## Lecture 16

Chi-Squared Test, Relative Risk, and Odds Ratio
Text: Chapter 10
STAT 8020 Statistical Methods II October 15, 2020

## Agenda

Chi-Squared Test Relative Risk, and Odds Ratio

## 

Chi-Squared Test
Relalive Risk and Odds Ratio

## (1) Chi-Squared Test

(2) Relative Risk and Odds Ratio

## Review: $\chi^{2}$-Test for Independence

- Calculate the $\chi^{2}$ statistic:

$$
\chi_{o b s}^{2}=\sum \text { partial } \chi^{2} \text { value }
$$

C2 Calculate the degrees of freedom ( $d f$ )

$$
d f=(\# \text { of rows }-1) \times(\# \text { of columns }-1)
$$

(3) Find the $\chi^{2}$ critical value with respect to $\alpha$
© Draw the conclusion:
Reject $H_{0}$ if $\chi_{o b s}^{2}$ is bigger than the $\chi^{2}$ critical value $\Rightarrow$ There is an statistical evidence that there is a relationship between the two variables at $\alpha$ level

## Handedness/Gender Example Revisited

|  | Right-handed | Left-handed | Total |
| :---: | :---: | :---: | :---: |
| Males | 43 | 9 | 52 |
| Females | 44 | 4 | 48 |
| Total | 87 | 13 | 100 |

Is the percentage left-handed men in the population different from the percentage of left-handed women?

A 2011 study was conducted in Kalamazoo, Michigan. The objective was to determine if parents' marital status affects children's marital status later in their life. In total, 2,000 children were interviewed. The columns refer to the parents' marital status. Use the contingency table below to conduct a $\chi^{2}$ test from beginning to end. Use $\alpha$ = . 10

| (Observed) | Married | Divorced | Total |
| :---: | :---: | :---: | :---: |
| Married | 581 | 487 |  |
| Divorced | 455 | 477 |  |
| Total |  |  |  |

## Example Cont'd

O Define the Null and Alternative hypotheses:
$H_{0}$ : there is no relationship between parents' marital status and childrens' marital status.
$H_{a}$ : there is a relationship between parents' marital status and childrens' marital status
(2) Calculate the marginal totals, and the grand total

| (Observed) | Married | Divorced | Total |
| :---: | :---: | :---: | :---: |
| Married | 581 | 487 | 1068 |
| Divorced | 455 | 477 | 932 |
| Total | 1036 | 964 | 2000 |

## Example Cont'd

(3) Calculate the expected cell counts

| (Expected) | Married | Divorced |
| :---: | :---: | :---: |
| Married | $\frac{1068 \times 10366}{2000}=553.224$ | $\frac{1068 \times 964}{2006}=514.776$ |
| Divorced | $\frac{932 \times 1036}{2000}=482.776$ | $\frac{93 \times 964}{2000}=449.224$ |

## Example Cont'd

(3) Calculate the expected cell counts

| (Expected) | Married | Divorced |
| :---: | :---: | :---: |
| Married | $\frac{1068 \times 1036}{20000}=553.224$ | $\frac{1068 \times 964}{2000}=514.776$ |
| Divorced | $\frac{932 \times 1036}{2000}=482.776$ | $\frac{932964}{2000}=449.224$ |

( Calculate the partial $\chi^{2}$ values

| partial $\chi^{2}$ | Married | Divorced |
| :---: | :---: | :---: |
| Married | $\frac{(581-553.244)^{2}}{553.224}=1.39$ | $\frac{(487-514.776)^{2}}{514.776}=1.50$ |
| Divorced | $\frac{(455-48.776)^{2}}{482.776}=1.60$ | $\frac{(477-449.24)^{2}}{449.224}=1.72$ |

## Example Cont'd

(0) Calculate the expected cell counts

| (Expected) | Married | Divorced |
| :---: | :---: | :---: |
| Married | $\frac{1068 \times 1036}{20000}=553.224$ | $\frac{1068 \times 964}{2000}=514.776$ |
| Divorced | $\frac{932 \times 1036}{2000}=482.776$ | $\frac{932964}{2000}=449.224$ |

- Calculate the partial $\chi^{2}$ values

| partial $\chi^{2}$ | Married | Divorced |
| :---: | :---: | :---: |
| Married | $\frac{(581-553.224)^{2}}{553.224}=1.39$ | $\frac{(487-514.776)^{2}}{514.766}=1.50$ |
| Divorced | $\frac{(455-48.776)^{2}}{482.776}=1.60$ | $\frac{(477-449.224)^{2}}{449.224}=1.72$ |

