| Clinical Biostatistics |
| :---: |
| Analyses for qualitative data |
| Martin Bland |
| Professor of Health Statistics |
| University of York |
| http://martinbland.co.uk/ |

$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$

## Analyses for qualitative data

$\qquad$
Also called nominal, categorical.
Only two categories: dichotomous, attribute, quantal, binary.

## Methods:

> Chi-squared test for association
> Fisher's exact test
$>$ Risk ratio, relative risk, rate ratio
> Odds ratio
> Number needed to treat
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$

## Contingency tables

Cross tabulation of two categorical variables:


Meadows J, Jenkinson S, Catalan J. (1994) Who chooses to have the HIV antibody test in the antenatal clinic? Midwifery 10, 44-48.

## Contingency tables

Cross tabulation of two categorical variables:

| Marital status Acmer | Acceptance of HIV test <br> Accepted Rejected Total |  |  |
| :---: | :---: | :---: | :---: |
| Married | 71 | 415 | 486 |
| Living w. partner | 41 | 181 | 222 |
| Single | 15 | 35 | 50 |
| Div./wid./sep. | 7 | 23 | 30 |
| Total | 134 | 654 | 788 |

This kind of cross-tabulation of frequencies is also called a contingency table or cross classification.
Called 4 by 2 table or $4 \times 2$ table.
In general, $r \times c$ table.

## Contingency tables

Cross tabulation of two categorical variables:
Acceptance of HIV test grouped by marital status

## Acceptance of HIV test

$\qquad$

| Marital status | Accepted | Rejected | Total |
| :--- | :---: | :---: | ---: |
| ----- | 71 | 415 | 486 |
| Married | 41 | 181 | 222 |
| Living w. partner | 15 | 35 | 50 |
| Single | 7 | 23 | 30 |
| Div./wid./sep. | 134 | 654 | 788 |

Want to test the null hypothesis that there is no relationship or association between the two variables.

If the sample is large, we can do this by a chi-squared test. If the sample is small, we must use Fisher's exact test.

## The chi-squared test for association



Null hypothesis: no association between the two variables.
Alternative hypothesis: an association of some type.
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$

The chi-squared test for association
$\left.\begin{array}{lcc}\text { Acceptance of HIV test grouped by marital status } \\ \text { Acceptance of HIV test }\end{array}\right)$

Proportion who accepted $=134 / 788$
Out of 486 married, expect $486 \times 134 / 788=82.6$ to accept if the null hypothesis were true.

## The chi-squared test for association

| Marital status ${ }^{\text {A }}$ | Acceptance of HIV test Accepted Rejected |  | Total |
| :---: | :---: | :---: | :---: |
| Married | 82.6 | 403.4 | 486 |
| Living w. partner |  |  | 222 |
| Single |  |  | 50 |
| Div./wid./sep. |  |  | 30 |
| Total | 134 | 654 | 788 |

Proportion who refused $=654 / 788$
Out of 486 married, expect $486 \times 654 / 788=403.4$
to refuse if the null hypothesis were true.
Note that $82.6+403.4=486$.

## The chi-squared test for association

$\left.\begin{array}{lccc}\text { Acceptance of HIV test grouped by marital status } \\ \text { Acceptance of HIV test }\end{array}\right)$

Out of 222 living with partner, expect $222 \times 134 / 788=37.8$ to accept if the null hypothesis were true.
Out of 222 living with partner, expect $222 \times 654 / 788=184.2$ to refuse if the null hypothesis were true.

Note that $37.8+184.2=222$.

