### SUPPORT INFORMATION

for

Development of Lead Source-specific Exposure Standards Based on Aggregate Exposure Assessment: Bayesian Inversion from Biomonitoring Information to Multipathway Exposure

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#### **Materials and Methods**

**Integrated Exposure Uptake Biokinetic model.** In this study, IEUBK model was used to link the external exposure and the biomonitoring information, and the pharmacokinetics procedure is detailed in technical support document (1). The model consists of three components (Support Information Figure S1): 1) exposure components, in which average daily lead intake is determined from multiple environmental media, including air, soil, food, drinking water, paint and others; 2) uptake component, which converts the media-specific intake in exposure component into media-specific uptake for the blood plasma; 3) biokinetic component, which simulates the absorption, transportation, metabolism and elimination in the body, and estimates BLLs finally. In this research, the model was coded in the Matlab programming language, and the distribution families for the daily intake amounts of air, soil, grain, vegetable, paint can be seen in the Support Information Tables S1 and S2.

Markov chain Monte Carlo (MCMC) Sampling Algorithm. In this study, the Gibbs and Metropolis Hastings (MH) samplers were used to update the object parameters. We iteratively update the parameters in the following sequence:  $\sigma^2$ ,  $\Sigma$ ,  $\mu$ , and  $C_{ext}$ . On the basis of Bayesian analysis of hierarchical linear model, the population parameters,  $\sigma^2$ ,  $\Sigma$ ,  $\mu$ , were randomly draw from inverse gamma, inverse gamma and normal distribution, respectively, using the Gibbs sampler. However, since the toxicokinetic model is nonlinear, the conditional distributions for  $C_{ext}$  have no closed form. Therefore, we sampled the  $C_{ext}$  using the steps of the Metropolis algorithm as described previously (2), and the following Gaussian distribution was adopted to execute the M-H sampling:

$$C_{ext}^{new} = C_{ext}^{k-1} + N(0, cov(C_{ext})/7)$$
(1)

where  $cov(C_{ext})$  in the Gaussian distribution is a diagonal matrix with its diagonal entry being set to the variances of prior  $C_{ext}$  and zeros elsewhere.

Relationships among Lognormal Distributional Descriptors. Given a lognormal

distribution of a parameter X for which  $\hat{\mu}$  and  $\hat{\sigma}$  are the mean and the standard deviation of the distribution Ln(X), respectively. GM, AM, GSD, SD represent the geometric mean, arithmetic mean, geometric standard deviation, standard deviation of the distribution X, respectively.  $\alpha_i$ ,  $\beta_i$  are the cumulative probabilities of the distribution X, and  $p_i$  is the corresponding cumulative probability of the standard normal distribution. The following relationships hold:

$$GM = \exp(\hat{\mu})$$

$$GSD = \exp(\hat{\sigma})$$

$$AM = \exp(\hat{\mu} + \hat{\sigma}^2 / 2)$$

$$SD = \sqrt{\exp(2 \times \hat{\mu} + \hat{\sigma}^2) \exp(\hat{\sigma}^2 - 1)}$$

$$\alpha_i = \exp(\hat{\mu} + \hat{\sigma} \times \beta_i)$$

$$p_i = \int_{-\infty}^{\beta_i} \frac{1}{\sqrt{2 \times \pi}} \exp(\frac{-t^2}{2}) dt$$

**Data combined for biomonitoring data from each city.** The data for each city, which was obtained from a separate study, was combined to create one sample size weighted geometric mean BLL according to the method described previously (*3*) as follows:

$$m_i = \frac{N_i}{\sum_{i=1}^n N_i}$$
(2)

$$Ln(BLLs) = \frac{\sum_{i=1}^{n} m_i \frac{Ln(BLL_i)}{SD[Ln(BLL_i)]^2}}{\sum_{i=1}^{n} \frac{m_i}{SD[Ln(BLL_i)]^2}}$$
(3)

$$SD[Ln(BLL)] = \sqrt{\frac{1}{\sum_{i=1}^{n} \frac{m_i}{SD[Ln(BLL_i)]^2}}}$$
(4)

where  $m_i$  is the weight factor, and  $N_i$  is the sample size of each city.

