

An Evidence Based Approach for Phase II Proof-of-Concept Trial

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GLOBAL PRODUCT DEVELOPMENT

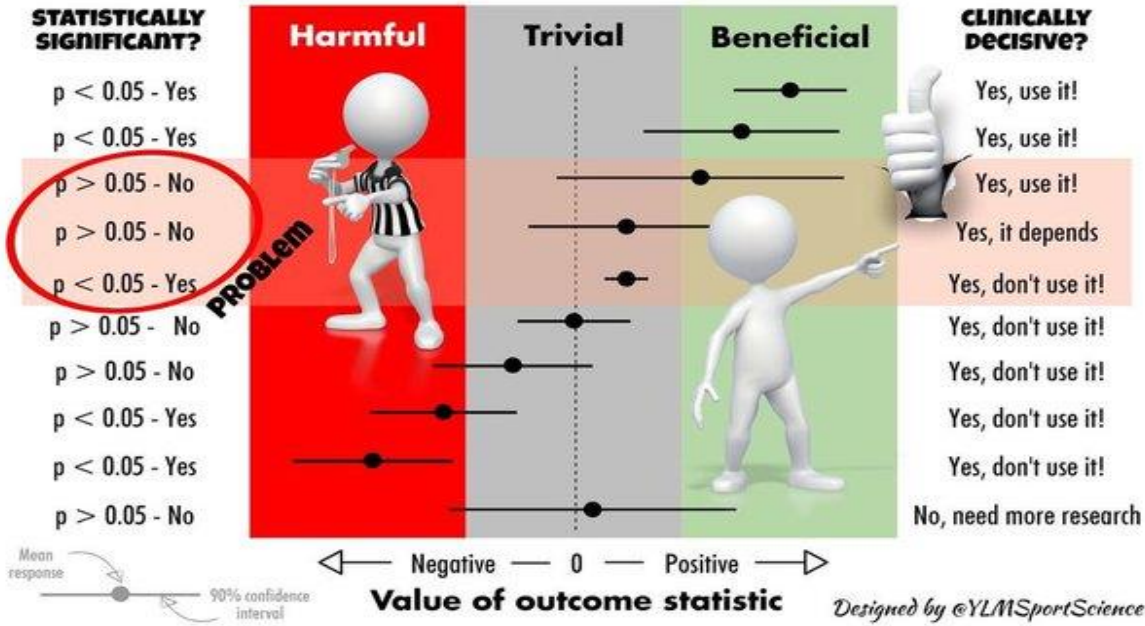
POC Trials: Getting Most Out of It!

- Proof-of-Concept (POC) is a milestone in the clinical development
- Traditionally Go/No-Go based on p-values or upper/lower CI
- A good POC should answer the followings:
 - What do we need to know?: inference regarding the treatment effect
 - How sure do we need to be?: manage the risk of making wrong decision
 - Can we stop early if treatment is not good?: meaningful interim analysis
- Can be formulated using Frequentist and Bayesian framework
 - Quantitative risk assessment for making Go/No-Go decision
 - Bayesian framework may be useful when historical data is available

