## CI and $z$-Test for Population Proportion

As reported by AMA, $16 \%$ doctors in any given year are subject to malpractice claims. A hospital of 300 physicians received claims against 58 of their doctors.
Since $\hat{p}=58 / 300=.1933, \hat{\sigma}_{\hat{p}}=$ $\sqrt{.1933(1-.1933) / 300}=.0228$, a $95 \% \mathrm{CI}$ is given by

$$
.1933 \pm 1.96(.0228)
$$

or $(0.1486,0.2380)$.
To test for $H_{0}: p=.16$,

$$
z=\frac{\hat{p}-.16}{\sqrt{.16(1-.16) / 300}}=1.575,
$$

with a 2 -sided $p$-value of 0.115 .

Consider $X \sim \operatorname{Bin}(n, p)$. For $n$ large, by CLT,

$$
P\left(\frac{X / n-p}{\sqrt{p(1-p) / n}} \leq z\right) \approx \Phi(z)
$$

The sample proportion $\hat{p}=X / n$ is actually an $\bar{X}$. As an estimate of $\sigma_{\hat{p}}=\sqrt{p(1-p) / n}$, one may use

$$
\hat{\sigma}_{\hat{p}}=\sqrt{\hat{p}(1-\hat{p}) / n} .
$$

A $(1-\alpha) 100 \%$ CI for $p$ is thus

$$
\hat{p} \pm z_{\alpha / 2} \hat{\sigma}_{\hat{p}}
$$

To test $H_{0}: p=p_{0}$ vs. $H_{a}: p \neq p_{0}$,

$$
Z=\frac{\hat{p}-p_{0}}{\sqrt{p_{0}\left(1-p_{0}\right) / n}} .
$$

## $\chi^{2}$-Test for Binary Proportions

Let $Z_{i} \sim N(0,1), i=1, \ldots, n$, independent. The distribution of

$$
\sum_{i=1}^{n} Z_{i}^{2}
$$

is a $\chi^{2}$-distribution with $n$ degrees of freedom. Selected percentiles of $\chi^{2}$-distributions, $\chi_{\alpha, \nu}^{2}$, can be found in Table A.11.

Chisq(5)


The $z$-test is equivalent to a $\chi^{2}$ test based on the expected and observed cell counts.

| $E$ | $n p_{0}$ | $n\left(1-p_{0}\right)$ |
| :---: | :---: | :---: |
| $O$ | $Y$ | $n-Y$ |

One rejects $H_{0}$ if

$$
\chi^{2}=\sum \frac{(O-E)^{2}}{E} \geq \chi_{\alpha, 1}^{2} .
$$

For the malpractice data,

| $E$ | 48 | 252 |
| :--- | :--- | :--- |
| $O$ | 58 | 242 |

$\chi^{2}=\frac{(58-48)^{2}}{48}+\frac{(252-242)^{2}}{252}=2.480$

- $2.480=(1.575)^{2}, \chi_{\alpha, 1}^{2}=1.96^{2}$.


## Testing for Multiple Cell Proportions

According to a certain Mendelian genetic model, self-pollination of pink-flowered plants of snapdragon should produce progeny that are red, pink, and white in the ratio 1:2:1.

$$
H_{0}: p_{1}=.25, p_{2}=.5, p_{3}=.25
$$

Data were obtained on 209 plants.

| $E$ | 52.25 | 104.5 | 52.25 |
| :---: | :---: | :---: | :---: |
| $O$ | 52 | 128 | 29 |

$$
\begin{aligned}
\chi^{2} & =\frac{.25^{2}}{52.25}+\frac{23.5^{2}}{104.5}+\frac{23.25^{2}}{52.25} \\
& =15.63
\end{aligned}
$$

Since $P\left(\chi_{2}^{2}>15.63\right)=.0004$, evidence was strong against $H_{0}$.

