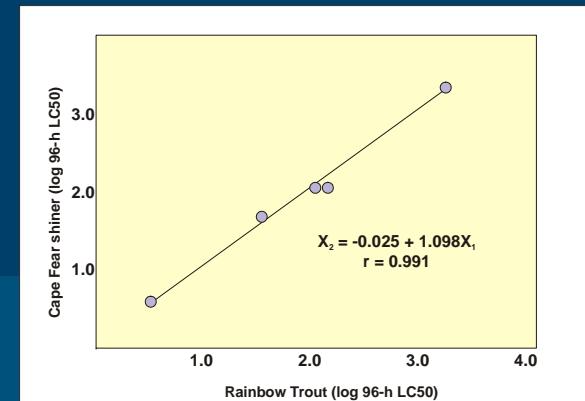


# Aquatic and Wildlife Species Sensitivity Modeling using Web-ICE

*Mace Barron*

*USEPA/ORD/NHEERL/GED*



# With the invaluable assistance of...

GED Coauthors: Sandy Raimondo, Deborah N. Vivian, Jill Awkerman

## USEPA/ORD/NHEERL/GED

Sonny Mayer (retired)  
Carl Litzinger  
Marion Marchetto  
Larry Goodman  
Anthony DiGirolamo  
Brandon Jarvis  
Christel Chancy  
Nathan Lemoine  
Nicole Allard  
Laura Dobbins  
Cheryl McGill  
Sarah Kell  
Michael Murrell  
Raymond Wilhour  
Susan Yee  
Crystal Jackson  
Sorci Soriano

## USEPA/ORD/NHEERL

Chris Russom (MED)  
Rick Bennett (MED)  
Glen Thursby (AED)  
Anne Fairbrother (WED)

## USEPA/ORD/NERL/ERD

Candida West  
Tim Rowen  
Luis Suárez

## Proctor & Gamble

Scott Dyer  
Don Versteeg  
Joel Chaney  
Scott Belanger

## USEPA/OPPTS

Thomas Steeger (OPP)  
Brian Montague (OPP)  
Don Rodier (OPPT)  
Vince Nabholz (OPPT)

## Environment Canada

Pierre Mineau  
Alain Baril  
Brian Collins

## USGS

Christopher Ingersoll  
Ning Wang

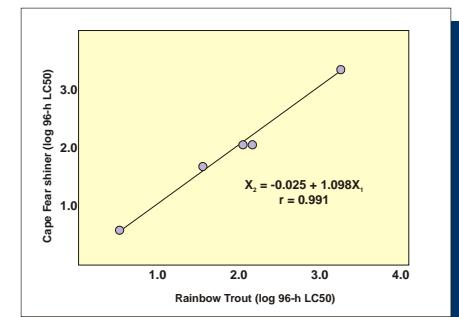
## Computer Sciences Corporation

Wally Schwab  
Derek Lane  
Mike Galvin  
David Owens

# What is Web-ICE?



- Web-ICE: Web-based Interspecies Correlation Estimation
- User friendly internet-based acute toxicity estimation tool
- ICE models estimate toxicity to a species, genus, family, or multiple species from a single known toxicity value
- Consists of modules to predict acute toxicity to aquatic and wildlife species using ICE models and generate species sensitivity distributions (SSDs)
- Validated and published models and methodologies:  
ES&T (2006,2007, 2008), ETC (2007, 2008)



# Presentation Outline

## Model Development

- Background on ICE models
- Database expansion & QC
- Model validation & uncertainty analysis
- User guidelines

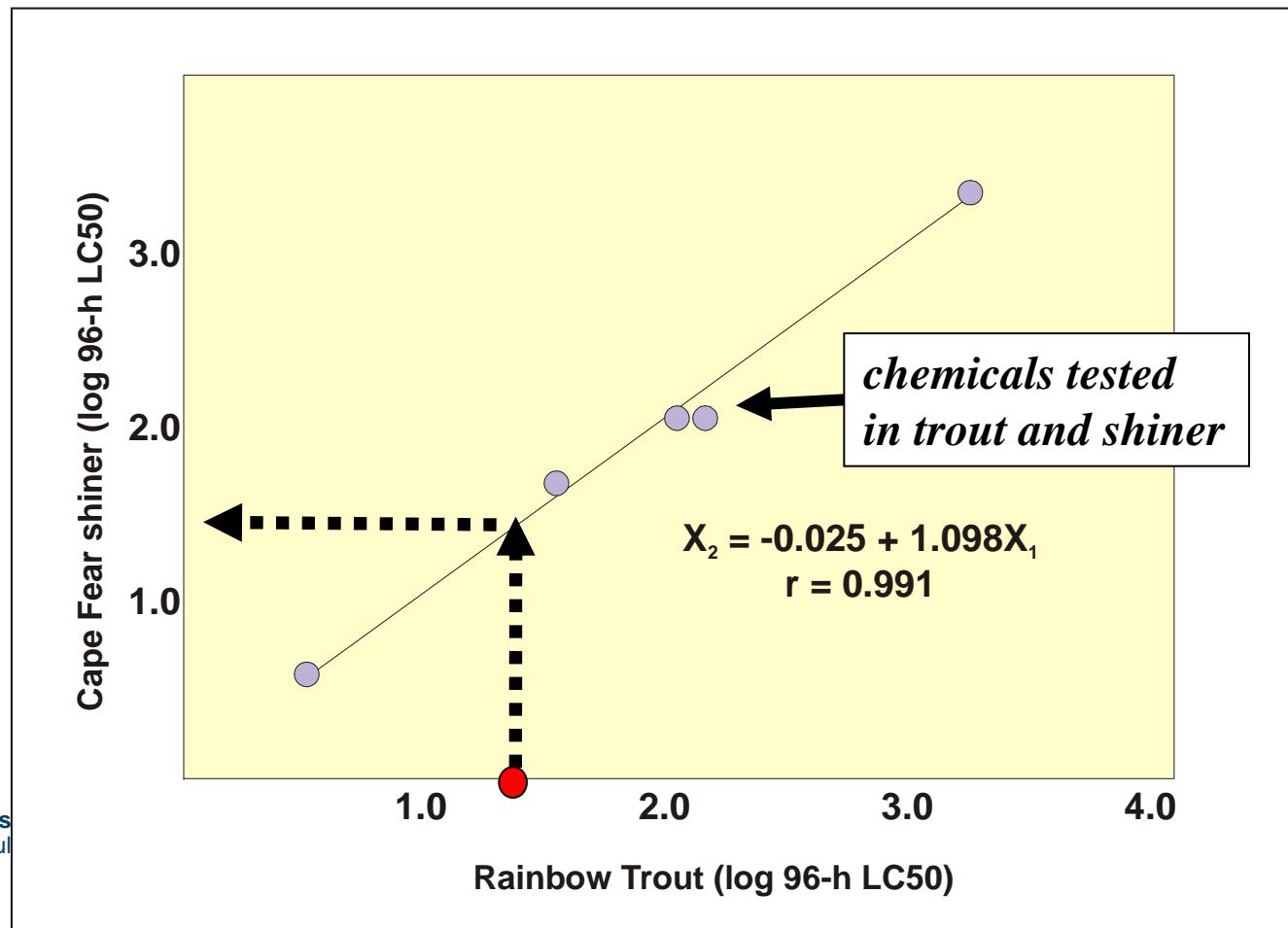


## Tour of Web-ICE

- Introduction to Web-ICE
- User-friendliness
- Species Sensitivity Distribution (SSD) Module
- Applications, Future development

# What is an ICE Model?

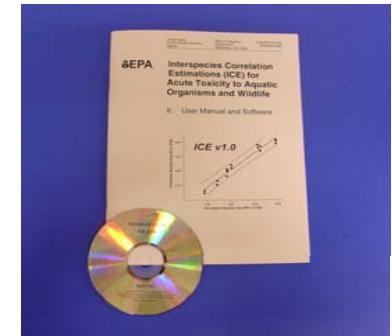
Log-linear model of the relationship between the acute toxicity (LC50/LD50) of chemicals tested in two taxa



# A Brief History of ICE

- **2003 - ICE version 1.0**

- Sonny Mayer (USEPA/ORD/NHEERL/GED)
- Mark Ellersieck & Amha Asfaw (Univ. Missouri)
- CD-based platform



- **2007 - Web-ICE**

- Sandy Raimondo, Deborah Vivian, Mace Barron (USEPA/ORD/NHEERL/GED)

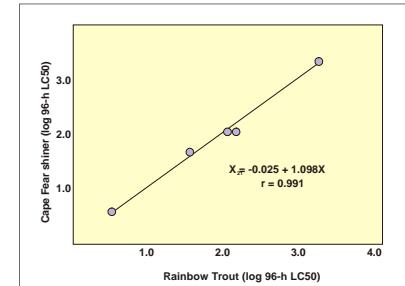


- **2008-2010 – Continued development of Web-ICE**

- database expansion (>12000 records)
- new modules (endangered species, algae)
- improved functionality (SSDs, etc)

# ICE Models – the basics

1. ICE models start with large database of acute toxicity
  - e.g. ICE v1.0 aquatic database = 4708 LC50 values; 661 chemicals; 247 species
2. All possible pairings of species by common chemical
  - e.g.  $247^*247 = 61009$  potential pairings
3. ICE model = Log-linear least squares regression of common chemicals tested in two species
  - some pairings will not yield any ICE model
  - some models will not be significant ( $p>0.05$ )
4. Suite of ICE models dependent on toxicity database



