

# Bayesian Adaptive Design for a Practice-Changing Platform Trial in a Rare Paediatric Cancer: **The Glo-BNHL Trial**

Lucinda Billingham

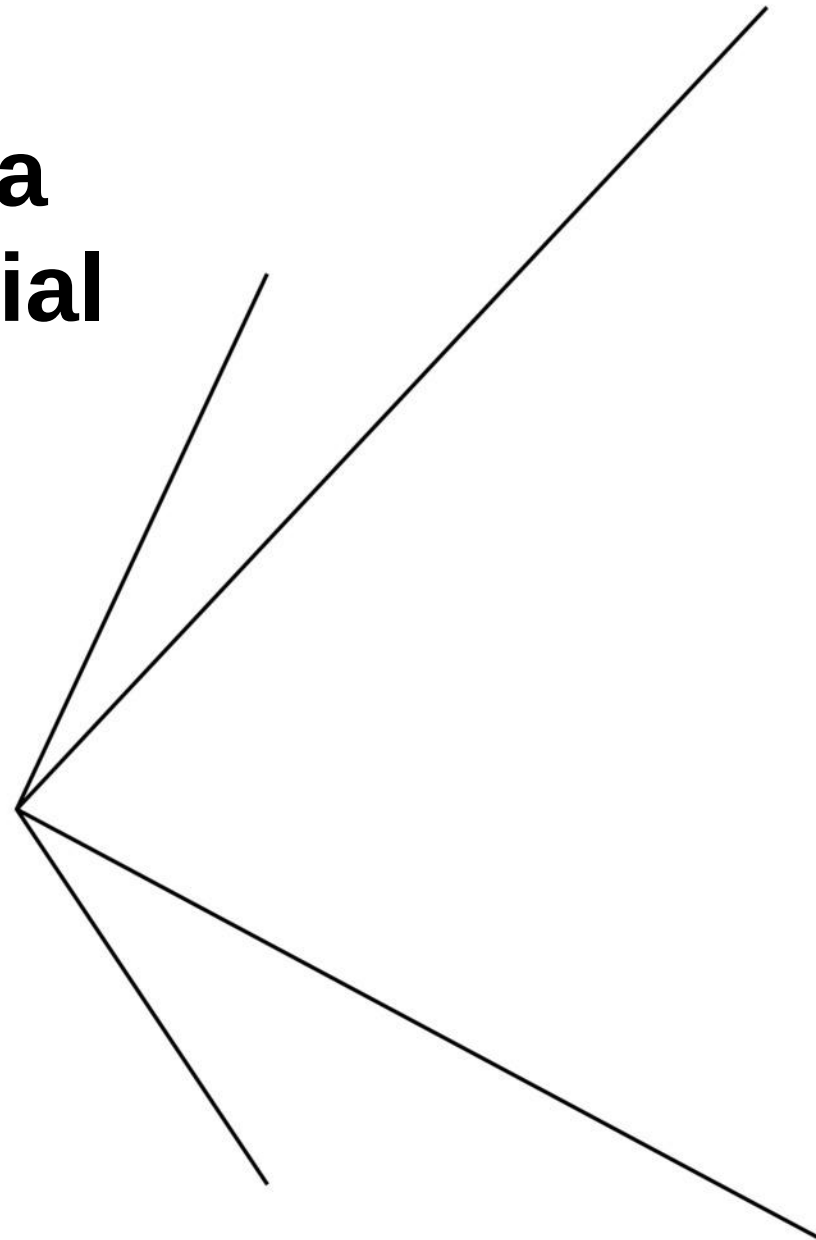
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# GIO-BNHL

## A Global Study of Novel Agents in Paediatric and Adolescent Relapsed and Refractory B-cell Non-Hodgkin Lymphoma (B-NHL)

**Chief Investigator:** Professor Amos Burke

**Lead Biostatistician:** Professor Lucinda Billingham

**Trial Biostatisticians:** Shanna Maycock, Jiayi Wang

**Sponsor:** University of Birmingham

**CTU:** Cancer Research UK Clinical Trials Unit



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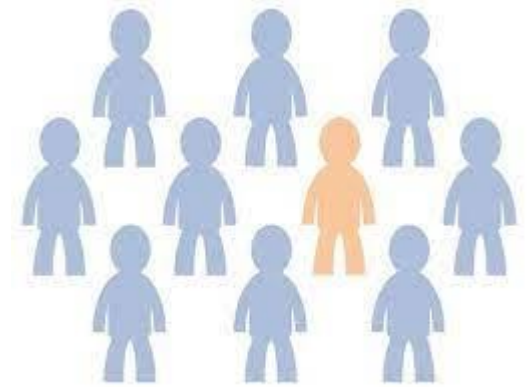
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# The Clinical Need for the Trial

- Population: Relapsed/refractory mature B-NHL
  - heterogeneous: histology and prior therapies received
- Estimated that ~30 patients per year could realistically be recruited to trials from this population globally (Europe, North America and Australasia)
- Rare population with a number of promising novel agents to be tested
- Trials should limit the exposure of children, adolescents and young adults to potentially harmful and/or ineffective therapies



