

A Simulation Study of the Performance of the Prescription Time-Distribution Matching Method to Address Immortal Time Bias

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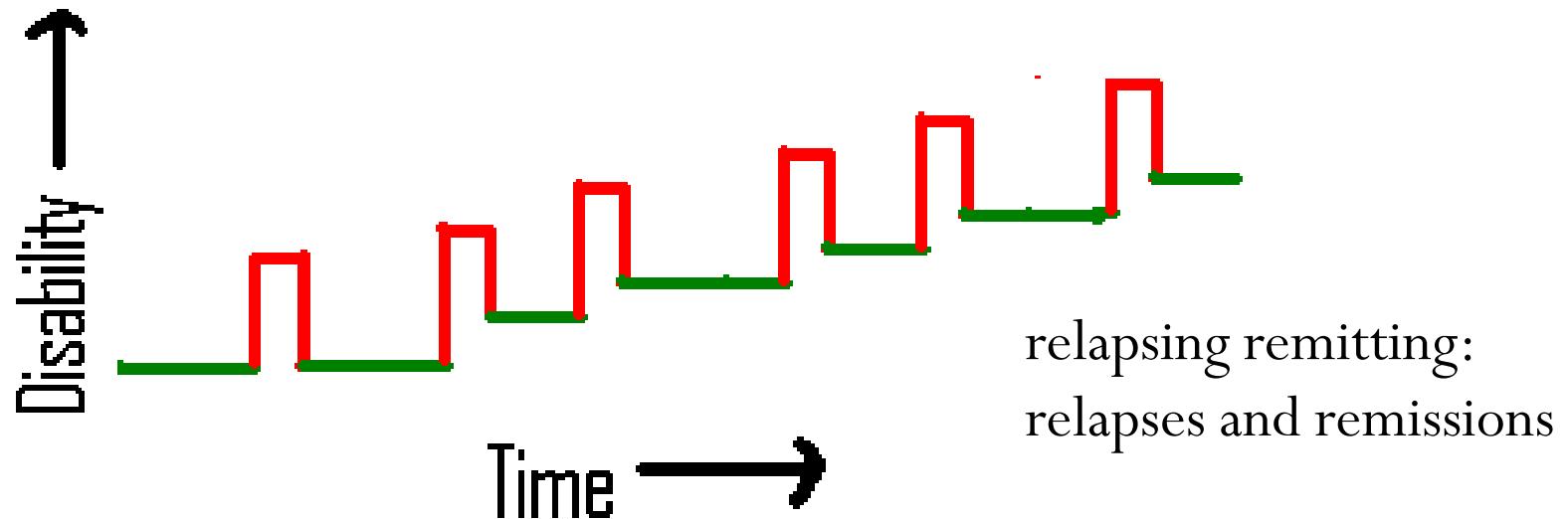
Outline >

- Motivation
- Immortal time bias
- Method
 - Time Distribution Matching (TDM)
 - Causal extension of TDM
- Simulation
- Results
 - Simulation
 - Data analysis

