

# Gatekeeping strategies in Phase III clinical trials with multiple endpoints and doses

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on multiplicity issues in clinical trials  
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# Outline

## **Multiple “sources” of multiplicity in clinical trials**

Multiple endpoints and multiple dose-control comparisons

## **Gatekeeping procedures**

Methods for building gatekeeping procedures

Development of gatekeeping procedures

# Multiple “sources” of multiplicity

## Multiple families of null hypotheses

Family 1

Primary hypotheses

Family 2

Secondary hypotheses

Family 3

Tertiary hypotheses

...

Multiplicity problems with a hierarchical structure

# Case study

## Latuda (lurasidone) Phase III program in patients with schizophrenia

### Multiple doses

**Two** or **three** doses versus placebo

### Multiple endpoints

**Primary endpoint:** Positive and Negative Syndrome Scale (PANSS) total score at Week 6

**Secondary endpoints:** Clinical Global Impression-Severity (CGI-S) score at Week 6 and PANSS total score at Day 4

# Case study

## Multiple objectives

Multiple doses: Improve success probability

Multiple endpoints: Strengthen lurasidone product label and create differentiating factors

## Gatekeeping strategy

**Powerful gatekeeping procedures** were developed (Brechenmacher, Xu, Dmitrienko, Tamhane, 2011)

**Importance of gatekeeping procedures** was recognized in clinical publication (Meltzer et al., 2011)

## Other examples

### **Osteoarthritis program**

Two dose-placebo comparisons and three endpoints (WOMAC subscale scores, PGA)

### **Rheumatoid arthritis program**

Two dose-placebo comparisons and four endpoints (DAS-28, ACR-20, HAQ, Sharp score)

# Case study

## Lurasidone Phase III trial

### Multiple doses

**Two doses** versus placebo (Dose L, 40 mg/day;  
Dose H, 120 mg/day)

### Multiple endpoints

**Primary endpoint E1** (PANSS at Week 6)

**Secondary endpoint E2** (CGI-S at Week 6)

# Case study

## Null hypotheses

	Dose L vs P	Dose H vs P
Endpoint E1	$H_1$	$H_2$
Endpoint E2	$H_3$	$H_4$

Overall Type I error rate (**global familywise error rate**) is controlled at two-sided  $\alpha = 0.05$



# Gatekeeping procedures

## Definition

Multiple testing procedures for **multiple families of null hypotheses**

## Type I error rate

Control Type I error rate **over multiple families**

## Power

**Optimal distribution of power** by accounting for hierarchical structure of multiple families, e.g., more power for more important tests

# Gatekeeping procedures

## Main classes of gatekeeping procedures

Basic gatekeeping procedures based on **Bonferroni test** (Bretz et al., 2009; Burman et al., 2009)

Multistage gatekeeping procedures based on **Bonferroni and more powerful tests** (Dmitrienko, Tamhane and Wiens, 2008)

General mixture/gatekeeping procedures based on **Bonferroni and more powerful tests** (Dmitrienko and Tamhane, 2011; Kordzakhia and Dmitrienko, 2012)

# Development of gatekeeping procedures

## Principles

- A. Incorporate all **logical relationships** among null hypotheses
- B. Utilize available **distributional information** (joint distribution of hypothesis test statistics)
- C. Select an **optimal procedure** (based on a relevant criterion under trial-specific assumptions)

