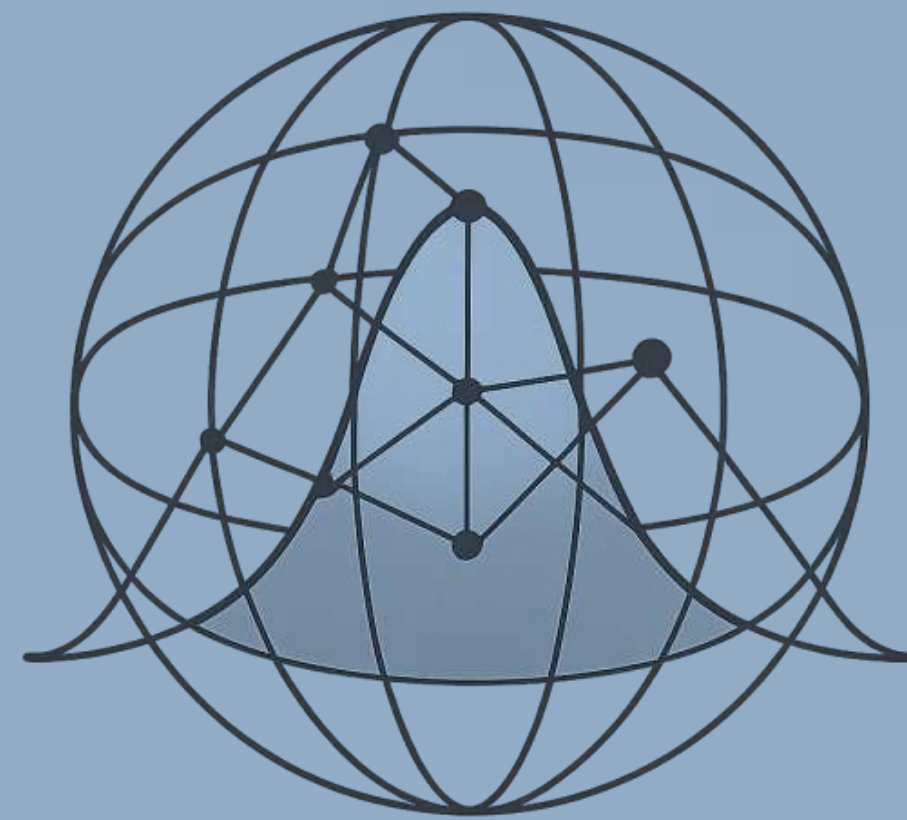


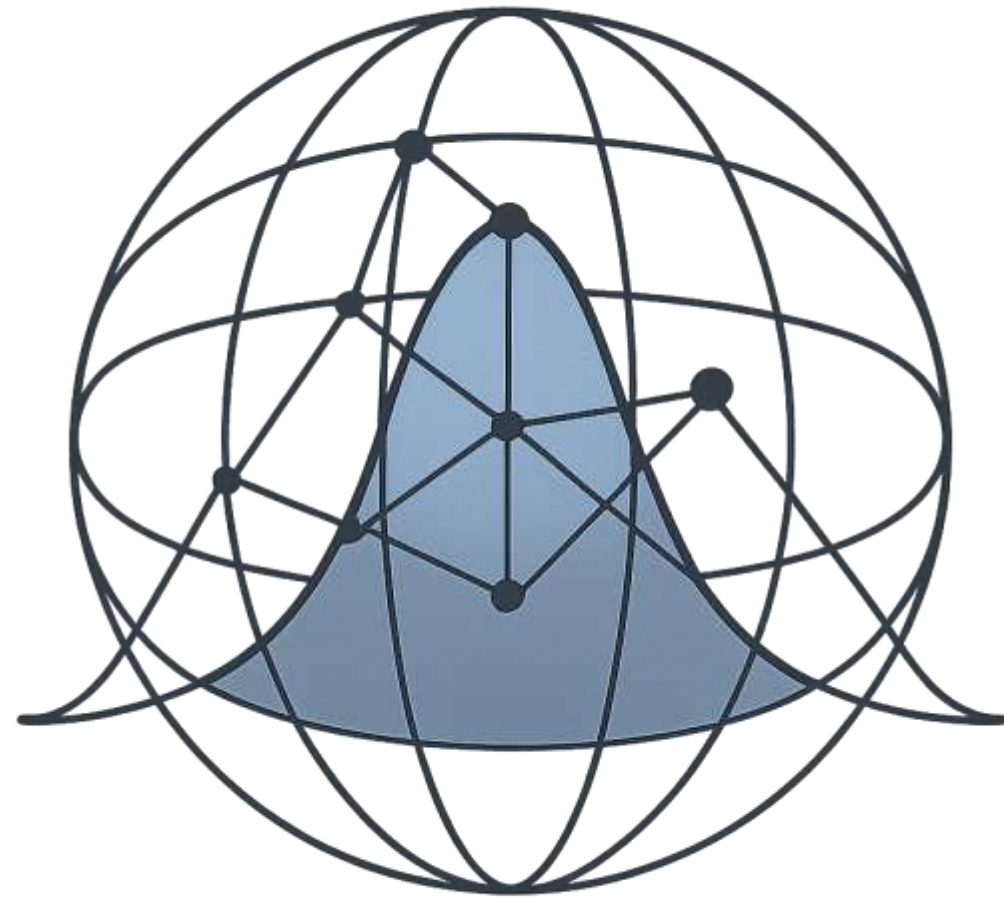
THE FUTURE OF PROBABILISTIC RISK ASSESSMENT: SCIENCE THAT BUILDS TRUST

From Uncertainty Quantification to Risk Governance



MOEZ SANAA
PRESENTATION

Outline



Probabilistic methods allow us to move from single points to population realities - to quantify variability, to explain uncertainty, and to visualize where risk truly lies. When regulators and stakeholders see the same uncertainty landscape, decisions become not only more accurate, but more legitimate.



FARMING THE FUTURE



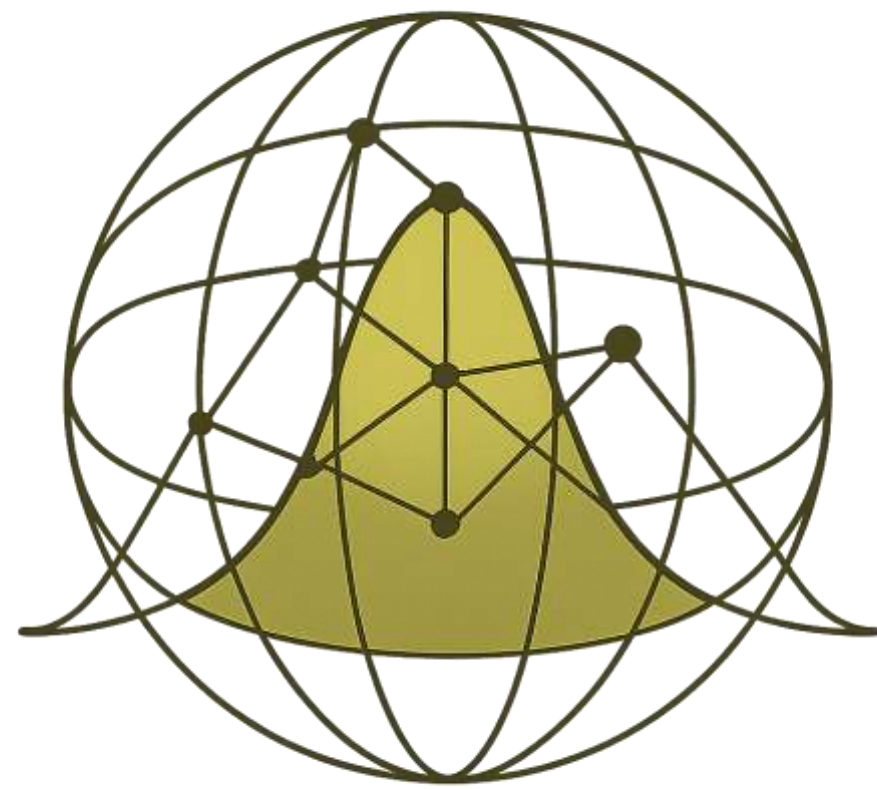
THE EVOLUTION OF RISK THINKING



THE SCIENCE BEHIND THE TRUST



INSTITUTIONAL MOMENTUM



FRAMING THE FUTURE

THE FUTURE OF PRA

THE CONTEXT SHIFT



Food safety in the age of
complexity

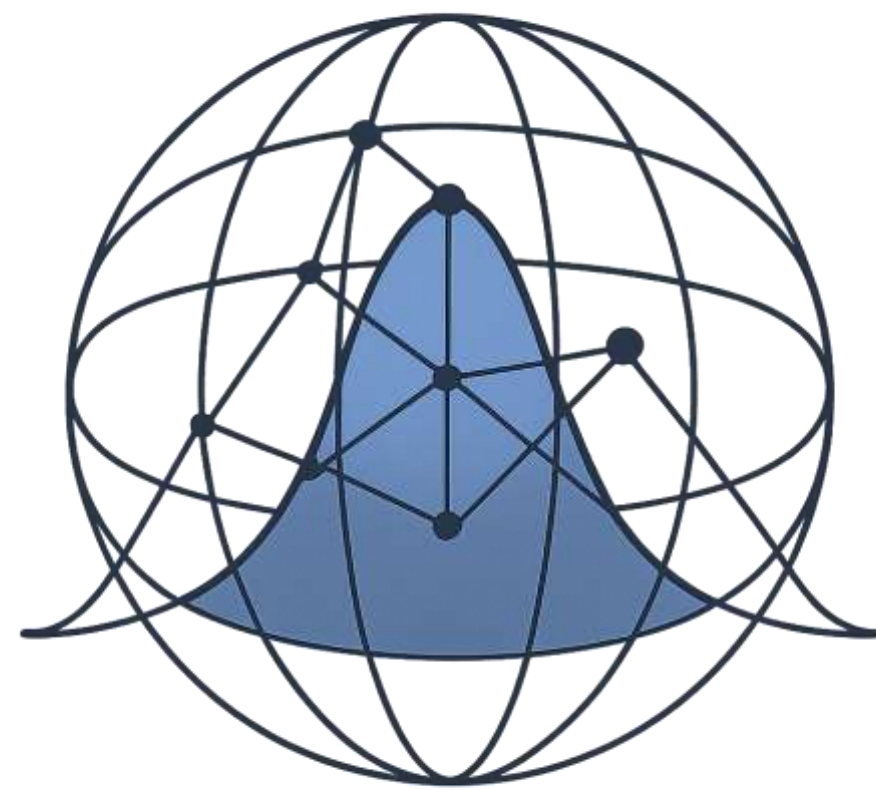
- Globalized supply chains → systemic vulnerabilities
- Climate and trade pressures → dynamic exposures
- Public expectations → transparency and accountability



The future of food safety
will not be written in
averages, but it will be
shaped by the
distributions that reveal
our realities.

