

# Are Estimands Necessary for Time-To-Event Endpoints?

*PSI One Day Meeting: Estimands : September 2017*

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***Roche Biostatistics, Methods, Collaboration & Outreach  
with thanks to Colin Neate & Kaspar Rufibach***





# Inconsistent Variable Definitions

## When is DFS (Disease Free Survival) not DFS?

**Table 1.** Example of Inconsistent Definitions of Disease-Free Survival

Trial	Local/Regional Recurrence	Distant Metastasis	Death From Any Cause	Invasive Contralateral Breast Cancer	Second Primary Invasive Cancer (nonbreast)	Ipsilateral DCIS	Contralateral DCIS	Ipsilateral LCIS	Contralateral LCIS
BIG 1-98 <sup>4</sup>	X	X	X	X	X				
MA-17 <sup>1</sup>	X	X		X		X	X	X	X
ATAC <sup>2</sup>	X	X	X	X		X	X		
IES <sup>3</sup>	X	X	X	X					
ARNO <sup>5</sup>	X	X		X					

NOTE: Event-free survival used by ARNO.

Abbreviations: DCIS, ductal carcinoma in situ; LCIS, lobular carcinoma in situ; BIG, Breast International Group; MA, National Cancer Institute of Canada Clinical Trials Group MA-17; ATAC, Arimidex, Tamoxifen Alone, or in Combination; IES, Intergroup Exemestane 031; ARNO, Arimidex, Nolvadex 95 Study.

\*Proposal for Standardized Definitions for Efficacy End Points in Adjuvant Breast Cancer Trials: The STEEP System , JCO, Hudis et al 2007



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**Trial objectives and effect quantification may not be aligned.**

- **Is the trial measuring what the authors claim to be measuring?**
- **Is the trial measuring what readers of the paper think it is measuring?**

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# Inconsistent Variable Definitions

## Does It Matter?

PETACC-03 : Colon Cancer Van Cutsem et al. (2005).	
Primary Endpoint : DFS	Secondary Endpoint : RFS
Counted second primary cancer other than colon as <b>event</b>	Counted second primary cancer other than colon as <b>not event</b>
<b>Non-Significant</b>	<b>Significant</b>
	This definition was DFS in MOSAIC

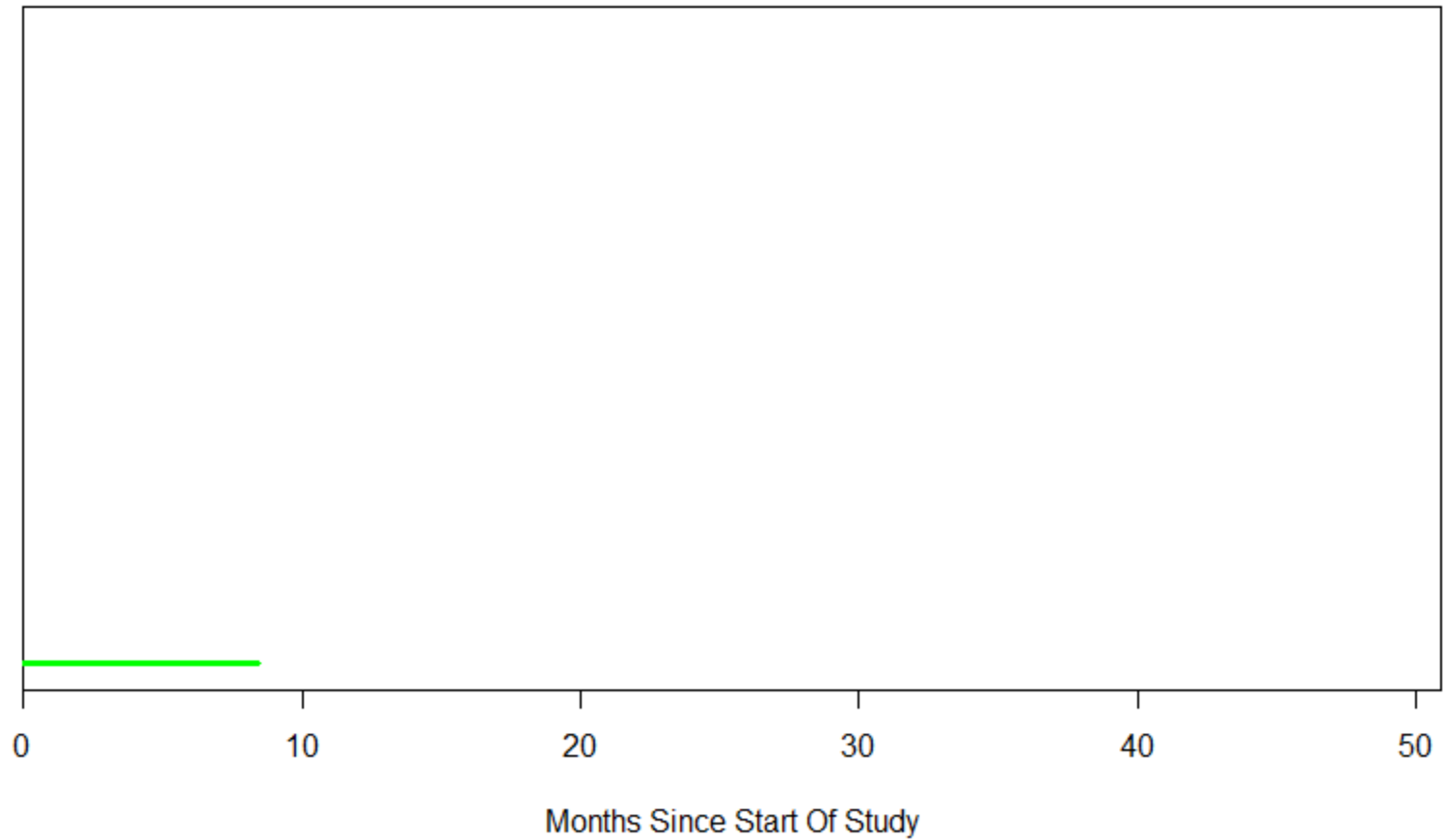
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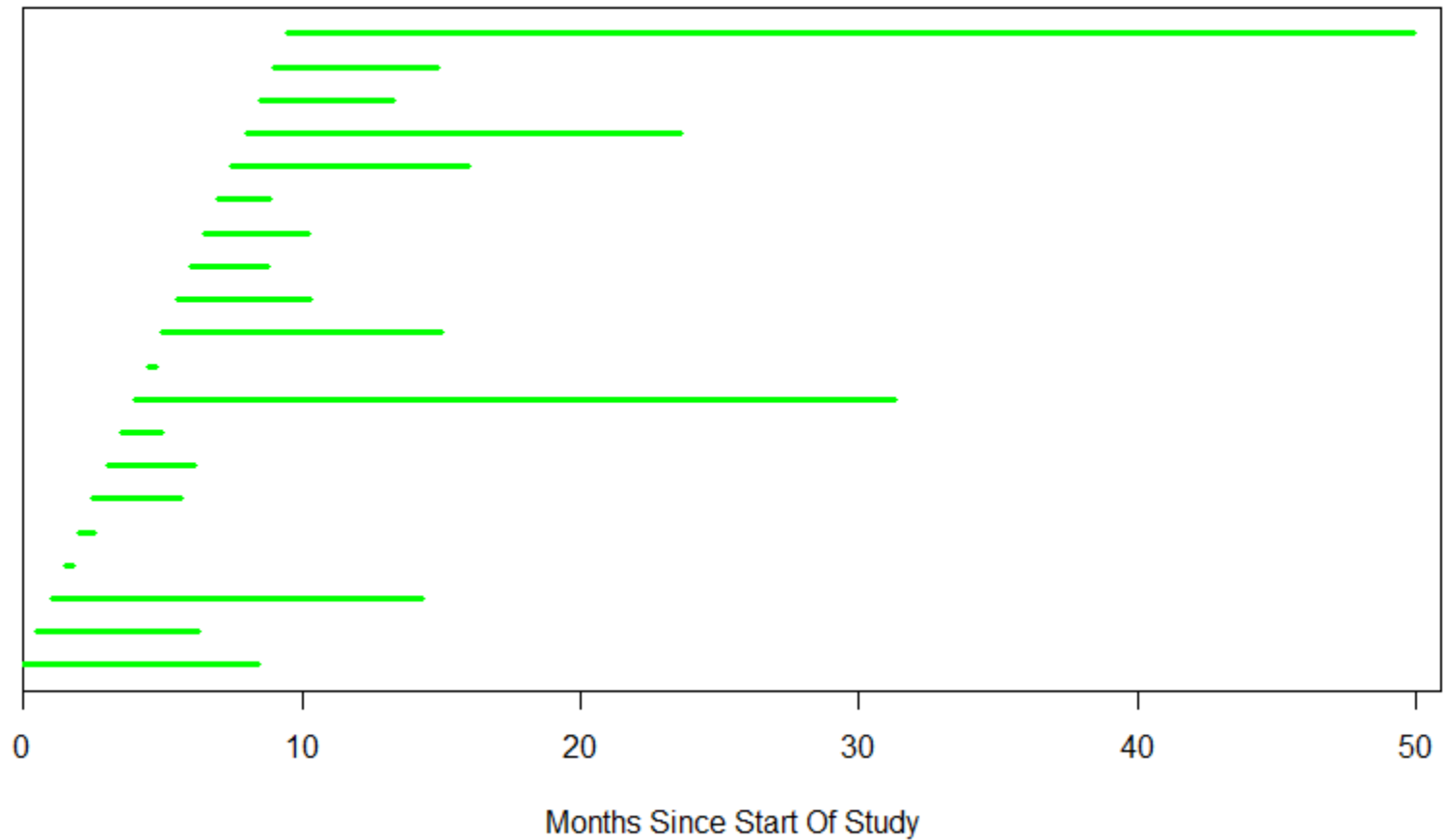
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- **Heterogeneous definitions affect both**
  - **Relative (e.g. hazard ratio) and**
  - **Absolute (e.g. milestone survival, medians) measures**
- **Can affect results and interpretation of individual trials**
- **Can have huge impact, when working across trials :**
  - **Bias and/or Variability**
  - **Meta-analysis, Surrogacy analyses, Historical controls.....**

