



# Estimand in Hematologic Oncology Trials

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# Presenting on behalf of Hematology Taskforce: Oncology Estimand Working Group

- Joint work with
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  - Hans-Jochen Weber (Novartis)
  - Emily Butler (GlaxoSmithKline)
  - Kaspar Rufibach (Roche)

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# Challenges in Hematology Oncology

- Number of development programs in Leukemia, Multiple myeloma, and Lymphoma in recent years
- Uniqueness in endpoint, treatment strategy, and interpretation of treatment effect
- Includes broad disease population causes heterogeneous response based on genomic characteristics (large B cell lymphoma vs others)
- Challenging to summarize treatment effect:
  - Long term vs short term effect
  - Effect of induction vs maintenance
  - Responder vs non-responders

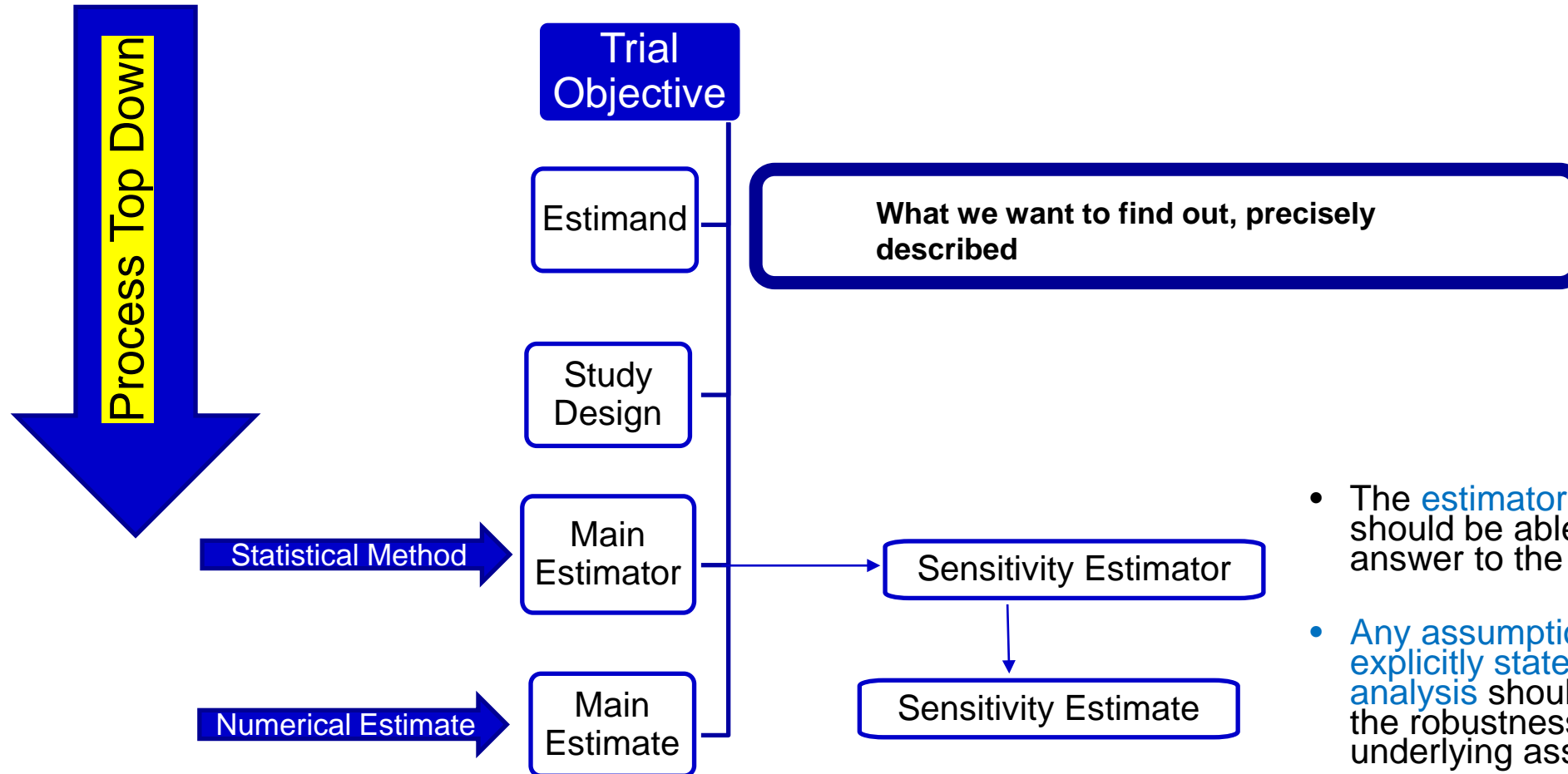
# Example

| Examples                               | Gallium Study  | Multiple Myeloma Study  | RATIFY Study   |
|--|--|---|--|
| <b>Treatment</b>                       | Obinutuzumab vs Rituximab<br>in combination with three backbone chemo  | Drug X vs Placebo<br>In combination with background therapy   | Midostaurin vs Placebo<br>in combination with chemo  |
| <b>Population</b>                      | Advanced indolent non-Hodgkin's lymphoma   | Diagnosed with multiple myeloma and eligible for high-dose therapy  | First-line acute myeloid leukemia (AML) with a FLT-3 mutation  |
| <b>Induction and Maintenance Phase</b> | <p><b>Induction:</b> Received Obinutuzumab or Rituximab + chemotherapy</p> <p><b>Maintenance:</b></p> <ul style="list-style-type: none"> <li>Achieving response : continue the treatment until disease progression.</li> <li>Stable disease (SD) : No further therapy</li> </ul> | <p><b>Induction:</b> Patients have received drug X + background therapy or background therapy only. Followed by a stem cell transplant and consolidation phase</p> <p><b>Maintenance:</b><br/>Same as randomized until disease progression or unacceptable toxicity</p> | <p>Patients have received midostaurin or placebo along with chemotherapy for one cycle. If there are definitive evidence of clinically significant residual leukemia, a second cycle of same therapy continues. Induction phase is followed by 4 cycles of consolidation</p> <p>Patients who remained in remission entered a maintenance phase in which they received drug A or placebo.</p> |
| <b>Primary Endpoint</b>                | Progression-free survival  | Progression-free survival   | Overall survival   |
| <b>Sample Size (events)</b>            | 1202   | 690   | 717  |

# Questions of Clinical Interest

- **Key question:** Is the inclusion of experimental treatment/regimen to SOC improve risk of progression and/or death for patients over SOC
- Is the question above clear?
  - How to handle patients who had considered other anti-cancer therapy before progression?
  - How to handle treatment discontinuation
- Other clinical questions:
  - Impact of induction/consolidation phase and maintenance phase
  - Response in subgroups: e.g., achieved CR or PR in the induction phase.

# What is an estimand?



- The **estimator** or summary measure should be able to provide clear answer to the quest of interest
- Any **assumptions made** should be explicitly stated, and **sensitivity analysis** should be used to assess the robustness of the results to the underlying assumptions.

# Attributes of an Estimand

Detailed description of treatment including all components

Treatment



Treatments being compared

Who to study

Population



The description of an estimand will not be complete without reflecting how potential **intercurrent events** are addressed in the scientific question of interest.

Endpoint for an individual trial participant

Variable



Population-level summary





# Intercurrent Events and Missing Values

Estimand framework allows pre-specification of (some) intercurrent events and handling of intercurrent events

- Results thorough data collection and analytical methods or strategies to handle intercurrent events prior to unblinding