(0) Calculate the $\chi^{2}$ statistic
$\chi^{2}=1.39+1.50+1.60+1.72=6.21$

## Example Cont'd

(0) Calculate the expected cell counts

| (Expected) | Married | Divorced |
| :---: | :---: | :---: |
| Married | $\frac{1068 \times 1036}{20000}=553.224$ | $\frac{1068 \times 964}{2000}=514.776$ |
| Divorced | $\frac{932 \times 1036}{2000}=482.776$ | $\frac{932964}{2000}=449.224$ |

- Calculate the partial $\chi^{2}$ values

| partial $\chi^{2}$ | Married | Divorced |
| :---: | :---: | :---: |
| Married | $\frac{(581-553.224)^{2}}{553.24}=1.39$ | $\frac{(487-514.776)^{2}}{514.776}=1.50$ |
| Divorced | $\frac{(455-482.776)^{2}}{482.776}=1.60$ | $\frac{(477-449.224)^{2}}{449.224}=1.72$ |

(0) Calculate the $\chi^{2}$ statistic
$\chi^{2}=1.39+1.50+1.60+1.72=6.21$
(0) Calculate the degrees of freedom (df)

The $d f$ is $(2-1) \times(2-1)=1$

- Calculate the expected cell counts

| (Expected) | Married | Divorced |
| :---: | :---: | :---: |
| Married | $\frac{1068 \times 1036}{92000}=553.224$ | $\frac{1068 \times 964}{20006}=514.776$ |
| Divorced | $\frac{932 \times 1036}{2000}=482.776$ | $\frac{93 \times 964}{2000}=449.224$ |

- Calculate the partial $\chi^{2}$ values

| partial $\chi^{2}$ | Married | Divorced |
| :---: | :---: | :---: |
| Married | $\frac{(581-553.244)^{2}}{553.224}=1.39$ | $\frac{(487-514.776)^{2}}{51.776}=1.50$ |
| Divorced | $\frac{(455-48.776)^{2}}{482.776}=1.60$ | $\frac{(477-449.244)^{2}}{449.224}=1.72$ |

(0) Calculate the $\chi^{2}$ statistic $\chi^{2}=1.39+1.50+1.60+1.72=6.21$
(0) Calculate the degrees of freedom ( $d f$ )

The $d f$ is $(2-1) \times(2-1)=1$

- Find the $\chi^{2}$ critical value with respect to $\alpha$ from the $\chi^{2}$ table The $\chi_{\alpha=0.1, d f=1}^{2}=2.71$
- Calculate the expected cell counts

| (Expected) | Married | Divorced |
| :---: | :---: | :---: |
| Married | $\frac{1068 \times 1036}{2000}=553.224$ | $\frac{1068 \times 964}{2000}=514.776$ |
| Divorced | $\frac{932 \times 1036}{2000}=482.776$ | $\frac{932 \times 964}{2000}=449.224$ |

- Calculate the partial $\chi^{2}$ values

| partial $\chi^{2}$ | Married | Divorced |
| :---: | :---: | :---: |
| Married | $\frac{(581-553.244)^{2}}{553.224}=1.39$ | $\frac{(487-514.776)^{2}}{51.776}=1.50$ |
| Divorced | $\frac{(455-48.776)^{2}}{482.776}=1.60$ | $\frac{(477-449.244)^{2}}{449.224}=1.72$ |

(0) Calculate the $\chi^{2}$ statistic $\chi^{2}=1.39+1.50+1.60+1.72=6.21$
(0) Calculate the degrees of freedom ( $d f$ )

The $d f$ is $(2-1) \times(2-1)=1$

- Find the $\chi^{2}$ critical value with respect to $\alpha$ from the $\chi^{2}$ table The $\chi_{\alpha=0.1, d f=1}^{2}=2.71$
(3) Draw your conclusion:

We reject $H_{0}$ and conclude that there is a relationship between parents' marital status and childrens' marital status.

The following contingency table contains enrollment data for a random sample of students from several colleges at Purdue University during the 2006-2007 academic year. The table lists the number of male and female students enrolled in each college. Use the two-way table to conduct a $\chi^{2}$ test from beginning to end. Use $\alpha=.01$

| (Observed) | Female | Male | Total |
| :---: | :---: | :---: | :---: |
| Liberal Arts | 378 | 262 | 640 |
| Science | 99 | 175 | 274 |
| Engineering | 104 | 510 | 614 |
| Total | 581 | 947 | 1528 |

