

**Statistics for Experimentalists**  
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**Lecture - 24**  
**Hypothesis Testing - Part C**


Welcome back, we will continue on hypothesis testing. We were looking at an example on type 1 error, and we were looking at the judge passing this decision on the hiring practices of the firm.

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**Illustrative Problem on formulating Hypothesis**

- a.  $H_0$ : Firm is fair in its hiring practices
- b.  $H_0$ : Firm is unfair in its hiring practices

Ref.: Walpole, R. E., Myers, R. H., Myers, S.L. K. Ye, Probability and Statistics for Engineers and Scientists. 8th ed. London: Pearson Educational, 2007.

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The reference for this example is the book written by Walpole, Myers, Myers and Ye, Probability and Statistics for Engineers and Scientists, 8th edition published by Pearson Educational in 2007. It has a large number of illustrative examples, there are also several other books which you may want to refer, and do the problems which you are comfortable with.

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## Illustration

Usually the critical value is set so that the probability is

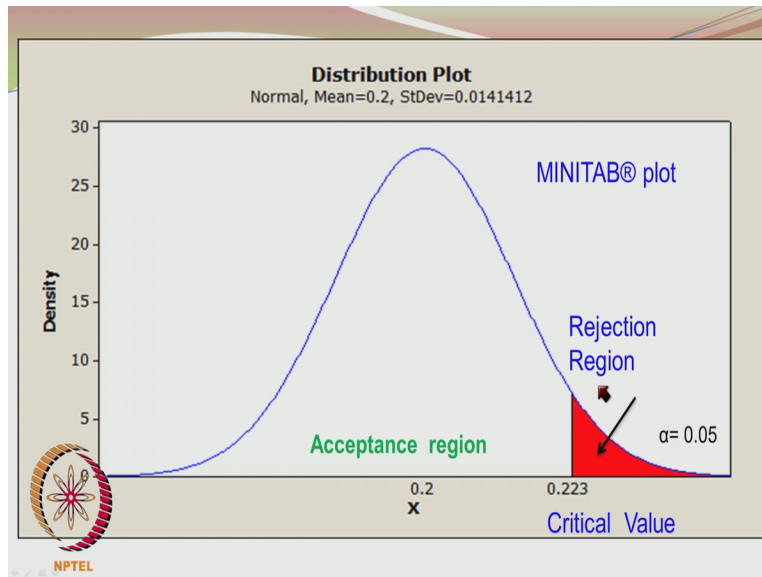
**0.05.**

This implies that the sample mean has to have an

impurity of **0.2233** ppm or higher for the shipment to be rejected.

Coming back to the illustration, the other illustration where we were looking at the mean impurity obtained from the samples. We want to set the critical value at an impurity level such that the probability is 0.05, this means that the sample mean has to have an impurity of 0.2233 ppm or higher for the shipment to be rejected.

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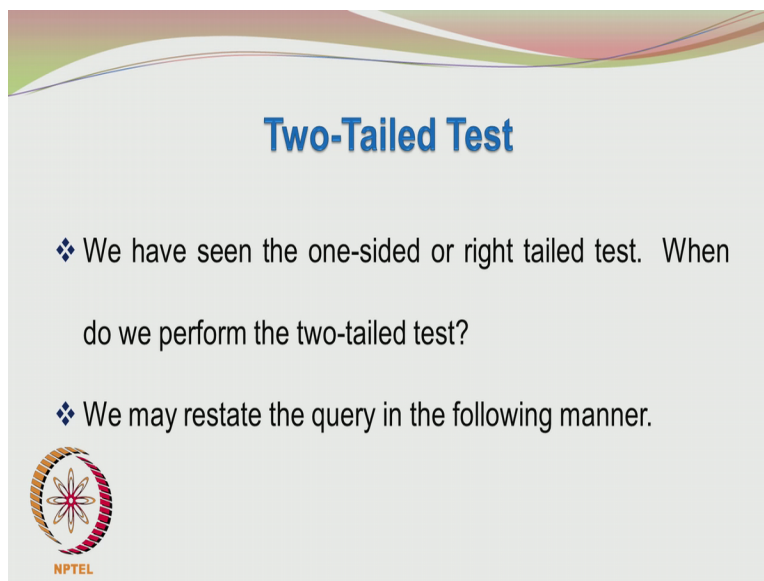


Next, we come to the normal distribution plot generated with the help of MINITAB, this is the normal distribution for the sampling distributions of the means, the mean value of this distribution is 0.2 ppm, this mean value is also the mean of the population. And the acceptance region and the rejection regions are shown in this diagram, it can be seen that the region below

0.2233 ppm is the acceptance region, and the region above 0.2233 ppm is the rejection region, 0.2233 ppm is the critical value.


