

# Population modelling of the effect of inogatran, at thrombin inhibitor, on ex vivo coagulation time (APTT) in healthy subjects and patients with coronary artery disease

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**Aims** The purpose of this study was to characterize the relationship between the degree of anticoagulation, assessed by APTT, and the plasma concentration of inogatran in healthy subjects and in patients with coronary artery disease.

**Methods** Data from five phase I studies in 78 healthy males and two phase II multicentre studies in 948 patients of both sexes with unstable angina pectoris or non-Q-wave myocardial infarction were evaluated. A total of 3296 pairs of concentration-APTT samples were obtained before, during, and after intravenous infusions of inogatran. Mixed effects modelling was used for population pharmacodynamic analysis of the drug effect and for describing the variability in baseline APTT.

**Results** The population mean baseline APTT was 29 s, but large variations between individuals (s.d. 3.6 s) were observed. The variability between studies (1.3 s) and centres (1.8 s) were of less importance, though statistically significant. APTT increased in a nonlinear manner with increasing inogatran concentration and the relationship was well described by a combined linear and  $E_{\max}$  model. A significant part of the overall variability could be ascribed to the APTT reagent and equipment used at the different study centres. These method-dependent differences were compensated for by including the lower limit of the normal reference range as a covariate, affecting both baseline and  $E_{\max}$ , in the model. For the typical healthy subject and patient, the method-corrected population mean parameters were:  $APTT_{\text{baseline}}$  35 and 31 s, slope 8.0 and 5.8 s l  $\mu\text{mol}^{-1}$ ,  $E_{\max}$  36 and 34 s, and  $EC_{50}$  0.54 and 0.72  $\mu\text{mol l}^{-1}$ , respectively. The model predicted plasma concentration needed to double the APTT from the baseline value was 1.25 and 1.45  $\mu\text{mol l}^{-1}$  in the healthy volunteer and patient, respectively.

**Conclusions** The nonlinear relationship between APTT and inogatran concentration in plasma was well described by a combined linear and  $E_{\max}$  model. Pooling of data was made possible by incorporating a centre-specific characteristic of the assay method in the model. Patients had lower baseline APTT and appeared to have less pronounced effect of inogatran than young healthy subjects.

**Keywords:** activated partial thromboplastin time, anticoagulation, APTT, inogatran, population pharmacodynamic modelling, thrombin inhibition

## Introduction

Inogatran is a synthetic low-molecular-weight thrombin inhibitor, developed for the possible treatment and

prophylaxis of arterial and venous thrombotic diseases. Thrombin is a key enzyme in the coagulation cascade, catalysing the formation of fibrin from fibrinogen [1]. *In vitro* studies have shown that the inhibition of thrombin by inogatran is reversible, competitive and selective [2]. For this class of drugs it is important that an optimal degree of anticoagulation is attained that gives the desired anti-thrombotic effect without increasing the risk for adverse

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effects, such as bleeding complications, to an unacceptable level. One common surrogate marker for the degree of anticoagulation is the activated partial thromboplastin time (APTT), which has long been used to monitor treatment with heparin [3] and more recently in the clinical evaluation of direct thrombin inhibitors, e.g. hirudin, hirulog and argatroban [4–10]. Therapeutic ranges for APTT have been established empirically for heparin in various indications [11], but difficulties exist due to lack of standardization of measurement methods between laboratories. After incubation of citrated plasma with a reagent containing phospholipids as a substitute for platelet membranes and a contact activator, calcium is added and the clotting time (APTT) is registered. Sources of variation in the APTT result include, e.g. type and source of reagents, including batch-to-batch variations, type of instrument used for clot detection, citrate concentration in the test tube, and type of test tube [12–18]. In addition, anticoagulants with differing mechanism of action produce different levels of anti-thrombotic effect and bleeding at the same level of APTT [3, 8, 19–22]. Antithrombotic effects have been demonstrated for inogatran at plasma concentrations of 0.3–3  $\mu\text{mol l}^{-1}$  in experimental rat models [20, 22, 23]. The predicted therapeutic level is 1  $\mu\text{mol l}^{-1}$ , which is the concentration that causes a two-fold increase of APTT from the baseline when inogatran is added to human plasma [2].

The aim of this investigation was to characterize the relationship between plasma concentration of inogatran and APTT, measured in healthy volunteers and in patients with coronary artery disease, and to identify important factors influencing this relationship. Pharmacodynamic data from seven clinical trials involving a total of 1026 individuals were therefore evaluated using the population approach.