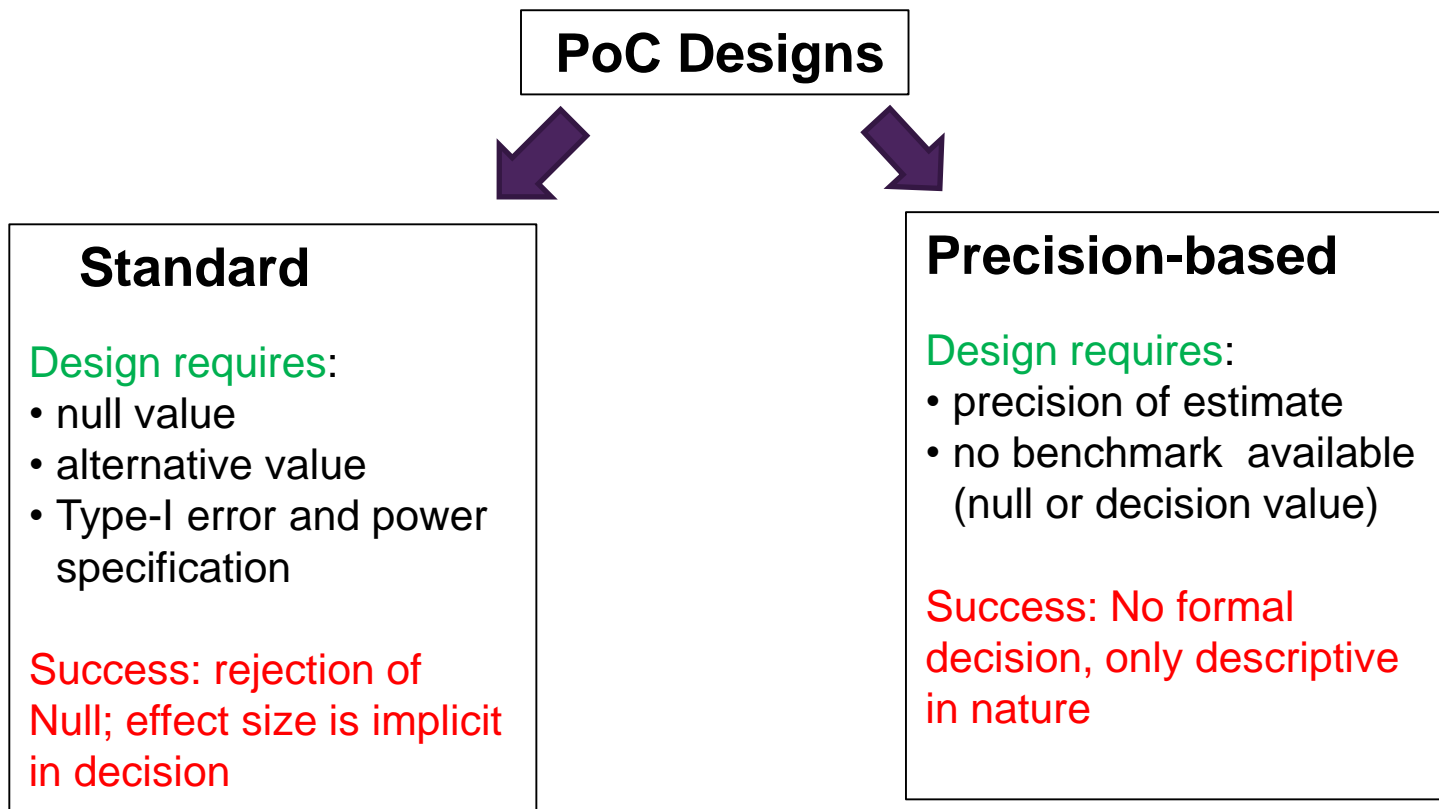
Statistical vs Clinical Significance: The “Gray Zone”