# Case study

## Clinical information

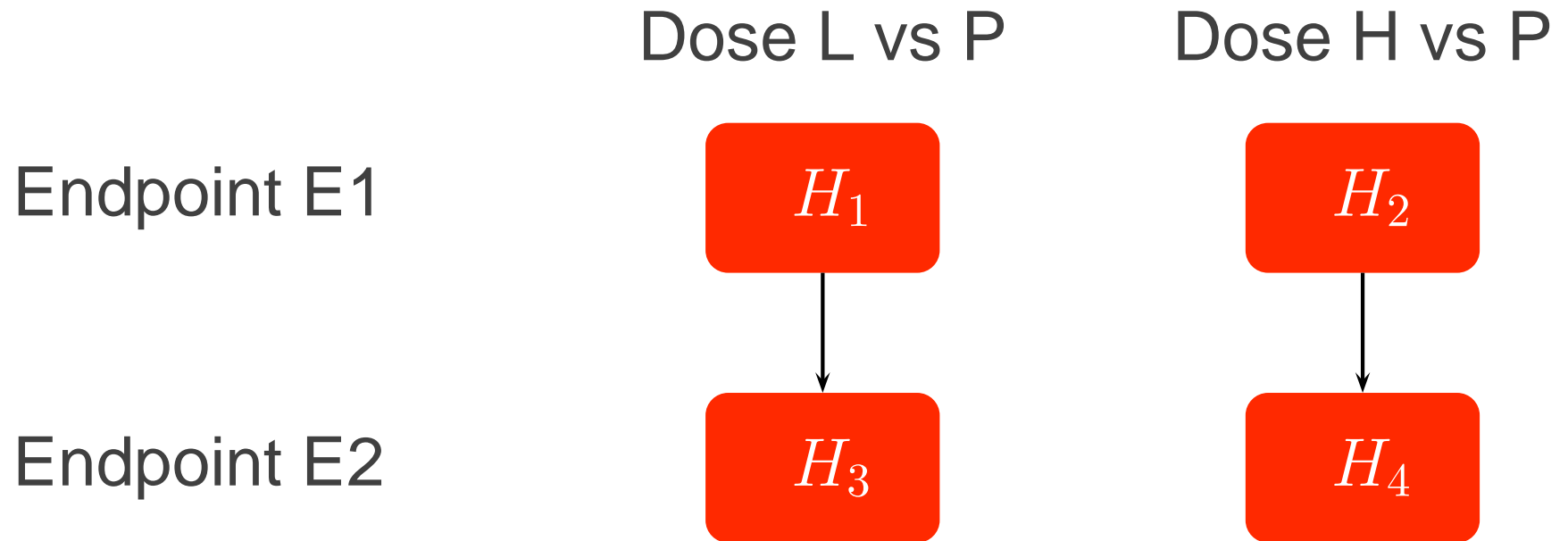
Establish efficacy based **first** on Endpoint E1 and **then** on Endpoint E2

**Sufficient** to establish efficacy for a **single dose** but **highly desirable** to demonstrate efficacy at **both dose levels**