# Web-ICE Database Sources

## Aquatic (fish and invertebrates):

- US EPA Office of Pesticide Programs Ecotoxicity Database
- US EPA Office of Pollution Prevention & Toxics (HPV, PMN)
- ECOTOX/Aquire: 250,000 records
- US Geologic Survey
- AWQC
- Mayer 1987
- Mayer and Ellersiek 1986
- other literature sources for taxa of interest
  - endangered species
  - Molluscs

# Web-ICE Database Sources

## Wildlife (birds and mammals):

- US EPA Office of Pesticide Programs Ecotoxicity Database
- Environment Canada (Baril et al. 1994)
- Hudson et al. 1984
- Schafer et al. 1983
- Shafer and Bowles 1985
- Safer and Bowles 2004
- Smith 1987

# Test Data Standardization

## Aquatic data

- Test Duration/endpoint:
  - 96-hr LC50/EC50 (immobilization): fish, most invertebrates
  - 48-hr LC50/EC50: daphnids, midges, copepods, mosquito
- Life stage: juvenile
- Chemical purity/formulation:  $\geq 90\%$
- Concentrations: ug/L
- Test conditions: ASTM or similar
- Metals, PCP, HCN, ammonia: normalized according to AWQC docs

## Wildlife data

- Single oral dose, 14 d acute LD50 (mg/kg)
- Adults only
- Chemical purity/formulation:  $\geq 90\%$

# Web-ICE Aquatic Expansion

- 1) Compile records from all sources (>250,000)
- 2) Filter out records not meeting test standardization criteria
- 3) Assign and QC age classes (juvenile only on Web)
- 4) QC chemical names and CAS
- 5) Screen out duplicate records
- 6) Assign and QC MOAs
- 7) Build ICE and QC ICE Models
- 8) Validate models
- 9) Upload to Web

# Web-ICE Database

|                        | # Records | # Chemicals | # Species |
|------------------------|-----------|-------------|-----------|
| Aquatic 2007           | 4706      | 695         | 217       |
| T&E species            | 1043      | 465         | 22        |
| <b>Aquatic 2009</b>    | > 10,000  | > 1600      | > 300     |
| <b>T&amp;E species</b> | ~ 2000    | ~ 550       | ~ 25      |
| <b>Wildlife</b>        | 4329      | 951         | 156       |

Additional data sources added  
 AWQC  
 new Ecotox  
 OPPT PMN & HPV  
 endangered species

# Quality Assurance

## In house

- centralized data management system
- data transcription thoroughly reviewed
- chemical and species name consistency
- duplicate records removed

## Extraneous factors

- reviewed each source for quality
- multiple records for same species and chemical were removed if min and max were > 10-fold

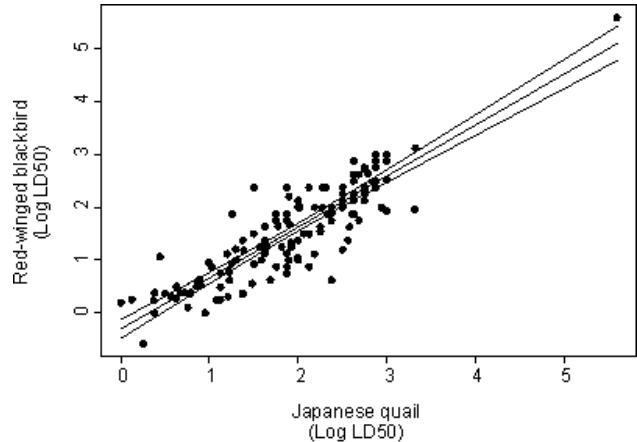
| A           | B                                 | C         | D                         | G    | H               |
|-------------|-----------------------------------|-----------|---------------------------|------|-----------------|
| data source | chemical                          | cas       | species                   | type | toxicity (ug/L) |
| 1 OPP       | (S)-Dimethenamid                  | 163515148 | Cyprinodon variegatus     | F    | 12000           |
| 3 OPP       | (S)-Dimethenamid                  | 163515148 | Daphnia magna             | F    | 12000           |
| 4 OPP       | (S)-Dimethenamid                  | 163515148 | Lepomis macrochirus       | F    | 10000           |
| 5 OPP       | (S)-Dimethenamid                  | 163515148 | Oncorhynchus mykiss       | F    | 6300            |
| 6 ECOTOX    | 1,1,2,2-tetrachloroethane         | 79345     | Paratanytarsus dissimilis | S    | 30800           |
| 7 ECOTOX    | 1,1,2,2-tetrachloroethane         | 79345     | Pimephales promelas       | F    | 13400           |
| 8 ECOTOX    | 1,1,2,2-tetrachloroethane         | 79345     | Pimephales promelas       | F    | 20300           |
| 9 ECOTOX    | 1,1-Dichloroethene                | 75354     | Menidia beryllina         | S    | 250000          |
| 10 ECOTOX   | 1,2,4-trichlorobenzene            | 120821    | Oncorhynchus mykiss       | F    | 1530            |
| 11 OPP      | 1,2-Benzenedicarboxaldehyde       | 643798    | Daphnia magna             | SR   | 87              |
| 12 OPP      | 1,2-Benzenedicarboxaldehyde       | 643798    | Daphnia magna             | S    | 90              |
| 13 OPP      | 1,2-Benzenedicarboxaldehyde       | 643798    | Oncorhynchus mykiss       | SR   | 20              |
| 14 OPP      | 1,2-Benzenedicarboxaldehyde       | 643798    | Oncorhynchus mykiss       | F    | 72              |
| 15 ECOTOX   | 1,2-dichlorobenzene               | 95501     | Lepomis macrochirus       | S    | 27000           |
| 16 ECOTOX   | 1,2-dichlorobenzene               | 95501     | Lepomis macrochirus       | S    | 320000          |
| 17 ECOTOX   | 1,2-dichlorobenzene               | 95501     | Menidia beryllina         | S    | 7300            |
| 18 ECOTOX   | 1,2-dichlorobenzene               | 95501     | Menidia beryllina         | S    | 240000          |
| 19 ECOTOX   | 1,2-dichlorobenzene               | 95501     | Oncorhynchus mykiss       | F    | 1580            |
| 20 ECOTOX   | 1,2-dichlorobenzene               | 95501     | Paratanytarsus dissimilis | S    | 12000           |
| 21 OPP      | 1,3 Dichloropropene               | 542756    | Crassostrea virginica     | F    | 640             |
| 22 OPP      | 1,3 Dichloropropene               | 542756    | Cyprinodon variegatus     | F    | 870             |
| 23 OPP      | 1,3 Dichloropropene               | 542756    | Daphnia magna             | S    | 90              |
| 24 OPP      | 1,3 Dichloropropene               | 542756    | Lepomis macrochirus       | F    | 3700            |
| 25 OPP      | 1,3 Dichloropropene               | 542756    | Lepomis macrochirus       | S    | 6700            |
| 26 OPP      | 1,3 Dichloropropene               | 542756    | Micropterus salmoides     | S    | 3650            |
| 27 OPP      | 1,3 Dichloropropene               | 542756    | Pimephales promelas       | S    | 4100            |
| 28 OPP      | 1,3 Dichloropropene               | 542756    | Sander vitreus            | S    | 1080            |
| 29 OPP      | 1,3,5-Triethylhexahydro-s-triazin | 7779273   | Daphnia magna             | S    | 15300           |
| 30 OPP      | 1,3,5-Triethylhexahydro-s-triazin | 7779273   | Daphnia magna             | F    | 26000           |
| 31 OPP      | 1,3,5-Triethylhexahydro-s-triazin | 7779273   | Lepomis macrochirus       | S    | 30800           |
| 32 OPP      | 1,3,5-Triethylhexahydro-s-triazin | 7779273   | Oncorhynchus mykiss       | S    | 23300           |
| 33 OPP      | 1,3,5-Triethylhexahydro-s-triazin | 7779273   | Oncorhynchus mykiss       | F    | 35000           |
| 34 OPP      | 1,4-dichlorobenzene               | 106467    | Lepomis macrochirus       | S    | 6400            |
| 35 OPP      | 1,4-dichlorobenzene               | 106467    | Oncorhynchus mykiss       | S    | 880             |
| 36 ECOTOX   | 1,4-dichlorobenzene               | 106467    | Oncorhynchus mykiss       | F    | 1120            |
| 37 ECOTOX   | 1,4-dichlorobenzene               | 106467    | Paratanytarsus dissimilis | S    | 13000           |
| 38 OPP      | 1,4-dichlorobenzene               | 106467    | Salvelinus fontinalis     | S    | 1670            |
| 39 Boogard  | 2-(digeranyl amino)-ethanol       | 001       | Carassius auratus         | S    | 290             |
| 40 Boogard  | 2-(digeranyl amino)-ethanol       | 001       | Cyprinus carpio           | S    | 50.7            |
| 41 Boogard  | 2-(digeranyl amino)-ethanol       | 001       | Fundulus diaphanus        | S    | 792             |
| 42 Boogard  | 2-(digeranyl amino)-ethanol       | 001       | Lepomis cyanellus         | S    | 640             |
| 43 Boogard  | 2-(digeranyl amino)-ethanol       | 001       | Lepomis macrochirus       | S    | 720             |
| 44 Boogard  | 2-(digeranyl amino)-ethanol       | 001       | Micropterus dolomieu      | S    | 237             |
| 45 Boogard  | 2-(digeranyl amino)-ethanol       | 001       | Micropterus salmoides     | S    | 360             |

EcoToxdata

# Web-ICE Model Development

Model II least square regression of log-transformed toxicity data for all possible species pairs

Included only models significant at the p<0.05 level



| # ICE Models: | Species | Genus | Family |
|---------------|---------|-------|--------|
| Aquatic 2007  | 1074    | 481   | 526    |
| Wildlife      | 560     | n/a   | 292    |

# Model Validation & Uncertainty Analysis

- Only included models significant at the  $p<0.05$  level
- Leave-1-out cross-validation
  - only conducted for models  $N \geq 4$
  - models excluded if removal of data resulted in non-significant model
    - degrees of freedom  $< 8$  ( $N < 10$ )
    - $0.05 \geq p\text{-value} \geq 0.01$
  - “N-fold difference” of each removed data point categorized
    - 5-fold, 10-fold, 50-fold,  $>50$ -fold
  - Cross-validation success rate for each model
    - percentage of model datapoints predicted within 5-fold of actual value

## leave-1-out cross-validation

Each data point is removed, one at a time, and the model is rebuilt with remaining data. Removed surrogate data are used to estimate removed predicted data from rebuilt model.

