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Integrated modelling of factor VIII activity kinetics, occurrence of bleeds and individual characteristics in haemophilia A patients using a full random effects modelling (FREM) approach

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Haemophilia A

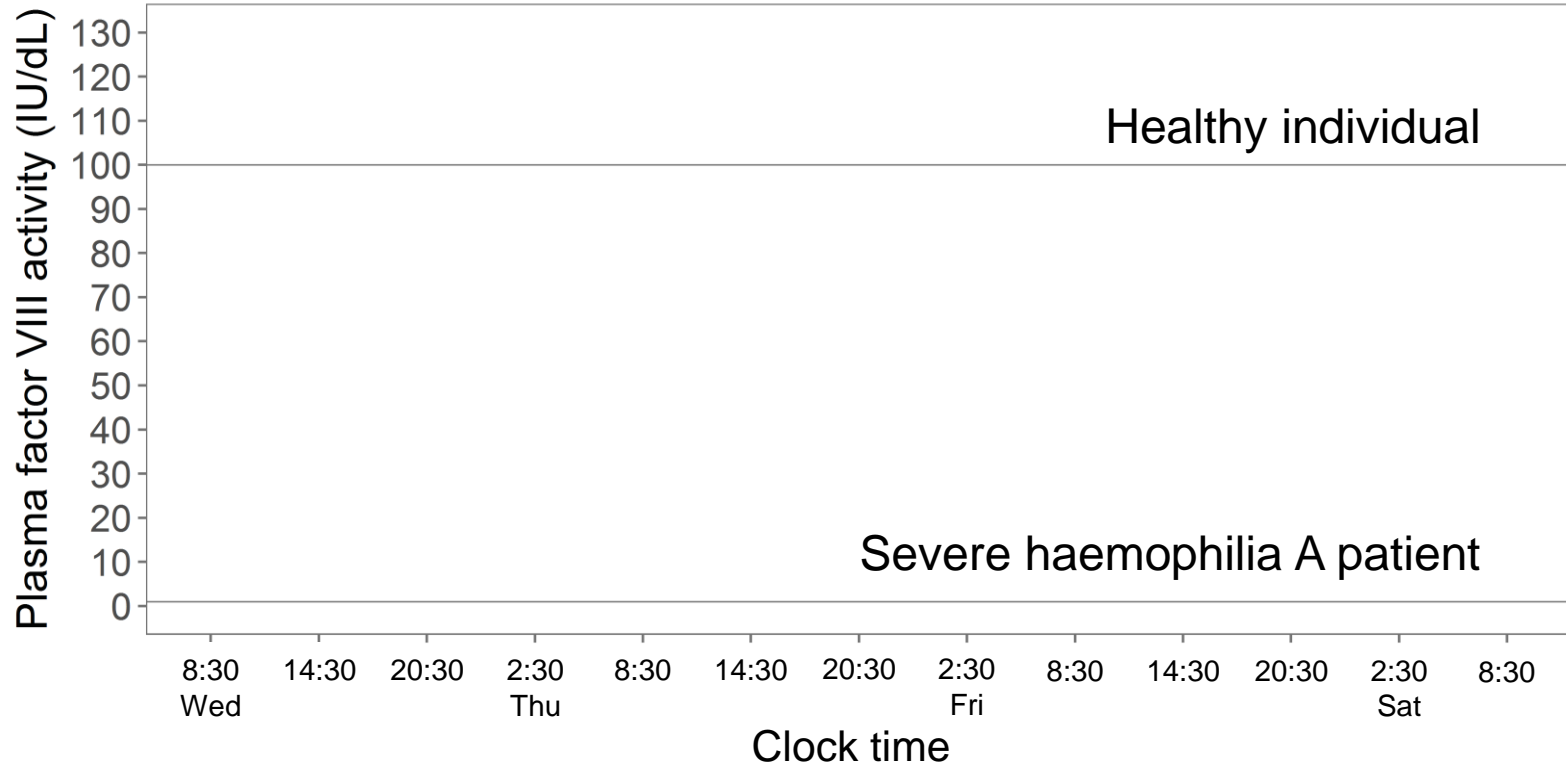
- Congenital X-linked bleeding disorder
- Deficiency of **coagulation factor VIII (FVIII)**
- Characteristic phenotype: bleeding events

Severity ^[1]	Endogenous FVIII activity (IU/dL or % normal)	Bleeding events
Severe	< 1	Spontaneous bleeding
Moderate	1 – 5	Occasional spontaneous bleeding
Mild	5 – 40	Severe bleeding with major trauma



