) \qquad x \quad P(player 3 has AA | player 2 has AA)$ 

= choose(4,2) / choose(50,2) x 1/choose(48,2)

= 0.0000043, or 1 in 230,000.

So, very little overlap! Given you have KK,

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P(someone has AA) = P(player2 has AA or player3 has AA or ... or pl.9 has AA)
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~ P(player2 has AA) + P(player3 has AA) + ... + P(player9 has AA)
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= 8 \text{ x choose}(4,2) / \text{choose}(50,2) = 3.9\%, or 1 in 26.
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What is exactly P(SOMEONE has an Ace | you have KK)? (8 opponents)

(or more than one ace)

Given that you have KK, P(SOMEONE has an Ace) = 100% - P(nobody has an Ace). And P(nobody has an Ace) = choose(46,16)/choose(50,16) = 20.1%.

So P(SOMEONE has an Ace) = 79.9%.

### 4. More conditional probability examples.

P(You have AK | you have exactly one ace)? = P(You have AK and exactly one ace) / P(exactly one ace) = P(AK) / P(exactly one ace)

 $= (16/C(52,2)) \div (4x48/C(52,2))$ = 4/48 = 8.33%.

P(You have AK | you have at least one ace)? = P(You have AK and at least one ace) / P(at least one ace) = P(AK) / P(at least one ace) =  $(16/C(52,2)) \div (((4x48 + C(4,2))/C(52,2)) \sim 8.08\%.$ 

P(You have AK | your FIRST card is an ace)? = 4/51 = 7.84%.

### 5. Answers to hw3.

6.6. If X is Pareto, with a = 1 and b = 3, then  $E(X) = \int yf(y)dy = \int y (b/a) (a/y)^{b+1} dy = \int 3y-3 dy = -3/2 y^{-2} ]y=1$  to  $\infty = 0 + 3/2 (1)^{-2} = 1.5$ .  $E(X^2) = \int y^2 (b/a) (a/y)^{b+1} dy = \int 3y^{-2} dy = -3 y^{-2} ]y=1$  to  $\infty = 0 + 3 = 3$ . Thus,  $V(X) = E(X^2) - (E(X))^2 = 3 - (1.5)^2 = 0.75$ .

6.12. X and Y are ind, X is exp with mean 1/2, Y=1 with prob 1/3 and 2 with prob 2/3, and Z = XY. Find a) the pdf of Z, b) the expected value of Z, and c) the sd of Z.

a) Let F be the cdf of Z.  $F(c) = P(XY \le c) = P(X \le c/Y) = 1/3 P(X \le c) + 2/3 P(X \le c/2)$ = 1/3 [1-exp(-2c)] + 2/3[1-exp(-c)], for  $c \ge 0$ . Taking the derivative,  $f(c) = F'(c) = 2/3 \exp(-2c) + 2/3 \exp(-c)$ , for  $c \ge 0$ .

b) The expected value of Z is  $\int c f(c) dc = 2/3 \int c \exp(-2c) dc + 2/3 \int c \exp(-c) dc$ . Integrating by parts,  $E(Z) = \int v du = uv - \int v du$ , where u = c and  $dv = \exp(-2c)dc$  or  $\exp(-c)dc$ ,  $v = -\exp(-2c)/2$ , or  $v = -\exp(-c)$ , so  $E(Z) = 2/3 [-c \exp(-2c)/2 + \int \exp(-2c)/2 dc] + 2/3 [-c \exp(-c) + \int \exp(-c)dc]$   $= 2/3 [-c \exp(-2c)/2 - \exp(-2c)/4 - c \exp(-c) - \exp(-c)]$ , evaluated from c = 0 to infinity, and at infinity everything converges to 0, so it's -2/3 [0 - 1/4 - 0 - 1] = 2/3 \* 5/4 = 5/6.

