



# **SPLINE FUNCTIONS TO MODEL POLYPHARMACY EXPOSURE**



**The studies discussed in this presentation are published here:**

Jeffery A, Bhanu C, Walters K, Wong ICK, Osborn D, Hayes JF. **Polypharmacy and Antidepressant Acceptability in Comorbid Depression and Type 2 Diabetes.** British Journal of General Practice 31 October 2022. DOI: [10.3399/BJGP.2022.0295](https://doi.org/10.3399/BJGP.2022.0295)

Jeffery A, Bhanu C, Walters K, Wong ICK, Osborn D, Hayes JF. **Association between polypharmacy and depression relapse in individuals with comorbid depression and type 2 diabetes: a UK electronic health record study.** British Journal of Psychiatry. 2022 Dec 1:1-7. DOI: [10.1192/bjp.2022.160](https://doi.org/10.1192/bjp.2022.160)

**How does polypharmacy effect antidepressant treatment in people with physical comorbidities?**

# Population: comorbid depression and type 2 diabetes (T2DM)



# Outcome: Antidepressant treatment in people with T2DM

## We already know:

- Antidepressants are effective in short-term

## We don't know:

- If antidepressants are acceptable (relevant side effects e.g. weight gain, cardiac disturbances, nausea, etc.)
- Long-term effectiveness

# Outcome: Antidepressant treatment in people with T2DM

## **Outcome 1: Antidepressant acceptability**

(measured by stopping antidepressants before the recommended duration)

## **Outcome 2: Depression relapse**

(measured by restarting antidepressants after stopping)



# How does **exposure to polypharmacy** effect antidepressant treatment?

- Polypharmacy = the use of multiple medications
- Common in people with T2DM
- Evidence polypharmacy can increase risk of side effects, drug interactions, treatment burden, poor quality of life, depression, poor medication adherence...
- No evidence of how polypharmacy effects antidepressant treatment in people with T2DM
- Hypothesis – polypharmacy makes antidepressants less acceptable and at higher risk of depression relapse

# Methods: Cohort study

## Inclusion criteria:

- Comorbid depression and T2DM
- Starting first antidepressant

**Study 1 entry:**  
First antidepressant prescription

**Outcome 1 measured:**  
Time to stopping first antidepressant

Patient follow-up through antidepressant treatment pathway

**Study 2 entry:**  
First antidepressant stopped

**Outcome 2 measured:**  
Time to restarting antidepressant treatment



# Methods: cox regression

**Investigates the effect of an exposure on the time taken for an event to happen:**

- 1 – Time taken to stop antidepressants (acceptability)
- 2 – Time taken to restart antidepressants (relapse)

**Exposure: Polypharmacy – the number of medications concurrently prescribed:**

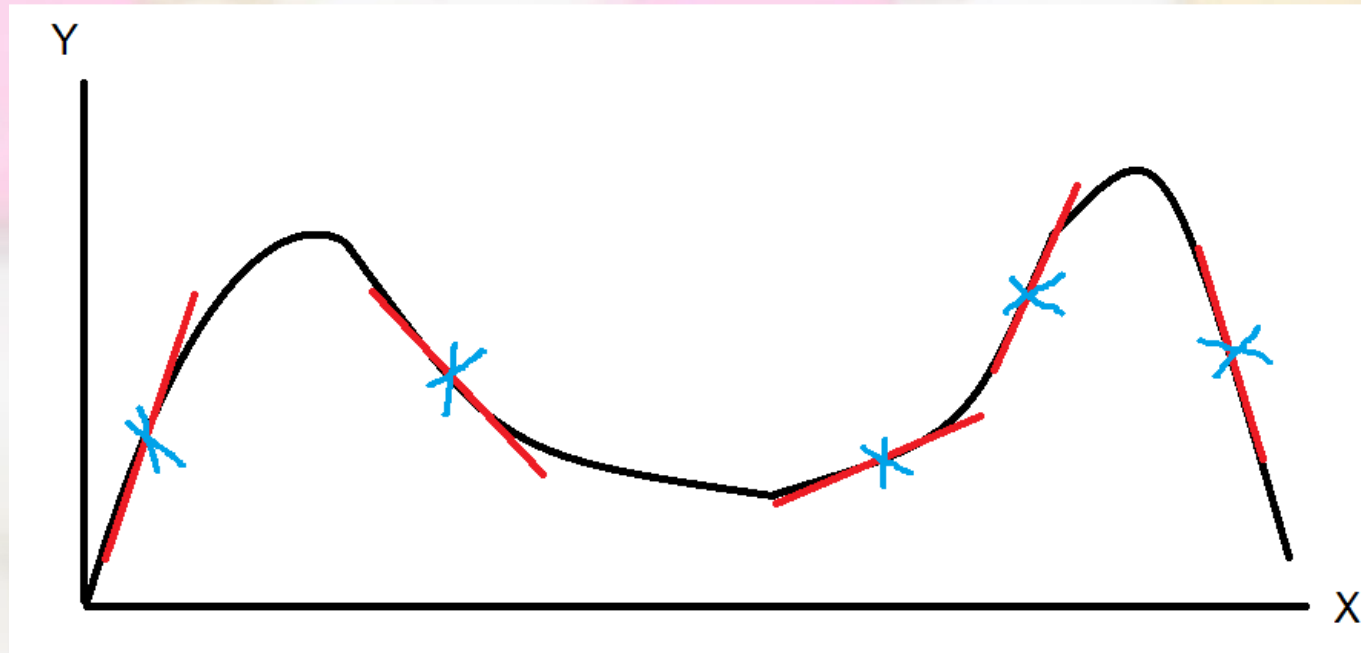
- Count of each different pharmaceutical agent prescribed alongside antidepressant treatment
- Exposure period – 90 days within index date
- Sensitivity analysis – repeat prescriptions (2 prescriptions within 180 days, 1 within 90)