Motivation > MS

— Relapse
— Stable

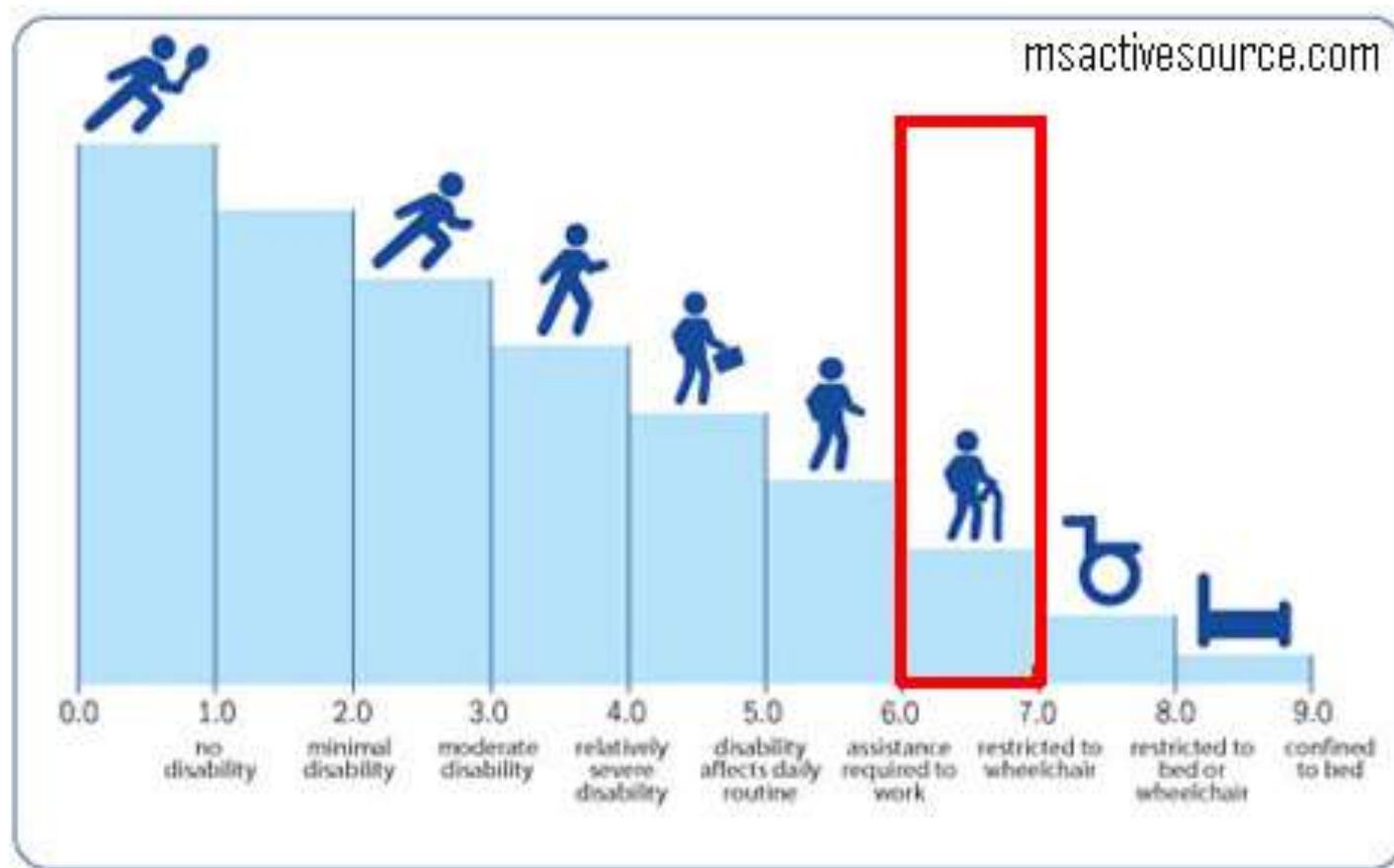
- Multiple Sclerosis: damage of nerve cells



