

# ***Biogeography of Nonindigenous Species: From Description to Prediction***

**By**

**Deborah A. Reusser**

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# Overview

- Introduction to Nonindigenous Species
- Design of an Ecosystem Informatics Framework for Marine Biogeography and Natural History
- Developing a Management Strategy for Ballast Water Discharge Standards
- Ecological Niche Modeling for Prediction

*Puget Sound, WA - August 2006*

# Ecological Problem

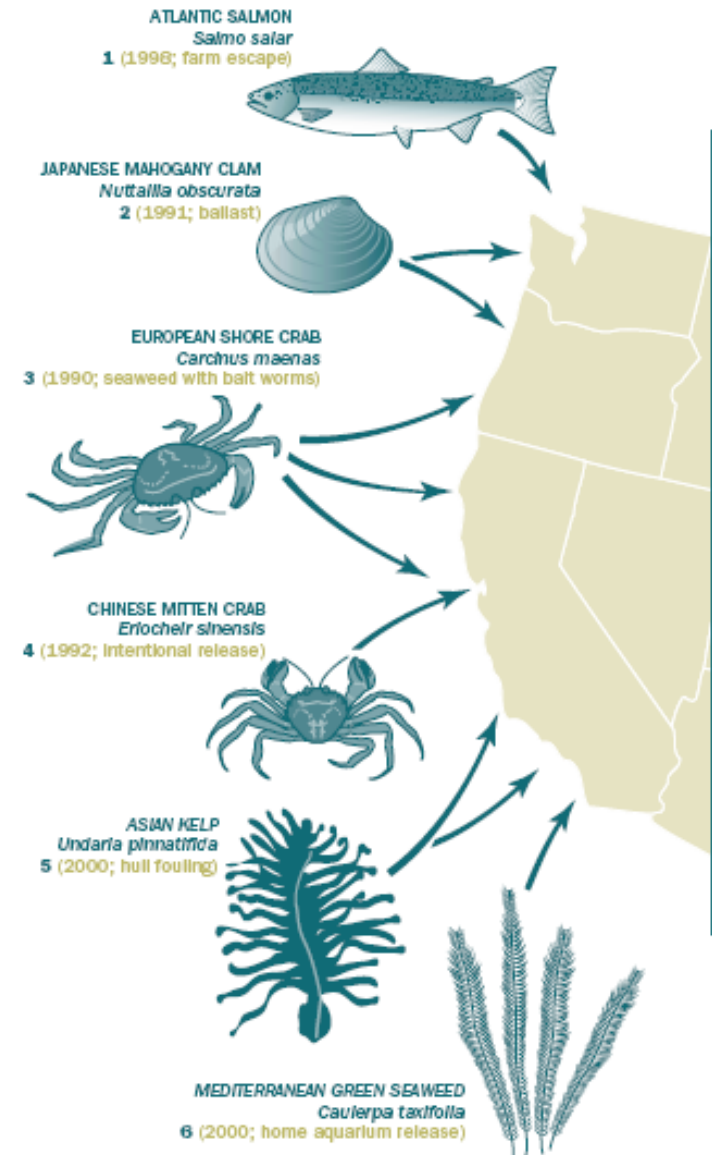
**Nonindigenous Species (NIS)**  
those species not native to a region - can have serious economic and environmental effects when they establish in new regions.

**Eradicating aquatic NIS after establishment is expensive and typically unsuccessful.**

**Prevention is the best strategy to address NIS in estuarine and coastal environments.**

Carlton, J.T. 2001. Introduced Species in U.S. Coastal Waters

## Some Recent Bioinvasions in U.S. Coastal Waters



# First Step

Regional and  
Local Databases  
containing  
samples and  
species  
distributions

