A Human PBPK/PD Model to Assess Arsenic Exposure Risk Through Farmed Tilapia Consumption

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Abstract The purpose of this study was to develop a biologically based risk assessment model for human health through consumption of arsenic (As) contaminated farmed tilapia (*Oreochromis mossambicus*) from blackfoot disease (BFD)-endemic area in Taiwan for estimating the consumption advice. We linked a physiologically based pharmacokinetic (PBPK) and a pharmacodynamic (PD) model to account for the exposure and dose-response profiles of As in human. Risk analysis indicates that consumption of farmed tilapia poses no significant threat from As-induced lung and bladder cancers. The predicted risk-based median consumption advice was no more than 5–17 meals month⁻¹ (or 2–6 g day⁻¹).

Keywords Arsenic · PBPK/PD · Risk analysis · Consumption advice

Arsenic (As) is a common environmental toxicant and a known human carcinogen. Tseng et al. (2007) indicated that long-time exposure to ingest inorganic As in ground-water has been found to induce blackfoot disease (BFD). BFD is a unique peripheral vascular disease that ends with dry gangrene and spontaneous amputation of affected extremities in a limited area on the southwest coast of

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Taiwan. Nowadays, most of the people living in these areas do not drink groundwater. However, groundwater is still used for aquaculture. Farming of tilapia (Orechromis mossambicus) is a promising business at BFD-endemic area in Taiwan. Agency for Toxic Substances and Disease Registry (ATSDR) (2000) indicated that ingestion of As may increase the risks of internal cancers. ATSDR (2000) further noted the occurrence of internal tumors of the internal tissues in patients with As-induced skin cancer. However, the USEPA has not yet calculated a specific risk value or cancer slope factor for As-induced internal cancers (ATSDR 2000). In this study, we developed a risk model that linked a physiologically based pharmacokinetic (PBPK) model and a pharmacodynamic (PD) model. The PBPK model can estimate As exposure distributions in human blood, lung, bladder, skin, and GI tract. The PD model can be used to reconstruct dose-response functions for arsenicosis (hyperpigmentation and keratosis) and Asinduced cancers (lung, bladder, and skin cancers). We combined the exposure distribution profiles and the reconstructed dose-response profiles to predict and to compare the human As exposure risks for subsistence fishers in BFD-endemic area and residents in non-BFDendemic area in Taiwan region.

The purposes of this study were: (1) to conduct an biologically-based risk assessment based on the USEPA (1998) methodology for human As exposure risk through consumption of farmed tilapia from BFD-endemic area in Taiwan; (2) to address the uncertainties by using a probabilistic PBPK/PD approach to characterize risks that yield quantitative risk estimates and their associated uncertainties; and (3) to estimate risk-based consumption advice regarding As contaminated farmed tilapia based on USEPA (2000) approach for potential carcinogenic risks.

Materials and Methods

The pathway of As exposure for human is through farmed tilapia consumption. Farmed tilapia is contaminated with

organ i, $\{u(t)\}$ represents an input vector of chemical concentration in tilapia muscle, [K] is a state matrix describes the diffusion exchange rate between target organs,

$$[K] = \begin{bmatrix} -(Q_{\rm L} + Q_{\rm BL} + Q_{\rm S} + Q_{\rm GI}) \frac{P_{\rm D}}{V_{\rm B}} & \frac{Q_{\rm L}}{R_{\rm L}V_{\rm B}} & \frac{Q_{\rm BL}}{R_{\rm BL}V_{\rm B}} & \frac{Q_{\rm S}}{R_{\rm S}V_{\rm B}} & \frac{Q_{\rm GI}}{R_{\rm GI}V_{\rm B}} \\ \frac{Q_{\rm L}F_{\rm D}}{W_{\rm L}} & -\left(\frac{Q_{\rm L}}{R_{\rm L}W_{\rm L}}\right) & 0 & 0 & 0 \\ \frac{Q_{\rm BL}F_{\rm D}}{W_{\rm BL}} & 0 & -\left(\frac{Q_{\rm BL}}{R_{\rm BL}W_{\rm BL}} + K_{\rm U}\right) & 0 & 0 \\ \frac{Q_{\rm S}F_{\rm D}}{W_{\rm S}} & 0 & 0 & -\left(\frac{Q_{\rm S}}{R_{\rm S}W_{\rm S}}\right) & 0 \\ \frac{Q_{\rm GI}F_{\rm D}}{W_{\rm GI}} & 0 & 0 & 0 & -\left(\frac{Q_{\rm GI}}{R_{\rm GI}W_{\rm GI}} + K_{\rm F}\right) \end{bmatrix}$$