STATISTICS MAKING INFERENCES: CLINICAL VS STATISTICAL SIGNIFICANCE

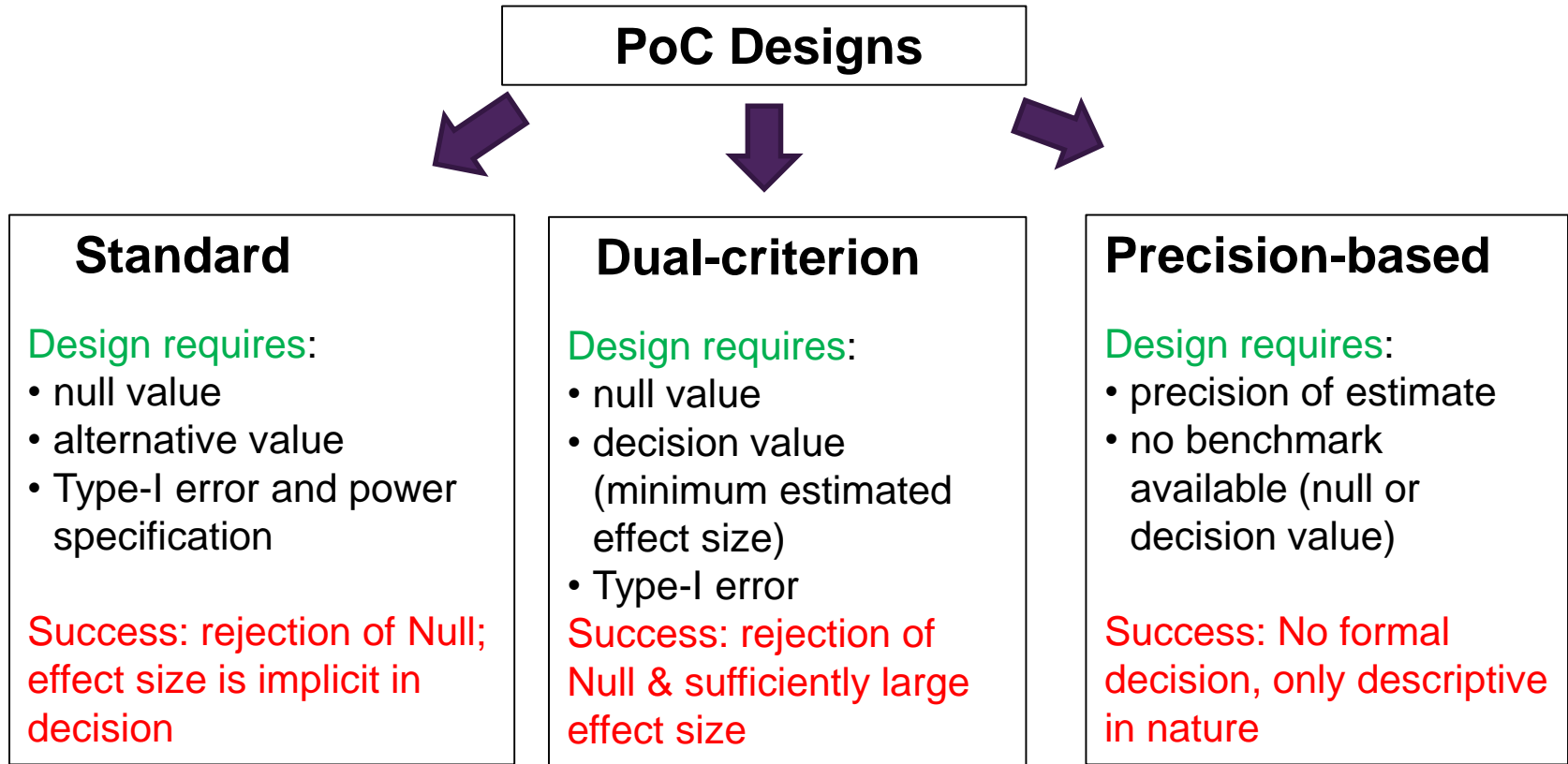
Reference: by Batterham & Hopkins, IJSP 2006



PoC Study Designs: Commonly Used Design

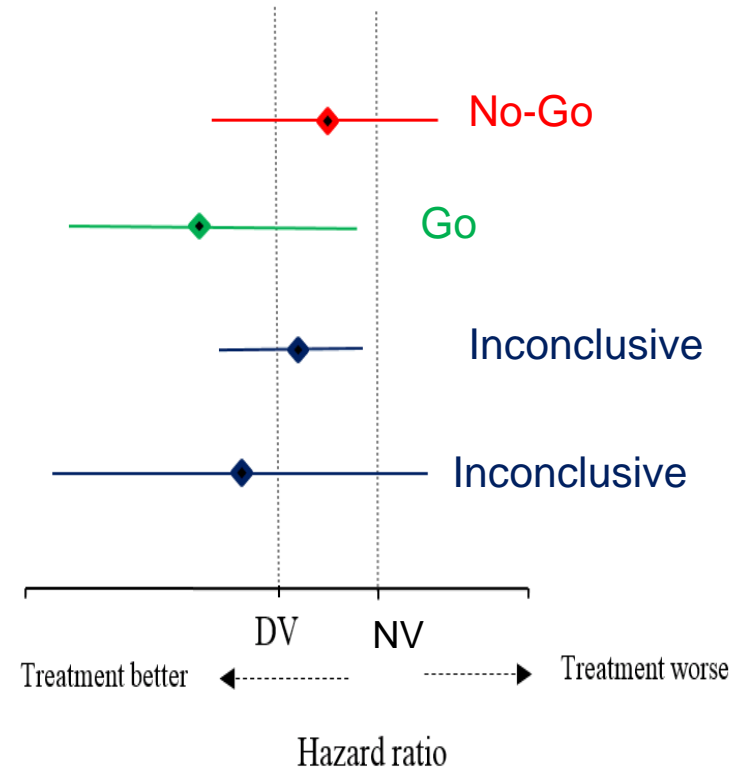


PoC Study Designs: Evidence based Design



POC Trials: Dual Criterion Design

- Formal inclusion of Statistical significance and clinical relevance in design: Decide **GO**
 - Strong evidence: effect \geq no effect or null value (**NV**)
 - Estimated effect \geq decision value (**DV**)
- **NV** and **DV** are the critical design parameters
 - **DV** is not classical alternative hypothesis
- Sample size requires consideration of **DV**
 - Ensure statistical significance when clinical relevance observed
 - Optimal type-I error control/power via simulation
- Applicable single arm and randomized setting



