

# Draft ICH Guidance on Estimands and Sensitivity Analyses: **Why** and **What?**

Devan V. Mehrotra

*Merck Research Laboratories*

*Acknowledgement:* ICH E9/R1 Expert Working Group

Conference on Statistical Issues in Clinical Trials

University of Pennsylvania

April 18, 2018

# Background

- ICH = International Council for Harmonization of Technical Requirements for Pharmaceuticals for Human Use
- ICH E9 (Statistical Principles for Clinical Trials; 1995)
  - Articulated foundational principles (randomization, double blind, interim analysis, non-inferiority, etc.)
  - Has served as a bedrock of regulatory guidance on major statistical aspects of confirmatory clinical trials
- 2013-14: regulatory statisticians proposed creation of an expert working group (EWG) to develop an E9 addendum (E9/R1) on **estimands** and **sensitivity analyses**
- Since Nov 2014, EWG (regulatory & industry statisticians) has met every 6 months and conducted monthly telecons

# Background [2]

- 3-4Q 2017: E9/R1 draft was released for public comment across all the ICH regions (some review periods still open)
- The purpose of today's presentation is to address:
  - **Why** was E9/R1 deemed necessary?
  - **What** is in the draft E9/R1?

ICH E9/R1 concept paper ([www.ich.org](http://www.ich.org))

*Perspective*

## Seeking harmony: estimands and sensitivity analyses for confirmatory clinical trials

Devan V Mehrotra<sup>1</sup>, Robert J Hemmings<sup>2</sup>, Estelle Russek-Cohen<sup>3</sup>, on behalf of the ICH E9/R1 Expert Working Group

### CLINICAL TRIALS

*Clinical Trials*  
2016, Vol. 13(4) 456–458  
© The Author(s) 2016  
Reprints and permissions:  
[sagepub.co.uk/journalsPermissions.nav](http://sagepub.co.uk/journalsPermissions.nav)  
DOI: 10.1177/1740774516633115  
[ctj.sagepub.com](http://ctj.sagepub.com)



DEPARTMENT OF HEALTH AND HUMAN SERVICES

Food and Drug Administration  
[Docket No. FDA-2017-D-6113]

E9(R1) Statistical Principles for Clinical Trials: Addendum: Estimands and Sensitivity Analysis in Clinical Trials; International Council for Harmonisation; Draft Guidance for Industry; Availability

AGENCY: Food and Drug Administration, HHS.

ACTION: Notice of availability.

**ICH E9/R1: Why?**

# Motivating Example

- Double-blind, randomized clinical trial, experimental anti-diabetic drug (treatment A) vs. placebo (treatment B)

**Endpoint** = HbA1c change from baseline after 24 weeks

**Objective:** estimate the between-treatment difference in population endpoint means ( $\delta = \mu_A - \mu_B$ ) and test  $H_{null}: \delta = 0$

- **IMPORTANT**
  - Some patients will be unable to continue on assigned treatment due to intolerable side effects and/or experience inefficacy of assigned treatment
  - Either reason may necessitate switching to or adding **rescue medication** to try and lower HbA1c

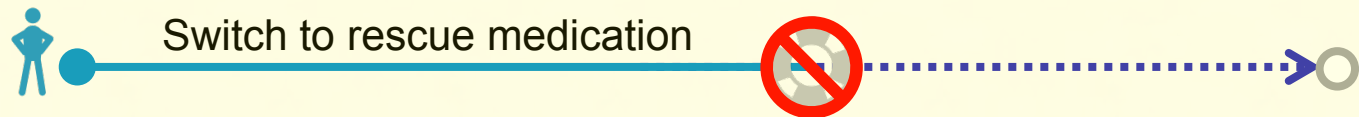
Endpoint/objective: is clinical question of interest clear? **No**

## Motivating Example [2]

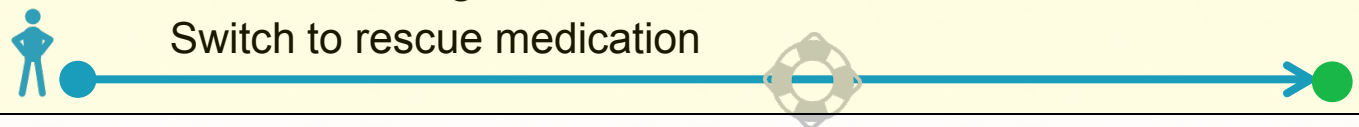
- What is the **treatment effect of interest**?
  - Combined effect of the assigned treatment and (potential) rescue medication?
  - Effect of assigned treatment only, i.e., without adding or switching to **rescue medication** if the assigned treatment has inefficacy or intolerability?
  - Something else?