It is important to note that the area under the curve beyond the critical value of 0.2233 ppm is 0.05, so this is a low probability, and only when this value is exceeded when this value of 0.2233 ppm is exceeded we reject the null hypothesis, we are claiming that the samples are coming from a population of mean impurity 0.2 ppm.

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A presentation slide titled "Two-Tailed Test" in blue text. The slide has a light gray background with a decorative wavy border at the top in shades of green, yellow, and red. It contains two bullet points, each preceded by a blue diamond symbol. The first bullet point asks "When do we perform the two-tailed test?" and the second bullet point states "We may restate the query in the following manner." At the bottom left of the slide is the NPTEL logo, which consists of a circular emblem with a stylized flower or star inside, surrounded by the text "NPTEL" in orange.

**Two-Tailed Test**

- ❖ We have seen the one-sided or right tailed test. When do we perform the two-tailed test?
- ❖ We may restate the query in the following manner.



We have seen the one-sided or right tailed test, when do we perform the two-tailed test? we may restate the query in the following manner.

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## Two-Tailed Test

Instead of asking what is the probability that the sample taken from the shipment with mean impurity of **0.2** ppm could actually have a mean impurity of **0.215** ppm or higher, we rephrase the statement.



Instead of asking what is the probability to the sample taken from the shipment with mean impurity of 0.2 ppm, could actually have a mean impurity of 0.215 ppm or higher, we rephrase the statement in the following manner. Actually, what we are trying to say is in the first sampling exercise, we are getting a sample mean of 0.215 ppm, perhaps this 0.215 ppm is deviating from the stated mean value of 0.2 ppm by a certain value, obviously it is 0.015 ppm, this is a positive deviation.

We can also have a negative deviation of -0.015 ppm, so if we are giving chances for both positive deviation and negative deviation to occur, then we have to conduct a two-tailed test. Let us see how to do it.

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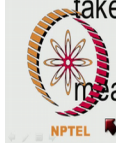


## Two Tailed Test

- ❖ The observed difference from the population mean is

$$0.215 - 0.2 = 0.015 \text{ ppm.}$$

- ❖ Hence, we may ask what is the probability that the sample taken from the population varies from the population mean by as much as **0.015** ppm or higher.



So the question we rephrase is, what is the probability that the sample taken from the population varies from the population mean by as much as 0.015 ppm or higher?

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## Two Tailed Test

- ❖ What is the probability that the sample taken from the population varies from the population mean by as much as **0.015** ppm or higher?

- ❖ This implies that the sample mean may be **0.185** ppm or lower or **0.215** ppm or higher.



This means the sample can have a mean impurity of 0.185 ppm or lower or 0.215 ppm or higher, so when we take the sample we have to see what is the probability that the mean impurity maybe 0.215 ppm or higher or 0.185 ppm or lower. So we have to find what is the probability of the sample mean being  $\geq 0.215$  ppm or  $\leq 0.185$  ppm.

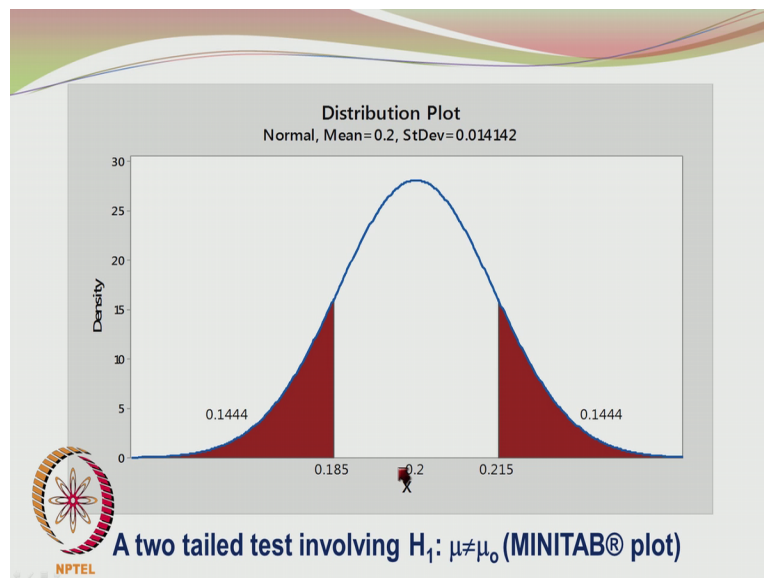
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## Two Tailed Test