As through groundwater. Exposures of subsistence fishers in BFD-endemic area and residents in non-BFD-endemic area to As were only through consumption of farmed tilapia obtained from tilapia farms in BFD-endemic area. We assumed people only eating the muscle part of contaminated farmed tilapia. The As level in farmed tilapia muscle is determined by using a physiologically based toxicokinetic (PBTK) model (Ling et al. 2005). In this

and [X] is a constant input matrix describes the exchange rate into the target organ,

$$[X] = \begin{bmatrix} 0 & 0 & 0 & 0 & \frac{CR\alpha}{W_{GI}} \end{bmatrix}^{T}.$$

We considered the steady-state condition in Eq. 1 and respectively solved for the steady-state As concentrations in human lung (C_L) , bladder (C_{BL}) , and skin (C_S) ,

$$C_{\rm L} = \frac{Q_{\rm L}F_{\rm D}IJCG}{\left[AFHIJ - \left(HIJBQ_{\rm L}F_{\rm D} + FIJCQ_{\rm BL}F_{\rm D} + FHJDQ_{\rm S}F_{\rm D} + FHIEQ_{\rm GI}F_{\rm D}\right)\right]},\tag{2}$$

$$C_{\rm BL} = \frac{Q_{\rm BL}F_{\rm D}FICG}{\left[AFHIJ - \left(HIJBQ_{\rm L}F_{\rm D} + FIJCQ_{\rm BL}F_{\rm D} + FHJDQ_{\rm S}F_{\rm D} + FHIEQ_{\rm GI}F_{\rm D}\right)\right]},\tag{3}$$

$$C_{\rm S} = \frac{Q_{\rm S}F_{\rm D}FJCG}{\left[AFHIJ - (HIJBQ_{\rm L}F_{\rm D} + FIJCQ_{\rm BL}F_{\rm D} + FHJDQ_{\rm S}F_{\rm D} + FHIEQ_{\rm GI}F_{\rm D})\right]},\tag{4}$$

study, the inorganic As level is account for 7.4% of the total As in farmed tilapia from BFD-endemic area (Huang et al. 2003).

We used a PBPK model to simulate inorganic As accumulation in human target organs through farmed tilapia muscle consumption. Our PBPK model structure consists of lung (compartment 2), bladder (compartment 3), skin (compartment 4), and GI tract (compartment 5), which were interconnected by blood (compartment 1) circulation. The present PBPK models can be described by a linear dynamic equation (Yu 1998, 1999a, b),

$$\frac{d\{C_{H,i}(t)\}}{dt} = [K]\{C_{H,i}(t)\} + [X]\{u(t)\},\tag{1}$$

where $\{C_{H,i}(t)\}$ is a state variable vector which describes the chemical concentration in each assigned human target

where $A = F_D(Q_L + Q_{BL} + Q_S + Q_{GI}), B = Q_L R_L^{-1}, C =$ $Q_{\rm BL} R_{\rm BL}^{-1}, \ D = Q_{\rm S} R_{\rm S}^{-1}, \ E = Q_{\rm GI} R_{\rm GI}^{-1}, \ F = Q_{\rm L} R_{\rm L}^{-1} + K_{\rm H}$ $W_{\rm L}$, $G = CR\alpha C_{\rm F,m}$, $H = Q_{\rm GI}R_{\rm GI}^{-1} + CR\alpha K_{\rm F}T$, $I = Q_{\rm S}$ $R_{\rm S}^{-1} + K_{\rm S}BW$, and $J = Q_{\rm BL} R_{\rm BL}^{-1} + K_{\rm U}W_{\rm BL}$, in that $C_{\rm F,m}$ is the As concentration in tilapia muscle ($\mu g g^{-1}$); Q_i is the diffusive exchange rate of organ i (L day⁻¹); F_D is the binding coefficient of As concentration to plasma proteins (g L⁻¹); R_i defines as C_i/C_{di} , which denotes the partition coefficient or is referred to as an organ/blood equilibrium distribution ratio for linear binding in specific organ i (L g^{-1}) in that C_i is the total As concentration in human target organ i ($\mu g g^{-1}$) and C_{di} is the dissolved As concentration in the blood leaving target organ i ($\mu g \text{ mL}^{-1}$); V_B is the blood volume (L); CR is the daily tilapia muscle consumption rate (g day $^{-1}$); W_L , W_{BL} and $W_{\rm GI}$ are the organ weight of lung, bladder and GI tract (g),



