

www.mdpi.com/journal/pharmaceutics

Article

Development of a Physiologically-Based Pharmacokinetic Model of the Rat Central Nervous System

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Received: 7 November 2013; in revised form: 26 February 2014 / Accepted: 6 March 2014 / Published: 18 March 2014

Abstract: Central nervous system (CNS) drug disposition is dictated by a drug's physicochemical properties and its ability to permeate physiological barriers. The blood-brain barrier (BBB), blood-cerebrospinal fluid barrier and centrally located drug transporter proteins influence drug disposition within the central nervous system. Attainment of adequate brain-to-plasma and cerebrospinal fluid-to-plasma partitioning is important in determining the efficacy of centrally acting therapeutics. We have developed a physiologically-based pharmacokinetic model of the rat CNS which incorporates brain interstitial fluid (ISF), choroidal epithelial and total cerebrospinal fluid (CSF) compartments and accurately predicts CNS pharmacokinetics. The model yielded reasonable predictions of unbound brain-to-plasma partition ratio (Kp_{uu brain}) and CSF:plasma ratio (CSF:Plasma_u) using a series of in vitro permeability and unbound fraction parameters. When using in vitro permeability data obtained from L-mdr1a cells to estimate rat in vivo permeability, the model successfully predicted, to within 4-fold, Kpuu, brain and CSF: Plasmau for 81.5% of compounds simulated. The model presented allows for simultaneous simulation and analysis of both brain biophase and CSF to accurately predict CNS pharmacokinetics from preclinical drug parameters routinely available during discovery and development pathways.

Keywords: physiologically-based pharmacokinetic model; blood-brain barrier; cerebrospinal fluid; unbound fraction; brain

1. Introduction

Quantification of central nervous system (CNS) drug levels in brain interstitial fluid (ISF) and cerebrospinal fluid (CSF) is often achieved by complex *in vivo* experimental procedures, such as microdialysis. This technique has the inherent advantage of directly measuring the concentration of unbound drug in the accessible brain biophase under non-steady state and steady-state conditions [1,2], reflecting both drug influx and efflux processes acting within the CNS. To be able to quantify the brain pharmacokinetics of a compound of interest, microdialysis offers the advantage of multiple time-point sampling within the same animal, although the procedure leads to local tissue damage around the site of probe insertion [3,4] and is an experimental procedure often limited to lower-species, although neuroimaging techniques, such as positron emission tomography, have been utilised in both lower- and higher-species to quantify temporal drug concentrations in brain [5]. Microdialysis and PET (positron emission tomography) are often considered the "gold-standard" for assessing (regional) brain disposition of drugs, but can be limiting due to their technical and experimental complexity, which may hinder widespread use in pre-clinical studies.

The ability to determine the relationship between systemic exposure and CNS drug disposition is an important focus for pharmaceutical industry and drug development programs. Typically, pre-clinical measurement of drug partitioning between the CNS (brain tissue and CSF components) and plasma to yield total brain-to-plasma concentration ratio, Kp_{brain} is conducted in rodents and Kp_{brain} is then converted to the unbound concentration ratio ($Kp_{uu,brain}$) by multiplication with plasma unbound drug fraction (fu_p) (Equation (1) *C*, total concentration; C_u , unbound concentration; V_u , unbound brain volume of distribution) [6]. The steady-state unbound brain-to-plasma ratio ($Kp_{uu,brain}$) (Equation (2)) or steady-state cerebrospinal fluid-to-plasma concentration ratios (CSF_u:Plasma_u and CSF:Plasma_u) (Equations (3) and (4) respectively) are routinely used to represent CNS disposition of pharmacologically active drugs within the CNS.

$$Kp_{\text{brain}} = \frac{C_{\text{brain}}}{C_{\text{plasma}}} \text{ and } Kp_{\text{uu,brain}} = \frac{Kp_{\text{brain}}}{Vu_{\text{brain}} \times fu_{\text{p}}}$$
 (1)

$$Kp_{uu,brain} = \frac{\int_0^\infty C_u brain \times dt}{\int_0^\infty C_u plasma \times dt} = \frac{AUC_{u,brain}}{AUC_{u,plasma}}$$
(2)

$$CSF_{u}:Plasma_{u} = \frac{\int_{0}^{\infty} C_{u}csf \times dt}{\int_{0}^{\infty} C_{u}plasma \times dt} = \frac{AUC_{u,csf}}{AUC_{u,plasma}}$$
(3)

$$CSF:Plasma_{u} = \frac{\int_{0}^{\infty} Ccsf \times dt}{\int_{0}^{\infty} C_{u}plasma \times dt} = \frac{AUC_{csf}}{AUC_{u,plasma}}$$
(4)

 $Kp_{uu,brain}$ and CSF_u :Plasma_u values less than 1 typically indicate restricted entry into the brain or CSF-compartments, predominantly a result of efflux or uptake transport proteins respectively, whereas

values greater than 1 indicate unrestricted entry into the brain or CSF, facilitated by active transport. Values close to unity indicate predominantly passive transport of drug.

A major factor in successful delivery of drugs to the CNS is circumvention of physiological barriers. The ATP-binding Cassette (ABC) efflux transporters P-glycoprotein [7], breast cancer resistance protein (BCRP) and several multidrug resistance-associated proteins (MRPs) are expressed at the BBB (blood-brain barrier) [7–10]. *Mdr1* knockout studies in mice reveal that P-glycoprotein significantly influences CNS disposition of both non-CNS targeted and CNS targeted therapeutics including amitriptyline, nortriptyline [11], olanzipine [12], buspirone, chlorpromazine, fluvoxamine, risperidone, zolpidem [13] and fexofenadine [14]. Similar reports of altered brain penetration of imatinib [15], oseltamivir [16] and genistein [17] have been reported in breast cancer resistance protein knockout mice. In addition to BBB-associated ABC transporters influencing CNS drug disposition, expression of highly restrictive tight junction complexes at the BBB (the transcellular electrical resistance is reported to be between 1000 and 1800 Ω cm² [18–20]) results in only limited passive diffusion of hydrophilic, low molecular weight (<400 Da) compounds [21] across the BBB into the CNS.

The blood-cerebrospinal fluid barrier (BCSFB) also can regulate entry of compounds into the CNS [22] and is an important consideration when describing CNS drug disposition. The BCSFB is located next to the choroidal epithelium, a continuous single layer of polarized epithelial-like cells, possessing tight junctions [23], which line the surface of the choroid plexuses. There are important physiological differences between the BBB and BCSFB. *In vitro* measurements suggest the transcellular electrical resistance of the BCSFB is approximately 10- to 15-fold less than that of the BBB, at 80–100 Ω cm² [18–20]. Unlike the BBB, the choroid plexuses may be 10-fold greater than previous estimates, placing the surface area of the choroid plexuses may be 10-fold greater than previous estimates, placing the surface area within a similar order of magnitude to that of the BBB [24–28], and resulting in *in vivo* BCSFB clearance measurements, per gram of brain, which may be similar to or greater than that at the BBB [29]. However, both P-glycoprotein [30,31] and BCRP [31] have been reported to be expressed at the apical plasma membrane of the choroidal epithelium, and have the potential to transport drugs from the choroidal epithelium into the ventricular CSF. It is therefore important that the differential transport directionalities at the BBB and BCSFB sites are taken into consideration when attempting to predict drug disposition within the CNS.

Efflux transporter proteins at the BBB will therefore limit penetration of compounds into the brain and impact on CNS disposition, whereas efflux transports at the BCSFB will act to potentially enhance the accumulation of compounds in the CSF. Consequently, for highly effluxed drugs there is often a discrepancy between the effects of efflux at the BBB (influencing $Kp_{uu,brain}$) and the BCSFB (influencing CSF_u:Plasma_u) [32–34].

Clearly, the measurement of brain unbound concentrations would provide a better indicator for assessing CNS disposition, but microdialysis is not an option routinely employed, pre-clinically. However, determination of the extent of non-specific brain tissue binding (fu_{brain}), using brain slice and brain homogenate methods, is utilised to drive forward an understanding of overall brain drug penetration. Thus, an understanding of the role of drug transporter proteins at both the BBB and BCSFB coupled with knowledge of brain tissue binding is crucial in order to more effectively predict CNS drug disposition ($Kp_{uu,brain}$ and CSF_u :Plasma_u) and facilitate early pharmacokinetic predictions and selection of compounds for further development [13,35].

A key paradigm in CNS drug development is the prediction of brain accumulation of candidate compounds [36,37]. The application of physiologically-based pharmacokinetic modeling provides an approach to mechanistically incorporate routinely determined *in vitro* data, such as drug permeability and protein binding, into a pharmacokinetic model capable of estimating CNS drug disposition. There is, however, a significant lack of predictive models capable of quantifying CNS drug disposition. In non-physiological models, the CNS is described by either a 1-compartment model (representing brain) or a 2-compartment model (representing brain interstitial fluid and brain intravascular fluid (IVF)) with such models often being used in conjunction with brain microdialysis data to describe CNS drug disposition [2,3]. Semi-physiological models have also been proposed that attempt to mechanistically describe drug disposition within the brain [38–42] but are nonetheless hindered by the requirement for some *a priori* clinically-derived input data.

Recently Ball *et al.* [43] described the development of a whole-body physiologically based pharmacokinetic (PBPK) model for the prediction of unbound drug concentration-time profiles in the rat brain, utilising a mechanistic approach to described drug transfer across the blood–brain barrier. Despite this, there is a lack of fully mechanistic CNS PBPK models employed to describe CNS pharmacokinetics, which limits the application of such models to the prediction of CNS drug disposition.