# First Patient In An Oncology Trial

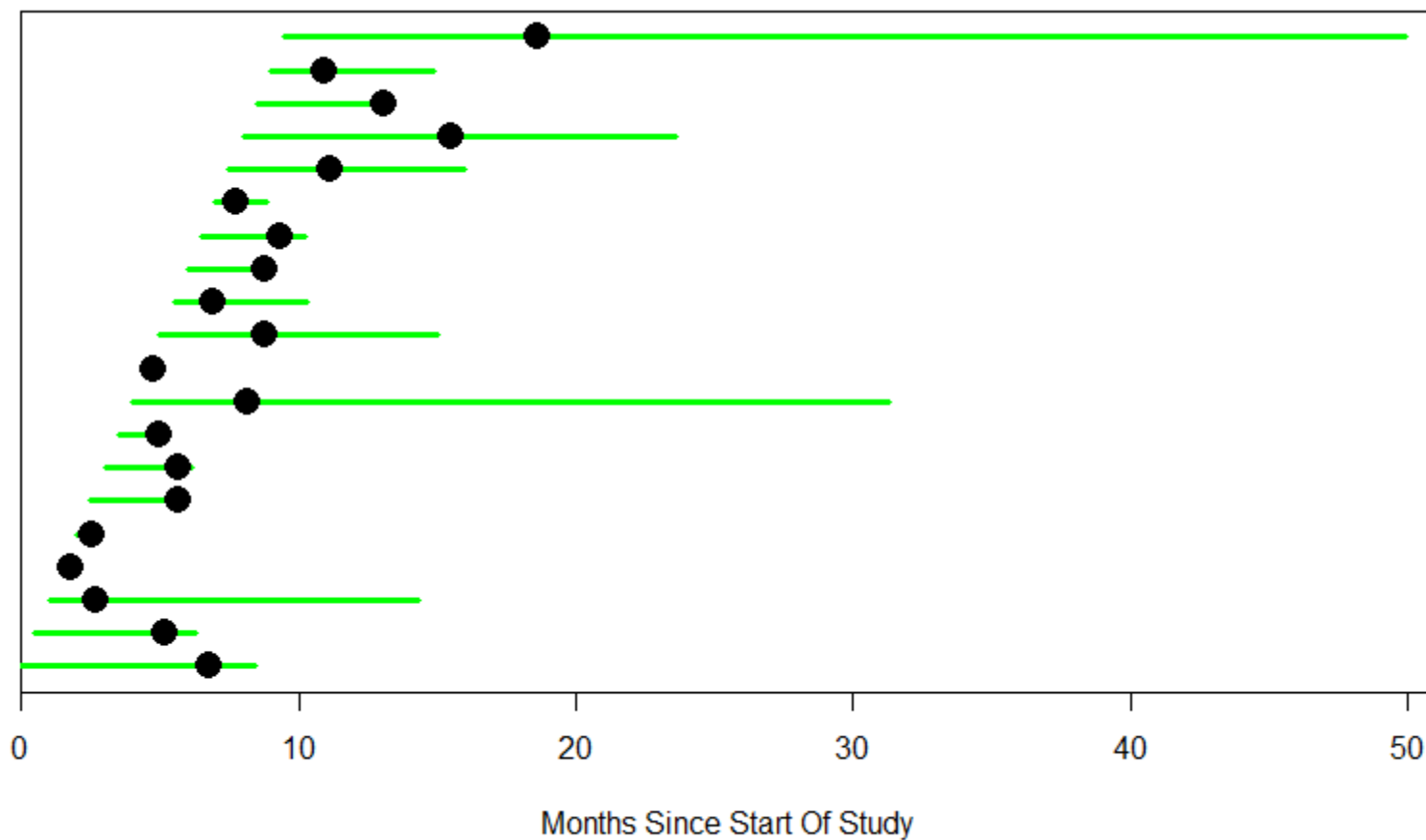


# An Oncology Trial

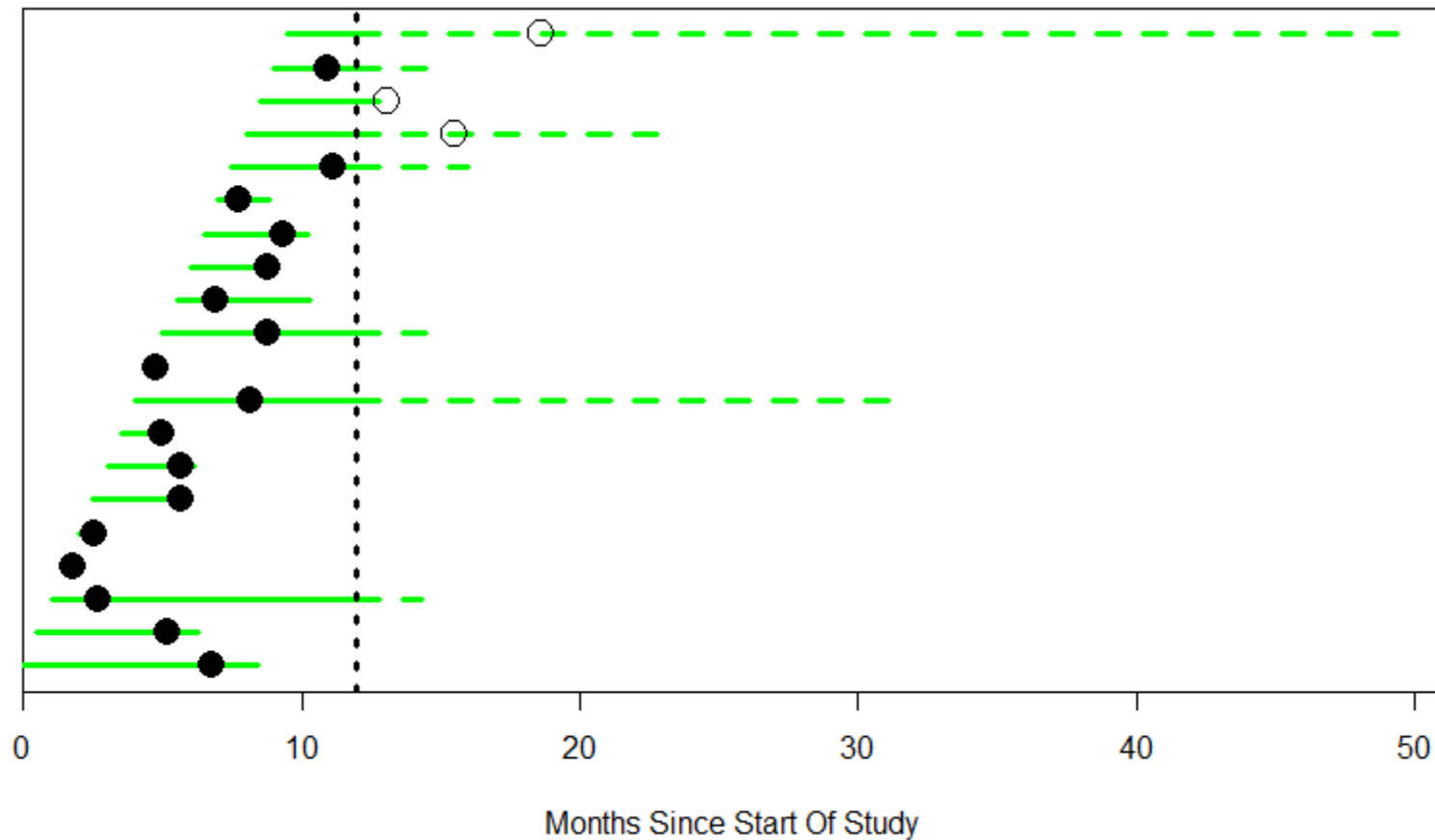




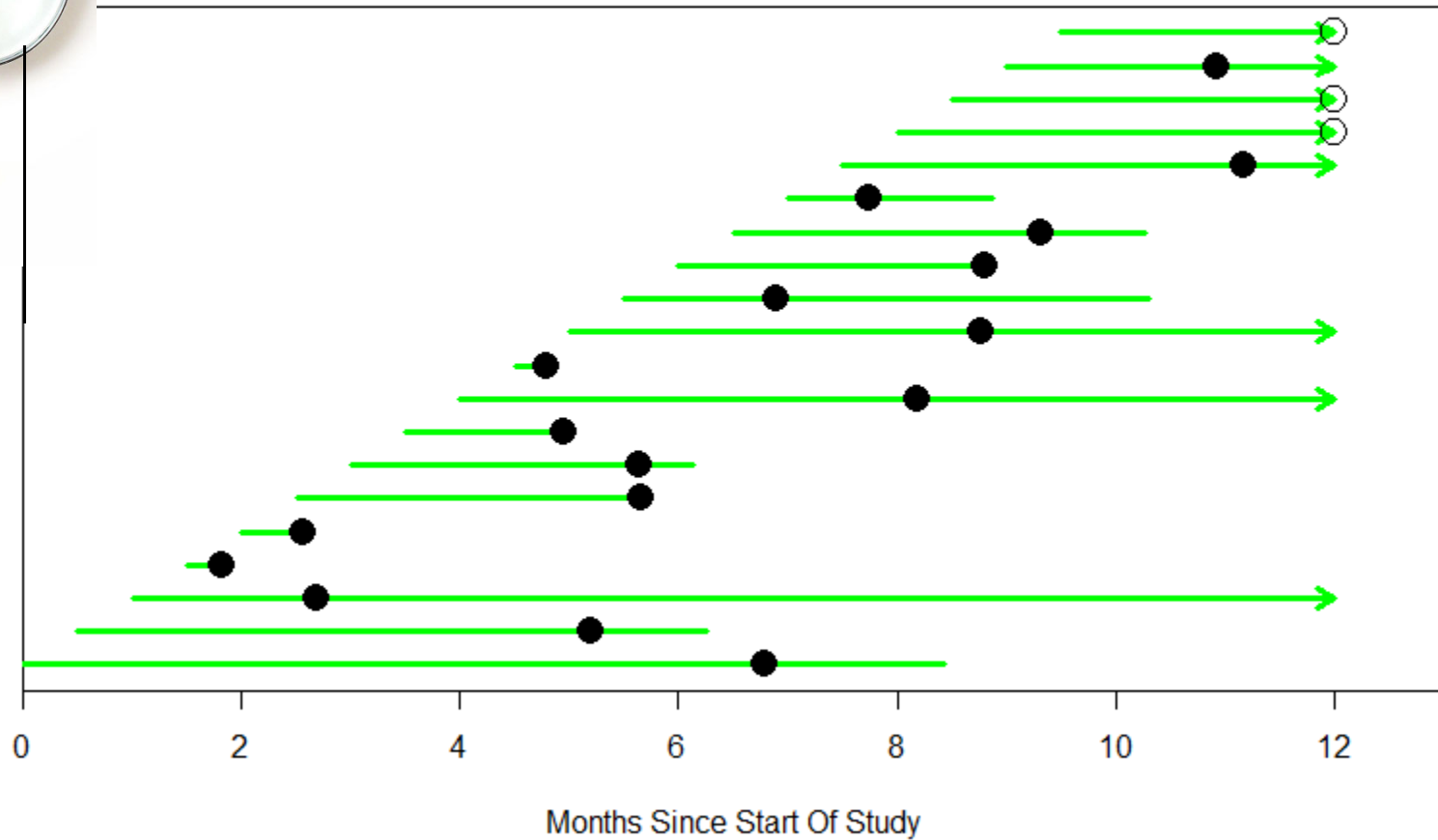
# Typically Also Measure An Intermediate Endpoint(s) e.g. PFS , DFS



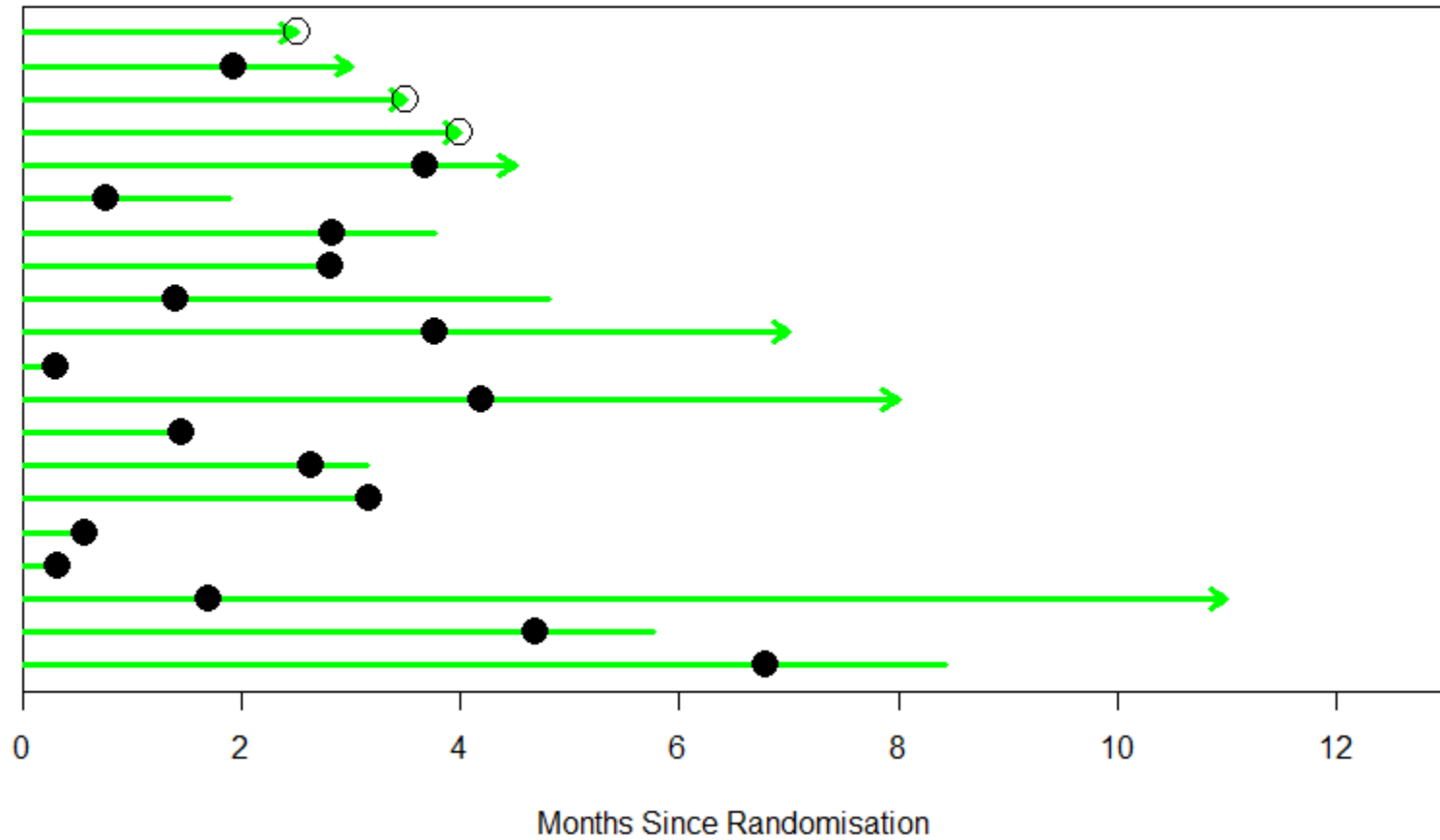
# Potential Intercurrent Events 1 : Only Observe Data Up To An Administrative Data Cut-Off -> Censored Data