## Example Cont'd

| (Expected) | Female | Male |
| :---: | :---: | :---: |
| Liberal Arts | $\frac{640 \times 581}{1528}=243.35$ | $\frac{640 \times 947}{1528}=396.65$ |
| Science | $\frac{274 \times 581}{1528}=104.18$ | $\frac{247 \times 947}{1528}=169.82$ |
| Engineering | $\frac{614 \times 581}{1528}=233.46$ | $\frac{611 \times 947}{1528}=380.54$ |


| partial $\chi^{2}$ | Female | Male |
| :---: | :---: | :---: |
| Lib Arts | $\frac{(378-243.35)^{2}}{243.35}=74.50$ | $\frac{(262-396.65)^{2}}{396.65}=45.71$ |
| Sci | $\frac{(99-104.18)^{2}}{104.18}=0.26$ | $\frac{(175-169.82)^{2}}{169.82}=0.16$ |
| Eng | $\frac{(104-233.46)^{2}}{233.46}=71.79$ | $\frac{(510-380.54)^{2}}{380.54}=44.05$ |

$\chi^{2}=74.50+45.71+0.26+0.16+71.79+44.05=236.47$
The $d f=(3-1) \times(2-1)=2 \Rightarrow$ Critical value
$\chi_{\alpha=.01, d f=2}^{2}=9.21$
Therefore we reject $H_{0}$ (at .01 level) and conclude that there is a relationship between gender and major.

## R Code \& Output

table <- matrix(c(378, 99, 104, $262,175,510), 3,2)$
colnames(table) <- c("Female", "Male")
rownames(table) <- c("Liberal Arts", "Science",
"Engineering")
table
Female Male

| Liberal Arts | 378 | 262 |
| :--- | ---: | ---: |
| Science | 99 | 175 |
| Engineering | 104 | 510 |

chisq.test(table)|
Pearson's Chi-squared test
data: table
X-squared $=236.47, \mathrm{df}=2, \mathrm{p}$-value $<$
$2.2 e-16$

## Take Another Look at the Example

| (Proportion) | Female | Male | Total |
| :---: | :---: | :---: | :---: |
| Liberal Arts | $.59(.65)$ | $.41(.28)$ | $(.42)$ |
| Science | $.36(.17)$ | $.64(.18)$ | $(.18)$ |
| Engineering | $.17(.18)$ | $.83(.54)$ | $(.40)$ |

Rejecting $H_{0} \Rightarrow$ conditional probabilities are not consistent with marginal probabilities

## Example: Comparing Two Population Proportions

Let $p_{1}=\mathrm{P}($ Female $\mid$ Liberal Arts $)$ and
$p_{2}=\mathrm{P}($ Female $\mid$ Science $)$.
$n_{1}=640, X_{1}=378, n_{2}=274, X_{2}=99$

- $H_{0}: p_{1}-p_{2}=0$ vs. $H_{a}: p_{1}-p_{2} \neq 0$
- $z_{o b s}=\frac{.59-.36}{\sqrt{\frac{.52 \times .48}{640}+\frac{.52 \times .48}{274}}}=6.36>z_{0.025}=1.96$
- We do have enough statistical evidence to conclude that $p_{1} \neq p_{2}$ at $.05 \%$ significant level.


## R Code \& Output

```
prop.test(x = c(378, 99), n = c(640, 274),
correct = F)
    2-sample test for equality of
    proportions without continuity
    correction
data: c(378, 99) out of c(640, 274)
X-squared = 40.432, df = 1, p-value =
2.036e-10
alternative hypothesis: two.sided
95 percent confidence interval:
    0.1608524 0.2977699
sample estimates:
    prop 1 prop 2
0.5906250 0.3613139
```


## Example: Test for Homogeneity

$$
\begin{aligned}
& \text { Let } p_{1}=\mathrm{P}(\text { Liberal Arts }), p_{2}=\mathrm{P}(\text { Science }), \\
& p_{3}=\mathrm{P}(\text { Engineering }) \\
& \quad \text { The Hypotheses: }
\end{aligned}
$$

$$
H_{0}: p_{1}=p_{2}=p_{3}=\frac{1}{3}
$$

$H_{a}$ : At least one is different

- The Test Statistic:

$$
\begin{aligned}
\chi_{o b s}^{2} & =\frac{(640-509.33)^{2}}{509.33}+\frac{(274-509.33)^{2}}{509.33}+\frac{(614-509.33)^{2}}{509.33} \\
& =33.52+108.73+21.51=163.76>\chi_{.05, d f=2}^{2}=5.99
\end{aligned}
$$

- Rejecting $H_{0}$ at .05 level


## R Code \& Output

```
chisq.test(x = c(640, 274, 614), p = rep(1/3, 3))
    Chi-squared test for given
    probabilities
data: c(640, 274, 614)
X-squared = 163.76, df = 2, p-value
< 2.2e-16
```


## The Lady Tasting Tea Experiment

A lady declares that by tasting a cup of tea made with milk she can discriminate whether the milk or the tea infusion was first added to the cup. We will consider the problem of designing an experiment by means of which this assertion can be tested. [...] [It] consists in mixing eight cups of tea, four in one way and four in the other, and presenting them to the subject for judgment in a random order. The subject has been told in advance of that the test will consist, namely, that she will be asked to taste eight cups, that these shall be four of each kind [...]. - Fisher, 1935.


