

Design of Phase I and II Clinical Trials

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Topics

- ▶ Phase I
 - Objectives
 - Types
 - Rule-based
 - Model-based
 - Model-assisted
- ▶ Phase II
 - Objectives
 - Types
 - Multi-stage
 - Randomized
 - Crossover

Phase I clinical trials

- ▶ Phase I (NIH definition): Tests a new biomedical intervention in a small group of people (e.g. 20–80) for the first time to determine efficacy and evaluate safety (e.g., determine a safe dosage range and identify side effects).
 - Healthy volunteers or patients who have failed other treatments
 - Determine maximum tolerated dose (MTD)
 - Assess pharmacokinetics (PK, what the body does to a drug) & pharmacodynamics (PD, what a drug does to the body)

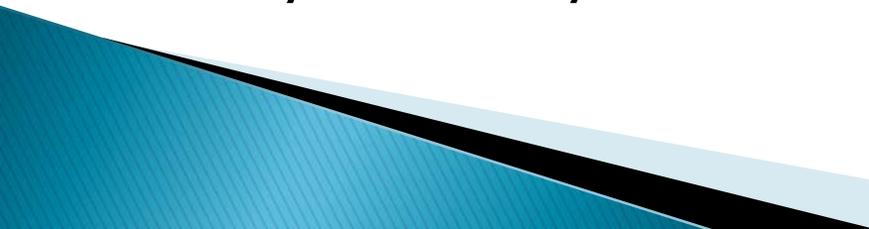
Cancer clinical trials design

- ▶ Most cancers are life-threatening
- ▶ Most anticancer drugs are cytotoxic with a narrow therapeutic window
 - Low doses: ineffective, but toxic
 - Higher doses: effective, but even more toxic
- ▶ Phase I and II studies designed to
 - Minimize the number of people exposed to toxic, ineffective treatments
 - Select efficacious treatments with an acceptable safety profile efficiently

Phase I cancer trials

- ▶ Participants are usually patients who have exhausted their treatment options
 - ▶ Goal is to determine the maximum tolerated dose (MTD)
 - ▶ Doses above the MTD have unacceptable levels of dose-limiting toxicity (DLT)
- 

General considerations

- ▶ Starting dose may be based on animal studies
 - ▶ Participants are usually
 - Critically ill
 - From a small pool of available patients
 - Heterogeneous, e.g., with different tumor types
 - ▶ Phase I cancer trials
 - Are a screening process to find potentially effective drugs with an acceptable safety profile
 - Determine the MTD with a minimal number of patients in a minimal amount of time
 - Establish the MTD from below (due to the extreme cytotoxicity of the drugs)
- 

Types of Phase I designs

- ▶ **Rule-based:** Assign patients to dose levels according to pre-specified rules based on observations of events (e.g., DLT) from the clinical data
- ▶ **Model-based:** Assign patients to dose levels based on estimation of the target toxicity level using a model of the dose-toxicity relationship
- ▶ **Model-assisted:** Use a model for efficient decision-making, but specify dose escalation & de-escalation rules before trial starts

Le Tourneau et al. J Natl Cancer Inst 2009; 101:708–20
Zhou et al. Clin Cancer Res 2018; 24(18):4357–4364

Rule-based designs

- ▶ No prior assumption of dose-toxicity curve
 - ▶ Up-and-down designs
 - Escalate or de-escalate dose with diminishing fractions of preceding dose depending on presence or absence of severe toxicity in previous dose cohort
 - Simple up-and-down design converges to dose with 50% probability of severe toxicity
 - Not used much because they risk exposing patients to unacceptable levels of toxicity
- 

Traditional 3+3 design

- ▶ Most common design for phase I cancer trials
- ▶ Only assumption: toxicity increases with dose
- ▶ Rules
 - Start with a cohort of 3 patients at a dose considered safe based on animal studies
 - If none experiences a DLT, treat another 3 patients at the next dose level
 - If one of the first 3 patients experiences a DLT, treat another 3 patients at the same dose level
 - Dose escalation continues until 2 of 3-6 patients experiences a DLT
- ▶ Recommended phase II dose is the dose below this toxic dose level

Example: ASP3026 in patients with advanced solid tumors

- ▶ Oral anaplastic lymphoma kinase (ALK) inhibitor
- ▶ First-in-human
- ▶ Open-label
- ▶ Multi-center
- ▶ Dose escalation
- ▶ Dose expansion
- ▶ Objectives: Determine
 - Primary: Safety & tolerability (MTD)
 - Secondary: Pharmacokinetics & antitumor effects

Dose Escalation & Expansion

- ▶ 28-day treatment cycles, continuous dosing
- ▶ First patient in each dose cohort evaluated for DLTs on cycle 1, day 4. If no DLTs, rest of cohort enrolled
- ▶ 8 dose levels: 25, 50, 75, 125, 200, 325, 525*, 800 mg
- ▶ Expansion of higher dose cohorts allowed to include crizotinib-refractory ALK-positive patients (target population)
- ▶ Dose expansion at MTD: crizotinib-refractory ALK-positive patients

