Interpretation: Bias

Learning Objectives

 Understand the aspects of a study to assess & to evaluate the validity of the study results

from: Module 7 Epi Assessment of Causation (slide 7)

Study Evaluation • Valid statistical association? > ... likely to be due to bias? > ... likely to be due to confounding? > ... likely to be due to chance?

Validity

- Evaluate the result
 - True?
 - False alternative explanation

Validity

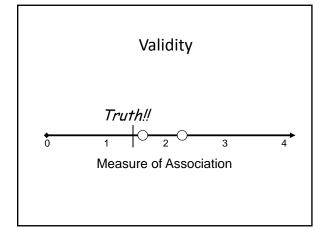
- What is it?
 - Validity = how close to TRUTH?
- Validity vs Reliability
 - Reliability = repeatability

Validity

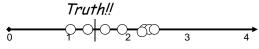
- If valid
 - Evaluate potential causal relationship
 - Generalizability

Validity

- Internal validity
 - Lack of measurement error
 - The association is correctly measured within the study
- External validity generalizability



Reliability



Measure of Association

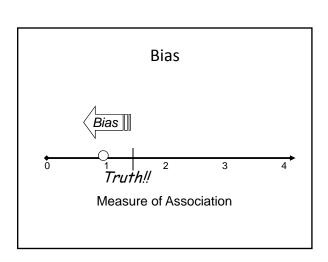
"It is better to be vaguely correct than precisely wrong." – G. Frisvold

Validity

- Alternate explanations
 - Bias
 - systematic error in design or conduct leading to error in estimation of association
 - Confounding
 - A third variable distorting the association
 - Random Error
 - Not a systematic error, but chance or the luck of the draw

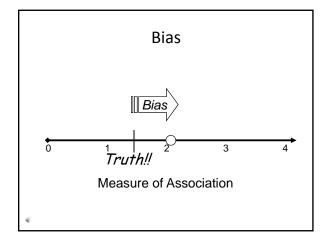
Bias

- A systematic error -> incorrect estimate of the measure of association
 - Create spurious association when there really is none (bias away from the null) or
 - Mask an association when there really is one (bias towards the null)
- Primarily introduced by investigator or study participants



Bias

- "Any systematic error in the
 - design,
 - conduct or
 - analysis
- of a study that results in a
 - mistaken estimate of the exposure's effect on the risk of disease."
 - Schlesselman and Stolley, 1982



Bias

- Bias ≠ prejudice
- All study types liable to bias
 - experimental, cohort, case-control
- Bias occurs in design and conduct of a study
- Can be evaluated but not fixed in the analysis

Biases

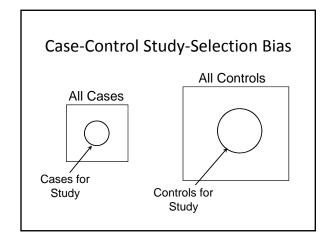
- Selection
- Misclassification
- Surveillance
- Observation
- Recall
- Interviewer
- Surrogate Interviews
- Loss to follow-up
- Non-response
- Temporal
- Analytic

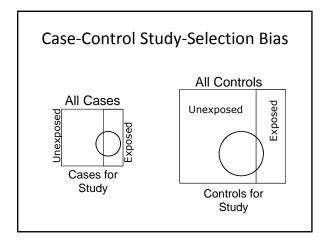
Selection Bias

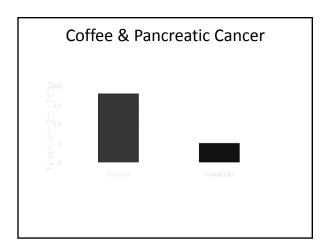
- When:
 - Procedures to select cases and/or controls in a case control study or
 - the exposed and unexposed in a cohort study
 - biases the estimated RR or OR
 - The RR or OR is not what you would find if you looked at the whole population

Selection Bias

- Chance that a case or a control will be selected depends on exposure status
 - Inclusion is not independent of exposure
- More likely to occur in case-control or retrospective cohort
 - exposure and outcome have already occurred at time of study selection







Case Control Selection Bias

- Example:
- Case control study:
 - Do PAP smears prevent cervical cancer?
 - Cases diagnosed at a city hospital
 - Controls randomly sampled from households same city
 - canvassing the neighborhood on foot

Case Control Selection Bias

	Cases	Controls
Pap Smear	100	150
No Pap Smear	150	100
	250	250

OR = (100)(100) / (150)(150) = .44

Interpretation:

In this study, women with cervical cancer were 56% less likely to have had a Pap smear than women in the neighborhood who did not have cervical cancer.

Case-Control Selection Bias

- Cases
 - from hospital
- Controls
- neighborhood around hospital
- Bias
 - Only controls who were at home were included
 - Women at home
 - less likely to work
 - less likely to have regular checkups and PAP smears
 - Inclusion as a control was not independent of exposure

Case-Control Selection Bias

Selecting controls in the evening:

	Cases	Controls
Pap Smear	100	100
No Pap Smear	150	150
	250	250

OR = (100)(150) / (150)(100) = 1.0

No association of PAP smears and cervical cancer

Case-Control Selection Bias

- Women at home during the day
 - Not representative of the whole study population that produced the cases

They did not accurately represent the distribution of exposure in the study population that produced the cases

This led -> biased estimate of the association

Cohort Selection Bias

- Selection bias in cohort study
 - selection of exposed & unexposed subjects is not independent of outcome
 - so, it can only occur in a retrospective cohort study

4

Cohort Study Selection Bias

- Retrospective study
 - occupational exposure and a disease in a factory
- Exposed / unexposed enrolled on the basis of prior employment records

Cohort Study Selection Bias

- · Records are old
 - many are lost
 - $\boldsymbol{-}$ complete cohort not available for study
- If
 - people with exposure but not disease were more likely to have their records lost,
 - the estimate of association between the exposure and the disease will be inflated

	Dis +	Dis -
Exposed	a	b
Unexposed	С	d

Cohort Study Selection Bias

True relationship, if all records were available

	Disease	No Disease	
Exposed	50	950	1000
Unexposed	50	950	1000

RR = (50/1000) / (50/1000) = 1.00

Cohort Study Selection Bias

300 records lost, all among exposed, no disease

	Disease	No Disease	
Exposed	50	650	700
Unexposed	50	950	1000

RR = (50/700) / (50/1000) = 1.43

Selection Bias Solutions

- Once this bias has occurred:
 - Little or nothing can be done to fix it
- To avoid selection bias
 - Choose your population very carefully
 - Use same criteria for selecting cases and controls
 - obtaining all relevant subject records
 - obtaining high participation rates
 - account for diagnostic and referral patterns of disease
 - Secondary data to check validity

Selection vs Selection Bias

- Study Population:
 - Female,
 - Left-handed,
 - Epidemiologists
 - · Selected?
 - > yes, very
 - Selection *Bias*
 - > not necessarily!
 - but, Generalizability?

