

Introduction to the Design and Evaluation of Group Sequential Clinical Trials

Session 1 - Scientific Setting

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Clinical Trials

Definition and Motivation
Public Health Objective
Statistical foundations
Trial Monitoring: Motivation
and Implications

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Module 9: Introduction to the Design and Evaluation of Group Sequential Clinical Trials

Session 1: Scientific setting

Session 2: Fixed-sample design

Session 3: Evaluation of group sequential clinical trial designs

Session 4: Bayesian evaluation of group sequential clinical trial designs

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A clinical trial is

- ▶ A planned experiment which involves patients that is designed to elucidate the most appropriate treatment of future patients. (Pocock, 1983)
- ▶ A planned experiment designed to assess the efficacy of a treatment in humans by comparing the outcomes in a group of patients treated with those observed in a comparable group of patients receiving a control treatment, where patients in both groups are enrolled, treated, and followed over the same time period. (Minert, 1986)

Types of questions that can be evaluated in clinical trials

- ▶ Therapeutic intervention studies:
 - ▶ Safety: Is risk of treatment-related toxicities suitably low?
 - ▶ Efficacy: Treatment benefits on disease processes?
 - ▶ Effectiveness: Does the treatment offer benefits when used as part of standard routine practice?
- ▶ Non-therapeutic intervention studies:
 - ▶ Mechanistic studies: Studies of drug mechanism of action.
 - ▶ Behavioral interventions: Examples: Smoking cessation; diabetes prevention.
 - ▶ Prevention studies: Examples: Women's Health Initiative (HRT for prevention of cardiovascular disease); lung cancer screening trial.
 - ▶ Community intervention studies: Interventions on schools to promote healthy lifestyles.
- ▶ Our focus in this course is on medical intervention studies.

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Clinical trials as experiments

- ▶ As scientific experiments clinical trials must:
 - ▶ Answer a scientifically meaningful questions.
 - Must discriminate between viable hypotheses
 - ▶ Provide results that inform (convince) medical practice.
 - Use valid materials and methods
 - Use valid measurement of the experimental outcome
 - Provide a valid quantification of uncertainty in the experiment.

As experiments on humans clinical trials must:

- ▶ Be ethically justifiable for the individuals entering the trial:
 - As much as possible, minimize harm and maximize benefit for individuals in the trial.
 - Avoid giving individual participants harmful treatments.
 - Avoid giving individual participants inferior treatments.
- ▶ Maintain the ethical responsiveness to all likely future recipients of the therapy under evaluation:
 - Identify (and approve) new beneficial therapies.
 - Avoid approving ineffective or harmful treatments.
 - Avoid unnecessary delays in the evaluation process.

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- ▶ Evidence-based medicine requires:
 - ▶ Results in the sample reflect effects in standard practice.
 - Does the trial population reflect the target population?
 - Do diagnostic procedures reflect standard practice?
 - Does ancillary/rescue therapy reflect standard practice?
- ▶ (Reiterating) Our ultimate goal should be to:
 - ▶ Identify (and approve) new beneficial therapies.
 - ▶ Avoid approving ineffective or harmful treatments.

Our objective is to have trials with high positive predictive value

- ▶ Positive predictive value (PPV):
 - ▶ *Diagnostic testing*: prevalence of diseased individuals among those with a positive diagnostic test.
 - ▶ *Clinical trials*: prevalence of truly beneficial therapies among those which are identified by a positive clinical trial.
 - ▶ PPV is calculated using Bayes rule:

$$PPV = \frac{\beta\pi}{\beta\pi + \alpha(1 - \pi)}$$

where :

$$\begin{aligned}\beta &= \textit{sensitivity} \\ 1 - \alpha &= \textit{specificity} \\ \pi &= \textit{prevalence}\end{aligned}$$

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Clinical trials as diagnostic tests

- ▶ The statistical hypothesis test is a diagnostic test for beneficial treatments.
 - ▶ α -level: probability of observing a positive (statistically significant) test in absence of a true treatment effect:
 - ▶ Level of significance is $1 - \text{specificity}$.
 - ▶ Choosing $\alpha = 0.05$ gives 95% specificity.
 - ▶ Statistical power (β): Probability of observing a positive (statistically significant) test when there is a true treatment effect:
 - ▶ Power is sensitivity.
 - ▶ 80% sensitivity is a common (though not ideal) choice.
 - ▶ Prevalence (π_0): the percentage of effective treatments among all tested treatments.
 - ▶ Positive predictive value: probability that a statistically significant trial indicates a truly effective treatment.

$$PPV = \frac{\beta\pi_0}{\beta\pi_0 + \alpha(1 - \pi_0)}$$

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The Public Health Objective: How does the design determine PPV?

PPV is increased through good experimental practice

$$PPV = \frac{\beta\pi_0}{\beta\pi_0 + \alpha(1 - \pi_0)}$$

- * Increase π_0 :
 - Careful planning of preliminary studies
 - Avoid "novel" and "innovative" ideas
 - Careful specification of hypothesis-driven research
- * Increase β :
 - Good practice (no missing data, low variation in outcome assessment, good adherence, etc.)
 - Increase sample size.
- * Reduce α :
 - Pre-specify outcomes
 - Pre-specify all analyses
 - Avoid multiple comparisons
 - Avoid surrogate outcomes.
 - Avoid subgroups

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The Public Health Objective: How does the design determine PPV?

