

## LESSON: Hypothesis testing

**FOCUS QUESTION:** How can I tell whether the test group is different from the control group?

In this lesson you will:

- Formulate and test a hypothesis regarding population mean.
- Apply the one sample t-test to assess the true mean.
- Apply the two sample t-test to assess whether two samples are likely to come from populations with the same mean.
- Use p-values and confidence intervals.



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### **SUGGESTED READING: Wikipedia has a discussion of hypothesis testing**

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**SUGGESTED READING:** Wikipedia also has a discussion of the concept of the null hypothesis which is somewhat readable. The discussion can be found at [http://en.wikipedia.org/wiki/Null\\_hypothesis](http://en.wikipedia.org/wiki/Null_hypothesis).

**SUGGESTED READING:** Wikipedia discusses the meaning of the p-value and the frequent misunderstandings in interpreting it. The discussion can be found at <http://en.wikipedia.org/wiki/Pvalue>.

### **DATA FOR THIS LESSON**

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File	Description
diaries.mat (found on Learn)	<ul style="list-style-type: none"> <li>▪ The data set contains sleep diary data for a cohort in MATLAB variables.</li> <li>▪ The arrays have a column for each person.</li> <li>▪ The vectors have an element for each person.</li> <li>▪ The values in column <math>n</math> correspond to the same person as the value in position <math>n</math> of each vector.</li> <li>▪ The file contains the following variables: <ul style="list-style-type: none"> <li>▪ <code>bedTimes</code> - array of bed times in decimal-date format.</li> <li>▪ <code>dayCaffeine</code> - array of daytime caffeine indicators.</li> <li>▪ <code>gender</code> - vector of male/female gender designators.</li> <li>▪ <code>nightCaffeine</code> - array of evening caffeine indicators.</li> <li>▪ <code>section</code> - vector of section indicators. The possible section numbers are 0, 1, 2, and 3. Section 0 contains only a single instructor. The remaining values correspond to course section numbers.</li> <li>▪ <code>toSleepMinutes</code> - an array of number of minutes to fall asleep.</li> <li>▪ <code>useAlarm</code> - array of alarm use indicators.</li> <li>▪ <code>wakeTimes</code> - array of wakeup times in decimal-date format.</li> </ul> </li> <li>▪ The data was originally gathered by students taking CS 1173 in the fall 2009 semester and anonymized and randomized to be unidentifiable.</li> <li>▪ The first column of each array represents the instructor's values, the rest of the columns represent individual students.</li> <li>▪ Diaries were recorded for 21 days (from September 23, 2009 to October 13, 2009).</li> </ul>

## SETUP FOR LESSON

- Create a `HypothesisTesting` directory on your `V:` drive and make it your current directory.
- Download the `diaries.mat` data file from Blackboard and save it to your `HypothesisTesting` directory.
- Create a `HypothesisTestingLesson.m` script file in your `HypothesisTesting` directory. Enter each of the examples in a new cell in this script.

## EXAMPLE 1: Load the consolidated sleep diary data

Create a new cell in which you type and execute:

```
load diaries.mat; % Load the sleep diaries

sleepHours = (wakeTimes - bedTimes)*24; % Calculate hours of sleep
```

You should see 9 variables in the Workspace Browser. We will be interested in the following variables:

- `gender` - vector containing gender of the individual subjects
- `section` - vector containing sections numbers of the individual subjects
- `sleepHours` - an array number of hours of sleep of individuals

### EXAMPLE 2: Does subject 1 sleep 8 hours on average?

Create a new cell in which you type and execute:

```
[h1, p1, c1] = ttest(sleepHours(:, 1), 8);

fprintf(['Does subject 1 sleep 8 hours on average?\n\t' ...

        'h = %g, p = %g, ci = [%g, %g]\n'], h1, p1, c1);
```

You should see 3 variables in the Workspace Browser:

- `c1` - confidence interval for the difference of the two population means
- `h1` - a value indicating whether to reject (1) or not reject (0) the null hypothesis
- `p1` - (the p-value) gives the probability that such a sample could be picked by chance if the null hypothesis were really true

You should also see the following output:

```
Does subject 1 sleep 8 hours on average?
```

```
h = 0, p = 0.113092, ci = [7.21123, 8.09036]
```