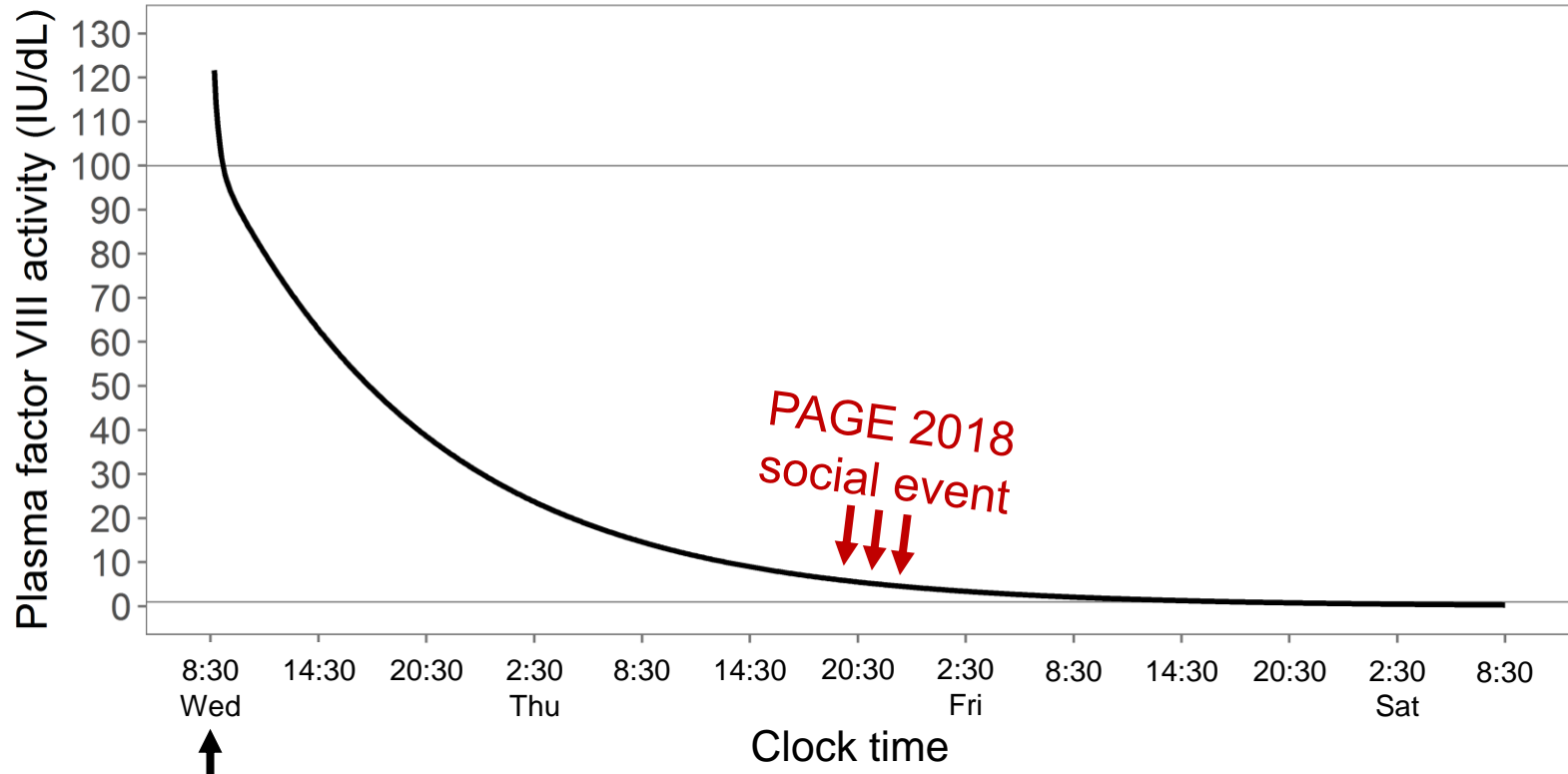


Haemophilia A





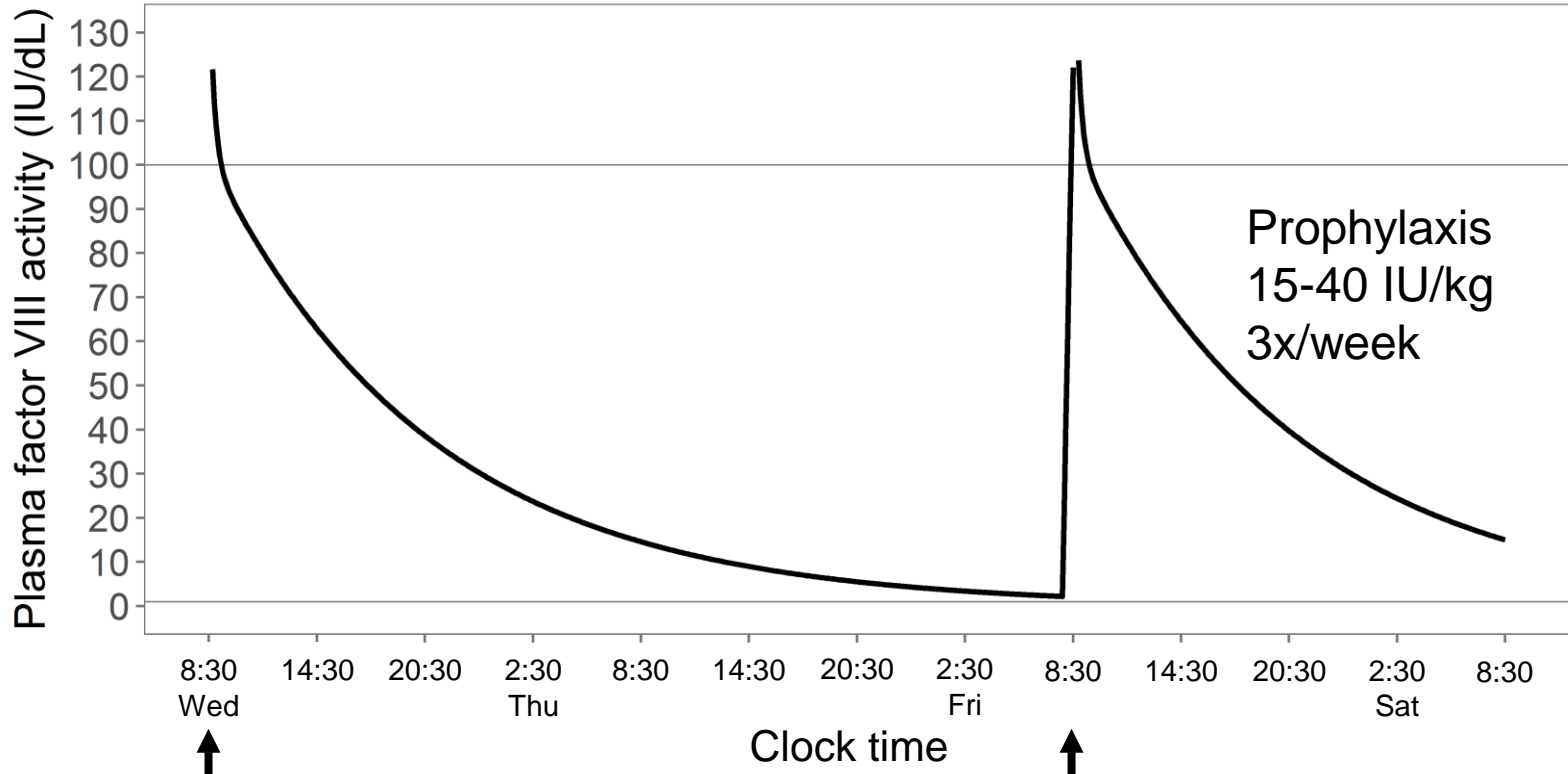
Haemophilia A





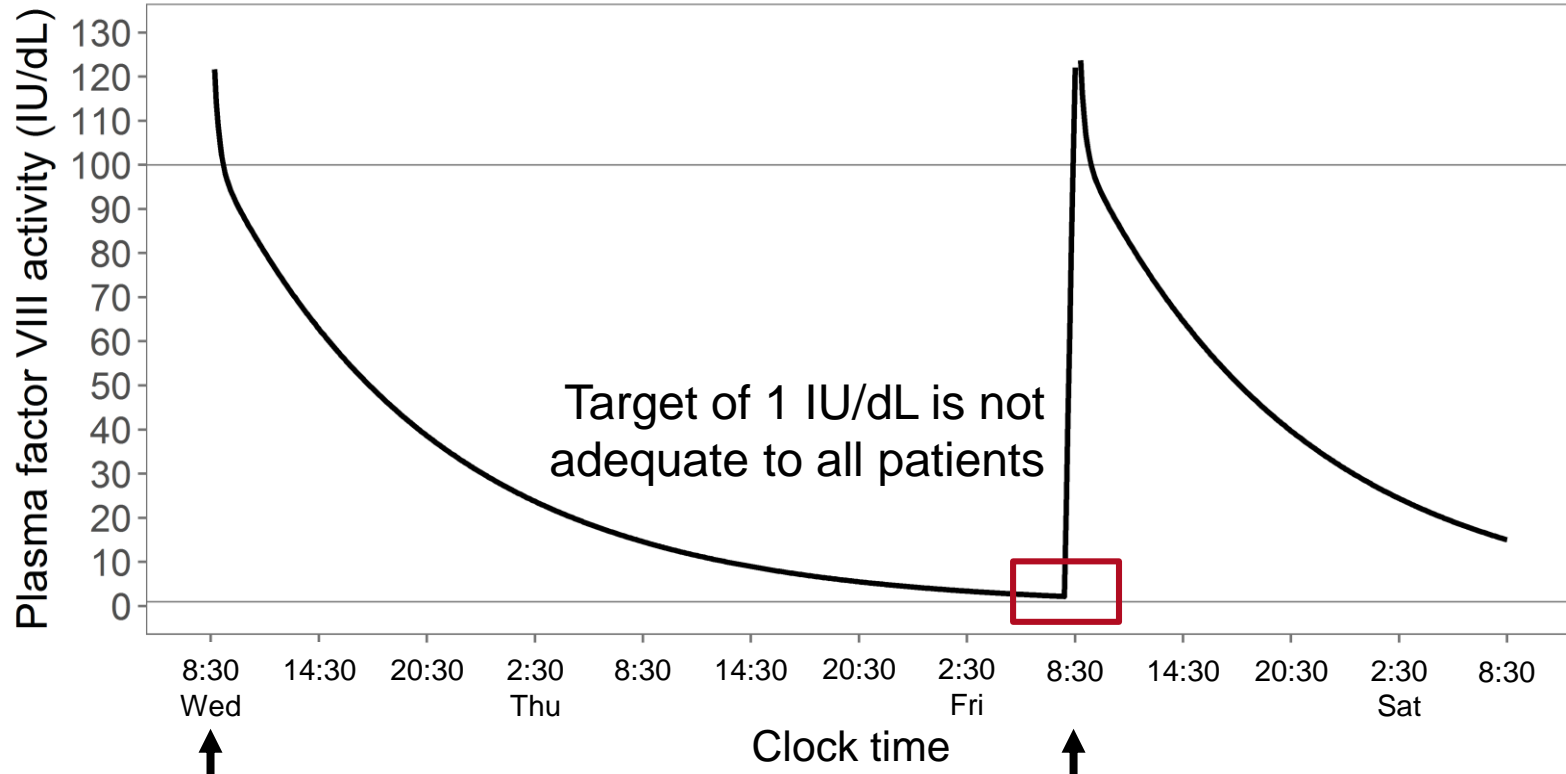
Today 8:30

Haemophilia A





Haemophilia A





Haemophilia A

Major economic burden

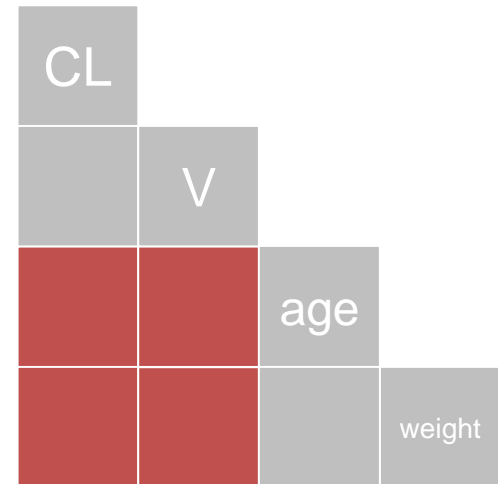
- Cost of €200 000/year across the five most populated EU countries^[1]
 - 34-87 times higher than the mean per capita health expenditure

Full random effect modelling (FREM)

- Single-step simultaneous covariate model building technique ^[1,2]
- Covariates treated as observations and their distributions modelled as random effects

$$\mathbf{COV} = \boldsymbol{\theta}_{\text{cov}} + \boldsymbol{\eta}_{\text{cov}}$$

Covariance matrix



[1] Karlsson MO. PAGE 21 (2012) Abstr 2455 [www.page-meeting.org/?abstract=2455]

[2] Yngman et al. PAGE 26 (2017) Abstr 7365 [www.page-meeting.org/?abstract=7365]



