Use of Physiologically Based Kinetic Modeling-Facilitated Reverse Dosimetry to Predict In Vivo Acute Toxicity of Tetrodotoxin in Rodents

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ABSTRACT

In this study, the ability of a new in vitro/in silico quantitative in vitro–in vivo extrapolation (QIVIVE) methodology was assessed to predict the in vivo neurotoxicity of tetrodotoxin (TTX) in rodents. In vitro concentration–response data of TTX obtained in a multielectrode array assay with primary rat neonatal cortical cells and in an effect study with mouse neuro-2a cells were quantitatively extrapolated into in vivo dose–response data, using newly developed physiologically based kinetic (PBK) models for TTX in rats and mice. Incorporating a kidney compartment accounting for active renal excretion in the PBK models proved to be essential for its performance. To evaluate the predictions, QIVIVE-derived dose–response data were compared with in vivo data on neurotoxicity in rats and mice upon oral and parenteral dosing. The results revealed that for both rats and mice the predicted dose–response data matched the data from available in vivo studies well. It is concluded that PBK modeling-based reserve dosimetry of in vitro TTX effect data can adequately predict the in vivo neurotoxicity of TTX in rodents, providing a novel proof-of-principle for this methodology.

Key words: physiologically based kinetic modeling; reverse dosimetry; tetrodotoxin (TTX), neurotoxicity; new approach methodology.

Tetrodotoxin (TTX; Figure 1) is a naturally occurring neurotoxin that can be found in various marine gastropods and some fish species (Bane et al., 2014; Centers for Disease Control and Prevention, 1996). There are over 30 structural analogs of TTX (Huang et al., 2008). TTX has potent voltage-gated sodium channel blocker activity (Sui et al., 2002), preventing depolarization, and propagation of action potentials in nerve cells, resulting in the loss of sensation (Bane et al., 2014). The acute exposure to TTX leads to a wide range of acute adverse effects including skeletal muscle fasciculations, apathy, lethargy, ataxia, paralysis, and even death (Bane et al., 2014).

The European Food Safety Authority (EFSA) established an acute reference dose (ARfD) for TTX of 0.25 μg/kg bw based on an acute toxicity study with a single intragastric dose in mice with a no observed adverse effect level (NOAEL) of 75 μg/kg bw choosing apathy as the critical effect observed at a lowest observed adverse effect level (LOAEL) of 125 μg/kg bw (Abal et al., 2017; EFSA Panel on Contaminants in the Food Chain [CONTAM] et al., 2017). In this study, lethality was observed at 250 μg/kg bw with a steep dose–response curve from which a benchmark dose lower confidence limit (BMDL10) of 112 μg/kg bw could be derived (EFSA Panel on Contaminants in the Food Chain [CONTAM] et al., 2017). Because this BMDL10 value for lethality was considered to be close to the NOAEL for apathy, the EFSA Panel argued that it cannot be excluded that effects can still occur at 75 μg/kg bw. Therefore, they established the ARfD based
Materials

TTX ≥98% (CAS 4368-28-9), was purchased from Sigma-Aldrich (Zwijndrecht, The Netherlands). Dimethyl sulfoxide (DMSO) was purchased from Acros Organics (Geel, Belgium) and phosphate-buffered saline was purchased from Invitrogen (Breda, The Netherlands). Pooled hepatocytes from male Sprague Dawley rats, cryopreserved hepatocyte recovery medium (CHRM, CM7000), and primary hepatocytes thawing and plating supplements (CM4000) were purchased from Thermo Fisher (Landsmeer, The Netherlands).