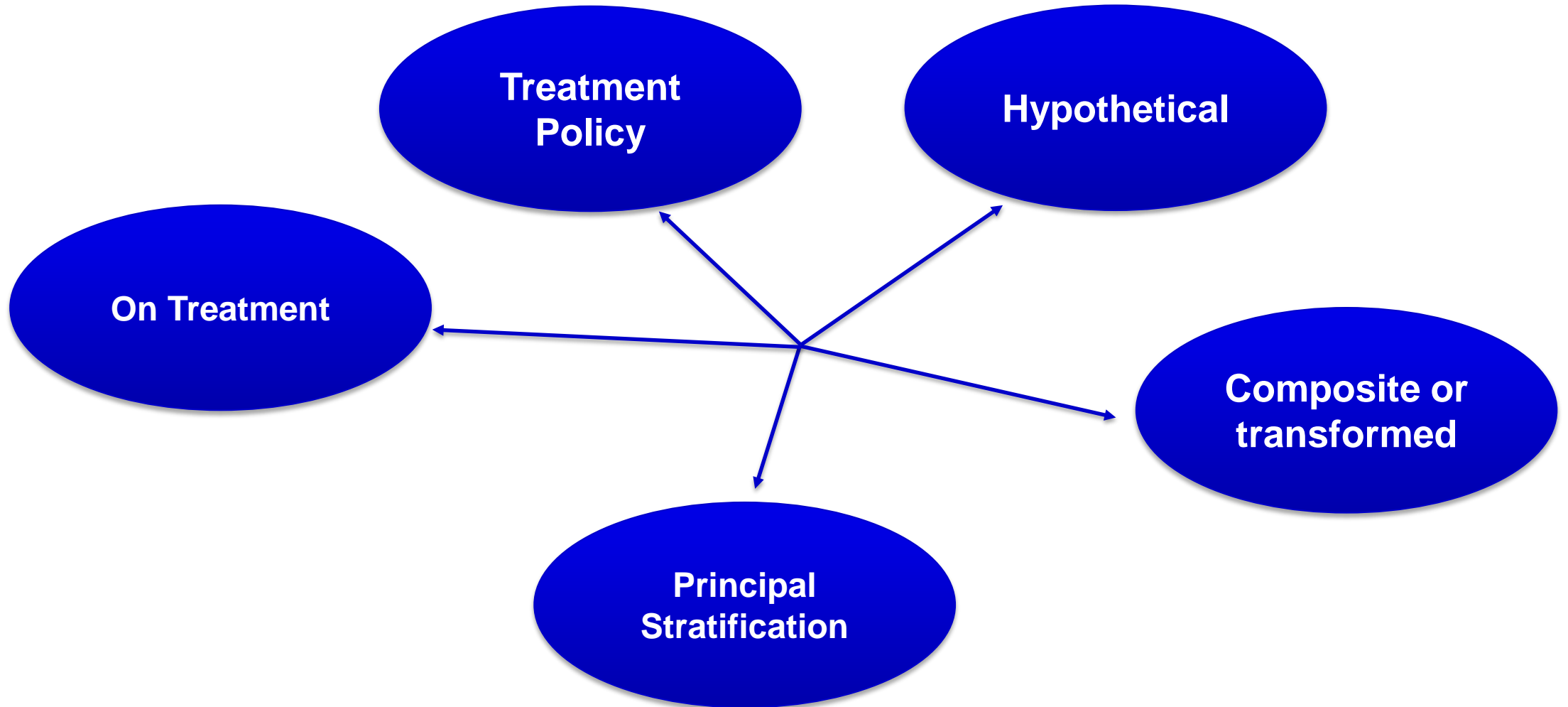
Missing data: *Meaningful data for analysis of an estimand but were not collected*

- After study withdrawal, after trial termination, due to missed visits or measurements

In an estimands framework, it is necessary to:

- Understand the **actual reasons** for intercurrent events
- Understand the **impact** these events might have on the interpretation of the actual data considering the research question
- **Pre-plan** for them in close cooperation among study team members of different disciplines