## Methods

### Clinical studies

Data from five pharmacokinetic studies in 78 healthy volunteers and two clinical multicentre studies in 948 patients with coronary artery disease were included in the analyses. The main design characteristics of the studies are given in Table 1. All study protocols were approved by the relevant ethics committees and the studies were performed according to GCP (Good Clinical Practice) standards. Written informed consent was obtained prior to enrolment. The pharmacokinetic and clinical results from these studies have previously been reported [24–26].

### Healthy volunteers

Seventy-eight male volunteers, judged to be healthy by standard clinical and laboratory investigations, participated in five phase I pharmacokinetic studies (studies A–E) conducted at the AstraZeneca drug study unit (Göteborg, Sweden). Demographic information is summarized in Table 2. A total of 110 administrations of inogatran were given as i.v. infusions over 10 min (studies A–B, D–E) or 4 h (study C). In addition, placebo was given in study C. A total of 1096 pairs of blood samples (3–15 per subject) were drawn for subsequent determination of inogatran concentration and APTT and were all included in the analysis.

### Patients

In a Swedish four-centre phase IIA study (study F) a total of 49 patients received inogatran as i.v. infusion during four hours (low, intermediate or high dose level) or three days (intermediate dose level). In a phase IIB study (study G)

**Table 1** Main study characteristics of i.v. inogatran data included in the population pharmacodynamic analysis

Study	Number of centres	Number of subjects	Study design	Dosing regime	Number of samples	Conc. range ( $\mu\text{mol l}^{-1}$ )
A	1	22 healthy	Open, dose-escalation 2–4 subjects/dose, 1–2 doses/subject	i.v. inf. (10')	183	0.10–7.06
B	1	16 healthy	1 dose/subject	i.v. inf. (10')	155	0.02–2.41
C	1	16 healthy	Open, 2-way cross-over inogatran or placebo	i.v. inf. (4 h)	477	0.02–2.38
D	1	12 healthy	Double-blind, 2-way cross-over inogatran + placebo or inogatran + aspirin 150 mg p.o.	i.v. inf. (10')	249	0.02–0.92
E	1	12 healthy	1 dose/subject	i.v. inf. (10')	32	0.02–2.42
F	4	49 patients	Open, 4 parallel dose groups	i.v. inf. 10' + 3 h 50' or 10' + 71 h 50'	286	0.03–1.91
G	61	899 patients	Double-blind, 3 parallel dose groups	i.v. bolus + inf. 72 h	1913	0.04–9.10

The amount of inogatran is given in Figure 1.

**Table 2** Subject characteristics. For continuous variables, the median (range) values are provided. For categorical variables the number (percentage) of subjects are given

	Healthy volunteers	Patients
<i>Gender</i>		
Male	78 (100%)	652 (69%)
Female	0	296 (31%)
<i>Age (years)</i>	28 (20–39)	66 (32–81)
<i>Weight (kg)</i>	76 (66–86)	79 (50–121)
<i>Smoking habits</i>		
Non-smoker	–	414 (44%)
Previous smoker	–	309 (33%)
Smoker	2 (17%) <sup>1</sup>	223 (24%)
<i>Baseline APTT (s)</i>	34 (28–49)	29 (15–60)
<i>Concomitant aspirin</i>	12 (15%)	948 (100%)
<b>Diagnosis</b>		
Unstable angina pectoris	0	716 (76%)
Non Q-wave myocardial infarction	0	232 (24%)
Hypertension	0	333 (35%)
Diabetes	0	153 (16%)
Cardiac failure	0	124 (13%)
<i>Clinical outcome</i>		
Death	0	9 (1%)
Myocardial reinfarction	0	41 (4%)
Refractory angina	0	38 (4%)
Recurrent angina	0	343 (36%)
None of the above	78 (100%)	517 (55%)

<sup>1</sup> Recorded in study E only

904 patients from 61 Scandinavian centres obtained constant infusion with one of three inogatran dose levels for 3 days. In both studies, the patients should have a clinical diagnosis of unstable angina pectoris or non-Q-wave myocardial infarction, with an episode of chest pain of at least 10 min duration within the preceding 72 h, and should have been clinically stable in hospital for at least 8 h before inclusion. Patient characteristics are given in Table 2. In addition to the study drug, all patients received standard doses of aspirin throughout the studies. Standard treatments with nitroglycerin,  $\beta$ -adrenoceptor blockers and calcium antagonists were given at the discretion of the responsible physician. In 948 patients at least one plasma concentration *vs* APTT observation was recorded and the total number of data points were 2200 ( $\leq 4$  per patient). All data points, except for one outlying value (APTT 90 s at  $0.026 \mu\text{mol l}^{-1}$ ), were included in the pharmacodynamic modelling.

### Study drug

The drug was administered as i.v. solutions containing a stable dihydrobromide salt of inogatran (base: MW 438.6, salt: MW 600.4). Dose information is given in Table 1.