- ❖ The sample mean may be **0.185** ppm or lower or **0.215** ppm or higher.
- ❖ The probability of these two occurrences is twice the probability of the occurrence of one of the occurrences by virtue of symmetry of the normal distribution.

Because of the symmetry of the normal distribution curve the probability of the random sample mean exceeding 0.215 ppm is also equal to the probability of the random sample mean in falling below 0.185 ppm. So it is enough if you find one of these 2 probabilities, and the resulting value is multiplied by 2.

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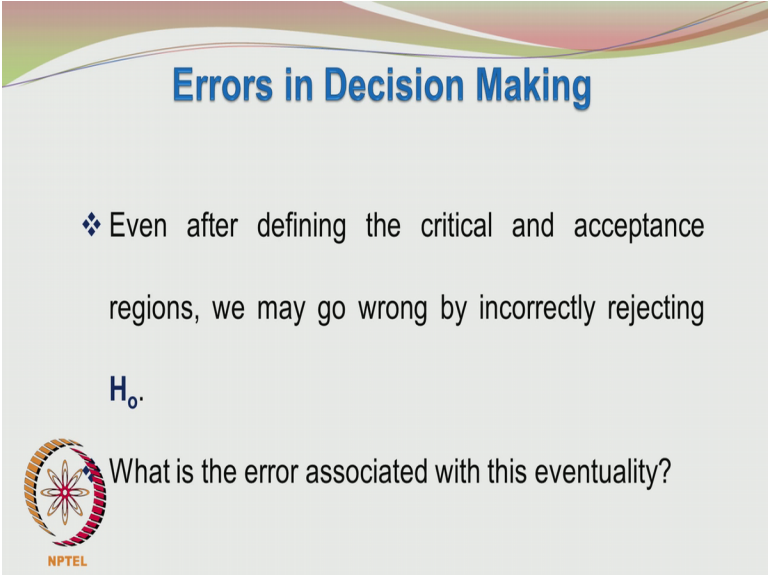


So here we have the normal distribution, again this represents the distribution of the sample means which is centered around the population mean value of 0.2 ppm, remember the population mean value is also equal to the random sampling distribution mean value. Here, we saw using the right tailed test the probability to be 0.1444, so the probability of  $\bar{x}$  falling below 0.185 ppm

is also 0.1444. Since we are now accounting for negative deviation and also positive deviation we have to add this 2 probabilities and that would come to about 0.29.

When we make a two-tailed test please remember that the alternate hypothesis is stated as  $H_1: \mu \neq \mu_0$ ,  $\mu_0$  is 0.2 ppm, so we are accounting for either  $\mu > \mu_0$  or  $\mu < \mu_0$ ,  $H_0$  was  $\mu = \mu_0$ ,  $H_1$  is  $\mu \neq \mu_0$ . In which case we are accounting for the mean being actually  $>$  the proposed mean of 0.2 ppm or being lower than the proposed mean of 0.2 ppm,  $\mu > \mu_0$  or  $\mu < \mu_0$ . So we generalized by saying  $\mu \neq \mu_0$ .


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**Errors in Decision Making**

❖ Even after defining the critical and acceptance regions, we may go wrong by incorrectly rejecting  $H_0$ .

What is the error associated with this eventuality?

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So even after defining the critical and acceptance region, we may go wrong by incorrectly rejecting  $H_0$ . What is the error associated with this eventuality? Incorrectly rejecting  $H_0$  is the type 1 error.

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## Errors in Decision Making

- ❖ The probability levels associated with the shaded region of the sampling distribution beyond the critical values are related to the type I error.



The probability levels associated with the shaded region of the sampling distribution beyond the critical values are related to be type 1 error, simply type 1 error corresponds to the shaded region here. Since this is 0.1444, this is also 0.1444, the alpha value will be about 0.29, 0.2888 okay, so it will be about 0.29 that is a rather high value of type 1 error. So we can also interpret this shaded region as  $\alpha/2$ , this shaded region may also be interpreted as a probability value of  $\alpha/2$ .

