## Hypothesis Testing

## Hypothesis testing

- An objective method of making decisions or inferences from sample data (evidence)
- Sample data used to choose between two choices i.e. hypotheses or statements about a population
- We typically do this by comparing what we have observed to what we expected if one of the statements (Null Hypothesis) was true


## Hypothesis testing Framework What the text books might say!

- Always two hypotheses:
$\mathrm{H}_{\mathrm{A}}$ : Research (Alternative) Hypothesis
- What we aim to gather evidence of
- Typically that there is a difference/effect/relationship etc.
$\mathrm{H}_{0}$ : Null Hypothesis
- What we assume is true to begin with
- Typically that there is no difference/effect/relationship etc.


## Discussion

- How could you help a student understand what hypothesis testing is and why they need to use it?



## Could try explaining things in the context of "The Court Case"?

- Members of a jury have to decide whether
 is guilty or innocent based on evidence

Null: The person is innocent
Alternative: The person is not innocent (i.e. guilty)

- The null can only be rejected if there is enough evidence to doubt it
- i.e. the jury can only convict if there is beyond reasonable doubt for the null of innocence
- They do not know whether the person is really guilty or innocent so they may make a mistake


## Types of Errors



## Steps to undertaking a Hypothesis test



## Example: Titanic

- The ship Titanic sank in 1912 with the loss of most of its passengers
- 809 of the 1,309 passengers and crew died = 61.8\%
- Research question: Did class (of travel) affect survival?


## Chi squared Test?

- Null:

There is NO association between class and survival

- Alternative: There IS an association between class and survival


Class * Survived? Crosstabulation
Count

|  |  | Survived? |  | Total |
| :--- | :--- | ---: | ---: | ---: |
|  | Died | Survived | 323 |  |
| Class | 1st | 123 | 200 | 277 |
|  | 2nd | 158 | 119 | 270 |
|  | 3rd | 528 | 181 | 709 |
|  |  | 809 | 500 | 1309 |

## What would be expected if the null is true?

- Same proportion of people would have died in each class!
- Overall, 809 people died out of $1309=61.8 \%$



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- Same proportion of people would have died in each class!
- Overall, 809 people died out of $1309=61.8 \%$



## Chi-Squared Test Actually Compares Observed and Expected Frequencies



Expected number dying in each class $=0.618$ * no. in class

## Chi-squared test statistic

- The chi-squared test is used when we want to see if two categorical variables are related
- The test statistic for the Chi-squared test uses the sum of the squared differences between each pair of observed (O) and expected values (E)

$$
\chi^{2}=\sum_{i=1}^{n} \frac{\left(O_{i}-E_{i}\right)^{2}}{E_{i}}
$$

## Using SPSS

## Analyse $\rightarrow$ Descriptive Statistics $\rightarrow$ Crosstabs

Click on 'Statistics' button \& select Chi-squared

## Test Statistic $=127.859$

Chi-Square Tests

|  | Value | df | Asymp. Sig. (2-sided) |  |
| :---: | :---: | :---: | :---: | :---: |
| Pearson Chi-Square | $127.859^{\text {a }}$ | 2 | . 000 | $p$ - value |
| Likelihood Ratio | 127.765 | 2 | . 000 | $p<0.001$ |
| Linear-by-Linear Association | 127.709 | 1 | . 000 |  |
| $N$ of Valid Cases | 1309 |  |  |  |

Note: Double clicking on the output will display the p -value to more decimal places

## Hypothesis Testing: Decision Rule

- We can use statistical software to undertake a hypothesis test e.g. SPSS
- One part of the output is the p -value $(\mathrm{P})$
- If $\mathrm{P}<0.05$ reject $\mathrm{H}_{0}=>$ Evidence of $\mathrm{H}_{\mathrm{A}}$ being true (i.e. IS association)
- If $\mathrm{P} \boldsymbol{>} \mathbf{0 . 0 5}$ do not reject $\mathrm{H}_{0}$ (i.e. NO association)


## Chi squared distribution

- The $p$-value is calculated using the Chi-squared distribution for this test
- Chi-squared is a skewed distribution which varies depending on the degrees of freedom


> Note: One sample test:
> $v=d f=$ outcomes -1

## What's a p-value? The technical answer!

Probability of getting a test statistic at least as extreme as the one calculated if the null is true

In Titanic example, the probability of getting a test statistic of 127.859 or above (if the null is true) is $<0.001$

Distribution of test statistics


## Interpretation



Since $p<0.05$ we reject the null
There is evidence ( $\chi_{2}^{2}=127.86, p<0.001$ ) to suggest that there is an association between class and survival

But... what is the nature of this
 association/relationship?