Methods

Clearance of TTX

It was assumed that the in vivo acute toxicity of TTX is induced by the parent compound as there is no evidence of potential metabolites exerting a similar effect. Therefore, only the overall hepatic clearance of TTX was included in the PBK model. Primary hepatocytes from male Sprague Dawley rats were used to determine the hepatic clearance by the substrate depletion approach. To this end, pooled primary hepatocytes were thawed in a 37°C water bath and transferred to 50 ml CHRM (CM7000). The cell suspension was centrifuged at 100g for 15 min at room temperature, and the supernatant was removed. The collected hepatocytes were dissolved in 1 ml prewarmed hepatocyte incubation medium, which contained 4% primary hepatocyte thawing and plating supplements (CM4000) in Williams’ Medium E1 without phenol red. The density and viability of the hepatocytes were measured using the Cellometer (Auto T4, Nexcelom Bioscience). Hepatocytes with >90% viability were used for the incubation. The cells were diluted with incubation medium to reach a density of 1 × 10⁶ cells/ml. TTX was dissolved in DMSO to obtain a stock solution of 600 μM. A total of 20 μl Stock solution of TTX was added to 1980 μl medium to generate the exposure medium (final DMSO concentration 1% v/v). The exposure medium was preincubated for 5 min. The incubation was started by adding 100 μl primary hepatocytes into 100 μl preincubated exposure medium, giving a final concentration of 0.5 × 10⁶ cells/ml and 3 μM TTX (a nontoxic concentration to hepatocytes as shown by the WST-1 assay [data not shown]) (final DMSO concentration 0.5% v/v). The incubation was done using a shaker (Titramax 1000, Heidolph, Germany) at 150 rpm in a 5% CO₂, 95% air-humidified incubator. The incubation time points were: 0, 1, 2, 3, 4, 5, 7, 8.5, 10, 15, 30, 45, 60, and 90 min. For each incubation time point a corresponding control was included, consisting of an incubation performed in the absence of primary hepatocytes. The incubation was terminated by adding 100 μl cold acetone/trimethylamine and the samples were put on ice for 30 min, then centrifuged at 3500 rpm (1200 g) for 15 min at 4°C. Supernatants were collected and the concentration of TTX was quantified using liquid chromatography-mass spectrometry (LC-MS/MS) analysis. All incubations were performed in triplicate in 3 independent studies. The ratio of the remaining parent compound concentration in the incubation sample (Ccompound) and in the sample at time 0 as control (Ccontrol) was calculated for each incubation time (taking the amount of TTX left in the corresponding control incubations into account) and the depletion curve of the parent compound [ln (Ccompound/Ccontrol)] against time was derived. The slope of the linear part of the depletion curve represents the elimination rate constant (k, in 1/min) of the parent compound. The in vitro clearance (CL, in vitro)
of the parent compound was calculated using the following equation: 
\[ \text{CL}_{\text{int}} = \text{CL}_{\text{rat}} \left( \frac{\text{mg}}{\text{L/min}} \right) \times \left( \frac{10^6 \text{ cells}}{\text{ml}} \right) \times \left( \frac{1}{10^8 \text{ cells}} \right) \]
where \( \text{CL}_{\text{int}} \) represents the total clearance of the parent compound in vivo, \( \text{CL}_{\text{rat}} \) is the total clearance of the parent compound in vivo or in vitro, \( \text{mg} \) is the mass of the parent compound, and \( \text{L/min} \) is the volume of distribution at steady state. The number of hepatocytes per milliliter incubation mixture, \( [0.5 \times 10^6 \text{ cells/ml}] \), was used to scale the \( \text{CL}_{\text{int}} \) of the parent compound to a whole liver using the scaling factor of 135 000 (cell density liver expressed in \( 10^6 \text{ cells/kg} \); Houston, 1994).

**Analysis of TTX by LC–MS/MS**

LC–MS/MS analysis was performed on a Shimadzu Nexera XR LC–20AD SR ultra high performance liquid chromatography (UHPLC) system coupled with a Shimadzu LCMS-8045 mass spectrometer (Shimadzu Benelux’s Hertogenbosch, The Netherlands). The samples (1 μl) were loaded onto a BEH C18 column (1.7 μm, 2.1 × 100 mm) at a flow rate of 0.3 ml/min. The column temperature was set to 40°C. The mobile phase consisted of ultrapure water with 0.1% (v/v) formic acid as mobile phase A and acetonitrile containing 0.1% (v/v) formic acid as mobile phase B. The initial condition of the eluents was 5% A, then changed to 50% A in 2 min and subsequently returned to the initial condition in the next 5 min, and was kept at these starting conditions for another 5 min. The total runtime was 12 min. A Shimadzu LCMS-8045 triple quadrupole with electrospray ionization interface was used to perform the MS–MS analysis. The instrument was operated in the positive ion mode in the multiple reaction monitoring mode with a spray voltage of 4.5 kV. TTX was monitored at the [M + H]+ of precursor to product 320.1 → 302.19, 320.1 → 162.4, and 320.1 → 60.2 m/z. The Postrun Analysis function from the LabSolutions software (Shimadzu, Kyoto, Japan) was used to obtain the peak area of the total ion chromatogram.

**Development of the PBK model for TTX**

The generic PBK model developed in our previous study (Zhang et al., 2020) was used with minor modifications, defining a PBK model for TTX in both rat and mouse. To allow model evaluation based on the 3 available in vivo kinetic data sets, all with different administration routes, the PBK model was built for oral, intravenous (IV), and IM administration (Hong et al., 2017, 2018). For the IM administration, it was assumed that TTX was solely taken up in the blood via the muscle tissue at the injection site, thereby excluding the role of the subcutaneous and lymph routes. To distinguish between IM and IV administration, the rate of absorption from the IM injection site was set to a much lower value (50 h−1) than that for an IV injection (1 000 000 h−1). Given that the study by Hong et al. (2017) concluded that the predominant route of the elimination of TTX is by urinary excretion, a kidney compartment was included in the PBK models. The developed PBK model for TTX consisted of 8 compartments, including the site of injection, GI tract, blood, fat, liver, kidney, rapidly perfused tissue, and slowly perfused tissue. The schematic representation of the PBK model is displayed in Figure 2. A separate compartment for the brain was not included given the inability of TTX to pass the blood–brain barrier (Melnikova et al., 2018). The values for physiological and anatomical parameters for rat were obtained from Brown et al. (1997b) and for mouse from Hall et al. (2012). The partition coefficients to describe the distribution of TTX over the different tissues were estimated using the quantitative property-property relationship approach from Rodgers and Rowland (2006) facilitated by a QIVIVE toolbox (input: zwitterion, pKa1: 8.76, pKa2: 11 logP: −6.2 and molecular weight: 319.27 g/mol; Punt et al., 2020).