A key challenge in predicting CNS drug disposition is the extrapolation of cell line-derived permeability data obtained *in vitro* to an *in vivo* permeability metric. *In vitro* permeability data derived from immortalised non-cerebral and cerebral cell lines [44–49] has been used previously to assess BBB penetration [50–52] despite clear phenotypic differences (e.g., efflux transporter expression profile, enzyme activity) between many of the cell lines used, e.g., Caco-2 (human colorectal adenocarcinoma cell line) and MDCK (Madin-Darby canine kidney cells), and blood–brain barrier endothelial cells.

Recently, positive correlations between drug permeability assessed in the L-mdr1a cell line (the LLC-PK1 porcine kidney cell line transfected with murine P-glycoprotein) and the extent of CNS drug disposition (Kp_{brain}) have been reported [53–55]. Of fundamental importance to this correlation is P-glycoprotein protein abundance in transfected cell lines compared to brain microvascular endothelial cells within the BBB. Recent progress in the quantification of absolute expression levels of P-glycoprotein in brain capillaries has estimated total *mdr1a* protein abundance in mouse brain capillaries to be 14.1 fmol/µg protein [56] and rat brain capillaries to be 19.1 fmol/µg protein [57] which is very similar to the *in vitro* protein abundance in L-mdr1a cells, 15.2 fmol/µg protein [54,55], but higher in comparison to that measured in human brain capillaries (6.06 fmol/µg protein) [54]. Such findings suggest data derived from L-mdr1a cells could be incorporated into predictive physiologically-based pharmacokinetic models and may prove useful in assessing CNS drug disposition for P-glycoprotein substrates.

In the present study we describe a predictive, physiologically-based pharmacokinetic model of the rat CNS which incorporates discrete brain and CSF components and is able to predict brain-to-plasma and CSF-to-plasma ratios using *in vitro* permeability parameters and drug protein/tissue binding data. In addition, we also developed a mouse whole-body PBPK model which, when populated with mouse physiological parameters and L-mdr1a cell-derived data, allowed prediction of mouse $Kp_{uu,brain}$ and CSF:Plasma_u (see Supplementary Information).

2. Experimental Section

2.1. Development of a Whole-Body Physiologically Based Pharmacokinetic (PBPK) Model

2.1.1. Model Development

A whole-body PBPK model was constructed in Matlab (version 8.1). The model consisted of the following compartments: lung, bone, brain vascular space (V), brain extravascular space (EV), cerebrospinal fluid (CSF), choroid plexus (CP), heart, kidney, liver, muscle, adipose, skin, pancreas, gut, spleen, and arterial and venous blood (Figure 1). All tissue compartments were considered well stirred (perfusion limited) except for CNS-related compartments (Figure 1).

Figure 1. (A) Whole-body physiologically based pharmacokinetic (PBPK) model. CL: Clearance; CSF: Cerebrospinal fluid; and (B) Brain and CSF compartments. V: vascular compartment; EV: extra-vascular compartment; $CL_{passive}$: passive clearance; CL_{active} : active efflux clearance.



Mouse and rat tissue volumes and perfusion rates were sourced from literature sources [58] (Table 1) with drug tissue partition coefficients calculated from the tissue-composition-based approach [59,60] using Log*P* and pKa parameters predicted using ChemAxon (http://www.chemaxon.com) or obtained from the literature (see Supplementary Information). Where absent in the literature, blood flow was scaled based on an allometric function (weight^{3/4}), and tissue volumes scaled to body weight [61,62], assuming a mouse body weight of 30 g and rat body weight of 250 g [58] (see Supplementary Information).

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]	Rat ^a	Mice ^b		
Tissue	Blood flow	Tissue volume	Blood flow	Tissue volume	
	(mL/h)	(mL)	(mL/h)	(mL)	
Arterial blood	2580	5.6	839.0	0.40	
Venous blood	2580	11.3	839.0	0.81	
Lung	2580	1.6	839.0	0.12	
Liver (Total)	120	10.3	16.8	0.74	
Hepatic artery ^c	0.29	-	0.28	-	
Portal vein ^d	2.12	-	1.96	-	
Kidney	553	2.3	91.9	0.17	
Stomach	8	1.1	4.8	0.08	
Spleen	37.8	0.6	9.5	0.04	
Pancreas	30	1.3	2.2	0.09	
Intestine	451	11	117.0	0.79	
Muscle	450	122	133.0	8.79	
Adipose	24	10	59.0	0.72	
Skin	350	40	48.4	2.88	
Bone	75.9	15.8	92.3	1.14	
Heart	236	0.8	55.1	0.06	
Thymus	18	0.7	1.4	0.05	
Brain ^e	120 ^f	1.8	25.9 ^g	0.36	
Brain IVS ^h	-	0.025	-	0.005	
Brain ISF	-	0.33	-	0.067	
ISF bulk flow	0.03 ⁱ	-	0.0016	-	
CP ^j	-	0.0036	-	0.00072	
CSF	80	1.2	25.8	0.09	

Table 1. Physiologically based pharmacokinetic (PBPK) model parameters for rats and mice.

^a Taken from Brown *et al.* [58]; ^b taken from Brown *et al.* [58] or blood flow scaled to the 0.75 of body weight and tissue volumes scaled to body weight (bold) [61,62]; ^c assuming hepatic artery flow is 2% (mouse) and 2.1% (rat) of cardiac output [58]; ^d assuming portal vein flow is 14.1% (mouse) and 15.3% (rat) of cardiac output [58]; ^e fractional volume of brain intravascular fluid, 0.014; Fractional volume of brain interstitial space, 0.188 [63], assuming brain weight of 1.8 g in rats and 0.36 g in mice [64]; ^f average of values reported from Eyal *et al.* [65] and Stange *et al.* [66]; ^g taken from Jay *et al.* [67]; ^h Brain IVS: brain intravascular space; ⁱ taken from Abbott *et al.* [68]; and ^j assuming choroid plexus (CP) weight is 0.2% of brain weight [69].

The CNS was comprised of brain IVS (intravascular space), brain ISF and CSF compartments. A rate-limited permeability barrier between the IVS and ISF and IVS and CSF represented the BBB and BCSFB respectively, and was incorporated into the model as passive bi-directional clearance terms ($CL_{passive}$) and active efflux terms (CL_{active}) modeling both passive and active flux of compounds across each permeability barrier (Figure 1). Bulk flow of ISF was incorporated within the model to represent the flow of unbound brain ISF drug to CSF. Unbound drug fractions in plasma (fu_p), brain ISF (fu_b) and cerebrospinal fluid (fu_{CSF}) were incorporated into the plasma, brain and CSF compartments respectively.

Well-stirred organs were described by the following equation:

$$\frac{\mathrm{d}C_{\mathrm{t}}}{\mathrm{d}\mathrm{t}} = \frac{Q_{\mathrm{t}}}{V_{\mathrm{t}}} \times C_{\mathrm{art}} - \frac{Q_{\mathrm{t}}}{K \mathrm{p}_{\mathrm{t}} \times V_{\mathrm{t}}} \times C_{\mathrm{t}}$$
(5)

where C is the concentration of drug, Q_t is the tissue perfusion rate, C_{art} is the arterial drug input, V_t is the volume of tissue compartment and K_{p_t} is the partition coefficient of the tissue compartment.

The removal of drugs from the eliminating organs (liver and kidney) was described by additional clearance terms (hepatic clearance: CL_H and renal clearance: CL_R). Hepatic clearance was predicted from *in vivo* data (human blood or plasma clearance: CL_b or CL_p) or *in vitro* data (*in vitro* intrinsic metabolic clearance: $CL_{int, in vitro}$) and renal clearance was calculated using a GFR (glomerular filtration rate) correction approach [70].

When using CL_b or CL_p as an input, the *in vivo* intrinsic clearance ($CL_{int, in vivo}$) was calculated (Equation (6)) by, if necessary, correcting for the blood:plasma ratio (R_b) (Equation (7)) (or, where not available, by assuming $R_b = 1$ for basic drugs and $R_b = 0.55$ for neutral and acidic drugs), and scaled using an allometric function of body weight (weight^{3/4}) to yield a species-specific $CL_{int, in vivo}$.

$$CL_{int, in vivo} = \frac{CL_b}{fu_b \times \left(1 - \frac{CL_b}{Q_H}\right)}$$
(6)

$$fu_{\rm b} = \frac{fu_{\rm p}}{R_{\rm b}} \tag{7}$$

When using the *in vitro* intrinsic metabolic clearance ($CL_{int, in vitro}$) as input, an *in vivo* intrinsic clearance ($CL_{int, in vivo}$) term was calculated by scaling $CL_{int, in vitro}$ accounting for microsomal recovery (microsomal protein content (rat: 45 milligrams protein per gram of liver [71] or hepatocellularity 130×10^6 cells per gram of liver) [72,73] and rat or mouse liver weight (40 grams per kilogram body weight [58] and 88 grams per kilogram body weight [71] respectively.

The unbound hepatic plasma clearance was then calculated using a well-stirred liver model (Equation (8)), where hepatic blood flow (Q_h) was assumed to be 55 mL min⁻¹ kg⁻¹ (rats) and 90 mL min⁻¹ kg⁻¹ (mice) [71].

$$CL_{\rm H} = \frac{f u_{\rm p} \times CL_{\rm int, in vivo} \times Q_{\rm h}}{Q_{\rm h} + f u_{\rm p} \times CL_{\rm int, in vivo} / R_{\rm b}}$$
(8)

For compounds which are cleared renally, unbound renal clearance (CL_R) was predicted using the GFR approach described by Lin [71] and by assuming a rat/human GFR ratio of 4.8 and a mouse/human GFR ratio of 6.6 (Mouse GFR = 12 mL/min/kg [74]), corrected for rat fu_{plasma} .

