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# PKPD Variability

## Quantifying Variability to aid Dose Individualization

**Guangda Ma & Conor O'Hanlon**

**Auckland Pharmacometrics Group**

Department of Pharmacology & Clinical Pharmacology

The University of Auckland

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## Objectives

- 1) Learn about the sources of variability in clinical pharmacology
- 2) Appreciate how a target concentration (TC) strategy is essential for rational drug development and clinical use
- 3) Distinguish target concentration intervention (TCI) from therapeutic drug monitoring (TDM)
- 4) Understand how to make rational choices for dose individualization

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## Coursework Assignment

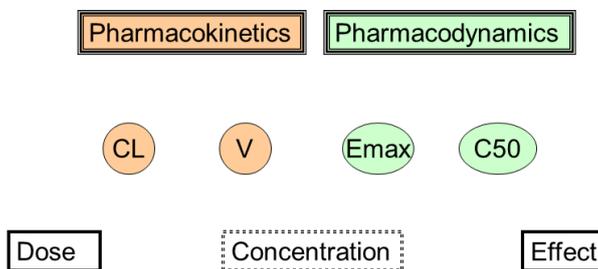
Critical review of a New Zealand medicine data sheet

- The essay should discuss the overall scope and content of the data sheet.
- It must also include a specific focus on the application of the target concentration approach to dose individualization and recommendations for improving the information given to clinicians and patients.

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## Clinical Pharmacology



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Clinical pharmacology describes the effects of drugs in humans. One way to think about the scope of clinical pharmacology is to understand the factors linking dose to effect.

A fundamental principle of clinical pharmacology is that drug effects are caused by drug concentrations—not drug doses. Drug concentration is not as easily observable as doses or effects. It is believed to be the linking factor that explains the time course of effects after a drug dose.

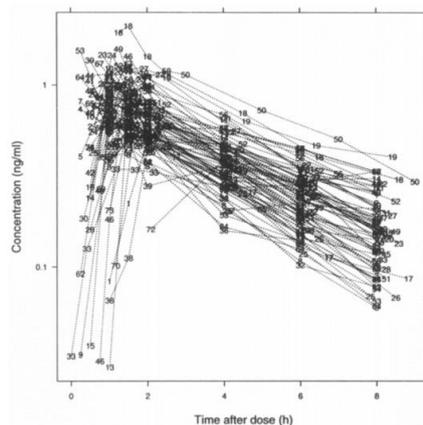
The science linking dose and concentration is pharmacokinetics. The two main pharmacokinetic properties of a drug are clearance (CL) and volume of distribution (V).

The science linking concentration and effect is pharmacodynamics. The two main pharmacodynamic properties of a drug are the maximum effect (Emax) and the concentration producing 50% of the maximum effect (C50).

Individual differences in the dose–effect relationship can be understood in terms of the PK parameters (CL, V) and the PD parameters (Emax, C50) for both therapeutic and toxic effects.

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## Clinical Data is Messy



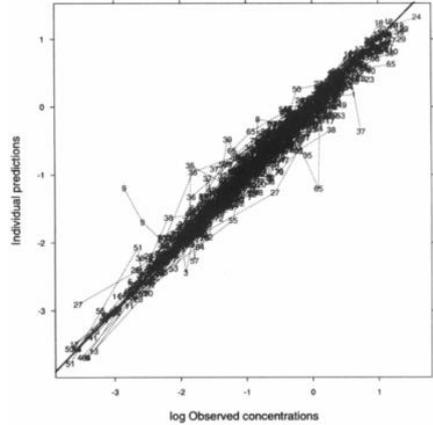
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Karlsson et al. J Pharmacokinet Biopharm. 1998 Apr;26(2):207-46.

This example illustrates the variability in time course of concentration following a dose.

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## Accounting for variability can help identify the signal



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Karlsson et al. J Pharmacokinet Biopharm. 1998 Apr;26(2):207-46.

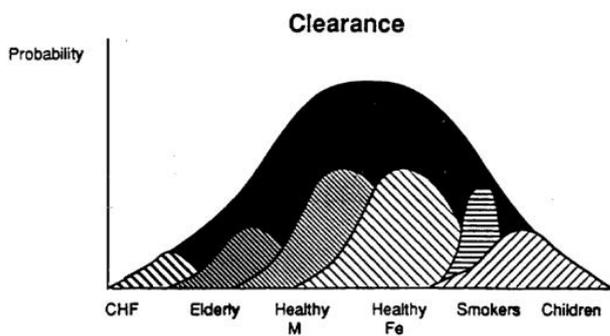
By accounting for sources of variability we can predict PK or PD such that our predictions line up with our observations.

We aim to account for sources of variability such that our treatment is rational, safe and effective for our patient.

We live in an age of personalised medicine. We recognise that patients are not identical, but rather they differ in how they respond to dose.

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## Variability



N.Sambol CDDS/SUMC1997

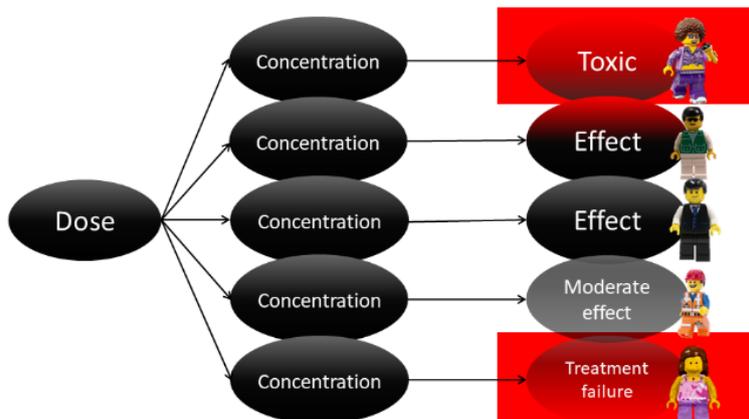
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This graph shows the frequency distribution of clearance. Despite the use of patient factors (e.g. sex, age) there remains a substantial variability of clearance within each sub-population.

We might be able to identify and quantify some of the factors that influence clearance in the population. Nevertheless, differences will remain even after accounting for obvious features; the black area of the graph shows that some of the variability in clearance can't be adequately described.