- May lead to disability in the advanced stage

Motivation >

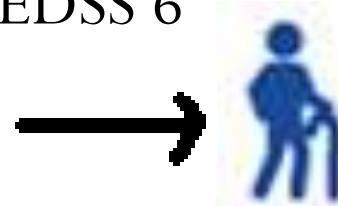
- Disability scores: EDSS



Motivation >



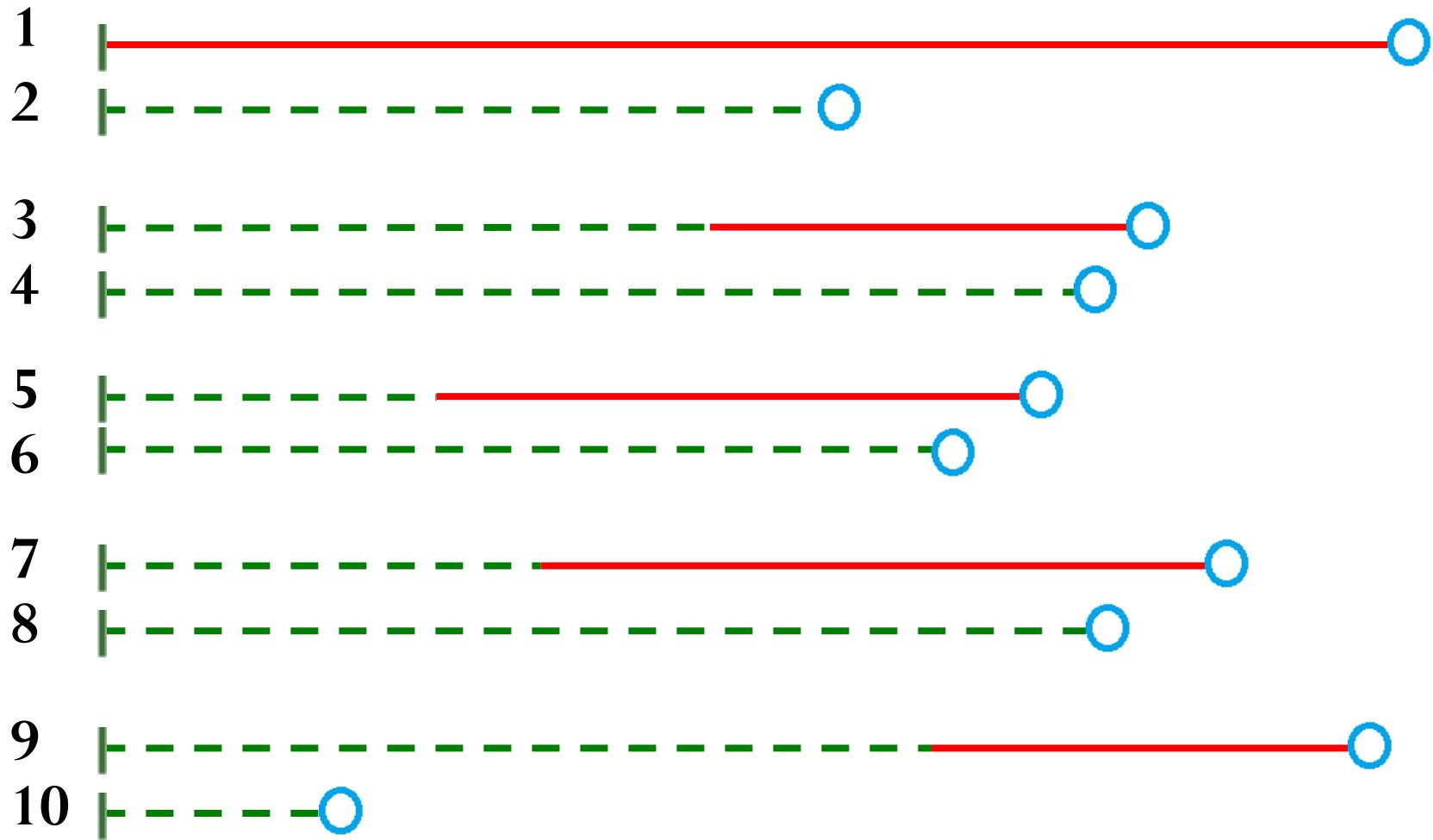
- Treatment: beta-interferon (INFB)
- Baseline: Eligibility to INFB (reimbursement scheme)
- Survival outcome: time to EDSS 6
- Covariates: gender, relapse, EDSS, age, disease duration