**EXERCISE 1: What is the null hypothesis for EXAMPLE 2?**

**EXERCISE 2: Is the null hypothesis rejected for EXAMPLE 2?**

### EXAMPLE 3: Do students in section 2 sleep 8 hours on average?

Create a new cell in which you type and execute:

```
sleepHoursSec2 = sleepHours(:, section == 2);

[h2, p2, c2] = ttest(sleepHoursSec2(:, 8));

fprintf(['Do section 2 students sleep 8 hours on average?\n\t' ...
```

```
'h = %g, p = %g, ci = [%g, %g]\n', h2, p2, c2);
```

**You should see 4 variables in the Workspace Browser:**

- c2 - confidence interval for the difference of the two population means
- h2 - a value indicating whether to reject (1) or not reject (0) the null hypothesis
- p2 - (the p-value) gives the probability that such a sample could be picked by chance if the null hypothesis were really true
- sleepHoursSec2 - hours of sleep for students in section 2

**You should also see the following output:**

```
Do section 2 students sleep 8 hours on average?
```

```
h = 1, p = 1.91292e-06, ci = [8.30087, 8.71824]
```

**EXERCISE 3: What is the null hypothesis for EXAMPLE 3?**

**EXERCISE 4: What is the alternative hypothesis for EXAMPLE 3?**

**EXERCISE 5: Is the null hypothesis rejected in favor of the alternative hypothesis for EXAMPLE 3?**

**EXAMPLE 4: Do the students in sections 2 and 3 sleep a different amount?**

**Create a new cell in which you type and execute:**

```
sleepHoursSec3 = sleepHours(:, section == 3);  
  
[h3, p3, c3] = ttest2(sleepHoursSec2(:), sleepHoursSec3(:));  
  
fprintf(['Do students in sections 2 and 3 get different amounts of sleep on  
average?\n\t' ...  
  
        'h = %g, p = %g, ci = [%g, %g]\n'], h3, p3, c3);
```

**You should see the following variables in your Workspace Browser:**

- c3 - confidence interval for the difference of the two population means
- h3 - a value indicating whether to reject (1) or not reject (0) the null hypothesis
- p3 - (the p-value) gives the probability that such a sample could be picked by chance if the null hypothesis were really true

- `sleepHoursSec3` - hours of sleep for students in section 3

Do students in sections 2 and 3 get different amounts of sleep on average?

```
h = 1, p = 0.0035873, ci = [0.127686, 0.652328]
```

### EXAMPLE 5: Do section 2 and 3 students sleep differently at the 0.01 significance level?

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Create a new cell in which you type and execute:

```
[h4, p4, c4] = ttest2(sleepHoursSec2(:), sleepHoursSec3(:), 0.01);

fprintf(['Do students in sections 2 and 3 sleep differently at the 0.01
significance level?\n\t' ...

'h = %g, p = %g, ci = [%g, %g]\n'], h4, p4, c4);
```

You should see the following variables in your Workspace Browser:

- `c3` - confidence interval for the difference of the two population means
- `h3` - a value indicating whether to reject (1) or not reject (0) the null hypothesis
- `p3` - (the p-value) gives the probability that such a sample could be picked by chance if the null hypothesis were really true

Do students in sections 2 and 3 sleep differently at the 0.01 significance level?

```
h = 1, p = 0.0035873, ci = [0.0451417, 0.734872]
```

### EXAMPLE 6: Do section 2 students sleep more than section 3 students?

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Create a new cell in which you type and execute:

```
[h5, p5, c5] = ttest2(sleepHoursSec2(:), sleepHoursSec3(:), 0.05, 'right');

fprintf(['Do sections 2 students get more sleep than section 3 students?\n\t' ...

'h = %g, p = %g, ci = [%g, %g]\n'], h5, p5, c5);
```

You should see the following 3 variables in your Workspace Browser:

- `c5` - confidence interval for the difference of the two population means
- `h5` - a value indicating whether to reject (1) or not reject (0) the null hypothesis

- p5 - (the p-value) gives the probability that such a sample could be picked by chance if the null hypothesis were really true

Do sections 2 students get more sleep than section 3 students?

```
h = 1, p = 0.00179365, ci = [0.169891, Inf]
```

