

Today's Agenda

- Thinking Statistically
- Review Bayes Rule (in brief)
- Review sampling distribution ✓
- Review some Julia bits (if time)

2 kinds of Prob.

- ① classical / frequentist
- ② subjectivist / Bayesian

Thomas Bayes

(LLN & CLT)

Monte Carlo Simulation

key methodology

# Bayes' Rule

- A probability statement a/b conditional prob's

- We're interest in some event A

- We observe the outcome of some event B

\* Glossary  
 - Random variable  
 - observations (data)  
 - observed variable

$$\frac{\underbrace{P(B|A)}_{\text{likelihood}} \underbrace{P(A)}_{\text{prior}}}{\underbrace{P(B)}_{\text{marginal of B}}}$$

$$\underbrace{P(A|B)}_{\text{Posterior}} = \frac{\underbrace{P(A|B)}_{\text{interest of random variable}} \times \underbrace{P(B)}_{\text{observation}}}{\text{conditional prob.}}$$

Bayes Rule =  
 updating beliefs in the light of evidence

Prior: a statement a/b our beliefs before we see the data

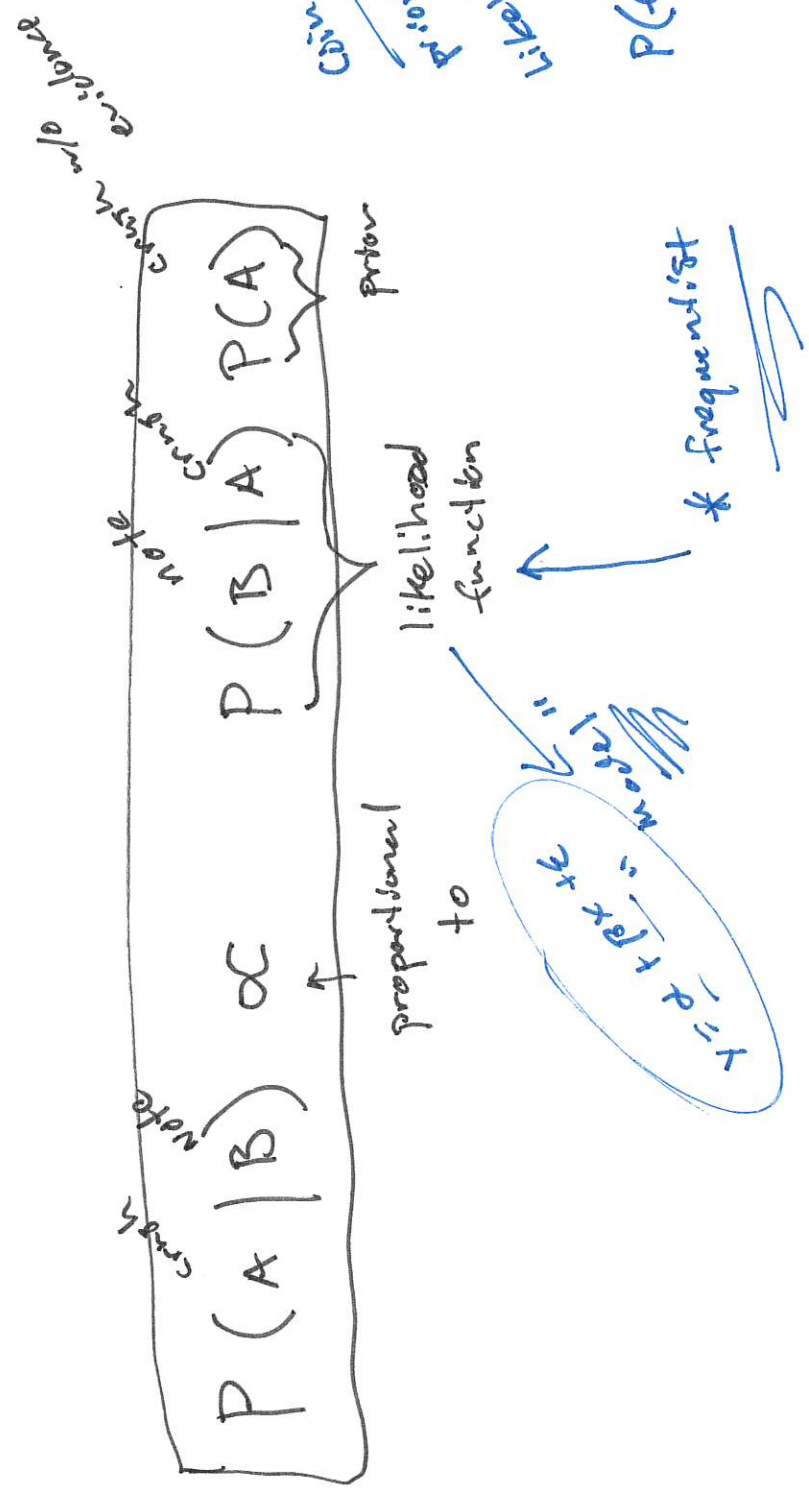
Posterior: updated belief after we see the data

③

- online algorithm: optimal for sequential data process

- information processing / updating beliefs

- Understanding Bayes' rule is what it means to "think statistically"



difficult to estimate

The Frequentist

$P(\theta) = \text{prob. heads}$

$$\hat{\theta} = \frac{\# \text{ heads}}{\# \text{ flips}} \quad \text{MLE}$$

prob. dist.