Motivation >

----- Not On treatment
——— On treatment
| Baseline

- Observational Multiple Sclerosis data

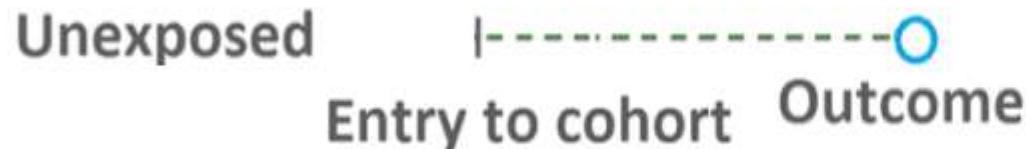
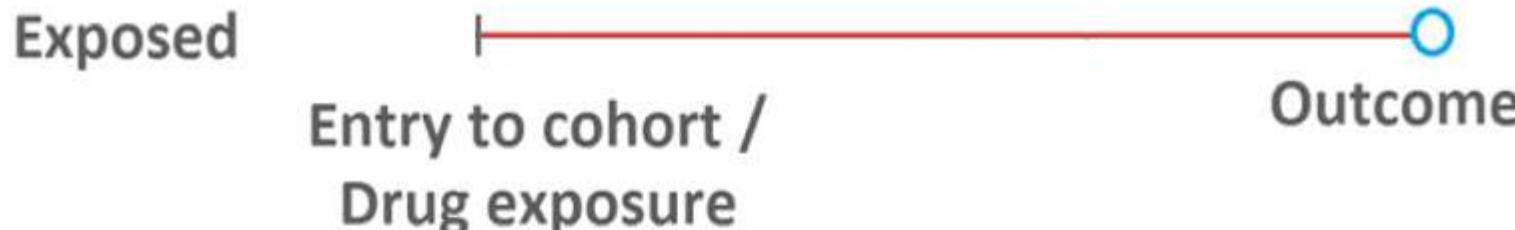


Motivation >

- Analysis strategies:
 - Time-dependent Cox
 - Nested Case control
 - Pooled Logistic regression
 - Marginal Structural model
 - Or something simpler ...?

