



Hartford Hospital Research Program
Research Methods Lecture Series
Part II :

Concepts of Inferential Statistics

Nov 2, 2009

Yes! We're going to talk about research methods!



OVERVIEW:

- October: Basic concepts of research design
- November: Concepts of inferential statistics
- December: Choosing the right statistic Part I
- January: Choosing the right statistic Part II
- February: Meta analysis and clinical trials
- March: Grant-writing



Presenters:

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To Review – Our last presentation

- ◆ Characteristics of systematic design
- ◆ Developing background/significance
- ◆ Experimental and non-experimental approaches
- ◆ Common study designs
- ◆ Sampling methods
- ◆ Levels of measurement



Today's Presentation

- ◆ Descriptive vs Inferential Statistics
- ◆ Hypothesis Testing
- ◆ Statistical significance and power
- ◆ Sample Size calculation



Descriptive Statistics

- ◆ Describes the characteristics of the sample
 - Frequency Distributions
 - Measures of Central Tendency – mean, mode, median
 - Measures of Variability – range, variance, standard deviation
 - Measures of Association – correlation



Inferential Statistics

- ◆ Gathers data about the sample and *infers* information about the larger population.
- ◆ Uses principles of probability to decide if what is observed about the sample reflects the population reality or occurs by chance.
- ◆ Process referred to as **hypothesis testing** and forms the basis of what most people think of as “statistics”



Hypothesis Testing

- ◆ Set up alternative possibilities to test
- ◆ Can be looking for differences in two populations, the existence of a relationship, etc.
- ◆ A Null Hypothesis (H_0) – suggests that there are no differences, relationships, or equivalences
- ◆ Alternative Hypothesis (H_1) suggests that there are



Hypothesis testing: How decisions made

- ◆ Based on data collected and statistical findings, you take one of two actions – either reject the null hypothesis or not reject
- ◆ Basic rule -- Never accept null hypothesis, you haven't proven it, you just have failed to prove it wrong (this makes more sense later)



Hypothesis testing: How decisions made

- ◆ When doing analysis, you have data and make decisions about sample and try to understand the population
- ◆ But. . . if you could “know all” and know about the population that would set up four possible combinations

Hypothesis testing: Correct and Incorrect Inferences



In the sample	In The Population	
	Differences Exist	No Differences Exist
Differences observed	Correct Decision	Incorrect Inference
No differences observed	Incorrect Inference	Correct Decision



Hypothesis testing: Statistical significance

In The Population

**Decision re:
Sample**

Differences Exist

No Differences Exist

Reject H_0

Correct Decision

Type I Error
($p = \text{Alpha}$)

“Significance level”

**Fail to Reject
 H_0**

Type II Error
($p = \text{Beta}$)

Correct Decision



Statistical Significance Level

- ◆ Probability of a Type I error is the probability that an effect seen in sample is due to chance and does not reflect a true effect in population
- ◆ Want the probability of error to be as low as possible
- ◆ How would you do that????



Keeping Type I error low

- ◆ Be less likely to “Reject the Null Hypothesis”
- ◆ But then what happens??
- ◆ More likely to have Type II error
- ◆ Have to balance Type I error and Type II error



Statistical Significance Level

- ◆ Actually set by the researcher prior to the analysis – despite *everyone calculating p values*
- ◆ Convention is to set alpha at .05
- ◆ But other factors can be in play to change what alpha should be
- ◆ How do you decide what the correct balance is?



Analogy to hypothesis testing: jury decisions

- ◆ Start with assumption of innocence (null hypothesis)
- ◆ Juries are presented with evidence (data)
- ◆ Reach a verdict – guilty or not guilty (reject or not reject null hypothesis)
- ◆ Verdict is meant to represent the actuality of guilt or innocence.



Analogy to hypothesis testing: jury decisions

Jury Decision

Actual Guilt or Innocence

Guilty

Innocent

Guilty

Correct Decision

Type I error

Wrongful sentence

Not Guilty

Type II error

Someone guilty goes
free

Correct Decision



Balancing Types of Error - Analogy

- ◆ What type of case/court – criminal vs family
 - “beyond a reasonable doubt”
 - “preponderance of evidence”
- ◆ Back to statistics
 - Alpha is ‘reasonable doubt’
 - When do we go to preponderance of evidence?
- ◆ Best aim is to maximize the likelihood of finding guilty party guilty – fair, safe for society, etc.