### Inogatran concentration in plasma

Venous blood samples were collected in 5 ml heparinized tubes. Plasma was recovered after centrifugation and stored at  $-20^\circ\text{C}$  until analysis. Plasma concentrations of inogatran were determined using reversed-phase liquid chromatography (LC) and positive electrospray ionization mass spectrometry. For quantification, an analogue to inogatran was used as internal standard. Inogatran was isolated from plasma (500  $\mu\text{l}$ ) by solid-phase extraction on octylsilica. LC separation was made on an ODS column using an acetonitrile/ammonium acetate/formic acid mobile phase. Inogatran and the internal standard were monitored by selected ion monitoring at  $m/z$  439.2 and 453.2, respectively. The method was linear over the range  $0.02\text{--}13 \mu\text{mol l}^{-1}$  (500  $\mu\text{l}$  plasma sample), with a lower limit of quantification of  $0.10 \mu\text{mol l}^{-1}$  in study A and  $0.02 \mu\text{mol l}^{-1}$  in studies B–G. The coefficient of variation ( $n=6$ ) of daily plasma standards in study G, in which samples were analysed on 41 occasions, was 1.5–14.2% (mean 6.5%) at  $0.02 \mu\text{mol l}^{-1}$  and 0.5–5.6% (mean 1.5%) at  $6.8 \mu\text{mol l}^{-1}$ .

### Activated partial thromboplastin time

Blood samples were drawn in citrated tubes and plasma was separated. Activated partial thromboplastin time (APTT) was measured according to the standard method of the local laboratory. All samples from studies A–E were analysed by the same laboratory using the reagent PTT-Automate 10<sup>TM</sup> (Diagnostica Stago). The normal reference range of this laboratory was 30–42 s. In study F three additional laboratories were used with reference ranges of 23–34 s, 24–35 s, and 30–42 s, respectively. In study G, APTT was determined locally at 61 different centres. Lower reference values (RefLow) varied between 18 and 30 s (median 25 s) and upper reference values (RefUpp) were between 30 and 46 s (median 36 s) in these centres. The width of the reference intervals (RefWidth) varied between 6 and 20 s (median 12 s) and the midpoint (RefMid) between 26 and 38 s (median 31 s) for the different laboratories.

### Pharmacodynamic modelling

#### Methodology and software

The population approach was applied for the pharmacodynamic modelling, using mixed effects models as implemented in the software package NONMEM (version V) [27]. The first-order (FO) method was used for estimation of mean and variability parameters. The postprocessor Xpose (version 2.0) [28] was used for model diagnostic purposes and for exploration of covariate relationships.

### Baseline APTT

Prior to modelling of the drug effect, the observed baseline APTT values were characterized in order to quantify the variability between centres, between studies within centres, between individuals, and within individuals when no inogatran is present. A linear mixed effects model with four levels of variability was applied to all APTT measured immediately before drug administration for this purpose (studies A-G). In addition, the baseline values from all healthy volunteers and from patients ( $n=138$ ) at the three centres using corresponding APTT methodology (reference midpoint 36 s) were compared.

### APTT after inogatran administration

To describe the effect of inogatran nonlinear mixed effects models were used. Different pharmacodynamic models were first fitted to absolute APTT values and inogatran plasma concentration data, pooled from the studies in healthy volunteers (studies A-E). The following structural models were compared ( $C$ =inogatran concentration):

$$\text{Model 1: APTT} = \theta_1 + \theta_2 \cdot \log(C + 1)$$

$$\text{Model 2: APTT} = \theta_1 + \theta_2 \cdot C^{\theta_3}$$

$$\text{Model 3: APTT} = \theta_1 + \theta_2 \cdot C / (\theta_3 + C)$$

$$\text{Model 4: APTT} = \theta_1 + \theta_2 \cdot C^{\theta_4} / (\theta_3^{\theta_4} + C^{\theta_4})$$

$$\text{Model 5: APTT} = \theta_1 + \theta_2 \cdot C + \theta_3 \cdot C / (\theta_4 + C).$$

The fixed effects (population mean) parameters ( $\theta:s$ ) and the random effects parameters ( $\omega^2:s$  and  $\sigma^2$ ) were estimated, where  $\omega^2$  is the variance of the individual deviations ( $\eta:s$ ) from the population mean parameters (interindividual variability) and  $\sigma^2$  is the variance of the deviations from the model predicted APTT values (residual error,  $\varepsilon$ ). Proportional and additive + proportional error models were tested. Interoccasion variability was modelled by the method proposed by Karlsson & Sheiner [29]. The models were compared according to goodness of fit plots and objective function values (OFV), which is approximately minus twice the logarithm of the maximum likelihood of the data [27]. The difference in objective function value ( $\Delta\text{OFV}$ ) between two hierarchical models is approximately  $\chi^2$ -distributed with  $n$  degrees of freedom, where  $n$  is the difference in the number of parameters between the two models. For example, a  $\Delta\text{OFV}$  of 3.84 is significant at the 5% level, and 10.83 at the 0.1% level, for one degree of freedom.