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## Concentrations will vary person to person given the same dose



Slide courtesy of David Metz, U of Melbourne

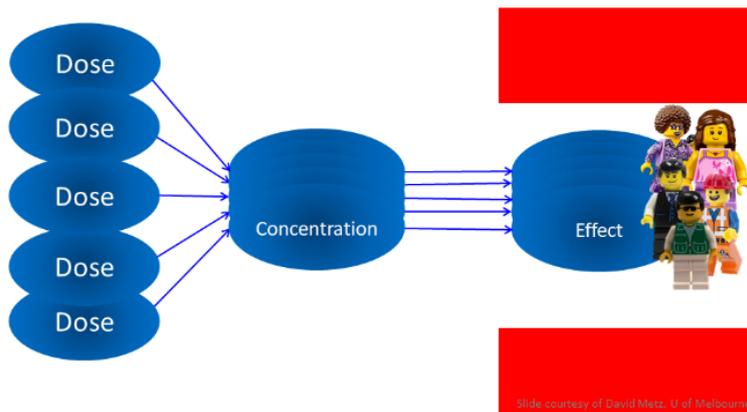
Personalised therapy should involve selection of a suitable medicine to treat the disease, and selection of the right dose.

In the clinic if we give everyone the same dose, we can expect concentration to vary from person to person. This will lead to toxicity for some, failure for others.

This is what we think about as a therapeutic or acceptable window.

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## Adjust each individual's dose to drug concentrations



A better approach is to adjust each individual's dose to achieve the same concentration. This maximises the opportunity of being in acceptable range.

Therapeutic drug monitoring and target concentration intervention are two ways of dose individualisation.

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## Target Concentration in Clinical Use of Medicines

$$\text{Target Conc} = \text{Target Effect} \times \text{C50} / (\text{Emax} - \text{Target Effect})$$

Target Conc	Dose Model
Initial Peak	Loading Dose = <b>Target Conc</b> x <b>Volume of Distribution</b>
Average Steady State	Maintenance Dose Rate = <b>Target Conc</b> x <b>Clearance</b>

Ideal dose prediction requires **individual** estimates of **Emax, C50, V and CL**

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The target concentration approach links PKPD to prediction of the right dose for a patient. All drug effects are linked to concentration and that link is defined by a PD model. The Emax model is widely used:  $\text{Effect} = \text{Emax} \times \text{Conc} / (\text{C50} + \text{Conc})$ . This can be rearranged to predict the target concentration required to achieve the target effect.

The loading dose and maintenance dose rates needed to achieve the target concentration depend upon the volume of distribution or clearance in the patient.

If Emax and C50 and Target Effect are not known then the Target Conc may be estimated:  $\text{Target Conc} = \text{Typical Average Daily Dose} / \text{Typical Clearance}$

The choice of target effect is always a balance between therapeutic benefit and toxicity and this requires clinical judgement along with comprehensive knowledge of the properties of the medicine.

### Further Reading

Holford NH. Target concentration intervention: beyond Y2K. Br J Clin Pharmacol. 1999 Jul;48(1):9-13.

Holford NH. Pharmacodynamic principles and target concentration intervention. Transl Clin Pharmacol. 2018 Dec; 26(4): 150–154.

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## Target Concentration Drug Development and Clinical Use

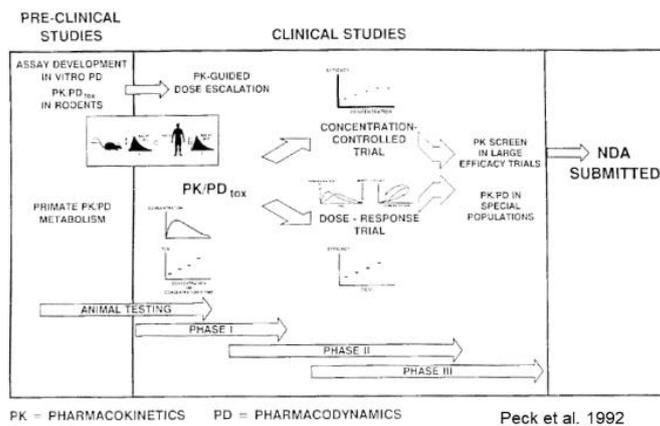
- Effective drug development needs a plan
  - » A good plan has a clear objective
  - » Target Concentration provides a clear objective in all phases of drug development
- TC is the rational basis for dose individualization
  - » Choose the target effect to determine the TC
  - » Use TC to predict individual dose

Holford NHG. The target concentration approach to clinical drug development. Clin Pharmacokinet. 1995;29(5):287-91.

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## Target Concentration in Drug Development



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The 1992 view was based on using PKPD for drug development but did not explicitly include how to use medicines in patients.

### Further Reading

Peck et al. Opportunities for integration of pharmacokinetics, pharmacodynamics, and toxicokinetics in rational drug development. J Clin Pharmacol. 1994 Feb;34(2):111-9.

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## How to Find the Target?

Clin. Pharmacokinet. 25 (6): 495-505, 1993

### Theophylline Target Concentration in Severe Airways Obstruction – 10 or 20 mg/L? A Randomised Concentration-Controlled Trial

Nicholas Holford<sup>1</sup>, Peter Black<sup>1</sup>, Ron Couch<sup>2</sup>, Julia Kennedy<sup>3</sup> and Robin Briant<sup>1</sup>

- 1 Department of Pharmacology and Clinical Pharmacology, School of Medicine, University of Auckland, Auckland, New Zealand
- 2 Department of Clinical Chemistry, Auckland Hospital, Auckland, New Zealand
- 3 Department of Pharmacy, School of Medicine, University of Otago, Dunedin, New Zealand

- Randomized concentration controlled trials are the gold standard

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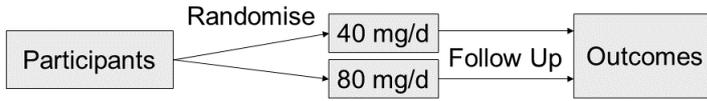
When we need to dose individualise, we should choose a target concentration to achieve a target effect, and this target concentration guides dose individualisation.

Now we want to think about how can we find the target?

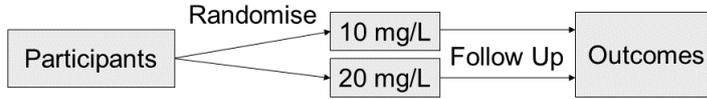
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# Randomised Controlled Trial Designs

➤ RDCT – Randomise to Dose Group



➤ RCCT – Randomise to Concentration Group



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In a randomised dose controlled trial (RDCT) participants are randomised to different groups and followed up over a period of time.

