
Key Issues in CER for Design and Analysis

(A statistician's view of intervention studies)

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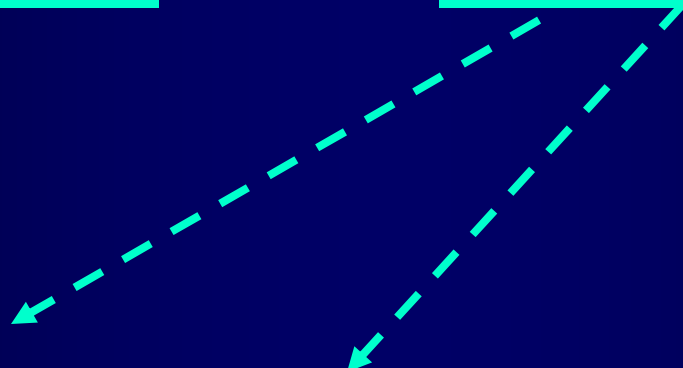
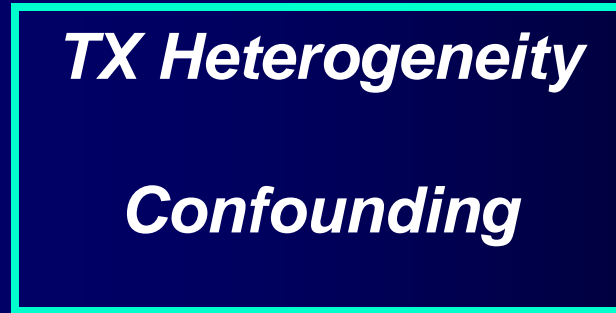
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External vs. Internal Validity

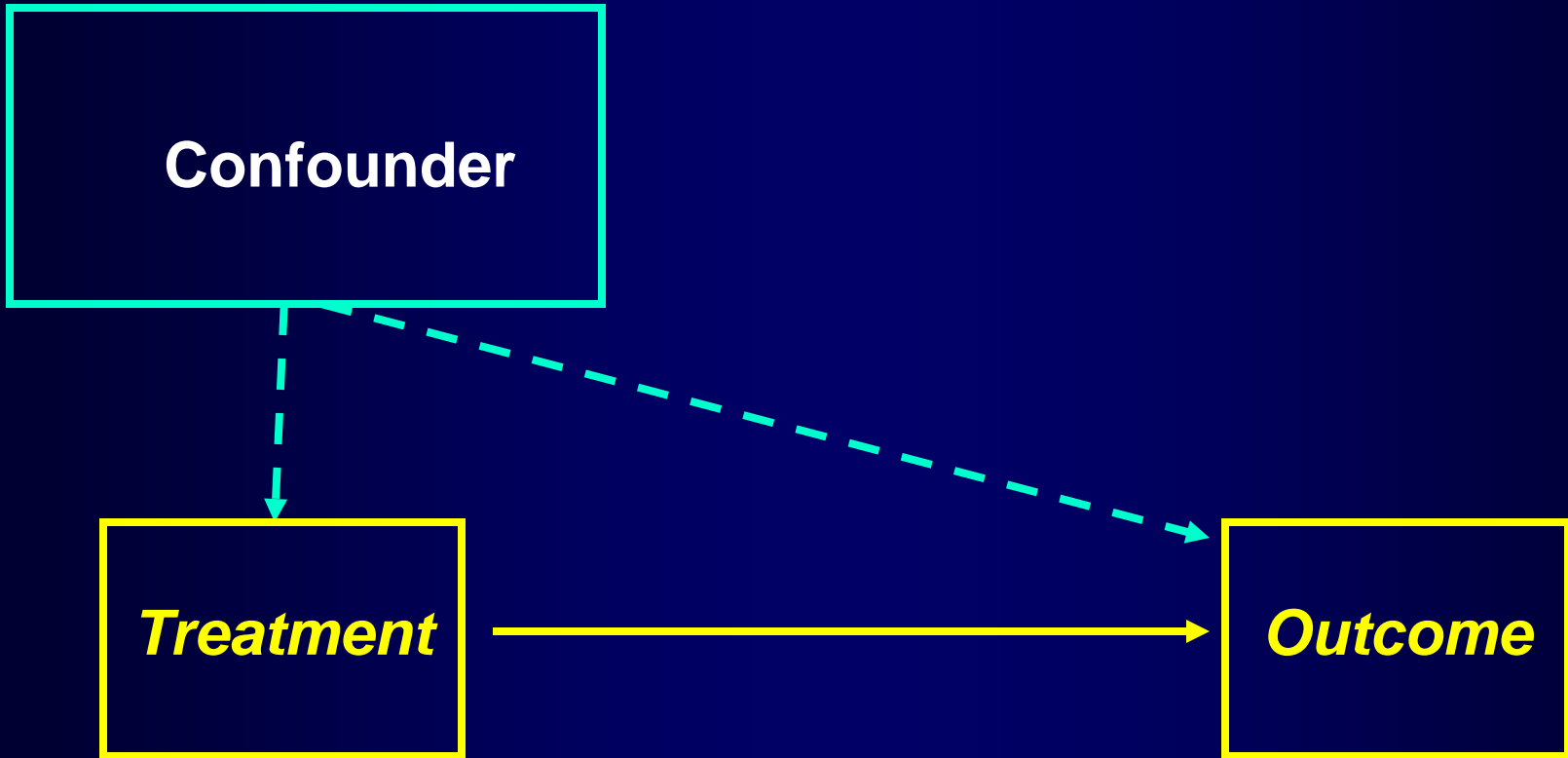
- **External Validity: Inference for a specific study sample generalize to other populations and conditions**
- **Internal Validity: A causal relation between intervention and outcome is “appropriately” demonstrated for a given study sample.**