The best model was selected for subsequent analysis of pooled patient data (studies F-G). The influence of covariates was then evaluated on these data, with the exception of concomitant aspirin medication that was studied in healthy volunteers only (study D). The covariates investigated in the patients were diagnosis, gender, age, weight, smoking habits, presence of hypertension, diabetes and cardiac failure, clinical outcome

day 30, and centre-specific reference values for the APTT method (RefLow, RefUpp, RefMid and RefWidth), see Table 2 for details. Missing covariates were set to the study median (continuous covariate) or mode (categorical covariate).

The covariate analysis was performed in three steps.

1. Individual Bayesian estimates of the pharmacodynamic parameters were generated in NONMEM using the model without covariates. The individual parameter estimates were plotted against each covariate and potentially important covariates were identified using a generalized additive modelling procedure (GAM), proposed by Mandema *et al.* [30]. The GAM procedure was incorporated in Xpose and explores linear and nonlinear relationships [28].

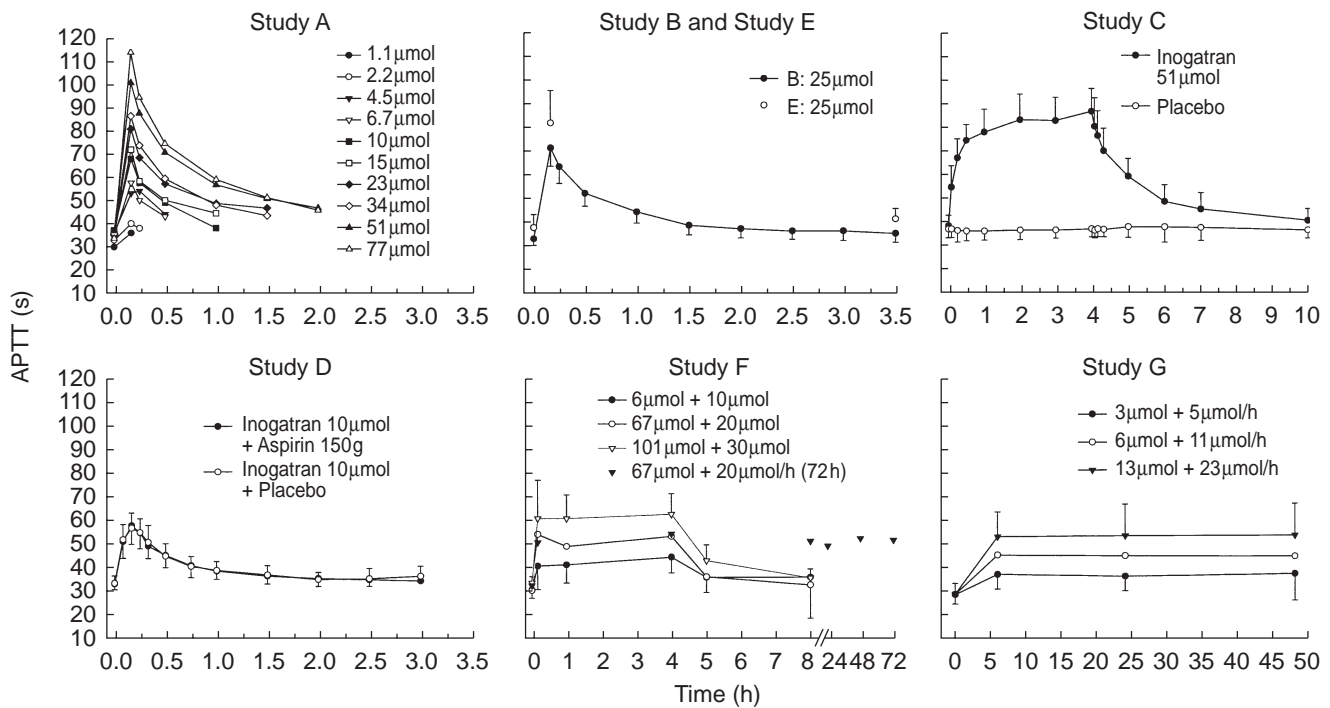
2. All covariates selected by the GAM, and other covariates that were considered of interest, were then formally tested in a stepwise covariate analysis by NONMEM. Each covariate was included in the model, one at a time, assuming no covariance between the individual parameters ( $\eta:s$ ). The covariate causing the largest reduction in OFV was kept in the population model. This procedure was then repeated until all statistically significant covariates have been included. The significance level during this model building phase was set to 0.05. Individual parameters ( $\eta:s$ ) were then allowed to covary in the full model.

