

# Assessing Uncertainty and Variability in the Context of Exposure Assessment



**RISK ASSESSMENT TRAINING AND EXPERIENCE**  
**Exposure Assessment Course Series – EXA 407**

# What You Can Expect to Learn From This Course

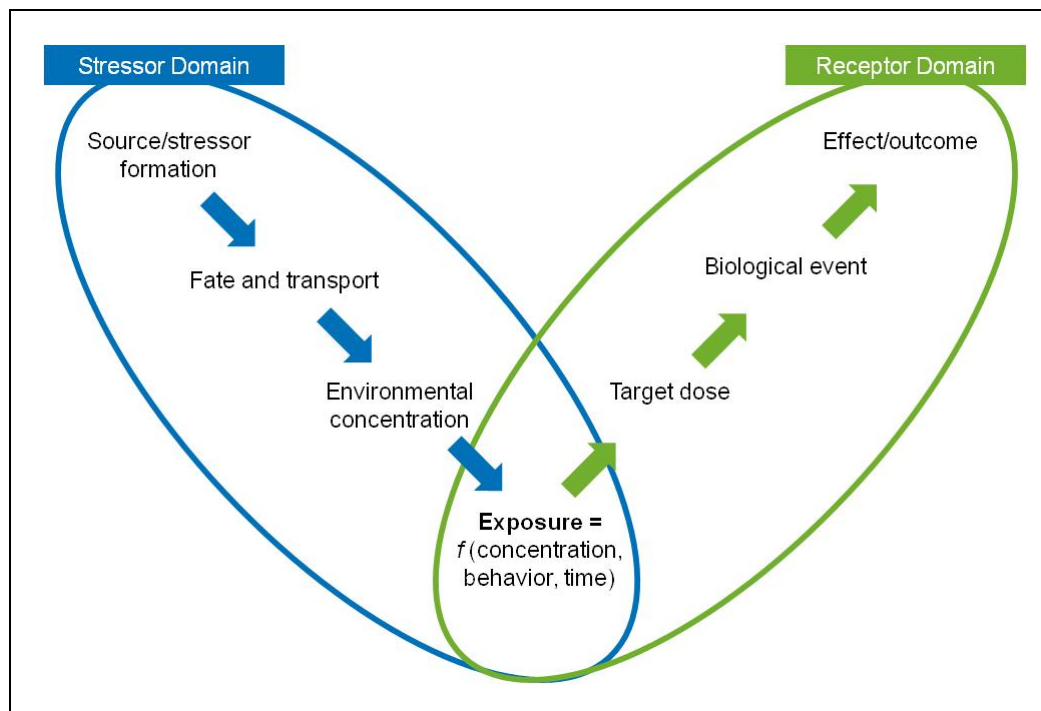
- Definitions of variability and uncertainty
- Factors that contribute to uncertainty and variability
- Types of variability and uncertainty



# VARIABILITY AND UNCERTAINTY IN EXPOSURE ASSESSMENT

# From Source to Receptor to Effect

- Variability and uncertainty are important to all components of the source-to-effect continuum
- Focus is on exposure in this course, but just as important to fate and transport



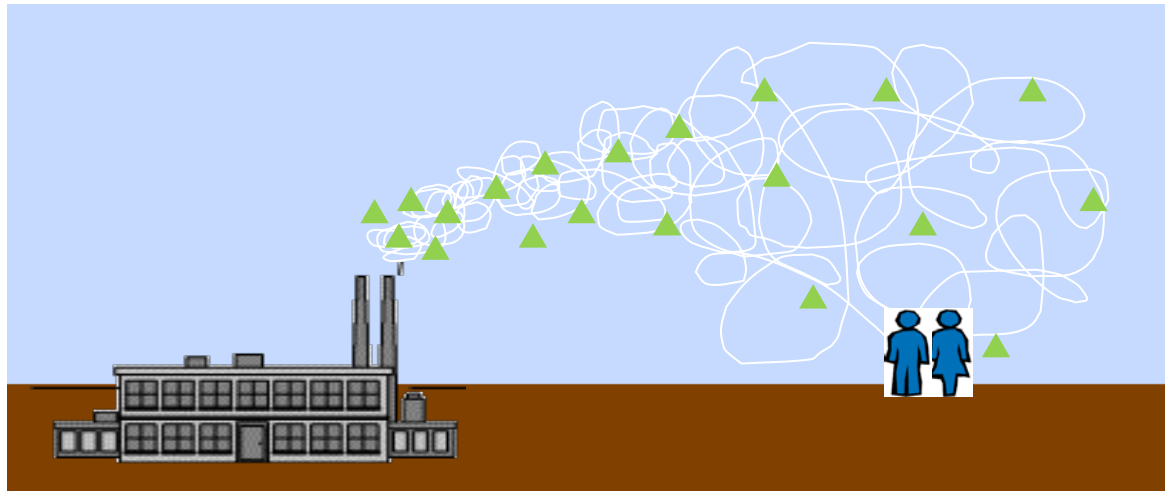
# What is Variability?

- **Variability** refers to true heterogeneity or diversity
  - Inherent property of a population
  - Cannot be reduced or eliminated
  - Can be better characterized with more data

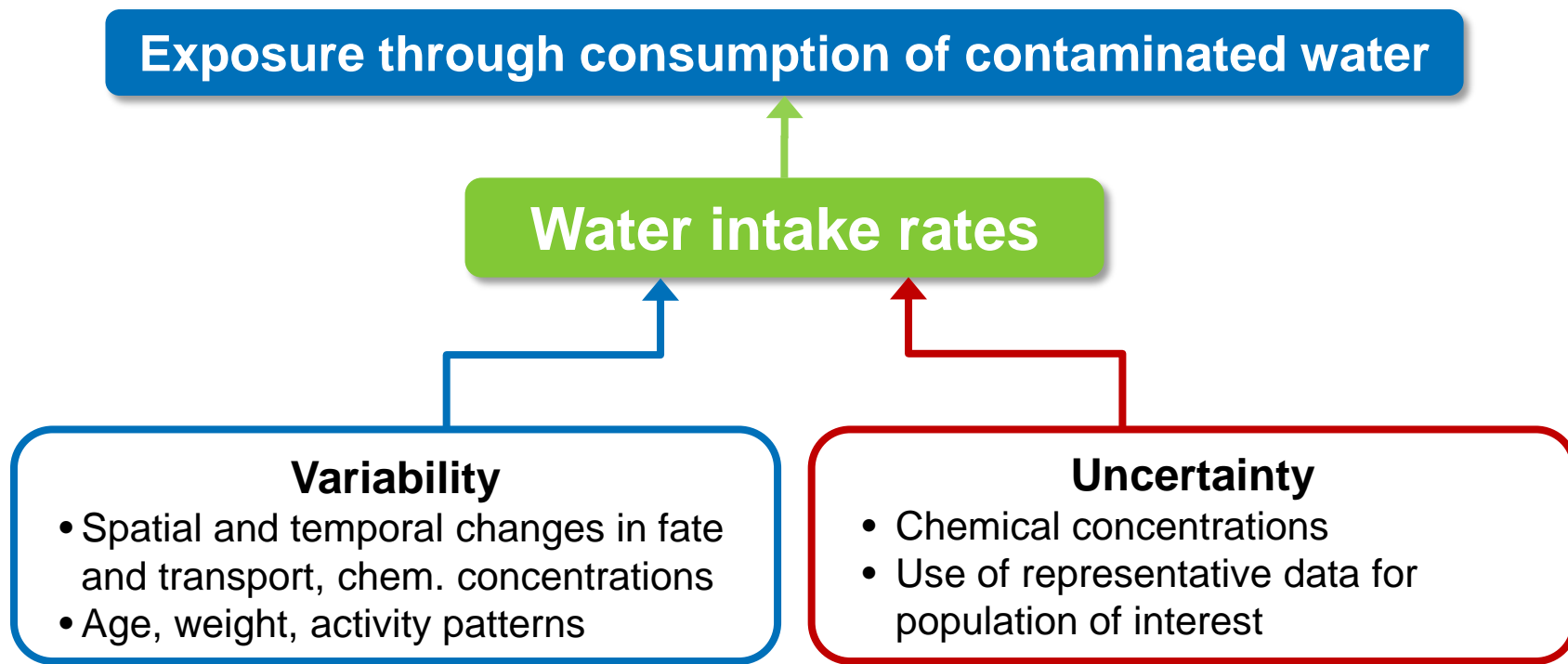


# What is Uncertainty?

- **Uncertainty** refers to a lack of knowledge due to incomplete data or an incomplete understanding of the process
  - Can be reduced or eliminated by collecting more or better data



