

# OPTIMIZATION OF THE IRINOTECAN – EFFLUX TRANSPORTERS INHIBITOR COMBINATION FOR TREATING IRINOTECAN RESISTANT TUMOURS

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Pierre FALSON, Ahcène BOUMENDJEL, Gilles FREYER, Pascal GIRARD,  
Michel TOD

# Outline

- Outline
- Issue
- Aims
- Animals
- Model Building
- MBD
- Discussion

- Clinical issue
- Aims
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- Model Building
- Model Based Development
- Perspectives

# Clinical Issue

## *Multi-Drug Resistance*

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## *Multi-Drug Resistance*

- Efflux transporters:
  - Important role in drug absorption, distribution and drug resistance
  - Inhibition of efflux transporters could be useful for patients who expressed drug resistance phenotype

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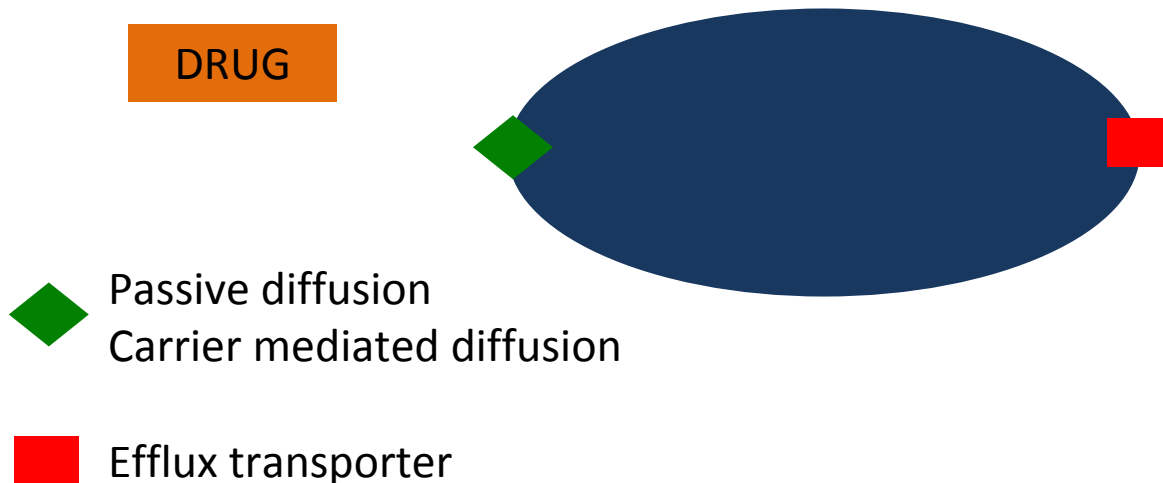
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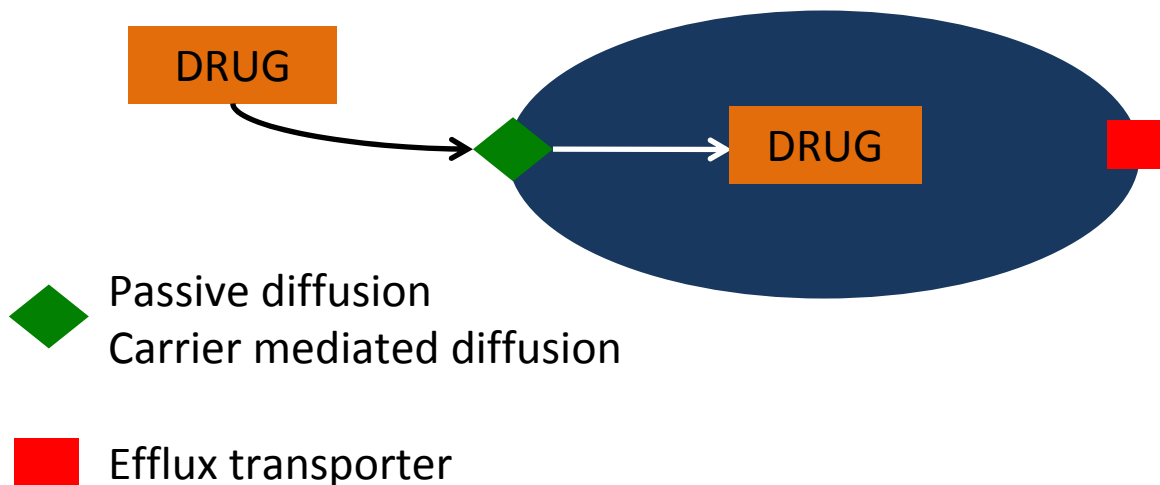
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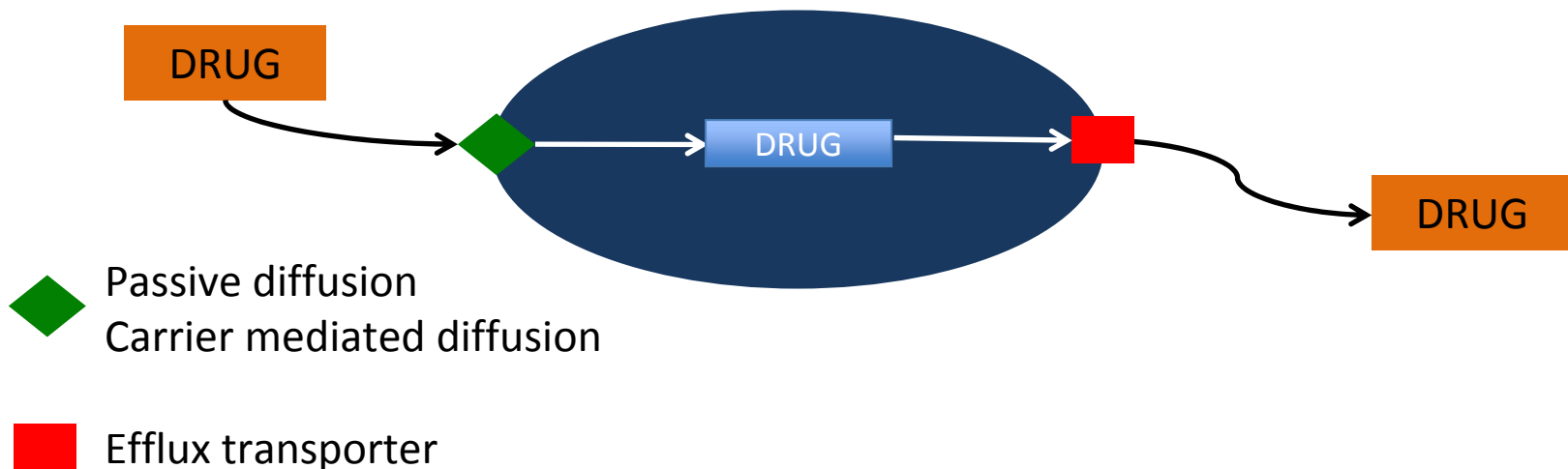
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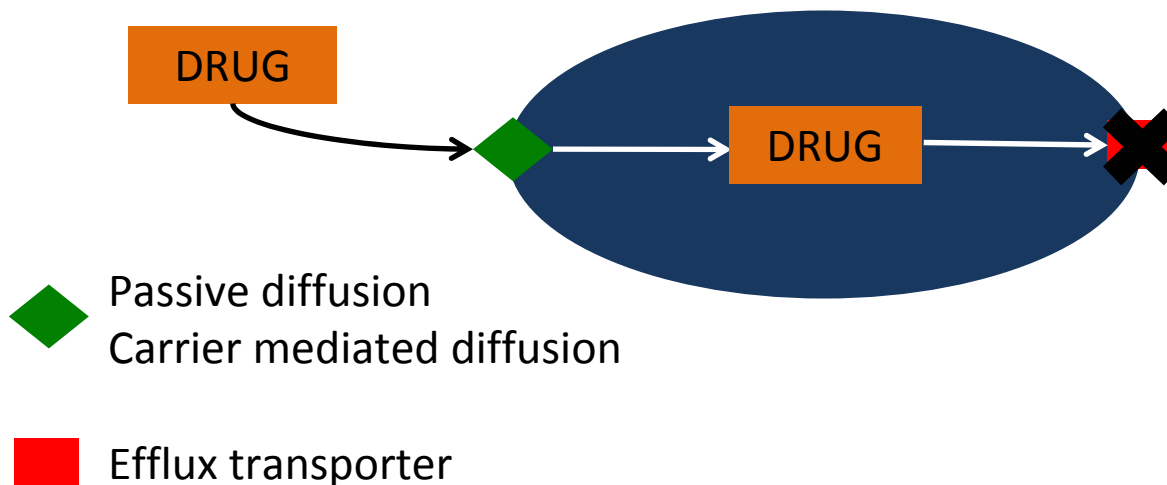
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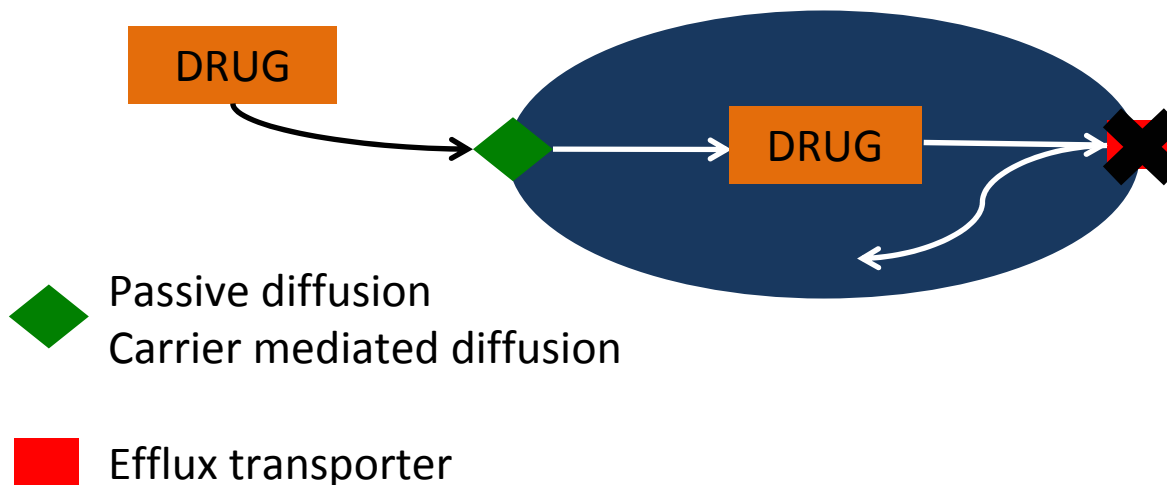
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- Mechanism:



# Clinical Issue

## *ABCG2-BCRP*

- ABCG2-Breast Cancer Resistance Protein (BCRP):
  - Efflux transporter discovered recently
  - Important transporter that effluxes a wide range of substrates (Mitoxantrone, Irinotecan, SN-38)

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- One BCRP reference inhibitor: Gefitinib (Iressa<sup>®</sup>, AstraZeneca)
  - Not BCRP specific

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### Development of new BCRP inhibitor Non toxic and more specific

- One acridone (A. BOUMENDJEL): as potent *in vitro* as Gefitinib<sup>1</sup>
  - Able to inhibit BCRP mediated efflux (Mitoxantrone, Irinotecan)
  - With the advantage of not inhibiting other efflux transporters
  - Proof of concept in mice

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### MBLI-87

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# Aims

## Optimizing a dose finding study

Optimizing the therapeutic regimen and effects of Irinotecan+MBLI-87 combination in mice

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- **Model Building**

Based on animal data, develop a non linear mixed effects model for Irinotecan+MBLI-87 effects on tumour growth in ABCG2 resistant xenografts

- **Simulation Study**

Based on previous model, develop a simulation analysis in order to select the best therapeutic regimen



# Animals

## *Proof of Concept Study Design*

- Therapeutic regimen:
  - 1 cycle over 4 weeks: 2 weeks on + 2 weeks off
  - Mice received 2 chemotherapy cycles over 8 weeks

Arms	N	Dose
Control + Vehicle	18	-
Irinotecan	9	30 mg.kg <sup>-1</sup>
Gefitinib	6	75 mg.kg <sup>-1</sup>
MBLI-87	6	2.4 mg.kg <sup>-1</sup>
Irinotecan+Gefitinib	3	30 mg.kg <sup>-1</sup> / 75 mg.kg <sup>-1</sup>
Irinotecan+MBLI-87	3	30 mg.kg <sup>-1</sup> / 2.4 mg.kg <sup>-1</sup>
TOTAL	45	

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# Animals

## *Data*

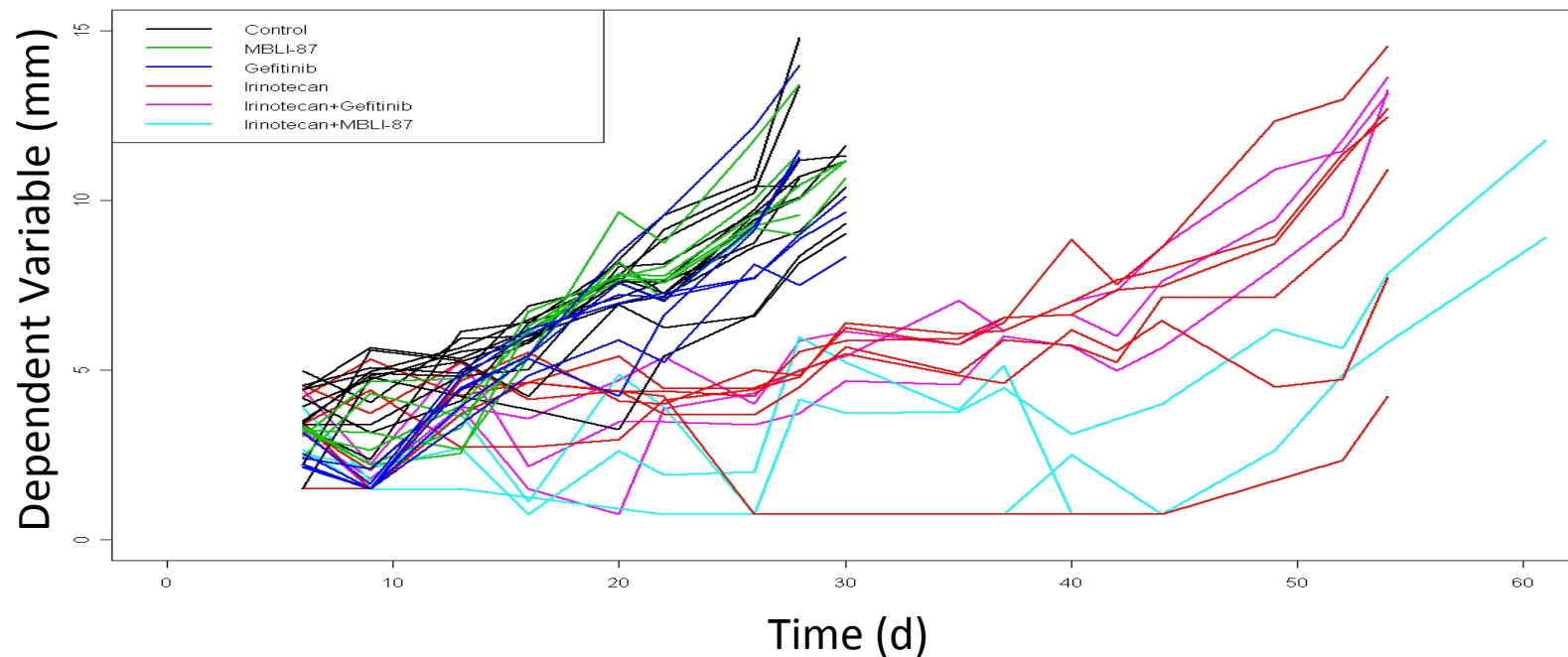
- 2 tumours implanted per mouse (right, left flank)
- 2 measures performed per tumour every 2<sup>nd</sup> day
- Dependent variable:  
Geometric mean of the 4 measures (L, w on each flank)

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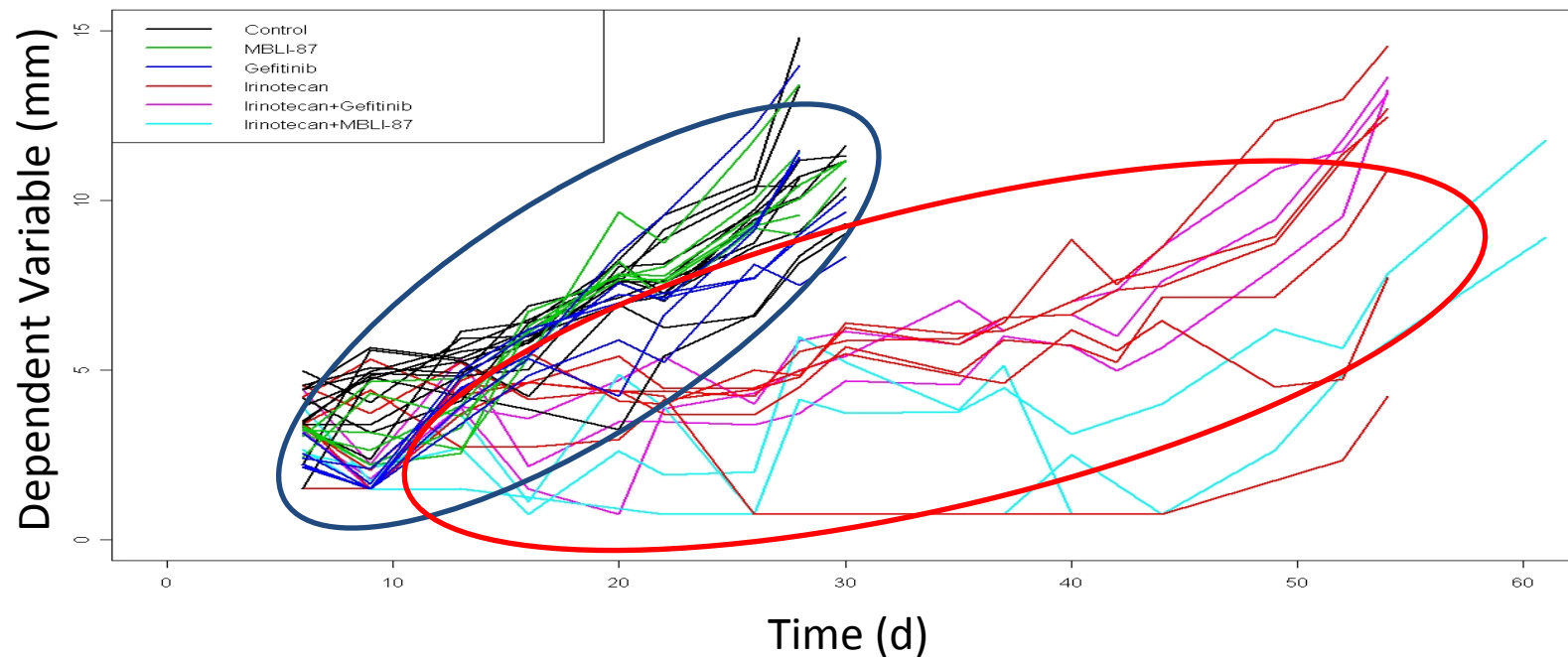
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# Model Building

## *Non linear mixed effects tumour growth inhibition models*

- Tumour Growth Inhibition Models (*TGI*): Useful to evaluate oncology drugs in early development
  - Describing disease progression
  - Linking administration regimen to tumour growth dynamics
  - Allowing next steps development prediction

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- Non Linear Mixed Effects modelling (*NLME*):
  - Using information from the entire population to estimate model parameters
  - Mixed effects: fixed, random effects estimated in the model<sup>2</sup>

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$$P_i = \theta \times e^{\eta_i}$$