3. One covariate at a time was then deleted from the full model and the covariate causing the least increase in OFV was removed from the model, provided that the significance level was not less than 0.001. This procedure was repeated until the final model was reached, containing only those covariates that caused an improvement of the model at the significance level of 0.001.

## Results

### Baseline APTT

The overall population mean (s.e. mean) of the observed baseline APTT was 29.2 (0.01) s, but large differences were observed across individuals. In healthy volunteers the mean (95% C.I.) baseline value was 35.2 (34.3, 36.1) s, while in patients from matching study centres it was 31.1 (30.4, 31.7) s. The repeated observations after placebo infusion demonstrated that the APTT level was stable over time (Figure 1, study C). The major source of overall variability was attributed to interindividual differences (s.d. 3.6 s) and the variability between studies (within centre) contributed to less than one tenth (on the variance scale) of the total variability in APTT when no inogatran is present (Table 3). Intercentre variability was also significant, but less than the interindividual variability.



**Figure 1** Mean ( $\pm$ s.d. where applicable) APTT vs time curves. The doses are expressed for a 70 kg person when dosed per kg.

**Table 3** Variability estimates for baseline APTT

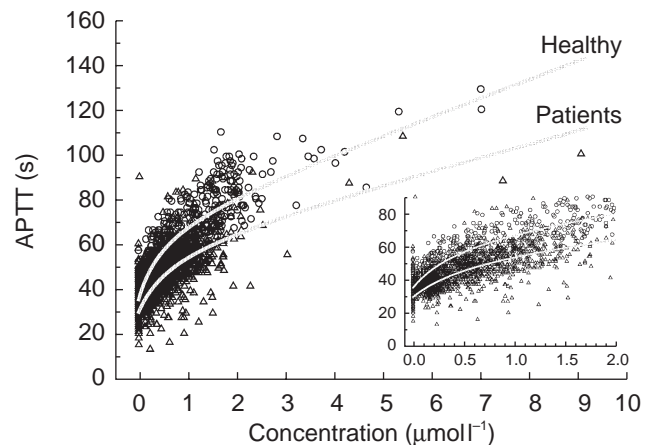
Variability component	Standard deviation ( $\sigma$ )	Standard error (s.e. $\sigma$ )	Significance level <sup>1</sup> (P)
Intercentre	1.8 s	0.27 s	<0.0005
Interstudy	1.3 s	0.34 s	<0.005
Interindividual	3.6 s	0.16 s	<0.0005
Interoccasion + residual	1.4 s	0.01 s	N.A.

<sup>1</sup> Based on increase in OFV when the variability component was fixed to zero.

### APTT after inogatran administration

For each study, the mean APTT values vs time after start of infusion are presented in Figure 1. The highest observed APTT was 129 s in the healthy subjects and 108 s in the patients, obtained after 10 min i.v. infusion of 83  $\mu\text{mol}$  and a steady state infusion of 11.4  $\mu\text{mol h}^{-1}$ , respectively. The APTT was close to baseline 6 h after cessation of the infusion. The response was not affected by concomitant administration of aspirin (study D).

The prolongation of APTT increased in a nonlinear manner with increasing inogatran concentration (Figure 2). Individual plots of the increasing and decreasing phases of the APTT vs plasma concentration curves showed no signs of hysteresis. The pooled data from healthy volunteers was best described by the combined linear and  $E_{\text{max}}$  model (model 5) with residual error proportional



**Figure 2** Combined linear and  $E_{\text{max}}$  models (solid lines), fitted to pooled data from healthy volunteers (circles) and patients with coronary arterial disease (triangles). Models without covariates.

to the predicted APTT. Interindividual variability components ( $\eta$ :s) were significant for APTT<sub>baseline</sub> and  $E_{\text{max}}$  only, and these were highly correlated. This implies that a subject with a high baseline APTT is prone to have a higher degree of response to inogatran, compared to a subject with a low baseline value. All mean and variability parameter estimates are given in Table 4.

The combined linear and  $E_{\text{max}}$  model provided a good fit to the patient data too, although the structural parameters differed somewhat from those obtained in the healthy subjects. Interindividual variability parameters ( $\omega$ :s) were similar for the two populations, but the residual

variability ( $\sigma$ ) was higher for the patient data compared to the data from healthy subjects. The forward inclusion of covariates resulted in a full model in which  $APTT_{\text{baseline}}$  was influenced by age and the APTT method, the lower reference value (RefLow) being the most explanatory covariate.  $E_{\text{max}}$  was also correlated to the RefLow as well as to the diagnosis. Age and diagnosis were, however, of

borderline statistical significance ( $P=0.004$  and  $P=0.010$ , respectively) according to the backward retention criterion and were therefore excluded from the final model, see Table 4.