*MTD

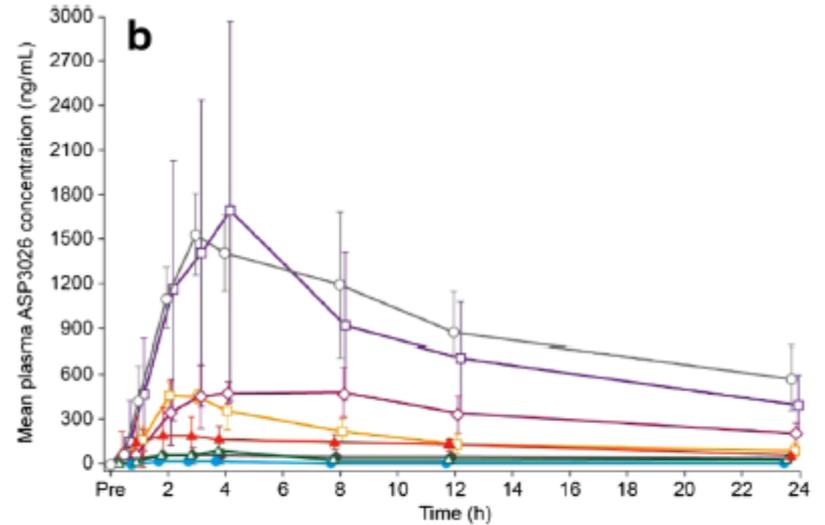
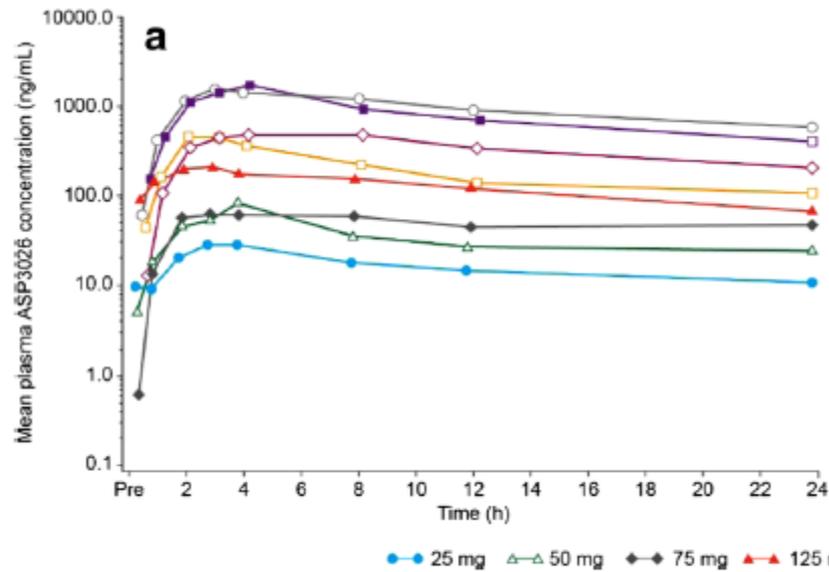


Fig. 1 Mean plasma concentration of ASP3026, cycle 1, day 1. **a** Semi-log plot. **b** Linear plot. For patient numbers at each dose, refer to Tables 3 and 4

Traditional 3+3 design

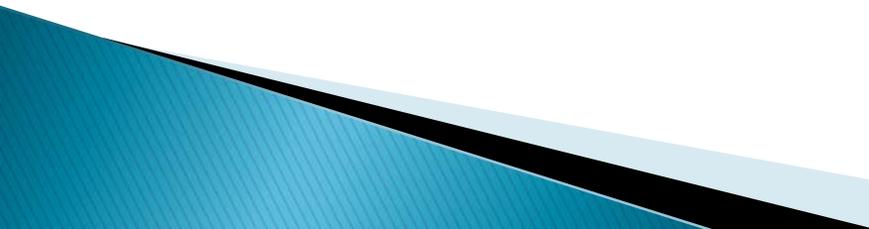
- ▶ Advantages

- Simple and safe
- Provides info on inter-patient PK variability

- ▶ Disadvantages

- Too many escalation steps
- Few patients get therapeutic doses

Accelerated titration design

- ▶ Cohorts of one new patient per dose level start at the lowest dose level
 - ▶ Intra-patient dose escalation is allowed
 - ▶ Reverts to 3+3 design if one DLT or 2 moderate toxicities are observed
 - ▶ Advantage: more patients treated at therapeutic doses
 - ▶ Disadvantage: intra-patient dose escalation may mask cumulative effects of treatments
- 

Pharmacologically guided dose escalation

- ▶ Assumes DLTs can be predicted by plasma drug concentrations based on animal data
- ▶ Not widely used

Summary of rule-based designs

- ▶ Easy to implement, but
 - ▶ Inefficient in establishing MTD
 - ▶ Only use information from last dose
 - ▶ Are widely used
- 

Model-based designs

- ▶ Continual reassessment method (CRM)
 - First Bayesian model-based method
 - Requires initial estimate of the slope of the dose-toxicity curve
 - This estimate is adjusted based on observed data
 - Estimated probability of DLT is updated for each patient