# Strategies for Handling Intercurrent Events



# Sensitivity Analysis vs Supplementary Analysis

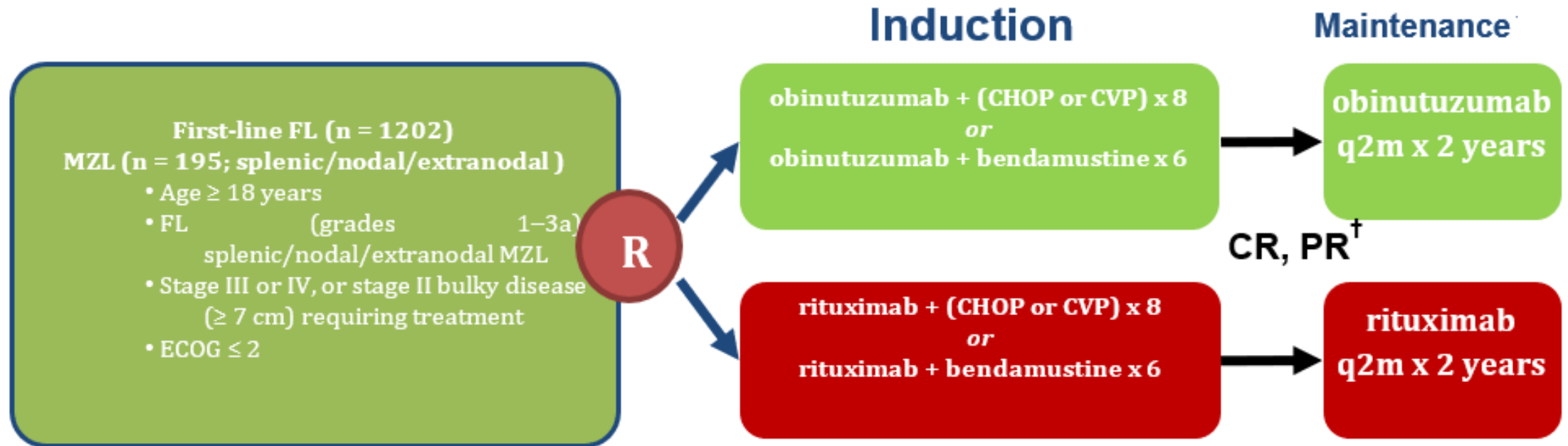
## Sensitivity Analysis

A series of analyses targeting the same estimand, with differing assumptions to explore the robustness of inferences from the main estimator to deviations from its underlying modeling assumptions and limitations in the data