Moez Sanaa

Keynote on the future of Probabilistic Risk Assessment, 2025.



THE EVOLUTION OF RISK THINKING

FROM DETERMINISTIC TO PROBABILISTIC

DETERMINISTIC

- Fixed assumptions
- “Average consumer”
- Point estimates (ADI, TDI)

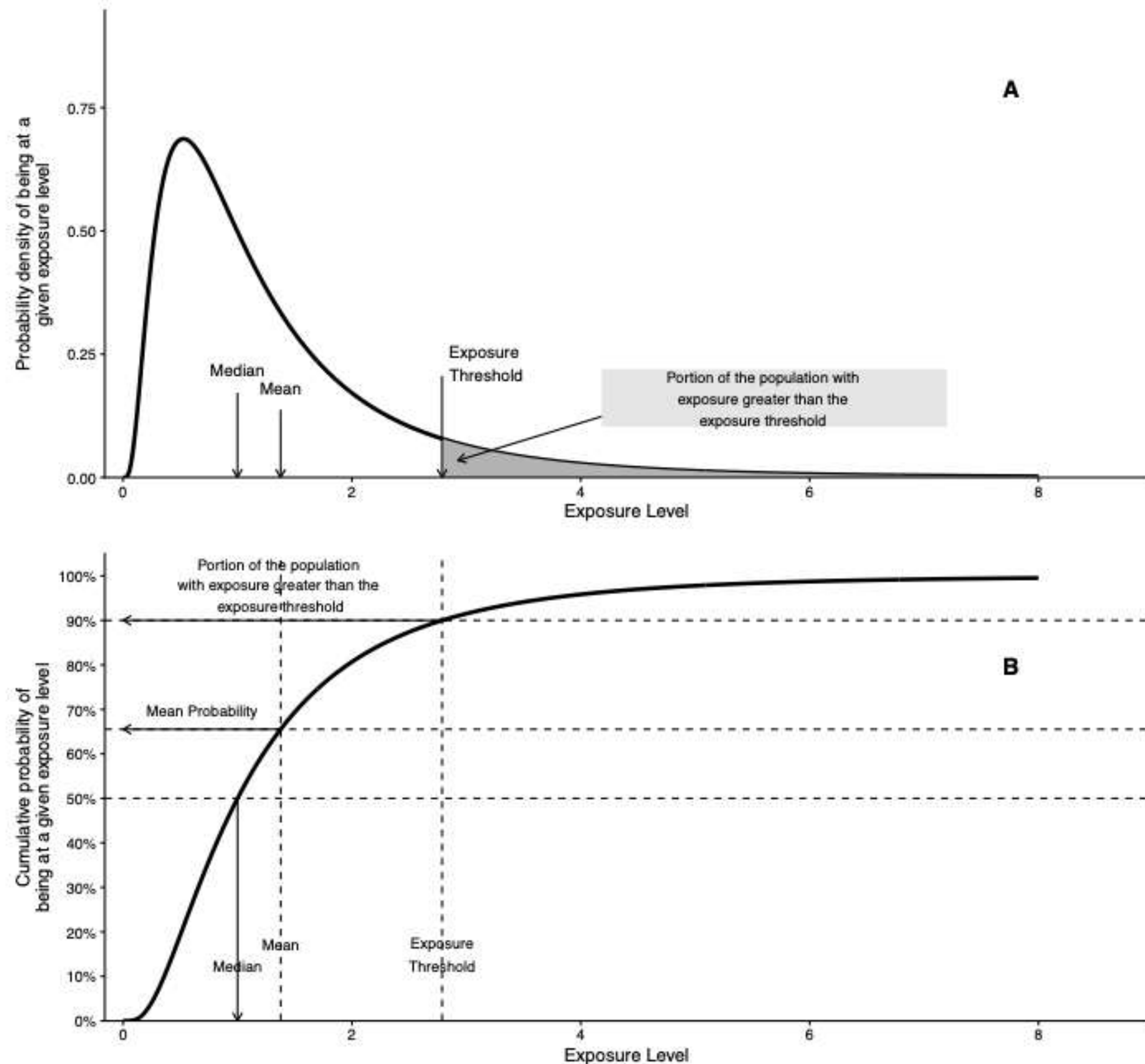
PROBABILISTIC

- Embraces variability (within and between individuals)
- Quantifies uncertainty
- Describe full exposure distributions

PROBABILISTIC

Probabilistic risk assessment (PRA) uses probability density(A) and cumulative probability (B) functions to represent how exposure varies across a population. It allows regulators to quantify the proportion of the population exceeding defined safety thresholds, offering a transparent basis for risk management decisions.

Theoretical example.
Figures generated using the
R *ggplot2* package.



THE FUTURE OF PRA

WHY PROBABILITY MATTERS



VARIABILITY



UNCERTAINTY



TRANSPARENCY

We don't hide uncertainty —
we manage it intelligently

1. Variability – real differences in populations
2. Uncertainty – limits of our knowledge
3. Transparency – clarity on both

UNDERSTANDING VARIABILITY VS UNCERTAINTY



UNCERTAINTY
VARIABILITY

“Variability is natural;
uncertainty is informational.
Probabilistic methods help us
manage both.”

Concept	What it Means	Example	How It’s Treated
Variability	Real differences across foods, people, time	Differences in consumption by age/region	Represented explicitly by distributions
Uncertainty	Imperfect knowledge	Limited sampling measuring a contaminant in foods	Reduced by better data and sensitivity analysis

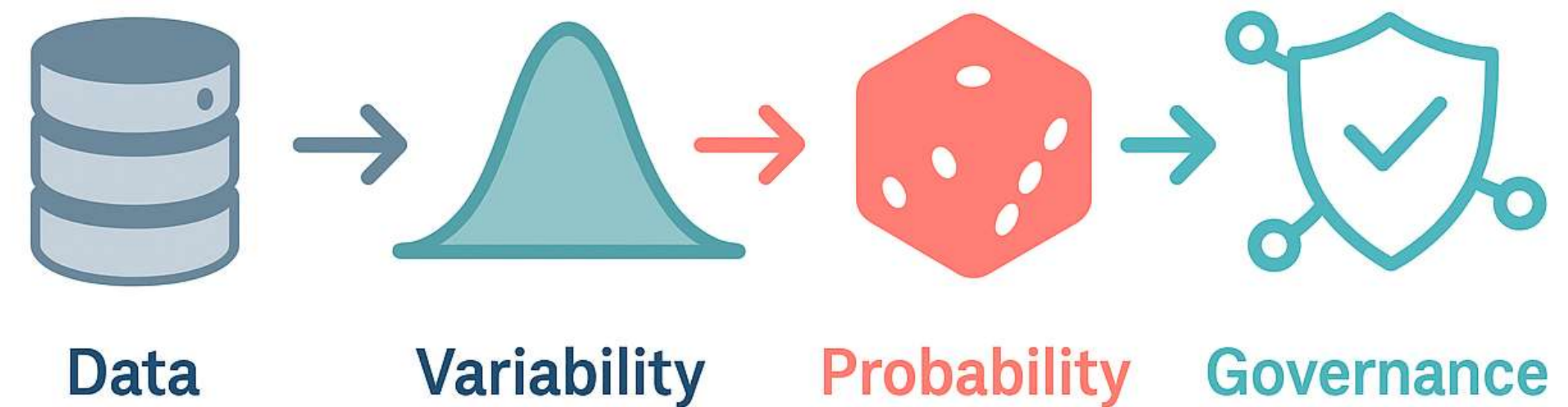
Risk Governance

Actors, Rules, Conventions, Processes, and Mechanisms concerned with how relevant risk information is collected, analyzed, and communicated and how management decision are made

REFRAMING THE RISK.

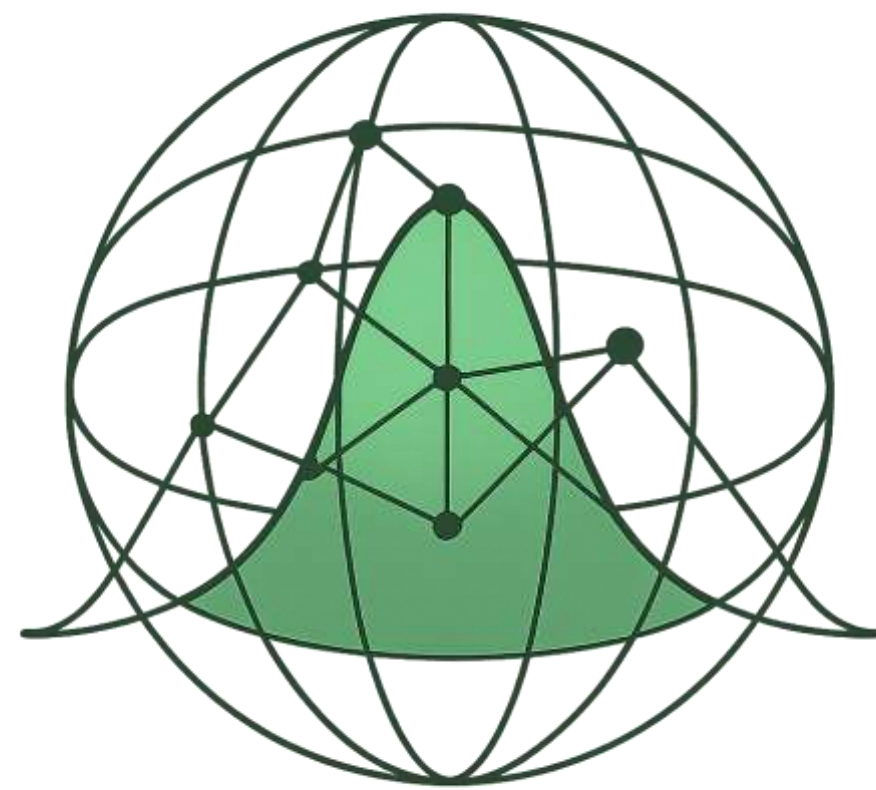
THE FUTURE OF PRA

FROM CONTROL TO COMPREHENSION



VARIABILITY

variability doesn't undermine safety — it refines it



THE SCIENCE BEHIND THE TRUST

Risk Governance

Actors, Rules, Conventions, Processes, and Mechanisms concerned with how relevant risk information is collected, analyzed, and communicated and how management decision are made

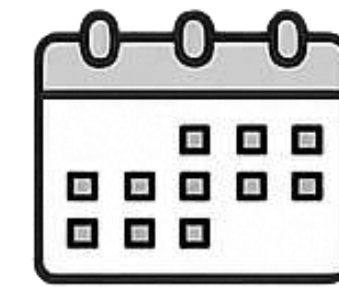
Transparency

REFRAMING THE RISK.

