



# Measures of Association

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# Introduction

- **One of epidemiological studies' goal is to determine and estimate effects**
- **Difficult to measure an effect directly**
- **Possible to measure an association**
- **Substitution of the association for the effect has both advantage and disadvantage**

# Quantitative Measures used in Epidemiology

- **Measures of disease frequency:** Reflect the relative occurrence of the disease in a population.
- **Measures of association:** Reflect the strength or magnitude of the statistical relationship between exposure status and disease occurrence.
- **Measures of effect:** Certain measures of association involving disease incidence are also measures of the exposure effect.

# Measures of Association

- can be based on
  - **absolute difference**
  - **relative difference**
- Interpretation depends on study designs
- Names are different regard to different textbooks
- Concept is similar



How can we measure disease occurrence?



# Incidence Measures: Risk and Rate

- **Risk (cumulative incidence):**

Probability of an individual at risk developing the disease during a given period

- **Incidence rate (incidence density):**

Occurrence of new cases at a point in time  $t$ , per unit of time, relative to the size of the population at risk at time  $t$

# Risk Estimation

- **Risk (R) is defined as:**

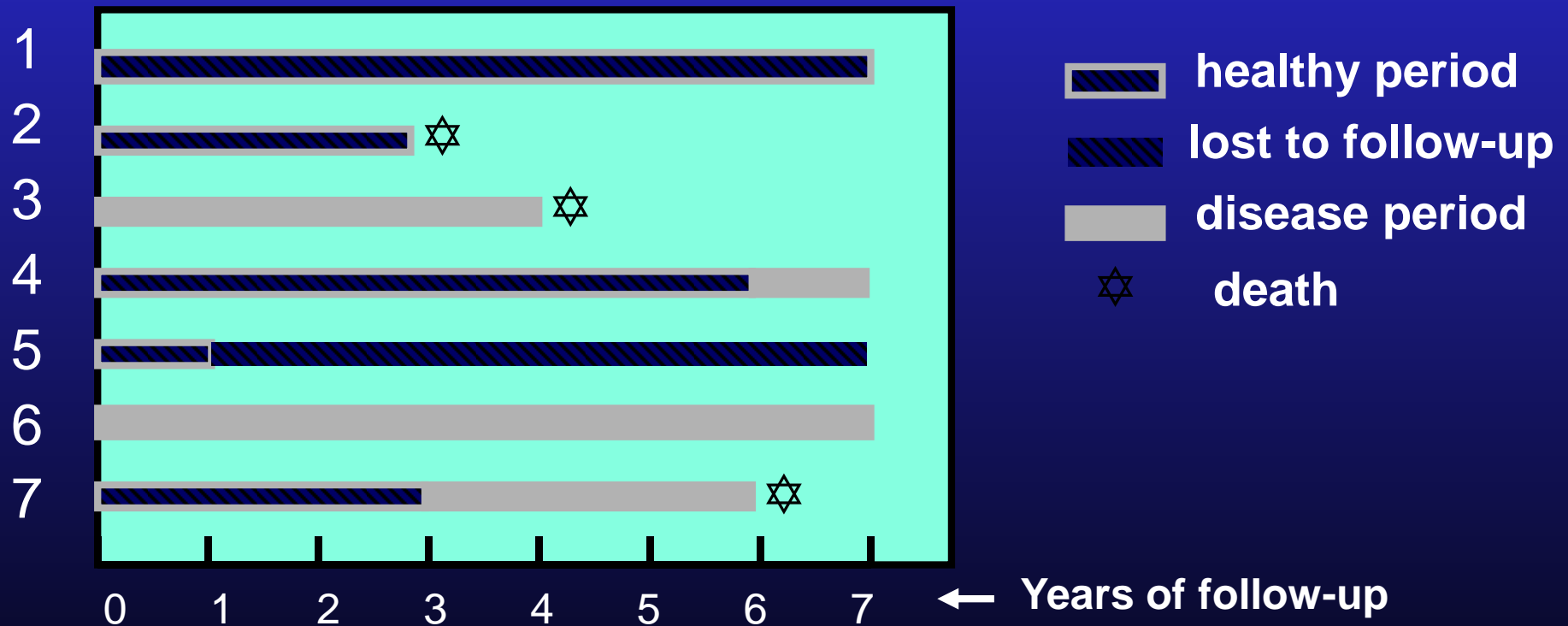
The probability of an individual at risk developing the disease during a given period.