$P_i$ : P individual value for the  $i^{\text{th}}$  individual

$\theta$ : fixed effect

$\eta_i$ : random effect,  $N(0, \omega^2)$

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$$P_i = \theta \times e^{\eta_i}$$

$$y_{ij} = f(\theta_i, X_{ij}) \times e^{\varepsilon_{ij}}$$

$y_{ij}$ :  $j^{\text{th}}$  observation for the  $i^{\text{th}}$  individual

$f$ : prediction function for parameter  $P_i$  under  $X_{ij}$  condition

$\varepsilon_{ij}$ : residual variability,  $N(0, \sigma^2)$

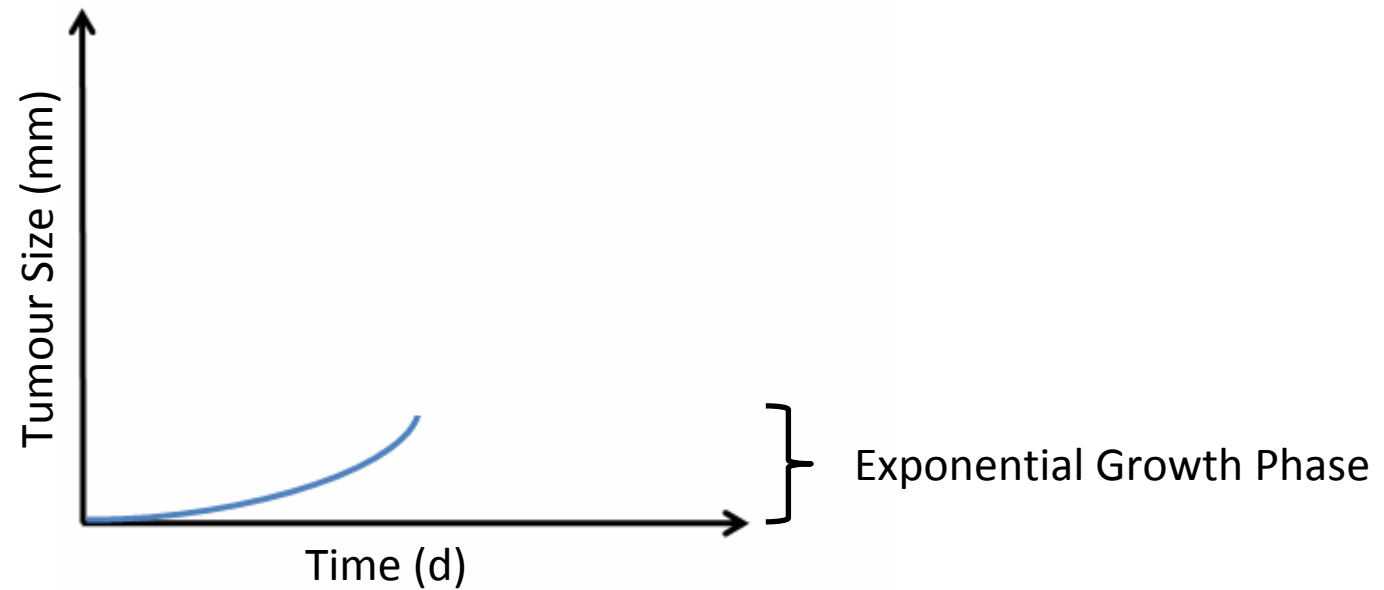
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# Model Building

## *“Unperturbed” Tumour Growth*

- 2 different growth phases (Simeoni *et al.*)<sup>3</sup>:



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**“Unperturbed”  
Tumour Growth**

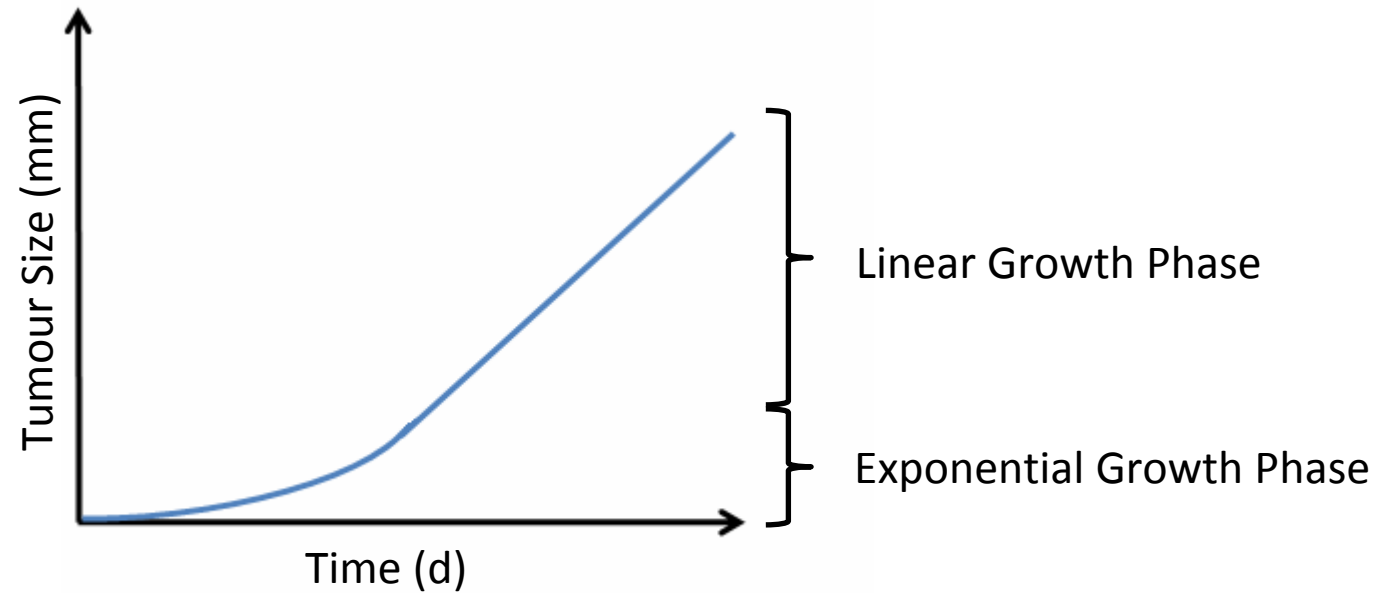
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# Model Building

## “Unperturbed” Tumour Growth

- 2 different growth phases (Simeoni *et al.*)<sup>3</sup>:

$$\frac{d\varphi_{tumour,i}}{dt} = \frac{\lambda_{0,i} \times \varphi_{tumour,i}}{\left(1 + \left(\frac{\lambda_{0,i}}{\lambda_{1,i}} \times \varphi_{tumour,i}\right)^\psi\right)^{\frac{1}{\psi}}}$$

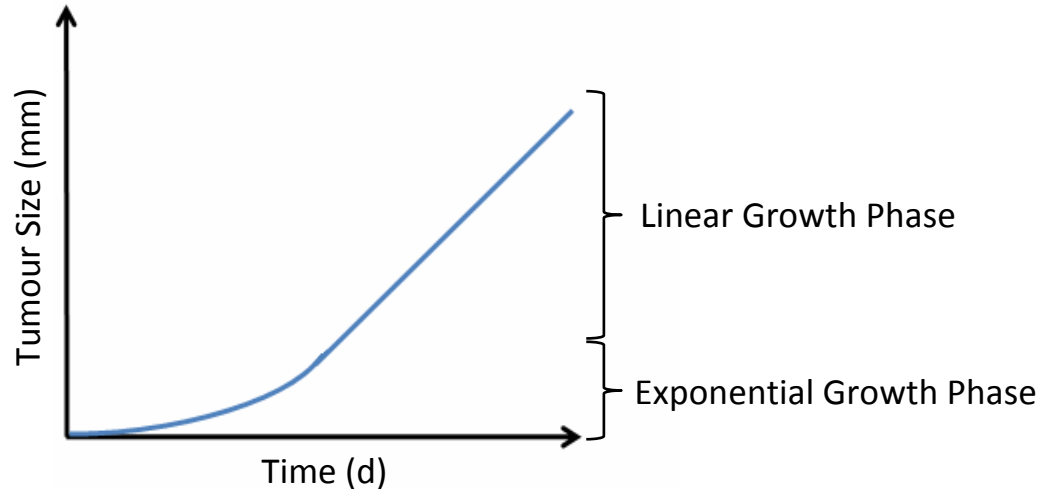
$\lambda_0$ : Exponential growth rate (d<sup>-1</sup>)  
 $\lambda_1$ : Linear growth rate (mm.d<sup>-1</sup>)  
 $\Psi$ : Switching parameter

$$\lambda_{0,i} = \lambda_0 * e^{\eta_{\lambda_0,i}}$$

$$\lambda_{1,i} = \lambda_1 * e^{\eta_{\lambda_1,i}}$$

$$\eta_{\lambda_0,i} \sim N(0, \Omega^2_{\lambda_0,i})$$

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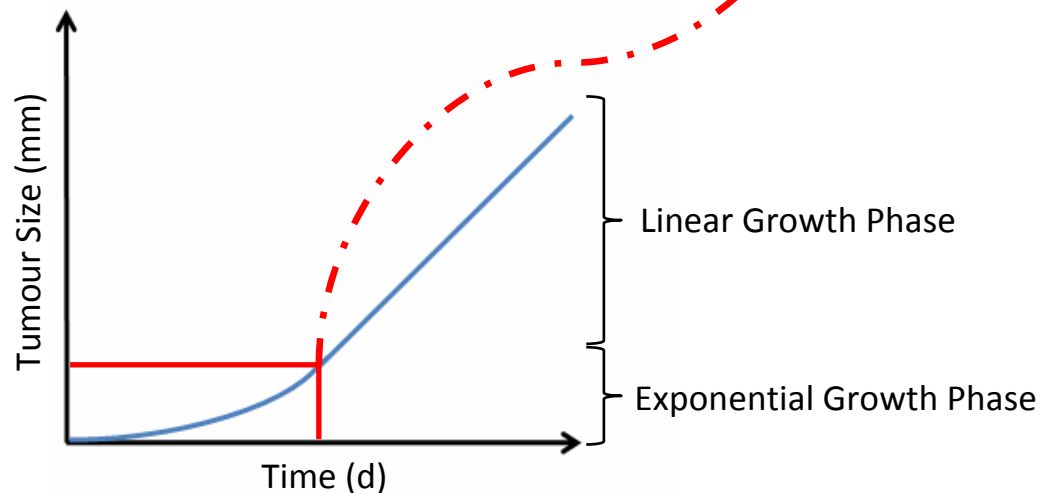
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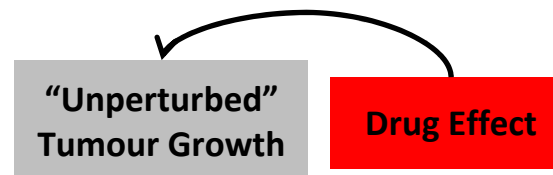
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# Model Building

## *“Perturbed” Tumour Growth*

- Natural growth perturbed by drug effect
- Assumed that cell die directly after drug administration

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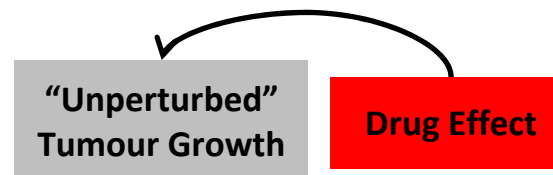
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## “Perturbed” Tumour Growth

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$$\frac{d\varphi_{tumour,i}}{dt} = \frac{\lambda_{0,i} \times \varphi_{tumour,i}}{\left(1 + \left(\frac{\lambda_{0,i}}{\lambda_{1,i}} \times \varphi_{tumour,i}\right)^\psi\right)^{\frac{1}{\psi}}} - P_X \times A_{X,i}(t) \times \varphi_{tumour,i}$$

$P_X$ : Potency of drug X ( $\text{mg}^{-1} \cdot \text{d}^{-1}$ )  
 $A_{X,i}$ : Amount of drug X (mg)



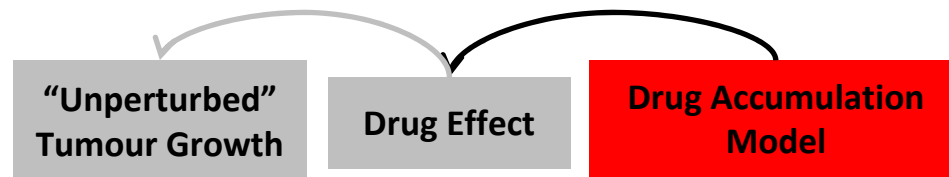
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# Model Building

## *Drug Accumulation Model*

- In our data, no drug concentration !!