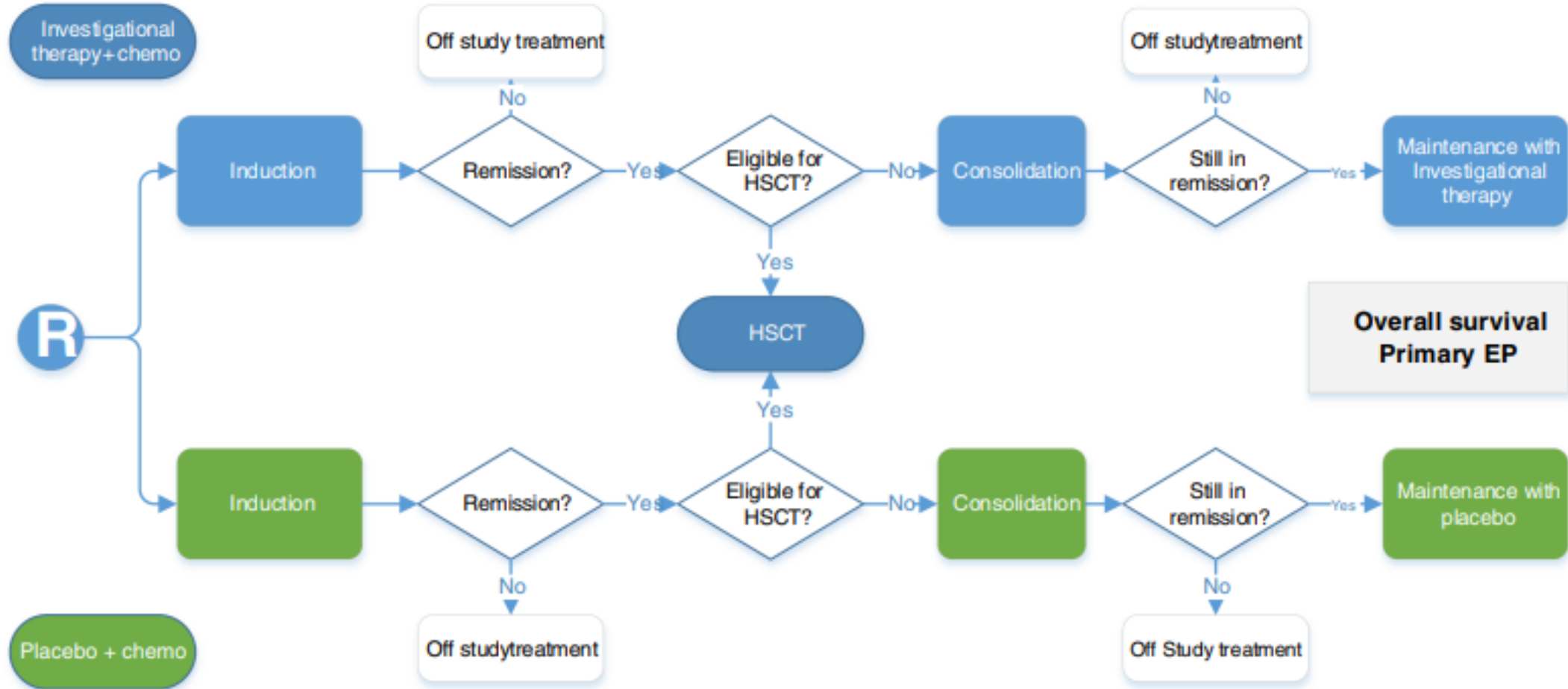
## Supplementary analysis

A general description for analyses that are conducted in addition to the main analysis to provide additional insights into the understanding of the treatment effect. The term describes a broader class of analyses than sensitivity analyses. The need for, and utility of, supplementary analyses should be considered for each trial

# Example 1: Gallium Study



# Example 2: RATIFY Study



# Estimand Framework for Gallium Study

## Scientific Question

Will the addition of Obinutuzumab to treatment strategy prolong the time to death and progression regardless of new anti-lymphoma treatments prior to experiencing a PFS event?

## Treatment

**Induction (6-8 weeks)**  
Received Obinutuzumab or Rituximab + chemotherapy

**Maintenance:**  
Achieving response : continue the treatment until disease progression.  
Stable disease (SD) : No further therapy