Permeability rate-limited transport across the BBB was described by Equations (9) and (10).

Vascular compartment:

$$\frac{\mathrm{d}C_{\mathrm{v}}}{\mathrm{dt}} = \frac{Q_{\mathrm{t}}}{V_{\mathrm{v}}} \times C_{\mathrm{art}} - \frac{Q_{\mathrm{t}}}{V_{\mathrm{v}}} \times C_{\mathrm{v}} - \frac{\mathrm{CL}_{\mathrm{passive,LA}}}{V_{\mathrm{v}}} \times fu_{\mathrm{p}} \times C_{\mathrm{v}} + \frac{\mathrm{CL}_{\mathrm{passive,AL}}}{V_{\mathrm{v}}} \times fu_{\mathrm{b}} \times C_{\mathrm{ev}} + \frac{\mathrm{CL}_{\mathrm{active}}}{V_{\mathrm{v}}} \times fu_{\mathrm{b}} \times C_{\mathrm{ev}} \tag{9}$$

Extra-vascular compartment:

$$\frac{d\mathcal{C}_{ev}}{dt} = \frac{CL_{passive,LA}}{V_{ev}} \times fu_p \times C_v - \frac{CL_{passive,AL}}{V_{ev}} \times fu_b \times C_{ev} - \frac{CL_{active}}{V_{ev}} \times fu_b \times C_{ev} - \frac{Q_{bf}}{V_{ev}} \times fu_b \times C_{ev}$$
(10)

where Q_t is tissue perfusion rate, V_{ev} is extra-vascular volume, V_v is the vascular volume, $CL_{passive}$ is the passive clearance across the BBB (subscript denotes either luminal-to-abluminal or abluminal-to-luminal flux), f_{u_p} is free drug fraction in plasma and f_{u_b} is free drug fraction in brain.

Permeability rate-limited transport across the BCSFB was described by Equations (11) and (12).

CP compartment:

$$\frac{\mathrm{d}\mathcal{C}_{\rm cp}}{\mathrm{dt}} = \frac{Q_{\rm t}}{V_{\rm cp}} \times \mathcal{C}_{\rm art} - \frac{Q_{\rm t}}{V_{\rm cp}} \times \mathcal{C}_{\rm cp} - \frac{\mathrm{CL}_{\rm passive,BA}}{V_{\rm cp}} \times fu_{\rm p} \times \mathcal{C}_{\rm cp} + \frac{\mathrm{CL}_{\rm passive,AB}}{V_{\rm cp}} \times fu_{\rm CSF} \times \mathcal{C}_{\rm CSF} - \frac{\mathrm{CL}_{\rm active}}{V_{\rm cp}} \times fu_{\rm p} \times \mathcal{C}_{\rm cp}$$
(11)

CSF compartment:

$$\frac{\mathrm{d}C_{\mathrm{CSF}}}{\mathrm{dt}} = \frac{Q_{\mathrm{bf}}}{V_{\mathrm{CSF}}} \times f u_{\mathrm{brain}} \times C_{\mathrm{ev}} - \frac{Q_{\mathrm{t}}}{V_{\mathrm{CSF}}} \times C_{\mathrm{CSF}} + \frac{\mathrm{CL}_{\mathrm{passive,BA}}}{V_{\mathrm{CSF}}} \times f u_{\mathrm{p}} \times C_{\mathrm{cp}} - \frac{\mathrm{CL}_{\mathrm{passive,AB}}}{V_{\mathrm{CSF}}} \times f u_{\mathrm{CSF}} \times C_{\mathrm{CSF}} + \frac{\mathrm{CL}_{\mathrm{active}}}{V_{\mathrm{CSF}}} \times f u_{\mathrm{p}} \times C_{\mathrm{cp}}$$
(12)

where Q_t is the perfusion rate, V_{cp} is choroid plexus cellular volume, V_{CSF} is the CSF volume, $CL_{passive}$ is the passive clearance across the BCSFB (subscript denotes either basolaterial-to-apical (BA) or apical-to-basolaterial (AB) flux), fu_b is free drug fraction in brain, fu_p is free drug fraction in plasma, fu_{CSF} is free drug fraction in CSF and C_{ev} is the concentration in the brain extravascular compartment.

2.1.2. Extrapolation of Passive Transport

Where apparent permeability (P_{app}) was reported in the absence and presence of transporter inhibitor, passive transport was assumed to be represented by the extent of inhibition. Where apparent permeability was reported in wild type and knock-out animals, passive transport was assumed to be the difference in apparent permeability. Passive bi-directional transport across the brain capillary was assumed to be represented by the apical-to-basolateral flux ($P_{app,AB}$) and basolateral-to-apical flux ($P_{app,BA}$) in the non-transfected LLC-PK1 cell line (by correcting for the insert surface area (0.33 cm²) and expressed as cm/h), and extrapolated to *in vivo* CL_{passive} for the luminal-to-abluminal (blood-to-brain) and abluminal-to-luminal (brain-to-blood) directions. Passive transport was effectively extrapolated to an *in vivo* passive clearance term based on correction for *in vivo* brain vascular endothelial surface area (SA), 150 cm² g brain⁻¹ for rats [75] and 240 cm² g brain⁻¹ for mice [44] and brain weight (rat: 0.57% of body weight; mouse: 1.6% of body weight [58]) yielding CL_{passive,LA} (Equation (13)) or CL_{passive,AL} (Equation (14)).

$$CL_{passive,LA} = Papp_{AB} \times SA \times Brain weight$$
 (13)

$$CL_{passive,AL} = Papp_{BA} \times SA \times Brain weight$$
 (14)

No studies have directly correlated drug permeability, *in vitro* or *in vivo*, at the BCSFB and the BBB. However, the *in vivo* permeability-surface area product (PS) of quinolone antibiotics at the choroid plexus [76,77] has been modeled in rats, and whilst based on pharmacokinetic modeling approaches, yielded similar *in vivo* permeabilities at the BBB (PS_{BBB}) and BCSFB (PS_{CSF}), when corrected for tissue weight. Furthermore the paracellular permeability of sucrose in monolayers of primary rat brain endothelial cells (average of 5 studies: $2-11 \times 10^{-6}$ cm/s [78–82], is similar to that reported in monolayers of primary rat choroid plexus cells (7×10^{-6} cm/s [83]).

Due to the absence of either *in vitro* or *in vivo* choroidal epithelial permeability data for many compounds, passive flux across the BCSFB was extrapolated based on correcting for *in vivo* choroid

$$CL_{passive} = P_{app} \times SA \tag{15}$$

Bi-directional flux (CL_{passive, apical-to-basolaterial} and CL_{passive, basolaterial-to-apical}) and active efflux at the BCSFB was parameterised using a similar approach to that detailed for the BBB.

When using *in vivo* reported CL_{passive} to describe passive permeability at the BBB, CL_{passive} at the BCSFB was scaled based on the BCSFB:BBB surface area.

2.1.3. Extrapolation of Active Transport

Effective extrapolation of *in vitro* determined active transport data requires knowledge of cellular transporter expression within the *in vitro* system and within the target tissue to account for variations in transporter expression. To address this, Ball et al. [43] reported an approach that utilised either a relative activity factor (RAF) or a physiological scaling factor to relate activity/expression of transporters within in vitro systems to an in vivo metric. Furthermore, Hoffmeyer et al. [84] suggested that the transport activity of P-glycoprotein in human is dependent on the level of protein expression. Similarly, Shirasaka et al. [85] and Tachibana et al. [86] also demonstrated that P-glycoprotein transport activity in vivo was proportional to its protein expression levels in vitro. Given these findings we have assumed *mdr1a* activity is directly related to *mdr1a* protein expression level and the *in vitro* intrinsic transport activity of *mdr1a* (transport rate per *mdr1a* protein) is identical to that *in vivo* in rats. The availability of P-glycoprotein and BCRP efflux kinetics terms is limited for a vast number of compounds in the literature and hinders widespread utilisation of PBPK modeling to assess the brain distribution of drugs. In lieu of widespread and robust Michaelis-Menten kinetics parameters for transporter substrates, the active efflux component of drug transport was described by a corrected efflux ratio (ER) [55,87] (Equation (16)) derived from the ratio of the efflux ratio in mdr1- or BCRP-transfected cells and vector-transfected control cells.

$$ER_{\text{corrected}} = \frac{ER_{\text{functional}}}{ER_{\text{non-functional}}}$$
(16)

To correct for the difference in protein abundance between *in vitro* cell lines and brain capillaries, an abundance-scaling factor (ASF) was incorporated to represent the ratio of *in vivo*-to-*in vitro* capillary abundance of transporter protein in cell lines (see Section 2.1.5) and either mice (P-glycoprotein; 14.1 fmol/µg protein or BCRP; 4.41 fmol/µg protein [56]) or rats (P-glycoprotein; 19.1 fmol/µg protein or BCRP; 4.95 fmol/µg protein [57]). For BCRP, *in vitro* abundance data were not available in the MDCK-II-BCRP cell line and therefore ASF was set as equal to 1. Subsequently active clearance was incorporated into the model as the product of the corrected *in vivo* efflux ratio and luminal-to-abluminal passive clearance (Equation (17)).

$$CL_{active} = ER_{corrected} \times CL_{passive,LA} \times ASF$$
(17)

Active efflux at the BCSFB was modelled using a similar approach, with directionality of efflux transport being from the systemic circulation into the CSF. The proposed model incorporates active efflux for two widely investigated drug efflux transporters, P-glycoprotein and BCRP. Alternative

transporter proteins with similar transport directionality could be paramatised within the model using *in vitro* passive and active permeability data for a specific transporter protein along with the protein abundance of the transporter(s).