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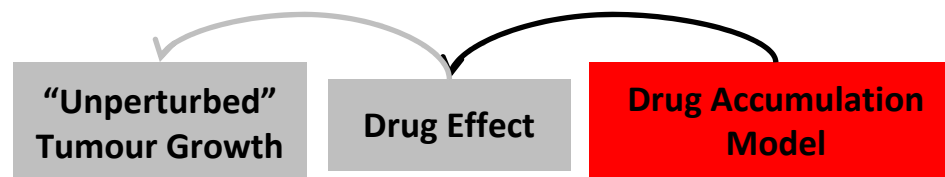
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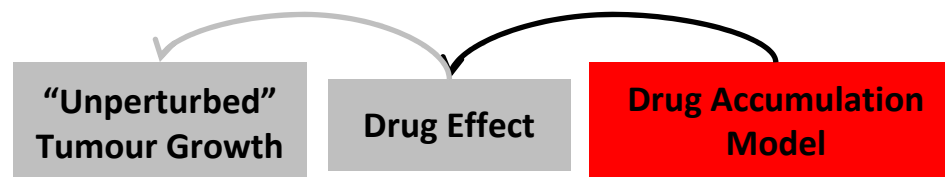
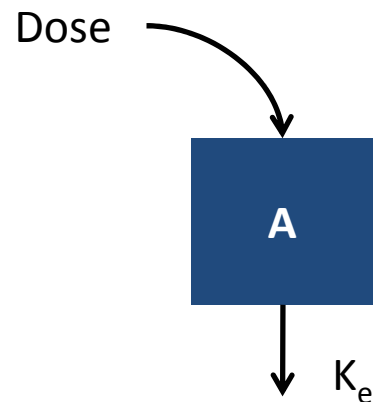
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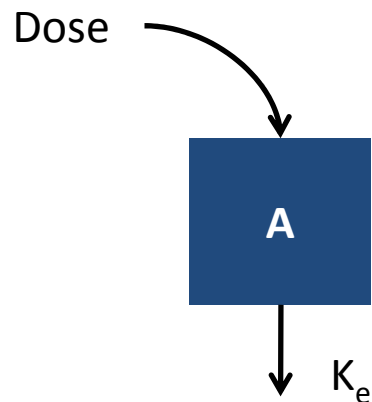


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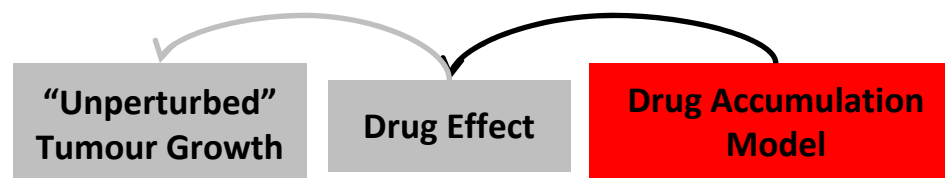
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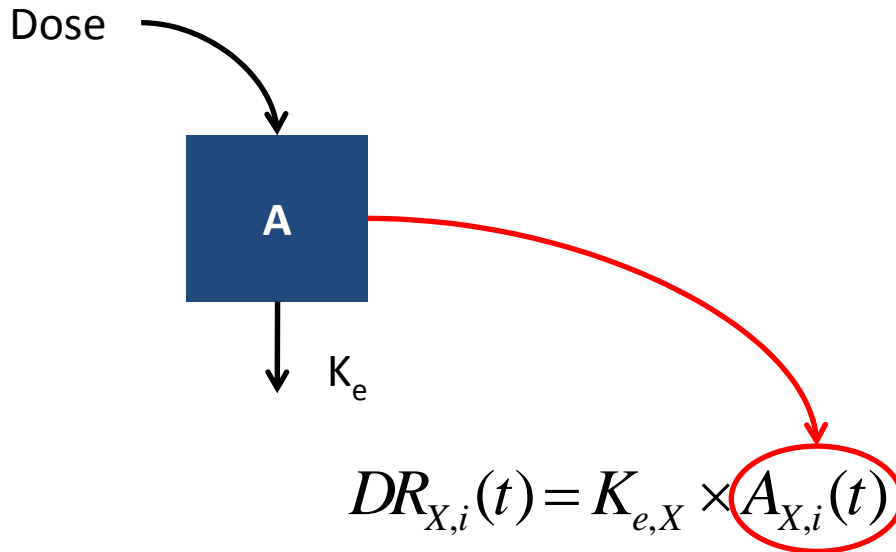
**Amount of drug at time t: Latent variable**  
Estimation supported by tumour growth dynamics



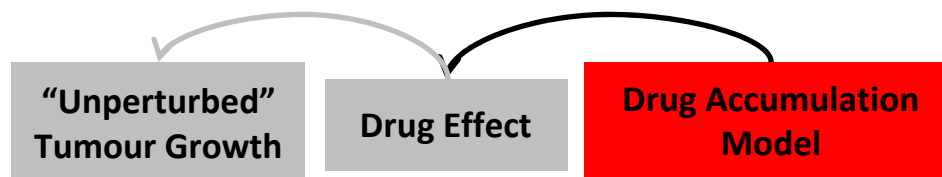
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# Model Building

## Drug Accumulation Model



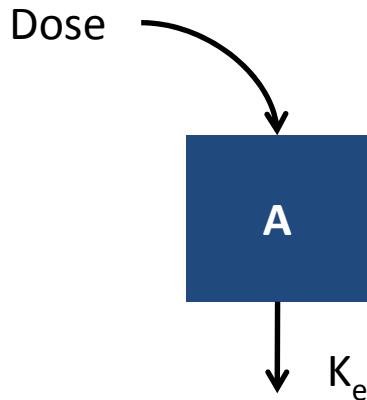
$$\frac{d\varphi_{tumour,i}}{dt} = \frac{\lambda_{0,i} \times \varphi_{tumour,i}}{\left(1 + \left(\frac{\lambda_{0,i}}{\lambda_{1,i}} \times \varphi_{tumour,i}\right)^\psi\right)^{\frac{1}{\psi}}} - P_X \times DR_{X,i}(t) \times \varphi_{tumour,i}$$



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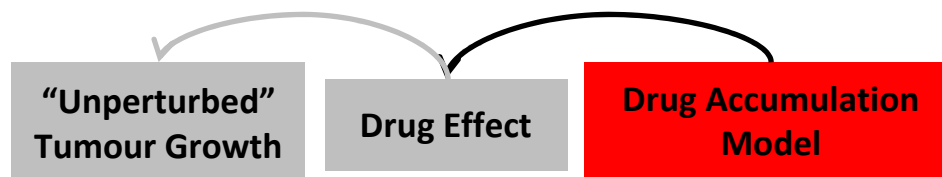
## Drug Accumulation Model



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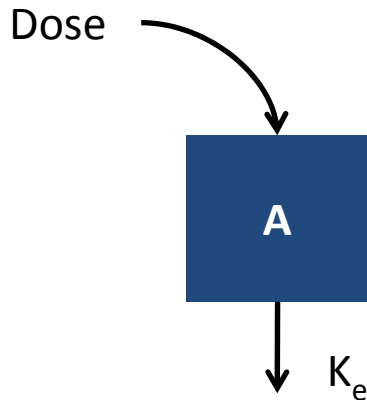
$$DR_{X,i}(t) = K_{e,X} \times A_{X,i}(t)$$

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# Model Building

## Drug Accumulation Model



Drug effects directly dependent on drug amount in animals

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“Unperturbed”  
Tumour Growth

Drug Effect

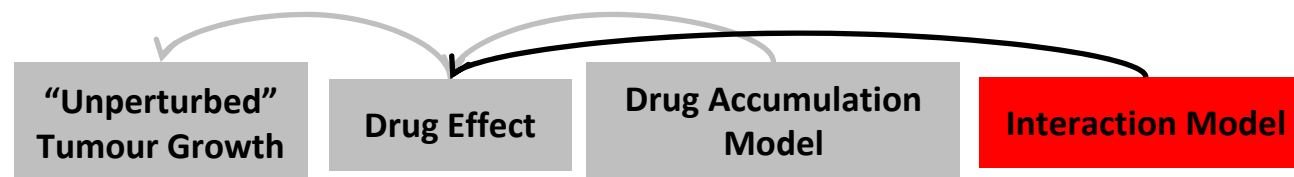
Drug Accumulation  
Model

# Model Building

## *Interaction Model*

- Assume that :
  - BCRP inhibitors have no cytotoxic effect when administered alone
  - BCRP inhibitors only modified Irinotecan potency

