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

Outline for the day

- 1. A quick fact about normals.
- 2. Random walks.
- 3. Reflection principle.
- 4. Ballot theorem.
- 5. Avoiding zero.
- 6. Chip proportions and induction.
- 7. Doubling up.

The computer project is due on Sun Dec1 8:00pm.
HW3 is due Tue Dec3 and is on the course website.
http://www.stat.ucla.edu/~frederic/100a/F19.
Thu Dec5 is the final exam, here in class, 11am to 12:15pm.
Again any notes and books are fine, and bring a pencil and a calculator. Also bring your student ID to the exam.

1. A fact about normals. If X and Y are independent and both are normal, then X+Y is normal, and so are -X and -Y.



\* <u>*Reflection principle*</u>: The number of paths from  $(0,X_0)$  to (n,y) that touch the x-axis = the number of paths from  $(0,-X_0)$  to (n,y), for any n,y, and  $X_0 > 0$ .

- \* <u>Ballot theorem</u>: In n = a+b hands, if player A won a hands and B won b hands, where a>b, and if the hands are aired in random order, P(A won more hands than B *throughout* the telecast) = (a-b)/n.
- [In an election, if candidate X gets x votes, and candidate Y gets y votes, where x > y, then the probability that X always leads Y throughout the counting is (x-y) / (x+y).]
- \* For a simple random walk,  $P(S_1 \neq 0, S_2 \neq 0, ..., S_n \neq 0) = P(S_n = 0)$ , for any even n.

**3. Reflection Principle.** The number of paths from  $(0,X_0)$  to (n,y) that touch the x-axis





For each path from  $(0,X_0)$  to (n,y) that touches the x-axis, you can reflect the first part til it touches the x-axis, to find a path from  $(0,-X_0)$  to (n,y), and vice versa.

Total number of paths from  $(0, X_0)$  to (n, y) is easy to count: it's just C(n,a), where you go up *a* times and down *b* times.

[For example, to go from (0,-10) to (100, 20), you have to "profit" 30, so you go up a=65 times and down b=35 times, and the number of paths is C(100,65).

In general,  $a-b = y - (-X_0) = y + X_0$ . a+b=n, so b = n-a,  $2a-n=y+X_0$ ,  $a=(n+y+X_0)/2$ ].

**4. Ballot theorem.** In n = a+b hands, if player A won a hands and B won b hands,

where a>b, and if the hands are aired in random order,

then P(A won more hands than B *throughout* the telecast) = (a-b)/n.

Proof: We know that, after n = a+b hands, the total difference in hands won is a-b.

Let x = a-b.

We want to count the number of paths from (1,1) to (n,x) that do not touch the x-axis. By the reflection principle, the number of paths from (1,1) to (n,x) that **do** touch the x-axis equals the total number of paths from (1,-1) to (n,x).

So the number of paths from (1,1) to (n,x) that **do not** touch the x-axis equals the number of paths from (1,1) to (n,x) minus the number of paths from (1,-1) to (n,x)  $\neg$ 



And each path is equally likely, and has probability 1/C(n,a).

So, P(going from (0,0) to (n,x) without touching the x-axis = (a-b)/n.

#### 5. Avoiding zero.

For a simple random walk, for any even # n,  $P(S_1 \neq 0, S_2 \neq 0, ..., S_n \neq 0) = P(S_n = 0)$ . Proof. The number of paths from (0,0) to (n, j) that don't touch the x-axis at positive times

- = the number of paths from (1,1) to (n,j) that don't touch the x-axis at positive times
  - = paths from (1,1) to (n,j) paths from (1,-1) to (n,j) by the *reflection principle*

$$= N_{n-1,j-1} - N_{n-1,j+1}.$$
Let  $Q_{n,j} = P(S_n = j)$ . By the logic above,  
 $P(S_1 > 0, S_2 > 0, ..., S_{n-1} > 0, S_n = j) = \frac{1}{2}[Q_{n-1,j-1} - Q_{n-1,j+1}].$ 
Summing from  $j = 2$  to  $\infty$ ,  
 $P(S_1 > 0, S_2 > 0, ..., S_{n-1} > 0, S_n > 0)$ 

$$= \frac{1}{2}[Q_{n-1,1} - Q_{n-1,3}] + \frac{1}{2}[Q_{n-1,3} - Q_{n-1,5}] + \frac{1}{2}[Q_{n-1,5} - Q_{n-1,7}] + ... and these terms are eventually 0$$

$$= (1/2) Q_{n-1,1}.$$

Now note that  $Q_{n-1,1} = P(S_n = 0)$ , because to end up at (n, 0), you have to be at (n-1,1) and then go down, or at (n-1,-1) and then go up. So  $P(S_n = 0) = (1/2) Q_{n-1,1} + (1/2) Q_{n-1,-1} = Q_{n-1,1}$ . Thus  $P(S_1 > 0, S_2 > 0, ..., S_{n-1} > 0, S_n > 0) = \frac{1}{2} P(S_n = 0)$ . By the same arguments,  $P(S_1 < 0, S_2 < 0, ..., S_{n-1} < 0, S_n < 0) = \frac{1}{2} P(S_n = 0)$ . So,  $P(S_1 \neq 0, S_2 \neq 0, ..., S_n \neq 0) = P(S_n = 0)$ .