**No evidence** of a positive dose-response relationship

# A: Logical relationships

## Clinical information

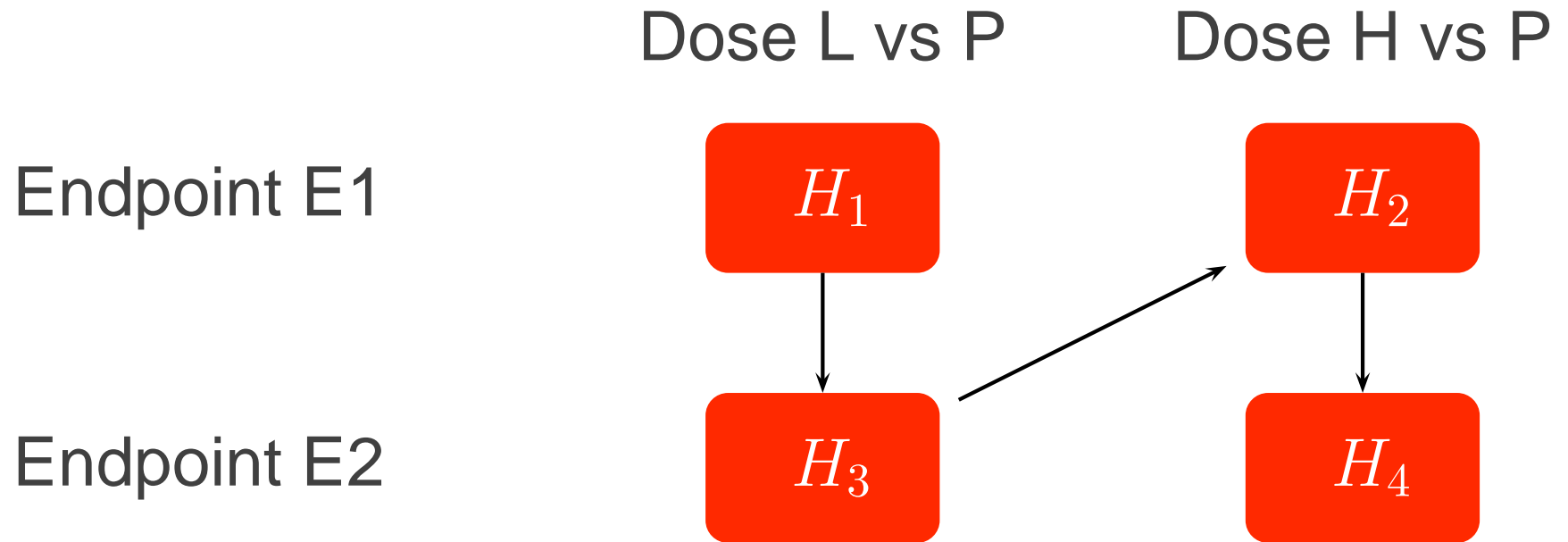


Take clinical information into account:

- $H_3$  depends on  $H_1$
- $H_4$  depends on  $H_2$

# A: Logical relationships

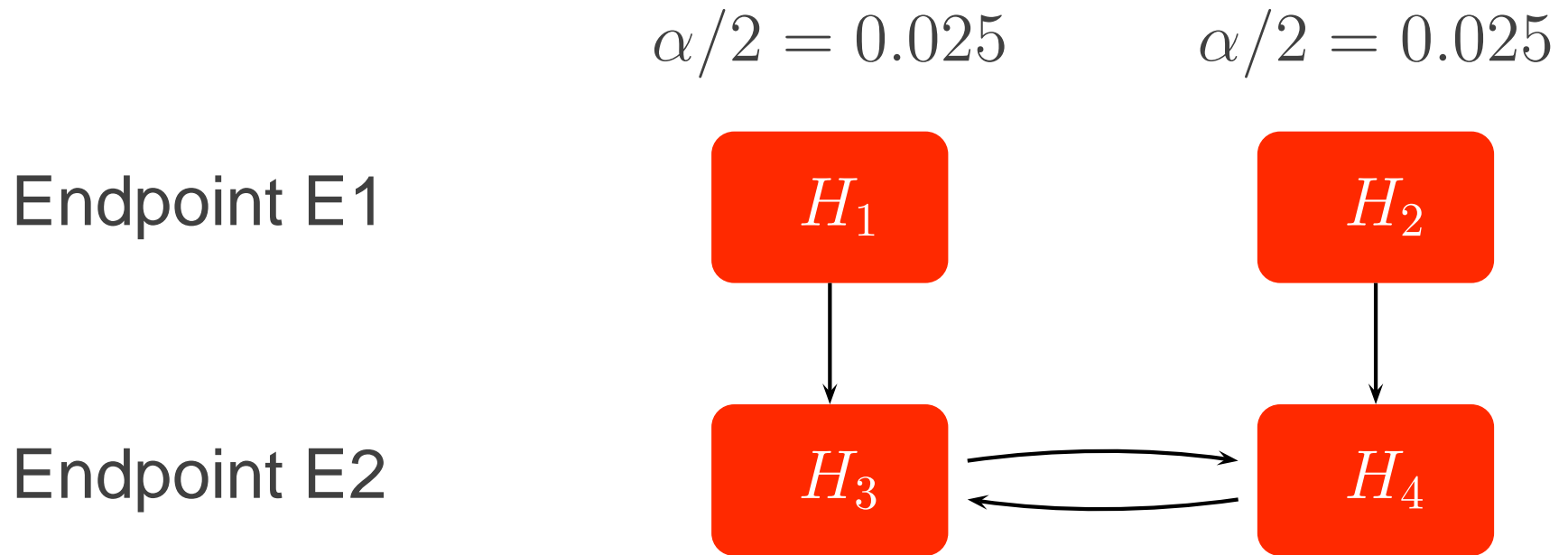
## Serial testing strategy



Inflexible strategy which is **not consistent** with clinical objectives:  $H_2$  and  $H_3$  cannot be tested if  $H_3$  is not rejected (Hung and Wang, 2009)

## B: Distributional information

### Gatekeeping procedure 1

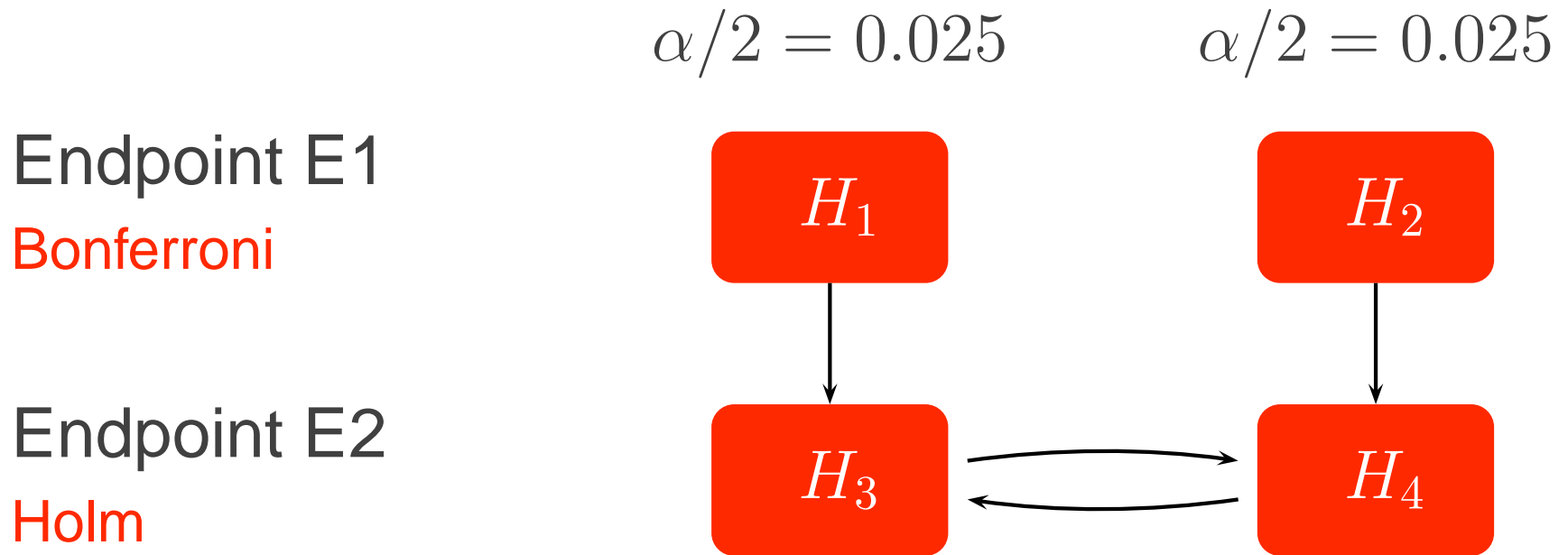


Gatekeeping procedure based on an  $\alpha$ -splitting method:

- $\alpha$  is split between  $H_1$  and  $H_2$
- $\alpha$  can be transferred between  $H_3$  and  $H_4$