### *2011 FDA advisory committee for dapagliflozin*

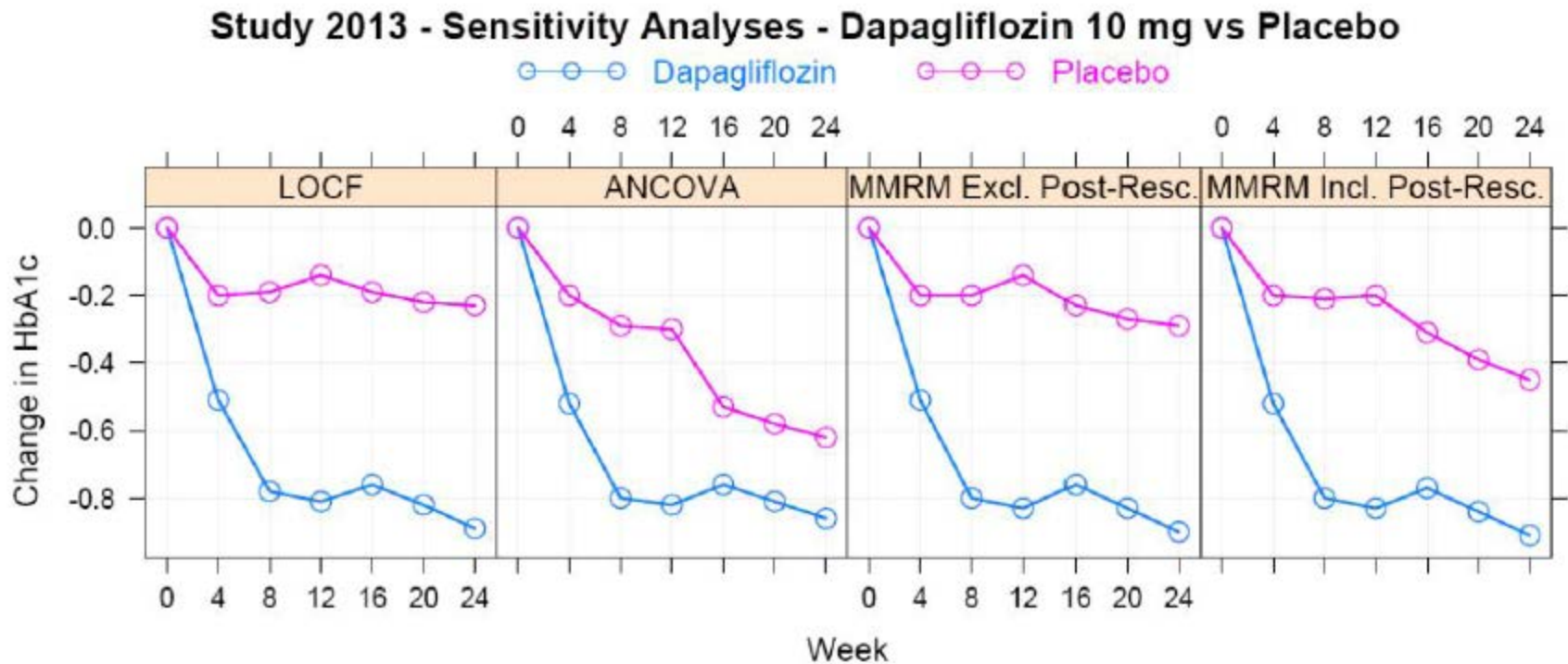
- **Company:** Remove data after initiation of rescue medication