The $\chi^{2}$-test applies to many testing problems involving cell proportions. To test for given proportions of multiple, say $k$, cells

$$
H_{0}: p_{i}=p_{i 0} \quad \text { vs. } \quad H_{a}: \text { o.w. }
$$

one obtains the expected and observed cell counts,

| $E$ | $n p_{10}$ | $\cdots$ | $n p_{k 0}$ |
| :---: | :---: | :---: | :---: |
| $O$ | $Y_{1}$ | $\cdots$ | $Y_{k}$ |

and rejects $H_{0}$ if

$$
\chi^{2}=\sum \frac{(O-E)^{2}}{E} \geq \chi_{\alpha, k-1}^{2}
$$

Note that $\sum Y_{i}=n$ and $\sum p_{i}=1$. $H_{0}$ has $0 \mathrm{df} ; H_{a}$ has $k-1$.

## $\chi^{2}$-Test for Composite Hypothesis

2 alleles at a locus yield 3 blood types, MM, MN, and NN. In equilibrium, the 3 types should have probabilities $\theta^{2}, 2 \theta(1-\theta)$, and $(1-\theta)^{2}$, respectively, where $\theta$ is the prevalence of M in the population. A sample of size 500 gives 125:225:150.
Based on $\hat{\theta}=(2(125)+225) / 1000=$ .475 , the estimated expected $\hat{E}$ 's are 112.8:249.4:137.8. One has

$$
\begin{aligned}
\chi^{2} & =\frac{12.2^{2}}{112.8}+\frac{24.4^{2}}{249.4}+\frac{12.2^{2}}{137.8} \\
& =4.787
\end{aligned}
$$

Since $P\left(\chi_{1}^{2}>4.787\right)=.0287$, evidence was moderately strong against equilibrium.

When $H_{0}$ is not completely specified but pending on knowledge of some parameter(s), say

$$
H_{0}: p_{i}=p_{i}(\theta) \text { vs. } H_{a}: \text { o.w., }
$$

one has to estimate the unknown parameter(s) $\theta$ then calculate the estimated expected $\hat{E}=n p_{i}(\hat{\theta})$.
$H_{0}$ will be rejected if

$$
\chi^{2}=\sum \frac{(O-\hat{E})^{2}}{\hat{E}} \geq \chi_{\alpha, k-1-d}^{2},
$$

where $d$ is the number of parameters to be estimated $(\operatorname{dim}(\theta))$.
$H_{0}$ has $d \mathrm{df} ; H_{a}$ has $k-1$.

## Testing for Distributional Models

The sex-ratio data of 72069 sixchild families are given below.

| Boys | $O$ | $\hat{E}$ |
| :---: | ---: | ---: |
| 0 | 1096 | 939.5 |
| 1 | 6233 | 5982.5 |
| 2 | 15700 | 15873.1 |
| 3 | 22221 | 22461.8 |
| 4 | 17332 | 17879.3 |
| 5 | 7908 | 7590.2 |
| 6 | 1579 | 1342.6 |

The boy ratio is estimated to be $\hat{p}=.5148723$.

Are the boy counts binomial?

$$
H_{0}: p_{i}=C_{i}^{6} p^{i}(1-p)^{6-i}
$$

$H_{a}$ : otherwise
$H_{0}$ has 1 df; $H_{a}$ has 6 df .
First calculate the estimated expected cell counts

$$
\hat{E}_{i}=n C_{i}^{6} \hat{p}^{i}(1-\hat{p})^{6-i} .
$$

Then calculate

$$
\chi^{2}=\sum_{i=0}^{6} \frac{\left(O_{i}-\hat{E}_{i}\right)^{2}}{\hat{E}_{i}}=112.7 .
$$

Since $P\left(\chi_{5}^{2}>112.7\right)=0_{+}$, evidence is overwhelming against a binomial model.

## $2 \times 2$ Table: Homogeneity - I

In a study to evaluate the effectiveness of the drug Timolol in preventing angina attacks, patients were randomly allocated to receive Timolol or placebo for 28 weeks.

|  | Timolol | Placebo |
| ---: | ---: | ---: |
| A-free | 44 | 19 |
| Not A-free | 116 | 128 |

One has $\hat{p}_{1}=\frac{44}{44+116}=.275, \hat{p}_{2}=$ $\frac{19}{19+128}=.129$, and

$$
\sqrt{\frac{.275(.725)}{160}+\frac{.129(.871)}{147}}=.045 .
$$

A $95 \% \mathrm{CI}$ for $p_{1}-p_{2}$ is thus
$(.275-.129) \pm 1.96(.045)$,
or (.058, .234).