The assumption was made that the distribution of TTX in rat is the same as in mouse. The glomerular filtration (GF) was added to the model according to the equation: 
\[ \text{GF} = \frac{\text{GFR}}{\text{CVK}} \times \left( \frac{\text{CVK}}{\text{fub}_{\text{in vivo}}} \right) \]
where GFR is the GF rate, which is 5.2 ml/min/kg bw for rat and 14 ml/min/kg bw for mouse (Walton et al., 2004), CVK is the concentration of TTX in the kidney compartment and \( \text{fub}_{\text{in vivo}} \) is the fraction of TTX unbound in the in vivo situation. As mentioned by Matsumoto et al. (2017), TTX seems to be a substrate for some active transporters in the proximal tubule cells in the kidney. Since it is unknown which transporter has the highest contribution it was decided to work with an estimated apparent overall \( V_{\text{max}} \) and \( K_m \); 1 \( V_{\text{max}} \) and 1 \( K_m \) for all transporters involved. After running model predictions including only GF as the excretion pathway, data for the apparent overall \( V_{\text{max}} \) and \( K_m \) were estimated based on manual input of \( V_{\text{max}} \) and \( K_m \) searching for the optimal transporter efficiency (TE = \( V_{\text{max}}/K_m \) in μl/min/mg protein) by fitting to the available in vivo kinetic data. Matsumoto et al. (2017) reported Papp values for the bidirectional transport of TTX over an LLC-PK1 kidney cell layer. Future use of such Papp values to define the in vivo kinetic parameters for urinary excretion of TTX in a PBK model requires definition of the scaling factor(s) needed to convert these in vitro Papp values to the kinetic constants for active transport of TTX in the kidney in vivo. This scaling could be achieved by scaling the model predictions to fit available in vivo data, as done in this study for \( V_{\text{max}} \), as well as in other studies for other transport parameters, including parameters for renal excretion in PBK models, such as for the PBK model for perfluorooctanoic acid in rats (Worley and Fisher, 2015) and the PBK model for meipiquat in rats (Noorlander et al., 2021). The model equations were coded and numerically integrated in Berkeley Madonna 8.0.1 (UC Berkeley, California), using the Rosenbrock’s algorithm for stiff systems (see Supplementary Material A for the model codes).

**PBK model evaluation**

For evaluation of the PBK model, in vivo kinetic data of the TTX blood concentration in time upon oral, IV or IM dosing were available for rats (Hong et al., 2017, 2018). It was assumed that evaluation of the model in rats would support its use for mice as well. It is important to note that the in vivo kinetic data were obtained in plasma, whereas the PBK model predicts the concentration in whole blood. Thus, an adjustment of the reported
concentrations in plasma to concentrations in blood was made by multiplying the plasma data with the blood:plasma ratio (0.42; derived from Hong et al. 2017). For the IM administration kinetic data presented by Hong et al. (2017) for the dried plasma curve were used since these data were corrected for the formed tritiated water by the hydrogen–tritium exchange of 11-[^3]H]TTX in the plasma possibly interfering with the results. To identify the most influential parameters of the PBK model on the model prediction of the maximum blood concentration ($C_{\text{max}}$) upon oral and IM administration, a sensitivity analysis was performed (see Supplementary Figure 1). To this end, an initial input parameter value was increased by 5% and the sensitivity coefficients (SCs) were calculated using the equation $SC = (C - C' / (F - P) \times (P / C)$, in which $P$ and $P'$ represent the initial and modified parameter value, respectively, whereas $C$ and $C'$ are the initial and modified model output for $C_{\text{max}}$ (Evans and Andersen, 2000). Each parameter was analyzed individually by changing 1 parameter at a time keeping the other parameters at their original value, while the total blood flow fraction was kept as 1. The sensitivity analysis was performed for exposure to 6 mg/kg for the oral and IM routes, representing the dose level actually used in the available in vivo studies (Hong et al., 2017, 2018).

Translation of the in vitro neurotoxicity data for TTX to in vivo dose–response data