Analytical Method for Lead in Drinking Water. Drinking water samples were collected

from the 34 cities' waterworks in China, and were frozen at the -4°C temperature refrigerator in the plastic bottle. 1.5 mL sample were mixed with 1.5 mL 6% HNO<sub>3</sub> (A.R) and inductively coupled plasma mass spectroscopy was used to determine the lead content in the mixture. The sensitivity was monitored daily and optimized when required. The elements measured were lead (m/z 208) and Rh (m/z 103). Concentration was determined using a six-point calibration of 0, 0.1, 0.5, 1, 2 and 10 µg/L (R<sup>2</sup>=0.99). Standards were run after every set of 10 samples.

**Sensitivity Analysis for the Parameters in IEUBK Model.** The sensitivity coefficient (*s*) was calculated as following Equation (5):

$$s = \frac{f(x + \Delta \times x, \Phi) - f(x, \Phi)}{\Delta}$$
(5)

where x is the objective parameter;  $\Delta$  is the changing scale of the objective parameter, and  $\Delta$  was set as 1% as the study by Yang (4);  $\Phi$  is the model default parameter family that excluded the objective parameter; *f* is the IEUBK model. In this study, the 43 parameters listed in the Supporting Information TABLE S3 were performed for sensitivity analysis in turn. The parameter with a sensitivity coefficient over 0.1 is usually considered a sensitivity parameter (4), which means varying the sensitivity parameter value by 1% has a 0.1% impact on the response. The default uptake for each month is an arithmetic sequence with initial value of 9.2 µg/day and common difference of 0.2 µg/day for children aged 13~84 months, thus BLLs for children aged 1~6 are calculated to be 4.47 µg/dL, 4.71 µg/dL, 5.26 µg/dL, 5.78 µg/dL, 6.15 µg/dL, 6.35 µg/dL, respectively, which are close to the observed blood lead concentration in chinese children. The output of function f is a vector with six elements which represented the BLLs of children aged 1~6. Thus, the sensitivity coefficient listed in the Supporting Information TABLE S3 is the average of the sensitivity coefficient for children aged 1~6. Also, the pseudocode used to calculate the BLLs in children was listed as follows:

function BLLs=ass(uptake,timestep);

