

Estimands in pharmacometrics – being precise about what we estimate

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ISOP SxP webinar

Summary

- Precisely defining what we intend to estimate is important for anyone estimating (including pharmacometricians)
- The ICH E9 addendum on estimands provides a useful framework for doing this
- Case Example: a proof-of-concept study with missed doses due to the COVID pandemic

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ICH E9 addendum proposes a new framework to define estimands

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- Estimand = What to estimate
- Emphasizes “what to estimate” before “how to estimate”
- Focus of ICH E9 addendum on treatment effect estimates in confirmatory trials
- Being clear about what to estimate is also relevant for pharmacometricians

The five attributes to specify an estimand

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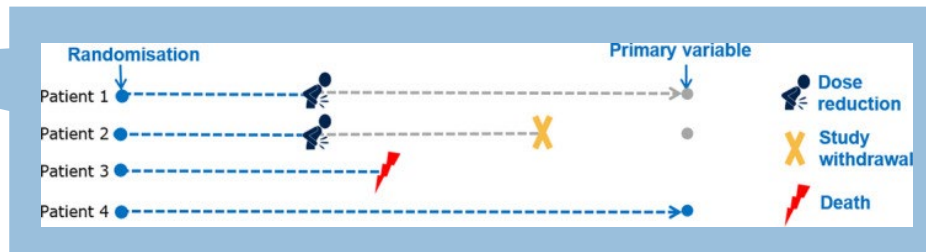
- Treatment(s)
- Population
- Variable
- Strategy to handle intercurrent events not already covered in other attributes
- Population-level summary

Intercurrent events affect interpretation or existence of measurements of interest

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The strategies to handle intercurrent events

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- Treatment policy strategy
= regardless of whether IE occurred
- Hypothetical strategies
= if IE had not occurred
- While on treatment strategies
- Composite variable strategies
- Principal stratum strategies

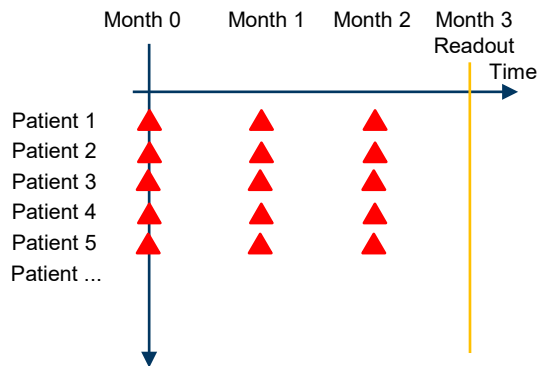
What's in it for the pharmacometrician?

- More clarity on what we are estimating
- Common language with statisticians and clinicians
- Facilitates discussion about why estimates are different (is the WHAT or the HOW different?)
- Pharmacometric methods might offer ways of estimating (=how) for estimands (=what) that are hard to estimate otherwise

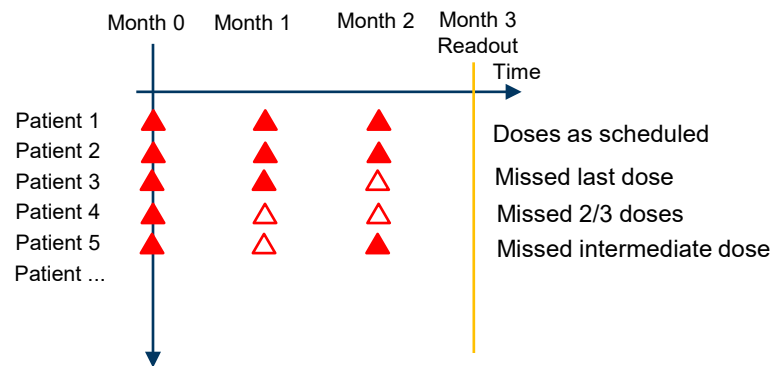
Case example: a PoC study with potentially missed doses

- This is based on theoretical considerations around a PoC study in diabetic macular edema
- Three monthly doses (injections) scheduled. Some doses might be missed due to unforeseen circumstances not related to patient health or drug response (e.g. a global pandemic)

Scheduled dosing



Actual / observed dosing



▲ = dose △ = missed dose

What are treatment policy vs hypothetical estimands?

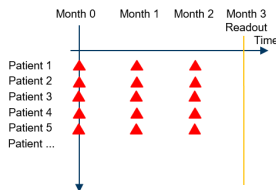
- Consider the intercurrent event of missed doses (could be missing doses intermittently or discontinuing treatment at some timepoint)
- **Treatment policy estimand** is ...
What is the effect of assigning treatment – regardless of whether doses were actually taken as scheduled or not.
- **Hypothetical estimand** is ...
What is the effect of the treatment – if it were taken according to the prescribed schedule.

Why would you use treatment policy vs. hypothetical?

- Treatment policy allows a causal effect estimate without additional assumptions (if randomized and no missing data).
 - Note, that this is the causal effect of assigning the treatment, not of taking the treatment.
- Hypothetical to assess full potential of regimen
 - Here, the hypothetical situation without the intercurrent event (i.e. no missed doses due to the ongoing pandemic) is hopefully relevant for the later real world use case
 - One can argue that “what if doses were taken” is more relevant in a “learning” setting than in a “confirming” setting
 - → method effectiveness (Sheiner)

Hypothetical estimand for the case example

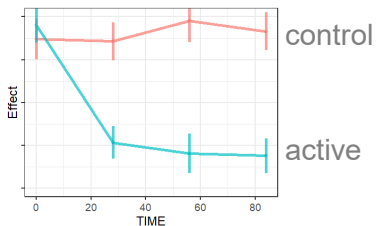
Scheduled dosing



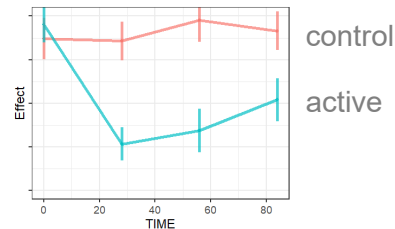
Actual / observed dosing



Hypothetical response



Observed response



PMX analyses often target a hypothetical estimand

- Hypothetical is what we often do in PMX
 - Estimate the model taking actual dosing into account (i.e. the dosing records)
 - Then simulate from population model with scheduled (hypothetical) dosing
- Allows for extrapolation to different doses or regimens
- Here, the intercurrent event was independent of patient health / drug response. Otherwise, beware of confounding.

- To simulate treatment policy estimands, one needs to either
 - Simulate using actual dosing & posthoc estimates for observed subjects, or
 - Implement a dosing/compliance model

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References

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Thank you