Statistical Significance and Clinical Relevance in POC Design

- Decision value (DV) is also known as
 - *target difference, minimum clinically important difference, indifference point*
- The idea to base **GO** decision on both statistical significance and effect estimate is widely discussed across pharma industry
- **Final decision:** should account for *all relevant information* e.g., secondary endpoints, safety, and subgroups
- Dual-criterion can be formulated in both Frequentist and Bayesian fashion

Design Inputs

Input Parameter	Standard Design	DC Design	Precision Design
Null value	✓	✓	✗
Alternative value	✓	✗	✗
Decision value	Implied	✓	✗
Type-I error	✓	✓	✗
Power	✓	Implied	✗
Estimate	Implied	Implied	✓
Sample Size	Implied	Implied	Implied

Sample Size Calculation

- Sample size calculation of Dual-criterion design needs consideration of both criteria.
- The sample size must ensure statistical significance when clinical relevance is achieved. We define this threshold as *minimum sample size* (n_{\min})
 - For normally distributed data, $n_{\min} = \sigma^2 \frac{z_{\alpha}^2}{(NV-DV)^2}$
 - For non-normal data, a grid search over sample sizes may be needed
- A good Dual-Criterion design must have sample size $\geq n_{\min}$
- The final sample size should be based on desired OC and other considerations (secondary endpoint, safety etc.)

Data Scenarios and Operating Characteristics

- On-study data scenarios showing
 - potential results, along with the Dual-criterion metrics and final study outcome
 - are useful to clarify the decision-making process and ensure they make clinical sense
- To assess the adequacy of the design, the operating characteristics should be measured:
 - Type-I error: under the null value, the probability for a GO decision must be controlled at α
 - Power: for truly promising effects (considerably better than DV), the probability for a GO decision should be large (70-90%)
- On-study scenarios and OCs should both be shown in the protocol

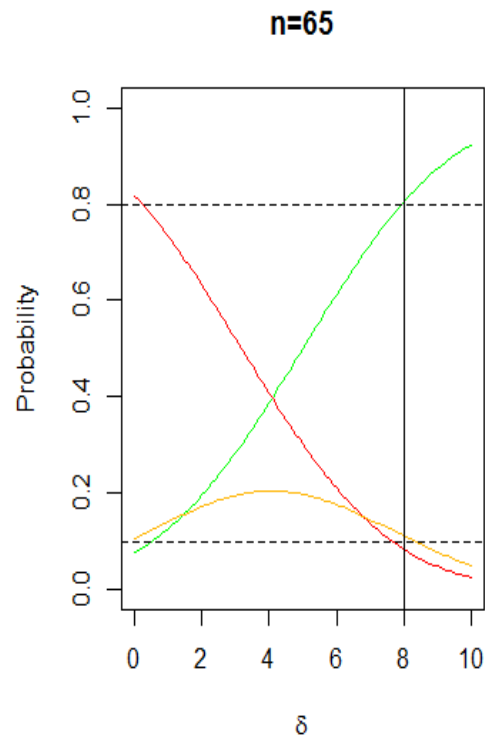
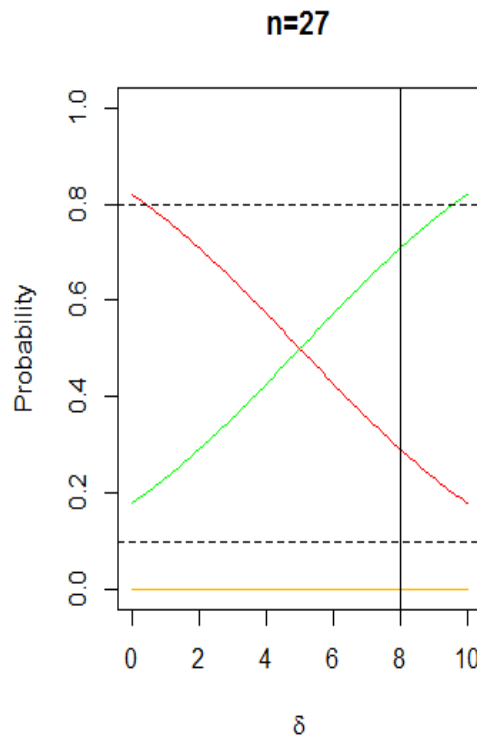
Example 1: PoC Trial in Cystic Fibrosis