respectively; BW is the consumer body weight (kg); α is absorption efficiency of As (%); T is time to 95% steady state in GI tract (days); $K_{\rm H}$ is the respiration rate (g g⁻¹ day⁻¹); $K_{\rm U}$ is the urine elimination rate (g g⁻¹ day⁻¹) and $K_{\rm F}$ is the sweat elimination rate (g g⁻¹ day⁻¹). The respiration rate and sweat elimination rate are much less than the elimination rate in bladder and GI tract. Hence, we ignored the respiration rate and sweat elimination rate (Table 1).

Dose-response functions for morbidity and fatality effects versus As level in target human organs were fitted by using a empirical three-parameter Hill equation based PD model to the previously published dose-response functions of the quadratic-exponential for arsenicosis and

As-induced cancers based on epidemiological data from West Bengal and Taiwan (Yu et al. 2003). The reconstructed dose-response profiles for given organ-specific As concentration in human, $P(E_i|C_{H,i})$ could be expressed as conditional cumulative distribution function (cdf),

$$P(E_{\rm i}|C_{\rm H,i}) = \Phi\left(\frac{E_{\rm max} \times C_{\rm H,i}^n}{EC_{\rm 50,i}^n + C_{\rm H,i}^n}\right),\tag{5}$$

where $C_{\rm H,i}$ is the internal As concentration in human target organ i (µg g⁻¹), $E_{\rm i}$ is human prevalence or incidence of those exposed to As through farmed tilapia consumption, $E_{\rm max}$ is human maximum prevalence or incidence that assumed values were 100%, EC_{50,i} is the 50% effect

Table 1 Input parameters values for human used for PBPK model simulation

Parameters	Symbol	Value
Physiological parameters for human		
Blood perfusion rate (L day ⁻¹) ^a		
Lung	$Q_{ m L}$	230.4
Bladder	$Q_{ m BL}$	1,368
Skin	$Q_{ m S}$	504.0
GI tract	$Q_{ m GI}$	1,382.4
Partition coefficient (L g ⁻¹) ^b		
Lung:blood	$R_{ m L}$	4.15
Bladder:blood	$R_{ m BL}$	4.15
Skin:blood	$R_{ m S}$	2.5
GI tract:blood	$R_{ m GI}$	2.5
Fraction As dissolved in blood (g L^{-1}) ^c	F_D	0.2
Time to 95% steady state in GI tract (days) ^d	T	1
Absorption efficiency of As (%) ^e	α	35
Body weight (kg)	BW	N(60.55, 4.67) ^f
Bladder weight (g)	$W_{ m BL}$	N(268.78, 26.88) ^g
Daily tilapia consumption rate (g day ⁻¹)		
Subsistence fishers (2-6 meals week ⁻¹) in BFD-endemic area ^h	CR_{2-6}	LN(22.07, 2.61)
Subsistence fishers (7–14 meals week ⁻¹) in BFD-endemic area ^h	CR_{7-14}	LN(36.68, 1.75)
Residents (average tilapia consumption rates) in Taiwan ⁱ	CR_{average}	LN(10.26, 1.10)
Meal size for human eating tilapia (g meal ⁻¹) ^j	MS	LN(10.26, 1.10)
Biokinetic parameters ^k		
Urine elimination rate (day ⁻¹)	$K_{ m U}$	LN(1.79, 1.10)
Fecal 64elimination rate (day ⁻¹)	$K_{ m F}$	LN(0.029, 1.11)
Chemical parameter ¹		
As concentration in tilapia muscle (μg g ⁻¹)	$C_{ m F,m}$	LN(0.52, 2.60)
Dose-response parameters		
Median effective concentration ($\mu g g^{-1}$) ^m		
Hyperpigmentation	$EC_{50,\mathrm{Hyper}}$	N(4.593, 1.197)
Keratosis	$EC_{50,\mathrm{Ker}}$	N(6.360, 0.883)
Skin cancer	$EC_{50,SC}$	N(4.647, 0.361)
Lung cancer	$EC_{50,\mathrm{LC}}$	N(222.0, 56.569)
Bladder cancer	$EC_{50,\mathrm{BC}}$	N(470.0, 31.113)