In the case of the one-tailed test, we have written  $\alpha=0.05$  that is also the type 1 error, the error in wrongly rejecting the null hypothesis.

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## Errors in Decision Making

❖ The probability of making the type 1 error is termed

$\alpha$ .

❖ The probability of type 1 error is also variously

termed **as significance level or the  $\alpha$  error or the**



**size of the test.**

So restating the probability of making the type 1 error is termed as alpha, alpha is denoted by various names. It is termed as the significance level or the alpha error or the size of the test, I feel more comfortable with the term significance level. What is the relation between confidence interval and hypothesis testing? The confidence interval we may recall is the identification of the bounds for the population parameter mu in this case.

The hypothesis testing speculates on a certain value of the population mean, both the confidence intervals and the hypothesis testing approach based their results on the random sample taken, only 1 random sample is taken, and usually the sample mean and the sample variances are calculated.

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## Relationship between CI and Hypothesis Testing Approaches

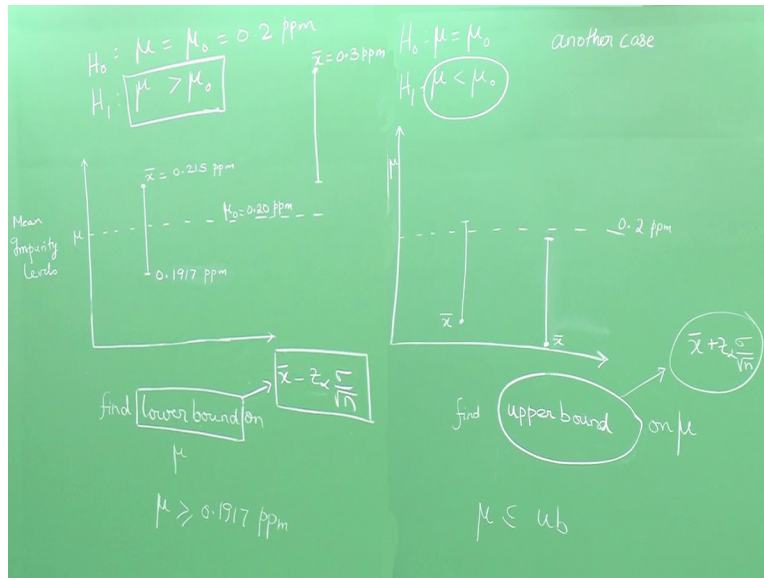
It stands to reason that the confidence interval and hypothesis testing approaches will come to identical conclusions when confronted with the same sample statistics, confidence levels and population parameters.



Let us now continue with the discussion on the relationship between confidence interval and hypothesis testing approaches, only one random sample is taken, and we have one value of the random sample mean and the random sample variance or standard deviation. We are using the same sample to construct the confidence interval, and also carry out the hypothesis testing approaches.

Hence, the conclusion given by the confidence interval should match with the conclusion made from the hypothesis testing. So I will show the calculations in the following slides, but before we get to that it is important to qualitatively see what is meant by a confidence bound, and what can be the decision that can be taken based on the confidence bound.

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So just going to the board, I have sketched the different samples and their bounds, the null hypothesis  $H_0: \mu = \mu_0$  which is 0.2 ppm that is the postulated speculated or hypothesized population parameter value. The alternate hypothesis is  $\mu > \mu_0$ , we got a sample of 0.215 ppm, and whenever we get sample which is having a value of higher than the population mean value, we construct lower bound on  $\mu$ .

We are not constructing a lower bound  $\bar{x}$ , we are constructing a lower bound on  $\mu$ . How do you find the lower bound on  $\mu$ ?  $\bar{x} - z_{\alpha} \frac{\sigma}{\sqrt{n}}$ ,  $\alpha$  is the chosen level of significance,  $\sigma$  is the assumed to be known standard deviation,  $n$  is the sample size,  $\bar{x}$  is the sample mean we have taken, in this particular case it is 0.215 ppm. So when we fix the lower bound on  $\mu$ , we write it as  $\mu \geq 0.1917$  ppm, this 0.1917 ppm came from this calculation,  $\bar{x}$  was 0.215, and  $z_{\alpha}$  is 1.645,  $\sigma$  was given,  $\sqrt{n}$  is also known.