# Model Validation & Uncertainty Analysis

**Cross-validation results used to identify sources of model uncertainty:**

- Aquatic
  - 2007: taxonomic distance
  - final: model parameters, chemical MOA/class
- Wildlife
  - taxonomic distance
  - chemical MOA/class
  - model parameters (MSE, R<sup>2</sup>)

taxonomic distance  
identifies the shared taxonomic  
level of the surrogate species and  
predicted taxa

# How well do ICE models work?

## Model uncertainty related to taxonomic distance

**Aquatics** in same order ~ 90% within 5-fold, 95% within 10-fold

Percentage of all datapoints in cross-validation category

| Common level | Number datapoints | 5-fold | 10-fold | 50-fold | > 50 fold |
|--------------|-------------------|--------|---------|---------|-----------|
| genus (1)    | 372               | 92     | 3       | 4       | 1         |
| family (2)   | 1042              | 92     | 6       | 2       | 0         |
| order (3)    | 280               | 89     | 6       | 4       | 1         |
| class (4)    | 5622              | 79     | 9       | 8       | 4         |
| phylum (5)   | 854               | 52     | 17      | 21      | 10        |
| kingdom (6)  | 4524              | 50     | 16      | 22      | 12        |

# How well do ICE models work?

## Model uncertainty related to taxonomic distance

**Wildlife** in same order ~ 90% within 5-fold, 97% within 10-fold

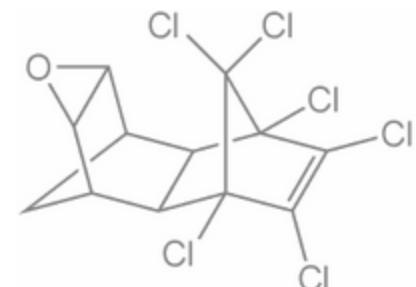
Percentage of all datapoints in cross-validation category

| Common level | Number datapoints | 5-fold | 10-fold | 50-fold | > 50 fold |
|--------------|-------------------|--------|---------|---------|-----------|
| genus (1)    | 48                | 100    | 0       | 0       | 0         |
| family (2)   | 1452              | 92     | 6       | 2       | 0         |
| order (3)    | 2238              | 90     | 7       | 3       | 0.3       |
| class (4)    | 5706              | 85     | 10      | 5       | 0.2       |
| phylum (5)   | 2402              | 76     | 13      | 9       | 1.5       |

Raimondo et al. 2003 Environmental Science and Technology (ES&T)

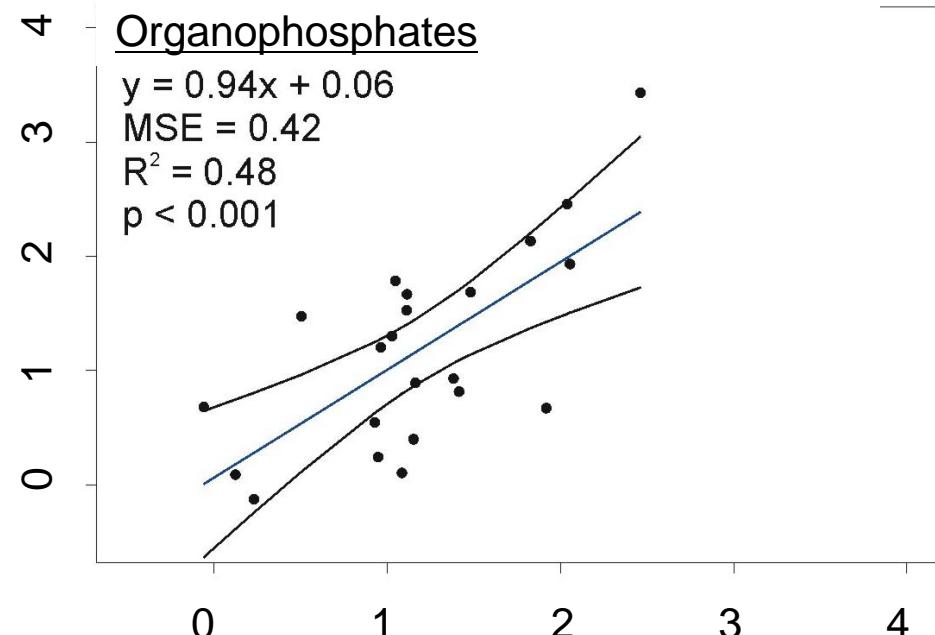
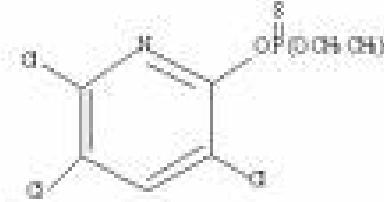
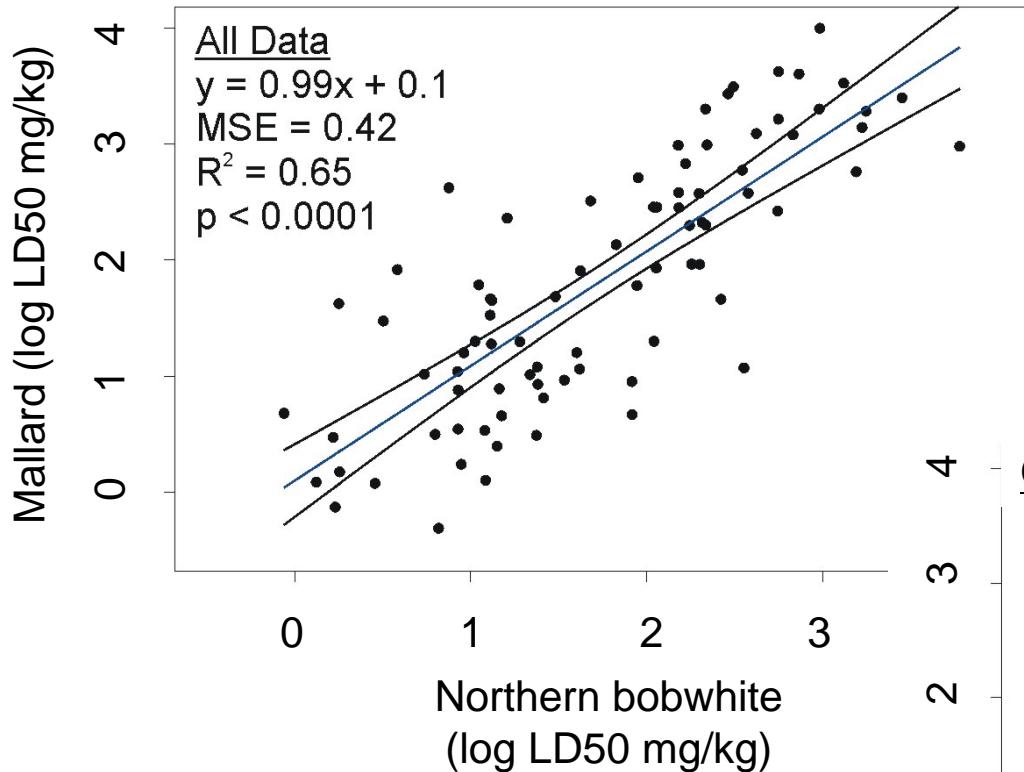
# ICE Model Uncertainty: Chemical Mode of Action (MOA)

- Each chemical assigned a chemical MOA based on ASTER assignment, assessment of chemical structure, mechanism of acute toxicity, therapeutic category and pesticidal activity
- Wildlife complete; aquatics in progress