For rat, 2 in vitro concentration–response data sets were available. Both studies performed the MEA assay using primary rat neonatal cortical cells for measuring neuronal activity upon exposure to TTX (Kasteel and Westerink, 2017; Nicolas et al., 2014). For mouse, 4 in vitro concentration–response data sets were available, where in all studies mouse neuro-2a cells were used to detect the inhibition by TTX on cellular toxicity (Hamasaki et al., 1996; Kogure et al., 1988; Nicolas et al., 2015; Yamashoji and Ishikii, 2001; Yeo et al., 1996). The inhibition is induced by first exposing the cells to veratridine (sodium-channel opener) and ouabain (blocking of Na+/K+ -ATPase) which may result in disturbance of the sodium ion homeostasis in the cells resulting in cell death (Kogure et al., 1988; Rossini and Hartung, 2012). When the veratridine/ouabain-treated cells are exposed to TTX the sodium channels are blocked and sodium accumulation in the cells is prevented, counteracting the toxic effects of veratridine and ouabain, thereby leading to cell survival (Kogure et al., 1988). Throughout this study, this assay is further referred to as the neuro-2a assay. The available concentration–response data were used to predict the dose levels that were required to reach the respective effect concentrations of TTX in blood, using PBK modeling-based reverse dosimetry. It is of importance to realize that only the free fraction of the compound will exert the effects, which implies that a correction for protein binding prior to applying reverse dosimetry should be considered. However, due to the physicochemical characteristics of TTX the fraction unbound in vivo is 1 (see toolbox Punt et al., 2020) and therefore, the excellent water solubility of TTX, it was assumed that in the in vitro MEA medium and neuro-2a medium containing 10% fetal bovine serum the $f_{\text{univ}}$ of TTX was 1, too. Thus, the in vitro effect concentration ($EC_{\text{in vitro}}$) of TTX was set equal to an in vivo effect concentration ($EC_{\text{in vivo}}$) without a need for correction for potential differences in protein binding in the in vitro and in vivo situation. The $C_{\text{max}}$ was the chosen dose metric for reverse dosimetry of TTX as the mode of action of its toxicity, sodium channel blocking, shows to be a concentration-dependent endpoint with a threshold (Rietjens et al., 2019). So, the estimated $EC_{\text{in vitro}}$ was set equal to $C_{\text{max}}$ of TTX in the PBK model. By repeating these steps for all the in vitro test concentrations, the in vitro concentration–response data were converted to define the corresponding in vivo dose–response data.

Comparing predicted dose–response curves to in vivo toxicity data

After evaluation of the model, the predicted in vivo dose–response curves were compared with the available in vivo TTX toxicity data. For this comparison, the most sensitive endpoint for toxicity was chosen for each route and species as described in the result section. To quantify the comparison benchmark dose (BMD) responses were generated using the EFSA online BMD software. The BMDL10 and BMDL90 were determined under the EFSA default settings for Akaike information criterion being 2 and a confidence interval of 95%. Only BMDL10 and BMDL90 values as a result of model averaging were taken. Furthermore, a medium effective dose (and concentration) ($ED_{50}$ and $EC_{50}$) was calculated in Excel using the TREND function as follows: (1) calculate from the dataset the halfway response: lowest $y_{\text{value}}$ + (highest $y_{\text{value}}$ - lowest $y_{\text{value}}$)/2 and (2) use the TREND function, which includes the 2 $x$-values with corresponding $y$-values in between where the halfway response lies to calculate its $x$-value, also the $ED_{50}$ (or $EC_{50}$). $EC_{10}$ Values were used to compare the in vitro data sets.

Human model

In spite of the limited available human data on TTX kinetics, a human PBK-model was defined, assuming that the evaluation of the model in rat would support its use for humans. The physiological and physicochemical parameters for the human model were taken from the literature in a similar way as for rat (Brown et al., 1997a; Punt et al., 2020) and are presented in Table 1. The kinetic constants were taken from the rat model and adjusted to human using human scaling factors. For reverse dosimetry 1 in vitro data set was available (Kasteel and Westerink, 2017) describing a concentration–response curve for the effect of TTX on human-induced pluripotent stem cell (hiPSC)-derived iCell neurons in coculture with hiPSC-derived iCell astrocytes in the MEA assay. Using our human PBK model, this in vitro concentration–response curve was translated to an in vivo dose–response curve for oral exposure to TTX and a BMDL10, BMDL90 and ED50 were derived that were compared with available (on mouse study based) human data on TTX toxicity.

RESULTS

Substrate Depletion of TTX

Figure 3 shows the depletion of TTX in incubations with rat hepatocytes. In the in vitro hepatic clearance ($CL_{\text{int}}$) derived from these data amounted to $1.6 \times 10^{-2} \pm 0.01 \text{ml/min/10}^6 \text{cells}$ converted to an in vivo $CL_{\text{int}}$ of $1.1 \times 10^{-1} \text{l/h}$ for the rat, indicating that clearance of TTX via metabolism is limited. It was assumed that the mouse hepatic clearance would be similarly limited.

In Vitro Concentration–Response Data for TTX in Rodent Cells

The available in vitro concentration–response data for neurotoxicity of TTX in rat primary neonatal cortical cells in the MEA assay and for the neurotoxicity of TTX in the mouse neuro-2a assay are summarized in Figure 4. Both the rat MEA data (Figure 4A) and the mouse neuro-2a data (Figure 4B) reported in different studies provide comparable results, except for the data of Nicolas et al., (2015) for the mouse neuro-2a assay, which indicate at a somewhat greater sensitivity. Nevertheless, these data together provide a suitable data set for QIVIVE and
Table 1. Physiological and Anatomical Parameter Values and the Partition Coefficients Used for the Physiologically Based Kinetic Models