Selection Bias Summary

- Selection Bias
 - Cases/controls or exposed/unexposed chosen so that
 - there appears to be a relationship of exposure and outcome that doesn't really exist or
 - a relationship that does exist is masked

Biases

- ✓ Selection
- Misclassification
- Surveillance
- Observation
- Recall
- Interviewer
- Surrogate Interviews
- Loss to follow-up
- Non-response
- Temporal
- Analytic

Misclassification

• Errors in ascertainment of exposure or outcome

		Disease Status		
		Yes	No	TOTAL
Exposure Status	Yes	а	b	a+b
Status	No	с	d	c + d
	TOTAL	a+c	b+d	a+b+c+d

Misclassification

- · Nondifferential or random
 - Non-selective or random error
 - Effect is the same in both groups

Decreases likelihood of finding an association if there is truly an association

Misclassification

- Differential
 - Likelihood of error in exposure classification
 - different for those with or without the outcome
 - OR
 - Likelihood of error in outcome classification
 different for those who are / are not exposed
 - R
 - Likelihood of error for one variable varies according to the actual value of the other
- Effect
 - Toward the null
 - Away from the null in either direction
 - unknowr

Misclassification Example 1

Truth

	Disease	No Disease	
Exposed	200	100	
Unexposed	100	200	
	300	300	

OR = (200)(200) / (100)(100) = 2.0

Misclassification Example 1

Differential Misclassification

	Disease	No Disease	
Exposed	200	50	
Unexposed	100	250	50
	300	300	>

OR = (200)(250) / (100)(50) = 10

True OR = 2

Misclassification Example 2

Truth

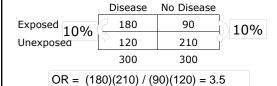
	Disease	No Disease	
Exposed	200	100	
Unexposed	100	200	
	300	300	

OR = (200)(200) / (100)(100) = 4.0

Misclassification Examples

Non-Differential Misclassification

10% of cases & 10% of controls misclassified



True OR = 4

Misclassification Solution

- Techniques to verify status:
 - Narrow case definitions
 - Clinical / histologic verification
 - Validation sub-studies
 - Refined methods of exposure measurement
 - Biologic measures
 - Lab techniques

Surveillance Bias

- Outcome often sub-clinical or asymptomatic
 - chances of diagnosis greater in those who are seen more often

Surveillance Bias Solutions

- Stratify
 - Create an index of medical care usage
 - Run separate analyses for each level of use
- Prospective study
 - Systematically assess for outcome in all participants

Stratified Analysis				
Low Use		Disease Status		
		Yes	No	TOTAL
Exposure	Yes	а	ь	a+b
Status	No	с	d	c+d
	TOTAL	a + c	b+d	a+b+c+d
High Use				
g ccc		Yes	No	TOTAL
Exposure	Yes	а	ь	a + b
	NI-	_	d	c + d
Status	No	С	a	c , u

Observation Bias

- Systematic differences in the WAY information on exposure or disease is obtained
- -> incorrect classification
 - exposed / unexposed or
 - diseased / not diseased
- Occurs after the subjects have entered the study

Recall Bias TRUTH OBSERVED Control Case Control Case 20 40 Ex. 40 Ex. 10 10 60 90 60 80 Unex. Unex. 100 100 100 100 Odds Ratio: 2.7 Odds Ratio: 6.0

Recall Bias - Solutions

- Sick controls
- Standardized questionnaires
 - that obtain complete information
- Mask subjects to study hypothesis

Interviewer Bias

- Systematic difference in
 - · soliciting,
 - recording,
 - interpreting information
 - Exposure information sought when outcome is known
 - Case control
 - Outcome information sought when exposure is known Cohort study

Interviewer Bias Solutions

- Standardize interviewer training
- Standardize interview procedure
- Monitor quality during data collection (taping)
- Mask interviewer
 - >to study hypothesis
 - disease / exposure status of subjects

Surrogate Interviews

- Cases unavailable for interview
 - > Family member interviews
 - Does family member know about exposure?
 - Occupational exposure?
- Controls available for interview

Surrogate Interviews - Solutions

- Standardize data collection for case / control groups
 - > Family member interviews for all
 - Compare family member interview to control interview

Loss to Follow up

- People who are lost to follow up may differ from those that remain in the study
 - > If subjects lost differ in outcome and exposure from those that remain -> BIAS
- Solution
 - > Don't lose people!
 - Achieve high and equal rates of follow up for the exposed and unexposed groups

Non-Response Bias

- Responders = Non-responders?
- Evaluation
 - > Compare responders to nonresponders for each variable on which you have data

Temporal Bias

- "Exposure" = early manifestation of disease
- Solution: stratify by early manifestation

Analytic Bias

- Wrong choice of statistical techniques
 - > Example: data don't meet assumptions of test
- Solution
 - > Learn more statistics yourself OR
 - > Consult a biostatistician
 - o Best done in DESIGN Phase
 - o Even the best statistician cannot help you if you have not collected the appropriate data in the right way....

Issues in Interpretation

this class • Could bias have occurred?

> Consider the design and conduct of study

this class • Is bias actually present?

> Evaluate where possible

 $_{\mbox{\scriptsize o}}$ Compare those lost with those kept

• Consequences of bias large enough to this class really alter the measure of association?

> Sensitivity analysis

• Which direction is the distortion?

> Towards or away from the null?

Potential for Bias Cross Case-Probability of: Sectional Control Ecological Cohort Selection Bias Recall Bias Loss to follow-up Confounding variable none less more MOST

Interpretation: Confounding Introduction

Learning Objectives

• Understand the concepts of Confounding and interaction, how to detect them and distinguish them from each other

61

Confounding

- Definition
 - mixing of the effect of the exposure on the disease with that of a third factor
 - Thus
 - It is an alternate explanation for an observed association between an exposure and disease
 - Result
 - distorts the true association toward the null (negative confounding) or away from the null (positive confounding).

62

Confounding Example

Horida	Alaska	RR

63

Confounder Requirements

- Is related to exposure
- Is related to disease
- Is not a biologic consequence of the exposure
- Is not part of the causal pathway

64

Possible Associations

$$x \rightarrow c$$

$$x < \frac{O_1}{O_2}$$

$$X_4 + X_2 \longrightarrow 0$$

$$x \rightarrow 1 \rightarrow 0$$





X = exposure, O = outcome,

C = confounder, I = Intermediate

MI and Physical Activity

- Could age be a potential confounder?
 - Is age related to myocardial infarction (MI)?
 - Is age related to PA?
- Could fluid intake be a potential confounder?
 - Is fluid intake related to MI?
 - Is fluid intake related to PA?

Confounding Notes

- Association of potentially confounding factor (PCF) & disease
 - does not have to be a causal
- PCF must be predictive of disease, independent of its association with the exposure under study
 - must be association of PCF and D among the nonexposed

67

Why worry about confounding?

- Confounding factors = nuisance variables
 - Distort the relationship you want to measure
 - Need to remove their effect
 - Age-standardization is an example

68

Causal Pathway

- A variable cannot be a confounder if it is a step in the causal chain or pathway
- Example
 - Moderate alcohol consumption increases serum HDL levels
 - Elevated serum HDL levels decrease risk of heart disease
 - HDL level is a step in this causal chain an Intermediary
 - not a confounder
 - We don't need to control for it
 - It is something interesting that helps us understand the disease mechanism

69

Interpretation: Confounding Strategies in Design

70

Learning Objectives

- Understand how to avoid confounding in the design of a study and
- Correct for confounding in the analysis

Avoiding Confounding

- Must be considered during design AND analysis
- Must know something about the potential confounding factors before you design or analyze

Design Strategies

- Selection or restriction
- Randomization
- Matching
 - Individual matching or frequency matching

73

Selection/Restriction

- Include only one strata in the study
 - If gender was the confounding variable
 - Include only one gender, e.g. men only
- Advantages?
- Disadvantages?