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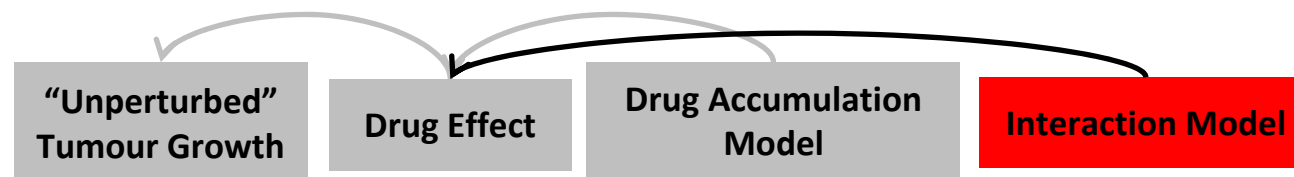
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**Irinotecan potency modified in presence of BCRP inhibitors ?**

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## Interaction Model

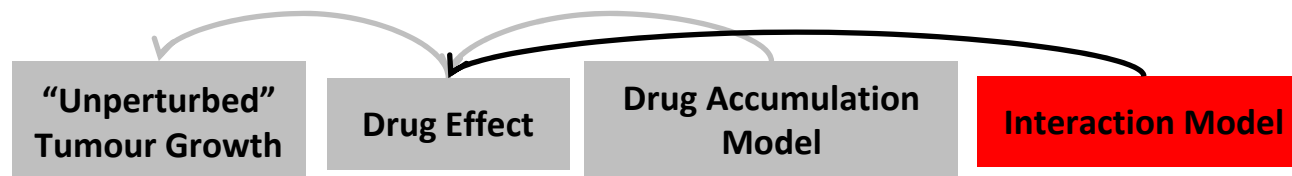
$P_{Irinotecan}$  decomposed into 2 terms:

$$P_{Irin|Inhib} = P_{Irin} + \beta_{Irin|Inhib} \times DR_{Inhib}(t)$$

$P_{Irinotecan}$  : Irinotecan potency ( $\text{mg}^{-1} \cdot \text{d}^{-1}$ )

$\beta_{Irinotecan|Inhibitors}$  : Interaction parameter ( $\text{mg}^{-1}$ )

$$\frac{d\varphi_{tumour,i}}{dt} = \frac{\lambda_{0,i} \times \varphi_{tumour,i}}{\left(1 + \left(\frac{\lambda_{0,i}}{\lambda_{1,i}} \times \varphi_{tumour,i}\right)^\psi\right)^{\frac{1}{\psi}}} - P_{Irin|Inhib} \times DR_{Irin,i}(t) \times \varphi_{tumour,i}$$



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# Model Building Summary

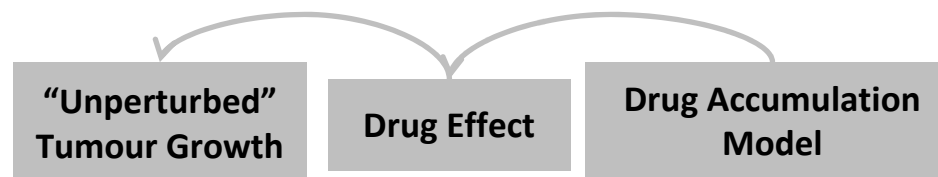
In case on single drug administration:

$$\frac{dA_{X,i}}{dt} = -K_{e,X} \times A_{X,i}(t)$$

$$DR_{X,i} = K_{e,X} \times A_{X,i}(t)$$

$$\frac{d\varphi_{tumour,i}}{dt} = \frac{\lambda_{0,i} \times \varphi_{tumour,i}(t)}{\left(1 + \left(\frac{\lambda_{0,i}}{\lambda_{1,i}} \times \varphi_{tumour,i}(t)\right)^\psi\right)^{\frac{1}{\psi}}} - P_X \times DR_{X,i} \times \varphi_{tumour,i}(t)$$

- Outline
- Issue
- Aims
- Animals
- Model Building
- MBD
- Discussion



# Model Building Summary

In case on single drug administration:

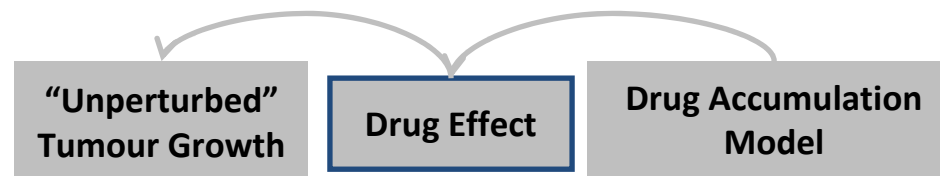
$$\frac{dA_{X,i}}{dt} = -K_{e,X} \times A_{X,i}(t)$$

$$DR_{X,i} = K_{e,X} \times A_{X,i}(t)$$

**K-PD component**

$$\frac{d\varphi_{tumour,i}}{dt} = \frac{\lambda_{0,i} \times \varphi_{tumour,i}(t)}{\left(1 + \left(\frac{\lambda_{0,i}}{\lambda_{1,i}} \times \varphi_{tumour,i}(t)\right)^\psi\right)^{\frac{1}{\psi}}} - P_X \times DR_{X,i} \times \varphi_{tumour,i}(t)$$

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# Model Building Summary

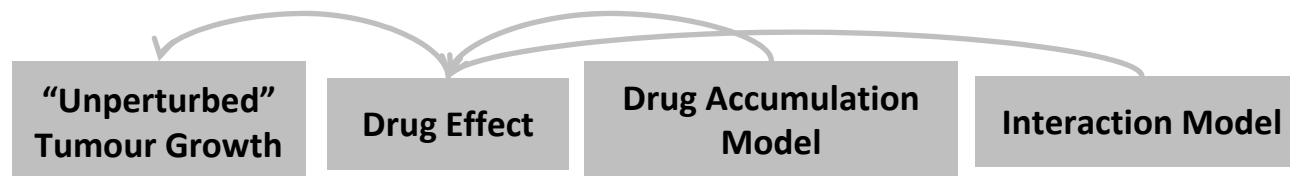
In case of co-administration:

$$\frac{dA_{X,i}}{dt} = -K_{e,X} \times A_{X,i}(t)$$

$$DR_{X,i} = K_{e,X} \times A_{X,i}(t)$$

$$\frac{d\phi_{tumour,i}}{dt} = \frac{\lambda_{0,i} \times \phi_{tumour,i}(t)}{\left(1 + \left(\frac{\lambda_{0,i}}{\lambda_{1,i}} \times \phi_{tumour,i}(t)\right)^\psi\right)^{\frac{1}{\psi}}} - \left(P_{Irin} + \beta_{Irin|Inhib} \times DR_{Inhib,i}\right) \times DR_{Irin,i} \times \phi_{tumour,i}(t)$$

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# Model Building Summary

In case of co-administration:

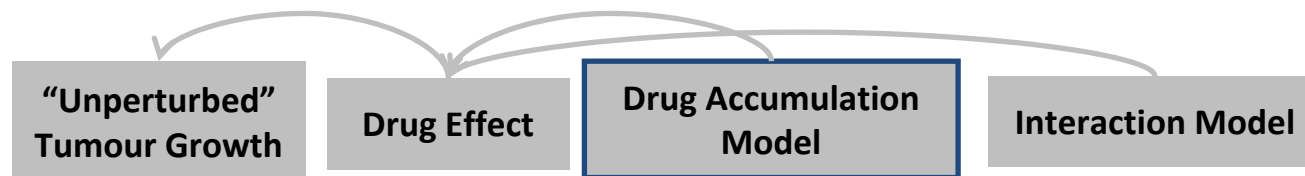
$$\frac{dA_{X,i}}{dt} = -K_{e,X} \times A_{X,i}(t)$$

$$DR_{X,i} = K_{e,X} \times A_{X,i}(t)$$

K-PD components

$$\frac{d\phi_{tumour,i}}{dt} = \frac{\lambda_{0,i} \times \phi_{tumour,i}(t)}{\left(1 + \left(\frac{\lambda_{0,i}}{\lambda_{1,i}} \times \phi_{tumour,i}(t)\right)^\psi\right)^{\frac{1}{\psi}}} - \left(P_{Irin} + \beta_{Irin|Inhib} \times DR_{Inhib,i}\right) \times DR_{Irin,i} \times \phi_{tumour,i}(t)$$

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# Model Building Summary

In case of co-administration:

$$\frac{dA_{X,i}}{dt} = -K_{e,X} \times A_{X,i}(t)$$

$$DR_{X,i} = K_{e,X} \times A_{X,i}(t)$$

K-PD components

$$\frac{d\phi_{tumour,i}}{dt} = \frac{\lambda_{0,i} \times \phi_{tumour,i}(t)}{\left(1 + \left(\frac{\lambda_{0,i}}{\lambda_{1,i}} \times \phi_{tumour,i}(t)\right)^\psi\right)^{\frac{1}{\psi}}} - \left(P_{Irin} + \beta_{Irin|Inhib} \times DR_{Inhib,i}\right) \times DR_{Irin,i} \times \phi_{tumour,i}(t)$$

Interaction component

## K-PD Tumour Growth Inhibition Model including Interaction Component



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# Model Building

## *Parameter Estimates*

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- Issue
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- Discussion

# Model Building

## Parameter Estimates

Parameters	Value
$\lambda_0$ (d <sup>-1</sup> )	0.06
$\lambda_1$ (mm.d <sup>-1</sup> )	0.2
$P_{\text{Irinotecan}}$ (mg <sup>-1</sup> .d <sup>-1</sup> )	0.3
$P_{\text{Inhibitors}}$ (mg <sup>-1</sup> .d <sup>-1</sup> )	10 <sup>-2</sup>

Values conform to values reported by Simeoni *et al.*

Inhibitors alone have no effect on tumour growth ( $p > 0.05$ )

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Interaction Parameter	Value
$\beta_{\text{Irinotecan Gefitinib}}$ (mg <sup>-1</sup> )	10 <sup>-2</sup>
$\beta_{\text{Irinotecan MBLI-87}}$ (mg <sup>-1</sup> )	5.3

# Model Building

## Parameter Estimates

Parameters	Value
$\lambda_0$ (d <sup>-1</sup> )	0.06
$\lambda_1$ (mm.d <sup>-1</sup> )	0.2
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Interaction Parameter	Value
$\beta_{\text{Irinotecan Gefitinib}}$ (mg <sup>-1</sup> )	10 <sup>-2</sup>
$\beta_{\text{Irinotecan MBLI-87}}$ (mg <sup>-1</sup> )	5.3

**Interaction stronger with MBLI-87**



# Model Building

## Parameter Estimates

Parameters	Value
$\lambda_0$ (d <sup>-1</sup> )	0.06
$\lambda_1$ (mm.d <sup>-1</sup> )	0.2
$P_{\text{Irinotecan}}$ (mg <sup>-1</sup> .d <sup>-1</sup> )	0.3
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Values conform to values reported by Simeoni *et al.*

