

# Analysis of Clinical Trials with Multiple Objectives

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# Outline

## **Regulatory guidelines**

FDA and EMA draft guidance documents

## **Multiplicity problems in clinical trials**

Selection of multiple testing methods

Multiplicity problems in adaptive trials

# Regulatory Guidelines

# Regulatory guidelines

## FDA guidance

*Draft guidance on multiplicity issues in clinical trials (2017)*

## EMA guideline

*Draft guideline on multiplicity issues in clinical trials (2017)*

*Revision of *Points to consider on multiplicity issues in clinical trials* (2002)*

# Regulatory guidelines

## FDA guidance

Provides information on **key principles** and **underlying methodology**

## EMA guideline

Focuses on **general principles**

# Overview of the FDA Guidance

# Key topics

## **Type I error rate**

Clear definition of Type I error rate control in confirmatory trials

## **General settings**

Traditional setting (single source of multiplicity) and advanced setting (several sources of multiplicity)

## **Success criteria (win criteria)**

Commonly used success criteria, e.g., at least one objective is met or all objectives are met

# Key topics

## **Analysis of hierarchically ordered endpoints**

Type I error rate control for primary and secondary endpoints (or, more generally, ordered clinical objectives)

## **Commonly used multiple testing procedure**

Comprehensive summary of procedures used in traditional settings and advanced settings (gatekeeping strategies)



# Key topics

## **Analytical approach**

Importance of an analytical approach to deriving valid multiplicity adjustments (simulation-based approaches are not appropriate)

## **Power evaluations**

Simulation-based evaluations to support power and sample size calculations

# Review papers

## Recent review papers and tutorials

Dmitrienko, D'Agostino and Huque. (2013). Key multiplicity issues in clinical drug development.

Dmitrienko and D'Agostino. (2013). Tutorial in Biostatistics: Traditional multiplicity adjustment methods in clinical trials.

Alosh, Bretz and Huque (2014). Advanced multiplicity adjustment methods in clinical trials.

# Response to the FDA Guidance

# Communication channels and forums

## **Statistics in Medicine**

Commentaries on FDA and EMA multiplicity guidelines (to be published in 2017)

## **Journal of Biopharmaceutical Statistics**

Special issue on multiplicity issues in clinical trials (to be published in early 2018)

Contributions from regulatory agencies, industry and academia (US, Europe and Japan)

# Communication channels and forums

## **Biopharmaceutical Section**

Online training program: Key Multiplicity Issues in Clinical Trials

Convenient and inexpensive training options for the Section's members

<http://sprmm.com/asa-biopharmaceutical-section/>

# Selection of Multiple Testing Methods

# Multiple testing methods

## Selection of most appropriate methods

Numerous multiple testing methods have been developed

Need guidelines that facilitate the selection of **most appropriate methods** for a given trial

“Statistical methods and approaches that have been suggested in the literature in recent years now deserve to be digested and placed in the context of how they can be best used in clinical trials” (O’Neill, 2006)

# Case study

## **APEX trial**

Phase III clinical trial for prevention of venous thromboembolism (VTE) (Cohen et al., 2016)

## **Trial design**

Novel treatment (betrixaban) versus control

## **Primary endpoint**

Composite binary endpoint based on deep-vein thrombosis, nonfatal pulmonary embolism or VTE-related death at Day 35



# APEX trial

## Key biomarkers

D-dimer level at baseline

Patient's age

## Three pre-defined patients populations

**Subpopulation 2** (elevated D-dimer)

**Subpopulation 1** (elevated D-dimer or older than 75 years)

**Overall population**

# APEX trial

## Trial results

Treatment effect within the three patients population was evaluated using the **fixed-sequence test**

Treatment effect in Subpopulation 2 **was not significant** and the other two populations could not be tested

## Alternative strategies

How would other multiple testing methods perform in this trial?

# Clinical scenario evaluation

## General framework

Clinical scenario evaluation (CSE) approach was developed in Benda et al. (2010) and other publications

## Motivation

CSE approach encourages clinical trial researchers to employ **systematic and quantitative approaches** to evaluating candidate trial designs and analysis methods to enable better decision making

# Clinical trial optimization

## Clinical scenario evaluation

An important application of the CSE framework is clinical trial optimization

### General theme

Utilize CSE to transition from **traditionally used approaches** to **optimal approaches** to selecting trial designs and analysis strategies

Inform decision making at different stages of a drug development program to **maximize the overall probability of success**

# Clinical trial optimization

## Publications

Review of general approaches to clinical trial optimization (*Clinical Trial Optimization Using R* edited by Dmitrienko and Pulkstenis, 2017)

## Examples

Optimal selection of multiplicity adjustments in Phase III trials, e.g., selection of **most efficient** and **robust** multiple testing procedures, optimal selection of procedure parameters, etc

# Multiplicity Issues in Adaptive Trials

# Adaptive trials with multiple objectives

## Multivariate objectives

Phase III trials with data-driven decision rules (group-sequential and adaptive trials) and several sources of multiplicity (e.g., several dose-control comparisons, several endpoints, etc)

## Regulatory guidelines

*Adaptive design clinical trials for drugs and biologics* (FDA, 2010)

*Reflection paper on methodological issues in confirmatory clinical trials planned with an adaptive design* (EMA, 2007)

# COMPASS trial

## Trial information

Evaluate the efficacy and safety of rivaroxaban alone or in combination with aspirin in patients with stable atherosclerotic vascular disease (Eikelboom et al., 2017)