## B: Distributional information

### Gatekeeping procedure 1



Bonferroni and Holm tests **do not use** available distributional information (test statistics within Families 1 and 2 are strongly positively correlated)



## B: Distributional information

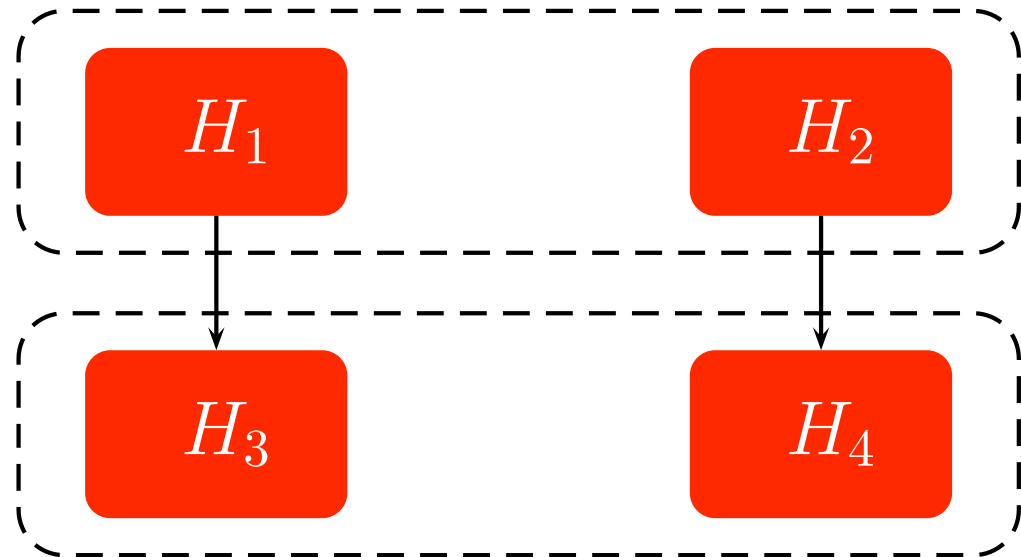
### Gatekeeping procedure 2

Family 1

Powerful test

Family 2

Powerful test



Select tests that **utilize** available distributional information

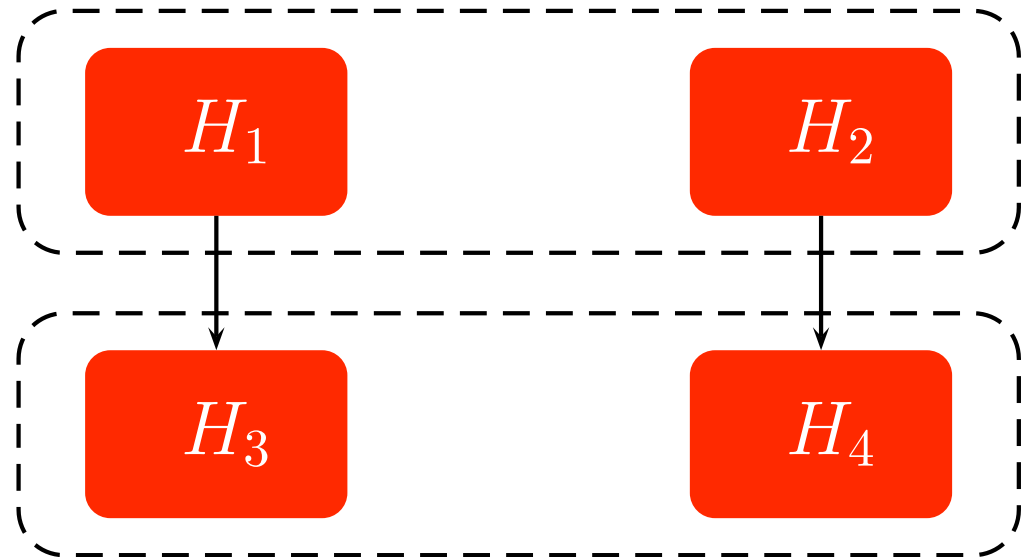
Specify  **$\alpha$  propagation rules**: how much error rate is transferred from Family 1 to Family 2