74

Randomization

- Typically in clinical trials
 - Randomize the exposure
 - Generally leads to an even distribution of subjects with confounding characteristics between treatment groups

75

Matching

- Choice of study subjects
 - potential confounders distributed in an identical manner among
 - exposed and unexposed groups (cohort study)
 - cases and controls (case control study)

76

Matching Example

- Cohort study
 - Exercise and heart attack
 - exercisers and non-exercisers
 - Confounders
 - age, sex, smoking
 - Exposed subject
 - 45 year old nonsmoking female
 - Choose unexposed subject
 - Age 45 (45 + or a couple of years)
 - female
 - Non smoker

77

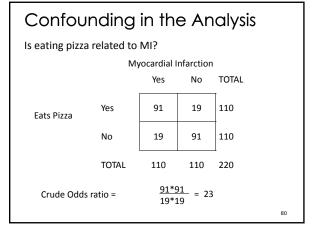
Matching

- Total sample size required usually smaller than unmatched design
- Does not control for other confounders

When to Match?

- Insufficient subjects for control through stratification/multivariate analysis
- May also control for factors that are indefinable and difficult to quantify
- Feasibility for accruing control group
- Small case series

79



Confounding in the Analysis

- Is this a valid result?
- Could there be another explanation for this large effect?
- Could drinking beer be a potential confounder and be an explanation for the effect?

81

Detecting Confounding

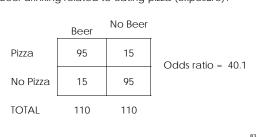
- Is the PCF related to both exposure and disease?
- Is the crude relationship between our exposure of interest different than the relationship after adjusting for the potential confounder?

82

Confounding Criterion 1

Is the PCF related to both exposure and disease?

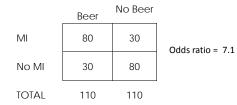
Is Beer drinking related to eating pizza (exposure)?



Confounding Criterion 1

Is the PCF related to both exposure and disease?

Is Beer drinking related to MI (outcome)?



Could Beer Drinking be in the pathway?

Confounding Criterion 2

Is the crude association similar to the association within the strata of the PCF?

Beer Drinkers

Pizza

No Pizza

TOTAL

MI No MI

75 20

5 10

80 30

 Beer Non-drinkers

 MI
 No MI

 Pizza
 10
 5

 No Pizza
 20
 75

Odds ratio = 7.5 Odds ratio = 7.5

TOTAL

Odds Ratio_{crude} = 23

30

80

Note

 All adjustment formulas and procedures assume that the strataspecific effects are equal

86

Interpretation: Confounding
Strategies in Analysis

87

Learning Objectives

- Understand how to avoid confounding in the design of a
- Correct for confounding in the analysis

88

Analytic Strategies

- Matching
 - Required if matching used in design
- Stratification
 - Suitable for all designs
 - To detect & control confounding AND to detect & describe effect modification
- Multivariate analyses

89

Matched Analysis

Control

Case Exposed Unexposed

Exposed	Unexposed
<u>a</u>	(b)
0	d

- Compare discordant pairs
 - -OR = B/C
 - McNemar's odds ratio

Stratification

• Evaluation of the exposure / outcome association within homogeneous categories (strata) of the confounding variable

Example

- Case Control Study
 - Exposure: Oral contraceptive use
 - Outcome: Heart attack

Total Data in one 2 x 2 table)

OC Use

	Case	Control
Yes	39	24
No	114	154

Crude OR = 2.2

Stratification

Age< 40

Case Control Yes 17 OC Use No 26

Age 40 and over

	Case	Control
Yes	18	7
No	88	95

Stratum-specific OR = 2.8

Stratum-specific OR = 2.8

- Each stratum like a restricted analysis
- Stratum specific ORs do NOT equal the crude
 - Stratum specific = 2.8, Crude = 2.2
- Difference > 10%

93

Adjustment

- CONTROL by computing an adjusted (summary) effect measure
 - Mantel-Haenszel Adjusted Odds Ratio

$$OR_{MH} = \frac{\sum (a_i \times d_i / N_i)}{\sum (b_i \times c_i / N_i)}$$

- Logistic Regression

OR_{MH}

Beer Drinkers

Pizza

TOTAL

MI No MI 20 75 No Pizza 10 80 30

Non Beer drinkers

Pizza

No Pizza

TOTAL

MI No MI 10 5 20 75 30 80

+ (20*5)110

Odds ratio = 7.5

Odds ratio = 7.5

Odds Ratio_{crude} = 23
$$- = \frac{(75*10)110 + (10*75)110}{(5*20)110 + (20*5)110}$$

= 7.5

Beer Drinking is a Confounder

- Beer drinking is related to both exposure (pizza) and disease
- Crude OR does not equal strata-specific OR
- Crude OR = 23
- OR for beer drinkers = 7.5
- OR for non-beer drinkers= 7.5
- OR_{MH} = 7.5
- Adjusted OR does not equal crude OR, but does equal strataspecific OR

Defining "Different"

- When you, the investigator, think the difference is meaningful
- A suggested general rule: when the difference between ORs >10%

97

Is this evidence of confounding?

- 1. Crude OR = 2.1
 - Strata OR1 approximately = 1.5
 - Strata OR2 approximately = 1.8
 - Adjusted OR =
- 2. Crude OR=2.1
 - Strata OR1 approximately = 2.3
 - Strata OR2 approximately = 1.9
 - Adjusted OR=

98

Limits of Stratification

 It is difficult to control for many variables simultaneously because a large number of strata will be generated relative to the number of study subjects

99

Example

- Case-control study of physical activity and heart disease
 - Stratify by
 - Gender
 - two categories: male and female
 - Age
 - five categories: 40-49, 50-59, 60-69, 70-79, 80 and over,
 - Smoking status
 - three categories: never smoked, light smoker, heavy smoker
 - you will end up with 30 strata.
- If you have a study with a few hundred cases and controls, you will end up with small numbers or even zeros in many cells

100

Multivariate Analysis

- Statistical technique
 - simultaneously adjusts for several variables
- Construction of mathematical model
 - describes associations between exposure, disease, and confounders
- Examples
 - multiple linear regression for continuous variables
 - logistic regression for case-control data
 - Cox proportional hazards model for cohort data

101

Multivariate Approach

· Logistic regression

$$\ln(Y/_{1-Y}) = \alpha + \beta_1 x_1 + ... + \beta_n x_n + \varepsilon$$

OR
$$(x_1) = e^{\beta_1}$$

Summary of Confounding

- Confounding can either exaggerate or minimize the true association
- Epidemiologists have developed many methods to control confounding in the design and analysis

103

Summary of Confounding

- Mixing of effect between and exposure, an outcome, and a third variable known as a confounder
- Considered a nuisance
- Studies may have a small, moderate or large degree of confounding

104

Remember this earlier note?

- All adjustment formulas and procedures assume that the strata-specific effects are equal
- What happens if the strata-specific effects are NOT equal?