### EXAMPLE 7: Do section 2 students sleep more than section 3 students (fewer assumptions)?

Create a new cell in which you type and execute:

```
[h6, p6, c6] = ttest2(sleepHoursSec2(:), sleepHoursSec3(:), 0.05, 'right',
'unequal');

fprintf(['Do sections 2 students get more sleep than section 3 students?\n\t' ...

'h = %g, p = %g, ci = [%g, %g]\n'], h6, p6, c6);
```

You should see the following 3 variables in your Workspace Browser:

- c6 - confidence interval for the difference of the two population means
- h6 - a value indicating whether to reject (1) or not reject (0) the null hypothesis
- p6 - (the p-value) gives the probability that such a sample could be picked by chance if the null hypothesis were really true

Do sections 2 students get more sleep than section 3 students?

```
h = 1, p = 0.00198515, ci = [0.167467, Inf]
```

### SUMMARY OF SYNTAX

MATLAB syntax	Description
<code>h = ttest(X, m)</code>	<p>Perform a one-sample student's t-test to determine whether the true mean of the population represented by the sample in the vector X could have a value different than m. The significance level for the test is 0.05.</p> <p>If h is 1, then it is likely that the mean of the population represented by the sample X is different from m.</p> <p>If h is 0, then you don't have enough evidence to conclude that the mean is different from m.</p>

MATLAB syntax	Description
	<p>The <code>ttest</code> assumes that <code>X</code> is a random sample drawn from a normally distributed population.</p> <p>If <code>X</code> is an array, <code>ttest</code> works along the first non-singleton dimension. <b>Note: Do NOT take the mean of <code>X</code> before applying <code>ttest</code>.</b></p>
<pre>[h, p, ci] = ttest(X, m)</pre>	<p>Perform a one-sample student's t-test to determine whether the true mean of the population represented by the sample in the vector <code>X</code> is <code>m</code>.</p> <p>The variable <code>p</code> represents a <i>p-value</i>, indicating how likely it is to observe the test statistic if the population mean were actually equal to <code>m</code>.</p> <p>The variable <code>ci</code> holds the 95% confidence interval for the true mean.</p>
<pre>[h, p, ci] = ttest(X, m, alpha)</pre>	<p>Perform a one-sample student's t-test at significance level <code>alpha</code> to determine whether the true mean of the population represented by the sample in the vector <code>X</code> is different from <code>m</code>.</p> <p>The variable <code>p</code> represents a <i>p-value</i>, indicating how likely it is to observe the test statistic if the population mean were actually equal to <code>m</code>.</p> <p>The variable <code>ci</code> holds the <math>100 \cdot [1 - \text{alpha}]</math>% confidence interval for the true mean.</p>
<pre>[h, p, ci] = ttest(X, m, alpha, 'left')</pre>	<p>Perform a one-sided one-sample student's t-test at significance level <code>alpha</code> to determine whether the true mean of the population represented by the sample in the vector <code>X</code> is different from <code>m</code>.</p> <p>If <code>h</code> is 1, then it is likely that the mean of the population represented by the sample <code>X</code> is less than <code>m</code>.</p> <p>The variable <code>p</code> represents a <i>p-value</i>, indicating how likely it is to observe the test statistic if the population mean were actually equal to <code>m</code>.</p> <p>The variable <code>ci</code> holds the <math>100 \cdot [1 - \text{alpha}]</math>% confidence interval for the true mean.</p>
<pre>[h, p, ci] = ttest(X, m, alpha, 'right')</pre>	<p>Perform a one-sided one-sample student's t-test at significance level <code>alpha</code> to determine whether the true mean of the population represented by the sample in the vector <code>X</code> is different from <code>m</code>.</p> <p>%</p> <p>If <code>h</code> is 1, then it is likely that the mean of the population represented by the sample <code>X</code> is greater</p>

