

Lecture 7 : 2/21/19

Recall $P(\theta) = U(0,1) = \text{Beta}(1,1)$

for $X=1, n=2 \Rightarrow P(\theta|X) = \text{Beta}(x+\alpha, n-x+\beta) = \text{Beta}(2,2)$

How can we make a set R s.t. $P(\theta \in R|X) = 1-\alpha$
where R is in the "middle" of $\theta|X$

$$\text{ie } \int_R P(\theta|X) d\theta = 1-\alpha$$

So let's define $CR_{\theta, 1-\alpha} := [\text{Quantile}[\theta|X, \frac{\alpha}{2}], \text{Quantile}[\theta|X, 1-\frac{\alpha}{2}]]$

here $CR_{\theta, 95\%} = [q_{\text{beta}}(.025, 2, 2), q_{\text{beta}}(.975, 2, 2)] = [.094, .906]$

- 1) 95% chance $\theta \in CR$, given prior data
- 2)

If we did this the frequentist way w/ $\hat{\theta}_{MLE} = 0.5$

$$CI_{\theta, 95\%} = [0.5 \pm 1.96 \sqrt{\frac{0.5(1-0.5)}{2}}] = [-0.2, 1.2]$$

This ~~doesn't~~ doesn't have a big enough n for a normal distribution
 \Rightarrow at least Bayesian tells us SOMETHING.

Above was a Bayesian 2-Sided Credible Region. Let's try 1-Sided:

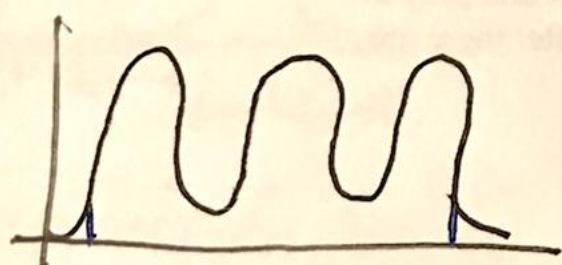
LEFT: $CR_{L, \theta, 1-\alpha} := [\text{smallest value } \theta \text{ or } -\infty, Q[\theta|X, 1-\alpha]]$
in our example: $= [0, q_{\text{beta}}(.95, 2, 2)] = [0, .864]$
"95% chance θ is at most .864"

RIGHT: $CR_{R, \theta, 1-\alpha} := [Q[\theta|X, 1-\alpha], \text{largest value in } \theta \text{ or } \infty]$
 $= [q_{\text{beta}}(.95, 2, 2), 1] = [.135, 1]$
"95% chance θ is greater than .135"

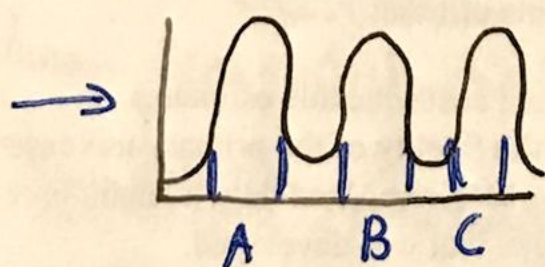
HDR is nicer b/c it's smaller. Though it is more difficult to calculate, making it computationally expensive. Also, it is fragmented which is annoying.

\Rightarrow is this even useful...?

BUT WHAT IF MY POSTERIOR LOOKS LIKE



$CR_{\theta, 1-\alpha}$
is not so bueno



HDR (High Density Region)

$$HDR = A \cup B \cup C$$

$$P(\theta \in HDR|X) = 1-\alpha$$

More bueno \rightarrow

[On to theory testing] \rightarrow

Review for prev. students...

THEORY TESTING

You wish to convince people of H_a : Alternate Hypothesis when they all believe H_0 : null hypothesis.

- (I) Assume H_a and wait for others to disprove based on evidence (word placing of Burden of Proof)
- (II) Assume H_0 and demonstrate contradictory evidence until others reject H_0

It is intellectually honest, which forces you to provide evidence for your claim ~~to~~ convince beyond a reasonable doubt. α level

ARE UFO'S AND ALIENS REAL?

~~H_0 : They exist~~
 H_a : They don't exist

if I have a high α maybe you can convince me of H_a ... if low α good luck

(II) H_0 : Don't exist
 H_a : Exist

now I'll be nicer, join your side and show you that aliens exist, and the higher your α -level the easier I can convince you of H_a .

In our application, we look at common H_a 's

- (I) $H_a: \theta \neq \theta_0 \rightarrow H_0: \theta = \theta_0$
- (II) $H_a: \theta < \theta_0 \rightarrow H_0: \theta \geq \theta_0$
- (III) $H_a: \theta > \theta_0 \rightarrow H_0: \theta \leq \theta_0$

For II, III we calculate a Bayesian P_{val}

$$P_{val} = P(H_0 | x) < \alpha$$

lets standardize a default $\alpha = 5\%$

Flip a coin 100 times, get 61 heads. Is the coin weighted?
 assume $P(\theta) = U(0,1)$, $\alpha = 5\%$

$$p(\theta | x) = \text{Beta}(61+1, 39+1)$$

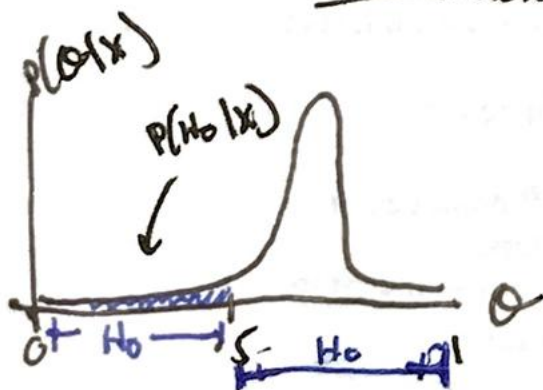
$H_0: \theta \leq 0.5$
 $H_a: \theta > 0.5$

CDF of Beta
 $F_{0.5}(0.5)$

(p = probability is CDF
 q = quantile)

$$P_{val} = P(H_0 | x) = P(\theta \leq 0.5 | x) = \int_0^{0.5} \frac{1}{B(62, 40)} \theta^{61} (1-\theta)^{39} d\theta \xrightarrow{\text{computer}} \text{pbeta}(0.5, 62, 40) = 0.014 < \alpha = 0.05$$

therefore ~~we conclude~~ we reject H_0 and conclude that the coin is unfairly weighted



Uber Driver did 200 rides w/ 37 5-stars reviews
 IF $\theta < 0.25\%$ then Uber fires the driver

Prob. of 5 star rating

assume $P(\theta) = U(0,1)$, $\alpha = 5\%$

$$\Rightarrow p(\theta | x) = \text{Beta}(38, 164)$$

$H_0: \theta \geq 0.25$

$H_a: \theta < 0.25$

$$P_{val} = P(H_0 | x) = P(\theta \geq 0.25 | x) = \int_{0.25}^1 \frac{1}{B(38, 164)} \theta^{37} (1-\theta)^{126} d\theta$$

$$= 1 - \text{pbeta}(0.25, 38, 164) = 0.17 < \alpha \therefore \text{reject } H_0 \text{ and fire driver}$$

If we ask the question "is coin fair" we will end up integrating $0.5 \rightarrow 0.5$, which gives $P_{val} = 0$ b/c $P(x=x)$ for a continuous RV $= 0$ always. ~~So, we finally~~ H_0 Can do 2 things

next ps

qbeta does integral up to point K
 pbeta does integral to specified point
 qbeta spits out K, pbeta takes K
 and spits out area
 inverse operations