## The chi-squared test for association

| Marital status ${ }^{\text {A }}$ | Acceptance of HIV test Accepted Rejected |  | Total |
| :---: | :---: | :---: | :---: |
| Married | 82.6 | 403.4 | 486 |
| Living w. partner | 37.8 | 184.2 | 222 |
| Single | 8.5 | 41.5 | 50 |
| Div./wid./sep. | 5.1 | 24.9 | 30 |
| Total | 134 | 654 | 788 |

Note that $82.6+37.8+8.5+5.1=134$,

$$
403.4+184.2+41.5+24.9=654
$$

Observed and expected frequencies have the same row and column totals.
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$

## The chi-squared test for association

Acceptance of HIV test grouped by marital status
Acceptance of HIV test

| Marital status | Accepted | Rejected | Total |
| :---: | :---: | :---: | :---: |
| Married | 82.6 | 403.4 | 486 |
| Living w. partner | 37.8 | 184.2 | 222 |
| Single | 8.5 | 41.5 | 50 |
| Div./wid./sep. | 5.1 | 24.9 | 30 |
| Total | 134 | 654 | 788 |

$\qquad$
$\qquad$
$\qquad$
Expected frequency if null hypothesis true $=$ row total $\times$ column total grand total

## The chi-squared test for association

| Marital status | Acceptance Accepted | of HIV test Rejected | Total |
| :---: | :---: | :---: | :---: |
| Married | 7182.6 | 415403.4 | 486 |
| Living w. partner | r 4137.8 | 181184.2 | 222 |
| Single | 158.5 | $35 \quad 41.5$ | 50 |
| Div./wid./sep. | 75.1 | 2324.9 | 30 |
| Total | 134 | 654 | 788 |

Compare the observed and expected frequencies.
Add (observed - expected) ${ }^{2} /$ expected for all cells $=9.15$.
If null hypothesis true and samples are large enough, this is an observation from a chi squared distribution, often written $\chi^{2}$.

## The Chi-squared distribution

Family of distributions, one parameter, called the degrees of freedom.





Percentage points of the Chi-squared Distribution

$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$

## Percentage points of the Chi-squared Distribution

| Degrees of | is exceeded |  |  |  |
| :---: | :---: | :---: | :---: | :---: |
| freedom | 10\% 0.10 | 5\% 0.05 | 1\% 0.01 | 0.1\% 0.001 |
| 1 | 2.71 | 3.84 | 6.63 | 10.83 |
| 2 | 4.61 | 5.99 | 9.21 | 13.82 |
| 3 | 6.25 | 7.81 | 11.34 | 16.27 |
| 4 | 7.78 | 9.49 | 13.28 | 18.47 |
| 5 | 9.24 | 11.07 | 15.09 | 20.52 |
| 6 | 10.64 | 12.59 | 16.81 | 22.46 |
| 7 | 12.02 | 14.07 | 18.48 | 24.32 |
| 8 | 13.36 | 15.51 | 20.09 | 26.13 |
| 9 | 14.68 | 16.92 | 21.67 | 27.88 |
| 10 | 15.99 | 18.31 | 23.21 | 29.59 |

$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$

## The chi-squared test for association

Acceptance of HIV test grouped by marital status
Acceptance of HIV test

| Marital status | Accepted | Rejected | Total |
| :---: | :---: | :---: | :---: |
| Married | 7182.6 | 415403.4 | 486 |
| Living w. partner | 4137.8 | 181184.2 | 222 |
| Single | 158.5 | $35 \quad 41.5$ | 50 |
| Div./wid./sep. | 75.1 | $23 \quad 24.9$ | 30 |
| Total | 134 | 654 | 788 |

For a contingency table, the degrees of freedom are given by: (number of rows -1 ) $\times$ (number of columns -1 ).

We have $(4-1) \times(2-1)=3$ degrees of freedom. $\chi^{2}=9.15$, 3 d.f.