- **FDA:** Include all data regardless of rescue medication



# Motivating Example [3]



- What is the **treatment effect of interest**?
- Is this really a “sensitivity” analysis? **No**

## E9/R1: Why was it deemed necessary?

- **Comments from regulatory statisticians** on several clinical trial protocols & new drug applications (NDAs):
  - Insufficient clarity in objectives and related treatment effect parameters (i.e., estimands) of interest
  - Lack of logical connectivity between trial objectives, design, conduct, analysis and interpretation
  - Misalignment between “missing data” analysis methods and estimands of interest
  - Misunderstanding of the term “sensitivity analysis”

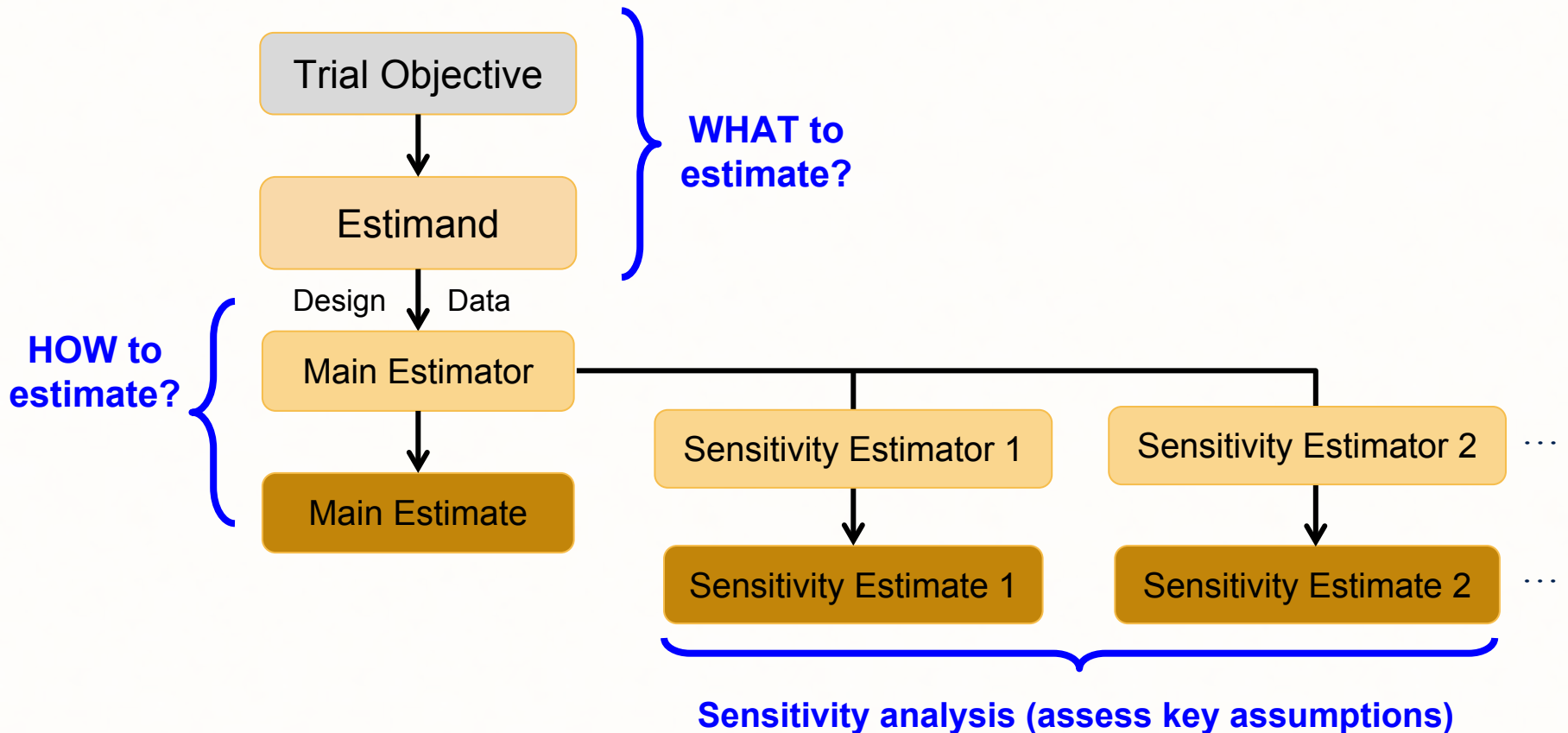
E9/R1 is intended to address these gaps, with a goal of improving clinical trial design/analysis/interpretation, NDA submissions and (ultimately) product labels



