

An Overview of Clinical Trials, Early Phase trials, Statistical Methods and Safety Issues

Weng Kee WONG, PhD

Dept. of Biostatistics Fielding School of Public Health,
University of California at Los Angeles

August 3, 2016



The China Heart Congress, Beijing, PRC

- 1 Overview of Designs in Health Care Studies
- 2 Safety Issues in Clinical Trials
- 3 Some Statistical Methods for Detecting Safety Issues
- 4 Summary and References

1 Overview of Designs in Health Care Studies

1.1 Common Studies in the Health Sciences

1 Overview of Designs in Health Care Studies

1.1 Common Studies in the Health Sciences

- Cross-sectional Study

1 Overview of Designs in Health Care Studies

1.1 Common Studies in the Health Sciences

- Cross-sectional Study
- Cohort or Prospective Study

1 Overview of Designs in Health Care Studies

1.1 Common Studies in the Health Sciences

- Cross-sectional Study
- Cohort or Prospective Study
- Case Control Study or Retrospective Study

1 Overview of Designs in Health Care Studies

1.1 Common Studies in the Health Sciences

- Cross-sectional Study
- Cohort or Prospective Study
- Case Control Study or Retrospective Study
- Randomized Clinical Trials (RCTs)

1 Overview of Designs in Health Care Studies

1.1 Common Studies in the Health Sciences

- Cross-sectional Study
- Cohort or Prospective Study
- Case Control Study or Retrospective Study
- Randomized Clinical Trials (RCTs)
- Clustered Randomized Trials (CRTs)

1 Overview of Designs in Health Care Studies

1.1 Common Studies in the Health Sciences

- Cross-sectional Study
- Cohort or Prospective Study
- Case Control Study or Retrospective Study
- Randomized Clinical Trials (RCTs)
- Clustered Randomized Trials (CRTs)
- Cross-Over Designs

1 Overview of Designs in Health Care Studies

1.1 Common Studies in the Health Sciences

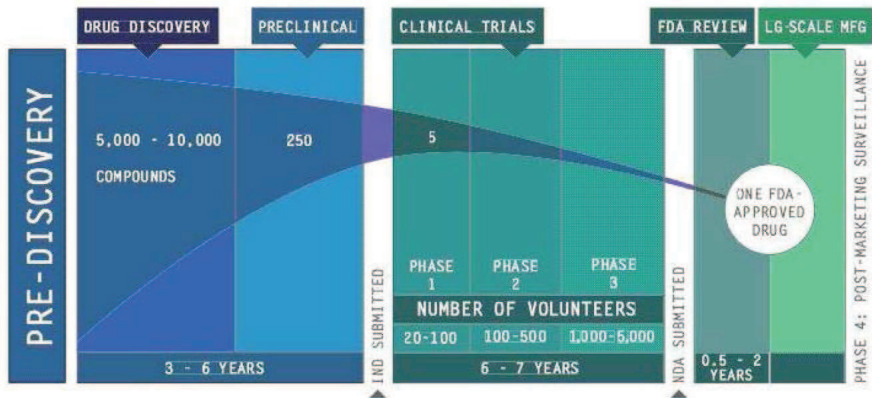
- Cross-sectional Study
- Cohort or Prospective Study
- Case Control Study or Retrospective Study
- Randomized Clinical Trials (RCTs)
- Clustered Randomized Trials (CRTs)
- Cross-Over Designs
- Sequential or Adaptive Designs

1 Overview of Designs in Health Care Studies

1.1 Common Studies in the Health Sciences

- Cross-sectional Study
- Cohort or Prospective Study
- Case Control Study or Retrospective Study
- Randomized Clinical Trials (RCTs)
- Clustered Randomized Trials (CRTs)
- Cross-Over Designs
- Sequential or Adaptive Designs
- Bayesian Designs

1.2 The Drug Discovery Cycle



McDOUGALL SCIENTIFIC
INSIGHTS YOU CAN TRUST

1.3 Staggering Cost of Developing Drugs (Herper, Forbes, 2012)

Research Spending Per New Drug

Company	Ticker	Number of drugs approved	R&D Spending Per Drug (\$Mil)	Total R&D Spending 1997-2011 (\$Mil)
AstraZeneca <small>AZN -0.84%</small>	AZN	5	11,790.93	58,955
GlaxoSmithKline <small>GSK -0.50%</small>	GSK	10	8,170.81	81,708
Sanofi <small>SNY +%</small>	SNY	8	7,909.26	63,274
Roche Holding AG <small>RHHBY +%</small>	RHHBY	11	7,803.77	85,841
Pfizer <small>PFE +0.14%</small> Inc.	PFE	14	7,727.03	108,178
Johnson & Johnson	JNJ	15	5,885.65	88,285
Eli Lilly & Co.	LLY	11	4,577.04	50,347

1.4 Clinical Trials

- A clinical trial is a research study to answer specific questions about a new medical treatment (medicine/drug, medical device, new therapies, vaccines), or new ways of using known treatments. Clinical trials are used to determine whether such new treatments are both safe and effective or non-inferior.
- Carefully conducted clinical trials are the fastest and safest way to find treatments that work in people. A clinical trial is one of the final stages of a long and careful research process. Studies are done with patients to find out whether promising approaches to disease prevention, diagnosis, and treatment are safe and effective.
- Historical details and information on clinical trials are available at many websites, commercial or otherwise, see for example, <http://www.availclinical.com/clinical-study/clinical-trials-history/>

1.5 Randomized Controlled Clinical Trials (RCT)

Need for a RCT

¹Foulds,GA (1958). Clinical research in psychiatry. J. Ment. Sci., 104, 259-265.