Alternatively, without integrating by parts, we know that  $\int c [2exp(-2c)] dc$  is the expected value of an exponential random variable with parameter lambda = 2, and this expected value is 1/2. Similarly,  $\int c \exp(-c) dc$  is the expected value of an exponential with lambda = 1, which is 1. So,  $E(Z) = 2/3 \int c \exp(-2c) dc + 2/3 \int c \exp(-c) dc$ = 2/3 (1/2)  $\int c [2exp(-2c)] dc + 2/3 (1)$ = 2/3 (1/2) (1/2) + 2/3 = 5/6. You could also use E(XY) = E(X)E(Y). 6.12 c) Var(Z) = E(Z^2) - (5/6)^2. E(Z^2) =  $\int c^2 f(c) dc = 2/3 \int c^2 exp(-2c) dc + 2/3 \int c^2 exp(-c) dc$ . One could do this by integrating by parts, or one could note that if X is exponential (lambda), then E(X^2) = 2/lambda^2, so  $\int c^2 [2exp(-2c)] dc = 2/(2^2) = 1/2$ , and  $\int c^2 exp(-c) dc 2/(1^2) = 2$ . Thus, E(Z^2) =  $\int c^2 f(c) dc = 2/3 \int c^2 exp(-2c) dc + 2/3 \int c^2 exp(-c) dc$ =  $2/3 (1/2) \int c^2 [2exp(-2c)] dc + 2/3 \int c^2 exp(-c) dc$ = 2/3 (1/2) (1/2) + 2/3 (2)= 1/6 + 4/3 = 1.5. So, Var(Z) =  $1.5 - (5/6)^2 = 54/36 - 25/36 = 29/36$ . SD(Z) =  $\sqrt{(29/36)} \sim 0.898$ .

6.14. Let X be exponential with parameter  $\lambda$ .  $\phi(t) = E(\exp(tX)) = \int \exp(ty) \lambda \exp(-\lambda y) dy$  from 0 to  $\infty = \lambda \int \exp(y(t-\lambda)) dy = \lambda \exp(y(t-\lambda))/(t-\lambda) = \lambda/(\lambda-t)$ . Thus  $\phi'(t) = \lambda/(\lambda-t)^2$  and  $E(X) = \phi'(0) = \lambda/(\lambda-0)^2 = 1/\lambda$ .  $\phi''(t) = 2\lambda/(\lambda-t)^3$  so  $E(X^2) = \phi''(0) = 2\lambda/(\lambda-0)^3 = 2/\lambda^2$ .  $V(X) = E(X^2)^{-} [E(X)]^2 = 2/\lambda^2 - 1/\lambda^2 = 1/\lambda^2$ . 7.2. X = # of face cards, Y = # of kings. What are a) E(Y)? b) E(Y|X)? c)  $P\{E[Y|X] = 2/3\}$ ?

a) E(Y) = 0 \* P(0 kings) + 1 \* P(1 king) + 2 \* P(2 kings)= 0 + 1 \* 4 \* 48 / C(52,2) + 2 \* C(4,2)/C(52,2) = 204/1326 ~ 15.38%. b) If X = 0, then Y = 0, so E[Y | X=0] = 0. E[Y | X = 1] = 0\*P(Y=0 | X=1) + 1 \* P(Y = 1 | X = 1)= 0 + 1\*P(Y = 1 & X = 1)/P(X=1) = {4 \* 40 / C(52,2)} ÷ {12 \* 40 / C(52,2)} = 1/3. E[Y | X = 2] = 0\*P(Y=0|X=2) + 1 \* P(Y = 1 | X = 2) + 2 P(Y = 2 | X = 2)= 0 + 1\*P(Y = 1 and X = 2)/P(X=2) + 2\*P(Y = 2 and X = 2) / P(X=2) = 0 + 1\*P(Y = 1 and X = 2)/P(X=2) + 2\*C(4,2)/C(52,2) ÷ C(12,2)/C(52,2) = 32/66 + 12/66 = 44/66 = 2/3. c) P{E[Y|X] = 2/3} = P(X = 2) = C(12,2)/C(52,2) ~ 4.98\%.

