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**RESEARCH PAPER** 



### Model-based analysis of treatment effects of paclitaxel microspheres in a microscopic peritoneal carcinomatosis model in mice

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#### ABSTRACT

**Purpose** Paclitaxel (PTX)-loaded genipin-crosslinked gelatin microspheres (GP-MS) are a prolonged IP delivery system under development for the treatment of peritoneal minimal residual disease (pMRD). Here, we show the use of a pharmacokinetic-pharmacodynamic (PKPD) modelling approach to inform the formulation development of PTX-GP-MS in a mice pMRD model.

**Methods** PTX blood concentrations and survival data were obtained in Balb/c Nu mice receiving different single IP doses (7.5 and/or 35 mg/kg) of PTX-ethanolic loaded GP-MS (PTX<sub>EtOH</sub>-GP-MS), PTX-nanosuspension loaded GP-MS (PTX<sub>nano</sub>-GP-MS), and immediate release formulation Abraxane®. A population PK model was developed to characterize the PTX blood concentration pattern and to predict PTX concentrations in peritoneum. Afterwards, PKPD relationships between the predicted peritoneal or blood concentrations and survival were explored using time-to-event modelling. **Results** A PKPD model was developed that simultaneously describes the competing effects of treatment efficacy (driven by peritoneal concentration) and toxicity (driven by blood concentration) of PTX on survival. Clear survival advantages of PTX<sub>nano</sub>-GP-MS over PTX<sub>EtOH</sub>-GP-MS and Abraxane®

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were found. Simulations of different doses of  $PTX_{nano}$ -GP-MS demonstrated that drug-induced toxicity is high at doses between 20 and 35 mg/kg.

**Conclusions** The model predicts that the dose range of 7.5-15 mg/kg of  $PTX_{nano}$ -GP-MS provides an optimal balance between efficacy and safety.

**KEY WORDS** Mouse · NONMEM · Paclitaxel · Peritoneal · PKPD

#### **ABBREVIATIONS**

AIC	Akaike's information criterion
3LI	Bioluminescence imaging
CRS	Cytoreductive surgery
OBS	Dried blood spot
GOF	Goodness of fit
GP-MS	Genipin-crosslinked
	gelatin microspheres
IV	Inter-individual variability
PC	Intraperitoneal chemotherapy
LOQ	Lower limit of quantification
Nab-PTX	Paclitaxel-loaded albumin
	nanoparticles
OFV	Objective function value
ocVPCs	Prediction-corrected visual
	predictive checks
PKPD	Pharmacokinetic-pharmacodynamic
oMRD	Peritoneal minimal residual disease
РТХ	Paclitaxel
PTX-GP-MS	Paclitaxel-loaded genipin-
	crosslinked gelatin microspheres
PTX <sub>EtOH</sub> -GP-MS	Paclitaxel-ethanolic loaded
	genipin-crosslinked gelatin microspheres
PTX <sub>nano</sub> -GP-MS	Paclitaxel-ethanolic loaded
	genipin-crosslinked gelatin microspheres
SIR	Sampling importance resampling

#### INTRODUCTION

Ovarian cancer is the eighth most common cancer among women (1), and is associated with the highest mortality across gynecological cancers (2). As a clinically silent cancer, more than two-thirds of women receive a diagnosis of advanced disease (International Federation of Gynecology and Obstetrics stage III or IV) that has been widely disseminated within the peritoneal cavity (3).

The standard treatment for advanced ovarian cancer is maximal cytoreductive surgery (CRS) to remove macroscopic tumors in the abdominal cavity followed by intravenous platinum/taxane-based adjuvant therapy to kill residual microscopic disease (4). Despite an initial response rate of 60%-80% to this standard of care (5), the prognosis remains poor with 3-year relapse rate greater than 75% and mean 5-year survival rate less than 25% (6–8). The recurrence is generally thought to be due to insufficient killing of undetectable residual cancer cells by first-line chemotherapy (9,10). Therefore, there is a critical need to develop novel strategies for treating peritoneal minimal residual disease (pMRD) with the goal of improving patient survival and preventing disease recurrence.

As the disease is predominantly confined to the peritoneal cavity, the use of intraperitoneal chemotherapy (IPC) (postoperative or intraoperative) is an increasingly popular regional treatment strategy for treating pMRD, which has been explored in numerous clinical studies (3). IPC can enhance drug concentrations in the abdominal cavity while at the same time limit systemic drug exposure, thus potentially achieving improved efficacy with less systemic drug-induced toxicity (11–15). Although IPC has demonstrated survival advantages compared to standard intravenous chemotherapy (16-18), the disease recurrence still remains quite high with a 3-year relapse rate greater than 50% (16,19). The intraperitoneal delivery of rapidly absorbed chemotherapeutic solutions with single-dose intraoperative IPC or intermittent doses of postoperative IPC can only provide short-term drug exposure for the residual disease, potentially leading to incomplete cancer cell killing and recurrence of the disease.

Locoregional delivery of sustained release chemotherapeutics to maintain a prolonged drug exposure in the peritoneal cavity might be a promising therapeutic strategy. Paclitaxel (PTX) is a front-line agent for ovarian cancer, and is thought to be a good candidate for IP treatment because of its low peritoneal clearance compared with systemic clearance and also significant first-pass effect, resulting in high area under the concentration-time curve ratio of peritoneal/plasma(>1000) (20). Some previous work has shown survival benefits of sustained PTX IP formulations (e.g. PTX loaded polymeric microparticles and implantable paclitaxel drug delivery system) over solution-based PTX products (e.g. Taxol®) in peritoneal tumor-bearing mice (21,22). Recently, we developed a novel IP delivery system of paclitaxel-loaded genipincrosslinked gelatin microspheres (PTX-GP-MS) specifically designed for treating pMRD (De Clercq *et al.*, submitted to *Scientific Reports*). The developed PTX-GP-MS showed prolonged PTX release over at least two weeks both *in vitro* and *in vivo* and demonstrated a significantly better survival outcome over a marketed PTX nanoparticle-based drug delivery system, Abraxane® (PTX-loaded albumin nanoparticles, Nab-PTX), in a microscopic peritoneal carcinomatosis mouse model mimicking the residual disease state after CRS. However, toxicity phenomena and/or lethality were observed at high doses of PTX-GP-MS, and the best dose with optimal survival outcome and minimal toxicity were left unidentified in this descriptive study.

