

Continual Reassessment Method for Partially Ordered Groups

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Outline of Talk

- ▶ Background on methods for groups
- ▶ Proposed method for partially ordered groups
- ▶ Simulation study

Existing methods

- ▶ The proposed method is extension of the 2 group shift model
 - ▶ O'Quigley and Paoletti (2003)
 - ▶ O'Quigley and Iasonos (2014)
- ▶ Phase I design for completely or partially ordered treatment schedules
 - ▶ Wages, O'Quigley, Conaway (2014)
- ▶ Partially ordered groups
 - ▶ Conaway (2017)

Example of a group trial

- ▶ Dose-finding and pharmacokinetic study to optimize the dosing of irinotecan according to the UGT1A1 genotype of patients with cancer.
 - ▶ Innocenti et al. (2014)
 - ▶ Three patient groups defined by $*1/*1$, $*1/*28$, and $*28/*28$ genotypes
 - ▶ Greatest DLT risk associated with the $*28/*28$ genotype
 - ▶ Individual group trials implemented using a modified 6+6 design
 - ▶ MTD selection followed known ordering information (no reversals)

Reversals in individual trials by group

Group	Grp Identity	MTD Selection				
		All too toxic	1	2	3	4
1	less frail	✓				
2	less frail				✓	
3	most frail					✓

- ▶ Reversal of magnitude 4 between groups 1 and 3
- ▶ Reversal of magnitude 1 between groups 2 and 3

- ▶ What is the final MTD decision for each group?

Process of choosing skeletons

- ▶ Skeleton values of length 7 generated with `getprior` function in the `dfcrm` package
 - ▶ 4 doses and potential shift of 3 dose levels
 - ▶ skeleton values: 0.10, 0.19, 0.30, 0.42, 0.54, 0.64, 0.73
- ▶ Multiple skeletons generated to allow for different shift patterns

Group	Grp Identity	1	2	3	4
3	most frail	0.10	0.19	0.30	0.42
2	less frail	0.10	0.19	0.30	0.42
1	less frail	0.10	0.19	0.30	0.42

No dose level shifts

Process of choosing skeletons

Dose level shifts of 1, 2, and 3 for Group 3

Group	Grp Identity	1	2	3	4
3	most frail	0.19	0.30	0.42	0.54
2	less frail	0.10	0.19	0.30	0.42
1	less frail	0.10	0.19	0.30	0.42

Group	Grp Identity	1	2	3	4
3	most frail	0.30	0.42	0.54	0.64
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Process of choosing skeletons

Dose level shifts of 1 and 2 between the groups

Group	Grp Identity	1	2	3	4
3	most frail	0.30	0.42	0.54	0.64
2	less frail	0.19	0.30	0.42	0.54
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Process of choosing skeletons

- ▶ 16 skeletons generated to allow for different shift patterns
- ▶ Use one parameter power model as a working model for the probability of toxicity for each group and dose level
- ▶ Select the skeleton that maximizes the likelihood
- ▶ Within groups, identify the dose with probability of toxicity closest to the target

First stage considerations for Partially Ordered Groups

- ▶ Patient group order is random
- ▶ A "less frail" (groups 1 and 2) patient can receive the highest dose observed +1
- ▶ A "most frail" (group 3) patient can receive the highest dose observed among patients in group 3 +1

Patient	Group	Grp Identity	Dose	DLT
1	3	most frail	1	no
2	2	less frail		
3	2	less frail		
4	3	most frail		
5	1	less frail		
⋮	⋮	⋮		

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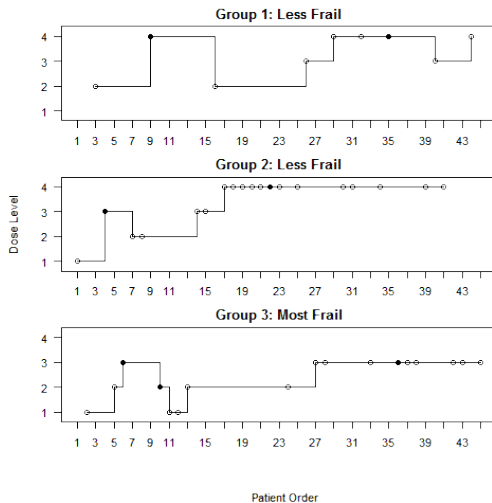
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4	3	most frail	2	no
5	1	less frail	4	yes

End stage 1. Begin modeling.