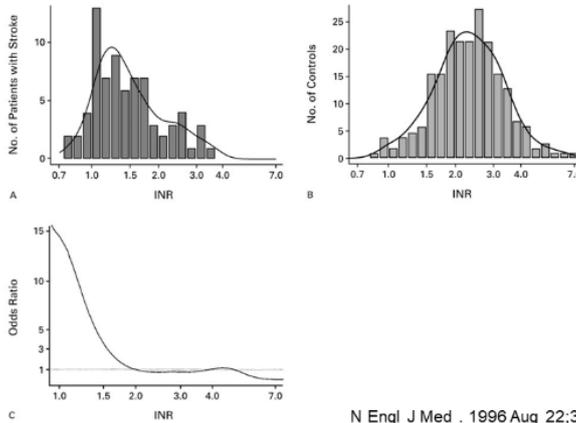
In a randomised concentration controlled trial (RCCT) participants are randomised to different target concentrations and followed up over a period of time.

We believe that achievement of a target concentration will be associated with improved outcome. A RCCT allows us to learn and confirm whether a proposed target concentration is optimal. It is up to the clinician to determine the most appropriate dose to achieve the target concentration. In contrast to empirical dose adjustment, the target concentration intervention provides a method to link dose to concentration.

See Sanathanan LP, Peck CC. The randomized concentration-controlled trial: an evaluation of its sample size efficiency. Control Clin Trials. 1991 Dec;12(6):780-94.

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# Finding the target using Observational Data



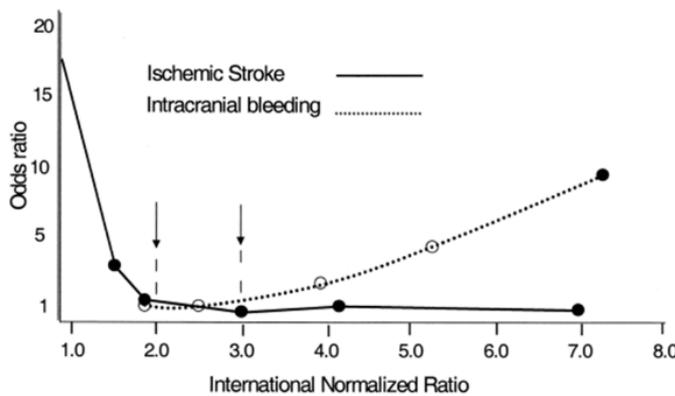
Hylek et al. N Engl J Med . 1996 Aug 22;335(8):540-6.

Experimental study designs can often be resource intensive (eg, due to the number of patients, duration of follow-up, economic costs). Observational study designs can help find a target concentration using existing data.

This example illustrates the odds of stroke relative to INR for patients with atrial fibrillation taking warfarin for stroke prevention. The top graphs show the distribution of INR (a measure of anticoagulation) among patients treated with warfarin who experienced a stroke, and among warfarin patients who did not experience a stroke (controls). The bottom graph presents the odds ratio (calculated using data from the top two graphs), and shows that the odds of stroke decreases as the INR approaches two; further increasing INR does not reduce the odds of a stroke while on warfarin.

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# Finding the target using Observational Data



Fuster et al. Circulation 2001 Oct 23;104(17):2118-50.

Conversely we also need to balance treatment benefit (the reduced stroke risk), with the risk of treatment harm (increased bleeding risk due to warfarin over-anticoagulation).

This data suggests that an INR of 2.5 to be a good balance, though a lower INR (1.8) may also be acceptable.

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## RCCT for Warfarin

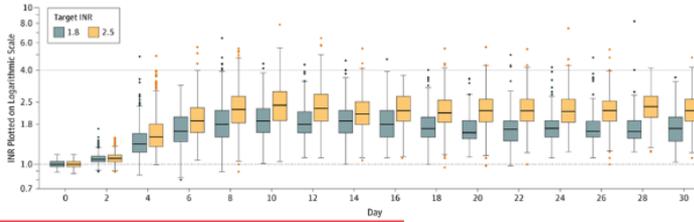


Table 2. Components of the Primary and Secondary End Points

End Point	No. (%) of Patients	
	Low-Intensity Warfarin (n = 804)	Standard Warfarin (n = 793)
VTE (days 1-60) or death (days 1-30) <sup>a</sup>	41 (5.1)	30 (3.8)
Death (days 1-30)	0	0
Asymptomatic DVT	27 (3.4)	22 (2.8)
Any PE or symptomatic DVT	17 (2.1)	8 (1.0)
Any PE	8 (1.0)	3 (0.4)
Major bleed (days 1-30) <sup>c</sup>	3 (0.4)	7 (0.9)
Major bleed + INR <4	3 (0.4)	5 (0.6)
Major bleed + INR ≥4	0	2 (0.3)
INR ≥4 (days 1-30)	36 (4.5)	97 (12.2)

➤ Higher rate of clotting events and death with target INR of 1.8

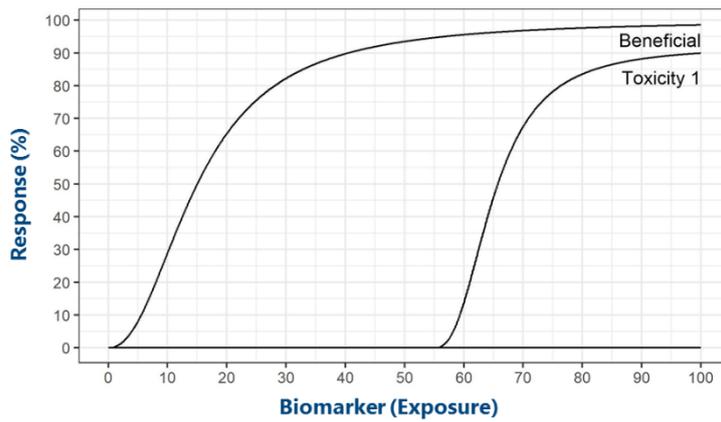
Gage et al.  
JAMA. 2019 Sep 3;322(9):834-842.

Experimental studies can be used to confirm what is learnt from observational data. This is an RCCT which examines whether a target INR of 1.8 would be better than 2.5; participants were randomised to a target INR of 1.8 (n=804) or 2.5 (n=793).