- **Risk is calculated by:**

$$R = \frac{\text{Number of incident cases of disease occurring in a specified period}}{\text{Number of people at risk at the start of the specified period}}$$

# Example: Risk estimation

Individuals



**7-year risk of disease =  $2 / 7 = 0.28 = 28\%$**

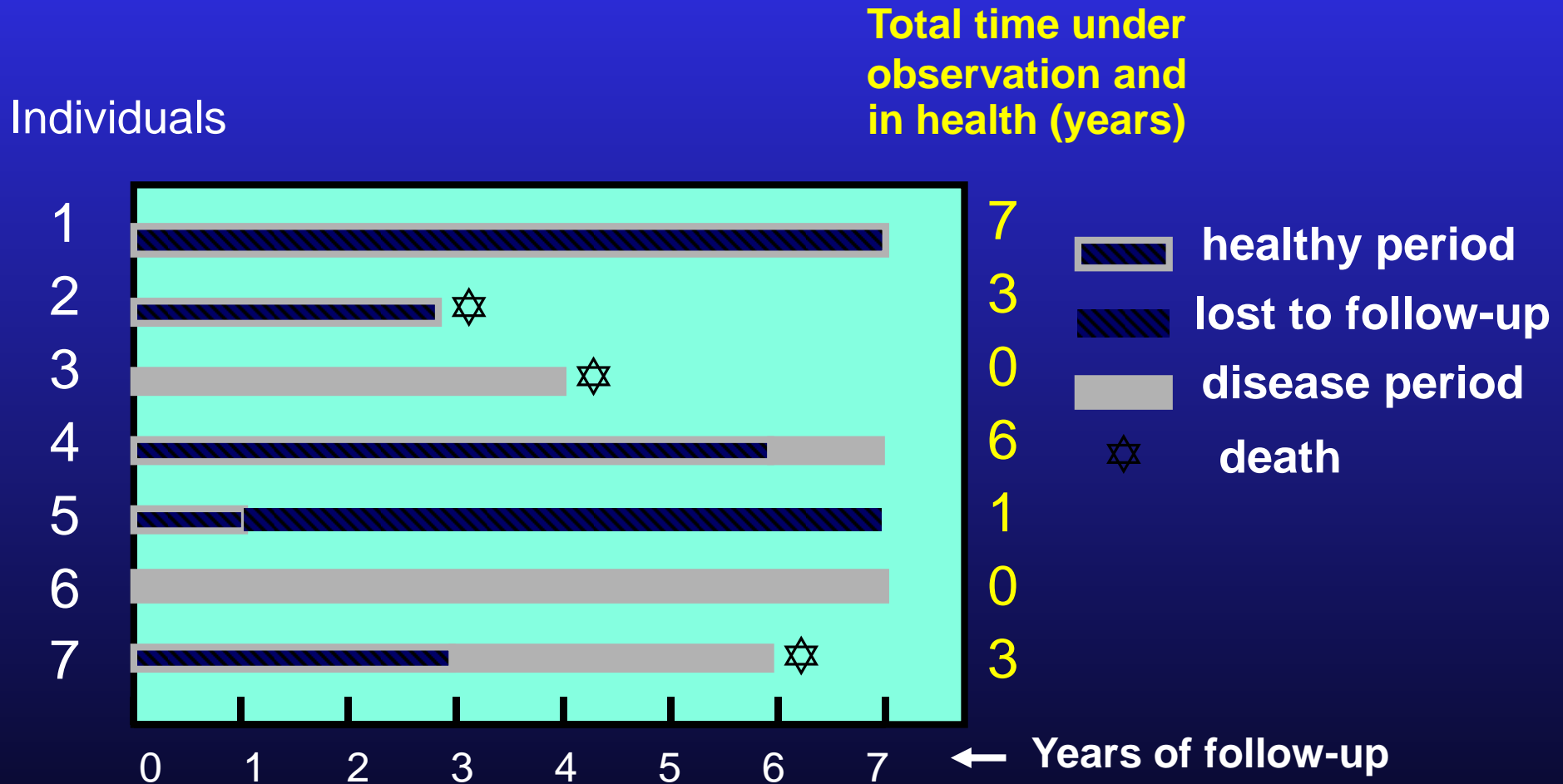


# Incidence Rate Estimation

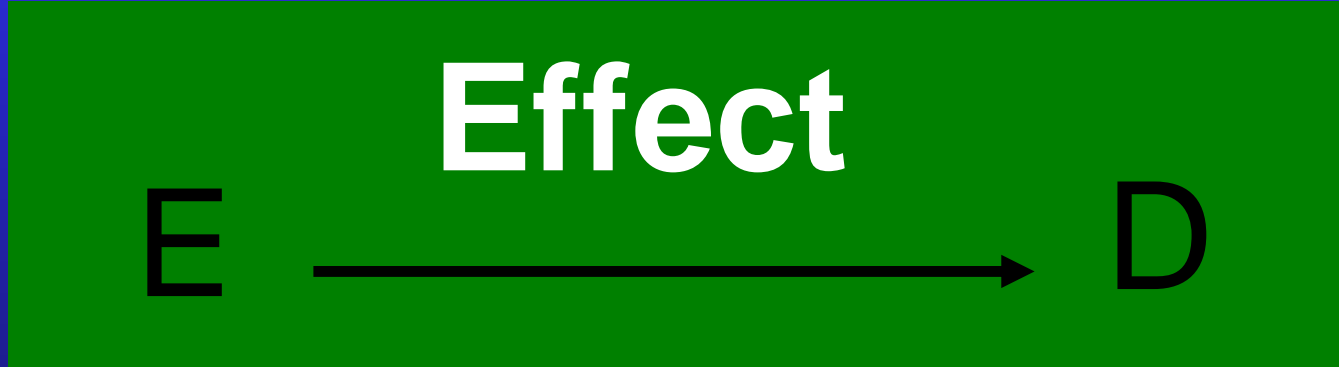
= The occurrence of new cases at a point in time  $t$ , per unit of time, relative to the size of the population at risk at time  $t$  (i.e., the occurrence of an event in a population over time)

$$I = \frac{\text{Number of incident cases of disease occurring in a specified period}}{\text{Amount of person-time experienced by population at risk in the same period}}$$

# Example: Risk estimation



**PT = 7+3+0+6+1+0+3 = 20 person-years**  
**Average incidence rate for 7-year follow-up period**  
**= incident cases / PT = 2 / 20 = 0.10 / year**



**Exposure**

**Disease**

**Risk factor**

**Outcome**

**Determinant**

**Illness**

- **Relative risk/ Risk ratio:**
  - **Probability of an event in exposed persons compare to the probability of an event in unexposed persons**
- **Risk ratio (RR) and risk difference (RD) are effect measures.**
  - **Assumption: The risk of disease in the unexposed population is equal to what the risk would have been in the exposed population had everyone been unexposed.**

# Measures of Association

- Reflect the magnitude of statistical relationship between two variables
- All or part of this relationship may correspond to
  - (1) **effect of the exposure on disease occurrence,**
  - (2) effect of disease on exposure changes, or