----- Not On treatment

Immortal time bias > ----- On treatment



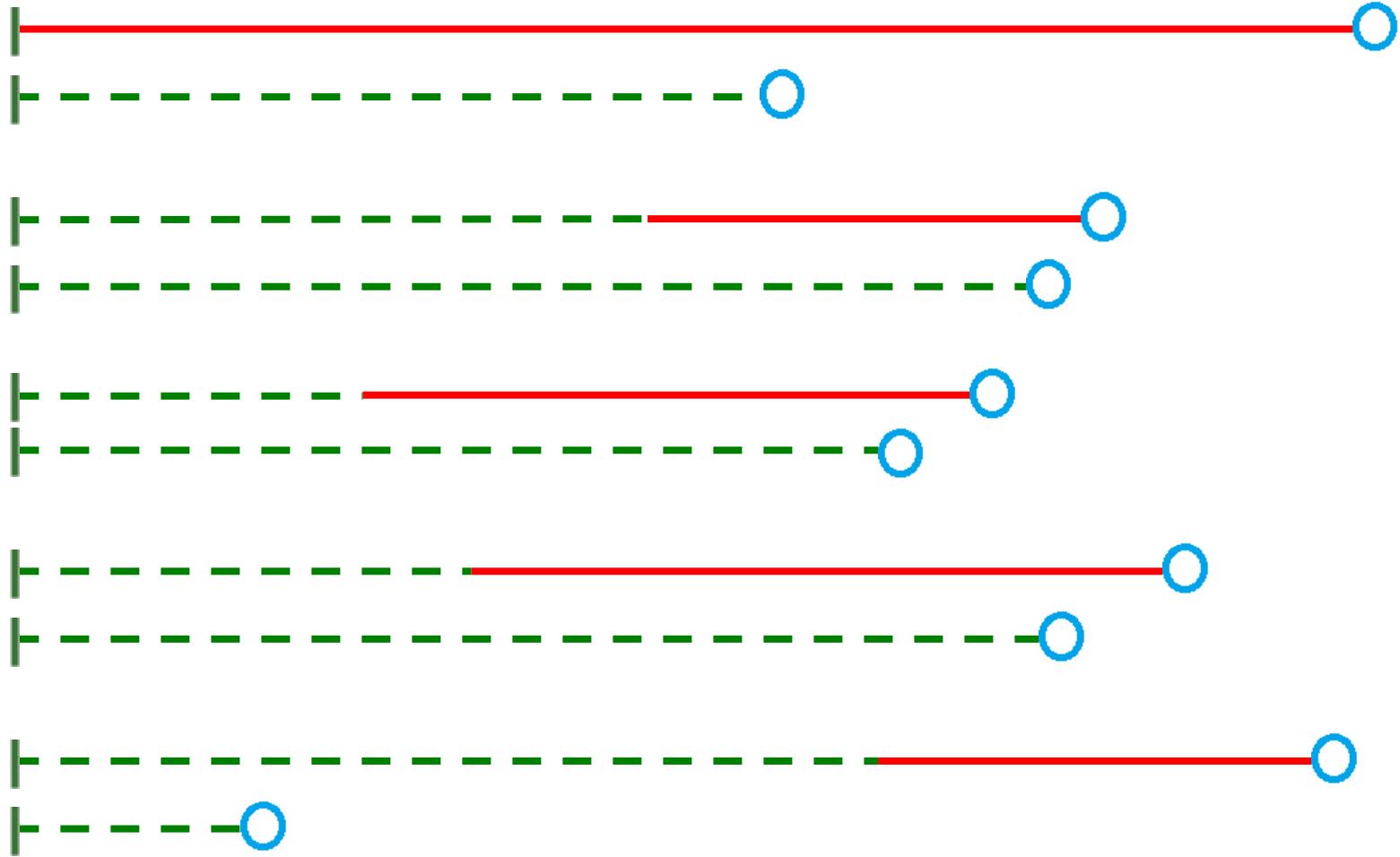
Immortal time bias >

- Simpler analysis strategies:
 - Simple Cox with ever versus never treated (?)
 - Simple Cox with baseline shifted forward (?)
 - Simple Cox excluding wait times (?)
 - Time distribution matching and then simple Cox (?)

TDM Method >

----- Not On treatment
——— On treatment

Zhou et al. (2005)



