# Estimands in Oncology: A Topical Panel Discussion

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Co-Chairs: Yeh-Fong Chen and Qing Xu

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The comments expressed herein are the authors' own and should not be interpreted in any way as representing FDA's views or policies.

#### **Questions for the Panel**

- I) How can we encourage consistent analysis and interpretation of Duration of Response and Time to Response in clinical trials?
- 2) What is the clinical question of interest if patients receive the option of subsequent therapy?
- 3) How does concern about causal estimands impact the way we do time toevent trials?
- 4) What do we mean by follow-up time in a clinical trial?

#### Question 1

How can we encourage consistent analysis and interpretation of Duration of Response and Time to Response in clinical trials?



to review DOR and TTR from the perspective of estimand framework

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- Hans-Jochen Weber (Novartis)
- Alexander Todd (AstraZeneca)
- Jiang Li (Beigene)
- Francois Mercier (Roche)
- Oliver Sailer (Boehringer Ingelheim)
- Satrajit Roychoudhury (Pfizer)
- Stephen Corson (Phastar)
- Godwin Yung (Genentech)
- Steven Sun (Johnson & Johnson)



Janssen

PHARMACEUTICAL COMPANIES OF Johnson Johnson

#### Response related endpoints



Jansser

#### Analytic Approach



- Combine ORR and cDOR in a single unconditional mean DOR (EDOR)
- Analyse via probability of being in response function (PBRF) (Ellis 2008 CCT 29 456-465)
  - Area under PBRF = EDOR
- Patient level: unconditional DOR=0 if nonresponder, else =cDOR
- EDOR more informative than ORR + cDOR? (Huang et al. 2020 Ann Intern Med 173: 368-374)



- Censoring at ICE of PD, death or subsequent therapy leading to **biased** estimate because these are competing risk
- Censoring at infinity/after last event date assumes that PD/death or ST time and OR time are independent – is this realistic?
- Principal stratum analysis: TTR for patients who don't have PD/D/ST – Does such subpopulation exist?

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# Question 2: What is the clinical question of interest if patients receive the option of subsequent therapy?

Jay Zhao, FDA Qing Xu, FDA

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#### **Case Study-Different Clinical Question Answered**

Sample size - N=320

Randomization - 1:1 ratio to experimental arm and placebo arm

HSCT - 48% in experimental arm vs 20% in placebo arm

OS endpoint , Imbalanced HSCT distribution	P-value	HR (95% CI)
Primary Analysis: Cox PH model	0.02	0.75 (0.58 <i>,</i> 0.96)
Supplement Analysis: MSM model	0.65	1.06 (0.82 <i>,</i> 1.35)

Qing Xu, Donna Przepiorka, Pharmaceutical Statistics, 2021 Nov;20(6):1088-1101. doi: 10.1002/pst.212





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Question 3: How does concern about causal estimands impact the way we do time to-event trials?

**Jonathan Siegel** 

BIOP 2022 – Rockville, MD – September 21, 2022

#### Causal Estimands and Time-to-Event Trials

- Conventional methods for estimation and testing in time-toevent trials are often not causal estimands under
  - non-proportional hazards (NPH)
  - competing risks
  - > intercurrent events (ICE)
- Dependence on censoring patterns can make estimators dependent on trial design and patient behavior
- > Non-proportional hazards are increasingly common in oncology

#### **Estimands and Feasibility**

- Must be clinically meaningful and feasible.
- Treatment policy strategy often preferred, not always feasible.
  - > Requires consistently following patients to event of interest
- Scheduled clinic visits after progression may be infeasible
- **Examples:** 
  - Subsequent therapy/new trial has different visit schedule Primary endpoint is not progression or OS but patients stop clinic visits at progression
  - Ending clinic visits at progression informatively censors all other secondary variables that depend on clinic visits
    - > E.g. clinically assessed symptom indicators
- Alternative strategy should be considered
  - Treatment policy might still be the best strategy

#### Imperfect Alternatives: While on Treatment

- > Event of interest assumed impossible/irrelevant after ICE
- RMST causal estimand under NPH
  - > Truncation perhaps analog of while on treatment
  - > Operating characteristics assume specific hazard pattern
  - > Absolute difference problematic. Hard to interpret

> 3 vs.15 months  $\neq$  8 vs. 9 years

- > Results depend on trial design, censoring pattern.
- Fine-Gray competiing risks Immortal time following ICE

> Lacks 1-1 relationship with cause-specific hazards.

Subdistribution HR not clinically interpretable.

- Cumulative Incidence Function preserves causal estimand
  - Descriptive only. Tests for comparing CIFs proposed but not widely received (e.g. Aly, Kaucher, and Mckeague, 1994; Zhang and Fine, 2008) BIOP) Regulatory-Industry Statistics Workshop 2022 – Rockville, MD

#### Imperfect Alternatives Cont.

- Composite strategy combines intercurrent event with event of interest. Example: PFS
  - > Often least problematic strategy for addressing ICEs
  - > Not necessarily clinically meaningful
- Principal Stratum identifies a population not susceptible to ICE.
  - The population for which causal estimation is valid is not necessarily the population of scientific or medical interest.
  - > Modeling the principal stratum may not be reliable.
- Hypothetical strategy addresses what would have happened if intercurrent event had not occurred
  - > Modeling generally dependent on strong assumptions
  - Discussed in subsequent therapy discussion.

#### Thoughts for Discussion

- The estimands framework requires paying close attention to assumptions, trial design, intercurrent events, and hazard patterns
- > Few good solutions. New developments often yield:
  - Estimand that is causal/valid but not clinically interpretable
  - > Reducing one assumption dependence by introducing others.
- Progress requires better collaboration between methodologists and clinical trialists
  - More attention to real-world problems and clinical meaning when constructing methods
  - > More attention to statistical issues by clinical trial community
  - Communication and shared understanding
- Importance of balance between scientific validity, reliability, and operational feasibility



#### Question 4: What do we mean by follow-up time in a clinical trial?

#### Yi-Ting Chang, AstraZeneca

ASA Biopharmaceutical Section Regulatory-Industry Statistics Workshop

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## Problem statement

### "Follow-up quantification":

**Unclearly defined concept.** 

- Different quantities used to "answer" question.
- □ Precise computation rarely mentioned in publication.

## What do trialists want to know?

Question of interest	Summary measure for one treatment group	Summary measure for treatment comparison and proportional hazards	Summary measure for treatment comparison and non-proportional hazards
Precision	KM confidence bands	Hazard ratio confidence interval	Hazard ratio confidence interval
Reliability	KM confidence bands, no. at risk	Assessment of proportional hazards assumption	-
Stability	Eg assume censored observations to be events	Assessment of proportional hazards assumption	-
Information		Information fraction	Depends on effect measure

## Conclusion

Generation Follow-up quantifiers used in literature **highly heterogeneous**.

□Focus on scientific question, answering that using suitable quantities: precision, stability, information, assumptions for any quantity of interest.

□No hope that any of these questions can be answered with one single number, however defined.

PH vs NPH

Assumption matters for stability.

**DNPH:** need to choose effect measure.

□Information depends on #events (PH) or many more quantities (NPH).

## Resources

- Paper: https://arxiv.org/abs/2206.05216
- Oncology estimand WG: <a href="http://www.oncoestimand.org">http://www.oncoestimand.org</a>

# Your Turn

# **OUESTIONS**?

The chair will moderate questions to the Panel

# End

# •THANKYOU!