Percentage points of the Chi-squared Distribution

| $\begin{gathered} \text { Degrees } \\ \text { of } \end{gathered}$ | is exceeded |  |  |  |
| :---: | :---: | :---: | :---: | :---: |
| freedom | 10\% 0.10 | 5\% 0.05 | 1\% 0.01 | $0.1 \% 0.001$ |
| 1 | 2.71 | 3.84 | 6.63 | 10.83 |
| 2 | 4.61 | 5.99 | 9.21 | 13.82 |
| 3 | 6.25 | 7.81 | 11.34 | 16.27 |
| 4 | 7.78 | 9.49 | 13.28 | 18.47 |
| 5 | 9.24 | 11.07 | 15.09 | 20.52 |
| 6 | 10.64 | 12.59 | 16.81 | 22.46 |
| 7 | 12.02 | 14.07 | 18.48 | 24.32 |
| 8 | 13.36 | 15.51 | 20.09 | 26.13 |
| 9 | 14.68 | 16.92 | 21.67 | 27.88 |
| 10 | 15.99 | 18.31 | 23.21 | 29.59 |

$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$

## The chi-squared test for association

| Marital status | Acceptance Accepted | of HIV test Rejected | Total |
| :---: | :---: | :---: | :---: |
| Married | 7182.6 | 415403.4 | 486 |
| Living w. partner | r 4137.8 | 181184.2 | 222 |
| Single | 158.5 | 3541.5 | 50 |
| Div./wid./sep. | 75.1 | 2324.9 | 30 |
| Total | 134 | 654 | 788 |

For a contingency table, the degrees of freedom are given by: (number of rows -1 ) $\times$ (number of columns -1 ).

We have $(4-1) \times(2-1)=3$ degrees of freedom.
$\chi^{2}=9.15,3$ d.f., $\mathrm{P}<0.05$. Using a computer, $\mathrm{P}=0.027=0.03$.

## The chi-squared test for association

The chi-squared statistic is not an index of the strength of the association.

If we double the frequencies, this will double chi-squared, but the strength of the association is unchanged.

## The chi-squared test for association

The test statistic follows the Chi-squared Distribution provided the expected values are large enough.

This is a large sample test.
The smaller the expected values become, the more dubious will be the test.

The conventional criterion for the test to be valid is this: the chi-squared test is valid if at least $80 \%$ of the expected frequencies exceed 5 and all the expected frequencies exceed 1.
Also known as the Pearson chi-squared test.

## Fisher's exact test

Also called the Fisher-Irwin exact test.
Works for any sample size.
Used to be used only for small samples in 2 by 2 tables, because of computing problems.
Calculate the probability of every possible table with the given row and column totals.

Sum the probabilities for all the tables as or less probable than the observed.
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
.
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$

Fisher's exact test

$\chi^{2}=9.15,3$ d.f., $P=0.027$.
Fishers' exact test: $\mathrm{P}=0.029$.

## Yates' correction



Fisher's exact test: $\mathrm{P}=0.0049$.
Chi-squared test: chi-squared $=8.87, \mathrm{P}=0.0029$.

Callam MJ, Harper DR, Dale JJ, Brown D, Gibson B, Prescott RJ, Ruckley CV. (1992) Lothian Forth Valley leg ulcer healing trial-part 1: elastic versus nonelastic bandaging in the treatment of chronic leg ulceration. Phlebology 7: 136-41.

## Yates' correction



Fisher's exact test: $\mathrm{P}=0.0049$.
Chi-squared test: chi-squared $=8.87, P=0.0029$.
As expected frequencies get smaller, chi-squared and Fisher's exact disagree.
Fisher's produces the 'correct' P value.
Chi-squared produces a P value which is too small.

## Yates' correction



Fisher's exact test: $\mathrm{P}=0.0049$.
Chi-squared test: chi-squared $=8.87, \mathrm{P}=0.0029$.
Yates introduced a modified chi-squared test for a 2 by 2 table which adjusts for this.
Also called the continuity correction.

## Yates' correction



Fisher's exact test: $\mathrm{P}=0.0049$.
Chi-squared test: chi-squared $=8.87, \mathrm{P}=0.0029$.
Chi-squared with Yates' correction:
chi-squared $=7.84, \mathrm{P}=0.0051$.
Yates' correction now obsolete as we can always do the exact test.

