# Hey Kids, Wanna Model Some Drugs?

Bayesian Pharmacokinetic Models

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#### Work Done To Date

- ► Some modelling has been done for Apixiban in conjunction with Markus.
- ▶ Inputs Variables: Clinical, Demographic, Genetic, Temporal, etc.
- ► Outputs: Plasma concentration.
- ▶ Black box machine learning does not improve much over linear regression.
- ▶ Unexplained variance not so bad if it is from between subject variability.



### Proposed Direction

- ► Use Bayesian statistics
- ► Incorporate prior information
- ► Estimate between subject variability using Heirarchical model



#### The "B"-Word

- a. Bayesian methods are good for prediction.
- b. Tons of prior information. This should be incorporated.
- c. Small sample sizes are not a problem.
- d. Can account for between subject variability.



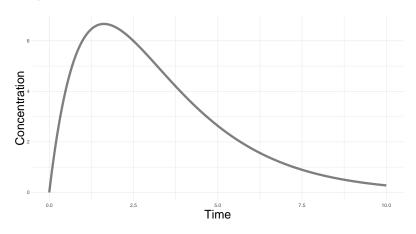
#### The "B"-Word

- ▶ Start with *prior information* about the parameters of the model  $p(\theta)$ .
  - ▶ This could be a population distribution of some PK parameter.
- ▶ Determine how we think the data are generated  $p(y|\theta)$ .
- ▶ New observations give a posterior  $p(\theta|y) \propto p(\theta) \cdot p(y|\theta)$
- In a Bayesian framework, probability is best interpreted as the strength of our belief.



# A Small Example

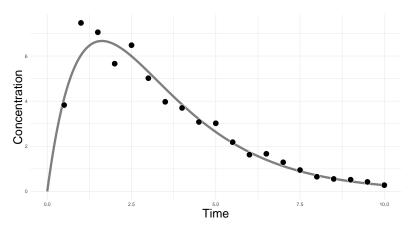
We think that each person has their own curve. The curve is determined by the absorption/elimination rates.





# A Small Example

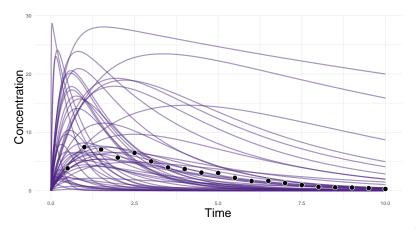
... and that when we measure concentration in plasma there is some noise.





### Sample From The Prior

We have some prior information. Each curve correpsonds to a unique pair of absorption and elimination rates.





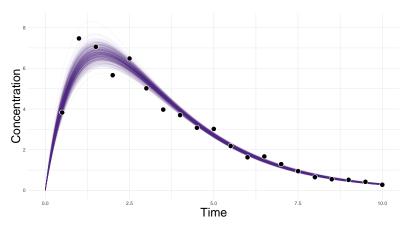
## A Small Example

Once we observe data, we can then determine which curves have most probably generated the data



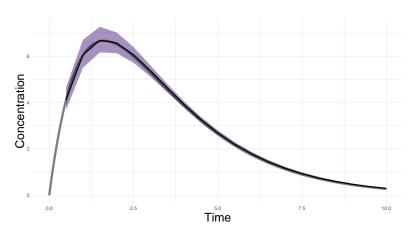
# Sample From Posterior

#### 500 curves drawn from the posterior



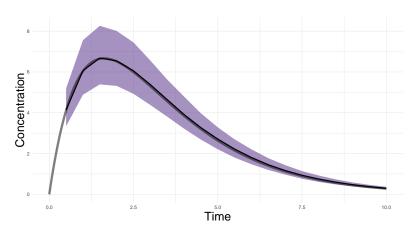


## "Confidence Interval"



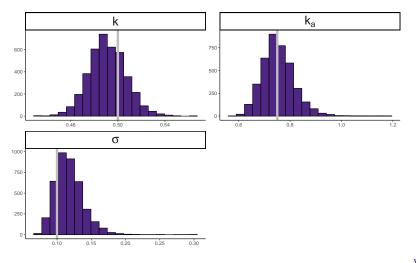


#### "Prediction Interval"





#### Distributions





### This Was A Toy Example

#### Proposed next steps:

- ► Identify exactly what it is we want to study or estimate.
- ► Construct quality priors from our data using Emperical Bayesian techniques.
- Construct heirarchical models so that for example, weight has an effect on drug clearance.