External Validity

Internal Validity



Confounding



Confounding

Selection bias into treatment

- **Disease severity -- Indication bias**
- **Patient/provider preference**

Treatment Heterogeneity

*Effect
Modifier=1*



*Effect
Modifier=2*



Baseline Treatment Heterogeneity

- **Gene-treatment interactions**
- **Optimizing interventions in sub-groups**
- **Personalizing treatment**
- **Cultural, social, and environmental,
provider heterogeneity**

Post Baseline Treatment Heterogeneity

- **Early response/non-response**
- **Non-adherence**
- **Adverse events**
- **Changing co-morbidities**
- **Changing social and familial relationships**

Design	Time 1	Time 2
<p data-bbox="311 161 513 251">Stratified Equipoise</p> <p data-bbox="233 305 587 348">(External Validity)</p>	<p data-bbox="736 161 1097 251">patient preference disease severity</p>	<p data-bbox="1267 161 1553 197">randomization</p>
<p data-bbox="247 444 577 576">Randomized Encouragement/ Consent</p> <p data-bbox="239 634 581 676">(Internal Validity)</p>	<p data-bbox="768 444 1064 479">Randomization</p>	<p data-bbox="1232 444 1593 534">patient preference disease severity</p>
<p data-bbox="262 726 562 859">Within-Subject Randomized Adaptive</p> <p data-bbox="239 916 581 959">(Internal Validity)</p>	<p data-bbox="768 726 1064 859">randomization/ history, patient preference</p>	<p data-bbox="1184 726 1634 908">randomization/ early response, patient preference, outcome</p>
<p data-bbox="179 1009 643 1099">Step-Wedge (Extended Wait Listing)</p> <p data-bbox="239 1156 581 1246">(Internal+External Validity)</p>	<p data-bbox="774 1009 1058 1093">staggered randomization</p>	<p data-bbox="1267 1009 1553 1093">staggered randomization</p>

Stratified Equipoise Designs

Generalizability Benefit (External Validity):

Comparison of treatment effects between randomized and preference samples (treatment heterogeneity).

Confounding (Internal Validity):

Propensity score for **observed confounding**

Instrumental variable for **unobserved confounding**

Improving generalizability of fully randomized designs

Baseline data collection of confounding factors that relate to treatment

Survey sampling methods to extrapolate results to general population

Post-stratification/ raking

Assumes no treatment heterogeneity

Assessing post-baseline treatment heterogeneity:

Sequential randomization design protects against confounding

**Without sequential randomization
Instrumental variable methods protect
against such bias but...**

Post-baseline heterogeneity in baseline randomized trials

Under MacArthur criteria, post-baseline treatment heterogeneity is “mediation” (Kraemer et al. 2008).

Standard methods are biased and causal methods are required for unbiased effect size estimates.

The challenge is to assess assumptions of standard and causal methods.

Achieving both external and internal validity

More complex randomization designs

Affordable?

More complex analytic methods

Good baseline and post-baseline data on potential confounders?

Close examination of assumptions?