# Model Uncertainty: Chemical MOA

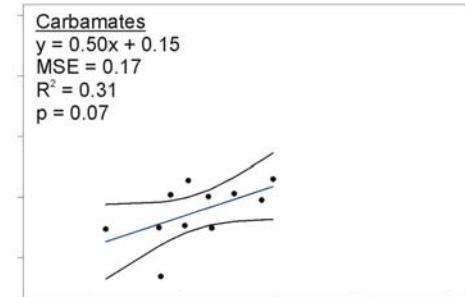
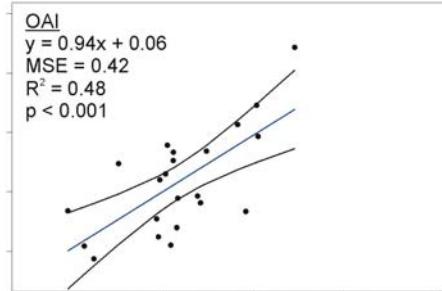
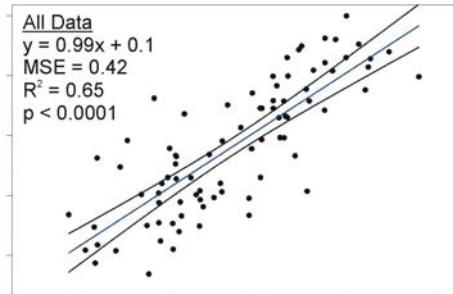
## *Wildlife models*



# Model Uncertainty: Chemical MOA

## *Wildlife models*

- Models were improved when built from data subsets for half of MOAs compared with models built from all data
- Many models built with MOA data subsets lost statistical significance
  - related to reduced degrees of freedom
  - signifies lack of model robustness
- Models may be improved by using MOA-specific data
- Abundant data is necessary to ensure model robustness preserved



# User Guidance: Selecting a Model with Low Uncertainty

No one attribute defines model robustness!

## *Rules of Thumb:*

(based on uncertainty analysis of Wildlife models)

- close taxonomic distance (within order)
- low MSE (< ~0.22)
- high R<sup>2</sup> (> ~0.6)
- high cross-validation success rate
- low p-value (< 0.01)
- high degrees of freedom (d.f. > 8; N > 10)
  
- input value should be relatively close to the range of surrogate data used to create the model



John J. Mosesso/NBI

# Tour of Web-ICE

**Available on EPA's Center for Exposure Assessment Modeling (CEAM)**

<http://www.epa.gov/ceampubl/fchain/webice/index.htm>





# U.S. Environmental Protection Agency

## Interspecies Correlation Estimation

[Recent Additions](#) | [Contact Us](#)Search:  All EPA  This Area  GoYou are here: [EPA Home](#) » [Exposure Assessment](#) » [Food Chain](#) » [Web-ICE](#)The V  
acute  
to th

Select taxonomic model  
for Aquatic or Wildlife

Web-ICE) application estimates  
use in risk assessment. Please refer  
Web-ICE.

### Web-ICE Modules

#### ICE Aquatic

Aquatic vertebrates / invertebrates

- [Species](#)
- [Genus](#)
- [Family](#)

#### ICE Wildlife

Terrestrial Birds / Mammals

- [Species](#)
- [Family](#)

### Species Sensitivity Distribution Module

- [ICE Aquatic](#)
- [ICE Wildlife](#)

Please address all comments and questions to the [webmaster](#)[Office of Research and Development](#) | [National Health and Environmental Effects Research Laboratory](#) | [Gulf Ecology Division](#)

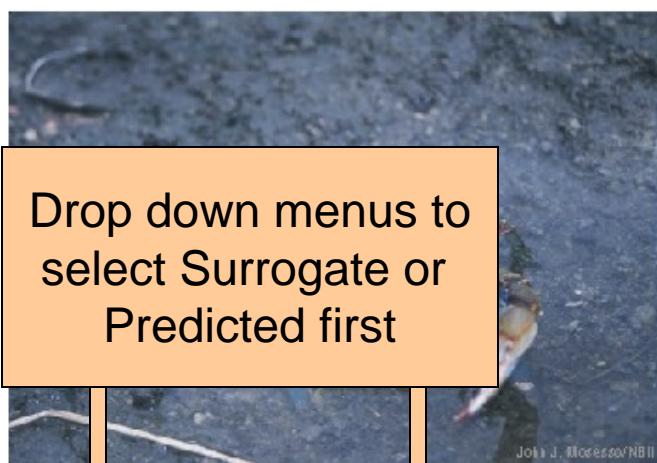


## U.S. Environmental Protection Agency

## Interspecies Correlation Estimation

[Recent Additions](#) | [Contact Us](#)Search:  All EPA  This AreaYou are here: [EPA Home](#) » [Exposure Assessment](#) » [Food Chain](#) » [Web-ICE Home](#) » [Aquatic Species](#)

## Aquatic Species - Taxa Selection Page



Surrogate:

Predicted:

- Downy rainbow (*Villosa villosa*)
- Eastern mud snail (*Nassarius obsoletus*)
- Eastern oyster (*Crassostrea virginica*)
- Fathead minnow (*Pimephales promelas*)
- Fiddler crab (*Uca pugillator*)
- Flagfish (*Jordanella floridae*)
- Fountain darter (*Etheostoma fonticola*)
- Fowlers toad (*Bufo fowleri*)
- Gila topminnow (*Poeciliopsis occidentalis*)
- Goldfish (*Carassius auratus*)
- Green crab (*Carcinus maenas*)



# U.S. Environmental Protection Agency

## Interspecies Correlation Estimation

[Recent Additions](#) | [Contact Us](#)Search:  All EPA  This AreaYou are here: [EPA Home](#) » [Exposure Assessment](#) » [Food Chain](#) » [Web-ICE Home](#) » Aquatic Species

### Exposure Assessment Models

[Web-ICE Home](#)  
[Aquatic Species](#)  
[Aquatic Genus](#)  
[Aquatic Family](#)  
[Wildlife Species](#)  
[Wildlife Family](#)[Species Sensitivity Distributions](#)  
[Aquatic](#)  
[Wildlife](#)

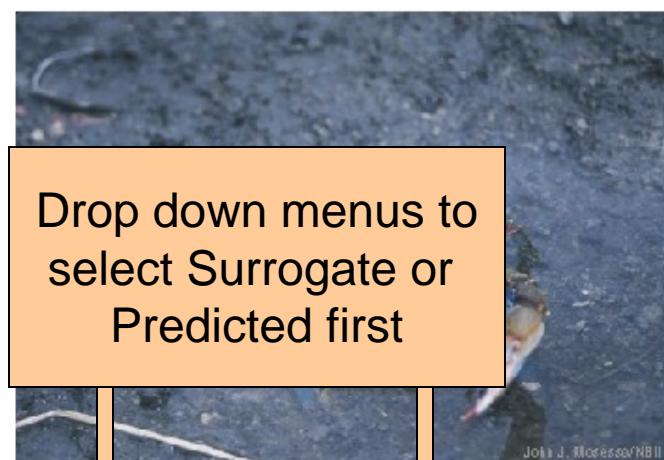
### Basic Information

### User Manual

### Download Model Data

### Bibliography

## Aquatic Species - Taxa Selection Page



Surrogate:

Sort By: 

Predicted:

- California grunion (*Leuresthes tenuis*)
- Cape Fear shiner (*Notropis mekistocholas*)
- Channel catfish (*Ictalurus punctatus*)
- Chinook salmon (*Oncorhynchus tshawytscha*)
- Coho salmon (*Oncorhynchus kisutch*)**
- Colorado pikeminnow (*Ptychocheilus lucius*)
- Common carp (*Cyprinus carpio*)
- Copepod (*Acartia clausi*)
- Copepod (*Acartia tonsa*)
- Copepod (*Eurytemora affinis*)
- Crayfish (*Orconectes naias*)

Please address all comments to:

[Office of Research and Development](#) | [National Health](#)

Division



# U.S. Environmental Protection Agency

## Interspecies Correlation Estimation

[Recent Additions](#) | [Contact Us](#)Search:  All EPA  This AreaYou are here: [EPA Home](#) » [Exposure Assessment](#) » [Food Chain](#) » [Web-ICE Home](#) » Aquatic Species

### Aquatic Species - Taxa Selection Page

Sort by common  
or scientific name



Surrogate:

Predicted:

- Acartia clausi (Copepod)
- Acartia tonsa (Copepod)
- Acipenser brevirostrum (Shortnose sturgeon)
- Actinonaias pectorosa (Pheasantshell)
- Ameiurus melas (Black bullhead)
- Americanamysis bahia (Mysid)
- Argopecten irradians (Bay scallop)
- Anguilla rostrata (American eel)
- Aplexa hypnorum (Snail)
- Asterias forbesi (Starfish)

Sort By: 

Please address all comments to:

[Office of Research and Development](#) | [National Health](#)

Division



## U.S. Environmental Protection Agency

## Interspecies Correlation Estimation

[Recent Additions](#) | [Contact Us](#)Search:  All EPA  This AreaYou are here: [EPA Home](#) » [Exposure Assessment](#) » [Food Chain](#) » [Web-ICE Home](#) » Aquatic Species

## Aquatic Species - Taxa Selection Page



Only offers significant  
( $p < 0.05$ ) models for  
chosen taxon

Surrogate:

A dropdown menu containing the following options:

- Americamysis bahia (Mysid)
- Carcinus maenas (Green crab)
- Homarus americanus (American lobster)
- Mytilus edulis (Blue mussel)

Predicted:

Acartia tonsa (Copepod)