## R Code \& Output

```
TeaTasting <-
matrix(c(3, 1, 1, 3), nrow = 2,
    dimnames = list(Guess = c("Milk", "Tea"),
                        Truth = c("Milk", "Tea")))
```

TeaTasting
Truth
Guess Milk Tea
Milk 31

Tea 13
fisher.test(TeaTasting, alternative = "greater")
Fisher's Exact Test for Count Data
data: TeaTasting
$p$-value $=0.2429$
alternative hypothesis: true odds ratio is greater than 1

## The Lady Tasting Tea



Chi-Squared Test, Relative Risk, and Odds Ratio

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Chi-Squared Test
Pelative Risk and Odds Ratio

## Aspirin Use and Myocardial Infarction

The table below is from a report on the relationship between aspirin use and heart attract by the Physicians' Health Study Research Group at Harvard Medical School (New Engl. J. Med. 318: 262-264, 1988).

|  | Heart Attack |  |  |
| :---: | :---: | :---: | :---: |
| Group | Yes | No | Total |
| Placebo | 189 | 10,845 | 11,034 |
| Aspirin | 104 | 10,933 | 11,037 |

Here we want to know if the use of aspirin effectively reduces the heart attack rate. To do so we are going to introduce relative risk and odds ratio.

## Relative Risk and Odds Ratio

The relative risk ( RR ) is defined to be the ratio

$$
\mathrm{RR}=\frac{p_{1}}{p_{2}}
$$

where $p_{i}$ is the probability of "success" for the $\mathrm{i}^{\text {th }}$ group.

The odds ratio $(\theta)$ is defined as

$$
\theta=\frac{\Omega_{1}}{\Omega_{2}}=\frac{p_{1} /\left(1-p_{1}\right)}{p_{2} /\left(1-p_{2}\right)},
$$

where $\Omega$ is the odds for the $\mathrm{i}^{\text {th }}$ group.

## Aspirin Use and Heart Attack Revisited: Inference for $\theta$

|  | Heart Attack |  |  |
| :---: | :---: | :---: | :---: |
| Group | Yes | No | Total |
| Placebo | 189 | 10,845 | 11,034 |
| Aspirin | 104 | 10,933 | 11,037 |

## Point Estimation:

$$
\hat{\theta}=\frac{\hat{p}_{1} /\left(1-\hat{p}_{1}\right)}{\hat{p}_{2} /\left(1-\hat{p}_{2}\right)}=\frac{n_{11} \times n_{22}}{n_{12} \times n_{21}}
$$

where $n_{i 1}$ is the number of successes and $n_{i 2}$ is the number of the failures of the $\mathrm{i}^{\text {th }}$ group. For this example, we have

$$
\hat{\theta}=\frac{189 \times 10933}{10845 \times 104}=1.83
$$

$\Rightarrow$ the odds of heart attack for those taking placebo was 1.83 times the odds of those taking aspiring.

## Inference for $\theta$ Cont'd

## Interval Estimation:

Confidence interval is constructed in the nature log scale. We have the Wald confidence interval for $\log \theta$

$$
\log \hat{\theta}+z_{\alpha / 2} \hat{\sigma}_{\log \hat{\theta}}
$$

where the estimated standard error for $\log \hat{\theta}$ is

$$
\hat{\sigma}_{\log \hat{\theta}}=\left(\frac{1}{n_{11}}+\frac{1}{n_{12}}+\frac{1}{n_{21}}+\frac{1}{n_{22}}\right)^{1 / 2} .
$$

Exponentiating its end points (i.e., the lower limit and the upper limit) provides a confidence interval for $\theta$.

## Aspirin Use and Heart Attack: Confidence Interval for $\theta$

Suppose we want to construct a $95 \% \mathrm{CI}$ for $\theta$ :

- $\log \hat{\theta}=0.6054$
- $\hat{\sigma}_{\log \hat{\theta}}=\left(\frac{1}{189}+\frac{1}{10845}+\frac{1}{104}+\frac{1}{10933}\right)^{1 / 2}=0.1228$
- Margin of error: $z_{0.025} \times \hat{\sigma}_{\log \hat{\theta}}=1.96 \times 0.1228=0.2407$
- Cl on the nature log scale:
$[0.6054-0.2407,0.6054+0.2407]=[0.3647,0.8461]$
- Cl on the original scale:

$$
[\exp (0.3647), \exp (0.8461)]=[1.4401,2.3305]
$$