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- Outline
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Interaction Parameter	Value
$\beta_{\text{Irinotecan Gefitinib}}$ (mg <sup>-1</sup> )	10 <sup>-2</sup>
$\beta_{\text{Irinotecan MBLI-87}}$ (mg <sup>-1</sup> )	5.3

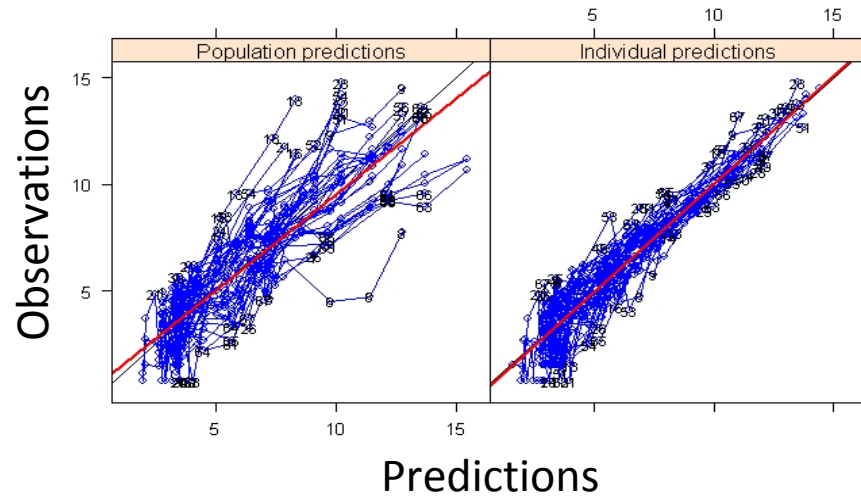
**Interaction stronger with MBLI-87**

**MBLI-87 able to revert Irinotecan resistance at a 20-fold lower dose compared to Gefitinib**

# Model Building

## *Model Evaluation*

- Goodness of fit plots:

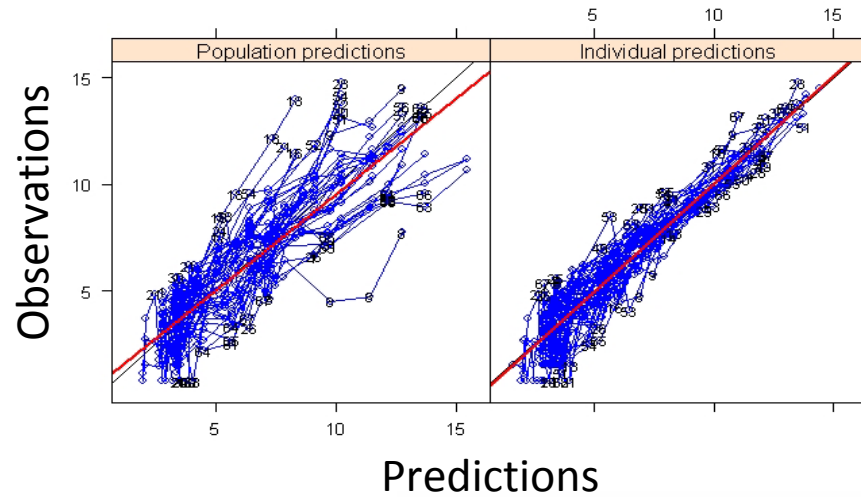


- Outline
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- Discussion

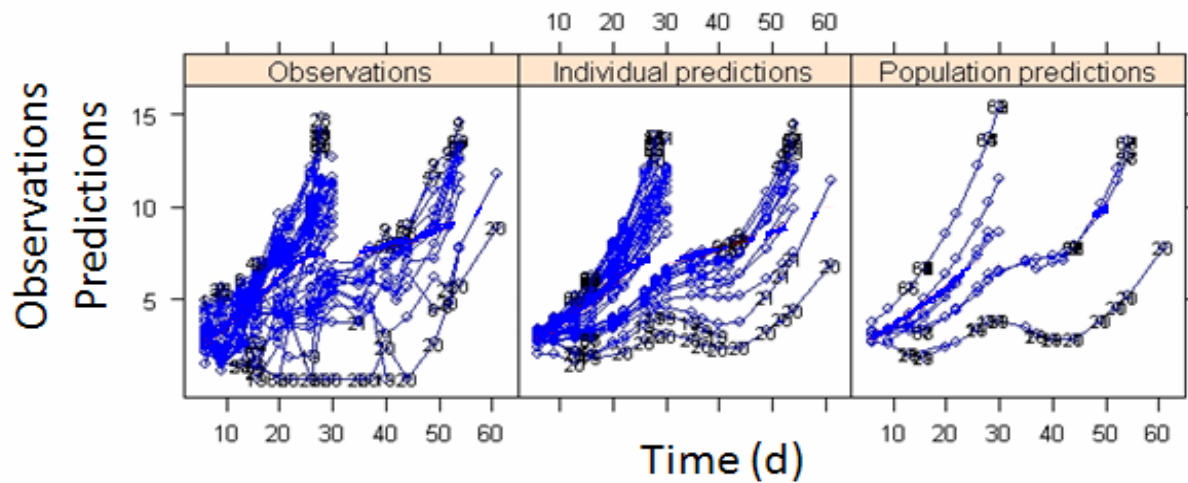
# Model Building

## *Model Evaluation*

- Goodness of fit plots:



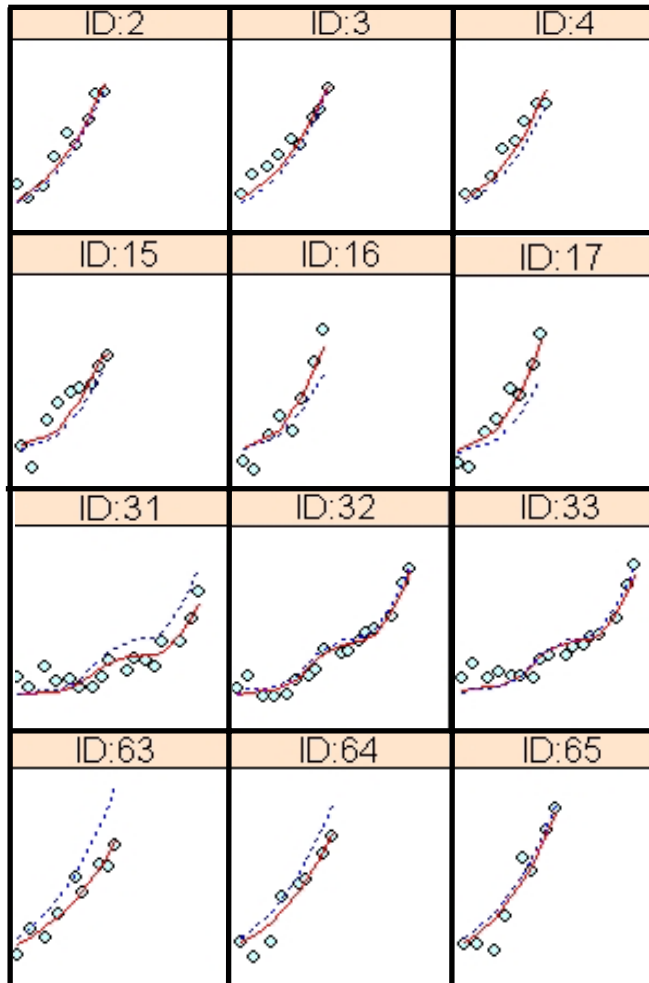
- Outline
- Issue
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- Discussion



# Model Building

## Model Evaluation

- Outline
- Issue
- Aims
- Animals
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- MBD
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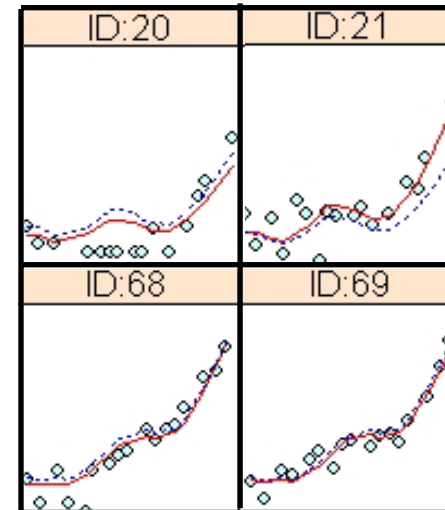


