

**Example 1: Retrospective calculation of power for a two-sample t-test.** A study was performed in order to evaluate the effectiveness of two devices for improving the efficiency of gas home-heating systems. Energy consumption in houses was measured after one of the two devices was installed. The two devices were an electric vent damper (Damper 1) and a thermally activated vent damper (Damper 2). The energy consumption data for each damper type were measured. Compare the effectiveness of these two devices by determining whether or not there is any evidence of a difference in energy use when using an electric vent damper versus a thermally activated vent damper.

Abbreviated write-up:

$$H_o: \mu_1 - \mu_2 = 0$$

$$H_a: \mu_1 - \mu_2 \neq 0$$

$$p\text{-value} = .2598$$

Retain  $H_o$ . The sample results do not show significant evidence of a difference in energy use for the two dampers.

Since the data analysis did not reveal any statistically significant difference, we may wish to calculate the power of detecting a difference.

- If the power is low, then there is little chance of finding a significant difference (and nonsignificant results are likely even if real differences exist). We may want to get more observations to increase power and continue to evaluate the problem.
- If the power is high, then significant differences should be detectable, and so we can conclude that there is no meaningful difference.

The power depends on the magnitude of the difference I wish to detect. Maybe I am interested in detecting a difference in energy usage as small as 2 units, for example. Actually, we can investigate the power for several different effect sizes at the same time. In the Minitab output below, we have requested power calculations for differences in energy usage of 1.0, 1.5, 2.0, 2.5, 3.0, . . . , 4.5, 5.0 units.

### Power and Sample Size

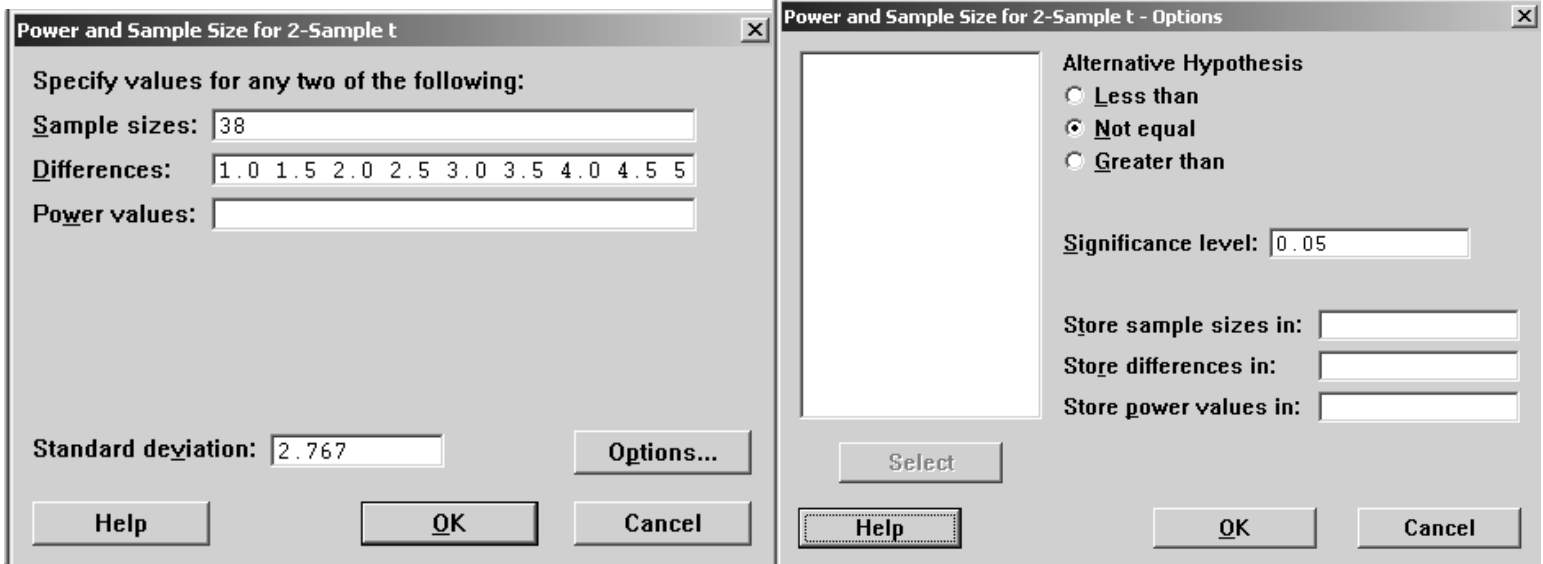
2-Sample t Test

Testing mean 1 = mean 2 (versus not =)  
Calculating power for mean 1 = mean 2 + difference  
Alpha = 0.05 Assumed standard deviation = 2.767

Difference	Sample Size	Power
1.0	38	0.34293
1.5	38	0.64516
2.0	38	0.87483
2.5	38	0.97299
3.0	38	0.99657
3.5	38	0.99975
4.0	38	0.99999
4.5	38	1.00000
5.0	38	1.00000

The sample size is for each group.