## Population

FL patients as defined by protocol eligibility criteria

## Variable

Progression Free Survival assessed by investigator

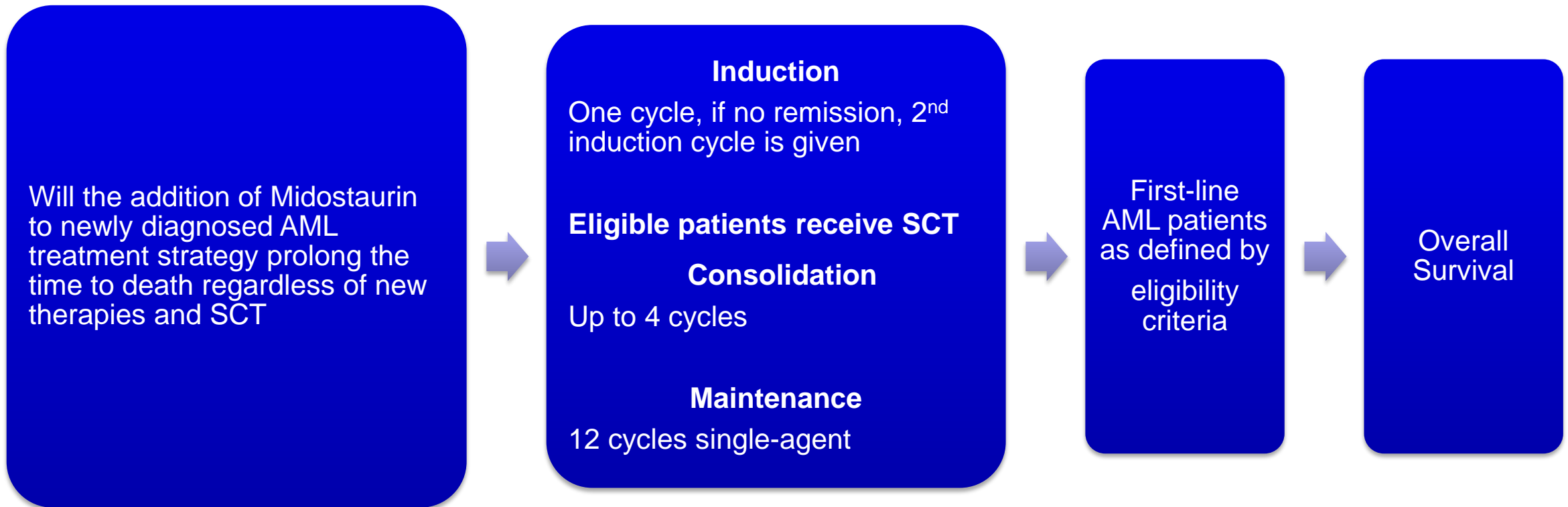
# Estimand Framework for Ratify Study

## Scientific Question

## Treatment

## Population

## Variable



# Handling Intercurrent Events

| Intercurrent event                                       | Strategy addressing the event  |
|--|--|
| Use of anti-multiple myeloma therapy prior to PFS events | <b>Treatment policy:</b> intercurrent event is ignored   |
| Premature discontinuation of study medication            | <b>Used for Gallium and Ratify studies</b>   |
| <b>Possible alternative</b>                              | <b>Hypothetical:</b> Patients who received anti-cancer therapy are assumed to have the same risk as those who did not receive subsequent anti-cancer therapy |