7.8. Negreanu lost \$1.7 million in 1250 hands, with an SD per hand of \$30,000. a) Find a 95% CI for  $\mu$ , and b) If Negreanu keeps losing at this rate, how many more hands til the 95% CI doesn't contain 0?

a) A 95% CI for  $\mu = -\$1.7$  million/1250 +/- 1.96 (\$30,000)/ $\sqrt{1250} = -\$1360$  +/- about 1663. b) 1.96 (\$30,000)/ $\sqrt{n} = 1360$ , so  $\sqrt{n} = 1.96(30,000)/1360$ , and  $n = \{1.96(30,000)/1360\}^2 \sim 1869$ . He's already played 1250, so he needs about 619 more hands at this rate til the CI doesn't contain 0. 7.14. You have 2 chips and your opponent has 4 chips. p = P(you gain a chip). a) If p = 0.52, what is P(win tournament)? b) Find p so that P(win tournament) = 0.5. c) If p = 0.75 and your opponent has 10 chips left, what is P(win tournament)? What if your opponent has 1,000 chips left?

a) By Theorem 7.6.8, P(win tournament) =  $(1-r^k)/(1-r^n)$ , where  $r = q/p = 0.48/0.52 \sim 92.31\%$ . So, P(win tournament) =  $(1-92.31\%^2) / (1-92.31\%^6) \sim 38.79\%$ .

b) We want to find p so that  $(1-r^2)/(1-r^6) = 1/2$ . That is,  $2(1-r^2) = 1 - r^6$ , so  $-r^6 + 2r^2 - 1 = 0$ . Letting  $x = r^2$ , this means  $-x^3 + 2x - 1 = 0$ , so  $(x-1)(-x^2 - x + 1) = 0$ . There are 3 solutions to this: x = 1, or

 $x^2 + x - 1 = 0$ , so  $x = (-1 + \sqrt{(1 + 4)})/2 = \sqrt{5}/2 - 1/2 \sim 0.618$ , or  $-\sqrt{5}/2 - 1/2 \sim -1.618$ .

 $x = r^2$ , so r can't be -1.618. Also, r can't be 1 because r = q/p, so r = 1 implies q = p = 0.5, which is not allowed in the conditions of Theorem 7.6.8. So, x must be 0.618 and  $r = \sqrt{0.618} = 0.786$ . (1-p)/p = 0.786, so 1-p = p(0.786), p(1+0.786) = 1. p = 1/(1.786) = 55.99%.

c) If p = 0.75, then r = q/p = 0.25/0.75 = 1/3.

If the opponent has 10 chips, then P(win tournament) =  $(1-r^2)/(1-r^12) = (1-1/3^2) / (1-1/3^12) \sim 88.88906\%$ . If the opponent has 1000 chips, then P(win tournament) =  $(1-1/3^2) / (1-1/3^1002) \sim 88.88889\%$ .

## 6. Equity gained example.

You have Qc Qd. I have 10s 9s. Board is 10d 8c 7c 4c. Pot is \$5.

The river is 2d, you bet \$3, and I call.

On the river, how much equity did you gain by luck and how much equity did you gain by skill?

Equity gained by luck on river = your equity when 2d is exposed – your equity on turn = 100% (\$5) - 35/44 (\$5) = \$1.02.

Why 35/44? I can win with a 10, 9, 6, or J that's not a club. There are 1 + 2 + 3 + 3 = 9 of these cards, so the remaining 35 cards give you the win.

Equity gained by skill on river = increase in pot on river \* P(you win) – your cost = \$6 \* 100% - \$3 = \$3.



A Bugatti clueless dangerous effect fantacy g h ice j kangaroo LuckyHand monkey notorious oteam punbreak quantity ridrink stopnotch Turnt ustrategy vSweet wbruin