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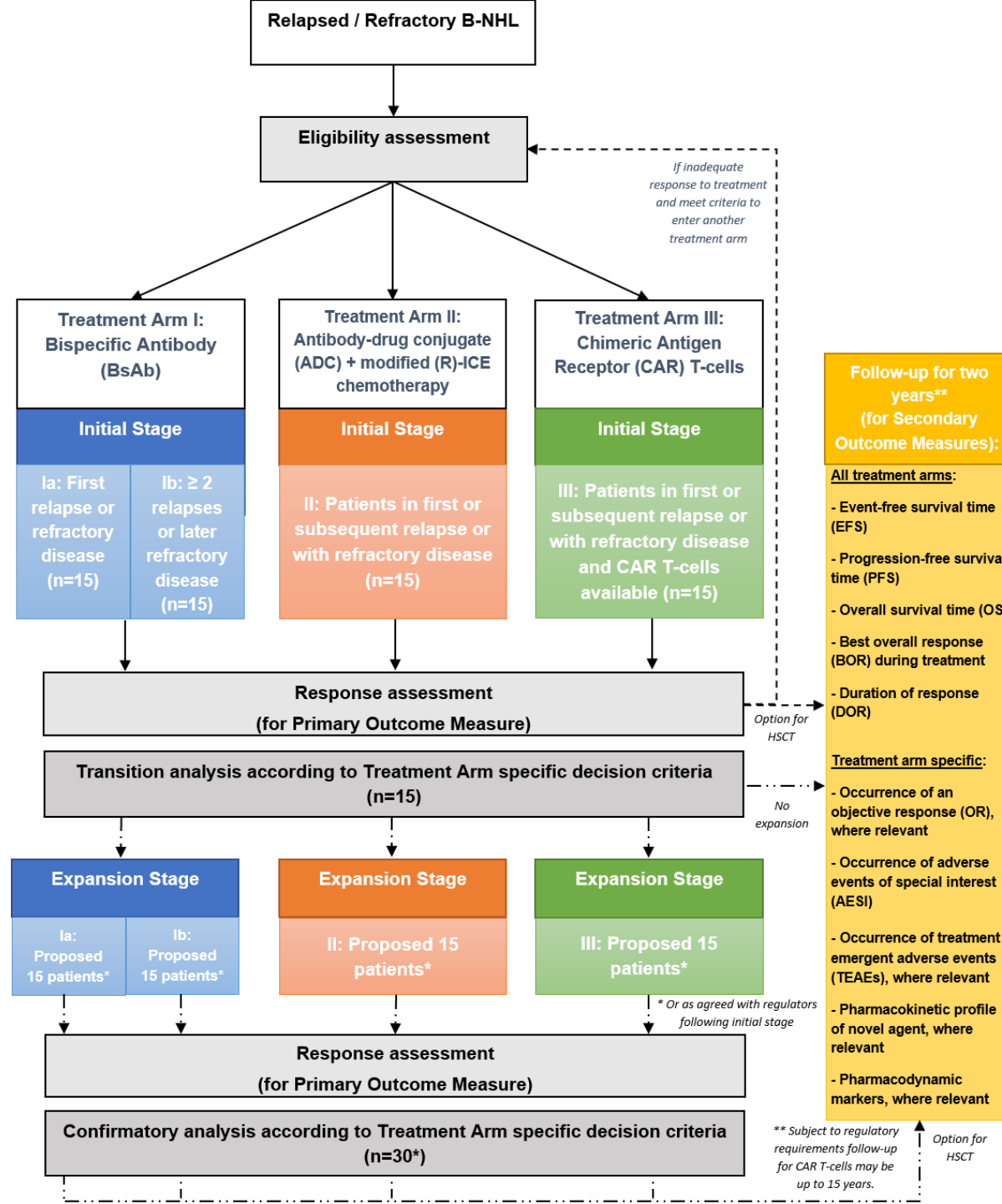
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# The Platform Trial Design

- 3 treatment arms (4 cohorts) being independently evaluated
- Expanding to include further treatment arms
- No control arms – evaluation based on single arm designs
- Overarching two-stage design common to all treatment arms but with some treatment arm specific criteria



# Trial Design: Treatment Arm Specific Criteria

|                                    | Treatment Arm Ia                           | Treatment Arm Ib                  | Treatment Arm II                                                 | Treatment Arm III                                |
|------------------------------------|--------------------------------------------|-----------------------------------|------------------------------------------------------------------|--------------------------------------------------|
| Population                         | 1 <sup>st</sup> Relapse / refractory B-NHL | B-NHL in >1 <sup>st</sup> relapse | B-NHL in 1 <sup>st</sup> or higher relapse or refractory disease | Insufficient response from prior relapse therapy |
| Intervention                       | BsAb                                       | BsAb                              | ADC + R-ICE                                                      | CAR T                                            |
| Primary outcome measure            | Objective Response (OR)                    | Objective Response (OR)           | Complete Response (CR) following max 3 cycles                    | Objective Response (OR)                          |
| Estimand                           | OR rate                                    | OR rate                           | CR rate                                                          | OR rate                                          |
| Clinically relevant critical value | 40%                                        | 10%                               | 20%                                                              | 10%                                              |



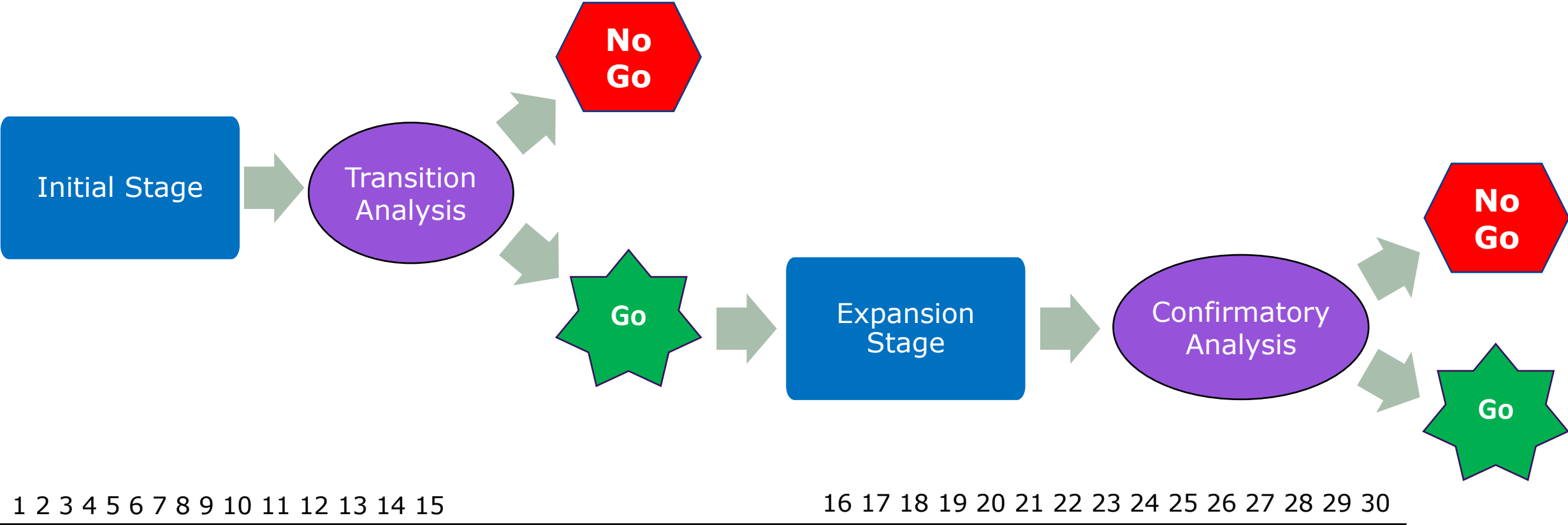
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# Decision Analysis Timeline