**ICH E9/R1: What?**

# A Structured Framework

For a given trial objective: aligning target of estimation, design, method of estimation and sensitivity analysis



# Inputs for Defining an Estimand

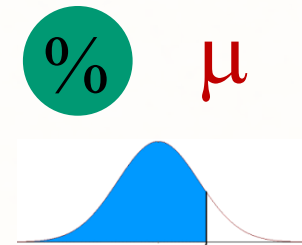
**A**  
Population



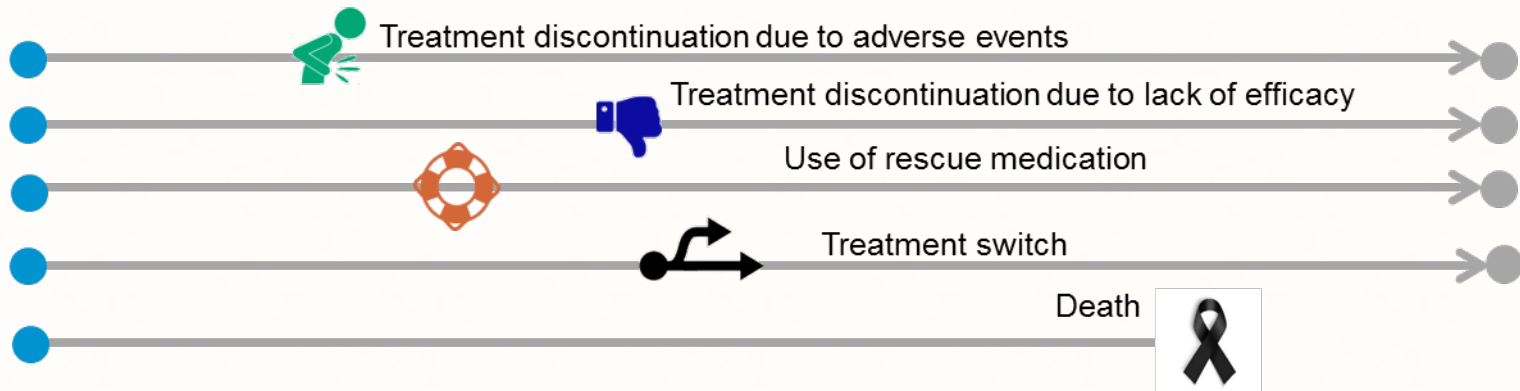
**B**  
Variable (Endpoint)








**D**  
Population-level  
Endpoint Summary



**C**  
Intercurrent Event(s)



# Strategies for Addressing Intercurrent Events in the Scientific Question of Interest

Strategy	<i>Example of Endpoint or Effect of Interest</i>
<b>Treatment Policy</b>	Overall survival regardless of whether or when <b>treatment switching</b> happens 
<b>Composite</b>	Heart attack or <b>treatment discontinuation due to AE</b> 
<b>Hypothetical</b>	Change in HbA1c if <b>rescue medication</b> is not used 
<b>Principal Stratum</b>	Infection severity in subpopulation that will <b>become infected</b> despite preventive treatment 
<b>While on Treatment</b>	QoL under palliative treatment until <b>death</b> in terminal illness 

# Case Study: Diabetes

- Double-blind, randomized clinical trial, drug vs. placebo

**Primary Objective:** assess whether drug is more effective than placebo in lowering HbA1c **without rescue medication** (the latter was allowed, but to address a different objective)

*Construction of Primary Estimand*

**Population:** adults with type II diabetes (per intended label)

**Endpoint:** HbA1c change from baseline at 24 weeks

**Intercurrent event:** treatment effect of interest is based on the endpoint envisioned under **hypothetical** scenario of **no rescue medication** if assigned treatment has inefficacy/intolerability