%the input parameters including uptake(each month),BLLs in children aged 1 and timestep %% basic parameters setting

```
a=1/30*timestep:
b=floor(1/a);
t=0:a:85-a;
%% physiological parameter
wtbody=(8.375./(1+\exp(-(t-3.8)/3.6)))+(17.261./(1+\exp(-(t-48.76)/20.63)));
tblur=20.*(wtbody/12.3).^0.33;
tblliv=10.*(wtbody/12.3).^0.33;
tbloth=10.*(wtbody/12.3).^0.33;
tblkid=10.*(wtbody/12.3).^0.33;
tblbone=(wtbody/12.3).^0.33;
RATOUTFEC=0.75;
tblfec=0.75.*tblur;
tblout=RATOUTFEC.*tblfec;
crbonebl=6+(215.*(1-exp(-0.000942.*t)));
for i=1:(85*b);
     if t(i) < 12 | t(i) = 12;
          wtbone(i)=0.111*wtbody(i);
     else
          wtbone(i)=0.838+0.02*wtbody(i);
     end
end
wttrab=0.2.*wtbone;
wtcort=0.8.*wtbone;
volblood=(10.67./(1+exp(-(t-6.87)/7.09)))+(21.86./(1+exp(-(t-88.15)/26.73)));
tbonebl=crbonebl.*tblbone.*((wttrab+wtcort)./(volblood/10));
tplrbc=0.1;
ratblpl=100;
trbcpl=tplrbc*(ratblpl-0.55/(0.55+0.73));
tplur=tblur./ratblpl;
tplliv=tblliv./ratblpl;
crkidbl=0.777+(2.35.*(1-exp(-0.0468.*t)));
crlivbl=1.1+(3.5.*(1-exp(-0.0462.*t)));
crothbl=0.931+(0.437.*(1-exp(-0.00749.*t)));
wtliver=(0.261./(1+\exp(-(t-9.82)/3.62)))+(0.584./(1+\exp(-(t-55.76)/37.64)));
tlivpl=crlivbl.*(tblliv./(1-tblliv./tblfec)).*(wtliver./(volblood./10));
tlivfec=crlivbl.*tblfec.*(wtliver./(volblood./10));
tplkid=tblkid./ratblpl:
wtkidney=(0.05./(1+\exp(-(t-5.24)/4.24)))+(0.106./(1+\exp(-(t-65.67)/34.11)));
tkidpl=crkidbl.*tblkid.*(wtkidney./(volblood./10));
tpltrab=tblbone./(0.2*ratblpl);
ttrabpl=tbonebl;
tplcort=tblbone./(0.8*ratblpl);
tcortpl=tbonebl;
tploth=tbloth./ratblpl;
wtblood=1.056.*volblood./10;
wtecf=0.73*volblood./10;
wtother=wtbody-wtkidney-wtliver-wttrab-wtcort-wtblood-wtecf;
tothpl=crothbl.*(tbloth./(1-tbloth./tblout)).*(wtother./(volblood./10));
tothout=crothbl.*tblout.*(wtother./(volblood./10));
volrbc = (4.31./(1+exp(-(t-6.45)/10)))+(26.47./(1+exp(-(t-129.61)/25.98)));
```

```
for i=2:85*b;
         volrbc1(1,i-1)=volrbc(1,i);
end
volplasm = (6.46./(1 + exp(-(t-6.81)/5.74))) + (8.83./(1 + exp(-(t-65.66)/23.62)));
volecf=0.73.*volblood;
conrbc=1200;
     pbbldmat=2.5;
pbbldo=0.85*pbbldmat;
volplasm0=2.0269;
volrbc0=1.6623;
hct0=0.45:
trbcpl0=trbcpl;
%% initial value
mplecf(1)=pbbldo*(volplasm0+volrbc0)*(tplrbc/timestep)*(1.7-hct0)/(trbcpl0/timestep+tplrb
c/timestep);
mrbc(1)=pbbldo*(volplasm0+volrbc0)*(trbcpl0/timestep)/(trbcpl0/timestep+tplrbc/timestep);
mplasm(1)=mplecf(1)/(1.7-hct0);
wtcort0=wtcort(1);
mcort(1)=78.9*pbbldo*wtcort0;
mkidney(1)=10.6*pbbldo*wtkidney(1);
mliver(1)=13*pbbldo*wtliver(1);
mother(1)=16*pbbldo*wtother(1);
mtrab(1)=51.2*pbbldo*wttrab(1);
tplrbc2(1)=tplrbc./(1-mrbc(1)./(conrbc.*volrbc1(1)));
tothall=1./(1./tothpl+1./tothout);
tlivall=1./(1./tlivpl+1./tlivfec);
%% compartmental lead masses
       for pp=1:84;
              sss=0;
for ii=(pp*b-b+2-sign(pp-1)):(pp*b);
     tplrbc2(ii)=tplrbc./(1-mrbc(ii-1)./(conrbc.*volrbc1(ii-b*sign(pp-1))));
sum1(ii)=1./tplur(ii)+1./tplkid(ii)+1./tplkid(ii)+1./tplcoth(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)+1./tplcott(ii)
c2(ii);
sum2(ii)=1/(tplrbc2(ii)*(trbcpl/timestep+1))+1/(tplliv(ii)*(tlivpl(ii)/timestep+1+tlivpl(ii)/tliva
ll(ii)))+1/(tothpl(ii)/timestep+1+tothpl(ii)/tothall(ii))+1/(tplkid(ii)*(tkidpl(ii)/timestep+1))+1/(
tpltrab(ii)*(ttrabpl(ii)/timestep+1))+1/(tplcort(ii)*(tcortpl(ii)/timestep+1));
sum3(ii)=mrbc(ii-1)/(trbcpl/timestep+1)+mliver(ii-1)/(tlivpl(ii)/timestep+1+tlivpl(ii)/tlivall(ii)
)+mother(ii-1)/(tothpl(ii)/timestep+1+tothpl(ii)/tothall(ii))+mkidney(ii-1)/(tkidpl(ii)/timestep+
1)+mtrab(ii-1)/(ttrabpl(ii)/timestep+1)+mcort(ii-1)/(tcortpl(ii)/timestep+1);
mplecf(ii)=(mplecf(ii-1)+(uptake(pp)*timestep/30)+sum3(ii))/(1+(timestep*sum1(ii))-timeste
p*sum2(ii));
     mrbc(ii)=(mrbc(ii-1)+(mplecf(ii)*(timestep/tplrbc2(ii))))/(1+timestep/trbcpl);
     mliver(ii)=(mliver(ii-1)+(mplecf(ii)*(timestep/tplliv(ii))))/(1+timestep/tlivall(ii));
     mother(ii)=(mother(ii-1)+(mplecf(ii)*(timestep/tploth(ii))))/(1+timestep/tothall(ii));
     mcort(ii)=(mcort(ii-1)+(mplecf(ii)*(timestep/tplcort(ii))))/(1+timestep/tcortpl(ii));
       mkidney(ii)=(mkidney(ii-1)+(mplecf(ii)*(timestep/tplkid(ii))))/(1+timestep/tkidpl(ii));
  mtrab(ii)=(mtrab(ii-1)+(mplecf(ii)*(timestep/tpltrab(ii))))/(1+timestep/ttrabpl(ii));
     mplasm(ii)=(mplecf(ii)*volplasm(ii))/(volecf(ii)+volplasm(ii));
       sss=sss+(mrbc(ii)+mplasm(ii))/volblood(ii); pbb(pp)=sss*a;
end
```