## Three sources of multiplicity

Two dose-control comparisons

Three decision points

Four endpoints (one primary and three secondary endpoints)



# Adaptive trials with multiple objectives

## Multi-stage design

Split the trial into multiple stages (e.g., before and after an interim analysis)

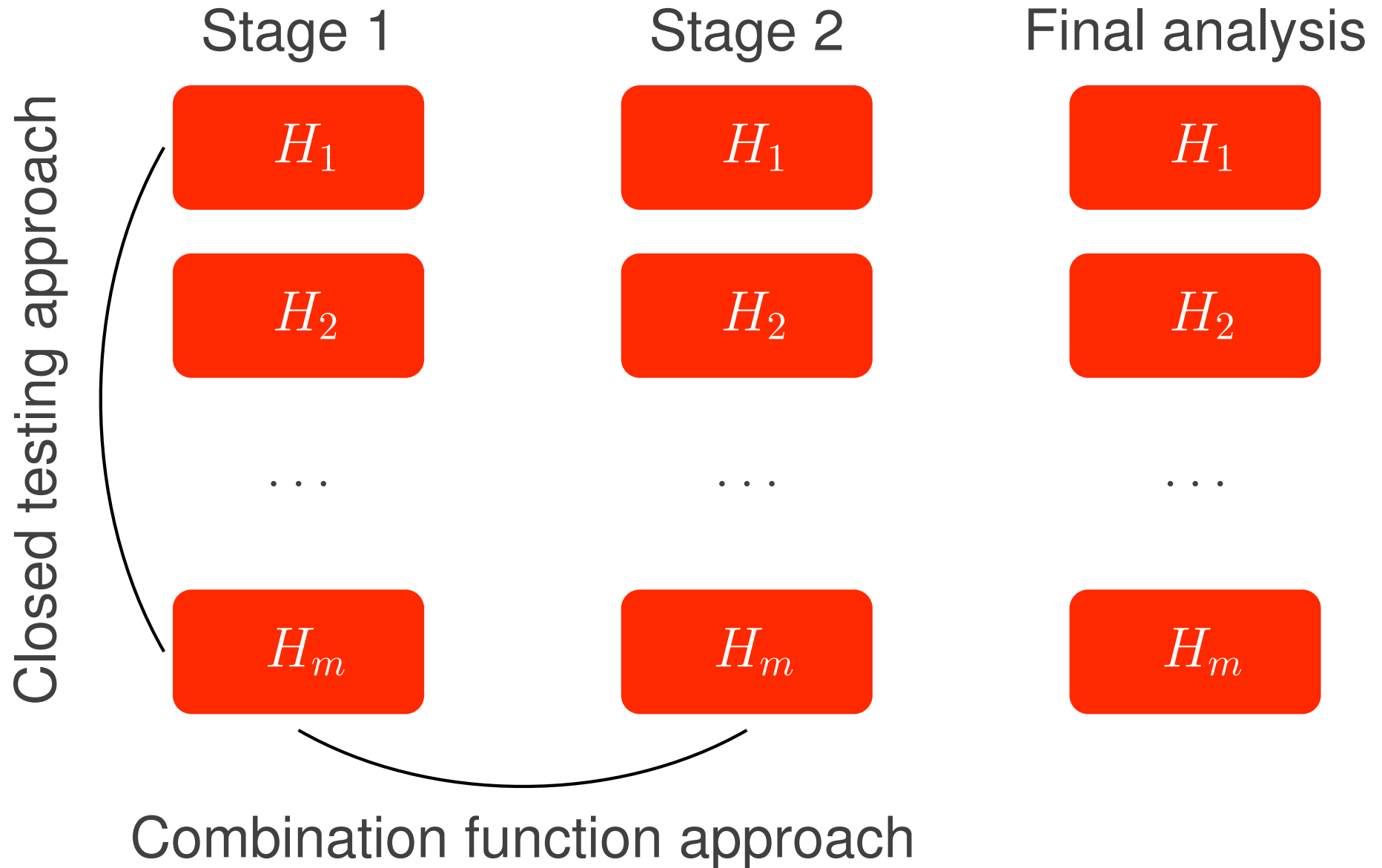
## Closed testing approach

Define a multiple testing procedure **within each stage**

## Combination function approach

Combine multiplicity-adjusted inferences **across the stages**

# Adaptive trials with multiple objectives



# Adaptive trials with multiple objectives

## Flexible decision rules

Lower significance level for the primary endpoint and higher significance levels for the secondary endpoints at early interim looks

## Example

Adjusted significance levels at the first interim analysis

Primary endpoint is tested at **0.0001**

Secondary endpoints are tested at **0.002**

# Adaptive trials with multiple objectives

## Recent publications

Chain procedures/graphical procedures in group-sequential and general adaptive trials (Maurer and Bretz, 2013; Sugitani, Bretz and Maurer, 2016)

More powerful gatekeeping procedures (e.g., Hommel-based gatekeeping procedures) in adaptive trials (Kordzakhia, Dmitrienko and Ishida, 2018)

# Summary

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## **Multiplicity issues in clinical trials**

Multiplicity adjustments are required by regulatory agencies in Phase III trials with multiple objectives

## **FDA and EMA guidelines**

Encourage drug developers to learn more about novel approaches to multiplicity adjustments and to judiciously apply them in confirmatory clinical trials

# References

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