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1 **Evaluating Human Health Risks from Exposure to Agricultural Soil Contaminants using**  
2 **One- and Two-Dimensional Monte Carlo Simulations**

3  
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34 **Keywords:** Soil contaminants, agriculture development, probabilistic risk assessment.  
35

**36 Abstract**

37 The health and well-being of Indigenous Peoples are closely connected to the state of their lands.  
38 While natural soils are important for food security initiatives within these communities, they may  
39 also expose people to harmful contaminants. Consequently, this study – guided by Indigenous  
40 community members and leaders – evaluates the human health risks associated with  
41 contaminants in soils intended for agricultural purposes on Indigenous Peoples' lands in regions  
42 of Australia and Canada. Soil samples were collected from 47 sites in seven locations and  
43 analyzed for metals, metalloids, and organochlorine pesticides. Non-carcinogenic and  
44 carcinogenic risks were assessed for children, youths, and adults using one- and two-dimensional  
45 Monte Carlo simulations. The results indicate that there is a non-carcinogenic risk of exposure to  
46 lead (Pb) for children (HQ = 1.83) in Australia and an oral ingestion risk due to inorganic arsenic  
47 (As) for children (HQ = 1.05) in Newfoundland. Carcinogenic risks from As exposure were also  
48 identified for children ( $R = 1.68 \times 10^{-5}$ ) and adults ( $R = 1.20 \times 10^{-5}$ ) in Newfoundland from oral  
49 ingestion. However, no non-carcinogenic or carcinogenic risk from dermal exposure was found  
50 for all tested contaminants. The results indicate a potential need for targeted interventions, such  
51 as soil remediation, when and where possible, or community education, to reduce exposure risks.

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## 59 **1. Introduction**

60 The health and well-being of Indigenous Peoples are directly tied to the health and well-being of  
61 their lands (Tsuji et al. 2023), where activities are carried out for sustenance and traditional  
62 cultural practice (Ahmed et al. 2022, 2023; Tsuji et al. 2022). The practice of agriculture has a  
63 long-standing history for Indigenous communities worldwide (Emmanuel et al., 2023), and some  
64 Indigenous Peoples have reintroduced or adopted agricultural activities, such as crop cultivation,  
65 to enhance healthy eating and increase the local availability of fruits and vegetables within their  
66 communities (Brimblecombe et al., 2017; Richmond et al. 2021; Wilton et al. 2023). However,  
67 the nature of crop cultivation, particularly in a garden setting, involves direct contact with soil  
68 and may increase exposure to toxicants, especially when individuals are unaware of their  
69 presence in the soil (Moriarity et al. 2024). Consequently, the presence of contaminants in soils  
70 used for agricultural activities may pose health risks, particularly in communities that rely on the  
71 land for sustenance or as part of traditional (Reyes et al. 2015) or non-traditional lifestyles. Thus,  
72 soil contamination with toxicants, such as metals and organic compounds, is a significant  
73 environmental and public health concern (Hoover et al. 2012; Kumar 2019; Raimi et al. 2022;  
74 Tsuji et al. 2019), particularly in Indigenous communities where agricultural activities are  
75 becoming more common, especially in the context of improving food security.

76  
77 Contaminated soils may expose individuals to toxicants directly from the soil via dermal,  
78 inhalation, or ingestion of the soil itself or on unwashed crops (Food and Agriculture  
79 Organization [FAO] 2021; Ramires et al. 2024). Additionally, there is also a potential for  
80 indirect exposure through the accumulation in crops, and depending on the nature of the toxicant,  
81 the exposure may pose non-carcinogenic or carcinogenic health risks (Chen et al. 2024). Metals

82 like cadmium (Cd), mercury (Hg), and chromium (Cr) pose risks to the nervous and renal  
83 systems and are sometimes carcinogenic, depending on the valence state (Clarkson and Magos,  
84 2006; Godt et al. 2006; Zhitkovich 2011); while metals and metalloids, such as, arsenic (As) and  
85 lead (Pb) from anthropogenic or natural sources can cause acute or chronic health impacts as  
86 well. For example, low-levels of Pb are known to cause neurological impairments and cognitive  
87 delays (Lanphear et al. 2016; Santa Maria et al. 2018; Ramirez-Ortega et al. 2021), while  
88 inorganic As is a classified Group A carcinogen associated with specific types of cancers and  
89 other health issues (Chatterjee et al. 2017; Chen et al. 2023; Martinez and Lam 2021).

90 Organohalogens, including PCBs, dioxins and certain pesticides, are also persistent in the  
91 environment, are bioaccumulative and have been linked to immune suppression, cancer and other  
92 health impacts (Eskenzai et al. 2009; Ruder et al. 2014; World Health Organization [WHO],  
93 2023a)

94

95 Given the potential risk of exposure to soil toxicants – and the increasing number of Indigenous  
96 communities, worldwide utilizing community and home gardens for various health and well-  
97 being programming (Brimblecombe et al. 2017; Emmanuel et al. 2023; Tsuji et al. 2019) – there  
98 is a need for a comprehensive health risk assessment that accounts for variability and uncertainty  
99 of the potential exposure risks. Therefore, the purpose of this study was to evaluate the human  
100 health risks associated with exposure to soil toxicants in different regions of Australia and  
101 Canada, and assess the risk of exposure to soil contaminants for Indigenous community members  
102 in these regions. Following the collection of soil samples from multiple locations on Indigenous  
103 Peoples' homelands, samples were analyzed for metals, metalloids (hereafter metal(loid)s), and  
104 organochlorine pesticides. The non-carcinogenic and carcinogenic exposure risk of these

105 toxicants in soil were examined using one-dimensional (1D) and two-dimensional (2D) Monte  
106 Carlo (MC) simulations, with 2DMC providing a more comprehensive assessment by capturing  
107 both the variability in exposure levels and uncertainties in input parameters. This approach is  
108 essential for accurately understanding potential health impacts. The goal of the study was to  
109 provide peoples of these regions with health risk information that empowers them to make more  
110 informed health decisions.

111

## 112 **2. Methods**

### 113 **2.1 Soil sampling sites**

114 In Australia, samples of potential soils to be used in agricultural activities were collected from  
115 eight sites in Queensland (**Figure 1A**) in 2023, including lands used for agriculture, residential  
116 areas, and a remediated gas station. Nine sites on Indigenous lands in New South Wales (**Figure**  
117 **1A**) were also sampled in 2016, covering different terrains like floodplains and grassy areas, and  
118 differing land uses, agricultural and traditional cultural areas.

119

120 In Newfoundland, Canada (**Figure 1B**), 15 sites were selected as potential areas for agricultural  
121 activities, including forested areas and developed zones (e.g., sites with histories of agricultural  
122 use and near a school) and sampled between 2017 and 2020. Lastly, in the western James Bay of  
123 subarctic Ontario, Canada, 24 sites (**Figure 1B**) were selected across two remote Indigenous  
124 communities, situated on community lands, and one site near an abandoned Mid-Canada Radar  
125 Line station; these sites were sampled between 2015 and 2018. This remote region is unique  
126 compared to the others of the present study, as there is no all-season road in and out of the  
127 communities, apart from seasonal ice roads which typically open from mid-January to early-

128 April (Hori et al. 2016, 2018). **Figures 1A and 1B** shows the relative locations of the sampling  
129 sites; however, the specific dates and locations of the soil sampling have been anonymized to  
130 safeguard the privacy of the community partners, in accordance with the requests of community  
131 representatives. Samples were collected between 2010 and 2023.

132

## 133 **2.2 Soil Sampling and Analysis**

134 Composite samples, each comprising at least 10 individual soil samples ( $n \geq 10$ ) per site, were  
135 collected using soil probes (AMS, American Falls, Idaho, USA): a 14-inch probe in Australia  
136 and a 33-inch reinforced probe in Canada. Sampling depths varied regionally, with 0-15 cm in  
137 Australia, 0-10 cm in Newfoundland due to shallow bedrock, and 0-20 cm in western James Bay  
138 for deep-rooted crop considerations. Soil from mixed piles was collected with a spade and shovel  
139 and stored in 20 L food-grade plastic buckets, with debris removed. Australian samples were  
140 sieved, mixed, bagged, and kept cool before analysis at NSW Department of Primary Industries  
141 (Wollongbar, NSW) for metals and metalloids, and Symbio Laboratory (Brisbane, QLD) for  
142 organohalogenes; while Canadian samples were frozen until analyzed at Queen's University's  
143 Analytical Service Unit for all contaminants. A total of 13 toxic contaminants were assessed for  
144 non-carcinogenic and carcinogenic human health risks from the soil samples, including five  
145 metal(loid)s and nine organochlorine pesticides (**Table 1**).

146

147 Metals, metalloids and organohalogenes were measured in soil samples by inductively coupled  
148 plasma mass spectrometry (ICP-MS) and gas chromatography with mass spectrometry (GC/MS).  
149 Samples were dried, ground, and digested by acid digestion in a solution of nitric and  
150 hydrochloric acids. The digestion process was performed using DigiPrep™ technology to fully

151 break down the samples. After digestion, samples were filtered, diluted, and analyzed with an  
152 Agilent 7700x ICP-MS in the same manner as USEPA Method 200.7, but with a modification to  
153 account for the soil matrix. Organohalogen analysis consisted of drying and homogenizing the  
154 samples which were spiked with DCBP and extracted using Soxhlet extraction with  
155 dichloromethane. Gel permeation chromatography (GPC) cleanup of the Florisil column was  
156 carried out after extraction, and the extracts were then analysed using an Agilent GC 6890 with a  
157 5975 mass selective detector.

158  
159 Arsenic speciation was carried out by Liquid Chromatography-Inductively Coupled Plasma Mass  
160 Spectrometry (LC-ICP-MS) and performed at ALS Laboratories using an Agilent 1200 series  
161 HPLC instrument paired with an Agilent 7700 ICP-MS. Quality control standards for arsenic  
162 analysis included the NIST 1568B Rice Flour reference material certified for DMA and  
163 monomethylarsonic acid (MMA), blanks, laboratory control standards, and matrix spikes.

164  
165 When testing extractable micronutrients (Cu, Zn, Mn, Fe, etc.), air-dried soil samples were  
166 mixed with a buffered extractant solution of diethylenetriaminepentaacetic acid (DTPA),  
167 triethanolamine and  $\text{CaCl}_2$ . Extracts were centrifuged, filtered, diluted, and analysed on an  
168 Agilent 5110 ICP-OES following USEPA Method 6010D. The recoverable element amounts  
169 were calculated using a modified USEPA Method 200.2, hot dilute mineral acid digestion.  
170 Ingredients were purified and measured by ICP-OES using reagent blanks, spiked replicates,  
171 internal standards, and certified reference materials. The instrument was calibrated and tested  
172 with matrix spikes, replicates, and repeated calibration checks.

173

174 Furthermore, soil sample preparation was performed with a modified QuEChERS extraction  
175 protocol to maximize extraction yields for PCB and pesticide analysis using a Thermo-Scientific  
176 Triple Quadrupole GC-MS for PCB analysis and a High-Resolution LC-MS Orbitrap for  
177 pesticide testing. The samples were homogenised, spiked with the appropriate solvents and salts,  
178 centrifuged to remove organic content, and put through an additional clean-up step to eliminate  
179 contaminants. Analyte concentrations were measured by calibration curves and a quality control  
180 check was carried out at 20 samples to verify instrument and protocol performance, preserving  
181 spike recoveries in the 70-130% range. The limit of detection was 1.0 ng/g for DDT and its  
182 metabolites, 2 ng/g for Aldrin and Dieldrin, and ranged from 0.5 µg/g (Cobalt) to 5 µg/kg (Lead)  
183 for metals.

184

### 185 **2.3 Probabilistic Health Risk Assessment**

186 This study focuses on assessing human health risks from exposure to soil contaminants.

187 Complementing this study, Moriarity et al. (2024) provides an ecological assessment using

188 pollution indices, demonstrating elevated Pb contamination in Australia, significant

189 organochlorine pesticide levels in Western James Bay, and As concentrations in Newfoundland

190 soils that exceed safety guidelines. The ecological risk assessment findings directly inform this

191 human health risk assessment study.

192

193 Health risk assessments that use a 1D Monte Carlo (1DMC) simulation consider either

194 variability or uncertainty in the calculation. Specifically, input parameters are varied one-at-a-

195 time so that the fewest number of iterations are required to produce a single distribution of the

196 risk outcome. Examples include the variability of human exposure to pesticides that contaminate

197 water or soil, or the uncertainty in the toxicity of a particular chemical found in food. While a  
198 1DMC may be appropriate to evaluate how uncertainty in data or variability in a population  
199 affects the estimate of risk, it falls short in its ability to differentiate between variability and  
200 uncertainty in a population. This separation can be accomplished with a 2D Monte Carlo  
201 (2DMC) simulation that uses nested loops to assess risk. Using a 2DMC simulation enables a  
202 more complete risk illustration, which would not be possible with a traditional 1DMC analysis.  
203 A 2DMC is appropriate when uncertainties in model inputs and/or natural variability in a  
204 population impact the risk estimate. The former is a result of the underlying model design, while  
205 the latter is an inherent characteristic of the studied population.