end

### BLLs=pbb(13:84); %BLLs for children aged 13-84 months

Sensitivity analysis of the prior  $C_{ext}$ . To illustrate the sensitivity of the prior  $C_{ext}$  for source allocation, the variation in source allocation was investigated by changing the pPDF of diet which shows the highest source allocation. GM of dietary lead changed from GM/GSD to GM × GSD where prior GSD was set as an average value of 2.5, and GSD changed from 2 to 4. Generally, GM is relatively sensitive to source allocation compared with GSD since the uncertainty from its prior distribution has been reduced during Bayesian inversion as described above. When the GM for dietary lead varied from 0.4 to 2.5 folds (Support Information Figure S2), the source allocation from diet changed from 60.46% to 66.91%. Following the change of GM and GSD for dietary lead, the source allocations for other sources are also changed as exemplified in Figure 2a~2d. Their source allocation changes limited to the range of 1.89%~3.56% for air, 0.07%~0.51% for water, 12.38%~14.42% for soil, and 16.41%~23.40% for paint, respectively.

SUPPORTING INFORMATION TABLE S1. Distributions and Parameters for the Daily Amounts of Soil, Grain, Vegetables, Drinking Water

and Paint

Age		1	2	3	4	5	6	Distribution-type	Ref.
Soil and dust	GM	0.11	0.11	0.11	0.090	0.088	0.087	Logranual	5
(mg/day)	GSD	1.23	1.23	1.23	1.16	1.14	1.14	Lognormal	5
	GM	45.64*	97.80	111.80	136.80	146.30	171.27*	т 1	< <b>-</b>
Grain (mg) GSI	GSD	1.50	1.50	1.50	1.50	1.50	1.50	Lognormal	0, /
Vegetable (mg)	GM	48.72*	104.4	140.3	144	182.7	213.89*	т 1	
	GSD	1.50	1.50	1.50	1.50	1.50	1.50	Lognormal	0, /
	Min	0.19	0.19	0.19	0.19	0.19	0.19		
Water (L)	Max	1.9	1.9	1.9	1.9	1.9	1.9	Triangular	8
	Mode	0.60	0.60	0.60	0.60	0.60	0.60		
Paint (mg)	GM	0.622	0.622	0.622	0.46	0.417	0.392	T I	0
	GSD	2.23	2.23	2.23	2.10	2.05	2.03	Lognormal	8

\* No the daily amounts of vegetable and grain for children aged 1 and 6 can be obtained. Fortunately, the IEUBK model adopt the defaulted lead intake rate for game animal meat, fish, home-grown vegetables, or home-grown fruit as 0.14, 0.3, 0.33, 0.35, 0.41, 0.48  $\mu$ g for children aged 1, 2, 3, 4, 5, 6 (1), respectively. So, the daily amount of children aged 1 and aged 6 were estimated by the rate of the daily amount between children aged 1 and 2 (0.14/0.3), aged 5 and 6 (0.48/0.41).