## List of Pacific Coast Estuaries where a species had been found



# Evolution of Scale & Scope



**Watershed Characteristics  
for an Estuary**

**Classification**

**Invasion vectors**

**Global distribution**



**Taxonomy**

**Habitat  
affinities**

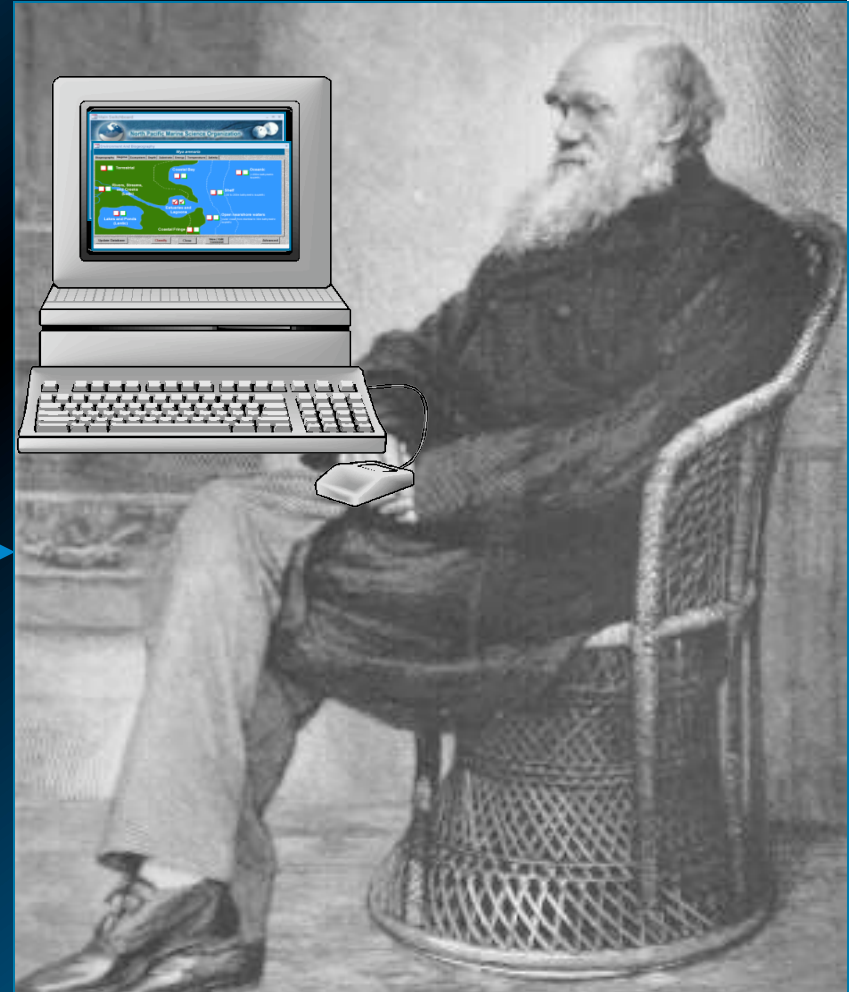
**Life history  
characteristics**

**Integrated Schemas for  
Capturing Diverse Information**

# Ecosystem Informatics Framework for Marine Biogeography and Natural History



**Text Based**



**Informatics Based**



# Basic Principles & Assumptions



**For many questions, classes for habitat requirements and/or physiological tolerances will suffice.**

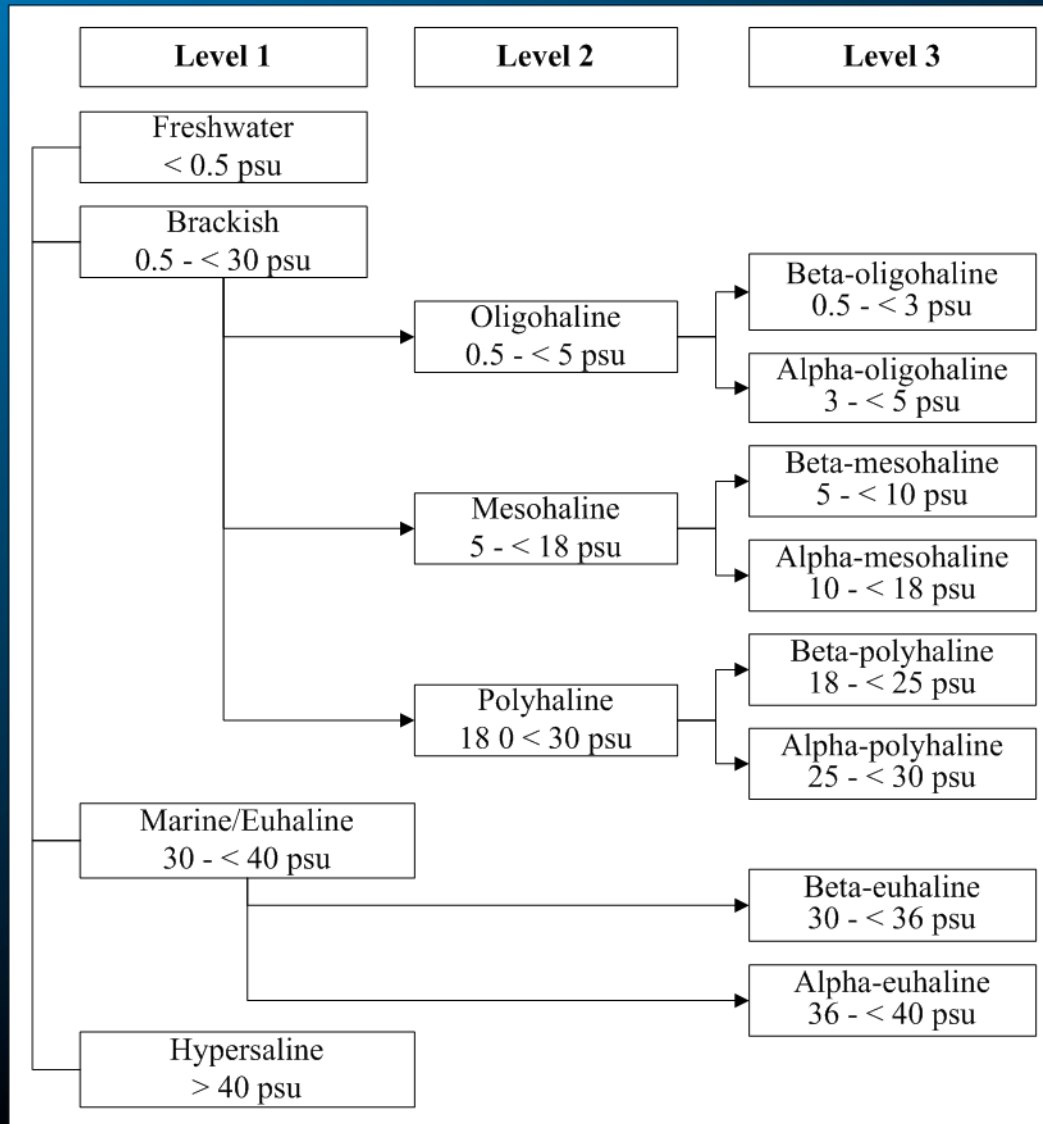
**Capture information by hierarchical classes where possible to accommodate different levels of knowledge and needs.**

**Geography is biology – use distributions to infer habitat specificity.**

**Queriable natural history requires standardization even at the loss of some ecological nuances.**

**Use established classification schemas if possible.**

# Hierarchical Schema for Salinity



- Example of a schema for a quantitative attribute hierarchical structure easily imposed

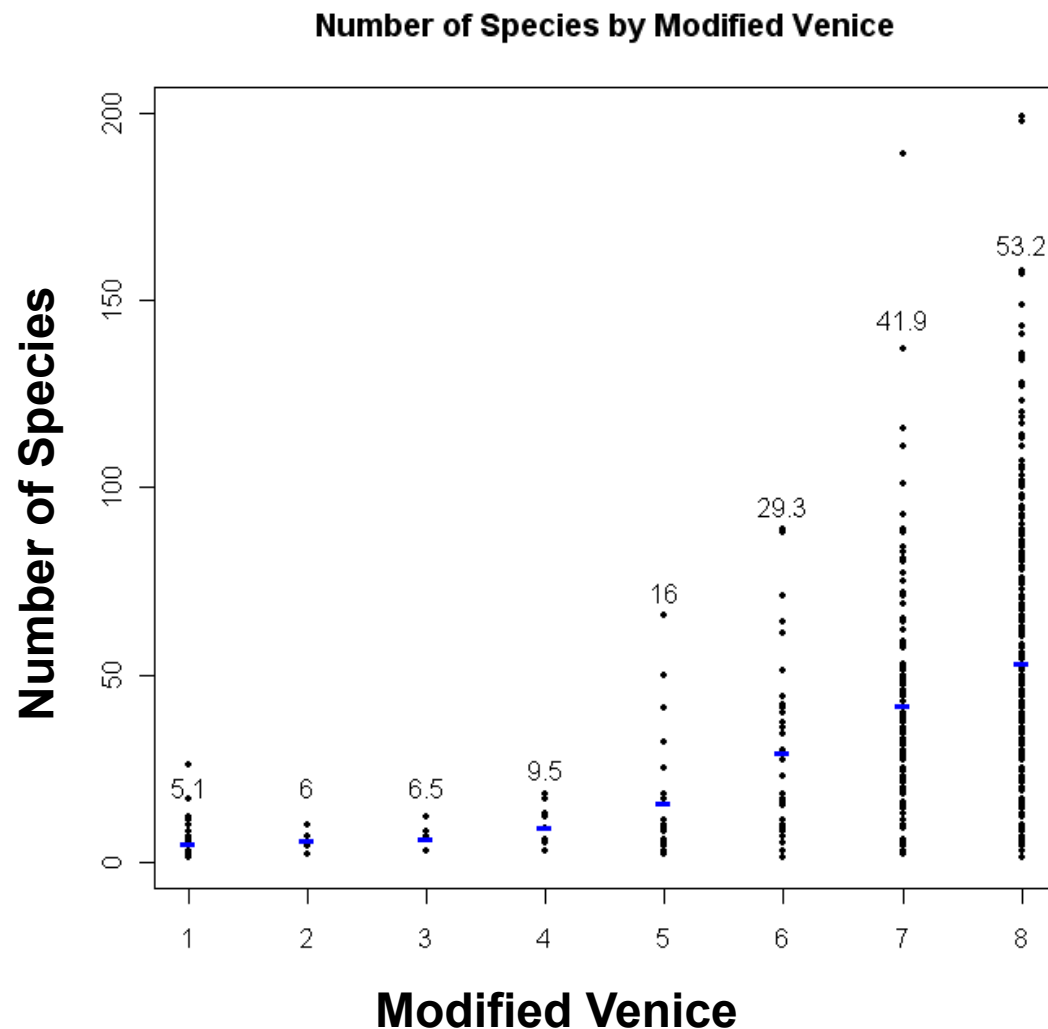
- Level 1 : FishBase

- Level 2 : Venice System developed by the International Union for Biological Sciences (IUBS, 1958).

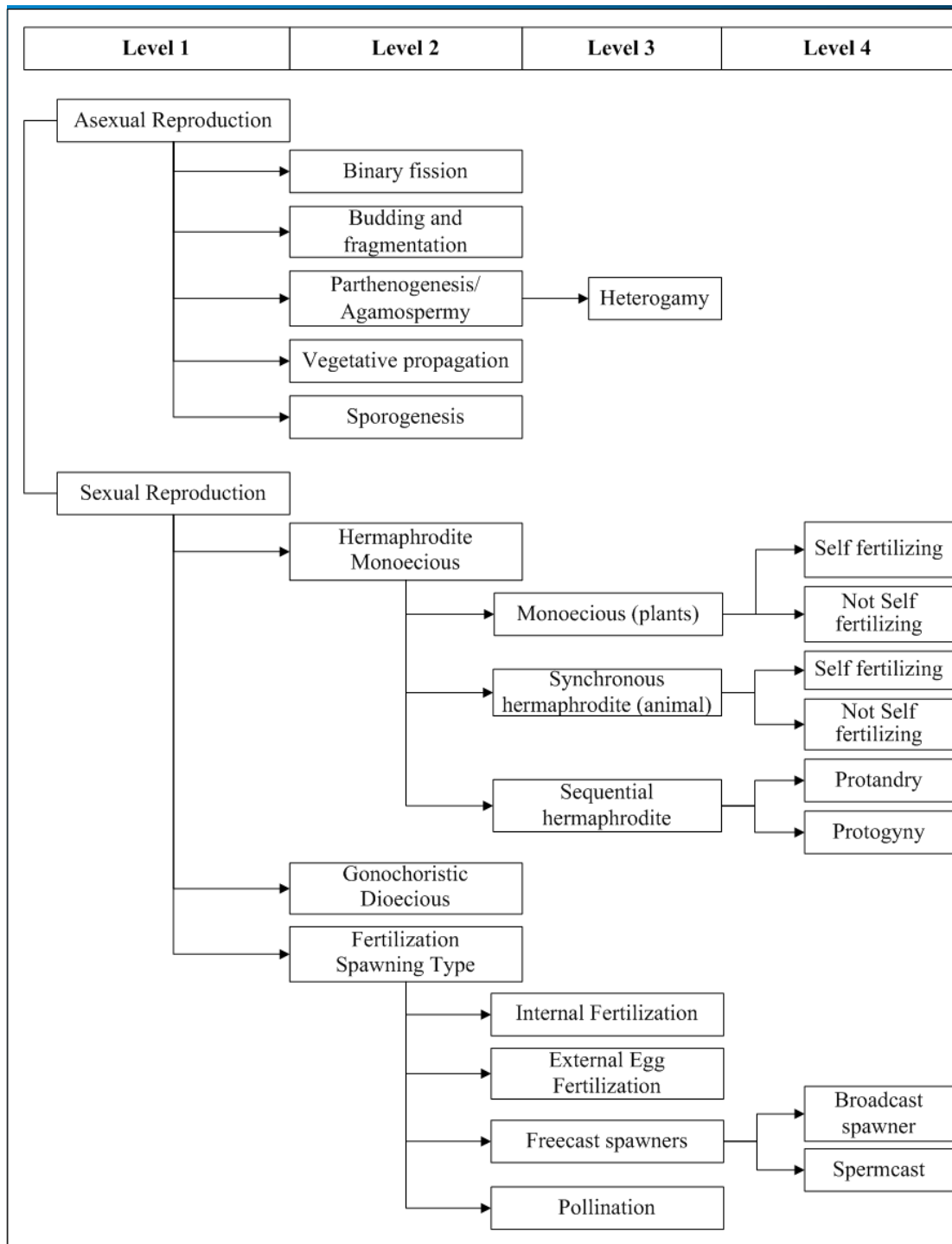
- Level 3 : Modified Venice System based on the Baltic system (IUBS, 1958)