## The chi-squared test for trend

Number of antenatal visits by type of maternity unit

| Type of maternity Number of antenatal visits |  |  |
| :---: | :---: | :---: |
| unit | that women received | Total |

0-4 5-9 10-14 $15+$
$\begin{array}{lllllll}\text { Traditional model } n & 10 & 82 & 167 & 72 & 331\end{array}$

|  | 37.0 | 30.8 | 40.7 | 46.2 |
| :--- | :--- | :--- | :--- | :--- |$\quad 38.5$


| $n$ | 27 | 266 | 410 | 156 |
| :--- | :--- | :--- | :--- | :--- | 859

undley V, Penney G, Fitzmaurice A, van Teijlinen E, Graham E. (2002) A comparison of data obtained from service providers and service users to assess the quality of maternity care. Midwifery 18, p 126-135.
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$

## The chi-squared test for trend

Number of antenatal visits by type of maternity unit
Type of maternity Number of antenatal visits
unit that women received Total
0-4 5-9 10-14 15+
$\begin{array}{lllllll}\text { Traditional model } n & 10 & 82 & 167 & 72 & 331\end{array}$ $\begin{array}{lllrlr}n & 10 & 82 & 167 & 72 & 331 \\ \% & 37.0 & 30.8 & 40.7 & 46.2 & 38.5\end{array}$
$\begin{array}{lllllll}\text { New model } n & 17 & 184 & 243 & 84 & 528\end{array}$
$\begin{array}{lllll}\% & 63.0 & 69.2 & 59.3 & 53.8 \\ 61.5\end{array}$
$\begin{array}{lllllll}\text { Total } n & 27 & 266 & 410 & 156 & 859\end{array}$

$$
\begin{array}{lllll}
\% & 100.0 & 100.0 & 100.0 & 100.0
\end{array} 100.0
$$

Chi-squared $=11.36,3$ d.f., $P=0.01$.
Does not take the ordering of the categories into account.
Trend: chi-squared $=9.33$, d.f. $=1, P=0.002$.
About trend: chi-squared $=2.03,2$ d.f., $\mathrm{P}=0.4$.

## Risk ratio

Wound healing by type of bandage

| Bandage | Healed Did not heal Total |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Elastic | 35 53.8\% | 30 | 46.2\% | 65 | 100\% |
| Inelastic | 19 28.4\% | 48 | 71.6\% | 67 | 100\% |

Want an estimate of the size of the treatment effect.
Difference between proportions: $0.538-0.284=0.254$ or $53.8 \%-28.4 \%=25.4$ percentage points.

Proportion who heal is called the risk of healing for that population.
Risk ratio $=53.8 / 28.4=1.89$.
Also called relative risk, rate ratio, RR

## Risk ratio

Wound healing by type of bandage


Risk ratio $=53.8 / 28.4=1.89$.
Because risk ratio is a ratio, it has a very awkward distribution.

If we take the log of the rate ratio, we have something which is found by adding and subtracting log frequencies.

The distribution becomes approximately Normal.
Provided frequencies are not small, simple standard error.
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$

## Risk ratio

Wound healing by type of bandage

| Bandage | Healed | Did not heal |  | Total |
| :---: | :---: | :---: | :---: | :---: |
| Elastic | 35 53.8\% | 30 | 46.2\% | 65 |
| Inelastic | 19 28.4\% | 48 | 71.6\% | 67 |

Risk ratio, $R R=53.8 / 28.4=1.89$.
$\log _{e}(R R)=0.6412$.
SE for $\log _{e}(R R)=0.2256$.
$95 \% \mathrm{Cl}$ for $\log _{\mathrm{e}}(\mathrm{RR})$
$=0.6412-1.96 \times 0.2256$ to $0.6412+1.96 \times 0.2256$ $=0.1990$ to 1.0834 .
$95 \% \mathrm{Cl}$ for $\mathrm{RR}=\exp (0.1990)$ to $\exp (1.0834)=1.22$ to 2.95 .