Model-based designs

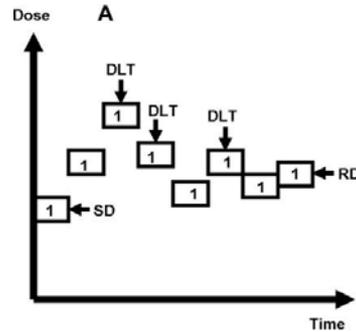
- ▶ Escalation with overdose control (EWOC)
 - Modification of CRM
 - Probability of exceeding MTD assessed after each patient
 - Stop dose escalation if probability of exceeding MTD gets too high
- ▶ Bayesian logistic regression (BLRM)
 - Modification of CRM
 - “Optimal” dose has highest posterior probability of being within the proper dosing interval, i.e., with probability of DLT within specified limits
 - Has overdose control similar to EWOC

Summary of model-based designs

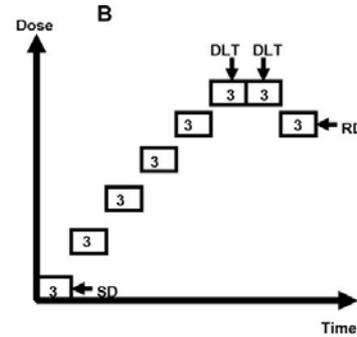
- ▶ Use all data accumulated during trial
 - ▶ Efficient, but
 - ▶ Difficult to implement
 - ▶ May fail to reach recommended phase II dose if initial estimate of dose-toxicity curve slope is wrong
- 

Graphical depiction of dose escalation methods for phase I cancer clinical trials.

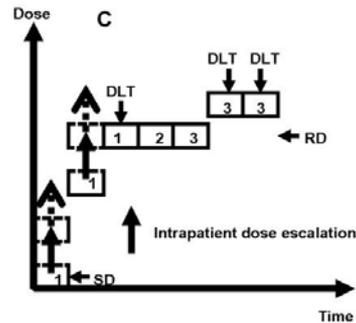
A: Simple up-and-down design



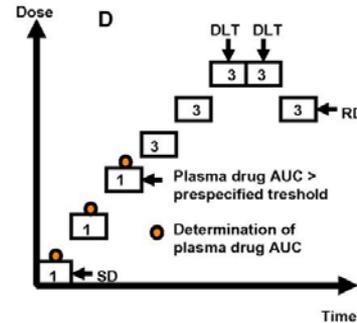
B: Traditional 3+3 design



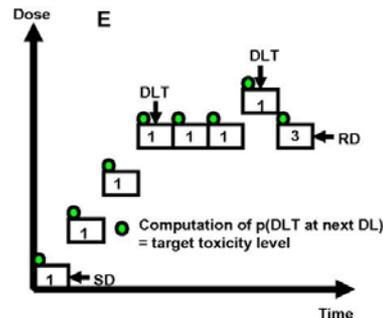
C: Accelerated titration design



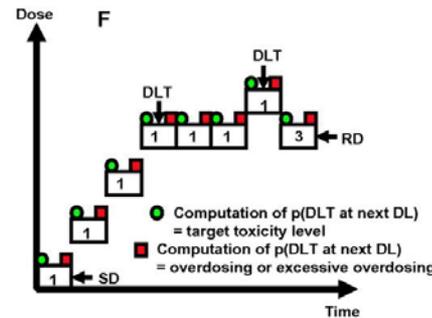
D: Pharmacologically guided dose escalation



E: Modified continual reassessment method (CRM)



F: Escalation with overdose control (EWOC)



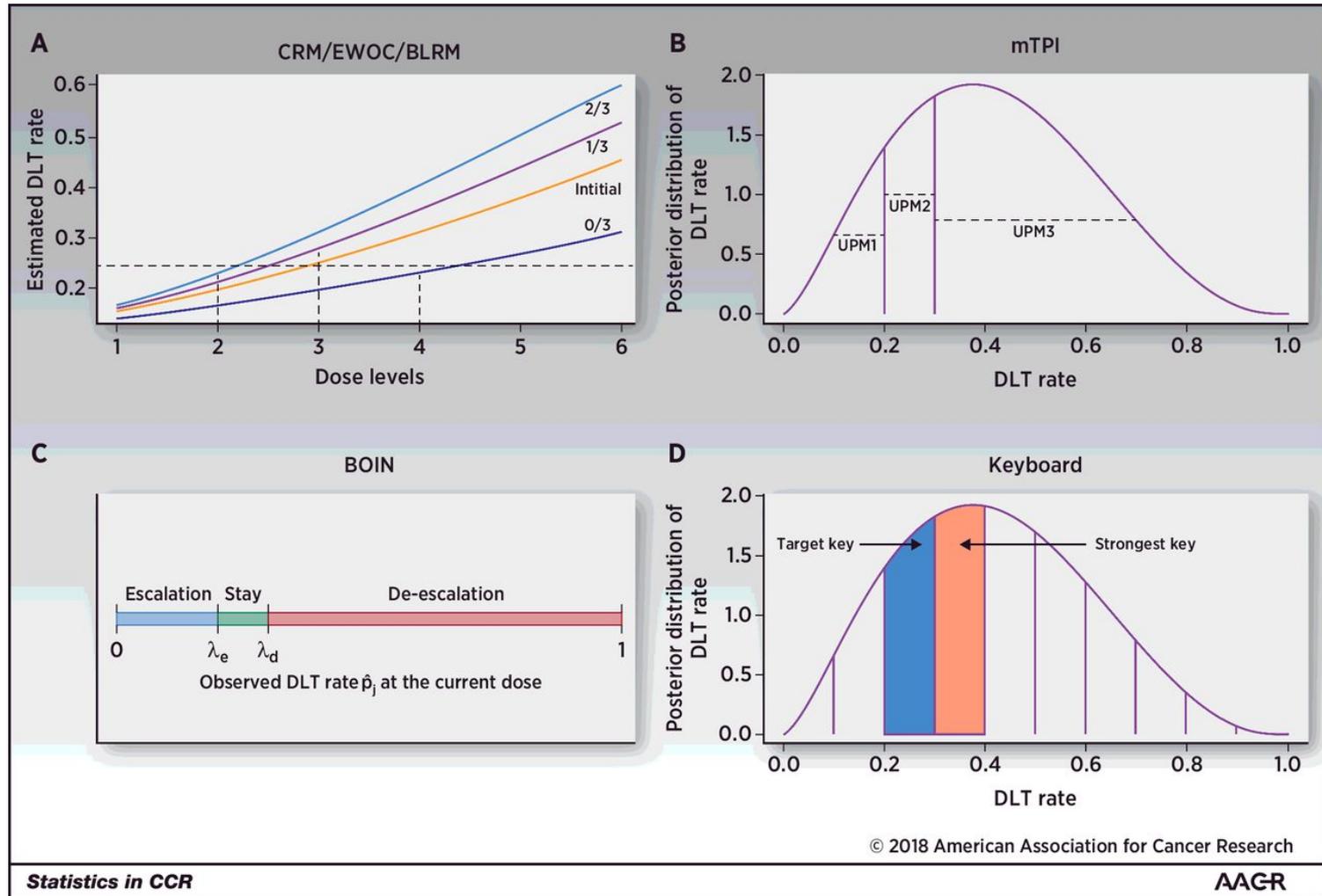
Le Tourneau C et al. JNCI J Natl Cancer Inst 2009;101:708-720

