



Accounting for treatment switching/discontinuation in comparative effectiveness studies

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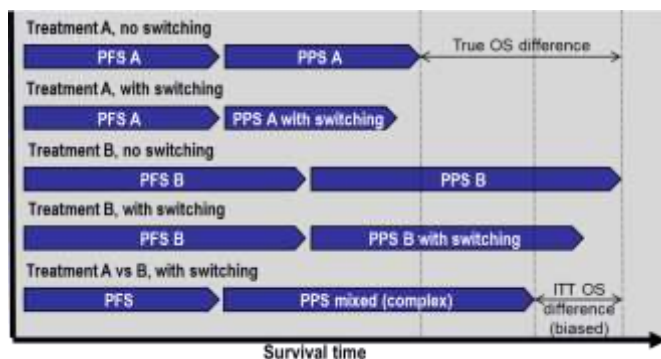


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Treatment switching can cause bias in estimates of treatment effects in observational studies



- Standard ITT/initiated treatment analysis doesn't answer the question we're interested in
- To answer the decision problem, we need to estimate (model) **what would have happened** if there had been no switching




PFS, Progression-free survival; PPS, Post-progression survival; OS, Overall survival

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Inadequate methods used to account for treatment switching¹

 <p>Unadjusted regression models (ITT approach)</p>	<p>assume that treatment switching occurs randomly; only adjust for baseline confounders</p>
 <p>Models that exclude and censor switchers</p>	<p>assume that there are no confounders that affect both the reason for switching and the treatment outcome</p>
 <p>Models with time-varying covariates with simple regression</p>	<p>assume that switching is not affected by prior treatment levels while affecting the outcome</p>



1. Pazzagli *et al.* Pharmacoepidemiol Drug Saf. 2018;27:148–60

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Proposed methods to account for treatment switching¹

 <p>Marginal structural models with inverse probability of censoring weights</p>	<ul style="list-style-type: none">• Switchers are censored from the analysis; non-switchers are given larger weights than switchers with similar histories
 <p>Structural nested failure time models with g -estimation, -formula, or -computation</p>	<ul style="list-style-type: none">• Produce an unbiased estimate of treatment effects on outcomes in studies with treatment switching• Construct a pseudo-population to hypothesize the outcome of switchers if they had not switched to an alternative treatment

1. Pazzagli *et al.* *Pharmacoepidemiol Drug Saf.* 2018;27:148–60

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The Target Trial approach¹

- Framework for analyzing observational data to facilitate appropriate adjustments to be made for treatment switching/discontinuation
- The approach comprises seven key components relating to data collection and analysis



This will be covered in more detail later in the workshop...

1. Hernan *et al.* *Am J Epidemiol.* 2016;183:758–64

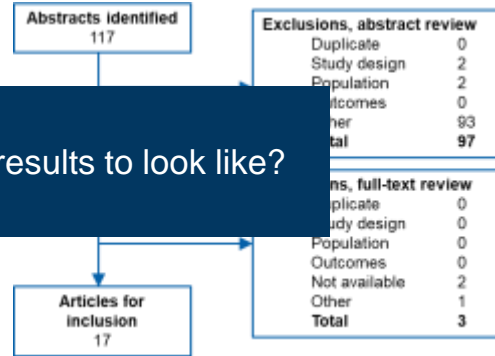
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Literature review of methods used

- Eligible studies:
 - Non-interventional studies comparing the effectiveness of at least two products
 - Title/abstracts mentioning switching/discontinuation in the treatment
 - Published from 1 January 2013
- Eligible studies were identified using PubMed/MEDLINE

What do you expect the results to look like?



PRISMA diagram presenting the selection of eligible studies
Most articles were excluded during abstract review owing to switching/discontinuation not being mentioned in the title/abstract

PRISMA, Preferred Reporting Items for Systematic Reviews and Meta-analyses

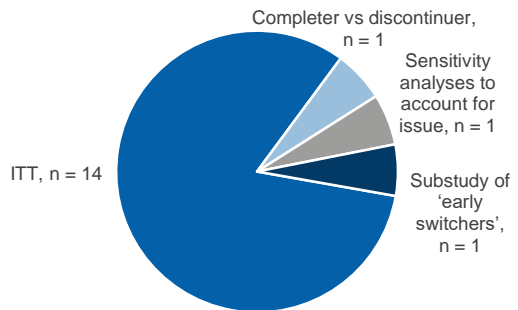
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Most studies identified did not account for treatment switching/discontinuation

- Of the 17 studies, only one included sensitivity analyses to account for switching/discontinuation¹
 - Most studies employed an ITT approach, assuming that switching/discontinuation occurs randomly and therefore can be ignored
 - One study compared the outcomes of 'early switchers' to a treatment with patients who received that treatment alone²



Method used to account for treatment switching/discontinuation, n = 17

ITT, intention-to-treat

1. Choy *et al.* Arthritis Care Res. 2017;69:1484-94

2. Turpie *et al.* Thromb Res. 2017;155:23-7

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Case study: Choy *et al.* 2017

- Study comparing the clinical effectiveness of tocilizumab and tumor necrosis factor inhibitors in patients with rheumatoid arthritis who have not responded to conventional synthetic DMARDs¹
- Sensitivity analyses used to confirm results of primary effectiveness analysis
 - Multiple imputation model used to account for treatment switching/discontinuation
 - Propensity scores calculated using multiple logistic regression with covariates including:
 - Stopped previous treatment (owing to lack of efficacy)
 - Stopped previous treatment (owing to intolerance)

DMARD, disease-modifying antirheumatic drug

1. Choy *et al.* Arthritis Care Res. 2017;69:1484–94

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Widespread adoption of effective methods is warranted



Unadjusted regression models

Excluding/censoring switchers

Time-varying covariates w/ simple reg



Marginal structural models

Structural nested failure time models w/ g-estimation

Target Trial approach

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Thank you