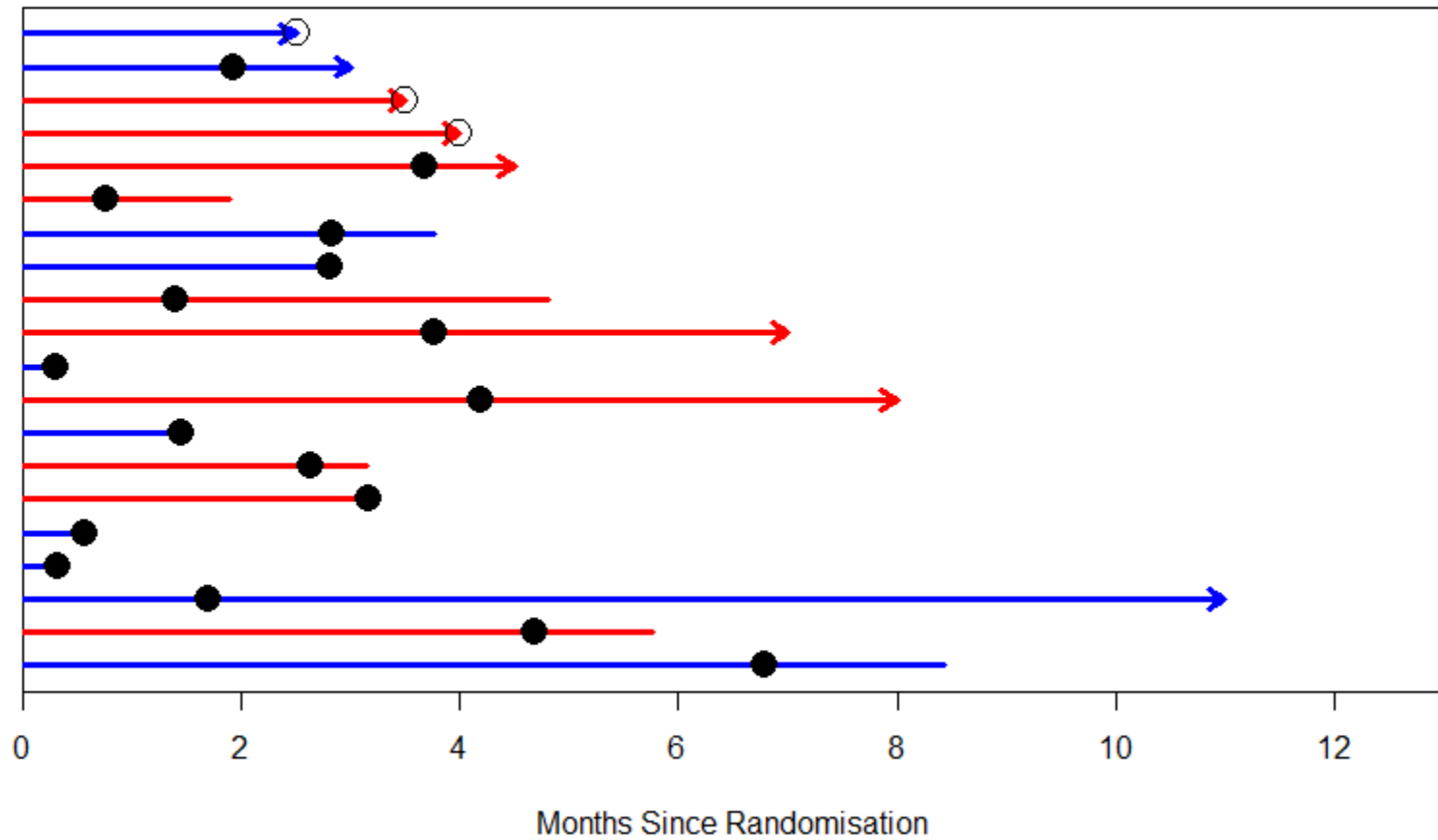
# Rescaling To Focus On The Times We Observe



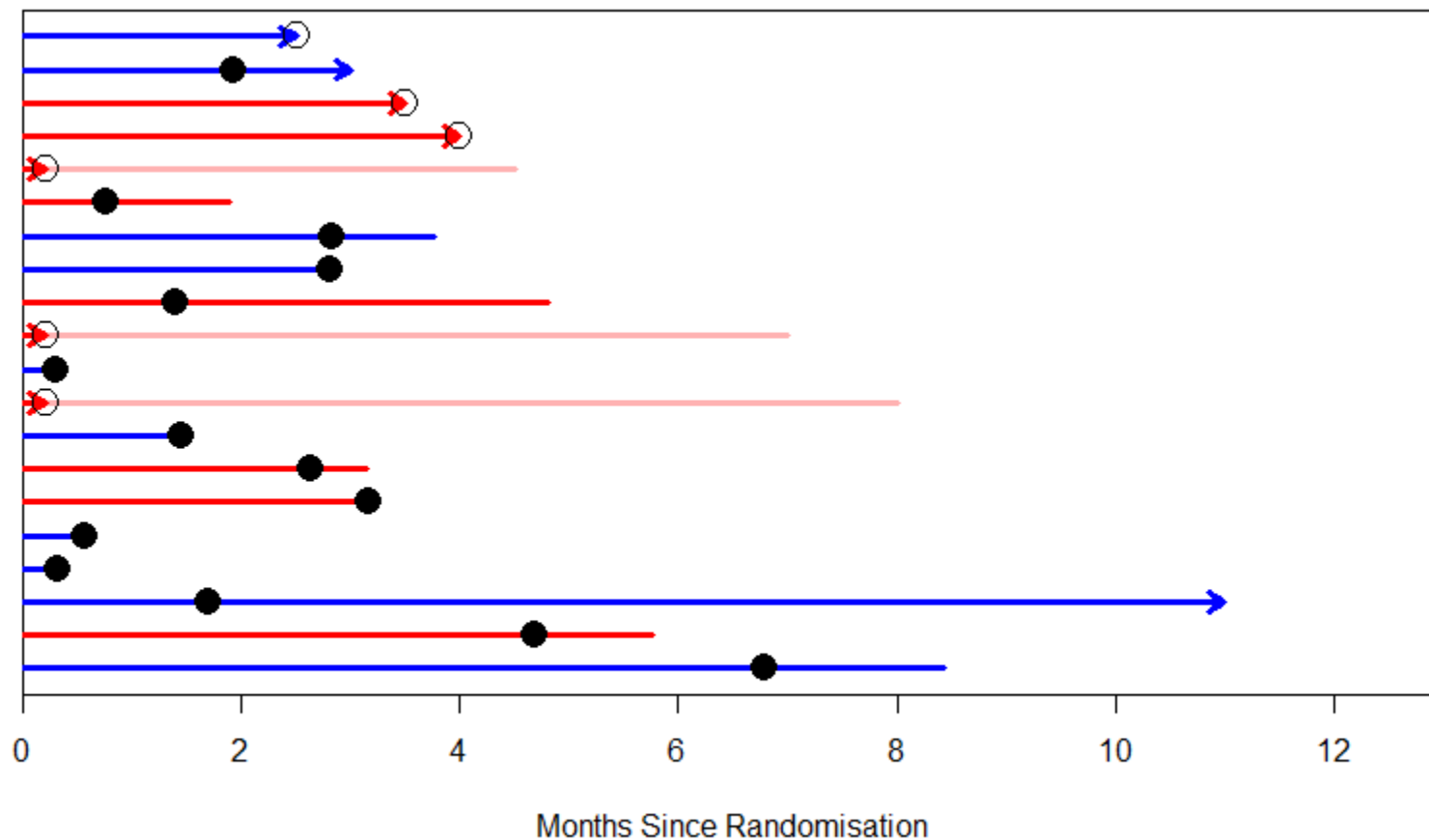
# Zeroing Back To A Time Since Randomisation



