



Shaping the Future of
Drug Development

Novel designs in early phase Oncology studies

Swapna Deshpande

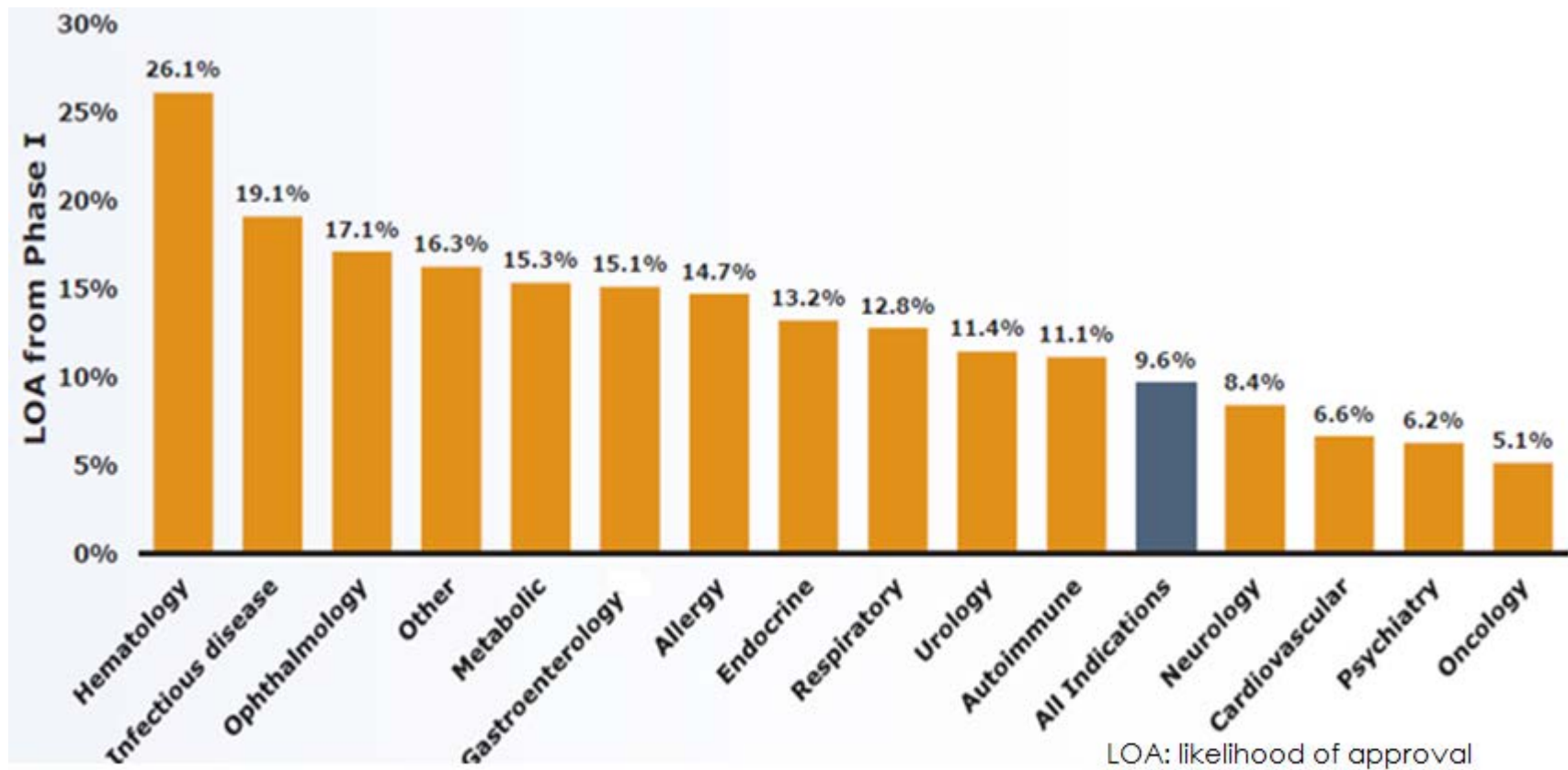
PhUSE-SDE
3rd Dec 2016
Mumbai

Agenda

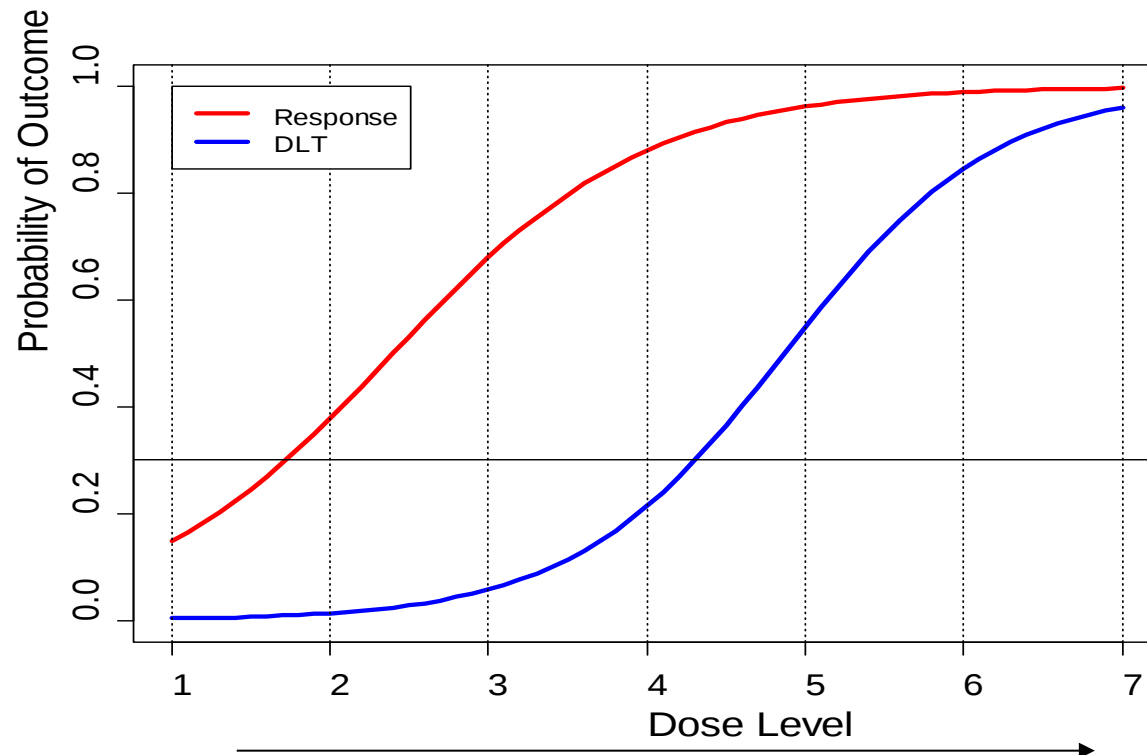
- Background - Dose escalation studies
- Challenges
- Dose escalation study designs
 - Rule based
 - Model based
- Bayesian Logistic Regression (BLR) design
 - Case study
 - Interpretation of results
- Highlights

Dose Escalation Studies

- Success rate of journey from phase I to FDA approval for Oncology drug molecule is the lowest (5.1% over timeframe 2006-2015)*



