

# Population Enrichment – The Future of Drug Discovery

Ankur Mukherjee, Cytel  
Pune, India  
ankur.mukherjee@cytel.com

## Background

**Population Enrichment** is prospective use of any patient characteristic to obtain a study population in which detection is more likely than it would be in an unselected population.

### Types of Population Enrichment:

- **Decrease Heterogeneity** (Recruiting from homogenous population based on certain characteristic)
- **Prognostic Enrichment** (Identifying high risk patients based on biomarkers)
- **Predictive Enrichment** (Identifying patients more likely to respond)

### Issues:

- Cost of clinical trials is increasing.
- Discovery of blockbuster drugs is on the decline. Slowly moving away from one size fits all idea.
- High failure rate of molecules (90%). Rate even lower in major diseases.

### Importance:

- Enrichment can help identifying high responsive group, which can help detecting treatment effect with lower sample size.
- Most importantly a drug can work in a subpopulation, failed molecules from one study may succeed in a different group.

### Examples:

- **Opdivo** failed as a immunotherapeutic drug in lung cancer study by **BMS** where as **Merck** competitor **Keytruda** succeeded. Merck enriched their study population by including only patients with **high level of PDL-1**.
- **ISPY2** trial identified different combination therapies across different biomarker (genetic) subgroups.

## Method and Assumptions

- The method is based on **predictive enrichment**.
- The study population is divided into two populations (subpopulation and complement) based on a predefined biomarker.
- Study will happen in two independent cohorts. The first cohort will recruit from the full population. The recruitment of the second cohort will depend upon an interim analysis based on the first cohort data only.
- Based on the interim analysis it will be decided whether to continue with the full population, sub population or to stop the trial for futility.
- The subpopulation prevalence will be user specified and accrual will depend upon this quantity.

## Motivating example

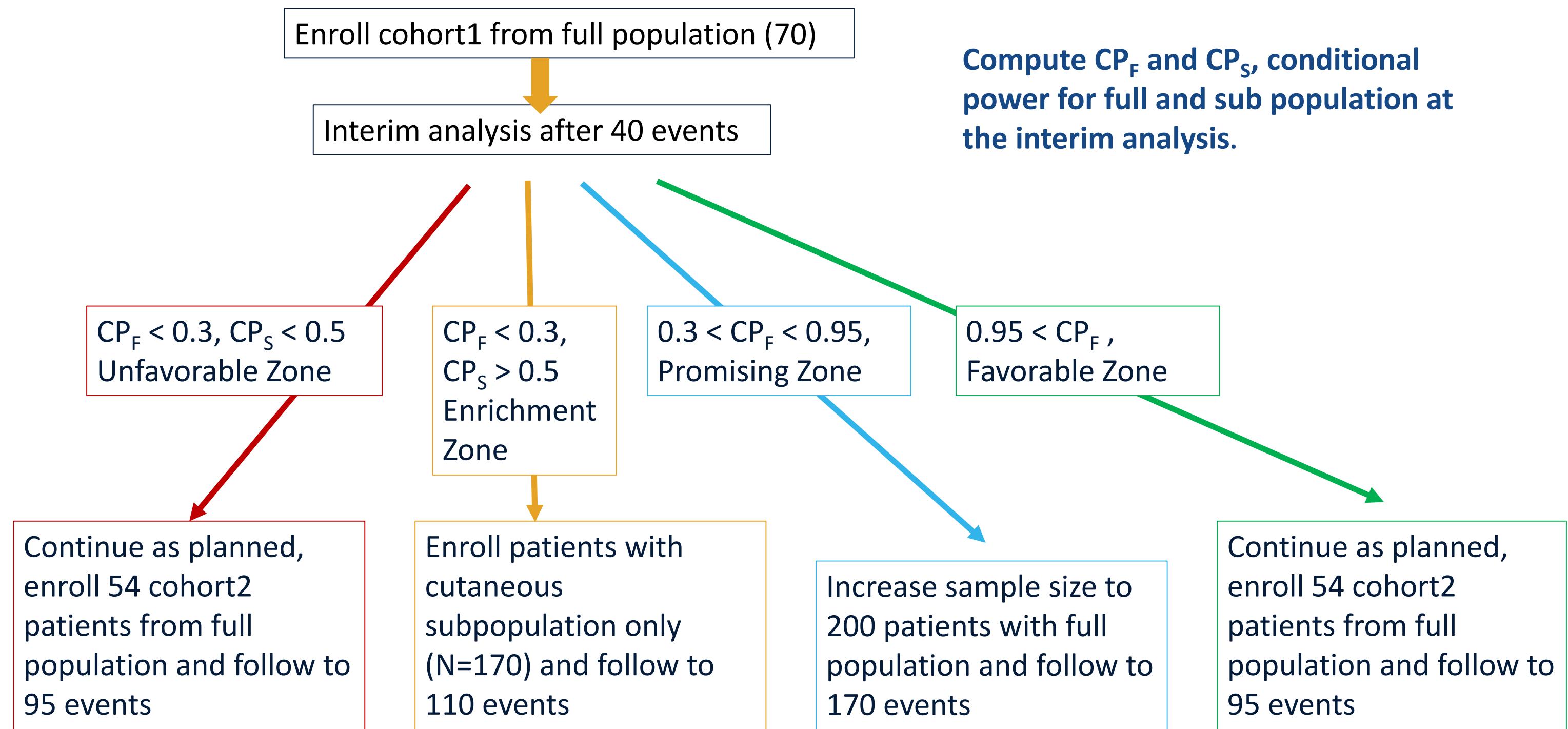
- The study is for **angiosarcoma** (AS) – cancer of inner lining of blood vessels.
- A two arm randomized trial with **single agent pazopanib and pazopanib +TRC105** in patients with unresectable angiosarcoma.
- Randomized 1:1, stratification cutaneous (sub population of interest) vs non-cutaneous , prevalence = 0.5.