# Breaking The Blind

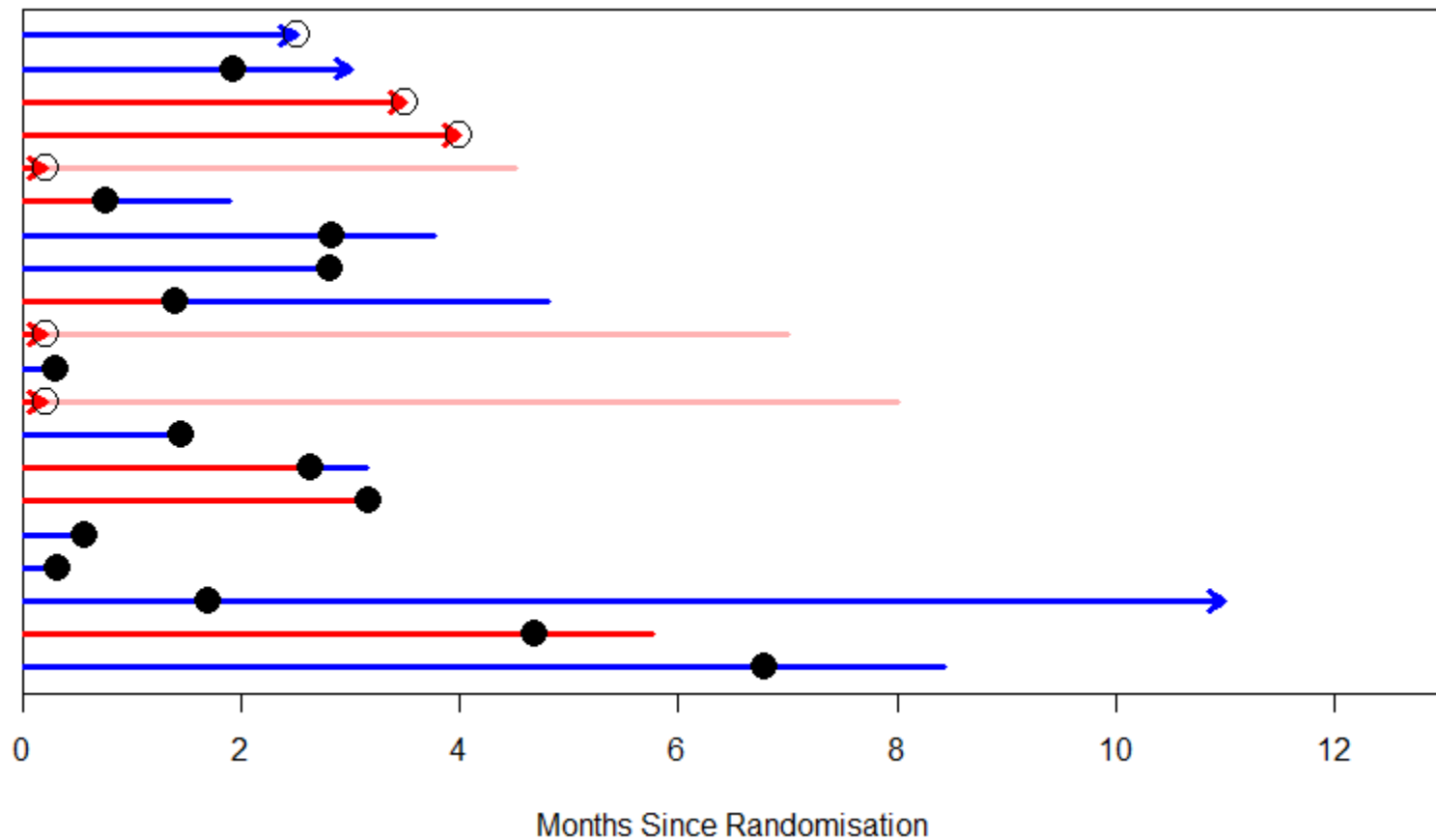


# Potential Intercurrent Events 2 : Early Study Withdrawal

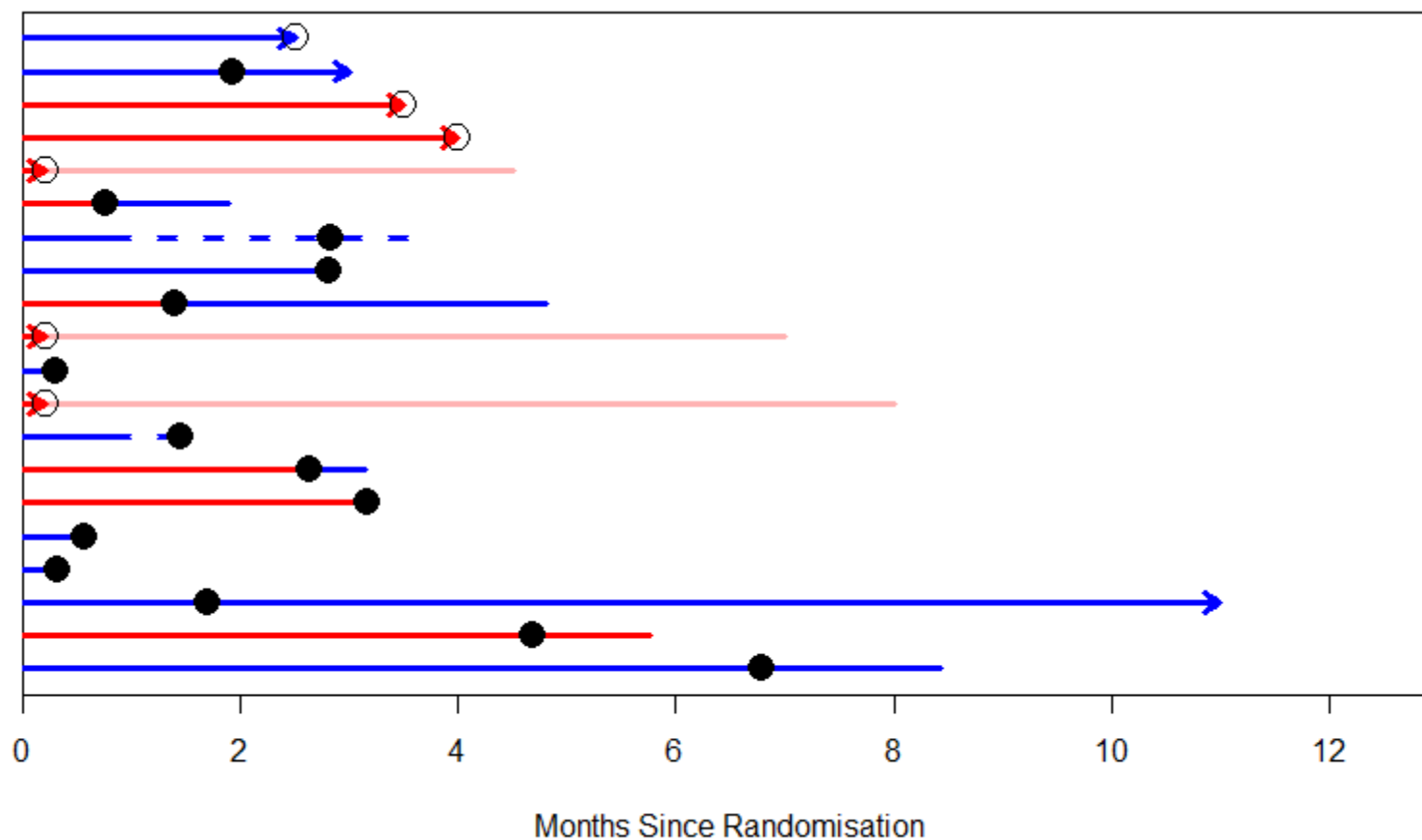




# Potential Intercurrent Events 3 : Post Progression Treatment Cross-Over

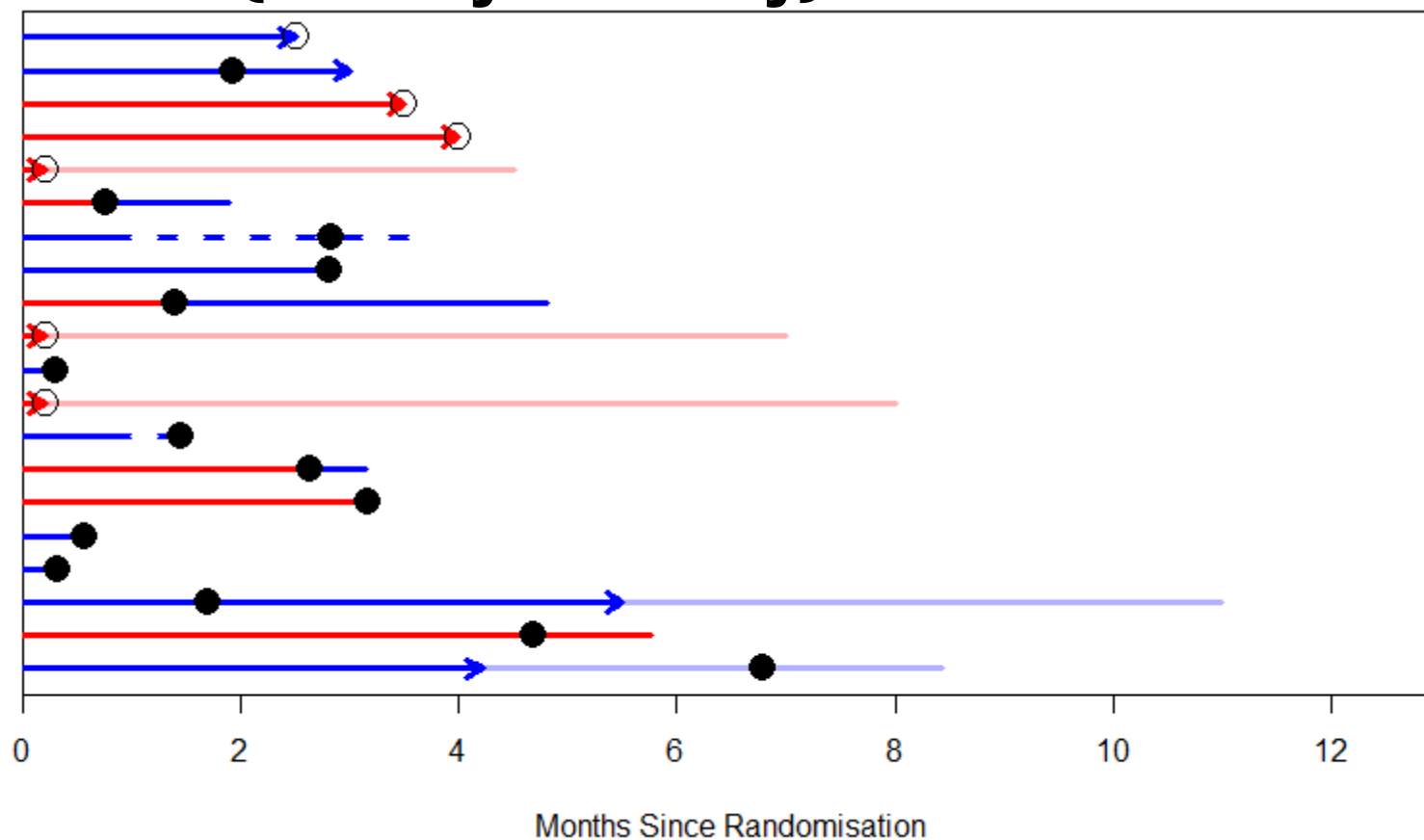


# Potential Intercurrent Events 4 : Dose Reductions



# Potential Intercurrent Events 5 :

## On-Treatment Withdrawals : May or May Not Be Treatment (Efficacy or Safety) Related

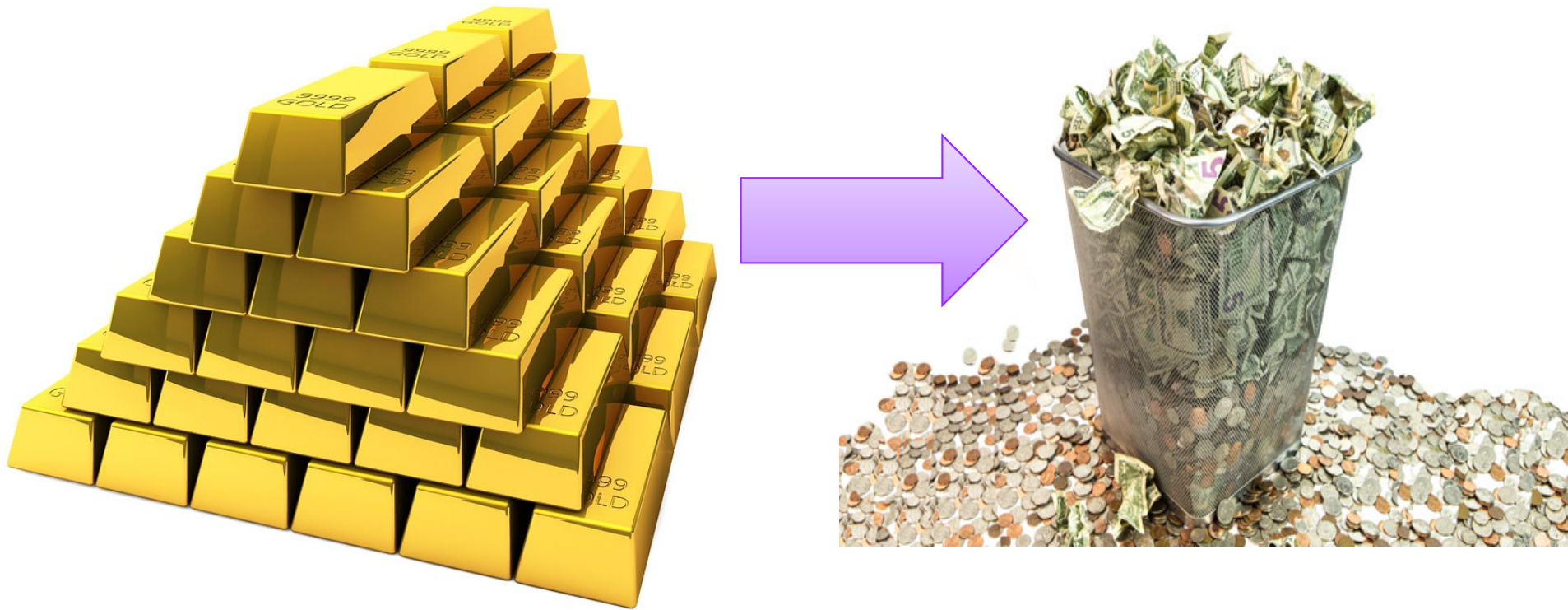