The trial results in the table show that targeting a lower INR (1.8) was associated with marginally higher rates of clotting events or death (5.1 v 3.8%). A target INR of 2.5 was not associated with a drastically higher rate of major bleeds (0.4 v 0.9%). This data confirms the appropriateness of a target INR of 2.5

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## TCl and TDM



Slide courtesy of David Metz, U of Melbourne

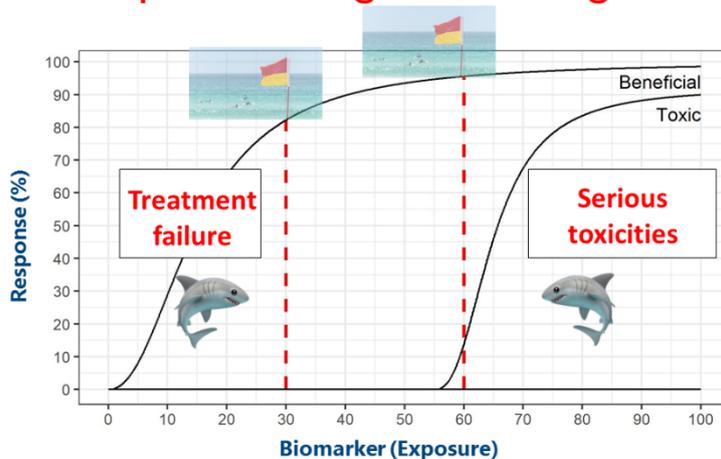
Up to this point we have discussed the concept that are strategies available to help us individualise dose.

We now focus our attention on differentiating between a target concentration intervention and therapeutic drug monitoring approach to dose individualisation.

Let us consider the exposure response curve for benefit and that for toxicity; for simplicity, we only have one curve for toxicity though in reality there may many (different) curves for toxicity.

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## Therapeutic Drug Monitoring

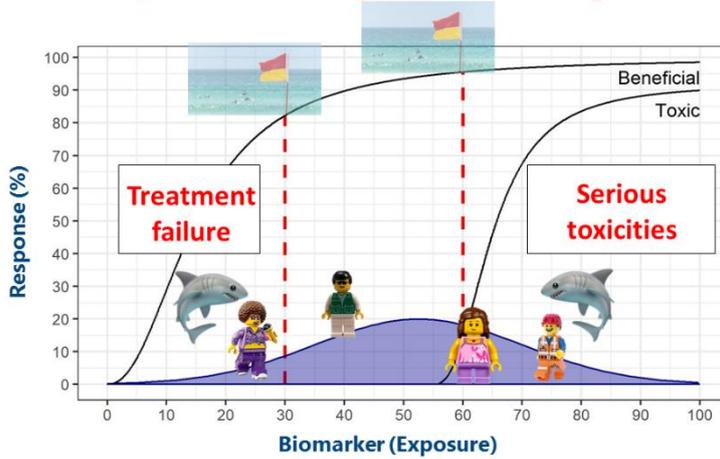


Slide courtesy of David Metz, U of Melbourne

In the therapeutic drug monitoring approach we consider a toxic limit and a treatment failure limit. Analogous to swimming between the flags.

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# Therapeutic Drug Monitoring



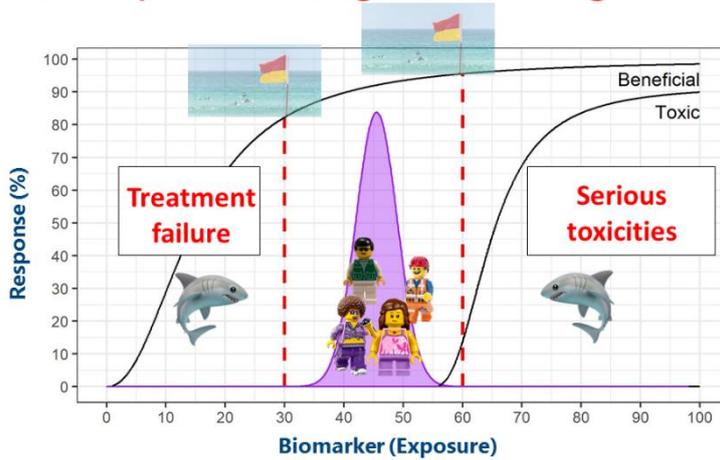
Slide courtesy of David Metz, U of Melbourne

In the clinic patients will have exposure within, at the limit of, and outside the acceptable range. They will be distributed within and across the therapeutic window.

The therapeutic drug monitoring approach, assumes, that all our patients sit within the flags. This assumption is not correct.

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# Therapeutic Drug Monitoring



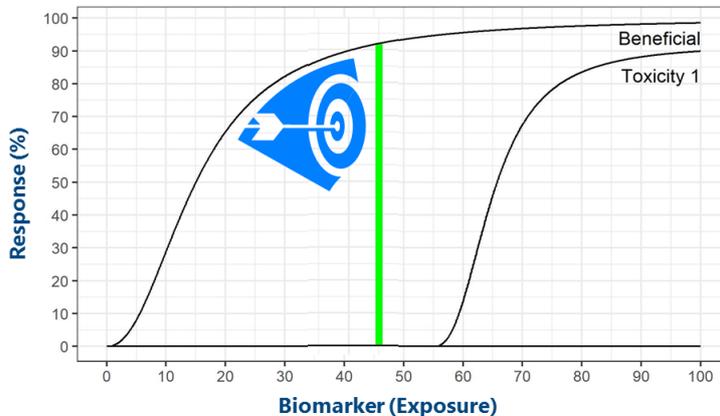
Slide courtesy of David Metz, U of Melbourne

The second fallacy of TDM is what is done with a concentration measurement; what should be the magnitude of the dose change given a measured concentration? What should we do if the measurement is just inside or outside the acceptable range (e.g. 28 or 31 in this example)?

Furthermore this approach assumes that there is a range of doses which match the acceptable range of concentrations. The maintenance dose rate is related to the target concentration and clearance. Clearance will time with time, but is constant at a single point in time. The target concentration can only be achieved by a single maintenance dose. It is not possible to have a range of targets (e.g. 28 to 31) as this will require a range of maintenance dose rates.

