Creating decision rules and locating rejection regions

## Example with a continuous random variable

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The sample mean.

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Here is a proposal for a rejection region: Reject $H_{0}$ if $\bar{X}<67$ or $\bar{X}>69$. Good? Bad? No idea?

- Arbitrary choice of the rejection region.
- Visualize the regions on a number line.


## Example with a continuous random variable: solution

Assume that the standard deviation for the population of weights is $\sigma=3.6$.
For large samples, we may substitute sample stdev ( $S$ ) for $\sigma$, if not other estimate of $\sigma$ is available.

- Test statistic?

We will use $\bar{X}$, since this is a test about $\mu$.

- Sampling distribution?

Sample size is $n=36$. Central limit theorem $\Longrightarrow$ distribution of $\bar{X}$ is approximately normal with $\sigma_{\bar{X}}=\frac{3.6}{6}=0.6$.

- Decision rule / rejection region?

Reject $H_{0}: \mu=68$ if $\bar{X}<67$ or $\bar{X}>69$.

## Plot: test in action

Reject $H_{0}: \mu=68$ if $\bar{X}<67$ or $\bar{X}>69$.
$Q:$ What is the probability of rejecting when $H_{0}$ is actually true?

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P\left(\bar{X}<67 \text { or } \bar{X}>69 \text { when } H_{0} \text { is true }\right)=P(Z<a)+P(Z>b)
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and we compute $a, b$ as: The $\mathbf{z}$-scores!:

```
true.mu = 68
```

true.sigma $=3.6$
n = 36
$\mathrm{a}=(67-68) /($ true.sigma/sqrt(n)) \# a -- the lower cut-off valr
b= (69-68)/(true.sigma/sqrt(n)) \# b -- the upper cut-off valr
c $(a, b)$
[1] -1.666667 1.666667
pnormGC(bound=c $(67,69)$, region="outside", mean $=68$, sd=true.sigma/sqrt ( $n$ ), graph=TRUE)

Normal Curve, mean $=68, S D=0.6$
Shaded Area $=0.0956$

[1] 0.0955807

## The level of significance

Uh-oh... $9.5 \%$ of all samples of size 36 would lead us to reject $\mu=68$ kilograms when, in fact, it is true.

Significance level
This error probability is called level of significance of the test, and denoted by $\alpha$.

- Happy? . . . seems too high of a chance of error.
- How to fix?
- Increase the sample size (try it yourself!), or
- Widen the fail-to-reject region.


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But what about $H_{1}$ ?
Suppose $H_{1}$ is true and $\mu=70$. What is $P(67<\bar{X}<69$ when $\mu=70)$ ?
Plot this!

## Test significance levels. . . choices?

## Philosophy: Preselection of significance level

Roots of pre-selection of $\alpha$ :
"The maximum risk of making a type I error should be controlled."

- Does not account for values of test statistics that are "close" to the critical region.
- Example: $H_{0}: \mu=10$ vs. $H_{1}: \mu \neq 10$. Observed value $z=1.87$.
- with $\alpha=0.05$, value not significant. (no reject)
- but risk of error:
$P=2 P(Z>1.87$ when $\mu=10)=2(0.0307)=0.0614$.
- 0.0614 is the probability of obtaining a value of $z$ as large as or larger (in magnitude) than 1.87 when in fact $\mu=10$.
- $\Longrightarrow$ Evidence against $H_{0}$ is not as strong as that which would result from rejection with $\alpha=0.05$, but it is important information to the user.
- Indeed, continued use of 'standard' $\alpha=0.05$ or 0.01 only a result of what standards have been passed down through the generations.


## Attained significance level

So how can we tell the user the important information about strength of evidence?

The $p$-value approach, adopted extensively by users of applied statistics, is designed to give the user an alternative (in terms of a probability) to a mere "reject" or "do not reject" conclusion.

- The P-value computation also gives the user important information when the $z$-value falls well into the ordinary critical region.
- For example, if $z=2.73$, it is informative for the user to observe that $P=2(0.0032)=0.0064$, and thus the $z$-value is significant at a level considerably less than 0.05 .
- It is important to know that under the condition of $H_{0}$, a value of $z=2.73$ is an extremely rare event.
- That is, a value at least that large in magnitude would only occur 64 times in 10,000 experiments!


## Graphical representation of $p$-value

Plot this!
Definition
A $p$-value is the lowest level (of significance) at which the observed value of the test statistic is significant.