# Salinity Values Converted to Modified Venice Classes



- Number of species as a function of salinity class
- As predictive as quantitative values in many cases
- Quant  $R^2 = .21$
- Class  $R^2 = .22$



# Reproduction Hierarchical Schema

- Example of qualitative Life history characteristic
- Structure can be imposed across all phyla but it is “messy”



# Geographic Distribution Schema

## Marine Biogeographic Hierarchical Schema

Realm

Region

Province

Ecoregion

## Land/Sea Connection Hierarchical Schema

Aggregation Levels for Complex Systems

Waterbody System

Basin

Sub-Basin

Estuary

Bay

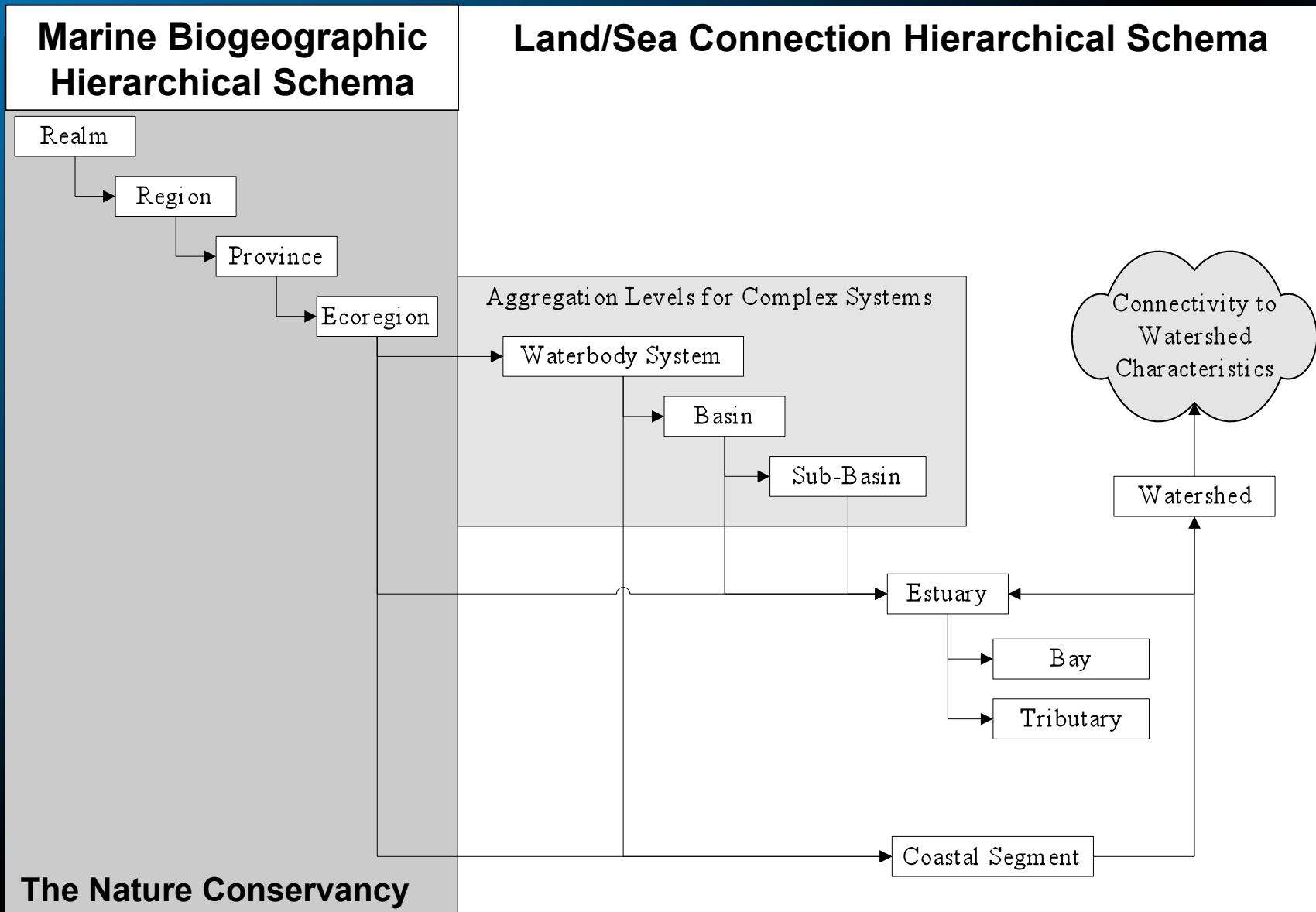