# Randomisation is the Gold Standard

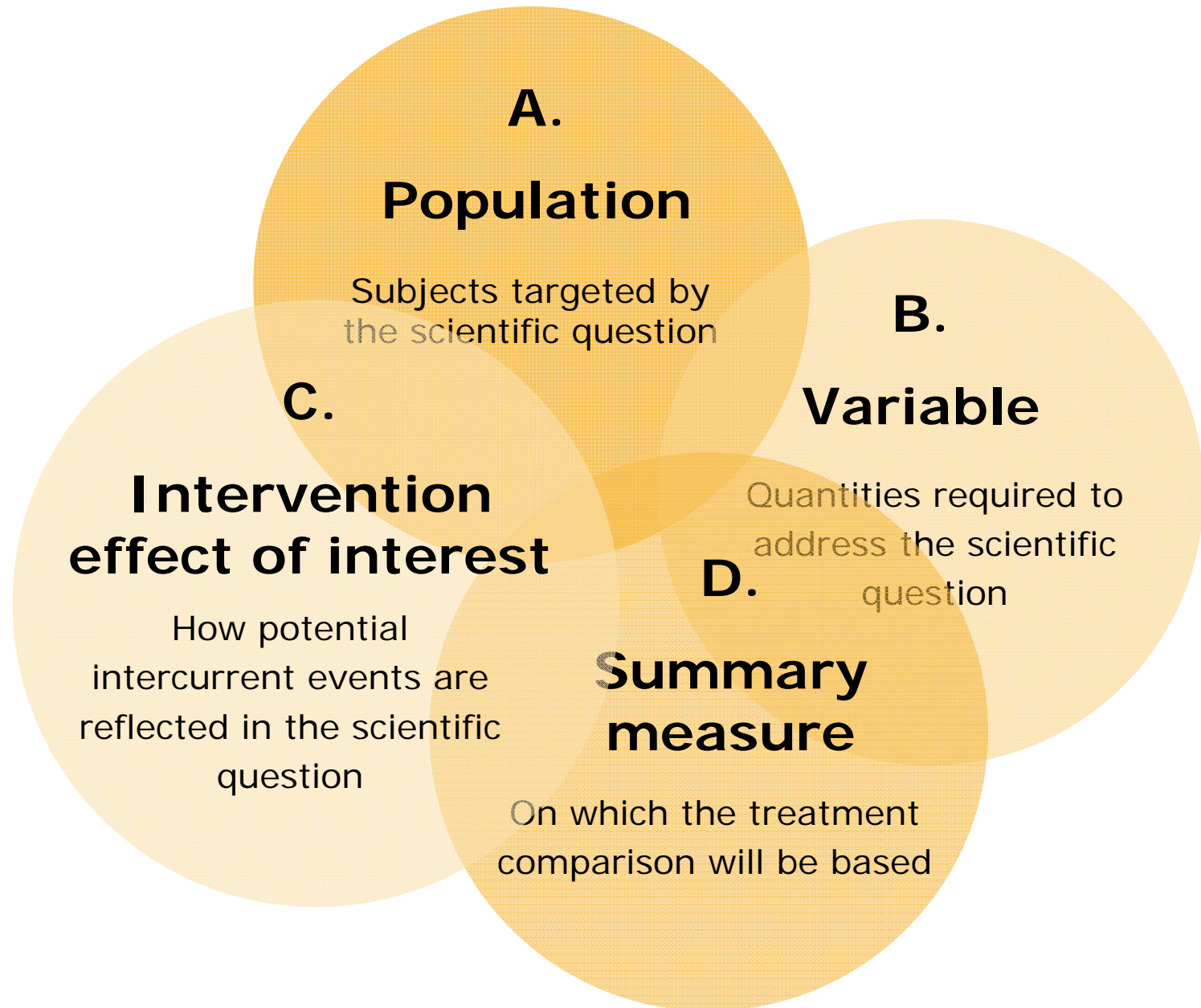


# Randomisation is the Gold Standard

**InterCurrent Events make the value of the wealth of information harder to evaluate**

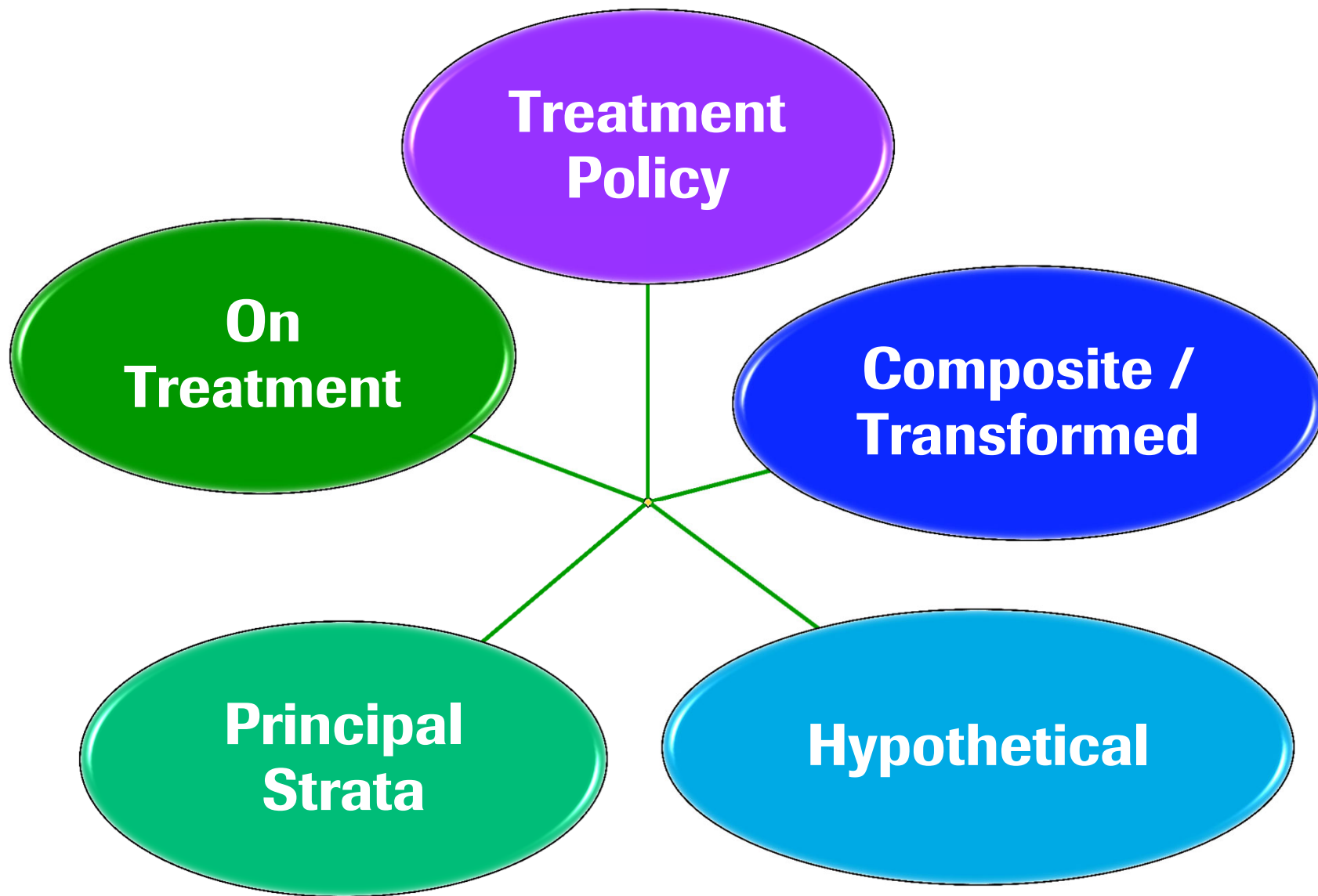


# Four Attributes Of An Estimand





# Five Potential Strategies



# Administrative Censoring



**Population**

**Variable**

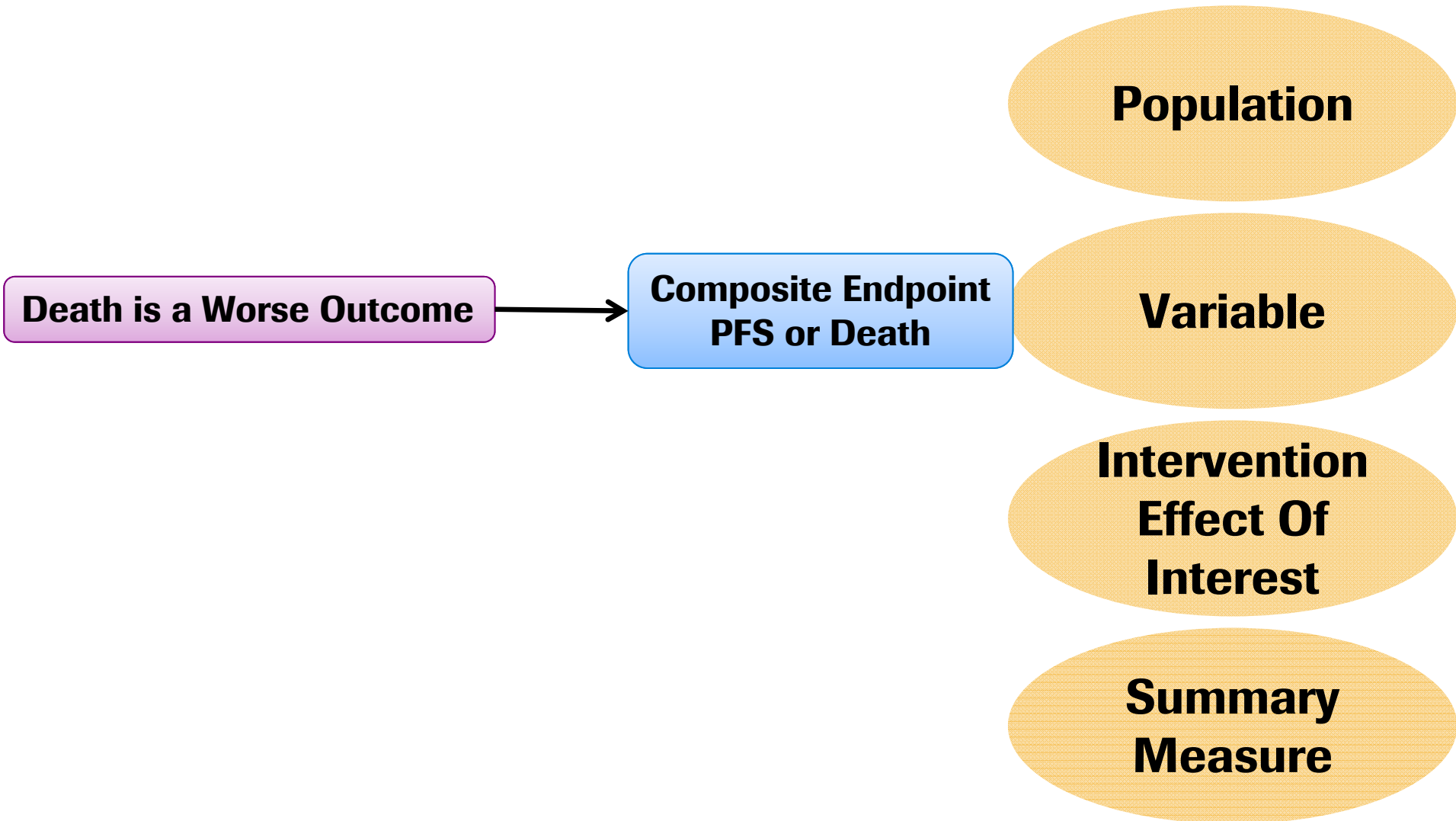
**Intervention  
Effect Of  
Interest**

**Summary  
Measure**

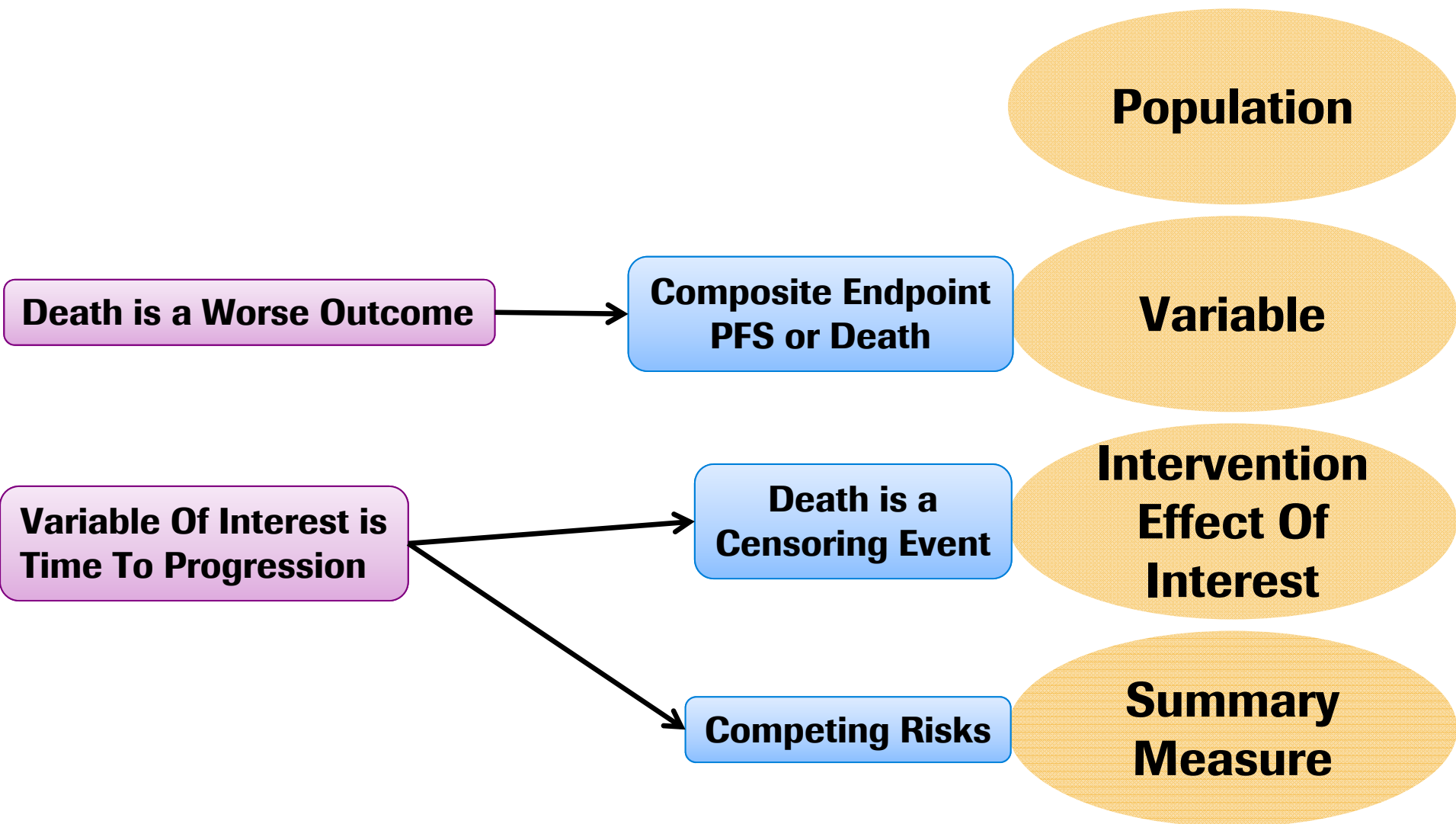
**Reasonable to be  
assumed uninformative**

