

WED OCT 25

NOTE HW DUE TUESDAY IS ALWAYS DISCUSSED MONDAY CLASS
IF YOU ARE NOT UNDERSTANDING ASSIGNMENT, YOU SHOULD BE
ATTENDING CLASS

TODAY: T-test, confidence intervals, example when distribution is not Normal
POWER OF TESTS

REVIEW:

X_1, X_2, \dots, X_n IID $\mu = E(X_i)$ $\sigma^2 = \text{Var}(X_i)$ unknown
DISTRIBUTION NOT SPECIFIED
DIST'N OF \bar{X} is approx. $\mu = \int_{-\infty}^{\infty} x f_X(x) dx$ \leftarrow pdf of X_i
USE \square to est. μ , \square to estimate σ^2 $S^2 = \frac{1}{n-1} \sum_{i=1}^n (X_i - \bar{X})^2$

Questions

- (1) How do we evaluate evidence against specific null-hypotheses?
- (2) How do we quantify uncertainty in estimate of μ ?
- (3) What is role of simulation vs theory?
Why simulate/how?

Review:

DATA numbers

MODEL: formulate a probability model for data

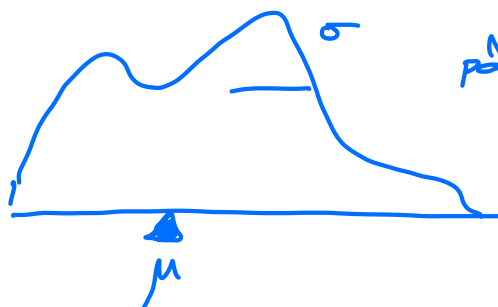
context dependent

library distribution

unknown parameters

geometric, Binomial, Poisson, Normal
 \leftrightarrow pick parameter values so
distribution approx data best

maximum likelihood estimation is algorithm for
finding good parameter values for data



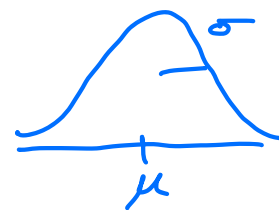
pdf of X

$$\mu = E(X)$$

$$\sigma^2 = \text{Var}(X)$$

$$= \int_{-\infty}^{\infty} (x - \mu)^2 f(x) dx$$

$$\sigma = \sqrt{\sigma^2}$$



μ, σ numerical quantities (not random)
property of pdf/pdf of X_i

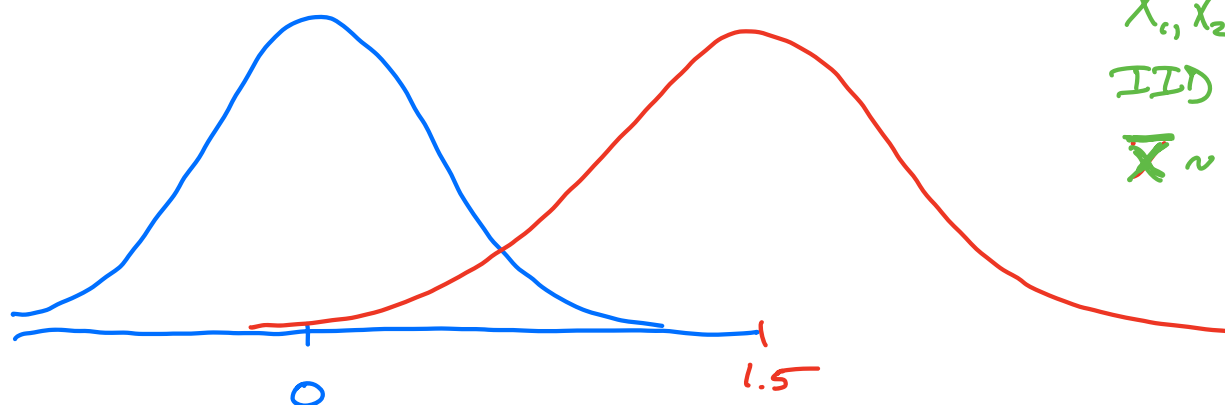
Guess μ, σ from data:
↓ unknown parameters