2.1.4. Model Validation: Prediction of Temporal Brain and Plasma Concentrations in Rats

To validate the PBPK model the plasma and brain concentrations of the antibiotic norfloxacin were modeled and compared to *in vivo* measurements in rats. Norfloxacin plasma pharmacokinetics in rats, following an intravenous (IV) bolus of 150 mg kg⁻¹, has been described by a 2-compartment model [88]. For modeling purposes, the unbound fraction of norfloxacin in brain was assumed to be equal to 1. This approach can be rationalised since the unbound brain volume of distribution $(V_{u,brain})$ [89] for norfloxacin (0.98 ± 0.59 mL g brain⁻¹), is similar to the brain water volume (0.8 mL g brain⁻¹) [90] suggesting limited brain binding. Predicted norfloxacin brain ISF- and plasma concentration-time profiles were compared with *in vivo* norfloxacin brain ISF (determined using microdialysis) and plasma concentration-time profiles from 10 rats (pharmacokinetic data provided by Chenel *et al.* [88]).

2.1.5. Prediction of Kpuu, brain and CSFu: Plasmau in Rat

The rat CNS hybrid PBPK model was used to predict $Kp_{uu,brain}$ and CSF_u :Plasma_u. Permeation across the BBB and BCSFB was incorporated into the model using *in vitro* permeability determined in the L-mdr1a cell line, as reported by Uchida *et al.* [55] and detailed in Section 2.1.3. All compounds were simulated as intravenous bolus doses. $Kp_{uu,brain}$ and CSF_u :Plasma_u were predicted for a dataset of 25 compounds where *in vitro* permeability, fu_{plasma} , fu_{brain} , fu_{CSF} , $Kp_{uu,brain}$ and CSF_u :Plasma_u had previously been reported in rats [53] (see Supplementary Information).

2.2. Prediction of Kp_{uu,brain} for Actively Effluxed Compounds in Mice

In order to assess the utility of *in vitro*-derived cell culture permeability data to predict CNS drug disposition for actively effluxed compounds in mice, a whole body CNS PBPK model was parameterised with physiological tissue volumes and perfusion rates obtained from literature [91], with any absent data assumed to be equivalent to rats [59,60]. Permeation across the BBB and BCSFB was incorporated into the model using *in vitro* permeability determined in the L-mdr1a cell line, as reported by Uchida *et al.* [55] and the brain disposition of 11 P-glycoprotein substrates was modeled and predictions compared to reported *K*p_{uu,brain} in mice [55]. All compounds were simulated as intravenous bolus doses.

2.3. Sensitivity Analysis

To further explore the factors that influence the disposition of drugs into the brain biophase, a series of additional simulations were conducted exploring the impact of variation in $CL_{passive}$ (luminal-to-abluminal and abluminal-to-luminal were assumed equal), *ER*, fu_{plasma} and fu_{brain} on $Kp_{uu,brain}$ and CSF_u :Plasma_u utilising input parameters based on a model compound selected from the $Kp_{uu,brain}$ and CSF_u :Plasma_u predictions.

2.4. Assessment of Prediction Accuracy

The predictability of individual compounds was assessed using a fold-error (FE) approach where: Predicted > Observed:

$$FE = \frac{\text{predicted}}{\text{observed}}$$
(18)

Observed > Predicted:

$$FE = \frac{\text{observed}}{\text{predicted}}$$
(19)

Prediction accuracy was assessed by the average fold error (*afe*) approach (geometric mean error) (Equation (20)):

$$afe = 10^{\left[\frac{1}{n}\sum\log\frac{\text{predicted}}{\text{observed}}\right]}$$
(20)

Precision of prediction was assessed using root mean squared error (*rmse*) (Equation (21)) where n refers to the number of observations.

$$rmse = \sqrt{\frac{1}{n}\sum (\text{prediction} - \text{observed})^2}$$
 (21)

The percentage of compounds within a 3-fold, 4-fold, 5-fold and >5-fold error was derived from predicted and observed values.

3. Results and Discussion

The availability of *in vivo* permeability measurements for candidate compounds undergoing pre-clinical assessment often remains a limiting factor for efficient and effective use of pharmacokinetic models attempting to model CNS drug disposition. Consequently, *in vitro* permeability data for passively and actively transported compounds are often used to extrapolate to *in vivo* permeability. Polli *et al.* [92] demonstrated a linear relationship between brain penetration (Kin) in rat *in situ* brain perfusion studies and apparent permeability in MDCK type-1 cells with a correlation coefficient of 0.86. A similar trend was reported between brain uptake index (BUI) and permeability across bovine brain endothelial cell cultures, with a correlation coefficient of 0.89 [50]. In more recent studies Uchida *et al.* [54] and Kodaira *et al.* [53] have demonstrated the utility of murine-mdr1a-expressing LLC-PK1 cells (L-mdr1a) to reconstruct $Kp_{uu,brain}$ and CSF_u:Plasma_u for a handful of P-glycoprotein substrates.

Our primary goal was to build upon existing approaches aimed at mechanistically predicting CNS drug disposition and examine the potential application of drug permeability data derived from L-mdr1a cells to predict $Kp_{uu,brain}$ in mice and both $Kp_{uu,brain}$ and CSF_u :Plasma_u in rats. Development of a PBPK model capable of predicting CNS drug disposition by extrapolation of *in vitro*-derived data may prove a valuable resource for rapid pre-clinical screening of candidate compounds during development.

3.1. Validation of the PBPK Model

To validate the PBPK model structure and the ability to predict both plasma and brain ISF temporal concentrations, we selected norfloxacin as a model compound and utilised published rat norfloxacin plasma data and brain pharmacokinetic data obtained by microdialysis [88].

Norfloxacin plasma (Figure 2) and brain (Figure 3) temporal concentration profiles were both predicted to be within the ranges observed *in vivo*. Simulation of brain ISF norfloxacin concentration-time profile using literature derived $CL_{passive}$ (value obtained from fitting to *in vivo* data) [76,77] in the absence of a P-glycoprotein/BCRP-type active efflux component yielded predictions in which the absorption and elimination phases were outside the range observed *in vivo* (Figure 3). Subsequent simulations using a $CL_{passive}$ 2-fold higher than the initial fitted value (Table 2) and P-glycoprotein/BCRP-type active efflux ratio of 3) resulted in absorption and elimination phases within the range reported in 10 rats by Chenel *et al.* [88] (Figure 3).

Importantly, incorporation of an active efflux component (P-glycoprotein/BCRP type) within our simulations corrected the over-prediction in brain ISF drug concentrations and demonstrated the importance of an efflux clearance mechanism in governing norfloxacin CNS drug disposition. These findings are consistent with those of Chenel *et al.* [88] who demonstrated the influence of efflux clearance mechanisms on norfloxacin brain pharmacokinetics. The inclusion of a P-glycoprotein/BCRP type active efflux component within our norfloxacin simulations is supported by a recent report demonstrating norfloxacin to be a BCRP substrate [93].

Figure 2. Model predicted norfloxacin plasma concentrations in rats. Small closed circles represent literature reported plasma concentrations determined in rats following an IV-bolus dose [88]. Large closed circles represent model predicted norfloxacin plasma concentrations in rats in the absence of efflux. Large open circles represent model predicted norfloxacin plasma concentrations in rats in the presence of efflux (efflux ratio = 3).



Figure 3. Model predicted norfloxacin brain concentrations in rats. Crosses represent literature reported brain concentration determined in rats following an IV-bolus dose [88]. Closed circles represent model predicted norfloxacin brain concentrations in rats in the absence of efflux. Open circles represent model predicted norfloxacin brain concentrations in rats in the presence of efflux (efflux ratio = 3).



Norfloxacin Kp_{brain} was predicted to be 0.141, within 2-fold of the observed Kp_{brain} of 0.091, whilst norfloxacin CSF:plasma was predicted to be 0.089, within 2.1-fold of the observed CSF:plasma of 0.043 (Table 2). Predicted plasma half-life was extremely close to observed half-life whilst brain ISF half-life was within 1.5-fold of the observed value (Table 2).

Parameter	Value	Unit
Predicted Kp _{brain}	0.141	
Mean observed <i>K</i> p _{brain}	0.093 ^a	
Predicted CSF:Plasma	0.089	
Observed CSF:Plasma	0.043 ^b	
Predicted $t_{1/2,\text{plasma}}$ (<i>ER</i> = 3)	183	(\min^{-1})
Observed $t_{1/2, \text{plasma}}$ ^c	202 ± 45	(\min^{-1})
Predicted $t_{1/2,\text{ISF}}$ (<i>ER</i> = 3)	231	(\min^{-1})
Observed $t_{1/2,\text{ISF}}^{d}$	255 ± 97	(\min^{-1})
Predicted AUC _{plasma}	340	$(\mu M \min^{-1})$
Predicted AUC_{ISF} (ER = 0)	329	$(\mu M \min^{-1})$
Predicted AUC_{ISF} (ER = 3)	47.9	$(\mu M \min^{-1})$
Predicted AUC_{CSF} (ER = 3)	30.4	$(\mu M \min^{-1})$
Predicted ISF C_{max} (ER = 0)	52.4	(µM)
Predicted ISF C_{max} (ER = 3)	16.3	(µM)

Table 2. Prediction of norfloxacin plasma, brain and CSF pharmacokinetics.

^a Mean of three reported values ($Kp_{u,brain}$: 0.035 ± 0.014 and Kp_{brain} : 0.044 [77], Kp_{brain} : 0.097 ± 0.029 [76] and 0.067 [89]); ^b Mean of two reported values (CSF:P_u, 0.033 ± 0.006 and CSF:P, 0.042 [77], CSF:P_u, 0.044 ± 0.010 and CSF:P, 0.056 [94]); ^c Reported parameter estimate from compartmental analysis [88]; and ^d Reported parameter estimate from non-compartmental analysis [95].