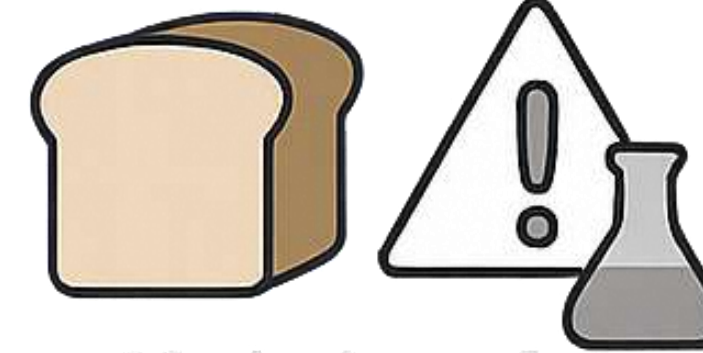
THE FUTURE OF PRA

CONSIDERING VARIABILITY

DIETARY EXPOSURE CALCULATION



Day-to-Day
Variation
in Consumption

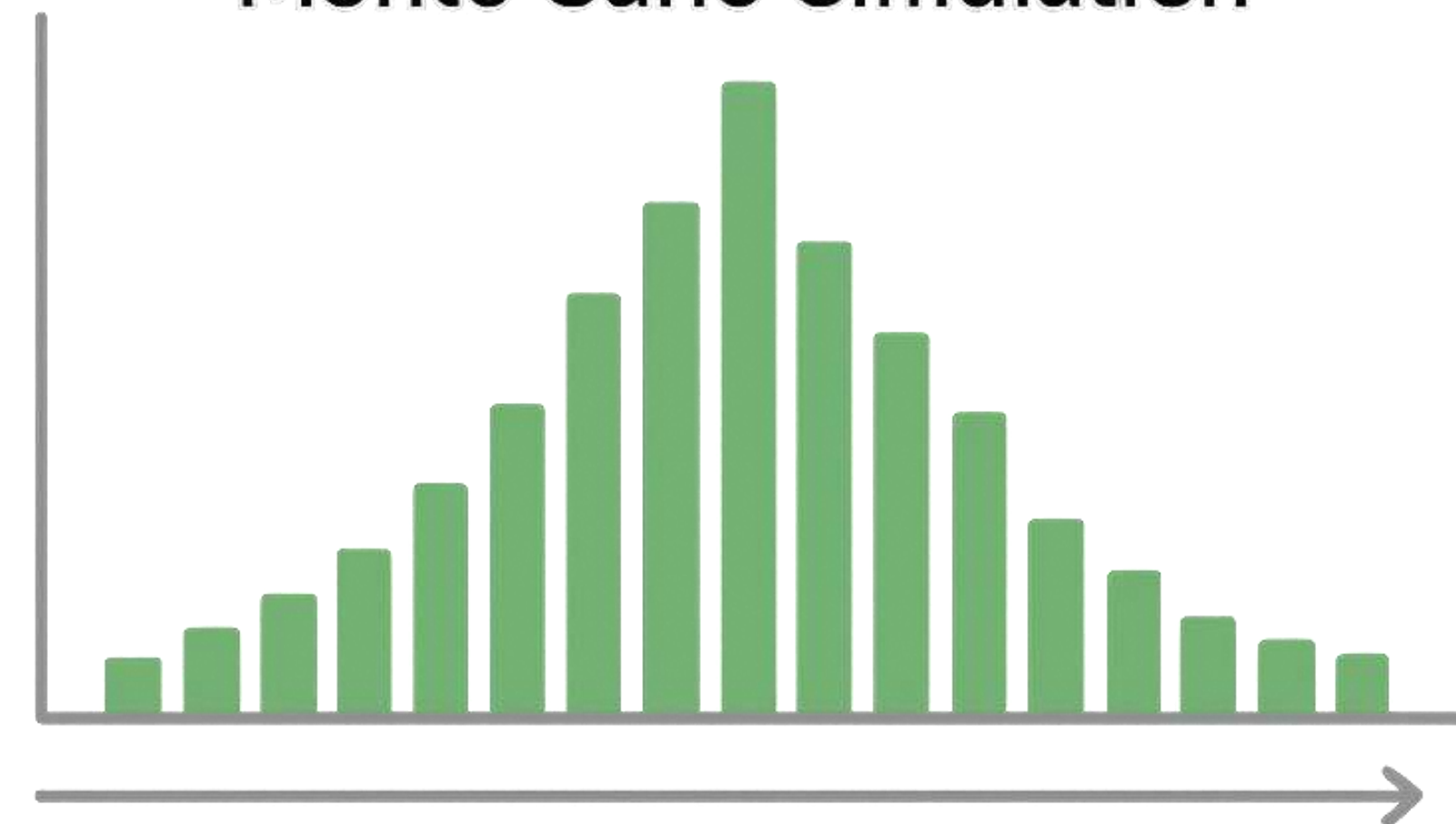


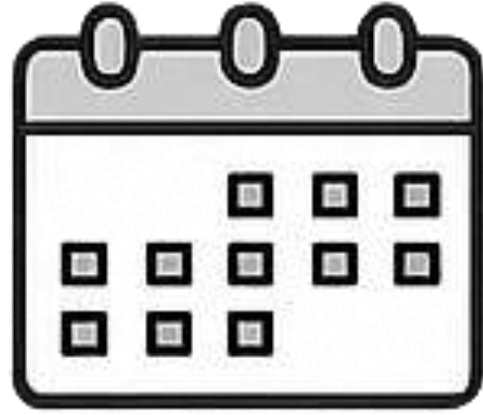
Variation of
Contamination
Level



Variation
Between
Individuals

Monte Carlo Simulation





Day-to-Day
Variation
in Consumption



Individual1



DAY1

DAY2

DAY3

172

166

225



27

23

0



197

187

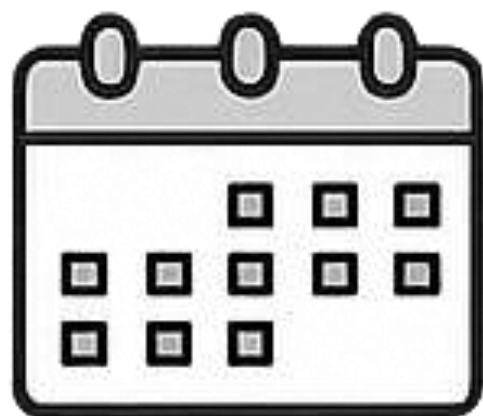
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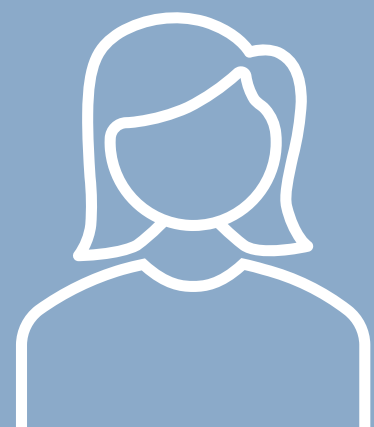
254