²Grace,ND et al. (1966). The present status of portal hypertension in cirrhosis.Gastroenterology, 50, 684-691.

1.5 Randomized Controlled Clinical Trials (RCT)

Need for a RCT

- Past experiences showed uncontrolled studies are much more likely to lead to enthusiastic recommendation of the treatment as compared with properly controlled trials

¹Foulds,GA (1958). Clinical research in psychiatry. J. Ment. Sci., 104, 259-265.

²Grace,ND et al. (1966). The present status of portal hypertension in cirrhosis.Gastroenterology, 50, 684-691.

1.5 Randomized Controlled Clinical Trials (RCT)

Need for a RCT

- Past experiences showed uncontrolled studies are much more likely to lead to enthusiastic recommendation of the treatment as compared with properly controlled trials
- Foulds¹ (1958) reviewed 52 published trials in psychiatry - 85% reported therapeutic success among the uncontrolled versus (25%) among controlled trials

¹Foulds,GA (1958). Clinical research in psychiatry. J. Ment. Sci., 104, 259-265.

²Grace,ND et al. (1966). The present status of portal hypertension in cirrhosis.Gastroenterology, 50, 684-691.

1.5 Randomized Controlled Clinical Trials (RCT)

Need for a RCT

- Past experiences showed uncontrolled studies are much more likely to lead to enthusiastic recommendation of the treatment as compared with properly controlled trials
- Foulds¹ (1958) reviewed 52 published trials in psychiatry - 85% reported therapeutic success among the uncontrolled versus (25%) among controlled trials
- Grace² (1996) reviewed 53 studies of portacaval shunt operation for portal hypertension; 75% of the 32 uncontrolled trials were strongly positive; 0% of the 6 well-controlled trials reported strongly positive results - 3 moderately positive

¹Foulds,GA (1958). Clinical research in psychiatry. J. Ment. Sci., 104, 259-265.

²Grace,ND et al. (1966). The present status of portal hypertension in cirrhosis.Gastroenterology, 50, 684-691.

1.6 Ethical Norms for a Clinical Trial

1.6 Ethical Norms for a Clinical Trial

- Equipose and availability of a suitable placebo/control

1.6 Ethical Norms for a Clinical Trial

- Equipose and availability of a suitable placebo/control
- The trial is under supervision of a DSMB

1.6 Ethical Norms for a Clinical Trial

- Equipose and availability of a suitable placebo/control
- The trial is under supervision of a DSMB
- Competent investigators

1.6 Ethical Norms for a Clinical Trial

- Equipose and availability of a suitable placebo/control
- The trial is under supervision of a DSMB
- Competent investigators
- Favorable balance of harm and benefit: societal good and welfare of patient/physician's obligation to patient

1.6 Ethical Norms for a Clinical Trial

- Equipose and availability of a suitable placebo/control
- The trial is under supervision of a DSMB
- Competent investigators
- Favorable balance of harm and benefit: societal good and welfare of patient/physician's obligation to patient
- Informed consent

1.6 Ethical Norms for a Clinical Trial

- Equipose and availability of a suitable placebo/control
- The trial is under supervision of a DSMB
- Competent investigators
- Favorable balance of harm and benefit: societal good and welfare of patient/physician's obligation to patient
- Informed consent
- Equitable selection of subjects, i.e. random assignment

1.6 Ethical Norms for a Clinical Trial

- Equipose and availability of a suitable placebo/control
- The trial is under supervision of a DSMB
- Competent investigators
- Favorable balance of harm and benefit: societal good and welfare of patient/physician's obligation to patient
- Informed consent
- Equitable selection of subjects, i.e. random assignment
- Compensation for research related injury

1.6 Ethical Norms for a Clinical Trial

- Equipose and availability of a suitable placebo/control
- The trial is under supervision of a DSMB
- Competent investigators
- Favorable balance of harm and benefit: societal good and welfare of patient/physician's obligation to patient
- Informed consent
- Equitable selection of subjects, i.e. random assignment
- Compensation for research related injury
- Respect for persons - individuals should be treated as autonomous

1.6 Ethical Norms for a Clinical Trial

- Equipose and availability of a suitable placebo/control
- The trial is under supervision of a DSMB
- Competent investigators
- Favorable balance of harm and benefit: societal good and welfare of patient/physician's obligation to patient
- Informed consent
- Equitable selection of subjects, i.e. random assignment
- Compensation for research related injury
- Respect for persons - individuals should be treated as autonomous

1.7 Some Difficulties in Running a Clinical Trial

Biases are unwanted systematic effects introduced in the trial beyond treatment effects. Examples of such issues in a RCT include

1.7 Some Difficulties in Running a Clinical Trial

Biases are unwanted systematic effects introduced in the trial beyond treatment effects. Examples of such issues in a RCT include

- selection bias

1.7 Some Difficulties in Running a Clinical Trial

Biases are unwanted systematic effects introduced in the trial beyond treatment effects. Examples of such issues in a RCT include