## Risk ratio

Wound healing by type of bandage
Bandage Healed Did not heal Total


Inelastic 1928.484871 .68671008
Inelastic $19 \quad 28.4 \% \quad 48 \quad 71.6 \% \quad 67$ 100\%
$\begin{array}{llll}\text { Total } & 54 & 78 & 132\end{array}$
$\log _{\mathrm{e}}(\mathrm{RR})=0.6412,95 \% \mathrm{Cl}=0.1990$ to 1.0834 .
Risk ratio, $\mathrm{RR}=53.8 / 28.4=1.89,95 \% \mathrm{CI}=1.22$ to 2.95 .
RR is not in the middle of its confidence interval.
The interval is symmetrical on the log scale, not the natural scale. $\qquad$
$\qquad$

## Odds

Elastic Healed Did not heal Total
Risk of healing $=35 / 65=0.538$
Odds of healing $=35 / 30=1.17$
Risk = number experiencing event divided by number who could.
Odds = number experiencing event divided by number who did not experience event.

Risk: for every person treated, 0.538 people heal, for every 100 people treated, 53.8 people heal.

Odds: for every person who does not heal, 1.17 people heal, for every 100 people who do not heal, 117 people heal.

## Odds ratio

| Wound healing by type of bandage |  |  |  |
| :--- | :---: | :---: | :---: |
| Bandage | Healed | Did not heal | Total |
| Elastic | 35 | 30 | 65 |
| Inelastic | 19 | 48 | 67 |
| Total | 54 | 78 | 132 |

Odds of healing given elastic bandages: 35/30 =1.17.
Odds of healing given inelastic bandages: 19/48 $=0.40$.
Odds ratio $=(35 / 30) /(19 / 48)=1.17 / 0.40=2.95$.
For every person who does not heal, 2.95 times as many will heal with elastic bandages as will heal with inelastic bandages.

## Odds ratio

Wound healing by type of bandage


Odds ratio, OR = $(35 / 30) /(19 / 48)=2.95$.
Like RR, OR has an awkward distribution. We use the log odds ratio.

The distribution becomes approximately Normal.
Provided frequencies are not small, simple standard error.

## Odds ratio



Odds ratio, $\mathrm{OR}=(35 / 30) /(19 / 48)=2.95$.
$\log _{\mathrm{e}}(\mathrm{OR})=1.0809$.
SE $\log _{\mathrm{e}}(\mathrm{OR})=0.3679$
$95 \% \mathrm{Cl}$ for $\log _{e}(\mathrm{OR})$
$=1.0809-1.96 \times 0.3679$ to $1.0809+1.96 \times 0.3679$ $=0.3598$ to 1.8020 .
$95 \% \mathrm{Cl}$ for $\mathrm{OR}=\exp (0.3598)$ to $\exp (1.8020)=1.43$ to 6.06 .

## Odds ratio

Wound healing by type of bandage
Bandage Healed Did not heal Total

| Elastic | 35 | 30 | 65 |
| :---: | :---: | :---: | :---: |
| Inelastic | 19 | 48 | 67 |

$\begin{array}{llll}\text { Total } & 54 & 78 & 132\end{array}$
$\log _{e}(O R)=1.0809,95 \% \mathrm{Cl}=0.3598$ to 1.8020 .
Odds ratio, $\mathrm{OR}=2.95,95 \% \mathrm{Cl}=1.43$ to 6.06 .
OR is not in the middle of its confidence interval.
The interval is symmetrical on the log scale, not the natural scale.