Individual trial

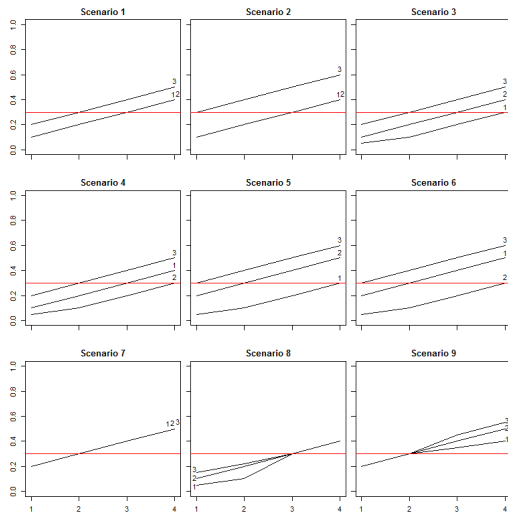


Simulation setup

- ▶ 3 groups
 - ▶ Group 3 has greatest DLT risk
 - ▶ Unknown order between groups 1 and 2
- ▶ 4 dose levels
- ▶ Target DLT rate, $\theta = 0.3$
- ▶ 1,000 simulated trials
- ▶ Sample size of 45 overall
 - ▶ Group sizes are random
- ▶ Same simulated data used for both methods

Dose-toxicity curves

- ▶ 9 scenarios considered



Comparisons to be made

- ▶ Dose finding methods
 - ▶ Proposed CRM for partially ordered groups
 - ▶ Individual CRM trials by group
- ▶ Method of comparison
 - ▶ Reversals
 - ▶ Percentage of correct selection (PCS)
 - ▶ Accuracy index (AI) (Cheung, 2011)
 - ▶ For dose selection and subject allocation

Reversals

- ▶ CRM for partially ordered groups cannot have reversals
- ▶ Individual trials by group can have reversals
 - ▶ May observe 0 to 2 reversals
 - ▶ Magnitude of reversal ranges from 1 to 4 dose levels

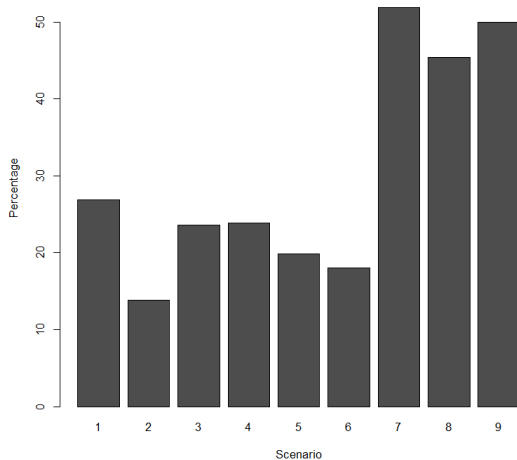
Reversals in individual trials by group

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- ▶ Reversal of magnitude 4 between groups 1 and 3
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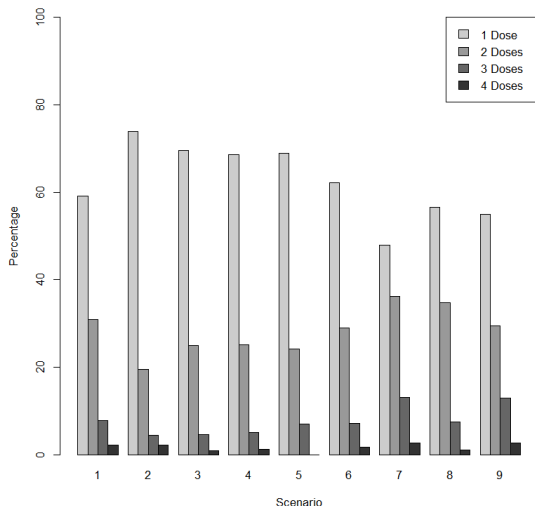
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Reversals in individual trials by group