| Parameters                        | Rata | Mouseb | Humanb |
|----------------------------------|------|--------|--------|
| Body weight (kg)                 | 0.24 | 0.03   | 70     |
| Fraction of tissue volumes       |      |        |        |
| Fat                              | 0.070| 0.070  | 0.214  |
| Liver                            | 0.094| 0.055  | 0.026  |
| Blood                            | 0.074| 0.087  | 0.079  |
| Kidney                           | 0.007| 0.017  | 0.004  |
| Rapidly perfused tissue          | 0.091| 0.137  | 0.064  |
| Slowly perfused tissue           | 0.724| 0.654  | 0.613  |
| Cardiac output                   | 15c  | 15.4d  | 15c    |
| Fraction of blood flow to tissue |      |        |        |
| Fat                              | 0.070| 0.070  | 0.052  |
| Liver                            | 0.174| 0.158  | 0.227  |
| Kidney                           | 0.141| 0.114  | 0.175  |
| Rapidly perfused tissue          | 0.093| 0.516  | 0.195  |
| Slowly perfused tissue           | 0.512| 0.142  | 0.351  |
| Partition coefficients           |      |        |        |
| LogP<sub>ow</sub>                | −6.2f| 8.76f  |        |
| pKα1                             | 11e  |        |        |
| pKα2                             |       |        |        |
| Fat/blood partition coefficient  | 0.46 | 0.46   | 0.46   |
| Liver/blood partition coefficient| 4.29 | 4.29   | 4.29   |
| Kidney/blood partition coefficient| 4.70 | 4.70   | 4.70   |
| Rapid perfused tissue/blood      | 4.29 | 4.29   | 4.29   |
| partition coefficient            | 0.95 | 0.95   | 0.95   |
| Slowly perfused tissue/blood     |      |        |        |
| partition coefficient            |      |        |        |

*Brown et al. (1997a).

*Hall et al. (2012).

*μl/h × kg × bw<sup>0.74</sup>

*μl/h × kg × bw<sup>0.74</sup>

*Punt et al. (2020).

*Hort et al. (2020).

*Camougis et al. (1967).

Figure 3. Time-dependent substrate depletion of tetrodotoxin in incubations with primary rat hepatocytes. Symbols represent the average ln([compound]/<sub>C<sub>control</sub>) at different incubation time points (mean ± SD of 3 independent experiments). Straight line represents the depletion curve and the dotted line represents zero depletion.

Figure 4. Dose–response data in vivo for tetrodotoxin (TTX) in rodents available in literature for evaluation of the QIVIVE predictions. The graphs in Figure 4 show that the rat primary neonatal cortical cells in the MEA assay (EC<sub>50</sub> values of 0.0035 and 0.0055 μM; Figure 4A) seem to be only slightly more sensitive than the mouse neuro-2a cells in the neuro-2a assay (EC<sub>50</sub> values of the 3 corresponding data sets amounting to 0.0082 μM).

PBK Model Evaluation

The evaluation of the PBK model using different routes of administration and the parameter input presented in Table 1 is shown in Figure 5. Predictions were fitted to the in vivo data by estimating the rate of absorption for the oral route (ka: 0.18/h) and IM route (kb: 50/h) and optimizing the contribution of active renal excretion based on the transporter efficiency, which was 90μl/min/mg protein (V<sub>max</sub> = 180 pmol/min/mg protein, K<sub>m</sub> = 2 μM). It appeared important to include this active excretion since it accounts for a substantial improvement in the predictions (compare Figure 5 with renal excretion, to Supplementary Figure 2 for data without taking renal excretion into account). For all administration routes, oral (Figure 5A), IM (Figure 5B), and IV (Figure 5C), the model was able to adequately predict the in vivo data. To enable subsequent PBK model-based reverse dosimetry for both the oral and the IM mode of administration a plot of the dose against C<sub>max</sub> was made, which was used to convert the in vitro concentrations from Figure 4 to in vivo dose levels to generate the dose–response curves. As explained in the Materials and Methods section, the high water solubility of TTX eliminated the need for a correction for differences in protein binding with the fub in vitro and in vivo both being 1.

Literature Reported In Vivo Dose–Response Data in Rodents

Figure 6 summarizes the available in vivo dose–response data for TTX in rodents available in literature for evaluation of the QIVIVE predictions. It must be noted that although the reported in vivo data are used for evaluation of the QIVIVE predictions made in this study using a NAM, this does not imply that the authors of this study agree with the ethics of these animal studies as they involve pain and discomfort to the animals. Three data sets for rat (Figure 6A) originate from studies reporting on the pharmacological application of TTX as a morphine-like painkiller (Kohane et al., 1998, 2000; Marcil et al., 2006). The dose–response curves from these 3 studies reveal substantial differences in sensitivity depending on the endpoint used to quantify the effect. The data reported by Marcil et al. (2006) using the so-called Von Fray hair test to quantify the TTX-induced reduction in mechanical allodynia (pain) showed effects at 16-fold lower dose levels (Figure 6A, left y-axis) than the dose–response curves defined based on TTX-induced thermal nociceptive blocking (blocking of the peripheral sensory neurons; nociceptors; Figure 6A, right y-axis). The route of administration in all 3 studies was comparable consisting of subcutaneous/percutaneous injection. The data set reporting mechanical alldynia, apparently relating to the most sensitive endpoint, was selected for QIVIVE-based predictions. For mouse (Figure 6B), 6 data sets were identified in the available literature of which 2 selected for QIVIVE-based predictions. It must be noted that although the reported
The “time to death” endpoint in minutes requires higher doses to be affected than the more sensitive endpoint including a so-called writhing test where the number of contractions of the abdomen was measured after exposure to acetic acid following increasing concentrations of TTX (both shown on left y-axis of Figure 6B). The latter study was selected for further QIVIVE-based predictions. The data sets for the oral route show a lower sensitivity to TTX compared with the parenteral route likely related to the low oral bioavailability of TTX of 6.7% reported by Hong et al. (2018). For the oral route, dose–response curves for the macroscopically observed neurological symptoms apathy, numbness, seizures, and mortality were available (shown on right y-axis of Figure 6B), where apathy was the most sensitive endpoint and therefore selected for the QIVIVE-based predictions.