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# Target Concentration Intervention



Slide courtesy of David Metz, U of Melbourne

We can be more accurate and precise if we remove the flags and aim for a specific target. In the target concentration intervention approach, every measurement is used to guide dose adjustment to achieve a target concentration a measure which is correlated with improved outcomes.

As described previously, maintenance dose rate is related to the target concentration and clearance. Therefore if we know the clearance for an individual, then the maintenance dose rate is known.

Target concentration intervention also provides a method to link target concentration with dose. This means that the clinician is provided a proposed dose that will achieve the target.

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## TDM or TCI

- » Therapeutic Drug Monitoring
  - » Relies upon the therapeutic range concept
  - » Concentrations are stratified into sub-therapeutic, acceptable, or toxic
  - » Considers concentrations at the top and bottom of the acceptable window to be the same
  - » Assumes that there is a range of doses which match the acceptable range of concentrations
    - There is only one dose that can achieve the target concentration that will produce the target effect
    - The therapeutic range cannot be used to get the right dose

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## TDM or TCI

- » Target Concentration Intervention
  - » Aims for a specific concentration
  - » Dose adjustments focus on an optimal point of balance between benefit and toxicity
  - » Dose can be calculated from the target concentration

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## TDM or TCI?

### Therapeutic Drug Monitoring

- » TDM Therapeutic Range
- ☹️ **Imprecise**
- » Sub-optimal at borders of the range



### Target Concentration Intervention

- » TCI Single Target
- ☺️ **Accurate**
- » Optimal – do the best you can



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TDM is imprecise and sub-optimal at the borders of the range.  
TCI is more accurate and provides a plan to do the best that we can.

#### Further reading

Holford NHG. Target concentration intervention: beyond Y2K. Br J Clin Pharmacol. 1999 Jul; 48(1): 9–13.

Holford N, Ma G, Metz D. TDM is dead. Long live TCI! Br J Clin Pharmacol. 2020 Jun 16. doi: 10.1111/bcp.14434. Online ahead of print.

## Why does PKPD vary?

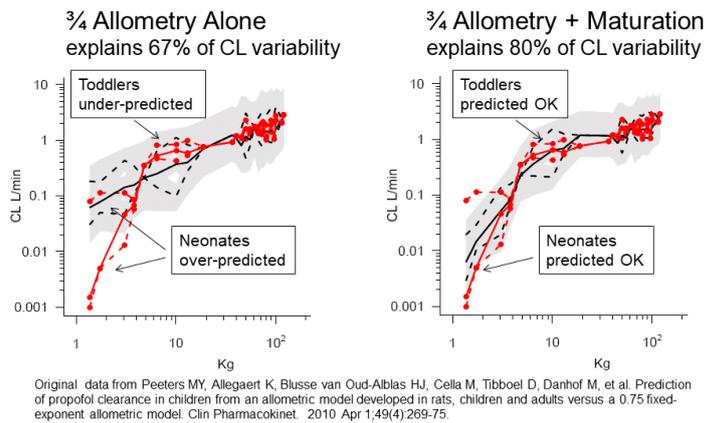
- Systematic (predictable)
  - » Body size
  - » Disease state (liver, kidney)
  - » Genotype
  - » etc...
  
- Random (not predictable)
  - » Between Subject Variability
  - » Within Subject Variability

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Some sources of variability are predictable, and some are not.

Further reading  
 Holford NH. Pharmacodynamic principles and target concentration intervention. *Transl Clin Pharmacol.* 2018 Dec; 26(4): 150–154.  
 Holford N. Pharmacokinetic variability due to environmental differences. *Transl Clin Pharmacol.* 2017 Jun; 25(2): 59–62.

## Predictable Variability Size and Maturation



This example demonstrates how accounting for predictable sources of variability, in this example size and age, can help explain some of the variability in clearance of propofol.

These plots are visual predictive checks. These plot a summary of the observed data against data simulated from a model which we believe describes the clearance of propofol. The solid red line is the median of the observations and dashed red lines indicate the 90<sup>th</sup> percentiles of the observations. The solid black line is the median of the simulated data, whereas the dashed black line indicate the 90<sup>th</sup> percentiles of the simulated data. The shaded areas (not important in this example) describe the 95% confidence intervals associated with the percentiles.

The left graph is generated using a model with only considers size (weight). It can be seen that in neonates the model (black lines) over-predict clearance compared to the observed data (red lines). Likewise for toddlers, the model under-predicts clearance. Overall by only considering weight alone, 67% of clearance variability is predictable.

The right graph considers both size and maturation (age). It can be seen that the model predicted lines (black) are much closer to that observed. By taking both size and maturation into consideration, more of the variability in clearance can be explained.

## Unexplained Clearance Variability

Drug	BSV <sub>U</sub> %	WSV <sub>U</sub> %	Source
Metoprolol	53	35	Lunn (1997)
Fenoterol	12	16	Bouillon (1996)
Riluzole	51	28	Bruno (1997)
Felodipine	34	33	Wade (1995)
Drug A	57	29	Karlsson (1993)
Drug B	35	19	Karlsson (1993)
Drug B	33	19	Jonsson (1996)
Moxonidine	22	15	Karlsson (1998)
Artemisinin	48	53	Sidhu (1998)
<b>Average</b>	<b>41</b>	<b>30</b>	

BSV<sub>U</sub>=Between Subject      WSV<sub>U</sub>=Within Subject

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While patient factors explain some of the variability in PKPD parameters, there will always remain some variability that cannot be predicted (unexplained).

One component of unexplained variability is variability between subjects (BSV). Another component that of unexplained variability is within subject variability (WSV); for example clearance may be different from one dosing interval to another.

The table illustrates that the unexplainable, (random) component of variability differs by medicine.

Note unexplained between subject variability (BSV<sub>U</sub>) and unexplained within subject variability (WSV<sub>U</sub>) are expressed as a percentage of an apparent co-efficient of variation.

## Three Ways to Dose

- Population
  - » Same dose for everyone
    - The dream dosing method!
- Group (Covariate guided)
  - » Same dose for similar group
    - e.g. same weight, CLcr, genotype
- Individual
  - » Dose determined by individual response
    - e.g. BP, INR, blood conc

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Since the predictable and random (unpredictable) sources of variability will be different for each medicine, we now can examine whether a criterion can be used to help us determine whether or not we need to dose individualize a medicine. Before we can consider this criterion, we first need to consider the different dosing strategies as well as identify/describe the different sources of variability.