Age	Mean (kg)	SD(kg)	Age	Mean (kg)	SD(kg)
1	10	1.6	4	16	3.0
2	12	2.2	5	18	2.6
3	14	1.8	6	24	4.2

**SUPPORTING INFORMATION TABLE S2.** Distribution of Body Weight for Children Aged 1~6 (9).

Parameters	Description	Sensitivity	Parameters	Description	Sensitivity
Vol <sub>blood</sub>	Volume of blood	-0.25	T <sub>bonebl</sub>	Lead transfer time from bone to blood	-0.057
Wt <sub>kidney</sub>	Weight of kidney	-0.00034	Wt <sub>trab</sub>	Weight of trabecular bone	-0.0109
Hct0	Hematocrit at birth	0.00	Vol <sub>ecf</sub>	Volume of extra-cellular fluid (ECF)	-0.0025
Wt <sub>bone</sub>	Weight of bone	-0.053	$Wt_{blood}$	Weight of blood	0.00035
T <sub>cortpl</sub>	Lead transfer time from cortical bone to plasma-ECF	-0.046	Vol <sub>plasm</sub>	Volume of plase	0.00073
W <sub>tecf</sub>	Weight of extra-cellular fluid (ECF)	0.00024	Ra <sub>tblpl</sub>	Ratio of lead mass in blood to lead mass in plasma-ECF	-0.0104
T <sub>othpl</sub>	Lead transfer time from soft tissues to plasma-ECF	-0.0399	T <sub>plrbc</sub>	Lead transfer time from plasma-ECF to red blood cells	-0.0099
T <sub>trabpl</sub>	Lead transfer time from trabecular bone to plasma-ECF	-0.0115	$T_{\text{blliv}}$	Lead transfer time from blood to liver	0.0238
Wt <sub>liver</sub>	Weight of liver	0.00074	Wtbody	Weight of body	0.12
$T_{kidpl}$	Lead transfer time from kidney to plasma-ECF	-0.00074	Cr <sub>othbl</sub>	Ratio of lead concentration in other soft tissue to blood lead concentration	-0.0035
P <sub>bbldmat</sub>	Maternal blood lead concentration	0.0067	P <sub>bbld0</sub>	Lead concentration in blood	0.0067
T <sub>blkid</sub>	Lead transfer time from blood to kidney	0.00	$T_{livpl}$	Lead transfer time from liver to plasma-ECF	-0.091
T <sub>blbone</sub>	Lead transfer time from blood to bone	0.00058	Ratoutfec	Ratio of elimination rate via soft tissues to endogenous fecal lead elimination rate	0.36
Vol <sub>rbc</sub>	Volume of red blood cells	0.0028	Tothout	Lead transfer time from soft tissues to elimination pool	0.0367
Wt <sub>cort</sub>	Weight of cortical bone	-0.043	T <sub>plkid</sub>	Lead transfer time from plasma-ECF to	0.00074

# SUPPORTING INFORMATION TABLE S3 Sensitivity Analysis of IEUBK Model Parameters

				kidney	
T <sub>blur</sub>	Lead transfer time from blood to urine	0.86	T <sub>pltrab</sub>	Lead transfer time from plasma-ECF to	0.0115
				trabecular bone	
$T_{livfec}$	Lead transfer time from liver to feces	0.093	Ratoutfec	Ratio of elimination rate via soft tissues	0.36
				to endogenous fecal lead elimination rate	
Cr <sub>livbl</sub>	Ratio of lead concentration ( $\mu$ g/kg) in	0.0012	Tothout	Lead transfer time from soft tissues to	0.0367
	liver to blood lead concentration ( $\mu$ g/L)			elimination pool	
Con <sub>rbc</sub>	Maximum lead concentration capacity	0.0128	T <sub>plcort</sub>	Lead transfer time from plasma-ECF to	0.046
	of red blood cells			cortical bone	
T <sub>bloth</sub>	Lead transfer time from blood to other	0.0365	Cr <sub>kidbl</sub>	Ratio of lead concentration ( $\mu$ g/kg) in	-0.00074
	soft tissue			kidney to blood lead concentration ( $\mu$ g/L)	
Ratfecur	Ratio of endogenous fecal lead	0.63			
	elimination rate to urinary lead				
	elimination rate				

Parameters	Mean	CV	Parameters	Mean	CV
Volblood	*	0.20	ABSD	0.3	0.20
Ratoutfec	0.75	0.20	ABSF	0.5	0.20
Ratfecur	0.75	0.20	ABSW	0.5	0.20
Tblur	*	0.20	ABSP	0.17	0.20
Air_absorb	0.32	0.20			

SUPPORTING INFORMATION TABLE S4. Prior distributions of the selected IEUBK model parameters for the Bayesian MCMC studies

Abbreviations: Volblood, Volume of blood; Ratoutfec, Ratio of elimination rate via soft tissues to endogenous fecal lead elimination rate; Ratfecur, Ratio of endogenous fecal lead elimination rate to urinary lead elimination rate; Tblur, Lead transfer time from blood to urine; Air\_absorb, Net percentage absorption of air lead; ABSD, ABSF, ABSW, ABSP, Total absorption for dust, food, water, paint at low saturation, respectively. \*The default function in the IEUBK model.