# What is the Difference Between Variability and Uncertainty?

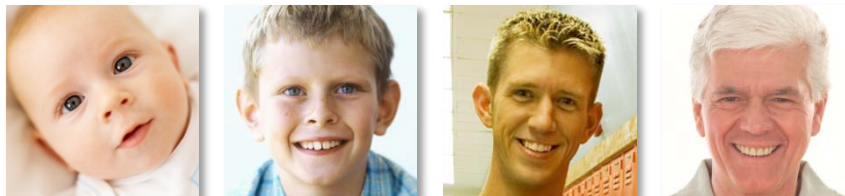


- Variability cannot be reduced, only better characterized
- Uncertainty can be reduced and in some cases even eliminated

# UNDERSTANDING VARIABILITY



# Factors Contributing to Exposure Variability



Age



Gender



Behavioral patterns



Location



Socioeconomic factors

# Types of Variability

- Spatial variability
- Temporal variability
- Inter-individual variability
- Intra-individual variability



# Spatial Variability

**Spatial variability** refers to variability across locations

## Regional Macroscale



## Local Microscale



# Temporal Variability

**Temporal variability** refers to variation over time



## Long-term variability:

- Seasonal fluctuations in weather
- Amount of time a person spends outdoors

## Short-term variability:

- An individual's activities at different times of day
- Industrial operations during weekdays versus weekends



# Inter-individual Variability

**Inter-individual variability** refers to variability between individuals

- **Characteristics:**

- Gender
- Age and lifestage
- Body weight
- Genetic predisposition

- **Behaviors:**

- Activity patterns
- Ingestion and inhalation rates
- May be related to spatial and temporal factors



# Intra-individual Variability

**Intra-individual variability** refers to variability within an individual

Function of fluctuations in an individual's physiologic or behavioral characteristics



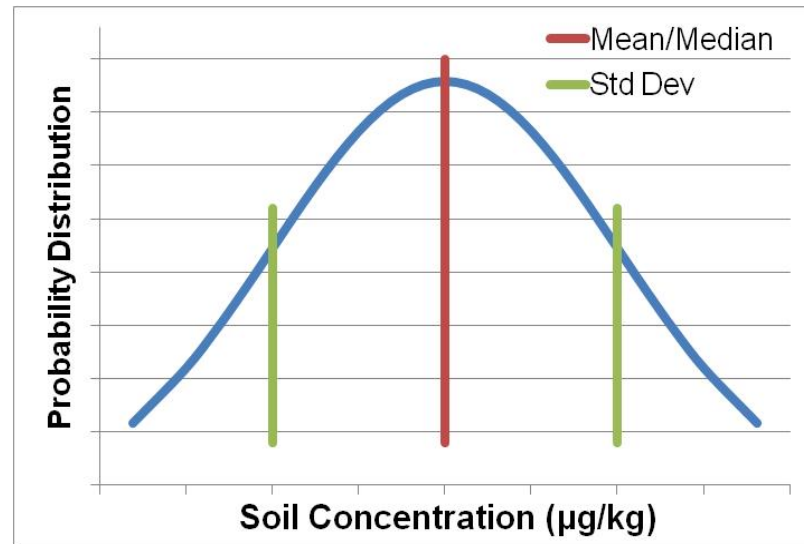
# ADDRESSING VARIABILITY IN AN EXPOSURE ASSESSMENT

# Presenting Variability

- Tables with percentiles or ranges of values
- Probability distributions with specified parameters
- Qualitative discussion

**Recommended Values for Intake of Grains,  
Edible Portion, Uncooked, Per Capita**  
(Source: EPA Exposure Factors Handbook, 2011)

Age Group	Mean (g/kg-d)	95th Percentile (g/kg-day)
Birth to 1	3.1	9.5
1 to <2	6.4	12.4
2 to <3	6.4	12.4
3 to <6	6.2	11.1
6 to <11	4.4	8.2
11 to <16	2.4	5
16 to <21	2.4	5
21 to <50	2.2	4.6
≥50	1.7	3.5

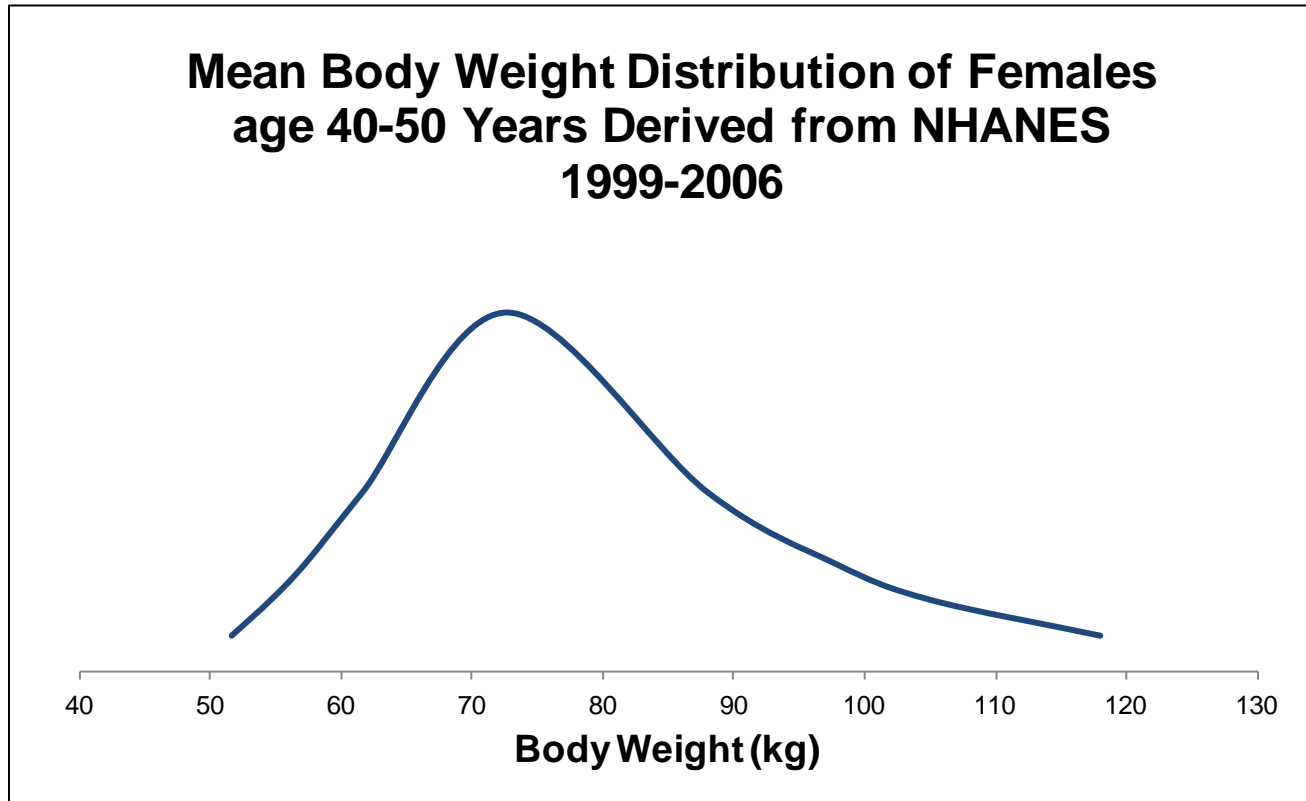


- Other ways to address variability:
  - Ignore
  - Disaggregate
  - Use an average, min, or max value
  - Probabilistic or bootstrap techniques