The simplest method is a population dose - the same dose for everyone. It is commonly used due to its convenience. By treating everyone as though they were the same, it ignores differences between patients. This means that some patients are either under-dosed or over-dosed.

We may also stratify/group patients based upon covariates. The same dose is used for patients with similar characteristics

Doses may also be individualized according to individual response. For example based upon blood pressure.

We can also consider our dosing strategies for initial and subsequent dosing. For initial dosing (e.g. when the patient is started on a treatment), we can use either the population or group based dosing strategy, subsequently once we can measure how the patient responds to the treatment and adjust the dose based on the individual response; alternatively subsequent dosing is not based on individual response and the dose is continued on the population or group based dosing strategy.

## Three Ways to Dose

In TCI:  $MDR = CL \times TC$

- Population CL
- Group CL
  - » e.g.  $CL_{GRP} = CL_{POP} \times Size \times Maturation$
- Individual
  - » e.g.  $CL_{individual}$  (influenced by  $CL_{GRP}$  and measured concentration)

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We can also consider these three strategies in the context of target concentration intervention. Recall that we can describe MDR using CL and TC.

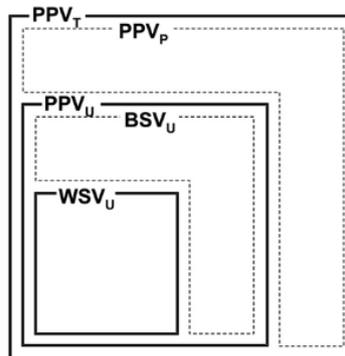
In population dosing we assume that there is no variability in clearance, that is, clearance is the same in everyone. We can think of the population clearance ( $CL_{POP}$ ) as the typical value in the population.

In group guided dosing, the population CL is adjusted according to patient specific factors which we know can account for variability. Therefore the clearance in each group is the same, but clearance will differ amongst groups.

Measured concentration (or other biomarker) tells us how the individual patient is different from other patients in the group. Therefore we may further individualize clearance by starting at  $CL_{GRP}$  and adjust this according to the individual response, leading to an individualized estimate of clearance ( $CL_{individual}$ ).

## Identifying Variability

- $PPV_P$ =Population Parameter Variability that is predictable
- $BSV_P$ =Between Subject Variability that is predictable
- $PPV_U$ =Population Parameter Variability that is unexplained
- $BSV_U$ =Between Subject Variability that is unpredictable
- $WSV_U$ =Within Subject Variability that is unpredictable



Holford NHG, Buclin TMD. Ther Drug Monit 2012; 34: 565-68

$PPV_{Total}$  describes the total variability from predictable and unexplained sources.

At any given dose rate, steady-state average concentrations are determined by the variability in the pharmacokinetic parameters (e.g. clearance). This variability is called population parameter variability (PPV).

The total variability ( $PPV_T$ ) can be broken down into predictable ( $PPV_P$ ) and unpredictable ( $PPV_U$ ) variability.

Some of the variability that is predictable ( $PPV_P$ ) is BSV ( $BSV_P$  not shown in figure). For propofol, size and maturation predict some of the BSV in clearance.

$PPV_U$  consists of 2 components. Seemingly random between-subject variability ( $BSV_U$ ) which is unpredictable from covariates and describes the variability of the individual's average parameter across subjects. Unpredictable within-subject variability ( $WSV_U$ ). Some values for  $BSV_U$  and  $WSV_U$  were shown in the previous slide.

## Safe and Effective Variability

- CLINICAL JUDGMENT
 

Suppose medicine use is **safe and effective** if:

  1. Individual  $C_{ss}$  is on average at the Target Conc
    - Aim for the optimum target
  2. 90% of the time  $C_{ss}$  is within 80%-125% of Target Conc
    - 'therapeutic range' with optimum target
- STATISTICS
 

Assume log-normal distribution for  $C_{ss}$

90% of  $C_{ss}$  must lie within  $\pm 1.64 \times SD$

  - Therefore SD must be 0.136

The **Safe and Effective Variability (SEV)** is 13.6%

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Suppose we determine a medicine is safe and effective if the individual steady state concentration typically lies at the target concentration. If our tolerance of risk and benefit requires us to have treatment with 90% of the population having  $C_{ss}$  measurements within 80-125% of the target, then we have a SEV of 13.6%.

$C_{ss}$  = Average steady state concentration  
 SD = Standard Deviation  
 SEV=Safe and Effect Variability around target concentration

Further Reading  
 Holford NHG, Buclin T. Safe and effective variability-a criterion for dose individualization. Ther Drug Monit. 2012 Oct;34(5):565-8.

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## Dosing Individualization Method Depends on SEV

- $SEV > PPV_T$ 
  - » Population dosing (same dose for all)
- $PPV_T > SEV > PPV_U$ 
  - » Group dosing (i.e. based on covariates)
- $PPV_U > SEV > WSV_U$ 
  - » Target concentration intervention
- $SEV < WSV_U$ 
  - » Safe & effective dosing is impossible

Holford NHG, Buclin TMD.  
Ther Drug Monit 2012; 34: 565-68

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Quantification of  $PPV_T$ ,  $PPV_U$ , and  $WSV$  allows the use of SEV as a quantitative criterion to decide on a dose individualisation method.

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## Dosing Individualization Method Depends on SEV

Suppose  $PPV_{total}=0.7$ ,  $BSV_U=0.4$ ,  $WSV_U=0.3$

$$PPV_U = \sqrt{BSV_U^2 + WSV_U^2} = 0.5 \quad BSV_P = \sqrt{PPV_{total}^2 - BSV_U^2} = 0.57$$

SEV	Method Criteria	Example	Dosing Strategy
0.9	$SEV > PPV_{total}$	$0.9 > 0.7$	Population dosing
0.55	$PPV_{total} > SEV$ $SEV > PPV_U$	$0.7 > 0.55$ $0.55 > 0.5$	Group dosing (WT, CLcr, etc) ( $BSV_P \Rightarrow 0$ )
0.35	$PPV_U > SEV$ $SEV > WSV_U$	$0.5 > 0.35$ $0.35 > 0.3$	Individual response dosing (TCI) ( $BSV_U \Rightarrow 0$ )

Note: If  $SEV < WSV_U$  then medicine cannot be used safely

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For this example we will consider a medicine that has  $PPV_T$  of 0.7,  $BSV_U$  of 0.4,  $WSV_U$  of 0.3,  $PPV_U$  of 0.5 and  $BSV_P$  of 0.57.