Tributary

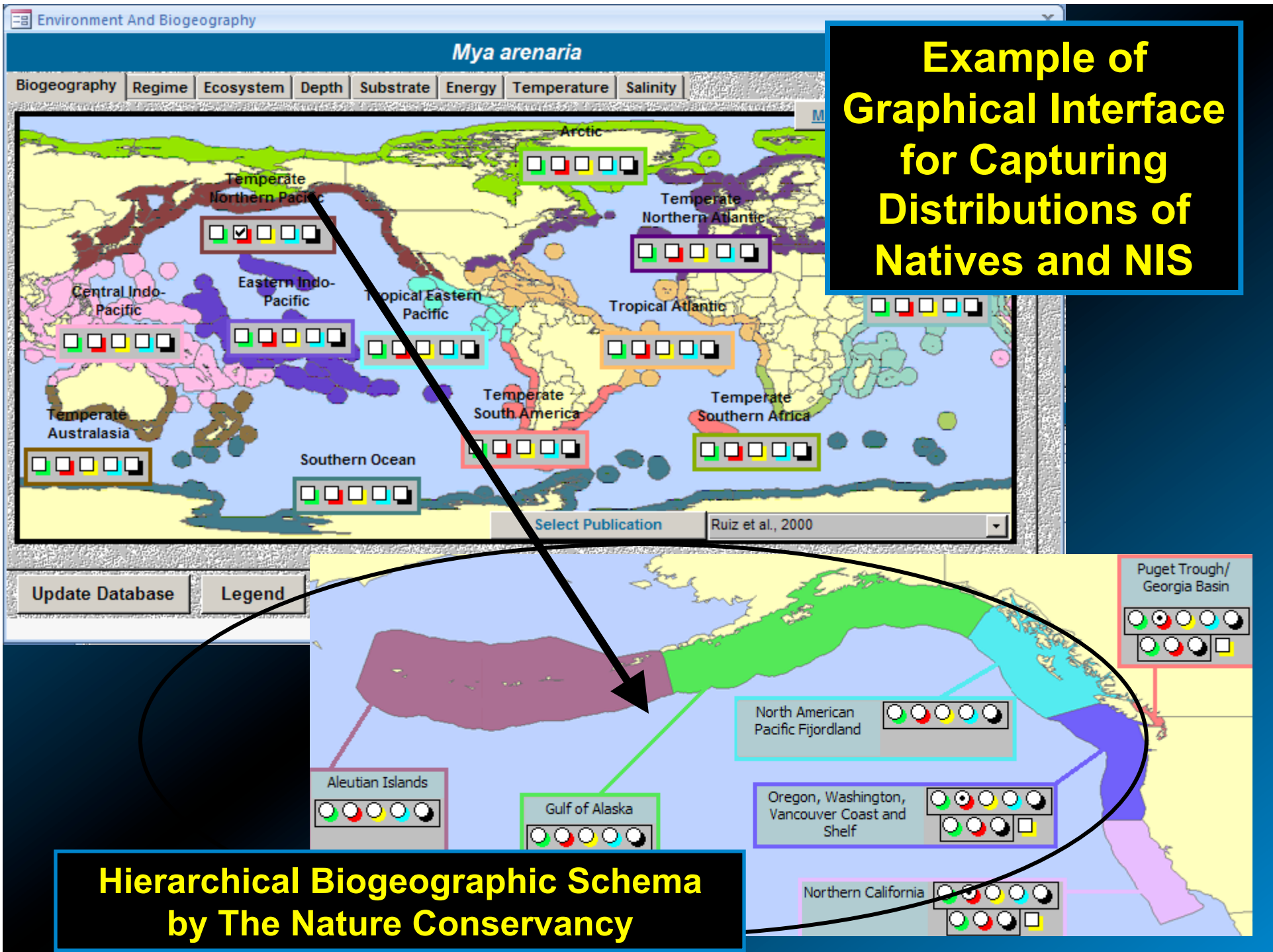
Coastal Segment

Connectivity to  
Watershed  
Characteristics

Watershed

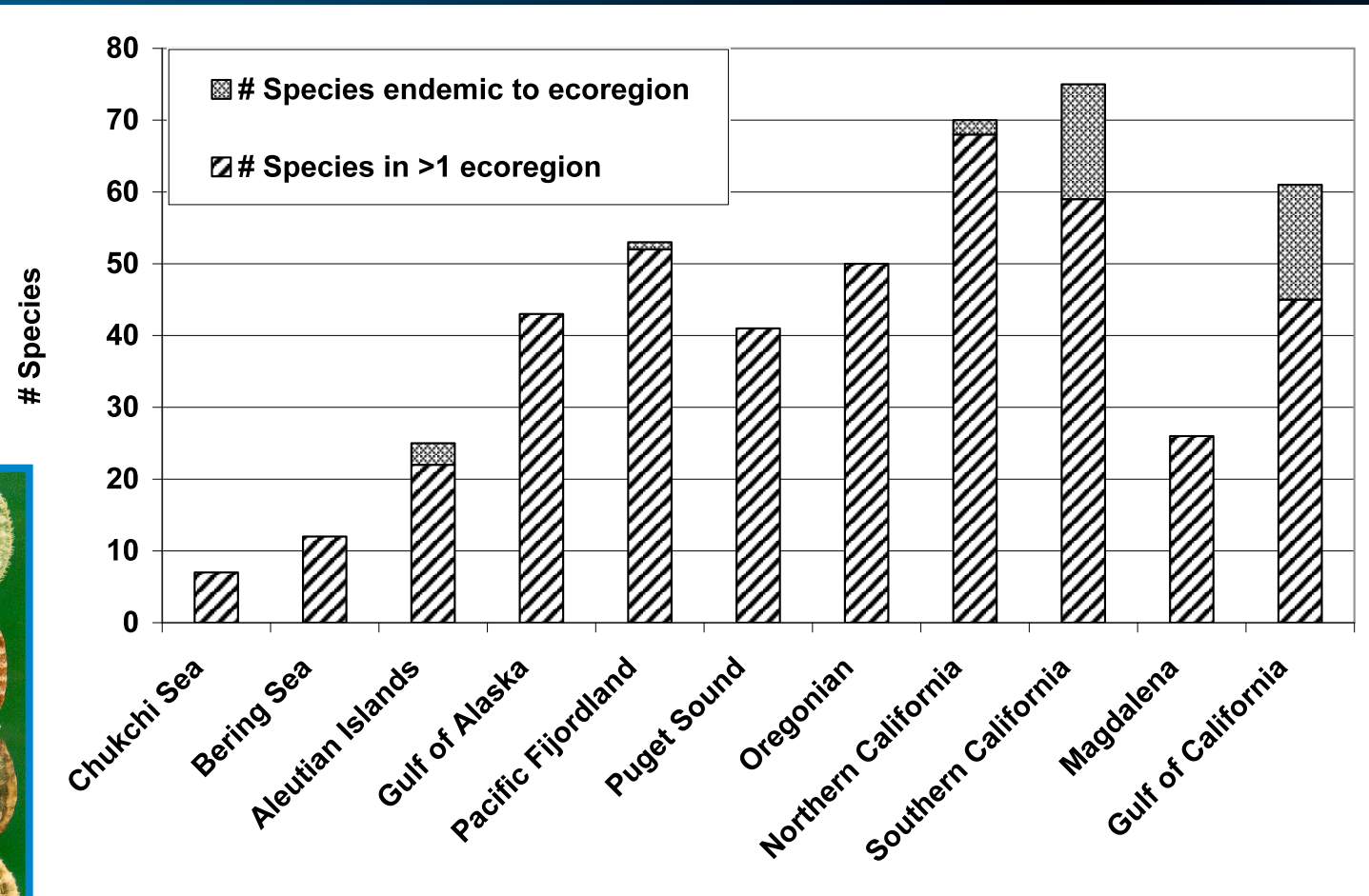
The Nature Conservancy







# Number of Chitons by Ecoregions in the Northeast Pacific & Arctic



# Summary

**Capturing physical requirements,  
distributions, and life history characteristics  
in an integrated information system**

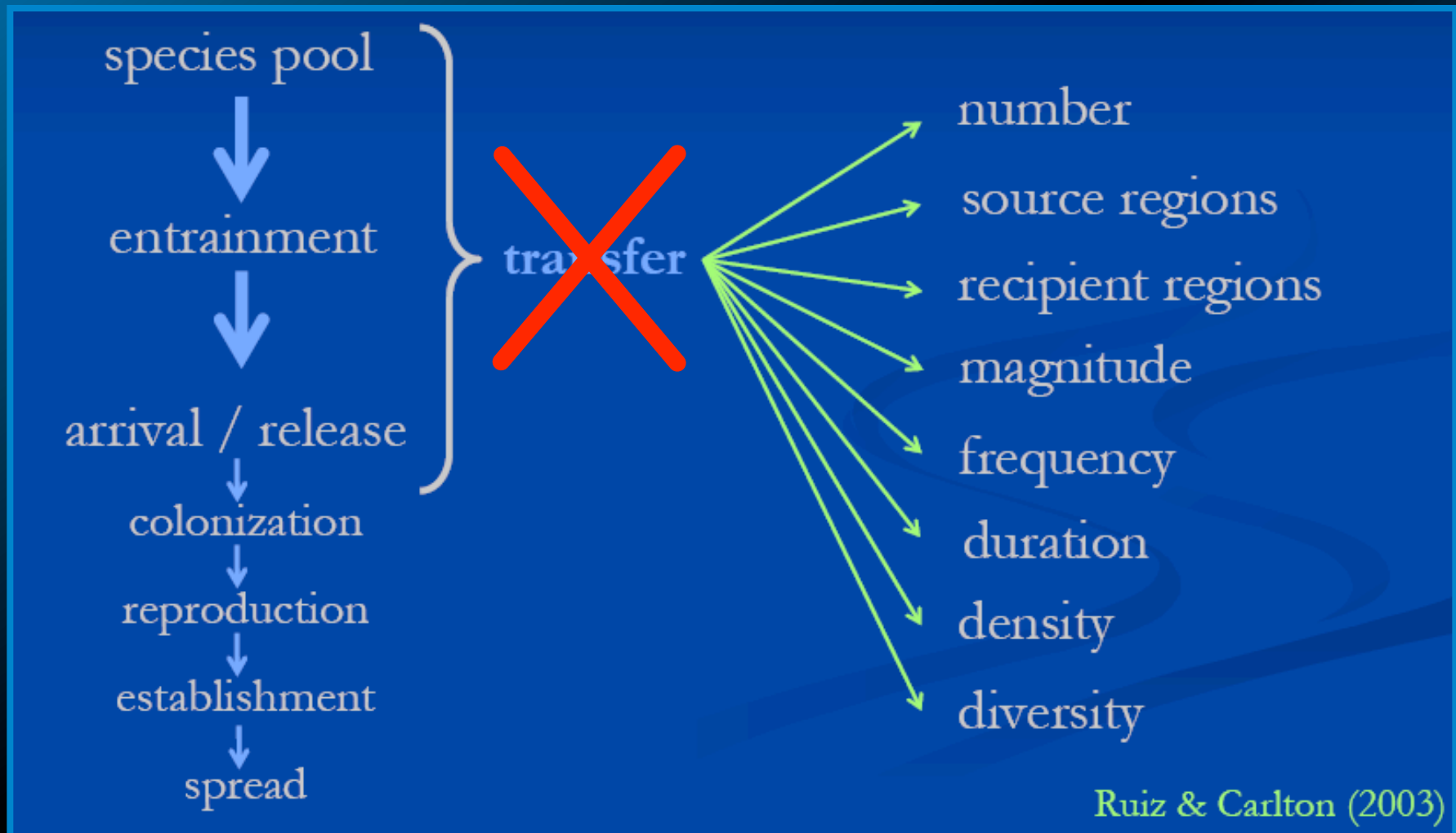
**provides a framework for synthesizing and  
analyzing biological information across  
biogeographic regions, habitats, guilds,  
classifications, or unique slices of each.**