Dose Escalation Study- Oncology



Based on Presumption:
Efficacy and toxicity both increase with dose

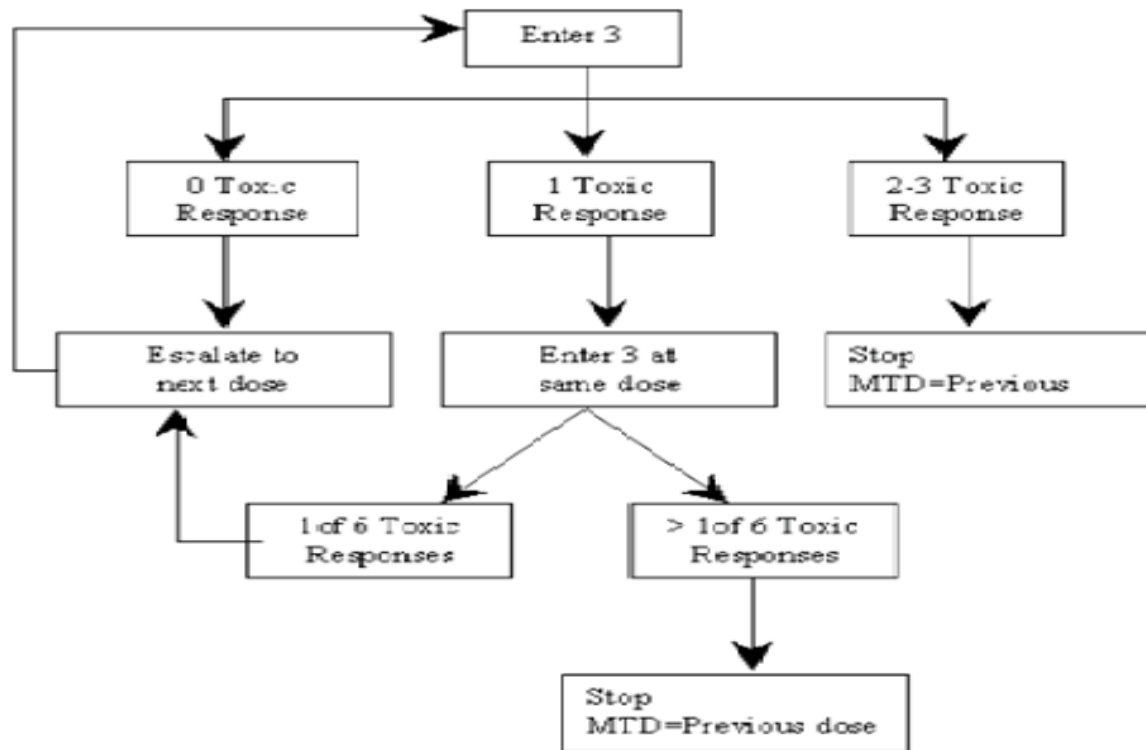
Challenges: Dose Escalation Studies

- Investigational drug is examined in diseased patients; often suffering from advanced cancer
- Inability to distinguish between toxicity due to condition and toxicity due to drug
- Minimize the number of patients exposed to sub-therapeutic doses as well control severely toxic overdosing
- Use all available data efficiently
- Precisely estimating the MTD

Dose Escalation Study Designs

- Multiple approaches are proposed using DLT as the primary endpoint.
 - Rule-based designs
 - Utilize dose-escalation/de-escalation rules
 - Based on actual observations of target events (DLT) to assign patients to dose level
 - E.g. 3+3 design, accelerated titration design
 - Model-based designs
 - Estimate the MTD by estimating the dose-toxicity relationship
 - E.g. continual Reassessment Method (CRM), Bayesian Logistic Regression Model (BLRM), Escalation with overdose control (EWOC), modified Toxicity Probability Interval (mTPI)

Rule Based Design: 3+3 Study



- Pre specify a set of doses to consider, usually between 3 and 10 doses
- MTD is defined as the maximum dose at which fewer than one-third ($< 33\%$) of subjects experience a DLT

Rule Based Design: 3+3 Study



- Most popular and widely used, costless implementation in practice
- Fixed cohort design
- Short memory, algorithm makes the decision
- Only recent cohort information and ignores data from earlier patients

Model Based Design: Bayesian Logistic Regression Model

- Described by Neuenschwander et al. (2008)
- Inference: Bayesian
- Based on a dose- toxicity model ~ 2 parameter logistic regression
- Prior: Based on historical data
- Posterior Distribution: Gather DLT data (binary) for each patient. Update the dose-toxicity rate model
- Following are intervals for probability of toxicity (DLT)
 - Under dosing toxicity: (0, 0.2]
 - Targeted toxicity: (0.20, 0.35]
 - Excessive toxicity: (0.35, 0.60]
 - Unacceptable toxicity: (0.60, 1.00]

Dose Recommendation Using BLRM



- Posterior probability is calculated for all candidate doses
- The recommended dose is the one which maximizes the probability of being in targeted toxicity, while controlling the probability of excessive or unacceptable toxicity at 25%
 - Priority No. 1: target toxicity window
Dose should maximize chance that DLT rate $\in (20\%, 35\%)$
 - Priority No. 2: overdose control
Dose must have $< 25\%$ risk that DLT rate is $> 35\%$
- BLRM implements the concept of escalation with overdose control

Case Study

First-in-human – Phase I Dose Escalation Study



Primary Objectives

- Evaluate the safety and tolerability of investigational drug in adult subjects with relapsed adenocarcinoma
- Determine the maximum tolerated dose (MTD) and/or biologically active dose (e.g. recommended phase 2 dose)

