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A PBPK model recapitulates early kinetics of anti-PEG antibody-mediated clearance of PEG-liposomes

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ABSTRACT

PEGylation is routinely used to extend the systemic circulation of various protein therapeutics and nanomedicines. Nonetheless, mounting evidence is emerging that individuals exposed to select PEGylated therapeutics can develop antibodies specific to PEG, i.e., anti-PEG antibodies (APA). In turn, APA increase both the risk of hypersensitivity to the drug as well as potential loss of efficacy due to accelerated blood clearance of the drug. Despite the broad implications of APA, the timescales and systemic specificity by which APA can alter the pharmacokinetics and biodistribution of PEGylated drugs remain not well understood. Here, we developed a physiologically based pharmacokinetic (PBPK) model designed to resolve APA's impact on both early- and latephase pharmacokinetics and biodistribution of intravenously administered PEGylated drugs. Our model accurately recapitulates PK and biodistribution data obtained from PET/CT imaging of radiolabeled PEG-liposomes and PEG-uricase in mice with and without APA, as well as serum levels of PEG-uricase in humans. Our work provides another illustration of the power of high-resolution PBPK models for understanding the pharmacokinetic impacts of anti-drug antibodies and the dynamics with which antibodies can mediate clearance of foreign species.

1. Introduction

Polyethylene glycol (PEG) is an uncharged, hydrophilic polymer routinely used to increase the circulation time and decrease the immunogenicity of therapeutic drugs, especially highly immunogenic drugs that are susceptible to induction of anti-drug antibodies (ADA) [1]. The hydrophilicity of PEG increases the aqueous solubility of hydrophobic drugs, thereby improving stability and reducing aggregation [2–6]. In addition, the highly flexible nature of PEG sterically hinders the adsorption of opsonic proteins and other blood components, diminishes

interactions with the immune system, increases hydrodynamic diameter, and reduces enzymatic degradation [3,7]. The resulting 'stealth' effect greatly prolongs the systemic pharmacokinetic (PK) profiles of PEGylated therapeutics, sparing millions of patients from daily or weekly injections.

Unfortunately, over the past 15 years, it is increasingly shown that some individuals produce high titers of antibodies specific to PEG [8], a phenomenon likely enhanced by the immunogenicity of the underlying drug [9,10]. We previously found detectible levels of anti-PEG antibodies (APA) in nearly 70% of blood samples from the general

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population [11], with the vast majority of subjects possessing an IgG isotype that implies the presence of immune memory and the possibility of rapid induction of APA. This is consistent with clinical observations that showed a sizable fraction of individuals could develop APA when exposed to select PEGylated drugs. For instance, roughly one-third of pediatric acute lymphoblastic leukemia (ALL) patients developed APA that quickly eliminated Oncospar (PEG-asparaginase) from the circulation [12]. The incidence rate increases to nearly half of the patients treated with Krystexxa (PEG-uricase) [13-15], and can be even higher (approaching 100%) in patients treated with Palynziq (PEGylated phenylalanine ammonia lyase, or PEG-PAL) [16]. At sufficient titers, APA can mediate accelerated blood clearance (ABC) of PEGylated drugs [17-23], likely by uptake of APA immune complexes by Kupffer cells and liver sinusoidal endothelial cells (LSEC) [20,24]. APA also increase the frequency of hypersensitivity to PEGylated therapeutics [25,26], as reflected by a range of allergic reactions, including anaphylactic shock, to pegloticase [27,28], pegnivacogin [29], and PEG-containing products such as osmotic laxatives and cosmetic products [30]. More recently, APA are implicated in an allergic response to the Pfizer/BioNTec mRNA vaccines for SARS-CoV-2, due to the inclusion of PEG-lipids in its formulation [31,32]. Despite the important implications of APA, the relationship between the circulating APA titers and the resulting impact on PK and biodistribution has not been established with high temporal resolution in the context of PK modeling.

Physiologically based pharmacokinetic (PBPK) modeling is a powerful tool enabling a deeper understanding of the fate of drugs and drug carriers in complex biological systems [33-36]. PBPK models can inform preclinical in vivo testing and serve as an impactful tool to guide clinical evaluations as well as potential dosing regimens in special populations [37,38]. Not surprisingly, PBPK models are routinely used to predict and interpret drug tissue distribution and clearance in various therapeutic areas, clinical scenarios, and patient populations [39,40]. They are also valuable for risk assessment [41,42]. Many PBPK models that recapitulate antibodies as biotherapeutics have been developed [43,44]; however, few models exist that capture how endogenous APA can alter the PK and biodistribution of the drugs, particularly nanomedicines such as PEG-liposomes. Previously, we developed a 2compartment minimal PBPK model that captures APA-mediated accelerated blood clearance of PEG-liposomes (PL) [45,46]. While useful in predicting the PK of PEGylated drugs over long timescales, that model was unable to reveal the impact of APA on either biodistribution to different organs, or early phase clearance of PEGylated drugs. In this work, we thus sought to utilize a more comprehensive PBPK model that captures potential APA-mediated clearance of PEGylated liposomal and protein drugs to all major organs of distribution (Fig. 1). Leveraging high-resolution PET/CT scans of radiolabeled PEG-liposomes and PEGuricase performed immediately following dosing to PEG-sensitized vs. naïve animals, we were able to verify that our PBPK model can accurately recapitulate the systemic PK and biodistribution of PEG-liposomes and PEG-uricase to liver, spleen, lung, kidney, and muscle in naïve and APA+ mice with high temporal resolution.

