

Chapter 6

Compare Two Groups

Section 6.5: Power, Margin of Error and Sample Size

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- Power, Margin of Error and Sample Size
 - Power Curve
 - Needed Sample Size for Confidence Interval
 - Procedure
 - Application

6.5a Power Curve

Power Analysis for Comparing Means

Run a power analysis after failing to reject the null

- ▶ **Power analysis** for the hypothesis test of a **mean difference** is very **similar** to the power calculation for a **single mean**
- ▶ **Key Concept:** After a **failure to detect an alternative value** from the null of the population mean, μ , or mean difference, $\mu_1 - \mu_2$, **evaluate power against potential alternative values**
- ▶ Power calculations are not from data, but are an electronic look-up of values from a “**non-central t-distribution**”
- ▶ The two groups can have different samples sizes, $n_1 \neq n_2$, and standard deviations, $s_1 \neq s_2$, yet the **power analysis for the mean difference requires only one value of n and of s**
 - For the one standard deviation, use the **within-group standard deviation, s_w**
 - For the one sample size, use the **harmonic mean of the two sample sizes**, described next

Combine Sample Sizes with the Harmonic Mean

One sample size

- ▶ The calculation of power for a **t-test** over both groups requires just **one sample size, applied to both groups**
- ▶ **Harmonic mean:**
$$\tilde{n} = \frac{2}{\frac{1}{n_1} + \frac{1}{n_2}}$$
- ▶ The desirable property of the **harmonic mean, \tilde{n}** , is that it is **closer to the smaller sample size** instead of evenly splitting the distance as with the usual **arithmetic mean, \bar{n}**
 - $n_1 = 50, n_2 = 50$: $\bar{n} = 50, \tilde{n} = 50$
 - $n_1 = 30, n_2 = 70$: $\bar{n} = 50, \tilde{n} = 42$
 - $n_1 = 10, n_2 = 90$: $\bar{n} = 50, \tilde{n} = 18$
- ▶ Power analysis proceeds from the **harmonic mean calculated from the actual sample sizes** of the two samples

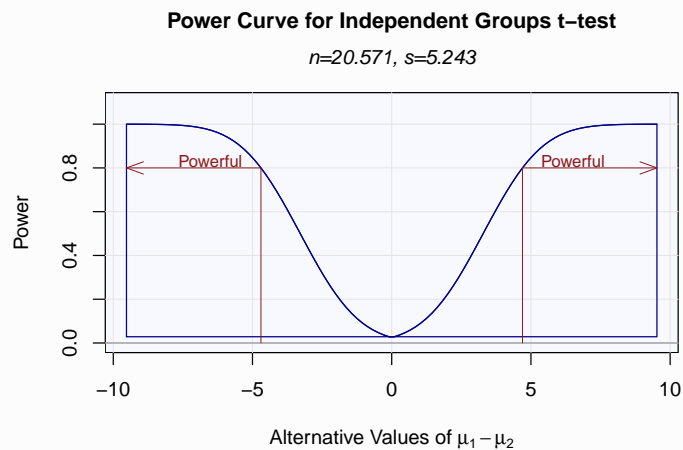
Need Range of Values for Alternative Values of $\mu_1 - \mu_2$

Obtain the power curve after failing to reject the null

- ▶ **Compare Salary** (1000's) for **Men and Women** in a company
Salary for Gender Males:
 $n = 18, \text{ mean} = 78.1, \text{ sd} = 4.25$
Salary for Gender Females:
 $n = 24, \text{ mean} = 76.5, \text{ sd} = 5.87$
- ▶ The **hypothesis test** of $H_0 : \mu_M - \mu_F = 0$ yielded
Hypothesis Test of 0 Mean Diff:
 $t = 0.98, \text{ df} = 40, \text{ p-value} = 0.334$
- ▶ No difference detected, but **what if there really is a difference?**
- ▶ The true value of $\mu_1 - \mu_2$ is not known, so obtain the power of **a range of alternative values of the population mean difference to derive a power curve**
- ▶ Use function **ttestPower** from the **lessR** package

ttestPower: Graphic Output

```
> ttestPower(n1=18, n2=24, s1=4.25, s2=5.87)
```



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ttestPower: Text Output

Power Curve Analysis for Independent Groups t-test

Harmonic mean of the two sample sizes: $n = 20.57$
Within-group (pooled) Standard Deviation: $sw = 5.24$

Mean difference to achieve power of 0.8: $Diff = 4.69$

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Power Curve Interpretation

What values of the mean difference have low or high power?