Study Design

- Multi-center, open-label, dose-escalation study

Study has 2 parts

Dose-escalation:

- The dose-escalation will define the MTD, safety, tolerability, pharmacokinetic (PK) and pharmacodynamics (PD) of study drug

Dose-expansion:

- Dose-expansion will enroll additional subjects to gain further clinical experience with study drug

A final estimate of the recommended phase 2 dose will be based on BLRM using all subjects from dose escalation and expansion cohorts

Dose Escalation Phase

- Dose levels : 200, 400, 800, 1600, 3200, and 6400, 12800 $\mu\text{g}/\text{day}$
- 3-6 subjects per cohort
- Dose decision analyses performed after every cohort
 - Recommendation for subsequent doses is based on Bayesian model, the next dose is the one with
 - The highest probability of being in target interval (0.20, 0.35)
 - With a less than 0.25 probability of an excessive or unacceptable target interval
- Can incorporate intermediate dose levels
- The Dose Level Escalation Meeting is planned for dose level decisions

Data for Ongoing Escalation Study

	Doses							
	200	400	800	1600	1600	3200	6400	12800
No. of patients	3	3	3	3	3	4	3	3
No. of DLTs	0	0	0	1	0	0	0	1

Inputs for Running BLRM

- Planned doses : 200, 400, 800, 1600, 3200, 6400 and 12800
- Intermediate doses : 4800, 9600
- Input data : subj dose response
- BLRM_Int : (0.2 0.35 0.60)
- BLRM_cut : (0 0.25 0.25)

Modeling after 1600 µg cohort		
No of Subject	Dose	Response (DLT)
3	200	0
3	400	0
3	800	0
6	1600	1

Results



Dose	Prob (Target Toxicity)	Prob (Over dosing)	Centiles of probability of target toxicity		
	0.20-0.35	0.35-1	2.5%	50%	97.5%
200	0.0024	0	0.000084	0.0112	0.1121
300	0.0047	0	0.000216	0.0168	0.1307
400	0.0072	0.001	0.000411	0.0225	0.1473
600	0.0151	0.0006	0.000981	0.0337	0.1790
800	0.0269	0.0012	0.00169	0.0445	0.2051
1600	0.1143	0.0131	0.00694	0.0870	0.3103
3200	0.2711	0.1247	0.0221	0.1644	0.5093
4800	0.2998	0.27	0.0354	0.2305	0.6570
6400	0.2850	0.389	0.0459	0.2876	0.7613
9600	0.2344	0.5446	0.0611	0.3781	0.8709
12800	0.1944	0.6372	0.0736	0.4508	0.9247

Recommendation & Dose Level Review Meet

- Next recommended dose is 3200 $\mu\text{g}/\text{day}$
 - with probability of target toxicity interval as 0.2711
 - with overdosing control as 0.1247 (<0.25%)
- Statistician informs the highest dose level one may escalate to as per statistical analysis
- Participants of Dose level escalation meet decide if synthesis of relevant clinical data justifies a dose escalation and to which dose (highest supported by the Bayesian analysis and protocol)

Highlights



- Next recommended dose is determined based on toxicity responses of all patients previously treated in the trial
- Evaluate intermediate doses in the trial
- Model tries to limit chances of overdosing
- Patient safety is the primary objective
 - Model quantifies knowledge about toxicity (DLT) data
 - Statistical inference serves as one component of a decision-making framework

Reference

- Cancer Phase I Clinical Trials: Efficient Dose Escalation With Overdose Control. *James Babb1 et al. Statist. Med. 17, 1103-1120 (1998)*
- Critical aspects of the Bayesian approach to phase I cancer trials. Neuenschwander, Beat, Michael Branson, and Thomas Gsponer. *Statistics in medicine 27.13 (2008)*
- A Bayesian case study in oncology phase I combination dose-finding using logistic regression with covariates. *B Neuenschwander et al. Journal of Biopharmaceutical Statistics, 19:369-484 (2009)*
- Phase 1 Trial Design: Is 3+3 the Best? *A Hansen et.al. cancer control. Vol 21 (2014)*

Thank-You

Contact Author: Swapna Deshpande
swapna.deshpande@cytel.com