225

222



Day-to-Day
Variation
in Consumption



Individual2



DAY1

DAY2

DAY3

331

239

325



0

16

5



149

138

156



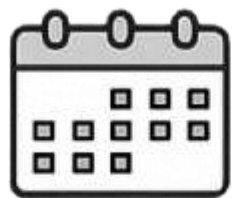
209

150

161



Variation
Between
Individuals



Day-to-Day
Variation
in Consumption



Individual1

80 kg BW



DAY1

172

DAY2

166

DAY3

225



27

23

0



197

187

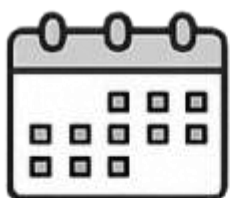
171



254

225

222



Day-to-Day
Variation
in Consumption



Individual2

55 kg BW



DAY1

331

DAY2

239

DAY3

325



0

16

5



149

138

156

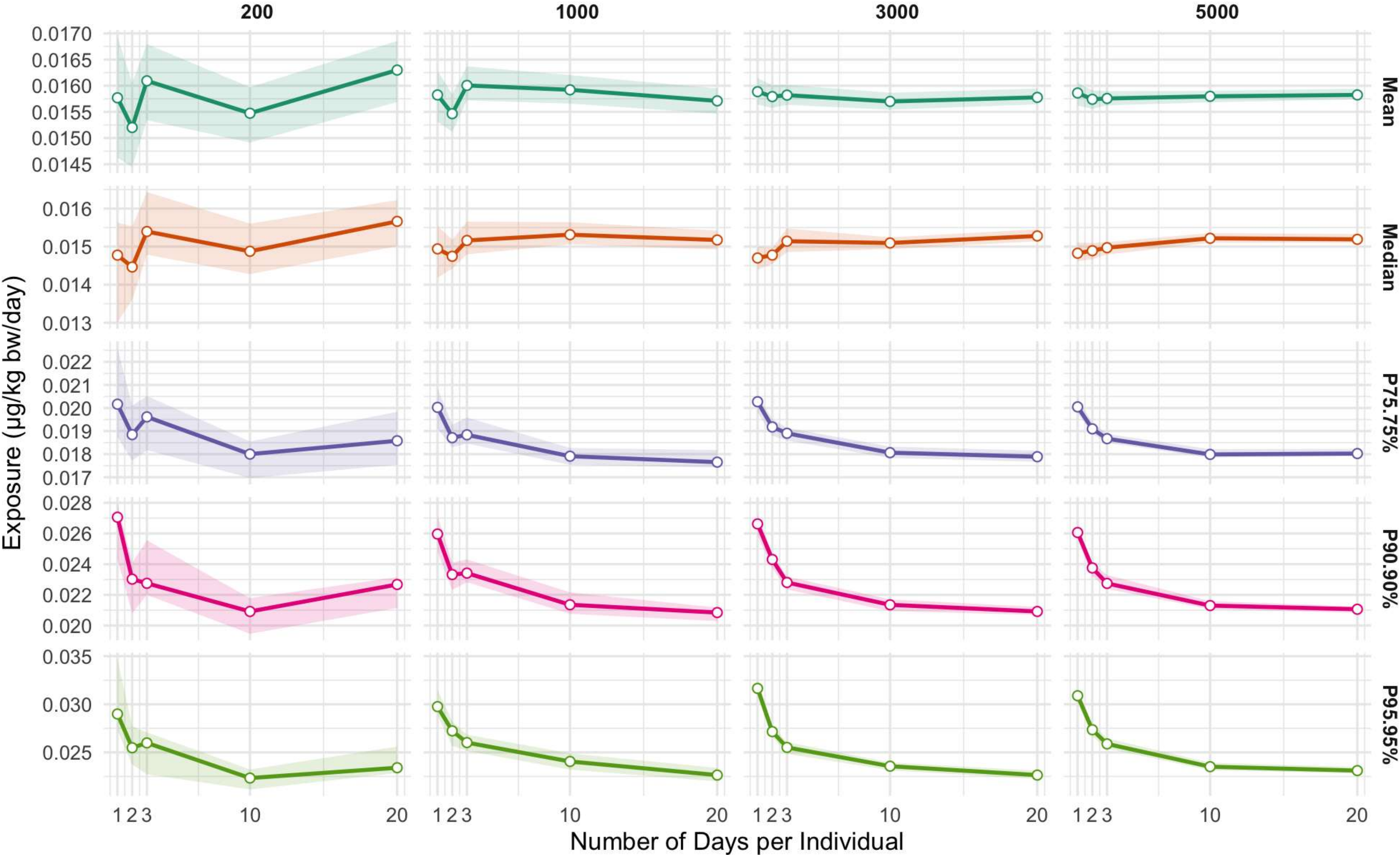


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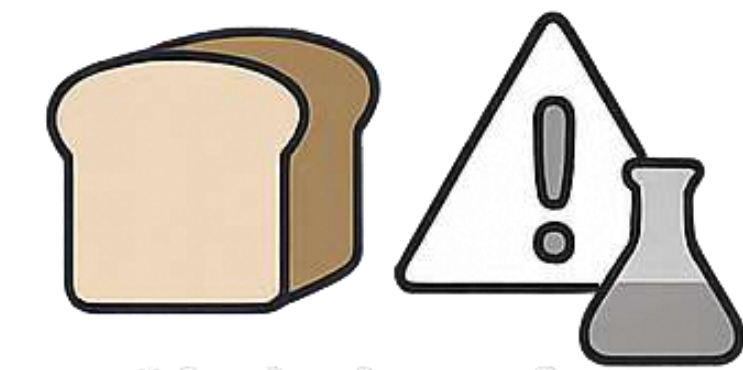
150

161

Stabilization of Dietary Exposure Distributions
Effect of survey duration (1–20 days) and population size (200–5000 individuals)



SOURCE OF VARIABILITY IN FOOD CONTAMINATION



Variation of
Contamination
Level

Primary Production

- Geographical origin of raw materials
- Soil and water contamination levels
- Agriculture practices (pesticides use, type, usage, timing, fertilizer use)
- Animal feed composition and contamination
- Animal health and metabolism affecting residue levels
- Seasonal variation in crop or animal products
- Climatic factors (temperature, humidity, rainfall)



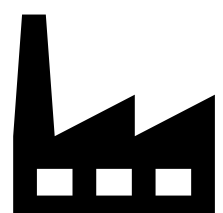
Distribution and Retail

- Variation in supplier or brand contamination profiles
- Differences in transport and storage conditions along the supply chain
- Mixing of products from multiple origins in retail lots
- Duration of storage before sale or consumption



Post-Harvest & Processing

- Post-harvest handling and drying conditions
- Storage duration and conditions (temperature, humidity, aeration)
- Processing efficiency (washing, blanching, roasting, milling, ...)
- Degradation or transformation of chemicals during processing
- Mixing of products with different contamination levels
- Cross contamination during transport, processing or packaging
- Equipment cleanliness and maintenance variability
- Batch-to-batch differences in industrial production



Purchasing and Consumption

- Brand loyalty – consistent purchase from specific brands with distinct contamination profiles.
- Preference for organic foods – reduced synthetic residues but possible higher natural contaminants.
- Food sourcing habits – local, seasonal, or niche products with variable contamination control levels.
- Storage and Preparation conditions



LIMITATIONS OF USING A SINGLE AVERAGE CONTAMINATION LEVEL

Key message

Current exposure assessments often assume one average contamination value for all foods of the same category and all consumers - but this ignores how contamination varies in the real world.

A

Using one mean contamination level simplifies assessment but undermines accuracy - realistic exposure estimation must reflect variability across individuals, foods, and time.

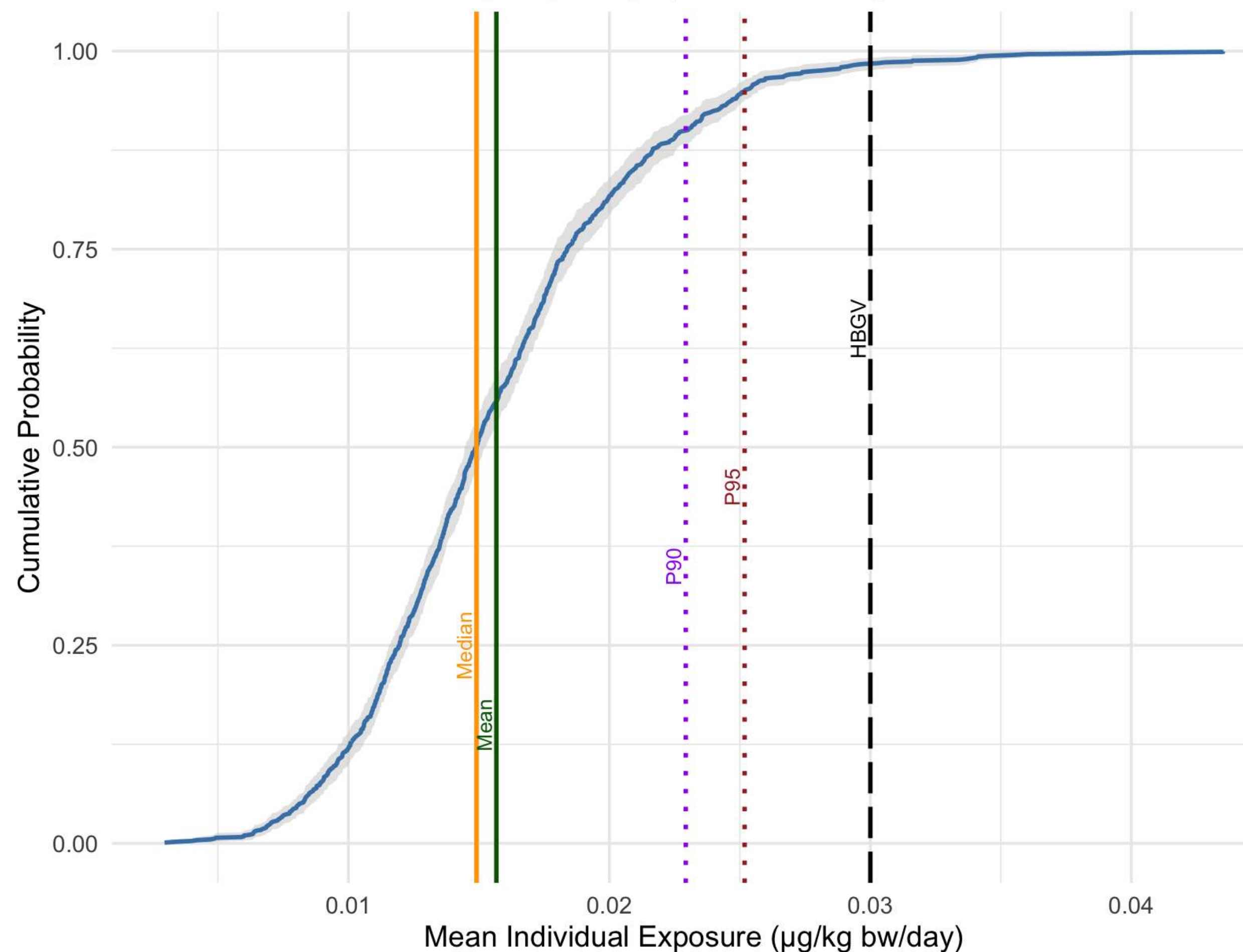
MAIN ISSUES

- Ignores variability - contamination differs by batch, source, season, and storage.
- Assumes stability over time - uses a snapshot even though contamination changes across years or decades.
- Masks high exposures - fails to identify individuals regularly consuming more contaminated foods.
- Reduces realism - treats the food system as static while it is dynamic and heterogeneous.
- Biases chronic exposure - may smooth random variation but misses long-term shifts in contamination trends.