- selection bias
- allocation bias

1.7 Some Difficulties in Running a Clinical Trial

Biases are unwanted systematic effects introduced in the trial beyond treatment effects. Examples of such issues in a RCT include

- selection bias
- allocation bias
- assessment bias

1.7 Some Difficulties in Running a Clinical Trial

Biases are unwanted systematic effects introduced in the trial beyond treatment effects. Examples of such issues in a RCT include

- selection bias
- allocation bias
- assessment bias
- publication bias

1.7 Some Difficulties in Running a Clinical Trial

Biases are unwanted systematic effects introduced in the trial beyond treatment effects. Examples of such issues in a RCT include

- selection bias
- allocation bias
- assessment bias
- publication bias
- Other issues include compliance, administrative problems

1.7 Some Difficulties in Running a Clinical Trial

Biases are unwanted systematic effects introduced in the trial beyond treatment effects. Examples of such issues in a RCT include

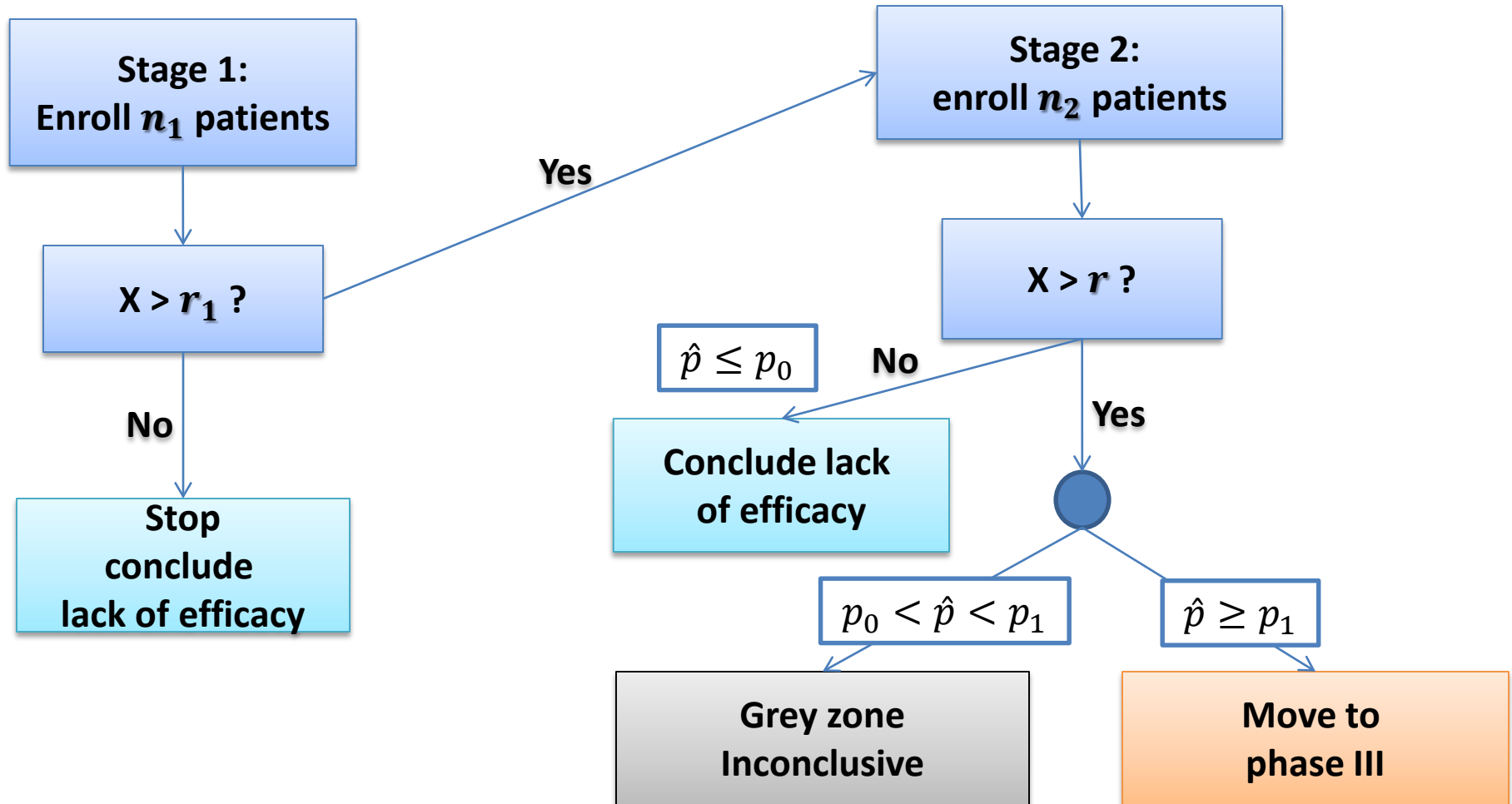
- selection bias
- allocation bias
- assessment bias
- publication bias
- Other issues include compliance, administrative problems
- These are not statistical biases that arise from estimators. For example, if s^2 is the sampling variance estimator, s is biased for estimating the standard deviation σ . However, we still can obtain an unbiased estimator for σ . Missing data is a constant problem.