## 6. Chip proportions and induction, Theorem 7.6.6.

P(win a tournament) is proportional to your number of chips.

Simplified scenario. Suppose you either go up or down 1 each hand, with prob. 1/2. Suppose there are n chips, and you have k of them.

Let  $p_k = P(\text{win tournament given } k \text{ chips}) = P(\text{random walk goes } k \rightarrow n \text{ before hitting } 0).$ 

Now, clearly  $p_0 = 0$ . Consider  $p_1$ . From 1, you will either go to 0 or 2.

So,  $p_1 = 1/2 p_0 + 1/2 p_2 = 1/2 p_2$ . That is,  $p_2 = 2 p_1$ .

We have shown that  $p_j = j p_1$ , for j = 0, 1, and 2.

(*induction:*) Suppose that, for  $j = 0, 1, 2, ..., m, p_j = j p_1$ .

We will show that  $p_{m+1} = (m+1) p_1$ .

Therefore,  $p_j = j p_1$  for all j.

That is, P(win the tournament) is prop. to your number of chips.

 $p_m = 1/2 p_{m-1} + 1/2 p_{m+1}$ . If  $p_j = j p_1$  for  $j \le m$ , then we have  $mp_1 = 1/2 (m-1)p_1 + 1/2 p_{m+1}$ ,

so  $p_{m+1} = 2mp_1 - (m-1) p_1 = (m+1)p_1$ .

- **7. Doubling up.** Again, P(winning) = your proportion of chips.
- Theorem 7.6.7, p152, describes another simplified scenario.
- Suppose you either double each hand you play, or go to zero, each with probability 1/2.
- Again, P(win a tournament) is prop. to your number of chips.
- Again,  $p_0 = 0$ , and  $p_1 = 1/2$   $p_2 = 1/2$   $p_2$ , so again,  $p_2 = 2$   $p_1$ .
- We have shown that, for j = 0, 1, and  $2, p_j = j p_1$ .
- (*induction:*) Suppose that, for  $j \le m$ ,  $p_j = j p_1$ .
- We will show that  $p_{2m} = (2m) p_1$ .

Therefore,  $p_j = j p_1$  for all  $j = 2^k$ . That is, P(win the tournament) is prop. to # of chips.

This time,  $p_m = 1/2 p_0 + 1/2 p_{2m}$ . If  $p_j = j p_1$  for  $j \le m$ , then we have

$$mp_1 = 0 + 1/2 p_{2m}$$
, so  $p_{2m} = 2mp_1$ . Done.

In Theorem 7.6.8, p152, you have k of the n chips in play. Each hand, you gain 1 with prob. p, or lose 1 with prob. q=1-p.

Suppose  $0 and <math>p \neq 0.5$ . Let r = q/p. Then P(you win the tournament) =  $(1-r^k)/(1-r^n)$ . The proof is again by induction, and is similar to the proof we did of Theorem 7.6.6.

## 8. Examples.

- (Chen and Ankenman, 2006). Suppose that a \$100 winner-take-all tournament has  $1024 = 2^{10}$  players. So, you need to double up 10 times to win. Winner gets \$102,400.
- Suppose you have probability p = 0.54 to double up, instead of 0.5.
- What is your expected profit in the tournament? (Assume only doubling up.)
- Answer. P(winning) =  $0.54^{10}$ , so exp. return =  $0.54^{10}$  (\$102,400) = \$215.89. So exp. profit = \$115.89.
- What if each player starts with 10 chips, and you gain a chip with
- p = 54% and lose a chip with p = 46%? What is your expected profit?
- Answer. r = q/p = .46/.54 = .852. P(you win) =  $(1-r^{10})/(1-r^{10240}) = 79.9\%$ . So exp. profit = .799(\$102400) - \$100 ~ \$81700.

### Random Walk example.

- Suppose you start with 1 chip at time 0 and that your tournament is like a simple random walk, but if you hit 0 you are done. P(you have not hit zero by time 47)? We know that starting at 0,  $P(Y_1 \neq 0, Y_2 \neq 0, ..., Y_{2n} \neq 0) = P(Y_{2n} = 0)$ .
- So, for a random walk starting at (0,0),
- by symmetry  $P(Y_1 > 0, Y_2 > 0, ..., Y_{48} > 0) = \frac{1}{2} P(Y_1 \neq 0, Y_2 \neq 0, ..., Y_{2n} \neq 0)$ =  $\frac{1}{2} P(Y_{48} = 0) = \frac{1}{2} Choose(48,24)(\frac{1}{2})^{48}$ .
- Also  $P(Y_1 > 0, Y_2 > 0, ..., Y_{48} > 0) = P(Y_1 = 1, Y_2 > 0, ..., Y_{48} > 0)$
- = P(start at 0 and win your first hand, and then stay above 0 for at least 47 more hands)
- = P(start at 0 and win your first hand) x P(from (1,1), stay above 0 for  $\ge$  47 more hands)
- = 1/2 P(starting with 1 chip, stay above 0 for at least 47 more hands).
- So, multiplying both sides by 2,
- P(starting with 1 chip, stay above 0 for at least 47 hands) = Choose(48,24)( $\frac{1}{2}$ )<sup>48</sup>
- = 11.46%.