OUTPUTS INCLUDING UNCERTAINTY

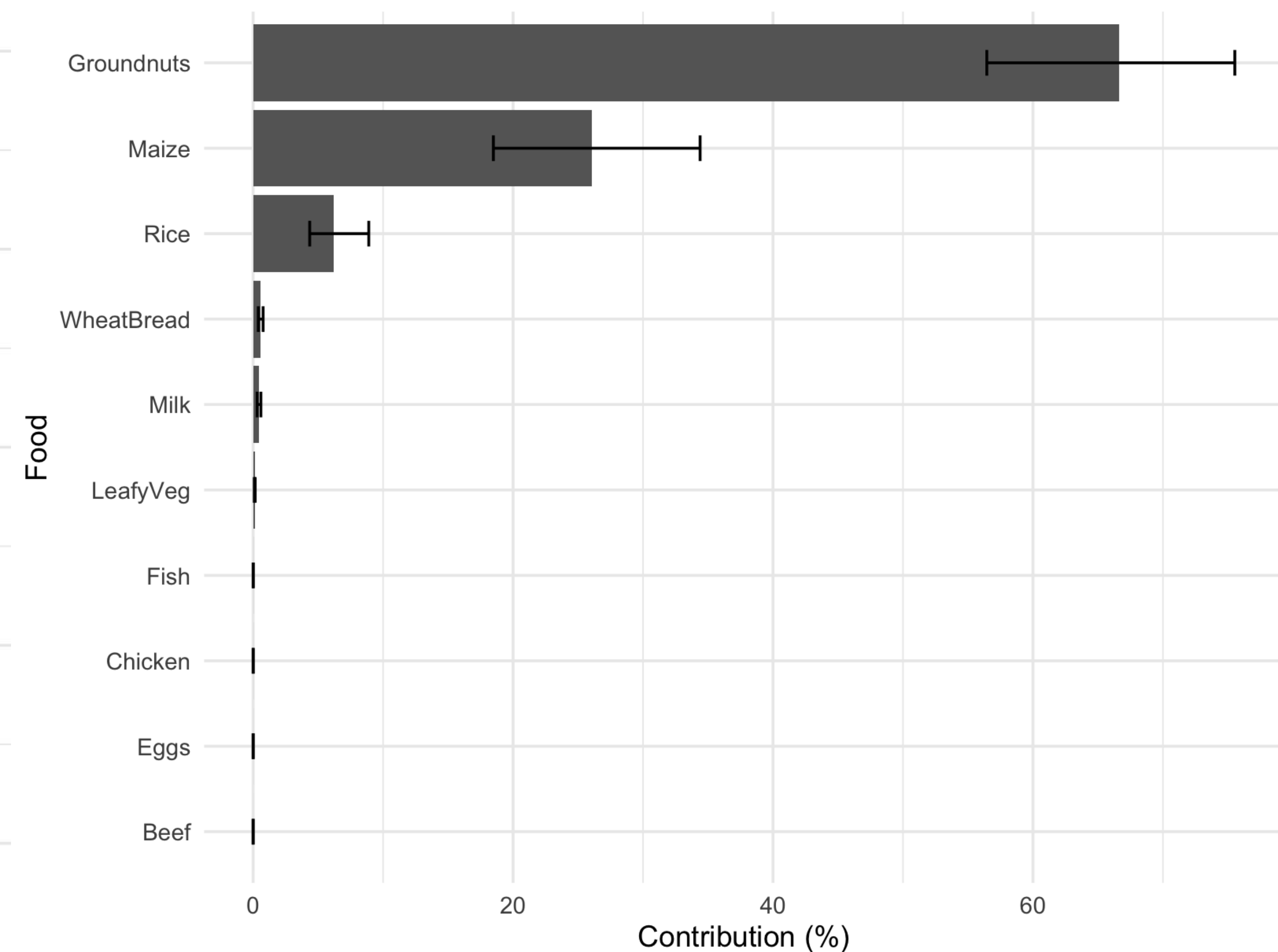
Cumulative Distribution of Dietary Exposure (1000 Individuals × 3 Days)

Shaded area = 95% bootstrap CI | Prob(Exposure > HBGV) = 1.6%



Food Contributions Among Individuals Exceeding HBGV

Bars = mean contribution; error bars = 95% bootstrap CI



Relative vs. Absolute Burden

Chemical exposure effects (e.g., cancers, neurotoxicity, developmental outcomes) may have low prevalence but high severity
Each case representing a major lifelong burden or DALY loss.

ALOP

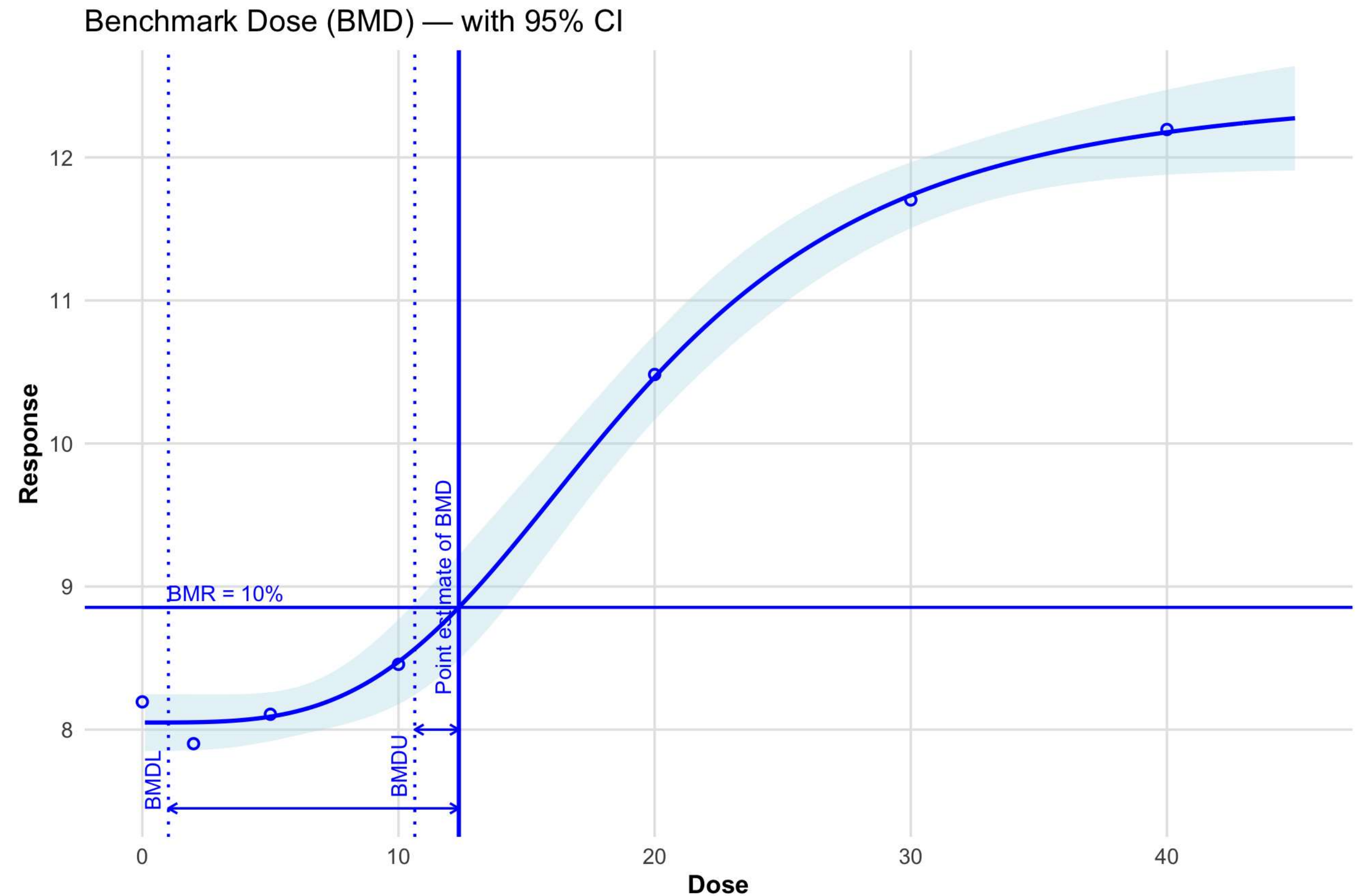
While 1% may seem small next to NCD prevalence, for involuntary and preventable exposures with potentially severe outcomes, it represents a meaningful and actionable public health concern.

Health Outcome	Typical Prevalence	Public Health Interpretation
Hypertension	25–35%	Common, chronic, multifactorial
Diabetes (Type 2)	8–10%	High and rising globally
Cancers (any type)	0.5–2% incidence	Considered high because of lethality
Chemical exposure exceeding HBGV	0.5–5%	Critical for regulatory action despite low prevalence

USE THE DOSE RESPONSE MODELS

The full dose–response model gives a clearer picture of population risk, while an HBGV shows only a single threshold and hides the gradient of potential effects.

DR



CASE STUDY WITH INFANT CEREAL

INFANT CEREALS (RICE VS OAT) AND TWO CONTAMINANTS
(INORGANIC ARSENIC, AFLATOXINS)

PROBABILISTIC ELEMENTS

- Contamination
 - Distributions fitted to iAs and aflatoxin measurements
 - Parametric bootstrap to generate uncertainty in mean concentrations
- Consumption (NHANES)
 - Each infant has their own intake + body weight
 - Captures real variability across 1,041 infants
- Dose–response models
 - Inorganic arsenic: FDA model-averaged cancer functions
 - Aflatoxins: JECFA cancer potency modeled as Pert distribution
- Two-dimensional Monte Carlo
 - Inner loop: variability across infants
 - Outer loop: uncertainty in contaminant levels & dose–response



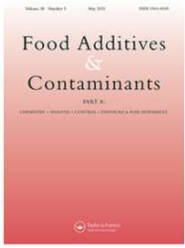
Food Additives & Contaminants: Part A

ISSN: 1944-0049 (Print) 1944-0057 (Online) Journal homepage: www.tandfonline.com/journals/tfac20

Implementing a risk-risk analysis framework to evaluate the impact of food intake shifts on risk of illness: a case study with infant cereal

Sofia M. Santillana Farakos, Régis Pouillot, Judith Spungen, Brenna Flannery,
Jane M. Van Doren & Sherri Dennis