Model-assisted designs

- ▶ Modified toxicity probability interval (mTPI)
 - Specifies 3 intervals: proper dosing interval, underdosing interval, overdosing interval
 - Escalate, de-escalate or stay at same dose based on posterior distribution of the DLT rate in the intervals at current dose
- ▶ Keyboard design
 - Similar to mTPI, but has several intervals of equal length (keys)
- ▶ Bayesian optimal interval (BOIN)
 - Compare observed DLT rate with pre-determined dose escalation & de-escalation boundaries, which are derived from pre-specified toxicity probability thresholds



Decision of dose escalation and de-escalation under the CRM/EWOC/BLRM, mTPI, BOIN, and keyboard designs.



Heng Zhou et al. Clin Cancer Res 2018;24:4357-4364

Study designs:

<https://biostatistics.mdanderson.org/SoftwareDownload/SoftwareOnline>

The screenshot shows the BOIN app interface with the following sections:

- Trial Setting** (selected):
 - Doses**: Number of doses: 5, Starting dose level: 1
 - Target Probability**: Target Toxicity Probability ϕ : 0.1, Use the default alternatives to minimize decision error (recommended).
 - Sample Size**: Cohort size: 2, Number of cohort: 16, Stop trial if number of patients assigned to single dose reaches: 16, No, Yes
 - Overdose Control**: Eliminate dose j if $Pr(p_j > \phi | data) > p_E$, Use the default cutoff (recommended) $p_E =$ 0.95, Check the box to impose a more stringent safety stopping rule.
- Simulation**
- Trial Protocol**
- Animation**
- Select MTD**
- Reference**

Below the settings, there are tabs for **Design Flow Chart** and **Decision Table**. The **Decision Table** is active, showing a table with 16 columns (patients) and 4 rows (treatment rules). Buttons for Copy, CSV, Excel, and Print are located above the table.

	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16
Number of patients treated	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16
Escalate if # of DLT \leq	0	0	0	0	0	0	0	0	0	0	0	0	1	1	1	1
Deescalate if # of DLT \geq	1	1	1	1	1	1	1	1	2	2	2	2	2	2	2	2
Eliminate if # of DLT \geq	NA	NA	2	2	2	2	2	3	3	3	3	3	3	4	4	4

Summary of model-assisted designs

- ▶ Combine superior performance of model-based designs with simplicity of rule-based designs
- ▶ BOIN and keyboard have similar performance and are easy to implement
- ▶ BOIN may be particularly appealing because it uses the observed DLT rate to determine dose escalation & de-escalation

Phase II clinical trials

- ▶ Phase II (NIH definition): Study the biomedical or behavioral intervention in a larger group of people (several hundred) to determine efficacy and further evaluate safety.
 - Is there any biological activity?
 - May or may not have concurrent controls
 - May be shorter term with different outcome and more exclusion criteria than phase III trials
 - Phase IIA–evaluate dosing; phase IIB –determine effectiveness

Phase II: Multi-stage designs

▶ Purpose

- Identify drugs that are promising for further testing in a Phase III trial
 - Preliminary efficacy assessment
 - Avoid exposing patients to sub-therapeutic dose levels
 - Terminate the study if the treatment is ineffective
- 