105

Interpretation: Interaction

Learning Objectives

• Understand interaction & how to distinguish this from confounding

Effect Modification

- Interaction = effect modification
 - the *magnitude* of the association between the exposure of interest and the outcome is *different* for each level of the third variable
 - If strata-specific effects are not approximately equal, then effect modification is present Stratan

OR or RR in women = 5.2 OR or RR in men = 1.1

Effect Modification = Interaction

Detecting Effect Modification

- Compare crude estimates with strata-specific estimates
 - If strata-specific estimates are approximately equal, then no effect modification.
 - Evaluate for confounding and adjust if appropriate
 - If strata-specific estimates are not approximately equal, then there is effect modification
 - No need to evaluate for confounding
 - Describe

SBP / MI / Gender Example							
			Crude	RR	= (95/3	91) / (17	3/1240)
SBP	MI	No MI				(1.39-2.	
≥ 165	95	296	391				
< 165	173	1067	1240				
Men					noW	men	
SBP	MI	No MI			MI	No MI	
≥ 165	44	106	150		51	190	241
< 165	120	537	657		53	530	583
Strata-s	Strata-specific RR = 1.61 (1.2-2.2) Strata-specific RR = 2.33 (1.6-3.3)						

SBP / MI / Gender Example

- Is gender and effect modifier?
 - Strata-specific RR are not approximately equal, although they are both in same direction
 - RR for men = 1.6
 - RR women = 2.3

When is 'different' different?

- Epidemiological perspective
 - When you, the investigator, judge the difference to be of importance
- Statistical perspective
 - When the difference is statistically significant

Presenting Results

- If there is effect modification present
 - Do NOT summarize (adjust) the association
 - Describe the associations
- Effect modification usually tells something about the causes

SBP / MI / Gender Example

• Crude RR = 1.7 - Male RR = 1.6

- Female RR = 2.3

• Adjusted RR = 1.9

Example

- · Relation of
 - BMI
 - · body mass index, a measure of obesity
 - and breast cancer
 - varies with
 - menopausal status
 - Pre-menopausal women:
 - higher BMI decreases risk Post-menopausal women:
 - higher BMI increases (or does not affect) risk

Summary-1

- · Why stratify?
 - To detect and describe effect modification
 - To detect and remove confounding
- When do you present strata-specific results?
 - When you have effect modification
 - RRcrude ne RRstrata1 ne RRstrata2

ne = not equal to, eq = equal to

Summary-2

- When do you present adjusted rates?
 - When you have confounding and no effect modification.
 - RRcrude **ne** RRstrata1 **eq** RRstrata2
- When do you present the crude results?
 - When there is no confounding and no effect modification

ne = not equal to; eq = equal to

Summary -3

- All strategies still require the investigator to know in advance which potential confounding factors or effect modifiers need to be included in data collection
 - You can't adjust for variables that you did not collect data on....

Confounding / Interaction Step by Step

- 1. Is it in the causal pathway?
 - Yes STOP! This is neither confounding nor interaction
 - No continue to #2
- 2. Is it associated with the exposure of interest?
 - No STOP! This is neither confounding nor interaction
 - Yes continue to #3
- 3. Is it associated with the outcome?
 - No STOP! This is neither confounding nor interaction
 Yes continue to #4
 - Yes continue to #4

Confounding / Interaction Step by Step

- 4. Does it affect the measure of association between the exposure of interest and the outcome (i.e., is ORcrude ≠ ORstrata)?
 - No STOP! This is neither confounding nor interaction
 - Yes continue to #5
- 5. Are the strata specific OR/RR approximately
 - Yes you have confounding, present an adjusted measure of association
 - No you have INTERACTION! Present strata specific measures of association separately - this has become the main point of your publication!

Standardization

Definition & Motivation

122

Learning Objectives

• Understand motivation for standardization

123

Disease Rates

- Rates are usually calculated because you want to COMPARE
 - Compare some observed experience with a target rate
 - Compare two populations at the same time period
 - Compare same population at two different time periods

124

Types of rates

- Crude rates
- Specific rates
 - Age, cause, time period
- Adjusted rates
 - Age-adjusted or age standardized rate

125

Crude rates

- Summary rates for whole population
- Denominators usually some midpoint estimation of population

Specific Rates

- Cause-specific
- Age-specific
- Race-specific
- Sex-specific
- Numerators and denominators are restricted to population subsets

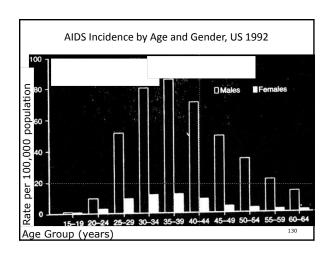
127

	10 Leading Cau	,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,	,, D	Sacri
	Ages 25-44, All races, Both	Sexes, U	5, 1991	
1	Accidenis /adverse evenis	26,526	18.0	32.2.
	All causes	147,750		

Cause-Specific Death Rate

Total number of deaths due to a specific cause among individuals ages 25-44 in the US in 1991

Total number of individuals in the US population in 1991 ages 25-44 years



Crade Beath	Rate / Life Expe	ceancy
Colombia (1285 - 1282) US (1288) Sweden (1282)	7.4 8.8 10.8	63.A 71.3 74.2

Comparing Two Rates

- · Category specific comparisons
- Comparisons with adjusted rates
 - Direct adjustment
 - Indirect adjustment

133

Under 5	686	16,548,000	4.2
751	130,259	9,969,000	1313.7
otal (crude rate)	416,481	226,546,000	183.8

Crude Rates

- Are summary rates of the total population
- Weighted average of the population
 - Weighted by the population structure
- Sum of specific rates x population in the specific categories

135

Why Adjust?

- Want to compare rates
- Populations to compare differ in distribution on another variable(s) (e.g. age) that may have a relationship with the outcome
- Strata-specific comparisons tedious & don't provide a summary
- Standardization
 - accounts for these differences so that we can make valid comparisons

136

Rate Standardization

137

Comparing Rates

Has the cancer mortality rate changed from 1940 to 1980?

Crude Mortality Rates

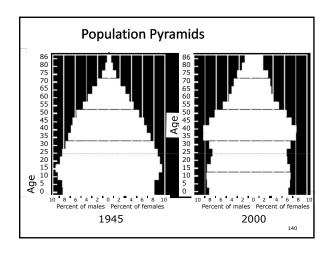
• 1940

• 1980

- 120.2/10⁵/yr

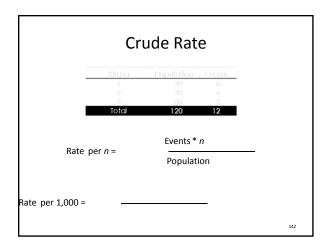
- 183.8/10⁵/yr

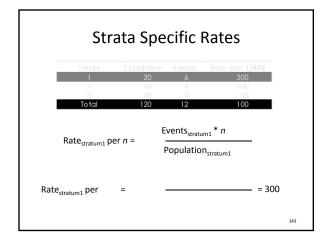
Under 5	4.7	4.2.	
751:	1183.5	1313.7	_
Total (crude rate)	120.2	183.8	

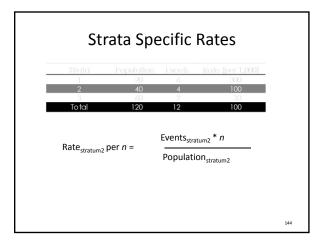


How to compare two rates

- Category specific comparisons
- Comparisons with adjusted rates
 - Direct adjustment
 - Indirect adjustment



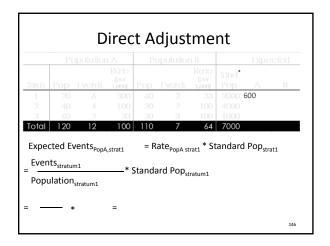


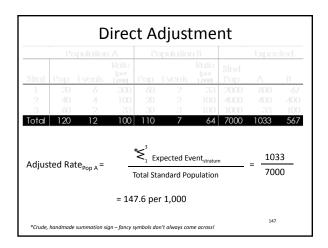


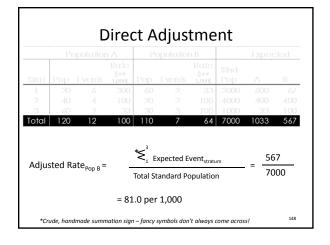
Direct Adjustment

- Category-specific rates x standard population distribution
- Provides an estimate of what would be <u>expected</u> if both populations in the comparison had the same population distribution

145







Comparing Rates

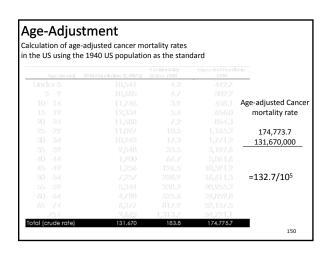
Has the cancer mortality rate changed from 1940 to 1980?