# Using Information to predict

- **Probability of Invasion from Ballast Water Discharges**
- **Spatial Distributions of Native and Nonindigenous Species (NIS)**

# Invasion Ecology is Complicated





# Vectors For NIS

**Primary Vector:** Initial process that transports a species from its native region to a recipient region.

**Secondary Vector:** Process that redistributes nonindigenous species within the recipient region (along coastline).

## Shipping Ballast, Fouling & Boring



## Along-shore Drift



## Migratory Birds & Wildlife



## Aquaculture



## Recreational Boats



## Fishing Boats



# Pacific Shipping Routes – Primary Vector

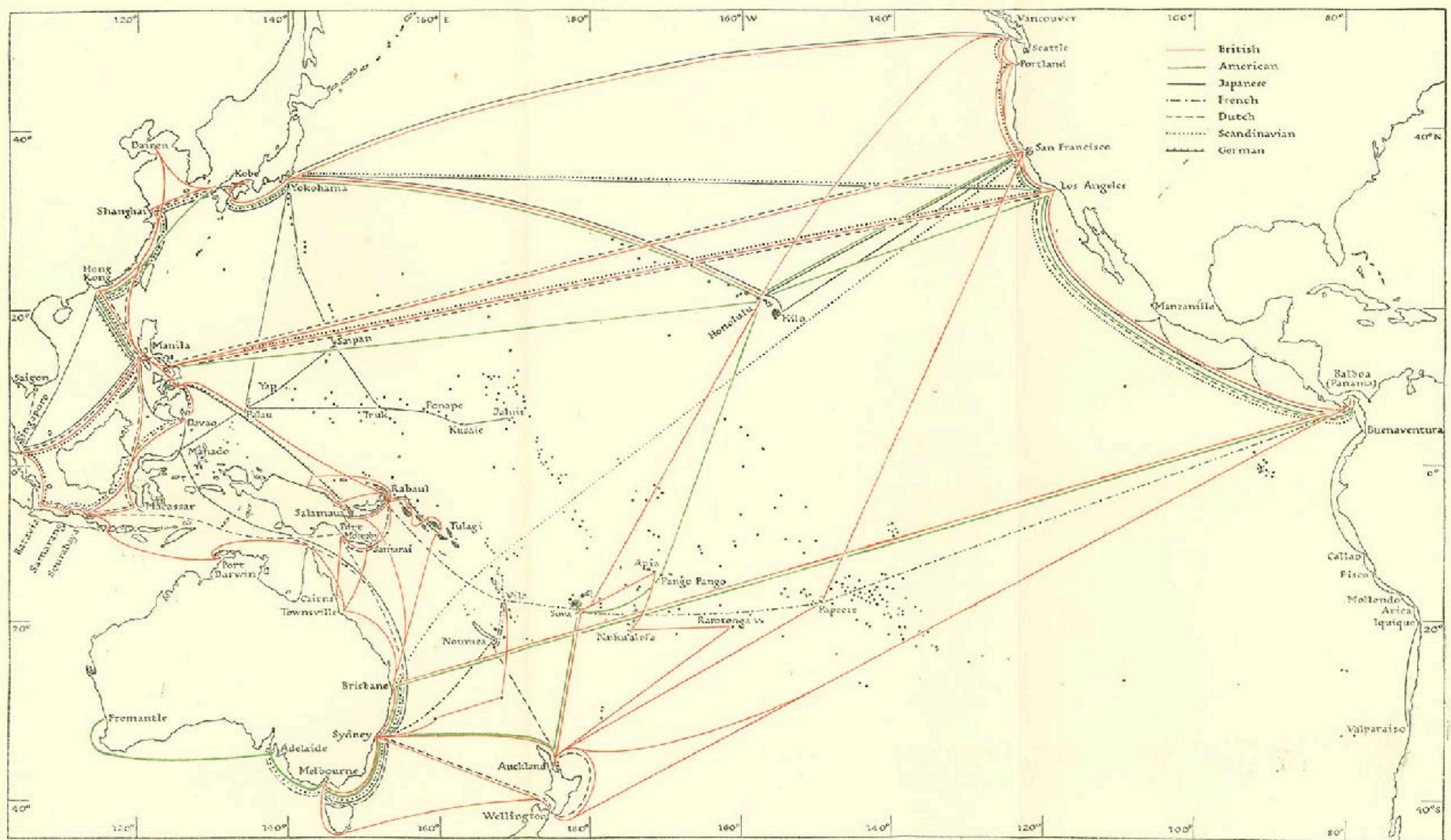


Fig. 117. Shipping routes in the Pacific, showing national interests  
This map shows the nationality of vessels operating on the principal routes in 1938-9. Based on various sources.



# Management Strategy for Ballast Water



**Ballast water was a possible vector in ~70% of shipping-based introductions.**

**Fofonoff, et al., 2003**



# Ballast Water Seascape

1000s of species are being transported in ballast water  
most of which we can not even identify

Dozens to hundreds of International ports in the U.S.

History of ballast water uptake and discharge is  
convoluted and complex and impossible to predict for  
any particular ship

Voyage times are getting shorter – better survival

About 110,000 domestic and international ship arrivals  
to U.S. port annually

International traffic is predicted to increase

***Not possible to model all these complexities***

# IMO Standards

## International Ballast Water Treaty

- International Maritime Organization has established organism concentration limits in ballast water discharge