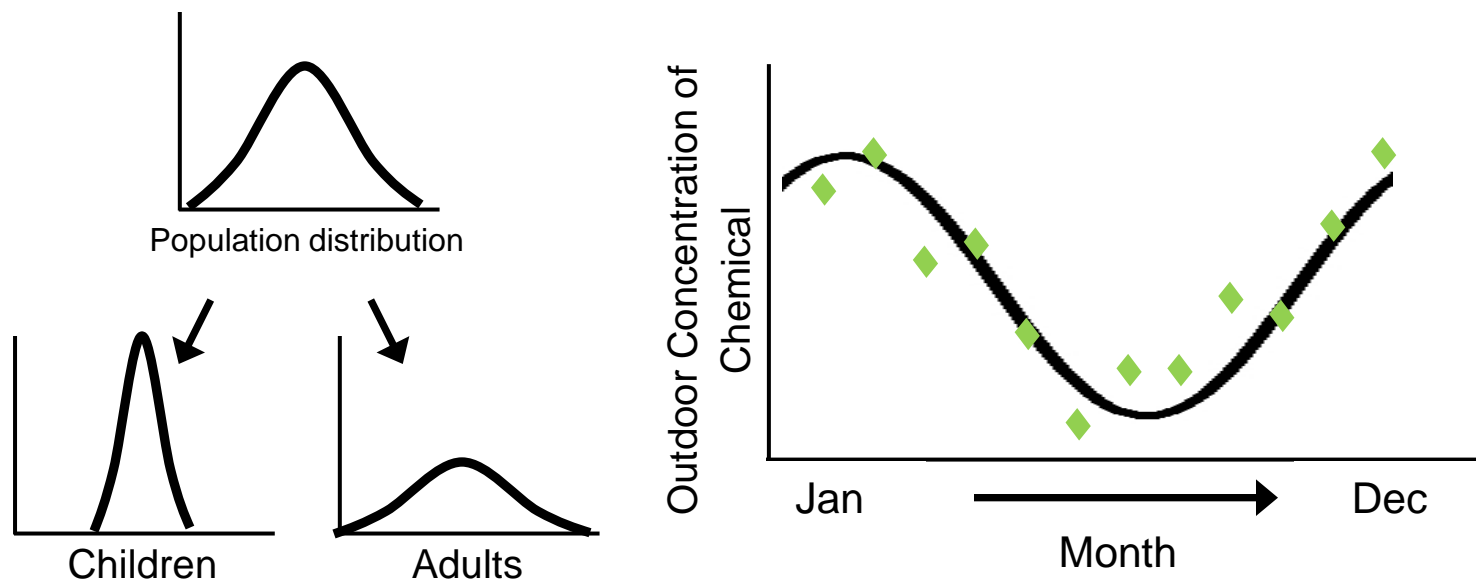
# Ignoring Variability

- Used in combination with other strategies
- Should only be used when variability is small or there is a reasonable expectation that impact would be small



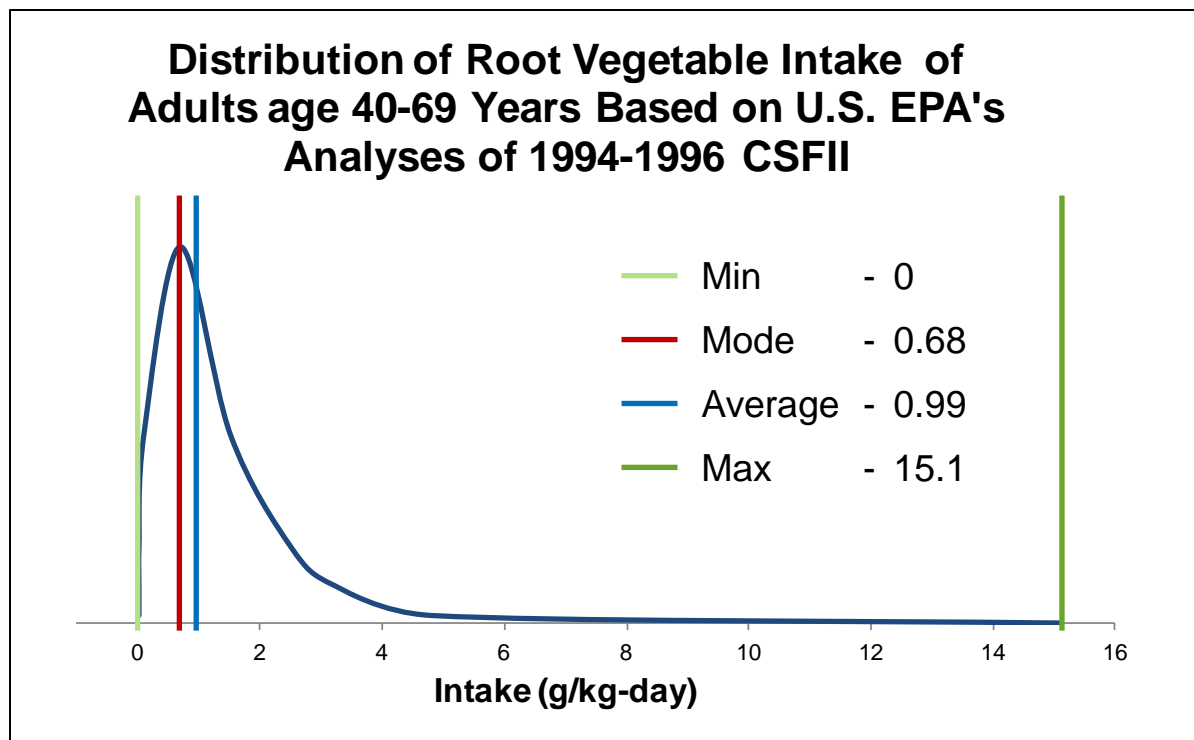
# Disaggregating Variability

- Can be a tool to better understand or reduce variability
- Consideration of population cohorts and lifestages, time scales, subregions, and/or microenvironments
- Application of mathematical models