2. Materials and methods

2.1. Production of empty PEG-liposomes (PL) for APA-induction

The PL used for induction were composed of phosphatidylcholine, cholesterol, and methoxy-PEG 2000 DSPE at a molar ratio of 39:56:5 [47]. The lipids were dissolved in a 2:1 chloroform: methanol solution in a glass vial and evaporated with nitrogen gas to form a thin film. This film was desiccated overnight. The following day, PBS heated to 50 °C was added to the vial, which was sonicated at 15 30-s intervals. The liposomes in PBS solution were then extruded 9 times each at a controlled temperature of 50 °C through 400 nm and 100 nm filters. The liposomes were characterized with a Malvern Zetasizer Nano ZS (Malvern Instruments, Malvern, UK) via intensity PSD and confirmed to be

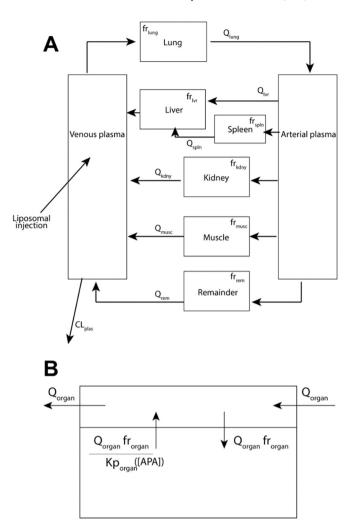


Fig. 1. (A) Schematic diagram of the PBPK model. (B) Illustration of PK within each organ compartment.

130 nm in diameter with PDI < 0.2.

2.2. Induction of APA in immunocompetent BALB/c mice

Female and male BALB/c mice (Charles River Labs) aged 4–5 weeks were used in this study. Animal procedures used in this study were approved by the University of North Carolina at Chapel Hill Institutional Animal Care and Use Committee. All mice were housed in non-sterile cages with constant access to food and water. To induce APA, mice were intravenously dosed with 150 μ L (0.1 μ mol lipids/kg bodyweight at 6 mL/kg) of PL in sterile PBS on Day 0, or 7 days prior to PET/CT imaging studies; APA-naïve mice (negative control) received PBS alone. On Day 6, a mandibular bleed was performed on each mouse. 200uL whole blood was transferred in EDTA tubes on ice. The blood was centrifuged at 2000 rcf for 15 min to separate the plasma. Samples were stored at 4 °C prior to ELISA assay and moved to -80 °C for long-term storage. IgG and IgM APA in the plasma were quantified via competition ELISA, following the methods described previously [46] (Table S.1).

2.3. Quantitation of APA titers

We determined the concentration of IgG and IgM APA via competition ELISA, run in duplicate for reproducibility. 96-well plates (Corning Costar 3695) were coated with DSPE-PEG5000 and stored overnight at 4 °C. They were then blocked for 1 h at room temperature with 5% milk in $1 \times$ PBS. Plasma samples were diluted 50-fold and 400-fold in 1%

milk, and tested in duplicate wells. Competition wells consisted of plasma at 50- or 400- fold dilution in 1% milk with 8 kDa PEG. The standard curve consisted of serial dilutions of mouse anti-PEG IgG (Silver Lake, CH2076) and IgM (Academia Sinica, AGP4 (AGP4-PABM-A)). After overnight incubation at 4 °C, goat anti-mouse IgG (Invitrogen, A28177, lot TG2596484) or IgM (ThermoFisher Life Technologies, 626,820, lot QB215229) conjugated to HRP was added to the wells. The plates were incubated for 1 h at room temperature. The colour change was initiated by TMB and stopped with 1 N HCl, and absorbance was measured at 450 and 570 nm. IgG and IgM concentrations were calculated based on 5-parameter logistic regression on the standard curve rows. The ELISA assays sensitively detected APA levels in excess of 0.6 $\mu g/mL$ IgG and 0.2 $\mu g/mL$ IgM. IgG and IgM APA below this level did not lead to appreciable accelerated blood clearance of PEG-liposomes [46].

2.4. Preparation of radio-labeled PL for PET/CT imaging

PL, with ~4% of lipids containing methoxy-PEG and 1% mol of the lipid containing amine-terminated PEG (PEG-NH₂) groups that allow for chelator conjugation needed for radiolabeling, were obtained from Encapsula NanoSciences. The composition of this commercial PL included lipids in the following ratio: Hydrogenated Soy Phosphatidylcholine: cholesterol: DSPE-PEG(2000): DSPE-PEG(2000)-Amine at a molar ratio of 57:38:4:1 (lots IMS2007-08272019, IMS2007-04162019, and IMS2007-07212020). The liposomes were radiolabeled with ⁶⁴Cu chelated with DOTA or ⁸⁹Zr chelated with Df (p-SCN-Bn-deferoxamine lot B70510004-150407) by conjugating the chelators to amine groups at a 20-fold molar excess to ensure complete reaction of the amines [48]. Purification and stability studies for the first scan group, using DOTA as a chelator, were conducted using a 30 kDa spin filter, and produced 36% yield. The signal of the product was still sufficient through 48 h, far longer than the initial phase of interest for this study, and the stability of the recovered Cu-DOTA-liposome was confirmed ~90% through at least the first 4 h. Purification for the second scan group was conducted using a PD-10 column and the 24 h stability of the radiolabeled sample remained approximately 90%. Purification for the third scan group, using Df as a chelator and Zr as the label, resulted in approximately 67% yield with 4-h labeling stability once again close to 90% and 24-h labeling stability of 66%. All stability tests were conducted after incubating radiolabeled sample in saline at 37 °C. The zeta potential of the liposomes conjugated with Df indicated that they were approximately neutral (-4.9 mV +/- 0.7 mV), suggesting most of the amines were indeed conjugated with Df, and that cationic charge from amine groups