3.2. Prediction of Central Nervous System (CNS) Disposition Using L-mdr1a in Vitro Permeability Data

Recent studies report positive correlations between drug permeability assessed in the LLC-PK1 porcine kidney cell line transfected with murine *mdr1* (to produce the L-mdr1a cell line) and *in vivo* brain distribution of P-glycoprotein substrates in rats and mice [53].

Furthermore, due to the similarity in the abundance of P-glycoprotein in L-mdr1a cells (15.2 fmol/µg protein) compared to the abundance in brain capillaries (Mouse: 14.1 fmol/µg protein [56]; rat: 19.1 fmol/µg protein [57]), we examined the use of L-mdr1a-derived *in vitro* permeability data in predicting CNS drug disposition.

In an attempt to examine the validity of the scaling approach to determine permeability clearance at the BBB, based on extrapolating *in vitro* permeability data, we obtained literature reported *in situ* brain permeability-surface area products (PS) for 16 compounds spanning over a 100-fold range of PS.

With the exception of three compounds (midazolam, diazepam and sertraline), 11 of 13 compounds fell within 3-fold and 2 within 4-fold of the reported PS values (see Supplementary Information Section 4). Similar trends have been previously reported by Uchida *et al.* (2011) in LLC-PK1 cells [55], Polli *et al.* (2000) [92] and Summerfield *et al.* (2007) [96] in cultured kidney epithelial cells, and support the extrapolation approach.

3.2.1. Prediction of Kpuu, brain for 11 Actively Transported Compounds in Mice

Using L-mdr1a-derived permeability data reported by Uchida *et al.* [55], the predicted $Kp_{uu,brain}$ for over 90% of P-glycoprotein substrates was within 4-fold of observed $Kp_{uu,brain}$. The predicted $Kp_{uu,brain}$ for all compounds was within 5-fold of observed $Kp_{uu,brain}$ (Figure 4A,B), with an overall *afe* and *rmse* of 0.7 and 0.23 respectively (Table 3).

Figure 4. Comparison of predicted and reported $Kp_{uu,brain}$ in mice. (A) Solid bold mid-line represents the line of unity and solid outer-lines represent 4-fold prediction error; and (B) residuals plot.



Species	Tissue	n	afe	rmse	% within 3-fold	% within 4-fold	% within 5-fold	% > 5-fold
Mouse	Brain	11	0.7	0.23	63.6	90.9	100	0
D - 4	Brain	27	1.19	0.43	63	81.5	88.9	11.1
Kat	CSF	27	0.8	0.32	77.8	81.5	96.3	3.7

Table 3. Statistics for the model predictions.

Uchida *et al.* [55] successfully demonstrated that Kp_{brain} (and $Kp_{uu,\text{brain}}$) could effectively be reconstructed though the integration of *in vitro* mdr1a transport activity and mdr1a protein expression levels in the brain capillaries and in mdr1a-transfected cell monolayers. Our model yielded reasonable predictions for passively transported and actively transported P-glycoprotein substrates and demonstrated the successful extrapolation of *in vitro* permeability data to yield an *in vivo* transfer clearance across the brain capillaries.

The basis of these predictions is quantitative calculation of the temporal drug concentrations in plasma and brain compartments. Whilst Uchida *et al.* [55] initially reconstructed $K_{\text{puu,brain}}$, for the first time we have shown that, using a well-designed PBPK modeling approach, plasma and brain ISF temporal concentrations, and $K_{\text{puu,brain}}$ can be adequately predicted in mice for a range of P-glycoprotein substrates, using a simple set of physiochemical and pre-clinically determined parameters.

3.2.2. Prediction of Rat Kpuu, brain and CSFu: Plasmau

In an attempt to assess the utility of L-mdr1a-derived permeability data to predict cross-species CNS distribution, we utilised L-mdr1a permeability data from 25 compounds to predict *in vivo* CNS distribution ($Kp_{uu,brain}$ and CSF_u :Plasma_u) in rat. Our reported model was capable of predicting rat brain disposition ($Kp_{uu,brain}$) for 81.5% of compounds simulated to within 4-fold of the reported $Kp_{uu,brain}$ (Table 3 and Figure 5). The predicted $Kp_{uu,brain}$ of quinidine was within 6.8-fold of observed $Kp_{uu,brain}$, whilst that of loperamide within 7.4-fold. The overall *afe* and *rmse* were 1.19 and 0.43 respectively (Table 3).

Predicted $Kp_{uu,brain}$, for compounds with observed $Kp_{uu,brain}$ less than 0.01 and greater than 1 deviated further from the line of unity (Figure 5A and local regression (LOESS) plot in Supplementary Information Section 5) but were nevertheless predicted within 4-fold of the reported $Kp_{uu,brain}$.

For flavopirodol and perfloxacin, the use of either MDCKII or LLC-PK1-derived cell permeability data did not significantly alter model predictions.

 Kp_{brain} for P-glycoprotein substrates ranges from 1 to 50 [97]. The $Kp_{uu,brain}$ of quindine and loperamide, typical P-glycoprotein substrates, were 7.4-fold over-predicted in our model. Recent reports have identified a 39.4-fold [55] to 44-fold [53] increase in Kp_{brain} when comparing wild-type to knock-out mice for quinidine and 23.3-fold [55] for loperamide. For these highly effluxed compounds, the use of *in vitro* permeability data may not truly reflect the extent of *in vivo* efflux and therefore the use of knock-out-to-wild-type Kp_{brain} (or $Kp_{uu,brain}$) could also be used as a surrogate metric for efflux. Such an approach improved model predictions of both loperamide ($Kp_{uu,brain} = 0.025$) and quinidine ($Kp_{uu,brain} = 0.071$) to within a 3-fold prediction window (see Supplementary Information Section 6). **Figure 5.** Comparison of predicted and reported $Kp_{uu,brain}$ in rat. (A) Solid bold mid-line represents the line of unity and solid outer-lines represent 4-fold prediction error; and (B) residuals plot.



The rat CNS whole-body PBPK model was successful in predicting CSF_u :Plasma_u for 81.5% of compounds to within 4-fold of observed CSF_u :Plasma_u (Table 3 and Figure 6A,B), with CSF_u :Plasma_u of benzylpenicillin 5.8-fold over predicted. The overall *afe* and *rmse* were 0.8 and 0.32 respectively (Table 3).

Figure 6. Comparison of predicted and reported CSF_u :Plasma_u in rat. (A) Solid bold mid-line represents the line of unity and solid outer-lines represent 4-fold prediction error; and (B) residuals plot.



3.3. Model Sensitivity Analysis

Several parameters, particularly passive clearance, active efflux, fu_{brain} and fu_{plasma} , have the potential to significantly impact CNS drug distribution by influencing drug clearance across the BBB and BCSFB. To further explore the relationship between drug clearance across the BBB and BCSFB and the extent of protein/tissue binding, risperidone was selected as a model candidate compound and the impact of variation in passive clearance, active efflux, fu_{brain} and fu_{plasma} on $Kp_{uu,\text{brain}}$ and CSF_u :Plasma_u was assessed.

3.3.1. Passive Clearance

3.3.1.1. Impact of Variation in fuplasma and fubrain on Kpuu, brain and CSFu: Plasmau

Irrespective of whether the passive clearance (CL_{passive}) (*i.e.*, passive permeability) of risperidone at the BBB and BCSFB was low (CL_{passive} 0.34 mL/h) or high (64 mL/h), increasing $f_{u_{plasma}}$ (from 0.001 to 1) resulted in a substantial increase in $Kp_{uu,brain}$ across the range of $f_{u_{brain}}$ (0.001 to 1) simulated (Figure 7A: transparent mesh indicates high permeability condition; coloured profile indicates low permeability condition).

Under conditions of both low and high $CL_{passive}$, an increase in fu_{brain} (from 0.001 to 1) was associated with a decrease in brain partitioning ($Kp_{uu,brain}$) of risperidone. This decrease was observed across the range of fu_{plasma} (0.001 to 1) simulated (Figure 7A: transparent mesh indicates high permeability condition; coloured profile indicates low permeability condition).

Overall, $Kp_{uu,brain}$ at high $CL_{passive}$ was greater than $Kp_{uu,brain}$ at low $CL_{passive}$ when $fu_{brain} < 0.1$.

Brain penetration is therefore influenced by the extent of plasma protein binding (fu_{plasma}) and the extent of drug binding within the brain (fu_{brain}). Whilst these observations are relatively intuitive, the importance of both fu_{plasma} (and hence unbound drug concentration in plasma) and drug permeability across CNS barriers in influencing CNS drug disposition is clearly demonstrated for drugs that exhibit high non-specific binding to brain tissue (fu_{brain}). For drugs that are highly bound to brain, fu_{plasma} drives entry of drug into the brain. Such drugs are retained within the bulk of the brain (bound-unbound cycling) creating a sink effect, and increasing BBB CL_{passive} would enhance this sink effect further increasing $Kp_{uu,brain}$ [98–100].

The disposition of drug into the CSF was demonstrated to be sensitive to fu_{plasma} , with increased CSF_u:Plasma_u associated with increasing fu_{plasma} . This finding was apparent for both low and high CL_{passive} conditions (Figure 7B: transparent mesh indicates high permeability; coloured profile indicates low CL_{passive} conditions). However, simulations were insensitive to any change in fu_{brain} (0.001–1) (Figure 7B). These simulations demonstrated no apparent relationship between the extent of fu_{brain} and CSF_u:Plasma_u, suggesting fu_{brain} alone does not significantly influence the unbound concentration of drug within the CSF. These findings support the notion that the extent of free drug in plasma is an important factor influencing drug penetration across the BCSFB into the CSF.