206  
207 A two-stage probabilistic risk assessment (PRA) was carried out to assess the risk of exposure to  
208 metal(loid)s in soils. A one-dimensional (1DMC) PRA was first conducted to evaluate the risk of  
209 exposure by varying the intake parameters through an iterative process. Additionally, a two-  
210 dimensional (2DMC) PRA was carried out for results passing the defined non-carcinogenic or  
211 carcinogenic risk threshold from the simulated 1DMC estimates to further investigate variability,  
212 but also uncertainty in the simulations. The processes of the 1D and 2DMC are shown in **Figure**  
213 **2A and 2B**.

### 214 215 **2.3.1 1DMC**

216 To quantify the risk of exposure to toxic soil contaminants in soils intended for agricultural  
217 activities, variables derived from the literature or generated for the current study (**Table 2**) were  
218 used in an intake calculation based on the oral ( $I_O$ ) or dermal ( $I_D$ ) ingestion (eqn. 1 and 2) rates

219 and those respective values in the non-carcinogenic (eqn. 10) or carcinogenic risk of exposure  
 220 equations (**Figure 2A**).

$$221 \quad I_o \left( \frac{\text{mg}}{\text{kg d}} \right) = \frac{\text{IR} \left( \frac{\text{mg}}{\text{d}} \right) \times C \left( \frac{\text{mg}}{\text{kg}} \right) \times \text{EF} \left( \frac{\text{d}}{\text{y}} \right) \times \text{ED} (\text{y})}{\text{BW} (\text{kg}) \times \text{AT} (\text{d})} \times 10^{-6} \left( \frac{\text{kg}}{\text{mg}} \right) \quad (1)$$

$$222 \quad I_D \left( \frac{\text{mg}}{\text{kg d}} \right) = \frac{\text{SA} (\text{cm}^2) \times \text{AF} \left( \frac{\text{mg}}{\text{cm}^2 \text{d}} \right) \times C \left( \frac{\text{mg}}{\text{kg}} \right) \times \text{EF} \left( \frac{\text{d}}{\text{y}} \right) \times \text{ED} (\text{y}) \times \text{ABS}}{\text{BW} (\text{kg}) \times \text{AT} (\text{d})} \times 10^{-6} \left( \frac{\text{kg}}{\text{mg}} \right) \quad (2)$$

223  
 224 To estimate the intake rate (IR) for youths and adults, mean soil ingestion rates from two studies  
 225 about Indigenous Peoples' soil intake from agricultural and cultural activities were modeled  
 226 using given parameters. The first study IR parameters (Doyle et al. 2012) were as follows in  
 227 mg/day: mean ( $\mu$ ): 74; standard deviation ( $\sigma$ ): 91; P<sub>50</sub>: 60, and P<sub>90</sub>: 193. The second study IR  
 228 parameters (Irvine et al. 2014), also in mg/day, were:  $\mu$ : 32;  $\sigma$ : 88; P<sub>50</sub>:18; and P<sub>90</sub>: 152. The  
 229 parameters for each of these distributions indicated an approximate log-normal distribution and  
 230 was a reasonable assumption for the IR distribution. Aggregating these two distributions resulted  
 231 in a combined approximated log-normal distribution with parameters (mg/day)  $\mu$ : 53;  $\sigma$ : 90; P<sub>50</sub>:  
 232 27; and P<sub>90</sub>: 120 that were used to model the IR for adults (**Table 2**). Additionally, for the IR for  
 233 children, we hypothesized a scenario where children consumed three times the amount typically  
 234 ingested by youths and adults, as they have more hand-to-mouth behaviors (Özkaynak et al.  
 235 2022), by scaling the IR for youths and adults  $\mu$  and  $\sigma$  by a factor of three (**Table 2**).

236  
 237 The approximated EF values were derived from first-hand observations by a team researcher  
 238 (M.W.) over the years working in the study regions and a detailed overview can be found in  
 239 **Table S1**. The Canadian exposure frequency (EF<sub>CAN</sub>) was a randomized triangular distribution,

240 with a mode of 60 days per year, a maximum of 75 days, and a minimum of 45 days, derived  
241 from agricultural activities from mid-May to mid-October. The Australian exposure frequency  
242 ( $EF_{AUS}$ ) differed slightly due to climate, approximating 108 days per year on a random triangular  
243 distribution (**Table 2**), consolidated for both Northern Queensland (NQLD) and New South  
244 Wales (NSW), as the individual community EFs only differed by about one day (**Table S1**).

245  
246 For  $I_D$ , the absorption factor (AF) for soil was modeled using a random triangular distribution  
247 based on EPA guidelines (EPA 2023), with different parameters for children, youths, and adults  
248 to account for varying hand-to-mouth contact frequencies and consistent with a subsistence  
249 lifestyle (**Table 2**). Specifically, children had a higher maximum value, whereas the maximum  
250 value for youths was adjusted to match that of adults, creating an AF category between children  
251 and adults. Adults had a lower AF mode due to reduced hand-to-mouth contact. Surface area  
252 (SA) was normally distributed to align with body weight (BW), per Health Canada's [HC] (1995)  
253 soil exposure guidelines. The averaging time (AT) was uniformly based on the exposure duration  
254 (ED) multiplied by 365 days for non-cancer risk and 25,550 for cancer risk estimates (**Table 2**).  
255 BW followed a normal distribution established for the region (**Table 2**), and contaminant  
256 concentration (C) was log-normal for each contaminant. All remaining variables used in the  
257 equations 1 and 2 and their distribution types are provided in **Table 2**.

258  
259 For equations 3 and 4, the reference dose (RfD) is in  $\text{mg}/\text{kg}\cdot\text{d}$ , and the slope factor (SF) is in  
260  $(\text{mg}/\text{kg}\cdot\text{d})^{-1}$ .

$$261 \quad \text{HQ} = \frac{I_{O,D}}{\text{RfD}} \quad (3)$$

$$262 \quad \text{R} = I_{O,D} \times \text{SF} \quad (4)$$

263 The reference doses and slope factors for each contaminant are presented in **Table S2**. Non-  
264 carcinogenic risk calculations were carried out for all metal(loid)s (**Table S3**) and pesticides  
265 (**Table S4**), and carcinogenic risk calculations were carried out for inorganic As – a Group A  
266 human carcinogen (Integrated Risk Information System [IRIS] 2017) – and all detectable  
267 pesticides, with all risk calculations conducted only when  $n \geq 5$  (**Tables S3 and S4**). We note  
268 that although Cr(VI) is a Group A human carcinogen, Cr(III) is the predominant form in soil  
269 (Agency for Toxic Substances and Disease Registry [ATSDR] 2012) and is therefore not  
270 considered for this risk assessment; we do not consider the other metal(loid)s to be a  
271 carcinogenic risk from oral or dermal exposure in soils.

272  
273 Following the input of these variables into the R environment (R Core Team 2024), Monte Carlo  
274 simulations were then carried out by randomly sampling  $10^5$  independent iterations from all non-  
275 deterministic distributions for each contaminant. We then simulated the 95<sup>th</sup>-percentile ( $P_{95}$ ) HQ  
276 or R (risk), where the focus was on results greater than 1.00 for the HQ, and  $1.00 \times 10^{-5}$  or  $1.00 \times$   
277  $10^{-6}$  for R depending on location, respectively. The Incremental Lifetime Cancer Risk [ILCR]  
278 ( $1.00 \times 10^{-5}$ ) was used to assess the carcinogenic risk for Newfoundland and the *de minimis* risk  
279 ( $1.00 \times 10^{-6}$ ) was used for Western James Bay, as these are the respective risk thresholds for each  
280 province (HC, 2012). In the absence of an equivalent risk threshold for Australia, we applied the  
281 *de minimis* risk for that region as well. We also assessed the total hazard (THQ) as the sum of the  
282 HQ for each exposure pathway, the Hazard Index (HI) as the sum of the HQ for each  
283 contaminant, the total HI (THI) as the sum of the HI, the total risk (TR) as the sum of the R for  
284 each exposure pathway, the incremental cancer risk (ICR) as the sum of the R for each  
285 contaminant, and total incremental cancer risk (TICR) as the sum of the ICR. Sensitivity

286 analyses were carried out using the Spearman-rank correlation coefficient using  $1.00 \times 10^5$   
287 iterations and  $p < 0.05$  for simulated estimates of the HQ  $> 1.00$  or R  $> 1.00 \times 10^{-5}$  or  $1.00 \times 10^{-6}$ .  
288 Furthermore, to estimate the uncertainty of the HQ or R, the  $\mu$  and  $\sigma$  of the bootstrap  $P_{95}$   
289 estimates were computed from  $1.00 \times 10^4$  bootstrapped samples, and a 95% confidence interval  
290 (BCI) was derived from the 2.5<sup>th</sup>- and 97.5<sup>th</sup>-percentiles.

291

### 292 2.3.2 2DMC

293 For the simulated 1DMC estimates that surpassed the non-carcinogenic or carcinogenic risk  
294 threshold, a 2DMC was carried out to further assess the uncertainty of the modeled risk of  
295 exposure to metal(loid)s or organohalogenes in soil. As shown in **Figure 2B**, the approach  
296 considered variability, in addition to uncertainty, among measurement methods (e.g., individual  
297 variations in consumption patterns and population differences) using an inner loop (variability)  
298 nested in an outer loop (uncertainty) of iterations. The same probability distributions as the  
299 1DMC (**Table 2**) were assigned to intake parameters (i.e., AT (for non-carcinogenic only), BW,  
300 ED, and EF) to reflect variability in populations, with  $C$  of metal(loids) in soil considered as an  
301 uncertainty variable because of potential measurement or sample collection differences over time  
302 and location. The IR was treated as a hybrid variable, incorporating variability and uncertainty  
303 (**Figure 2B**). This was carried out this way because the IR can vary across individuals (e.g.,  
304 behaviour, physiology) and there is uncertainty in the true population IR distribution as it was  
305 modeled off of two studies, albeit for Indigenous Peoples', with small sample sizes. Therefore,  
306 the IR was modeled to be variable within the inner loop using a log-normal distribution and  
307 uncertain in the outer loop using a normalized mean and standard deviation of the IR. For every  
308 outer loop iteration, an inner loop iteration was carried out, with  $1.00 \times 10^3$  outer iterations and

309  $1.00 \times 10^4$  inner iterations, resulting in a total of  $1.00 \times 10^7$  simulations overall. The 2DMC  
310 uncertainty was assessed at the median of the  $P_5$  and the  $P_{95}$  of the of the variability of non-  
311 carcinogenic or carcinogenic risk. A sensitivity analysis was also performed using the same  
312 method as the 1DMC.

313

## 314 **2.4 Statistical Methods**

315 All statistical analyses were performed in R version 4.4.0 (R Core Team 2024), with a  
316 significance level set at  $p < 0.05$ . The following R environment packages were used for the 1D,  
317 2DMC and sensitivity analysis: stats (R Core Team 2024), EnvStats (Millard, 2023), and HMisc  
318 (Harrell, 2023); and visualization: ggplot2 (Wickham, 2016), ggsci (Xiao, 2018), ggthemes  
319 (Arnold, 2019), reshape2 (Wickham, 2007), and gridExtra (Auguie, 2017).

320

## 321 **3. Results**

### 322 **3.1 Soil contamination**

323 **Tables S3 and S4** show the descriptive statistics of metal(loid) and organohalogen contaminants  
324 in soil by location. Australia showed the highest mean soil contamination concentrations of  
325 metals, particularly with Pb (mean = 58.25 mg Pb/kg), whereas Western James Bay had the  
326 lowest even though it had the most detectable samples ( $n = 92$ ), with Cr (mean = 20.63 mg Cr/kg  
327 ) as the primary contaminant. In Newfoundland, the mean As concentrations (mean = 31.29 mg  
328 As/kg) were the highest detectable metal(loid) in soil (**Table S3**). Pesticides were absent in  
329 Australia (**Table S4**), while Newfoundland had nine detections and Western James Bay had the  
330 most, with 155 detections, making it the region with the highest levels of pesticide contamination  
331 (**Table S4**). The detected pesticides in Western James Bay included DDT (mean = 0.50 mg

332 DDT/kg) and its metabolites, along with aldrin, dieldrin, and endosulfan sulfate, among others.  
333 Newfoundland also showed detections of DDT metabolites. The predominant pesticides or  
334 metabolites, in descending order of concentration, were *p,p'*-DDT, *p,p'*-DDE, and *o,p'*-DDT.