**Assumptions for cox regression:**

- Effect of exposure is proportional over time...i.e. linear relationship between exposure and outcome

# Spline functions

- Enable use of linear models, when linear assumptions fail
- Fit a linear function at certain intervals to fit individual hazard ratio point estimates
- Often used in time series analysis



# Penalised B-splines

- Penalised fit = defines optimal point where spline should be fit hazard ratio
  - balances flexibility with overfitting
  - removes bias from user-selected splines (e.g. quartiles, clinically relevant intervals)
- B-splines = piecewise defined
  - i.e. a spline point at integer values only, overcomes numerical instability

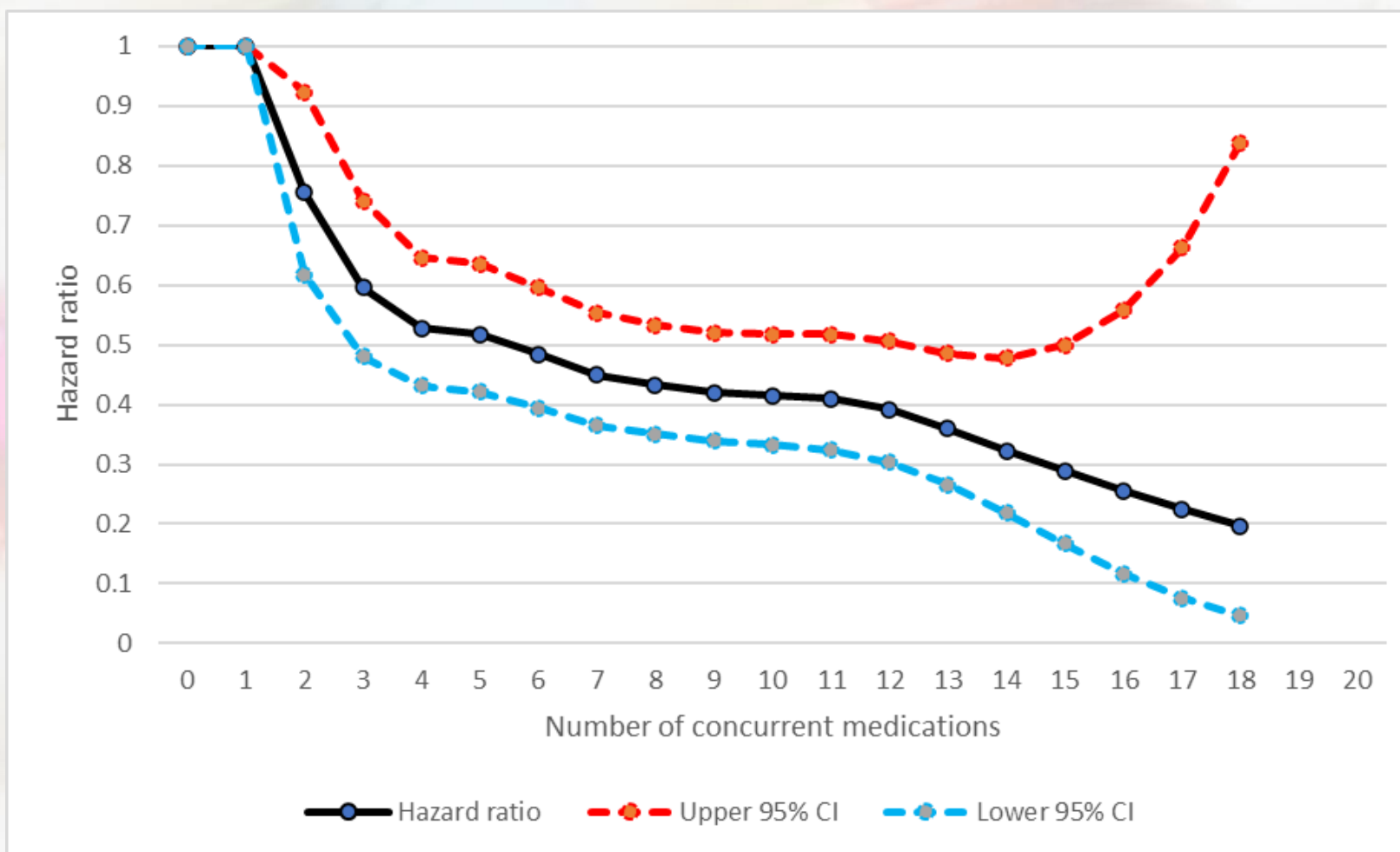
```
library(survival)
```

```
coxph(Surv(time, outcome) ~ pspline(polypharmacy_count, df = 0, caic = T) + confounders,  
      data = dataset)
```