## B: Distributional information

### Gatekeeping procedure 2

Family 1  
Truncated Hochberg

Family 2  
Regular Hochberg



Mixture-based gatekeeping procedure:

- Truncated Hochberg test in Family 1 to enable flexible  $\alpha$  propagation
- Regular Hochberg test in Family 2

## C: Performance

**Compare operating characteristics of candidate gatekeeping procedures**

### **Gatekeeping procedure 1**

Family 1: Bonferroni test

Family 2: Holm test

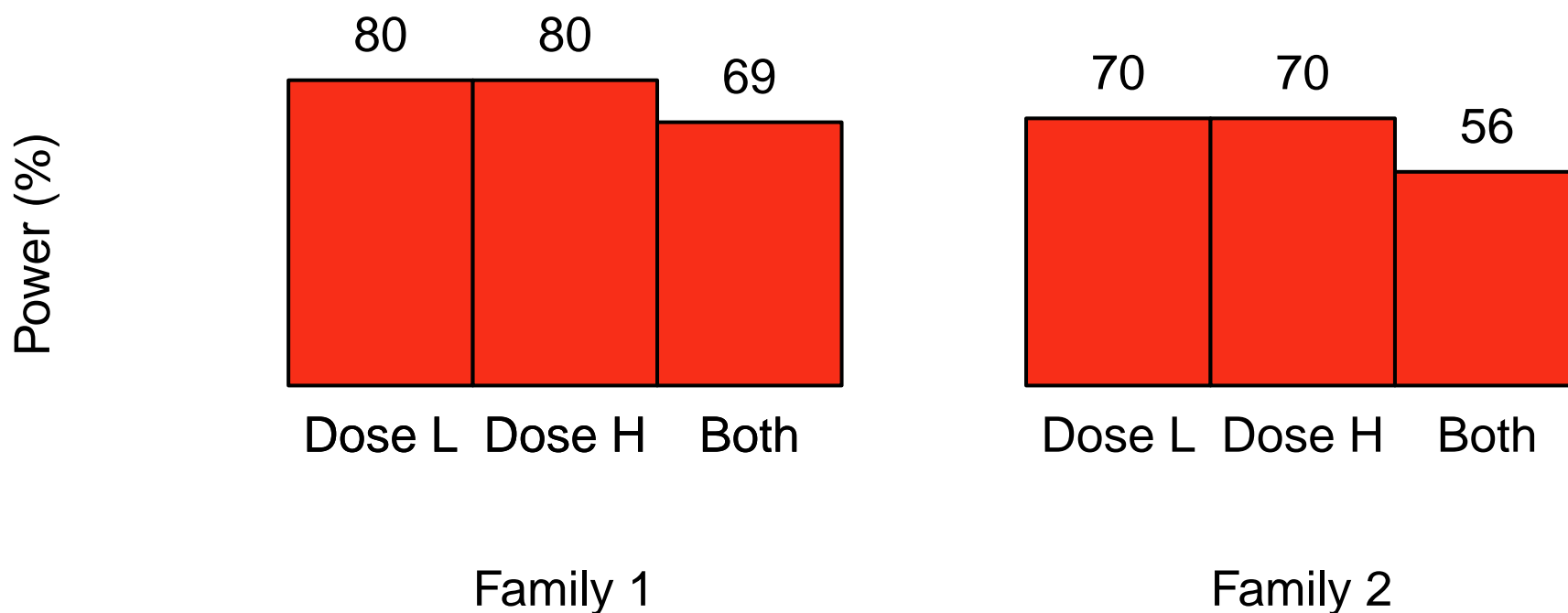
### **Gatekeeping procedure 2**

Family 1: Truncated Hochberg test with truncation parameter of 0.7

Family 2: Hochberg test

# C: Performance

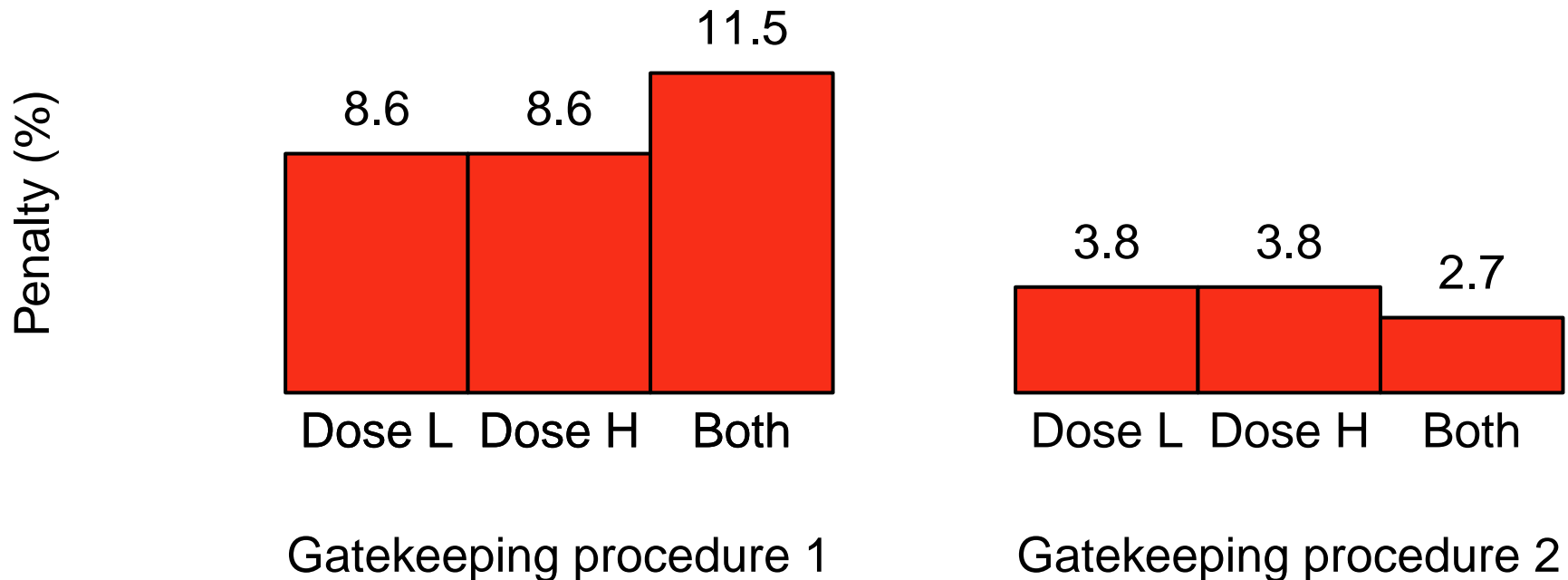
## Assumptions



Dose L: Probability of achieving significant at Dose L  
Dose H: Probability of achieving significant at Dose H  
Both: Probability of achieving significant at both doses