Our present model-based analysis study builds on these efforts and aims to investigate the relationships between drug exposure and treatment response using pharmacokineticpharmacodynamic (PKPD) modelling to find the optimal dose of PTX-GP-MS to better inform further formulation optimization.

#### MATERIALS AND METHODS

#### Paclitaxel-Loaded Genipin-Crosslinked Gelatin Microspheres

Genipin-crosslinked gelatin microspheres (GP-MS) with an average size of 50  $\mu$ m were prepared as described in De Clercq *et al.*, 2016 (23). The preparation of PTX-GP-MS with an (optimized) 40% crosslinking degree was described below.

PTX-ethanolic loaded GP-MS (PTX<sub>EtOH</sub>-GP-MS): GP-MS were loaded with PTX by immersion in an ethanolic PTX solution. 200 mg GP-MS with different degrees of crosslinking (7, 25, 40, 60 and 70%) were immersed in 2 ml of a 1, 2.5 or 5 mg/ml PTX (purity of >99%, LC laboratories, Woburn, MA, USA) ethanol/distilled water (75/25, *v/v*) (absolute ethanol, VWR chemicals, Fontenay-sous-Bois cedex, France) solution under slow magnetic stirring. After 3 hours, GP-MS were vacuum filtered and washed with absolute ethanol (VWR chemicals) to remove unentrapped PTX from the surface. PTX-loaded GP-MS were lyophilised for 24 hours at -50°C and 1 mbar.

PTX-nanosuspension loaded GP-MS (PTX<sub>nano</sub>-GP-MS): GP-MS were loaded by immersion in an aqueous PTXnanosuspension. Initially, PTX-nanocrystals were prepared using a wet milling technique. Pluronic® F-127/PTX (Pluronic® F-127, Sigma-Aldrich, Bornem, Belgium) (PTX purity of >99%, LC laboratories) in a 1/4 ratio was transferred in a 20 ml vial containing 5 ml 0.9% sodium chloride solution (Sigma-Aldrich) and 30 g zirconium oxide beads (Netzsch zetabeads, Ghislenghien, Belgium) with a diameter of 0.5 mm as milling pearls. The vials were placed on a rollermill and grinded at 150 rpm for 60 hours. The nanocrystals were lyophilised for 24 hours at -50°C and 1 mbar. Particle size and polydispersity index of the PTX nanocrystals were determined by dynamic light scattering, using a Zetasizer 3000 (Malvern Instruments, Worcestershire, UK). GP-MS (50, 100 or 200 mg) were immersed for 3 hours in 2 ml aqueous PTX nanosuspension, diluted using 0.9% sodium chloride solution to a concentration of 1, 2.5 or 5 mg PTX/ml. PTX-loaded GP-MS were collected by vacuum filtration and washed using distilled water to remove unentrapped PTX from the surface. PTX<sub>nano</sub>-GP-MS were lyophilised for 24 hours at -50°C and 1 mbar.

#### Microscopic Peritoneal Carcinomatosis Model and Intraperitoneal Chemotherapy Treatment

A luciferase positive human ovarian cancer cell line SK-OV-3-Luc IP1 was cultured at 37°C in a 10%  $CO_2$  humidified atmosphere in Dulbecco's Modified Eagle's Medium (ThermoFisher, Ghent, Belgium), supplemented with 10% fetal bovine serum (Sigma-Aldrich, Diegem, Belgium) and 2% penicillin/streptomycin.

Briefly, six-week old female Balb/c Nu mice (BALB/cOlaHsd-Foxn1nu, Envigo, Horst, The Netherlands) were acclimated to the animal facility one week before the start of the study. After 7 days, mice were intraperitoneally injected with 2 x 10<sup>6</sup> SK-OV-3-Luc IP1 cells suspended in 1 ml physiological saline. The number of injected cells was optimized in a pilot study for the development of the microscopic peritoneal carcinomatosis model. One day after engraftment with tumor cells (referred to as day 0 of the study), the mice were randomized across several groups, each consisting of 10 to 12 animals: the control group was injected with 2 ml 0.9% saline or 50 mg of blank GP-MS suspended in 2 ml 0.9% saline; PTXnano-GP-MS groups (dosed at 7.5 and 35 mg/kg) represented the relatively slow sustained release PTX delivery system; the PTX<sub>EtOH</sub>-GP-MS group (7.5 mg/kg) represented the relatively fast sustained release PTX delivery system; while the Nab-PTX group (35 mg/kg) represented the immediate release PTX delivery system. Every dose mentioned in this manuscript describes the PTX dose and not the amount of GP-MS.

Throughout the study, mice were kept in standard housing conditions with water and food *ad libitum* and a 12 h light/dark cycle. All animal experiments were approved by the Animal Ethics Committee of the Faculty of Medicine at Ghent University (ECD 17/83) and adhered to the "Principles of Laboratory Animal Care" (NIH publication #85-23, revised in 1985).

#### **Collection of Blood Samples**

Dried blood spot (DBS) microsampling was performed in our study by withdrawing tiny volumes (< 15  $\mu$ L at each timepoint) of blood from the tail vein. Under a sparse sampling scheme design, blood samples were collected at pre-defined time-points between 0.5 h and 13 days after the start of treatment. Two to five blood samples were taken from each mouse. At each sampling-point, 10  $\mu$ L of blood was spotted on a blood spot card (PerkinElmer 226 Bioanalysis RUO Card, Perkin Elmer, Greenville, USA).

PTX concentrations of DBS samples were measured using a previously developed UPLC-MS/MS method (24). The lower limit of quantification (LLOQ) of PTX in a DBS sample was 1 ng/ml. The method imprecision was less than 14.6% and bias was less than  $\pm$  11.9%.

#### **Recording of Tumor Growth, and Survival**

Animals were evaluated weekly from the day of treatment until occurrence of death, the attainment of predefined endpoints or until the end of the study (90 days post-treatment). Mice were euthanised when the following events occurred: excessive weight loss (body weight loss of 20% at any timepoint or of 15% maintained for 72 h compared with pretreatment weight), presence of ascites and signs of abnormal behaviour.