Row	Damper1	Damper2
1	7.87	12.28
2	9.43	7.23
3	7.16	2.97
4	8.67	8.81
5	12.31	9.27
6	9.84	11.29
7	10.04	8.29
8	12.62	9.96
9	7.62	10.30
10	11.12	16.06
11	13.43	14.24
12	9.07	11.43
13	6.94	10.28
14	10.28	13.60
15	9.37	5.94
16	7.93	10.36
17	13.96	6.85
18	6.80	6.72
19	4.00	10.21
20	8.58	8.61
21	8.00	11.62
22	5.98	11.21
23	15.24	10.95
24	8.54	7.62
25	11.09	10.40
26	11.70	12.92
27	12.71	15.12
28	6.78	13.47
29	9.82	8.47
30	12.91	11.70
31	10.35	7.73
32	9.60	8.37
33	9.58	7.29
34	9.83	10.49
35	9.52	8.69
36	10.64	8.26
37	6.62	7.69
38	5.20	12.19
39		5.56
40		9.76
41		7.15
42		12.69
43		13.38
44		13.11
45		10.50
46		14.35
47		13.42
48		6.35
49		9.83
50		12.16



Specifying differences

For a two-sample t-test, express the “Difference” as the difference between the population means that you would like to be able to detect.

If you choose “Less than” as your alternative hypothesis, then you must enter a negative value in “Differences.” If you choose “Greater than,” you must enter a positive value. This is because with a one-tailed test, you have no power to detect an effect in the opposite direction.

**Example: one-sided test.**

Suppose instead that we wish to test the hypothesis that the electric vent damper (Damper 1) consumes less energy than the thermally activated vent damper (Damper 2).

$H_0: \mu_1 - \mu_2 = 0$       Alternative Hypothesis = “Less than”  
 $H_a: \mu_1 - \mu_2 < 0$

If you want to check the power of detecting a difference of 2 units, then set “Difference” = -2, or, if desired, we can investigate the power for several sizes of differences.

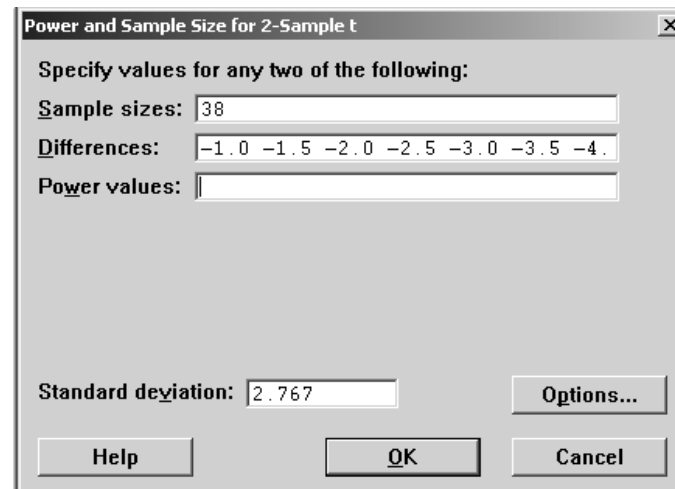
**Power and Sample Size**

2-Sample t Test

Testing mean 1 = mean 2 (versus <)  
 Calculating power for mean 1 = mean 2 + difference  
 Alpha = 0.05 Assumed standard deviation = 2.767

Difference	Sample Size	Power
-1.0	38	0.46654
-1.5	38	0.75692
-2.0	38	0.93013
-2.5	38	0.98800
-3.0	38	0.99881
-3.5	38	0.99993
-4.0	38	1.00000
-4.5	38	1.00000
-5.0	38	1.00000

The sample size is for each group.



Comments:

- (1) Notice that a one-sided test has more power than a two-sided test for the same number of observations. Compare the entries below for a two-sided test and a one-sided test.

**Power and Sample Size**

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**Power and Sample Size**

2-Sample t Test

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-4.0	38	1.00000
-4.5	38	1.00000
-5.0	38	1.00000

- (2) Notice that when you demand a higher degree of evidence in order to reject Ho (i.e., demand a lower p-value), the power for such a test is lower. Compare the entries below for significance levels set at  $\alpha = .05$  and  $\alpha = .01$ .

**Power and Sample Size**

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**Alpha = 0.05** Assumed standard deviation = 2.767

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3.5	38	0.99975
4.0	38	0.99999
4.5	38	1.00000
5.0	38	1.00000

**Power and Sample Size**

2-Sample t Test

Testing mean 1 = mean 2 (versus not =)  
 Calculating power for mean 1 = mean 2 + difference  
**Alpha = 0.01** Assumed standard deviation = 2.767

Difference	Sample Size	Power
1.0	38	0.15021
1.5	38	0.39523
2.0	38	0.69287
2.5	38	0.89859
3.0	38	0.97947
3.5	38	0.99754
4.0	38	0.99983
4.5	38	0.99999
5.0	38	1.00000

**Example 2: Prospective calculation of sample size to ensure high power for detecting effects that you have determined to be important.**

Ordinary corn doesn't have as much of the amino acid lysine as animals need in their feed. Plant scientists have developed varieties of corn that have increased amounts of lysine. Suppose you are planning an experiment to test the effectiveness of the high-lysine corn feed. You plan to measure the weight gains of one-day-old chicks after 21 days for a group of chicks fed the high lysine corn and for a control group fed the normal corn.