References: PPV as a function of π_0 , α , and β

** *EfficiencyForTargetedTX.pdf* discusses effect of power (sensitivity) and α -level (specificity) on the PPV of phase II/III clinical trials.

Scenario	Number of trials	π_0	Phase II trials		Phase III trials		Pos	Pos	PPV
			α_2	β_2	α_3	β_3			
1	1000	0.10	*	*	0.05	0.975	98	45	0.685
2	12500	0.10	0.05	0.15	0.05	0.800	150	28	0.842
3	11765	0.20	0.05	0.15	0.05	0.800	282	24	0.923
4	13245	0.01	0.05	0.15	0.05	0.800	16	33	0.327
5	9091	0.10	0.05	0.15	0.05	0.975	133	20	0.867
6	15385	0.10	0.05	0.15	0.05	0.500	115	35	0.769
7	6780	0.10	0.20	0.15	0.05	0.800	81	61	0.571
8	6780	0.10	0.20	0.15	0.10	0.800	81	122	0.400

** *Evaluation of Strategies for the Phase II to Phase III Progression in Treatment Discovery:*
(Sanchez, 2014) <http://rctdesign.org/TechReports/SanchezThesis201404.pdf>

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The Public Health Objective

How do clinical trials determine PPV?

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Summary remarks

- ▶ A wide range of situations/therapies are studied in trials.
- ▶ Globally, clinical trials need to assure:
 - ▶ Scientific credibility
 - ▶ Ethical experiments
 - ▶ Efficient experiments:
 - ▶ Minimize time
 - ▶ Minimal number of extra subjects
 - ▶ Minimize cost
 - ▶ A high prevalence of truly beneficial therapies among all therapies used in routine care.

Evidence-based practice

- ▶ As a scientific experiment, the results of a clinical trial are used to rule out (or rule in) hypotheses about treatment effects.
- ▶ The standards for rejecting (or accepting hypotheses) are based on statistical criteria.
- ▶ Clinical trial designs should be evaluated by the potential inference upon trial completion.

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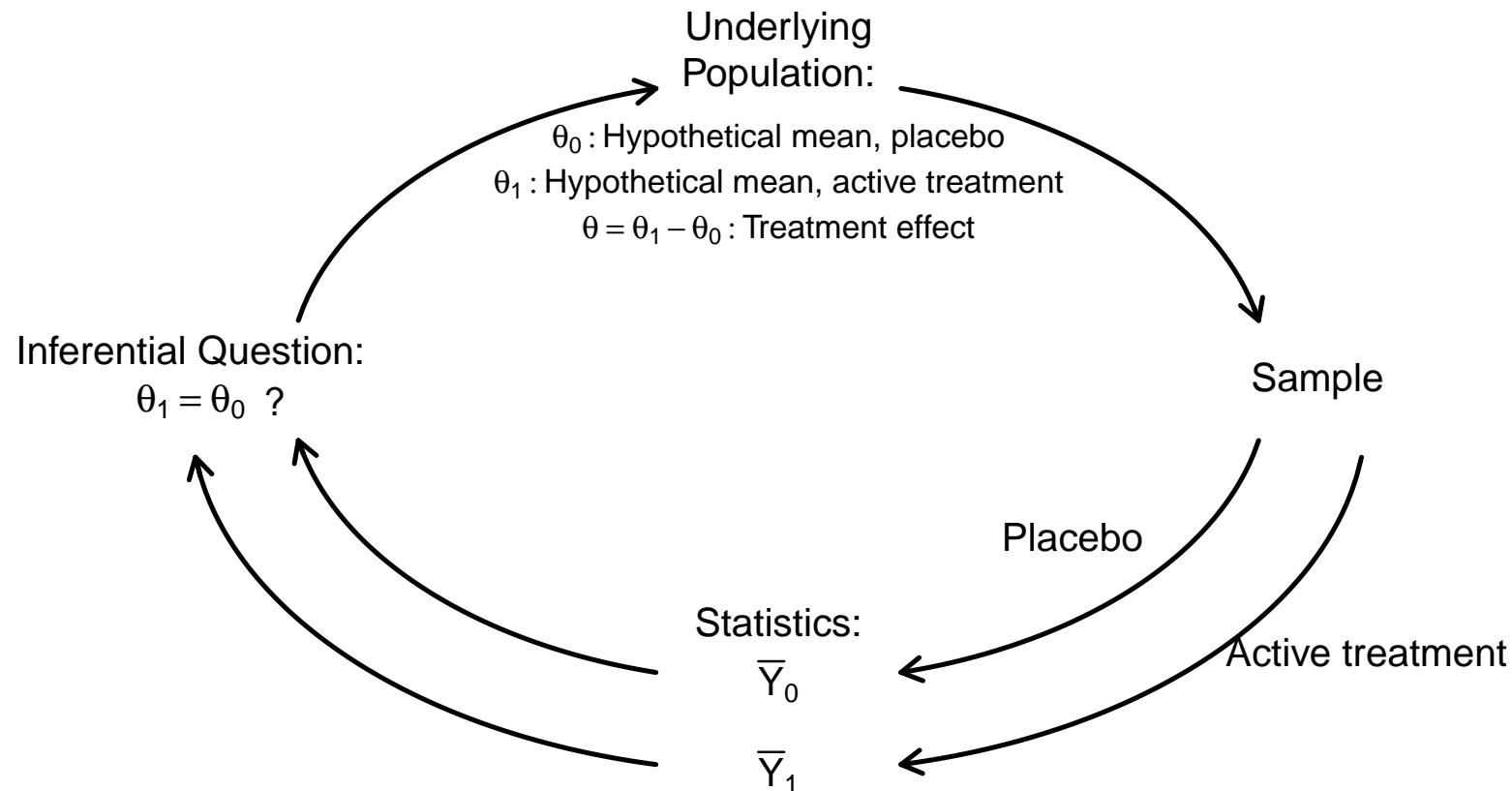
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Recall Empirical Objective:

Use observed trial result ($\hat{\theta}$) to make inference about underlying population θ



Four main inferential elements

1. Point estimate: $\hat{\theta}$ is the “best” estimate of θ .
2. Interval estimate: Values of θ that are consistent with the trial results.
3. Expression of uncertainty (p -value): To what degree is a particular hypothesis (the “null” hypothesis) consistent with the observed trial results?
4. Decision: Based on the above measures, what decision should be reached about the use of a new therapy?

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Why monitor a clinical trial?

- ▶ Monitoring for quality control; for example,
 - ▶ Patient accrual.
 - ▶ Data quality/completeness.
 - ▶ Unanticipated adverse events.
- ▶ Monitoring study endpoint(s); for example,
 - ▶ Treatment benefits.
 - ▶ Toxicity differences.
- ▶ Good quality control should be part of every study to ensure that the study achieves its goals.
- ▶ Monitoring study endpoints is not applicable in every study, and requires special statistical methods to avoid increased statistical errors.

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Reasons to monitor trial endpoints

- ▶ To maintain the validity of the informed consent for:
 - ▶ Subjects currently enrolled in the study.
 - ▶ New subjects entering the study.
- ▶ To ensure the ethics of randomization.
 - ▶ Randomization is only ethical under equipoise.
 - ▶ If there is not equipoise, then the trial should stop.
- ▶ To identify the best treatment as quickly as possible:
 - ▶ For the benefit of all patients (i.e., so that the best treatment becomes standard practice).
 - ▶ For the benefit of study participants (i.e., so that participants are not given inferior therapies for any longer than necessary).

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Monitoring trial endpoints

Monitoring endpoints must be done properly to avoid bias:

- ▶ Data driven analyses cause bias:
 - ▶ Analyzing study results because they look good leads to an overestimate of treatment benefits.
- ▶ Publication/presentation of 'preliminary results' can affect:
 - ▶ Ability to accrue subjects.
 - ▶ Type of subjects that are referred and accrued.
 - ▶ Treatment of patients not in the study.
- ▶ Failure to design for interim analyses can lead to hasty decisions subject to:
 - ▶ Inadequate consideration of trade-offs between competing endpoints (toxicity versus benefit).
 - ▶ External pressures from study investigators or sponsors.
 - ▶ Lack of objectivity by study monitors.

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Monitoring trial endpoints

Thus:

- ▶ Monitoring of study endpoints is often required for ethical reasons.
- ▶ Monitoring of study endpoints must carefully planned as part of study design to:
 - ▶ Avoid bias
 - ▶ Assure careful decisions
 - ▶ Maintain desired statistical properties

How are trials monitored?

- ▶ “Data Safety and Monitoring Boards (DSMB)” are used to avoid biased decisions:
 - ▶ DSMB members are *independent* of the study investigators
 - ▶ The DSMB reviews unblinded data in the midst of a trial to:
 - Assure the trial is safe to continue.
 - Make decisions about early termination based on the statistical monitoring plan (“group-sequential clinical trial design”).
- ▶ DSMB composition:
 - ▶ Subject-matter specialists (2-4)
 - ▶ Biostatistician (1-2).

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Elements of trial monitoring

Trial monitoring plan

Trial monitoring plan is typically pre-specified in 2 documents:

- ▶ DSMB charter:
 - ▶ Defines scope of trial monitoring
 - ▶ Defines DSMB responsibilities
 - ▶ Defines sponsor responsibilities
 - ▶ Pre-specifies monitoring plans and decisions (reasons for stopping)

- ▶ Interim Statistical Analysis Plan (ISAP):
 - ▶ Defines monitoring endpoint(s)
 - ▶ Pre-specifies analysis timing, decision criteria, and rationale

 - ▶ Pre-specifies methods for implementation (changes to analysis timing)
 - ▶ Pre-specifies adjustments to statistical inference about treatment effects

Monitoring the primary endpoint: Illustration of statistical implications

Illustration setting (trial design):

Consider a clinical trial evaluating *superiority* of a new agent:

- ▶ Measure of treatment effect ($\theta = \theta_1 - \theta_0$) defined based on fixed-sample design:
 - Primary endpoint
 - Probability model
 - Functional
 - Contrast
 - Statistical hypotheses
 - Statistical standards for decisions (i.e., frequentist or Bayes)
- ▶ Suppose large values of θ denote superiority of the new agent.

