

# 18.600: Lecture 12

## Poisson random variables

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Poisson random variable definition

Poisson random variable properties

Poisson random variable problems

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- ▶ **Key idea for all these examples:** Divide time into large number of small increments. Assume that during each increment, there is some small probability of thing happening (independently of other increments).

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- ▶ Can also change sign:  $e^{-\lambda} = \lim_{n \rightarrow \infty} (1 - \lambda/n)^n$ .

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- ▶ This is one way to *remember* the Poisson probability mass function. Just remember that it comes from Taylor expansion of  $e^{\lambda}$ .

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  - ▶  $e^{-\lambda}$  is approximate probability of all tails sequence.
  - ▶  $\lambda^k$  comes from fact that *given* sequence with  $k$  heads is  $(\lambda/n)^k$  times more probable than *given* sequence with zero heads.
  - ▶  $k!$  is “ordered vs. unordered overcount factor.”

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- ▶ **Mnemonic:** binomial has variance  $npq$ , and Poisson is obtained by fixing  $\lambda = np$  and taking  $q \rightarrow 1$ , so Poisson has variance  $\lambda = np$ . It's like  $npq$  without the  $q$ .

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- ▶ Setting  $j = k - 1$ , this is  $\lambda \sum_{j=0}^{\infty} \frac{\lambda^j}{j!} e^{-\lambda} = \lambda$ .

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- ▶ Then  $\text{Var}[X] = E[X^2] - E[X]^2 = \lambda(\lambda+1) - \lambda^2 = \lambda$ .

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- ▶ Assuming this, what is the probability of exactly 2 crashes? Of zero crashes? Of four crashes?
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- ▶ Expected number of royal flushes is  $\lambda = 10^6 \cdot 4/\binom{52}{5} \approx 1.54$ . Answer is  $e^{-\lambda}\lambda^k/k!$  with  $k = 2$ .

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