Bioluminescence imaging (BLI) was performed weekly using the IVIS Lumina II system (PerkinElmer) for tumor growth follow-up of each mouse. Luminescence was quantified using the Living Image® 4.3.1 software (PerkinElmer).

#### Available Data for PKPD Modelling

The final dataset consisted of data collected in the present study and from previous (unpublished) work throughout different study periods. These studies comprised: (i) in a pharmacokinetic study of the developed PTX-GP-MS (40% crosslinking degree), PTX concentrations measured in 24 female Balb/c mice (aged 7 weeks) between 0.5 h and 9 days post IP injection (7.5 and 35 mg/kg) were included for population pharmacokinetic modelling and (ii) in a pilot study for the development of the microscopic peritoneal carcinomatosis model, where five female Balb/c Nu mice were IP injected with 2 x 10<sup>6</sup> SK-OV-3-Luc IP1 cells suspended in 1 ml physiological saline without any further treatment. The mortality data from this study were included for survival modelling. Finally, mean plasma concentration values in male Balb/c mice (6-8 weeks old) at a single intravenous (IV) dose of 5.0 mg/kg PTX were digitized from a published study by Gao et al. (25). A plasma-to-blood ratio (PBR) of 0.7 was applied to convert plasma concentrations to blood values (26).

#### **PKPD Model Development**

The PKPD model building process was carried out in a sequential manner. The population PK model was developed first, and the resulting predicted full PK profile was used as a predictor for survival modelling. The relationship between the potential predictor, BLI based tumor burden, and survival was also examined.

#### **Population Pharmacokinetic Modelling**

Non-linear mixed effects modelling was carried out in NONMEM® (version 7.3, Icon Development Solutions, Ellicott City, MD, USA) using the first-order conditional estimation algorithm with interaction. The model was executed through Perl-speaks-NONMEM (PsN, version 4.60, Uppsala University, Uppsala, Sweden) with the Pirana software (version 2.9.6, Pirana Software & Consulting BV) as interface. Data processing and graphical analysis was performed in R (version 3.4.1, R Foundation for Statistical Computing, Vienna, Austria).

To describe the disposition of PTX, both one- and twocompartment disposition models were explored. A peritoneal compartment was implemented in the PK model for obtaining predicted PTX concentrations in peritoneum for IP injected formulations. The overall apparent absorption process was separated into the release of PTX from the administered formulations in the peritoneum and the transmembrane absorption of the dissolved PTX from peritoneum to blood. For the release of PTX from the formulations into the peritoneum, several release models were tested, including single first-order or zero-order release, parallel or sequential firstorder release, parallel or sequential zero-order release, and mixed zero- and first-order release (27). PTX transmembrane absorption was assumed to be first-order and the absorption rate constant was fixed to a reported value of  $0.95 \text{ h}^{-1}$  (28). The fluid volume of the mice peritoneal cavity was fixed to a physiologically typical value of 0.4 mL (28). The predicted peritoneal PTX concentrations were calculated as: the amount of released PTX in the peritoneum/peritoneal fluid volume. The bioavailability (F) of the IP formulations relative to IV data was estimated (absolute F).

Inter-individual variability (IIV) was modeled using a lognormal distribution with a mean of zero and a variance of  $\omega^2$ . Unexplained residual variability was explored using additive, proportional, and combined (additive + proportional) residual error models. For the measured concentrations between LLOQ and the limit of detection, implementation of an additional residual error model was tested to account for the potentially larger residual variability.

Model development was guided by the objective function value (OFV) between nested models, Akaike's information criterion (AIC) between non-nested models, and standard goodness of fit (GOF) plots. A  $\Delta$ OFV criterion of -3.84corresponded with a significance level of p < 0.05 for one degree of freedom. The predictive performance of the final model was evaluated using prediction-corrected visual predictive checks (pcVPCs) based on 1000 model-based simulations. The sampling importance resampling (SIR) (n=1000) approach was applied on the final model to evaluate model robustness and obtain non-parametric confidence intervals of the estimates (29).

#### **Survival Modelling**

A parametric time-to-event approach was utilized to explore the relationships between the predictors (i.e. blood/peritoneal PK profile, and BLI tumor burden) and survival. The peritoneal PK profile was used to describe the treatment effect on survival, while the blood concentration was assumed to be responsible for toxicity-induced death. All the predictorsurvival relationships were implemented in a time-varying manner. The time to death event was based on the initiation of IP treatment. Mice who survived at the time of the last day of follow-up (day 90) were right-censored. The dataset was analyzed using the first-order algorithm in NONMEM®.

The probability density f(t) for observing a death event was described as the product of a function S(t) and hazard h(t) at that time, according to equations 1-3.

$$f(t) = S(t) \cdot h(t) \tag{1}$$

$$S(t) = e^{-f_0^t h(t)dt}$$
<sup>(2)</sup>

$$\mathbf{h}(\mathbf{t}) = \mathbf{h}_0 \cdot \mathbf{Drug}(\mathbf{t}) \tag{3}$$

Where  $h_0$  is the baseline hazard, and Drug (t) is a timevarying drug effect. The survival S(t) is an integral function of the hazard h(t) with respect to time, representing the probability of survival (i.e. not having the death event). The same baseline hazard was assumed for all mice since the variability of baseline hazard could not be estimated with survival data.

The base model was developed by exploring different probability density functions for the baseline hazard, including exponential, Weibull, Gompertz, and log-logistic distributions. For the implementation of measured BLI data as a time-varying predictor, linear interpolation was used between adjacent BLI observations. When using the peritoneal PK profile as a time-varying predictor, the drug effect model was optimized by testing a range of different PKPD models such as linear, log-linear,  $E_{max}$ , and sigmoidal  $E_{max}$  relationships (30). The drug effect delay was also evaluated by incorporating an effect compartment model, an indirect response model, and a transit compartment model. Like the implementation of the treatment effect model, various toxicity models using the blood PK profile as a driving force were also tested to account for drug toxicity-induced death.

Models were selected based on OFV (nested models) and AIC (non-nested models), in combination with simulationbased diagnostics (Kaplan–Meier plots) based on 100 simulations of the model. For the final model, Kaplan–Meier visual predictive check plots based on 1000 simulations were used for internal model validation. The uncertainty (95% confidence intervals) of the parameter estimates was checked through the SIR approach (n=1000).