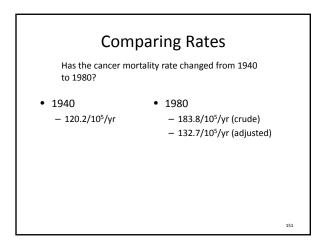
Crude Mortality Rates

• 1940

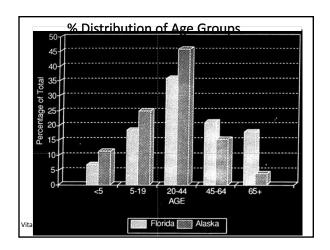
- 120.2/10⁵/yr

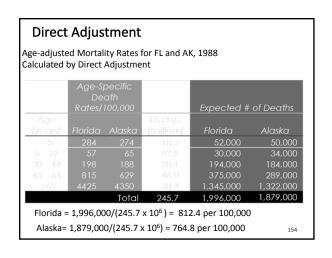
- 183.8/10⁵/yr







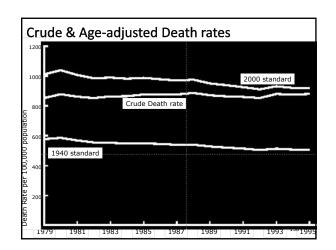




Comparing Rates		
Are people more likely to die than in Alaska?	in Florida	
	Horida	Alaska
Age-Adjusted Mortality Rate (per 100,000)		
		155

Picking the 'Standard' • Actual adjusted values will vary with the selection of the 'standard' population - Comparisons between groups will usually remain fairly constant • Important: All groups in the comparison should be adjusted to same standard

	Stand	ard Pop	oulations	•
<1	2,020,174	0.015343	3,795,000	0.013818
Total	131,669,275	1.000000	274,634,000	1.000000



Indirect Adjustment

- Standard population rates x observed population
 - Apply age-specific rates from standard population to
 - age-specific population under study
 - Calculate 'expected' number of cases (if the rates from a standard population were applied)
 - Then compare to what was observed:

SMR = observed/expected x 100%

159

				d Deaths .
US Death Raies				
	⋆ Total E		. 144,539	x 2,295
	⋆ Total C	bserved	131,044	2,064

Interpreting the SMR

- < 100%
 - This population has fewer events than you would expect based on the standard rates
- = 100%
 - This population has the same number of events that you would expect based on the standard rates
- > 100%
 - This population has more events than would be expected based on the standard rates

161

When to use indirect adjustment?

- When category-specific rates are not known
- When populations are small (and rates not stable)
 - Occupational settings
 - Small communities for short time periods

Direct vs Indirect Adjustment

Adjustment

Strata pop X Strata Rate

- Direct Adjustment
 - Standard Population X <u>OBSERVED</u> RATES
- Indirect Adjustment
 - OBSERVED POPULATION X Standard Rates

163

Summary

- Different types of rates
 - Crude, category specific
- How to compare two rates?
 - Strata-specific always appropriate
 - Direct-adjustment for summary comparisons
- Direct: Standard populations
- Indirect: Standard rates

64

Interpretation: Chance Introduction

165

Learning Objectives

• Understand the role of Chance in epidemiologic studies

166

Sampling

- · Goal of study
 - Determine the true relation between exposure and disease
- Actual results may vary
 - Sample vs. whole population
 - Sampling variability

167

Statistics 101 Urn holds 100 marbles > red and/or blue draw 4

S	tatistics	3 101	
Red	Blue	Conclusion	
0	4	All blue	
1	3	75% blue	
2	2	50% blue	
3	1	25% blue	
4	0	All red	
			169

Statistics 101						
50 Blue, 50 Red						
Red	Blue	Probability	Conclusion			
0	4	6%	All blue			
1	3	25%	75% blue			
2	2	38%	50% blue			
3	1	25%	25% blue			
4	0	6%	All red			
				170		

Statistics 101		
50 Blue, 50 Red	Probability of sample with 1 color	
Sample Siz		
4	12.0	
5	5.6	
6	2.7	
7	1.2	
8	0.6	
9	0.3	
10	0.1	
15	0.0018	
20	0.000018	
		171

• Given - Hypothesis • the chance of drawing a red marble on any one try is 50% - information about sample size • Possible to calculate probability of - a bad sample, or - observing a particular result from a set of sample data

Statistics 101

"Bad samples happen" – S. Pettygrove

- \uparrow sample size \rightarrow
- \downarrow sampling variability and
- $\ensuremath{\downarrow}$ probability of an unrepresentative sample

Interpretation: Chance
Statistical Inference

Learning Objectives

• Understand how chance affects our **interpretation** of the results of an epidemiologic study

175

Epi Studies

- Measure disease frequency in two (or more) groups
 - differ only on the exposure of interest
- 2 measures of disease frequency
 - --> single measure
 - RR,
 - OR,
 - Risk or rate difference

176

Statistical Inference

- Unrepresentative sample due solely to chance
 - measure of association you observe ≠
 - true measure of association
 - by chance alone
- Possible to calculate probability that observed measure of association was due to chance

177

Hypothesis Testing

- · Hypothesis testing
 - performing a statistical test
 - Particular statistical test to use depends on type of study, type of measurement, etc.
- Statistical test
 - quantifies the probability that sampling variability or chance may explain the observed association

178

Hypothesis Testing

- Null hypothesis
 - (H₀): RR=1, OR=1, RD=0
 - Assume H₀ is true
 - NOT some alternative hypothesis (H_A)
- H_o assessed by statistical test
 - Reject H_o or
 - Fail to reject H₀

170

T-test

Continuous Data (like height)

$$H_0: \bar{x}_1 - \bar{x}_0 = 0$$

$$t_{(df)} = \frac{-\bar{x}_1 - \bar{x}_0}{\sqrt{(1/n_1 + 1/n_2)}}$$

Where:

n₁ = number in group 1 n₂ = number in group 2

 x_1 = mean of group 1

 $x_2 = mean of group 2$

 s_p = pooled estimate of variance

Chi-square

Categorical Data

$$\chi^2_{(df)} = \sum \frac{(O_i - E_i)^2}{E_i}$$

Where:

 O_i = Observed in the i_{th} group

 E_i = Expected in the i_{th} group

df = degrees of freedom for the statistic

181

Hypothesis Testing

- Statistical test → p-value
- P-value
 - Probability observed result would occur, if the null hypothesis is really the truth
 - Given that H₀ is true, the p-value is the probability of seeing the observed result, or results more extreme, by chance alone

182

Hypothesis Testing

- P value ranges from 0 to 1
- · "Small" p-values
 - Low probability that a result as extreme (or more so) would have been observed if H₀ were true
 - H₀ incompatible with observed data
 - alternate hypothesis a better explanation for the data
 - chance is an unlikely explanation for the result

183

Statistical Conventions

- p≤ 0.05
 - arbitrary cutoff for statistical significance
- If $p \le 0.05$
 - results unlikely to be due to chance
 - reject $\rm H_0$ in favor of $\rm H_A$

184

Statistical Conventions

- If p> 0.05
 - the finding can be explained by chance
 - do not reject H₀
- NOTE
 - Chance cannot be completely excluded as a possible explanation no matter how small the pvalue

185

More on the P value....