- Randomized, double-blind, placebo-controlled, parallel group trial
- **Endpoint:** change from baseline in % of predicted FEV1 at day 28 (δ)
- Specification of NV and DV need literature review and clinical discussion
 - **NV = 0** => true drug effect is better than placebo
 - Data from competitor have shown effect size of 8% in a similar population
 - No interest in further development if observed effect **< 5%** in PoC: **DV = 5%**
- **Go** criteria is defined as:
 - Statistical significance: one sided p-value < 0.1
 - Estimated change from baseline in % of predicted FEV1 ($\hat{\delta}$) $\geq 5\%$
- Equivalent Bayesian formulation is also available

Source: Example is adopted from Fisch et. al. 2015

Example 1: Sample Size of Trial

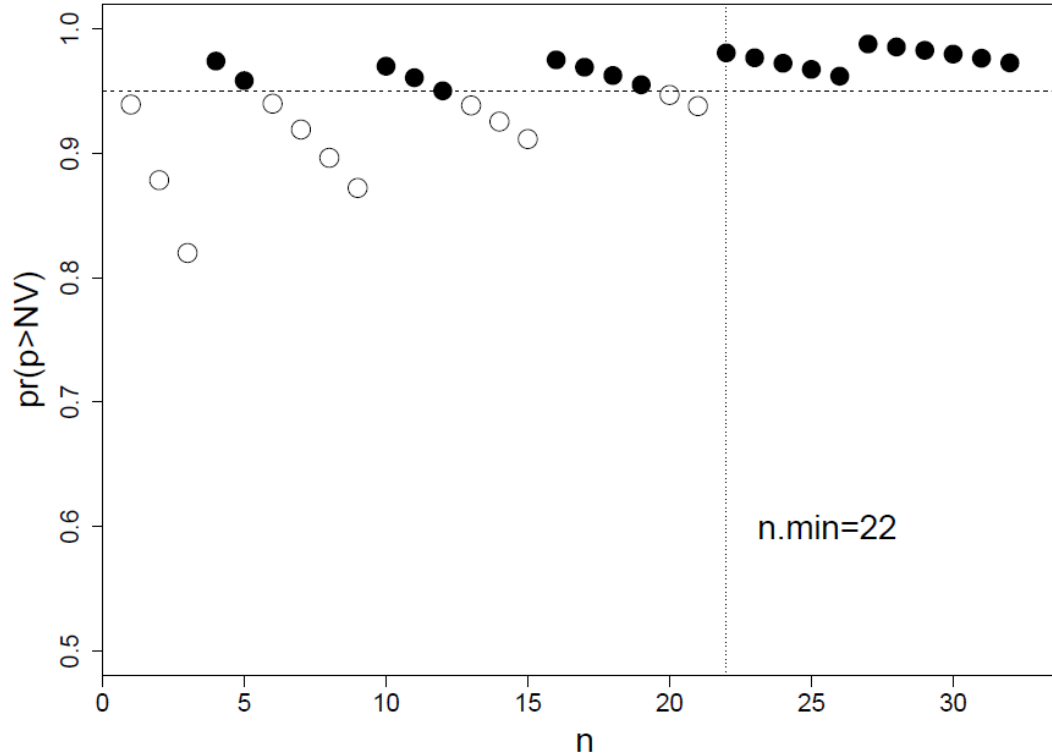
- Standard deviation for $\hat{\delta} = 20$
- Minimum sample size = 27
 - $n > 27$ clinical relevance ensure statistical significance
- However the final sample size depends on frequentist OC
- OC sub-optimal with $n = 27$
 - Desirable OC with $n = 65$
 - Type I error: 7.7% ($\delta = 0$)
 - Power: 80.4% ($\delta = 8$)
- Effect size $> 8\%$: *target value*