#### Dose Simulation of PTX<sub>nano</sub>-GP-MS

From the observed survival data,  $PTX_{nano}$ -GP-MS is the most promising IP delivery system in mice for treating microscopic peritoneal carcinomatosis disease, and the optimal dose falls between 7.5 and 35 mg/kg. With the final PKPD model, survival probabilities (within 90 days) were simulated for different  $PTX_{nano}$ -GP-MS dose levels (7.5, 10, 12.5, 15, 20, 25, and 35 mg/kg). 1000 typical subjects (mice with population estimates) were simulated for each scenario. The Kaplan–Meier survival curve and hazard over time were constructed, and the 95% confidence intervals of simulated survival curves at day 40 and 90 were reported.

#### RESULTS

#### **Exploratory Data Analysis**

Figure 1 shows the individual blood concentrations and trends for the different formulations and injection routes applied. As shown in the plot, Nab-PTX displayed a many-fold higher exposure immediately after administration but was eliminated much more rapidly compared to PTX-GP-MS. A burst peak was observed during the first hours for PTX-GP-MS, followed by a prolonged PTX release over several days resulting in relatively stable concentrations. Therefore, dual release rate models were investigated for PTX-GP-MS in order to describe the biphasic PK profile. In total, 195 PTX blood concentrations were included for the population pharmacokinetics analysis. A summary of all collected data is given in Table 1.

BLI based tumor growth profiles and Kaplan-Meier survival curves from mice with microscopic peritoneal carcinomatosis disease receiving different IP treatments are presented in supplementary Figure S1 and Fig. 2, respectively. The groups of mice with microscopic peritoneal disease treated with 2 ml physiological saline or 50 mg blank GP-MS suspended in 2 ml saline or without any treatment (from the pilot study) showed comparable survival curves. Therefore, these were merged together as the control group (in total n=26 mice, Fig. 2). The PTX<sub>nano</sub>-GP-MS groups at doses of 7.5 and 35 mg/kg showed the best survival outcomes; however, some of the mice in the 35 mg/kg dose group of PTX<sub>nano</sub>-GP-MS experienced toxicity-induced death (indicated by the arrows in Fig. 2, indicating severe hepatotoxicity observed by histopathological analysis). As can be seen in Figure S1, in this dose group, BLI profiles demonstrated no tumor development (except for one mouse) thus good cancer cell killing effect, as indicated by the baseline BLI signals. These observations suggest a toxicity effect on survival that needs to be considered separate from the beneficial treatment effect. During the survival model development, we thus attempted to implement a toxicity model on the hazard to account for the toxicity effect for all PTX delivery systems.

#### **Population Pharmacokinetics**

The PK model development was started with first-order release of the formulations into the peritoneum, followed by first-order transmembrane absorption and one-compartment disposition. Introducing a peripheral compartment led to a significant drop in the OFV ( $\Delta$ OFV of -18.8) which was thus selected for further model development. Among all of the tested release models, the parallel first-order release model (burst + sustained release) gave the lowest AIC for PTX-GP-MS, and the single first-order release model was optimal for Nab-PTX. Owing to sparseness of the data, IIVs could only be identified for the dose fraction parameters (i.e. FORM2F1 and FORM34F1, Table 2) of PTX<sub>ETOH</sub>-GP-MS and PTX<sub>nano</sub>-GP-MS via burst/ sustained release, and the absolute bioavailability parameter of  $PTX_{nano}$ -GP-MS ( $\Delta OFV$  of -86.4 in total). Addition of an extra proportional residual error term for the extrapolated concentrations below LLOO further improved the model fit ( $\Delta OFV$  of -55.2). A schematic representation of the final PK model is depicted in Fig. 3. The parameter estimates of the final PK model and associated 95% confidence intervals obtained by the SIR approach are presented in Table 2.

The GOF plots in supplementary Figure S2 indicate that the final PK model adequately describes the observed data. The central tendency and spread of the observed PTX blood concentrations were also well captured by the model, as demonstrated in the supplementary pcVPCs plot for all PTXformulations (Figure S3).

#### **Survival Modelling**

In our initial modelling strategy of treatment effect on survival, we first attempted to establish a PKPD relationship between the peritoneal PK profile and BLI tumor burden, and then link the predicted BLI tumor burden to survival. Unfortunately, it was difficult to integrate the PK profile and BLI data both for tumor developing and non-tumor developing mice in a plausible biologically inspired model. As a straightforward evaluation of the predictiveness of BLI tumor burden on survival, the measured BLI data (excluding the 35 mg/kg PTX<sub>nano</sub>-GP-MS dose group due to obvious toxicityinduced death) were tested as a time-varying covariate on the



Fig. 1 Available paditaxel (PTX) blood concentration data for population pharmacokinetic analysis. A base 10 logarithmic scale was used for the y-axis, and the x-axis was shown using the square root scale. The grey dashed line represents the lower limit of quantification (1 ng/ml) of the analytical method. A Loess smoothing solid line was added to the plot for each formulation.

hazard rate with linear interpolation between adjacent BLI observations. As shown in the supplementary Figure S4, the BLI based survival model gave marked misfits for the control group and the 7.5 mg/kg PTX<sub>nano</sub>-GP-MS group.

Since the BLI data did not well predict the survival from a modelling point of view, we then decided to test peritoneal concentration as a direct predictor of the treatment effect. The model development path of survival modelling using concentration as predictor is summarized in Table 3. Model building started with the control group data, and a log-logistic distribution model ( $\lambda$ , hazard coefficient;  $\gamma$ , shape factor; equation 7) best characterized the underlying baseline hazard, which greatly increased with time ( $\gamma$ =9.67, Table 4). PTX treatment groups (except the 35 mg/kg PTXnano-GP-MS group) were then added into the dataset. A delayed PTX treatment effect on hazard rate was detected, and the indirect response model (IDR) with linear stimulation of the  $K_{OUT}$  (equation 6) driven by peritoneal concentration was found optimal. From the VPC plots of this intermediate IDR model, significant misfits were observed for the Nab-PTX group (supplementary Figure S5). Therefore, we decided to first develop a model for all PTX-GP-MS groups. To account for drug-induced toxicity effects on survival that could obviously be observed in the 35 mg/kg PTX<sub>nano</sub>-GP-MS dose group, a systemic blood concentration-based sigmoid inhibition model on K<sub>OUT</sub> was incorporated for all PTX-GP-MS groups and led to a clear improvement of the model fit ( $\Delta OFV$ : -27.6, supplementary Figure S6). Lastly, the Nab-PTX group was added to the dataset, and we implemented a separate treatment efficacy parameter for Nab-PTX ( $\Delta OFV: -26.3$ ) in order to preserve the good model fit of the PTX-GP-MS groups.