  - (3) **non-causal aspects of the association**



- Ratio measures--e.g., RR, IR, OR
- Difference measures--e.g., RD, ID, AR
- Model coefficients\*
- Correlation coefficients\*

**Not all measures of association are  
measures of effect**

**This lecture focuses on ratio measures**

# Measures of Association: Ratio

- **RR: ratio of two probabilities (exposed group VS unexposed group)**
- **RR: an effect measure of primary interest in epidemiology**
- **Null value of “one”: corresponds to no association between exposure status and disease**
- **Value of a ratio: vary between zero and infinity**

# Interpreting Ratio

- Exact meaning of a ratio measure of association depends on the type of frequency measure.
- Ex: The association between smoking status and lung cancer, a value of 8 for:
  - **5-year risk ratio--A smoker is 8 times more likely to develop lung cancer in 5 years than is a non-smoker**
  - **mortality rate ratio--The average mortality rate of lung cancer is 8 times greater in smokers than it is in non-smokers**
  - **prevalence ratio--A smoker is 8 times more likely to have lung cancer is a non-smoker**

# Ratio: Dose-response Relationship

- With  $> 2$  exposure categories, dose-response relationship can be expressed by comparing each exposure group with a single reference (unexposed) group.

- **Ex: Smoking status is categorized into 3 groups, heavy, light and none**

$$IR_{\text{heavy}} = 12 \text{ (heavy/none)}$$

$$IR_{\text{light}} = 5 \text{ (light/none)}$$

$$IR_{\text{none}} = 1 \text{ (none/none)}$$

= a positive dose-response relationship, because the more people smoke, the higher the rate of disease.