1.8 Phases of Clinical Trials

- **Phase I Trials:** These first studies in people evaluate how a new drug should be given, how often, and what dose is safe. A phase I trial usually enrolls only a small number of patients, sometimes as few as a dozen.
- **Phase II Trials:** A phase II trial continues to test the safety of the drug, and begins to evaluate how well the new drug works.
- **Phase III Trials:** These studies test a new drug, a new combination of drugs, or a new surgical procedure in comparison to the current standard. Phase III trials often enroll large numbers of subjects and assign them to one of the treatment groups.

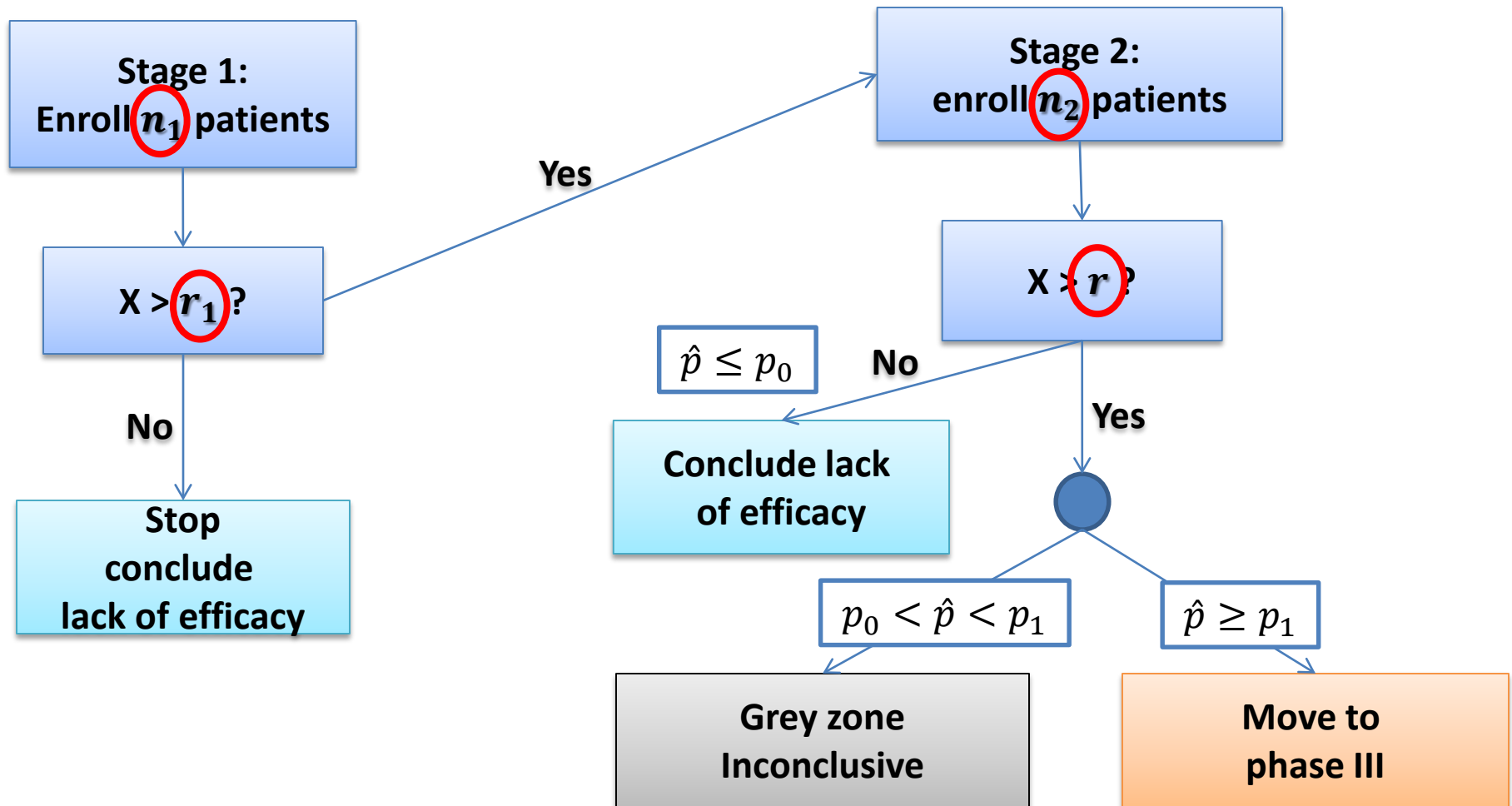
Simon's Two-Stage Designs

- X : the number of responders

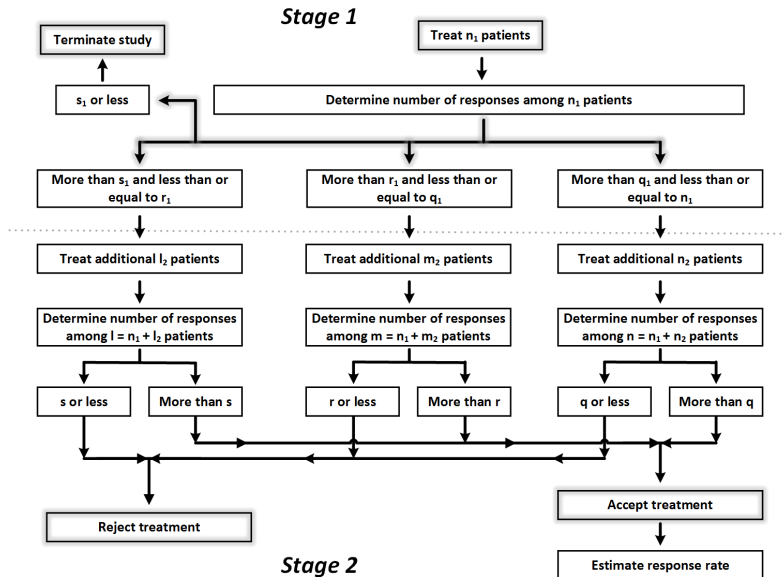


Simon's Two-Stage Designs

- X : the number of responders



1.10 An Extended 2-stage Adaptive Phase II Design (Kim and Wong, 2016)



1.11 Phases of Clinical Trials

Phase IV Trials:

- These trials typically continue to investigate a drug after its initial approval from the regulatory authorities.

1.11 Phases of Clinical Trials

Phase IV Trials:

- These trials typically continue to investigate a drug after its initial approval from the regulatory authorities.
- Focus is on further evaluation of the use for which approval was secured, for comparison to or combination with other established drugs and to generate more data on safety under broader use.

1.11 Phases of Clinical Trials

Phase IV Trials:

- These trials typically continue to investigate a drug after its initial approval from the regulatory authorities.
- Focus is on further evaluation of the use for which approval was secured, for comparison to or combination with other established drugs and to generate more data on safety under broader use.
- Phase IV trials are an important tool to strengthen the understanding of the drug and to give guidance to prescribers and patients on the safe and appropriate use under various clinical conditions.

1.11 Phases of Clinical Trials

Phase IV Trials:

- These trials typically continue to investigate a drug after its initial approval from the regulatory authorities.
- Focus is on further evaluation of the use for which approval was secured, for comparison to or combination with other established drugs and to generate more data on safety under broader use.
- Phase IV trials are an important tool to strengthen the understanding of the drug and to give guidance to prescribers and patients on the safe and appropriate use under various clinical conditions.
- [Metha, et al. \(Circulation, 2016\)](#) discusses choice of design strategies for CV research.

1.12 Useful Sites for Conducting Clinical Trials

- The site <http://www.clinicaltrials.gov> for information provides lots of information on past and ongoing clinical trials conducted worldwide and lots more

1.12 Useful Sites for Conducting Clinical Trials

- The site <http://www.clinicaltrials.gov> for information provides lots of information on past and ongoing clinical trials conducted worldwide and lots more