Figure 7. Sensitively analysis of the whole-body physiologically based pharmacokinetic (PBPK) model. The impact of variations in fu_{brain} , fu_{plasma} , CL_{passive} and efflux ratio on $Kp_{\text{uu,brain}}$ and CSF_{u} :Plasma_u.



3.3.1.2. Impact of Variation in fubrain and CL_{passive} on Kp_{uu,brain}

Irrespective of the extent of plasma protein binding ($fu_{plasma} 0.01$ (low) or 1 (high)), $Kp_{uu,brain}$ was insensitive to changes in $CL_{passive}$ at higher fu_{brain} ($fu_{brain} > 0.1$) (Figure 7C: transparent mesh indicates high fu_{plasma} ; coloured profile indicates low high fu_{plasma}). The sensitivity of $Kp_{uu,brain}$ to changes in $CL_{passive}$ increased as fu_{brain} decreased (<0.1) (Figure 7C).

As already established, fu_{plasma} determines the unbound plasma drug concentration available to penetrate the BBB and BCSBF, where higher fu_{plasma} results in an increase in the unbound drug concentration available to cross the BBB and BCSFB. Equally, drug binding in brain provides a driving force for retention of drug within the brain mass, which is evident by the increasing $Kp_{uu,brain}$ as fu_{brain} decreases (irrespective of changes in $CL_{passive}$). However the important role fu_{brain} plays in determining $Kp_{uu,brain}$ for highly brain-bound drugs ($fu_{brain} < 0.1$) is particularly evident for lower permeability compounds ($CL_{passive} < 1$); $Kp_{uu,brain}$ appeared not to change significantly when fu_{brain} was between 0.001 and 0.1. However $Kp_{uu,brain}$ was reduced when fu_{brain} was between 0.1 and 1 (these findings were observed with both high fu_{plasma} and low high fu_{plasma} conditions).

3.3.2. Active Clearance

3.3.2.1. Impact of Variation in fubrain and Active Efflux on Kpuu, brain

Irrespective of the extent of plasma protein binding (fu_{plasma} : 0.01 (low) or 1 (high)), $Kp_{uu,brain}$ was influenced by variations in both fu_{brain} over the range studied (fu_{brain} 0.001–1) and efflux ratio (2–100) (Figure 7D: transparent mesh indicates high fu_{plasma} ; coloured profile indicates low fu_{plasma}). $Kp_{uu,brain}$ increased as fu_{brain} decreased from 1 to 0.001, with extensive brain accumulation ($Kp_{uu,brain}$ greater than 1) when fu_{plasma} was high ($fu_{plasma} = 1$) (Figure 7D).

The increase in $Kp_{uu,brain}$ as fu_{brain} decreases can be rationalised by considering that $Kp_{uu,brain}$ is largely driven by a combination of membrane permeability (passive and active) and drug free fraction in plasma and brain. Where permeability is low (<0.5 mL/h) the impact of variation in fu_{brain} on $Kp_{uu,brain}$ is limited (Figure 7C). When passive permeability increases (CL_{passive} > 0.5 mL/h), and with increasing active efflux at the BBB (Figure 7D), the extent of dug passive permeability may augment $Kp_{uu,brain}$ and counter the impact a reduction in fu_{brain} would have on $Kp_{uu,brain}$.

3.3.2.2. Impact of Variation in CL_{passive} and Efflux Ratio on Kp_{uu,brain}

The extent of non-specific binding of drug in brain (fu_{brain}) had a significant effect on the sensitivity of $Kp_{uu,brain}$ to $CL_{passive}$ and to active efflux (Figure 8). When drug was highly bound in brain (Figure 8A: $fu_{brain} = 0.01$ and $fu_{plasma} = 1$), increasing the extent of drug efflux (efflux ratio 2–50) resulted in a progressive decrease in $Kp_{uu,brain}$, which was more apparent at higher $CL_{passive}$ (>10 mL/h).

Interestingly, at lower $CL_{passive}$ (<1 mL/h), increasing the extent of active efflux had minimal effects on $Kp_{uu,brain}$ compared to higher $CL_{passive}$ (>1 mL/h). This effect was diminished when fu_{brain} was high (Figure 8B: $fu_{brain} = 1$ and $fu_{plasma} = 1$), since $Kp_{uu,brain}$ was not sensitive to changes in $CL_{passive}$ over a range of efflux ratios (2–50).

Figure 8. Sensitively analysis of the whole-body PBPK model. The impact of variations in fu_{brain} (A) low fu_{brain} and (B) high fu_{brain} , $CL_{passive}$ and efflux ratio on $Kp_{uu,brain}$ (see text for details).



 Fu_{brain} governs the unbound drug concentration in brain and, in conjunction with the clearance of drug across the BBB, helps to regulate the rate and extent of CNS drug accumulation. With extensive non-specific drug binding in brain tissue (Figure 8A), $Kp_{uu,brain}$ was higher than when fu_{brain} is not a limiting factor (Figure 8B). In the absence of an efflux effect the sensitivity of $Kp_{uu,brain}$ to fu_{brain} , particularly at low CL_{passive} (Figure 8A), may reflect enhancement of the sink effect as drug is readily able to cross the BBB and accumulate within the brain mass with a diminished abluminal-to-luminal clearance. As active efflux increases, this effect is diminished as efflux provides an additional driving force to rebalance the partition of drug between intravascular spaces and brain biophase.

4. Conclusions

With development of therapeutic drugs targeted to the CNS lagging behind development of drugs for other therapeutic areas there is an urgent requirement to better predict CNS drug disposition. The application of brain microdialysis and PET imaging techniques will provide a true quantitative understanding of the temporal (regional) brain concentrations, but the techniques and equipment needed for their applications in understanding CNS drug disposition is often a limiting factor to their widespread use.

To address this issue, we have developed a mechanistic, whole-body physiologically-based pharmacokinetic model incorporating both brain biophase (brain ISF) and cerebrospinal fluid compartments, which provided reasonable estimates of brain-to-plasma and CSF-to-plasma ratios using routinely determined experimental parameters (e.g., *in vitro* permeability, efflux ratio, fu_{plasma} or fu_{blood} and fu_{brain}). This model not only allows the simultaneous prediction of brain-to-plasma and CSF-to-plasma ratios and examination of the impact of drug permeability and blood flow on CNS drug disposition, but allows a quantitative prediction of unbound drug concentration within the CNS.

Despite the lack of availability of *in vitro* permeability data from representative *in vitro* choroid plexus cell models (such as the immortalised Z310 rat cell line [101]), the model adequately predicted CSF-to-plasma ratios for over 90% of the compounds simulated. The lack of predictive models currently capable of quantifying both brain biophase and CSF drug disposition significantly hinders the assessment of drug disposition within the CNS. Current methods utilising CSF drug kinetics as surrogates for brain drug kinetics remain controversial [95,102], with many studies disagreeing with the use of CSF as a surrogate for brain [103–105]. The physiological differences between the BCSFB and the BBB, advocate the viewpoint that CSF and BCSFB are distinct entities when compared to the BBB. In particular, since CSF drug concentrations do not accurately reflect brain drug concentrations for many actively transported compounds, it is essential that the brain and CSF be considered as separate entities within mechanistic models.

Clearly, in the context of the interactions of drug substrates with transporter proteins, the benefit of the proposed PBPK model would be to effectively incorporate the impact of temporal concentrations on transporter activity and the impact this would have on CNS pharmacokinetics.

The proposed model is capable of predicting temporal CNS drug concentrations, however due to the lack of routinely available transporter-specific Michaelis–Menten terms for drug substrates, the proposed approach of examining overall CNS disposition ($Kp_{uu,brain}$ and CSF_u :Plasma_u) is a valid one. In addition, the complexity of modeling the kinetics of drug-transporter protein interaction, at a

cellular level, is now recognised and could potentially be examined further within the proposed model if BBB and BCSFB cellular compartments were expanded towards a semi-systems biology based model [106]. It is prudent to note however, that such approaches would benefit from the use of microdialysis or PET imaging in combination with more elaborate semi-systems biology models, to aid in the development and validation of models.

The present study reports, for the first time, a PBPK CNS model that predicts $Kp_{uu,brain}$ and CSF:Plasma (bound and unbound) for compounds possessing diverse pharmacokinetic characteristics. Additionally, this study illustrates the potential use of *in vitro* L-mdr1a-derived permeability data to predict rat CNS drug disposition within an acceptable tolerance.

Acknowledgments

The authors would like to thank Brian Houston for his advice during the preparation of this manuscript.

Author Contributions

Conceived and designed the study: R.B. Performed the simulations: R.B. Analysed the data: R.B. and J.P. Provided *in-vivo* microdialysis data: M.C. Wrote the manuscript: R.B.

Conflicts of Interest

The authors declare no conflict of interest.

Supplementary Information

S1. Model Validation: Prediction of Norfloxacin Temporal Brain and Plasma Concentrations in Rats

Parameter	Value	Units
Permeability Clearance ^a		
CL _{passive}	0.21	mL/h
<i>Efflux</i> ^b		
Efflux ratio	3	
Unbound fraction		
$fu_{ m plasma}$ ^c	0.78	
$f u_{brain} d$	1	
$fu_{\rm CSF}$ ^e	1	
Physicochemcial		
LogP ^f	-1.03	
pKa ^g	6.4 and 8	.7 (Zwitterion)
Total plasma clearance		
CL ^h	15.5	mL/min/kg

Table S1. Model input parameters.