Patients Recruited

# Statistical Analysis Plan

- **Bayesian beta-binomial conjugate analysis**
  - Binomial likelihood:  $r$  responses /  $n$  patients
  - Beta prior distribution:  $\text{beta}(a,b)$ 
    - Minimally informative:  $\text{beta}(1,1)$
  - Beta posterior distribution:  **$\text{beta}(a+r, b+n-r)$**
- Estimation from posterior probability distribution:
  - Response rate (median) and 95% credible intervals
- Decision-making based on posterior probabilities:
  - Transition analysis ( $N=15$ ):  
**if  $p(\text{True response rate} > \text{Target}) > 0.80$  then GO**
  - Confirmatory analysis ( $N=30$ ):  
**if  $p(\text{True response rate} > \text{Target}) > 0.95$  then GO**
- Simple approach due to small numbers of patients



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# Transition Analysis Examples: Scenario 1

## Treatment Arm II

Primary outcome: Complete Response (CR)

Target response rate: 20%

### Data from Initial Stage

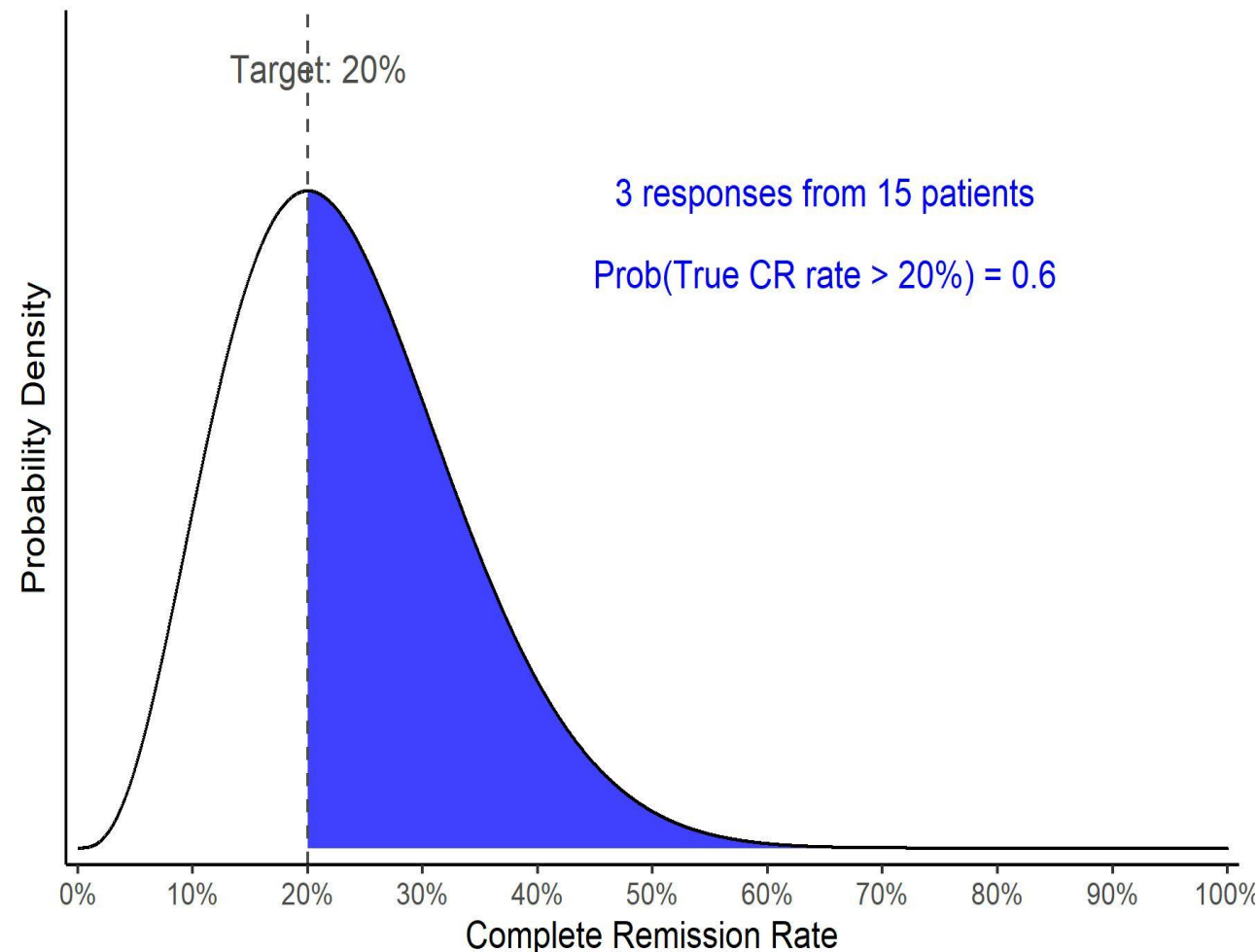
Responses: 3 / 15

Observed CR rate = 20%

Bayesian estimate of true CR rate = 22.5%

95%CrI: (7%, 46%)

$P(\text{True CR rate} > 20\%) = 0.60$



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# Transition Analysis Examples: Scenario 2

## Treatment Arm II

Primary outcome: Complete Response (CR)