2.5. PET/CT imaging

On day 7, mice underwent PET/CT imaging with radiolabeled PL. Naïve and APA+ mice (n=6 for each cohort) were imaged. The mice were scanned in three groups of four mice each, with n=2 from each cohort in each scan group (Table S.2). Imaging was performed using a small animal PET/CT scanner (SuperArgus_4R, Sedecal, Inc. Spain). Mice were anesthetized with inhalation of 1.5%–2.5% isoflurane-oxygen gas mixture. Radiolabeled PL (5–7 MBq, estimated ~2.1 µmol of PL) was administrated through tail vein catheter, followed immediately by a 60 min dynamic PET scan. CT was conducted for anatomical reference and attenuation correction. Repeated PET/CT imaging (~20 min of PET acquisition) was conducted at 3, 24, and 48 h post injection of radiolabeled PL. After the final imaging, major organs were collected and weighed, and radioactivity was further measured using a gamma counter to verify PET/CT results.

PET images were reconstructed using the 3D-OSEM algorithms with scatter, attenuation, and decay correction. Standardized uptake value (SUV) was calculated voxel-wise by normalizing the signal to the injection dose and animal body weight. Image analysis was conducted using PMOD software (version 3.9). Regions of interest (ROI) were delineated based on fused PET/CT images, and the uptake level of each ROI was reported in mean %ID/g.

2.6. PBPK model

A system of Ordinary Differential Equations (ODEs) (Fig. 1, Eq. 1–8) was developed for the present focus to replicate the high-resolution PET/CT scan data. Each organ was treated as a well-stirred compartment, and drug transfer from blood to tissue was assumed to follow Fick's law of diffusion. A remainder compartment was considered to maintain the mass balance of drugs in the system. We assumed tissue distribution rate to be primarily restricted by liposomes' vascular permeability due to their approximately 100 nm (80–130 nm) size. The average concentration vs. time profiles in each compartment were reported. We assumed that the radioactivity signal primarily originated from the vascular and interstitial sub-compartments, as 100 nm liposomes are likely too large to permeate the deep tissue cellular layers. Transfer between compartments was driven by blood flow. The amount of drug reaching and being retained by each organ was adjusted by perfusion and permeability coefficients.

$$\frac{dDrug_{plas}}{dt} = 1 / V_{plas} \cdot \left(-Drug_{plas} \cdot CL_{plas} \right) - Qt_{lung} \cdot fr_{lung} \cdot Drug_{plas} / V_{plas} + \left(Qt_{lvr} \cdot fr_{lvr} + Qt_{spln} \cdot fr_{spln} \right) / V_{plas} \cdot \left(Drug_{lvr} / Kp_{lvr} \right)$$

$$+ Qt_{musc} \cdot fr_{musc} / V_{plas} \cdot \left(Drug_{musc} / Kp_{musc} \right) + Qt_{kdny} \cdot fr_{kdny} / V_{plas} \cdot \left(Drug_{kdny} / Kp_{kdny} \right) + Q_{rem} \cdot fr_{rem} / V_{plas} \cdot \left(Drug_{rem} / Kp_{rem} \right)$$

$$(1)$$

$$\frac{dDrug_{lvr}}{dt} = 1 / V_{lvr} \bullet \left(Qt_{lvr} \bullet fr_{lvr} \bullet Drug_{art} - \left(Qt_{lvr} \bullet fr_{lvr} + Qt_{spln} \bullet fr_{spln} \right) \bullet Drug_{lvr} / Kp_{lvr} \right) + Qt_{spln} \bullet fr_{spln} / V_{lvr} \bullet \left(Drug_{spln} / Kp_{spln} \right) - Drug_{lvr} / (Kp_{lvr} \bullet V_{lvr}) \bullet CL_{lvr}$$
(2)

$$\frac{dDrug_{kdny}}{dt} = Qt_{kdny} \cdot fr_{kdny} / V_{kdny} \cdot \left(Drug_{art} - Drug_{kdny} / Kp_{kdny}\right) - Drug_{kdny} / \left(Kp_{kdny} \cdot V_{kdny}\right) \cdot CL_{kdny}$$
(3)

is not expected to impact their biodistribution patterns. No signal was detected in the bone of the mouse for the duration of study, indicating that the radiolabel remained attached to the PL, since free label typically accumulates in the bone [49,50].

$$\frac{dDrug_{spln}}{dt} = Qt_{spln} \bullet fr_{spln} / V_{spln} \bullet \left(Drug_{art} - Drug_{spln} / Kp_{spln}\right)$$
(4)

$$\frac{dDrug_{musc}}{dt} = Qt_{musc} \cdot \hat{fr}_{musc} / V_{musc} \cdot (Drug_{art} - Drug_{musc} / Kp_{musc})$$
 (5)

Table 1Physiological parameters in the PBPK model in 20 g mice.