335

### 336 **3.2. Non-carcinogenic risk of exposure to contaminants from soils intended for agricultural** 337 **activities (1DMC)**

#### 338 **3.2.1 1DMC**

339 There is a non-carcinogenic oral risk of exposure for children (HQ = 1.83 (BCI: 1.79, 1.90);  
340 **Figure 3A**) to Pb in tested soils in Australia and to As (HQ = 1.05 (1.02, 1.09); **Figure 3B**) in  
341 tested soils in Newfoundland, respectively, (**Table 3**), driven by the *C* of the metal(loid)  
342 according to the sensitivity analyses (**Figure 3A and 3B; Table S5**). The mean HQ for  
343 children's exposure to Pb is 0.24, with a 6.18% probability of exceeding an HQ of 1.00. For As,  
344 the mean HQ is 0.13, with a 2.73% likelihood of reaching or surpassing this threshold (**Figure**  
345 **3A and 3B**). The HI, and therefore the THQ and THI for children exceeds 1.00, but is primarily  
346 from oral exposure to Pb (**Table 3**); the same measures are exceeded for oral exposure to As in  
347 Newfoundland for children as well (**Table 3**). No other metals or pesticides (**Table S6**) HQ  
348 exceed a value of 1.00, nor do any HQ values for dermal exposure for metal(loid)s or pesticides  
349 (**Tables S6**).

350

#### 351 **3.2.2 2DMC**

352 At the P<sub>95</sub> of the variability of non-carcinogenic risk for the oral exposure to Pb for children in  
353 Australia (**Figure 5A**), the median uncertainty was 2.05 (interquartile range: 1.48, 2.86). The  
354 sensitivity analysis showed that the IR ( $\rho = 0.56$ ) was the most influential exposure factor,

355 surpassing the  $C$  from the 1DMC (**Figure 3A; Table S5**). For the oral exposure to As for  
356 children in Newfoundland, the median uncertainty was 1.22 (0.87, 1.82) at the  $P_{95}$  of the  
357 variability of non-carcinogenic risk (**Figure 5B**). The sensitivity analysis showed that the  $C$  ( $\rho$   
358 = 0.57) was the most influential exposure factor (**Table S5**).

359

### 360 **3.3 Carcinogenic risk of exposure to contaminants from soils intended for agricultural** 361 **activities**

#### 362 **3.3.1 1DMC**

363 There is an oral carcinogenic risk of exposure to As for children ( $R = 1.68 \times 10^{-5}$  ( $1.64 \times 10^{-5}$ ,  
364  $1.72 \times 10^{-5}$ ); **Figure 4A**) and adults ( $R = 1.18 \times 10^{-5}$  ( $1.16 \times 10^{-5}$ ,  $1.23 \times 10^{-5}$ ); **Figure 4B**) from  
365 an ingestion exposure to the tested soils in Newfoundland (**Table 4**). The mean  $R$  for children's  
366 exposure to As is  $2.53 \times 10^{-6}$ , with a 6.57% probability of  $R$  exceeding of the ILCR threshold of  
367  $1.00 \times 10^{-5}$ . For adults, the mean  $R$  is  $1.79 \times 10^{-6}$ , with a 3.79% likelihood of surpassing this  
368 threshold (**Figure 4A and 4B**). The sensitivity analyses showed that the  $C$  of As in the tested soil  
369 held the strongest influence for oral exposure (**Figure 4A and 4B; Table S5**) for both  
370 demographics in Newfoundland. The ICR exceeds the ILCR risk for these demographics (**Table**  
371 **4**) in Newfoundland and is driven by the oral exposure to As. Lastly, although no individual  
372 pesticide  $R$  values exceed the *de minimis* risk in Western James Bay (**Table S7**), the exposure to  
373 all pesticides (TICR) does exceed the *de minimis* risk for adults in this region (**Table 4**). There is  
374 no dermal carcinogenic risk from exposure to any metal(loid)s or organochlorine pesticides  
375 (**Table S7**).

376

#### 377 **3.3.2 2DMC**

378 In Newfoundland, the median uncertainty at the P<sub>95</sub> of the variability of carcinogenic risk of  
379 exposure to As for children was  $2.03 \times 10^{-5}$  ( $1.35 \times 10^{-5}$ ,  $2.60 \times 10^{-5}$ ) (**Figure 5C**). For adults, the  
380 median uncertainty at the P<sub>95</sub> of the variability of carcinogenic risk was  $1.46 \times 10^{-5}$  ( $9.61 \times 10^{-6}$ ,  
381  $2.13 \times 10^{-5}$ ) (**Figure 5D**). The sensitivity analysis (**Table S5**) showed that the *C* of As in soil was  
382 the main exposure factor for children and adults ( $\rho = 0.63$ ).

383

#### 384 4. Discussion

385 This study shows there are potential risks from exposure to metal(loid)s in soils intended for  
386 agricultural activities on Indigenous lands. In the Australian 1DMC simulations, children face a  
387 non-carcinogenic risk from oral exposure to Pb (HQ = 1.83) (**Figure 5A**) and in Newfoundland,  
388 children have a non-carcinogenic risk from exposure to As (HQ = 1.05) (**Figure 5B**), with soil  
389 contaminant concentration playing a significant role in both cases. Furthermore, our analyses  
390 indicate carcinogenic risks from As exposure affecting child ( $R = 1.68 \times 10^{-5}$ ) and adult  
391 demographics ( $R = 1.20 \times 10^{-5}$ ) in Newfoundland (**Figure 5C and 5D**). Despite these risks, the  
392 non-carcinogenic and carcinogenic risk values generally remain below risk thresholds for other  
393 metal(loid)s, indicating that under current exposure conditions, there is little to no risk from the  
394 remaining metals or any pesticides. Further, the 1DMC model, while simpler, provided a clear  
395 indication of the primary drivers of risk – namely, the *C* of contaminants in the soil. However,  
396 the 1DMC results are limited by their inability to separate the effects of variability and  
397 uncertainty, potentially underestimating or overestimating the risk by treating them as  
398 interchangeable.

399

400 The 2DMC builds on the 1DMC by going a step further to incorporate uncertainty (e.g.,  
401 variations in  $C$ ) as well as variability within the population (e.g., differences in IR). For example,  
402 while the 1DMC simulations identified a non-carcinogenic risk of exposure to Pb in Australia  
403 and As in Newfoundland for children, respectively, the 2DMC simulations revealed that the  
404 potential risk varied more significantly based on the same intake parameters (**Figure 5A and**  
405 **5B**). The median uncertainty at the  $P_{95}$  of variability of non-carcinogenic risk for Pb exposure in  
406 Australian children was greater (HQ = 2.05) than the results of the 1DMC, suggesting that the  
407 risk could be higher than the risk identified in that model. The uncertainty was influenced by not  
408 only the  $C$  in this simulation, but the IR as well. In fact, the latter parameter was weak in the  
409 1DMC sensitivity analysis ( $\rho = -1.00 \times 10^{-3}$ ), but the strongest intake parameter in the 2DMC  
410 ( $\rho = 0.56$ ), thus emphasizing the role of the uncertainty in the IR driving the variability of Pb  
411 exposure risk. Similarly, for children's As exposure in Newfoundland, the 2DMC model  
412 suggested a higher potential non-carcinogenic risk (HQ = 1.22) than the 1DMC model; a similar  
413 increase in the IR was also seen in the sensitivity analysis, but the  $C$  remained the most  
414 influential risk parameter in the 2DMC simulations, only slightly however (**Table S5**).  
415

416 For the carcinogenic risk of exposure to As for children ( $R = 2.03 \times 10^{-5}$ ) and adults ( $R = 1.46 \times$   
417  $10^{-5}$ ) in Newfoundland, the  $R$  values derived from the 2DMC simulations are also consistently  
418 higher than those from the 1DMC simulations (**Figure 5C and 5D**), reflecting the 2DMC  
419 model's ability to capture a broader range of potential risk outcomes. Additionally, for the  
420 carcinogenic risk of exposure to As, for both children and adults in this same region, the  
421 sensitivity analysis showed slight increases in the  $C$  and IR (**Table S5**), suggesting a potential  
422 relationship between these parameters and the resulting risk. In other words, the  $C$  of As in the

423 soil and the amount of soil ingested (i.e., IR) are important determinants for assessing the  
424 carcinogenic risk, not just the *C* as shown in the 1DMC sensitivity analysis.

425  
426 The different results between the 1DMC and 2DMC simulations demonstrate the strengths and  
427 weaknesses of each method. The 1DMC model provides a baseline risk estimate that is easier to  
428 interpret but potentially less comprehensive in accounting for all sources of uncertainty. The  
429 2DMC model, on the other hand, offers a more detailed risk assessment by considering the  
430 relationship between variability and uncertainty. However, this increased complexity could  
431 potentially lead to an overestimation of risk, especially when the input parameters were already  
432 conservatively modeled. Therefore, we urge caution when interpreting the results of these  
433 simulations independently. Instead, we recommend an integrated approach, viewing the risks as  
434 informed by two distinct yet complementary methods.

#### 435 436 **4.1 Non-carcinogenic risk of exposure to As in soils intended for agricultural purposes**

437 According to the CCME (2001), children have twice the percentage of daily exposure to As from  
438 oral ingestion via soil than adults, and therefore, this warrants further discussion as the results  
439 indicate that there is a non-carcinogenic risk of exposure to As from agricultural soils in  
440 Newfoundland. For children, oral exposure – especially from hand-to-mouth activity – to  
441 inorganic As in soils may be neurotoxic and can lead to early onset cognitive delays and  
442 neurological deficits, and several studies (e.g., Wasserman et al. 2004; 2011; 2015; Wang et al.  
443 2007a; von Ehrenstein et al. 2007) have demonstrated that IQ scores are negatively correlated to  
444 oral As exposure, but mainly from drinking unfiltered well-water.

445

446 Historically, it was thought that exposures to only large doses of As were associated with  
447 negative health outcomes, like lowered IQ, but studies have demonstrated an association of  
448 lowered IQ scores with exposure to low concentrations of As as well (Tollins et al. 2014; Vaidya  
449 et al. 2023), which suggests the need for monitoring exposure to any concentration of inorganic  
450 As in soils. There is also an association with exposure to As in childhood and reduced lung  
451 function in later life (Dauphiné et al. 2011) which suggests that there is a critical exposure  
452 window in childhood and a need for intervention to avoid long-term health effects. It is noted,  
453 however, that these studies provide mixed evidence regarding the age of exposure to inorganic  
454 As, the age of onset of deficits due to previous exposure, and the specific dose that elicits a  
455 negative health outcome (Tsuji et al. 2015). Therefore, further study is required to fully elucidate  
456 the relationship between exposure to inorganic As and negative health outcomes. Additionally,  
457 exposure to inorganic As has been linked to type 2 diabetes (Kim et al. 2013; Navas-Acien et al.  
458 2008) and cerebrovascular and cardiovascular diseases (Chen et al. 2011; Lee et al. 2002; Moon  
459 et al. 2012) such as hypertension and stroke.

460  
461 The non-carcinogenic risk for As exposure in agricultural soils in this study is consistent with  
462 findings from other studies, which have reported comparable risk levels for children in regions  
463 with elevated As contamination in soils (Alsafran et al. 2021; Kharazi et al. 2021). While it is  
464 difficult to draw direct comparisons across regions due to different environmental and exposure  
465 conditions, the results suggests a need for further research to understand impact of As on  
466 children in different agricultural contexts. Additionally, the non-carcinogenic risk for As in our  
467 study is approximately 7% lower than the aforementioned studies, stressing both the importance

468 of localized assessments and the existing gaps in the literature regarding cross-regional risk  
469 evaluations.

470

#### 471 **4.2 Carcinogenic risk of exposure to As in soils intended for agricultural purposes**

472 The International Agency for Research on Cancer (IARC) classifies As as a known human  
473 carcinogen (IARC, 2004), and the risk of cancer is higher from oral ingestion than dermal  
474 ingestion (Demissie et al. 2024). Of the 16 contaminants assessed in this study, As is the only  
475 contaminant with a carcinogenic risk to children and adults, but not youth. In particular, children  
476 have an oral carcinogenic risk of exposure to As; the ICR for children exceeds the ILCR and is  
477 also driven by the oral exposure to As (**Table 4**). There is also an oral carcinogenic risk of  
478 exposure to As for adults (**Table 5**). The results of this study demonstrate an increased  
479 carcinogenic risk from As exposure in soil, approximately 4% higher than a similar study  
480 (Agyemen et al. 2021), but lower than Mishra et al. (2024), which reported a carcinogenic risk  
481 nearly two orders of magnitude greater. For adults, however, the carcinogenic risk is generally  
482 comparable across these studies with little differences noted. What does this mean?