The hazard of the final survival model is described in equations 4-7, and the NONMEM control stream of the final PKPD model is provided in the online supplement.

$$EFF = I + \alpha_{PTX-GP-MS/Nab-PTX} \cdot C_{peritoneal}$$
(4)

$$TOX = I - \frac{C_{blood}}{IC_{50}}^{Hill} + C_{blood}^{Hill}$$
(5)

$$\frac{d\mathrm{Drug}}{d\mathrm{t}} = \mathrm{K}_{\mathrm{IN}} - \mathrm{K}_{\mathrm{OUT}} \cdot \mathrm{Drug} \cdot \mathrm{EFF} \cdot \mathrm{TOX}$$
(6)

$$h(t) = \frac{\lambda \cdot \gamma \cdot (\lambda \cdot t)^{\gamma - 1}}{1 + (\lambda \cdot t)^{\gamma}} \cdot \text{Drug}(t)$$
(7)

Where EFF is the stimulation effect of the drug treatment on  $K_{OUT}$ , and  $\alpha_{PTX-GP-MS}$  and  $\alpha_{Nab-PTX}$  are the efficacy parameters of PTX-GP-MS and Nab-PTX, respectively. TOX is the inhibition effect of drug-induced toxicity on  $K_{OUT}$ , and IC<sub>50</sub> is the blood concentration at which the  $K_{OUT}$  is reduced by 50%. Drug(t) represents the overall effect of drug treatment efficacy and toxicity projected onto the hazard.  $K_{IN}$  and  $K_{OUT}$  are the zero-order production rate and first-order removal rate of Drug(t), respectively. Hill is the sigmoidicity factor controlling the steepness of the sigmoid function. This factor was fixed to 20 as there was insufficient information in the data to reliably estimate it.

The final survival model is demonstrated as grey blocks in Fig. 3. The parameter estimates and 95% confidence intervals of the final model are shown in Table 4. The Kaplan–Meier plots of the observed survival data overlaid with the simulated 95% confidence interval from the final model are shown in Fig. 4, stratified by treatment group. In general, the control

and PTX<sub>ETOH</sub>-GP-MS groups show good agreement between the observed survival curve and the simulated data. For PTX<sub>nano</sub>-GP-MS groups, an obvious over-prediction between day 70 and 90 was observed at a dose of 7.5 mg/kg, and a less noticeable over-prediction between day 20 and 30 was found at a dose of 35 mg/kg. Similarly, some misfits were also present for Nab-PTX.

## Dose effects of PTX<sub>nano</sub>-GP-MS Derived through Simulations

The effect of a dose of PTXnano-GP-MS given to 1000 typical subjects with microscopic peritoneal carcinomatosis disease on the hazard and survival probability over time is illustrated in Fig. 5. The simulated PK profiles in the peritoneal cavity and blood (central compartment), the response in the Drug(t) compartment, and the hazard over time after removal of toxicity effects (i.e. assuming no toxicity effect on the hazard) for the different doses (7.5 to 35 mg/kg) were provided in Figure S7 of Supplement 1. The reader may refer to these details, as well as to Fig. 5, to better understand how the model behaves and how the drug contributes to the efficacy and toxicity effects on the hazard. For doses between 7.5 and 15 mg/kg, the survival probabilities were near 100% before day 40 and all above 80% at day 90, and there were no significant differences in survival curve among these doses (supplementary Table S1). For doses  $\geq$ 20 mg/kg, the survival probability started to decrease at an early time point (e.g. day 25), and the survival outcomes were significantly worse than those of lower doses (7.5 -15 mg/kg), due to the increased hazard caused by the drug-induced toxicity effect (upper plot in Fig. 5). The simulation demonstrated that the dose range of 7.5-15 mg/kg is expected to be optimal for subjects to achieve a good survival outcome while minimizing the drug-induced toxicity effect on the hazard.

#### DISCUSSION

In this work, first a population PK model was developed to characterize the in vivo concentration-time profiles of different PTX formulations. A peritoneal compartment with a fixed peritoneal fluid volume was added during population PK modelling in order to obtain the predicted peritoneal concentrations. The in vivo release models of the formulations were optimized to give the best description of PTX blood concentrations, and a fixed first-order transmembrane absorption rate constant was assumed for the released PTX regardless of the formulations. During the PK modelling, the use of parameter estimates from the best fitted in vitro release model as input for in vivo release model was also considered, but this didn't give a good description of PTX blood concentrations. This is because PTX-GP-MS released much faster in vivo compared with in vitro, confirmed by the deconvolution results (data not shown). Because the in vitro dissolution of PTX-GP-MS was not fully indicative for its in vivo behavior, the in vitro release data were not used to identify the *in vivo* release rate. Due to the difficulty of

 Table I
 Summary of Available Data for PKPD Modelling Collected from Different Studies