CASE STUDY WITH INFANT CEREAL



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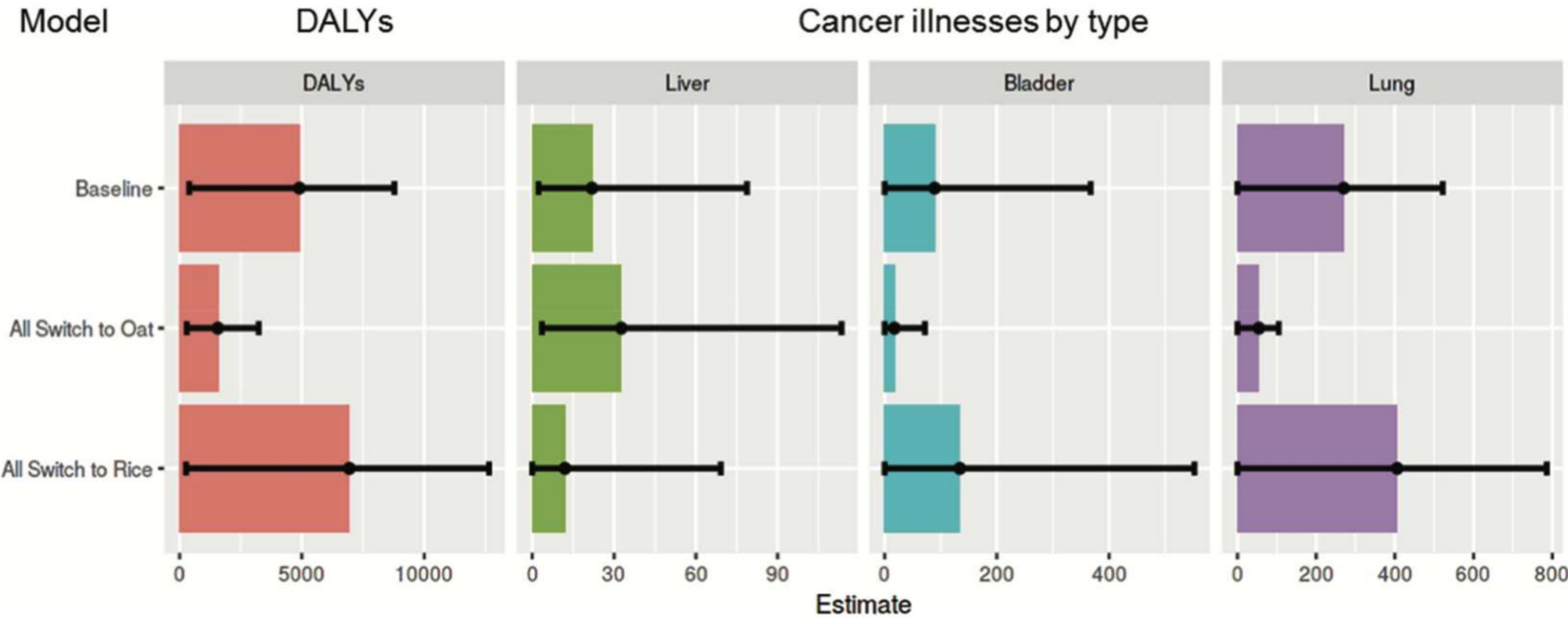
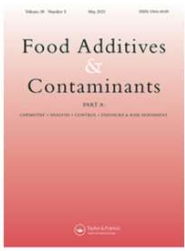


Table 2. Median number of cancer illnesses per year and DALYs for the total U.S. population and 90% uncertainty CI.

Model		Number of cancer illnesses by type				DALYs
		Liver	Bladder	Lung	Total	
Baseline exposure		21 (2, 87)	92 (0, 376)	270 (0, 531)	397 (25, 762)	4,921 (414, 9,071)
100% switch to oat	Absolute	31 (3, 121)	18 (0, 74)	55 (0, 108)	111 (26, 222)	1,513 (312, 3,356)
	Relative to baseline	1.60	0.21	0.21	0.29	0.35
100% switch to white rice	Absolute	11 (0, 72)]	139 (0, 566)	405 (0, 799)	575 (18; 1,126)	6,942 (326; 12,931)]
	Relative to baseline	0.61	1.50	1.50	1.40	1.40

CASE STUDY WITH INFANT CEREAL



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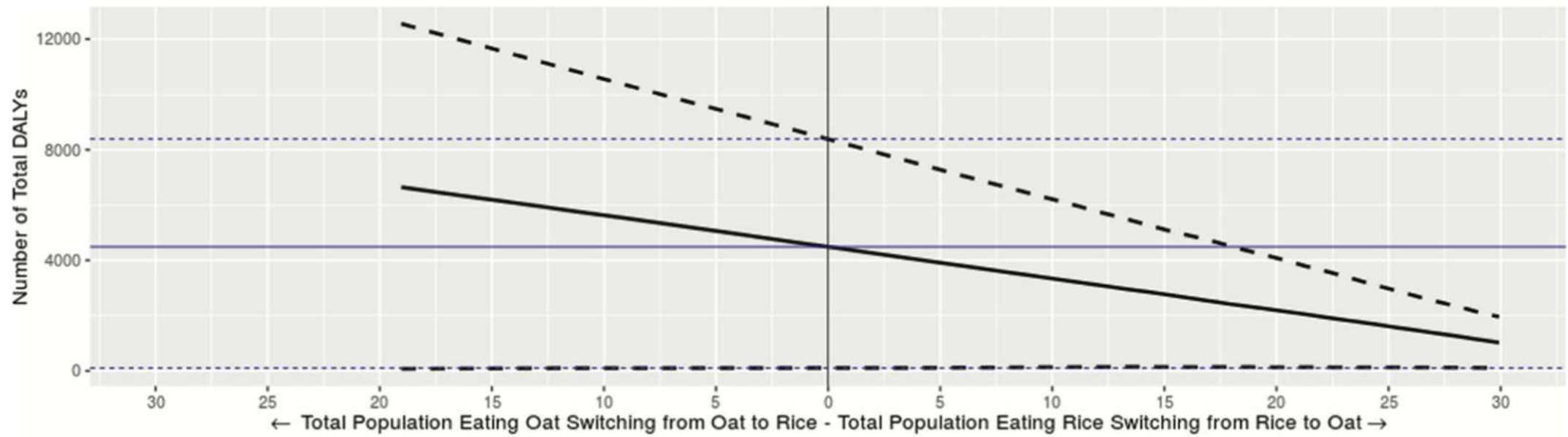


Figure 5. Predicted total cancer illnesses as percent shift in consumption from oat to white rice (left) and from white rice to oat (right). Straight blue line represents the median estimated baseline value (including the lower and upper 90% confidence interval of the baseline in the blue dotted lines) and the straight black line represents the median predicted value as a result of the shift (including the lower and upper 90% confidence interval of the prediction in the black dotted lines).

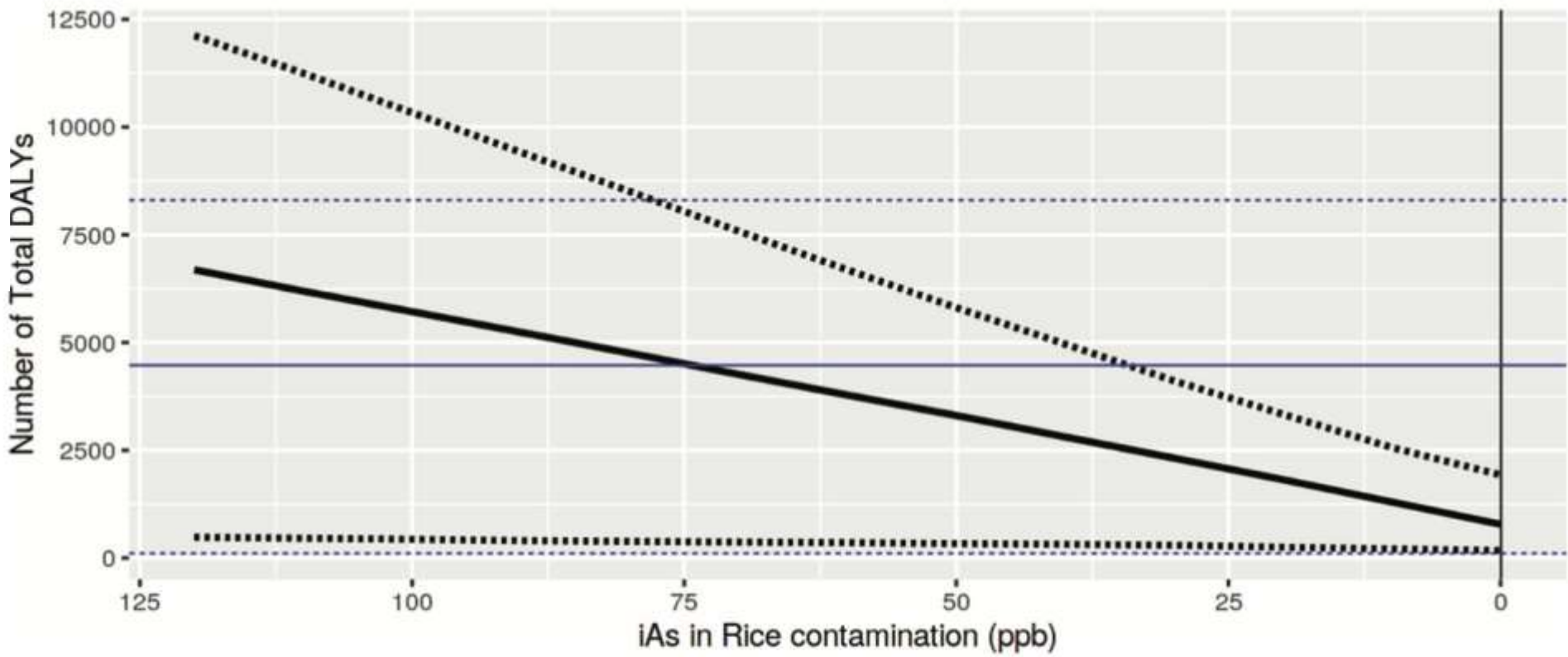
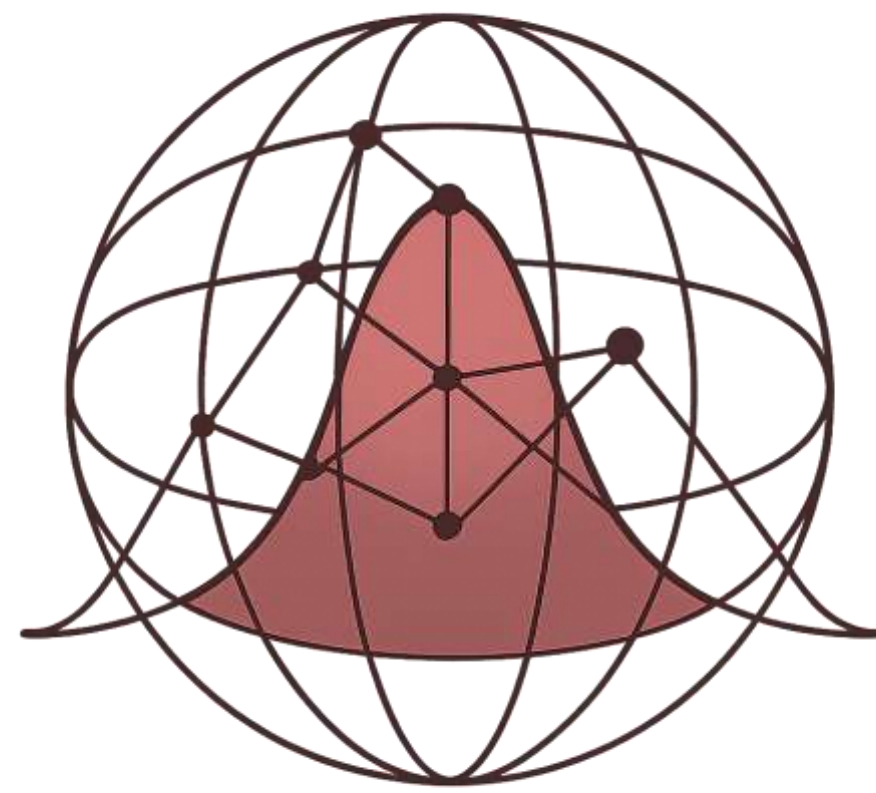


