# Chapter 9. Analyzing Simple Epidemiologic Data 

Epidemiology (11)
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## The formulas to get confidence intervals and $p$ values

- The equations are approximates and valid only for large samples (though threshold is difficult to determine)
- More accurate measures are available by exact methods
- Even for the studies with modest numbers, usually the results are almost same between approximate methods and exact methods
- If the result is close to the border of statistical significance, the difference between approximate methods and exact methods may affect the result, but it may matter less if the general width and location of a confidence interval is considered (as discussed in the previous chapter).


## Confidence intervals for the measures of disease frequency

- Risk data and prevalence data
- 20 among 100 become ill with flu during the winter season, the risk $\mathrm{R}=20 / 100$ (=0.2)
- For confidence interval, binomial model is applied: a denotes the number of cases, $N$ denotes the population at risk, $\mathrm{R}=a / N$.
- Confidence interval can be obtained by equation [9-1]
- Z is a fixed value taken from standard normal distribution. $Z=1.645$ for $90 \%$ confidence interval and $Z=1.96$ for $95 \%$ confidence interval

$$
\begin{aligned}
& R_{L}, R_{U}=R \pm Z \cdot \operatorname{SE}(R) \quad[9-1] \\
& \mathrm{SE}(R)=\sqrt{\frac{a(N-a)}{N^{3}}}
\end{aligned}
$$

## Confidence intervals for the measures of disease frequency (cont'd)

- Example: Confidence limits for a risk or prevalence
- In the flu epidemic of 20 cases among 100 population at risk during a flu season, $90 \% \mathrm{Cl}$ is obtained as 0.13 to 0.27 by below

$$
\begin{aligned}
& R_{L}=R-Z \cdot \mathrm{SE}(R)=0.20-1.645 \cdot \sqrt{\frac{20 \cdot 80}{100^{3}}}=0.13 \\
& R_{U}=R+Z \cdot \mathrm{SE}(R)=0.20+1.645 \cdot \sqrt{\frac{20 \cdot 80}{100^{3}}}=0.27
\end{aligned}
$$

- (Complementary info) see,
https://www.ncss.com/wp-content/themes/ncss/pdf/Procedures/PASS/Confidence_Intervals_for_One_ Proportion.pdf
- This is very simple asymptotic formula.

```
> propCI <- function(a, N, conf.level=0.9)
    { a/N + c(-1,1)*qnorm(1-(1-conf.level)/2)*sqrt(a*(N-a)/N^3) }
> propCI(20, 100)
```

[1] 0.13420590 .2657941

- In R software, somewhat improved Wilson Score Cl (with/without continuity correction) is readily available. In this case,
$>$ prop.test $(20,100$, conf.level=0.9, correct=FALSE) gives $90 \% \mathrm{Cl}$ as [ $0.1425018,0.2733038$ ]
- Exact method is also readily available by > binom.test(20,100, conf.level=0.9) It gives $90 \% \mathrm{Cl}$ as [ $0.1366613,0.2772002$ ].

Box: When whole population is measured instead of sample, there are two ways of consideration (up to context). (1) No sampling error, thus Cl doesn't make sense, (2) It's possible by assuming hypothetical superpopulation.

## Confidence intervals for the measures of disease frequency (cont'd)

- Incidence rate data
- a denotes cases, PT denotes person-time.
- Different from binomial model.
- It's impossible to know how many people contributed time by the value of PT.
- The IR obeys Poisson model.
- The equation is given below.
- Example

$$
\begin{aligned}
& \mathrm{IR}=\frac{a}{\mathrm{PT}} \\
& \mathrm{IR}_{L}, \mathrm{R}_{U}=\mathrm{IR} \pm Z \cdot \mathrm{SE}(\mathrm{IR}) \\
& \mathrm{SE}(\mathrm{IR})=\sqrt{\frac{a}{\mathrm{PT}^{2}}} \\
& a=8, \mathrm{PT}=85000 \\
& \mathrm{IR}=8 / 85000=9.4 / 100000
\end{aligned}
$$

$$
\mathrm{IR}_{L}=8 / 85000-1.645 \cdot \sqrt{\frac{8}{85000^{2}}}=3.9 / 100000
$$