## C: Performance

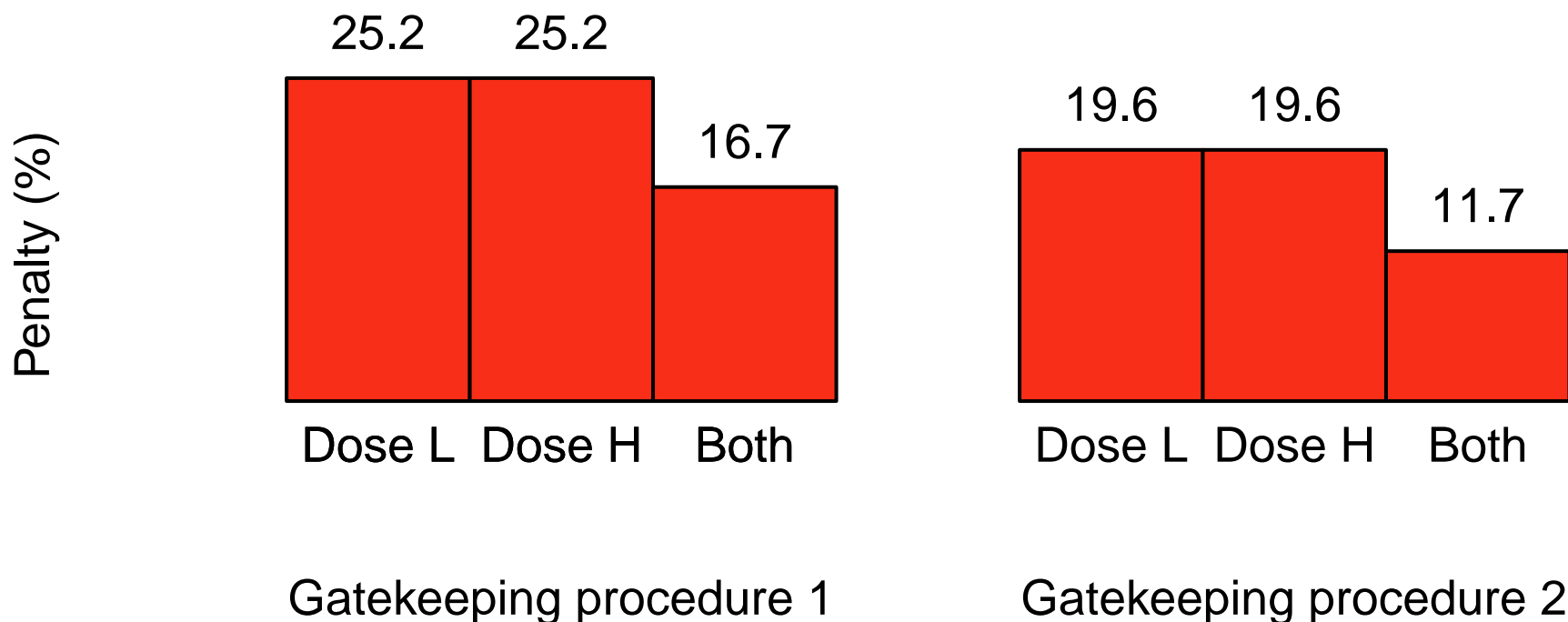
### Multiplicity penalties in Family 1



Multiplicity penalty = Power before multiplicity adjustment – Power after multiplicity adjustment

## C: Performance

### Multiplicity penalties in Family 2



Multiplicity penalty = Power before multiplicity adjustment – Power after multiplicity adjustment

## C: Performance

### General evaluation criteria

Simple disjunctive power (one or more null hypotheses are rejected) or simple conjunctive power (all null hypotheses are rejected)

Subset disjunctive power (one or more null hypotheses are rejected in each family)

Weighted power

See Bretz, Maurer and Hommel (2011), Dmitrienko et al. (2011) for more information

## Case study

### Hochberg-based gatekeeping procedure

Endpoint	Dose	Raw $p$	Adjusted $p$
E1	L	0.001	0.002
	H	0.011	0.022
E2	L	0.006	0.011
	H	0.040	0.040

Both dose-placebo comparisons for Endpoints E1 and E2 are significant at  $\alpha = 0.05$



# Gatekeeping procedures in confirmatory trials

## Type I error rate considerations

Control **global** error rate over multiple families

## Power considerations

Based on **powerful multiple tests**

## Clinical trial applications

Widely used in clinical trials to enrich product labels and provide **important clinical information** to physicians and patients (lurasidone product label)

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