Example 2: Single-arm PoC Design with Binary Data

- Background: single-arm Ph I expansion PoC trial of an experimental drug in Chinese patients with NSCLC
- Primary objective: Objective Response Rate (ORR)
- Bayesian analysis method: Posterior analysis of ORR based on a binomial sampling model and a Beta prior distribution ($a=0.0811$, $b=1$)
 - Prior mean centered at the NV (0.075) and 95% credible interval (0, 0.73)
- Bayesian dual criteria:
 - **Significance:** $\text{pr}(\text{ORR} \geq 7.5\% \mid \text{data}) \geq 0.95$
 - **Relevance:** estimate (posterior median) $\geq 17.5\%$

Example 2: Sample Size Calculation

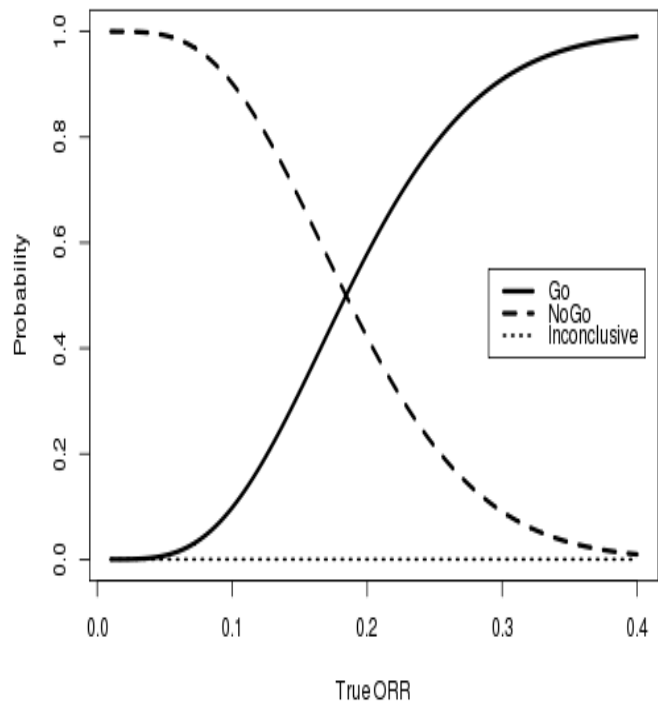


Example 2: Data Scenarios

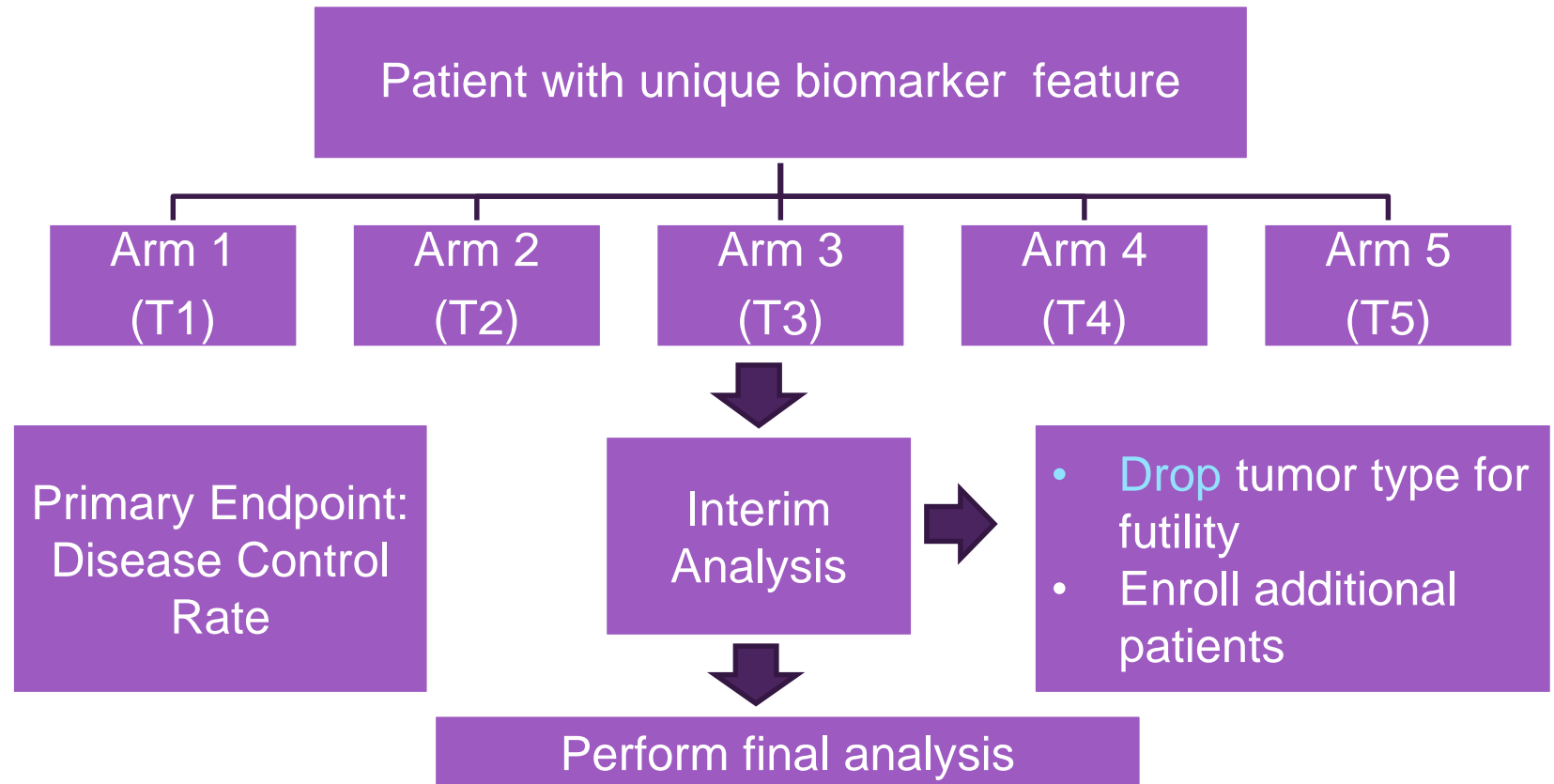
#responders/n	posterior median ORR	posterior $\text{pr}(\text{ORR} > 7.5\% \text{data})$	PoC decision
1/25	3%	0.161	NO-GO
2/25	6.9%	0.454	NO-GO
3/25	10.8%	0.729	NO-GO
4/25	14.8%	0.895	NO-GO
5/25	18.7%	0.967	GO
6/25	22.6%	0.992	GO