# Summarizing Treatment Effect

- **Assumption:**

- **non-informative** censoring (**missing at random** for missing disease assessment or after study withdrawal, loss to follow-up, etc)
- proportional hazard (**PH**)

- **Analysis method:**

- **Stratified Cox regression** model (with stratification factors used in randomization) for **without adjustment by other covariates**

# Design Challenges



How to isolate the treatment benefit in each phase (FDA's concern)?

Overall benefit may be driven by the induction phase only  
Re-randomization may be necessary to estimate the effect of maintenance



What is appropriate follow-up time?



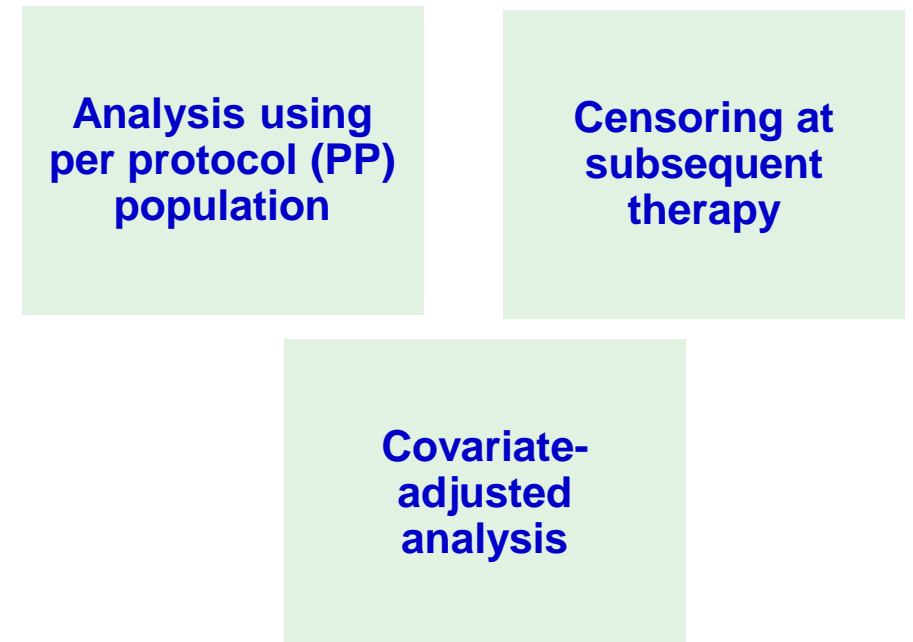
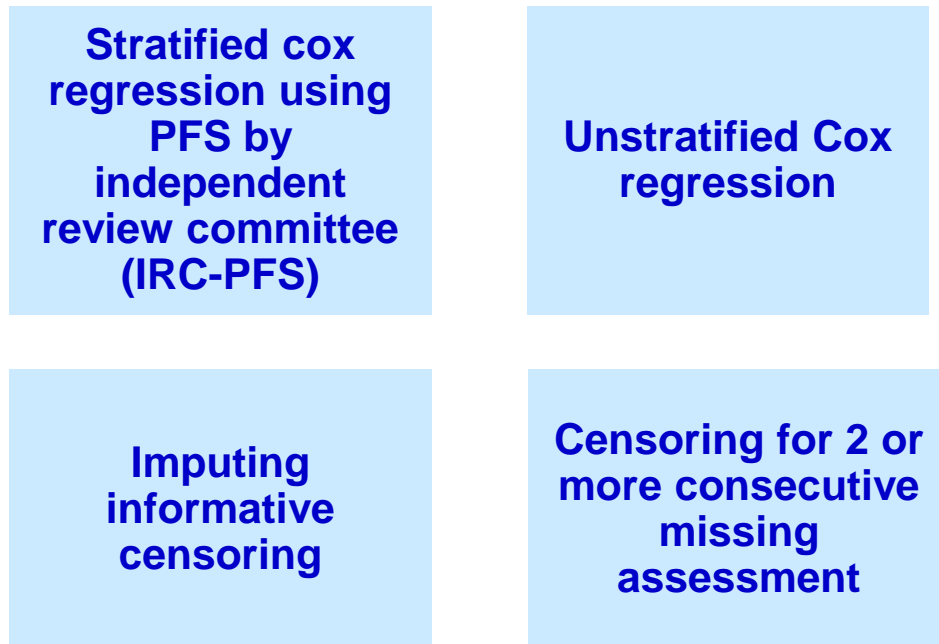
Can HR capture the benefit of treatment?