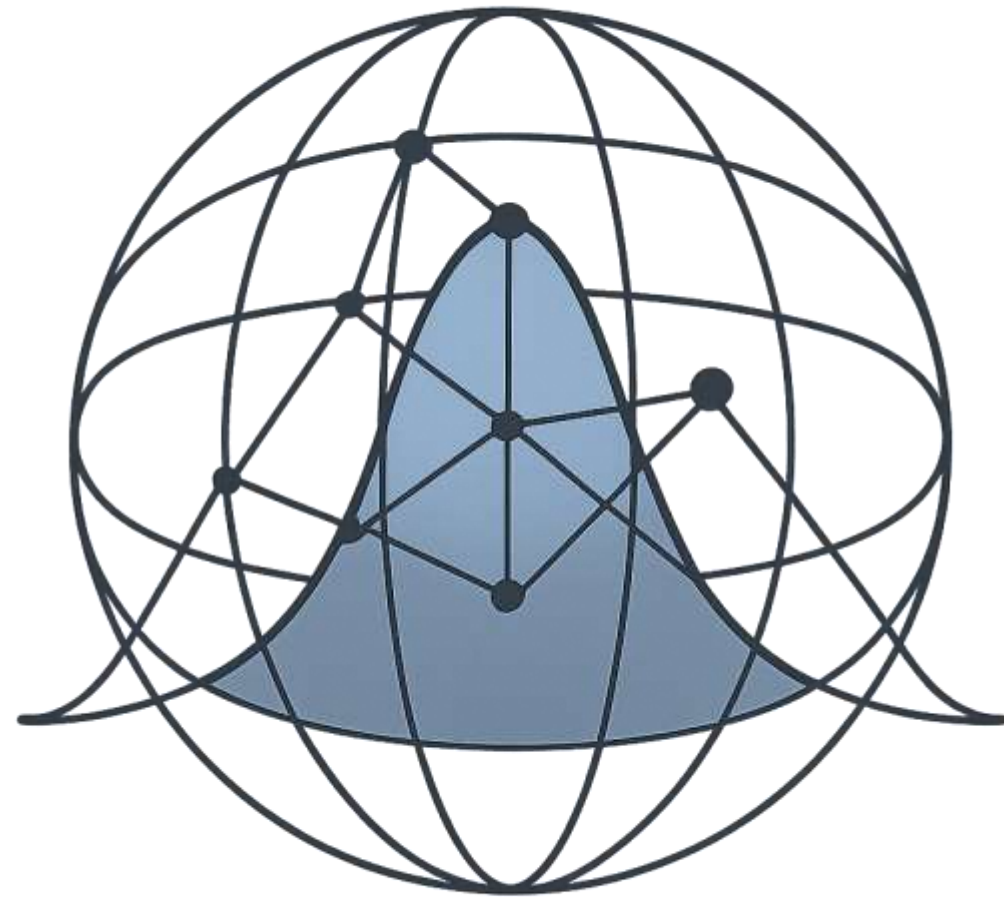
Figure 6. Predicted number of total DALYs as a function of iAs concentration in infant white rice cereal. Where the straight blue line is the median baseline value (including the lower and upper 90% confidence interval of the baseline in the blue dotted lines) and the straight black line is the median predicted value as a result of the change in concentration (including the lower and upper 90% confidence interval of the prediction in the black dotted lines).



INSTITUTIONAL MOMENTUM

THE FUTURE OF PRA

INTERNATIONAL ORGANIZATIONS



Integrating variability/Uncertainty into global scientific advice.

Building interoperability and coherence.