x_1, x_2, \dots, x_n
 $\bar{X} = \frac{1}{n} \sum_{i=1}^n x_i$ sample average

\bar{X} guess at μ
 S^2 guess at σ^2

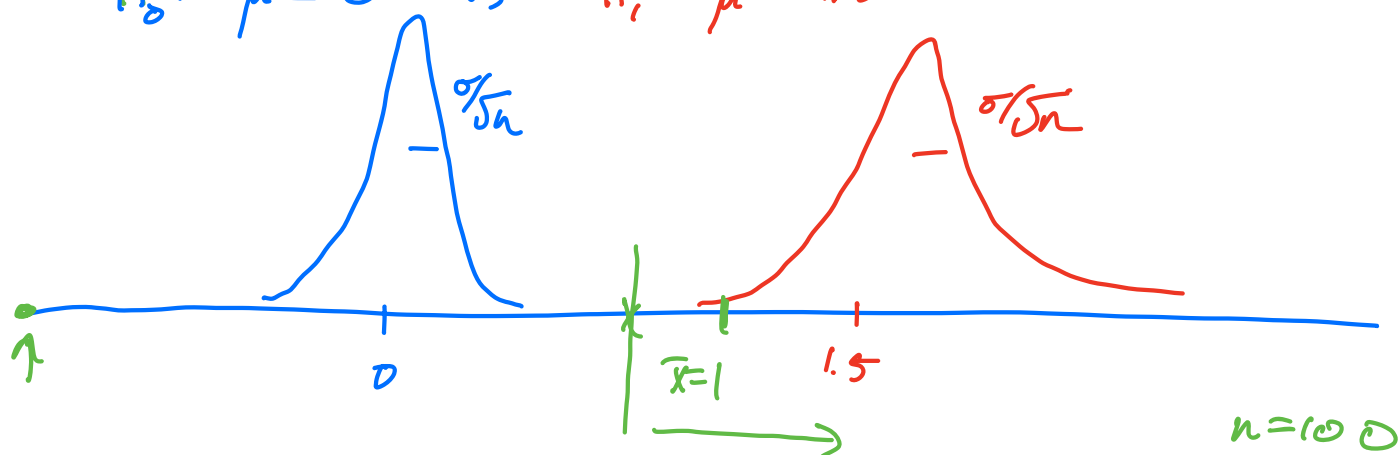
$$S^2 = \frac{1}{n-1} \sum_{i=1}^n (x_i - \bar{x})^2$$

↑
data dependent statistics



x_1, x_2, \dots, x_n
IID $N(\mu, \sigma^2)$
 $\bar{X} \sim N(\mu, \frac{\sigma^2}{n})$
↑ ↑
 $E(\bar{X})$ $Var(\bar{X})$
SD = σ/\sqrt{n}

$H_0: \mu = 0$ is $H_1: \mu = 1.5$



Compute p-value: Assume null hypothesis

"Prds of observing data at least as extreme as observed data, assuming NULL is true"

$P(\bar{X} \geq 1)$

↑
Normal $(0, \sigma)$ scale = σ
estimated
SD = ?