**Exposure Assessment Models**

**Surrogate toxicity input:**

**Select confidence interval**

| Surrogate Acute Toxicity (log value) | Predicted Acute Toxicity (log value)  |
|--------------------------------------|---------------------------------------|
| 400 µg/L (2.60)                      | 454.50 µg/L (2.65)                    |
| <b>Select Confidence Interval:</b>   | <b>Lower Limit</b> <b>Upper Limit</b> |
| 95%                                  | 288.03 µg/L    717.18 µg/L            |
| <b>Calculate</b>                     |                                       |

**Predicted toxicity and confidence interval**

**Aquatic graphs coming in 2009**

**Model Information**

|   |                 |
|---|-----------------|
| Intercept:                              | -0.316554       |
| Slope:                                  | 1.14            |
| Degrees of Freedom (N-2):               | 15              |
| R <sup>2</sup> :                        | 0.923529        |
| p-value:                                | 0.000000        |
| Average value of surrogate (log value): | 302.23 (2.48)   |
| Minimum value of surrogate (log value): | 3.80 (0.580881) |
| Maximum value of surrogate (log value): | 19208.68 (4.28) |
| Mean Square Error (MSE):                | 0.145078        |
| Sum of Squares ( $S_{xx}$ ):            | 20.11           |
| Cross-validation Success (%):           | 94.11           |
| Taxonomic Distance:                     | 2               |

**Model parameters**

**Surrogate species data summary**

**Additional information**



## Exposure Assessment Models

Web-ICE Home  
Aquatic Species  
Aquatic Genus  
Aquatic Family  
Wildlife Species  
Wildlife Family

Species Sensitivity Distributions  
Aquatic Wildlife

Basic Information

User Manual

Download Model Data

Bibliography

## Aquatic Species

**Surrogate Species:** Rainbow trout (*Oncorhynchus mykiss*)**Predicted Species:** Brook trout (*Salvelinus fontinalis*)

|   |                                      |
|---|--------------------------------------|
| Surrogate Acute Toxicity (log value)                                | Predicted Acute Toxicity (log value) |
| 1.5   |                                      |
| Select Confidence Interval:   |                                      |
| Lower Limit    Upper Limit  |                                      |
| Microsoft Internet Explorer   |                                      |
| This value is outside the x-axis range for this model.<br>Continue? |                                      |
| OK    Cancel  |                                      |

**Warning that input data is outside model range**
**Model Information**

|  |                 |
|--|-----------------|
| <b>Intercept:</b>                              | -0.316554       |
| <b>Slope:</b>                                  | 1.14            |
| <b>Degrees of Freedom (N-2):</b>               | 15              |
| <b>R<sup>2</sup>:</b>                          | 0.923529        |
| <b>p-value:</b>                                | 0.000000        |
| <b>Average value of surrogate (log value):</b> | 302.23 (2.48)   |
| <b>Minimum value of surrogate (log value):</b> | 3.80 (0.580881) |
| <b>Maximum value of surrogate (log value):</b> | 19208.68 (4.28) |
| <b>Mean Square Error (MSE):</b>                | 0.145078        |
| <b>Sum of Squares (S<sub>xx</sub>):</b>        | 20.11           |
| <b>Cross-validation Success (%):</b>           | 94.11           |
| <b>Taxonomic Distance:</b>                     | 2               |



## Exposure Assessment Models

Web-ICE Home  
 Aquatic Species  
 Aquatic Genus  
 Aquatic Family  
 Wildlife Species  
 Wildlife Family

Species Sensitivity Distributions  
 Aquatic Wildlife

Basic Information

User Manual

Download Model Data

Bibliography

## Aquatic Species

Surrogate Species: Rainbow trout (*Oncorhynchus mykiss*)Predicted Species: Brook trout (*Salvelinus fontinalis*)

| Surrogate Acute Toxicity (log value)  | Predicted Acute Toxicity (log value) |
|---|--------------------------------------|
| 1.5 µg/L (0.176)  | 0.766 µg/L (-0.115)                  |
| Select Confidence Interval:   |                                      |
| <input type="button" value="Lower Limit"/> <input type="button" value="Upper Limit"/> |                                      |
| <input type="button" value="95%"/>  |                                      |
| <input type="button" value="Calculate"/>  |                                      |

Surrogate toxicity outside model range.

Review confidence intervals for prediction certainty

Warning that input data is outside model range

## Model Information

|   |                 |
|---|-----------------|
| Intercept:                              | -0.316554       |
| Slope:                                  | 1.14            |
| Degrees of Freedom (N-2):               | 15              |
| R <sup>2</sup> :                        | 0.923529        |
| p-value:                                | 0.000000        |
| Average value of surrogate (log value): | 302.23 (2.48)   |
| Minimum value of surrogate (log value): | 3.80 (0.580881) |
| Maximum value of surrogate (log value): | 19208.68 (4.28) |
| Mean Square Error (MSE):                | 0.145078        |
| Sum of Squares (S <sub>xx</sub> ):      | 20.11           |
| Cross-validation Success (%):           | 94.11           |
| Taxonomic Distance:                     | 0               |



# U.S. Environmental Protection Agency

## Interspecies Correlation Estimation

[Recent Additions](#) | [Contact Us](#)Search:  All EPA  This Area  GoYou are here: [EPA Home](#) » [Exposure Assessment](#) » [Food Chain](#) » [Web-ICE](#)

The Web-based Interspecies Correlation Estimation (Web-ICE) application estimates acute toxicity to aquatic and terrestrial organisms for use in risk assessment. Please refer to the [User Manual](#) for detailed instructions on using Web-ICE.

### Exposure Assessment Models

- [Web-ICE Home](#)
- [Aquatic Species](#)
- [Aquatic Genus](#)
- [Aquatic Family](#)
- [Wildlife Species](#)
- [Wildlife Family](#)

### Species Sensitivity Distributions

- [Aquatic](#)
- [Wildlife](#)

### Basic Information

### User Manual

### Download Model Data

### Bibliography

### Web-ICE Modules

#### ICE Aquatic

Aquatic vertebrates / invertebrates

- [Species](#)
- [Genus](#)
- [Family](#)

#### ICE Wildlife

Terrestrial Birds / Mammals

- [Species](#)
- [Family](#)

#### Species Sensitivity Distribution Module

- [ICE Aquatic](#)
- [ICE Wildlife](#)

Please address comments or questions to the [webmaster](#)

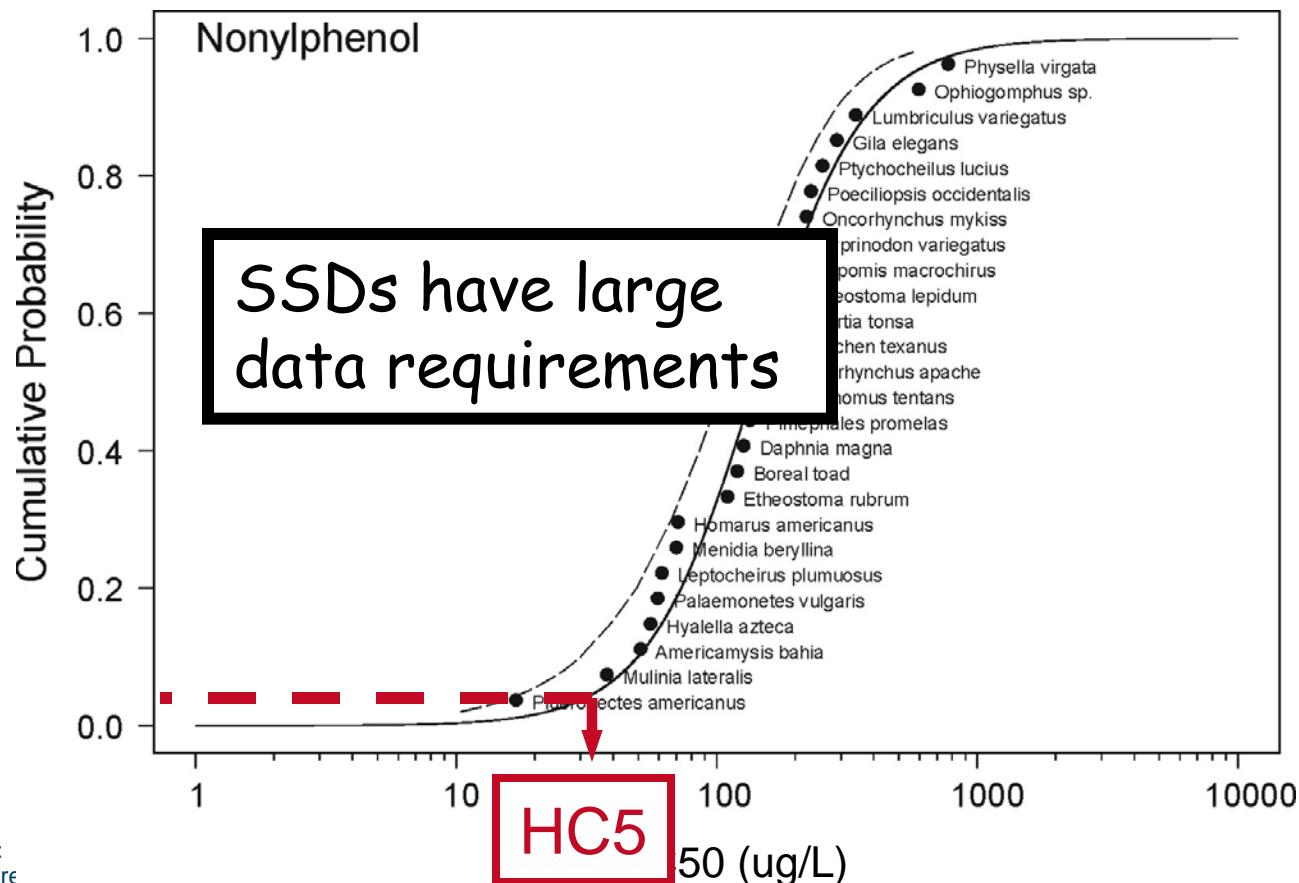
[Office of Research and Development](#) | [National Health and Environmental Effects Research Laboratory](#) | [Gulf Ecology Division](#)

