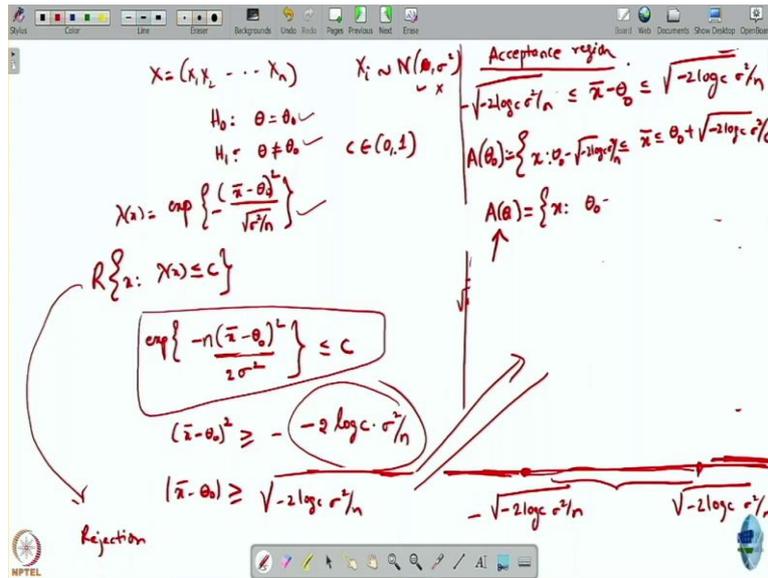


**Engineering Statistics**  
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**Week 11**  
**Lecture 51**  
**Tautology of tests and confidence intervals**

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Last time we discussed, started discussing about what are confidence intervals and what is confidence coefficient and how to construct confidence intervals. Now, today we will continue the discussion of how to construct confidence intervals and this time we will see how to use the tests basically the hypothesis tests to come up with a confidence sets.

So, last time we discussed this let us say hypothesis I want to distinguish between two hypotheses  $H_0$  or not. And then we know for this when the samples are coming from Gaussian distribution, this is the likelihood ratio test we get. And then if  $x$  is given to me, I can test the condition whether this quantity is less than or equals to  $c$  and it will give rise to a condition. Now, let us get started with this today, from this point.

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$$R = \left\{ x: \exp\left\{-\frac{n(\bar{x}-\theta)^2}{2\sigma^2}\right\} \leq c \right\}$$

$$\exp\left\{-\frac{n(\bar{x}-\theta)^2}{2\sigma^2}\right\} \leq c \Rightarrow (\bar{x}-\theta)^2 \geq -\frac{2\sigma^2}{n} \log c.$$

$$\frac{|\bar{x}-\theta|}{\frac{\sigma}{\sqrt{n}}} \geq \sqrt{-2 \log c}$$

$$\Rightarrow R = \left\{ x: \frac{\bar{x}-\theta_0}{\frac{\sigma}{\sqrt{n}}} \geq \sqrt{-2 \log c} \text{ \& } \frac{(\bar{x}-\theta)}{\frac{\sigma}{\sqrt{n}}} \leq -\sqrt{-2 \log c} \right\}$$

$$R = \left\{ x: \bar{x} \geq \theta_0 + \frac{\sigma}{\sqrt{n}} \sqrt{-2 \log c} \text{ \& } \bar{x} \leq \theta_0 - \frac{\sigma}{\sqrt{n}} \sqrt{-2 \log c} \right\}$$

$$A = \left\{ x: \frac{\bar{x}-\theta_0}{\frac{\sigma}{\sqrt{n}}} \geq \sqrt{-2 \log c} \text{ \& } \frac{(\bar{x}-\theta)}{\frac{\sigma}{\sqrt{n}}} \leq -\sqrt{-2 \log c} \right\}$$

$$A = \left\{ x: \frac{\bar{x}-\theta_0}{\frac{\sigma}{\sqrt{n}}} \geq \sqrt{-2 \log c} \text{ \& } \frac{(\bar{x}-\theta)}{\frac{\sigma}{\sqrt{n}}} \leq -\sqrt{-2 \log c} \right\}$$