- Cancer incidence rate is estimated from a registry that $\mathrm{IR}_{U}=8 / 85000+1.645 \cdot \sqrt{\frac{8}{85000^{2}}}=14.9 / 100000$
reports 8 cases of astrocytoma among 85000 personyears at risk.
- $90 \% \mathrm{Cl}$ is $3.9 / 100000$ person-years to $14.9 / 100000$ person-years.
- By exact method, $90 \% \mathrm{CI}$ I 4.7/100000 person-years to 17.0/100000 person-years.
- See, IRCIPois $(8,85000)$ in https://minato.sip21c.org/epispecial/codes-for-Chapter9.R


## Confidence intervals for effect measures (1)

- The effect of exposure is compared between two (or more) groups
- Cohort studies (as difference or ratio)
- Direct comparison of risks of the exposed and unexposed groups with same follow-up period for all individuals
- Comparison of incidence rates between the exposed and unexposed groups with different follow-up periods by person
- Case-control studies (as ratio)
- Usually analysis of odds ratio is done
- Surveys or cross-sectional studies
- Usually the prevalence data, treated as risk data because those are expressed as proportions (though the effect measure is often odds ratio)
- Case-fatality risks (showing disease severity or virulence)
- Also usually treated as risk data because those are proportions


## Confidence intervals for effect measures (2)

- Cohort Studies with Risk Data or Prevalence Data
- Assume the dichotomous exposure (exposed, unexposed), all subjects were followed for a fixed period, no important competing risk, no confounding
- RD (risk difference) and RR (risk ratio) with SE (standard error) can be estimated by the formula below

|  | Exposed | Unexposed |
| :--- | :--- | :--- |
| Cases | a | b |
| People at risk | $\mathrm{N}_{1}$ | $\mathrm{~N}_{0}$ |

$$
\begin{aligned}
& \mathrm{RD}=\frac{a}{N /}-\frac{b}{N_{0}} \\
& \mathrm{RR}=\frac{a / N_{1}}{b / N_{0}}
\end{aligned}
$$

$$
\mathrm{SE}(\mathrm{RD})=\sqrt{\frac{a\left(N_{1}-a\right)}{N_{1}{ }^{3}}+\frac{b\left(N_{0}-b\right)}{N_{0}{ }^{3}}} \quad[9-2]
$$

$$
\mathrm{SE}(\ln (\mathrm{RR}))=\sqrt{\frac{1}{a}-\frac{1}{N_{1}}+\frac{1}{b}-\frac{1}{N_{0}}} \quad[9-3]
$$

## Confidence intervals for effect measures (3)

- Example (Table 9-1)
- RD is

321/686-411/689
$=0.47-0.60$
$=-0.13$
$90 \% \mathrm{Cl}$ is -0.17 to -0.08

- $17 \%$ to $8 \%$ lower in absolute terms for women receiving combined tamoxifen and radiotherapy
- $R R$ is $0.47 / 0.60=0.78$ $90 \% \mathrm{Cl}$ is 0.72 to 0.85
- $28 \%$ to $15 \%$ lower risk in relative term, compared to tamoxifen alone.

Table 9-1. Risk of recurrence of breast cancer in a randomized trial of women treated with tamoxifen and radiotherapy or tamoxifen alone

|  | Tamoxifen and <br> radiotherapy | Tamoxifen <br> alone |
| :--- | :--- | :--- | :--- |
| Women with <br> recurrence | 321 | 411 |
| Total women <br> treated | 686 | 689 |
| Data from Overgaard M et al., 1999 <br> (https://www.ncbi.nlm.nih.gov/pubmed/10335782) |  |  |



## Confidence intervals for effect measures (4)

- Confidence intervals vs confidence limits
- "Interval" is a range indicating the degree of statistical precision that describes the estimate
- Level of confidence is set arbitrarily
- Width of the interval expresses the precision: Wider interval implies less precision, narrower interval implies more precision
- The upper and lower boundaries of the interval are the "limits"
- (Complementary info)
- In R with fmsb package (including the formula given here), it's easy to calculate by

```
> library(fmsb)
```