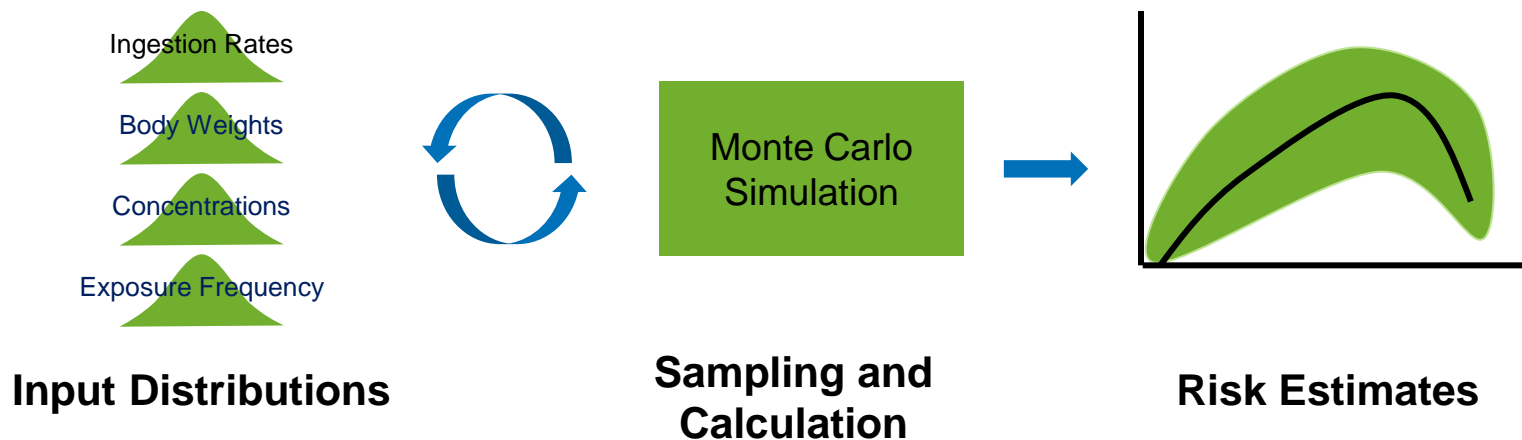
# Average or Minimum/Maximum

- Requires confidence in value and small variability
- Minimum and maximum values to characterize range
  - Most common method
  - Might results in over- or underestimation of exposure

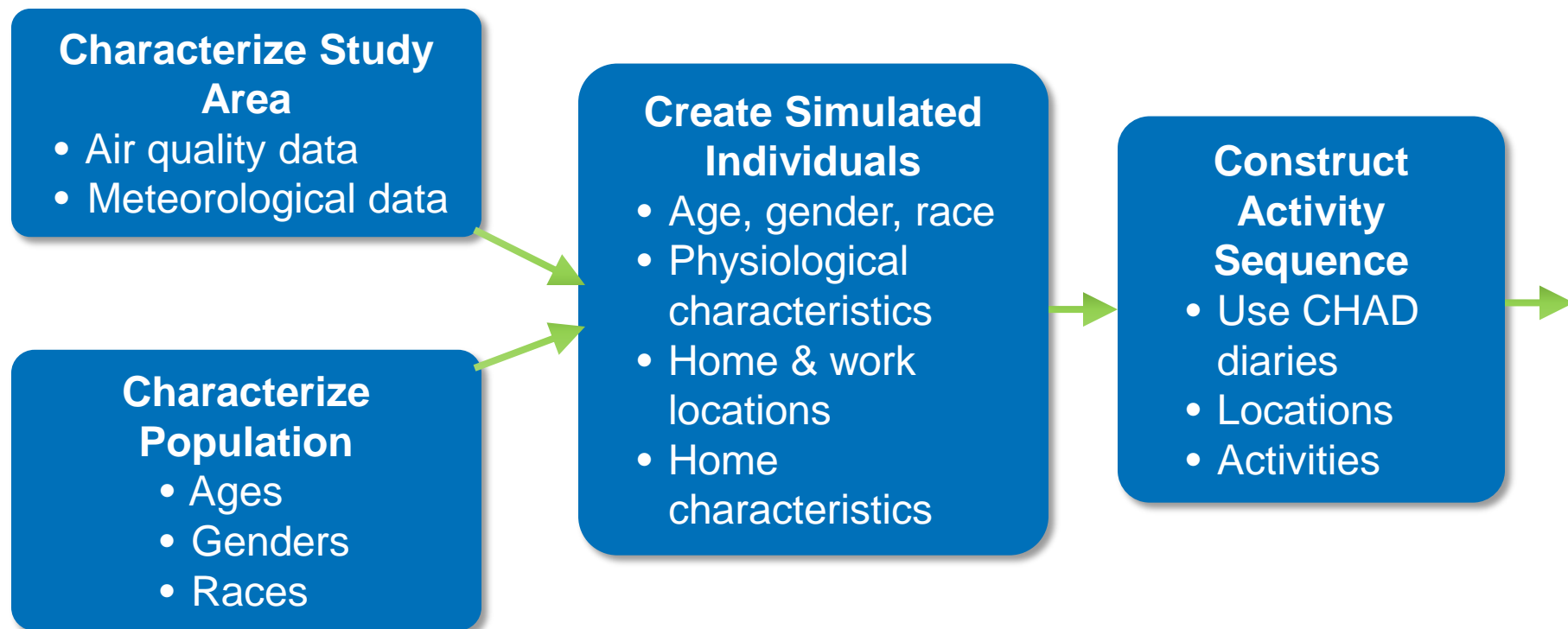


# Probabilistic or Bootstrapping Techniques

- Characterize variability by repeated sampling of probability distributions of equation variables
- Result: Distribution of outcomes with associated probability
- Bootstrap techniques estimate confidence intervals for parameters by simulated re-sampling of empirical distributions



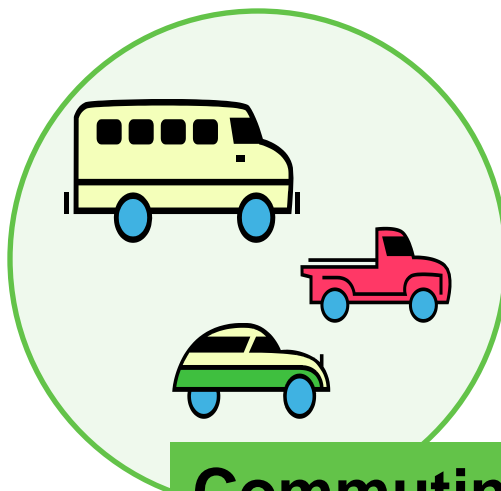
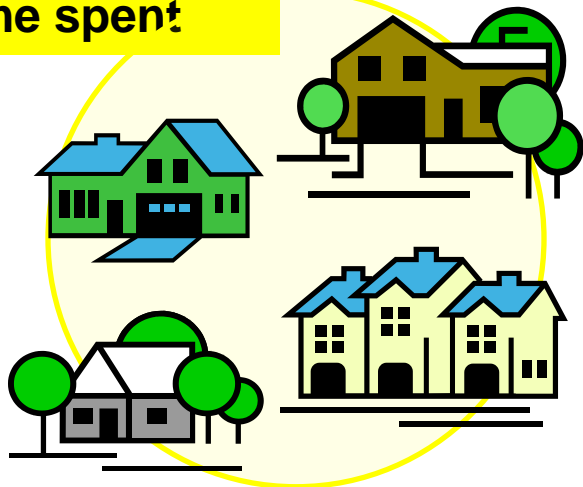
# Exposure Modeling with APEX



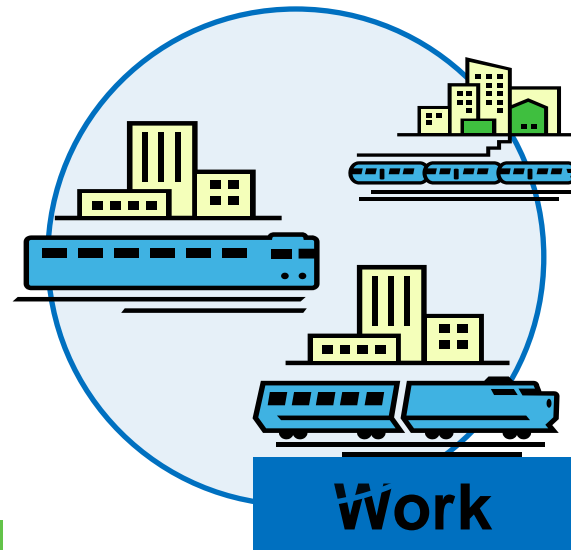
# APEX Activity Modeling

## Home

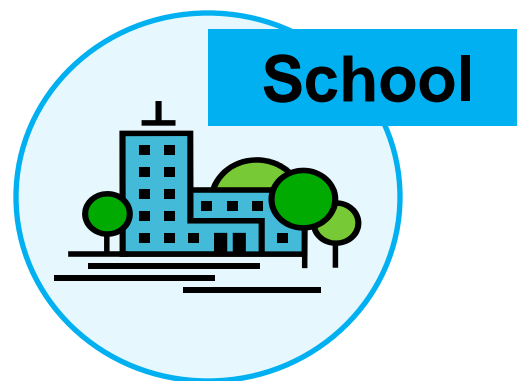
Air conditioning  
Proximity to road  
Air exchange rate  
Activity level  
Time spent