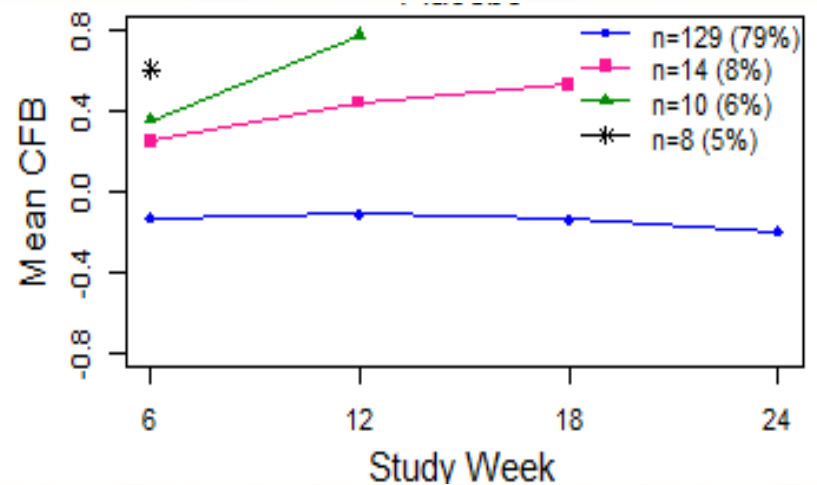
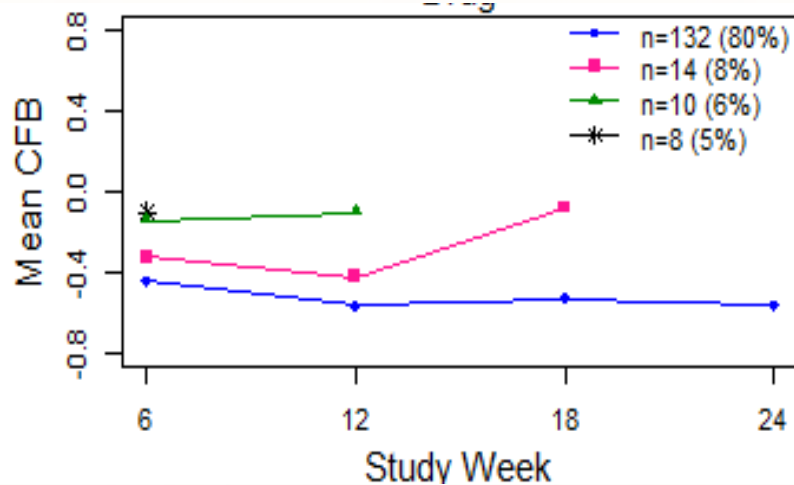
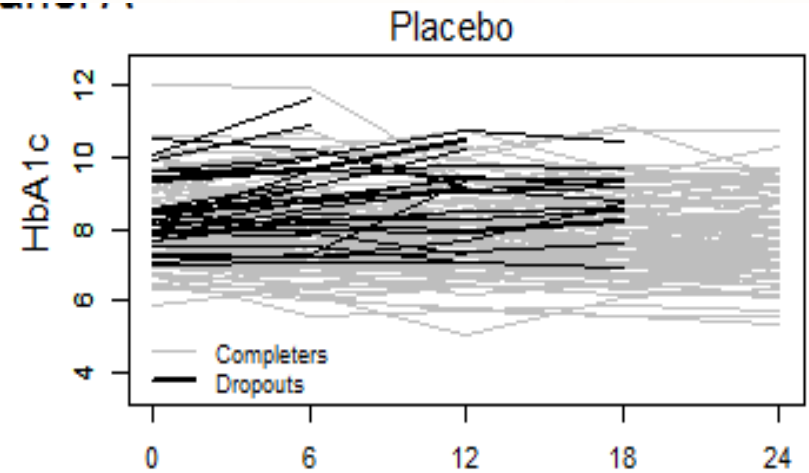
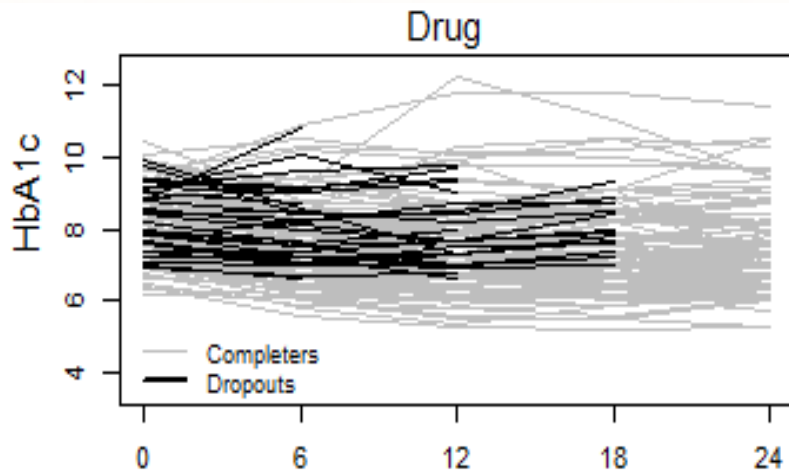