So we get  $\mu \geq 0.1917$  ppm, so it can be seen that the 0.2 ppm is falling within the bound, or since  $\mu \geq 0.1917$  ppm, it includes the population parameter  $\mu$  of 0.2 ppm. So we can indeed say that this random sample was taken from a population with the mean impurity of 0.2 ppm. On the other hand, if we had chosen a random sample and the value we cannot choose a random sample in fact we have to take a random sample.

So if we had taken a random sample of 0.3 ppm mean, and we construct a lower bound on  $\mu$ , then value would have been here, and you can see that this interval does not encompass or include the population parameter of 0.2 ppm. Then we can say that this random sample could not have come from a population with mean impurity of 0.2 ppm. Let us say what would have happened if we had sample mean which was lower than 0.2 ppm.

Then we could have stated the alternate hypothesis as  $\mu < \mu_0$ , then what we have to do is reverse of what we did earlier. We have to now find the upper bound on  $\mu$  okay, so  $\mu$  should be  $\leq$  the upper bound, we are only constructing the one-sided confidence bounds on  $\mu$ , so  $\bar{x}$  is falling here, and then we construct the upper bound on  $\mu$  using the relation  $\bar{x} + z_{\alpha} \sigma / \sqrt{n}$ , and then we see whether this upper bound on  $\mu$  is such that it includes the population parameter 0.2 ppm.

For this case this confidence bound is including the population parameter, so we can say that this sample mean could have ended come from a population of mean 0.2 ppm. On the other hand, if we had chosen if we had not choose we cannot choose. I again want to repeat if we had taken a random sample such that the mean value was pretty low, and then we construct the upper bound on  $\mu$ , and that does not include the population parameter of 0.2 ppm.

Then we can say that this random sample could not have come from a population with mean impurity level of 0.2 ppm, so now what we have seen is how to relate the hypothesis testing and the confidence interval procedures.

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## Relationship between CI and Hypothesis Testing Approaches

$$\bar{x} - z_{\alpha} \frac{\sigma}{\sqrt{n}} \leq \mu$$

$$\mu \geq 0.215 - 1.6449 * \frac{0.04472}{10}$$

using  $\alpha$  value of 0.05

$$\mu \geq 0.1917 \text{ ppm}$$



As I discussed on the board we can put the lower bound on  $\mu$  as  $\bar{x} - z_{\alpha} \sigma / \sqrt{n}$ , and then the mean value  $\mu$  will be  $\geq 0.215 - 1.6449 * \sigma / \sqrt{n}$ , and we get mean  $\mu$  value of 0.1917 ppm that is what I showed on the board a few minutes ago.

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## Relationship between CI and Hypothesis Testing Approaches

$$\bar{x} - z_{\alpha} \frac{\sigma}{\sqrt{n}} \leq \mu$$

using  $\alpha$  value of 0.05

$$\mu \geq 0.1917 \text{ ppm}$$



Hence this interval includes the population mean of **0.2** ppm.

Since  $\mu \geq 0.1917$  ppm, then we have the speculated population mean value of 0.2 ppm, and this is included in this interval, so we can accept the null hypothesis or we can also say that this sample has indeed come from a population of mean impurity 0.2 ppm.

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## 95% Confidence Interval

We need to establish the lower bound on  $\mu$  for the  
95% confidence interval



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## 95% Confidence Interval

The correct interpretation is the interval headed by the  
sample mean must have the population mean within its  
lower bound i.e. the end of the interval must be below the  
hypothesized population value for  $\mu$



$$\bar{x} - z_{\alpha} \frac{\sigma}{\sqrt{n}} \leq \mu$$

So when we are looking at a 95% confidence interval or confidence bound, the correct interpretation is the interval headed by the sample mean must have the population mean within its lower bound, that is the end of the interval must be below the hypothesized population value for  $\mu$ ,  $\bar{x} - z_{\alpha} \frac{\sigma}{\sqrt{n}} \leq \mu$  should be  $\leq$  the speculated mean value. The lower bound should be such that it includes the population parameter  $\mu$ .

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## Confidence Interval Approach

$$0.215 - 1.644854 \cdot (0.04472/10^{0.5}) = 0.1917$$

Hence the sample taken does have within the lower bound the required population mean of **0.2**.



We got the answer as 0.1917, and so it is falling below the required population mean value of 0.2. So hence population mean of 0.2 ppm is included in the confidence bound. There are different types of hypothesis testing.