PDF  $f(x; \mu, \sigma)$

$N(\mu, \sigma)$

"Truth"

Platonic

Population: object of interest

Sample: data that results from an experiment

Sampling Distribution

(LW)

Law of Large Numbers } Intro stats classes

Central Limit Theorem (CLT)

Q?

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- As  $n \rightarrow \infty$ , our estimator  $\bar{X}$  gets closer and closer to a Normal distribution for

its sampling distribution

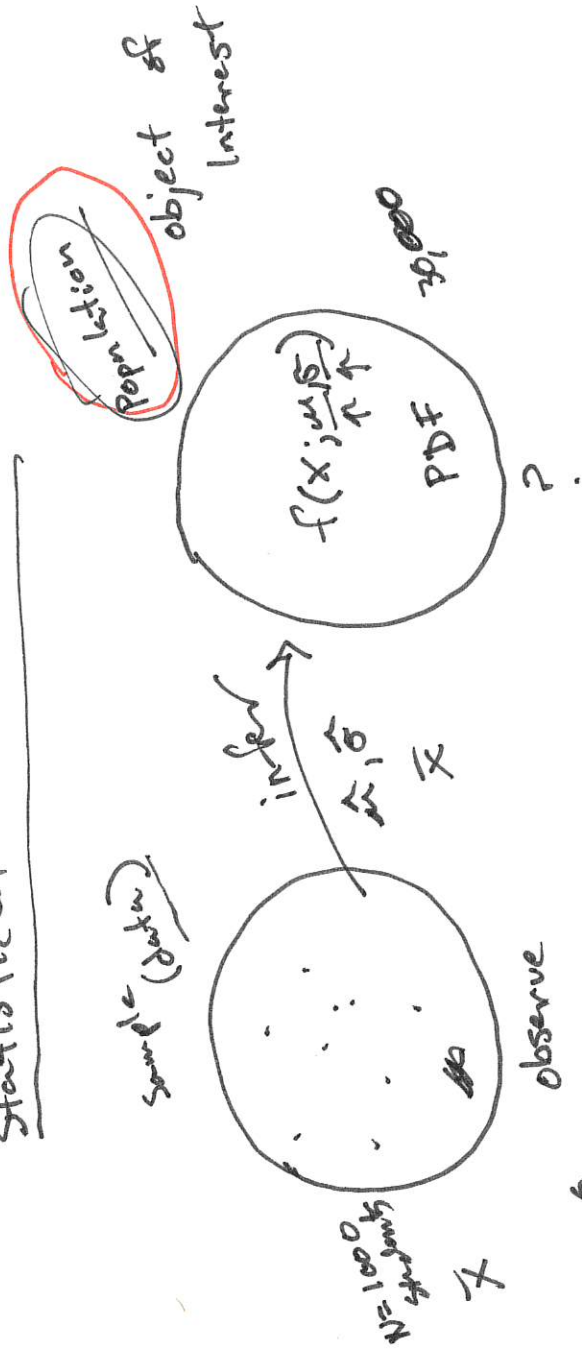
- Q: What is the Sampling Distribution?

- The statistical distribution of an

estimator

- Q: Estimator:

# Statistical Inference.



$$\bar{X} = \frac{1}{n} \sum x_i$$

Sample mean

$$E(\bar{X}) = \mu$$

$$E(\hat{\beta}) = \beta$$

statement the sampling dist of  $\bar{X}$

sampling dist  $\rightarrow$  like 1, 2, 3, 4, 5, 6, 7, 8, 9, 10

# Visualize the Frequentist Prob.

Multiverse  
parallel universe

Population  
 $\mu, \sigma$  or  $\theta$   
? inference about this  
probability density  
Population ~ Data Generating Process

Sampling process

Universe  $j = M = 100,000$

... ..

Sample 3  $j=3$

Sample 2  $j=2$

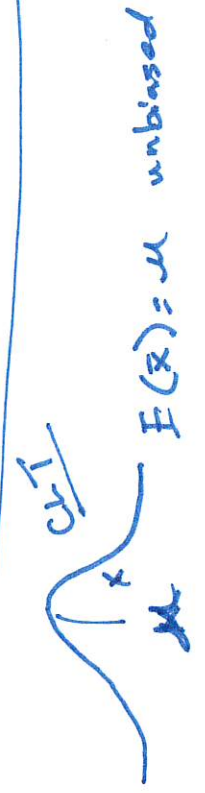
obs  $i=1 \dots n$   
Sample  $\bar{x}_1, s_1, \dots$   
 $j=1$

yield  $\bar{x}_1$   
in universe 1  
sample = universe 1

$\bar{x}_2$

$\bar{x}_3$

$\bar{x}_M$





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