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Monitoring the primary endpoint: Illustration of statistical implications

Illustration setting (interim analysis plan):

- ▶ Suppose that the trial is planned with interim analyses after outcomes are measured on $N_1 < N_2 < \dots < N_J$ participants.
- ▶ Let $\hat{\theta}_j$ denote the estimated treatment effect at the j th analysis ($j = 1, \dots, J$).
- ▶ Consider stopping criteria $a_j < d_j$ with:

$$\begin{aligned}\hat{\theta}_j \geq d_j &\Rightarrow \text{Decide new treatment is superior} \\ \hat{\theta}_j \leq a_j &\Rightarrow \text{Decide new treatment is not superior} \\ a_j < \hat{\theta}_j < d_j &\Rightarrow \text{Continue trial}\end{aligned}$$

Set $a_J = d_J$ so that the trial stops by the J th analysis.

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Illustration of statistical implications

Example: O'Brien-Fleming (OBF) 2-sided design

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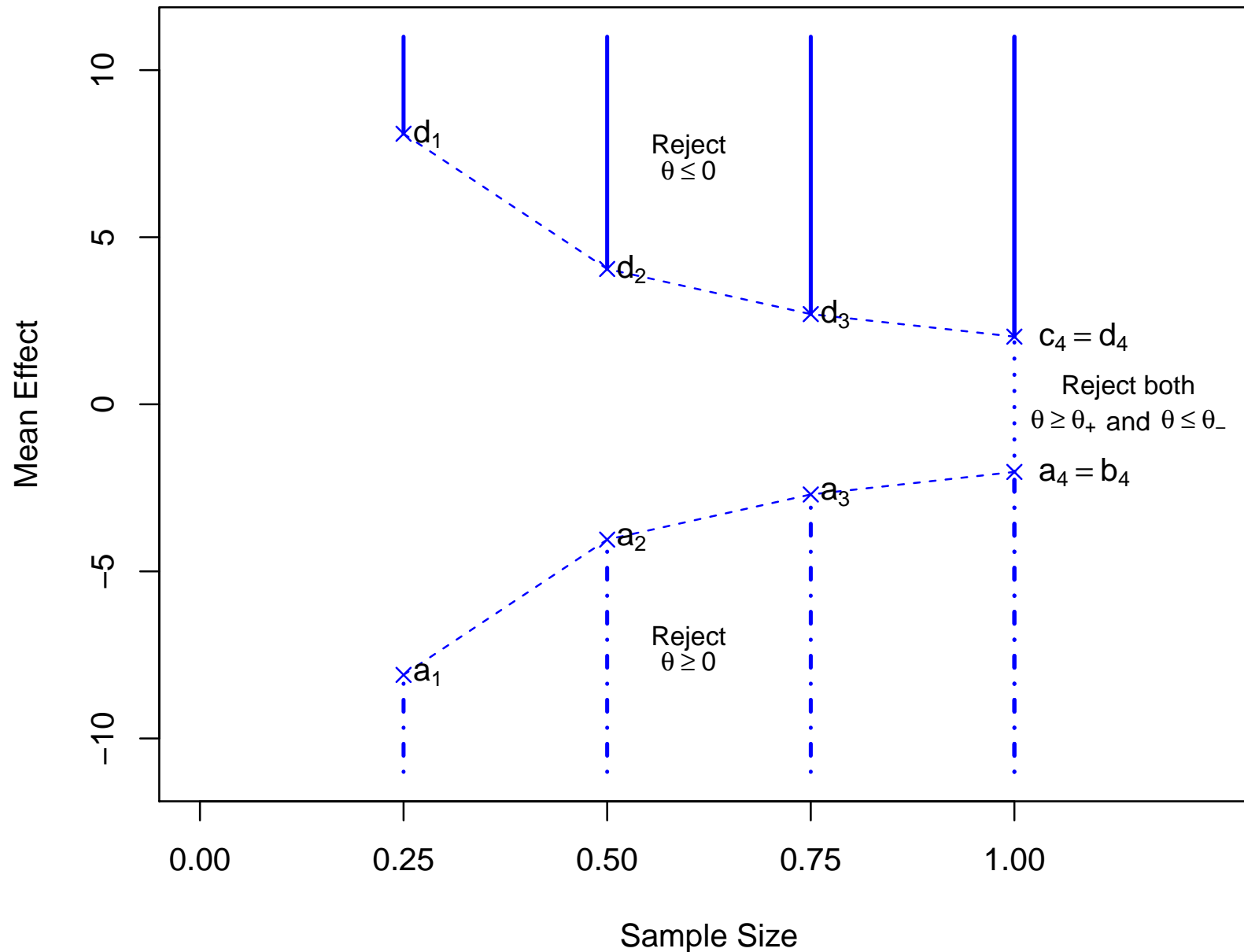
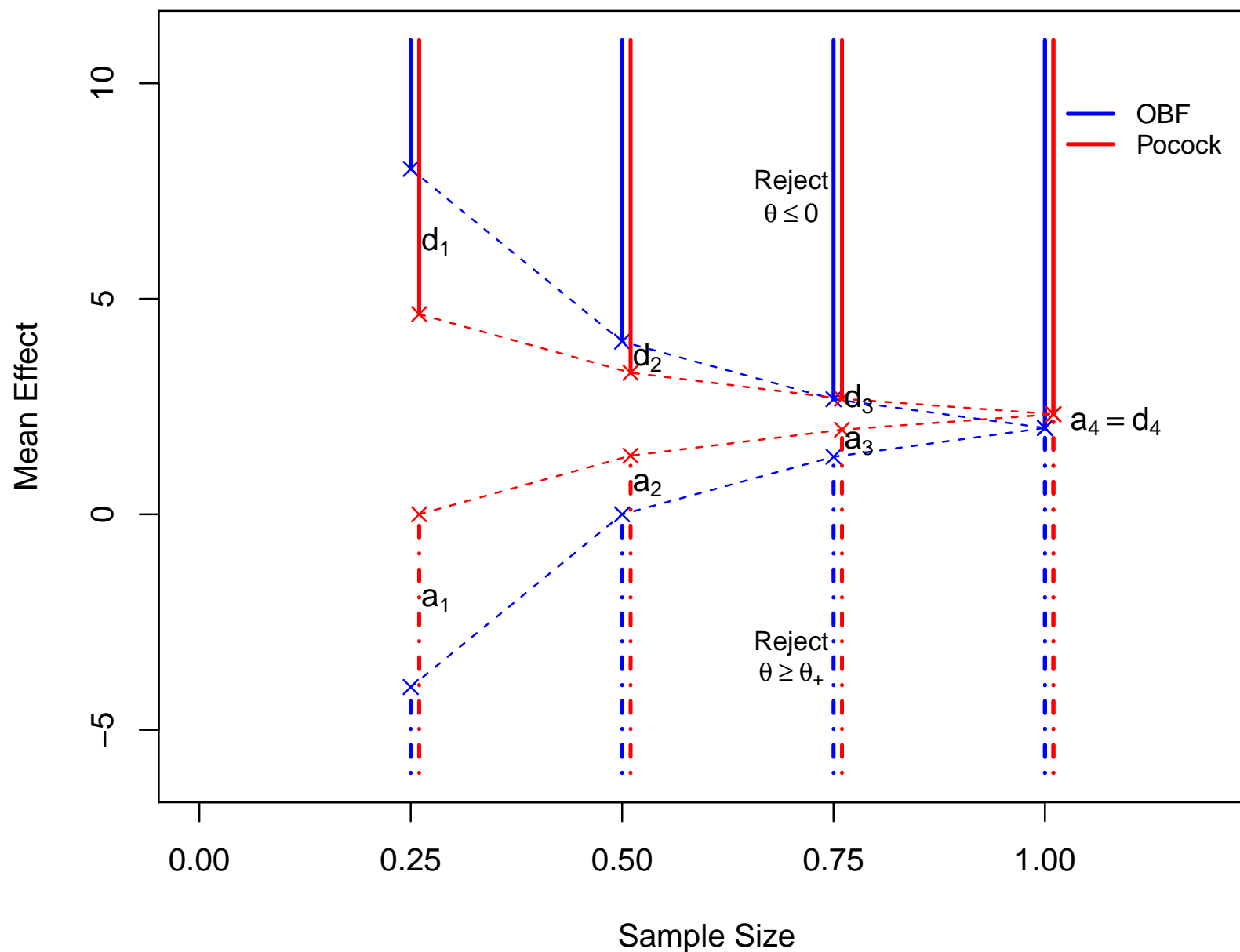


Illustration of statistical implications

Example: OBF versus Pocock 1-sided designs

One-sided superiority stopping boundaries



Effect of stopping boundaries on the sampling density

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[Simulated sample paths]

