

Matched T-Test

Cohen Chapter 11

For EDUC/PSY 6600

“...we are suffering from a plethora of surmise, conjecture, and hypothesis. The difficulty is to detach the framework of fact – of absolute undeniable fact – from the embellishments of theorists and reporters.”

Sherlock Holmes

Silver Blaze

MOTIVATING EXAMPLES

*Dr. Filburn wishes to assess the effectiveness of a leadership workshop for 60 middle managers. The 60 managers are rated by their immediate supervisors on the Leadership Rating Form (LRF), **before and after** the workshop.*

*Dr. Clarke is interested in determining if workers are more concerned with job security or pay. He gains the cooperation of 30 individuals who work in **different settings** and asks each employee to rate his or her concern about 1) salary level and 2) job security on a scale from 1 to 10.*

*Dr. Gale questions whether husbands or wives with infertility problems feel equally anxious. She recruits 24 infertile couples and then administers the Infertility Anxiety Measure (IAM) to both **the husbands and the wives**.*

PAIRED-SAMPLES DESIGNS

- Comparing means of 2 groups
 - Assumption of independence has been violated resulting in a **dependency** across groups
 - E.g., Members of same family, class, group, litter, twinship
 - Variance of DV smaller as groups consist of same or closely matched cases
- Paired-samples *t*-test also known as...
 - Matched-, Related-, Correlated-, Dependent-, or Non-independent samples *t*-test
 - Repeated-measures *t*-test

Experimental

Matching groups on some variable(s)

E.g., sex, age, education

↓ potential confounds on IV-DV relationship or
when cases cannot receive both conditions

Naturalistic

Samples naturally related, correlated,
dependent

REPEATED-MEASURES DESIGNS

- **Successive designs:**

2 measurements, conditions, or sets of stimuli are applied to cases sequentially

- Before-and-after (or longitudinal) designs
 - Pre- / post-test, time 1 / time 2
- Cross-over designs
 - Order effects? Need to counterbalance order
 - Random subset of cases → A then B
 - Another random subset of cases → B then A
 - Counterbalancing may not eliminate carry-over effects
 - Wash-out period

Cohen Chap 11 - Matched t test

- **Simultaneous designs:**

2 varying conditions or sets of stimuli inter-mixed w/in study and all cases receive both

No concern for order effects or temporality

Order is generally random

HYPOTHESES: 'DIRECT DIFFERENCE' METHOD

- Same as Independent-samples t -test
 - $H_0: \mu_1 = \mu_2$ or $\mu_1 - \mu_2 = 0$ or $\mu_1 - \mu_2 = 0$
 - $H_1: \mu_1 \neq \mu_2$ or $\mu_1 > \mu_2$ or $\mu_1 < \mu_2$
- $H_0: \mu_1 - \mu_2 = 0 \rightarrow H_0: \mu_D = 0$
 - **Compute difference score for each subject**
 - $X_{i1} - X_{i2} = D$
 - $H_0: \mu_D = 0$ and $H_1: \mu_D \neq 0$
- **Now equivalent to 1-sample t -test**
 - Mean of difference scores compared w/ $H_0: \mu_D = 0$

CALCULATIONS

Mean of difference scores Hypothesized population difference

$$df = N - 1$$

Number of difference
scores (pairs) - 1

$$t = \frac{\bar{D} - \mu_D}{s_{\bar{D}}} = \frac{\bar{D} - 0}{\frac{s_D}{\sqrt{N}}}$$

$$s_D = \sqrt{\frac{\sum_{i=1}^n (D_i - \bar{D})^2}{N - 1}}$$

= SD of difference scores

ASSUMPTIONS

1. Independence of pairs of observations
2. Normality of sampling distribution of difference scores in population
3. Equal *ns*
 - Pair deleted when 1 member missing data

PAIRED-SAMPLES *T*-TEST AND CORRELATION

- Paired-samples *t*-test almost always more powerful than independent-samples *t*-test
 - More likely to reject H_0 when false
 - Requires fewer subjects
- Degree of correlation (r) between scores on 2 groups related to size of difference between paired- and independent-samples *t*-statistics
 - Larger correlation \rightarrow larger difference

$$t = \frac{\bar{X}_1 - \bar{X}_2}{\sqrt{\left(\frac{s_1^2}{n_1} + \frac{s_2^2}{n_2} \right) - \frac{2rs_1s_2}{n}}}$$

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Paired-samples t -test calculated as a function of r

- When $r = 0$,
 - equation reduces to independent-samples t -test
- When $r > 0$
 - denominator reduces, leading to larger t -statistic
- When $r < 0$
 - denominator increases, leading to smaller t -statistic
 - *Rare to have a negative correlation with paired-data*

CONFIDENCE INTERVALS

95% *CI* around μ_D

Rewrite:

$$t = \frac{\bar{D} - \mu_D}{\frac{s_D}{\sqrt{N}}}$$

As:

$$CI_{1-\alpha} = \bar{D} \pm t_{\alpha/2} * \frac{s_D}{\sqrt{N}}$$

Are paired sample means
significantly different?