MATLAB syntax	Description
	<p>than <math>m</math>.</p> <p>The variable <code>p</code> represents a <i>p-value</i>, indicating how likely it is to observe the test statistic if the population mean were actually equal to <math>m</math>.</p> <p>The variable <code>ci</code> holds the <math>100 \cdot [1 - \alpha]\%</math> confidence interval for the true mean.</p>
<pre>h = ttest2(X, Y)</pre>	<p>Perform a two-sample student's t-test to determine whether the true means of the populations represented by the samples <math>X</math> and <math>Y</math> are different.</p> <p>If <code>h</code> is 1, then it is likely that the means of the respective populations represented by samples <math>X</math> and <math>Y</math> are different.</p> <p>If <code>h</code> is 0, then you don't have enough evidence to conclude that the means are different. The significance level for the test is 0.05.</p> <p>The <code>ttest2</code> assumes that <math>X</math> and <math>Y</math> are random samples drawn from a normally distributed populations.</p> <p>If <math>X</math> is an array <code>ttest2</code> works along the first non-singleton dimension. In this case <math>Y</math> must be the same size as <math>X</math> except along the first non-singleton dimension. <b>Note: Do NOT take the mean of <math>X</math> or of <math>Y</math> before applying <code>ttest2</code>.</b></p>
<pre>[h, p, ci] = ttest2(X, Y)</pre>	<p>Perform a two-sample student's t-test to determine whether the true means of the populations represented by the samples <math>X</math> and <math>Y</math> are different.</p> <p>The variable <code>p</code> represents a <i>p-value</i>, indicating how likely it is to observe the test statistic if the population means were actually equal.</p> <p>The variable <code>ci</code> is the 95% confidence interval for the difference of the two population means.</p>
<pre>[h, p, ci] = ttest2(X, Y, alpha)</pre>	<p>Perform a two-sample student's t-test at significance level <code>alpha</code> to determine whether the true means of the populations represented by the samples <math>X</math> and <math>Y</math> are different.</p> <p>The variable <code>p</code> represents a <i>p-value</i>, indicating how likely it is to observe the test statistic if the population mean were actually equal.</p> <p>The variable <code>ci</code> holds the <math>100 \cdot [1 - \alpha]\%</math> confidence interval for difference of the true population means.</p>

MATLAB syntax	Description
<pre>[h, p, ci] = ttest2(X, Y, alpha, 'left')</pre>	<p>Perform a one-sided two-sample student's t-test at significance level <math>\alpha</math> to determine whether the true mean of the population represented by the sample <math>X</math> is less than the true mean of the population represented by the sample <math>Y</math>.</p> <p>If <math>h</math> is 1, then it is likely that the mean of the population represented by the sample <math>X</math> is less than the population mean represented by the sample <math>Y</math>.</p> <p>The variable <math>p</math> represents a <i>p-value</i>, indicating how likely it is to observe the test statistic if the population mean corresponding to <math>X</math> were actually greater than or equal to the population mean corresponding to <math>Y</math>.</p> <p>The variable <math>ci</math> holds the <math>100 \cdot [1 - \alpha]\%</math> confidence interval for the difference of the two populations means.</p>
<pre>[h, p, ci] = ttest2(X, Y, alpha, 'right')</pre>	<p>Perform a one-sided two-sample student's t-test at significance level <math>\alpha</math> to determine whether the true mean of the population represented by the sample <math>X</math> is greater than the true mean of the population represented by the sample <math>Y</math>.</p> <p>If <math>h</math> is 1, then it is likely that the mean of the population represented by the sample <math>X</math> is less than the population mean represented by the sample <math>Y</math>.</p> <p>The variable <math>p</math> represents a <i>p-value</i>, indicating how likely it is to observe the test statistic if the population mean corresponding to <math>X</math> were actually less than or equal to the population mean corresponding to <math>Y</math>.</p> <p>The variable <math>ci</math> holds the <math>100 \cdot [1 - \alpha]\%</math> confidence interval for the difference of the two populations means.</p>

*This lesson was written by Kay A. Robbins of the University of Texas at San Antonio and last modified by Dawn Roberson on 3 Nov-2013. Please contact [krobbins@cs.utsa.edu](mailto:krobbins@cs.utsa.edu) with comments or suggestions. The photo is of Sir Ronald Fisher, founder of modern statistics and namesake of the Fisher Iris dataset. (See [http://en.wikipedia.org/wiki/File:R.\\_A.\\_Fischer.jpg](http://en.wikipedia.org/wiki/File:R._A._Fischer.jpg).*