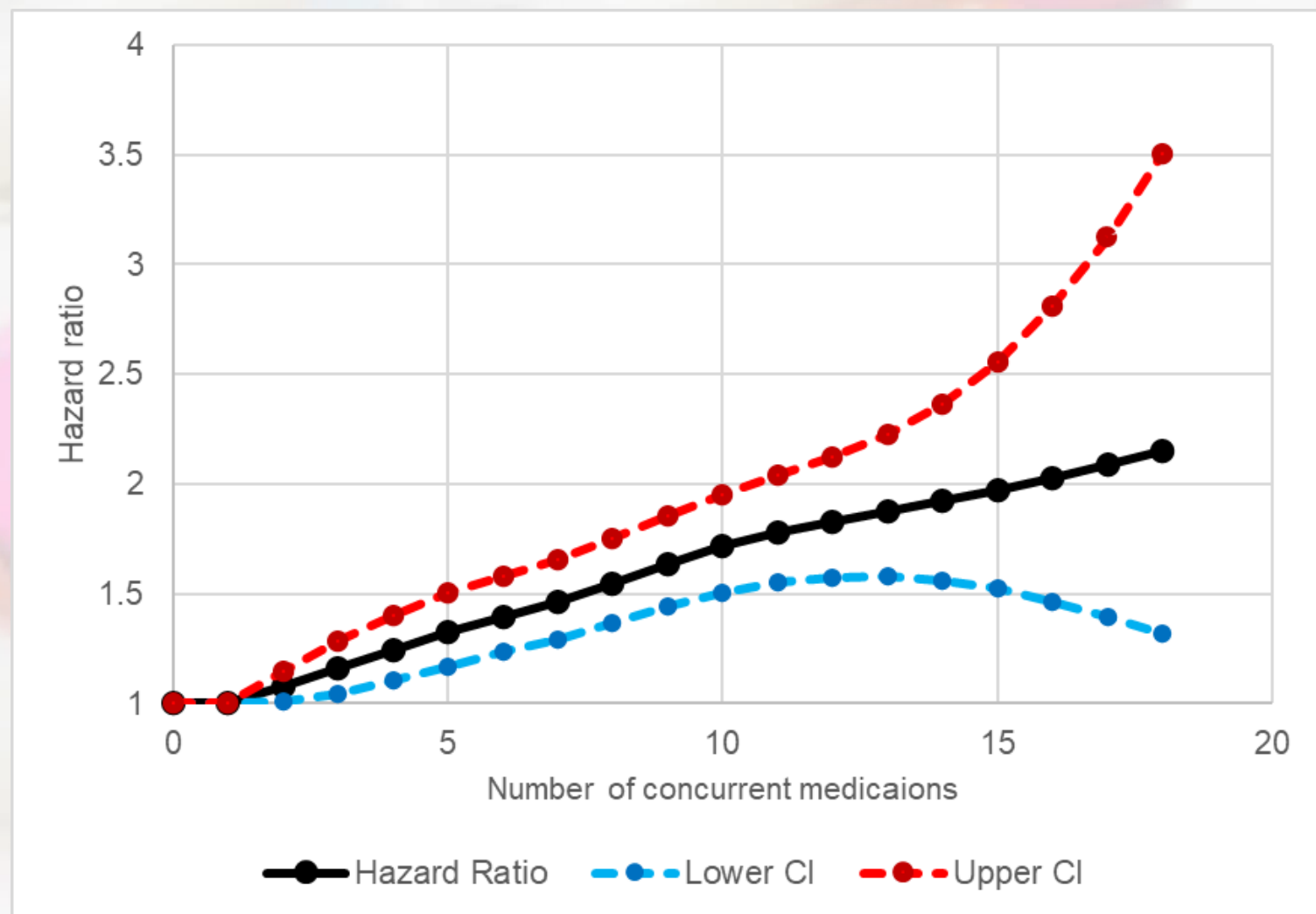
# How does **exposure to polypharmacy** effect antidepressant treatment?

- 1) Stopping antidepressants before the recommended duration (acceptability)
- 2) Restarting antidepressants (relapse)

# Stopping antidepressants



# Restarting antidepressants





# Benefits of using penalised B-splines

- Can identify change in hazard ratio at statistically relevant intervals
- Can see the first and last value for which an association exists

**LIMITATION: May require large sample size**

# Interpretation of results

- More concurrent medications = more likely to continue antidepressant treatment
- More concurrent medications = more likely to restart antidepressant treatment
- More concurrent medications → maybe more unwell, more severely depressed
- More concurrent medications → maybe more accepting of pharmacological treatment

Any questions about the studies? Email [annie.jeffery.09@ucl.ac.uk](mailto:annie.jeffery.09@ucl.ac.uk)

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