Table 1 continued

Parameters	Symbol	Value
Cancer slope factor correction [(mg kg ⁻¹ day ⁻¹) ⁻¹] ⁿ		
Lung cancer	$CSF_{ m corr,LC}$	N(9.43, 1.30)
Bladder cancer	$CSF_{\mathrm{corr},\mathrm{BC}}$	N(2.77, 0.37)

- ^a Values were taken from Mann et al. (1996) and Leggett (2003)
- ^b Values were taken from Yu (1999a)
- ^c Adopted from Leggett et al. (2003)
- ^d Estimated from Lawerence and Gobas (1997)
- ^e Adopted from Lung et al. (2003)
- f Information adopted from Department of Health, Taiwan (2006) (19–65 years)
- g Value was taken from Mann et al. (1996)
- ^h Values were adapted from Lin (unpublished work), which were based on a questionnaire from 57 subsistence fishers in BFD-endemic area for 2–6 and 7–14 meals week⁻¹, respectively
- ⁱ Value was calculated from annual consumption quantities of tilapia by the number of residents (age > 5 years) in Taiwan (Department of Statistics 2006, Fisheries Administration 2006)
- ^j Value was assumed the same average tilapia consumption rates of residences in Taiwan
- ^k Values were taken from Yu (1999b)
- ¹ Values were taken from Ling et al. (2005)
- m The reconstructed distributions derived from published dose-response functions (Yu et al. 2003)
- ⁿ Values taken from the upper 95% CI on the linear term in the multistage model, based on an assumed 1 meal tilapia consumed per day as suggested by USEPA (2000)

concentration ($\mu g g^{-1}$) of the E_{max} , n is the Hill coefficient which is a measure of cooperativity, and $\Phi(\bullet)$ is the cumulative standard normal distribution.

Risk at a specific As concentration in human target organ in a joint probability function or exceedence profile, which describes the probability of exceeding the concentration associated with a particular degree of effect. This can be expressed mathematically as

$$P(R_{C_{\mathrm{H,i}}}) = P(C_{\mathrm{H,i}})P(E_{\mathrm{i}}|C_{\mathrm{H,i}}), \tag{6}$$

where $P(R_{C_{H,i}})$ is the risk for a specific organ i at concentration $C_{H,i}$, and $P(C_{H,i})$ is the cdf of having organ concentration $C_{H,i}$.

We predicted the consumption advice for As based on estimates of potential carcinogenic risks and on an assumption of risk activity (USEPA 2000). To calculate meal consumption limits based on a contaminant's carcinogenic effects, the first step is the calculation of daily consumption limits and is defined as (USEPA 2000)

$$CR_{\text{lim,carcinogenic}} = \frac{ARL \cdot BW}{CSF_{\text{corr}} \cdot C_{\text{F.m}}},$$
 (7)

where $CR_{\rm lim}$ is the maximum allowable tilapia consumption rate (g day⁻¹), BW is the consumer body weight (kg), $ARL = 10^{-5}$ is the maximum acceptable individual lifetime risk level suggested by USEPA (2000) (unit less), and $CSF_{\rm corr}$ is a corrected cancer slope factor for the dose-response function [(mg kg⁻¹ day⁻¹)⁻¹]. The

second step is the calculation of meal consumption limits and is defined as (USEPA 2000)

$$CR_{\text{mm,carcinogenic}} = \frac{CR_{\text{lim,carcinogenic}} \cdot T_{\text{ap}}}{MS},$$
 (8)

where $CR_{\rm mm}$ is the maximum allowable tilapia consumption rate (meals month⁻¹), MS is the meal size for human eating tilapia (g meal⁻¹), and $T_{\rm ap}$ is the time averaging period (365.25 days 12 months⁻¹ = 30.44 days month⁻¹ (USEPA 2000)).