### Eligibility Criteria:

- Advanced **cutaneous and non-cutaneous** angiosarcoma (AS) not amenable to curative intent surgery
- Measurable disease by RECIST 1.1
- No prior treatment with a VEGF inhibitor
- 0, 1, or 2 prior lines of therapy
- ECOG  $\leq 1$

## Adaptive Design Based On Interim Analysis

- Cohort 1 70 patients from full population. Interim analysis after 40 events are observed.
- Cohort 2 initial sample size 54
- 60 total events from cohort 1 and 35 from cohort 2.



## Simulations Scheme

- Pazopanib (control) median survival = 4 months
- Hazard ratio cutaneous sub group = 0.55
- Hazard ratio non cutaneous sub group will be taken as (0.55, 0.7, .85, 1)
- Type I error = 0.025

## Inputs

Type I Error ( $\alpha$ ):

Rejection Region:

Subpopulation Prevalence:

Allocation Ratio ( $n_t/n_c$ ):

Subjects are followed:

Cohort #	Sample Size	# of Events	
		Total	At IA
Cohort 1	70	60	40
Cohort 2	54	35	

Adaptation Parameters in Promising Zone			
	Total	Coh1	Coh2
Maximum Sample Size if Adapt:	<input type="text" value="200"/>	<input type="text" value="70"/>	<input type="text" value="130"/>
Maximum # of Events if Adapt:	<input type="text" value="170"/>	<input type="text" value="60"/>	<input type="text" value="110"/>
Target CP for Re-estimating Events:	<input type="text" value="0.95"/>		
Promising Zone	Lower CP:	<input type="text" value="0.3"/>	
	Upper CP:	<input type="text" value="0.95"/>	
Accrual Rate after Adaptation:	<input type="text" value="No change"/>		

Survival Information			
Input Method: <input type="text" value="Median Survival Times"/>			
Subpopulation			
Piece #	Med.Surv.Time Control	Med.Surv.Time Treatment	Hazard Ratio
1	4.000	7.273	0.550

Complement			
Piece #	Med.Surv.Time Control	Med.Surv.Time Treatment	Hazard Ratio
1	4.000	4.706	0.850

Adaptation Parameters in Enrichment Zone			
	Total	Coh1	Coh2
Maximum Sample Size of Enriched Subgroup:	<input type="text" value="135"/>	<input type="text" value="35"/>	<input type="text" value="10"/>
Maximum Events of Enriched Subgroup:	<input type="text" value="110"/>	<input type="text" value="35"/>	<input type="text" value="7"/>
Enrich if $CP\_F < 0.3$ & $CP\_S \geq$	<input type="text" value="0.5"/>		
Terminate for Futility if $CP\_F < 0.3$ & $CP\_S <$	<input type="text" value="0.1"/>		
Target CP for Re-estimating Events:	<input type="text" value="0.95"/>		
Minimum # of Events from Subgroup:	<input type="text" value="58"/>		
Accrual Rate after Enriched:	<input type="text" value="No change"/>		
Note: Cohort1 and Cohort2 events contain average estimates.			

## Table: Simulation Outputs

\* Fixed sample design shown in parenthesis

HR Cutaneous, Non Cutaneous	Zone	Prob. Of Zone	Power	Average Study Duration	Average Sample Size
0.55, 0.55	Unfavorable	16	34	21	124
	Enrich	3	84	25	162
	Promising	39	93	30	197
	Favorable	42	93	22	124
	Total	100	81 (97)	25 (25)	154 (200)
0.55, 0.7	Unfavorable	24	25	20	124
	Enrich	7	88	25	161
	Promising	37	85	30	197
	Favorable	19	88	21	124
	Total	100	71 (86)	24 (25)	156 (200)
0.55, 0.85	Unfavorable	31	18	20	124
	Enrich	12	84	24	157
	Promising	38	79	29	197
	Favorable	19	82	20	124
	Total	100	61 (66)	24 (25)	155 (200)
0.55, 1	Unfavorable	36	15	19	124
	Enrich	18	84	24	155
	Promising	34	76	29	197
	Favorable	12	76	20	124
	Total	100	56 (43)	24 (25)	154 (200)

## Discussion

- Compared to a fixed sample design of 200 patients, the adaptive design provides for greater power, smaller trial size and shorter duration
- The adaptive design maintains over 80% power in the favorable, promising and enrichment zones at the hazard ratio of 0.55 for the cutaneous subgroup even with larger hazard ratios in the non-cutaneous subgroup
- In this rare disease a trial that starts out small but adapts the sample size and patient population as needed, based on interim data from the trial itself, is preferable to a larger 200 patient fixed sample trial

## Reference

- Jones, RJ, et al. TAPPAS: An Adaptive Enrichment Phase 3 Trial of TRC105 And Pazopanib versus Pazopanib alone in Patients with Advanced AngioSarcoma (AAS). American Society for Clinical Oncology annual meeting, 2017
- Mehta, C., & Pocock, S. (2011). Adaptive increase in sample size when interim results are promising: A practical guide with examples. Statistics in Medicine, 30(28), 3267-3284
- Jenkins M, Stone A, Jennison CJ. An adaptive seamless phase II/III design for oncology trials with subpopulation selection using correlated survival endpoints. Pharmaceutical Statistics, 2010. On-line version, DOI: 10.1002/pst.472.