Study description	Mice type and model	Treatment	No. of mice	Observation data
Treatment efficacy study in microscopic peritoneal	Intraperitoneal xenograft model in female Balb/c Nu mice	IP injection of 2 ml physiological saline		BLI data and survival
carcinomatosis mouse model (present study)	(IP injection of 2 x 10 <sup>6</sup> SK-OV-3-Luc IP1 cells)	IP injection of 50 mg blank GP-MS in 2 ml saline	10	BLI data and survival
		IP injection of PTX <sub>ETOH</sub> -GP-MS at a dose of 7.5 mg/kg	10	DBS samples (14 concentrations), BLI data and survival
		IP injection of PTX <sub>nano</sub> -GP-MS at a dose of 7.5 mg/kg	11	DBS samples (26 concentrations), BLI data and survival
		IP injection of PTX <sub>nano</sub> -GP-MS at a dose of 35 mg/kg		DBS samples (44 concentrations), BLI data and survival
		IP injection of Abraxane at a dose of 35 mg/kg	12	DBS samples (6 concentrations), BLI data and survival
Pilot study for the development of a microscopic peritoneal carcinomatosis mouse model	Intraperitoneal xenograft model in female Balb/c Nu mice (IP injection of 2 x 10 <sup>6</sup> SK-OV-3-Luc IP1 cells)	None	5	Survival
Pharmacokinetics study of PTX-GP-MS	Female Balb/c mice	IP injection of PTX <sub>ETOH</sub> -GP-MS at a dose of 7.5 mg/kg	6	DBS samples (29 concentrations)
		IP injection of PTX <sub>nano</sub> -GP-MS at a dose of 7.5 mg/kg	6	DBS samples (28 concentrations)
		IP injection of PTX <sub>nano</sub> -GP-MS at a dose of 35 mg/kg	12	DBS samples (40 concentrations)
Pharmacokinetics study of PTX (Gao et al)	Male Balb/c mice	IV injection of PTX at a dose of 5.0 mg/kg	27	Plasma samples (8 mean concentrations)

**Fig. 2** Kaplan-Meier survival curves of the mice with microscopic peritoneal disease after intraperitoneal treatment. Toxicity-related death events are indicated by the arrows.



reliably sampling and measuring the dissolved PTX fraction in peritoneal fluid (excluding the particles), PTX concentrations in

peritoneum were not determined. The lack of PTX measurements in the peritoneum did not allow us to separately estimate

Table 2 Parameter Estimates of the Final Population Pharmacokinetic Model and the Results of the Sampling Importance Resampling (SIR) Approach

Final model	SIR results		Meaning of parameter	
Estimate (RSE%) [Shrinkage%]	Median	95% confidence interval		
28.2 (6.6)	28.7	26.0 - 32.2	Clearance	
.4 (35.0)	12.4	6.3 – 19.7	Volume of distribution of central compartment	
24.6 (14.5)	25.4	17.5–33.7	Inter-compartmental clearance	
20.0 (6.3)	20.2	17.5 – 23.1	Volume of distribution of peripheral compartment	
0.468 (21.3)	0.479	0.262 - 0.682	Fraction of dose with first-order burst release for $\text{PTX}_{\text{ETOH}}$ -GP-MS	
0.487 (10.8)	0.499	0.395 – 0.611	First-order burst release rate constant for $PTX_{ETOH} ext{-}GP ext{-}MS$	
0.0124 (8.4)	0.0123	0.010 - 0.014	First-order sustained release rate constant for $PTX_{ETOH} ext{-}GP-MS$	
0.13 (9.2)	0.13	0.11-0.15	Absolute bioavailability for PTX <sub>ETOH</sub> -GP-MS	
0.25 (13.4)	0.25	0.18-0.33	Fraction of dose with first-order burst release for $PTX_{nano}$ -GP-MS	
0.0731 (11.9)	0.0747	0.0582 - 0.0942	First-order burst release rate constant for PTX <sub>nano</sub> -GP-MS	
0.00286 (35.0)	0.00303	0.00174 - 0.00457	First-order sustained release rate constant for PTX <sub>nano</sub> -GP-MS	
0.101 (18.2)	0.101	0.078 - 0.130	Absolute bioavailability for PTX <sub>nano</sub> -GP-MS	
0.44 (3.6)	0.44	0.406 - 0.480	First-order release rate constant for Abraxane	
0.429 (11.5)	0.438	0.344 – 0.546	Absolute bioavailability for Abraxane	
)				
258.6 (35.7) [52.6]	287.2	121.5 – 727.1		
93.2 (31.5) [37.8]	100.4	62.4 - 145.5		
41.9 (23.3) [34.6]	42.3	30.2 - 53.2		
ntrations above LLOQ				
0.789 (31.1) [15.3]	0.82	0.44 – 1.27		
22.8 (20.9) [15.3]	23.1	18.7 – 26.9		
ntrations below LLOQ				
29.9 (39.2) [21.4]	31.6	22.2 - 40.0		
	Final model Estimate (RSE%) [Shrinkage%] 28.2 (6.6) 11.4 (35.0) 24.6 (14.5) 20.0 (6.3) 0.468 (21.3) 0.468 (21.488 (21.3) 0.468 (21.3)	Final model         SIR results           Estimate (RSE%)         Median           [Shrinkage%]         Median           28.2 (6.6)         28.7           11.4 (35.0)         12.4           24.6 (14.5)         25.4           20.0 (6.3)         20.2           0.468 (21.3)         0.479           0.487 (10.8)         0.479           0.13 (9.2)         0.13           0.25 (13.4)         0.25           0.0731 (11.9)         0.0747           0.00286 (35.0)         0.00303           0.101 (18.2)         0.101           0.44 (3.6)         0.44           0.429 (11.5)         0.438           258.6 (35.7) [52.6]         287.2           93.2 (31.5) [37.8]         100.4           41.9 (23.3) [34.6]         42.3           41.9 (23.3) [34.6]         0.82           22.8 (20.9) [15.3]         0.82           22.8 (20.9) [15.3]         23.1           trations below LLOQ         29.9 (39.2) [21.4]	Final model         SIR results           Estimate (RSE%) [Shrinkage%]         Median         95% confidence interval           28.2 (6.6)         28.7         26.0 – 32.2           11.4 (35.0)         12.4         6.3 – 19.7           24.6 (14.5)         25.4         17.5 – 33.7           20.0 (6.3)         20.2         17.5 – 23.1           0.468 (21.3)         0.479         0.262 – 0.682           0.487 (10.8)         0.499         0.395 – 0.611           0.0124 (8.4)         0.0123         0.010 – 0.014           0.13 (9.2)         0.13         0.11 – 0.15           0.25 (13.4)         0.25         0.18 – 0.33           0.0731 (11.9)         0.0747         0.0582 – 0.0942           0.00286 (35.0)         0.00303         0.00174 – 0.00457           0.101 (18.2)         0.101         0.078 – 0.130           0.44         0.406 – 0.480         0.429 (11.5)           0.438         0.344 – 0.546           258.6 (35.7) [52.6]         287.2         121.5 – 727.1           93.2 (31.5) [37.8]         100.4         62.4 – 145.5           41.9 (23.3) [34.6]         42.3         30.2 – 53.2           0.789 (31.1) [15.3]         0.82         0.44 – 1.27	

<sup>a</sup> CV (%) is calculated according to: CV (%) =  $\sqrt{\exp(\omega^2) - 1} \times 100\%$ .  $\omega^2$ : the variance estimate in the log-domain.

the actual transmembrane absorption rate for different formulations when the *in vivo* release rate is also estimated, and thus a reported PTX peritoneal transmembrane rate constant had to be adopted. We acknowledge that this is a simplification of the reality of the physiological absorption process of these formulations. We also acknowledge that the predicted peritoneal PK profile from the PK model may not fully reflect reality.