Control

Gefitinib

Irinotecan

MBLI-87



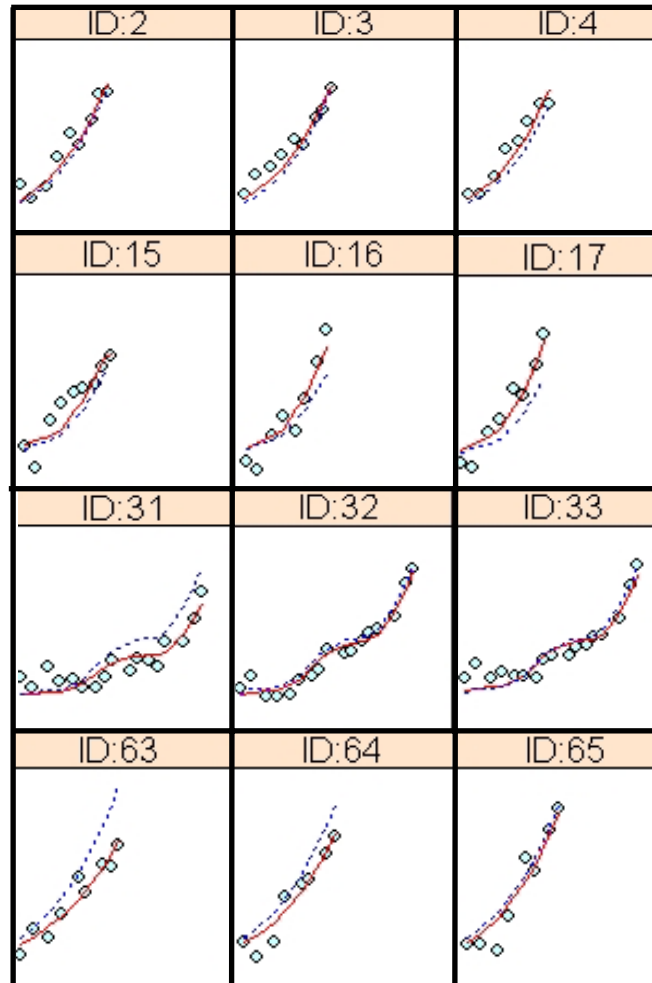
Gefitinib +  
Irinotecan

MBLI-87+  
Irinotecan

# Model Building

## Model Evaluation

- Outline
- Issue
- Aims
- Animals
- Model Building
- MBD
- Discussion

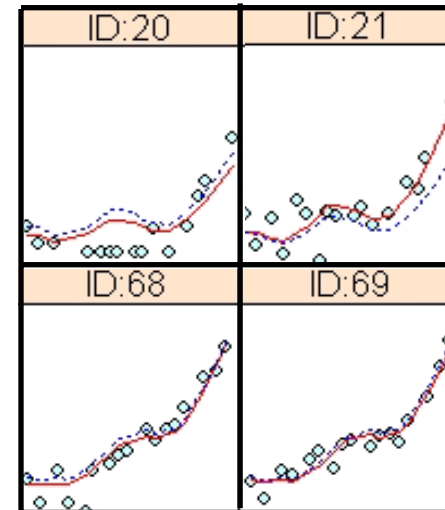


Control

Gefitinib

Irinotecan

MBLI-87



Gefitinib +  
Irinotecan

MBLI-87+  
Irinotecan

**Model fits quite well data in all groups**

# Model Building

## *Model Evaluation-Predictive Properties*

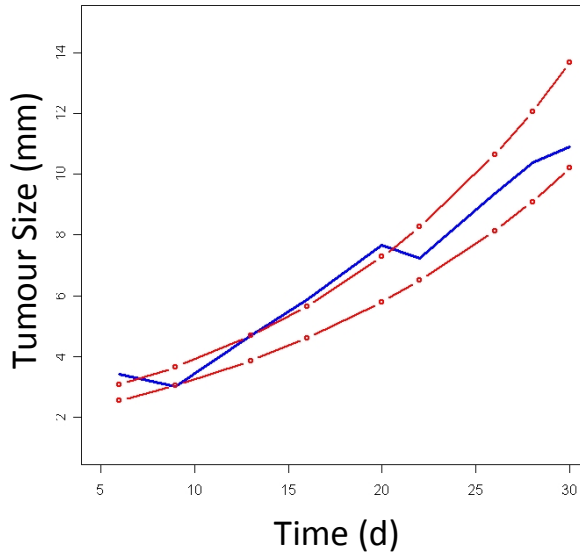
- Visual Predictive Check:
  - Simulations of tumour growth profiles based on parameter estimates and model structure
  - Comparison of observed median and simulated median given the model

- Outline
- Issue
- Aims
- Animals
- **Model Building**
- MBD
- Discussion
- Perspectives

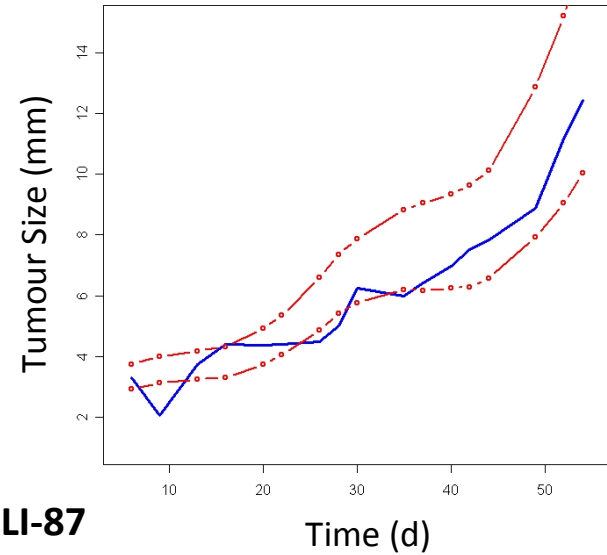
# Model Building

## Predictive Properties

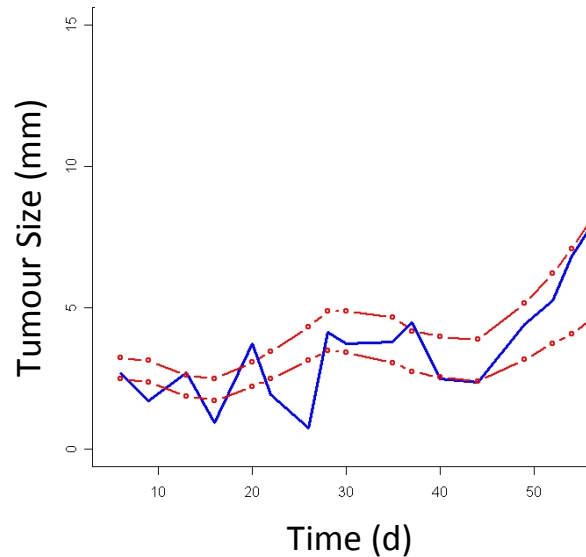
**VCP: Control**  
(Based on 18 animals)



**VCP: Irinotecan**  
(Based on 9 animals)



**VCP: Irinotecan+MBLI-87**  
(Based on 3 animals)



— Observed Median  
- - - 90% non parametric confidence interval

- Outline
- Issue
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- Animals
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- Perspectives

# Model Based Development

## *Objectives and Methods*

- **Objectives:**
  - **Optimizing Irinotecan/MBLI-87 combination schedule**
  - Explore the impact of:
    - ✓ Doses
    - ✓ Administration schedules
    - ✓ Treatment duration

- Outline
- Issue
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# Model Based Development

## *Objectives and Methods*

- **Objectives:**

- Optimizing Irinotecan/MBLI-87 combination schedule
- Explore the impact of:
  - ✓ Doses
  - ✓ Administration schedules
  - ✓ Treatment duration

- **Criterion:**

- Maximizing differences between Irinotecan and Irinotecan+MBLI-87 tumour growth profiles at day 50

- Outline
- Issue
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# Model Based Development

## *Objectives and Methods*

- Outline
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- MBD
- Discussion

- **Objectives:**

- Optimizing Irinotecan/MBLI-87 combination schedule
- Explore the impact of:
  - ✓ Doses
  - ✓ Administration schedules
  - ✓ Treatment duration

- **Criterion:**

- Maximizing differences between Irinotecan and Irinotecan+MBLI-87 tumour growth profiles at day 50

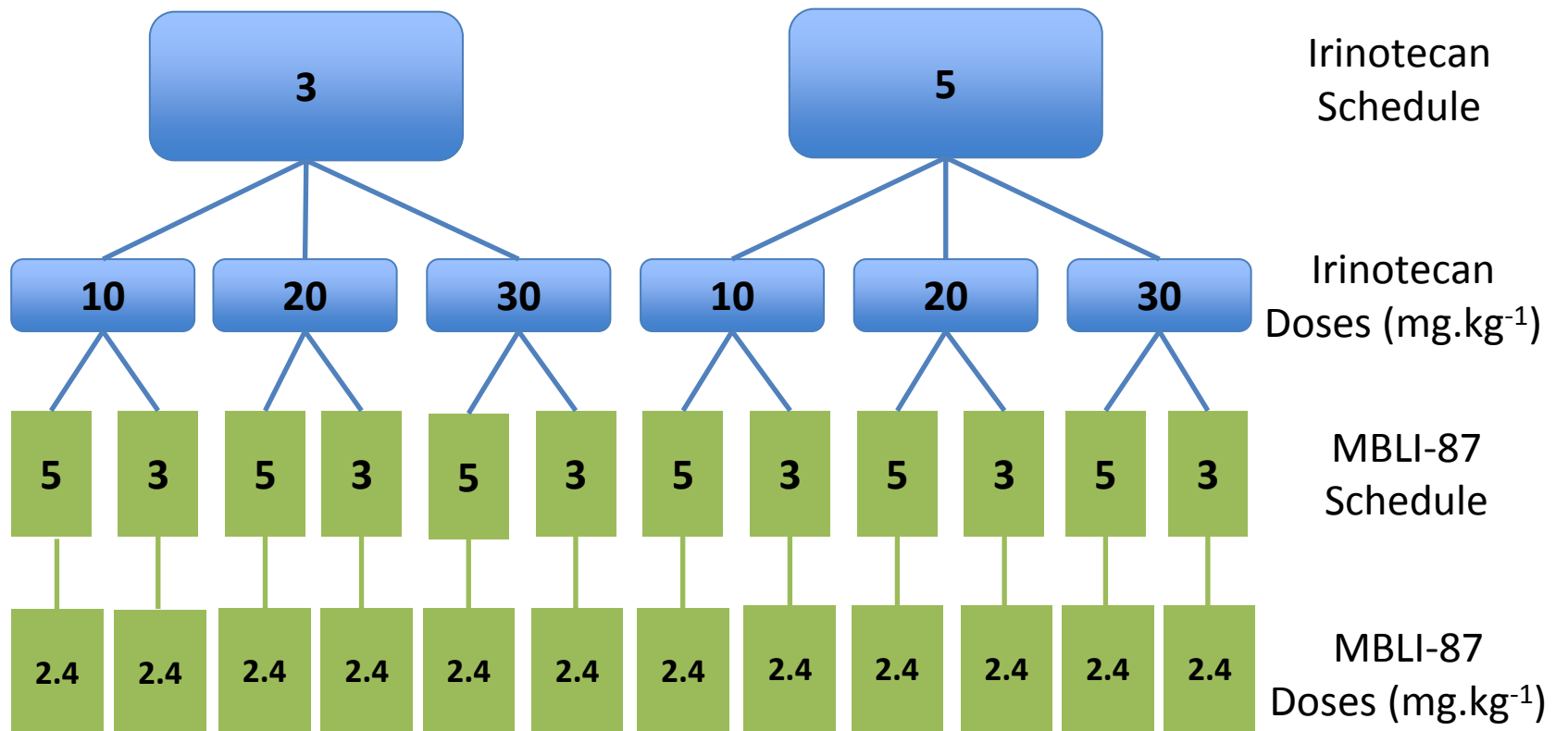
- **Methods:**

- Simulation of 1000 virtual animals on the model structure and parameter estimates basis (Monte Carlo simulations)
- Taking into account experimental constraints (drug formulation, animals care, ethics, ...)