483

484 Following the exposure to As, for children, there is a potential association with acute  
485 lymphoblastic leukemia (ALL) and possibly epigenetic changes that may lead to leukemia  
486 (Infante-Rivard et al. 2007; Metayer et al. 2013). However, the association of As exposure with  
487 childhood leukemia is not fully elucidated and research is ongoing. Comparable studies on soil  
488 contamination have shown that children face higher As-related cancer risks from consuming  
489 crops grown in soils with elevated As concentrations, highlighting the vulnerability of this age  
490 group to soil-based contaminants in agricultural settings (Mishra et al. 2024). Furthermore, for

491 adults, there are several studies (e.g., Ahsan and Chen 2006; Ferreccio et al. 2000; López-  
492 Carrillo et al. 2014; Smith et al. 2006; Steinmaus et al. 2003) that show an association of pre-  
493 cancerous (i.e., skin lesions) or cancerous outcomes (i.e., cancer of the bladder, lung) following  
494 exposure to As from different media. Steinmaus et al. (2003), for example, found that exposure  
495 to even low concentrations of As are linked to an increased risk of bladder cancer, similar to  
496 findings from studies in contaminated agricultural regions, where adults faced elevated cancer  
497 risks from As in As-contaminated soil (Agyeman et al. 2021).

498

#### 499 **4.2.1 As in tested soils from Newfoundland**

500 A spatial study of cancer outcomes in Newfoundland indicates that there may be added burden  
501 from environmental pollutants, like As, potentially leading to an additional lifetime risk of  
502 cancers (Rahman et al. 2020). We note however, as in most studies, the risk is estimated from the  
503 consumption of well-water, not soil, and that the geology of Newfoundland is highly varied, so  
504 we extrapolate the results of these studies to compare to our own with a cautionary approach.  
505 Though, this leads us to an important point: there are few studies on the risk of exposure to As  
506 from soils intended for agricultural activities, and more work is needed to understand if the risk  
507 is significant or not – if it poses the same risks as other routes of exposure, such as, ingestion  
508 from water or inhalation, and if health outcomes are strictly related to the species of As. For  
509 example, in our study, the prominent form of As in tested soils in Newfoundland was As(V)  
510 (Moriarity et al. 2024), which has different toxic properties than As(III) but can still pose a risk  
511 to health if ingested (Genchi et al. 2022). Lastly, to date, there is no evidence in the literature  
512 indicating increased cancers or other health outcomes as a result of exposure to As exposure  
513 from soil in our study region. Nevertheless, we present our results from this risk assessment that

514 a possibility of an oral risk of exposure to As from soils intended for agricultural activities may  
515 exist.

516

#### 517 **4.3 Non-carcinogenic risk to children from the exposure to Pb in agricultural soils**

518 Studies on soil Pb contamination reveal similar non-carcinogenic risks for children, largely due  
519 to ingestion pathways. For example, Li et al. (2022) found that children exposed to Pb-  
520 contaminated agricultural soils had associated elevated blood Pb levels, with children under the  
521 age of three showing concentrations that exceeded acceptable thresholds. In regions with  
522 significant Pb contamination, non-carcinogenic risks may surpass thresholds, particularly for  
523 younger children who are more prone to frequent hand-to-mouth behaviors (Agyeman et al.  
524 2021), which expands on ingestion rates as a route of exposure, however, findings from other  
525 similar assessments do not support the results of this study (Sarvestani et al. 2024; Yuan et al.  
526 2021). These conflicting results likely reflect differences in soil Pb, variations in assessment  
527 methods and/or assumptions about ingestion rates and the use of different risk thresholds.  
528 However, these findings highlight the importance of continued and targeted investigations in  
529 contaminated agricultural areas and potential interventions to reduce health risks associated with  
530 soil ingestion.

531

532 Children are vulnerable to ingesting Pb-contaminated soil which can lead to increased blood Pb  
533 concentrations and impact development of the nervous system (EPA 2020; Roberts et al. 2022;  
534 WHO 2023b). The non-carcinogenic risk for children in Australia could indicate a need for  
535 intervention if the tested soils were to be used for agricultural purposes, to mitigate Pb exposure  
536 from ingested soils, particularly among young children, who are susceptible due to their frequent

537 hand-to-mouth activities and lower body weights, thus increasing the body burden of Pb  
538 (Chisolm 2008; Ramirez-Ortega et al. 2021). Chronic exposure to Pb, even at low levels, can  
539 lead to significant health issues (Lanphear et al. 2016), including cognitive impairment,  
540 developmental delays, and exacerbation of existing health problems (Lasley 2018; Ruebner et al.  
541 2019; Schultheiss et al. 2020). However, it is important to consider that specific soil Pb  
542 concentrations found in this study and their implications for children's health need to incorporate  
543 more detailed factors like the bioaccessibility of Pb in the soil, and the exposure scenarios  
544 relevant to children in particular regions, globally.

545

#### 546 **4.4 Recommendations**

547 The findings suggest a potential need to mitigate exposure to specific toxicants (i.e., Pb, As), in  
548 specific regions. Recommended actions include soil replacement where feasible, issuing public  
549 health advisories, and implementing community education programs to minimize direct contact  
550 with contaminated soil, particularly among children. Since remediation is not always possible for  
551 naturally occurring contaminants such as As, implementing community-led awareness programs  
552 to help educate parents and caregivers about the risks of exposure could be helpful in reducing  
553 risk (e.g., ensuring children's hands are washed frequently). Regular screening of biomarkers  
554 (e.g., blood, urine) for Indigenous Peoples living in these regions could also be part of a public  
555 health response to monitor the ongoing risk to health, but it is invasive. Lastly, ongoing  
556 monitoring of As and Pb concentrations in soils and additional research are necessary to fully  
557 understand the spatial distribution of contamination and its potential health impacts over time.

558

#### 559 **4.5 Limitations**

560 This study has limitations that should be discussed. The soil collection period was over the  
561 course of 10 years and non-consecutive, and there may have been slight differences in collection  
562 methods across the different sites; this extended period could introduce variability or uncertainty  
563 due to environmental or land use changes. Importantly, the human health risk assessment models  
564 rely on estimated and randomized modeled variables, which may not capture the complex  
565 dynamics of exposure to the measured contaminants. Additionally, some intake parameters,  
566 although from other similar studies, may not represent specific communities included in the  
567 present study. A disadvantage of the 2DMC is that it is highly sensitive to errors in the input  
568 data, which could result in potential overestimation of the risk simulations. An additional  
569 concern is that the EF's are based on observations for adults, therefore, we had to make the  
570 assumption that children were on the land when their parents were, but this assumption might not  
571 fully capture the actual EF's for children. Despite these potential limitations, we are confident  
572 that our findings provide a global assessment of the human health risks associated with exposure  
573 to agricultural soil contamination on Indigenous lands.

574

## 575 **5. Conclusion**

576 This study assessed the risk from exposure to contaminants in soils intended for agricultural  
577 activities using 1DMC and 2DMC probabilistic risk simulations. Findings indicate that Pb was a  
578 primary contaminant of concern in Australian soils, and As in Newfoundland soils posed the  
579 greatest health risks. For children in Australia, exposure to Pb presents a potential non-  
580 carcinogenic risk, while in Newfoundland, As exposure poses both non-carcinogenic and  
581 carcinogenic risks for children. Adults also face a carcinogenic risk of exposure to As in  
582 Newfoundland, however, the risk from other metal(loid)s and organic pesticides remain below

583 risk thresholds for all demographics. The 2DMC approach revealed more variability in the PRA  
584 by incorporating uncertainty and demonstrated factors such as *C* and IR were both important  
585 intake parameters for the non-carcinogenic risk of exposure from Pb and As for children. These  
586 findings stress the need for targeted interventions, such as monitoring and mitigation strategies,  
587 in regions where agricultural activities occur on contaminated soils. We recommend follow-up  
588 and monitoring in these regions to mitigate exposure and to ensure safe agricultural activities.

589

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## Figure Captions

**Figure 1.** Relative location map of participating communities in (A) Australia and (B) Canada where soils were sampled.

**Figure 2.** (A) The first figure shows a one-dimensional Monte Carlo (1DMC) simulation for assessing oral soil ingestion. Parameters (C, IR, ED, EF, AT, BW) are set with probability density functions (PDFs) and iterated ( $i = 1$  to  $10^5$ ). Intake (I) is calculated and used to evaluate non-carcinogenic risk using the RfD or carcinogenic risk using the SF. The histograms show the risk probability distributions, with key thresholds marked. (B) The second figure shows a two-dimensional (2DMC) Monte Carlo simulation process, combining both variability and uncertainty iterations. Uncertainty iterations ( $i = 1$  to  $10^3$ ) encompass nested variability iterations ( $i = 1$  to  $10^4$ ) for all parameters. The C parameter is included separately as uncertainty. The hybrid aspect of the intake IR is highlighted, as it is subject to both uncertainty and variability. The resulting intake values are then used to evaluate non-carcinogenic or carcinogenic risk. Box plots at the bottom display the distribution of non-carcinogenic and carcinogenic risks across different percentiles. (\*): indicates that AT is only considered in iterations for non-carcinogenic risk as the AT for carcinogenic risk is a fixed factor, not modeled from a PDF.

**Figure 3.** (A) Probability distribution of non-carcinogenic risk for children exposed to lead (Pb) in Australia and (B) for children exposed to arsenic (As) in Newfoundland, with the hazard quotient (HQ) threshold set at 1.00 (orange dashed line) and the 95<sup>th</sup>-percentile (P<sub>95</sub>) in red. Below each histogram, bar plots show the sensitivity analysis of risk parameters. The bars represent the correlation coefficients ( $\rho$ ) of each parameter (AT: Averaging Time, BW: Body Weight, C: Concentration, ED: Exposure Duration, EF: Exposure Frequency, IR: Intake Rate) with non-carcinogenic risk.

**Figure 4.** Probability distribution of carcinogenic risk for children (A) and for adults (B) exposed to arsenic (As) in Newfoundland, with the incremental lifetime cancer risk (ILCR) threshold set at  $1.00 \times 10^{-5}$  (orange dashed line) and the P<sub>95</sub>. Below each histogram, bar plots show the sensitivity analysis of risk parameters. The bars represent the correlation coefficients ( $\rho$ ) of each parameter (BW: Body Weight, C: Concentration, ED: Exposure Duration, EF: Exposure Frequency, IR: Intake Rate) with carcinogenic risk.

**Figure 5.** Uncertainty boxplots illustrate the distribution of non-carcinogenic (A and B) and carcinogenic (C and D) variability of risk at 5<sup>th</sup>, 25<sup>th</sup>, 50<sup>th</sup>, 75<sup>th</sup>, and 95<sup>th</sup>-percentiles from the 2DMC models. Panel (A) shows non-carcinogenic risk for children exposed to lead (Pb) in Australia. Panel (B) shows non-carcinogenic risk for children exposed to arsenic (As) in Newfoundland. Panel (C) shows carcinogenic risk for children exposed to arsenic (As) and panel (D) shows carcinogenic risk for adults exposed to arsenic (As), both in Newfoundland. The orange lines connect the 1DMC model values at each percentile, providing a reference for comparison. The dashed red lines indicate threshold values for acceptable risk levels: a hazard quotient (HQ) of 1.00 for non-carcinogenic risk and an incremental lifetime cancer risk (ILCR) of  $1.00 \times 10^{-5}$  for carcinogenic risk. Each boxplot shows the median (black line), interquartile range (IQR), and outliers of the risk distributions.

**Table 1. Contaminants assessed for human health risk in soils intended for agricultural purposes.**

<b>Contaminant</b>	
<b>Carcinogenic risk</b> (n=8)	<b>Non-carcinogenic risk</b> (n=5)
(As) Arsenic	(As) Arsenic
Dieldrin	(Co) Cobalt
<i>o,p'</i> -DDD (2,4-Dichlorodiphenyl-dichloroethane)	(Cr) Chromium
<i>o,p'</i> -DDE (2,4-Dichlorodiphenyl-dichloroethylene)	(Ni) Nickel
<i>o,p'</i> -DDT (2,4-Dichlorodiphenyl-trichloroethane)	(Pb) Lead
<i>p,p'</i> -DDD (4,4-Dichlorodiphenyl-dichloroethane)	
<i>p,p'</i> -DDE (4,4-Dichlorodiphenyl-dichloroethylene)	
<i>p,p'</i> -DDT (4,4-Dichlorodiphenyl-trichloroethane)	

**Table 2. Variables used to calculate the intake of contaminants from soils intended for agricultural purposes.**

Intake variable	Children	Youths	Adults	Unit	Distribution	References
ABS <sub>Co,Cr,Ni</sub>		0.010		-	Deterministic	Environmental Protection Agency [EPA] (2023)
ABS <sub>As</sub>		0.032		-	Deterministic	EPA (2023)
ABS <sub>Pb</sub>		0.006		-	Deterministic	Health Canada (2021b)
ABS <sub>Pesticides</sub>		0.100		-	Deterministic	EPA (2023)
AF	0.20(0, 3.30)	0.20(0, 0.30)	0.07(0, 0.30)	mg/cm <sup>2</sup> d	Triangular	International Atomic Energy Agency (1995); Men (2021), EPA (2023)
AT <sub>Co,Cr,Ni</sub>	$U(0, 4015)$	$U(0, 7300)$	$U(0, 25550)$	d	Uniform	Based on the ED · 365 in this study
AT <sub>As, Pesticides</sub>		25550		d	Deterministic	AT for carcinogenic risk
BW	$N(30, 7.5)$	$N(60, 15)$	$N(90, 22.5)$	kg	Normal	CCHS 2.2 data in Health Canada (2021a)
C		-		mg/kg	Lognormal	Current study
EF <sub>AUS</sub>		108(87, 130)		d/y	Triangular	Current study
EF <sub>CAN</sub>		60(45, 75)				
ED	$U(0, 11)$	$U(0, 17)$	$U(0, 70)$	y	Uniform	Canadian Community Health Survey (CCHS) 2.2 data in Health Canada (2021a)
IR	$\mu: 159; \sigma: 270;$ $P_{50}: 81; P_{90}: 360$	$\mu: 53; \sigma: 90;$ $P_{50}: 27; P_{90}: 120$		mg/d	Lognormal	Adapted from Doyle et al. (2012) and Irvine et al. (2014)
SA	$N(1020, 255)$	$N(1590, 398)$	$N(2080, 520)$	cm <sup>2</sup>	Normal	Adapted from Health Canada (1995)

Key:  $N(M, SD)$ : normal distribution, mean and standard deviation; IR values:  $\mu$ : mean;  $\sigma$ : standard deviation;  $P_{50}$ : 50<sup>th</sup>-percentile (median);  $P_{90}$ : 90<sup>th</sup>-percentile; AF and EF values: mode(min, max);  $U(\min, \max)$ : uniform distribution, minimum and maximum values.