Single arm trials

- ▶ Optimal two-stage designs
 - Permit early stopping if there is a moderately long sequence of initial failures
 - Enroll n_1 patients in stage 1
 - If $\leq r_1$ responses, stop the trial
 - Otherwise, enroll n_2 more patients
 - Decide whether or not treatment is promising based on the $n_1 + n_2$ patients

Two-stage designs

- ▶ Null hypothesis: probability of response is unacceptably low
 - ▶ Alternative hypothesis: probability of response is sufficiently high to warrant further study
 - ▶ Simon's **optimal** two-stage design minimizes the **expected** sample size under the null hypothesis for the given error constraints
 - ▶ Simon's **minimax** design minimizes the **maximum** sample size for the given error constraints
- 

Example: Intravenous aflibercept in patients with ovarian cancer

- ▶ Drug is a vascular endothelial growth factor (VEGF) inhibitor
- ▶ 2 dose levels tested (2 mg/kg and 4 mg/kg), based on previous phase 1 & 2 studies
- ▶ Patients with advanced platinum-resistant ovarian cancer
- ▶ Simon minimax 2-stage design
- ▶ Primary outcome: objective response rate (ORR)
- ▶ Null hypothesis: $ORR \leq 5\%$
- ▶ Alternative hypothesis: $ORR \geq 15\%$
- ▶ Tested at the 0.025 level, 1-sided

Tew et al. Cancer 2014; 120:335-43

2-stage design

- ▶ Plan: enroll 42 patients in each group in stage 1
 - ▶ If at least 3 responders in stage 1 in a group, go on to enroll 25 patients in stage 2
 - ▶ Declare drug suitable for future study if at least 8 responders total (stages 1 & 2) in a group
 - ▶ Allowed to enroll additional patients beyond the 2-stage design to reach a planned total sample size of 200
- 

Sample size calculation

<http://cancer.unc.edu/biostatistics/program/ivanova/SimonsTwoStageDesign.aspx>



Anastasia Ivanova, Ph.D, University of North Carolina at Chapel Hill

Continuous monitoring for toxicity | **Simon's two-stage design** | Fleming's two-stage design | Simon's like design with relaxed futility stopping

Two-stage design for ordinal outcomes | The Rapid Enrollment Design (RED) for Phase I trials | Other programs

Simon's Two-Stage design

This program generates Simon's optimal two-stage designs (Simon, 1989) and admissible designs from Jung et al. (2004) for Phase II single arm clinical trials.

- Simon R (1989). *Controlled Clinical Trials* 10: 1-10. [Click here to download Simon's \(1989\) article.](#)
- Jung SH, Lee TY, Kim KM, George S (2004). *Admissible two-stage designs for phase II cancer clinical trials, Statistics in Medicine* 23: 561-569.

Type I error rate, α (one-sided):

Power:

Response probability of poor drug, p_0 :

Response probability of good drug, p_1 :

n	n_1	r_1	r_2	Type 1 Error	Power	EN_0	Probability of early stopping	Interval for w	Comment
67	42	2	7	0.0180	0.8008	50.8	0.6490	[0.8344,1]	Minimax
68	29	1	7	0.0188	0.8002	45.7	0.5708	[0.6871,0.8343]	
69	27	1	7	0.0198	0.8014	43.5	0.6061	[0.5303,0.687]	
73	23	1	7	0.0238	0.8009	39.0	0.6794	[0,0.5302]	Optimal

Calculated in 4 milliseconds

n is the total number of subjects
 n_1 is the number of subjects accrued during stage 1
 r_1 , if r_1 or fewer responses are observed during stage 1, the trial is stopped early for futility
 r_2 , if r_2 or fewer responses are observed by the end of stage two, then no further investigation of the drug is warranted
 EN_0 is the expected sample size for the trial when response rate is p_0
Interval for w is the set of values w such that the design minimizes $w * n + (1 - w) * EN_0$

Recommended write up for a protocol

Simon's two-stage design (Simon, 1989) will be used. The null hypothesis that the true response rate is $[p_0]$ will be tested against a one-sided alternative. In the first stage, $[n_1]$ patients will be accrued. If there are $[r_1]$ or fewer responses in these $[n_1]$ patients, the study will be stopped. Otherwise, $[n - n_1]$ additional patients will be accrued for a total of $[n]$. The null hypothesis will be rejected if $[r_2 + 1]$ or more responses are observed in $[n]$ patients. This design yields a type I error rate of $[Type\ I\ error\ rate]$ and power of $[power]$ when the true response rate is $[p_1]$.

The development of this software was supported by funds from the National Institutes of Health [R01 CA120082-01A1]. For comments, questions and suggestions e-mail to Anastasia Ivanova at avanova@bios.unc.edu

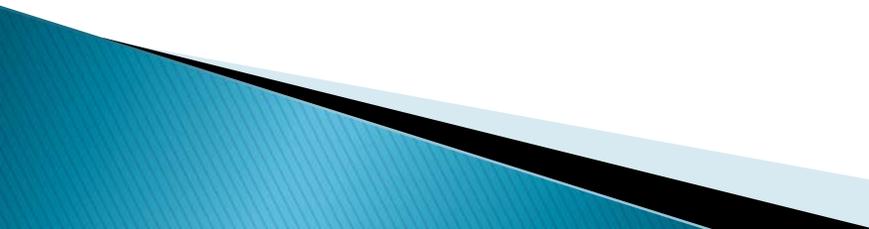


A Comprehensive Cancer Center Program by the National Cancer Institute



N.C. Cancer Hospital

Multiple stage designs

- ▶ Can extend to 3 (or even 4 stages)
 - ▶ May require at least one response at first stage to go on to the second stage
 - ▶ Considerations for any multi-stage design
 - How long will it take to determine whether there are enough responses to proceed to the next stage?
 - Will we stop the study or keep on enrolling while waiting for the results from the previous stage?
- 