# Model Based Development

## *Irinotecan Schedule*

- Outline
- Question
- Aims
- Animals
- Model Building
- **MBD**
- Discussion



# Model Based Development

## *Example*

- Influence of Irinotecan schedule on tumour growth

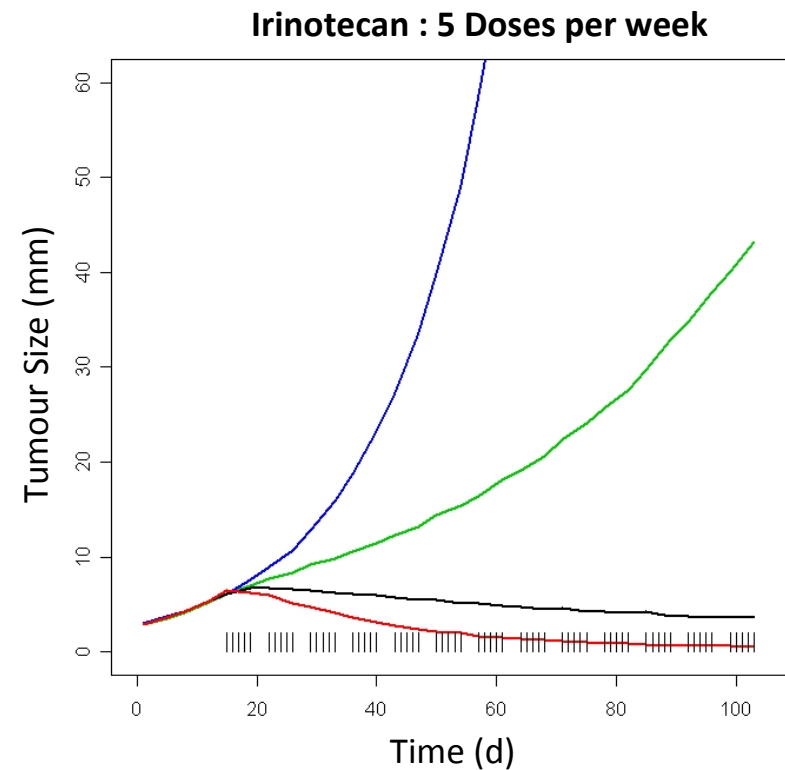
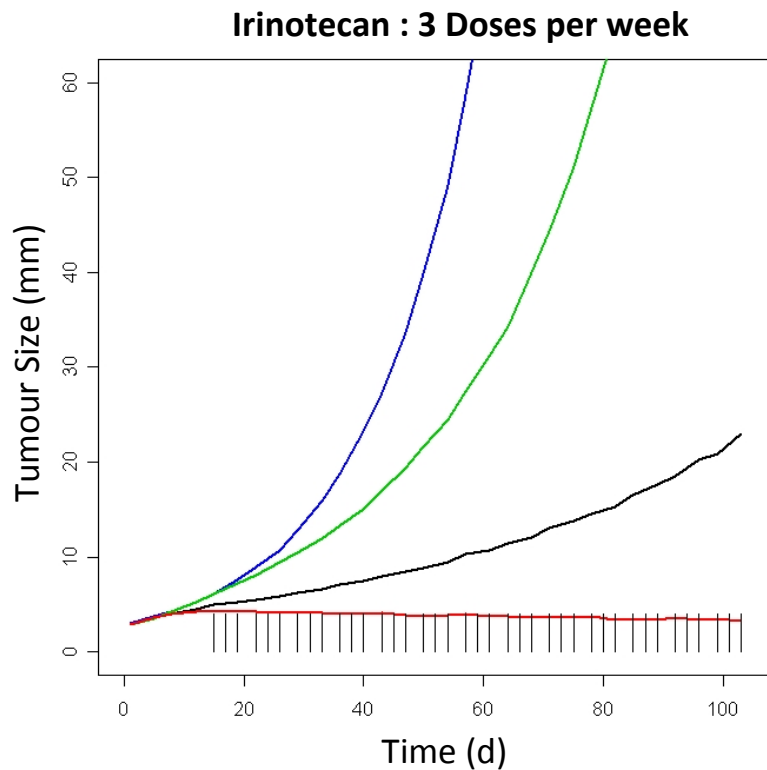
- Outline
- Question
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# Model Based Development

## Example

- Influence of Irinotecan schedule on tumour growth

- Outline
- Question
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- Discussion

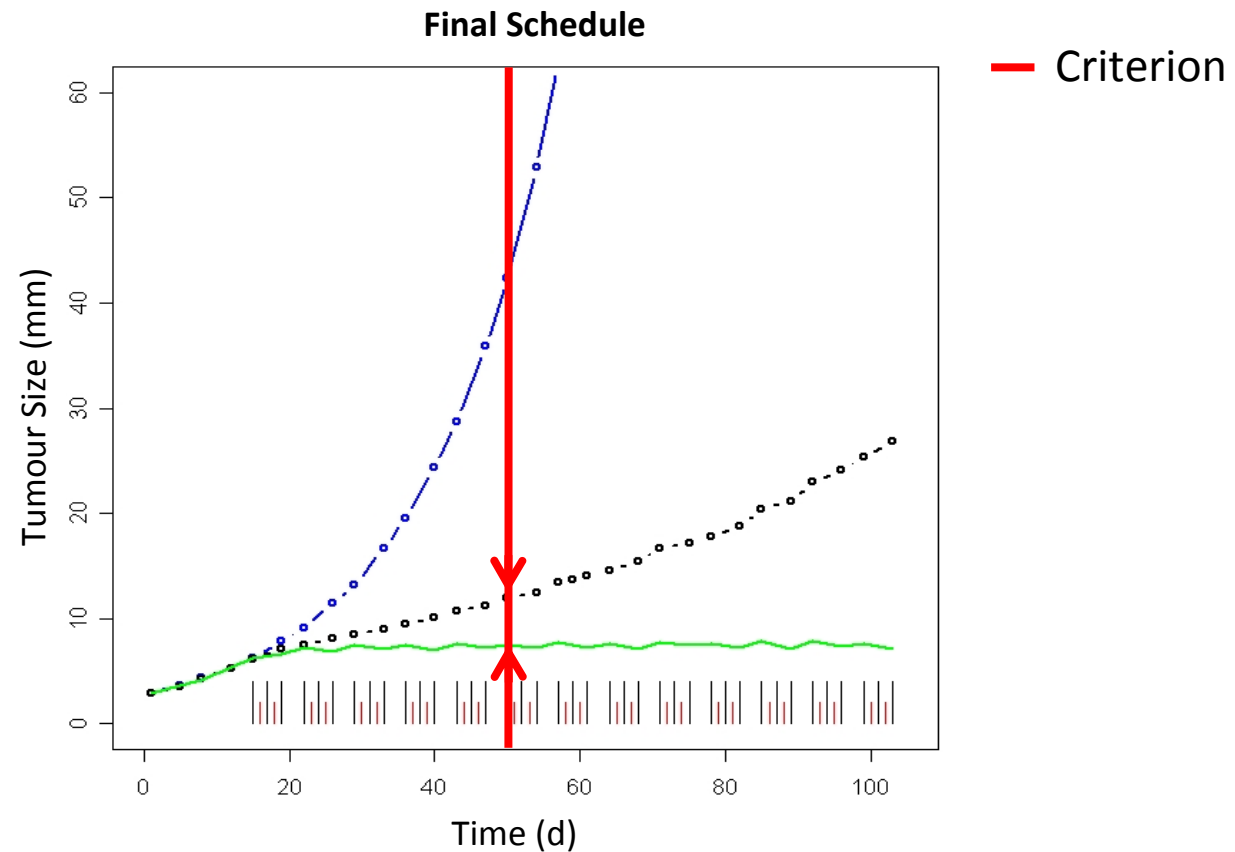


- Control (median value)
- Irinotecan 10 mg.kg<sup>-1</sup> (median value)
- Irinotecan 20 mg.kg<sup>-1</sup> (median value)
- Irinotecan 30 mg.kg<sup>-1</sup> (median value)

# Model Based Development

## Final Schedule

- Outline
- Question
- Aims
- Animals
- Model Building
- **MBD**
- Discussion



- Control (median value)
- Irinotecan 20 mg.kg<sup>-1</sup> + MBLI-87 2.4 mg.kg<sup>-1</sup> (median value)
- Irinotecan 20 mg.kg<sup>-1</sup> (median value)

**Irinotecan: 20 mg.kg<sup>-1</sup>, 3 times per week**  
**MBLI-87: 2.4 mg.kg<sup>-1</sup>, 5 times per week**

# Synthesis and Discussion

- Development of a non linear mixed effects tumour growth inhibition model:
  - Based on Simeoni *et al.* model with some modifications
  - No PK data: K-PD approach (PK: latent variable)
  - Drugs co-administered: Drug-drug interaction parameter
- Parameter Estimates:
  - **Synergistic effect between MBLI-87 and Irinotecan**
- Adequate predictive properties

- Outline
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- Animals
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# Synthesis and Discussion

- Development of a non linear mixed effects tumour growth inhibition model:
  - Based on Simeoni *et al.* model with some modifications
  - No PK data: K-PD approach (PK: latent variable)
  - Drugs co-administered: Drug-drug interaction parameter
- Parameter Estimates:
  - **Synergistic effect between MBLI-87 and Irinotecan**
- Adequate predictive properties
- Definition of new therapeutic regimens with biologists
- Simulation study:
  - Choosing the best therapeutic regimen

- Outline
- Issue
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# Synthesis and Discussion

- Small number of individuals and poor design of this 1<sup>st</sup> study:
  - Fisher Information Matrix unobtainable: no standard error
  - Only simulation based diagnostics

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# Synthesis and Discussion

- Small number of individuals and poor design of this 1<sup>st</sup> study:
  - Fisher Information Matrix unobtainable: no standard error
  - Only simulation based diagnostics

**BUT, this model is useful to take decision  
for the next development step**

- Outline
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# Synthesis and Discussion

- Small number of individuals and poor design of this 1<sup>st</sup> study:
  - Fisher Information Matrix unobtainable: no standard error
  - Only simulation based diagnostics

**BUT, this model is useful to take decision  
for the next development step**

- A new dose finding study, based on simulation results, is ongoing:
  - PK analysis
  - Number of subjects increased

**Confirmation of these 1<sup>st</sup> results ?**

- Outline
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## Thanks to

- Michel TOD, my supervisor
- Brigitte TRANCHAND, for valuable discussions
- Colleagues from Lyon and Uppsala
- Organization Committee

You, for your attention