STATS 217: Introduction to Stochastic Processes I

Lecture 1

Course information

- Instructor: Vishesh Jain
- TAs: Sohom Bhattacharya, Michael Feldman, Disha Ghandwani.
- Final grade based entirely on 9 problem sets. See "Grading" section of course website for policies and further details.
- Course website: jainvishesh.github.io/STATS217_Winter2021.html.
- There are also associated Canvas and Gradescope sites that you should be enrolled in.

• $X_1, X_2, ...$ is a sequence of independent and identically distributed (i.i.d.) **Rademacher random variables** i.e.,

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 the outcome is heads, she wins \$1 and if the outcome is tails, she loses \$1.
 X_i records the payout to the gambler in the ith round.
- Denote the initial wealth of the gambler by S_0 .
- So, after *n* rounds of betting, the wealth of the gambler is

$$S_n := S_0 + X_1 + \cdots + X_n.$$

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- **Question 5:** How do these answers change if $\mathbb{P}[X_i = 1] = 0.49$?

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- Question 4: " $A=\infty$ ", B=100, find (i) $\mathbb{P}[\tau<\infty\mid S_0=0]$ and (ii) $\mathbb{E}[\tau\mid S_0=0]$.

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• Since f(A) = 1, we must have

$$x = \frac{1}{A + B}$$
.

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- Answer 2: A = 200, B = 100, f(0) = 1/3.

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- **Answer 1:** A = 100, B = 100, f(0) = 1/2.
- Answer 2: A = 200, B = 100, f(0) = 1/3.
- Another interpretation of this scenario is the following: suppose Alice and Bob bet on the outcomes of fair coin tosses. If the outcome is heads, then Bob pays \$1 to Alice, otherwise Alice pays \$1 to Bob. If Alice starts with A and Bob starts with B then the probability that Alice wins everything ('Alice ruins Bob') is

$$\frac{A}{A+B}$$
.

Consider the symmetric simple random walk on the circle with n+1 points, starting from the point marked 0.

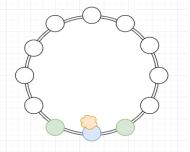


Image courtesy of user 'mark' on math.stackexchange.com

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$$= \mathbb{P}[S_{\tau_{(n-1,-1)}} = n-1 \mid S_0 = 0]$$

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$$= \frac{1}{n}.$$

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$$\begin{split} \mathbb{P}[1 \text{ is the last point visited}] &= \mathbb{P}[2 \text{ is visited before 1}] \\ &= \mathbb{P}[S_{\tau_{(n-1,-1)}} = n-1 \mid S_0 = 0] \\ &= \frac{1}{n}. \end{split}$$

• On the homework, you will show that for all $1 \le k \le n$,

$$\mathbb{P}[k \text{ is the last point visited}] = \frac{1}{n}$$
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- Let $(\Delta h)(k) := h(k+1) h(k)$.
- Then, for all -B < k < A

$$(\Delta(\Delta g))(k-1) = (\Delta g)(k) - (\Delta g)(k-1)$$

$$= g(k+1) - g(k) - g(k) + g(k-1)$$

$$= g(k+1) - (g(k+1) + g(k-1) + 2) + g(k-1)$$

$$= -2.$$

- "Second derivative of g is -2" so $g(k) = -k^2 + Dk + C$.
- Using boundary conditions,

$$g(k) = -(k-A)(k+B).$$

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$$100\ell = \mathbb{E}[\tau_2(\ell) \mid S_0 = 0] \leq \mathbb{E}[\tau_1 \mid S_0 = 0],$$

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• Then, for all $\ell \geq 1$, $\tau_2(\ell) \leq \tau_1$ so that

$$100\ell = \mathbb{E}[\tau_2(\ell) \mid S_0 = 0] \leq \mathbb{E}[\tau_1 \mid S_0 = 0],$$

and now take $\ell \to \infty$.

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 \bullet So, a symmetric simple random walk starting at 0 visits -100 with probability 1. Again, there is nothing special about -100 here.