Aim

Develop an integrated pharmacometric model

Plasma FVIII
activity

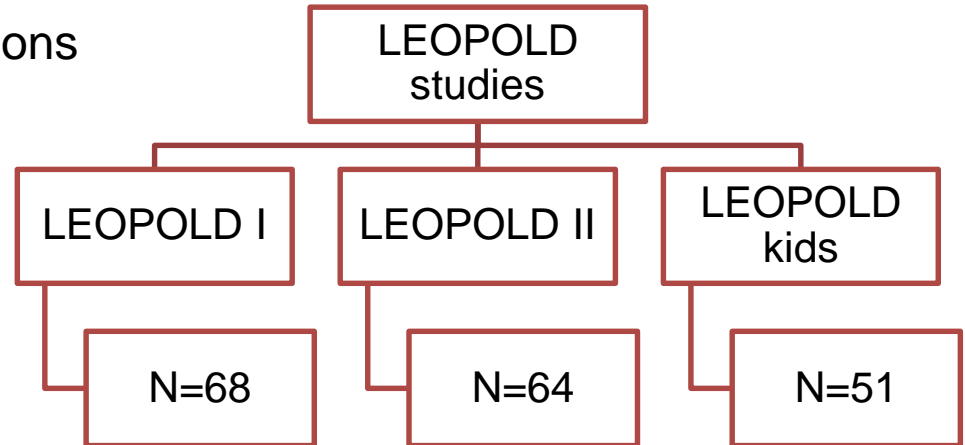
Bleeds

Patient
characteristics

Study
characteristics

LEOPOLD clinical trials^[1-3]

- Evaluated PK, efficacy and safety of BAY 81-8973 (octocog alfa, Kovaltry®)
 - 183 severe haemophilia A patients
 - 1535 FVIII activity observations
 - 633 bleeds



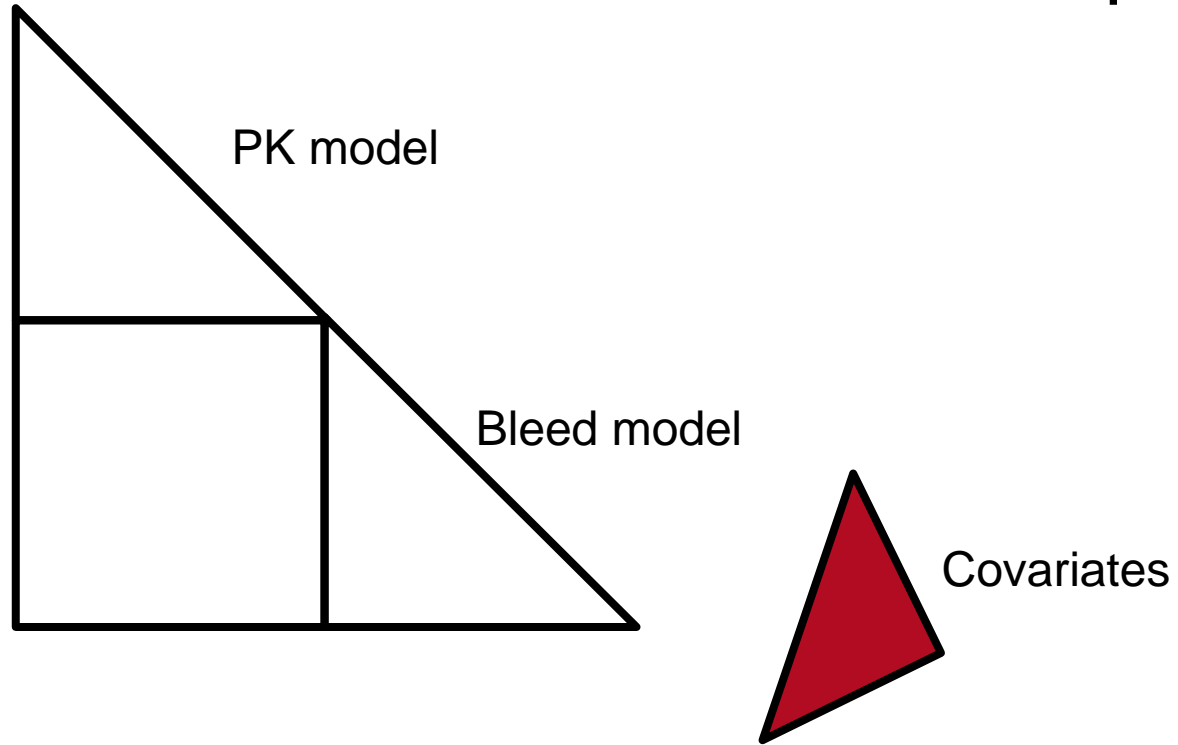
LEOPOLD: Long-Term Efficacy Open-Label Program in Severe Hemophilia A Disease

[1] Saxena K, et al. Haemophilia. 2016;22(5):706-12.

[2] Kavakli K, et al. J Thromb Haemost. 2015;13(3):360-9.

[3] Ljung R, et al. Haemophilia. 2016;22(3):354-60.