- ▶ Minimum power is usually set at 0.8, here obtained with a mean difference of around $+\$4,690$ or $-\$4,690$
- ▶ There is an 80% or larger chance that an actual population mean difference greater than about $+\$4,690$ or less than $-\$4,690$ would have been properly detected by rejection of the null hypothesis of no difference
- ▶ For a mean difference of about $\$3000$ or less, in either direction, there is more than a 50% chance of committing a Type II error, which is a failure to detect the real difference

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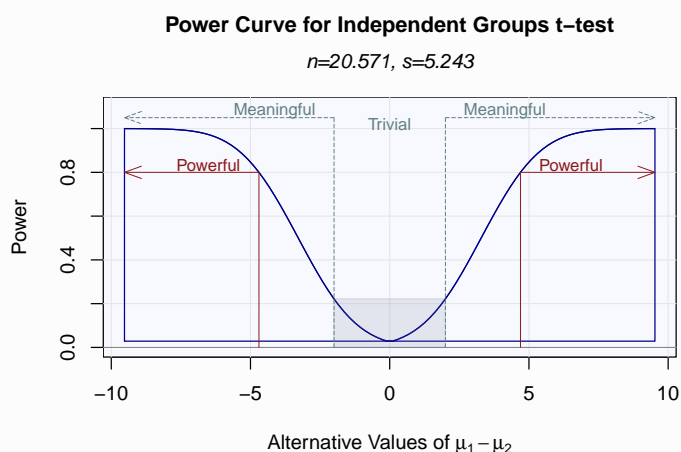
Minimum Mean Difference of Practical Importance

How large does the difference need be before important?

- ▶ **Minimum Mean Difference** of practical importance (mmd): Smallest difference from the null value, usually 0, considered to be of practical importance
- ▶ When no difference from the null value is detected, the question becomes, “Could a real, meaningful difference in fact exist, so that the outcome of the analysis is incorrect?”
- ▶ The power analysis provides the probabilities of detecting various meaningful differences
- ▶ Suppose that management deemed a population difference of average salary between men and women of \$2000 to be the smallest difference of practical importance, that is, meaningful
- ▶ To annotate the power curve, use the minimum mean difference option, `mmd`, with the `lessR ttestPower` function

ttestPower: Graphic Output

```
> ttestPower(n1=18, n2=24, s1=4.25, s2=5.87, mmd=2)
```



Analysis of Power Curve with Meaningful Changes

What changes are detected and which are meaningful?

- ▶ Text output of this `ttestPower` analysis includes

Given $n = 20.57$ and $sw = 5.24$, for `mmd` of 2:

Power = 0.222

Warning: Meaningful differences, from 2 to 4.696, have Power < 0.8

- ▶ If a meaningful difference of \$2000 did exist from the null value of 0, then there is a low probability, 0.22, of detecting this difference
- ▶ So maybe a meaningful difference does exist, \$2000 and larger, and this test failed to detect it
- ▶ If a more definitive conclusion is desired, the only alternative is to gather more data, of which `ttestPower` provides the relevant information

Needed Sample Size for Desired Power

More information from `ttestPower`

- Text output of this `ttestPower` analysis, because of the specification of `mmd=2` for a minimal mean difference of \$2000, also includes

```
Given sw, needed n to achieve power= 0.8  
for mmd of 2: n = 109
```

Sample size n applies to *each* group

- Achieve an 80% probability of correctly detecting a true difference for the mmd of \$2000 with a sample size of $n = 109$ for *each* sample
- This needed value of 109 is a considerable increase over the initial sample sizes of $n_1 = 18$ and $n_2 = 24$