Patients thus have lower baseline APTT and seem to have less pronounced effect of inogatran than healthy subjects when the reference range of the APTT method is

**Table 4** Parameter estimates (s.e. estimate) and objective function values for the pharmacodynamic model<sup>a</sup>

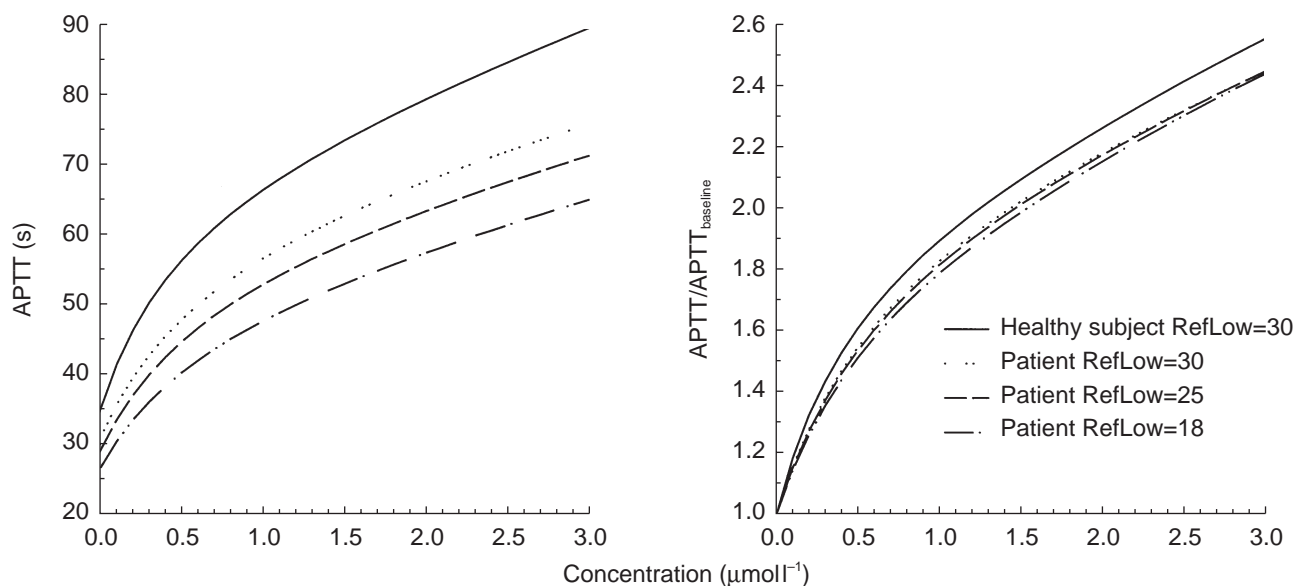
Parameter	Healthy volunteers	Patients – no covariates	Patients – full model	Patients – final model
<i>Structural model parameters (<math>\theta : s</math>)</i>				
$APTT_{\text{baseline}}$ ( $\theta_1$ )	35.1 (0.5)	29.5 (0.1)	29.2 <sup>b</sup> (0.1)	29.2 <sup>b</sup> (0.1)
RefLow on $APTT_{\text{baseline}}$ ( $\theta_5$ )	–	–	0.36 <sup>b</sup> (0.06)	0.36 <sup>b</sup> (0.06)
Age on $APTT_{\text{baseline}}$ ( $\theta_6$ )	–	–	–0.039 <sup>b</sup> (0.019)	–
SLOPE ( $\theta_2$ )	8.0 (0.6)	5.8 (1.4)	5.6 (1.4)	5.8 (1.4)
$E_{\text{max}}$ ( $\theta_3$ )	36 (2)	31 (5)	32 <sup>c</sup> (5)	31 <sup>c</sup> (5)
RefLow on $E_{\text{max}}$ ( $\theta_7$ )	–	–	0.70 <sup>c</sup> (0.23)	0.67 <sup>c</sup> (0.22)
Diagnosis on $E_{\text{max}}$ ( $\theta_8$ )	–	–	–2.8 <sup>c</sup> (1.2)	–
$EC_{50}$ ( $\theta_4$ )	0.54 (0.06)	0.72 (0.12)	0.74 (0.11)	0.72 (0.12)
<i>Interindividual variability parameters (<math>\omega : s</math>)</i>				
$APTT_{\text{baseline}}$ (%)	10 (2)	12 (2)	11 (2)	11 (2)
$E_{\text{max}}$ (%)	20 (4)	29 (8)	28 (8)	28 (8)
Correlation between $APTT_{\text{baseline}}$ and $E_{\text{max}}$ ( $\tau$ )	1.00 (17%) <sup>d</sup>	0.43 (39%) <sup>d</sup>	0.37 (49%) <sup>d</sup>	0.37 (49%) <sup>d</sup>
<i>Interoccasion variability parameter (<math>\pi</math>)</i>				
$APTT_{\text{baseline}}$ (%)	4.5 (1.1)	N.A.	N.A.	N.A.
<i>Residual error parameter (<math>\sigma</math>)</i>				
Coefficient of variation (%)	5.0 (1.0)	8.9 (0.9)	8.8 (0.9)	8.8 (0.9)
Objective function value	3371	9298	9222	9237