$>$ riskdifference $(321,411,686,689$, conf.level=0.9)
> riskratio (321, 411, 686, 689, conf.level=0.9)

- Exact confidence intervals can be obtained by Santner-Snell method or Z-pooled method. Getting exact confidence intervals of RD by Z-pooled method is possible using $R$ with Exact package such as

```
> library(Exact)
> T<- matrix(c(321, 411, 365, 278), 2)
```

$>$ exact.test(T, conf.int=TRUE, conf.level=0.9)

## Confidence intervals for effect measures (5)

|  | Exposed | Unexposed |
| :--- | :--- | :--- |
| Cases | a | b |
| People-time at risk | PT | $\mathrm{PT}_{0}$ |

- Cohort studies with incidence rate (IR) data
- IR among exposed

$$
I \mathrm{R}_{1}=\mathrm{a} / \mathrm{PT}_{1}
$$

- IR among unexposed

$$
\mathrm{IR}_{0}=\mathrm{b} / \mathrm{PT}_{0}
$$

$-\quad I R D=I R_{1}-I R_{0}=a / P T_{1}-b / P T_{0}$
$-\quad \mathrm{IRR}=\mathrm{IR}_{1} / \mathrm{IR}_{0}=\left(\mathrm{a} / \mathrm{PT}_{1}\right) /\left(\mathrm{b} / \mathrm{PT}_{0}\right)$

- Standard errors can be obtained by the following formula
$\mathrm{SE}(\mathrm{IRD})=\sqrt{\frac{a}{\mathrm{PT}_{1}{ }^{2}}+\frac{b}{\mathrm{PT}_{0}{ }^{2}}} \quad[9-4]$
$\mathrm{SE}(\ln (\operatorname{IRR}))=\sqrt{\frac{1}{a}+\frac{1}{b}} \quad[9-5]$

Table 9-2. Incidence rate of cancer among a blind population and a population that is visually severely impaired but not blind

| Totally <br> blind | Visually severely impaired but <br> not blind |
| :--- | :--- |
| 136 | 1709 |
| 22050 | 127650 |

Data from Feychting M et al., 1998
(https://www.ncbi.nlm.nih.gov/pubmed/9730026)

- Example (Table 9-2)
- Feychting et al. calculated standardized rate ratio with exact $95 \% \mathrm{Cl}$ based on national data and Poisson distribution
- IRD = 136/22050-1709/127650 = -7.2/1000 personyears (pyrs), $90 \% \mathrm{Cl}$ is $-8.2 / 1000$ pyrs to $-6.2 / 1000$ pyrs
- By R with fmsb package, ratedifference(136, 1709, 22050, 127650, conf.level=0.9)
$-\quad \operatorname{IRR}=(136 / 22050) /(1709 / 127650)=0.46,90 \% \mathrm{Cl}$ is 0.40 to 0.53

By R with fmsb package rateratio(136, 1709, 22050, 127650, conf.level=0.9)

## Confidence intervals for effect measures (6)

|  | Exposed | Unexposed |
| :--- | :--- | :--- |
| Cases | $a$ | $b$ |
| Controls | $c$ | $d$ |

- Case-Control Studies (for density case-control study or cumulative case-control study)
- Analysis of case-cohort studies and casecrossover studies is slightly different
- As the estimate of IRR or RR (depending on how the controls were sampled), $O R$ is used.
- $\quad \mathrm{OR}=\mathrm{ad} / \mathrm{bc}$
- Standard errors can be obtained by the following formula
$\mathrm{SE}(\ln (\mathrm{OR}))=\sqrt{\frac{1}{a}+\frac{1}{b}+\frac{1}{c}+\frac{1}{d}} \quad[9-6]$

| Table 9-3. Frequency of recent amphetamine use among <br> stroke cases and controls among women between 15 and <br> 44 years old |  |  |
| :--- | :--- | :--- |
|  | Amphetamine users | No Amphetamine use |
| Stroke cases | 10 | 337 |
| Controls | 5 | 1016 |