**Table 3. Non-carcinogenic risk of exposure to contaminants from soils intended for agricultural activities.**

Location	Contaminant		Demographic								
			Children			Youth			Adult		
			HQ <sub>D</sub>	HQ <sub>O</sub>	HI	HQ <sub>D</sub>	HQ <sub>O</sub>	HI	HQ <sub>D</sub>	HQ <sub>O</sub>	HI
Australia	Metals	Co	1.88E-03	2.32E-02	2.51E-02	1.84E-04	3.39E-03	3.57E-03	1.37E-04	2.65E-03	2.79E-03
		Cr	5.61E-05	6.92E-04	7.48E-04	5.19E-06	9.66E-05	1.02E-04	4.07E-06	7.83E-05	8.24E-05
		Ni	1.75E-03	2.23E-02	2.41E-02	1.67E-04	3.14E-03	3.31E-03	1.31E-04	2.48E-03	2.61E-03
		Pb	1.21E-02	<b>1.83E+00</b>	<b>1.84E+00</b>	1.18E-03	2.56E-01	2.58E-01	9.10E-04	2.02E-01	2.02E-01
		<b>THQ</b>	1.58E-02	<b>1.88E+00</b>		1.54E-03	2.63E-01		1.18E-03	2.07E-01	
		<b>THI</b>		<b>1.89E+00</b>		<b>THI</b>	2.65E-01		<b>THI</b>	2.08E-01	
Western James Bay		As	1.43E-02	5.95E-02	7.38E-02	1.35E-03	8.41E-03	9.76E-03	1.06E-03	6.59E-03	7.65E-03
		Co	2.11E-04	2.80E-03	3.01E-03	1.99E-05	3.94E-04	4.13E-04	1.55E-05	3.10E-04	3.26E-04
		Cr	9.51E-06	1.26E-04	1.36E-04	8.98E-07	1.80E-05	1.88E-05	7.06E-07	1.41E-05	1.48E-05
		Ni	4.06E-04	5.40E-03	5.81E-03	3.83E-05	7.69E-04	8.07E-04	3.01E-05	5.96E-04	6.26E-04
		Pb	7.70E-04	1.23E-01	1.24E-01	7.23E-05	1.75E-02	1.75E-02	5.69E-05	1.35E-02	1.36E-02
		<b>THQ</b>	1.57E-02	1.91E-01		1.48E-03	2.71E-02		1.16E-03	2.11E-02	
Newfoundland		<b>THI</b>			2.06E-01		<b>THI</b>	2.85E-02		<b>THI</b>	2.22E-02
		As	2.76E-01	<b>1.05E+00</b>	<b>1.32E+00</b>	2.65E-02	1.46E-01	1.73E-01	2.05E-02	1.17E-01	1.38E-01
		Co	3.39E-04	4.40E-03	4.74E-03	3.24E-05	6.21E-04	6.53E-04	2.46E-05	4.93E-04	5.17E-04
		Cr	1.18E-05	1.56E-04	1.68E-04	1.16E-06	2.25E-05	2.37E-05	8.92E-07	1.76E-05	1.85E-05
		Ni	7.94E-04	1.00E-02	1.08E-02	7.61E-05	1.45E-03	1.53E-03	5.88E-05	1.14E-03	1.20E-03
		Pb	1.57E-03	2.48E-01	2.49E-01	1.49E-04	3.54E-02	3.56E-02	1.16E-04	2.77E-02	2.78E-02
Western James Bay	Pesticides	<b>THQ</b>	2.79E-01	<b>1.31E+00</b>		2.68E-02	1.84E-01		2.07E-02	1.47E-01	
		<b>THI</b>			<b>1.59E+00</b>		<b>THI</b>	2.11E-01		<b>THI</b>	1.6E-01
		Dieldrin	7.28E-03	8.55E-03	1.58E-02	7.15E-04	1.21E-03	1.93E-03	5.29E-04	9.38E-04	1.47E-03
		Endosulfan sulfate	1.02E-05	1.26E-05	2.28E-05	9.59E-07	1.76E-05	1.86E-05	7.41E-07	1.39E-05	1.46E-05
		<i>p,p'</i> -DDE	4.21E-03	4.62E-03	8.83E-03	4.13E-03	6.71E-04	4.80E-03	3.11E-04	5.08E-04	8.19E-04

<i>p,p'</i> -DDD	6.76E-04	7.97E-04	1.47E-03	6.51E-05	1.11E-04	1.76E-04	5.00E-05	8.77E-05	1.38E-04
<i>p,p'</i> -DDT	1.01E-02	1.09E-02	2.10E-02	9.94E-04	1.53E-03	2.52E-03	7.43E-04	1.18E-03	1.92E-03
<b>THQ</b>	2.23E-02	2.49E-02		5.91E-03	3.54E-03		1.63E-03	2.73E-03	
		<b>THI</b>	4.72E-02		<b>THI</b>	9.44E-03		<b>THI</b>	4.36E-03

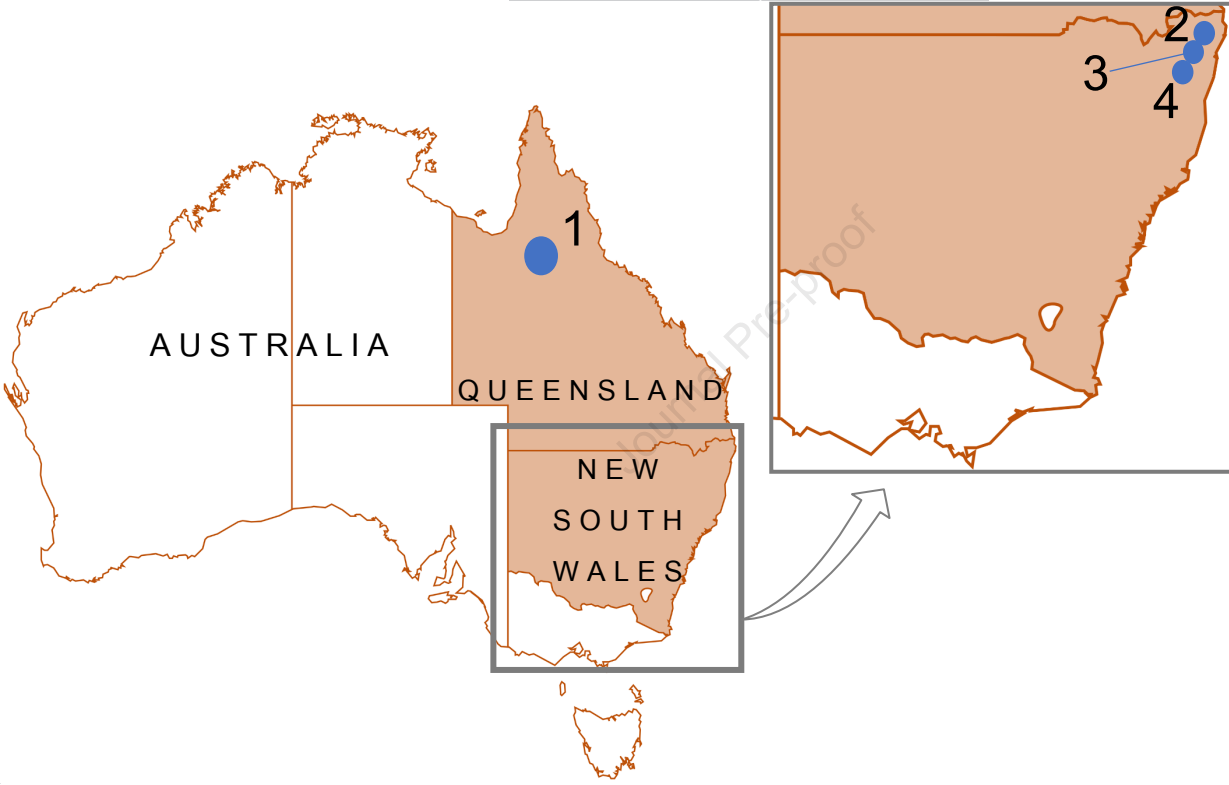
Key: HQ<sub>D</sub>: dermal non-carcinogenic risk of exposure; HD<sub>O</sub>: oral non-carcinogenic risk of exposure; HI: hazard index, THQ: total hazard, THI: total hazard index  
 Bold indicates HQ, HI, THQ or THI greater than 1.00.

**Table 4. Carcinogenic risk of exposure to contaminants from soils intended for agricultural activities.**

Location	Contaminant		Demographic								
			Children			Youth			Adult		
			R <sub>D</sub>	R <sub>O</sub>	ICR	R <sub>D</sub>	R <sub>O</sub>	ICR	R <sub>D</sub>	R <sub>O</sub>	ICR
Western James Bay	Metals	As	1.67E-07	8.15E-07	9.82E-07	2.46E-08	2.11E-07	2.36E-07	5.86E-07	1.00E-06	<b>1.59E-06<sup>a</sup></b>
Newfoundland		As	4.25E-06	<b>1.68E-05<sup>b</sup></b>	<b>2.11E-05<sup>b</sup></b>	7.05E-07	4.29E-06	5.00E-06	1.92E-06	<b>1.18E-05<sup>b</sup></b>	<b>1.37E-05<sup>b</sup></b>
Western James Bay	Pesticides	Dieldrin	2.15E-07	2.53E-07	4.68E-07	3.73E-08	6.64E-08	1.04E-07	9.48E-08	1.84E-07	2.79E-07
		<i>p,p'</i> -DDE	2.85E-08	3.11E-08	5.96E-08	5.07E-09	7.99E-09	1.31E-08	1.34E-08	2.22E-08	3.56E-08
		<i>p,p'</i> -DDD	2.85E-09	5.00E-09	7.85E-09	4.99E-10	1.27E-09	1.77E-09	1.31E-09	3.61E-09	4.92E-09
		<i>p,p'</i> -DDT	6.95E-08	7.68E-08	1.46E-07	1.27E-08	1.97E-08	3.24E-08	3.24E-08	5.48E-08	8.72E-08
		<b>TR</b>	3.16E-07	3.66E-07		5.56E-08	9.54E-08		1.42E-07	2.65E-07	
				TICR	6.82E-07		TICR	1.51E-07		TICR	4.07E-07