^a Mean of reported values from Ooie *et al.* [76]; ^b Reported as apical-to-basolateral/basolateral-to-apical flux [107]; ^c Taken from Ooie *et al.* [77]; ^d Estimated from $V_{u,brain}$ [89]; ^e Total CSF concentrations were simulated as only CSF:Plasma_u have been reported in literature; ^f Taken from Hansch *et al.* [108]; ^g Calculated using ChemAxon; and ^h Total plasma clearance [88] is split between hepatic (85%) and renal (15%) clearance [109].

S2. Mouse PBPK Model Compound Specific Parameters

	Iı	<i>ı vitro</i> pe	rmeabilit	y ^a		Active efflux			Permeability clearance			
Compounds	P _{app} (L- 10 ⁻⁶	·mdr1a) cm/s	P _{app} (LI 10 ⁻⁶	C-PK1) cm/s		Efflux ratio						
	A to B	B to A	A to B	B to A	ER functional	ER non-functional	ER _{corrected}	CL _{passiveLA}	CL _{passiveAL}	CL _{active}		
Quininde	3.16	146	57.2	80.5	46.2	1.4	30.2	14.8	20.9	447.8		
Loperamide	5.49	271	49.7	98	49.4	2	23	12.9	25.4	296.7		
Digoxin	1.13	31.9	11.8	18.8	28.2	1.6	16.3	3.1	4.9	49.9		
Risperdone	23.3	150	96.3	58.7	6.4	0.6	9.7	25	15.2	242.5		
Indindavir	3.33	45.3	14.4	20.5	13.6	1.4	8.8	3.7	5.3	32.8		
Dexamethasone	6.91	102	29.5	36.5	14.8	1.2	11	7.6	9.5	83.9		
Vinblastine	2.83	56.1	24.2	38.7	19.8	1.6	11.4	6.3	10	71.5		
Paclitaxcel	2.7	53.8	20.5	33.2	19.9	1.6	11.3	5.3	8.6	60.1		
Verapamiol	11.9	84	73.5	39	7.1	0.5	12.2	19.1	10.1	233.2		
Loratidine	32	80.2	23.1	33.1	2.5	1.4	1.6	6	8.6	9.6		
Diazepam	57.3	67.2	31.8	43.5	1.2	1.4	0.8	8.2	11.3	6.5		

 Table S2.
 Mouse PBPK model parameters.

^a Taken from Uchida *et al.* [55].

	Metabolic clearance		Renal cl	earance
Compounds	Human ^a	Mouse ^b	Human	Mouse
Compounds	CL _{plasma} or CLint _{,u}	CLint, in vivo	CL _R	
	mL/min/mg protein or mL/min/kg	mL/min/kg	mL/min/kg	
Quininde	4.02	11.02	0.8	5.28
Loperamide	0.1775	183.56	na	na
Digoxin	0.07	0.08	2.06 °	13.596
Risperdone	5.4	10.76	12.8 ^d	84.48
Indindavir	14.7	308.30	na	na
Dexamethasone	3.91	6.31	na	na
Vinblastine	15.4 ^e	221.51	na	na
Paclitaxcel	na	$0.54^{\rm f}$	na	na
Verapamiol	13.3	119.58	na	na
Loratidine	na	na	na	na
Diazepam	0.51	1.88	na	na

Table S3. Mouse PBPK metabolic and renal clearance.

^a unless otherwise indicated, human clearance values were obtained from Hallifax *et al.* [110]; ^b unless otherwise indicated, mouse clearance was determined from human clearance (via calculation of human *in vivo* intrinsic hepatic clearance) and allometrically scaled (Human = 70 kg, Mouse = 0.020 kg), see Section 2.1.1 for further details; ^c taken from Hedman *et al.* (1990) [111]; ^d taken from Thyssen *et al.* [112]; ^e taken from Rataom *et al.* [113]; ^f taken from Eiseman *et al.* [114]; na: not available.

S3. Mouse Brain PBPK Model Predictions

Compounds	Predicted	Observed ^a	Fold error
Compounds	<i>K</i> p _{uu,brain}	K p _{uu,brain}	
Quinidine	0.034	0.058	1.7
Loperamide	0.031	0.016	1.9
Digoxin	0.021	0.005	4.2
Risperidone	0.315	0.212	1.4
Indinavir	0.036	0.119	3.3
Dexamethasone	0.031	0.093	3
Vinblastine	0.041	0.025	1.6
Paclitaxel	0.054	0.116	2.1
Verapamil	0.025	0.100	4
Loratidine	0.236	0.740	3.1
Diazepam	0.588	1.160	1.9

Table S4. Mouse PBPK model predictions.

^a Taken from Uchida et al. [55].

S4. Rat CNS PBPK Model

		Transporter e	xpressing cells ^a	Parent	tal cells	Active efflux ^b			
Compounds	Transporter	P _{app} (µl	L/h/well)	Papp (µL/h/well)		Efflux ratio			
_	_	A to B	B to A	A to B	B to A	ER functional	ER non-functional	ER corrected	
Antipyrine		28.7	25.6	31.2	29.6				
Benzypenicillin		7.5	4.7	5.2	3.7				
Buspirone		38.6	38.4	40.7	39.9				
Caffeine		29.7	35.4	32.1	34.5				
Carbamazepine		40.6	45.2	41	46.5				
Cephalexin		4.8	3.7	4	3.7				
Citalopram		25.9	39.2	32	35.5				
Cimetidine	BCRP	1.8	7.2	1.2	2.4	4.0	2.0	1.8	
Daidzen	BCRP	16.9	36.4	20.5	24.1	2.2	1.2	1.7	
Dantrolene	BCRP	19.9	41.9	31.1	36.1	2.1	1.2	1.7	
Diazepam		46.5	42.2	44.4	43.7				
Flavopiridol	P-gp	9.6	67.3	26.6	39.6	7.0	1.5	4.3	
Flavopiridol	BCRP	42.9	64	54.9	53.6	1.5	1.0	1.4	
Fleroxacin	BCRP	5.6	9.9	5.6	6.8	1.8	1.2	1.3	
Genistein	BCRP	13.8	32.4	20.7	23.1	2.3	1.1	1.9	
Loperamide	P-gp	12.9	54.7	22.1	15	4.2	0.7	5.7	
Midalzolam		38.1	44.5	41.4	42.2				
Pefloxacin	P-gp	5.1	12.3	5.4	8.5	2.4	1.6	1.4	
Pefloxacin	BCRP	10.8	17.4	9	9.2	1.6	1.0	1.5	
Phenytoin		29.6	37.1	31	37.7				
Quinidine	P-gp	6.6	42.2	22.3	22.9	6.4	1.0	5.7	
Risperidone	P-gp	21.3	63	41.8	45.9	3.0	1.1	2.5	
Sertraline		2.8	2.4	2.7	1.9				
Sulpiride		2	2.7	1.9	2.4				
Thiopental		39.6	37.7	37.1	36.4				
Verapamil	P-gp	15.4	49	24.9	23.4	3.2	0.9	3.1	
Zolpidem		40.3	45.8	42.4	41.6				

 Table S5. Permeability data.

^a Compounds known to be subjected to active efflux as a result of a transporter protein are indicated by either BCRP (breast cancer resistance protein or P-gp (P-glycoprotein); and ^b calculated only for compounds reported to be subjected to active efflux.

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		Permeability clearance		<i>In situ</i> permeability ^b	
Compounds	Transporter		mL/h		mI /h
		CL _{passiveLA} ^a	CL _{passiveAL}	CL _{active}	11112/11
Antipyrine		25.5	24.2		$66 \pm 2.5 [115 - 117]$
Benzypenicilli	n	4.3	3		0.97 [118]
Buspirone		33.3	32.6		
Caffeine		26.3	28.2		$95 \pm 33.7 [100, 115, 116, 119]$
Carbamazepin	e	10.6	33.5		116 [96]
Cephalexin		3.3	3		
Citalopram		26.2	29		67.3 [96]
Cimetidine	BCRP	2.9	16.5	5.2	0.58 [120]
Daidzen	BCRP	13.5 (7)	32	23	21.6 (WT), 30 (-/-) [121]
Dantrolene	BCRP	18.4 (8.6)	31.6	31.3	16.7 (WT), 35 (-/-) [121]
Diazepam		36.3	35.8		351 ± 254 [96,100,122]
Flavopiridol	P-gp	21.8	32.4	181.1	
Flavopiridol	BCRP	44.9	43.9	62.9	
Fleroxacin	BCRP	4.1	5	5.3	
Genistein	BCRP	14.6	27.1	27.7	
Loperamide	P-gp	18.1 (8)	12.3	130	2 (WT), 26 (-/-) [123]
Midalzolam		33.9	34.5		459 [96]
Pefloxacin	P-gp	4.4	7	7.8	
Pefloxacin	BCRP	7.4	7.5	11.1	
Phenytoin		25.4	30.8		36.7 ± 21 [96,115,124]
Quinidine	P-gp	18.2	18.7	130.7	7.45 ± 6.35 [116,120,125]
Risperidone	P-gp	34.2	37.6	107.7	101.7 [96]
Sertraline	U.	2.2	1.6		129 [96]
Sulpiride		1.6	2		
Thiopental		30.4	29.8		
Verapamil	P-gp	20.4 (10.1)	19.1	79.7	6 ± 0.78 (WT) 46.3 ± 8.42 (-/-) [124,126]
Zolpidem		34.7	34		

Table S6. Model predicted versus literature reported in situ permeabilities.

^a Permeabilities in italics represent *in vivo* passive influx in mice and are used in conjunction with the equivalent *in situ* brain permeability (italics) for correlation purposes; and ^b values in italics represent *in situ* brain permeabilities in mice used for correlation purposes.



Figure S1. Correlations and confidence interval plots of *in situ* brain perfusion and predictions of $CL_{passive}$.