## Odds ratio

Wound healing by type of bandage
Bandage Healed Did not heal Total

| Elastic | 35 | 30 | 65 |
| :--- | :--- | :--- | :--- |


| Inelastic | 19 | 48 | 67 |
| :--- | :--- | :--- | :--- |
| - | 78 |  |  |

$\begin{array}{llll}\text { Total } & 54 & 78 & 132\end{array}$
Odds ratio for healing: $\mathrm{OR}=(35 / 30) /(19 / 48)=2.95$.
Doesn't matter which way round we do it.
Odds ratio for treatment: $\mathrm{OR}=(35 / 19) /(30 / 48)=2.95$.
Both OR = $(35 \times 48) /(30 \times 19)$.
Ratio of cross products.
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$

## Odds ratio



Switching the rows or columns inverts the odds ratio.
Odds ratio for not healing given elastic bandage:

$$
\text { OR }=(30 / 35) /(48 / 19)=0.339=1 / 2.95 .
$$

There are only two possible odds ratios.
On the log scale, equal and opposite.
$\log _{\mathrm{e}}(2.95)=1.082, \log _{\mathrm{e}}(0.339)=-1.082$.

## Odd ratios in case control studies

Case-control study: take a group of subjects with a characteristic, the cases, and compare them to another group without the characteristic, the controls.

```
Smoking history of stroke patients (cases) and
controls, with row percentages (data of Markus et
al., 1995)
Patient Smoked Never smoked Total
group
Stroke patients }7170.3\quad3029.7 101 100.
Healthy controls }\begin{array}{llllll}{36}&{26.3}&{101 73.7 137 100.0}
Total \(10745.0 \quad 13155.0 \quad 238100.0\)
```

Markus HS, Barley J, Lunt R, Bland JM, Jeffery S, Carter ND, Brown MM. (1995) Angiotensin-converting enzyme gene deletion polymorphism: a new risk factor for lacunar stroke but not carotid atheroma. Stroke 26, 1329-33.

## Odd ratios in case control studies

| Patient | Smoked |  | Never smoked |  | Total |  |
| :--- | ---: | :---: | :---: | :---: | :---: | :---: |
| group | n | $\%$ | n | $\%$ | n | $\%$ |
| Stroke patients | 71 | 70.3 | 30 | 29.7 | 101 | 100.0 |
| Healthy controls | 36 | 26.3 | 101 | 73.7 | 137 | 100.0 |
| Total | 107 | 45.0 | 131 | 55.0 | 238 | 100.0 |

Because we started with stroke patients and controls, rather than smokers and non-smokers, we cannot estimate the proportion of smokers who have strokes.

We cannot calculate the risk of a stroke for a smoker or for a non-smoker.

We cannot divide one by the other to get the relative risk.
We can evaluate the odds ratio:

$$
\mathrm{OR}=(71 \times 101) /(30 \times 36)=6.64 .
$$

## Odd ratios in case control studies

Not many people in the population have had a stroke.
We don't know what the prevalence of past stroke is among the population being studied here, who were aged between 35 and 91 years, but it is quite small.
Purely for illustration, we are going to suppose it is $0.7 \%$ If we multiply the frequencies for the healthy controls by 100, the proportion of stroke patients will be $0.7 \%$.
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$


## Odd ratios in case control studies

Artificial data:

| Patient | Smoked |  | Never smoked |  | Total |  |
| :--- | :---: | :---: | :---: | :---: | :---: | :---: |
| group | $n$ | $\%$ | $n$ | $\%$ | $n$ | $\%$ |
| Stroke patients | 71 | 70.3 | 30 | 29.7 | 101 | 100.0 |
| Healthy controls | 3600 | 26.3 | 10100 | 73.7 | 13700 | 100.0 |
| Total | 3671 | 45.0 | 10130 | 55.0 | 13801 | 100.0 |

The row percentages are unchanged, and so is the odds ratio. It is still 6.64 .