# Species Sensitivity Distributions (SSDs)

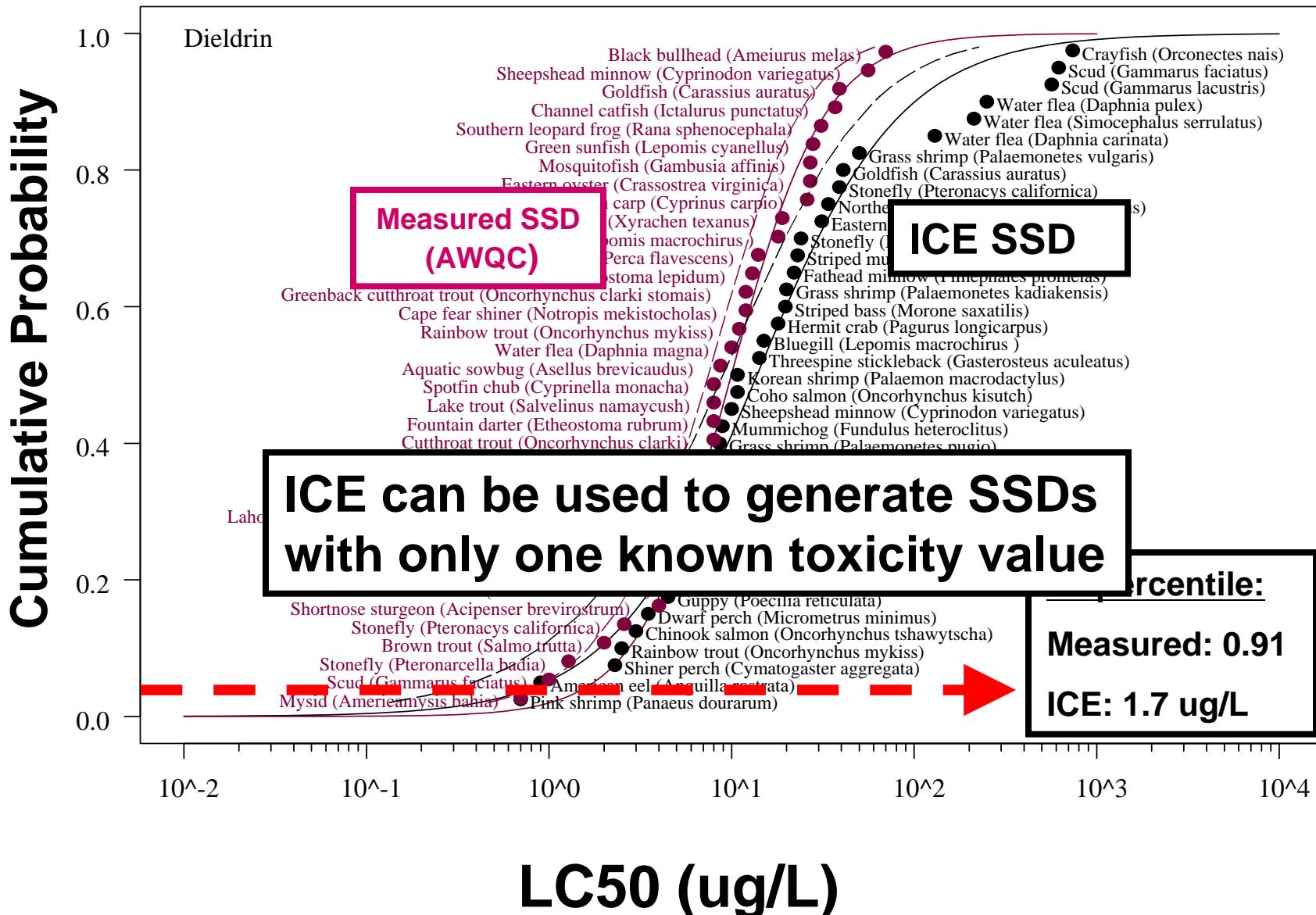
- Cumulative probability distribution of species sensitivity

Used widely in ecological risk assessment to determine hazard level (e.g., HC5)

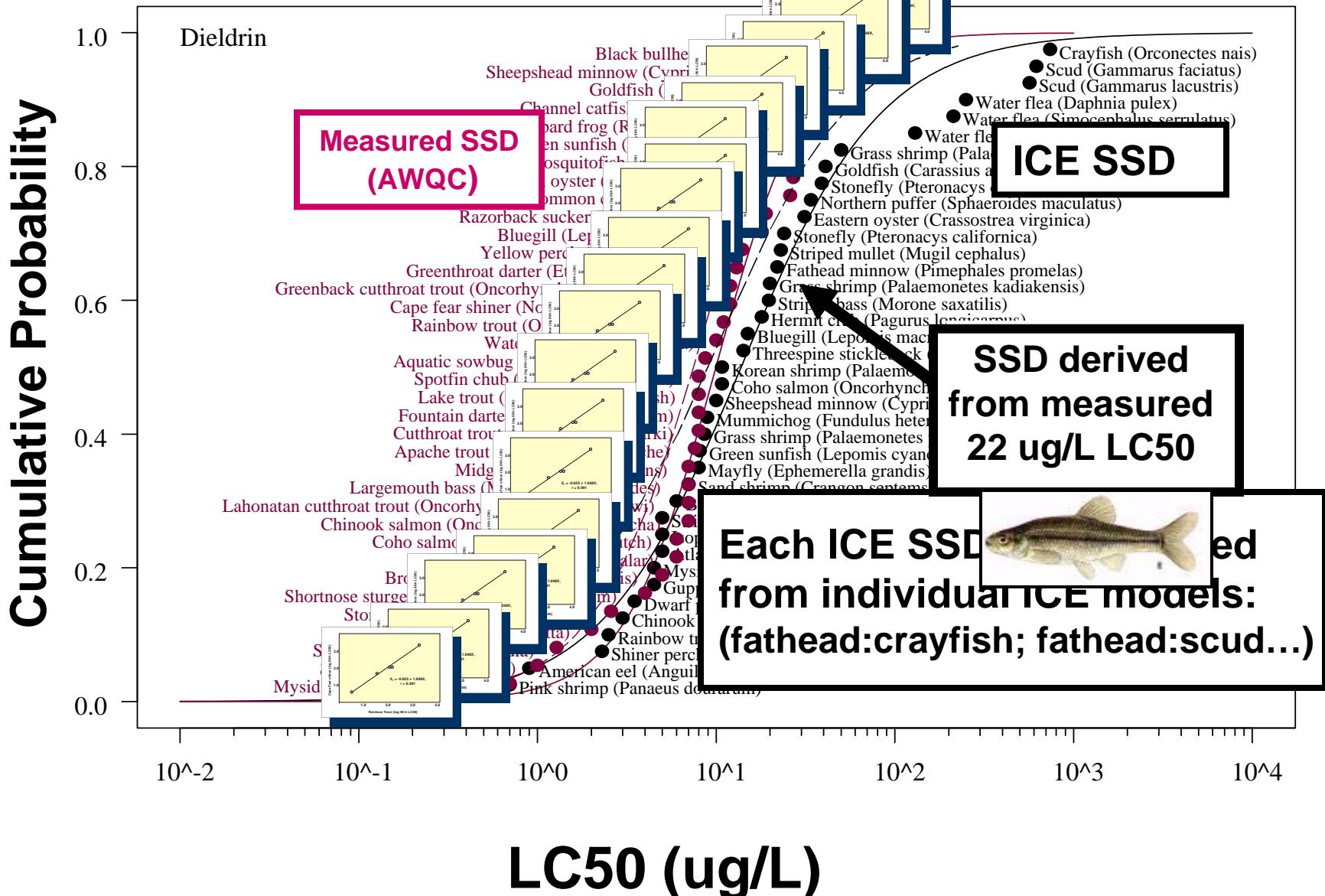
SSDs protective of endangered species (Raimondo et al. 2008. ETC 27:2599-2607)



# ICE and Measured SSDs



# ICE and Measured SSDs



# How Do ICE and Measured SSDs Compare?

- **Aquatic Species Proof of Concept** (Dyer et al. 2006. ES&T 40:3102–3111)
  - ICE-based SSDs had HC5s within an order of magnitude of measured HC5s
- **Aquatic Species, Expanded Study** (Dyer et al. 2008. ES&T 42:3076–3083)
  - 55 AWQC chemicals
  - using fish surrogate to predict fish and invertebrate surrogate to predict invertebrates yielded SSDs similar to measured
- **Wildlife ICE SSD study** (Awkerman et al. 2008. ES&T 42:3447–3452)
  - > 90% of ICE HD5s within 5-fold of measured HD5

# Web-ICE SSD Modules

<http://www.epa.gov/ceampubl/fchain/webice/index.htm>





# U.S. Environmental Protection Agency

## Interspecies Correlation Estimation

[Recent Additions](#) | [Contact Us](#)Search:  All EPA  This Area  GoYou are here: [EPA Home](#) » [Exposure Assessment](#) » [Food Chain](#) » [Web-ICE](#)

The Web-based Interspecies Correlation Estimation (Web-ICE) application estimates acute toxicity to aquatic and terrestrial organisms for use in risk assessment. Please refer to the [User Manual](#) for detailed instructions on using Web-ICE.