City	Ref.	City	Ref.	City	Ref.	City	Ref.
Chengdu	10	Beijing	15	Kunming	20	Yinchuan	25
Huhhot	11	Wenzhou	16	Xi'ning	21	Harbin	26
Nanchang	12	Shenyang	17	Hefei	22	Haikou	27
Guangzhou	13	Shijiazhuang	18	Zhengzhou	23	Xi'an	28
Tianjin	14	Qingdao	19	Changsha	24		

SUPPORTING INFORMATION TABLE S5. References of Biomonitoring Information in Different Regions in China

	Air ( $\mu$ g/m <sup>3</sup> )	Reference
Chengdou	0.38	29
Huhhot	0.44	30
Nanchang	0.080	31
Guangzhou	0.27	32
Tianjin	0.27	33
Beijing	0.082	34
Shenyang	0.88	35
Hefei	0.072	32
Zhengzhou	0.13	32
Yinchuan	0.047	36
Harbin	0.17	37
Xi'an	0.44	38
Nation	0.34	

SUPPORTING INFORMATION TABLE S6. Air lead concentration for different regions in China.

and G-R Test for All Exposure Pathways									
Pathways	Prior distrib	ution		Posterior dis	Posterior distribution				
	Population	Uncertainty	Interindividual	Population	Uncertainty	Interindividual	G-R		
	GM	GSD	variability	GM	GSD	variability			
Air	0.250	2.28	2.28	0.68	1.28	1.31	1.00		
$(\mu g/m^3)$									
Soil	25.8	2.67	2.67	82.2	1.50	1.56	1.00		
(mg/kg)									
Grains	0.0800	2.34	2.34	0.0850	1.90	1.91	1.00		
(mg/kg)									
Vegetable	0.0520	2.76	2.76	0.0700	1.87	1.88	1.00		
s(mg/kg)									
Water	0.054	2.05	2.05	0.0760	1.55	1.43	1.00		
(mg/L)									
Paint	553	2.59	2.59	266	2.11	2.12	1.00		
(mg/kg)									

## SUPPORTING INFORMATION TABLE S7 Prior Distributions, Posterior Distributions,



**SUPPORTING INFORMATION FIGURE S1.** IEUBK model structure for predicting lead exposure through the multipathway (1).



**SUPPORTING INFORMATION FIGURE S2.** Variation of Source allocations in different media when changing GM and GSD of pPDF for diet exposure. We used colour contour shading with a rainbow scale from blue to rose red to visualize source allocation. a)~e) Source allocation for air, soil, water, paint and diet when scaling GM, GSD of diet lead from 0.5 to 2 and from 2 to 4, respectively.



**SUPPORTING INFORMATION FIGURE S3.** Standard probability distribution in air, soil, grains, vegetables, drinking water, and paint.