$$
\text { OR }=(71 \times 10100) /(30 \times 3600)=6.64 .
$$

We should now have the correct proportions of stroke cases among the smokers and among the non-smokers.
The relative risk should also be correct:

$$
\operatorname{RR}=(71 / 3671) /(30 / 10130)=6.53
$$

## Odd ratios in case control studies

Artificial data:

| Patient | Smoked | Never | smok | d Tot | tal |
| :---: | :---: | :---: | :---: | :---: | :---: |
| group | n \% | $n$ | \% | n | \% |
| Stroke patients | 7170.3 | 30 | 29.7 | 101 | 100.0 |
| Healthy controls | 360026.3 | 10100 | 73.7 | 13700 | 100.0 |
| Total | 367145.0 | 10130 | 55.0 | 13801 | 100.0 |
| $\mathrm{OR}=(71 \times 10100) /(30 \times 3600)=6.64$. |  |  |  |  |  |
| $R \mathrm{R}=(71 / 3671) /(30 / 10130)=6.53$ |  |  |  |  |  |

RR is very similar to the OR.
When the frequencies in one category are much smaller than those in the other, OR and RR are much the same.

## Odd ratios in case control studies

Original real data:

| Patient | Smoked | Never smoked | Tot | tal |
| :---: | :---: | :---: | :---: | :---: |
| group | n \% | n \% | n | \% |
| Stroke patients | 7170.3 | 3029.7 | 101 | 100.0 |
| Healthy controls | 3626.3 | 10173.7 | 137 | 100.0 |
| Total | 10745.0 | 13155.0 | 238 | 100.0 |
| $\mathrm{OR}=(71 \times 10100) /(30 \times 3600)=6.64$. |  |  |  |  |
| $R \mathrm{R}=(71 / 107) /(30 / 131)=2.90$ |  |  |  |  |

RR is very different from the OR.
In a case-control study, provided what defines a case is rare in the population, the odds ratio can be used as an estimate of the relative risk.
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$

## Risk ratio or odds ratio?

Wound healing by type of bandage
Bandage Did not heal Healed Total

| Elastic | 30 | 35 | 65 |
| :---: | :---: | :---: | :---: |
| Inelastic | 48 | 19 | 67 |

$\begin{array}{cccc}\text { Total } & 78 & 54 & 132\end{array}$
Switching the columns does not invert the risk ratio.
Risk ratio for not healing given elastic bandage:

$$
R R=(30 / 65) /(48 / 67)=0.644
$$

Risk ratio for healing given elastic bandage:
$R R=(35 / 65) /(19 / 67)=1.89$
$1 / 1.89=0.529$, not 0.644 .

## Risk ratio or odds ratio?

| Bandage | Did not heal | Healed | Total |
| :---: | :---: | :---: | :---: |
| Elastic | 30 | 35 | 65 |
| Inelastic | 48 | 19 | 67 |
| Total | 78 | 54 | 132 |

Finding risks down the columns instead of across the rows produces more values for the risk ratio.

Risk ratio for elastic bandage given not healing:
$R R=(30 / 78) /(35 / 54)=0.593$.
Risk ratio for inelastic bandage given not healing : $R R=(48 / 78) /(19 / 54)=1.749$.

Altogether there are eight possible rate ratios.

## Risk ratio or odds ratio?

Two hypothetical tables:

|  | Success | Fail |  | Success Fail |  |
| :--- | :---: | :---: | :--- | :---: | :---: |
| Treat | 20 | 80 | Treat | 90 | 10 |
| Control | 10 | 90 | Control | 80 | 20 |

$R R=(20 / 100) / 10 / 100)=2.00(90 / 100) / 80 / 100)=1.125$
$\mathrm{OR}=(20 \times 90) /(80 \times 10)=2.25(90 \times 20) /(10 \times 80)=2.25$
These tables have the same data, different RRs, same OR.
OR is a much better measure of the strength of the relationship than RR.
RR has a more intuitive interpretation.
OR is better for statistical analysis.
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$

## Number needed to treat

| Bandage | Healed Did not heal Total |  |  |
| :---: | :---: | :---: | :---: |
| Elastic | 35 53.8\% | $3046.2 \%$ | 65 100\% |
| Inelastic | 19 28.4\% | $4871.6 \%$ | 67 100\% |
| Total | 54 | 78 | 132 |

Difference between proportions: $0.538-0.284=0.254$ or $53.8 \%-28.4 \%=25.4$ percentage points.