$\left\{ x \in R \right\} \rightarrow \text{Type I error}$

So, we know that exponential minus n x bar minus theta not minus 2 sigma square. This is going to be less than a request to c, this is my rejection region. Now, let us focus on this. Now, we can invert this exponential minus n x bar theta not by 2 sigma square by less than c I can write it as x bar, so there is a squared here I missed, x bar by theta not to be less than or equals to and then this is 2 sigma square by n log c. Now, this is less than or equals to because of the minus sign, there is a minus sign here which I have taken on the other side.

Student: (())(02:46).

Professor Manjesh Hanawal: Okay, sorry, you mean this. That is fine. Now, we also said x bar minus theta not, this should be minus sigma or maybe we said, further I can take it down this two sigma, sorry the sigma square n and the denominator and then square root, do the square root both sides then I am going to get minus 2 log c.

So, this is basically I will get the condition and we say that this is basically the rejection region I can write this is set of all points such that x bar minus theta if this is, yeah, this should be if it is a plus we said that this should be sigma square by n should be greater than or equals to minus 2 log c. And maybe I should have, that is x bar minus theta not by sigma square by n will be minus 2 log c and if and x not minus theta, this is the negative.

We said that this is minus if I take this should be less than or equals to minus 2 log c. And I think there should be a square root here also. If my x bar minus theta divided by this quantity happens to be greater than this, this should happen. And now, I can similarly can come up

with the acceptance region. So, last time we said that so, now, I see. So, now,  $\bar{x} - \theta$ , let us say or like.

So,  $\bar{x}$  let us say plus  $\theta$  plus, I am just taking this or maybe let me rewrite here itself. If  $R$  is equals to such that, if you are  $x$  such that  $\bar{x}$  is greater than or equal to  $\theta + \frac{\sigma^2}{n} - 2 \log c$  and  $\bar{x}$  is less than, this should be just a minute  $\theta - \frac{\sigma^2}{n} - 2 \log c$ . So, we said that, this will give me, so this quantity here maybe we can say and maybe this quantity is here.

And whenever my  $x$  such that the value falls in this region, I am going to, sorry outside this, either this region or this region I am going to reject and if it falls in between this I am going to accept and that acceptance region is called as  $A$ , that acceptance is easier to write. So, this is nothing but  $\theta + \frac{\sigma^2}{n} - 2 \log c$   $\theta - \frac{\sigma^2}{n}$ .

So, now, I want to do a little manipulation on this side,  $A$  is nothing but  $x$  such that  $\bar{x} - \theta \leq \frac{\sigma^2}{n} - 2 \log c$  and  $\bar{x} - \theta \geq -\frac{\sigma^2}{n} - 2 \log c$ . So, this is my acceptance region. And now, let us say if I compute probability that my  $\theta$ , maybe instead of this let us say I compute probability that  $x$  belongs to  $R$ . When the true parameter  $\theta$  itself, what is the error this one gives you? This will give you a type 1 error.

So, now before I continue to say in a way this is already giving me some kind of hint that I am looking for  $x$  to be in this particular interval, when I have to accept  $x$  to belonging to this my null hypothesis, it has to belong to this. So, this is if I am going to invert this. Here, I am looking as a function of  $x$ .

But what if I fix  $x$  here and look for all  $\theta$ , which satisfies this condition? Maybe that will give me a range of  $\theta$ s that potentially explains this sample  $x$ . In that way we can invert this to get up our confidence set. Before we go into that, let us look, I want to write this in a simplified term.