Constant proportional hazard at two treatment phases?  
Patients with stable disease won't get maintenance treatment

# Common Sensitivity and Supplementary Analyses for Progression Free Survival

## Sensitivity Analysis

## Supplementary Analysis



# Common Sensitivity and Supplementary Analyses for Overall Survival

## Sensitivity Analysis

Imputing  
informative  
censoring

Unstratified Cox  
regression

## Supplementary Analysis

Censor at  
subsequent  
anti-cancer  
therapy

Rank preserving  
structural failure  
time (RPSFT)  
model

Inverse  
probability  
censoring  
weighting (IPCW)  
analysis

Two-stage  
approach

# Violation of Proportional Hazard (PH)

For NPH, a single measure is often inadequate to summarize the treatment effect

- More than one clinical question or “estimand” need to be answered to understand treatment effect
- Traditional effect like HR and Median are often inadequate

Stepwise approach helps practitioners to provide appropriate summary

- Test for rejecting null
- Assessing PH assumption
- Choice of proper summary based on the variability of PH assumption

Flexible and interpretable measures are required for totality of evidence

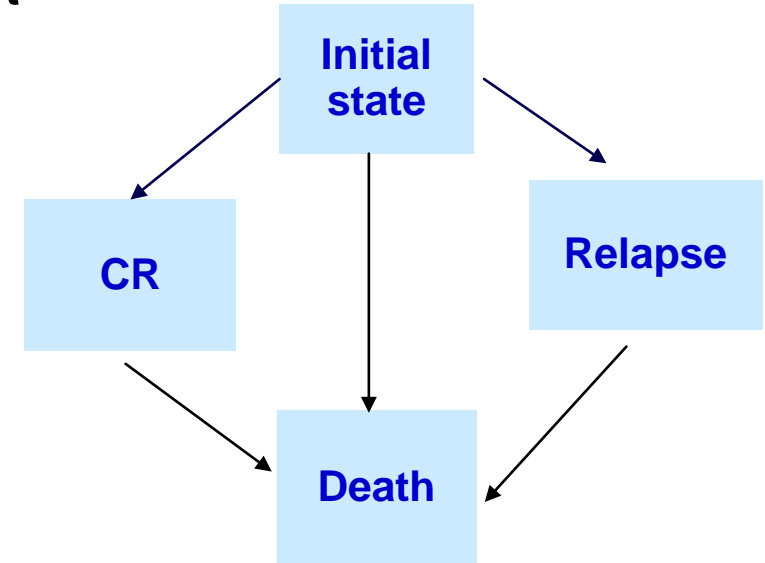
NPH is often driven by heterogeneity of effect in disease specific subgroups