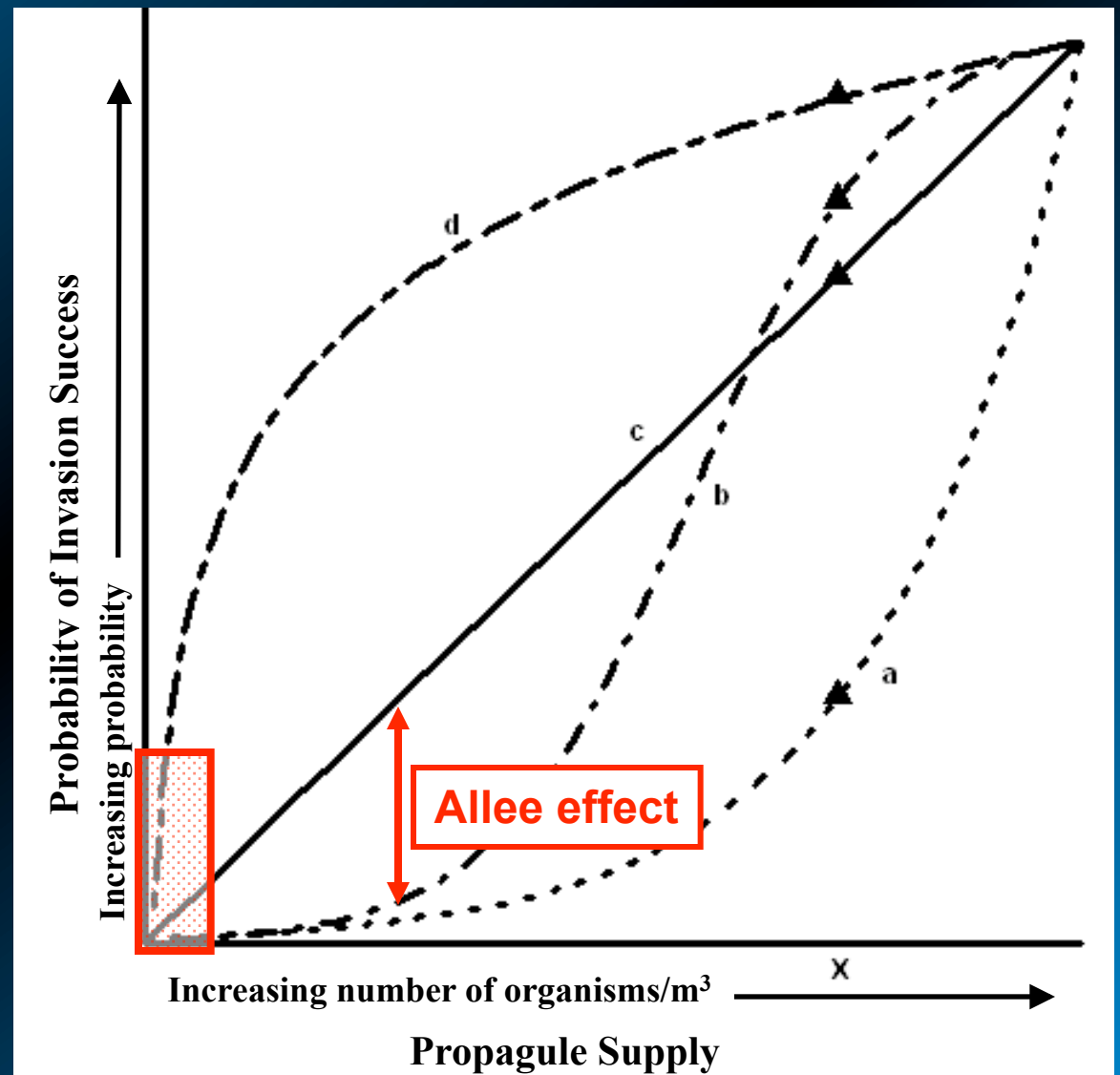
Organism Size Class	IMO Regulation D-2 <sup>(1)</sup>
Organisms greater than 50 µm <sup>[3]</sup> in minimum dimension	< 10 viable organisms per cubic meter
Organisms 10 – 50 µm in minimum dimension	< 10 viable organisms per ml <sup>[4]</sup>
Living organisms less than 10 µm in minimum dimension	
<i>Escherichia coli</i>	< 250 cfu <sup>[5]</sup> /100 ml
Intestinal enterococci	< 100 cfu/100 ml
Toxicogenic <i>Vibrio cholerae</i> (O1 & O139)	< 1 cfu/100 ml or < 1 cfu/gram wet weight zooplankton samples

# Propagule Pressure: Dose-Response Relationship

**a & b: Allee effects**  
– the results will be more protective for lower concentrations

**c: Linear response**

**d: Unknown response**



From Ruiz & Carlton, 2003



# Objective

## An Approach to Generating National Ballast Water Discharge Standards

**Develop a linear model to predict  
invasion risk from historical invasion  
estimates and organism concentrations  
in ballast water discharges.**

*New Zealand – August 2005*

# Coastal Invasion Statistics

Coast	Annual Foreign Ballast*	# Invaders 1981-2006	# Ships	High PCIP
East	7,407,832	40	12,860	4.64E-11
Pacific	14,788,369	67	5998	3.83E-11
Gulf	19,605,340	18	11,821	7.67E-12

**\*Average annual foreign ballast water discharged  
calculated from records between 2005 – 2007**

PCIP was also calculated for 17 international ports but it created uncertainty in Invasion rate due to secondary dispersal so analysis was redone using coastal data.



# Linear Model

$$\text{Per Capita Invasion Probability (PCIP)} = \frac{\text{Historical Invasions}}{\text{BW Discharge} * \text{BW Concentration}}$$

**PCIP is the probability that an individual organism will become a new invader in an location**

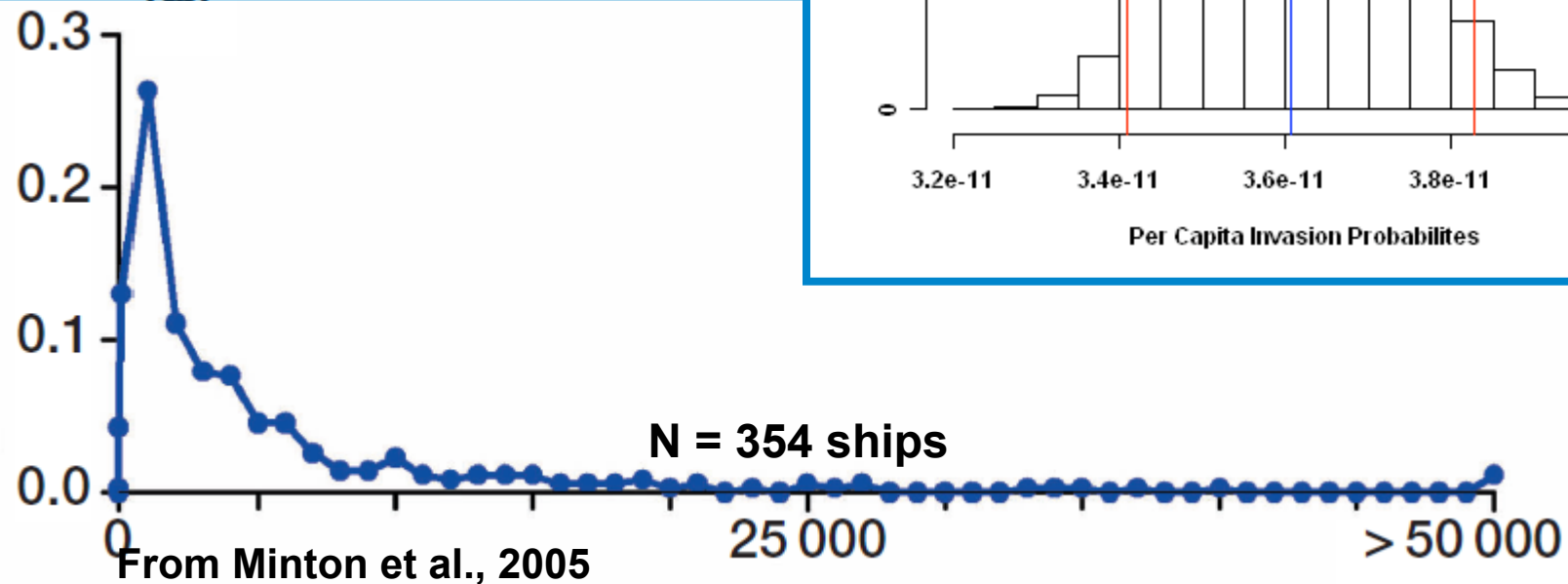
$$\text{Propagule Supply} = \text{BW Discharge} * \text{BW Organism Concentration}$$



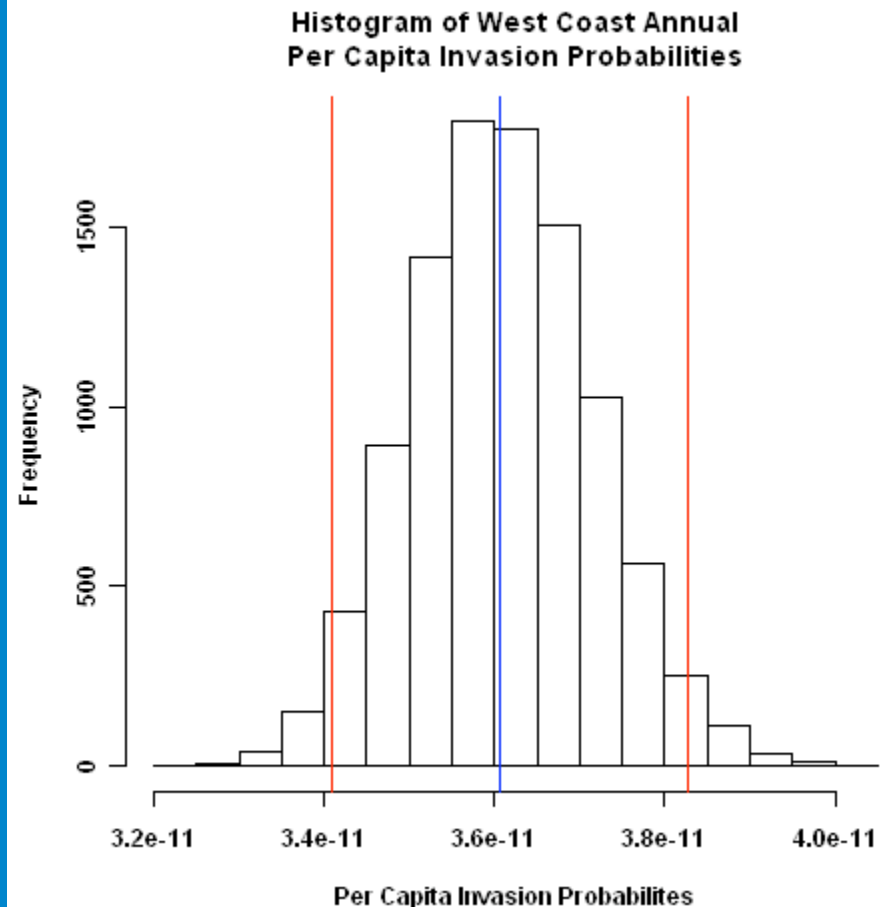
# Simulation to Calculate Range of Invasion Probabilities