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$Z \sim N(0, 1)$ : for a given  $\alpha$ ,  $z_{\alpha/2}$  be such that  

$$Pr\{Z \geq z_{\alpha/2}\} = \alpha$$

$$Pr\left\{\frac{|\bar{x} - \theta_0|}{\sqrt{\sigma^2/n}} \geq \sqrt{-2 \log c}\right\}$$
 Type-I Error.  

$$Pr\left\{\frac{|\bar{x} - \theta_0|}{\sqrt{\sigma^2/n}} \geq \sqrt{-2 \log c}\right\} = \alpha$$

$$\sqrt{-2 \log c} = z_{\alpha/2}$$

$$c = \exp\left\{-\frac{z_{\alpha/2}^2}{2}\right\}$$


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$$A = Pr\left\{x: -z_{\alpha/2} \leq \frac{\bar{x} - \theta_0}{\sqrt{\sigma^2/n}} \leq z_{\alpha/2}\right\}$$

$$A = Pr\left\{x: -z_{\alpha/2} \sqrt{\sigma^2/n} + \theta_0 \leq \bar{x} \leq z_{\alpha/2} \sqrt{\sigma^2/n} + \theta_0\right\} = 1 - \alpha$$

$$R = \left\{x: \exp\left\{-\frac{n(\bar{x} - \theta_0)^2}{2\sigma^2}\right\} \leq c\right\}$$

$$\exp\left\{-\frac{n(\bar{x} - \theta_0)^2}{2\sigma^2}\right\} \leq c \Rightarrow (\bar{x} - \theta_0)^2 \geq \frac{2\sigma^2}{n} \log c$$

$$\frac{|\bar{x} - \theta_0|}{\sqrt{\sigma^2/n}} \geq \sqrt{-2 \log c}$$

$$\Rightarrow R = \left\{x: \frac{\bar{x} - \theta_0}{\sqrt{\sigma^2/n}} \geq \sqrt{-2 \log c} \text{ or } \frac{(\bar{x} - \theta_0)}{\sqrt{\sigma^2/n}} \leq -\sqrt{-2 \log c}\right\}$$

$$R = \left\{x: \bar{x} \geq \theta_0 + \sqrt{\sigma^2/n} \sqrt{-2 \log c} \text{ or } \bar{x} \leq \theta_0 - \sqrt{\sigma^2/n} \sqrt{-2 \log c}\right\}$$

$$A = \left\{x: \theta_0 - \sqrt{\sigma^2/n} \sqrt{-2 \log c} \leq \bar{x} \leq \theta_0 + \sqrt{\sigma^2/n} \sqrt{-2 \log c}\right\}$$

$$A = \left\{x: \frac{\bar{x} - \theta_0}{\sqrt{\sigma^2/n}} \leq \sqrt{-2 \log c} \text{ or } \frac{(\bar{x} - \theta_0)}{\sqrt{\sigma^2/n}} \geq \sqrt{-2 \log c}\right\}$$

$$Pr\{x \in R\} \rightarrow \text{Type-I Error}$$

First, let set B standard gaussian normal, sorry standard normal distribution. Now, I am going to say that probability z greater than or equals to some z alpha by 2, this is equals to alpha. This is my definition. Now, I am basically saying that for a given alpha, z alpha by 2 be such that this quantity holds, this property holds. What I am basically saying, suppose this is my gaussian and I am basically looking for probability that z will be taking value larger such that that probability is alpha. Let us say if my z if it takes --

Student: (())(10:31).

Professor Manjesh Hanawal: Haa?

Student: Mod z.

Professor Manjesh Hanawal: Mod  $z$ . So, now let us, for time being only put only this quantity, I want to let us right now for the time being, let us use that. If I am going to only look at only what is the probability that beside taking value larger than certain quantities such that this probability. Maybe I want this probability, coverage of this probability to be  $\alpha$ . And this will happen at some point I am going to call this to be beside  $\alpha$  by 2.

Now, let us go back to our hypothesis testing problem we had. Probability, so, in the gaussian example, what is the condition we came up? In this previous example, this is our condition which translated to this quantity. So, now let us look into this I want to write this  $\bar{x} - \theta_0$ , this quantity divided by  $\sigma^2/n$ , this is being greater than  $-\sqrt{2 \log c}$ .