QIVIVE to Translate In Vitro Neurotoxicity Data for TTX into In Vivo Dose–Response Data

The in vitro concentration–response curves were translated to in vivo dose–response curves using the PBK models for reverse dosimetry and QIVIVE. This resulted in the predicted dose–response curves presented in Figure 7 on the left y-axis. Figure 7 also presents, for comparison, the reported in vivo dose–response curves for the most sensitive endpoint as taken from Figure 6A on the right y-axis. The results thus obtained reveal an adequate match between the predicted and actual experimentally obtained dose–response curves, with the predicted ED$_{50}$ values differing only 1- to 1.4-fold from the in vivo ED$_{50}$ value (Table 2).

For mouse, both the IM model and the oral PBK model were used to translate the respective in vitro concentration–response data into in vivo dose–response data (Figure 8). For the parenteral route, the most sensitive endpoint was the number of visceral contractions for which the in vivo dose–response curve was provided by Marcil et al. (2006). Figure 8A presents a comparison of the in vivo experimental data (right y-axis) to the predicted dose–response curves (left y-axis) for TTX in mice. This comparison reveals that the predicted dose–response curves based on the in vitro data obtained in the neuro-2a assay are in line with the observed in vivo dose–response data as the predicted ED$_{50}$ values vary 1.8-fold to a maximum of 3-fold from the in vivo ED$_{50}$ value (Table 2). Apathy was the most sensitive endpoint for the oral route and therefore chosen for the comparison to the predicted dose–response curve upon oral administration of TTX (Figure 8B). Here too, the predicted dose–
response curves (left y-axis) appear to be in accordance with the observed in vivo data (right y-axis) with the predicted ED$_{50}$ values being at most up to 2.3-fold lower than the observed in vivo ED$_{50}$ value (Table 3).

**Predicting TTX Neurotoxicity in Human and Estimating a Tentative PoD**

Upon evaluation of the rat TTX model the model code was used to define a human oral PBK-model. For predicting TTX neurotoxicity in human by QIVIVE an in vitro data set reported by Kasteel and Westerink (2017) was used describing TTX toxicity towards human iPSC-derived iCell neurons in co-culture with hIPSC-derived iCell astrocytes exposed to TTX in the MEA (MEA assay; Figure 9A). The dose–response curve obtained of TTX in this MEA cell model was translated to an in vivo dose–response curve applying PBK model-based reverse-dosimetry with the human PBK-model resulting in an in vivo dose–response curve with an ED$_{50}$ of 18 µg/kg bw (Figure 9B). Further BMD analysis on this predicted in vivo dose–response curve resulted in a BMD$_{10}$ of 4.3 µg/kg bw, and a BMDL$_{10}$ of 1.8 µg/kg bw (see Supplementary Figs. 3 and 4 and Supplementary Table 1 for details). Taking the BMDL$_{10}$ as a PoD for the risk assessment of TTX and using a factor 10 for interindividual variability would result in an ARfD of 0.18 µg/kg bw. This tentative PoD is only 1.4-fold different from the previously established ARfD by EFSA of 0.25 µg/kg bw based on an acute toxicity study in mice (Abal et al., 2017).
Table 2. Established ED$_{50}$ Values for the Predicted In Vivo Dose–Response Data and In Vivo Data for Rat and Mouse via Parenteral Administration

|                | ED$_{50}$ (µg/kg bw) | Endpoint                        | Literature                          |
|----------------|----------------------|---------------------------------|--------------------------------------|
| **Injection**  |                      |                                 |                                      |
| Rat            |                      |                                 |                                      |
| Predicted      | 1                    | MEA Spike                       | Kasteel and Westerink (2017)         |
|                | 0.7                  | MEA Spike                       | Nicolas et al., (2014)               |
| In vivo        | 0.7                  | Von Frey                        | Marcil et al., (2006)                |
|                | 10.4                 | Nociceptive block               | Kohane et al., (1998)                |
| **Mice**       |                      |                                 |                                      |
| Predicted      | 2.1                  | Cytotoxicity inhibition         | Hamasaki et al., (1996)              |
|                | 1.5                  | Cytotoxicity inhibition         | Yamashoji and Isshiki (2001)         |
|                | 2.4                  | Cytotoxicity inhibition         | Yeo et al., (1996)                   |
| In vivo        | 0.84                 | No. visceral contractions       | Marcil et al., (2006)                |
|                | 12                   | Time to death                   | Finch et al., (2018)                 |

The literature reported ED$_{50}$ values used for comparison to the predicted ED$_{50}$ values are printed in bold.