- The site <http://www.ich.org/> for the International Conference on Harmonization (ICH) provides important guidelines to standardize technical requirements for registering medical products

2 Safety Issues in Clinical Trials

2 Safety Issues in Clinical Trials

- Goal is to show new drugs are not unsafe, for example, they do not produce higher rates of cardiovascular (CV) events

2 Safety Issues in Clinical Trials

- Goal is to show new drugs are not unsafe, for example, they do not produce higher rates of cardiovascular (CV) events
- Detecting safety issues are generally problematic, especially in early phase trials!

2 Safety Issues in Clinical Trials

- Goal is to show new drugs are not unsafe, for example, they do not produce higher rates of cardiovascular (CV) events
- Detecting safety issues are generally problematic, especially in early phase trials!
- [Sullivan and Hamadeh \(Chapter 17 of Jiang and Xia\)](#) provides an overview of safety evaluation and quantitative approaches during preclinical and early phases of drug development.

2.1 Difficulties in Identifying Safety Issues

2.1 Difficulties in Identifying Safety Issues

- Often-rare nature of significant adverse events

2.1 Difficulties in Identifying Safety Issues

- Often-rare nature of significant adverse events
- Prospectively planning a pre-market safety trial is challenging

2.1 Difficulties in Identifying Safety Issues

- Often-rare nature of significant adverse events
- Prospectively planning a pre-market safety trial is challenging
- Power of a study increases with the event rate

2.1 Difficulties in Identifying Safety Issues

- Often-rare nature of significant adverse events
- Prospectively planning a pre-market safety trial is challenging
- Power of a study increases with the event rate
- Decreasing smoking rates, improvements in cholesterol drugs and other coronary drug interventions do not help actualize CV events

2.1 Difficulties in Identifying Safety Issues

- Often-rare nature of significant adverse events
- Prospectively planning a pre-market safety trial is challenging
- Power of a study increases with the event rate
- Decreasing smoking rates, improvements in cholesterol drugs and other coronary drug interventions do not help actualize CV events
- Statistical methods vary with different effectiveness. Sometimes, FDA guidance mandates use of a bounded risk ratio to evaluate CV risk for new antidiabetic drugs.

2.1 Difficulties in Identifying Safety Issues

- Often-rare nature of significant adverse events
- Prospectively planning a pre-market safety trial is challenging
- Power of a study increases with the event rate
- Decreasing smoking rates, improvements in cholesterol drugs and other coronary drug interventions do not help actualize CV events
- Statistical methods vary with different effectiveness. Sometimes, FDA guidance mandates use of a bounded risk ratio to evaluate CV risk for new antidiabetic drugs.
- [Connor \(2015, chapter 7 of Jiang and Xia\)](#) provides an adaptive trial for finding optimal sample size when the true event rate is unknown subject to type 1 error specification in a confirmatory study on CV events.