Not all ships' ballast is equal (large variance)

Proportion of Ships

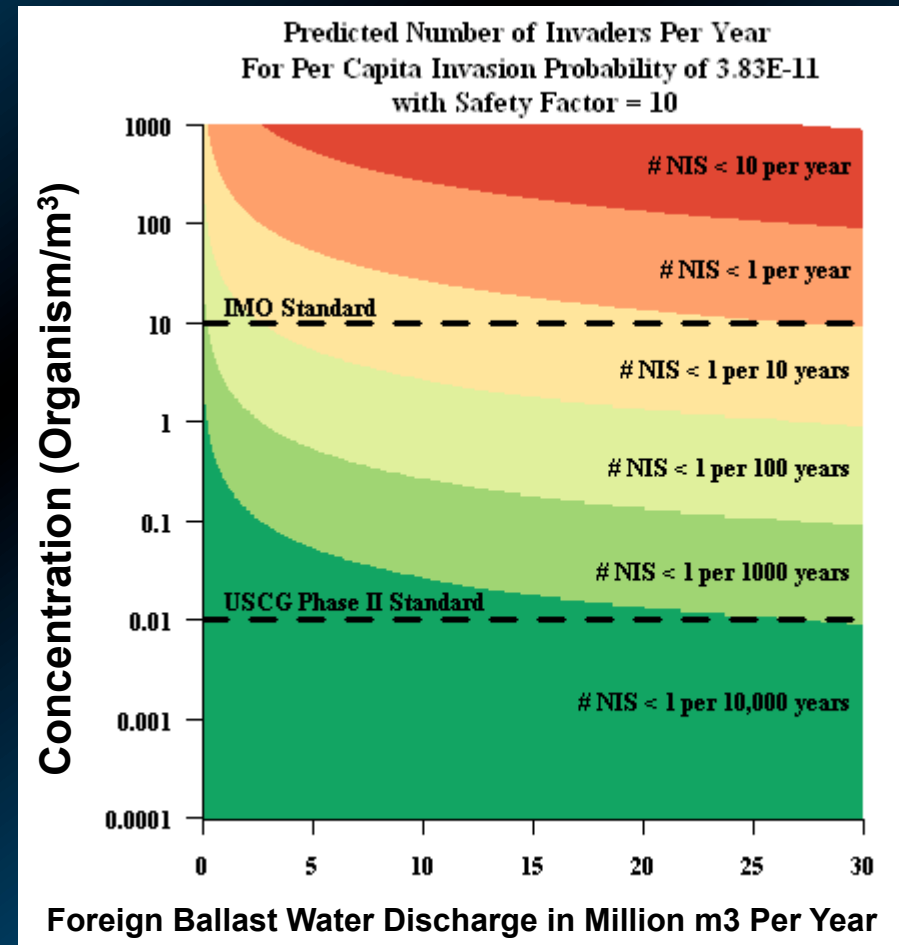


Organism Concentrations in Ballast Water per m<sup>3</sup>



# “Regulatory Landscape” of Establishment Probabilities

- Colors indicate number of invaders per year as a function of ballast water discharge and organism concentrations.
- For less than 1 invader per 10,000 years, ballast water and organism concentrations must be in the dark green area.



$$\text{Invasion rate} = \text{PCIP} * \text{Concentration} * \text{Total Discharge} * \text{Safety Factor}$$

# Advantages

- **The complexities existed historically so have been captured in the historical invasion rate**
- **It's simple and the assumptions are clear**
- **Not restricted to a particular guild or taxon**
- **Level of uncertainty can be assessed with new information**
- **The level of uncertainty in the coastal models is within an order of magnitude which is better than other approaches**



# After NIS Arrive Where Will They Establish?



*New Zealand – August 2005*

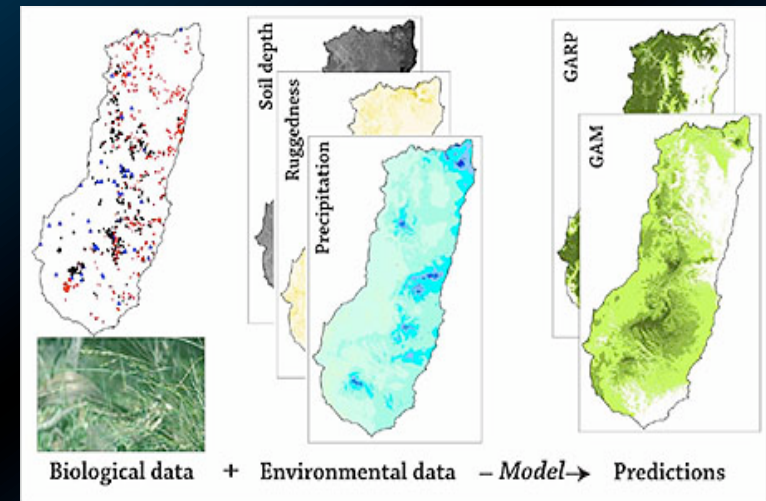


# Ecological Niche Modeling for Prediction

Evaluate a niche modeling approach using species with known distributions.

Evaluate the model at different spatial scales.

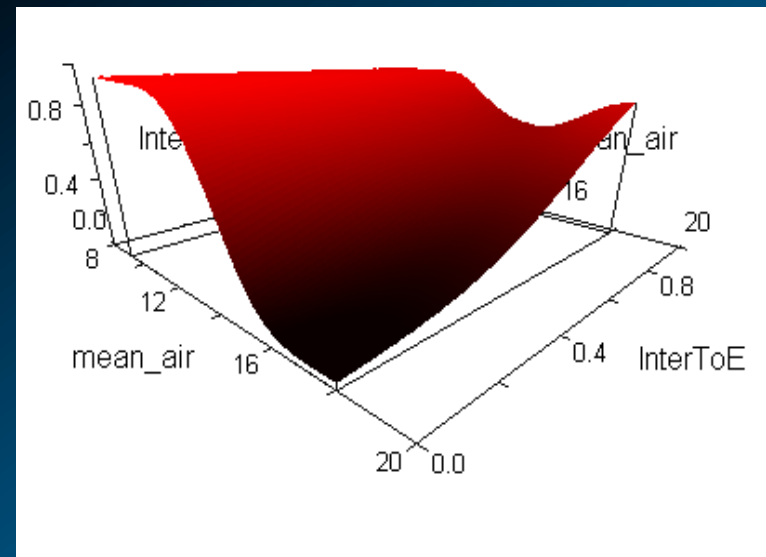
Evaluate different classes of environmental variables.



## Niche Model Evaluated

### Nonparametric Multiplicative Regression

NPMR represents a species' response surface in multidimensional niche space by smoothing the species response in a local area of predictor space by combining information from nearby observations.