You will carry out the analysis with a two-sample t test

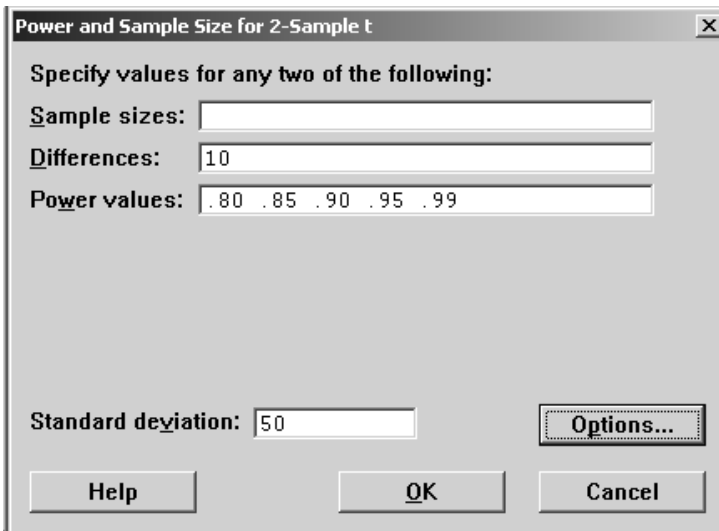
$$H_0: \mu_1 - \mu_2 = 0$$
$$H_a: \mu_1 - \mu_2 > 0$$

where  $\mu_1$  = mean weight gain for the high lysine group and  $\mu_2$  = mean weight gain for the control group.

- (a) You would like to be able to detect a difference in average weight gain as small as 10 grams with at least 80% power. You plan to use a significance level of .05 (i.e., you will reject  $H_0$  if p-value < .05). Investigate the sample sizes needed for such a study. Past experience shows that the standard deviation in weight gains for chicks fed normal corn is about 40 grams, and about 50 grams for chicks fed high lysine corn.

Comment:

The calculation of power requires knowledge of the standard deviations of the populations from which we sample, which we don't have. So we estimate the population standard deviations from knowledge of the process or a pilot study. Use the larger of the two in the calculation of power (conservative).



**Power and Sample Size**

2-Sample t Test

Testing mean 1 = mean 2 (versus >)  
Calculating power for mean 1 = mean 2 + difference  
Alpha = 0.05 Assumed standard deviation = 50

Difference	Sample Size	Target Power	Actual Power
10	310	0.80	0.800218
10	361	0.85	0.850743
10	429	0.90	0.900078
10	542	0.95	0.950067
10	790	0.99	0.990054

The sample size is for each group.

- (b) The researcher is disappointed that the required sample sizes are so large due to the cost of doing such a large study. She considers modifying the experiment so as to reduce the variability in the chicks' weight gains. She finds that she can cut the standard deviation in half by switching to a different supplier of chicks and a different research facility. However, the cost of each observation would be doubled. Would these measures be cost effective? That is, would the modified experiment be less costly?

**Power and Sample Size for 2-Sample t**

Specify values for any two of the following:

Sample sizes:

Differences:

Power values:

Standard deviation:

Buttons: Help, OK, Cancel, Options...

### Power and Sample Size

2-Sample t Test

Testing mean 1 = mean 2 (versus >)  
 Calculating power for mean 1 = mean 2 + difference  
 Alpha = 0.05 Assumed standard deviation = 25

Difference	Sample Size	Target Power	Actual Power
10	78	0.80	0.800147
10	91	0.85	0.851556
10	108	0.90	0.900643
10	136	0.95	0.950051
10	198	0.99	0.990051

The sample size is for each group.

- (c) After more consideration, the researcher decides that it's probably not important to be able to detect such a small difference in the average weight gains. She decides to investigate the power associated with a difference in weight gains of 15, 20, and 25 g, using the original supplier and the original facility.

**Power and Sample Size for 2-Sample t**

Specify values for any two of the following:

Sample sizes:

Differences:

Power values:

Standard deviation:

Buttons: Help, OK, Cancel, Options...

### Power and Sample Size

2-Sample t Test

Testing mean 1 = mean 2 (versus >)  
 Calculating power for mean 1 = mean 2 + difference  
 Alpha = 0.05 Assumed standard deviation = 50

Difference	Sample Size	Target Power	Actual Power
15	139	0.80	0.802340
15	161	0.85	0.851086
15	191	0.90	0.900016
15	242	0.95	0.950581
15	352	0.99	0.990130
20	78	0.80	0.800147
20	91	0.85	0.851556
20	108	0.90	0.900643
20	136	0.95	0.950051
20	198	0.99	0.990051
25	51	0.80	0.805899
25	59	0.85	0.854276
25	70	0.90	0.902966
25	88	0.95	0.951425
25	127	0.99	0.990064

The sample size is for each group.