Target response rate: 20%

## Data from Initial Stage

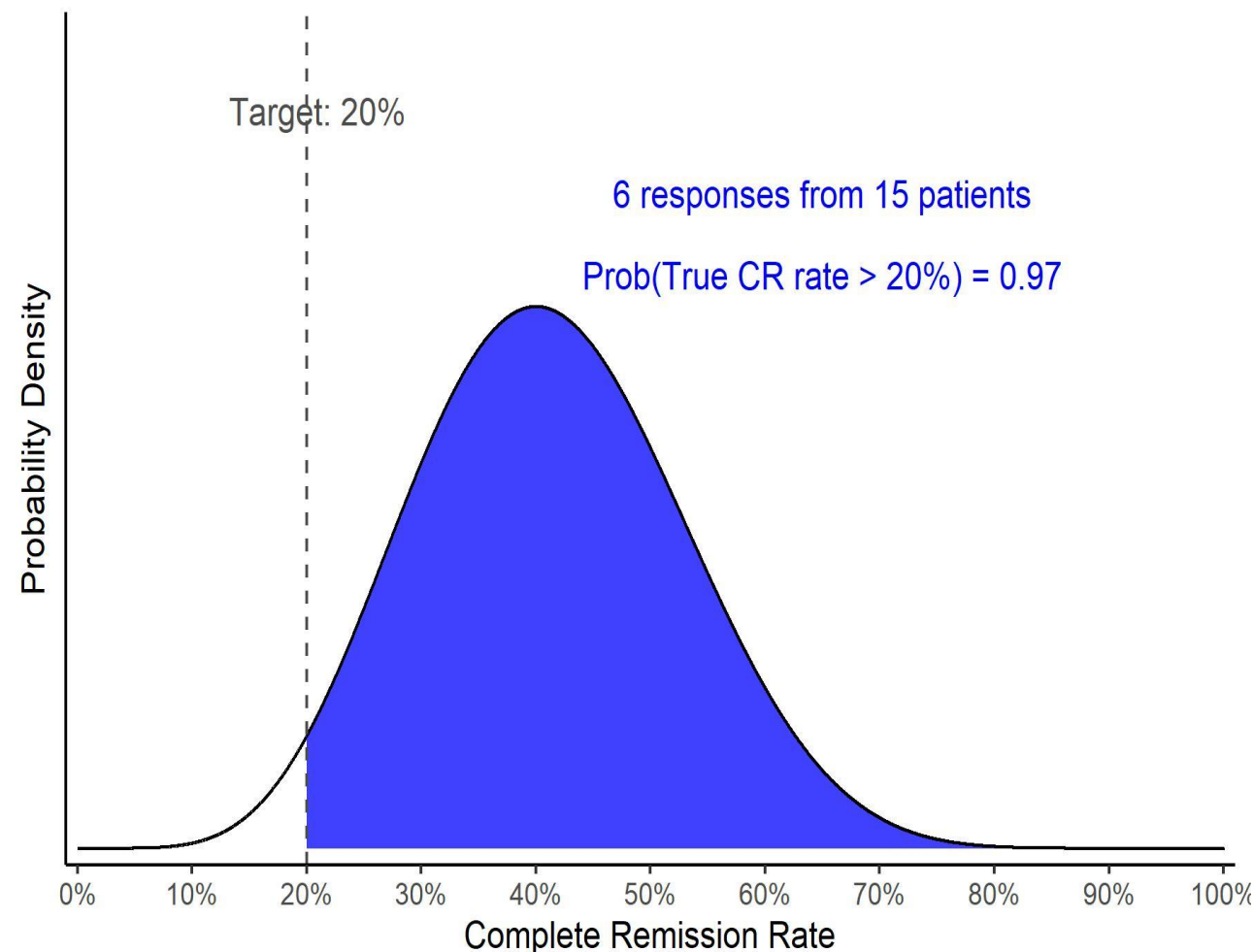
Responses: 6 / 15

Observed CR rate = 40%

Bayesian estimate of true CR rate = 41%

95%CrI: (20%, 65%)