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## One Sided and Two Sided Tests

The alternate hypothesis may be specified as either greater than or less than the population mean.

Examples of  $H_1: \mu > \mu_0$  may be the chemical impurity



illustration we saw previously.

We can see that the alternate hypothesis as  $\mu > \mu_0$ , just as we did in the previous illustration.

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## One Sided and Two Sided Tests

Saying that  $\mu \neq \mu_0$  in a two-tailed test, which is equivalent to saying that the impurity levels may be greater than or less than the population mean value.



If we want to play it safe and also to be fair, we can always question that assumption that the random samples picked from the lot will always be exceeding the required mean impurity. There may be some random samples which may also fall below the mean impurity which is good, so we have to account for the case where the mean impurity may be  $>\mu_0$  or  $<\mu_0$ . So we then go for the two sided test, where the  $H_1$  is given as  $\mu \neq \mu_0$ .

It also depends upon the problem we are really not interested in looking at samples which are having mean impurities lower than the stipulated mean value of 0.2 ppm. If it is so then it is well and good, we are more worried about cases where the mean impurity exceeds 0.2 ppm, then we have to check. So it is better in such critical cases to going for the alternate hypothesis  $\mu > \mu_0$ .

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## Single Tailed or Two Tailed?

So we need to set a **lower bound** on  $\mu$  and see if the postulated mean is included within it or test as the alternate hypothesis the sample belongs to a higher population mean i.e. whether  $H_1: \mu > \mu_0$ .



If you are going through the confidence interval approach, then set the lower bound one sided lower bound on  $\mu$ .

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## One Sided and Two Sided Tests

If a new process claims smaller impurity levels due to improvements, then the hypotheses that may be framed for testing the subsequent samples are

$$H_0: \mu = \mu_0$$

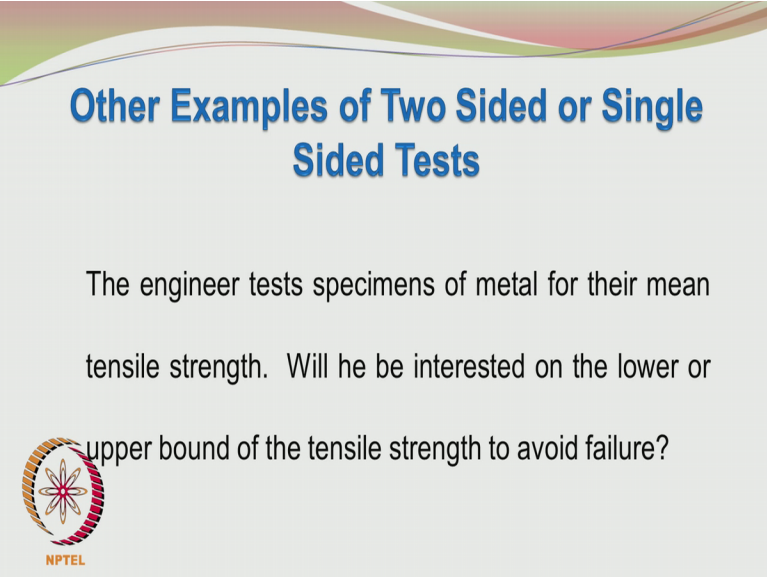
$$H_1: \mu < \mu_0$$



Suppose we are not happy with the manufacturer, who is consistently sending mean impurity levels of greater than the stipulated mean, and so either the same manufacturer or another manufacturer claims because of process improvements, he can send specimens which will come from a population of lower mean impurity. So we take the new set of shipments and take a random sample and find the average impurity.


If the average impurity is only slightly lower than 0.2 ppm, we are rather skeptical, if the mean impurity is coming to be only slightly lower than the stipulated setting of 0.2 ppm we are a bit skeptical. And then we have to make the hypothesis statement as  $\mu = \mu_0$  for  $H_0$ , and for  $H_1$   $\mu < \mu_0$ , the new shipment is coming from a population of mean impurity levels lower than 0.2 ppm. So this is how we state the hypothesis problem and draw meaningful conclusions.