Figure 8. Predicted in vivo dose–response curves for tetrodotoxin in mice upon (A) injection (intramuscular model) and (B) oral administration (oral model). In blue the in vivo endpoints visceral contractions (diamonds; Marcil et al., 2006; Figure 8A) and apathy (inverted triangles; Abal et al., 2017; Figure 8B) displayed on right y-axes. The predictions were based on the mouse neuro-2a assay data reported by Hamasaki et al. (1996; triangles); Yamashoji and Isshiki (2001; circles), and Yeo et al. (1996; squares) displayed on the left y-axes. Data points represent mean (± SD/SEM, where available).

Table 3. Established ED$_{50}$ Values for the Predicted In Vivo Dose–Response Data and In Vivo Data for Mouse via Oral Administration

|                | ED$_{50}$ (µg/kg bw) | Endpoint                          | Literature                          |
|----------------|----------------------|----------------------------------|-------------------------------------|
| **Oral**       |                      |                                  |                                      |
| Mice           |                      |                                  |                                      |
| Predicted      | 61                   | Cytotoxicity inhibition          | Hamasaki et al. (1996)              |
|                | 42                   | Cytotoxicity inhibition          | Yamashoji and Isshiki (2001)        |
|                | 69                   | Cytotoxicity inhibition          | Yeo et al. (1996)                   |
| In vivo        | 96                   | Apathy                           | Abal et al. (2017)                  |
|                | 560                  | Seizures/Numbness                |                                     |
|                | 223                  | Mortality                        |                                     |

The literature reported ED$_{50}$ values used for comparison to the predicted ED$_{50}$ values are printed in bold.
TTX is an acute neurotoxin, which upon systemic exposure affects both action potential generation and impulse conduction by extracellular blockade of the voltage-gated sodium channels. The available ARID of TTX (0.25 μg/kg bw), is derived from a study on mice in which TTX was dosed orally (via gavage; EFSA Panel on Contaminants in the Food Chain [CONTAM] et al., 2017). Given the available data sets on acute toxicity of TTX in rodents and the many analogs of TTX for which experimental toxicity data are lacking, it is of interest to study whether the acute toxicity of TTX can be adequately predicted by a NAM based on in vitro and in silico data.

PBK modeling-based reverse dosimetry has proven to be a promising NAM to derive quantitative data, which can potentially be used in risk assessment to estimate in vivo toxicity in rodents and human (Chen et al., 2018; Li et al., 2017a; Louisse et al., 2015; Ning et al., 2019; Shi et al., 2020; Strikwold et al., 2017; Zhang et al., 2018, 2020). This study aimed to assess the potential of using the PBK modeling-based reverse dosimetry approach as a NAM to predict the neurotoxicity of TTX in rodents, based on in vitro toxicity data obtained in the MEA assay using primary rat neonatal cortical cells or data obtained using the mouse neuro-2a assay.

Evaluation of the PBK model performance for TTX demonstrated its adequacy for predicting kinetic data for different routes of administration. In line with the results from Hong et al. (2017) who reported that <10% of TTX was metabolized, the results of this study corroborated that hepatic metabolism does not contribute substantially to the systemic clearance of TTX in vivo (CLint: 1.6 × 10^{-7} ± 0.01 ml/min/10^6 cells; in vitro CLint: 1.15 × 10^{-5} l/h), while renal excretion plays a major role in TTX kinetics. Furthermore, the PBK modeling data of this study revealed that up to 86% of TTX clearance in the kidney could be ascribed to active transport by the proximal tubule cells. This active transport of TTX was previously also demonstrated in the renal proximal tubule cell line LLC-PK1 (Matsumoto et al., 2017). In this in vitro study, TTX was shown to be primarily transported by the organic cation transporters and the organic cation/carnitine transporters. To a lesser extent organic anion transporters and multidrug resistance-associated proteins were involved, too. The PBK model evaluation of this study provides insight in the efficiency of this active transport and revealed that it contributes considerably to TTX clearance. To substantiate the values used in this article, it would be of interest to perform in vitro transport studies with TTX for the organic cation transporters in stably transfected cell lines such as the human embryonic kidney cell line HEK-293 and investigate to what extent such in vitro data can provide the kinetic data defined in this study by fitting the PBK model to available in vivo data for TTX kinetics.

The results obtained revealed that the NAM used in this study could adequately predict the dose–response curves for the selected most sensitive endpoints reported in the available in vivo studies. This, in spite of the fact that the spike rates used as readout in the MEA assay (Nicolas et al., 2014) and the endpoint quantified in the MT assay using the mouse neuroblastoma cell line, both used to generate the in vitro concentration–response curves, may detect TTX neurotoxicity based on different endpoints than the endpoints quantified in the in vivo neurotoxicity studies. This is possible because the underlying mode of action for all in vivo endpoints relates to the TTX mediated blocking of sodium channels. The reasons underlying the differential sensitivity of the various in vivo endpoints may relate to as yet unidentified differences in the toxicodynamics and/or toxicokinetics of TTX in the target tissue of interest underlying the respective adverse effects (mechanical allodynia, thermal nociceptive blocking, visceral contractions, apathy, and seizures).