Parameter	Interpretation	Value	Ref
Qt_{lvr}	Plasma flow through liver (mL/min)	1.1	[44]
Qt_{kdny}	Plasma flow through kidney (mL/min)	0.8	[44]
Qt_{spln}	Plasma flow through spleen (mL/min)	0.05	[44]
Qt_{musc}	Plasma flow through muscle (mL/min)	0.8	[44]
Qt_{lung}	Plasma flow through lung (mL/min)	4.38	[44]
V_{lvr}^{whole}	Volume of liver (g)	1.75	[51,52]
V_{kdny}^{whole}	Volume of kidney (g)	0.32	[51,52]
V_{spln}^{whole}	Volume of spleen (g)	0.1	[51,52]
V_{musc}^{whole}	Volume of muscle (g)	7.6	[51,52]
V_{lung}^{whole}	Volume of lung (g)	0.12	[51,52]
V_{plas}	Volume of venous blood plasma (mL)	0.67	[53]
V_{art}	Volume of arterial blood plasma (mL)	0.67	[53]
$PlasFracV_{lvr}$	Fraction of volume of murine liver comprised of plasma	0.155	[51,53]
$PlasFracV_{kdny}$	Fraction of volume of murine kidney comprised of plasma	0.120	[51,53]
$PlasFracV_{spln}$	Fraction of volume of murine spleen comprised of plasma	0.085	[51,53]
$PlasFracV_{musc}$	Fraction of volume of murine muscle comprised of plasma	0.020	[51,53]
$PlasFracV_{lung}$	Fraction of volume of murine lung comprised of plasma	0.250	[51,53]

$$\begin{split} &\frac{dDrug_{art}}{dt} = Qt_{lung} \bullet fr_{lung} \Big/ V_{art} \bullet \Big(Drug_{lung} \Big/ Kp_{lung} \Big) - Drug_{art} \bullet \Big(Qt_{lvr} \bullet fr_{lvr} / V_{art} \\ &+ Qt_{musc} \bullet fr_{musc} / V_{art} + Qt_{spln} \bullet fr_{spln} / V_{art} + Qt_{kdny} \bullet fr_{kdny} / V_{art} + Q_{rem} \bullet fr_{rem} / V_{art} \Big) \end{split}$$

$$\frac{dDrug_{lung}}{dt} = Qt_{lung} \cdot fr_{lung} \cdot Drug_{plas} / V_{lung} - Qt_{lung} \cdot fr_{lung} \cdot Drug_{lung} / \left(V_{lung} \cdot Kp_{lung}\right)$$

$$\frac{dDrug_{rem}}{dt} = Q_{rem} \cdot fr_{rem} / V_{rem} \cdot (Drug_{art} - Drug_{rem} / Kp_{rem})$$
(8)

All physiological parameters, including blood flows and tissue volumes, were taken from the literature (Table 1) [44,51-53]. The interstitial tissue volume (V_{organ}) values were obtained by subtracting the respective vascular plasma contribution from the total organ volume (Table 1). For example, $V_{lvr} = (1 - PlasFracV_{lvr}) \times V_{lvr}^{whole}$. The initial values of the partitioning coefficients (Kp_{tissue}) were determined by taking the ratio of area under the curve (AUC) between tissue and plasma, which were then optimized (Table S.2) [54]. The apparent permeability coefficients of liposomes across vascular membrane were also optimized, accounting for the intrinsic permeability and the impact of other variables at in vivo conditions (shear stress, osmotic pressure, etc.) (Table S.2). Initial conditions were determined from the peaking time of tissue profiles in the data. The model was initialized at the point at which the total PET signal stabilized in the mouse, at approximately 1 min post-injection. The system was solved numerically using MATLAB's ode15s function (MATLAB R2019a). The PET data for each organ included total signal from both the tissue and residual blood plasma. Therefore, when comparing the model output to the data, we computed a weighted average of PL contained in each organ's tissue and plasma. Parameters were optimized to obtain individual fits for each mouse using Latin Hypercube Sampling (LHS) (Table S.2) [55]. We furthermore used Partial Rank Correlation Coefficients (PRCC) to determine output sensitivity versus model parameters [56,57]. Brief descriptions of LHS

and PRCC are provided in the Supplemental information. The high temporal resolution of the continuous scan alleviates many concerns of implementing a model in which several parameters are optimized.

3. Results

3.1. PET/CT imaging reveals APA quickly eliminates PEG-liposomes from the circulation

In our previous study that relied on quantifying doxorubicin levels in the blood and different organs collected from sacrificed animals, we were unable to gain insights into the PK and biodistribution of Doxil® between 5 mins and 3 h post-infusion. In contrast, PET/CT imaging, by tracking the PK and biodistribution of radiolabeled entities in the same mouse in nearly continuous time, can accurately reveal the physiological fate of drugs and drug carriers with unparalleled temporal resolution even with just a small number of animals (Fig. 2A). To investigate the temporal dynamics with which APA can mediate clearance of PEGylated drug carriers, we thus performed PET/CT imaging in naïve and PEG-sensitized mice infused with radiolabeled PEG-liposomes.