# Measures of Association: Difference

The difference between two risks (exposed group VS unexposed group)

- Risk difference (RD) and rate difference (ID) are measures of effect.\*
- Null value of all difference measures: zero
- Difference measures of effect: reflect the magnitude of a public health problem

**\* Not explicit but implicit comparison**



$$RD = R_1 - R_0 = RR (R_0) - R_0 = R_0(RR - 1)$$

- Suppose the 5-yr risk of disease X is 10% in exposed population and 8% in unexposed population. Then,

$$RR = 1.25$$

and

$$RD = 0.02$$

- **Interpretation: an exposed person in this population is 1.25 times more likely to get the disease in 5-yr than is unexposed person; or the difference in risk between exposed and unexposed persons is 2%**
- “The 5-yr risk of disease is 25% greater in exposed persons than in unexposed persons” ?

# Example: Ratio and Difference Measures

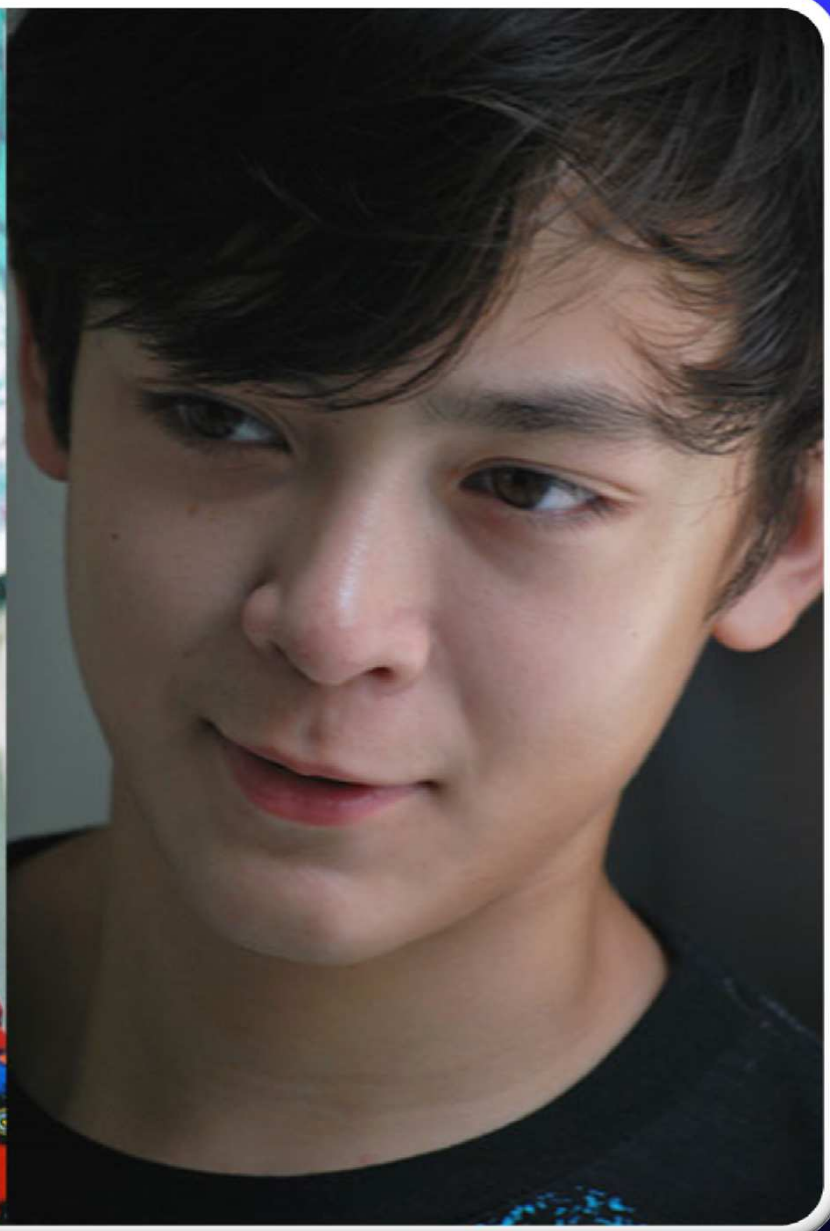
Numbers of new cases of lung cancer and CHD in the U.S. by smoking status

Smoking Status	No. People	Lung Cancer		CHD	
		Cases	I (/10 <sup>5</sup> /yr)	Cases	I (/10 <sup>5</sup> /yr)
Smokers	70,000,000	60,000	85.7	250,000	357.1
Nonsmokers	150,000,000	10,000	6.7	250,000	166.7
Rate ratio			12.9		2.14
Rate difference			79 x 10 <sup>-5</sup> /yr		190 x 10 <sup>-5</sup> /yr