$P(\text{True CR rate} > 20\%) = 0.97$



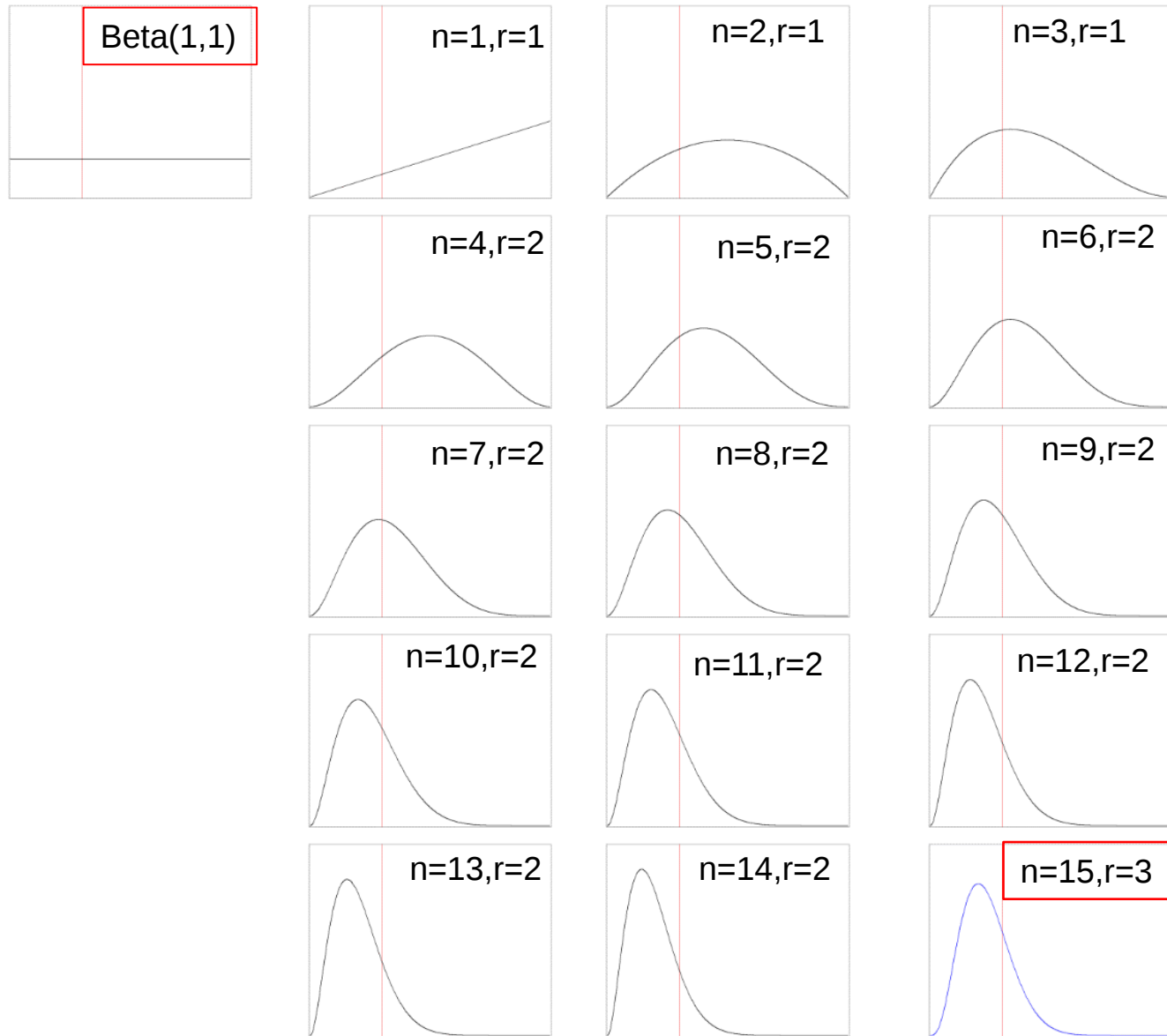
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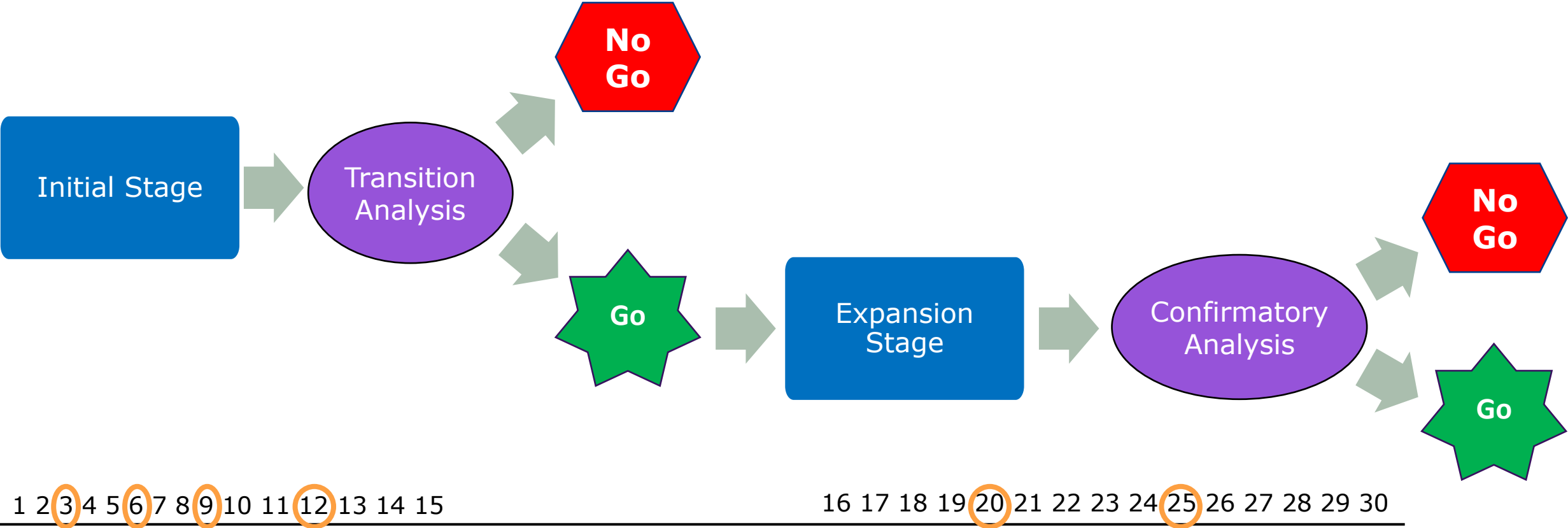


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# Bayesian Approach Allows Cumulative Learning



# Interim Analysis Timeline



Patients Recruited

Regular interim analyses  
allow early stopping for futility



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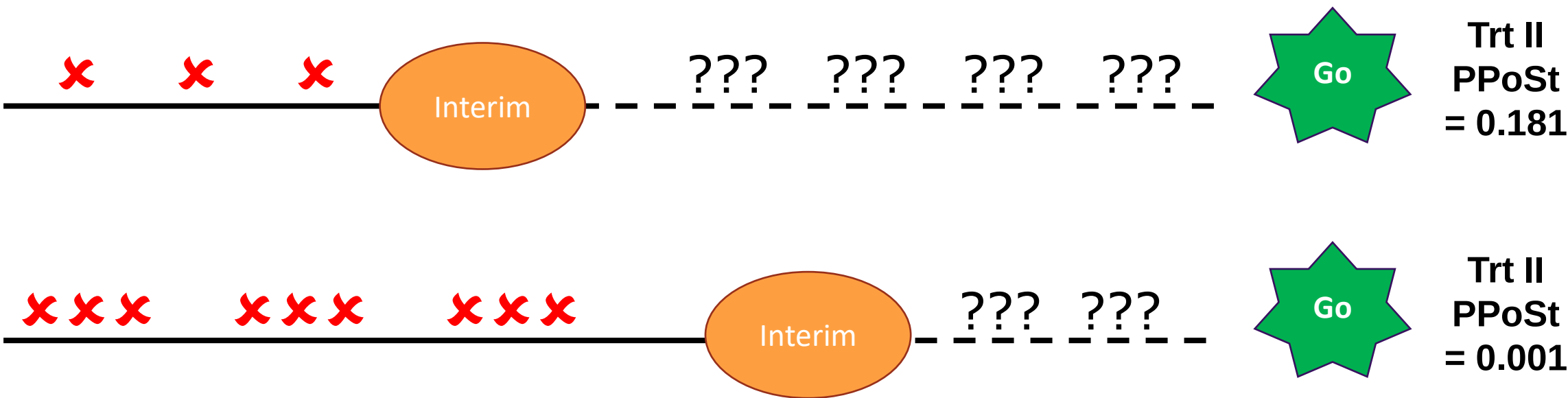
# Statistical Analysis Plan for Interims