### Species Sensitivity Distribution Modules

#### ICE Aquatic

- Aquatic vertebrates
- Invertebrates
  - Species
  - Genus
  - Family

- Terrestrial Birds / Mammals
  - Species
  - Family

### Species Sensitivity Distribution Module

- [ICE Aquatic](#)
- [ICE Wildlife](#)



## U.S. Environmental Protection Agency

## Interspecies Correlation Estimation

[Recent Additions](#) | [Contact Us](#)Search:  All EPA  This AreaYou are here: [EPA Home](#) » [Exposure Assessment](#) » [Food Chain](#) » [Web-ICE Home](#) » [SSD](#) » [SSD-Aquatic](#)

## Species Sensitivity Distrib

## Single Surrogate SSD

- Pick your Surrogate
- Fathead minnow (*Pimephales promelas*)
  - Sheepshead minnow (*Cyprinodon variegatus*)
  - Bluegill (*Lepomis macrochirus*)
  - Channel catfish (*Ictalurus punctatus*)
  - Rainbow trout (*Oncorhynchus mykiss*)

Pick a surrogate  
Enter known toxicity

Enter Toxicity (µg/L)

75

If toxicity data for a chemical is available for both a vertebrate and an invertebrate species, SSDs can be improved by using two surrogates. The two surrogate SSD uses the vertebrate surrogate to estimate toxicity to all vertebrate species and the invertebrate surrogate to estimate toxicity to all invertebrate species. Data generated from both surrogates are combined to create one SSD. See the [user manual](#) for more on this method.

## Two Surrogate SSD

- Pick your vertebrate Surrogate
- Fathead minnow (*Pimephales promelas*)
  - Sheepshead minnow (*Cyprinodon variegatus*)
  - Bluegill (*Lepomis macrochirus*)
  - Channel catfish (*Ictalurus punctatus*)
  - Rainbow trout (*Oncorhynchus mykiss*)

Enter Toxicity (µg/L)



## U.S. Environmental Protection Agency

### Interspecies Correlation Estimation

[Recent Additions](#) | [Contact Us](#)Search:  All EPA  This Area[Go](#)You are here: [EPA Home](#) » [Exposure Assessment](#) » [Food Chain](#) » [Web-ICE](#)

### Species Sensitivity Distributions

Calculates hazard level confidence interval

Surrogate Species: Fathead minnow (Pimephales promelas)

Input Toxicity: 75 µg/L

HC5  3.56 µg/L

95% Confidence Interval: 0.547 - 7.77

| Common Name<br><a href="#">Sort</a>                    | Scientific Name<br><a href="#">Sort</a> | Estimated Toxicity<br><a href="#">Sort +</a> | 95% Confidence Intervals<br><a href="#">Sort</a> |
|--|---|--|--|
| <input checked="" type="checkbox"/> Mysid              | Americamysis bahia                      | 0.825  | 0.020 - 32.47                                    |
| <input checked="" type="checkbox"/> Stonefly           |   | 1.37   | 0.567 - 3.3                                      |
| <input checked="" type="checkbox"/> Stonefly           |   | 2.48   | 1.36 - 4.51                                      |
| <input checked="" type="checkbox"/> Amphipod           |   | 3.30   | 0.695 - 15.7                                     |
| <input checked="" type="checkbox"/> Stonefly           | Ceraclea californica                    | 5.83   | 1.60 - 21.2                                      |
| <input checked="" type="checkbox"/> Northern pike      | Esox lucius                             | 11.63  | 4.06 - 33.30                                     |
| <input checked="" type="checkbox"/> Atlantic salmon    | Salmo salar                             | 13.39  | 3.61 - 49.68                                     |
| <input checked="" type="checkbox"/> Brook trout        | Salmo trutta                            | 13.52  | 3.85 - 47.40                                     |
| <input checked="" type="checkbox"/> Shortnose sturgeon | Acipenser brevirostrum                  | 14.83  | 7.05 - 31.20                                     |
| <input checked="" type="checkbox"/> Brook trout        | Salvelinus fontinalis                   | 18.98  | 6.65 - 54.17                                     |
| <input checked="" type="checkbox"/> Smallmouth bass    | Micropterus dolomieu                    | 19.66  | 4.35 - 88.92                                     |
| <input checked="" type="checkbox"/> Fountain darter    | Etheostoma fonticola                    | 20.64  | 10.63 - 40.09                                    |
|  |   | 21.00  | 11.05 - 49.00                                    |

Unclick boxes to exclude species

Simultaneously calculates toxicity & confidence intervals

Indicates potential uncertainty

\* Input toxicity less than model minimum of 93.07

Exposure Assessment Models

[Web-ICE Home](#)  
[Aquatic Species](#)  
[Aquatic Genus](#)  
[Aquatic Family](#)  
[Wildlife Species](#)  
[Wildlife Family](#)
[Species Sensitivity Distributions](#)  
[Aquatic](#)  
[Wildlife](#)
[Basic Information](#)[User Manual](#)[Download Model Data](#)[Bibliography](#)



**Web-ICE Home**  
 Aquatic Species  
 Aquatic Genus  
 Aquatic Family  
 Wildlife Species  
 Wildlife Family

**Species Sensitivity  
 Distributions**  
 Aquatic  
 Wildlife

Basic Information

User Manual

Download Model Data

Bibliography

**Pick your Surrogate****Enter Toxicity (µg/L)**

- Fathead minnow (*Pimephales promelas*)
- Sheepshead minnow (*Cyprinodon variegatus*)
- Bluegill (*Lepomis macrochirus*)
- Channel catfish (*Ictalurus punctatus*)
- Rainbow trout (*Oncorhynchus mykiss*)

Reset

Continue

If toxicity data for a chemical is available for both a vertebrate and an invertebrate species, SSDs can be improved by using two surrogates. The two surrogate SSD uses the vertebrate surrogate to estimate toxicity to all vertebrate species and the invertebrate surrogate to estimate toxicity to all invertebrate species. Data generated from both surrogates are combined to create one SSD. See the [user manual](#) for more on this method.

**Two Surrogate SSD****Pick your vertebrate Surrogate****Enter Toxicity (µg/L)**

- Fathead minnow (*Pimephales promelas*)
- Sheepshead minnow (*Cyprinodon variegatus*)
- Bluegill (*Lepomis macrochirus*)
- Channel catfish (*Ictalurus punctatus*)
- Rainbow trout (*Oncorhynchus mykiss*)

75

**Pick your invertebrate Surrogate****Enter Toxicity (µg/L)**

- Daphnid (*Daphnia magna*)
- Mysid (*Americanasys bahia*)

20

Option to use  
 two surrogates

Reset

Continue



# U.S. Environmental Protection Agency

## Interspecies Correlation Estimation

[Recent Additions](#) | [Contact Us](#)Search:  All EPA  This AreaYou are here: [EPA Home](#) » [Exposure Assessment](#) » [Food Chain](#) » [Web-ICE Home](#) » [SSD](#) » [SSD-Aquatic](#) » [SSD-Aquatic Results](#)

## Species Sensitivity Distributions - Aquatic

**Surrogate Species:** Fathead minnow (Pimephales promelas) ; Daphnid (Daphnia magna)**Input Toxicity:** 75;20 µg/LHC5  7.88 µg/L 95% Confidence Interval: 1.87 - 17.23

| <b>Common Name</b><br><a href="#">Sort</a>             | <b>Scientific Name</b><br><a href="#">Sort</a> | <b>Estimated Toxicity</b><br><a href="#">Sort</a> | <b>95% Confidence Intervals</b><br><a href="#">Sort</a> |
|--|--|---|---|
| <input checked="" type="checkbox"/> Mysid              | Americamysis bahia                             | 9.40  |   |
| <input checked="" type="checkbox"/> Northern pike      | Esox lucius                                    | 11.63   | 4.06 - 33.30  |
| <input checked="" type="checkbox"/> Atlantic salmon    | Salmo salar                                    | 13.39   | 3.61 - 49.68  |
| <input checked="" type="checkbox"/> Brown trout        | Salmo trutta                                   | 13.52   | 3.85 - 47.40  |
| <input checked="" type="checkbox"/> Shortnose sturgeon | Acipenser brevirostrum                         | 14.83   | 7.05 - 31.20  |
| <input checked="" type="checkbox"/> Pink shrimp        | Farfantepenaeus duorarum                       | 15.61   | 0.398 - 612.31  |
| <input checked="" type="checkbox"/> Amphipod           | Gammarus pseudolimnaeus                        | 16.70   | 6.02 - 46.33  |
| <input checked="" type="checkbox"/> Brook trout        | Salvelinus fontinalis                          | 18.98   |   |
| <input checked="" type="checkbox"/> Daphnid            | Simocephalus serrulatus                        | 19.10   | 7.87 - 46.34  |
| <input checked="" type="checkbox"/> Smallmouth bass    | Micropterus dolomieu                           | 19.66   | 4.35 - 88.92  |
| <input checked="" type="checkbox"/> Fountain darter    | Etheostoma fonticola                           | 20.64   | 10.63 - 40.09   |
| <input checked="" type="checkbox"/> Lake trout         | Salvelinus namaycush                           | 21.02   | 11.05 - 40.02   |

**Predicted from invertebrate**

\* Input toxicity less than model minimum of 93.07

**predicted from fish****Exposure Assessment Models****Web-ICE Home**  
**Aquatic Species**  
**Aquatic Genus**  
**Aquatic Family**  
**Wildlife Species**  
**Wildlife Family****Species Sensitivity Distributions****Aquatic Wildlife****Basic Information****User Manual****Download Model Data****Bibliography**

# 2009 update: Improved SSD surrogate choices

U.S. ENVIRONMENTAL PROTECTION AGENCY

Bookmar

## Interspecies Correlation Estimation

Recent Additions | Contact Us   Search:  All EPA  This Area

You are here: [EPA Home](#) » [Exposure Assessment](#) » [Food Chain](#) » [Web-ICE Home](#) » [SSD](#) » [SSD-Aquatic](#)

### Species Sensitivity Distributions - Aquatic Species

#### Multiple Surrogate SSD

Surrogate:

No more than 25 species may be chosen for one calculation.