Randomized phase II designs

- ▶ May randomize patients to different drugs or dose levels of the same drug
 - ▶ Can estimate differences between treatments
 - ▶ Can pick the treatment with best response
 - ▶ Randomization produces balanced groups
- 

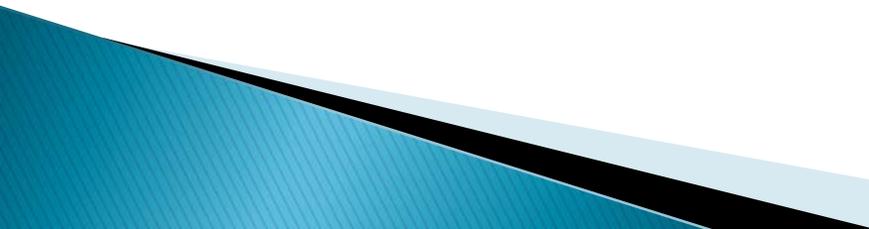
Example: Phase II trial—Oncken (2006)

- ▶ Background: Evaluated 4 varenicline dose regimens for promoting smoking cessation.
- ▶ Methods: Multicenter, double-blind, placebo-controlled. Randomized healthy smokers aged 18–65 to varenicline tartrate or placebo twice daily for 12 weeks
 - 0.5 mg non-titrated (n=129); 0.5 mg titrated (n=130)
 - 1.0 mg non-titrated (n=129); 1.0 mg titrated (n=130)
 - placebo (n=129)

with 40-week follow-up to assess long-term efficacy. Primary efficacy outcomes: carbon-monoxide confirmed 4-week continuous quit rates; continuous abstinence

Arch Intern Med. 2006 166(15):1571–7

Results

- ▶ Weeks 9–12 continuous quit rates greater in 1.0 mg group and 0.5 mg group than placebo
 - ▶ Weeks 9–52 abstinence rates greater in 1.0 mg group and 0.5 mg group than placebo
 - ▶ Generally well tolerated
 - Nausea in 16%–42% of varenicline treated subjects
 - Less nausea with titrated dosing
- 

From: **Efficacy and Safety of the Novel Selective Nicotinic Acetylcholine Receptor Partial Agonist, Varenicline, for Smoking Cessation**

Arch Intern Med. 2006;166(15):1571-1577. doi:10.1001/archinte.166.15.1571

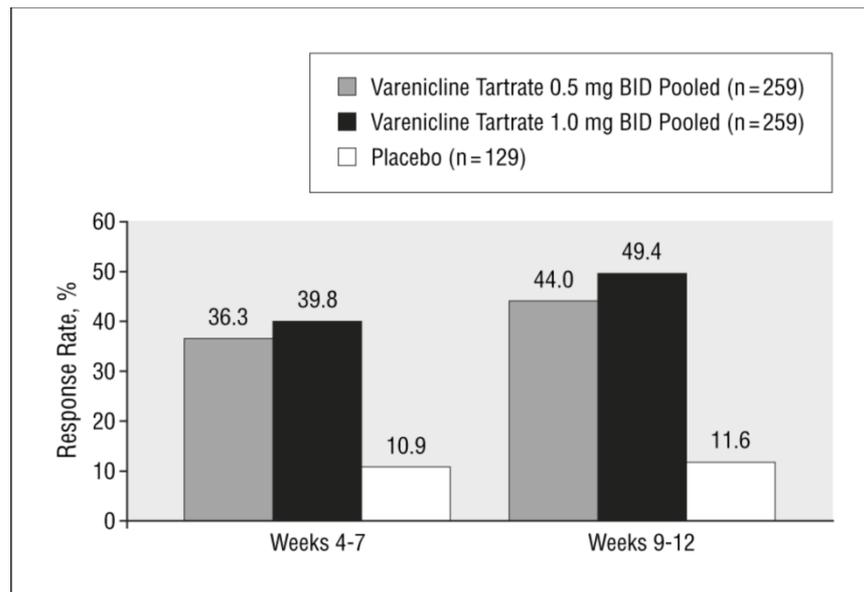


Figure Legend:

Continuous quit rates. $P < .001$ for each treatment group vs placebo. BID indicates twice daily. The odds ratios (ORs) and 95% confidence intervals (CIs) for the weeks 4 through 7 evaluation were 4.96 (95% CI, 2.66-9.22) for the 0.5-mg group and 5.86 (95% CI, 3.16-10.90) for the 1.0-mg group; for the weeks 9 through 12 evaluation, 6.32 (95% CI, 3.47-11.50) and 8.07 (95% CI, 4.42-14.70), respectively.