<sup>a</sup>  $APTT = APTT_{\text{baseline}} + SLOPE \cdot C + E_{\text{max}} \cdot C / (EC_{50} + C)$ , where  $C$  is the concentration in  $\mu\text{mol l}^{-1}$  and APTT is in s.

<sup>b</sup>  $APTT_{\text{baseline}} = \theta_1 + \theta_5 (\text{RefLow} - 25) - \theta_6 (\text{Age} - 66)$ , where 25 is the median of the lower limit of the reference range for the APTT method and 66 is the median age.

<sup>c</sup>  $E_{\text{max}} = \theta_3 + \theta_7 (\text{RefLow} - 25) + \theta_8 \text{Diagnosis}$ , where 0 = Angina pectoris and 1 = Non-Q-wave myocardial infarction.

<sup>d</sup> Relative s.e. of  $\text{COV}(APTT_{\text{baseline}}, E_{\text{max}})$



**Figure 3** Model predicted APTT (left panel) and APTT-ratio (right panel) vs inogatran plasma concentration in a typical patient and healthy subject at varying lower limits of the reference range (RefLow).

not taken into account (Figure 2, Table 4). The influence of the lower reference value of the assay method is illustrated in Figure 3 (left panel), where the model predicted APTT values for patients have been calculated at varying RefLow values. When comparing the curves at a RefLow of 30 s, the value for the phase I centre, a difference between patients and healthy volunteers is still indicated. The method-corrected model parameters were (mean (s.e. mean)):  $APTT_{\text{baseline}}$  35 (0.5) and 31 (0.3) s, slope 8.0 (0.6) and 5.8 (1.4)  $\text{s l } \mu\text{mol}^{-1}$ ,  $E_{\text{max}}$  36 (2.4) and 34 (5.1) s, and  $EC_{50}$  0.54 (0.06) and 0.72 (0.12)  $\mu\text{mol l}^{-1}$  for healthy subjects and patients, respectively. By taking the ratio between APTT and  $APTT_{\text{baseline}}$  the method-dependency is essentially eliminated in the expected therapeutic range and the difference between patients and healthy subjects is considerably less, see Figure 3 (right panel). For example, the concentration that is needed to increase the APTT to twice the baseline value in a typical patient is 1.55  $\mu\text{mol l}^{-1}$  at a RefLow of 18 s and 1.45  $\mu\text{mol l}^{-1}$  at a RefLow of 30 s. In comparison, the model predicts that the corresponding concentration is 1.25  $\mu\text{mol l}^{-1}$  at RefLow 30 s in the typical healthy subject.

## Discussion

The relationship between the degree of anticoagulation, APTT, the plasma concentration of the direct thrombin inhibitor inogatran was investigated in a large number of healthy volunteers and patients with coronary artery disease. The pharmacodynamic response after administration of heparins and other thrombin inhibitors has previously been described in the literature, mostly by linear models between APTT (or APTT-ratio) and drug levels (untransformed or after logarithmic transformations) [7, 17, 31–34]. Polynomial [35], exponential [36] and parabolic [37, 38] models have also been applied. We found that the nonlinear APTT response after inogatran was best described by a combined linear and  $E_{\text{max}}$  model, allowing predictions in the concentration range from zero (baseline APTT) to 9  $\mu\text{mol l}^{-1}$ . These *ex vivo* results are similar to previously reported *in vitro* data, which followed the same curvilinear shape with no maximum attained when inogatran was added to human plasma [2].