Hence the question arises as to what extent the endpoints quantified in the MEA assay or the neuro-2a assay match these in vivo endpoints. Although the mechanism of action underlying all the in vitro and in vivo endpoints studied for TTX is blocking of the voltage-gated sodium channels, thereby interfering with the production of action potentials, it is of interest to consider the different endpoints in some more detail. For the rat in vivo data, the sensory neurons stimulated in the Von Frey hair test and the thermal nociceptive blocking test are nonvisceral (or somatic) sensory neurons that can respond to (noxious) events such as mechanical, (extreme) heat/cold, or chemical stimuli (Dubin and Patapoutian, 2010; Robinson and Gebhart, 2008). In both experiments, the hind paw of the rats was exposed to either mechanical stimuli by Von Frey filament or heat stimuli by a hot plate (56°C) until paw withdrawal was observed. Apparently, enduring the pain of heat (uncomfortable sensation) requires higher doses of TTX than enduring the pinprick of a Von Frey filament until uncomfortable sensation, and the type of stimuli (mechanical, heat) and/or the underlying...
pathway determines how sodium channel blocking is perceived. Here, the Von Frey hair test seems to be the more sensitive endpoint than the thermal nociceptive blocking test. The underlying neuronal/neuromuscular processes to further explain this difference between the different in vivo endpoints lies beyond the scope of this study (Dubin and Patapoutian, 2010).

In the MEA assay, primary rat neonatal cortical neurons isolated from cortices form a network of inhibitory and excitatory cells with different subtypes and amongst them nonvisceral neurons (Masland, 2004; Nicolas et al., 2014; Schnitzler et al., 1999). In the MEA assay, the neuronal cells are directly exposed to TTX and show a decrease in activity compared with baseline with increasing concentrations of TTX. The sodium channel block is therefore directly measurable, whereas this effect in vivo is only indirectly noticeable via neuromuscular communication with the central nervous system. Nevertheless, the MEA assay provides a very sensitive endpoint; therefore, the in vivo endpoint chosen for the comparison to data predicted based on the in vitro assay should be as sensitive as possible.

A similar evaluation for in vitro endpoints and in vivo endpoints can be performed for the mouse assays. The in vivo data on mice, generated in the writhing test, are based on innervation of the visceral sensory neurons by exposure to acetic acid, which via the acid-sensing ion channels lead to pain sensation expressed as abdomen contraction together with twisting and turning of the trunk and arching of the back (Holzer, 2011; Marcill et al., 2006; Robinson and Gebhart, 2008). These effects are decreased by increasing TTX concentrations blocking the sodium channels and preventing signal transduction. This endpoint appears much more sensitive than measuring the time of death that requires higher doses of TTX (Finch et al., 2018). Comparing the endpoint of the TTX effect in the in vivo writhing test—decrease of visceral contractions—to the TTX effect in the in vitro neuro-2a assay—cell survival—suggests that these endpoints are not exactly the same in spite of the similar underlying mechanism of action. However, in spite of this apparent difference, the use of the neuro-2a assay for QIVIVE did provide adequate in vivo predictions for the writhing test. Similarly, outcomes of the in vitro embryonic stem cells test for developmental toxicity, detecting the inhibition of the development of mouse embryonic ES-D3 stem cells to beating cardiomyocytes, appeared to provide a suitable in vitro endpoint to predict a wide range of in vivo endpoints for developmental toxicity including malformations, number of live pups, and fetal body weight (Kamelia et al., 2017; Li et al., 2017b; Strikwold et al., 2013).

With respect to neurotoxicity, previous studies already concluded that for determining the toxicity of neurotoxins in vivo the 2 most promising assays are the MEA assay (using rat primary neonatal cortical cells) and the mouse neuro-2a assay (Bodero et al., 2018; Nicolas et al., 2014, 2015). The results of this study reveal that these 2 assays are adequate to define concentration-dependent in vitro toxicity data for TTX for QIVIVE using PBK model-based reverse dosimetry. Moreover, using a human iPSC in vitro MEA assay showed to have potential to generate data for establishing a tentative PoD (BMDL010) for human TTX toxicity in line with the previously established ARfD by EFSA. To confirm this with more proof, more research should be conducted on the kinetics of TTX in human.

To recapitulate, in this study, we have successfully built a PBK model for the marine biotoxin TTX in rodents (rat, mouse) where renal excretion via active transport seems to play a major role in its kinetics. The results presented provide support for the use of this NAM for predicting the acute neurotoxicity of TTX (and its analogs). Thereby, a cautious attempt has been made to predict TTX toxicity in human using only in vitro and in silico data applying reverse-based dosimetry enabled by PBK-modeling and shows to have potential.

**SUPPLEMENTARY DATA**

Supplementary data are available at Toxicological Sciences online.

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**DECLARATION OF CONFLICTING INTERESTS**

The authors declared no potential conflicts of interest with respect to the research, authorship, and/or publication of this article.

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