Conclusion

- ▶ *Varenicline tartrate , 0.5 mg and 1.0 mg twice daily, is efficacious for smoking cessation.*

Crossover Trial

- ▶ Definition (Chow & Liu): Modified randomized block design in which each block receives more than one treatment at different dosing periods.
- ▶ Simplest case: each participant is randomized to receive 2 treatments, A and B, in the order AB or BA.
- ▶ Between the 2 treatments, there is a washout period.

Crossover Trial

▶ Advantages

- Each participant serves as his or her own control
- Removes inter-patient variability from the comparison of treatments
- Therefore, requires a smaller sample size than a parallel groups design

▶ Disadvantage

- Have to worry about carryover between treatments
 - Carryover effects may not be equal
- Vulnerable to dropouts

Higher Order Crossover Designs

- ▶ Definition (Chow & Liu):
 - Number of periods $>$ number of treatments
 - Two-sequence dual (extra period) design: ABB, BAA
 - Doubled (replicated) design: AABB, BBAA
 - Number of sequences $>$ number of treatments
 - Balaam's design: AA, BB, AB, BA
 - Both
 - Four-sequence design: AABB, BBAA, ABBA, BAAB
- ▶ These designs allow estimation of carryover effects and intra-patient variability

Crossover Trial

- ▶ Example: Randomized double blind trial of dark chocolate/cocoa snack vs. control snack in overweight people aged 40–64 (n=30)
- ▶ 2 periods, 4 weeks each, with 2-week washout period
- ▶ Outcomes: large & small blood vessel dilatation, peripheral blood flow, arterial stiffness
- ▶ Comparison: Active vs. control & baseline

West et al., British Journal of Nutrition 2014; 111:653–61

Data Analysis

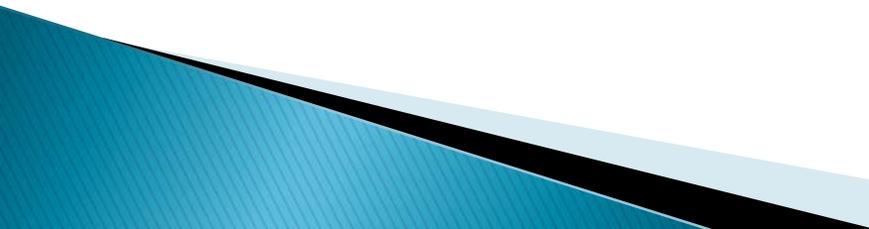
- ▶ Initial model
 - Fixed effects: treatment (baseline, active, control), period, treatment X period interaction
 - Random effect: participant
 - ▶ Treatment X period was not statistically significant
 - ▶ Some models included treatment X sex interaction
 - ▶ Tukey's post-hoc tests for multiple comparisons
- 

Table 4: Results

	Pre-treatment‡		Control§		Active§	
	Mean	SE	Mean	SE	Mean	SE
Ultrasound measurements						
Basal arterial diameter (mm)	4.20***	0.17	4.21***	0.17	4.47	0.17
Peak arterial diameter (mm)	4.39***	0.18	4.42***	0.18	4.65	0.18
FMD (% change)	4.73	0.41	5.12	0.44	4.25	0.44
Doppler-derived measures						
Basal flow volume (ml/s)	166**	18	176*	18	214	18
Peak flow volume (ml/s)¶	1059*	76	1032*	77	1153	77
Reactive hyperaemia (% change)††	612*	37	567	39	503	39
EndoPAT variables						
RHI	2.26	0.14	2.19	0.12	2.20	0.11
fRHI	0.60	0.09	0.55	0.08	0.49	0.07
AI‡‡	9.92**	3.9	5.90**	3.6	-0.57	3.5
AI at 75 bpm§§	2.75**	3.9	-2.72**	3.6	-8.53	3.5
Anthropometrics						
Weight (kg)	80.9	2.3	80.7	2.3	81.3	2.3
BMI (kg/m ²)	27.4	0.5	27.5	0.5	27.7	0.5
Waist circumference (cm)	94.6	1.2	94.7	1.2	95.5	1.2
Hip circumference (cm)	106.8	0.9	106.9	0.9	106.9	0.9
Waist:hip ratio	0.89	0.01	0.89	0.01	0.89	0.01

Mean values were significantly different from those of the active group: * $P \leq 0.05$, ** $P \leq 0.01$, *** $P \leq 0.001$.