**JECFA AND JMPR
ADOPTING
PROBABILISTIC
EXPOSURE MODELS**



**SHARED DATA STRUCTURES FOR
DISTRIBUTION-BASED MODELLING**



**CAPACITY-BUILDING FOR
COUNTRIES TO GENERATE
NATIONAL VARIABILITY DATA**

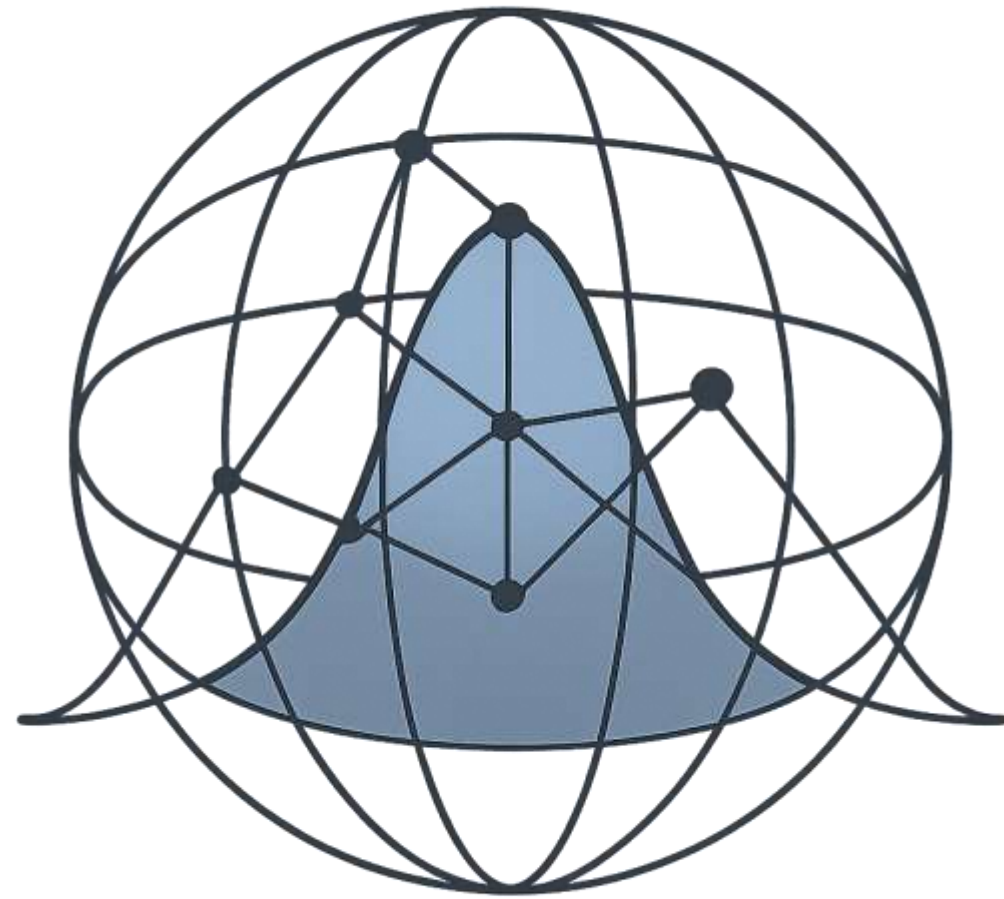


**SUPPORT FOR NATIONAL
MODELLING CAPACITY**

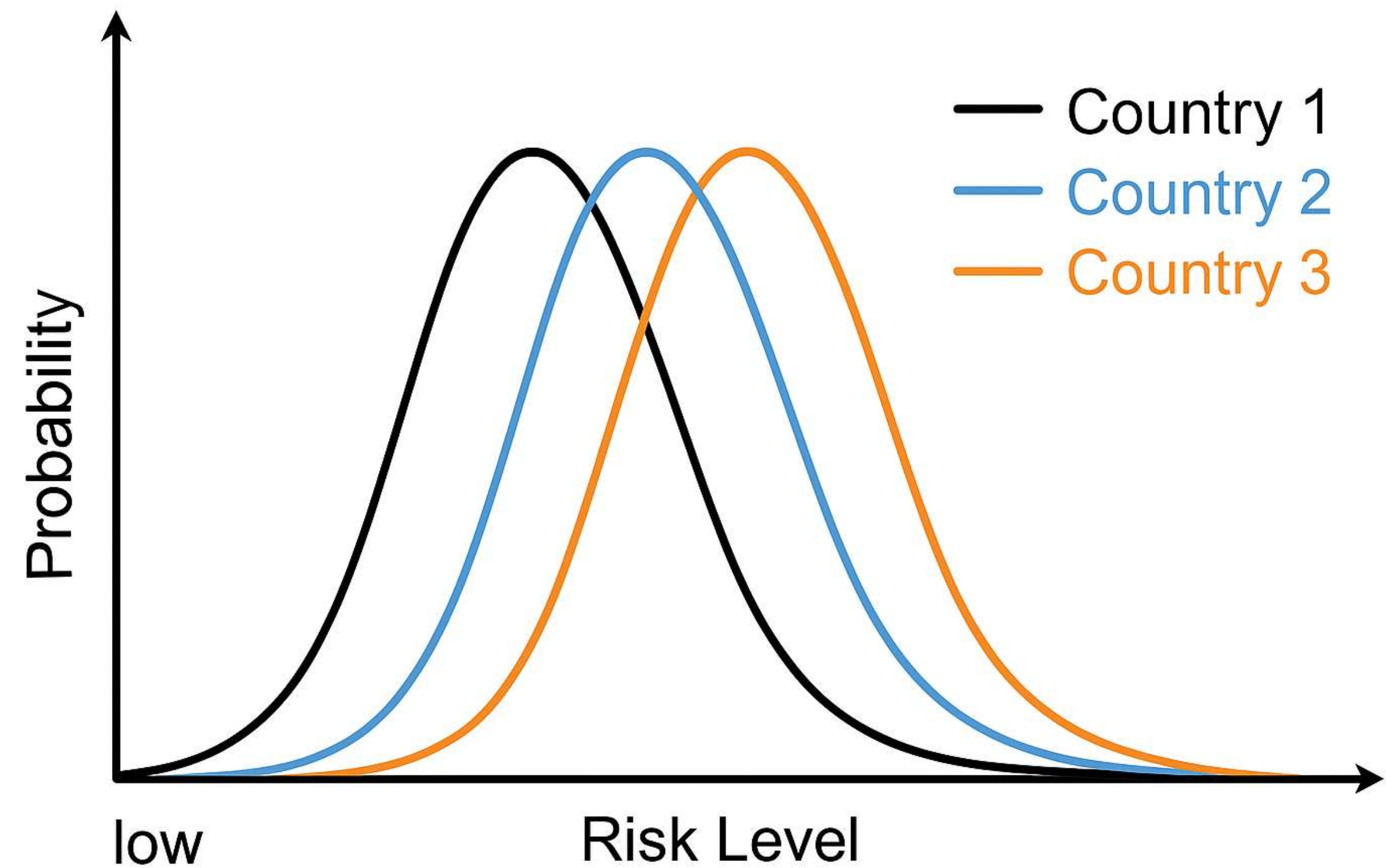


THE FUTURE OF PRA

GLOBAL ALIGNMENT, LOCAL RELEVANCE

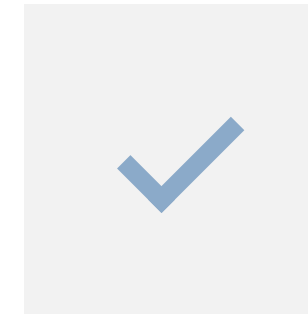
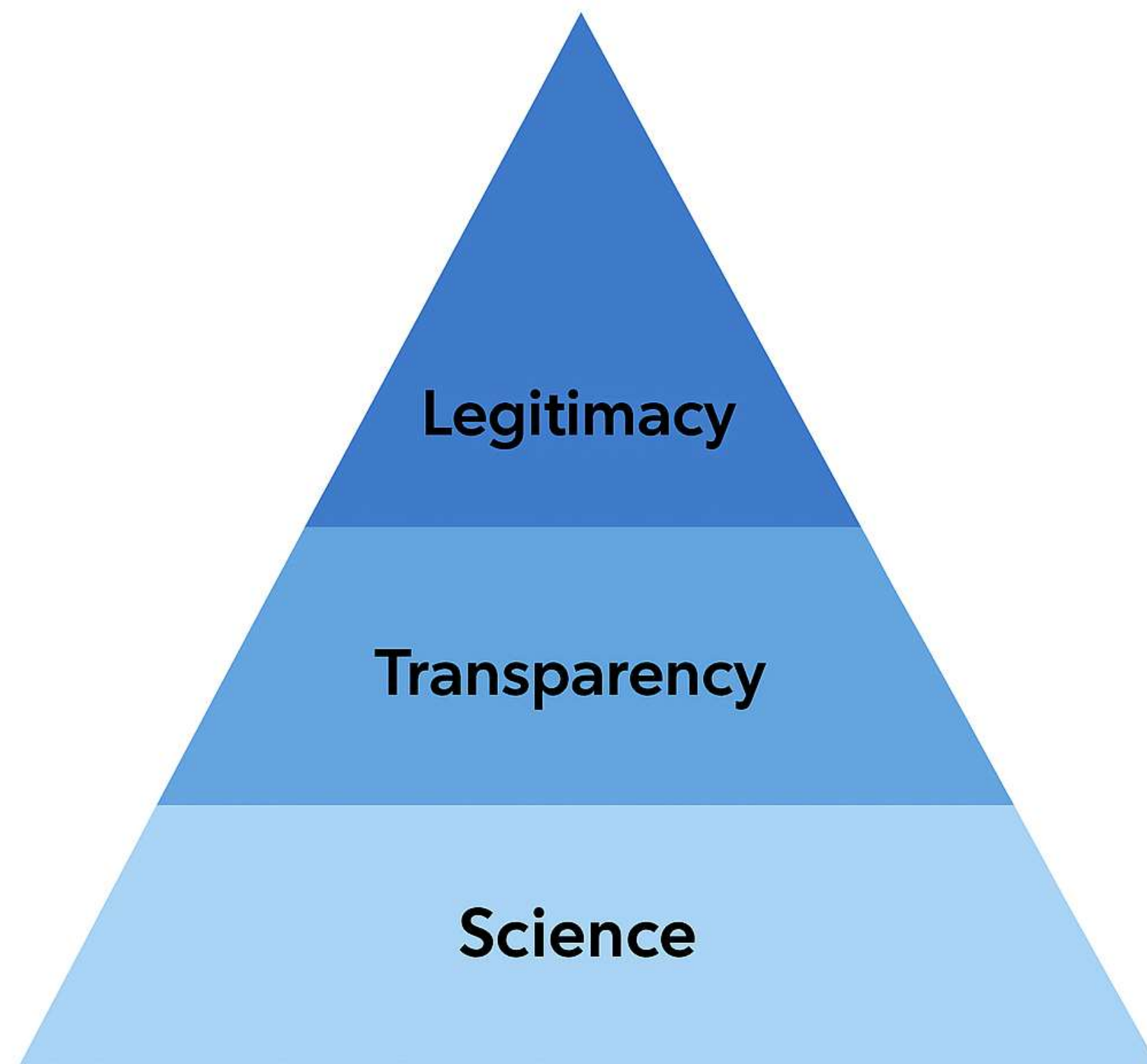


*Different data,
same science and
shared trust.*

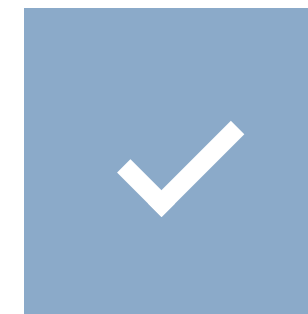


THE FUTURE OF PRA

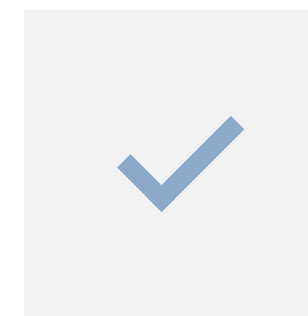
POLICY RELEVANCE AND RISK GOVERNANCE



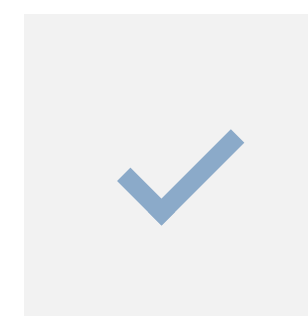
**SCIENTIFIC
UNDERSTANDING OF
VARIABILITY**



**TRANSPARENT QUANTIFICATION OF
UNCERTAINTY**



**EVIDENCE-INFORMED,
PROPORTIONATE DECISIONS**

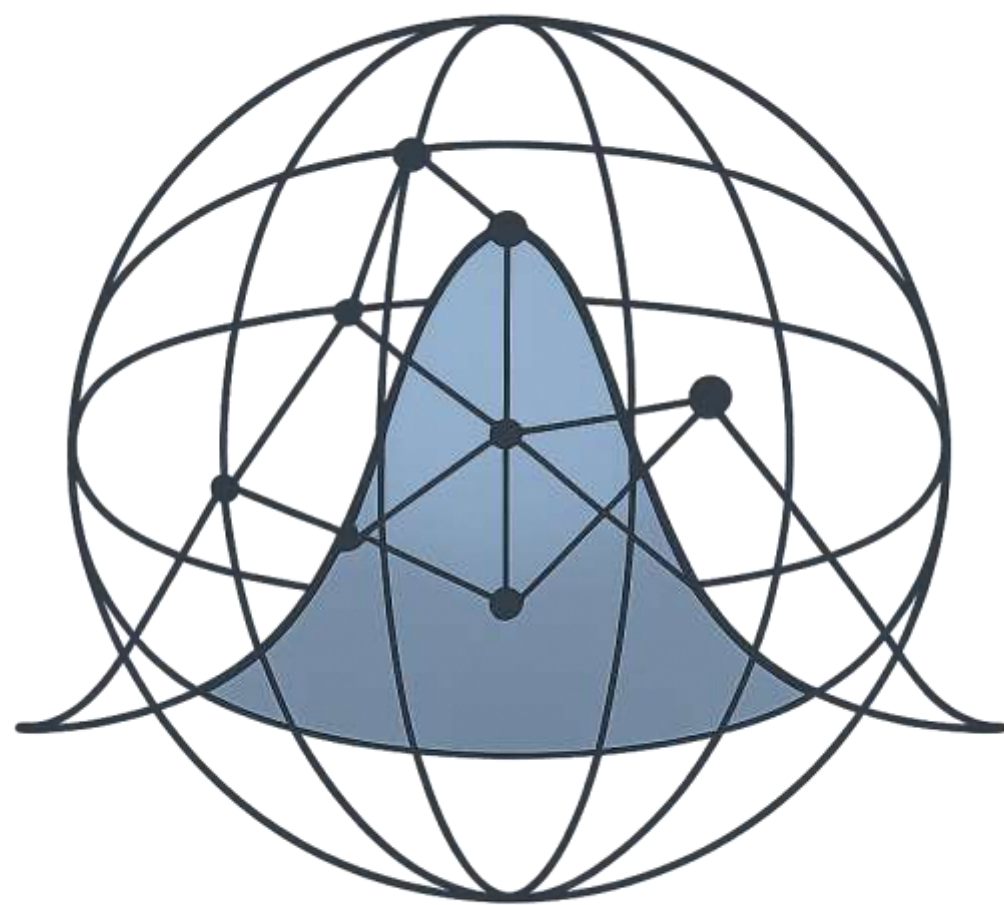


PUBLIC LEGITIMACY



THE FUTURE OF PRA

THE PROMISE OF PROBABILISTIC THINKING



Traditional Approach	Probabilistic Approach
One number fits all	Population spectrum
Manage to threshold	Manage to distribution
Hide uncertainty	Communicate uncertainty
Compliance	Confidence

“By embracing variability, we reveal equity. By embracing probability, we build trust.”

THANKS