How many people must we treat with elastic rather than inelastic bandages to heal or benefit one extra person?
Extra people healed per person treated $=0.254$.
Number needed to treat to benefit $=1 / 0.254=3.9$.
Small NNT is good!

## Number needed to treat



Number needed to treat to benefit $=1 / 0.254=3.9$.
For every 3.9 people treated with elastic bandages rather than inelastic we estimate that one extra person is healed.

For $95 \%$ confidence interval, find the $95 \% \mathrm{Cl}$ for the difference and invert it.

Difference: $95 \% \mathrm{Cl}=0.093$ to 0.417 .
NNT: $95 \% \mathrm{Cl}=1 / 0.093$ to $1 / 0.417=10.8$ to 2.4 .

## Number needed to treat

| Bandage | Healed | Did not heal | Total |
| :---: | :---: | :---: | :---: |
| Elastic | 35 53.8\% | $3046.2 \%$ | 65 100\% |
| Inelastic | 19 28.4\% | $4871.6 \%$ | 67 100\% |
| Total | 54 | 78 | 132 |

Number needed to treat $=1 / 0.254=3.9$.
Difference: $95 \% \mathrm{Cl}=0.093$ to 0.417 .
NNT: $95 \% \mathrm{Cl}=1 / 0.093$ to $1 / 0.417=10.8$ to 2.4 .
We turn this round to give $95 \% \mathrm{CI}=2.4$ to 10.8 .
This is straightforward when difference is significant and confidence interval for the difference does not include zero.
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$


## Number needed to treat

Wound healing by type of bandage

| Bandage | Healed | Did not heal | Total |
| :---: | :---: | :---: | :---: |
| Elastic | 31 63.3\% | 18 36.7\% | 49 100\% |
| Inelastic | 26 50.0\% | 26 50.0\% | 52 100\% |

$\qquad$
$\qquad$
(Northeast et al., 1990)
Difference $=0.133$, NNT $=1 / 0.133=7.5$.
Difference: $95 \% \mathrm{Cl}=-0.059$ to 0.324 .
$95 \% \mathrm{Cl}$ includes 0.0 , difference not significant.
NNT: $95 \% \mathrm{CI}=1 /(-0.059)$ to $1 / 0.324=-16.9$ to 3.1 .
What does this mean?
Northeast ADR, Layer GT, Wilson NM, Browse NL, Burnand KG. (1990) Increased compression expedites venous ulcer healing. Royal Society of Medicine Venous Forum. London: Royal Society of Medicine.

## Number needed to treat

| Bandage | Healed Did not heal Total |  |  |
| :---: | :---: | :---: | :---: |
| Elastic | 31 63.3\% | 18 36.7\% | 49 100\% |
| Inelastic | 26 50.0\% | 26 50.0\% | 52 100\% |

(Northeast et al., 1990)
NNT: $95 \% \mathrm{Cl}=1 /(-0.059)$ to $1 / 0.324=-16.9$ to 3.1 .
What does this mean?
Can NNT be negative?
Proportion healed on new treatment less than proportion healed on control treatment.
More harm than good. Number needed to treat to harm, NNTH or NNH.

## Number needed to treat



NNT: $95 \% \mathrm{Cl}=3.1$ to -16.9 to 3.1 .
What does this mean?
NNT cannot be between -1 and +1 .
Difference $=0.0$, NNT infinite, i.e. no matter how many patients we treat no extra person will heal or be harmed.
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$

## Number needed to treat

When the difference is not significant, the confidence interval goes off to infinity in either direction.


Number needed to treat is not helpful when the difference is not significant.

## Paired data, e.g. cross-over trial

> Dichotomous data: McNemar's test, same as sign test, corresponding confidence interval for difference between two proportions. $\qquad$
> Ordered categories: sign test.
$>$ Categories not ordered: very rare in clinical evaluations.
$\qquad$
$\qquad$
$\qquad$
$\qquad$
$\qquad$