- P values determined by
 - magnitude of the association
 - sample size (sample variability)
- Huge sample →
 - even a trivial risk increase or decrease is statistically significant
- Small sample →
 - even a large risk increase or decrease is not statistically significant

p-Value Example

- In utero DES Exposure and the Risk of Breast Cancer
- H₀
 - There is no association of in utero DES exposure and breast cancer risk
- H,
 - There is an association of in utero DES exposure and breast cancer risk OR (two-sided test)
 - In utero DES exposure increases the risk of breast cancer (one-sided test)

187

p-Value Example

- RR = 1.4 p-value = .10
- Best estimate of the increased breast cancer risk associated with DES is 1.4
- p-value > 0.05not "statistically significant"

188

p-Values

- p-value
 - guide to whether chance is an explanation
- Statistical significance
 - evaluates only the role of chance
 - Does not test for bias or confounding
- Statistical significance vs biological significance
- Multiple testing effects

189

Interpretation: Chance Confidence Intervals

190

Learning Objectives

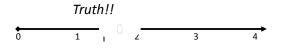
Understand the Concept and interpretation of confidence intervals

191

Confidence Intervals

- Means of quantifying sampling variability
- Measure of association (RR, OR) is the point estimate
- · Point estimate has variability
 - can be expressed mathematically

Chance



Measure of Association

193

Confidence Intervals

- Formulas to calculate CIs specific to measure of association
 - See biostat books / class
- What goes into the calculation?
 - Size of point estimate
 - \bullet Point estimate $\pm\,\text{a}$ measure of variance
 - Sample size
 - \uparrow sample size $\rightarrow \downarrow$ size of CI
 - Z score
 - 95% CI : α = 0.05 : 1.96

194

Confidence Intervals

• RR and 95% CI

-1.6 (1.5 - 1.7)

- 1.7 (1.3 ----- 2.5)

- 2.5 (0.95 ----- 6.5)

195

Confidence Intervals

Increase sample size

Decrease variance

Increase α (from 95% CI to 60% CI)

196

Things to Remember

- CI is a measure of variability around the point estimate
 - The point estimate will ALWAYS fall within the CI
- CI does indicate a range of values that are consistent with the data
 - If the CI includes 1, you cannot reject the null hypothesis of no association

197

Interpreting CIs

'The 95% confidence interval means that if you repeated the study 100 times, and calculated a confidence interval each time, you expect that the true value of the measure of association (RR or OR) would fall within that interval for 95 of those repetitions."

» Sylvan Green

Interpreting CIs

- Note
 - In 5 out of the hundred repetitions the TRUE value would be outside the 95% CI
- Note also
 - You most likely did the experiment ONCE
 - Is it one of the 95 or one of the 5?

199

p-values vs Cls

- p-value
 - null hypothesis compatible with the data?
 - Yes / No
- CI
 - range of hypotheses that are compatible with the data
 - \bullet Size of CI \rightarrow how much weight to place on results
 - "CI you could drive a truck through"

200

CIs Example

- DES and breast cancer
 - RR = 1 4
 - 1.4 = best estimate of the increased breast cancer risk associated with DES
 - 95% CI = 0.7 2.6
 - Data consistent with an association of sizes 0.7 to 2.6
 - > Data consistent with RR = 1
 - > Cannot reject the hypothesis of no increase in breast cancer risk with DES exposure

201

Statistical Testing

- p-Values and CIs tell you nothing about other possible explanations for an observed result
 - Bias?
 - Confounding?
- p-Values and CIs tell you nothing about biological, clinical or public health significance

202

Horse Race Analogy

- · Betting on a horse
 - which horse
 - how much money
- Point estimate is which horse to bet on
 - DES and breast cancer example
 - best bet for a winning RR is 1.4

203

Horse Race Analogy

- P value and CI
 - how much money to bet
 - p-value relatively large
 - CI wide
 - Do not bet a lot of money on this "horse"
- If small P value and narrow CI, bet more

Interpretation: Chance Design Issues & Summary

Learning Objectives

• Understand issues of chance in epidemiology and how to account for them in the design phase

206

Chance in Study Design

- Design effect
 - sample size
 - power

207

Estimating Sample Size

- You will need
 - Probable size of the effect
 - Proportion of exposure in the control group
 - Size of the Type I error you are concerned about (alpha level)
 - Size of the Type II error you are concerned about (power)

208

Errors in Inference

Significance Testing

Truth

Do not Reject H_0 (not significant) Reject H_0

(significant)

H₀ True H_A True

Correct Type II

Type I Correct

209

Chance in Study Design

- Type I error = p value
 - -α
- Type II error = β (beta) error
 - $-1-\beta$ = Power

Example: Study 1

 Blood Test
 Males
 Females

 Positive
 52
 48

 Negative
 48
 52

OR = 1.17 95% CI = (0.65 - 2.12)

211

Example: Study 2

Blood TestMalesFemalesPositive52004800Negative48005200

OR = 1.17 95% CI = (1.11 - 1.24)

212

Example

Study A

• OR = 2.6 95% CI = 1.9 – 4.2

Study B

• OR = 2.6 95% CI = 0.54 – 17.2

Either

- Sample size too small insufficient power or
- No true relationship

213

Exercise

- Interpreting p values and confidence intervals
- Five studies
 - same exposure-disease relationship
 - assume no bias or confounding

214

Exercise Study RR p-value 95% CI Α 3.1 0.8 - 4.2 100 .10 В 3.0 .06 0.9 – 3.3 500 С 1000 .02 2.6 – 4.5 3.5 D 2000 3.2 .015 2.2 - 3.5Ε 2500 3.3 .001 2.8 - 3.6

Interpretation

Bias vs.. Confounding & Other Issues

Learning Objectives

• Some wrap-up notes on bias and confounding

217

Bias vs.. Confounding

- Difference between confounding and bias:
 - you collected data on the confounder
 - you can examine it and
 - · control for it in analysis
 - No data collected on biasing variable
 - nothing you can do about it once data collected

- paraphrased from Dr. Moyses Sklo, Johns Hopkins University

Confounder Criteria

- 1. It must NOT be in the causal pathway
- 2. It MUST be associated with the exposure of interest
- 3. It MUST be associated with the outcome
- 4. It must NOT be an effect modifier
- 5. It MUST affect the measure of association between the exposure of interest and the outcome (i.e., $OR_{crude} \neq OR_{strata}$)

219

Bias

- If it affects both groups equally then it is NOT BIAS
 - Study subjects are all 103 years of age or older
 - Recall is definitely likely to be a *problem*
 - It is only recall BIAS if the problem affects the two groups (exposed/unexposed or diseased/healthy) differently

220

Writing about Bias

• Hypothetical test question:

What are potential sources of bias for this study?