Using posterior probability distributions, calculate:

**PPoS: Predicted Probability of Success**

PPoS<sub>15</sub> = P(GO decision at N=15 | prior and current observed data)

PPoS<sub>30</sub> = P(GO decision at N=30 | prior and current observed data)



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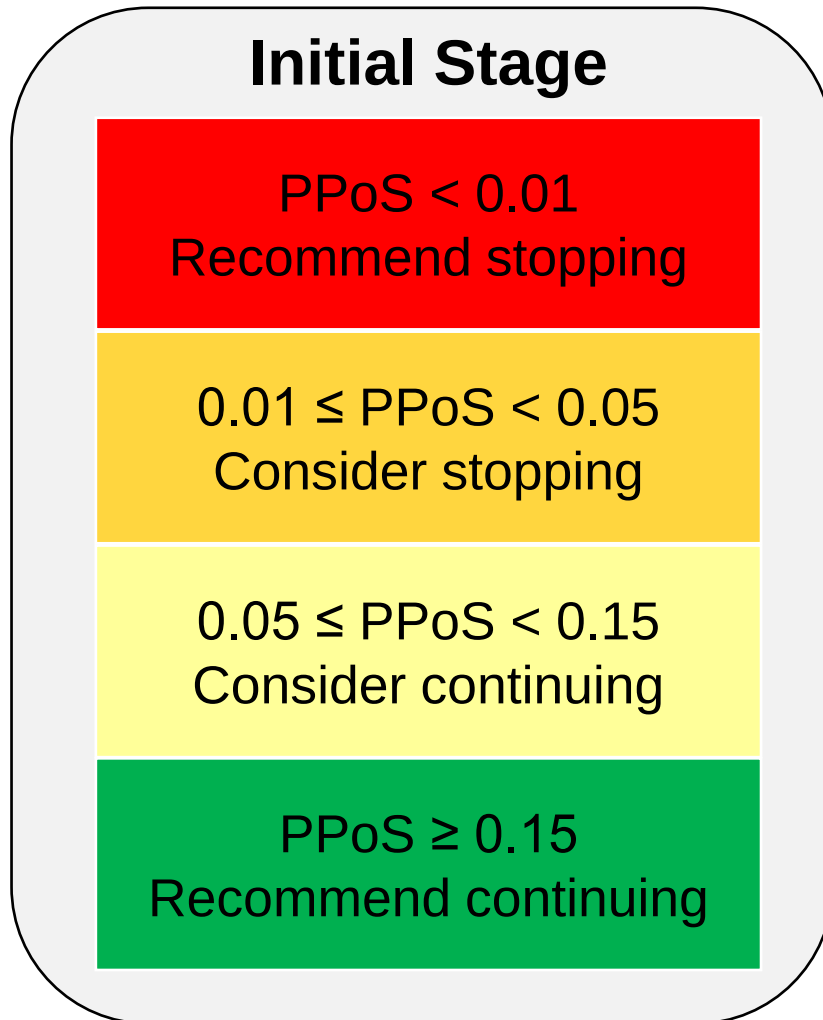
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# Interim Analysis Guidelines

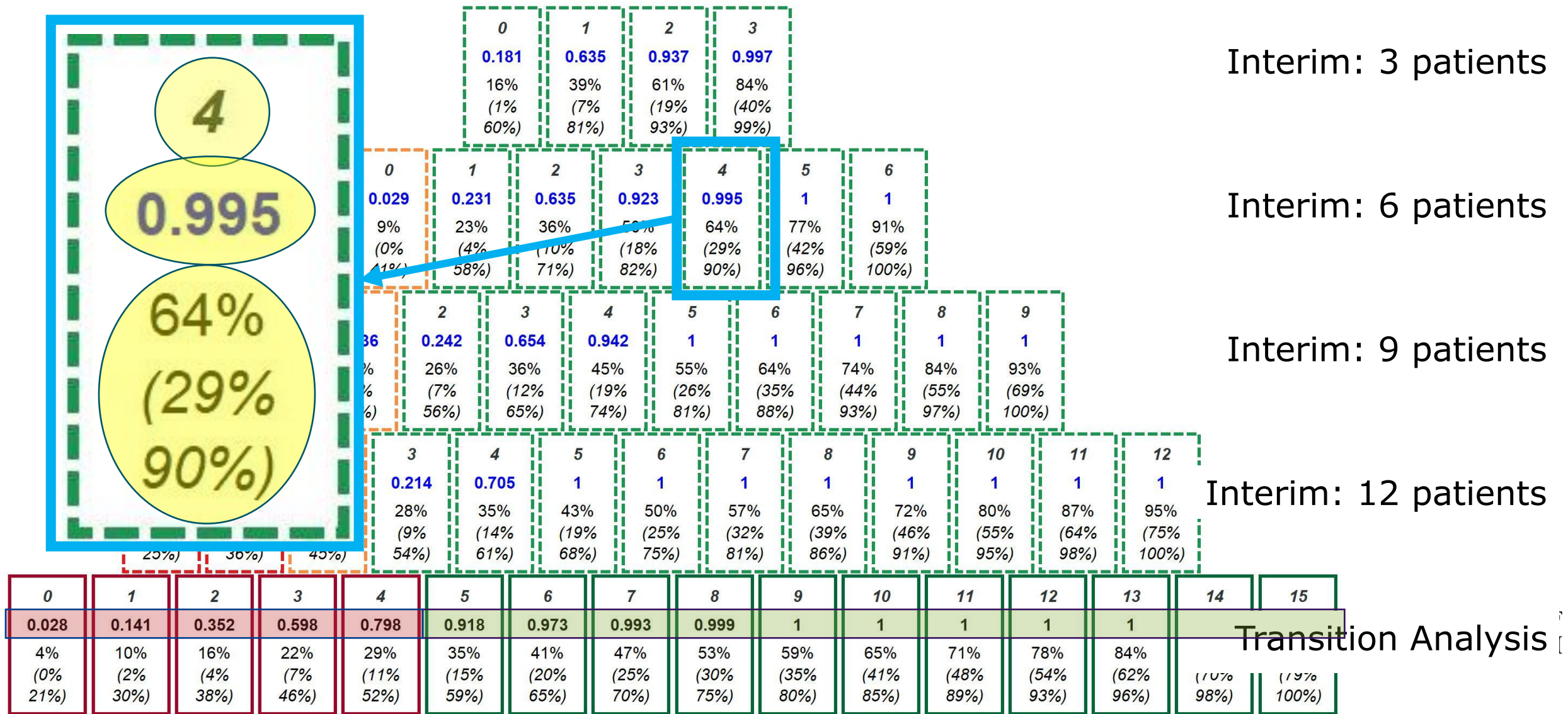
Use Predicted Probability of Success (**PPoS**) for decision-making at interim analyses