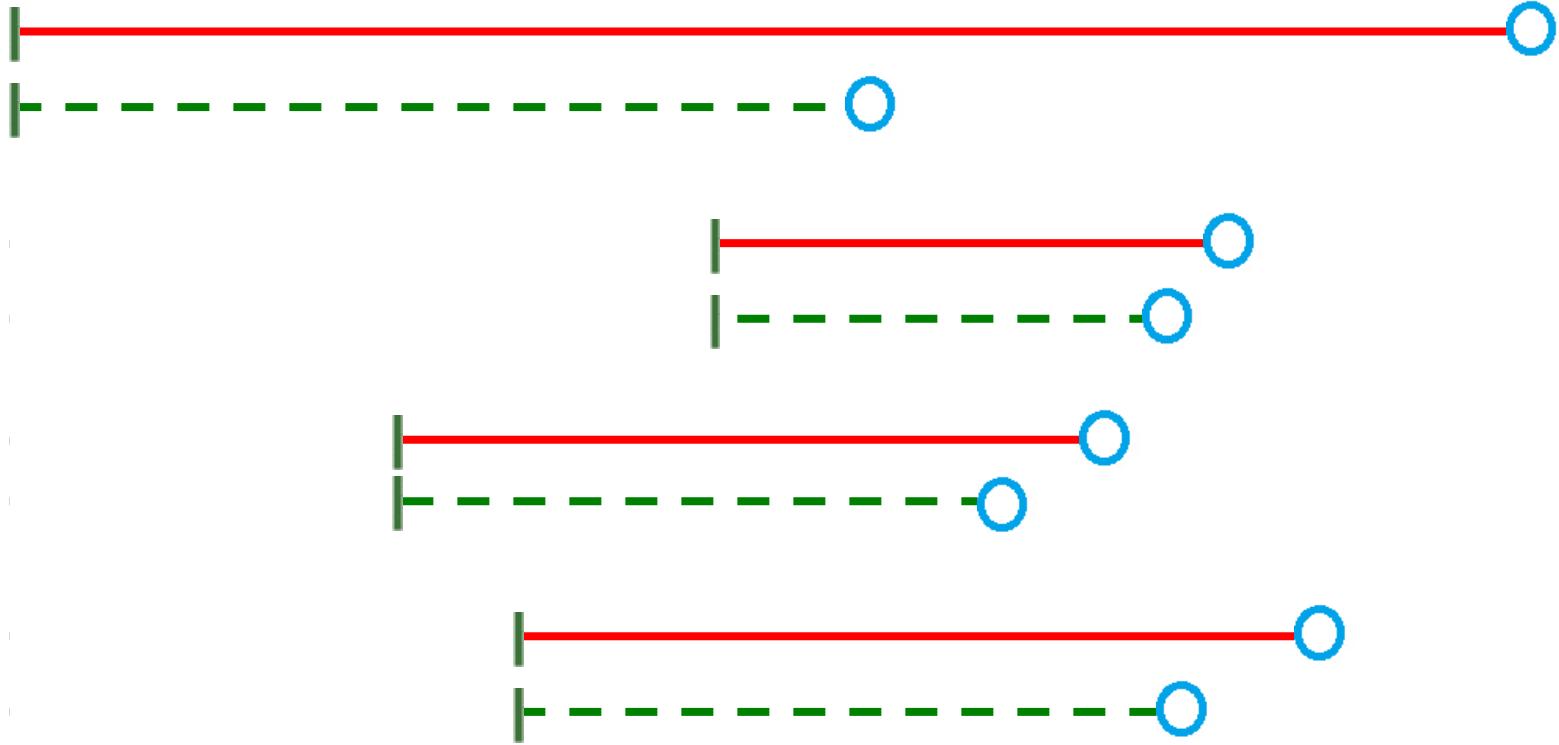
TDM Method >

----- Not On treatment
— On treatment
— Matched wait period

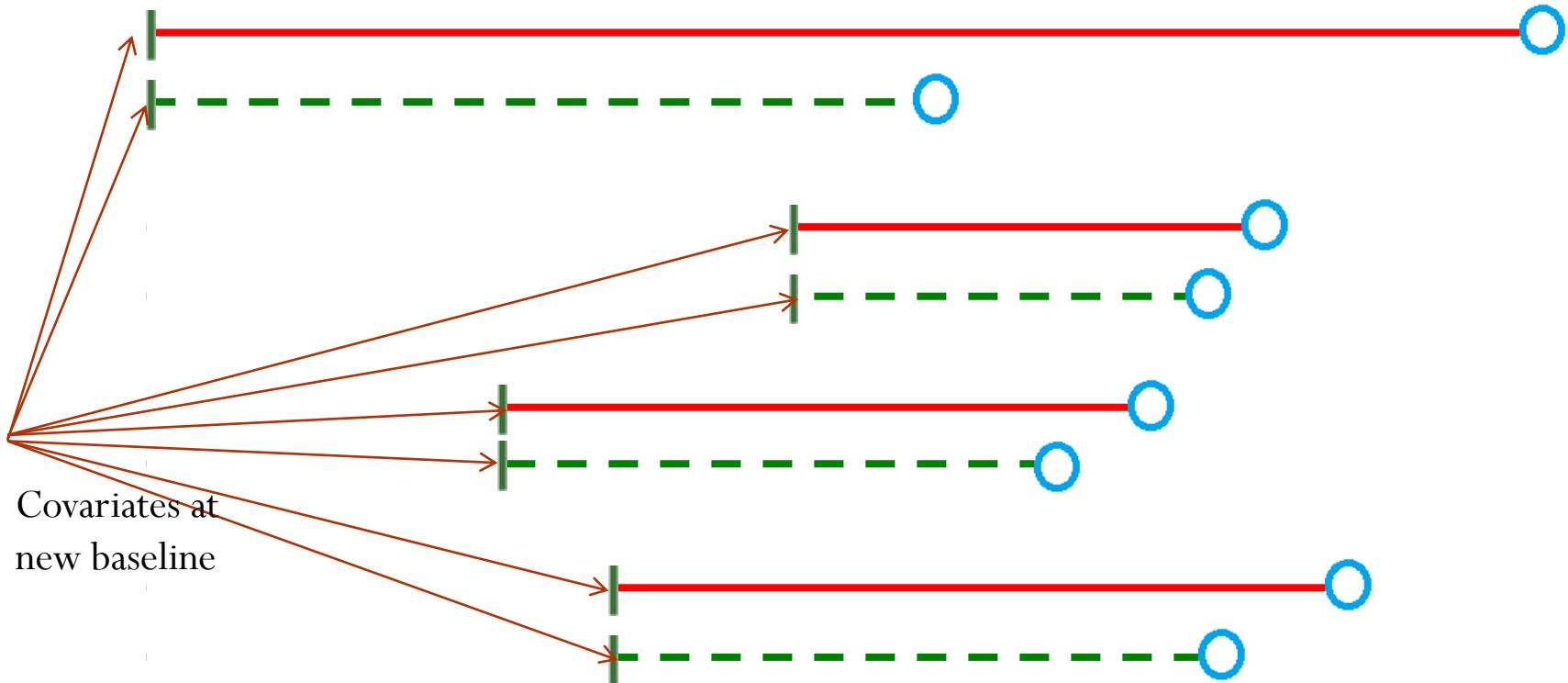


TDM Method >

----- Not On treatment
----- On treatment



Causal extension of TDM >



Simulation >

Sylvestre et al. (2008)

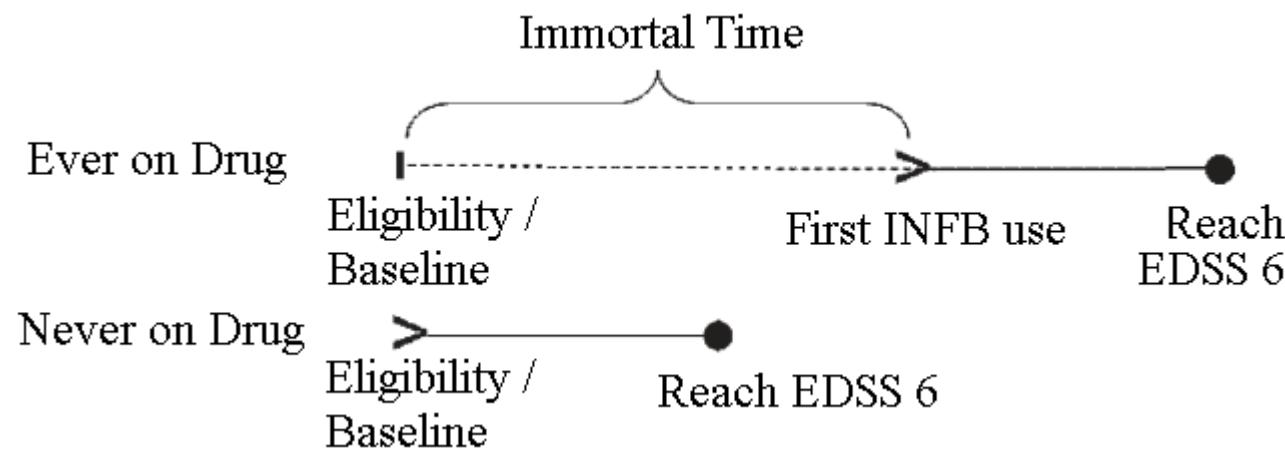
- Generate survival population data using **permutation algorithm**
- 1,000 subjects from the population with
 - Follow-up is 5 years
 - Event time generated from exponential
 - Censoring and wait time generated from uniform
 - Covariates include a fixed and a time-dependent
 - Exposure is binary and time dependent