A bad answer: "Recall bias"

A **good** answer: "Recall bias may be a problem because cases were interviewed within 2 days but the average time to interview was 14 days for controls"

A **better** answer: The good answer PLUS "This would be likely to artificially inflate the measure of association <u>because</u> cases will be more likely than controls to remember their exposure"

221

Validity vs. Generalizability

- The study is
- Valid
 - If the association between exposure and disease has been accurately assessed
- Generalizable to the population represented by the study subjects

Validity vs. Generalizability

- A study may be Valid within a very specific population
 - Left-handed, Norwegian, vegetarian, women
- But not Generalizable to the general population

223

Validity vs. Generalizability

• If the study is not Valid then who cares whether it is Generalizable or not?

224

Target Population

- The population to which you would like to Generalize the results:
 - Ambulatory, community-living, adults ages 65+ (footwear study)
 - People with age-associated memory-impairment (gingko study)

225

Screening

226

Learning Objectives

• Understand the public health context and considerations in screening

227

Screening

- Definition
 - Presumptive identification of unrecognized disease or defect by the application of tests, examinations, or other procedures which can be applied rapidly
- How does a screening test differ from a diagnostic test?

Screening

- 2⁰ prevention
 - goal is to reduce morbidity and mortality
- Reduce burden on the individual
 - potential years of life lost
 - extent of disability, pain and discomfort
- cost of treatmen
- impact on individual and family
- Reduce burden on society
 - Mortality
 - Morbidity
 - Societal costs of treatment

229

Screening Considerations

- When do you consider screening?
 - Characteristics of Disease
 - Disorder is well-defined
 - Pre-clinical phase
 - Prevalence is known
 - Effective treatment readily available
 - Follow-up & treatment for a positive result are agreed upon, acceptable to patients, and available

230

Screening Considerations

- · When do you consider screening?
 - Characteristics of Test
 - Parameters of test
 - Sensitivity & specificity, reliability
 - Cost
 - Acceptability / safety of test
 - Cost-effective
 - Simple and safe
 - Facilities are available or easily installed
 - Simple to perform, easy to interpret, capable of use by various health professionals

231

Screening Considerations

- When do you consider screening?
 - Public Health Context
 - Equity available to all
 - Consequences of False Positives
 - Intrusiveness /cost of follow-up
 - Consequences of False Negatives
 - Cost / Benefit analysis
 - Benefit vs Harm from test
 - Diversion of health resources to new screening tests and follow-up
 - Society values for new screening test vs other health services

Screening Problems

Referral bias: selection in types who are screened – also

Length-biased sampling: selection bias in the type of

disease detected among those who are screened

PSA

232

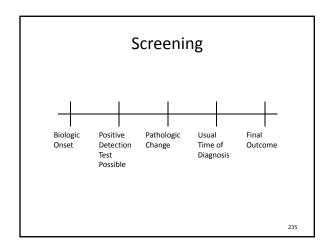
Evaluating Screening

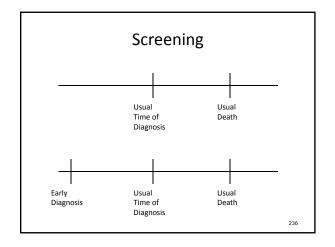
- Reduction of mortality
- Reduction of case fatality in screened vs unscreened
- Reduction of complications
- Prevention / reduction of recurrences
- Improvement in quality of life indicators

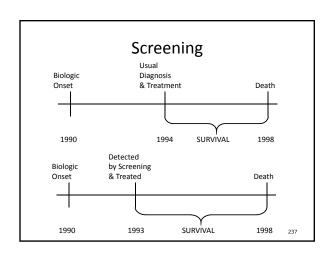
Lead time bias

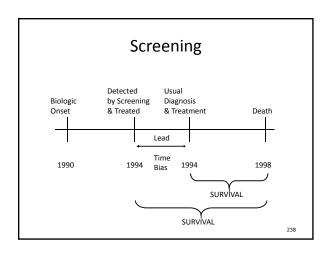
called volunteer bias

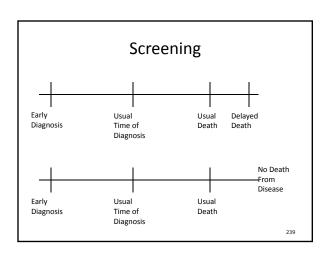
234













Learning Objectives

· Understand the purpose and types of surveillance systems

Surveillance

- Definitions
 - "...continued watchfulness over the distribution and trends of incidence through the systematic collection, consolidation, and evaluation of morbidity and mortality reports and other relevant data with timely and regular dissemination to those who 'need to know'..."

 » Langmuir, 1963, NEJM, 268, 182-192
 - Systematic ongoing collection, collation, and analysis of data and the timely dissemination of information to those who need to know so that action can be taken.
 - » World Health Organization
 - The ongoing systematic collection, analysis, and interpretation of health data, essential to the planning, implementation, and evaluation of public health practice, closely integrated with the timely dissemination of these data to those who need to know. The final link in the surveillance chain is the application of these data to prevention and control. A surveillance system includes a functional capacity for data collection, analysis and dissemination linked to public health programs.
 - » Centers for Disease Control and Prevention

242

Surveillance

- Key Components
 - Data collection
 - Analysis
 - Dissemination
 - Action!

243

245

History of Surveillance

- Johann Peter Frank—1776—first public health monitoring of schoolchildren's health, prevention of injuries, maternal and child health, and public water and sewage disposal
- William Farr—1839—Father of modern surveillance—developed vital statistics and weekly, quarterly, and annual reporting
- United Kingdom—1899—first compulsory notification of selected infectious disease
- United States—1878—national morbidity data on plague, smallpox, and
- -1925—all states reported weekly to the USPHS on selected
- Worldwide—1907-1950s—from Europe to most of the globe, mortality reporting was required, as was surveillance of selected communicable

244

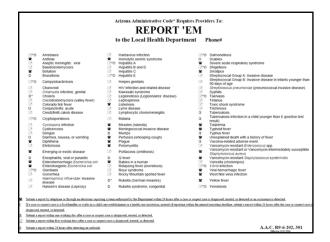
Surveillance Objectives

- 1. To characterize disease patterns by time, place, and person
 - To suggest etiologic hypotheses
- 2. To detect epidemics (e.g., communicable diseases)
 - To identify bioterrorist events
- 3. To detect changes in incidence (e.g., chronic diseases)
- 4. To identify cases for analytic epidemiologic research
- 5. To evaluate prevention and control programs
- 6. To project future health care needs

Surveillance Types

- Passive
 - Required reporting by health professionals
 - Passive on the part of those running the system, but requires action from health professionals
- Active
 - Those administering the system send teams out to data sources to actively look for cases

Passive Surveillance - Reportable Diseases in AZ Arrebass Botulism Brucellosis Campylobacteriosis Condiciolismomycis (haller fever) Colorado tick fever) Colorado ti



Surveillance

- From local to global
 - Pima County
 - Arizona
 - United States
 - Selected Populations
 - Pan Americ
 - World

Surveillance

- Arizona Department of Health Services (ADHS) (www.hs.state.az.us)
 - Communicable diseases
 - Cancer registry
 - Cancer registr
 Bioterrorism
 - West Nile Virus

250

249

251

ADHS Cancer Registry

- The Arizona Cancer Registry
 - population-based surveillance system
 - incidence and
 - survival of persons having been diagnosed with cancer
- Arizona Revised Statute §36-133
 - Mandates the reporting of cancer cases in the state of Arizona
 - Required to report
 - hospitals,
 - clinics, and
 - physicians

ADDSP

- Arizona Developmental Disabilities Surveillance Program
- UA Pediatrics
- CDC funding
- System-wide protocol

What is Autism?