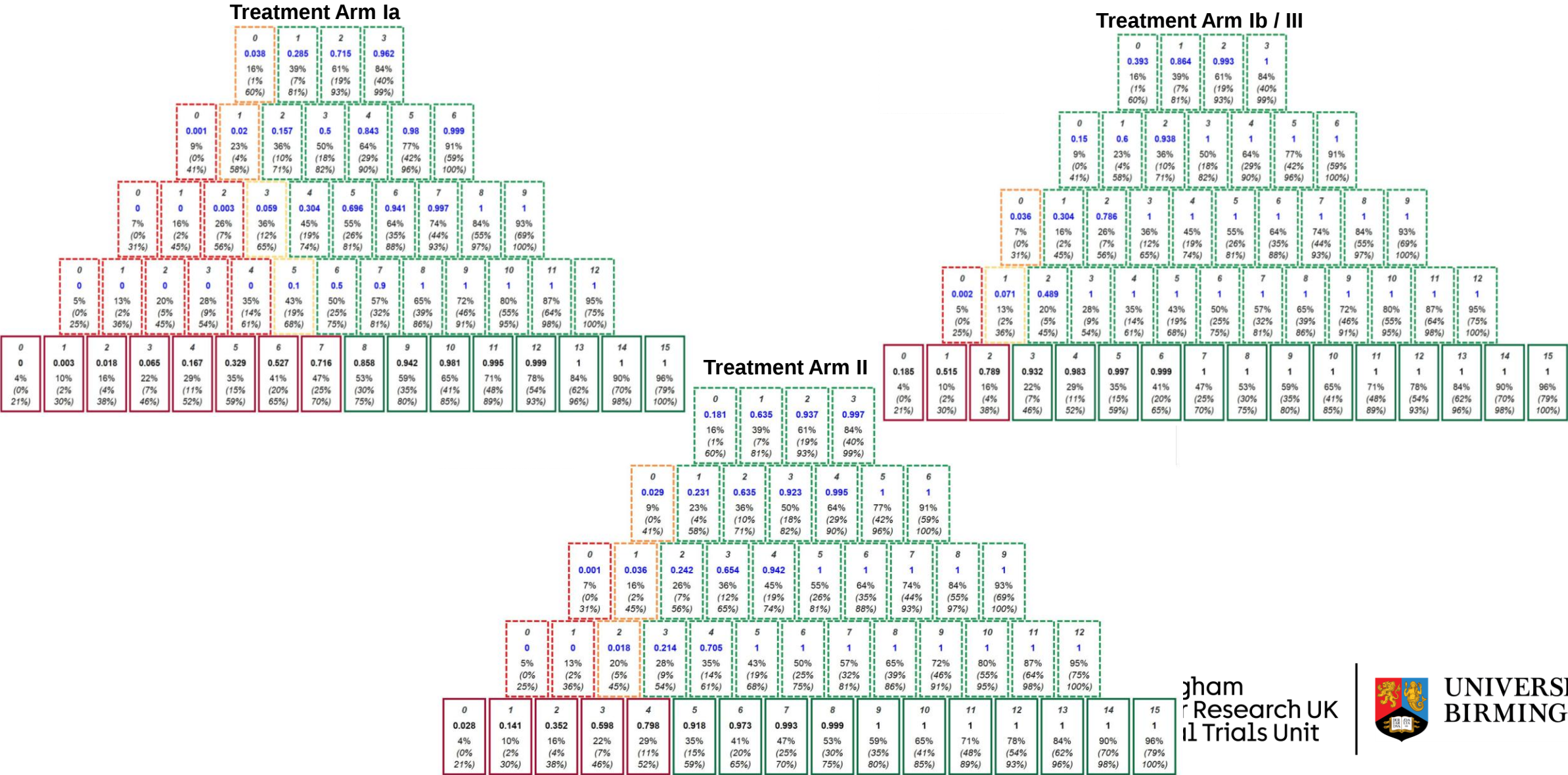
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# Visual Representation Using Efficacy Transition Pathways