**Population-level summary:** mean of the endpoint

# Case Study [2]

- **Estimand:** between-treatment difference in target population endpoint means for the treatment effect of interest ( $\delta$ )
- **Statistical objectives**
  - Deliver acceptable point estimate and 95% CI for  $\delta$
  - Test  $H_{\text{null}}: \delta=0$  vs.  $H_{\text{alt}}: \delta<0$  (with type 1 error rate  $\leq \alpha$ )
- **Tackling rescue medication in the analysis**
  - Given estimand of interest, HbA1c values after initiation of rescue medication can be discarded, resulting in “missing” endpoint data for such patients (and dropouts)
- **Analysis challenge:** all patients need to be included in the analysis (per the estimand), so how do we tackle the missing endpoint data problem?

# Case Study [3]



% missing endpoint: **20%** (33/165) Drug

**21%** (34/164) Placebo

*1 patient assigned to drug and 2 patients assigned to placebo were dropouts before week 6*

# Case Study [4]

**Important:** **control-based mean imputation** approach below is one of several options that can be considered in the (pre-specified) SAP

- Obs = endpoint observed, miss = endpoint missing
- $\pi_i^{miss}$  = true Pr(endpoint missing under trt  $i$ ) =  $1 - \pi_i^{obs}$

<b>Placebo</b>	<b>Drug</b>
$\mu_P = \pi_P^{obs} \mu_P^{obs} + \pi_P^{miss} \mu_P^{miss}$	$\mu_D = \pi_D^{obs} \mu_D^{obs} + \pi_D^{miss} \mu_D^{miss}$
$\hat{\mu}_P = \hat{\pi}_P^{obs} \hat{\mu}_P^{obs} + \hat{\pi}_P^{miss} \hat{\mu}_P^{miss}$	$\hat{\mu}_D[c] = \hat{\pi}_D^{obs} \hat{\mu}_D^{obs} + \hat{\pi}_D^{miss} (\hat{\mu}_P + c)$

$\hat{\mu}_P^{miss}$  = estimate of  $\mu_P$  assuming missing endpoints are MAR for placebo

