



Introduction to Population Pharmacokinetic modeling

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No conflicts of interest to report





Questions:

- Population PK is the description of the PK of an individual in a population. Yes (red) or No (green)
- Non-compartment analysis is suitable to study the influence of physiological changes on the of behaviour of the drug. Yes (red) or No (green)
- PK curves of healthy volunteers are aimed at model identification (red) or identification of interindividual variability (green)





Typical data in an individual PK curve







Non-compartmental pharmacokinetic analysis

Advantage:

-Simple

Disadvantage:

- Only descriptive

- Not suitable for study of the influence of physiological changes on the of behaviour of the drug







6

Compartmental pharmacokinetic analysis

Advantage:

- Can be used for mathematical modelling in other doses and patients

Disadvantage:

- Requires mathematical and physiological understanding
- -Requires software
- -Takes more time







Population Pharmacokinetics is

- A description of pharmacokinetic behaviour of a drug in a population
 - Using a pharmacokinetic model, describing the typical relationships between physiology and pharmacokinetics
- A description of the interindividual variability in these relationships
 - Using a statistical model for parameter distribution and error







Population modeling allows you to:

- > Find interindividual characteristics on PK
 - > Covariates like renal function, pharmacogenetics
- > Find interoccasion or intraindividual variability
 - > Bioavailability, alterering renal function
- > Find other sources of error
 - > Model misspecification
- > Define MAP Bayesian parameter estimation
 - > for dose adjustment in individual patient (TDM)

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Model parameters

- > Model parameters
 - · Measure of central tendency ('mean value')
 - · Measure of inter-individual variability ('sd')
 - · Covariance between parameters (often ignored!)
 - Assessment of covariates





$CL = CLm + fr \cdot CLcr$







Parameter distribution

- > Parametric methods require assumptions, e.g.
 - normal distribution
 - log-normal distribution
- > Nonparametric methods





Data (measurements)

- > Rich data
- Sparse data





Rich data

- > Large number of blood samples from each subject
- > Small number of subjects
- > Experimental environment
- > Healthy volunteers
- > Aim: model identification





Sparse data

- > Small number of blood samples from each patient
- > Large number of subjects
- Clinical environment
- > Patients
- Aim: Identification of model parameters and covariates for TDM





Methods

- > Naive pooling
- > Standard Two-Stage (STS)
- > Mixed-Effect modeling (eg: NONMEM)
- > Nonparametric methods (eg: NPEM)
- > Iterative Two-Stage Bayesian (ITSB)





Naive Pooling

- > Data of all patients pooled
- > Inter-individual variability ignored
- > No information on inter-individual variability obtained





Standard Two-Stage (STS)

Step 1

Data of each patient analysed separately

Step 2

Mean and SD of model parameters calculated from results of step 1





Standard Two-Stage (STS)

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· Conceptually and computationally simple

- _
- Inter-individual variability overestimated
- Not applicable to sparse data
- Problems with 'non-fittable' patients





Mixed-Effect Modeling

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- Statistically sophisticated
- Generally accepted (FDA)
- · Inter- and intra individual variability estimated
- Rich and sparse data

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'Black box'





Iterative Two-Stage Bayesian

- Prior knowledge of parameter distribution is needed to estimate posterior distribution
- Assume a reasonable set of population data (e.g. from STS)
 - means ± sd
 - covariance matrix (usually zero)
 - residual error (e.g. assay error pattern)





Iterative Two-Stage Bayesian

- Step 1: Perform Bayesian analysis on each subject separately
- > Step 2: Calculate new set of population data
 - means ± sd
 - covariance matrix
 - residual error





Iterative Two-Stage Bayesian

 Repeat step 1 and step 2 until convergence is reached, i.e.

stable values for:

- means ± sd
- covariance matrix
- · residual error





Iterative Two-Stage Bayesian

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Conceptually and computationally simple

 Results may be less precise and/or less accurate for sparse data





25

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Literature

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