Hypothesis testing: Statistical significance and power

	In The Population	
	Differences Exist	No Differences Exist
Reject H_0	Correct Decision ($p = 1 - \text{Beta}$) “Power”	Type I Error ($p = \text{Alpha}$) “Significance level”
Fail to Reject H_0	Type II Error ($p = \text{Beta}$)	Correct Decision ($p = 1 - \text{Alpha}$)



Hypothesis testing: How decisions made

- ◆ Based on data collected and statistical findings, you take one of two actions – either reject the null hypothesis or not reject
- ◆ Basic rule -- Never accept null hypothesis, you haven't proven it, you just have failed to prove it wrong (think of the analogy)




Keeping Type I and Type II error low

- ◆ You can decrease either at the expense of the other but how do you minimize both of them?
- ◆ Let's go back to our analogy
 - Only try cases that are really obvious
 - Get more evidence – more in depth information
 - Get more compelling evidence (clearer, less confusion)



What is statistical power?

- ◆ Power is the inverse of Type II error – it is the probability that a true effect in the population will be found;
- ◆ What determines power?
 - alpha level (need to balance between the two errors)
 - how substantial a population effect does one want to be able to identify
 - how much variance exists in the sample
 - **sample size – this is the one most easily changed**



Why is a sample size calculation needed?

- Increasing sample size is the best way to increase power without sacrificing significance level
- Determining proper balance between error types and providing large enough sample
 - insures best interpretation
 - prevents too many patients included unnecessarily and/or too few to make useful conclusions



Calculating power/sample size

Preparation

- ◆ What is your research question, design?
- ◆ What will be your primary measure? Is powering on that alone sufficient – what are implications of ‘indefinite’ interpretation
- ◆ What do you want (expect) to find?
 - How large an effect (difference) do you expect
 - How large is ‘zone of indifference’
 - How wide a confidence interval is appropriate?



Calculating power/sample size

Estimating effect size or “How do you expect me to know what the differences will be, that’s why I am doing the study? !!”

Base estimates on:

- ◆ Prior empirical findings – Are there studies that are similar to use as a guide? (Best)
- ◆ How large a difference has clinical significance? What are smallest differences in population that if exist, study should definitely be able to identify?
- ◆ Standard effect sizes small (.2), medium (.5) or large (.8) effect size (see Cohen, 1988)



Calculating power/sample size

- ◆ Best approach is to estimate effect size or precision desired and calculate required sample size
- ◆ Practical issues can limit available sample; can start with sample size and calculate what effect size/level of precision is adequately powered
- ◆ Even if power less than desired, knowing this will improve interpretation of any negative (no difference) findings



Calculating power/sample size

Resources

- ◆ Purchased software
 - (e.g.) nQuery, PASS, Sample Power
- ◆ Free internet software (e.g.) G-Power
<http://www.psych.uni-duesseldorf.de/aap/projects/gpower/>
- ◆ Applets, published tables, specialized web sites
 - Various: <http://www.stat.uiowa.edu/~rlenth/Power/>
 - ROC:
<http://department.obg.cuhk.edu.hk/index.asp?scr=1024>
- ◆ **Ask for help from the Research Program**



What about sample size for study that is ‘just descriptive’?

- ◆ If objective is describing an event or process and its outcomes rather than testing an hypothesis – speak of precision rather than power
- ◆ Estimating means – confidence interval
- ◆ Estimating proportions – charts available



Interpreting the data:

- ◆ Describe the findings
- ◆ Were they statistically significant? Were they clinically significant?
 - Statistical significance is only about probability and generalizing from sample to population; it does not speak to importance to care
- ◆ How do the findings relate back to hypotheses, to findings in other studies outlined in background?
- ◆ What have we learned?



Summary: A Well Thought Out Research Process

- Clearly defined study objectives using and extending prior research findings
- A clearly defined target population and representative sample of sufficient size to yield good statistical power
- An appropriate research mode and design



Summary: A Well Thought Out Research Process (cont'd)

- Operationally defined measures that can be proven reliable and are as free from barriers to validity as possible
- Null and alternative hypotheses stated; alpha set
- Appropriate statistical tests selected
- Findings properly interpreted and generalized



Coming Attractions – next month. . .

Choosing the
appropriate statistics

Join us for 3rd Annual Research Day Symposium, November 9th

Monday, November 9, 2009
Heublein Hall in the Education
& Resource Center (ERC)
CEUs/CMEs available



Hartford Hospital Research Program
2009 Research Symposium



To Register: call Health Referral Service (545-1888)
or visit: www.hartfordhospital.org/researchsymposium



Featured Speaker on Bioinformatics
Also-5 Hartford Hospital Researchers

CMEs/CEUs available w registration

Research Program Information

All day (7:00 – 2:15) - \$25 including
breakfast and lunch

OR, don't have all day??

Just stop by for 1 or more speakers –
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Questions??