

Paired Binary Data

ST551 Lecture 23

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response: Y

did ~~you~~ eat breakfast?

yes/no
0/1

groups: G

do you prefer cats or dogs?

cat/dog
0/1

Paired setting:

find n siblings

whose one

prefers cats?

and one

prefers dogs?

Did you eat breakfast this

morning?

Finish last time's slides

morning?

Paired Binary Data

Paired Binary Data

Imagine now that our two samples of Bernoulli populations aren't independent, but paired in some way.

$$Y_1, \dots, Y_n \sim \text{Bernoulli}(p_Y)$$

$$X_1, \dots, X_n \sim \text{Bernoulli}(p_X)$$

but (Y_i, X_i) are paired.

Examples:

- n subjects with a disease, and n without a disease are sampled then matched (based on demographic factors), response is presence of some risk factor
- Sibling (or twin) studies: n pairs of related people where one falls in one group, and the other falls in the other group, observe some binary response on every person.
- Binary before and after measurements on the same person

Paired Binary Data

Gather sample of $n = 40$ voters.

Before debate: Will you vote for candidate A?

After debate: Will you vote for candidate A?

subject	before	after
1	1	1
2	1	0
3	1	0
4	1	1
5	1	1
6	1	0
⋮		
⋮		
⋮		
40		

Just a 2×2 table?

No! ignores the pairing

Group?

Vote for candidate A

	0	1
after	21	19
before	23	17

80

this isn't really 80 independent observations

before

	after	
	0	1
0	a = 12	b = 11
1	c = 9	d = 8

$$40 = n = \# \text{ pairs}$$

Reflects pairing

→ each pair is counted once

How to analyse?

Option 1: Treat like paired two sample data and do a paired t-test

Option 2: McNemar's test

Paired t-test

Null hypothesis: $H_0 : \mu_{\text{before}} = \mu_{\text{after}}$
 $\rho_{\text{before}} = \rho_{\text{after}}$

Look at (per voter) differences:

subject	before	after	diff
1	1	1	0
2	1	0	-1
3	1	0	-1
4	1	1	0
5	1	1	0
6	1	0	-1

o
o
o

	table of differences		
40	-1	0	1
	9	20	11

who went from voting to not voting

Paired t-test calculations

$$\frac{\bar{D} - 0}{\sqrt{s_D/n}}$$

$$\bar{D} = \frac{1}{n} ((-1 \times 9) + (0 \times 20) + (1 \times 11)) = \frac{b - c}{n} = \frac{2}{40} = 0.05$$

sample variance of differences

$$\begin{aligned} s_D^2 &= \frac{1}{n-1} (9(-1 - \bar{D})^2 + 20(0 - \bar{D})^2 + 11(1 - \bar{D})^2) \\ &= \frac{1}{n-1} \left(c + b - \frac{(b-c)^2}{n} \right) \\ &= \frac{1}{40-1} \left(9 + 11 - \frac{(11-9)^2}{n} \right) \\ &= 0.51 \end{aligned}$$

Paired t-test calculations

```
##  
## One Sample t-test  
##  
## data: df$diff  
## t = 0.4427, df = 39, p-value = 0.6604  
## alternative hypothesis: true mean is not equal to 0  
## 95 percent confidence interval:  
## -0.1784514 0.2784514  
## sample estimates:  
## mean of x  
## 0.05
```

$$t = \frac{\bar{D}}{\sqrt{\frac{SD^2}{n}}}$$

no evidence against
 $P_{before} = P_{after}$

McNemar's test

Null hypothesis: $H_0 : p_{\text{before}} = p_{\text{after}}$

Conditions on the number of discordant pairs, $b + c$.

		after	
		0	1
before	not vote A	0	12
	vote A	1	9

Under Null hypothesis, we expect the number of discordant pairs (e.g. people who change their minds during debate) should be equally split between b and c .

McNemar's test

Conditional on $b + c$,

$$b \sim \text{Binomial}(b + c, 0.5)$$

Do, one sample Z-test for proportions, leads to

$$Z = \frac{b - c}{\sqrt{b + c}} \sim N(0, 1) \quad \text{under null hypothesis}$$

(sometimes people square this statistic, and compare to χ_1^2)

Example: McNemar's

		<i>after</i>	
		0	1
		<hr/>	
<i>before</i>	0	12	11
	1	9	8
		<hr/>	

$$Z = \frac{b - c}{\sqrt{b + c}} = \frac{11 - 9}{\sqrt{11 + 9}} = 0.45$$

Compare to $N(0,1)$

$Z_{1-\alpha/2}$

Final points

- McNemar's test is equivalent to the paired t-test, in the sense that the two test statistics are monotone transformations of each other.
- For large sample sizes, the two test statistics get closer and closer to the same value: asymptotically equivalent.