Likelihood Functions

The probability mass function (PMF) for a Poisson distribution with parameter λ is:

$$P(X=k) = \frac{e^{-\lambda}\lambda^k}{k!}.$$

We think of λ as a constant and k as the input variable. But what if we know k, and don't know λ ? When we treat k as a constant and λ as a variable, we get the **Likelihood** function:

$$L(\lambda \mid X = k) = \frac{e^{-\lambda}\lambda^k}{k!}.$$

Intuitively, $L(\lambda | X = k)$ is the likelihood that parameter λ has a particular value, given the outcome for X that we saw. It is a function of λ , and sometimes we just write $L(\lambda | X)$ or even just $L(\lambda)$ to emphasize this. You create likelihood functions for continuous random variables the same way, except using probability density functions (PDFs) instead of PMFs.

- 1. Some geologists set up monitoring equipment to find out how often a small island has major earthquakes. Let X be the time until they detect the first major earthquake and assume that $X \sim \text{Exp}(\lambda)$ so the PDF is: $f_X(x) = \lambda e^{-\lambda x}$.
 - (a) If it takes X = 4 years until the first major earthquake, then what is the likelihood function $L(\lambda | X = 4)$?

(b) **Important:** The likelihood function is not the probability distribution for λ . But you can use it to say that certain values of the parameter λ are more likely than others, given our observation that X = 4. How many times more likely is it that $\lambda = \frac{1}{5}$ than that $\lambda = 1$ according to the likelihood function above?

(c) Take the derivative of the likelihood function in part (a) to find the value of λ with the maximum likelihood. Then graph the likelihood function and see if you got the right answer.

- 2. You visit a large university and are wondering how many of the students are science majors. You pick one random student and find out that she is a science major. Let X be the random variable representing whether a student is a science major (so the values that X can take are either 1 if a student is a science major, or 0 if they are not). Assume that the true proportion of students on campus who are science majors is p.
 - (a) What is the probability distribution for X and what is its probability mass function?

(b) What is the likelihood function for the parameter p given that x = 1?

- 3. What if, instead of interviewing one student, you took a random sample of six students and 2 of the 6 were science majors. You can think of the number of science majors in the sample as a random variable with the binomial distribution Binom(6, p).
 - (a) What is the likelihood function for p given that there were 2 science majors in our sample?

(b) Show that the maximum value of the likelihood function L(p | x = 2) occurs when $p = \frac{1}{3}$. Hint: it is often easier to maximize the log-likelihood function, which is just the natural logarithm of L(p).