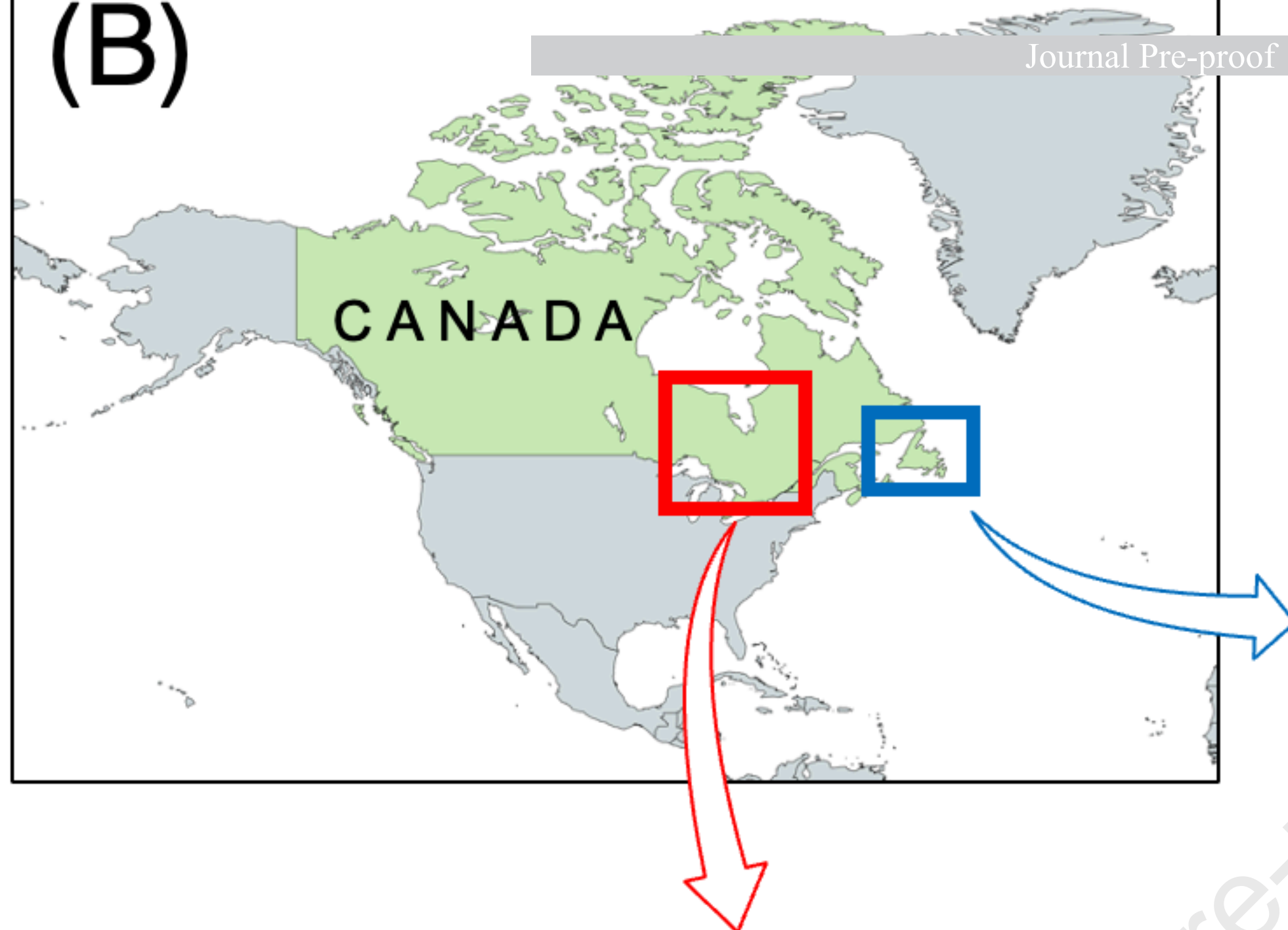
Key: R<sub>D</sub>: dermal carcinogenic risk of exposure; R<sub>O</sub>: oral carcinogenic risk of exposure; TR: total risk, ICR: incremental cancer risk, TICR: total incremental cancer risk

Bold<sup>a</sup> indicates risk that exceeds the *de minimis* risk ( $1.00 \times 10^{-6}$ ) for Western James Bay only and bold<sup>b</sup> indicates a risk that exceeds the Incremental Lifetime Cancer Risk ( $1.00 \times 10^{-5}$ ) for Newfoundland only.



(B)

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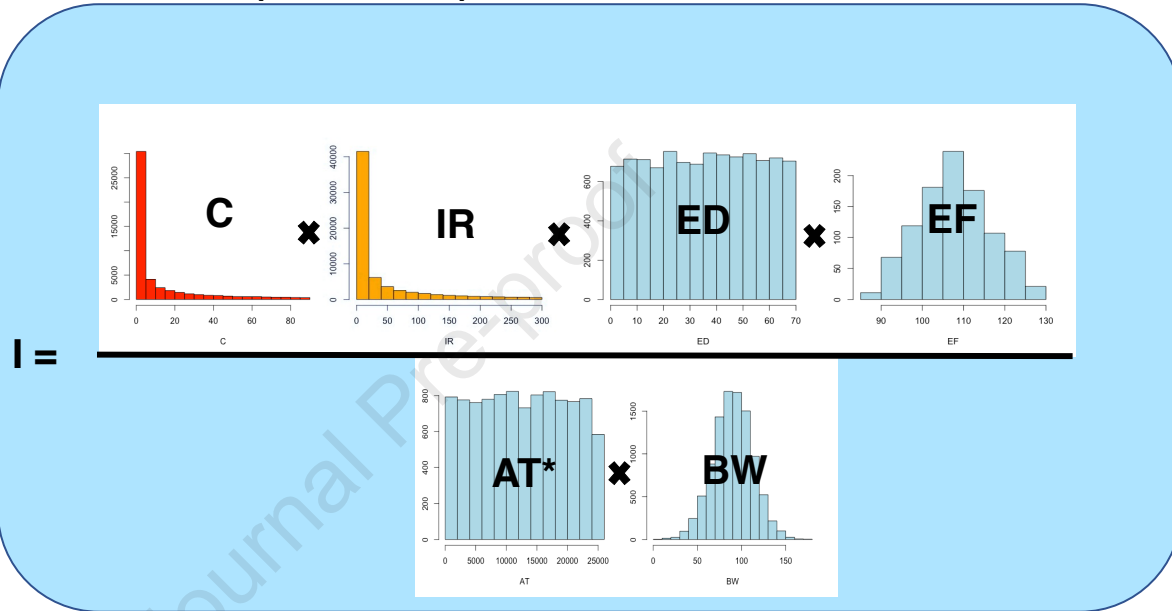


(A)

Set 1D Monte Carlo Parameters PDFs

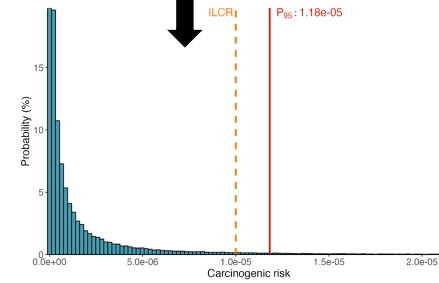
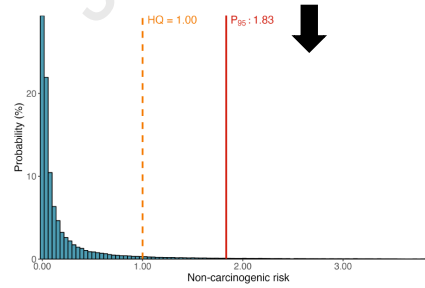


Iterations ( $i = 1$  to  $10^5$ )