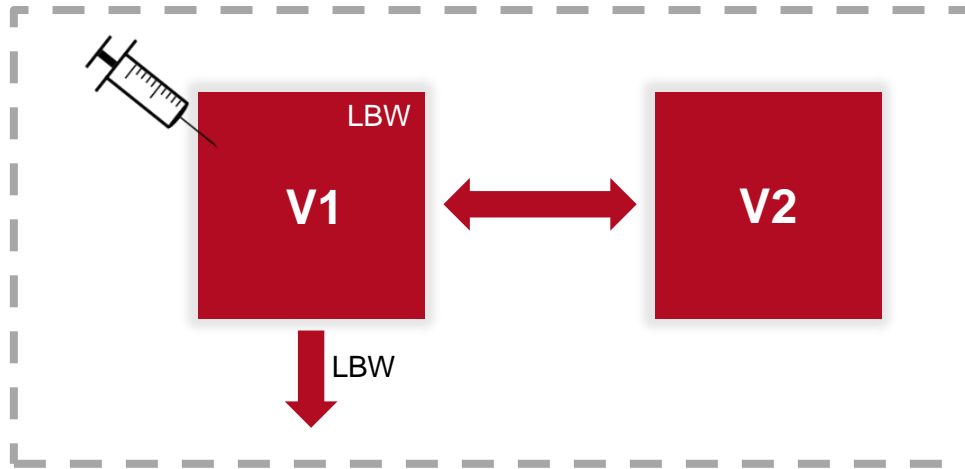
Model development



NONMEM 7.3 using LAPLACE/IMP+IMP methods, assisted by PsN



PK model



$$CL \text{ (dL/h)} = 1.88 \times \left(\frac{LBW}{51.1}\right)^{0.61}$$

$$V1 \text{ (dL)} = 30.0 \times \left(\frac{LBW}{51.1}\right)^{0.95}$$

$$Q \text{ (dL/h)} = 1.90$$

$$V2 \text{ (dL)} = 6.36$$

$$IIV_{CL} = 29.7 \% CV$$

$$IIV_{V1} = 11.1 \% CV$$

$$IIV_{RUV} = 48 \% CV$$

$$RUV_{add} = 1.45 \text{ IU/dL}$$

$$RUV_{prop} = 21.1 \% CV$$

IIV: inter-individual variability

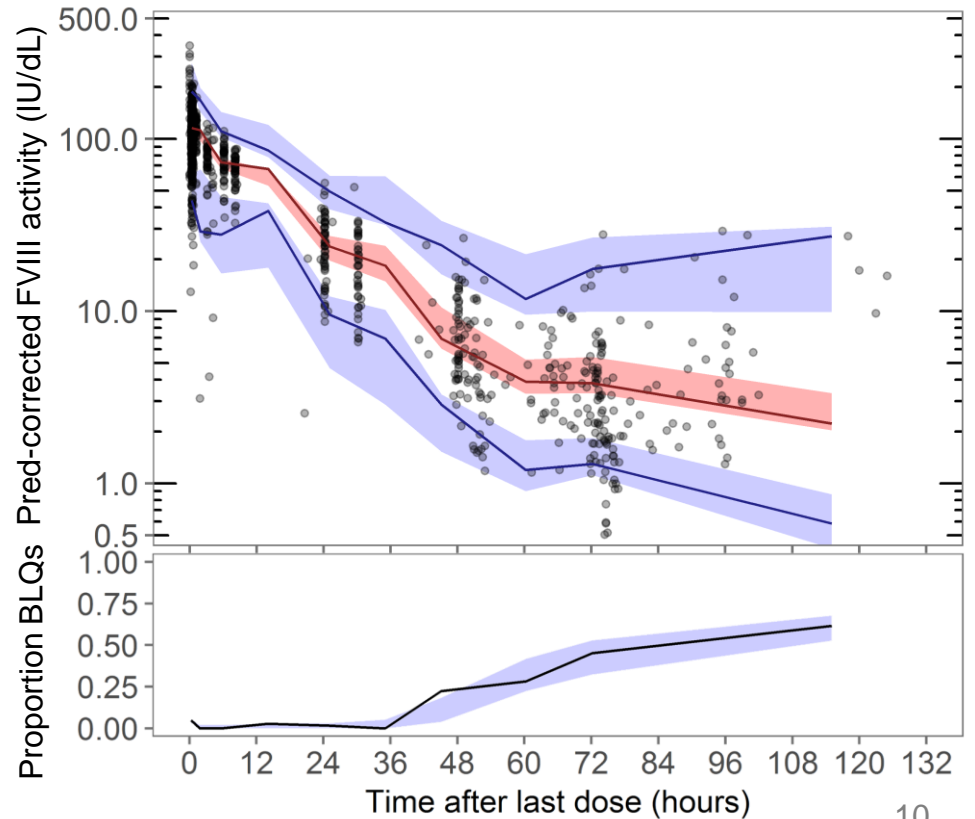
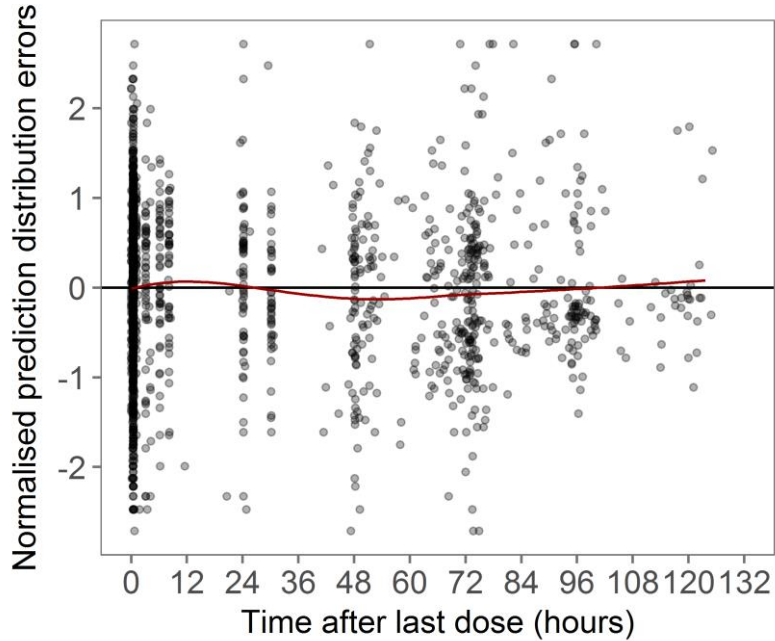
LBW: lean body weight

RUV: residual unexplained variability

Base model from Garmann *et al.* Haemophilia 2017 Jul;23(4):528-537



Model qualification: PK model





Repeated time-to-event (RTTE) model

$$h(t) = \lambda \cdot e^{\gamma \cdot (t - 1)} \cdot \left(1 - \frac{FVIII}{FVIII + IF50} \right)$$