Consider $X_{i} \sim \operatorname{Bin}\left(n_{i}, p_{i}\right), i=1,2$.
For $n_{1}, n_{2}$ large,

$$
\frac{\left(\hat{p}_{1}-\hat{p}_{2}\right)-\left(p_{1}-p_{2}\right)}{\sqrt{\frac{\hat{p}_{1}\left(1-\hat{p}_{1}\right)}{n_{1}}+\frac{\hat{p}_{2}\left(1-\hat{p}_{2}\right)}{n_{2}}}} \sim N(0,1)
$$

which can be used to construct CI for $p_{1}-p_{2}$.

To test the hypotheses

$$
H_{0}: p_{1}=p_{2} \quad \text { vs. } H_{a}: p_{1} \neq p_{2}
$$ calculate

$$
Z=\frac{\hat{p}_{1}-\hat{p}_{2}}{\sqrt{\hat{p}(1-\hat{p})\left(\frac{1}{n_{1}}+\frac{1}{n_{2}}\right)}}
$$

$$
\text { where } \hat{p}=\left(X_{1}+X_{2}\right) /\left(n_{1}+n_{2}\right)
$$ and reject $H_{0}$ when $|Z|>z_{\alpha / 2}$.

- Plug in $H_{0}$ in $\hat{\sigma}_{\hat{p}_{1}-\hat{p}_{2}}$ for test.


## $2 \times 2$ Table: Homogeneity - II

For the angina data, the pooled estimate is $\hat{p}=\frac{44+19}{160+147}=.205$, and

$$
\sqrt{.205(.795)\left(\frac{1}{160}+\frac{1}{147}\right)}=.046
$$

To test $H_{0}: p_{1}=p_{2}$, calculate

$$
Z=\frac{.275-.129}{.046}=3.159,
$$

with $p$-value $P(|Z|>3.16)=.0016$.
The estimated expected cell counts under $H_{0}$ are

|  | Timolol | Placebo |
| ---: | ---: | ---: |
| A-free | 32.83 | 30.17 |
| Not A-free | 127.17 | 116.83 |

One calculates

$$
\chi^{2}=\sum \frac{(O-E)^{2}}{E}=9.98=3.159^{2}
$$

One can also use the $\chi^{2}$-test for $H_{0}: p_{1}=p_{2}$. Under $H_{0}$, the expected cell counts are

|  | $\operatorname{trt} 1$ | $\operatorname{trt} 2$ |
| :---: | :---: | :---: |
| s | $n_{1} p$ | $n_{2} p$ |
| f | $n_{1}(1-p)$ | $n_{2}(1-p)$ |

with $p$ estimated by $\hat{p}=\frac{Y_{1}+Y_{2}}{n_{1}+n_{2}}$. The resulting $\chi^{2}=Z^{2}$.

Write the observed table as

| $n_{11}$ | $n_{12}$ | $n_{1 .}$ |
| :--- | :--- | :--- |
| $n_{21}$ | $n_{22}$ | $n_{2 .}$ |
| $n_{\cdot 1}$ | $n_{\cdot 2}$ | $n .$. |

The estimated expected table consists of $e_{i j}=n_{i \cdot n \cdot j} / n \ldots$

## $2 \times 2$ Table: Conditional Probability

To study the relationship between hair color and eye color in a German population, an anthropologist observed a sample of 68000 men.

|  | Hair |  |  |
| ---: | ---: | ---: | ---: |
| Eye | Dark | Light | Total |
| Dark | 726 | 131 | 857 |
| Light | 3129 | 2814 | 5943 |
| Total | 3855 | 2945 | 6800 |

Simple calculation yields

$$
\begin{aligned}
\hat{P}(D E \mid D H) & =\frac{726}{3855}=.1883 \\
\hat{P}(D E \mid L H) & =\frac{131}{2945}=.0445 \\
\hat{P}(D H \mid D E) & =\frac{726}{857}=.8471
\end{aligned}
$$

$2 \times 2$ tables also come up with two binary r.v.'s.

|  | B | $\overline{\mathrm{B}}$ |  |
| :---: | :---: | :---: | :---: |
| A | $p_{11}$ | $p_{12}$ | $p_{1}$. |
| $\overline{\mathrm{A}}$ | $p_{21}$ | $p_{22}$ | $p_{2}$. |
|  | $p_{\cdot 1}$ | $p_{\cdot 2}$ | 1 |

It is clear that $P(A \mid B)=p_{11} / p_{\cdot 1}$, $P(B \mid A)=p_{11} / p_{1 .}$, etc.