The data of amount of tilapia consumed by subsistence fishers in BFD-endemic area and residents in Taiwan were collected in 2004 and 2006, respectively. Data on tilapia consumption in subsistence fishers in BFD-endemic area in 2004 were adapted from Lin (Nanhua University, Chiayi, Taiwan, unpublished data), which was based on a questionnaire from 57 subsistence fishers. Data of tilapia consumption by residents in Taiwan was calculated from the reports of Fisheries Administration (2006) and Department of Statistics (2006). We divide the annual consumption quantities of tilapia by the number of residents (age > 5 years) in Taiwan. These data were the newest among available literature. In order to provide an estimate for each of the model parameters, Monte Carlo (MC) analysis was performed to generate the probability distributions. The chi-square (χ^2) and Kolmogorov– Smirnov (K-S) goodness-of-fit were used to determine the optimal fitted distributions for MC simulation (Table 1). Data and distribution parameters were analyzed and



estimated using the Statistica® software (Version 7.1, StatSoft, Tulsa, OK, USA). A sensitivity analysis was performed to identify and determine the most significant parameters influencing the value that presented in the uncertainty and variability analysis. The result shows that 10,000 iterations are sufficient to ensure the stability of results. We incorporate probability distributions into MC simulation to obtained 2.5%- and 97.5%-tiles as 95% confidence interval (CI) for all uncertainty analyses. The Crystal Ball® software (Version 7.3, Decisioneering, Inc., Denver, Colorado, USA) was used to perform all the MC simulations.

Results and Discussion

Figure 1 depicts the exposure profile of the box and whisker plot and the exceedence risk functions with 95% CI with noncarcinogenic and carcinogenic effect based on different tilapia consumption rates. The comparison of 90%-tile values shows that human exposure to As caused the relative skewness and spread in modeled output varied among specific organs. Our results demonstrate that the distribution of As concentration in human bladder is more highly skewed with a long tail at higher concentration (Fig. 1).

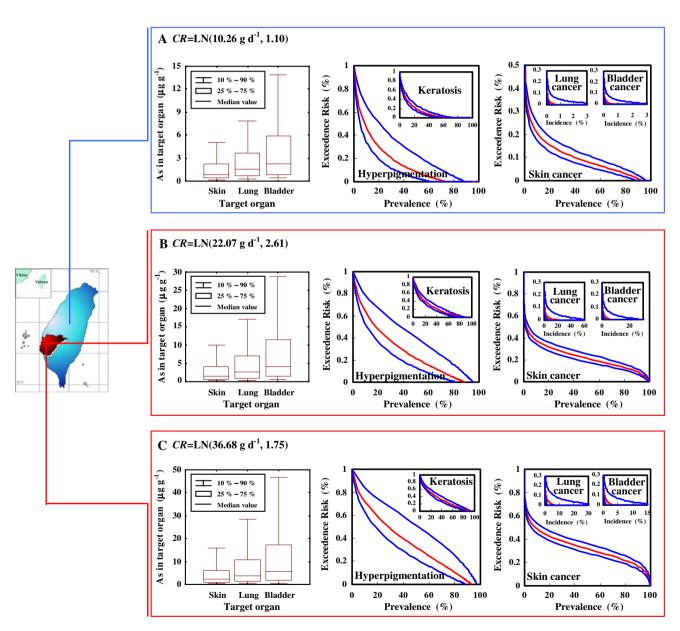


Fig. 1 Box and whisker plot representations of distributions of As concentration in human target organ and exceedence risk functions with 95% CI in noncarcinogenic effects: hyperpigmentation,

keratosis, and carcinogenic effects: skin cancer, lung cancer, and bladder cancer according to tilapia consumption rates (CR) of a residents in Taiwan and b, c subsistence fishers in BFD-endemic area