### **Literature Cited**

- (1) U.S. Environmental Protection Agency. *Technical support document: parameters and equations used in the integrated exposure uptake biokinetic model for lead in children (v0.99d).* EPA: Washington, DC, 1994.
- (2) Xu, T.; White, L.; Hui, D.F.; Luo, Y.Q. Probabilistic inversion of a terrestrial ecosystem model: Analysis of uncertainty in parameter estimation and model prediction. *Global Biogeochem Cy.* **2006**, *20*, GB200272.
- (3) Jarosinska D.; Biesiada M.; Muszynska-Graca M. Environmental burden of disease due to lead in urban children from Silesia, Poland. *Sci. Total Environ.* **2006**, *367*(1), 71-79.
- (4) Yang, Y.C.; Xu, X.; Georgopoulos, P.G. A Bayesian population PBPK model for multiroute chloroform exposure. J. Expo. Sci. Environ. Epidemiol. 2010, 20(4), 326-341
- (5) Kobayashi N.; Naya M.; Nakanishi J. *Risk Assessment for Lead (In Japanese)*. Maruzen Bookstores Press. Tokyo, Japan, 2006.
- (6) Zhai F.Y. The diet changes and nutirtional status of follow-up study in Chinese residents(In Chinese). Science and Technology Press. Beijing, China, 2008.
- (7) Nakanishi J.; Shigeki M.; Matsuda H. *Risk Calculation in the Simulated Environment (In Japanese).* Iwanami Shoten. Japan, 2003.
- (8) Goodrum P.E.; Diamond G.L.; Hassett J.M.; Johnson D.L. Monte Carlo modeling of childhood lead exposure: Development of a probabilistic methodology for use with the EPA IEUBK model for lead in children. *Hum. Ecol. Risk Assess.* **1996**, *2*(4), 681-708.
- (9) Ogiu N.; Nakamura Y.; Ijiri I.; Hiraiwa K.; Ogiu T. A statistical analysis of the internal organ weights of normal Japanese people. *Health Phys.* **1997**, *72*(3), 368-383.
- (10) Yang F.; Yang H.; Mao M.; Yang S.; Jiang Y. Risk factors related to blood lead level in Chengdou children aged 0~8 (In Chinese). *Chin. J. Child Health Care* 2007, 15(01), 83-84.
- (11) Yang Y.; Wang Z.F.; Luo X.D.; Hua J; Bai H.; Bai J.X.; et al. 2005. Blood lead level and related risk factors analysis Huhhot children aged 0~7 (In Chinese). *Chin. J. Child Health Care* **2005**, *13*(03), 262-263.
- (12)Gong Y.; Xiong L.; Hu X. Blood lead level and related risk factors analysis in NanChang children aged 0-7 (In Chinese). *Mater. Child Health Care China* **2008**, *23*(23), 3300-3301.
- (13)Lin T.; Li Y.; Kuang J.; Tan Z. Investigation on Blood Lead Levels in 23019 Children in Guangzhou (In Chinese). J. Mod. Clin. Med. Bioeng. 2006, 12(02), 197-199.
- (14)Liu D.D.; Zhao Z.C.; Ye T.; Li Y.M. Investigation on blood lead levels of 8 836 children aged 0-15 in Tian jin (In Chinese). *Mater. Child Health Care China* 2005, 20(16), 2112-2114.
- (15) Liu Z.Q.; Yu Y.M.; Zheng D.Y. Analysis of mineral elements in Jiuxiang Qiao,Beijing diasporachildren aged 0-6 (In Chinese). *Occup. Health* **2007**, *23*(23), 2190-2191.
- (16) Zheng M.Q.; Zhao C.R.; Cao J.M.; Fang F.; Hu, Y.L. Investigation on Whole Blood Lead Levels in 2956 Children in Wenzhou (In Chinese). J. Med. Res. 2006, 35(01), 52-53.
- (17)Dong Y.; Chang H.; Zhu L.; Zhang X.; Zhao Y. Investigate on the prevalence of lead pollution in Shenyang children aged 3-6 (In Chinese). *Chin. J. Child Health Care* **2004**, 8(11), 26-30.
- (18) Ma S.J.; Sha C.; Ma D.Y.; Liu Y. Investigation on the whole blood trace element and blood lead concentration of children aged 2-6 years old (In Chinese). *Mater. Child Health Care China* **2007**, *22*(04), 521-523.
- (19) Zhang L.Q.; He Y.F.; Song Y.; Wang Y.Y.; Yu S.Y. Investigation and analysis of blood lead level in part of the pre-school children in Qingdao (In Chinese). *Mater. Child Health Care China* **2007**, *22*(02), 270-271.
- (20)Shi S.T.; Ma Y.M.; Liu H.Y.; Ni L.X.; Chen Z., Zhou J.J.; et al. Blood lead level and

releated factors analysis in different regions of Yunnan children (In Chinese). *Chin. J. Sch. Health* **2006**, 27(05), 450-451.