Illustration of statistical implications

Example: O'Brien-Fleming (OBF) 2-sided design

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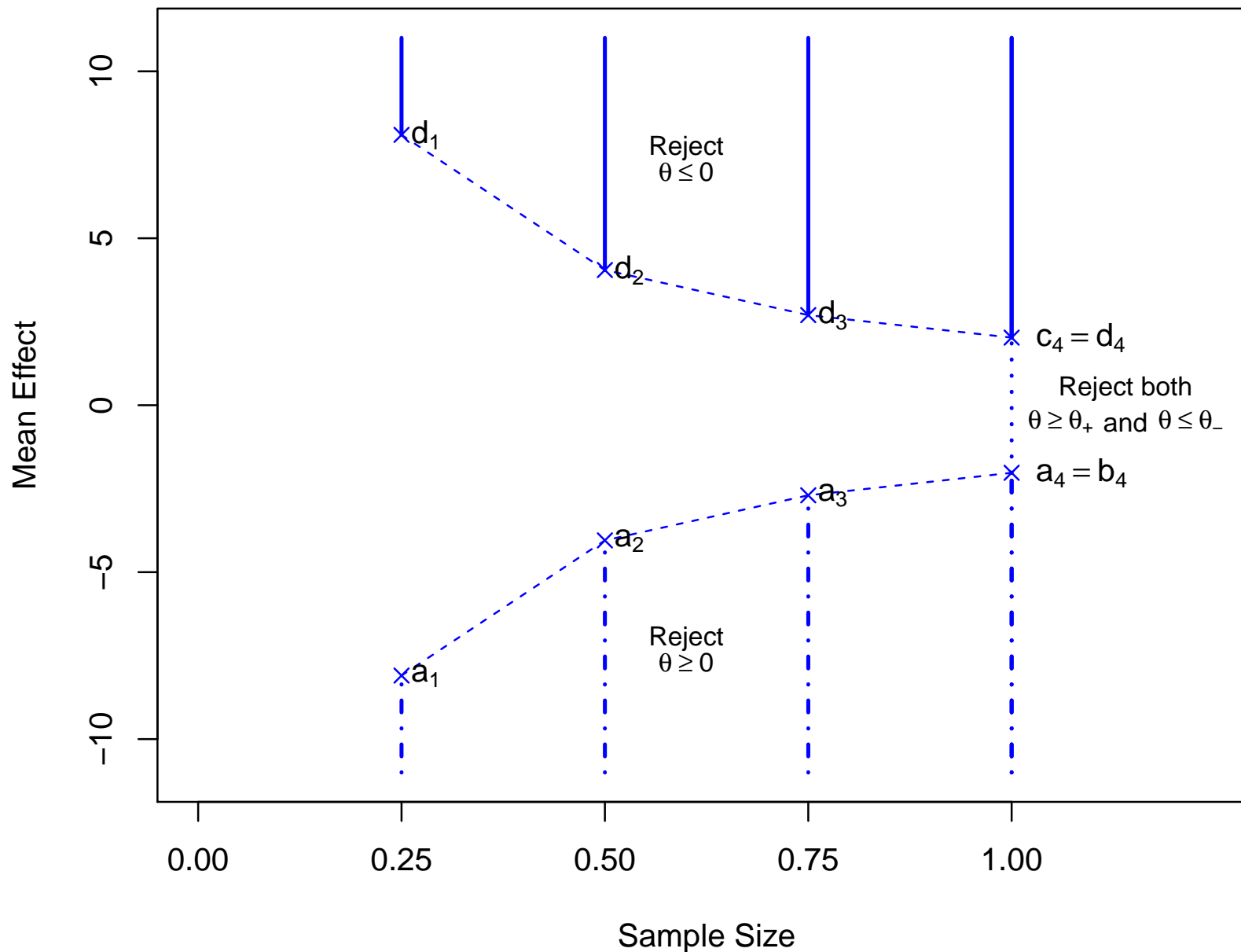
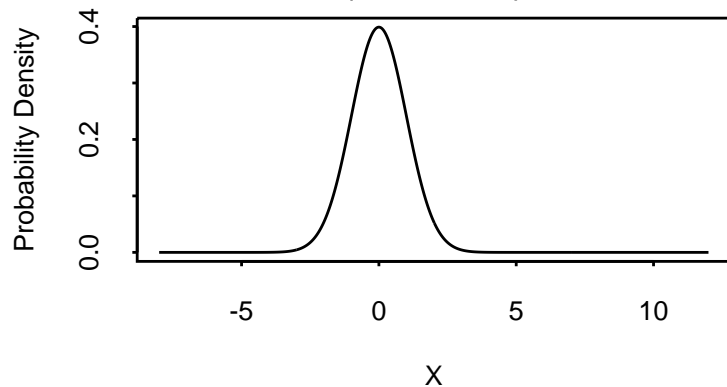


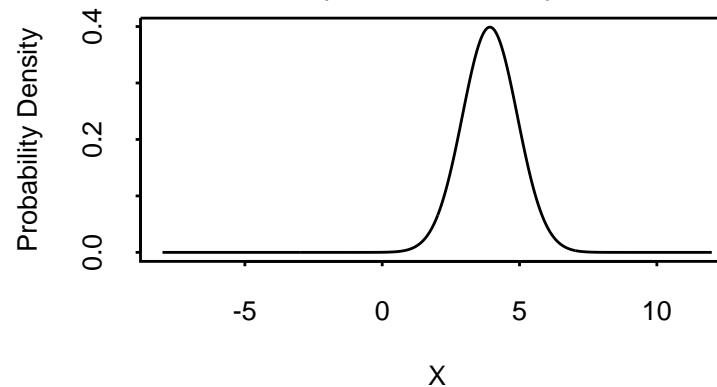
Illustration of statistical implications

Sampling density for OBF boundaries with $\theta = 0$ and $\theta = 3.92$ (corresponding Normal sampling density for comparison):