**Hazard ratio  
Modelling incorporating censoring  
Cox PH / AFT**

# For PFS : Death Before Progression



# For PFS : Death Before Progression



# Treatment Switching



Ignore



Treatment Policy

**Population**

**Variable**

**Intervention  
Effect Of  
Interest**

**Summary  
Measure**

# Treatment Switching

**Ignore**

**Treatment Policy**

**Population**

**Associated With Progression**

**Incorporate Into  
Composite**

**Variable**

**Intervention  
Effect Of  
Interest**

**Summary  
Measure**



# Treatment Switching

**Ignore**

**Treatment Policy**

**Population**

**Associated With Progression**

**Incorporate Into  
Composite**

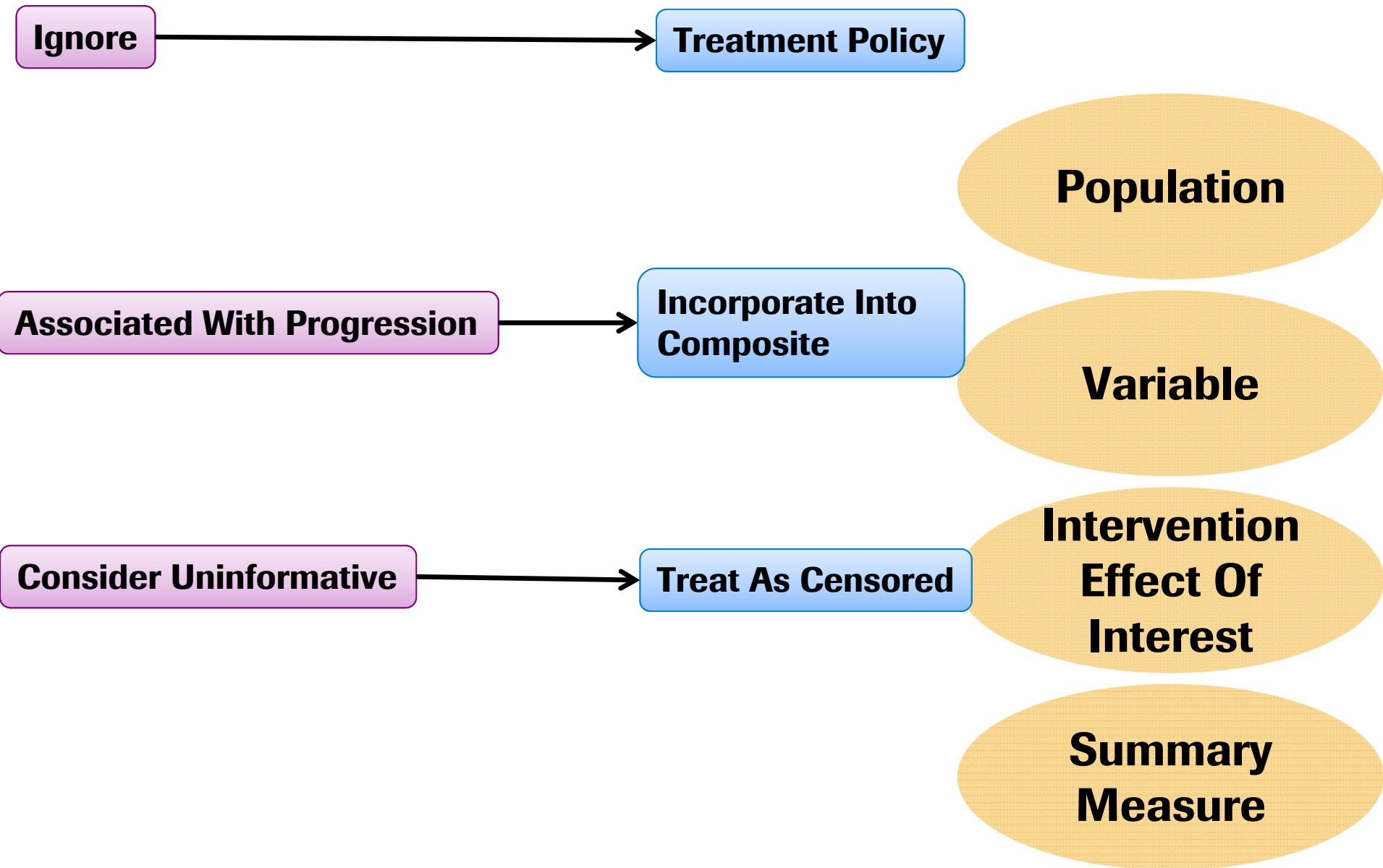
**Variable**

**Consider Uninformative**

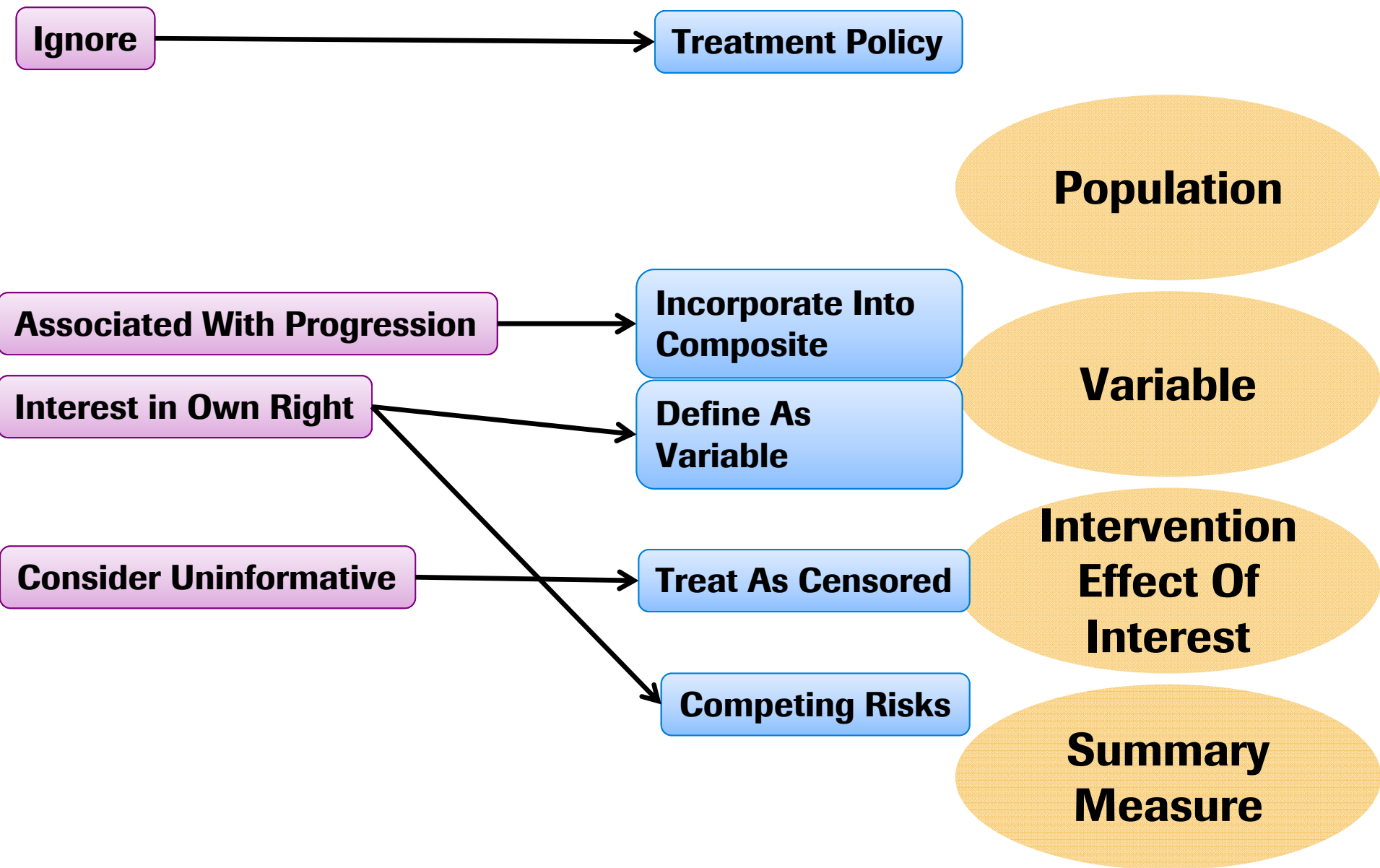
**Treat As Censored**

**Intervention  
Effect Of  
Interest**

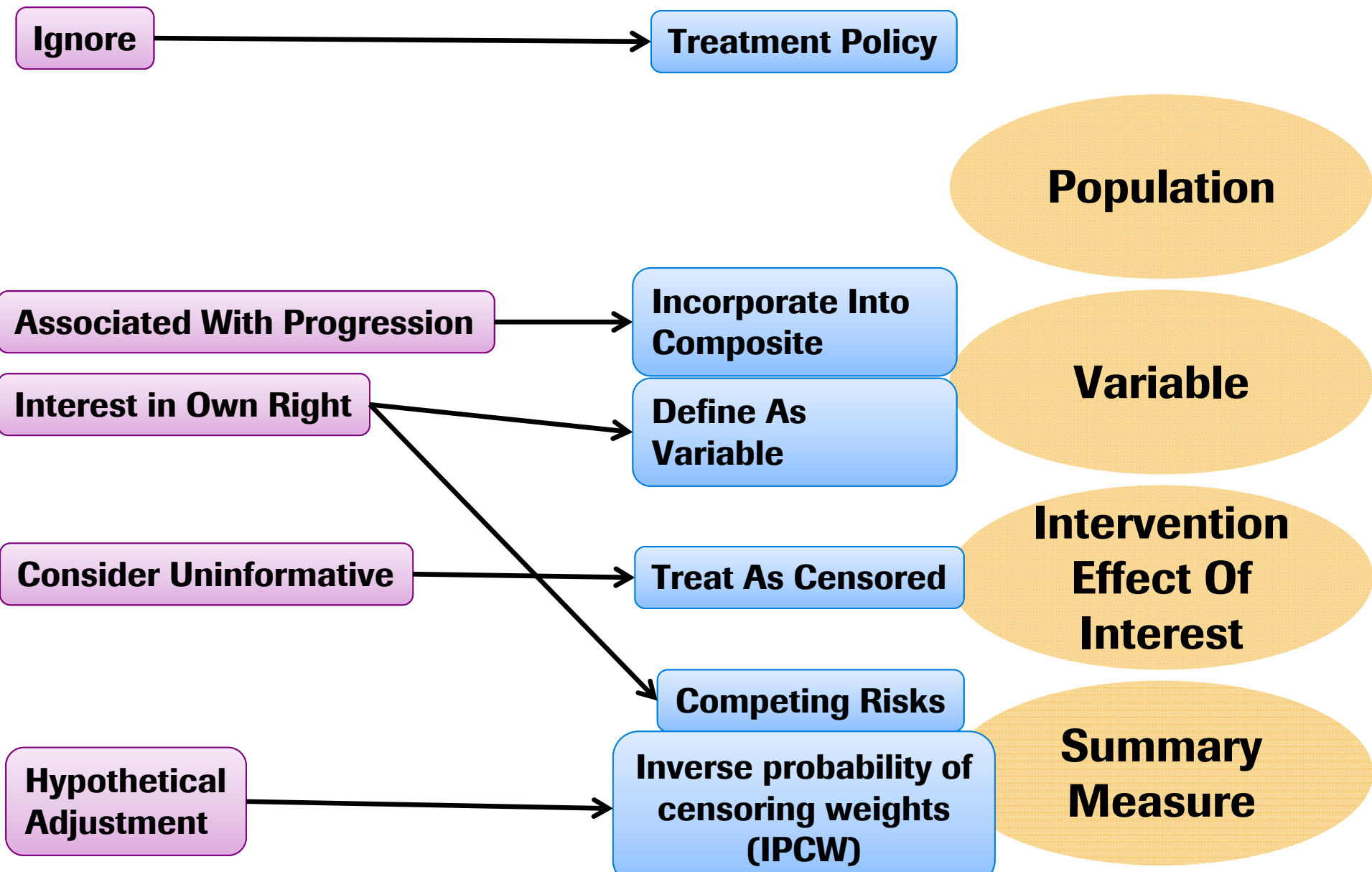
**Summary  
Measure**



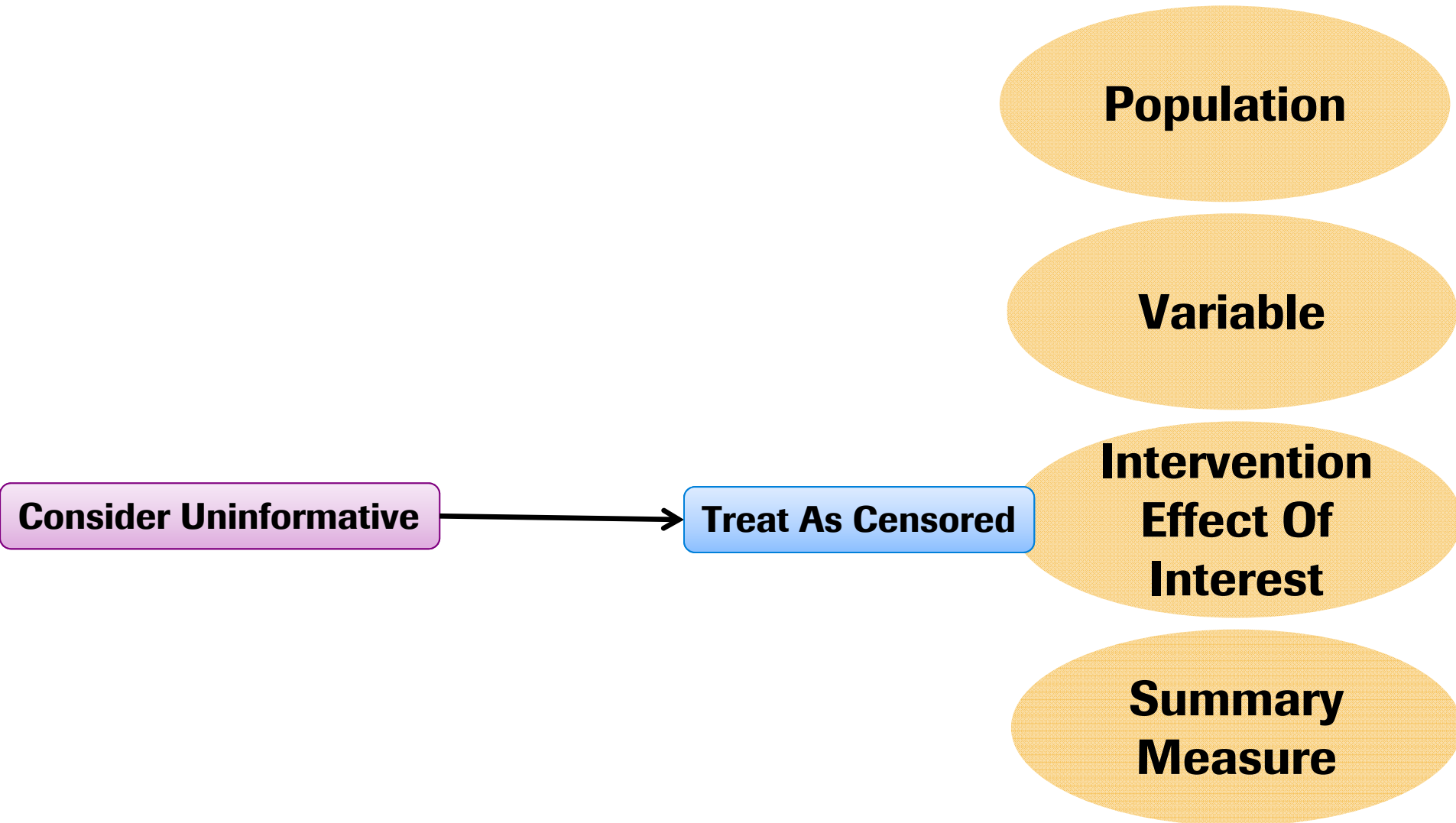
# Treatment Switching



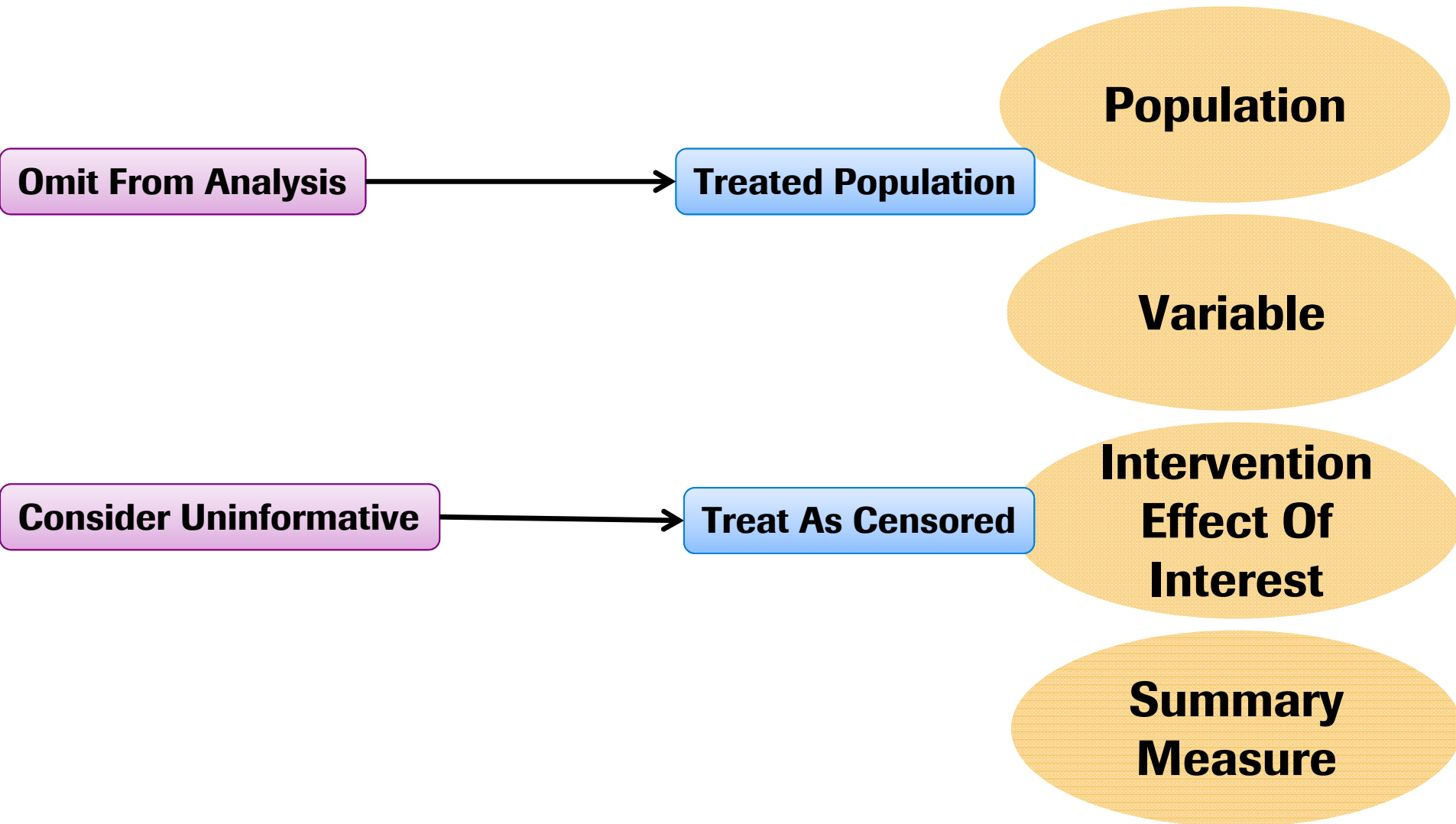
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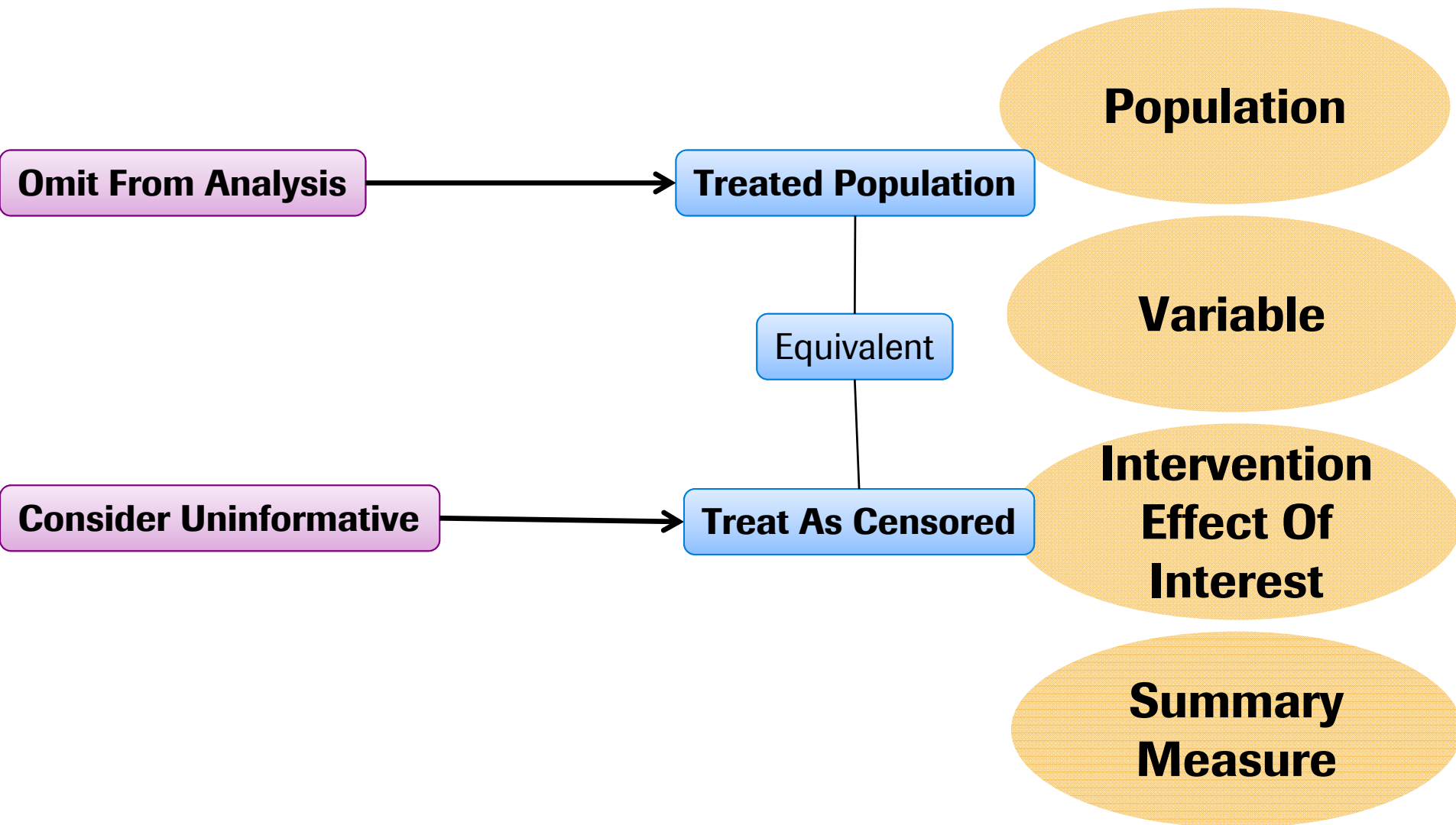
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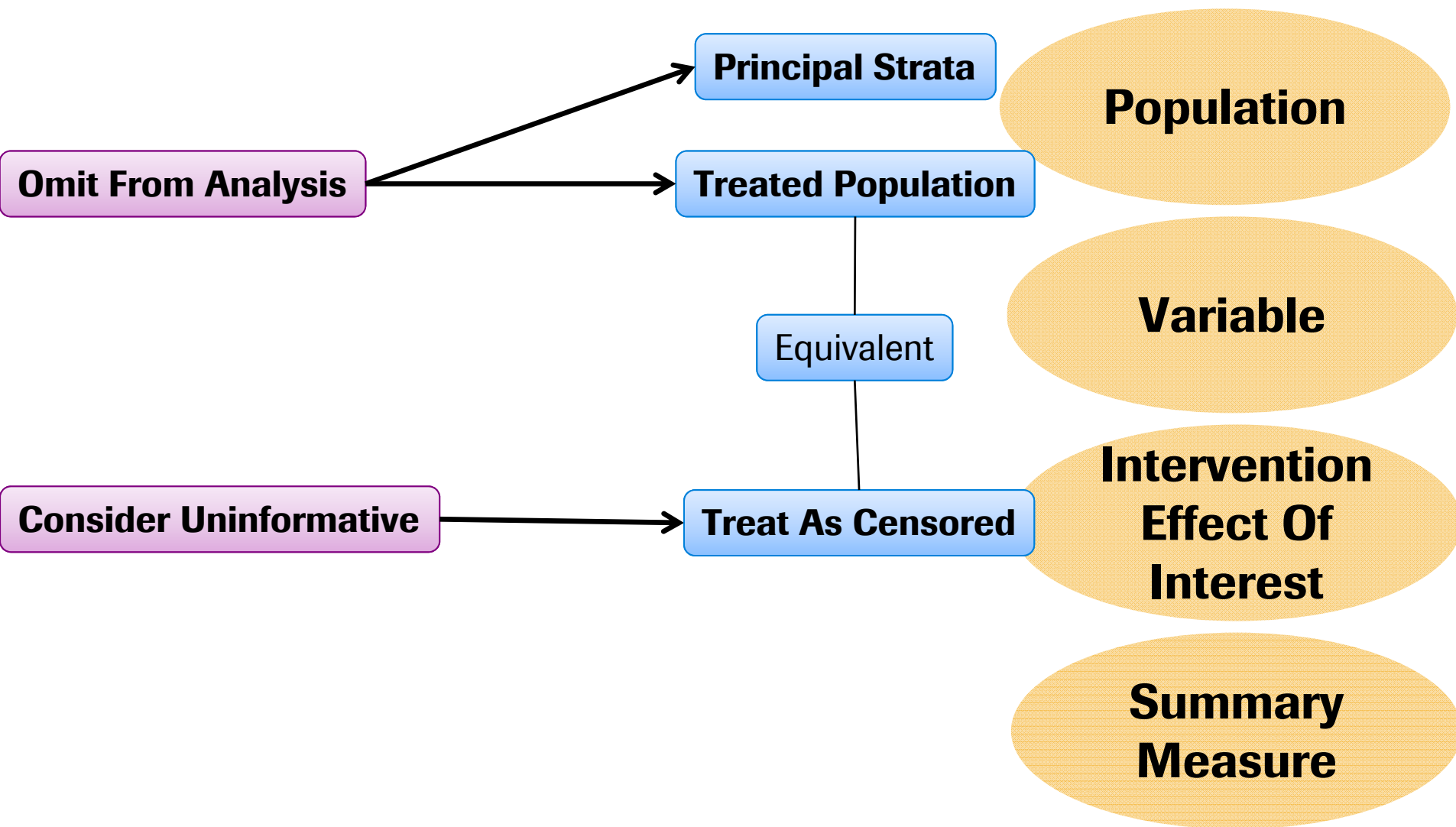