2.2 Examples of Safety Issues in Cardiovascular-Related Trials

- Increased focus on pre-market confirmations of drug safety

2.2 Examples of Safety Issues in Cardiovascular-Related Trials

- Increased focus on pre-market confirmations of drug safety
- Recent drug withdrawals include Rofecoxib, Valdecoxib, Fen-phen and Tegaserod all for CV safety concerns

2.2 Examples of Safety Issues in Cardiovascular-Related Trials

- Increased focus on pre-market confirmations of drug safety
- Recent drug withdrawals include Rofecoxib, Valdecoxib, Fen-phen and Tegaserod all for CV safety concerns
- Other drugs like Rosiglitazone are prescribed with tighter restrictions after discovering that it produced higher CV risk

2.2 Examples of Safety Issues in Cardiovascular-Related Trials

- Increased focus on pre-market confirmations of drug safety
- Recent drug withdrawals include Rofecoxib, Valdecoxib, Fen-phen and Tegaserod all for CV safety concerns
- Other drugs like Rosiglitazone are prescribed with tighter restrictions after discovering that it produced higher CV risk
- Result in more stringent drug safety requirements on new drugs; eg. new diabetes drug must, in addition to efficacy, demonstrate it is heart safe

3. Statistical Methods for Detecting Safety Issues

- Graphical Tools
- Systematic Reviews and Meta-analysis
- Safety Surveillance and Signal Detection Process
- Bayesian Adaptive Trials for Drug Safety (Chapter 2 of Jiang and Xia - Bayesian Design for Evaluating CV Risk)
- False Discovery Rate for Evaluating Clinical Safety Data (Mehrotra and Heyse, SMMR, 2004)
- Several others as well...

3.1 Graphical Tools (Amit, et al., 2008)

3.1 Graphical Tools (Amit, et al., 2008)

- Traditional methods for evaluation and interpretation of safety data in clinical trials is tabular display of descriptive statistics

3.1 Graphical Tools (Amit, et al., 2008)

- Traditional methods for evaluation and interpretation of safety data in clinical trials is tabular display of descriptive statistics
- Improved graphics can convey multiple information more effectively

3.1 Graphical Tools (Amit, et al., 2008)

- Traditional methods for evaluation and interpretation of safety data in clinical trials is tabular display of descriptive statistics
- Improved graphics can convey multiple information more effectively
- Multi-panel displays and paired dotplots can display risk and relative risk of key safety endpoints in clinical trials, including the QT interval from electrocardiograms.

3.1 Graphical Tools (Amit, et al., 2008)

- Traditional methods for evaluation and interpretation of safety data in clinical trials is tabular display of descriptive statistics
- Improved graphics can convey multiple information more effectively
- Multi-panel displays and paired dotplots can display risk and relative risk of key safety endpoints in clinical trials, including the QT interval from electrocardiograms.
- Next few slides are taken from

<https://www.ctspedia.org/do/view/CTSpedia/StatGraphHome>

Graphics Best Practices

1. **Content** Every graph should stand on its own
2. **Communication** Tailor each graph to its primary communication purpose
3. **Information** Maximize the data-to-ink ratio
4. **Annotation** Provide legible text and information
5. **Axes** Design axes to aid interpretation of a graph
6. **Styles** Make symbols and plot lines distinct and readable
7. **Colors** Make use of color if appropriate for the medium of communication
8. **Techniques** Use established techniques to clarify the message
9. **Types of plots** Use the simplest plot that is appropriate for the information to be displayed

<http://www.ctspedia.org/do/view/CTSpedia/BestPractices>

How to Make Quality Graphs More Quickly?

Use Standard Graphs for Common Safety Questions

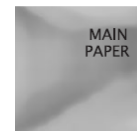
- Two references:

- Graphical approaches to the analysis of safety data from clinical trials (Amit, Heiberger & Lane, 2008)

PHARMACEUTICAL STATISTICS
Pharmaceut. Statist. 2008; 7: 20–35
Published online 26 February 2007 in Wiley InterScience
(www.interscience.wiley.com) DOI: 10.1002/pst.254



Graphical Approaches to the Analysis of Safety Data from Clinical Trials



Ohad Amit¹, Richard M. Heiberger^{2,†} and Peter W. Lane^{3,*†}

¹Oncology Medicine Development Center, GlaxoSmithKline, USA

²Department of Statistics, Temple University, USA

³Research Statistical Unit, GlaxoSmithKline, UK

Patient safety has always been a primary focus in the development of new pharmaceutical products. The predominant method for statistical evaluation and interpretation of safety data collected in a clinical trial is the tabular display of descriptive statistics. There is a great opportunity to enhance evaluation of drug safety through the use of graphical displays, which can convey multiple pieces of information concisely and more effectively than can tables. Graphs can be used in an exploratory

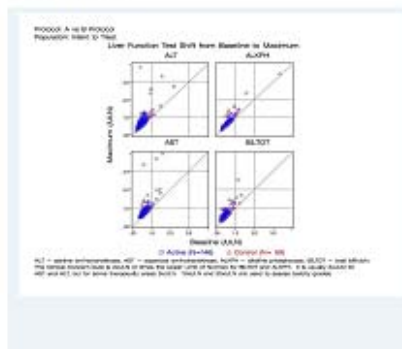
- FDA/Industry/Academia Safety Graphics Working Group
 - Each graph entry in the wiki has a description of use, sample program code & data
 - The wiki is searchable, has a glossary and many other features
 - ctspedia.org/StatGraphHome