All mice exhibited a rapid initial re-distribution of PL signals within the first minute of infusion. Naïve mice then exhibited very little change in plasma PL over the first hour, retaining $\sim\!50\%$ of the total signal (i.e., injected dose) (Fig. 2B). Of the remaining 50% of the PL radioactivity, $\sim\!30\%$ was found in the liver, with a steady level observed throughout the first hour of the scan. Muscle mass comprised $\sim\!10\!-\!20\%$ of the total signal, but was generally very noisy and reflected low, diffuse concentrations. Roughly 1% of the signal was present in the spleen, $\sim\!2.5\%$ in the lung, and $\sim\!3\!-\!4\%$ in the kidney at 1 h after dosing. The trends in change in radioactivity signal over time for the lung and kidney

(7)

In contrast, PL-sensitized mice with substantial APA titers exhibited rapid and extensive clearance of PL from the systemic circulation within the first hour post-infusion, retaining only ~20% of the injected dose in the circulation at the end of the first hour, less than half of the signal measured in the naïve mice. Much of the clearance from the systemic circulation appeared to occur within the first 10-15 min. We found a corresponding increase in PL radioactivity in the liver over the same time frame, accounting for nearly 75% of the injected dose. The dominant hepatic accumulation is consistent with APA-mediated clearance by Kupffer cells and LSECs. In contrast, the spleen, the lung, and the kidney retained only \sim 2%, \sim 1%, and \sim 2.5% of the PL-associated radioactivity at the end of the first hour. The difference in the measured radioactivity by the end of the first hour translates to statistically significant differences in the AUC in the plasma and liver between naïve and PL-sensitized, APA+ mice even within such short duration (p < 0.001, Welch's t-test) (Fig. 2C).

Unfortunately, by 24 h post-infusion, we were unable to detect appreciable radioactivity in the plasma from PET/CT imaging (data not shown), which is far shorter than the half-life of PL such as Doxil® established from earlier studies [46]. We believe this is unlikely

attributed entirely to the natural decay in radioactivity of 64 Cu, as we were also unable to detect a signal from PL labeled with 89 Zr. Instead, the most likely explanation is that the amine-functionalized PL preparations purchased commercially and used for tracing were not as stable as clinical formulations of PL, such as Doxil®. We thus only utilized PET/CT data from the first hour post-infusion in validating our PBPK model.

3.2. PBPK model accurately captures early phase APA-mediated clearance of PL

We first sought to confirm that our PBPK model can accurately reproduce the PK and biodistribution of PL in the absence of APA over the first hour, using parameter values that are reflective of the mouse anatomy and physiology. We systematically selected and tested combinations of the unknown parameters, while fixing the physiologically known parameters. When calibrating our model, we used a threshold of no more than 10% error between the data and model prediction for each organ (normalized to total signal in the mouse) to stop the optimization process; for most of the data, the error associated with the optimal parameter combination was less than 5%. With minimal optimization, our PBPK model accurately reproduced not only the correct concentration of PL in both plasma and the major organs of interest, but also the change in concentrations over time (Fig. 3A, Supp Fig. S1-S2). We noticed appreciably greater variations in the data from model predictions in the initial few minutes post-infusion (Supp Fig. S3), which are likely attributed to fluctuations in the initial PET signal immediately following infusion. We also noticed generally greater relative error between model prediction and PET/CT measurements of the muscle compartment, which is likely attributed to the low intensity of the signal in this organ resulting in a low signal-to-noise ratio (Supp Fig. S3).

We next assessed the ability of our PBPK model to recapitulate APA-mediated clearance of PL from the blood to the liver and spleen. In our previous work on developing a minimal PBPK model for APA-mediated clearance of PL [46], we had already developed the algorithms to tally the rates of APA accumulation on PL over time as a function of APA titers. Thus, for the current more comprehensive PBPK model, once we validated our ability to model the fate of PL over time in the absence of APA, we simply needed to account for the affinity between APA/PL complexes and the accumulation potentials on key organs (captured in the *Kp* value for each organ). With these additions, our model was able to capture the initial transient dynamics of PL circulation and accumulation in different organs in mice with substantial APA titers (Fig. 3B, Supp Fig. S1-S3). Not surprisingly, AUC predictions from the model closely matched experimental measurements (Fig. 4, Supp Fig. S2).

PBPK models can make predictions that are often difficult to directly test in vivo. For instance, PET/CT imaging does not offer the resolution needed to differentiate the fraction of drug found in the blood vasculature within an organ vs. in the cells/tissue interstitium. Utilizing parameters that are largely consistent with other PBPK models (and thus reflective of the mouse physiology), our PBPK model predicts that a substantial fraction of PL begins to distribute to the liver within the first 5 min post infusion, initially within the blood vasculature. It is at this point that the time series curves tracking PL in plasma of naïve and APA+ mice began to diverge. In naïve mice, residual blood (in the liver) continued to account for most of the predicted signal in the liver. In contrast, in APA+ mice, the model predicts that within 15 min, a substantial fraction of PL can begin to extravasate from local blood vasculature into the cells and tissues, with the amount of PL in the cells and tissues in the liver dominant over the amount in the local plasma subcompartment. Such preferential distribution of PL was necessary for the model to faithfully reproduce the observed plasma PK and biodistribution data in both naïve and PL-sensitized, APA+ mice. Indeed, while all of the APA+ mice had a distinct extravasation point in the liver compartment, none of the naïve mice exhibited this behavior. Consistent with physiological trends in the data, the rate of change in drug