- (21) Hu A. Blood lead level and releated facors analysis in Xi'ning children aged 3-6 (In Chinese). *Mater. Child Health Care China* **2008**, *23*(08), 1093-1095.
- (22) Fu S.L.; Zhang L.M.; Zhu M.; Zhuang Z.M. Investigation on Blood Lead Levels of children in Hefei (In Chinese). *Anhui J. Prev. Med.* **2006** *12*(05), 294-297.
- (23) Zhai L.C.; Yan Z.; Lu N.; Deng W.; Yan K.J.; Cheng X.H.; et al. Blood lead level analysis in Zhengzhou children: 2553 cases study (In Chinese). *Chin. J. Child Health Care* 2005, *13*(06), 501-502.
- (24) Li J.M.; Yi Z.W.;, Luo X.M.; Sun X.H.; Jin Y.; Li Y.P.; et al. An epidemiological study on blood lead level among children aged 0-6 years in Changsha (In Chinese). *Chin. J. Epidemiol.* **2006**, *27*(07), 643-644.
- (25) Wang B.Z.; Li J.; Xi W.J.; Sun Y.; Zhang X.L. Monitoring results of blood lead level in three years analysis in Yinchuan children (In Chinese). *Mater. Child Health Care China* 2008, 23(32), 4637-4639.
- (26) Du J.; Zheng G.L.; Ying Y. Survey lead poisoning prevention project in Harbin children (In Chinese). *Mater. Child Health Care China* **2005**, *20*(12), 1525-1526.
- (27) Xu J.Z. Analysis of level of blood lead in children of Haikou City and relevant factors (In Chinese). *China Trop. Med.***2007**, *07*(07), 1246-1247.
- (28) Jia H.; Ma X.; Ma X.; Xue X.; Tang Z.; Mingli Q.; et al. Analysis of lead poisoning investment in Xi'an children aged 0-6 (In Chinese). *Chin. J. Child Health Care* 2008, *16*(01), 98-100.
- (29) Shang Y.N.; Yang B.; Yin G.; Ni S.J.; Zhang C.J. Distribution characteristics and sources of lead in air dust near the ground surface of chengdu city (In Chinese). *Geophys. Geochem. Explor.* **2006**, *30*(02), 104-107.
- (30) Tong Q.; Zhao T.Q.; Ruan Y.Y.; Feng S.Y.; Yang F. *Metal elements of different size in air particles, HuHHot (In Chinese).* The Ninth National Conference on Atmospheric Environment: Beijing, China, 2002.
- (31) Cao J.Y.; Zhang X.Y.; Li S.C.; Chow J.C.; Wang D. *The elements characteristics of atmospheric -dust aerosol in China's inland and coastal regions (In Chinese).* Technical seminars on Particulate Matter across the Taiwan Strait, annual metting by Chinese Society of Particulogy: Gui Lin, China, 2002.
- (32) Lee C.; Li X.D.; Zhang G; Li J.; Ding A.J; Wang T. Heavy metals and Pb isotopic composition of aerosols in urban and suburban areas of Hong Kong and Guangzhou, South China-Evidence of the long-range transport of air contaminants. *Atmos. Environ.* 2007, 41(2), 432-447.
- (33) Wang W.; Liu X.D.; Zhao L.W.; Guo D.F.; Tian X.D.; Adams F. Effectiveness of leaded petrol phase-out in Tianjin, China based on the aerosol lead concentration and isotope abundance ratio. *Sci. Total Environ.* **2006**, *364*(1-3), 175-187.
- (34) Zhou G.H.; Wang G.P.; Zhang L.J. The change on the character of particular matter in Beijing(In Chinese). *Chin. J. Process Eng.* **2004**, 4.sup. (8), 717-720.
- (35)Ren H.M.; Wang J.D.; Zhang X.L.; Wang C.M. Exposure assessment of environment lead for children in Shenyang City(In Chinese). *Acta Sci. Circumst.* **2005**, *25*(9), 1236-1241.
- (36)Fan S.X.; Fan T.; Yan P.J.; Zheng Y.F.; Jin G.X.; Chen S.G. Environmental Pollution Characteristics of Heavy Metal Elements of PM\_(2.5) in Yinchuan(In Chinese). *J. Desert Res.* **2006**, *26*(02), 4637-4639.
- (37) Mukai H.; Tanaka A.; Fujii T.; Zeng Y.Q.; Hong Y.T.; Tang J; et al. Regional characteristics of sulfur and lead isotope ratios in the atmosphere at several Chinese urban sites. *Environ. Sci. Technol.* **2001**, *35*(6), 1064-1071.
- (38) Yu Y.; Zhang Z.J.; Li Y.P.; Zhang J.H. Study on the mutagenicity of organic extracts and

metal features of total suspended particulates in Xi'an city. *Chin. J. Clin. Rehabilit.* 2004, 15, 2970-2972.