## Commuting



## Work



## School

# Concentrations and Exposure in APEX

**For  
simulated  
individuals**

## **Calculate Microenvironment Concentrations**

- Hourly air quality data
- Mass balance for MEs

## **Calculate Hourly Exposure for Each Individual**

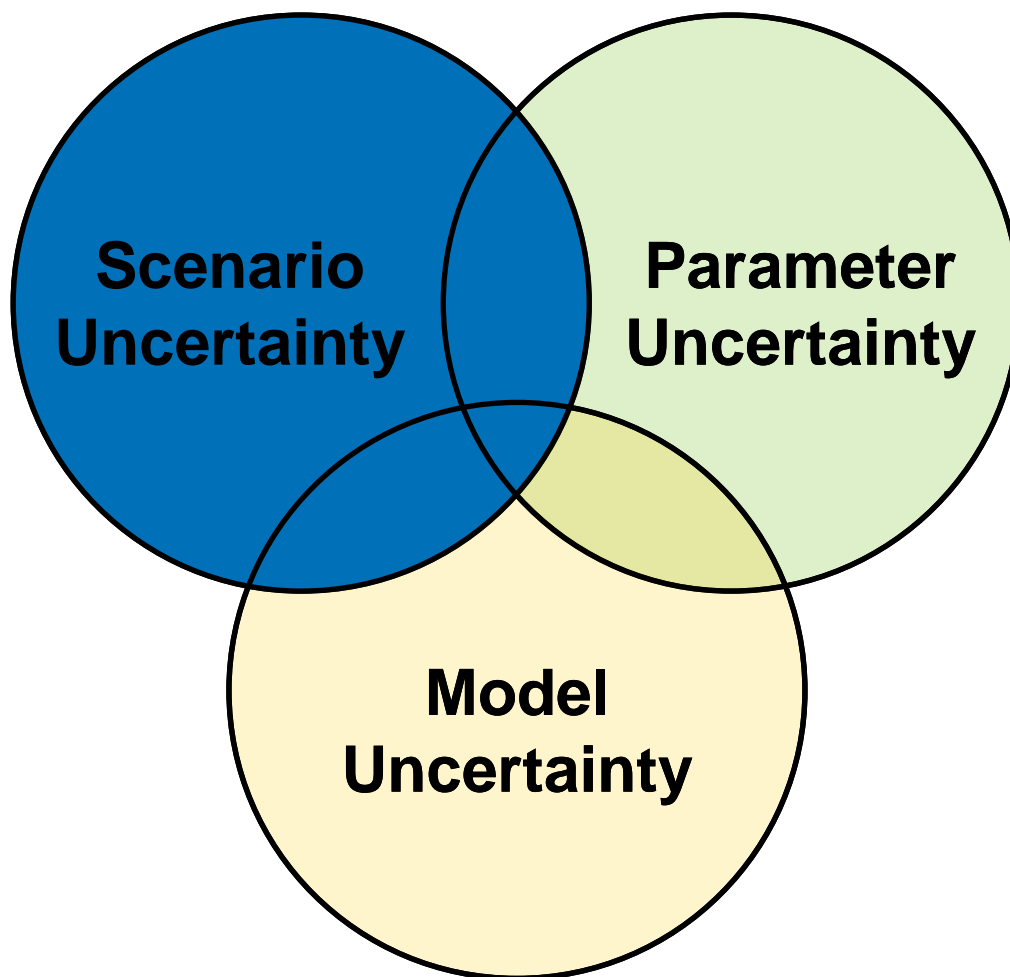
- Time spent in MEs
- ME concentration

## **Calculate Population Exposure**

# UNDERSTANDING UNCERTAINTY



# Types of Uncertainty



# Scenario Uncertainty

- **Scenario uncertainty:** uncertainty regarding missing or incomplete information on the scenario
  - Can be attributed to incomplete descriptions of key information
- Sources of scenario uncertainty:
  - Descriptive errors
  - Aggregation errors
  - Errors in professional judgment
  - Incomplete analysis

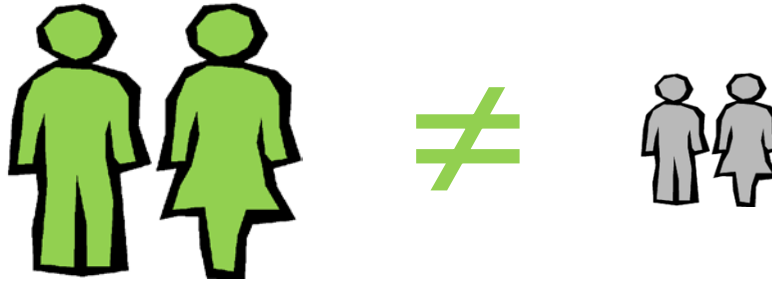


- Errors in basic information about exposure pathways, scenarios, and populations of concern
- For example:
  - Misidentifying chemical producers, uses, or properties of a chemical
  - Neglecting to include population cohort



- Result from too much “lumping” of information

**Assumption that  
population is  
homogeneous**



**Spatial and  
temporal  
approximations**



# Errors in Professional Judgment

- Affect how the exposure scenario is defined
  - Population of concern
  - Exposure routes and pathways
  - Chemical of concern
- Related to selection of appropriate models