The analysis of the observed baseline APTT demonstrated that the variability between studies and study centres were small, compared with the individual variability, which justifies pooling of data from different studies and centres in the population pharmacodynamic modelling. The reason for the significant variability between studies performed at the same study centre on the same population (young healthy subjects) is not evident, but could be due to batch-to-batch variations not being fully compensated for. The variability between

centres can be explained by methodological differences in the APTT method, as reflected by the diverse normal reference ranges reported. Information from the reference range was therefore included in the model of the drug effect. Of the characteristics tested, the lower reference value (RefLow) was the most significant covariate, influencing the pharmacodynamic parameters  $APTT_{\text{baseline}}$  and  $E_{\text{max}}$ . RefUpp and RefMid also had some influence on both parameters, while RefWidth did not affect any of them. It might have been expected that the RefWidth should reflect the sensitivity of the reagent used and therefore influence the degree of response to inogatran. However, since the criteria for defining the reference range varies between laboratories, the RefWidth will be influenced by several factors in addition to the assay sensitivity, e.g. the number of normal plasma samples and the variability between individuals selected for assessment of the APTT reference range. Nevertheless, this range contains some quantitative information about the sensitivity of the method, which can be accounted for by the lower reference value when predicting the APTT response. As long as the APTT method is not standardized, the normal reference range is a convenient characteristic since it can easily be obtained from accredited laboratories. Another means of compensating for the methodological differences could be to take the ratio between APTT and baseline APTT, where the latter is either the patient's pretreatment value or an average value from pooled normal plasma. This approach is sometimes used in clinical practice when monitoring heparin treatment. When modelling a pharmacodynamic response, however, it is generally most appropriate to include the baseline value as a parameter to be estimated in the model [39], since the baseline measurement is afflicted with random error. This study shows that most of the disparities in APTT-result obtained from different laboratories, for a typical inogatran patient, were eliminated by taking the APTT-ratio ( $APTT/APTT_{\text{baseline}}$ ). Other studies have, however, shown that quite different ratios are obtained with varying reagents for heparin and hirudin [11, 13, 17, 40, 41]. More importantly, it has to our knowledge not been shown whether the APTT-ratio or the absolute APTT value is the clinically most relevant marker for anticoagulation, i.e. whether two patients with different absolute APTT, but the same ratio ( $APTT/APTT_{\text{baseline}}$ ), are at comparable anticoagulation, or if the patient with the higher absolute APTT value is at higher risk, for example haemorrhage, everything else being equal. Which of the variables absolute APTT, absolute increase, or relative increase ( $APTT/APTT_{\text{baseline}}$ ), is the best predictor for the clinical outcome after thrombin inhibition remains to be shown.

Differences in baseline APTT and response to inogatran between healthy volunteers and patients were observed.

A formal test of a true difference could, however, not be performed due to imbalance in the dataset, where all data from healthy volunteers originated from one centre, whose reference interval was in the upper region. To be able to discern the patient factor from the other variability sources, by simultaneously fitting a mixed effects model to pooled healthy and patient data, five levels of random effects (study, centre, individual, occasion and residual variability) would ideally have been required. Such a model is not possible to implement within NONMEM. The results from the subanalysis of data from centres with matching reference values do, however, support the finding of different APTT values between the two study populations. Furthermore, it seems plausible that patients with acute thrombosis have lower APTT values than healthy subjects, since they are in a hypercoagulable state. Similar results have been reported where patients with thrombosis responded with lower APTT prolongation to heparin treatment, compared to when the drug was added *in vitro* to plasma from healthy subjects [14, 18, 42] and in a pure *in vitro* comparison between spiked plasma from patients and normal subjects the patient plasma was less sensitive to heparin [43]. Another contributing factor to the difference in APTT between patients and healthy subjects, observed in our study, could be that the patients were older, since a small age effect on the baseline value was indicated in the patient material ( $-2$  s in the interval 32–81 years,  $P=0.004$ ). Gender, weight, smoking habits, hypertension, cardiac failure or diabetes had no influence on the baseline APTT or APTT response after inogatran, and no relationships between any of the pharmacodynamic parameters and the clinical outcome were seen.

The population approach is commonly applied to data collected from clinical trials in the late phases of drug development, typically large multicentre studies. Method-dependency can then be a complicating factor, which could introduce bias in the parameter estimates and create false covariate–parameter relationships, if overlooked. Clinical pharmacological observations from different sources using different methods can only be compared if method–effect interaction can be excluded. In a recent review of more than 200 clinical pharmacological publications on blood pressure, the authors found that the data were not reported with adequate methodological specification, although there are well-known method-dependencies in that field [44]. In the current study, methodological differences were accounted for by including a characteristic of the normal reference range as a covariate in the model, affecting both the baseline value and the degree of the response. This approach might be used in other areas as well when a method–interaction is present and data from several studies and/or study centres are to be combined in a population model.

In conclusion, the nonlinear relationship between APTT and inogatran concentration in plasma could be well described by a combined linear and  $E_{\max}$  model. Pooling of data was made possible by incorporating a centre-specific characteristic of the assay method in the model. Patients had lower baseline APTT and appeared to have less pronounced effect of inogatran on APTT than healthy subjects. This difference could be due to the higher age of the patients or to them being in a hypercoagulable state.

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