Compounds	Physicochemical parameters ^a				
Compounds	рКа	LogP			
Antipyrine	1.4	0.38 ^b			
Benzypenicillin	3.55 °	2.74 ^d			
Buspirone	7.62	1.95 ^e			
Caffeine	14	$0.92^{ m f}$			
Carbamazepine	15.96	2.1			
Cephalexin	3.45 ^g	0.65			
Citalopram	9.78	3.5			
Cimetidine	6.8 ^h	0.26			
Daidzen	8.69	0.71			
Dantrolene	7.5	1.65			
Diazepam	3.4 ^d	2.82 ⁱ			
Flavopiridol	5.68	2.8			
Fleroxacin	7.15	1.84			
Genistein	6.35	3.04			
Loperamide	8.6	5.5			
Midalzolam	6.2	3.89			
Pefloxacin	8.3	0.27 °			
Phenytoin	8.3 ^j	2.5			
Quinidine	8.56	3.4 °			
Risperidone	8.8	2.5			
Sertraline	9.16 ^k	5.1			
Sulpiride	9.12 ¹	0.57			
Thiopental	7.55 ⁱ	2.85 °			
Verapamil	8.9 ⁱ	3.7 °			
Zolpidem	6.2	1.2			

Table S7. Physicochemical parameters used to calculate partition coefficients.

^a Unless otherwise stated, calculated using ChemAxon; ^b Stevenson *et al.* [127]; ^c Hansch *et al.* [108]; ^d Merck Index [128]; ^e Ullrich and Rumrich [129]; ^f Martin *et al.* [130]; ^g Streng W.H. [131]; ^h Tomlinson and Hafkenscheid [132]; ⁱ Sangster [133]; ^j McLure *et al.* [134]; and ^k Deak *et al.* [135]; ⁱ El Tayer *et al.* [136].

	Prot	ein Bindin	ng ^a	Metabolic Clearance			
Compounds	Plasma	Brain	CSF	Human ^b	Rat ^c		
	<i>f</i> u _{plasma}	<i>f</i> u _{brain}	<i>f</i> u _{CSF}	CL _{plasma} (mL/min/kg)	CL _{int, in vivo} (mL/min/kg)		
Antipyrine	0.98	0.86	1	0.57	0.21		
Benzypenicillin	0.649	2.26	0.998	na	na		
Buspirone	0.45	0.137	0.996	17.17	95.34		
Caffeine	0.917	0.697	1	1.67	0.70		
Carbamazepine	0.385	0.17	0.995	0.4	0.37		
Cephalexin	1.05	1.42	1	na	na		
Citalopram	0.82	0.437	0.999	4.5	2.50		
Cimetidine	0.529	0.0197	0.997	3.2	2.55		
Daidzen	0.0542	0.0828	0.95	na	na		
Dantrolene	0.117	0.0746	0.978	na	na		
Diazepam	0.211	0.0426	0.989	0.51	0.88		
Flavopiridol	0.254	0.0552	0.991	2.1	3.27 ^d		
Fleroxacin	0.793	0.555	0.999	na	na		
Genistein	0.0101	0.0531	0.773	na	na		
Loperamide	0.0701	0.00196	0.962	0.1775	0.90		
Midalzolam	0.045	0.0431	0.94	6.5	75.66		
Pefloxacin	0.86	0.514	1	na	na		
Phenytoin	0.302	0.0967	0.993	0.47	0.56		

Table S8. Protein binding and metabolic clearance.

Protein Binding ^a			ng ^a	Metabolic Clearance			
Compounds	Plasma	Brain	CSF	Human ^b	Rat ^c		
	<i>f</i> u _{plasma}	<i>f</i> u _{brain}	<i>f</i> u _{CSF}	CL _{plasma} (mL/min/kg)	CL _{int, in vivo} (mL/min/kg)		
Quinidine	0.454	0.0242	0.996	4.02	3.92		
Risperidone	0.158	0.0596	0.984	5.4	16.55		
Sertraline	0.0347	0.00038	0.923	27.5	158.01 ^e		
Sulpiride	0.88	0.345	1	0.08	0.03 ^f		
Thiopental	0.202	0.244	0.988	na	na		
Verapamil	0.101	0.0165	0.974	13.3	138.68		
Zolnidem	0 267	0 265	0 992	43	7 47		

Table S8. Cont.

Zolpidem0.2670.2650.9924.37.47a Taken from Kodaira *et al.* [53]; ^b unless otherwise indicated data was taken from Hallifax *et al.* [113], as
either plasma clearance (denoted by: p) or microsomal clearance (denoted by: m); ^c unless otherwise
indicated, intrinsic *in vivo* clearance was calculated based on a well stirrer liver model assuming average
hepatic blood flow ($Q_{\rm H}$, 55 mL/min/kg). Blood clearance and unbound fraction in blood were determined
using the blood:plasma ratio ($R_{\rm b}$) or by assuming a value of 1 for basic and neutral drugs and 0.55 for
acidic drugs; ^d taken from Blum *et al.* [137]; ^e calculated from Ronfield *et al.* [138]; and ^f taken from
Bres *et al.* [139]; na: not applicable.

Table S9. Renal clearance. Renal clearance in rats (CL_R) was calculated based on glomerular filtration rate (GFR) ratio approach as described by Lin [70].

Compounds	Human	Rat		
Compounds	CL _R (mL/min/kg)	CL _R (mL/min/kg)		
Antipyrine	0.038 ^a	0.11		
Benzypenicillin	3.52 ^b	10.22		
Buspirone	na	na		
Caffeine	0.0073 ^c	0.021		
Carbamazepine	na	na		
Cephalexin	2.85 ^d	8.28		
Citalopram	na	na		
Cimetidine	4.34 ^e	12.6		
Daidzen	na	na		
Dantrolene	na	na		
Diazepam	na	na		
Flavopiridol	na	na		
Fleroxacin	0.93 ^r	2.7		
Genistein	na	109 ^g		
Loperamide	na	na		
Midalzolam	na	na		
Pefloxacin	na	na		
Phenytoin	na	na		
Quinidine	0.8 ^h	2.32		
Risperidone	na	na		
Sertraline	na	na		
Sulpiride	1.72 ⁱ	4.99		
Thiopental	na	na		
Verapamil	na	na		
Zolpidem	na	na		

^a Taken from Scavone *et al.* (1989 [140], 1997 [141]) and Thompson *et al.* [142]; ^b taken from Rumble *et al.* [143]; ^c taken from Birkett and Miners [144]; ^d taken from Brogard *et al.* [145]; ^e taken from Larson *et al.* [146]; ^f taken from Stuck *et al.* [147]; ^g taken from Setchell *et al.* [148]; ^h taken from Hughes, Ilett and Jellett [149] and Verme *et al.* [150]; and ⁱ taken from Bres and Bressolle [140].

S5. Rat Brain PBPK Model Predictions

	Transporter -	KD uu brain ^a			CSF _n :Plasma _n ^b		
Compounds		Predicted	Observed	Fold error	Predicted	Observed	Fold error
Antipyrine		0.235	0.708	3.0	0.215	0.99	4.6
Benzypenicillin		0.054	0.0264	2.0	0.078	0.0134	5.8
Buspirone		0.254	0.612	2.4	0.867	0.558	1.6
Caffeine		0.220	0.584	2.7	0.477	1.03	2.2
Carbamazepine		0.241	0.771	3.2	0.135	0.535	4.0
Cephalexin		0.078	0.016	4.8	0.106	0.0225	4.7
Citalopram		0.045	0.00981	4.6	0.088	0.0211	4.1
Cimetidine	BCRP	0.320	0.494	1.5	0.224	0.667	3.0
Daidzen	BCRP	0.120	0.0667	1.8	0.134	0.189	1.4
Dantrolene	BCRP	0.144	0.0297	4.8	0.037	0.0838	2.3
Diazepam		0.578	0.805	1.4	0.570	0.847	1.5
Flavopiridol	P-gp	0.087	0.0525	1.7	0.120	0.216	1.8
Flavopiridol	BCRP	0.079	0.0525	1.9	0.098	0.216	2.2
Fleroxacin	BCRP	0.187	0.25	1.3	0.172	0.283	1.6
Genistein	BCRP	0.33	0.181	1.8	0.942	0.589	1.6
Loperamide	P-gp	0.066	0.00886	7.4	0.118	0.0376	3.1
Midalzolam		0.699	2.19	3.1	0.504	1.35	2.7
Pefloxacin	P-gp	0.154	0.199	1.3	0.196	0.389	2
Pefloxacin	BCRP	0.181	0.199	1.1	0.177	0.389	2.2
Phenytoin		0.319	0.447	1.4	0.489	0.396	1.2
Quinidine	P-gp	0.176	0.026	6.8	0.054	0.0911	1.7
Risperidone	P-gp	0.10	0.0787	1.2	0.112	0.124	1.1
Sertraline		0.54	1.85	3.4	0.354	0.832	2.3
Sulpiride		0.07	0.0219	3.4	0.110	0.0499	2.2
Thiopental		0.42	0.911	2.2	0.399	0.599	1.5
Verapamil	P-gp	0.24	0.0786	3.1	0.165	0.333	2
Zolpidem		0.27	0.447	1.7	0.315	0.475	1.5

Table S10. Model predictions.

^{a,b} Bold indicates parameters predicted with a fold-error >5.



Figure S2. LOESS regression and confidence interval plots.

S6. Simulated Kpuu,brain and CSFu:Pu for Loperamide and Quinidine

Figure S3. *K*p_{uu,brain} model predictions for loperamide and quinidine (highlighted in black) using an *in vivo* surrogate efflux ratio metric for highly effluxed transporter substrates.



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