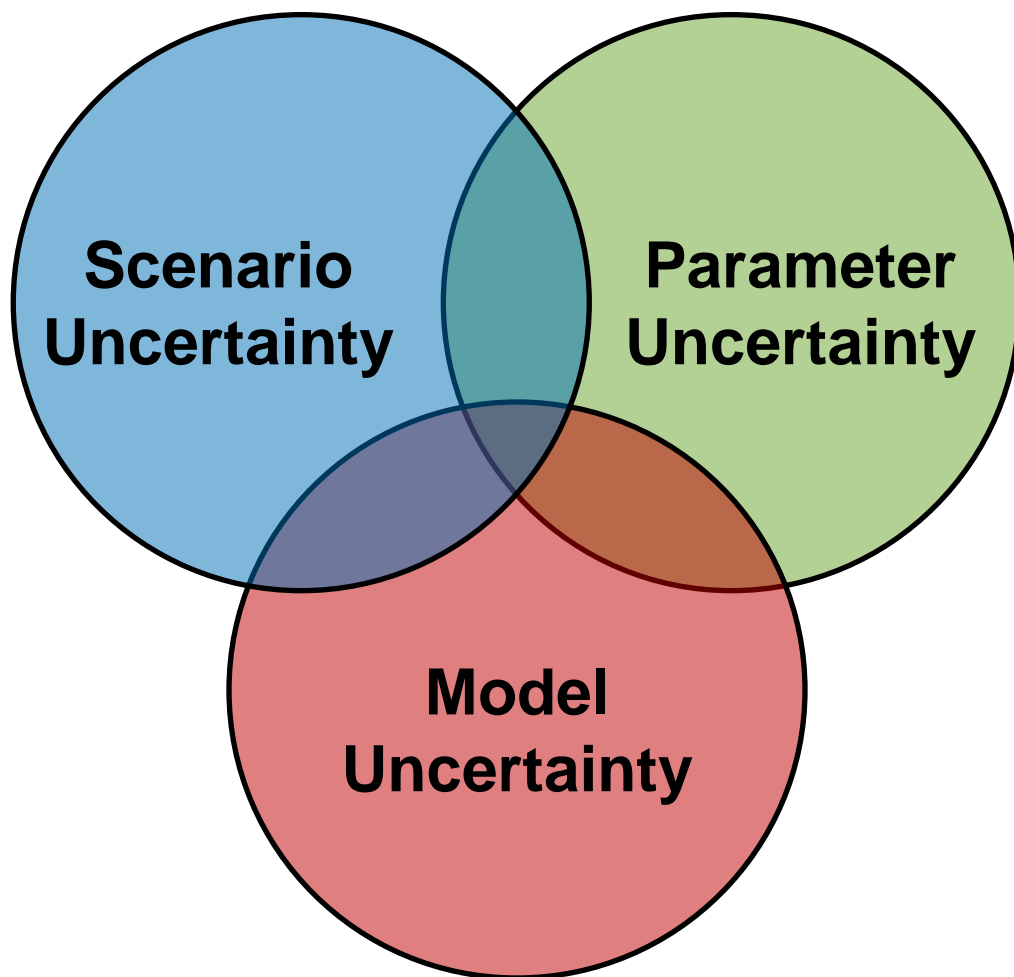


# Incomplete Analysis

- Result from overlooking exposure scenarios or populations due to lack of data
- Difficult to quantify
- Recommended approach:
  - Include rationale for excluding potential exposure scenarios
  - Explain whether decision was based on data, analogs, or professional judgment
- Example: Is dermal exposure relevant?

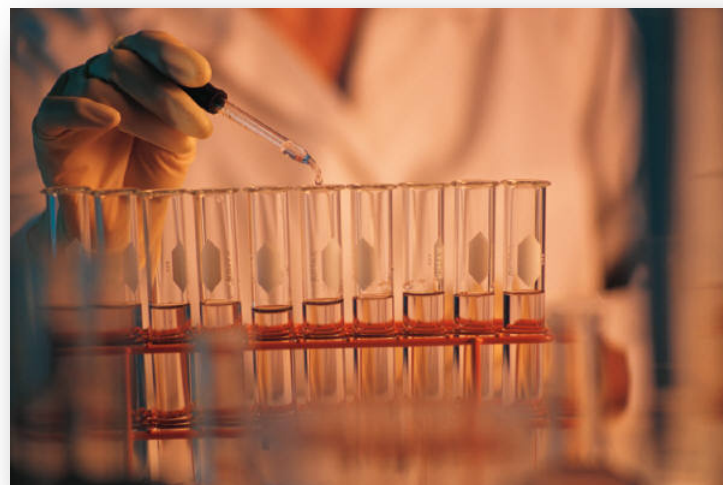


# Types of Uncertainty



# Parameter Uncertainty

- **Parameter uncertainty** refers to uncertainty regarding a specific exposure parameter
- Numerical values for exposure parameters typically derived from EPA's *Exposure Factors Handbook* and other sources
- Sources include:
  - Measurement errors
  - Sampling errors
  - Variability
  - Data type



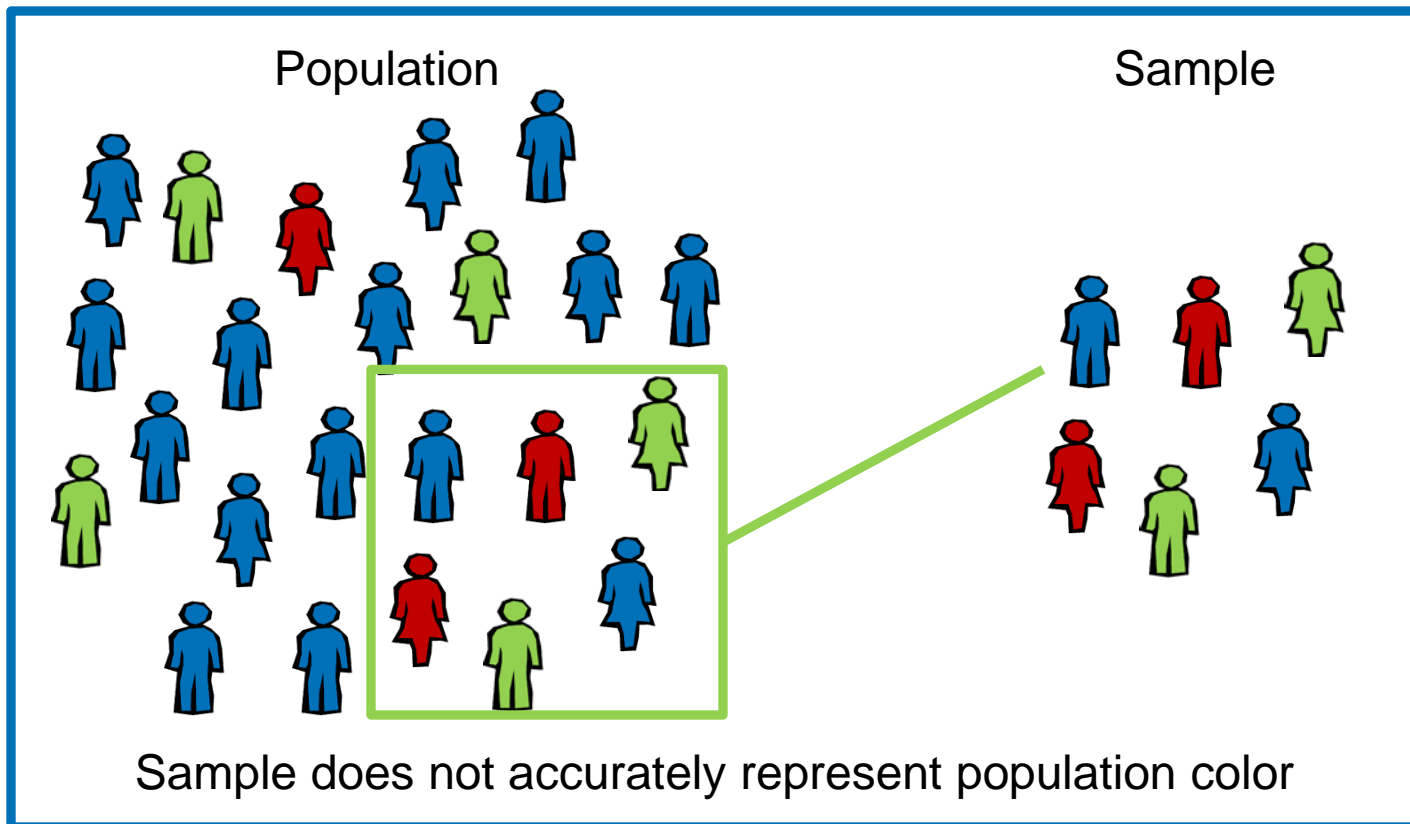


- Errors associated with anything measured
  - **Random error:** results from imprecision in the measurement process
  - **Systematic error:** bias or tendency away from true value



# Sampling Errors

- Sample representativeness is important
  - There are implications of extrapolating from small data sets