Now, I know that the quantity here,  $\bar{x}$  maybe I will just write it  $\theta_0$  divided by  $\sigma^2/n$   $2 \log c$ . This quantity  $\bar{x} - \theta_0$  divided by  $\sigma/\sqrt{n}$  this we know is gaussian distributed with mean 0 and variance equals to 1. Now, that is where we may need a mod of  $z$ , just a minute, just let me check this.

So, to, I mean I want this definition to be compatible with this, that is what mark I will do is maybe I will just take mod of  $z$  here. And in that case, I want  $\alpha$  the take probability both on the positive side and the negative side, that total to be equals to  $\alpha$  and where that point happens on the  $x$  axis that is what I am going to call it as  $z_{\alpha/2}$ .

Student: (())(13:51).

Professor Manjesh Hanawal: Here, it should be  $z_{\alpha/2}$ . Now, let us now try to say that this is what this is basically the rejection probability? Suppose, let us say I am looking this under the parameter  $\theta_0$ , under  $\theta_0$  I know this quantity is standard normal, because the mean of  $\bar{x}$  is  $\theta_0$  and its variance is anywhere  $\sigma^2/n$ . Now, suppose I want this to be set to  $\alpha$ ,  $\alpha$  is given to me.

Now, can you find out a  $c$  that will give me this probability  $\alpha$ . So, this is what this is type 1 error right now. I want type 1 error to be set  $c$ . Now, I am asking give me a test. When I say give me a test here you can say okay, take this LRT test, but the LRT test remember you have to give me the value of  $c$ . What should be the value of  $c$ ? That you should, I should use so that I will get value  $\alpha$ .

One possibility is what we can do is okay, we can say okay said these  $2 \log c$  simply to  $z_{\alpha/2}$  you can do this. So, if I tell  $\alpha$  on this gaussian curve can you find me what is

the value of  $z_{\alpha/2}$  uniquely. That is unique? Like if I tell  $\alpha$ , you know that, what is that tail possibility is that will give me the value of  $z_{\alpha/2}$ . So, now I do this and from this, I will just do the inversion.

What is this is going to give me?  $z^2_{\alpha/2}$  and then I think this whole quantity divided by 2, then exponential of minus of this. So, what I am basically saying, now, I am giving you a method, if for the gaussian sample, if you asked me to set the type 1 error to the  $\alpha$ , then I am going to choose my  $c$  in this fashion exactly. Once you give me  $\alpha$ , my  $z_{\alpha/2}$  is fixed and then I use that quantity to find out my  $c$ , and if I use this  $c$ , then I am guaranteeing you that my type 1 error is going to be  $\alpha$ . So, with this now let us continue.

Now, let us start that my LRT test is such that it is already type 1 error is  $\alpha$ . In that case, I can simply replace my  $2 \log c$  by  $z^2_{\alpha/2}$  in these expressions. So, what I am going to get, what I am going to get maybe I am starting with my rejection region to be probability that  $x$  has that  $\bar{x}$  is now upper bounded by  $\theta +$

Student: (17:18).

Professor Manjesh Hanawal: No, maybe I should, I should, just a minute, maybe I should say  $\bar{x} - \theta$ , let me write this  $\sigma^2/n$  this should be?

Student: (17:33).

Professor Manjesh Hanawal: --  $z_{\alpha/2}$  and on the lower side.

Student: Minus  $z_{\alpha/2}$ .

Professor Manjesh Hanawal: Minus  $z_{\alpha/2}$ . So, or like I will just start further rewrite  $x$  such that  $-\frac{z_{\alpha/2} \sigma}{\sqrt{n}} + \theta$  upper bounded by this quantity plus  $z_{\alpha/2}$ , no, I think known it  $\frac{z_{\alpha/2} \sigma}{\sqrt{n}} + \theta$ . So, this is my acceptance region. And this acceptance region when I look under the parameter  $\theta$ , when I say that, I look into this under the parameter  $\theta$  I know that this probability is equal to how much? How much is this going to be? This is going to be  $1 - \alpha$ .

Student: (19:06).

Professor Manjesh Hanawal: Yeah, because this  $\alpha$  was set on the rejection one. Now, this set is the complement of that. So, this is going to be  $1 - \alpha$ .