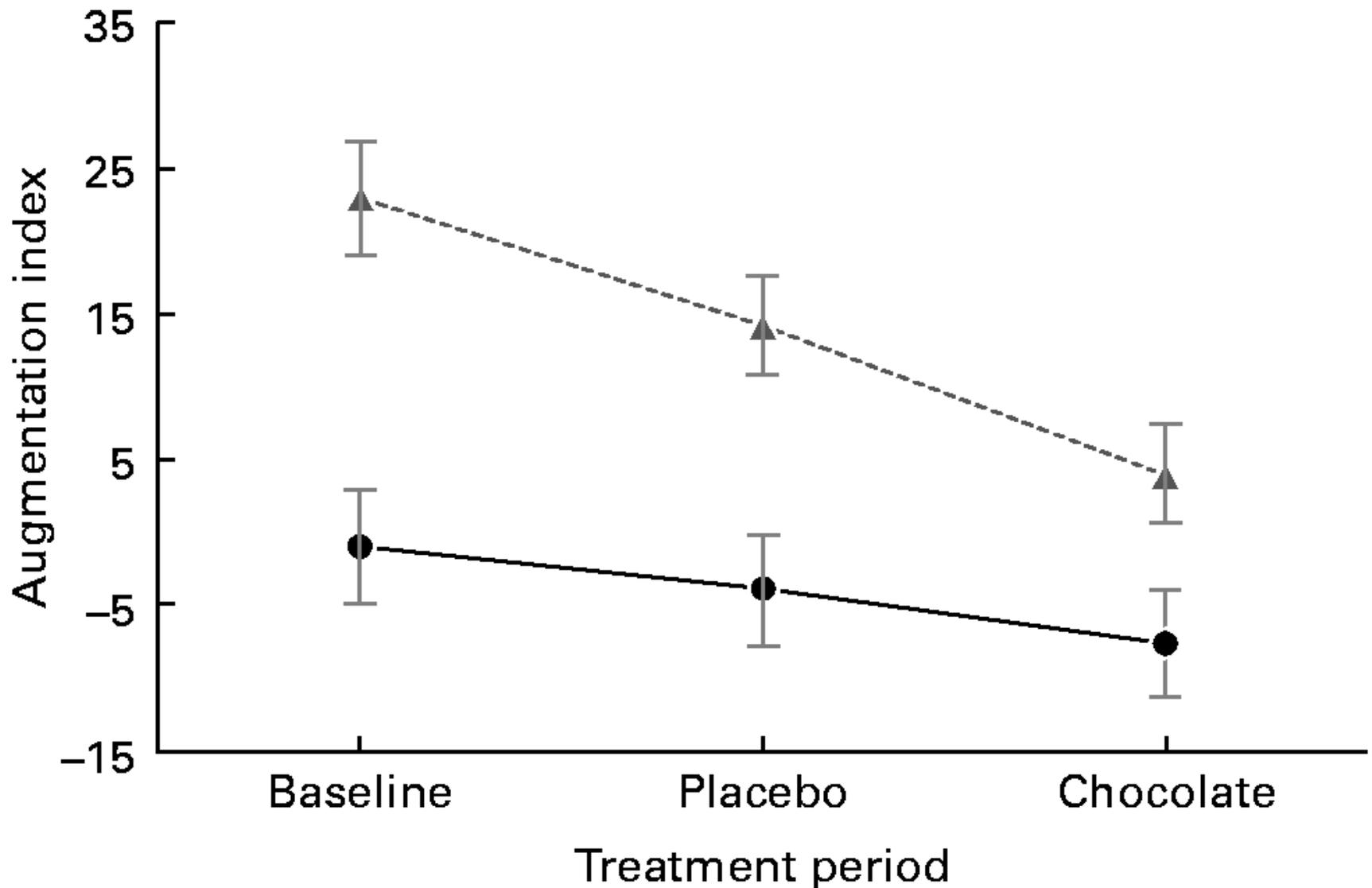


Fig. 1 Sex difference in vascular response to the cocoa+dark chocolate treatment. Women (●) exhibited significant reductions in the augmentation index, whereas men (▲) did not (sex × treatment interaction, $P = 0.01$).

2-Period 2-Treatment Crossover Trial: Outcome by Sequence & Period

Sequence	Period 1	Period 2
AB	Y_A	Y_B
BA	Y_B	Y_A

Simplifying Assumptions

- ▶ $H_0: \mu_B = \mu_A; H_a: \mu_B \neq \mu_A$
- ▶ Specify $\mu_B - \mu_A = \delta$
(difference in treatment effects)
- ▶ No sequence or period effect: paired t-test comparing treatment B with treatment A over the entire sample
 - Specify $SD = \sqrt{2} * (\text{within-person } SD) = SD(Y_B - Y_A)$
 - Or specify $SD(Y_B)$, $SD(Y_A)$, and $\text{corr}(Y_A, Y_B)$

One Arm Normal

One Arm Normal is a program to calculate either estimates of sample size or power for one sample normal problem.

User Input

Program Output

Select Calculation and Test Type

- Sample Size
- Power

- 1 Sided
- 2 Sided

Select Hypothesis Test Parameters

Null Mean

Alternative Mean

Standard Deviation

Alpha

0

1

1.414

0.05

Power

Sample Size

0.9

22

Calculate

Within-person SD=1

Crossover Trial vs. Parallel Group Sample Size

- ▶ For a given
 - difference in treatment mean responses $\mu_B - \mu_A = \delta$
 - treatment response variance $\text{Var}(Y)$
 - (between-person plus within-person)
 - levels of type I & II error

$$\frac{n_{\text{crossover}}}{n_{\text{parallel}}} = 0.5 * [1 - \text{corr}(Y_B, Y_A)]$$

- Even if there is no within-person correlation, the crossover trial requires half the sample size
- The greater the correlation, the greater the reduction in sample size

Selecting a Design

- ▶ Need to consider (Chow & Liu)
 - Number of treatments to be compared
 - Characteristics of the treatment
 - Study objectives
 - Availability of participants
 - Inter- and intra-person variability
 - Duration of the study
 - Dropout rates
- 

Considerations

- ▶ If intra-patient variability \geq inter-patient variability, parallel groups preferred to crossover
- ▶ If inter-patient variability is large and the number of treatments is small, consider a cross-over design
 - However, disease state must be stable