Estimand:  $\delta = \mu_D - \mu_P$

Estimation:  $\hat{\delta}[c] = \hat{\mu}_D[c] - \hat{\mu}_P$

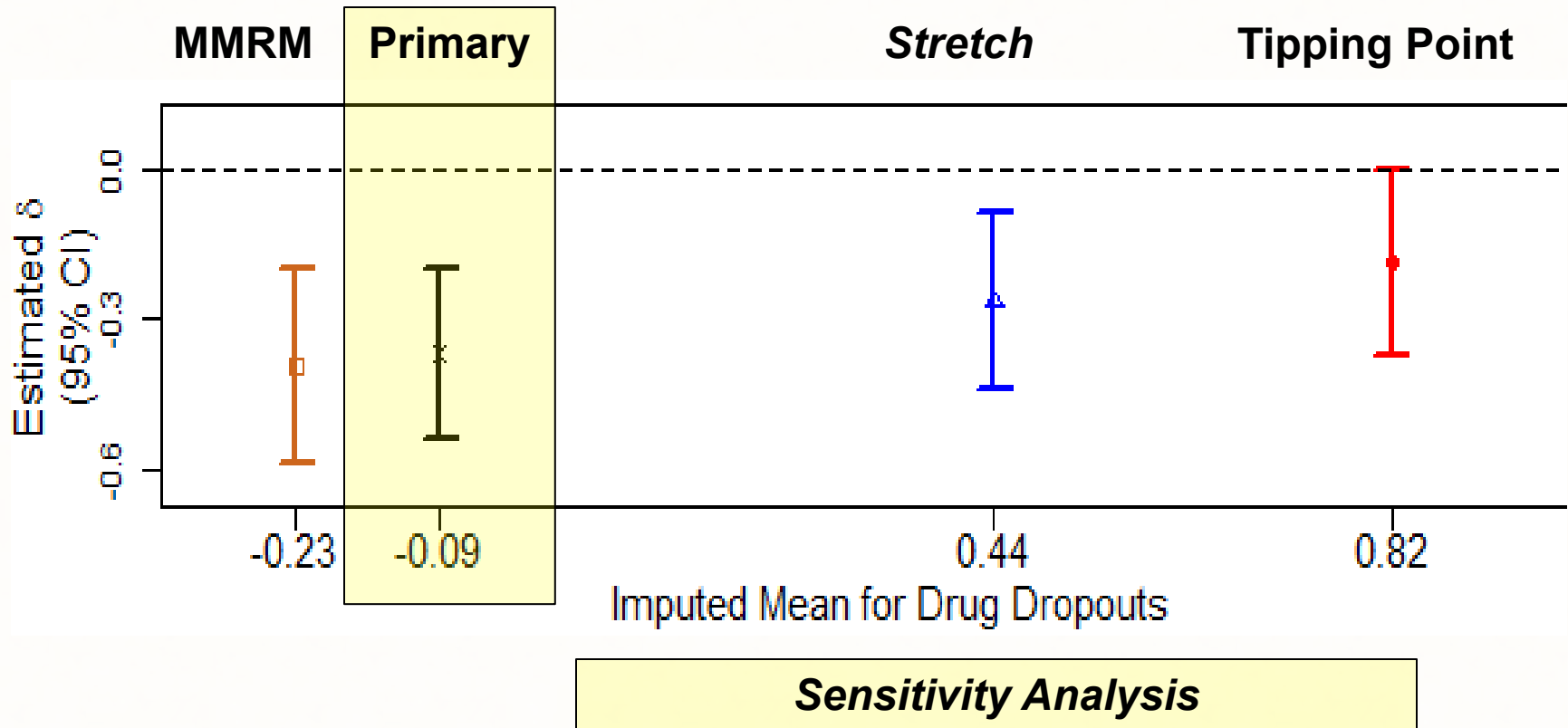
**Primary Analysis:** use  $c = 0$

**Sensitivity Analysis:** increase  $c$  until **Tipping Point**

Details: Mehrotra, Liu, Permutt (2017; Pharm Stat)



# Case Study [5]



- MMRM: mixed model repeated measures assuming MAR dropout for drug and placebo [shown for historical reference only]
- *Stretch*: imputed mean for drug dropouts matches estimated mean for placebo dropouts assuming MAR dropout for placebo
- **Note**: tipping point after *stretch* imputation  $\Rightarrow$  **robust** evidence of trtmt effect

# Wrap Up

- The framework proposed in ICH E9/R1 is expected to:
  - Enable better planning and preparation of application dossiers for new drugs/vaccines/biologics
  - Strengthen understanding of decision-making by regulatory authorities and advisory committees
- The ICH E9/R1 expert working group:
  - Will begin to review/address collated public comments on the E9/R1 draft in June 2018 (Kobe, Japan)
  - Is developing a [training slide deck](#) to augment the E9/R1 text document; will include other case studies