During the subsequent survival modelling, predicted peritoneal concentrations were used as the time-varying input for treatment effects considering that the disease is limited to the peritoneal cavity, whereas blood concentrations were assumed to be responsible for the systemic toxicity effect on survival. To describe the competing effects of PTX treatment and toxicity on survival, a sigmoidal inhibition model of the toxicity effect on K<sub>OUT</sub> was found to be optimal. Estimation of the sigmoidicity factor was not supported by the data, it was thus empirically fixed to a high value of 20. A sensitivity analysis on this sigmoidicity factor at values of 5, 10, 20, and 50 was performed to inspect its influence on parameter estimates and model fit. The analysis demonstrated that the parameter estimates (changes  $\leq \pm 10\%$ ) and model fit were not influenced by sigmoidicity factor values between 5 and 50. The IC<sub>50</sub> estimate (0.695 ng/ml) is the PTX blood concentration inflection point significantly producing (> 0.695 ng/ml)/not significantly having (< 0.695 ng/ml) a drug-induced toxicity signal on the hazard. Depending on the time period that the

blood concentration remains above the IC<sub>50</sub>, the accumulated toxicity effect on the hazard can be lethal (e.g. 35 mg/kg PTX<sub>nano</sub>-GP-MS) or non-lethal (e.g. 7.5 mg/kg PTX-GP-MS). This indicates the importance of achieving an appropriate concentration during dose optimization of PTX-GP-MS to avoid a toxicity-lethal hazard, as demonstrated in the hazard plot (Fig. 5) for the dose simulations of PTX<sub>nano</sub>-GP-MS.

The final survival model indicates that Nab-PTX has a larger efficacy parameter than that of PTX-GP-MS. Indeed, pharmacokinetic studies have demonstrated that, compared with PTX, Nab-PTX is associated with a 9-fold greater penetration of PTX into tissues and also a longer tissue retention. thus potentially a higher activity (31). This is because Nab-PTX consists of nanoparticle albumin-bound paclitaxel, which exploits the natural interactions between albumin and the gp60/caveolin-1 receptor pathway, thus leading to enhanced transport across endothelial cell monolayers and greater delivery of paclitaxel to tumors (32). However, as an immediate release formulation, Nab-PTX only provided a very short drug exposure towards residual disease thus finally resulted in a worse survival outcome compared to a sustained release PTX-GP-MS formulation. We acknowledge that the formulation vehicle effect of Nab-PTX was difficult to be captured in its entirety, hence the estimated  $\alpha_{\text{Nab-PTX}}$  might to some extent be a value to be used with caution.

Our study demonstrates that the local PTX concentration is a better survival predictor than the BLI data. This might be due



Fig. 3 Schematic representation of the final PKPD model. The PK model is represented by the black blocks, while the PD model is displayed by the grey blocks.

Table 3 Model Development Path for Paclitaxel Survival Modelling

No. of mod	Ref. mod	OFV	∆OFV	AIC	No. of estimates	No. of mice	Description
l (start model)		237.8		239.8	I	26	Control group (26 mice): Exponential distribution
2	1	172.9	-64.9	176.9	2	26	Control group (26 mice): Weibull distribution
3	1	179.8	-58.0	183.8	2	26	Control group (26 mice): Gompertz distribution
4	1	161.5	-76.3	165.5	2	26	Control group (26 mice): Log-logistic distribution
10	4	399.5		405.5	3	59	Add data of PTX <sub>EtOH</sub> -GP-MS (10 mice), PTX <sub>nano</sub> -GP-MS (7.5 mg/kg, 10 mice) and Abraxane (12 mice): direct effect model + E <sub>max</sub> inhibition model (driven by peritoneal concentration) on hazard rate
11	10	387.2	-12.3	395.2	4	59	Use delayed drug effect: effect compartment model
12	10	397.8	-1.7	405.8	4	59	Use delayed drug effect: transit compartment model (3 CMTs)
15	10	353.2	-46.3	363.2	5	59	Use delayed drug effect: indirect response model (drug E <sub>max</sub> stimulation effect on K <sub>OUT</sub> )
16	15	354.6	1.4	362.6	4	59	Linear simulation model on K <sub>OUT</sub>
25	16	343.3		351.2	4	58	Temporally remove the Abraxane group, and add data of PTX <sub>nano</sub> -GP-MS (35 mg/kg, 11 mice)
26	25	315.7	-27.6	325.7	5	58	Incorporate drug-related toxicity effect on survival for all PTX-GP-MS groups: sigmoidal inhibition model (driven by systemic blood concentration) on K <sub>OUT</sub> of the indirect response model (sigmoidicity factor fixed to 20)
27	26	420.0		430.0	5	70	Add Abraxane group
35 (final model)	27	393.7	-26.3	405.7	6	70	Consider different treatment effect between Abraxane and PTX-GP-MS
28–34, 36–40	35	393.5 – 407.4	-1.9 - 12	407.5 – 419.4	6–7	70	Drug toxicity effect on K <sub>IN</sub> or directly on hazard; drug toxicity E <sub>max</sub> inhibition/exponential model on K <sub>OUT</sub> ; separate indirect response model for drug toxicity effect; considering time-varying drug cell killing capacity; inter-individual variability on population parameters, etc.

to the fact that BLI is a rather semi-quantitative method since various endogenous and exogenous factors can impact the signal quantification and might lead to erroneous readouts (33). Even with the final concentration-driven survival model, some discordances were seen in the VPC plots across PTX formulations. This might partly be explained by the sparse blood sampling scheme and small sample size of the survival data. Sparse blood sampling can impede the estimates of the IIV of population PK parameters and may lead to less precise estimates of individual PK parameters, whereas the small sample size can lead to a large uncertainty of the observed Kaplan–Meier survival curve. For example, only the typical concentration-time profile can be predicted for Nab-PTX because only six blood concentrations were available. The difficulty of appropriately