Yes: H_0 value not w/in *CI*

No: H_0 value within *CI*

EXAMPLE

- Same example from independent-samples t -test lecture
- But suppose participants were carefully matched into pairs based on their level of depression prior to initiation of study
- One member of each pair was randomly assigned to drug group, other to placebo group
- After 6 months, level of depression was measured by a psychiatrist
- Need to conduct paired-samples t -test due to matching

Group 1 - Drug	Group 2 - Placebo
11	11
1	11
0	5
2	8
0	4

R CODE: FIRST APPROACH

```
df <- read.csv("drug_paired.csv")
```

```
## do some plots and summaries
```

```
df %>%  
  tidyr::gather(key = "group",  
                value = "value",  
                group1, group2,  
                na.rm = TRUE) %>%  
  t.test(value ~ group,  
        data = .,  
        paired = TRUE)
```

} Get the data into R

} Plot and summaries

} Reshape the data into wide form

} Paired samples t-test

Group 1 - Drug	Group 2 - Placebo
11	11
1	11
0	5
2	8
0	4

R CODE: FIRST APPROACH

Paired t-test

```
data: value by group
t = -3.1009, df = 4, p-value = 0.03619
alternative hypothesis: true difference in means is not equal to 0
95 percent confidence interval:
 -9.4768832 -0.5231168
sample estimates:
mean of the differences
-5
```

R CODE: SECOND APPROACH

```
df <- read.csv("drug_paired.csv")
```

} Get the data into R

```
## do some plots and summaries
```

} Plot and summaries

```
df %>%
```

```
  dplyr::mutate(group_diff = group2 - group1) %>%
```

} Create group difference variable

```
  dplyr::pull(group_diff) %>%
```

```
  t.test(mu = 0)
```

} Single samples t-test of the group difference

Group 1 - Drug	Group 2 - Placebo
11	11
1	11
0	5
2	8
0	4

R CODE: SECOND APPROACH

One Sample t-test

```
data: .  
t = 3.1009, df = 4, p-value = 0.03619  
alternative hypothesis: true mean is not equal to 0  
95 percent confidence interval:  
 0.5231168 9.4768832  
sample estimates:  
mean of x  
      5
```


EFFECT SIZE

- *Cohen's d (same as in 1-sample t -test)

- $d = \frac{\bar{D}}{s_D}$ or $\frac{t}{\sqrt{N}}$

- Eta squared (η^2)

- $\eta^2 = \frac{N * \bar{D}^2}{N * \bar{D}^2 + (N-1) * s_{\bar{D}}^2}$ or $\frac{t^2}{t^2 + N - 1}$

POWER ANALYSIS

Post hoc

With Cohen's d estimate and # pairs, compute delta to obtain power of study

$$\delta = d \sqrt{\frac{N}{2}}$$

A Priori

With desired power, compute delta and combine with estimated Cohen's d to obtain # pairs (N)

$$N = \left(\frac{\delta}{d} \right)^2$$

δ	ONE-TAILED TEST (α)			
	.05	.025	.01	.005
	TWO-TAILED TEST (α)			
	.10	.05	.02	.01
0.5	.14	.08	.03	.02
0.6	.16	.09	.04	.02
0.7	.18	.11	.05	.03
0.8	.21	.13	.06	.04
0.9	.23	.15	.08	.05
1.0	.26	.17	.09	.06
1.1	.29	.20	.11	.07
1.2	.33	.22	.13	.08
1.3	.37	.26	.15	.10
1.4	.40	.29	.18	.12
1.5	.44	.32	.20	.14
1.6	.48	.36	.23	.16
1.7	.52	.40	.27	.19
1.8	.56	.44	.30	.22
1.9	.60	.48	.33	.25
2.0	.64	.52	.37	.28
2.1	.68	.56	.41	.32
2.2	.71	.60	.45	.35
2.3	.74	.63	.49	.39
2.4	.77	.67	.53	.43
2.5	.80	.71	.57	.47
2.6	.83	.74	.61	.51
2.7	.85	.77	.65	.55
2.8	.88	.80	.68	.59
2.9	.90	.83	.72	.63

WEAKNESSES

- Reduction in df for critical value
- Lack of a control group (sometimes)
- If samples are not truly matched, results will be spurious

ALTERNATIVES

- Violation of normality
 - Matched-pairs Wilcoxon Test
- Binomial Sign Test for Two Dependent Samples
- Sample Re-use methods
 - Exact tests
 - Randomization and permutation tests