Sort By: Common Name

| Species  | Toxicity | Remove Species                                |
|--|----------|---|
| American eel ( <i>Anguilla rostrata</i> )              |          | <input type="button" value="Remove Species"/> |
| Amphipod ( <i>Hyalella azteca</i> )                    |          | <input type="button" value="Remove Species"/> |
| Bluegill ( <i>Lepomis macrochirus</i> )                |          | <input type="button" value="Remove Species"/> |
| Bryozoan ( <i>Lophopodella carteri</i> )               |          | <input type="button" value="Remove Species"/> |
| Copepod ( <i>Acartia clausi</i> )                      |          | <input type="button" value="Remove Species"/> |
| White perch ( <i>Morone americana</i> )                |          | <input type="button" value="Remove Species"/> |
| Stonefly ( <i>Pteronarcella badia</i> )                |          | <input type="button" value="Remove Species"/> |
| Southern rainbow ( <i>Villosa vibex</i> )              |          | <input type="button" value="Remove Species"/> |
| Spotfin chub ( <i>Erimonax monachus</i> )              |          | <input type="button" value="Remove Species"/> |
| Amphipod ( <i>Gammarus fasciatus</i> )                 |          | <input type="button" value="Remove Species"/> |
| Amphipod ( <i>Gammarus pseudolimnaeus</i> )            |          | <input type="button" value="Remove Species"/> |
| Atlantic silverside ( <i>Menidia menidia</i> )         |          | <input type="button" value="Remove Species"/> |
| Bay scallop ( <i>Argopecten irradians</i> )            |          | <input type="button" value="Remove Species"/> |
| Blue mussel ( <i>Mytilus edulis</i> )                  |          | <input type="button" value="Remove Species"/> |
| Daggerblade Grass shrimp ( <i>Palaemonetes pugio</i> ) |          | <input type="button" value="Remove Species"/> |
| Cape Fear shiner ( <i>Notropis mekistocholas</i> )     |          | <input type="button" value="Remove Species"/> |
| Walleye ( <i>Sander vitreus</i> )                      |          | <input type="button" value="Remove Species"/> |
| Common carp ( <i>Cyprinus carpio</i> )                 |          | <input type="button" value="Remove Species"/> |

Select from all surrogates in database;  
Up to 25 surrogate inputs per SSD

# 2009 update: Improved SSD output

U.S. ENVIRONMENTAL PROTECTION AGENCY



## Interspecies Correlation Estimation


[Recent Additions](#) | [Contact Us](#)

 Search:  All EPA  This Area

 You are here: [EPA Home](#) » [Exposure Assessment](#) » [Food Chain](#) » [Web-ICE Home](#) » [SSD](#) » [SSD-Aquatic](#) » [SSD-Aquatic Results](#)

 Exposure Assessment  
Models

[Web-ICE Home](#)  
[Aquatic Species](#)  
[Aquatic Genus](#)  
[Aquatic Family](#)  
[Wildlife Species](#)  
[Wildlife Family](#)
[Species Sensitivity  
Distributions](#)
[Aquatic  
Wildlife](#)
[Basic Information](#)
[User Manual](#)
[Download Model Data](#)
[Bibliography](#)

## Species Sensitivity Distributions - Aquatic

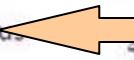
**Surrogate Species:** Blue crab (*Callinectes sapidus*), Channel catfish (*Ictalurus punctatus*), Rainbow trout (*Oncorhynchus mykiss*)

**Input Toxicity:** 150, 200, 250 µg/L

HC5 30.58 µg/L 95% Confidence Interval: 7.41 - 57.81

| Common Name<br><a href="#">Sort</a>               | Scientific<br><a href="#">Sort</a> | Estimated<br>Toxicity<br><a href="#">Sort</a> | 95% Confidence<br>Intervals<br><a href="#">Sort</a> | Show Data:<br><a href="#">Surrogate</a><br><a href="#">Sort</a> |
|---|------------------------------------|---|---|---|
| <input checked="" type="checkbox"/> Stonefly      | <i>Claassenia sabulosa</i>         | 1.94  | 0.805 - 4.68  | Channel catfish ( <i>Ictalurus punctatus</i> )                  |
| <input checked="" type="checkbox"/> Stonefly      | <i>Pteronarcella badia</i>         | 3.46  | 1.80 - 6.67   | Channel catfish ( <i>Ictalurus punctatus</i> )                  |
| <input checked="" type="checkbox"/> Amphipod      | <i>Gammarus lacustris</i>          | 12.14   | 4.72 - 31.19  | Rainbow trout ( <i>Oncorhynchus mykiss</i> )                    |
| <input checked="" type="checkbox"/> Stonefly      | <i>Pteronarcys californica</i>     | 30.44   | 13.44 - 68.94                                       | Rainbow trout ( <i>Oncorhynchus mykiss</i> )                    |
| <input checked="" type="checkbox"/> Daphnid       | <i>Daphnia pulex</i>               | 43.79   | 1   |   |
| <input checked="" type="checkbox"/> Pink shrimp   | <i>Farfantepenaeus duorarum</i>    | 47.10   | 2   |   |
| <input checked="" type="checkbox"/> Mysid         | <i>Americamysis bahia</i>          | 49.87   | 12.59 - 197.51                                      | Rainbow trout ( <i>Oncorhynchus mykiss</i> )                    |
| <input checked="" type="checkbox"/> Northern pike | <i>Esox lucius</i>                 | 50.39   | 21.07 - 120.47                                      | Channel catfish ( <i>Ictalurus punctatus</i> )                  |
| <input checked="" type="checkbox"/> Amphipod      | <i>Gammarus pseudolimnaeus</i>     | 68.03   | 25.20 - 183.64                                      | Rainbow trout ( <i>Oncorhynchus mykiss</i> )                    |

Estimate based on best fit ICE model  
of input surrogate species



# Attributes of Web-ICE

## Defensibility

- cross-validation of models provides user with estimate of model performance
- all models significant

## • User guidance

- clearly outlined
- uncertainty analyses identify “Rules of Thumb” (Aquatic complete in 2009)
- Web-ICE alerts users to potentially poor-fitting data

## • Dynamic application easy to update

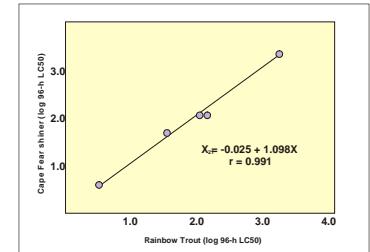
- updated & new models with new toxicity data
- update user-friendliness through user feedback
- new modules to meet ecorisk needs



# Applications: Ecological Risk Assessment

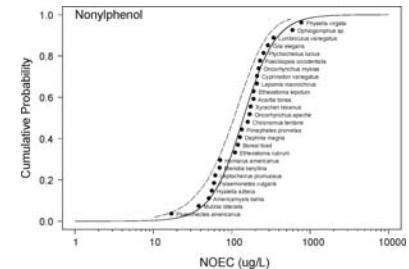
## Direct toxicity estimation

- >14,000 standardized QC'd acute tox records
- 2000+ chemicals, 400+ species
- 2000 interspecies models



## Species Sensitivity Distributions

- populate SSDs and derive HC5/HD5
- high accuracy, easy to use
- link to QSAR



## Endangered species risk assessment

- Web-ICE module in development
- Direct toxicity estimation
- SSD approach: 97% T&E >HC5; 99% T&E >HC1  
(Raimondo et al. 2008. ETC 27:2599-2607)



# Web-ICE Future Research Directions

- **Internet platform allows for dynamic product**
  - updates of latest model development
  - continuous improvement of user-friendliness
  - updates occur in short time frame
- **Expand SSD Module**
  - include option to select distribution type
  - include model information on output screen
- **2009-2010 Research**
  - QSAR to ICE linkage
  - ICE chronic toxicity models
  - Algal models
  - MOA specific aquatic models
- **FUTURE Modules**
  - Endangered Species module (2009)
  - Algal ICE (2009)





<http://www.epa.gov/ceampubl/fchain/webice/index.htm>