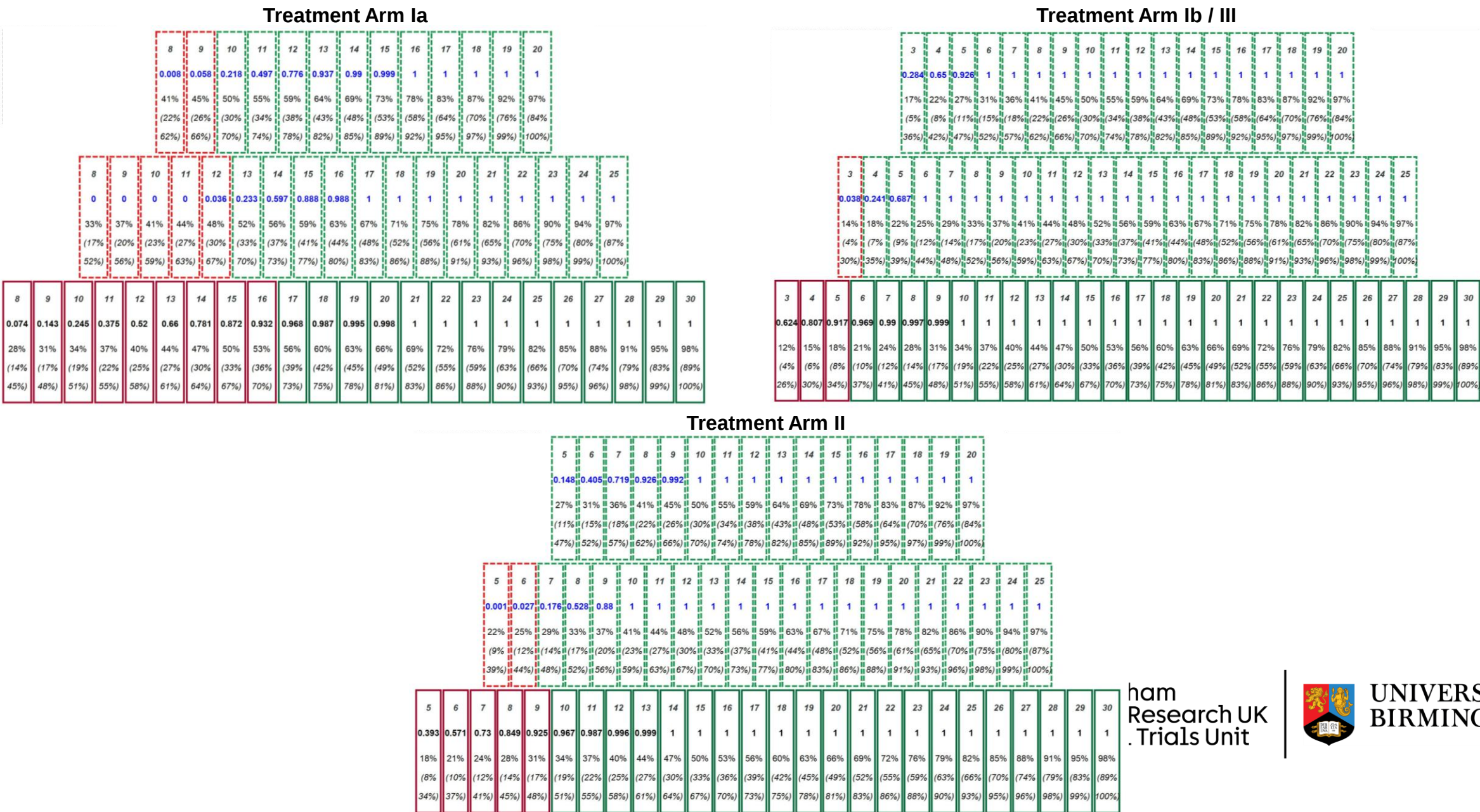
## Example: Treatment Arm II



# Efficacy Transition Pathways: Initial Stage for All Treatment Arms



# Efficacy Transition Pathways: Expansion Stage for All Treatment Arms



# Operating Characteristics

## Example: Treatment Arm Ia (Target Response Rate 40%)

|                     | True Response Rate | I1<br>N=3 | I2<br>N=6 | I3<br>N=9 | I4<br>N=12 | Transition<br>N=15 | I6<br>N=20 | I7<br>N=25 | Confirmatory<br>N=30 |       | Overall T1E  | Overall Power |
|---------------------|--------------------|-----------|-----------|-----------|------------|--------------------|------------|------------|----------------------|-------|--------------|---------------|
|                     |                    | P(Stop)   | P(Stop)   | P(Stop)   | P(Stop)    | P(Stop)            | P(Stop)    | P(Stop)    | P(Stop)              | P(GO) |              |               |
| Multi-Stage<br>N=30 | 40%                | 0         | 0.046     | 0.189     | 0.215      | 0.338              | 0.044      | 0.061      | 0.068                | 0.039 | <b>0.039</b> |               |
|                     | 65%                | 0         | 0.002     | 0.010     | 0.017      | 0.086              | 0.008      | 0.014      | 0.047                | 0.818 |              | <b>0.818</b>  |
| One-stage<br>N=30   | 40%                | -         | -         | -         | -          | -                  | -          | -          | 0.952                | 0.048 | <b>0.048</b> |               |
|                     | 65%                | -         | -         | -         | -          | -                  | -          | -          | 0.127                | 0.873 |              | <b>0.873</b>  |

- <5% Type I error and >80% 'power' for absolute increase in response rate of 25%
- Target set low (with certainty set high) so this improvement is feasible
- Multiple interims has minimal impact:
  - improves Type 1 error rate but reduces power



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# Bayesian design allows greater flexibility to maximise the utility of the trial in this rare paediatric cancer

- Target recruitment not met, trial will still be informative
  - E.g. In Treatment Arm Ia, if trial gives **5 ORs out of 9 patients**  
→  **$p(\text{true OR rate} \geq 40\%) = 0.83$**
- External evidence that becomes available can be incorporated to aid decision-making
  - Supplementary analysis with informative prior
  - Important in rare cancers when any evidence is limited and valuable
- Flexibility for multiple interim analyses
  - allows trial to stop for futility as early as possible
  - minimises number of children exposed to ineffective treatments
  - allows pipeline of assets to be evaluated efficiently



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# Bayesian analysis generates statistics that allow intuitive decision-making

- Bayesian final analysis
  - E.g. In Treatment Arm Ia, if trial gives **13 ORs out of 30 patients (43%)**  
→  **$p(\text{true OR rate} \geq 40\%) = 0.66$**
  - Easily understood and interpreted by clinicians and decision-makers
  - No equivalent statistic in a non-Bayesian framework
- Bayesian interim analysis
  - Predicted probability of success allows intuitive futility decisions
  - E.g. In Treatment Arm Ia, if trial gives **4 CRs out of 9 patients**  
→  **$p(\text{GO decision at } n=15) = 0.30$**
  - Allows us to include orange and yellow 'flags' as well as formal stopping
- Frequentist analysis
  - P-values well-known to be widely misunderstood and misinterpreted
  - Simon's two-stage design does not generate probabilities, the analysis is based only on the number of CRs required for a GO decision



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# Summary and Discussion

- Trial designed to be practice-changing
- Bayesian design allows flexibility and intuitive decision-making with small numbers of patients
- Early involvement of regulators, ethics committees, investigators and patients essential to ensure any concerns on the design can be addressed
- EMA Qualification Advice process completed
- Pre-Investigational New Drug (IND) consultation process completed with US Food & Drug Administration (FDA)
- Feedback from regulators incorporated into the protocol
- Plan to revisit evidence generation discussions after the initial stage
- Supplementary analysis may include comparison to synthetic control



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