# Early Withdrawals – Post-Randomisation , Pre-Treatment





# Early Withdrawals – Post-Randomisation , Pre-Treatment



# Treatment Withdrawals Post- Starting Treatment

Ignore

Treatment Policy

**Population**

**Variable**

**Intervention  
Effect Of  
Interest**

**Summary  
Measure**

# Treatment Withdrawals Post- Starting Treatment

**Ignore**

**Treatment Policy**

**Population**

**Variable**

**Intervention  
Effect Of  
Interest**

**Summary  
Measure**

**Consider Uninformative  
While On-Treatment**

**Treat As Censored**

# Treatment Withdrawals Post- Starting Treatment

**Ignore**

**Treatment Policy**

**Could potentially split out by reason for withdrawal (efficacy, safety, unrelated) and treat differently**

**Population**

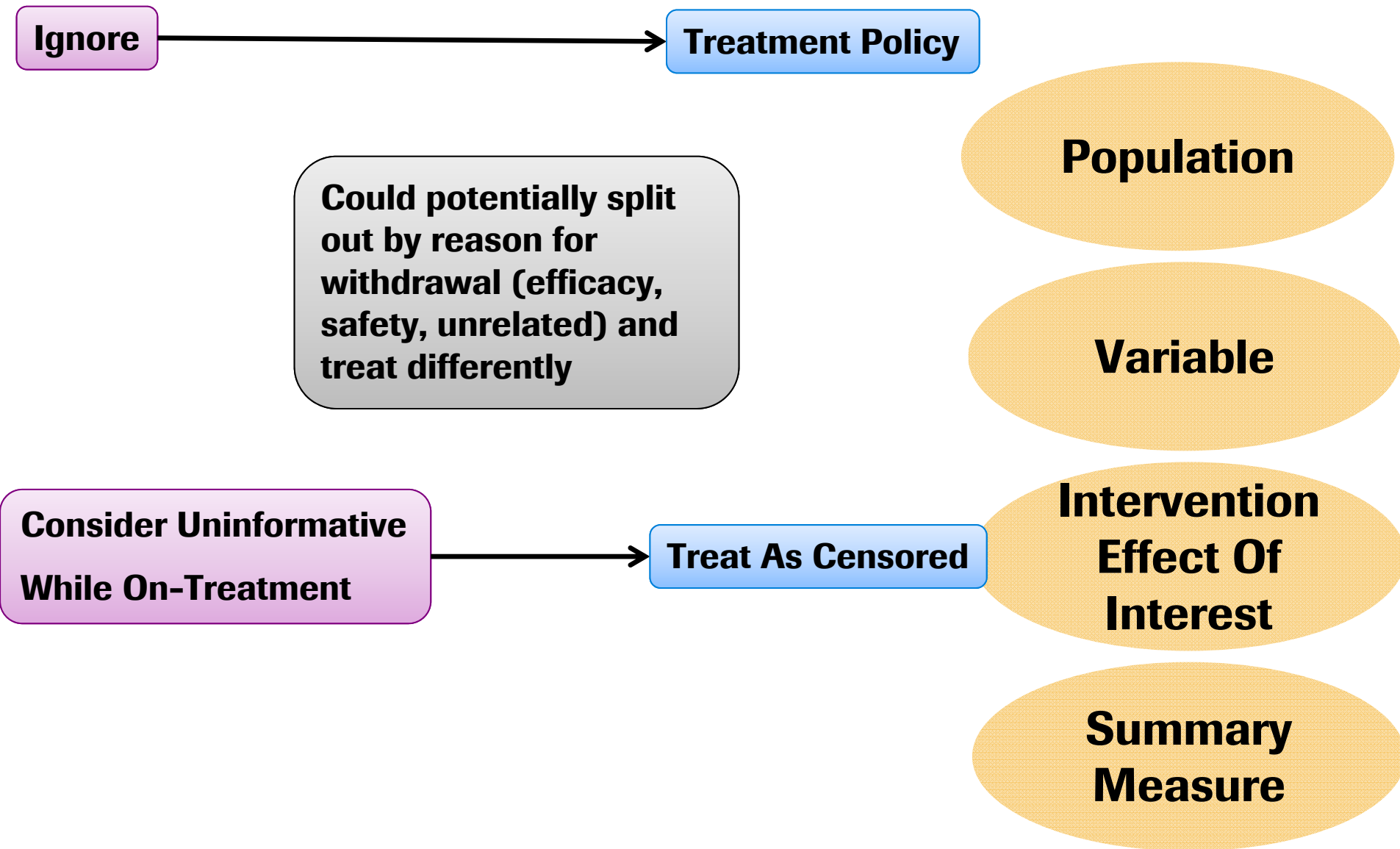
**Variable**

**Consider Uninformative While On-Treatment**

**Treat As Censored**

**Intervention Effect Of Interest**

**Summary Measure**



# Dose Reductions



**Ignore**



**Treatment Policy**

**Population**

**Variable**

**Intervention  
Effect Of  
Interest**

**Summary  
Measure**

# Dose Reductions

**Ignore**

**Treatment Policy**

**Population**

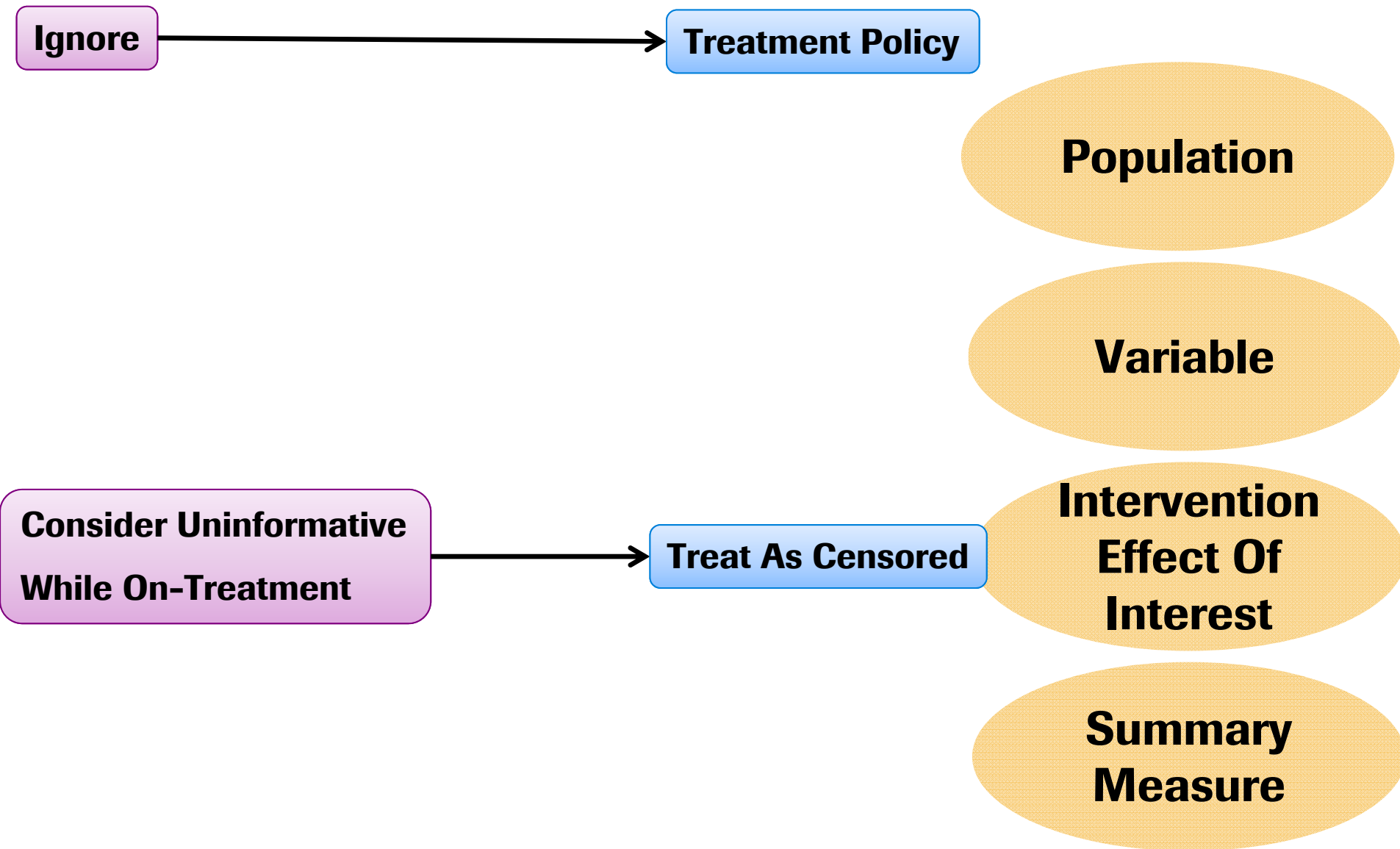
**Variable**

**Intervention  
Effect Of  
Interest**

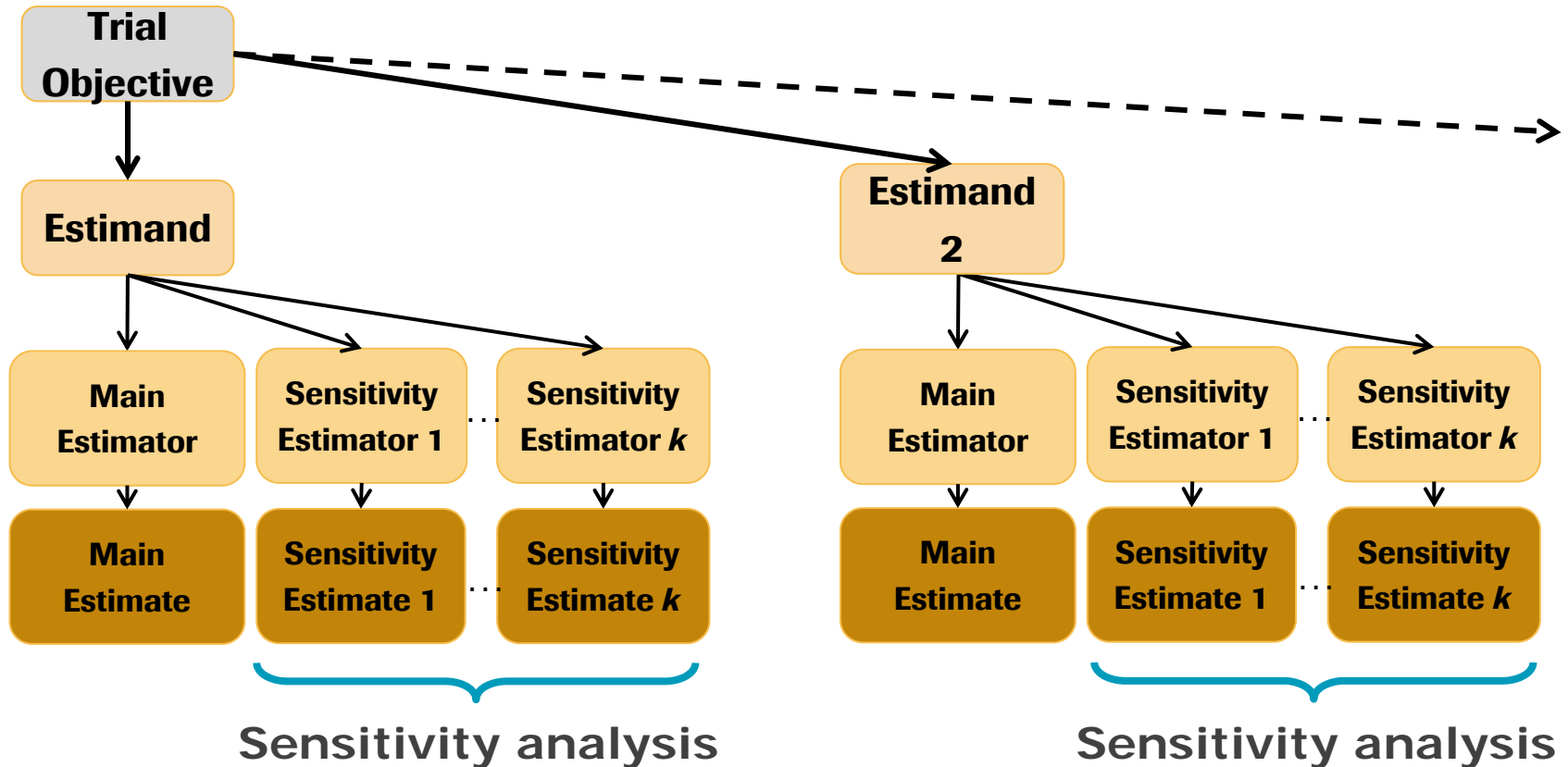
**Summary  
Measure**

**Consider Uninformative  
While On-Treatment**

**Treat As Censored**



# Sensitivity Analyses



**Different estimands may require different numbers of sensitivity analyses**

- Importance of estimand
- Level of assumptions required in estimator
  - Treatment policy – fewer assumptions -> fewer sensitivity analyses
  - Hypothetical or Principal Strata -> modelling -> more sensitivity analyses

# Non-Hodgkin Lymphoma

**DLBCL & FL : Two most common lymphomas,  
Often treated with the same agents**

<b>Follicular Lymphoma</b>	<b>Diffuse Large B-Cell Lymphoma</b>
<b>~20% of NHL diagnoses</b>	<b>~30% of NHL diagnoses</b>
<b>Indolent disease – cancer cells clump in lymph nodes</b>	<b>Aggressive disease – cancer cells spreading out</b>
<b>Late diagnosis</b>	<b>Diagnosis can be early</b>
<b>Many patients respond, but usually relapse</b>	<b>Highly responsive, good prognosis if respond, poor prognosis if relapse</b>
<b>Aim is to delay disease return</b>	<b>Aim is cure</b>
<b>New anti-lymphoma therapy (NALT) typically initiated after PD</b>	<b>Investigators tempted to initiate NALT if patient only achieves partial or stable response, even before PD</b>



# Non-Hodgkin Lymphoma

**PFS: Event = PD/death, censored at last tumor assessment.**

Estimand	PD	Death	No Response but no PD	NALT without PD
Fleming et al (2009): "patients <b>should not be censored</b> at the time other treatments are initiated when analyzing the PFS endpoint"	E	E	-	-
Cheson et al (2007): "...in studies in which failure to respond without progression is considered an indication for another therapy, such patients <b>should be censored</b> at that point for the progression analysis. "	E	E	C (DLBCL) - (FL)	-
Event Free Survival	E	E	-	E
Time To Next Treatment	-	E	-	E

E=Included in composite endpoint, C=Censoring , - = Not considered



# Any Questions?

Roche



*Doing now what patients need next*



Observed time-to-event endpoints typically contain many censored observations. As a consequence, many of the standard analysis approaches e.g. Kaplan-Meier and Proportional Hazards are specifically designed to address these partially missing data. This ability to cope with data being missing due to censoring has frequently led to the benefits of estimands for addressing other types of intercurrent events being overlooked.

In this presentation I will discuss how the estimand framework provides a vehicle for explicitly describing and addressing several of the challenges within time-to-event analyses such as treatment cross-over, informative censoring, lack of blinding and inconsistent definition of endpoints.