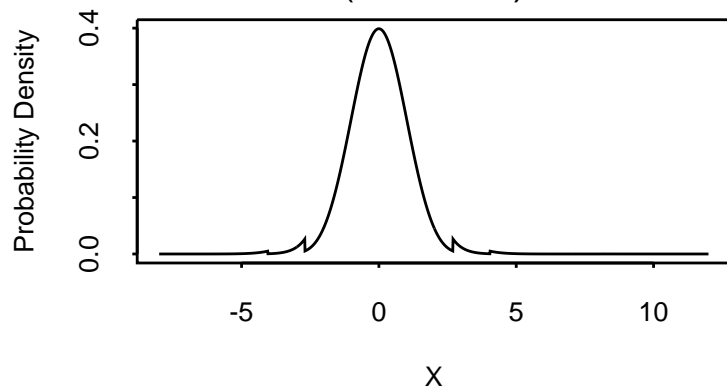
Standard Normal
($\theta = 0$)



Standard Normal
($\theta = 3.92$)



O'Brien-Fleming
($\theta = 0$)



O'Brien-Fleming
($\theta = 3.92$)

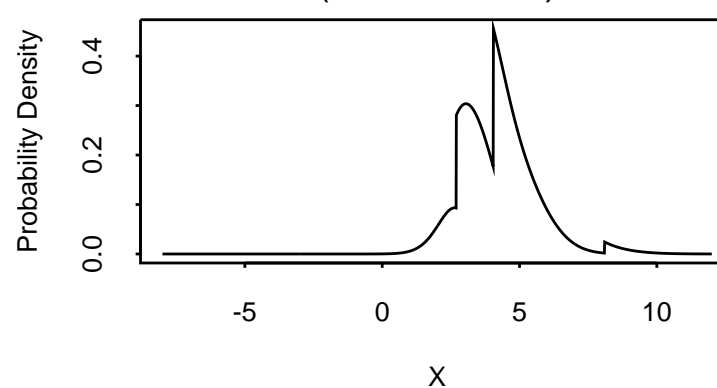


Illustration of statistical implications

Example: OBF versus Pocock 1-sided designs

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One-sided superiority stopping boundaries