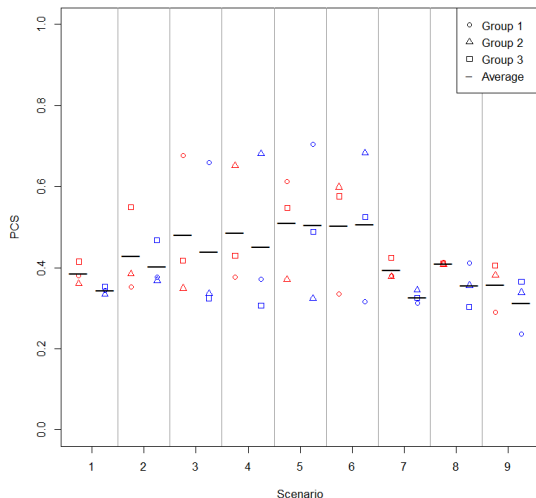
- ▶ Scenarios 2 - 6
- ▶ More distance between true group MTDs
- ▶ Scenarios 7 - 9
- ▶ All groups have same true MTD

Reversals in individual trials by group



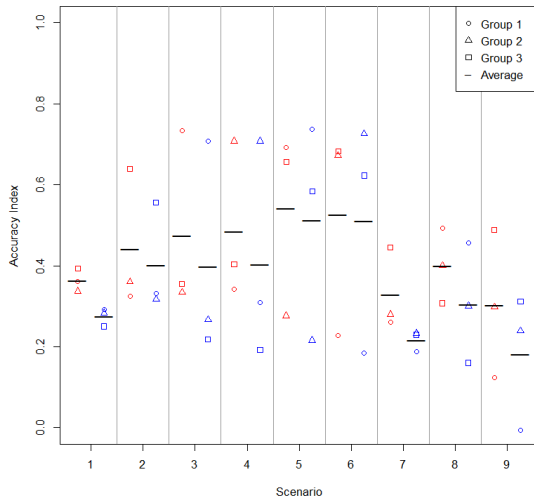
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Percentage of correct selection



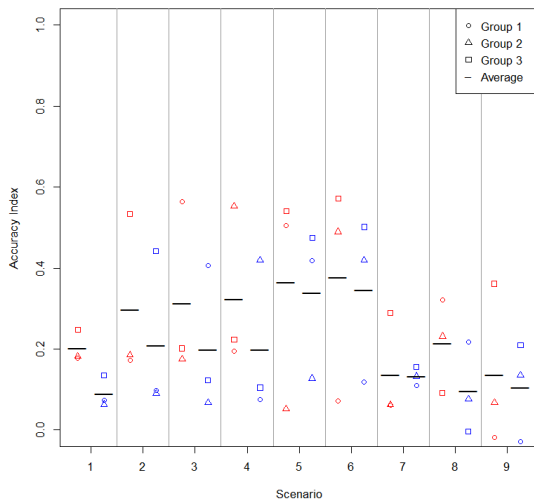
- ▶ Scenarios 2 - 4
- ▶ Max. shift of 2 dose levels
- ▶ Scenarios 5 - 6
- ▶ Max. shift of 3 dose levels
- ▶ Scenarios 7 - 9
- ▶ All groups have same true MTD

Accuracy index for dose selection



- ▶ Scenarios 2 - 4
- ▶ Max. shift of 2 dose levels
- ▶ Scenarios 5 - 6
- ▶ Max. shift of 3 dose levels
- ▶ Scenarios 7 - 9
- ▶ All groups have same true MTD

Accuracy index for subject allocation



- ▶ Scenarios 2 - 4
- ▶ Max. shift of 2 dose levels
- ▶ Scenarios 5 - 6
- ▶ Max. shift of 3 dose levels
- ▶ Scenarios 7 - 9
- ▶ All groups have same true MTD

Dose-toxicity curves

- ▶ Limited options with partially ordered groups
- ▶ Reversals are a common problem when using independent trials by group
 - ▶ Creates a need for additional decision rules
 - ▶ Ignoring reversals is not a good option
- ▶ PCS and AI have better properties for the proposed CRM for partially ordered groups