6.5b

Needed Sample Size for Confidence Interval

Desired Margin of Error

Distinguish between what you got and what you want

- Question: How large a sample for *each* group is needed to obtain a smaller, desired margin of error?
 - **Key Concept:** Calculate the needed sample size for each group, n_{needed} , that will, with a .90 probability, obtain the desired margin of error, $E_{desired}$, for the new 95% confidence interval
-
- E is the margin of error *obtained* with the group sample size of n
 - $E_{desired}$ is the margin of error *desired*, which requires an increase of the current n to the larger value n_{needed}

Procedure

Overview of Sample Size Procedure

Move from initial sample to final, larger sample

- ▶ Specify the desired margin of error (precision), $E_{desired}$
- ▶ Obtain initial data samples
- ▶ Calculate margin of error, E , then the confidence interval
- ▶ If $E_{desired} < E$, calculate n_{needed}
- ▶ Gather new data for larger samples
- ▶ Re-calculate the margin of error, E , and the confidence interval

Two-step Procedure to Calculate the Needed Sample Size

Two-step procedure for obtaining needed sample size

- ▶ 1. From the initial sample, get the standard deviation, s_w , and then calculate preliminary estimate of sample size, n_s :

$$n_s = 2 \left[\frac{(1.96)(s_w)}{E_{desired}} \right]^2$$

- ▶ 2. Revise the initial estimate upward to obtain the estimate actual of sample size: s may underestimate σ , so revise n_s upward for a given probability¹ of obtaining $E_{desired}$ with a 95% level of confidence
 - .70 probability: $n_{needed} = 1.039n_s + 2.291$
 - .90 probability: $n_{needed} = 1.099n_s + 4.863$ ▷ Most often used
 - .99 probability: $n_{needed} = 1.175n_s + 7.526$

¹These coefficients come from analysis of a paper by Kupper and Hafner in the *American Statistician*, 43(2):101-105, 1989

Application

Reconsidering Ship Times

Reduce the margin of error

- ▶ Previously constructed a confidence interval about the mean difference of delivery time for two different suppliers
- ▶ Supplier 2 was shown faster, on average, than Supplier 1
- ▶ Problem: Obtained margin of error was large, $E = 1.062$ days
- ▶ One manager prefers Supplier 1 for other reasons, so if Supplier 2 is not that much faster, the manager would prefer to retain Supplier 1
- ▶ How much faster is Supplier 2, on average?
- ▶ Answer to within a margin of error of half a day
- ▶ Managerial Question: How many shipments for each group need be sampled to reach a .90 probability of obtaining a margin of error of half a day or less at the 95% confidence level of the mean difference?

Analysis of Sample Size

Step 1: Initial sample size of each group

- ▶ From previous analysis of the confidence interval of the mean difference, $s_w = 1.51$, with $E_{desired}$ specified as 0.5

$$n_s = 2 \left[\frac{(z_{.025})(s_w)}{E_{desired}} \right]^2 = 2 \left[\frac{(1.96)(1.51)}{0.5} \right]^2 = 70.06$$

Step 2: Upward adjusted actual sample size of each group

- ▶ $n_{needed} = 1.099n_s + 4.863$
 $= 1.099(70.06) + 4.863$
 $= 81.86$
- ▶ Now round up, 81.86 to: $n_{needed} = 82$

Results

82 shipments per group

- ▶ Now gather measurements of Ship Time for 82 shipments for each supplier, a **dramatic increase** from the 15 and 19 shipments currently in each group
- ▶ There is a **.90 probability that when the revised 95% confidence interval is calculated over all 82 shipments in each group, the resulting margin of error will be 0.5 or less**

Conclusion

Potential problems

- ▶ 82 shipments per supplier are not available
- ▶ The older shipments are from so long ago the underlying process has changed, rendering many of them **invalid** for estimating the *current* population mean shipping time, μ

Extent of knowledge

- ▶ The previous inferential analysis demonstrated that, **on average, Supplier 2 is faster than Supplier 1**
- ▶ And, moreover, anywhere from **about $\frac{1}{2}$ to $2\frac{1}{2}$ days faster**
- ▶ Obtaining more information may simply not be practical, but fortunately, much is already known

- ▶ The End