- Autism 1943 Kanner
- Kanner L. Autistic disturbances of affective contact. Nervous Child 2:217-250.
 - Deficits in 3 areas
 - Social
 - Communication
 - · Behavior and interests
 - Approximately 70% have IQ's < 70 (mental retardation) as originally described...

253

Diagnostic Criteria

 "There are no definitive diagnostic tests for autism. Diagnosis is made from a detailed developmental history and observation of behavior in structured and unstructured situations. This process is fraught with difficulties of definition and standardiz(s)ation."

- Wing and Potter, 2002. Ment Ret and Dev Dis Res Rev

254

Autism

- Autistic Disorder
 - At least 6 criteria from 3 areas:
 - Impaired social interaction (at least 2)
 - Impaired communication (at least 1)
 - Activities, behavior and interests that are repetitive, restricted and stereotyped (at least 1)
 - Symptoms not better explained by Childhood Disintegrative Disorder or Rett's Disorder

Differences are <u>QUALITATIVE</u>, not only the result of delays

Development in these areas follows a <u>DIFFERENT</u> path than that of most children.

255

Individuals with **D**isabilities **E**ducation **A**ct

- 1991 IDEA Part B
 - Mandates that the public schools provide a free and appropriate education for all children with disabilities between the ages of 3 and 21

256

Children (ages 6-17 years) Served for Autism Under IDEA 60,000 40,000 30,000 20,000 10,000 91.92 92.93 93.94 94.95 95.96 96.97 97.98 98.99 School Year Source: U.S. Department of Education, Office of Special Education Programs, Data Analysis System (DANS)

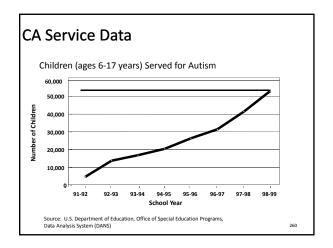
CA Service Data

- 1987-1998 Data
 - Autistic Disorder: >200% ↑
 - ASD: 1966% **↑**
 - Other Developmental Disabilities: 31-49% ↑

California Service Data

- Increase from 3,795 to over 53,000 children served under autism classification
 - does not consider population growth
- Switching from services for mental retardation to autism
 - Croen LA, Grether JK, Hoogstrate J, and Selvin S.
 The changing prevalence of autism in California.
 J Autism Dev Disord. 2002;32:207-215.

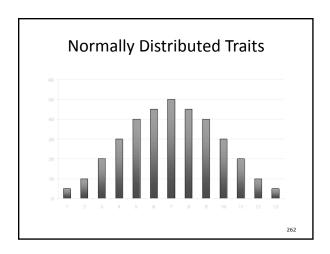
259



Fuzzy Outcomes

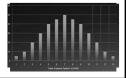
- Autism
- · High blood pressure
- High blood sugar
- Obesity

261



Artifactual Prevalence Increase

- Increased availability of services
- Expanding case definition
- ↑ Awareness among parents and providers
- ↓ stigma
- \downarrow age @ diagnosis
- Changing ascertainment methodology
- Diagnostic patterns



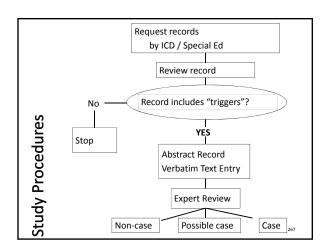
Determining Disease Frequency

- Define the population
- Define a case *
- Identify sources of information
- ullet Count cases using a systematic approach



Data Sources

- Special Educational Records
 - All public schools in Maricopa Co.
- Clinical Records
 - Phoenix Children's Hospital
 - St. Joseph's Hospital Developmental Clinic



Data Collected

- Name
- Date of birth
- State of birth
- Gender
- Race/ethnicity
- Parent names, address/phone to determine residency for surveillance year
- Special ed exceptionalities
- Evaluation Information date, examiner, reason for referral, verbatim behaviors and diagnoses
- MR/IQ, Adaptive, and ASD Test information

268

Autism Results

- Morbidity and Mortality Weekly Report
 - (www.cdc.gov/mmwr)
 Weekly bulletin on surveillance
 - Electronic Subscription available free
- Example: lead poisoning in children
- Report includes: definition of the condition Reporting period

- State and local surveillance
 Description of CDC prevention programs
- National surveys
- Extensive bibliography
- Maps and graphs
 Results for reporting period

Registry vs. Surveillance

- How to distinguish between a registry and a surveillance system
 - Registry

269

- Consent
- Contact
- Surveillance
 - Waiver of consent
 - No contact

Surveillance Concerns

- · Emerging Issues
 - SARS
 - West Nile Virus
 - Influenza
 - Tuberculosis

271

Agencies Conducting Surveillance

- Pan American Health Organization (PAHO)
 - Basic Country health profiles for the Americas
 - Health statistics from the Americas
 - Identification of and connection to each country's epidemiology and surveillance system
 - EID weekly undates: emerging and reemerging infectious diseases and other conditions
 - Antimicrobial resistanceCampylobacter

 - ChagaCholera

 - DengueMalaria

 - SalmonellaShigella
 - TuberculosisSARS

 - Veterinary Public Health
 - Non-Communicable Diseases

272

Agencies Conducting Surveillance

- National Institute for Occupational Health and Safety (NIOSH)
 - Data collection to fill gaps in other surveillance data
 - · Occupational health surveillance tracks - injury
 - illness
 - hazards
 - Began with Occupational Safety and Health Act (OSHA) of 1970

273

Surveillance Links

- Agencies
 - Centers for Disease Control and Prevention (CDC)
 - National Institute for Occupational Safety & Health
 - www.cdc.gov/niosh/topics/surveillance
 - National Center for Health Statistics
 - www.cdc.gov/nchs
 - Pan American Health Organization
 - www.paho.org

274

Surveillance Links

- Data and Statistics
 - National Electronic Disease Surveillance System (NEDSS) http://www.cdc.gov/nedss
 - http://www.cdc.gov/scientific.htm with links to:
 - CDC and ATSDR Electronic Information Resources for Health Officers
 - CDC WONDER
 - Hazardous Substance Release / Health Effects Database (HAZDAT)
 - HealthComm Key
 - Injury Maps
 - WISQARS Web-based Injury Statistics Query and Reporting System
 - 121 Cities Mortality Reporting System
 - Assisted Reproductive Technology Success Rate - Behavioral Risk Factor Surveillance System
 - Birth Defect Surveillance

275

Surveillance Links

- More Data and Statistics....
 - http://www.cdc.gov/scientific.htm with links to:
 - Cancer Registries Program
 - Hazardous Substances Emergency Events Surveillance
 - HIV/AIDS Surveillance Report
 - National Notifiable Diseases Surveillance System (NNDSS)
 - National Oral Health Surveillance System
 - Pediatric Nutrition Surveillance System - Pregnancy Risk Assessment Monitoring System
 - Sexually Transmitted Diseases
 - Surveillance Resources for Infectious Diseases
 - Tuberculosis Surveillance Reports - Workplace Safety and Health Surveillance
 - Youth Risk Behavior Surveillance System - Laboratory Practice Standards Information