Example 2: Operating Characteristics

- The OCs exhibit a proposed design with satisfactory features



Example 3 : Basket Trial with Rare Tumor Types



Example 3: Statistical Significance and Clinical Relevance

Tumor Type	Minimum SS for Interim	Not Clinically meaningful (C_1)	Clinically meaningful (C_2)	Maximum SS
T1	10	$\leq 40\%$	$\geq 50\%$	20
T2	5	$\leq 20\%$	$\geq 30\%$	15
T3	10	$\leq 10\%$	$\geq 20\%$	20
T4	10	$\leq 10\%$	$\geq 20\%$	20
T5	10	$\leq 10\%$	$\geq 20\%$	20

Example 3: Criteria to Declare Futility and PoC

- A Bayesian hierarchical model is used for each interim and final analysis
- At each of these interim analyses, a decision will be made based on the calculated posterior probability
 - stop for futility if the calculated probability of being clinically meaningful (response $\geq C_2$) is less than 20%
 - otherwise extend recruitment for at least 10 more patients
- For a specific tumor type, a Proof of Concept will be declared if both of the following conditions are met:
 - observed mean response \geq “clinically meaningful” threshold (C_2).
 - posterior probability of “not being clinically meaningful (response $\leq C_1$)” is less than 20%
- For any analysis all accumulated data will be used

Communication, Reporting and Software

- For Dual-criterion designs, the proper specification of the statistical and clinical criteria depends on effective communication with non-statisticians in project team.
- Proper specification of Dual-criterion needs:
 - identification and review of the medical literature with clinical team
 - discussion with key opinion leaders (KOL)
 - input from clinical and regulatory colleagues to understand the competitive landscape and regulatory requirements
- Using graphs, data scenarios and non-statistical language are useful for project team to understand the design components

Summary

- Statistical design
 - Elicit the Dual-criterion in collaboration with the clinical team
- Determine the sample size and share with the team the data scenarios and corresponding OCs
 - include them in the protocol along with the statistical model and the two criteria underlying success
- The dual-criterion can be applied in other settings (e.g. more complex setting)
 - Non-inferiority
 - Bridging studies
 - Dose finding
- Interim analysis (efficacy and futility) can be also introduced

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Reference:

Roychoudhury, Scheuer, and Neuenschwander (2018). Beyond p-values: A phase II dual-criterion design with statistical significance and clinical relevance. *Clinical trials* 15 (5): 452-461 .

Thank You