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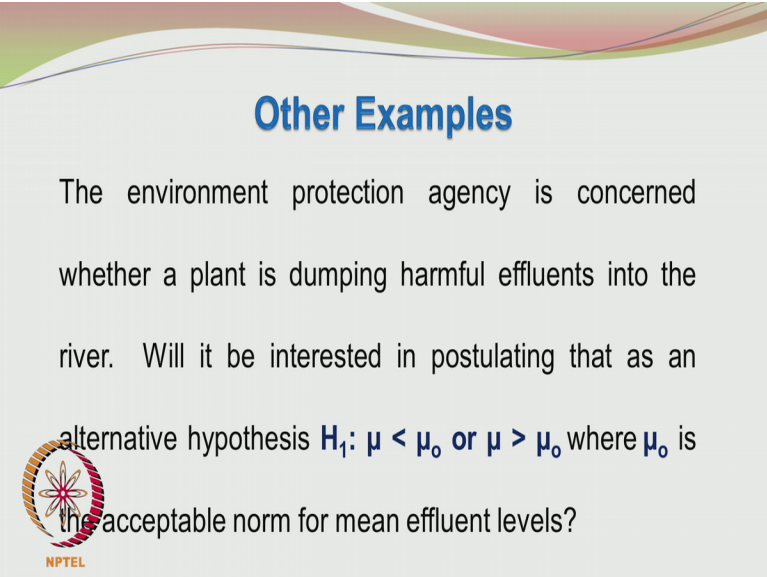
### Other Examples of Two Sided or Single Sided Tests

The engineer tests specimens of metal for their mean tensile strength. Will he be interested on the lower or upper bound of the tensile strength to avoid failure?




As an exercise, the engineer in a particular company is testing specimens of metals for their mean tensile strength okay. Will he be interested on the lower or upper bound of the tensile strength to avoid failure?

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### Other Examples

The environment protection agency is concerned whether a plant is dumping harmful effluents into the river. Will it be interested in postulating that as an alternative hypothesis  $H_1: \mu < \mu_0$  or  $\mu > \mu_0$  where  $\mu_0$  is the acceptable norm for mean effluent levels?

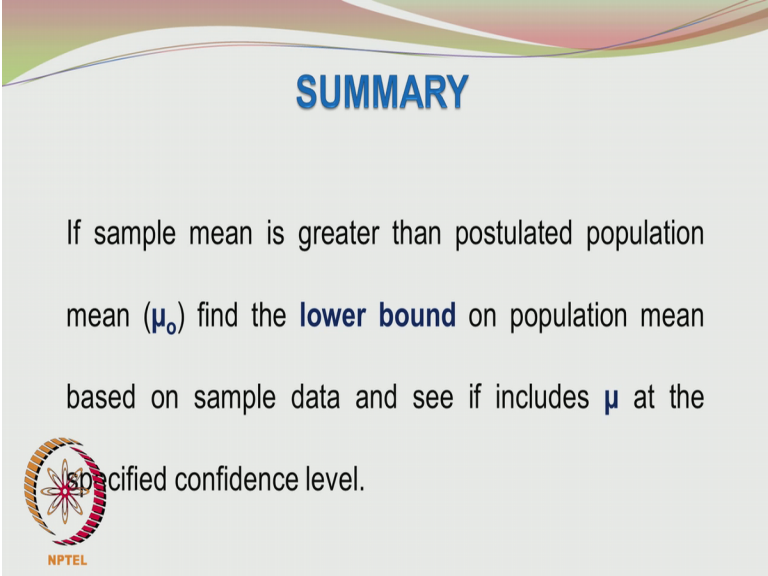


Another example is, the environmental protection agency is concerned whether a plant is dumping harmful effluents into the river. Will it be interested in postulating that as an alternative hypothesis  $H_1: \mu < \mu_0$  or  $\mu > \mu_0$  where  $\mu_0$  is the acceptable norm for mean effluent levels? In this case  $\mu \neq \mu_0$  does not make any sense okay, you have to then see which of the 2  $H_1: \mu < \mu_0$  or  $\mu > \mu_0$  is the correct alternate hypothesis to be considered by the environmental protection agency.

Of course it will be doing samples, and then analyzing the samples to find the concentration of the harmful effluents, if it finds the effluents to be above the stipulated production limit  $\mu > \mu_0$  would be the correct alternate hypothesis. The company will say that this is only a random fluctuation, our company is following all the measures required to minimize the pollutants concentrations and effluents, so it is only a minor aberration.


