CS230 SP24

LDoC recap/review

04/24/2024

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- Numbers are not important. What matters is you are able to identify what tool(s) to use for every question and are comfortable with applying them.
 - Therefore, do not fixate on the numerical part of the answers.

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Disclaimer: I wrote this based on the Among us fandom wiki¹ and simplified as necessary. Please do not nitpick if you are an Among us expert.

https://among-us.fandom.com/wiki/

In the most basic setting, players in a game are secretly divided into two teams: Crewmates and Impostors.

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- Note that all the above are known without specifying the underlying probability distribution.

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 - For every two consecutive games, we can define an indicator variable with expectation $\frac{1}{45}$. Using the **linearity of expectation**, the expectation of the sum of these variables is $\frac{44}{45}$. Did you say 1?

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Dressing up



Players in the lobby must select one of the 18 available colors: Red, Blue, Green, Pink, Orange, Yellow, Black, White, Purple, Brown, Cyan, Lime, Maroon, Rose, Banana, Gray, Tan, and Coral. Every player has to have a different color.



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$$\blacktriangleright 18 \times 17 \times 16 \times \ldots \times 9 = \frac{18!}{8!}.$$



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The last step in the inductive step does not hold when k = 1 and (k + 1) = 2. In this case, the two sets P_1 and P_2 are disjoint.



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- In how many different ways can one player customize their look, disregarding color (because that part depends on other players)?
 - Product rule: (99 + 1)(12 + 1)(4 + 1)(2 + 1) = 19500. Note the +1s in each category account for choosing nothing.





Voting happens if someone reports a body or calls an emergency meeting.

Each player can vote for any player, including self, or skip (pass).³

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 - Each player has 11 actions (including skipping), so $11^{10} = 25937424601$.

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- Assume now 9 players are alive and thus can vote. How many different voting results can be displayed now?
 - Stars and bars. We need to distribute 9 votes across 10 candidates (treating all skipped votes as one "candidate"). So 9 stars and 9 bars. This is (⁹⁺⁹₉) = (¹⁸₉) = 48620.

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$$\sum_{x=3}^{4} \binom{8}{2} \cdot \binom{8-2x+5}{5}$$

⁴To sanity check, again verify that when x = 4 the brown part reduces to $1 \rightarrow \langle \Box \rangle + \langle \Box \rangle + \langle \Xi \rangle + \langle \Xi \rangle = \langle O \land O \land O \rangle$

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3. Finally... there may be a 8-way tie with 1 vote.

1

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 - We can denote I, C, and W as being an Impostor, being a Crewmate, and winning the game. Assume all the hidden assumptions hold, we have

 $\Pr[W] = \Pr[W|I] \cdot \Pr[I] + \Pr[W|C] \cdot \Pr[C] = 0.6 \times 0.2 + 0.4 \times 0.8 = 44\%.$

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We can apply Bayes's Theorem:

$$\Pr[I|W] = \frac{\Pr[W|I] \cdot \Pr[I]}{\Pr[W]} = \frac{0.6 \times 0.2}{0.44} = 27.3\%.$$

⁵https://twitter.com/AmongUsGame/status/1334923871611461638

⁶This may have included all settings, not just 10-player 2-impostor games. Moreover, most public lobbies were played without a side voice channel for players to verbally communicate. In late 2020, when a group of streamers played with a Discord voice channel to aid discussion before voting, Impostors only won roughly 30% of the time.

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This evaluates to about 26.3%.



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- Is R a total order? No (not everyone dies).



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How many red venting walks of length at most 8 are there?

This includes entering a vent and staying there (length-0 walks).



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$$\sum_{k=0}^{8} T(k) = 4 + 4 \cdot 2^{1} + \dots + 4 \cdot 2^{8} = 4\left(\frac{1-2^{9}}{1-2}\right) = 2044$$

Don't get caught



Each time Impostors hop in and out of the vent, they risk getting seen by Crewmates.⁷

 $^{^{7}}$ If you vent with a pet, your pet follows you after you jump in, increasing the chance that you get caught. = \sim 2

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- Say there is a 10% chance an Impostor get caught venting each time (independently). If an Impostor keeps venting, what is the expected number of times they can vent without getting caught?

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- What is the variance of this number?
 - The variance of a geometric r.v. is ^{1-p}/_{p²}. We are interested in the r.v. that is this r.v. minus 1, but that doesn't affect the variance. Plugging in p = 0.1, this evaluates to ^{0.9}/_{0.01} = 90.

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It is hot out there



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- We don't know. But using Markov's Bound,

$$\Pr[\text{READING} > 360] < \frac{\mathsf{E}[\text{READING}]}{360} = \frac{5}{6}.$$

It is cold in here



For the temperature inside the laboratory, READING will show a random integer (it now can be negative). The probability distribution of READING is still unknown, but its **expected value** is -30 and its **variance** is 36. What is Pr[READING > 0]?

It is cold in here



For the temperature inside the laboratory, READING will show a random integer (it now can be negative). The probability distribution of READING is still unknown, but its expected value is -30 and its variance is 36. What is Pr[READING > 0]?
 We don't know. But note that the standard deviation is σ_{READING} = √36 = 6. Using Chebyshev's Bound, Pr[READING > 0] ≤ Pr[|READING - E[READING]| > 30]

 $= \Pr[|\texttt{READING} - \textbf{E}[\texttt{READING}]| > 5 \cdot \sigma_{\texttt{reading}}]$

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$$<rac{1}{5^2}=rac{1}{25}=4\%.$$

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WHO IS THE IMPOSTOR??

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WHO IS THE IMPOSTOR??

- Impostor syndrome can happen when people "doubt their skills, talents, or accomplishments and have a persistent fear of being exposed as frauds".⁸
- ▶ NO ONE IS IMPOSTOR HERE. WE ALL BELONG.



⁸Langford, J., & Clance, P. R. (1993). The imposter phenomenon: Recent research findings regarding dynamics, personality and family patterns and their implications for treatment. Psychotherapy: theory, research, practice, training, 30(3), 495.