Graphs that answer common lab questions

Baseline and Trending over Time

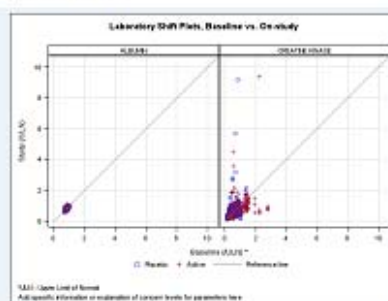
1. What are the changed and percent changes from baseline over time? ie, are abnormal lab values a result of an abnormal baseline or have values changed on study?

Example 1



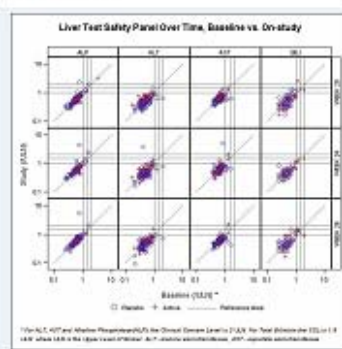
[Click here for Example 1 Data](#)

Example 2



[Click here for Example 2 Data](#)

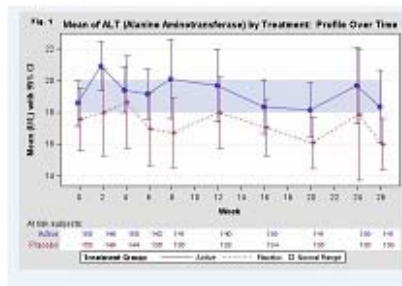
Example 3



[Click here for Example 3 Data](#)

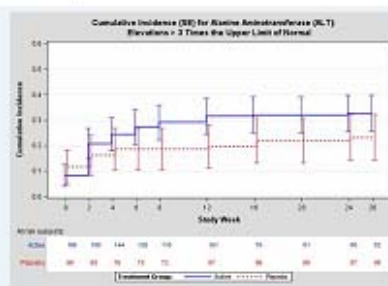
2. Is there a temporal relationship between treatment and lab values?

Example 1



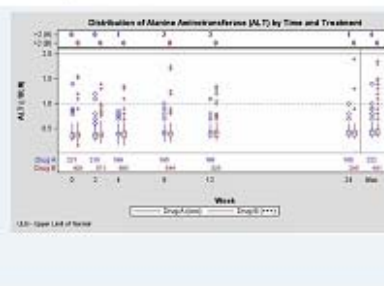
[Click here for Example 1 Data](#)

Example 2



[Click here for Example 2 Data](#)

Example 3



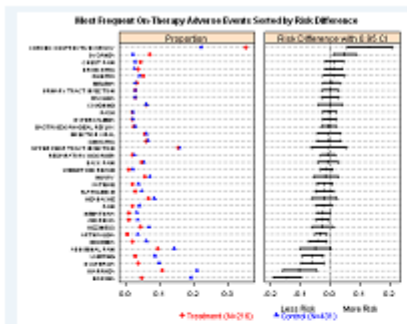
[Click here for Example 3 Data](#)

See more questions and graphs at ctspedia.org/StatGraphHome

Graphs that answer common adverse event questions

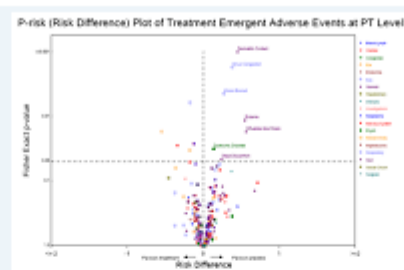
1. Which AEs are elevated in treatment vs. control? Which AE could be a safety signal?

Example 1



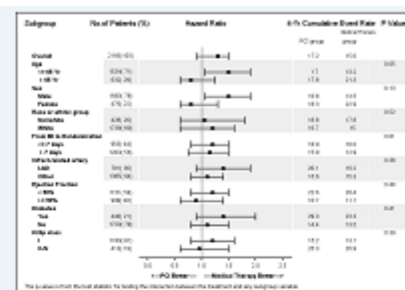
[Click here for Example 1 Data](#)

Example 2



[Click here for Example 2 Data](#)

Example 3

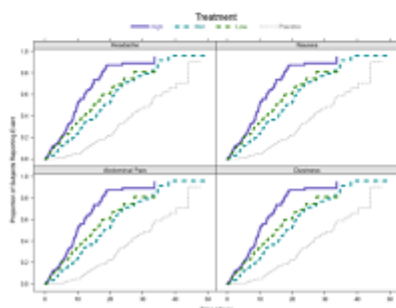


[Click here for Example 3 Data](#)

2. What is the risk trend of an Adverse Event of Special Interest?

3. Is there a difference in the time to the first event across treatment groups?

Example 1



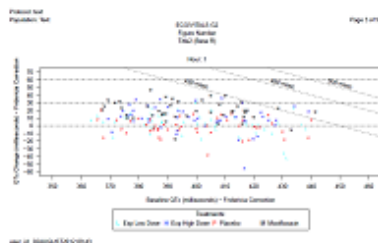
[Click here for Example 1 Data](#)

See more questions and graphs at ctspedia.org/StatGraphHome

Graphs that answer common ECG/Vital Signs questions

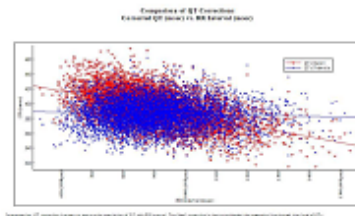
1. What are the longitudinal trends in the data?