If we set SEV as 0.9 then this medicine is suitable for population dosing ( $SEV > PPV_T$ ), that is all patients could be given the same dose.

If SEV is set as 0.55, then this is lower than  $PPV_T$  and thus population dosing would be inadequate. As SEV is greater than  $PPV_U$ , a group based approach (e.g based on weight) would be suitable.

If SEV is set as 0.35, then a group based approach would not be adequate as SEV is less than  $PPV_U$ . As SEV is greater than  $WSV_U$ , dosing according to individual response should be considered.

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## Safe and Effective Variability (SEV) Aminoglycosides

$PPV_U$	$BSV_U$	$WSV_U$
0.33	0.30	0.13

- Suggested Therapeutic Success Criterion
  - 90% of Concs Within 80%-125% of Target C<sub>ss</sub>
  - SEV is 0.136 (log normal SD)
- Unpredictable  $PPV_U$  is 0.33 and is  $> SEV$ 
  - Covariate (WT, CLcr) prediction alone will be inadequate
- Unpredictable  $WSV_U$  is 0.13 and is  $< SEV$  (just!)
  - TCI can achieve safe and effective target

Matthews I, Kirkpatrick C, Holford NHG. Quantitative justification for target concentration intervention - Parameter variability and predictive performance using population pharmacokinetic models for aminoglycosides. British Journal of Clinical Pharmacology 2004;58(1):8-19

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Using aminoglycoside antibiotics as an example.

$PPV_U$ ,  $BSV_U$  and  $WSV_U$  have been characterised as 0.33, 0.3 and 0.13 respectively. If we use an SEV criterion of 0.136, this is less than  $PPV_U$  and more than  $WSV_U$ , therefore population and covariate guided dosing alone (e.g. based sole on weight and creatinine clearance) would be inadequate, and an individualised approach (e.g. target concentration intervention) should be used.

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## Which Way to Aim?

- Phase 2 Drug Development
  - » PK and PKPD relationships (Target Effect → Target Conc)
  - » Predictable and Unpredictable variability ( $PPV_T$ )
  - » Between ( $BSV_U$ ) and within subject ( $WSV_U$ )
- Phase 3 Drug Development
  - » Safe and effective variability (SEV)
  - » The BIG difficulty is deciding on SEV !
- Clinical Use of Medicines
  - » Use quantitative criteria to decide on dosing method
    - » Covariate Dosing if  $PPV_T > SEV > PPV_U$
    - » TCI Dosing if  $PPV_U > SEV > WSV_U$

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The target for PKPD is improving patient outcome by developing medicines which can achieve the target effect

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## Why TCI?

Clin. Pharmacokinet. 25 (6): 495-505, 1993

### Theophylline Target Concentration in Severe Airways Obstruction – 10 or 20 mg/L? A Randomised Concentration-Controlled Trial

Nicholas Holford<sup>1</sup>, Peter Black<sup>1</sup>, Ron Couch<sup>2</sup>, Julia Kennedy<sup>3</sup> and Robin Briant<sup>1</sup>

<sup>1</sup> Department of Pharmacology and Clinical Pharmacology, School of Medicine, University of Auckland, Auckland, New Zealand

<sup>2</sup> Department of Clinical Chemistry, Auckland Hospital, Auckland, New Zealand

<sup>3</sup> Department of Pharmacy, School of Medicine, University of Otago, Dunedin, New Zealand

- How can a target concentration of 10 mg/L be achieved and maintained?

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## Which Drugs for TCI?

1. Effect is hard to measure (drug is working when the response is not observable)
  - » Anti-arrhythmics e.g. lignocaine
  - » Anti-convulsants e.g. phenytoin
  - » Anti-coagulants e.g. warfarin
  
2. Big unpredictable variability (using weight, renal function, etc) and small within subject variability
  - » Too much variability means either inadequate beneficial effect or too much adverse effect
  - » Observing patient response can predict future dose needs

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The first reason for using TCI uses a response, such as BP, as a substitute for being able to measure the clinical disease state that is being treated. When the medicine is working well or it is not working at all the clinical disease state may appear to be the same. It is assumed that trying to reach a typical response that is usually associated with benefit is better than giving everyone the same dose.

The second reason for using TCI is when group based dosing (e.g. using weight) is not enough to reduce the between subject variability so that the medicine can be used safely and effectively. TCI can only work however if the within subject variability (that cannot be influenced by TCI) is small enough so that dose individualization is really predictive for future use of the medicine in the same patient.

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## How? Target Concentration Strategy

1. Choose Target Concentration
2. Determine V and CL using WT etc.
3. Calculate LD and MDR
4. Measure Response (e.g. INR)  
Revise Target Conc
5. Measure Concs  
Revise V and CL
6. Goto Step 3

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The target concentration strategy is an algorithm for reaching the best individual dose. It starts with choosing a target concentration based on pharmacodynamic studies. A group value for volume (V) and or clearance (CL) can be determined before the medicine is given. These PK parameters are then used to calculate the initial loading dose (LD) and maintenance dose rate (MDR). A response is measured reflecting how the individual is different from the group of patients who are otherwise similar in weight, genotype, etc. If the response is a measure of drug effect e.g. INR, then it can be used to revise the target conc. If the response is a concentration then it can be used to revise V and CL. Most commonly the focus will be on CL so that a new individualized maintenance dose rate can be calculated.

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## Target Concentrations

**Target Concentrations and Pharmacokinetic Parameters for Selected Medicines (70 kg standard individual). C<sub>ss</sub> is the average steady state concentration.**

Drug	Target Conc	Clearance	Volume of distribution
Aminoglycosides	Peak 20 mg/L* C <sub>ss</sub> 3 mg/L	6 L/h	18 L
Ciclosporin**	150 ng/mL	17 L/h	245 L
Phenytoin	10 mg/L	V <sub>max</sub> =415 mg/d, K <sub>m</sub> =4mg/L	45 L
Digoxin	2 ng/mL	9 L/h	500 L
Theophylline	10 mg/L	3 L/h	35 L

\* 24 hour dosing      \*\* whole blood

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Target concentrations and PK parameters are known for most medicines which are helped by TCI.