Table 4	Parameter Estimates	of the Final Survival	Model and the	Results of the S	Sampling Importance	Resampling (SIR) Approach
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Parameter	Final model	SIR results		Meaning of parameter
	Estimate (RSE%)	Median	95% confidence interval	
λ	0.0293 (2.4)	0.0293	0.0276 - 0.0310	Hazard coefficient of the log-logistic distribution
γ	9.67 (19.9)	9.64	6.82 - 12.87	Shape factor of the log-logistic distribution
α <sub>PTX-GP-MS</sub> (ml/ng)	8.59 (55.5)	9.65	4.59 - 16.16	Treatment efficacy parameter of PTX-GP-MS
α <sub>Nab-PTX</sub> (ml/ng)	728.0 (63.9)	857.8	398.9 – 1475.5	Treatment efficacy parameter of Nab-PTX
IC <sub>50</sub> (ng/ml)	0.695 (8.7)	0.682	0.534 – 0.838	Toxicity associated parameter, indicating the blood concentration where the K <sub>OUT</sub> is inhibited by 50%
K <sub>IN</sub>	0.00129 (54.1)	0.00120	0.000581 - 0.00222	Zero-order production rate

\*The value of K<sub>OUT</sub> (first-order removal rate of drug response) equals K<sub>IN</sub>. The baseline of the drug response compartment is 1.



Fig. 4 Visual predictive checks of the final survival model, stratified by treatment group. The solid lines represent the observed data while the shaded areas represent the 95% confidence intervals of the simulated data.

modelling the underlying formulation vehicle effect (e.g. Nab-PTX) on PKPD might be an additional explanation.

The main strength of this model is its ability to appropriately describe the competing effects of PTX treatment efficiency and toxicity on survival using a parametric approach. The ability to simultaneously model treatment and toxicity effects on survival allows for a better understanding of the overall drug effect. Also, as demonstrated, a PK driven

**Fig. 5** Predicted hazard (upper plot) and median survival probability (bottom plot) of a typical subject without PTX<sub>nano</sub>-GP-MS treatment (no dose as control) or after receiving different single doses of PTX<sub>nano</sub>-GP-MS (7.5, 10, 12.5, 15, 20, 25, and 35 mg/kg). The Y-axis of the hazard plot is shown as square root scale.



PD model gives flexibility for using the model to simulate unexplored scenarios to find the optimal dose achieving satisfactory survival and avoiding unwanted lethal toxicity.

Our present study showed a pronounced improvement on survival rate of a sustained release system (i.e. PTX-GP-MS) over an immediate release system (i.e. Nab-PTX) in a microscopic peritoneal carcinomatosis mouse model. PTXnano-GP-MS was identified to be superior to PTXEtOH-GP-MS and needs to provide a suitably sustained concentration to avoid a toxicity-lethal hazard, as indicated by the PKPD model. Further simulations of new treatment regimens of PTXnano-GP-MS indicate that 7.5 - 15 mg/kg seems to be the optimal dose range to provide the optimal balance between efficacy and safety. The use of PKPD modelling and simulation allows us to provide answers on the optimal efficacy and safety of new drug formulation faster and at a lower cost. In the future, a prospective evaluation is warranted to validate the findings from our simulation study. Also, further efficacy and toxicity evaluations of PTX-GP-MS in other animal models (non-rodent species) are planned. Thereafter, we intend to combine all of the obtained pre-clinical knowledge into a modelling framework aimed at deriving a suitable dosage form to be tested in a Phase I clinical trial.

Our results of PTX-GP-MS in a microscopic peritoneal ovarian cancer disease mouse model align with earlier work of other PTX sustained IP delivery formulations in peritoneal cancer xenograft mice models with macroscopic tumor disease (21,22). Vassileva *et al.* demonstrated that an implantable PTX drug delivery system gave about 30-fold lower tumor burden and a 2-times higher survival rate in comparison to intermittent Taxol® solution therapy in ovarian cancer tumor-bearing mice (22). Similarly, a 2-times longer survival extension of PTX loaded polymeric microparticles over paclitaxel Cremophor®EL solution in mice bearing human pancreatic tumors was reported by Tsai *et al* (21). Compared with previously reported sustained PTX IP formulations, our developed PTX-GP-MS formulation has a dual application in the treatment of advanced ovarian cancer: 1) the prevention of peritoneal adhesions (pathological attachments between tissues and organs of the abdominal cavity) after surgery (shown in our previous work) (23) and 2) the improvement of the efficacy of IP chemotherapy by providing a prolonged drug delivery of a chemotherapeutic agent. Peritoneal adhesions are a common complication after CRS that compromise quality of life by causing small bowel obstruction, chronic abdominal pain and female infertility (34). The promising preclinical results and the potential dual application of the concept in the treatment modality of advanced ovarian cancers marks the clinical relevance and supports the continued (pre)clinical evaluation of the developed PTX-GP-MS.

A limitation of the study is the small sample size of the survival data and the limited PK samples per mouse, a natural limitation for this animal species. With more data, knowledge of inter-individual variability in PK and uncertainty in survival could be obtained, which would further strengthen our conclusions. Nevertheless, our work also demonstrates the power and advantages of the non-linear mixed effects modelling approach, for pooling and maximizing the utility of this limited amount of data in a way still suitable to inform dose optimization, e.g. in early preclinical trials, even when inherently confronted with sparse data.

#### CONCLUSION

In the current work, a PKPD model was developed to simultaneously describe the competing effects of efficacy and toxicity of PTX on survival for PTX-GP-MS and Nab-PTX formulations in mice with microscopic peritoneal carcinomatosis disease. The developed model allows in a flexible way to explore the interplay of positive treatment effects and toxicity of PTX on survival outcome. PTX<sub>nano</sub>-GP-MS was identified as the most promising IP drug delivery system for treating peritoneal minimal residual disease, and model-based simulations indicate that 7.5 - 15 mg/kg seems to be the optimal dose range.

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