- Supplementary analysis are important to understand the treatment effect
- Requires appropriate methodology (principal stratification) for post-hoc subgroup analysis

# Evaluating Stage-wise Effect

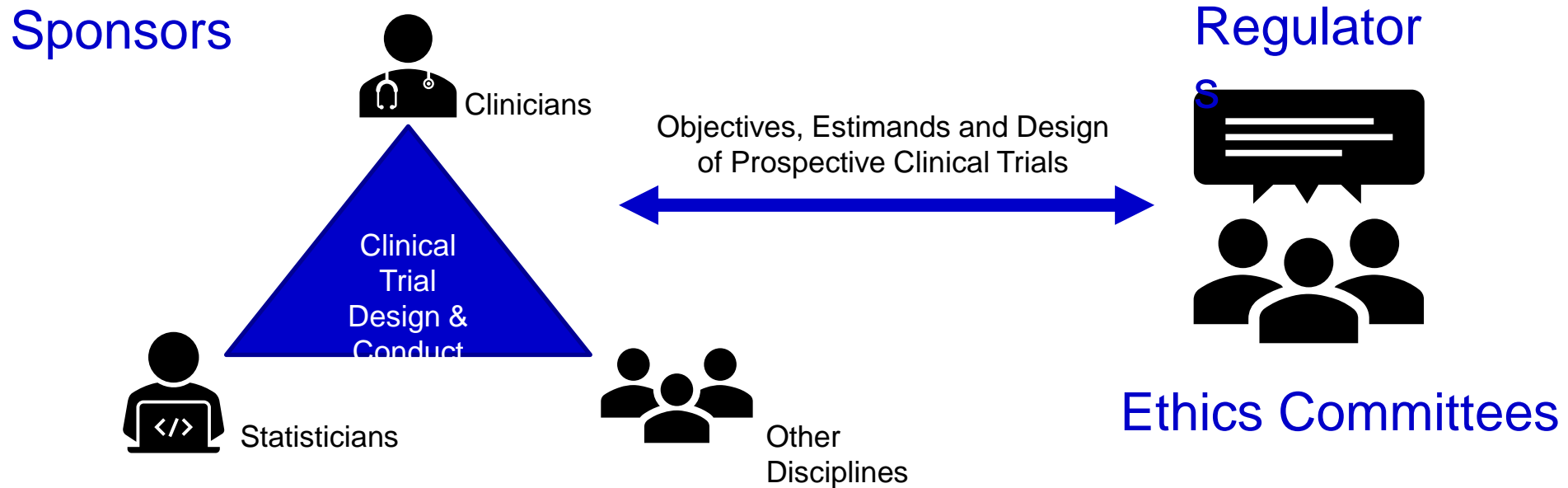
- Design with induction and maintenance phase
  - How to isolate the treatment benefit in each phase (FDA's concern)?
- Use of multistate survival model
  - Example: Considers complete remission as intermediate events to investigate the impact of the maintenance phase on the treatment effect
  - Other models are possible based on the design
  - Appropriate summary measures need to be chosen

Use of ***“While on treatment strategy”***



# Multi-disciplinary Collaboration is the Key to Success

It is a multi-disciplinary undertaking and should be the subject of discussion between sponsors and regulators



# Conclusion

- The estimand framework lends itself to a more transparent way of specifying each objective of a trial and ensuring alignment with the selected estimator/analysis method
- Detailed pre-specification of sensitivity and supplementary analyses are required
- Estimand(s) need to be included in the study protocol and statistical analysis plan (SAP) for the study
- To assess the contribution of each treatment phase of a sequential treatment strategy requires further work





Thank You