Estimation of conditional probabilities is straightforward.

$$
\begin{aligned}
& \hat{P}(A \mid B)=n_{11} / n_{\cdot 1} \\
& \hat{P}(A \mid \bar{B})=n_{12} / n_{\cdot 2} \\
& \hat{P}(B \mid A)=n_{11} / n_{1 \cdot}
\end{aligned}
$$

## $2 \times 2$ Table: Independence

For the hair color and eye color data above,

$$
\begin{aligned}
& \hat{P}(D E)=\frac{857}{6800}=.1260, \\
& \hat{P}(D H)=\frac{3855}{6800}=.5669 .
\end{aligned}
$$

The estimated expected are

|  | Hair |  |  |
| ---: | ---: | ---: | ---: |
| Eye | Dark | Light | Total |
| Dark | 485.8 | 371.2 | 857 |
| Light | 3369.2 | 2573.8 | 5943 |
| Total | 3855 | 2945 | 6800 |

$$
\chi^{2}=\sum \frac{(O-E)^{2}}{E}=313.6 .
$$

Evidence is overwhelming against $H_{0}: p_{i j}=p_{i \cdot} p_{\cdot j}$.

For A and B indep., $P(A \cap B)=$ $P(A) P(B)$, or $p_{11}=p_{1 \cdot p \cdot 1}$.

To test the hypotheses

$$
H_{0}: p_{i j}=p_{i \cdot p \cdot j} \quad \text { vs. } H_{a}: \text { o.w. }
$$

estimate $p_{i}$. by $\hat{p}_{i}=n_{i} / n_{. .}, p_{\cdot j}$ by $\hat{p}_{\cdot j}=n_{\cdot j} / n . .$, and calculate the estimated expected under $H_{0}$,

$$
e_{i j}=n . . \hat{p}_{i \cdot} \cdot \hat{p}_{\cdot j}=n_{i} \cdot n \cdot j / n \ldots
$$

- Different problem settings yield the same $\chi^{2}$.
- For homogeneity, $H_{0}$ has 1 df , $H_{a}$ has 2. For independence, $H_{0}$ has $2 \mathrm{df}, H_{a}$ has 3 .


## Testing with $r \times c$ Table

Blood types were determined for 1655 ulcer patients and 10000 healthy controls.

|  | Ulcer | Control | Total |
| :---: | ---: | ---: | ---: |
| O | 911 | 4578 | 5489 |
| A | 579 | 4219 | 4798 |
| B | 124 | 890 | 1014 |
| AB | 41 | 313 | 354 |
| Ttl | 1655 | 10000 | 11655 |

E's are easily calculated, e.g.,

$$
e_{11}=\frac{5489(1655)}{11655}=779.4
$$

Since $\chi^{2}=49$ and $\chi_{.01,3}^{2}=11.34$, reject homogeneity at the $1 \%$ level.

A $r \times c$ table can be $r$ outcomes cross $c$ treatments, or the joint distribution of two discrete r.v.'s.

To test for homogeneity or independence, calculate the estimated expected by

$$
e_{i j}=n_{i} \cdot n_{\cdot j} / n \ldots
$$

The test statistic $\chi^{2}=\sum \frac{(O-E)^{2}}{E}$ has $(r-1)(c-1) \mathrm{df}$.

For homogeneity, $H_{0}$ has $r-1 \mathrm{df}$, $H_{a}$ has $c(r-1)$. For independence, $H_{0}$ has $(r-1)+(c-1) \mathrm{df}, H_{a}$ has $r c-1$.