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## Target Effects

**Target Effects and Pharmacodynamic Parameters for Selected Medicines.**  
**E<sub>max</sub>** is the maximum effect due to the drug, **EC<sub>50</sub>** is the concentration producing 50% of E<sub>max</sub>. **PEFR** is peak expiratory flow rate.

Drug	Target Effect	E <sub>max</sub>	EC <sub>50</sub>
Aminoglycosides	"cure"	?	?
Cyclosporine	"prevention of rejection"	?	?
Phenytoin	"prevention of seizures"	?	?
Digoxin	"control of atrial fibrillation"	?	?
Theophylline	"normal PEFR"	344 L/min	11 mg/L
Warfarin	INR 2-3	100% *	1.5 mg/L

- Inhibition of prothrombin complex synthesis

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The pharmacodynamic parameters for medicines that use TCI are typically not well known. This is a reflection of the difficulty of measuring a clinical response that can be related to concentration.

Holford NHG, Black P, Briant R, Couch R, Kennedy J. Theophylline target concentration in severe airways obstruction - 10 or 20 mg/L? A randomised concentration-controlled trial. *Clinical Pharmacokinetics* 1993; 25:495-505  
Holford NHG, Hashimoto Y, Sheiner LB. Time and theophylline concentration help explain the recovery of peak flow following acute airways obstruction. Population analysis of a randomised concentration controlled trial. *Clinical Pharmacokinetics* 1993; 25:506-515

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## Determine Group V and CL

### ➤ Volume of Distribution

- » size  $V = V_{pop} \times WT/WT_{std}$
- » body composition

### ➤ Clearance

- » size  $CL = Cl_{pop} \times (WT/WT_{std})^{3/4}$
- » renal function
- » hepatic function
- » concomitant drugs

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WT=patient weight  
WTstd=standard weight e.g. 70 kg  
V<sub>pop</sub>, CL<sub>pop</sub>=population volume and clearance in a standard subject e.g. 70 kg.

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## Calculate LD and MDR e.g. gentamicin

$$\begin{aligned} \text{➤ LD} &= \text{TC} \quad \times \quad V \\ &= 20 \text{ mg/L} \quad \times \quad 20 \text{ L} = 400 \text{ mg} \end{aligned}$$

$$\begin{aligned} \text{➤ MDR} &= \text{TC} \quad \times \quad \text{CL} \\ &= 3 \text{ mg/L} \quad \times \quad 6 \text{ L/h} = 18 \text{ mg/h} \end{aligned}$$

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## When to Measure Concs?

Goal is to estimate PK e.g. CL

➤ Number of Samples

- » Most medicines 1
- » Gentamicin 2

➤ Timing of Sample

- » Most medicines Middle of dosing interval
- » Gentamicin "peak" and "trough"

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A rational approach to measuring drug concentrations is based on using the measurement to predict pharmacokinetic parameters – most commonly clearance.

The least informative time to measure concentrations is just before the next dose (the 'trough' concentration) unless this is paired with another 'peak' concentration. This is because clearance determines the average concentration. So measuring a concentration in the middle of the dosing interval will be closer to the average and therefore more useful for predicting clearance. Gentamicin concentrations vary widely in a dosing interval so two concentrations are needed to reliably estimate clearance.

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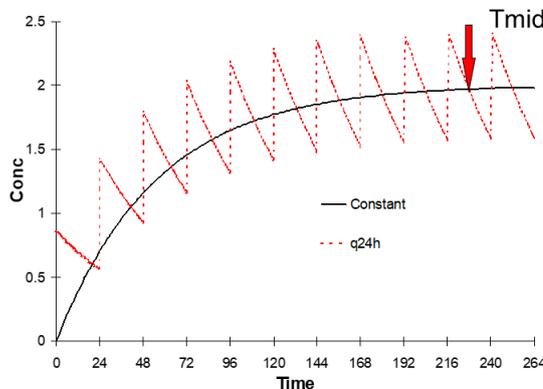
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## Digoxin



Tmid = middle of dosing interval

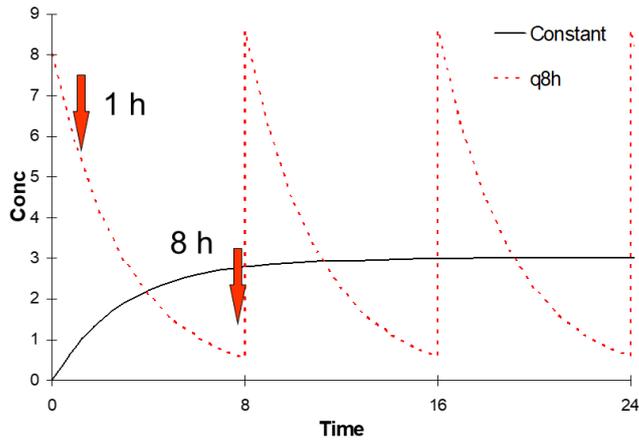
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A concentration in the middle of the dosing interval (C<sub>tmid</sub>) will be closer to the average steady state concentration (C<sub>ss</sub>) than either a peak or trough concentration.

Clearance is easily calculated from  $CL = \text{DoseRate} / C_{ss}$  which can be approximated by  $CL = \text{DoseRate} / C_{tmid}$ .

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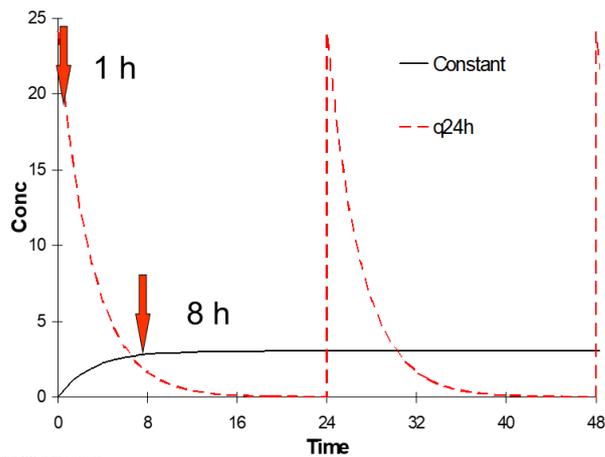
## Gentamicin TDS



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## Gentamicin OD



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Gentamicin concentrations with once a day dosing vary considerably. The trough concentration at 24 h is often unmeasurable because it is below the limit of quantitation. Concentrations are best measured 1h and 8 h after the dose.

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