But the environmental protection agency is saying no. We are not convinced the mean impurity levels in your effluents are above the stipulated norm. So you have to decide whether you will go for  $\mu > \mu_0$  or  $\mu < \mu_0$  for your alternate hypothesis.

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**SUMMARY**

If sample mean is greater than postulated population mean ( $\mu_0$ ) find the **lower bound** on population mean based on sample data and see if includes  $\mu$  at the specified confidence level.

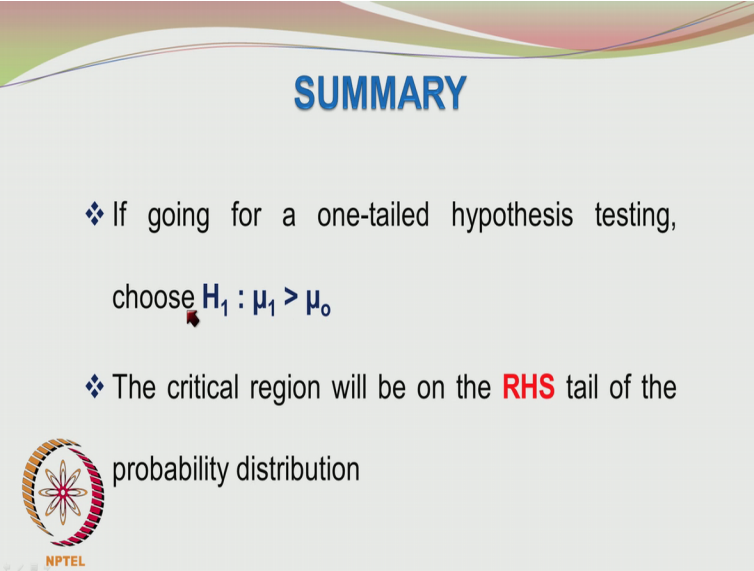


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To summarize, if the sample mean is greater than the postulated population mean  $\mu_0$ , find lower bound on population mean based on sample data, and see if it includes  $\mu$  at the specified confidence level.

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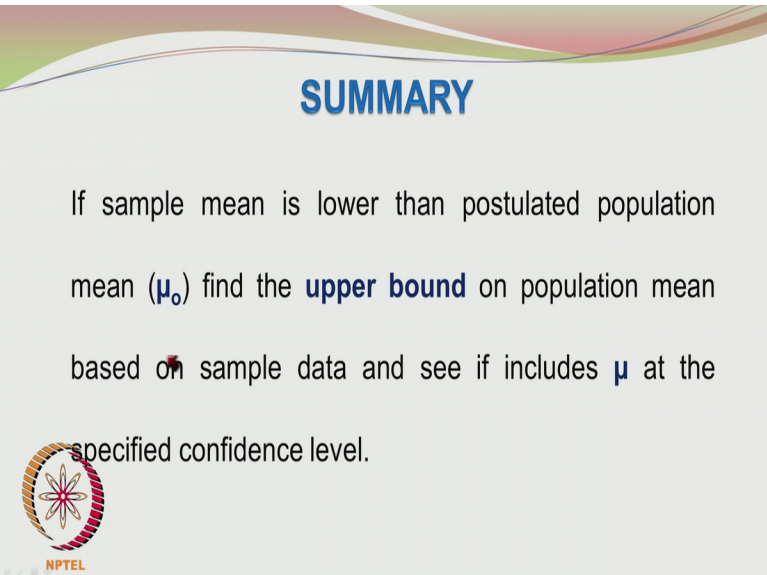
**SUMMARY**

- ❖ If going for a one-tailed hypothesis testing, choose  $H_1 : \mu_1 > \mu_0$
- ❖ The critical region will be on the **RHS** tail of the probability distribution




In such cases if you are going in for a one-tailed hypothesis testing, choose  $H_1 : \mu > \mu_0$ . The critical region will be on the right hand side tail of the probability distribution.

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**SUMMARY**

If sample mean is lower than postulated population mean ( $\mu_0$ ) find the **upper bound** on population mean based on sample data and see if includes  $\mu$  at the specified confidence level.



If the sample mean is lower than the postulated population mean  $\mu_0$ , find the upper bound on population mean based on sample data, and see if it includes  $\mu$  at the specified confidence level.



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## SUMMARY

❖ If going for a one-tailed hypothesis testing, choose

$$H_1 : \mu_1 < \mu_0.$$

❖ The critical region will be on the **LHS** tail of the probability distribution.



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