

# Math 362: Mathematical Statistics II

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# Chapter 5. Estimation

§ 5.1 Introduction

§ 5.2 Estimating parameters: MLE and MME

§ 5.3 Interval Estimation

§ 5.4 Properties of Estimators

§ 5.5 Minimum-Variance Estimators: The Cramér-Rao Lower Bound

§ 5.6 Sufficient Estimators

§ 5.7 Consistency

§ 5.8 Bayesian Estimation

# Plan

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**Motivating example:** Given an unfair coin, or  $p$ -coin, such that

$$X = \begin{cases} 1 & \text{head with probability } p, \\ 0 & \text{tail with probability } 1 - p, \end{cases}$$

how would you determine the value  $p$ ?

**Solutions:**

1. You need to try the coin several times, say, three times. What you obtain is “HHT”.
2. Draw a conclusion from the experiment you just made.

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**Rationale:** The choice of the parameter  $p$  should be the value that maximizes the probability of the sample.

$$\begin{aligned}\mathbb{P}(X_1 = 1, X_2 = 1, X_3 = 0) &= P(X_1 = 1)P(X_2 = 1)P(X_3 = 0) \\ &= p^2(1 - p).\end{aligned}$$

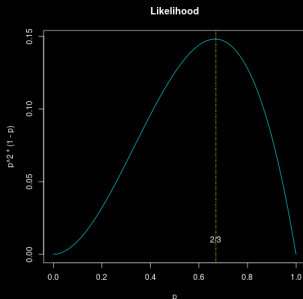
```
1 # Hello, R.  
2 p <- seq(0,1,0.01)  
3 plot(p,p^2*(1-p),  
4       type="l",  
5       col="red")  
6 title ("Likelihood")  
7 # add a vertical dotted (4) blue line  
8 abline(v=0.67, col="blue", lty=4)  
9 # add some text  
10 text(0.67,0.01, "2/3")
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Maximize  $f(p) = p^2(1 - p) \dots$

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**A random sample of size  $n$  from the population – Bernoulli( $p$ ):**

- ▶  $X_1, \dots, X_n$  are i.i.d.<sup>1</sup> random variables, each following Bernoulli( $p$ ).
- ▶ Suppose the outcomes of the random sample are:  $X_1 = k_1, \dots, X_n = k_n$ .
- ▶ What is your choice of  $p$  based on the above random sample?

$$p = \frac{1}{n} \sum_{i=1}^n k_i =: \bar{k}.$$

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<sup>1</sup>independent and identically distributed

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**A random sample of size  $n$  from the population with given pdf:**

- ▶  $X_1, \dots, X_n$  are i.i.d. random variables, each following the same given pdf.
- ▶ a **statistic** or an **estimator** is a function of the random sample.

Statistic/Estimator is a random variable!

e.g.,

$$\hat{p} = \frac{1}{n} \sum_{i=1}^n X_i.$$

- ▶ The outcome of a statistic/estimator is called an **estimate**. e.g.,

$$p_e = \frac{1}{n} \sum_{i=1}^n k_i.$$

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