## Estimands

## Peter J Diggle

## Lancaster University





a randomised trial of drug treatments for schizophrenia

◆□▶ ◆□▶ ◆臣▶ ◆臣▶ 臣 のへで

- What's the question?
- a model-based answer
- estimation or prediction?
- Imaginal or conditional effects?



weeks

・ロ・ ・ 日・ ・ ヨ・ ・

2

- what benefit could a patient expect to receive from either treatment?
- what treatment should we recommend for general use?

◆□▶ ◆□▶ ◆臣▶ ◆臣▶ 臣 のへで

• ...?

Measurement sub-model

$$\mathbf{Y}_{ij} = \{\alpha_{\mathsf{k}(i)} + \beta_{\mathsf{k}(i)}\mathbf{t}_{ij} + \gamma_{\mathsf{k}(i)}\mathbf{t}_{ij}^2\} + \mathsf{S}_{\mathsf{i}}(\mathbf{t}_{ij}) + \mathsf{Z}_{ij}$$

**Dropout sub-model** 

$$\log[\mathsf{P}_{ij}/(1-\mathsf{P}_{ij})] = \tau + \phi \mathsf{Y}_{i,j-1}$$

What's the difference between treatments 2 and 1 with respect to the change in symptom severity over the 8-week follow-up period?

**Estimation** An estimand is a function of the model parameters

Example:  $(\beta_2 - \beta_1) \times \mathbf{8} + (\gamma_2 - \gamma_1) \times \mathbf{64}$ 

#### Prediction

A predictand is a function of parameters and unobserved random variables

#### **Example:**

$$(\beta_2 - \beta_1) \times 8 + (\gamma_2 - \gamma_1) \times 64 + \{S^{(2)}(8) - S^{(2)}(0)\} - \{S^{(1)}(8) - S^{(1)}(0)\}$$

# Marginal or conditional effects?

### Logistic regression example



A B > A B >

## The PANSS data re-visited



weeks

◆□ > ◆□ > ◆三 > ◆三 > 三 のへの

- I don't understand what LOCF is estimating
- I find it hard to define the precise question of interest without using mathematics
- Writing down a model makes two things explicit:
  - the relevant estimand or predictand
  - the underlying assumptions
- The combined effects of non-linearity, missing values and serial correlation are subtle ... and can be counter-intuitive