We optimal fitted the Hill model to published doseresponse functions to obtain the reconstructed dose-response profiles from Eq. 5 for arsenicosis and As-induced cancers. The Hill model and a 10,000 MC simulation provided an adequate fit for the data (χ^2 goodness-of-fit, p > 0.5). The n and EC₅₀ values clearly show that there were significant differences in sensitivity to As in different human health effects. Regression analyses show that the nonlinear Hill three-parameter model in a good agreement with published dose-response models as judged by high r^2 values (0.972–0.999, p < 0.05). The Hill coefficients (n) for arsenicosis (1.344–1.402) and for As-induced cancers (3.206–3.474) are indicative of positive cooperativity.

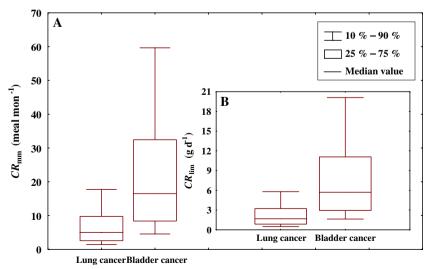
Exceedence risk functions shown in Fig. 1 were based on the exposure and dose-response profiles for human consumption of farmed tilapia. Because of variability and uncertainty in model parameters from Eq. 6 describing the exceedence cdfs associated with a particular degree of prevalence and incidence, we applied the plotted probabilities calculated from the outcome of the MC simulation to estimate risks. For skin cancer from subsistence fishers $(CR = LN(22.07 \text{ g day}^{-1}, 2.61))$ in BFD-endemic area, the probabilities that 10% or more of human affected (risk = 0.10) is approximately 88% (95% CI: 81%–93%). Therefore, the probability is 0.10 for at least 88% of human will be affected; whereas the probability is 0.5 for at least 2% (95% CI: 1%-4%) of human will pose health risks (Fig. 1b). Overall, risk diagrams (Fig. 1) demonstrate that consumption of farmed tilapia from BFD-endemic area may increase potential prevalence ratios of arsenicosis and skin cancer, yet pose no significant threat to health risks from lung and bladder cancers.

We recommended that the toxicological effect resulting in the more conservative consumption limits can be used to estimate an advisory since resulting limits would be protective of cancer health effects. Figure 2 shows the recommended consumption limit of tilapia from BFD-endemic area in daily (g day⁻¹) and meal (meals month⁻¹) basis for adults in Taiwan, suggesting a median meal consumption rate for lung and bladder cancer effects of 5 to 17 meals month⁻¹ (Fig. 2a) or 1.68 and 5.72 g day⁻¹, respectively (Fig. 2b). Our finding also indicates that the As-induced lung and bladder cancer risks generally considered a low individuals exposing risk in eating contaminated farmed tilapia of the people. This advice for human carcinogenicity health effects is more restrictive than consumption advice triggered contaminants in the tissues of farmed tilapia.

Sensitivity analysis indicates that the most important exposure variable for As in human organ-specific is As concentration in tilapia muscle. The contribution is approximately 54.1%. Arsenic concentration in human organ is the key parameter for estimating human organ-specific dose-response relationships. For allowable maximum consumption advice for As, the key parameter in the tilapia consumption limits is As concentration in tilapia muscle that contribution to variance is approximately 100%.

In conclusion, this study indicates that consumption of As contaminated farmed tilapia may pose potential arsenicosis and skin cancer risks, yet pose low risks to human health risks from As-induced internal cancers. To precise determine the risk/benefit ratios from consumption of farmed tilapia are complicated, cautious interpretation of present data may substantially reduce the likelihood in dealing with uncertainty and risk management. This present probabilistic risk scheme provides general conclusions that are more robust than estimates made without probabilistic presentations of outcomes.

Fig. 2 Risk-based consumption advisories for human Asinduced lung and bladder cancer effects with maximum allowable tilapia consumption rates for a meal limits for consumption rate of tilapia $(CR_{\rm mm})$, and b daily limits for consumption rate of tilapia $(CR_{\rm lim})$



Human health effect



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