Lifecourse modelling and time-varying covariates

Solomon Beer University of Galway, Ireland 25/09/24



Prospective cohorts

- **Repeated** exposure and covariate measures over the lifecourse
- Measurements within an individual • highly correlated over time

Time

X5

- X: Exposures
 Y: Later outcome





Lifecourse hypotheses

- Sensitive periods
- Accumulation
- Compound hypotheses





Structured LifeCourse Modelling Approach

- Hypotheses defined a priori
- Encoded into suitable models
- Least Angle Regression
 Approach to the Lasso
 (LARS)
- Post selection inference

A structured approach to modelling the effects of binary exposure variables over the life course

Gita Mishra, $^{1\star^+}$ Dorothea Nitsch, $^{2\uparrow}$ Stephanie Black, 1 Bianca De Stavola, 2 Diana Kuh 1 and Rebecca Hardy 1

Model Selection of the Effect of Binary Exposures over the Life Course

Andrew D. A. C. Smith,^{a,b} Jon Heron,^a Gita Mishra,^c Mark S. Gilthorpe,^d Yoav Ben-Shlomo,^a and Kate Tilling^{a,b}

A structured approach to hypotheses involving continuous exposures over the life course

Andrew DAC Smith,^{1,2}* Rebecca Hardy,³ Jon Heron,¹ Carol J Joinson,¹ Debbie A Lawlor,^{1,2} Corrie Macdonald-Wallis^{1,2} and Kate Tilling^{1,2}



But what about time-varying covariates?

- Can switch from a potential confounder to a potential mediator depending on hypothesis
- Ignoring potential confounders leads to bias





Direct and mediated effects SLCMA

- Adjusts for time-varying covariates on a per hypothesis basis
- Sensitive period → start of sensitive pathway





Our data - DCHS

- X: Maternal psychopathology
 - (SRQ score)
- C: Socioeconomic status
 - (assets value)
- Y: Offspring depression
 - (Offspring depression at age 8)





Socioeconomic status a plausible mediator for maternal psychopathology on later offspring depression



Application

 Sensitive period for exposure to maternal psychopathology at age 8 on offspring depression at age 8 even after adjusting for time-varying socioeconomic status



n = 442



Summary

- Ignoring time-varying covariates can cause incorrect selections when:
 - It is likely that covariates may be mediators
 - There may be no / small direct effects
 - There is a compound hypothesis





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