**Lung cancer:** incidence rate ratio is greater

**CHD:** incidence rate difference is greater

**Reflect:** CHD is much more common in the U.S. population



**Ratio and Study Design**

# I Cohort Study

## 1. Relative Risk (RR)

- RR refers to rate ratio or risk ratio\*
- RR (incidence) of developing a disease in exposed individuals to that in unexposed

e.g. 
$$\frac{\text{Risk of lung cancer among smoker}}{\text{Risk of lung cancer among nonsmoker}}$$

\*rate ratio  $\approx$  risk ratio, when exposure negligibly affects the person-time at risk

RR(cont.)

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		Lung Cancer		
		Yes	No	
Smoking	Yes	800	200	1000
	No	200	1800	2000

$$RR = \frac{800/(1000)}{200/(2000)} = \frac{8}{1}$$



RR(cont.)

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		Disease		
		Yes	No	
Exposure	Yes	a	b	a+b
	No	c	d	c+d

$$RR = \frac{a/(a+b)}{c/(c+d)}$$

## 2. Odds ratio

- Odds = event/nonevent
- OR = ratio of the odds of developing a disease

$$\begin{aligned} \text{(Probability) OR} &= \frac{q_+ / (1 - q_+)}{q_- / (1 - q_-)} \\ &= \frac{a/b}{c/d} = ad / bc \end{aligned}$$

$q_+$  incidence (probability) in exposed  
 $q_-$  incidence (probability) in unexposed

## Example: **Rare** disease

- When the probability (risk) of developing disease is **low** for both the exposed and the unexposed groups, the probability odds of developing the disease  $\approx$  the probabilities (Table 3-3)

$$\begin{aligned} RR &= 0.0180 / 0.0030 \\ &= 6.00 \end{aligned}$$

$$\begin{aligned} \text{Probability OR} &= 0.01833 / 0.00301 \\ &= 6.09 \end{aligned}$$

# Example



## Example: **Common** disease

- When the probability (risk) of developing disease is **high**, the probability odds of developing the disease is biased estimation of the probabilities (Table 3-4)

$$\begin{aligned} RR &= 0.2529 / 0.0705 \\ &= 3.59 \end{aligned}$$

$$\begin{aligned} \text{Probability OR} &= 0.3385 / 0.0759 \\ &= 4.46 \end{aligned}$$



- OR often used as an approximation of RR
- OR tends to exaggerate the magnitude of the association
- This built-in bias is small when the disease is relatively rare
- **OR is directly derived from logistic regression models**

Odds ratio (cont.)

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- **Built-in bias**

$$\text{OR} = \frac{q_+ / (1 - q_+)}{q_- / (1 - q_-)}$$

$$= \frac{q_+}{q_-} \times \left[ \frac{1 - q_-}{1 - q_+} \right]$$

$$= \text{RR} \times \text{built-in bias}$$

q+ incidence (probability) in exposed  
q- incidence (probability) in unexposed

# Example: Built-in bias

- Rare disease: (Table 3-3)

$$\begin{aligned} - \text{OR} &= \frac{6.0 \times (1-0.0030)}{1-0.0180} \\ &= 6.0 \times 1.015 = 6.09 \end{aligned}$$

- Common disease: (Table 3-4)

$$\begin{aligned} - \text{OR} &= \frac{3.59 \times (1-0.0705)}{1-0.2529} \\ &= 3.59 \times 1.244 = 4.46 \end{aligned}$$

# II Cross-sectional Study



# 1. Point Prevalence Rate Ratio

- **Point Prevalence:**
  - Frequency of disease or condition at a point in time
  - Depends on disease's duration
  - Used as a proxy of risk

- Formula of **point prevalence odds**

$$\left[ \frac{\text{Point Prev}}{1 - \text{Point Prev}} \right] = \text{incidence} \times \text{duration}$$

- Formula of **point prevalence**

$$\text{Point Prev} = \text{inc} \times \text{dur} \times (1 - \text{Point Prev})$$