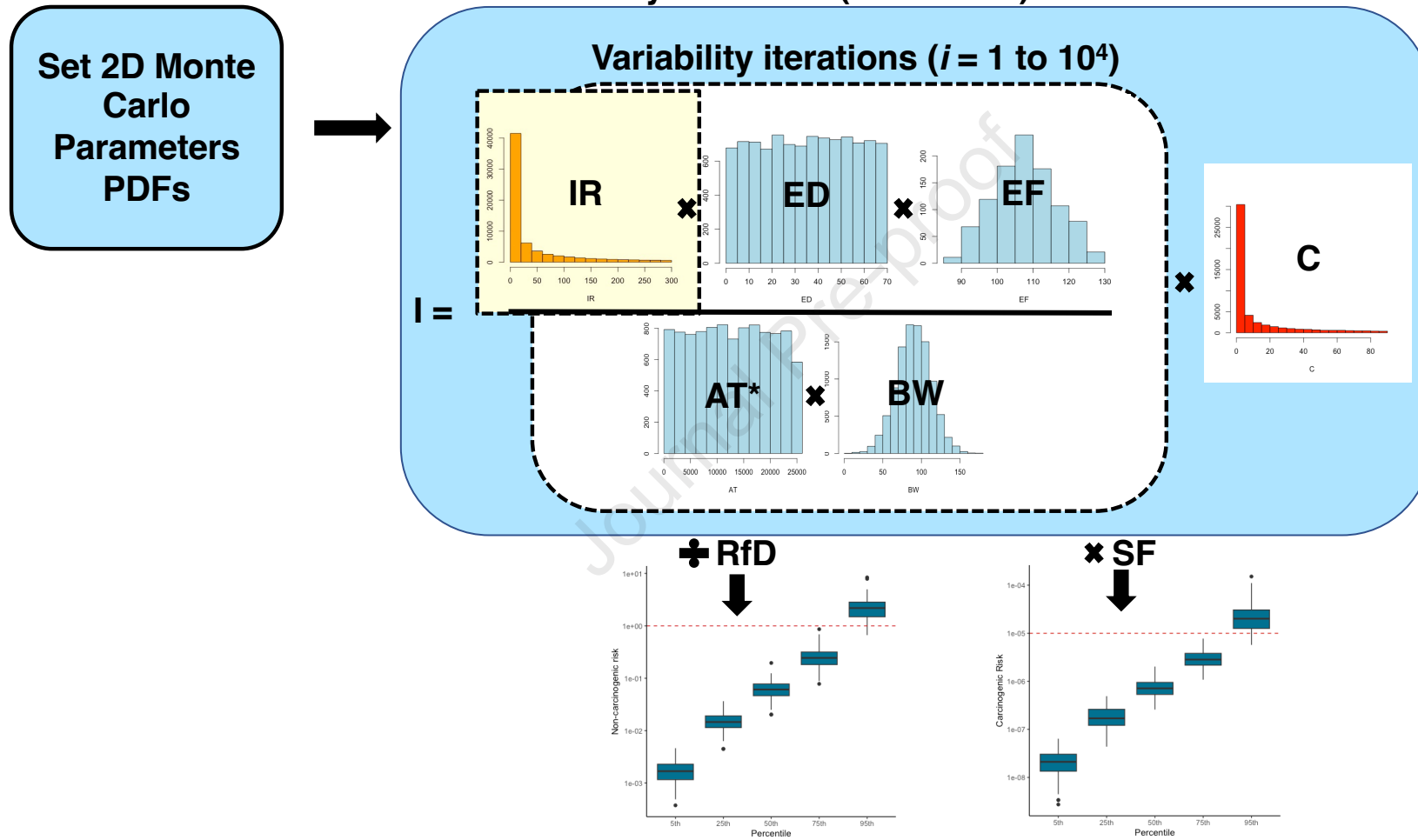


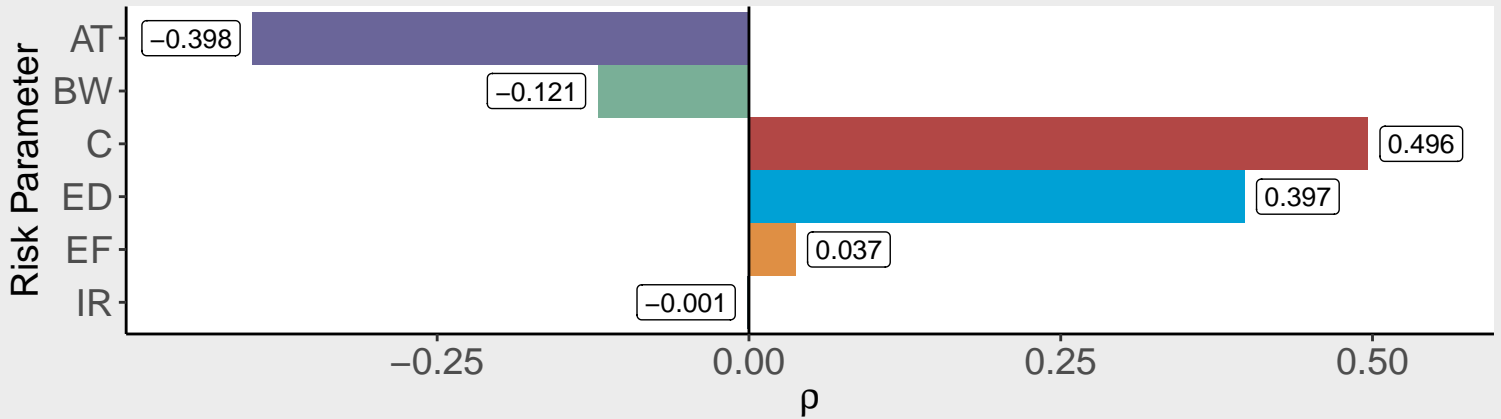
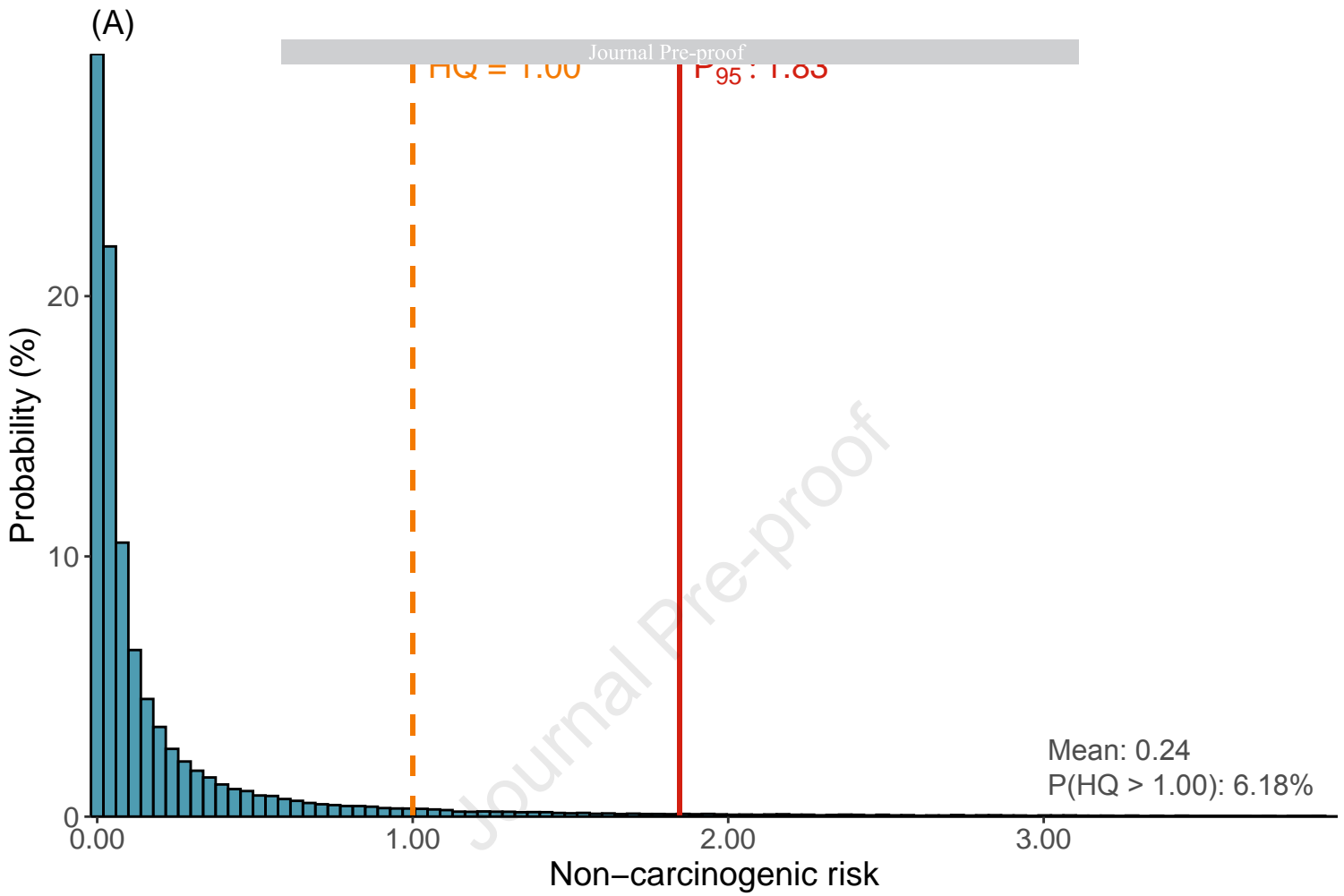
$\oplus$  RfD

$\times$  SF

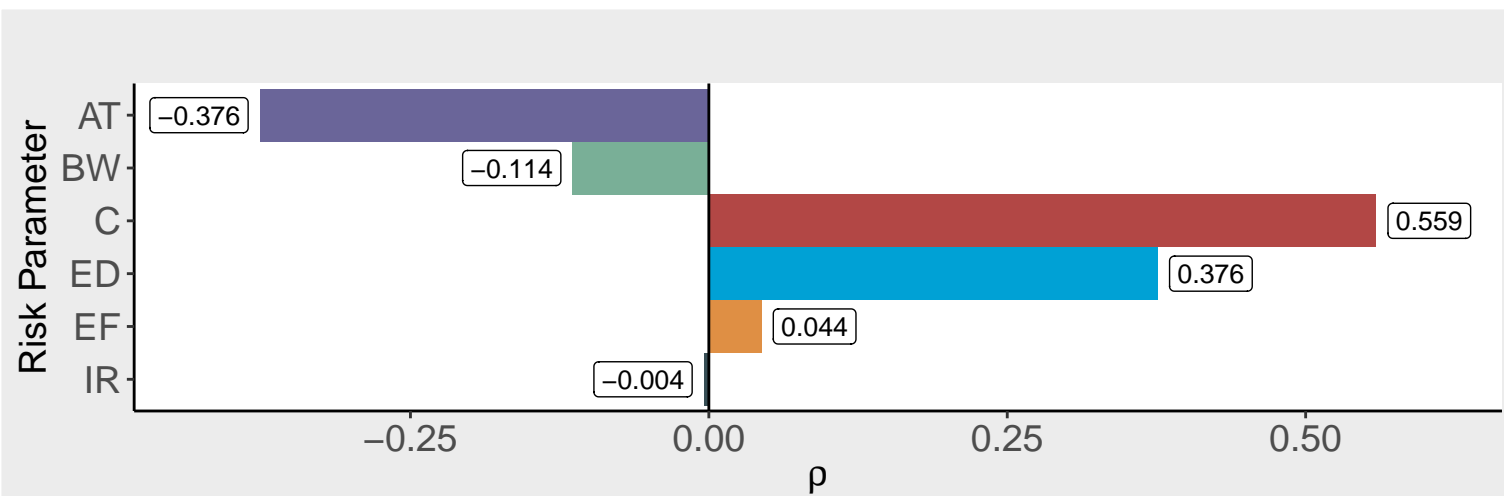
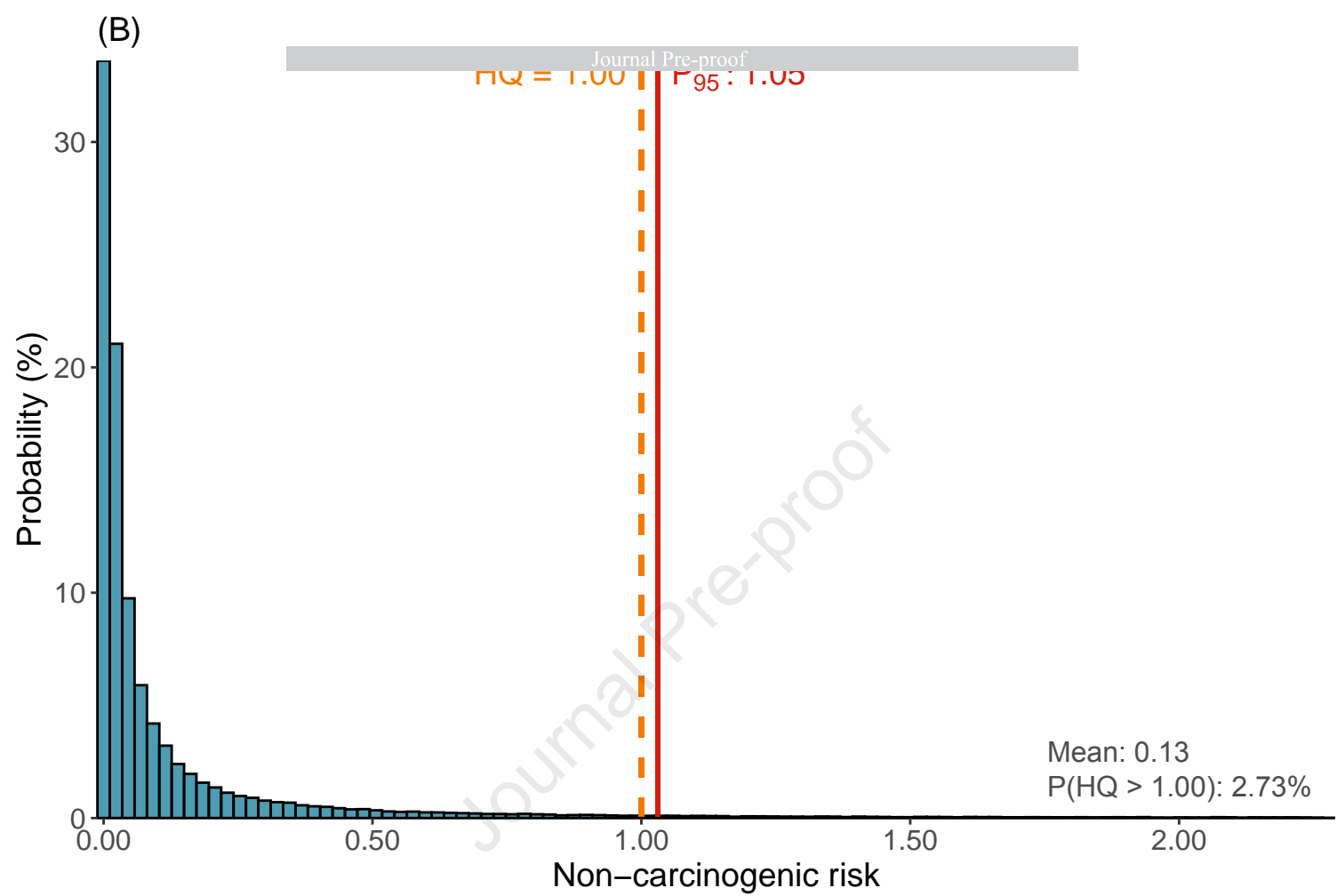


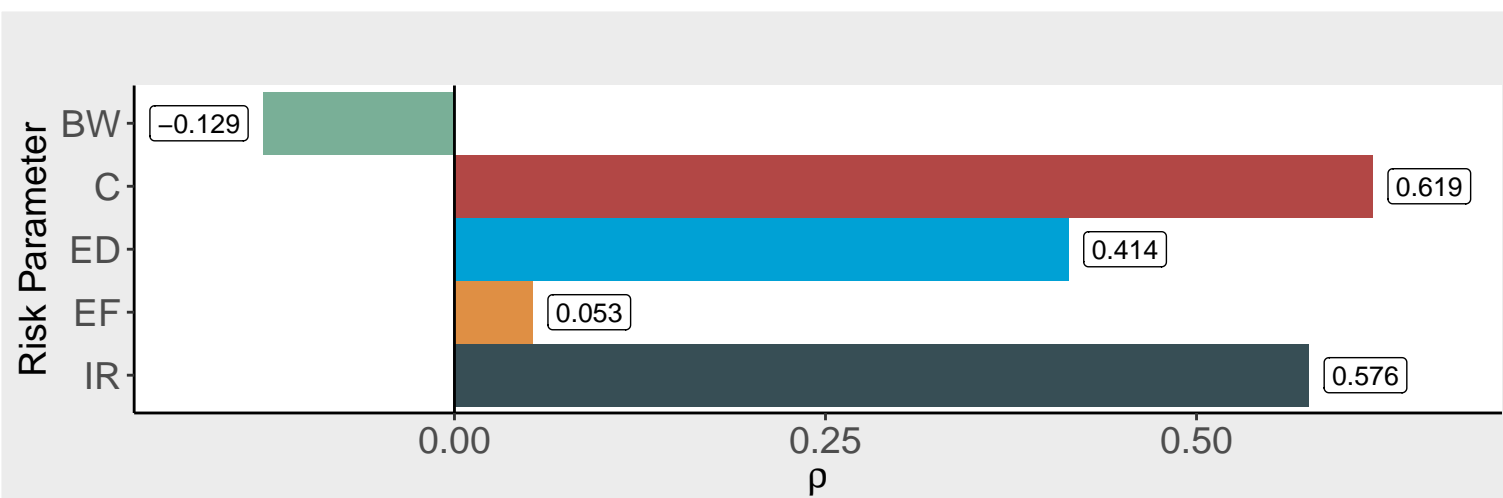
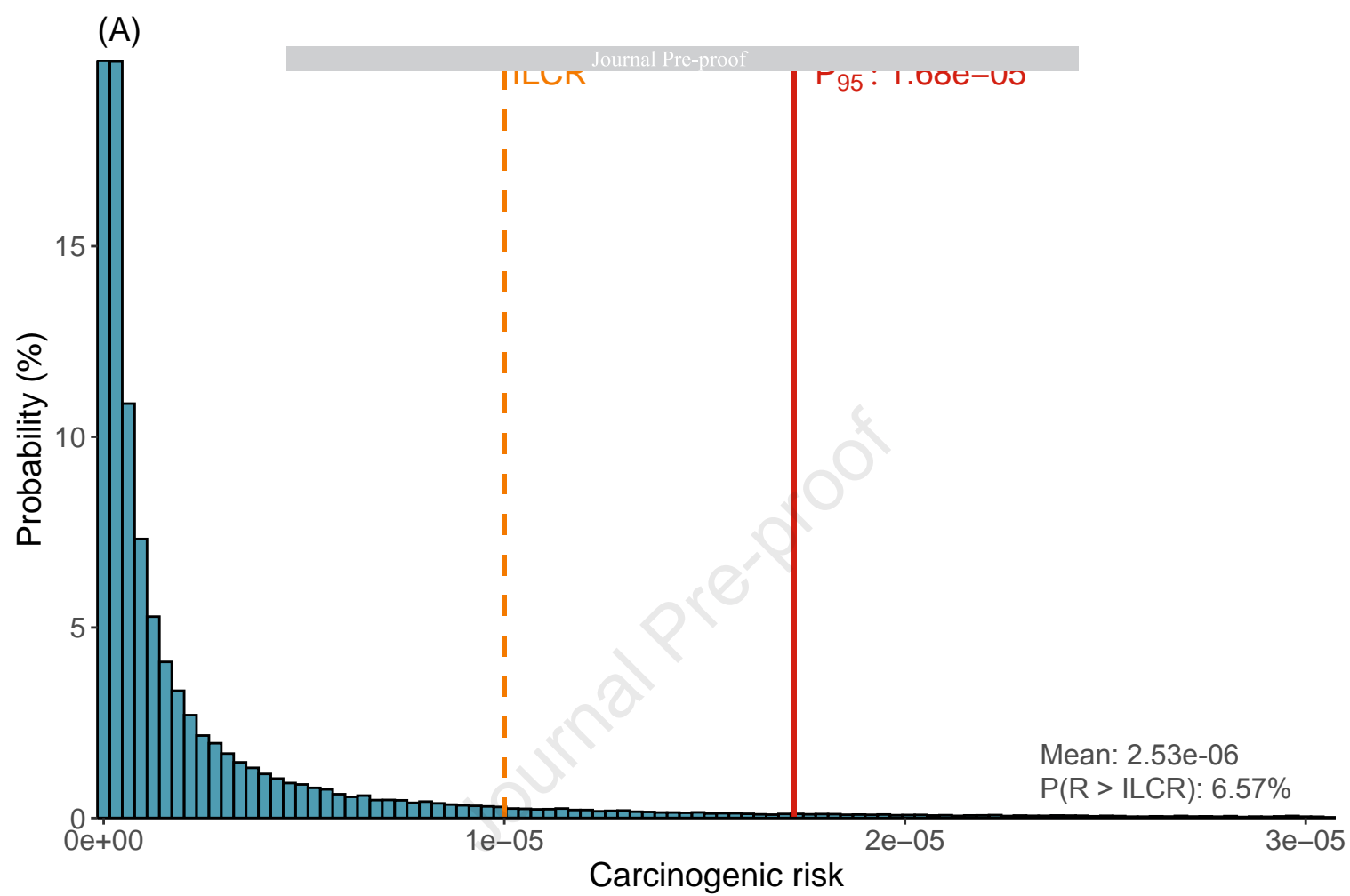
(B)