2. Are there outlier individuals that have large changes or raw values?



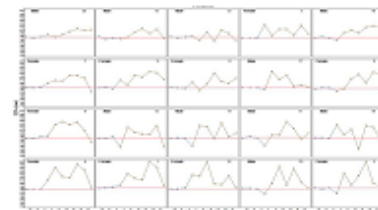
[Click here for more information](#)

3. How do the different QT correction compare w.r.t relationship with RR?



[Click here for more information](#)

4. How do individuals' values track over time?



[Click here for more information](#)

See more questions and graphs
at ctspedia.org/StatGraphHome

3.7 Steps in a Meta-analysis

- Eligibility criteria
- Search Strategy
- Study Selection
- Data Collection and analysis
- Methodological quality of included studies
- All cause and cause-specific mortality
- Risk factors across underlying conditions
- Adverse events

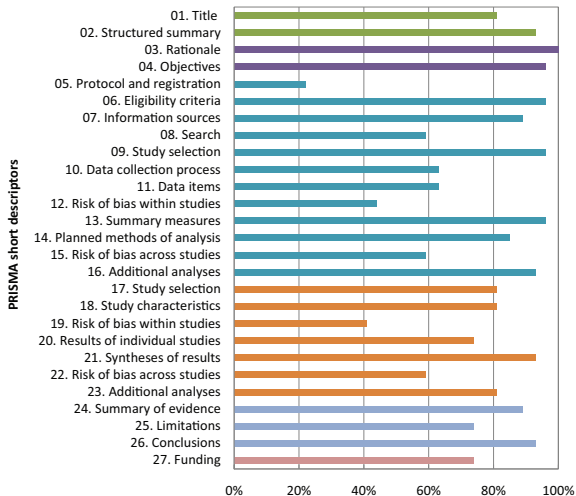
Reference: Mills E. J., et al. (2010). Efficacy and safety of statin treatment for cardiovascular disease: a network meta-analysis of 170255 patients from 76 randomized trials. Q J Med.:An International Journal of Medicine.

3.8 Further guidelines: QUOROM and PRISMA

- Quality of Reporting of Meta-Analyses (QUOROM, 2009)
- Preferred Reporting Items for Systematic Reviews and Meta-Analyses (PRISMA, 2009)
- Both aim to provide a more regulated and systematic framework that requires certain ingredients or details in the report.
- Meta-analysis is commonplace in heart study; one example is Singh, et al. (2011). Risk of serious adverse CV events associated with Varenicline: a systematic review and meta-analysis, CMAJ, 183(12), 1859-1366.

3.9 An Empirical Assessment of Quality of Recent Meta-Analyses Reports from High Impact Journals

Reporting in meta-analyses of drug safety 393



4 Summary and References

4.1 Summary

- There are **Good Clinical Practices** and adherence to these principles, including adequate human subject protection is universally recognized as a critical requirement to the conduct of research involving human subjects.

4 Summary and References

4.1 Summary

- There are **Good Clinical Practices** and adherence to these principles, including adequate human subject protection is universally recognized as a critical requirement to the conduct of research involving human subjects.
- I gave an overview of clinical trials and a quick review on the importance of discovering safety issues.

4 Summary and References

4.1 Summary

- There are **Good Clinical Practices** and adherence to these principles, including adequate human subject protection is universally recognized as a critical requirement to the conduct of research involving human subjects.
- I gave an overview of clinical trials and a quick review on the importance of discovering safety issues.
- Only some statistical methods for detecting safety issues in clinical data are mentioned briefly here; there are more. **Keep diligently alert to new methods for evaluating safety issues.**

4.2 References

- Amit, O., Heiberger, R. M. and Lane, P. W. (2008). Graphical approaches to the analysis of safety data from clinical trials. *Pharmaceutical Statistics*, 7, 20-35.
- Chen, M. et al. (2016). Evaluation of statistical methods for safety signal detection: a simulation study. *Pharmaceutical Statistics*. In press.
- Coloma, et al. (2013). A reference standard for evaluation of methods for drug safety signal detection using electronic healthcare record databases. *Drug Safety*, 36, 13-23.
- Gibbons, R. D. and Amatya, A. K. (2016). *Statistical Methods for Drug Safety*. Chapman and Hall, CRC Press.
- Jiang, Q. and Xia, H. A. (2015). *Quantitative evaluation of safety in drug development: design, analysis and reporting*. Chapman and Hall, CRC Press.
- Li, T., et al. (2011). Network meta-analysis-highly attractive but more methodological research is needed. *BMC Medicine*, 9, 79, 1741.
- Yao, B., et al. (2013). Safety Monitoring in Clinical Trials. *Pharmaceutics*, 5, 94-106.