

# STATISTICAL INFERENCE

ETHAN LEVIEN

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### 1. STATISTICAL INFERENCE FOR BERNOULLI RANDOM VARIABLES

Let's imagine we do in fact conduct a survey of  $n = 20$  students and find  $k = 3$  students identify as republicans.

**Exercise 1.** *Based only on this information (and not your previous experience) what is your best guess of  $q$ ?*

Can we make this a little more precise? Recall that if each individual data point  $y_i$  has a Bernoulli distribution, then the a number of people,  $k$ , who responded saying they are republican's follows a Binomial distribution:

$$(1) \quad p(k|q) = \sum \binom{n}{k} q^k (1-q)^{n-k}$$

This equation tells us how likely it is to observe  $k$  yeses among  $n$  people surveyed. Then, it seems reasonable that this number should not be very small, since that would mean our survey results are an anomaly. In fact, the larger this number is, the more "typical" our results are. This provides us with a way to determine  $q$ : We can take as our estimate  $\hat{q}$  the value which makes  $p(k|q)$  largest. You can do this using calculate

$$(2) \quad \hat{q} = \frac{k}{n}$$

This is not the only way to estimate  $q$ , but it is the most natural and widely used. We call estimates like this one, which are obtained by maximizing the probability distribution evaluated at the data, or **likelihood**, maximum likelihood estimates, or MLEs. They are useful, but as we learn later on, they are not the entire story.

A question we often ask about any sort of estimate is: How accurate is this? For example, if we survey  $n = 10000$  people and find 5000 respond YES, our estimate of  $\hat{q} = 1/2$  is clearly more reliable than if we had surveyed  $n = 4$  and received 2 YES. In classical statistics, we measure accuracy using the standard error, denoted  $se(\hat{q})$ . Roughly speaking, if we performed many experiments and measured  $\hat{q}$ , the measurements will typically differ by  $se(\hat{q})$ . I

$$(3) \quad se(\hat{q}) = \sqrt{\frac{\hat{q}(1-\hat{q})}{n}}$$

### 2. STATISTICAL INFERENCE FOR NORMAL RANDOM VARIABLES

Now let's think about statistical inference for a Normal random variable.