- *If the point prev is low (e.g. 0.05)*

$$\text{Point Prev} \sim = \text{inc} \times \text{dur}$$

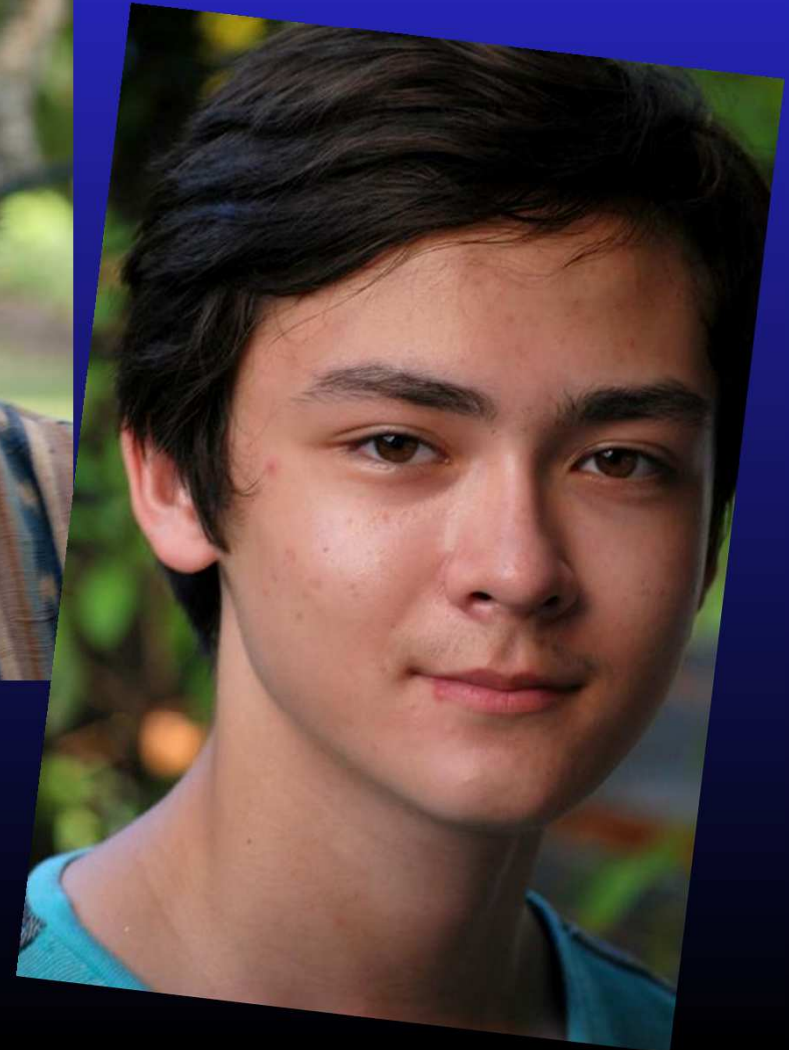
- **PRR**

$$\begin{aligned}
 &= \frac{\text{Prev}_+}{\text{Prev}_-} = \frac{\text{inc} \times \text{dur}_+ \times (1 - \text{Prev}_+)}{\text{inc} \times \text{dur}_- \times (1 - \text{Prev}_-)} \\
 &= \text{RR} \times \left[ \frac{\text{dur}_+}{\text{dur}_-} \right] \times \left[ \frac{1 - \text{Prev}_+}{1 - \text{Prev}_-} \right]
 \end{aligned}$$

- **PRR differs from RR due to 2 bias factors**



# III Case-control Study





# 1. Odds Ratio

- OR of exposure ( $OR_{exp}$ ) is mathematically identical to OR of disease ( $OR_{dis}$ )

$$OR_{exp} = \frac{a/c}{b/d} = ad / bc = OR_{dis}$$

*The reason why the interpretation of the OR in this study design is prospective.*

# Characteristic of OR

OR is used to estimate RR when:

- the disease is rare\*, or
- case-cohort design, or
- nested case-control design

*\* When cases studied are representative (regard to exposure history), of all persons with the disease in the pop from which the cases were drawn*

*\* When the control studied are representative (regard to exposure history), of all persons without the disease in the pop from which the cases were drawn*

## 2. OR for matched paired

		Controls	
		Exp	Unexp
Cases	Exp	a	b
	Unexp	c	d

**Pair OR =  $\frac{b}{c}$  use Mantel-Haenszel weighing**

# Important issues

*Is there an association between exposure and outcome?*

= epidemiologic studies

*How can an excess risk be expressed quantitatively?*

= type of risk measurement

*Is the observed association reflect a causal relationship?*

= type of causal relationship; bias; confounding; interaction

**Example articles  
and more info**

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Thank You