$$\lambda_{0.5 \text{ IU/dL}} = 2.94 \text{ year}^{-1}$$

$$\lambda_{20 \text{ IU/dL}} = 1.06 \text{ year}^{-1}$$

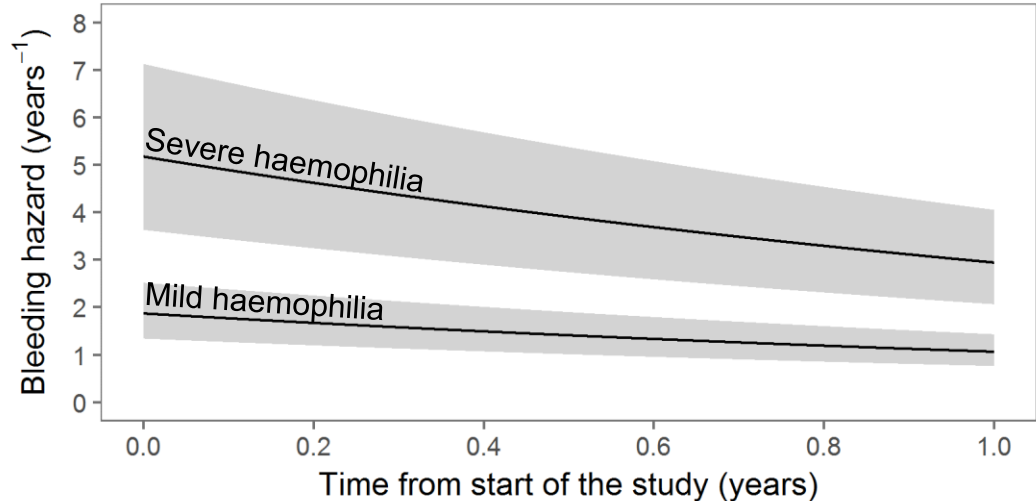
$$\gamma = -0.56 \text{ year}^{-1}$$

$$IIV_{\lambda} = 129.5 \%CV$$

Derived parameters

$$\lambda_{(0 \text{ IU/dL}, 1 \text{ year})} = 3.08 \text{ year}^{-1}$$

$$IF50 = 11 \text{ IU/dL}$$

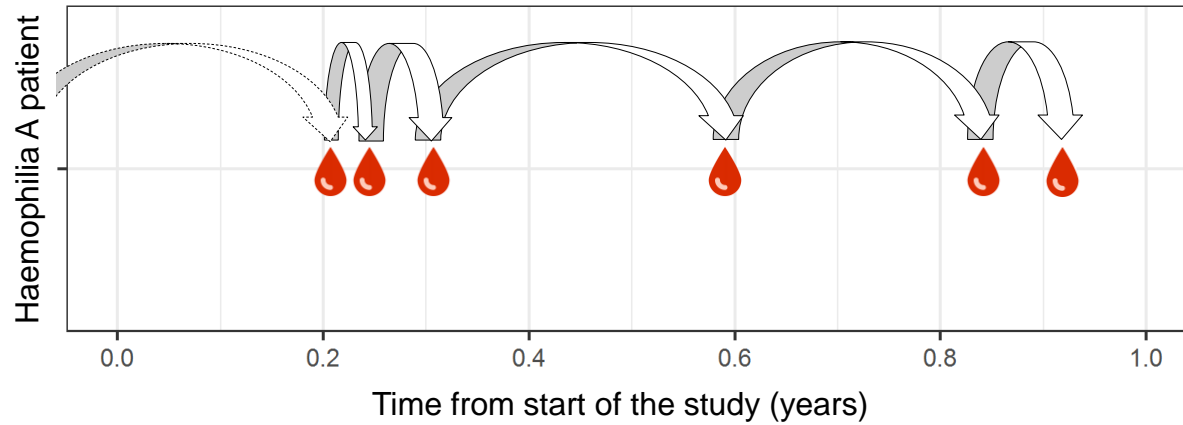


95%CI obtained using sampling importance resampling

Base model from Garmann *et al.* PAGE 24 (2015) Abstr 3683 [www.page-meeting.org/?abstract=3683]



Time-dependency between consecutive bleeds?

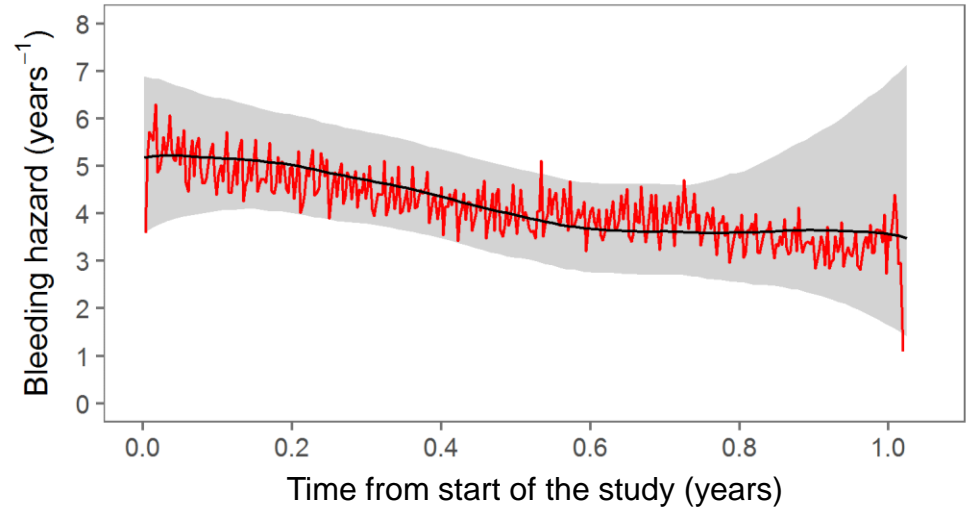
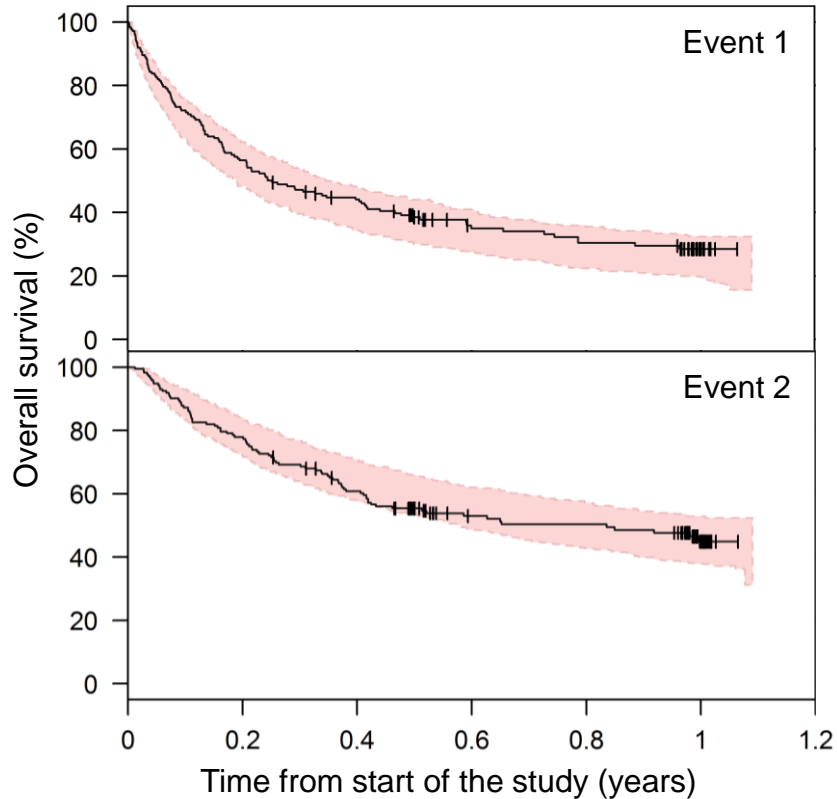