Simulation >

- Calibration and sensitivity:
 - Immortal time distribution
 - Censoring
 - Sample size
 - exposed/unexposed ratio

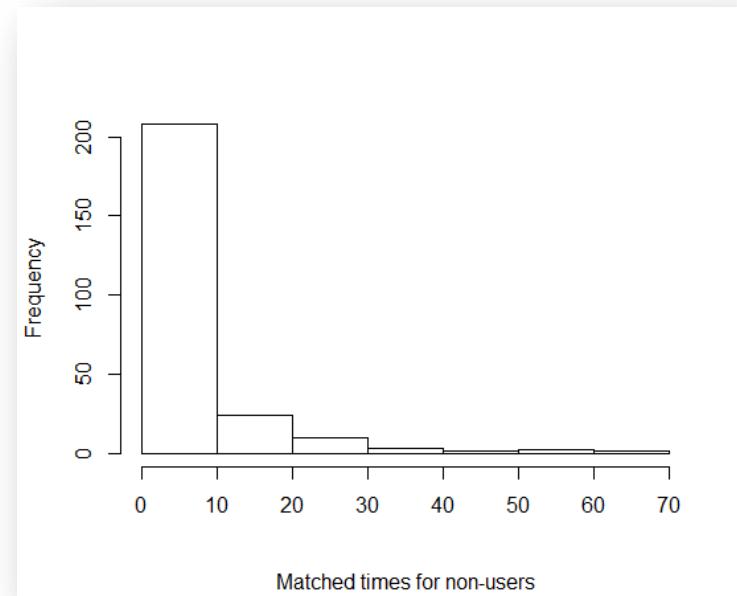
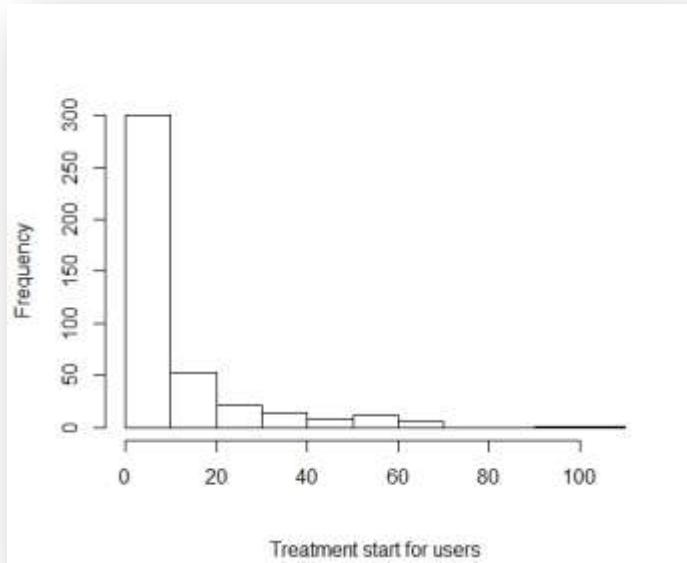
Multiple sclerosis data >

- 747 eligible patients
- Maximum 13 years of follow-up
- 3029 person-years of follow-up
- 1461 person-years under beta-interferon



Multiple sclerosis data >

- Wait periods are matched



Acknowledgement >

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References >

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5. Karim, M. E; Gustafson, P.; Petkau, J.; Shirani,A.; van der Kop, M.; Kingwell, E.; Zhao,Y.; Evans, C.; Tremlett, H. Assessing the long-term effectiveness of beta-interferons in delaying disease progression in multiple sclerosis using a marginal structural Cox model. Work in progress.

send comments to

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Thank You!

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