$$\sigma = \sqrt{\frac{1}{n-1} \sum (x_i - \bar{x})^2} = \text{np.std}(x)$$

$$\frac{\sigma}{\sqrt{100}}$$

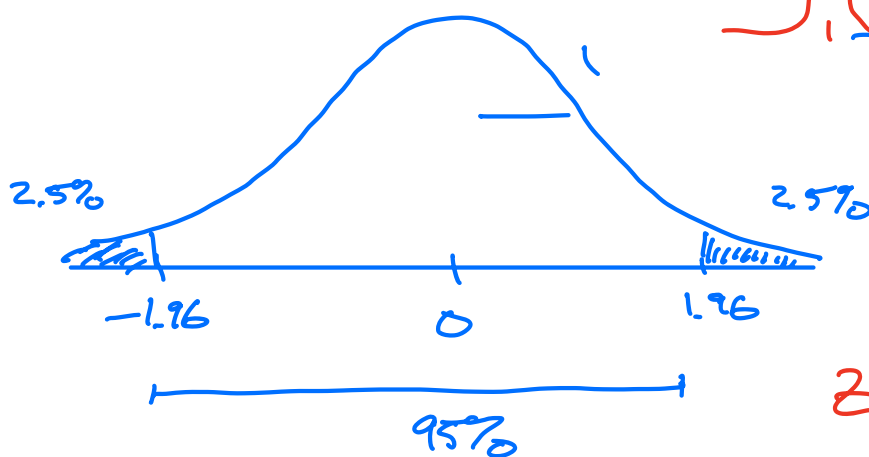
(If $n=100$)

NOT QUITE CORRECT BUT CLOSE

z-test \swarrow μ_0 requested value under null

$$Z = \frac{\bar{X} - \mu_0}{\sigma/\sqrt{n}} \leftarrow \text{SD of } \bar{X}$$

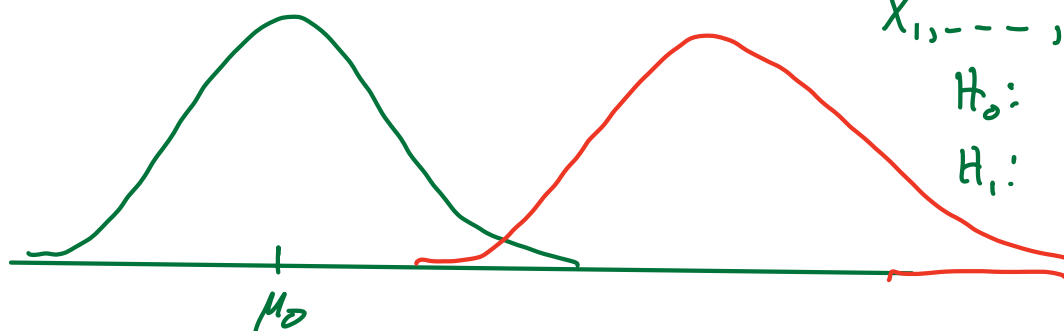
$$Z \sim N(0, 1)$$



$Z < -2$ OR $Z > 2$
occurs w/ prob 0.05
If null is correct

$$T = \frac{\bar{X} - \mu_0}{\sigma/\sqrt{n}}$$

t-distribution \sim w/ $n-1$ deg. of freedom



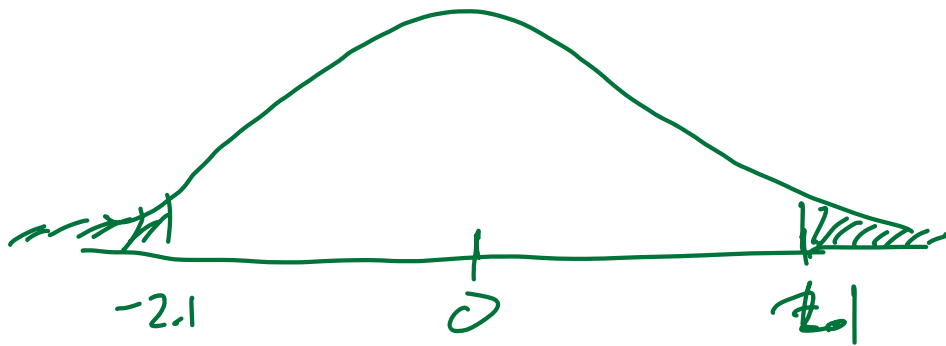
$$X_1, \dots, X_n \sim N(\mu, \sigma^2)$$

$$H_0: \mu = \mu_0$$

$$H_1: \mu \neq \mu_0$$

known prob distri

$$t = 2.1$$



Confidence intervals

x_1, \dots, x_n IID $N(\mu, \sigma^2)$

$$\mathbb{P}(-1.96 \leq \frac{\bar{X} - \mu}{\sigma/\sqrt{n}} \leq 1.96) = 0.95$$