$$h(t) = \lambda \cdot e^{\gamma \cdot (t - 1)} \cdot \left(1 - \frac{FVIII}{FVIII + IF50} \right) + \lambda_{\text{markov}} \cdot e^{-\gamma_{\text{markov}} \cdot \text{TSE}}$$

At time=0, TSE derived from the mean inter-event time in the previous year



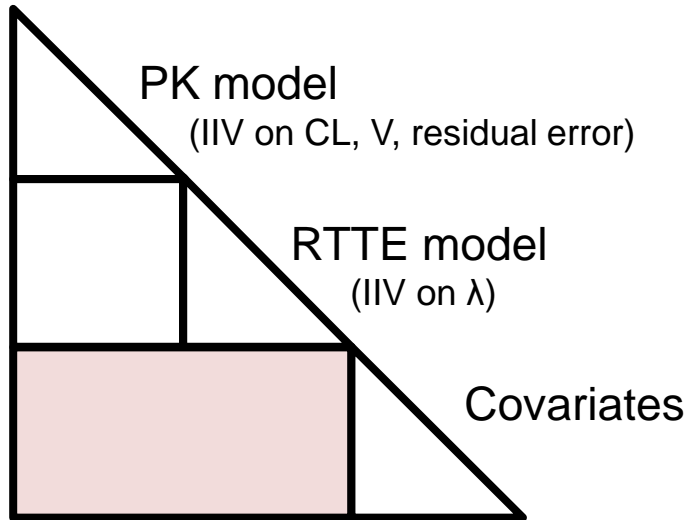
Model qualification: RTTE model



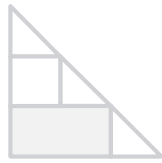
Kernel-based visual hazard comparison
Goulooze *et al.* AAPS J (2017) Nov 27;20(1):5



Covariate analysis



- Age
- Weight
- Body mass index
- Lean body weight
- Race
- Von Willebrand factor
- Number of spontaneous bleeds within 12 months pre-study
- Previous therapy history (on-demand/prophylaxis)
- Number of target joints at study start
- Study