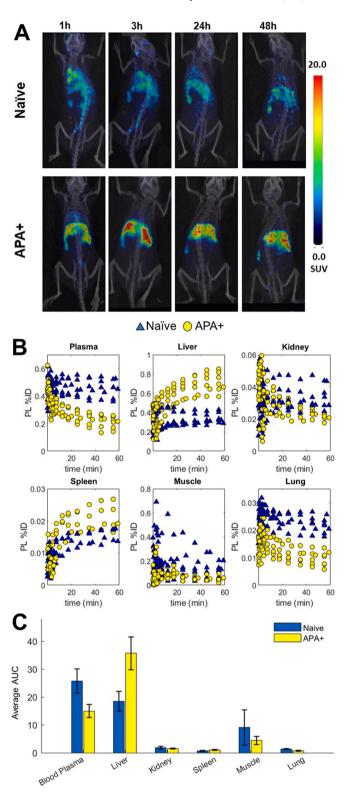


Fig. 2. (A) PET/CT imaging for a representative APA+ and naïve mouse. Note the substantial liver uptake within the first hour of study, particularly in the APA+ mouse. (B) Quantity of PL in the blood and different organs in APA-sensitized (n=6, yellow filled circle) vs. naïve (n=6, blue filled triangle) mice: (i) Blood, (ii) Liver, (iii) Kidney, (iv) Spleen, (v) Muscle, and (vi) Lung. (n=100% Lung. (C) Comparison of 1 h AUC of percent injected dose in each organ for APA-sensitized vs. naïve mice. Error bars represent standard deviation. (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article.)

distribution to the lung and kidney compartments tended to mirror those in the plasma (which indicates no appreciable distribution to cells and tissues within those organs, as the data and model both suggest that much of the signal was attributed to the plasma present in those organs). In contrast, the concentrations in the spleen tended to mirror those in the liver, consistent with the abundance of cells with Fc receptors that can intercept and retain APA-immune complexes.

3.3. PBPK model also recapitulates APA-mediated clearance of PL over long timescales

Finally, our goal was to develop a comprehensive PBPK model that can recapitulate not only the early fate of PEGylated drug carriers but also their PK and biodistribution over longer timescales. To assess the predictive power of our model over the course of days, we tested our model against our prior data set, capturing the fate of Doxil® (PEGylated liposomal doxorubicin) in mice with and without APA [46]. The APA+ mice in this data set possessed anti-PEG IgG levels of $\sim 0.3 \, \mu g/mL$, enough to induce ABC of PL, but lower than the APA levels in PLsensitized mice from our PET/CT studies. We had to fine-tune model parameters to account for the fact that Doxil® has a longer systemic persistence than the PL used in our PET/CT studies. Our model accurately recapitulated the PK and biodistribution of the drug in the liver, lung, and spleen over a 96-h period (Fig. 5), underscoring the model's ability to capture the fate of PL at both short and long timescales. It should be noted that minimal tuning of the other model parameters was necessary, and the only notable difference was lower splenic uptake of Doxil® at later time points. This suggests that the model accurately captures the physiology of APA-mediated accelerated clearance, and that it is generally adaptable to predicting PK of other drugs and assessment through alternate experimental designs.

3.4. PBPK model also captures the behavior of PEGylated protein in mice and humans

To test the generalizability of our model to PEG-protein drugs, we next tested our model output on a recently published PET/CT imaging data set measuring the PK and biodistribution of PEG-uricase in naïve and APA+ mice [58]. Notably, PEG-uricase can readily induce APA that

leads to accelerated blood clearance of the drug and loss of efficacy [13,14]. In this data set, APA were induced in mice by injection of PEG-uricase approximately two weeks prior to the imaging study, and APA titers were measured and confirmed to be above the threshold for ABC [58]. After accounting for differences in size and tissue permeability between PEG-uricase and PEG-liposomes, our PBPK model was able to accurately recapitulate the behavior of the PEG-uricase in both naïve (n=4) and APA+ (n=6) mice, as quantified by the concentration estimated and measured in the plasma, liver, kidney, muscle, and lung (Fig. 6). The extent of variations between model predictions and experimental measurements was small and comparable to the PL data. The optimal parameter sets for capturing PEG-uricase clearance were very similar to those utilized for modeling PL, with the exception that permeability of the drug was slightly increased due to the smaller size of uricase compared to PEG-liposomes.

To demonstrate the potential clinical utility of our PBPK model, we next evaluated our model's ability to recapitulate the circulation of PEGuricase in humans [13]. Given the clinical sampling nature, only plasma uricase activity was reported; from the activity, we could approximate PEG-uricase concentration in the plasma and normalize to the full injected dose. The model was adapted to simulate an average 71 kg male, utilizing previously determined physiological parameters for organ volume and blood flow available in the literature [59]. We again found very good agreement between our PBPK model predictions and the reported PEG-uricase activity in both patients with accelerated and non-accelerated clearance of the PEG-uricase (Fig. 7). This serves as a compelling proof of concept for the clinical utility of our model in future work guiding the dosing of PEG-uricase, and possibly other PEGylated therapies.

4. Discussion

Numerous clinical trials have shown that the human immune system can secrete APA – effectively a form of ADA – that in turn can directly reduce efficacy and/or trigger hypersensitivity reactions to at least select PEGylated therapeutics. A distinguishing feature of APA vs. classical ADA is that APA can be present prior to initial dosing of therapeutics and can also be elicited by other therapies containing PEG or PEG-conjugates. Furthermore, while clinical studies to date indicate

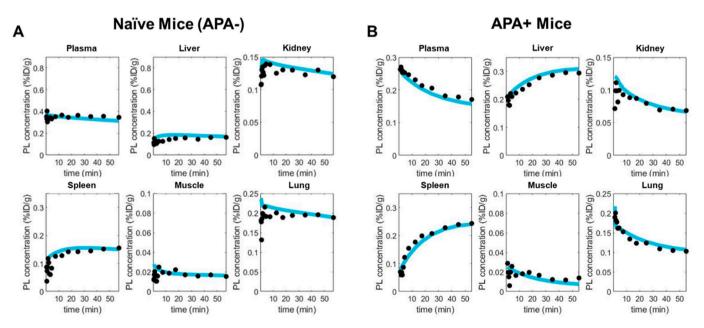


Fig. 3. Comparison of PBPK model predictions vs. in vivo PET/CT imaging data for (A) a representative naïve mouse and (B) a representative APA+ mouse (37 μg/mL IgG), reported as %ID/g (1 = 100%ID/g). Black closed circles represent measurements from PET/CT imaging, whereas turquoise line represents predictions from PBPK model. (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article.)