## Titanic exercise

Were 'wealthy' people more likely to survive on board the Titanic?

## Option 1:

- Choose the right percentages from the next slide to investigate
- Fill in the stacked bar chart with the chosen \%'s
- Write a summary to go with the chart


## Contingency tables exercise <br> Which percentages are better for investigating whether class had an effect on survival?

## Column

Class * Survived? Crosstabulation

|  |  |  | Survived? |  | Total |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  |  |  | Died | Survived |  |
| Class | 1st | Count | 123 | 200 | 323 |
|  |  | \% within Survived? | 15.2\% | 40.0\% | 24.7\% |
|  | 2nd | Count | 158 | 119 | 277 |
|  |  | \% within Survived? | 19.5\% | 23.8\% | 21.2\% |
|  | 3rd | Count | 528 | 181 | 709 |
|  |  | \% within Survived? | 65.3\% | 36.2\% | 54.2\% |
| Total |  | Count | 809 | 500 | 1309 |
|  |  | \% within Survived? | 100.0\% | 100.0\% | 100.0\% |

Row

Class * Survived? Crosstabulation

|  |  |  | Survived? |  |  |
| :--- | :--- | :--- | ---: | ---: | ---: |
|  |  | Died | Survived | Total |  |
| Class | 1st | Count | 123 | 200 | 323 |
|  |  | \% within Class | $38.1 \%$ | $61.9 \%$ | $100.0 \%$ |
|  | 2nd | Count | 158 | 119 | 277 |
|  |  | \% within Class | $57.0 \%$ | $43.0 \%$ | $100.0 \%$ |
|  | 3rd | Count | 528 | 181 | 709 |
|  |  | \% within Class | $74.5 \%$ | $25.5 \%$ | $100.0 \%$ |
| Total |  | Count | 809 | 500 | 1309 |
|  |  | \% within Class | $61.8 \%$ | $38.2 \%$ | $100.0 \%$ |

$65.3 \%$ of those who died were in $3^{\text {rd }}$ class $74.5 \%$ of those in $3^{\text {rd }}$ class died

## Did class affect survival? Question

Fill in the \%'s on the stacked bar chart and interpret


## Did class affect survival? Solution

\%'s within each class are preferable due to different class frequencies
pelass * survived Crosstabulation

|  |  |  | surwiwed |  | Total |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  |  |  | Died | Survived |  |
| polase | 1 st | Count | 123 | 200 | 323 |
|  |  | \% within pelass | 38.1\% | 61.9\% | 100.0\% |
|  | 2nd | Count | 158 | 119 | 277 |
|  |  | \% within pelass | 57.0\% | $43.0 \%$ | 100.0\% |
|  | 3 rd | Count | 528 | 181 | 709 |
|  |  | \% within pelass | $74.5 \%$ | $25.5 \%$ | $100.0 \%$ |
| Total |  | Count | 809 | 500 | 1309 |
|  |  | \% within pelass | 61.8\% | 38.2\% | $100.0 \%$ |

## Did class affect survival? Solution



Figure 1: Bar chart showing \% of passengers surviving within each class

Data collected on 1309 passengers aboard the Titanic was used to investigate whether class had an effect on chances of survival. There was evidence ( $\chi_{2}^{2}=127.86, \mathrm{p}<0.001$ ) to suggest that there is an association between class and survival.

Figure 1 shows that class and chances of survival were related. As class decreases, the percentage of those surviving also decreases from $62 \%$ in $1^{\text {st }}$ Class to $26 \%$ in $3^{\text {rd }}$ Class.

## Low EXPECTED Cell Counts with the Chisquared test



## Low Cell Counts with the Chi-squared test

- Check no. of cells with EXPECTED counts less than 5
- SPSS reports the \% of cells with an expected count <5
- If more than $20 \%$ then the test statistic does not approximate a chi-squared distribution very well
- If any expected cell counts are <1 then cannot use the chi-squared distribution
- In either case if have a $2 \times 2$ table use Fishers' Exact test (SPSS reports this for $2 \times 2$ tables)
- In larger tables ( $3 \times 2$ etc.) combine categories to make cell counts larger (providing it's meaningful)