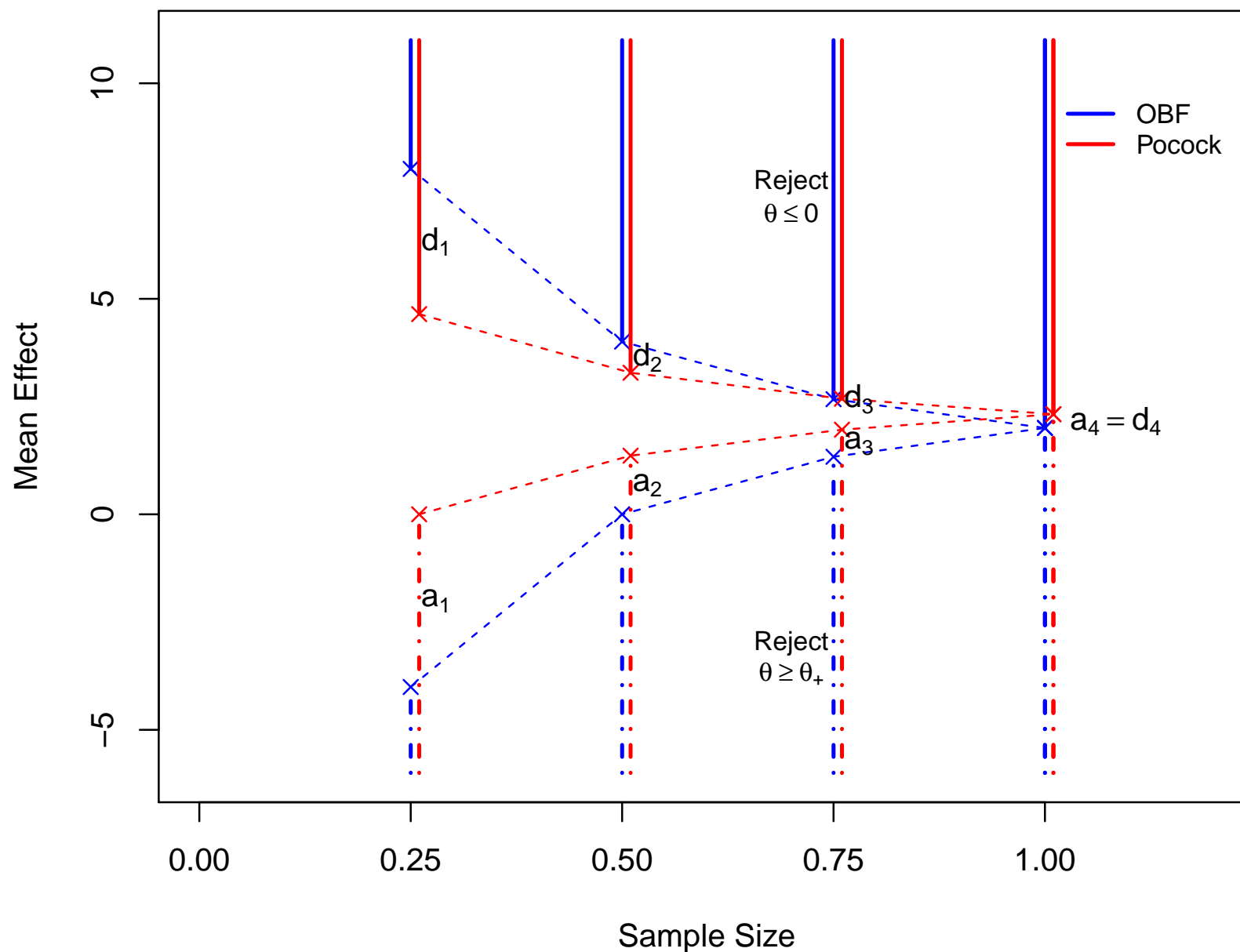


Illustration of statistical implications

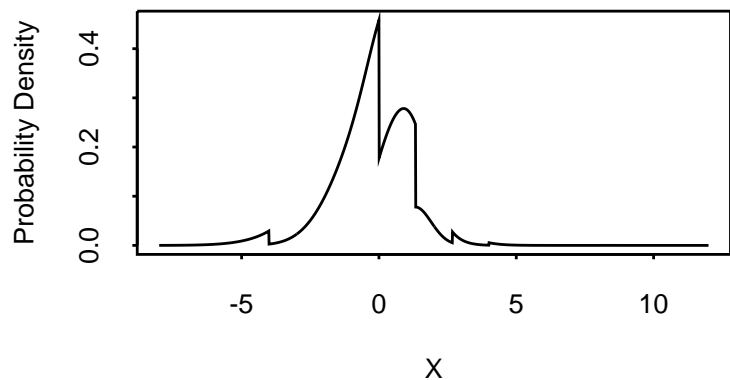
Sampling density for OBF and Pocock 1-sided designs.

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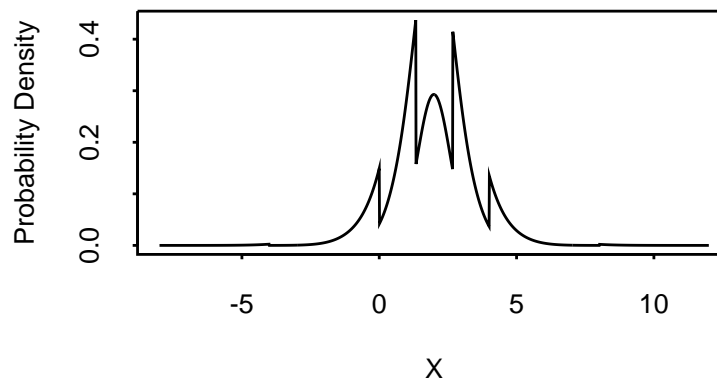
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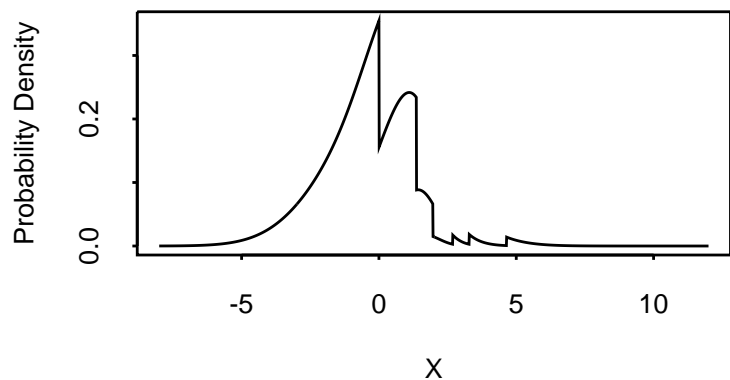
OBF ($\theta = 0$)



OBF ($\theta = 1.96$)



Pocock ($\theta = 0$)



Pocock ($\theta = 1.96$)

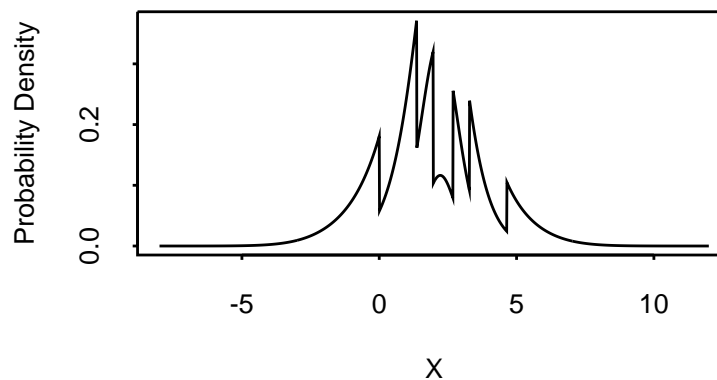


Illustration of statistical implications

Characteristics of the group sequential sampling density:

- ▶ Density is not shift invariant
- ▶ Jump discontinuities
- ▶ Requires numerical integration
- ▶ Sequential testing introduces bias:

θ	$E(\hat{\theta})$	
	OBF	Pocock
0.00	-0.29	-0.48
1.96	1.95	1.82
3.92	4.21	4.38

- ▶ (Recursive form of the sequential sampling density is computationally useful.)
- ▶ Fully discussed in sections 3 and 6 of this course.