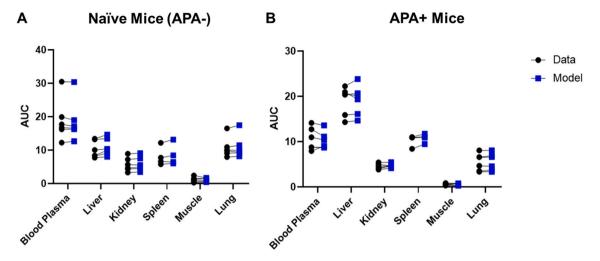


Fig. 4. AUC at 1 h time point for n = 6 individual mice, predicted by the PBPK model (blue filled square) vs. PET/CT data (black filled circle), for (A) naïve and (B) APA+ mice. AUC values were computed from %ID/g in each organ as a numerical integral in MATLAB. (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article.)

only a small number of PEGylated drugs are impacted by APA, those clinical studies effectively reflect *only* the immunogenicity profiles of the PEGylated drugs being investigated, as the primary and secondary endpoints generally focus on the safety and efficacy of the drug following repeated dosing. Due to the nature of the study design, these clinical studies typically do not reflect the efficacy and safety of the PEGylated drugs when dosed into patients with high APA titers elicited by other means, for instance by other more immunogenic PEGylated drugs. Given the increasing number of PEGylated drugs that are FDA-approved or in clinical development, including the unprecedented scale with which mRNA vaccines stabilized with PEG-lipid conjugates are deployed because of the COVID pandemic, we are likely entering a new era where the polypharmacy risks associated with APA are greater than ever before. In turn, this likely necessitates a new series of tools and approaches for addressing the APA polypharmacy issues.

PBPK models offer a powerful tool to understand, interpret and possibly intervene in risks presented by APA to patients, even in the absence of data from controlled clinical trials. Although a number of mathematical models have been published [60,61], quantitative insights into the interactions between ADA and their therapeutic targets

remain very limited. Indeed, it is difficult to experimentally tease apart complex binding interactions in living systems. The likely demand for more powerful predictive tools for APA motivated us to expand on our minimal PBPK model to develop a comprehensive PBPK model that can accurately recapitulate the circulation profiles of PEGylated protein drugs and liposomes in the presence of APA. While PBPK modeling is largely mechanistic, the combination of mechanistic and data-driven approaches in such models improves their accuracy and predictive ability [62-64]. Here, we validated our PBPK model against both PK and biodistribution data from PET/CT imaging as well as classical assessment of drug concentrations. Our PBPK model was able to accurately recapitulate the in vivo fate of PL and PEG-uricase at both short and long timescales. We believe our model not only can guide animal studies of PEG-immunogenicity, but also serves as a promising platform for interpreting the impact of APA in PEG-sensitized patients in clinical settings.

From both experimental studies and model predictions, it is abundantly clear that PL are rapidly cleared from the systemic circulation in APA+ mice, with liver representing the dominant organ of distribution. In contrast, naïve mice exhibited substantially slower clearance, with PL

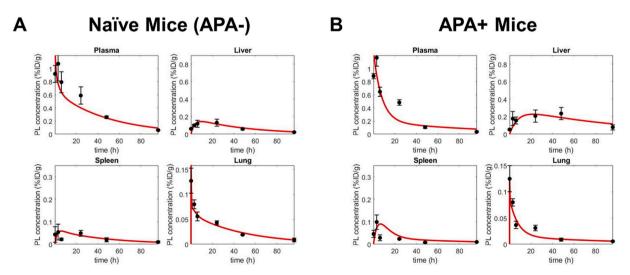


Fig. 5. PBPK model recapitulates Doxil® pharmacokinetics and distribution in (A) naïve mice and (B) APA+ mice over 96 h, reported in %ID/g (1=100%ID/g). Black closed circles represent Doxil® levels measured by HPLC from Ref [46], whereas red line represents predictions from the current PBPK model. This data reflects the average Doxil® level from 3 mice sacrificed at each time point (5 min, 3 h, 6 h, 24 h, 48 h, 96 h). Error bars represent standard deviation. (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article.)