Data from Petitti et al., 1998
(https://www.ncbi.nlm.nih.gov/pubmed/9799166)

- Example (Table 9-3)
- $\mathrm{OR}=(10 / 337) /(5 / 1016)=6.0,90 \% \mathrm{Cl}$ is 2.4 to 14.9
- By R with fmsb package, oddsratio(10, 337, 5, 1016, conf.level=0.9)
- The point estimate is the geometric mean between the lower limit and
upper limit of the Cl . This relation applies whenever Cl is set on the $\log$ scale.


## Calculation of $p$ values (1)

- Though Cl is better than p -values, the basic formula to calculate $p$-values is given for completeness. Testing the null hypothesis that exposure is not related to disease.
- Risk Data
- $\quad \chi$-statistics is used to get p -value (eg. Table 9-1 data for [9-7] using standard normal distribution given in Appendix, whereas it's easy to get the $p$-value using $R$ function pnorm().
- $\chi=-4.78, \mathrm{p} \approx 0.0000009$
(From Appendix, assuming one-sided) $>$ pnorm (-4.78)
[1] $8.76476 \mathrm{e}-07\left(\rightarrow 8.76 \times 10^{-7}\right)$
(If we consider two-sided,)
$>$ pnorm(-4.78)*2
[1] 1.752952e-06
$>$ library (fmsb)
> riskratio (321, 411, 686, 689) \$p.value [1] 1.784687e-06

|  | Exposed | Unexposed | Total |
| :--- | :--- | :--- | :--- |
| Cases | $a$ | $b$ | $M_{1}$ |
| Noncases | $c$ | $d$ | $M_{0}$ |
| People at risk | $N_{1}$ | $N_{0}$ | $T$ |

$$
\begin{aligned}
& \chi=\frac{a-\frac{N_{1} M_{1}}{T}}{\sqrt{\frac{N_{1} N_{0} M_{1} M_{0}}{T^{2}(T-1)}}} \quad[9-7] \\
& \chi=\frac{a-\frac{P T_{1}}{T} M}{\sqrt{M \frac{P T_{1}}{T} \frac{P T_{0}}{T}}} \quad[9-8]
\end{aligned}
$$



## Calculation of $p$ values (2)

- Incidence rate data
- $\quad \chi$-statistics is used to get p-value (eg. Table 9-2 data for [9-8] using standard normal distribution)
- $\quad \chi=-8.92, \mathrm{p}<10^{-20}$ (Assuming one-sided) $>$ pnorm (-8.92)
[1] $2.331441 e-19\left(\rightarrow 2.3 \times 10^{-19}\right)$ > rateratio(136, 1709, 22050, 127650) p-value < 2.2e-16

|  | Exposed | Unexposed | Total |
| :--- | :--- | :--- | :--- |
| Cases | $a$ | $b$ | $M$ |
| Person-time | $P T_{1}$ | $P T_{0}$ | $T$ |

$$
\begin{aligned}
& \chi=\frac{a-\frac{N_{1} M_{1}}{T}}{\sqrt{\frac{N_{1} N_{0} M_{1} M_{0}}{T^{2}(T-1)}}} \quad[9-7] \\
& \chi=\frac{a-\frac{P T_{1}}{T} M}{\sqrt{M \frac{P T_{1}}{T} \frac{P T_{0}}{T}}} \quad[9-8]
\end{aligned}
$$

- Case-control data
- [9-7] can be used, because the null hypothesis (as $2 \times 2$ table, exposure and disease are independent) is same for risk data and case-control data (It's the answer to Question 5).
- Eg. Table 9-3 data for [9-7] using standard normal distribution
- $\chi=3.70, \mathrm{p}=0.00022$ (Two-sided test, 2*(1-pnorm(3.7))=0.0002155...; By oddsratio(), p=0.0002196; Difference due to rounding error)
- All those were easily obtained by fmsb package's functions riskratio(), rateratio() and oddsratio().