# Characterization of Variability

- Inability to characterize variability contributes to uncertainty

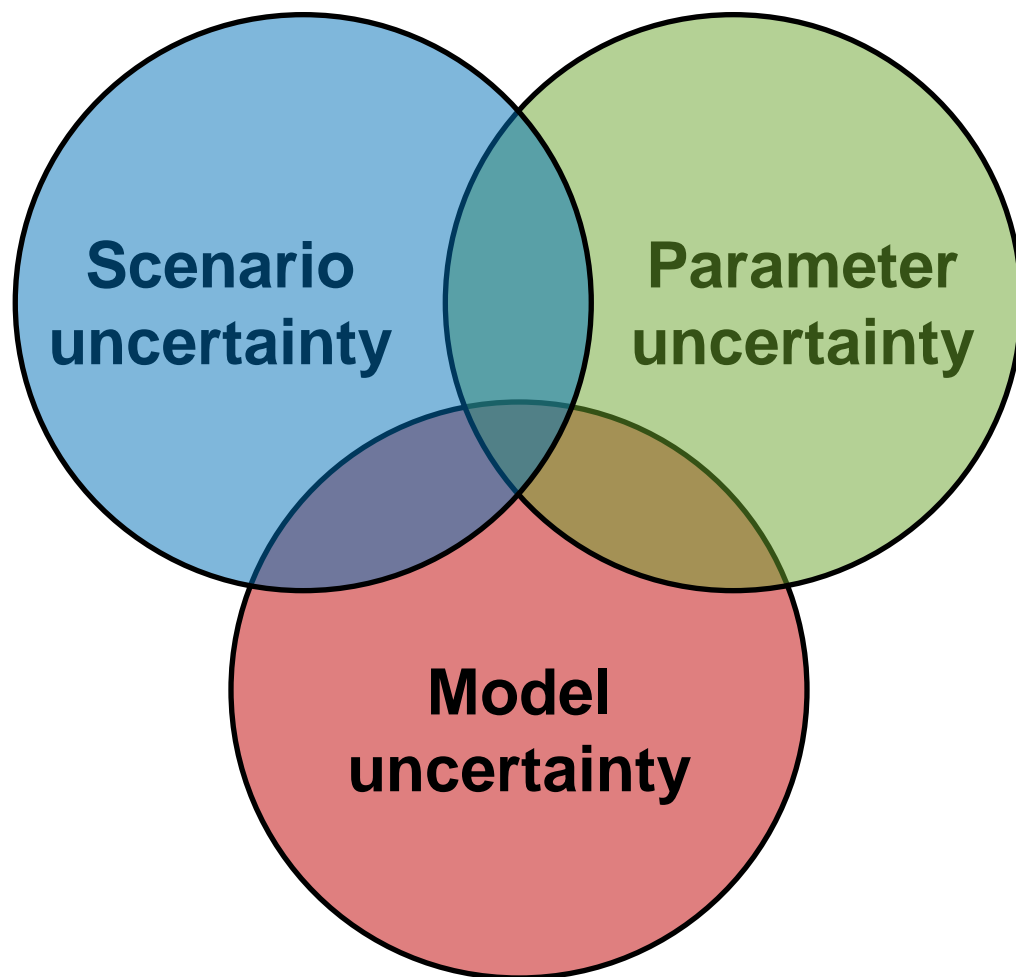


SOURCES OF PARAMETER UNCERTAINTY:  
**Data Type Uncertainty**

- Surrogate or generic data
- Expert judgment or elicitation
- Default data (especially for screening-level assessments)



# Types of Uncertainty



- **Model uncertainty** results from gaps in scientific knowledge required to make predictions
- Models represent exposure process and fate and transport processes
  - Quantitatively describe relationship between input parameters and responses to changes in inputs
- Sources of uncertainty include:
  - Relationship errors
  - Modeling errors
  - Selection of the incorrect model
  - Parameter uncertainty

# Relationship Errors, Modeling Errors, and Model Selection

- **Relationship errors** result from drawing incorrect conclusions from correlations
- **Modeling errors** result from failure to consider exposure parameters
- **Model selection** and implementation considerations:
  - Boundary conditions
  - Dependencies
  - Assumptions
  - Level of detail
  - Extrapolation
  - Implementation and technical aspects