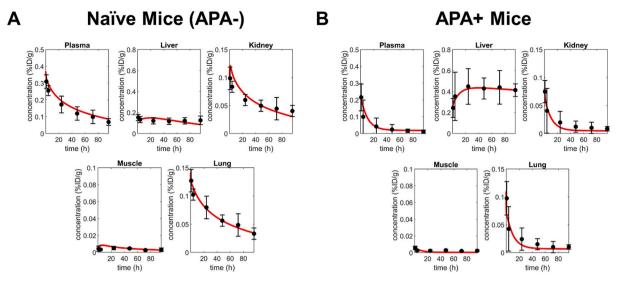


Fig. 6. PBPK model recapitulates PEGylated uricase pharmacokinetics and distribution in (A) naïve mice and (B) APA+ mice over 96 h, reported in %ID/g (1 = 100% ID/g). Black closed circles represent PEG-uricase levels measured by PET/CT from Ref [58], whereas red line represents predictions from the current PBPK model. This data reflects the average PEG-uricase level from 4 (naïve) and 6 (APA+) mice scanned at each time point (1 h, 4 h, 24 h, 48 h, 72 h, 96 h). Error bars represent standard deviation. (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article.)

levels in the spleen comparable to or above those in the liver. Assuming the vasculature and general tissue permeability that governs extravasation of PL should be the same between naïve and APA+ mice, our PBPK model indicates that the distinct PK and biodistribution of PL driven by APA must be attributed to interactions between cells possessing Fc receptors that can bind extravasated APA/PL immune complexes. In other words, the primary driver of APA-mediated clearance of PL from the circulation is unlikely due to preferential distribution of PL from the circulation into a local plasma compartment, but rather enhanced retention of PL that has already been distributed to the liver. Not surprisingly, due to the abundance of cells possessing FcR in the liver, the liver is the dominant organ of APA clearance.

Some disparity between the predicted and observed blood plasma concentrations and clearance can be attributed to the use of PET data from the heart as a proxy for plasma. This data collection process may have captured a low level of additional heart tissue signal, which could

not be determined at a high enough resolution to separate. The initial peaks of signal post-injection may not have been fully captured during PET imaging due to image resolution, saturation, and binning limitations. It is also acknowledged that minimal free ⁶⁴Cu or ⁸⁹Zr isotope accumulation by the intracellular compartments could have contributed to some of the observed PET signals. There is also the possibility of minimal signal in organs not specifically accounted for, such as the brain, though this has been absorbed into the "remainder" compartment. However, Cu labeling is a common and accepted method for tracking biodistribution with consistent signals [65,66].

In conclusion, we have demonstrated the ability to track the fate of PEGylated liposomal drug carriers and PEG-uricase while capturing certain complexities of physiology that may significantly impact the dynamics of APA-mediated clearance with high temporal resolution. This multi-compartment PBPK model holds promise for answering questions about the dynamics of APA in systemic circulation. More

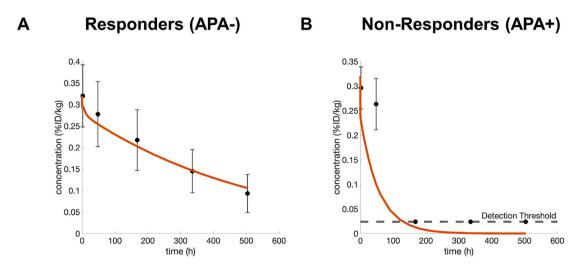


Fig. 7. PBPK model recapitulates PEGylated uricase pharmacokinetics and distribution in (A) PEG-uricase responders with typical clearance of the drug, and (B) PEG-uricase non-responders who exhibit accelerated clearance of PEG-uricase, reported in MID/kg (1 = 100MID/kg). Black closed circles represent PEG-uricase levels approximated by uricase activity measurements from Ref [13], whereas red line represents predictions from the current PBPK model. This data reflects the average PEG-uricase level in plasma sampled from 17 (standard clearance; responder) or 13 (accelerated clearance; transient or non-responder) patients at each time point (2 h, 48 h, 7d, 14d, 21d). Error bars represent standard deviation. It should be noted that the equipment tolerance from Ref [13] allowed a minimum value equivalent to about 0.02MID/kg. (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article.)

broadly, we expect future iterations of the model to provide important mechanistic insights into APA-mediated clearance of other PEGylated drugs with diverse physicochemical properties, monoclonal antibodymediated clearance of pathogens, and other ADA-mediated processes. With this PBPK model, we can explicitly track the binding dynamics of various species in the system, as a multiscale process, rather than as an average phenomenon related to how their effects are propagated. The model lays a framework for testing possible interventions to mitigate APA-mediated accelerated blood clearance. For example, we have previously shown that pre-injection with a high molecular weight free PEG (unbound to drug carriers) can increase the circulation time of PEGylated therapeutics even in the presence of APA [45]. When free PEG is injected into the bloodstream, the APA form complexes with and clear the PEG rather than the drug [45]. Future modeling efforts aim to incorporate the dynamics of free PEG interactions with APA and PEGliposomes, with the goal of preventing APA-mediated clearance and thus enabling the safe and efficacious use of PEGylated therapeutics in individuals with APA.

Code availability

The code for implementing our ODE system is available at: htt ps://github.com/DrWessler/Experimental-data-and-PBPK-modeli ng-quantify-antibody-interference-in-PEGylated-drug-carrier-deliver

Authors' contributions

All authors contributed to the study conception and design. Material preparation and data collection were performed by A.M.T, M.D.M., M.K. R., T.Z., Z.L., J.E.F., and H.Y. Modeling and data analysis were performed by A.M.T. and T.W. The first draft of the manuscript was written by A.M.T. and all authors commented on previous versions of the manuscript. All authors read and approved the final manuscript.

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Declaration of Competing Interest

The authors have no conflict of interest to disclose.

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Appendix A. Supplementary data

Supplementary data to this article can be found online at https://doi.org/10.1016/j.jconrel.2022.01.022.

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