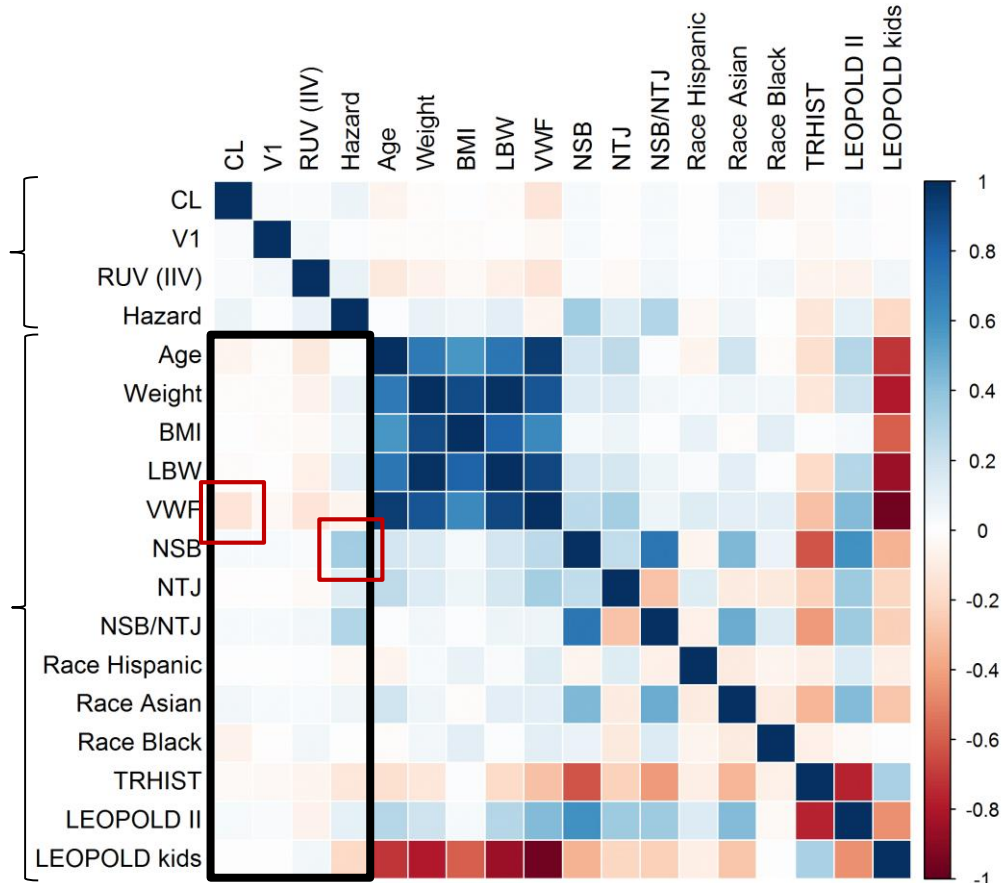


FREM: correlation matrix

Model
parameters

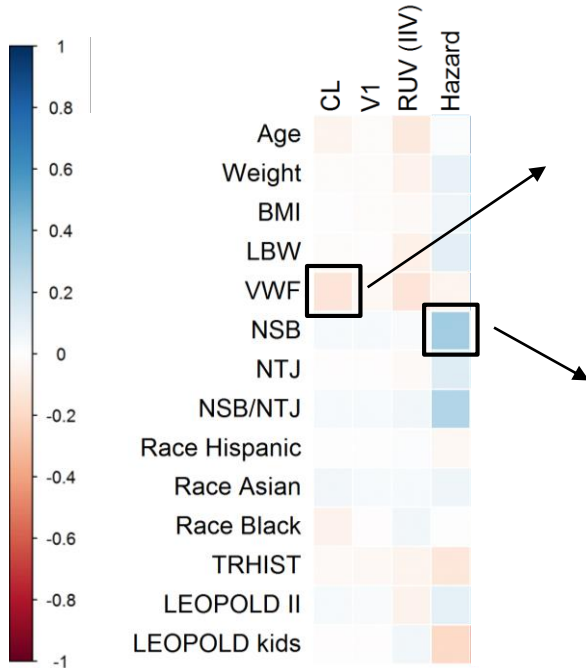
Covariates

BMI: body mass index
 CL: clearance
 LBW: lean body weight
 NSB: number of spontaneous bleeds within 12 months pre-study
 NTJ: number of target joints
 RUV: residual unexplained variability
 TRHIST: treatment history
 V1: central volume of distribution
 VWF: Von Willebrand factor





FREM: most relevant effect sizes identified

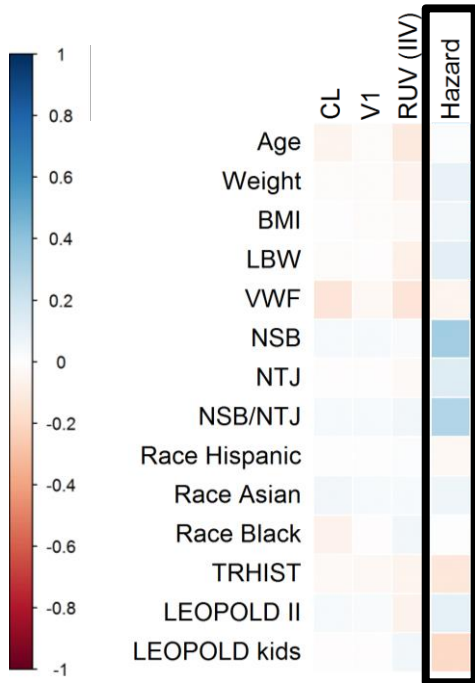


	VWF value (%)	CL (dL/h) [95%CI]	Effect size (%)
5 th percentile	64	2.00 [1.93-2.18]	+6.28
Mean	116	1.88	reference
95 th percentile	242	1.63 [1.32-1.77]	-13.5

	Number of bleeds within 12 months pre-study	Bleeding hazard (year ⁻¹) [95%CI]	Effect size (%)
5 th percentile	1	2.33 [1.99-2.69]	-24.5
Mean	21	3.08	reference
95 th percentile	84	7.64 [4.80-12.7]	+148



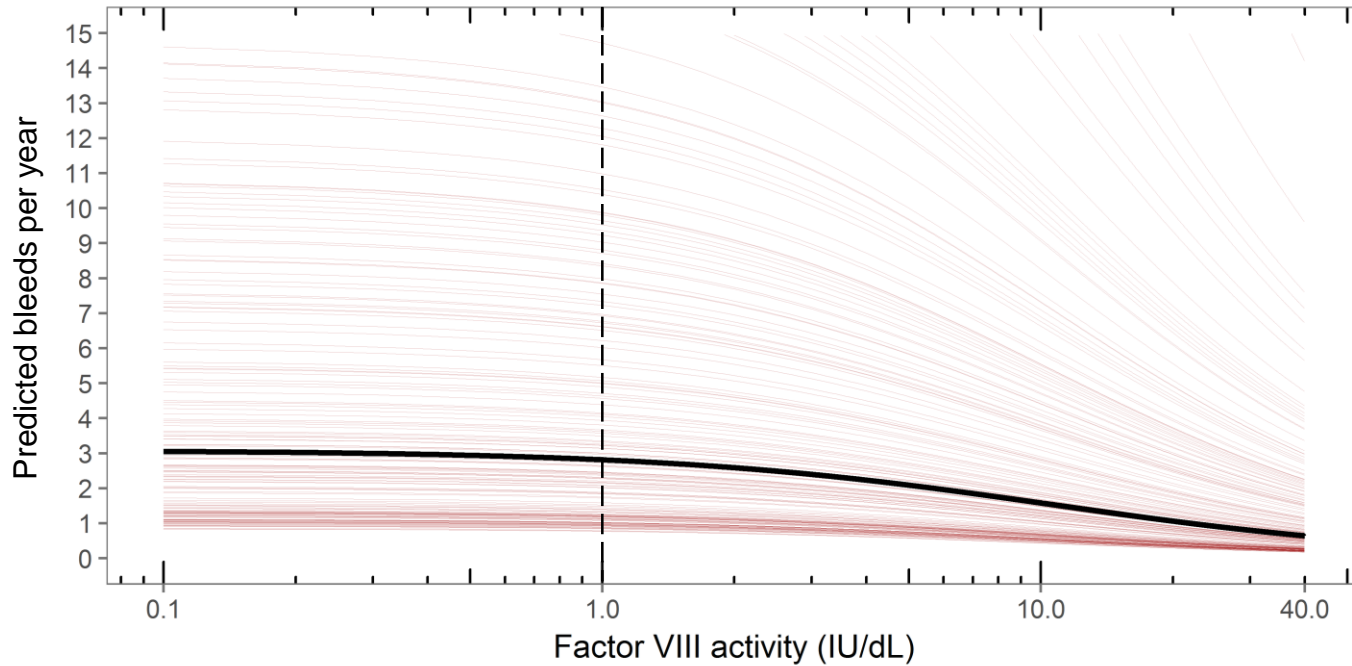
FREM: most relevant effect sizes identified



All covariates did not explain a major part of the variability on the bleeding hazard (total 132%)



High (unexplained) bleeding variability under prophylaxis





What have we learnt?

- We characterized relationship between **FVIII activity** and **occurrence of bleeds**, accounting for **all available individual and study characteristics**
- Just a few predictors of bleeding risk identified: **plasma FVIII activity** and **preceding bleeding frequency**
- Individualization of treatment based on the **underlying hazard** may be the key to a **more cost-effective prophylactic treatment** of haemophilia A patients



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