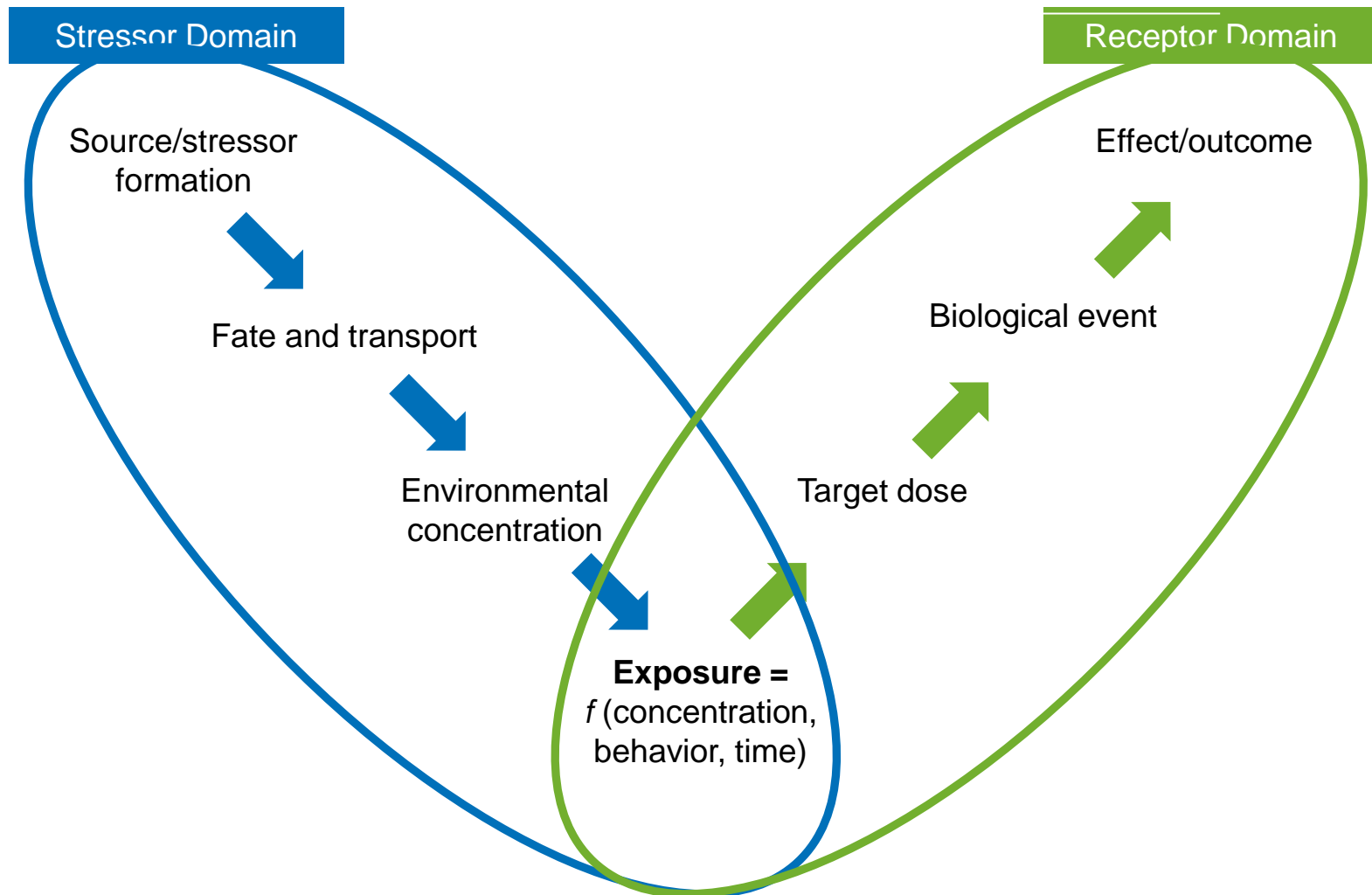




# CLASS ACTIVITY



# Source to Effect Continuum



# London Smog of 1952



# ADDRESSING UNCERTAINTY IN AN EXPOSURE ASSESSMENT

# Why Address Uncertainty in Exposure Assessments?

## Addressing uncertainty allows us to:

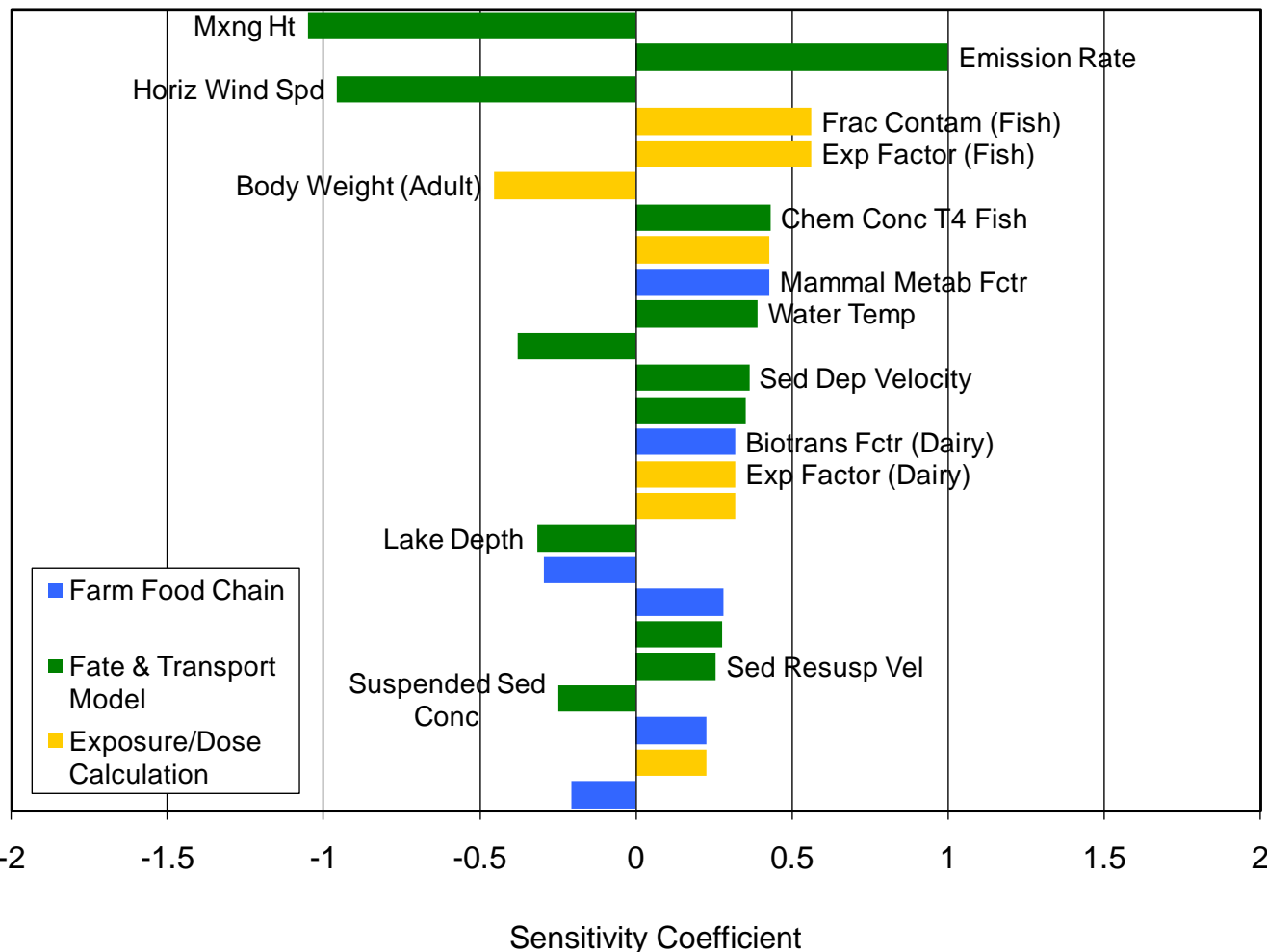
- **Demonstrate** our level of understanding and confidence in exposure estimate
- **Combine** uncertain information from different sources
- **Provide** context for evaluation
- **Improve** quality of best estimates
- **Inform** decisions about expending resources to acquire more data
- **Guide** refinement process
- **Increase** transparency

# Qualitative and Quantitative Uncertainty Analysis

	Qualitative	Quantitative
<b>What are Sources of Uncertainty?</b>	<ul style="list-style-type: none"> <li>• Scenario</li> <li>• Parameter</li> <li>• Model</li> </ul>	<ul style="list-style-type: none"> <li>• Parameter</li> <li>• Model</li> </ul>
<b>How is Uncertainty Approached?</b>	<p>Characterize:</p> <ul style="list-style-type: none"> <li>• Level of uncertainty in influential parameters</li> <li>• Data gaps</li> <li>• Impact of subjective decisions</li> </ul>	<ul style="list-style-type: none"> <li>• Probabilistic methods</li> <li>• Non-probabilistic methods</li> </ul>

# Sensitivity Analysis

**Elasticity of TCDD Lifetime Risk (-5% Perturbation of Variable)**

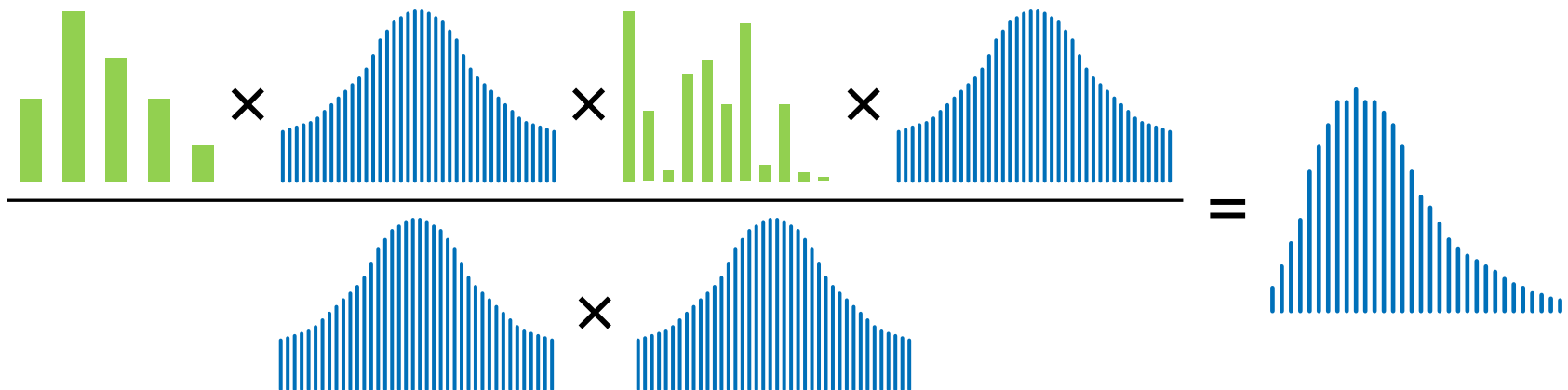


- Change one variable and leave others constant
- Useful to identify variables with greatest effect on outcome

# Probabilistic Approaches to Uncertainty Analysis

- Monte Carlo

- Probability density functions assigned to each parameter
- Values from distribution selected randomly and inserted into exposure equation
- Process repeated many times
- Result is a distribution of values that reflects the overall uncertainty in the inputs



# Monte Carlo Analysis

- Strength:
  - Applicable to many situations
- Complications:
  - Must have confidence in distributions
  - Must understand relationships between parameters (or assume independence)
  - One change → re-run simulation
  - Results do not tell assessor which variables are most important contributors to uncertainty
- Remember! Garbage in = Garbage out



# CONCLUSION

- **Variability:** true heterogeneity or diversity
  - Can be characterized, not reduced
- **Uncertainty:** lack of knowledge due to incomplete data
  - Can be reduced

**It is important to address both variability and uncertainty in exposure assessments.**