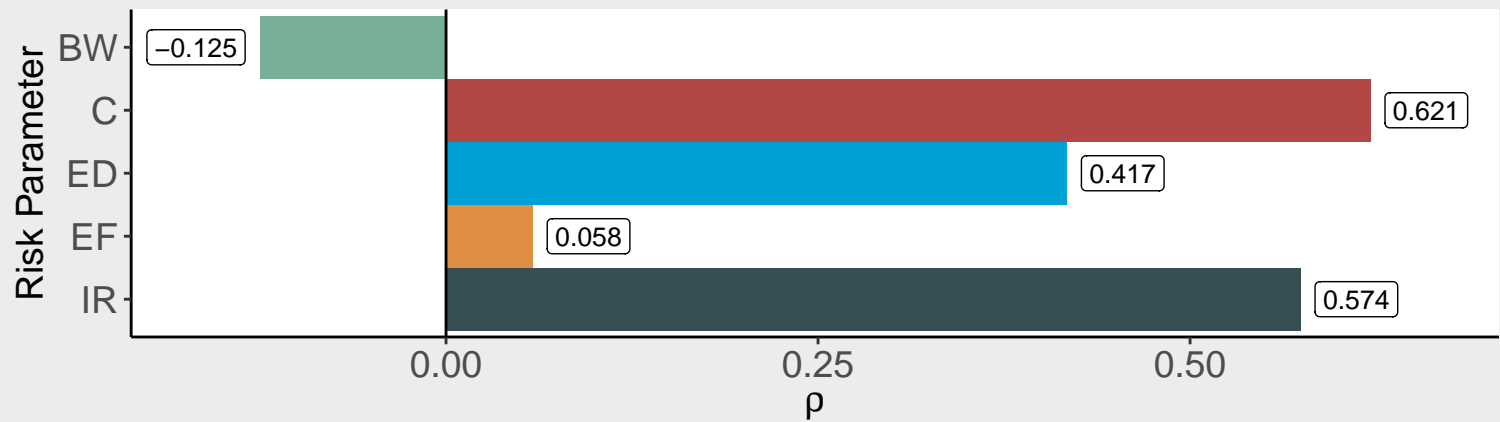
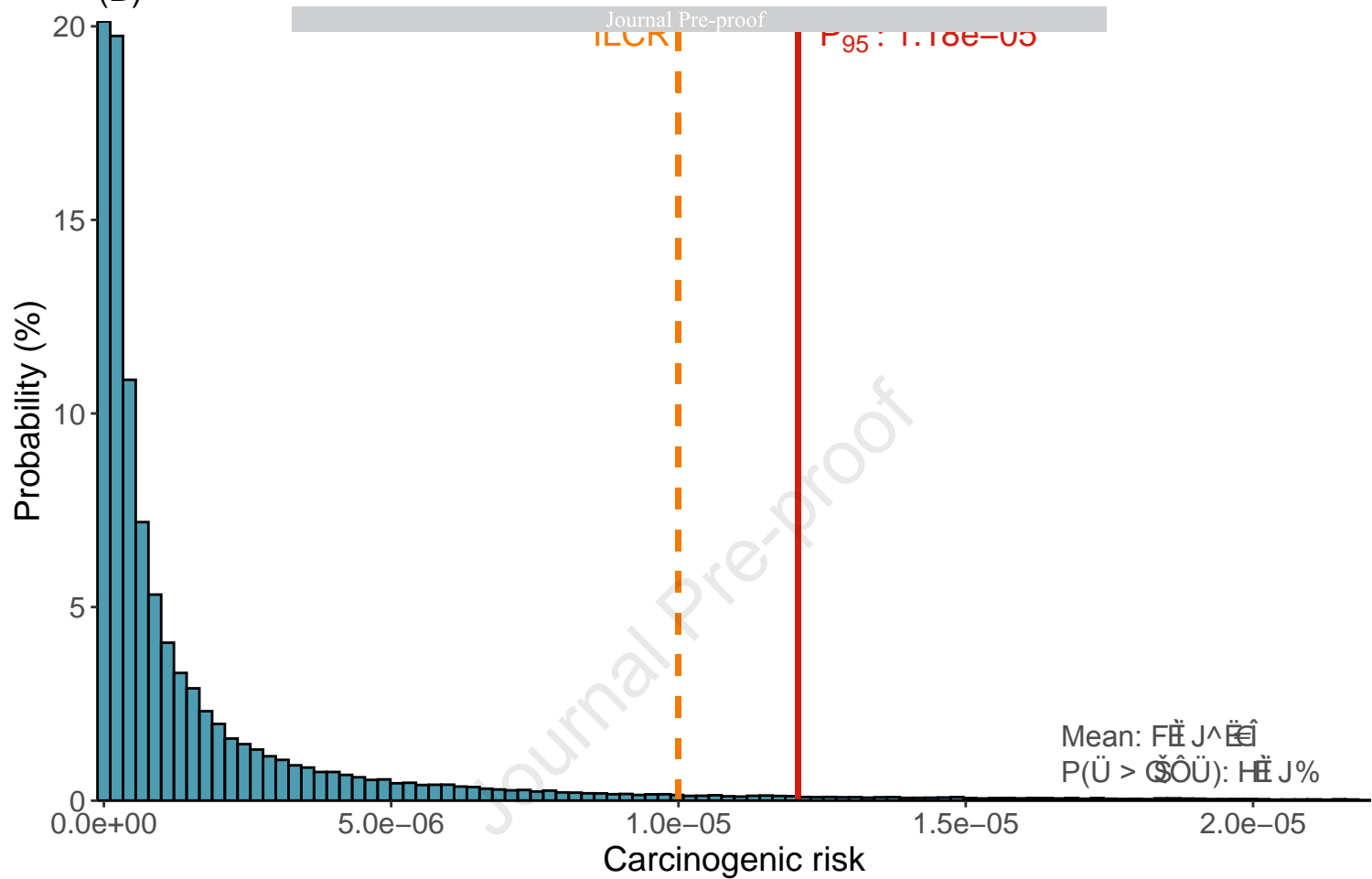


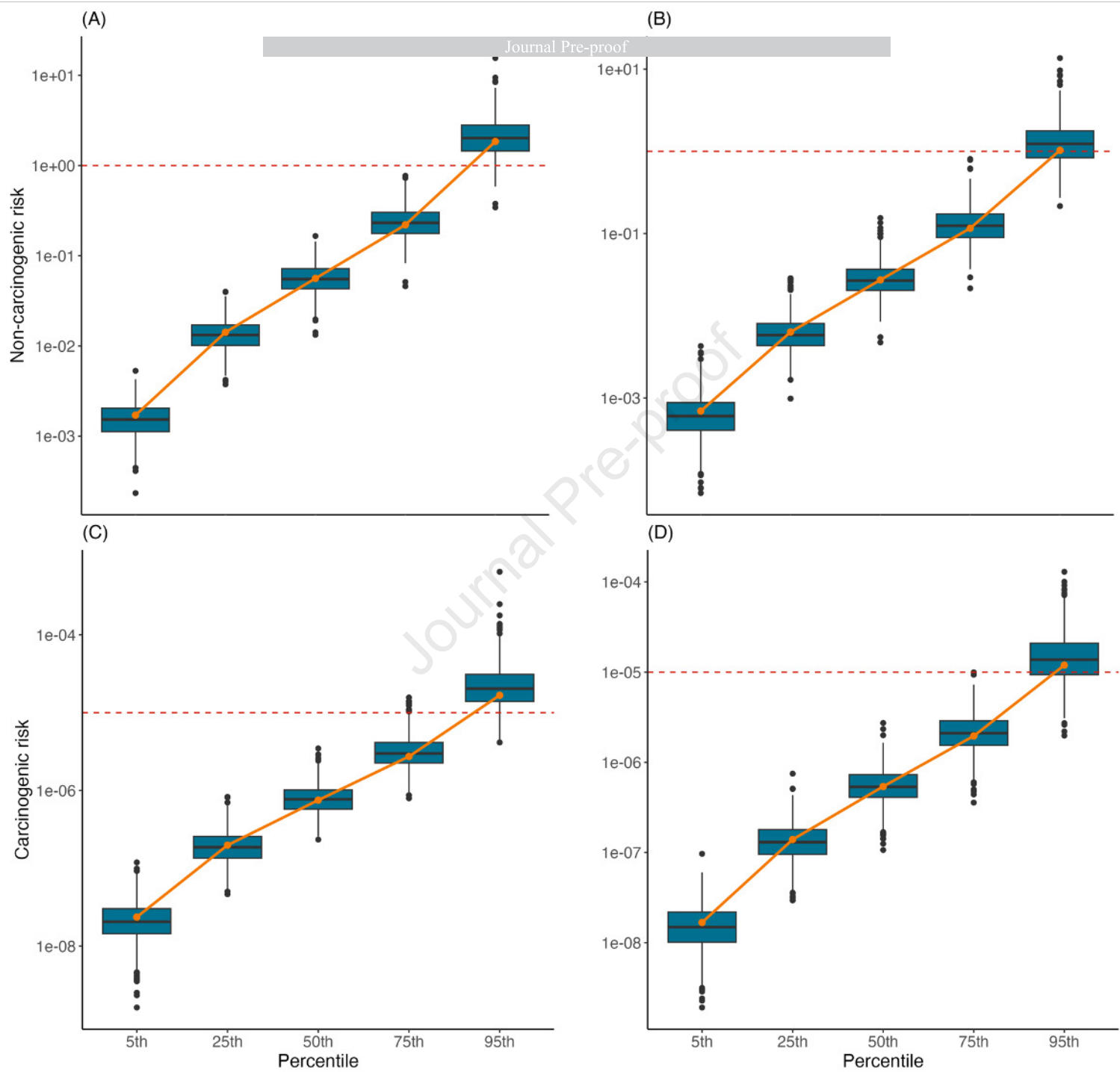
HQ = 1.00 P<sub>95</sub> = 1.05





(B)





## Highlights

- Monte Carlo simulations reveal risks from soils used for agricultural activities.
- Children in Australia face non-carcinogenic risk from Pb in agricultural soils.
- As in Newfoundland soils linked to carcinogenic risk for children and adults.
- Soil remediation and ongoing education efforts are recommended to reduce exposure risks.

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**Declaration of interests**

The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

The authors declare the following financial interests/personal relationships which may be considered as potential competing interests:

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