$\hookrightarrow N(0,1)$

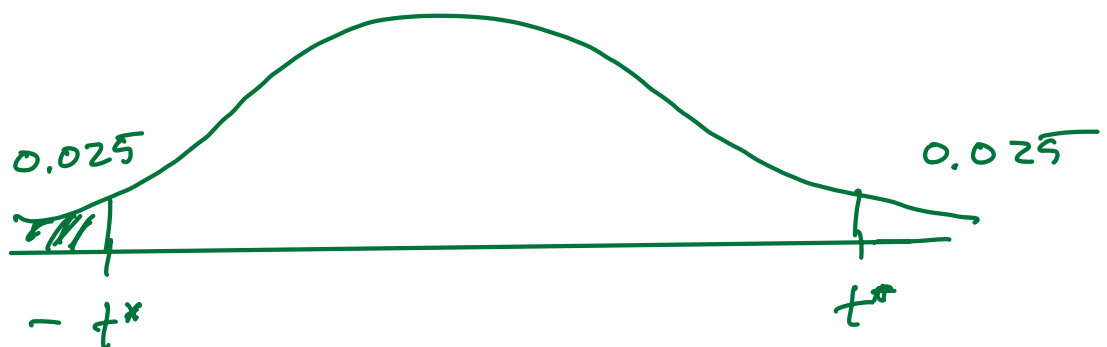
$$\mathbb{P}(\bar{X} - 1.96 \sigma/\sqrt{n} \leq \mu \leq \bar{X} + 1.96 \sigma/\sqrt{n}) = 0.95$$

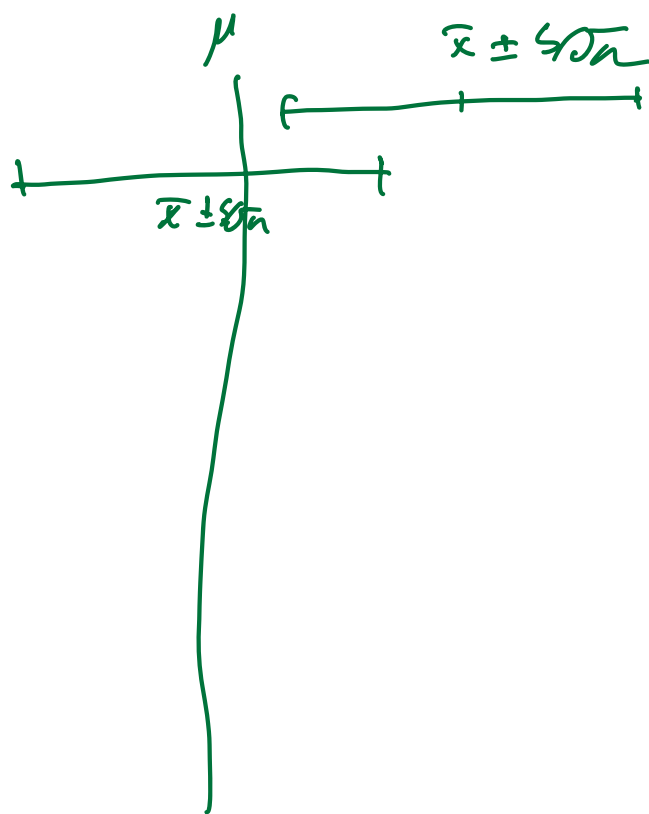
$\bar{x} \pm 1.96 \sigma/\sqrt{n}$ is a 95% conf. interval

$$\bar{x} \pm \boxed{2} s/\sqrt{n}$$

\uparrow
t distribution

$$s = \hat{\sigma} = \sqrt{\frac{1}{n-1} \sum (x_i - \bar{x})^2}$$





BAD

GOOD