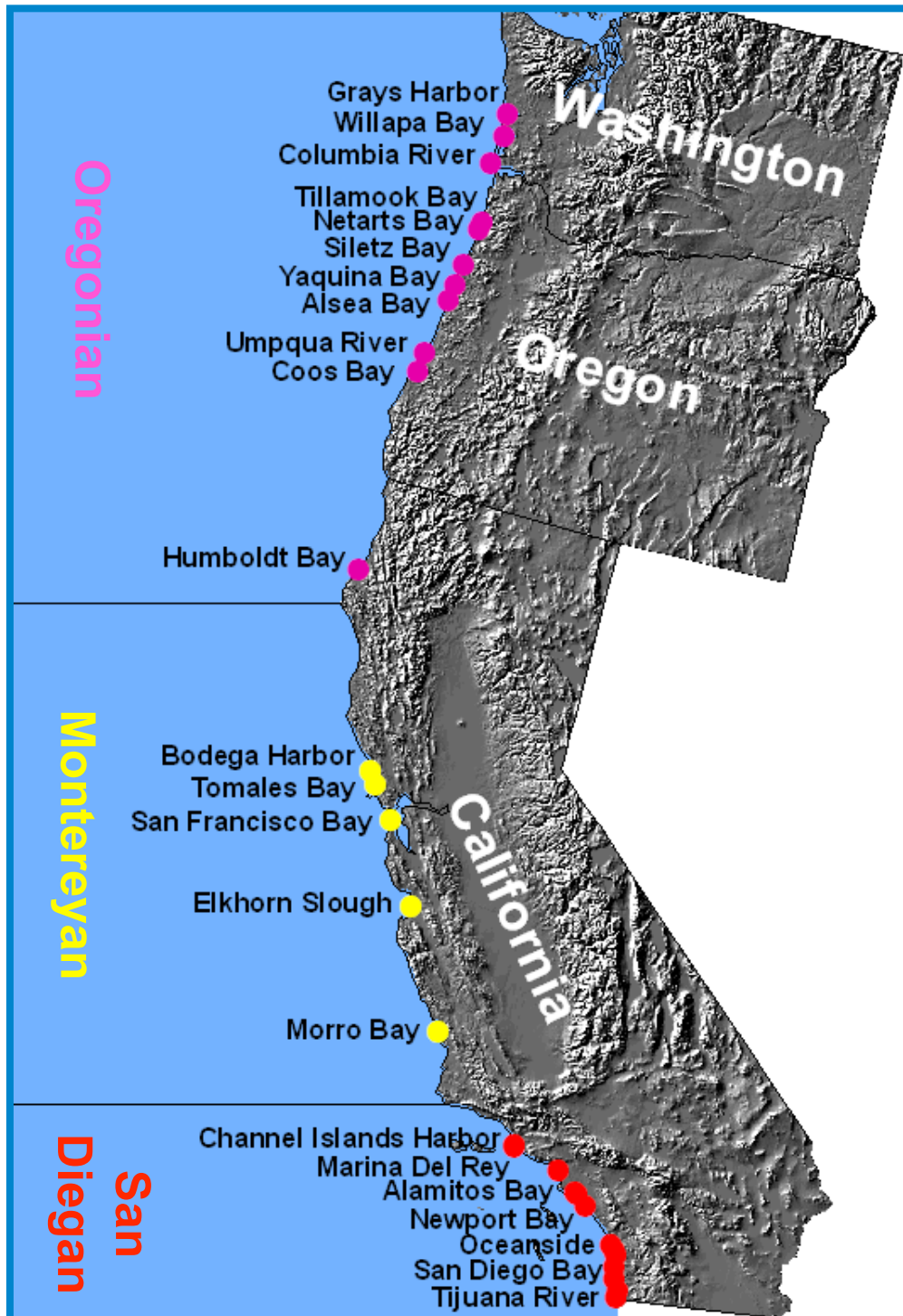




# Advantages of NPMR

- Incorporates interactions among multiple ecological variables.
- Allows quantitative and categorical habitat variables.
- Utilizes both absences as well as presence data.
- Built-in controls for overfitting.





# Estuary Scale

- Estuaries with at least 100 species (N = 28)
- Distributed across 3 biogeographic ecoregions

# Habitat Scale



**EMAP  
1999 - 2003**

**AK - CA**

**Total = 664 benthic samples**

## **Estuary Scale**

### **Watershed**

- Land area
- Water area
- Intertidal area
- Subtidal area
- Riverine area

### **Climate**

- Temperature
- Precipitation

### **Geomorphologic**

- Water/land
- Subtidal/intertidal
- Riverine/estuarine
- Intertidal/estuarine

## **Variables**

### **Geographic**

- Biogeographic Zone
- Latitude

## **Habitat Scale**

### **Habitat**

- Sediment
- Depth
- Salinity

### **Ecological Engineering**

- P/A Burrowing Shrimp
- P/A Marsh Plants
- P/A Seagrass
- P/A Macroalgae

# Species Selection

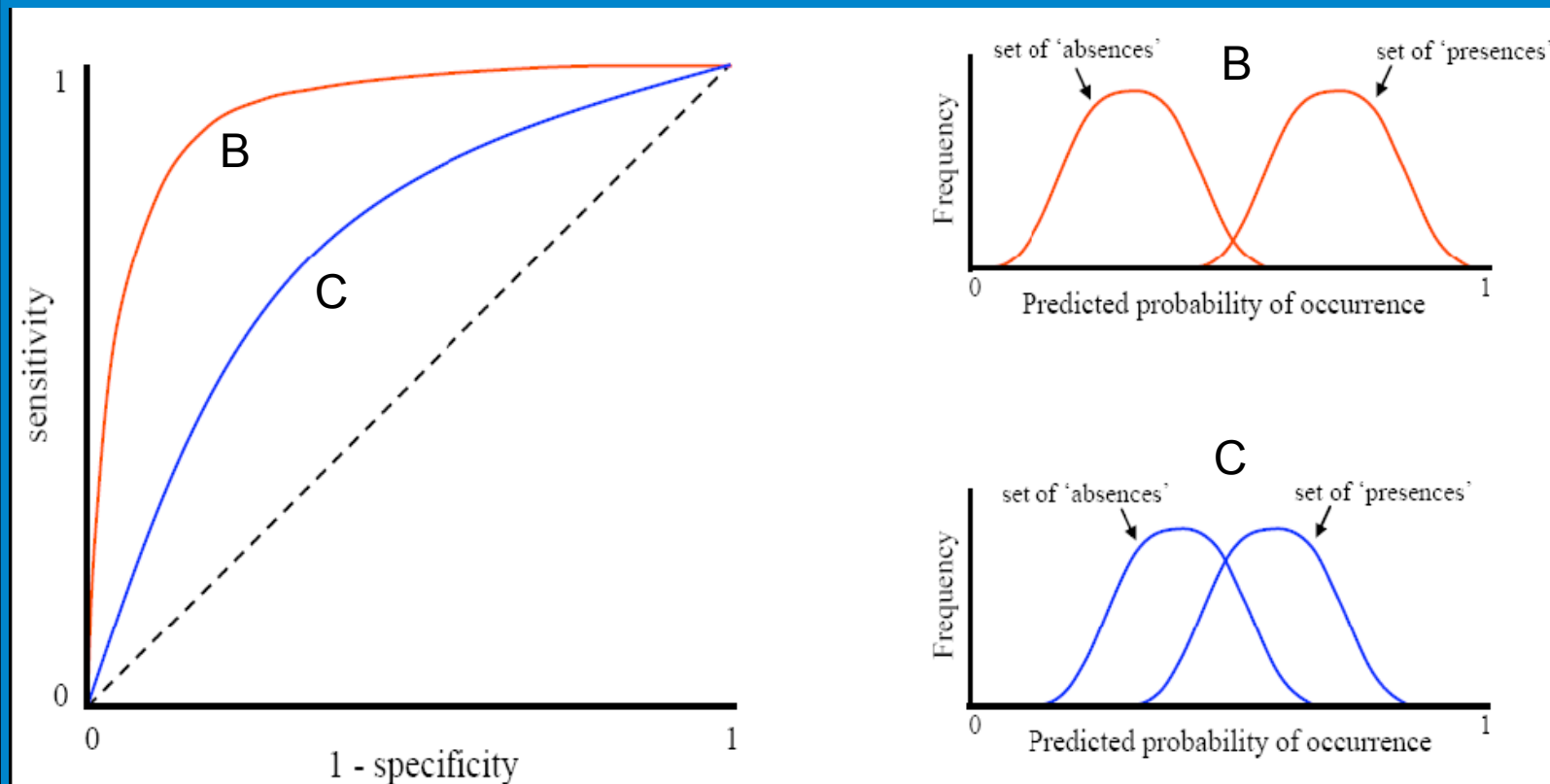
- Most frequently occurring species in > 50 habitat samples (N = 28)
- Subset of species occurring in selected estuaries (N=13)

Class	Habitat	Estuary
NIS	11	5
Native	13	7
Cryptogenic	4	1



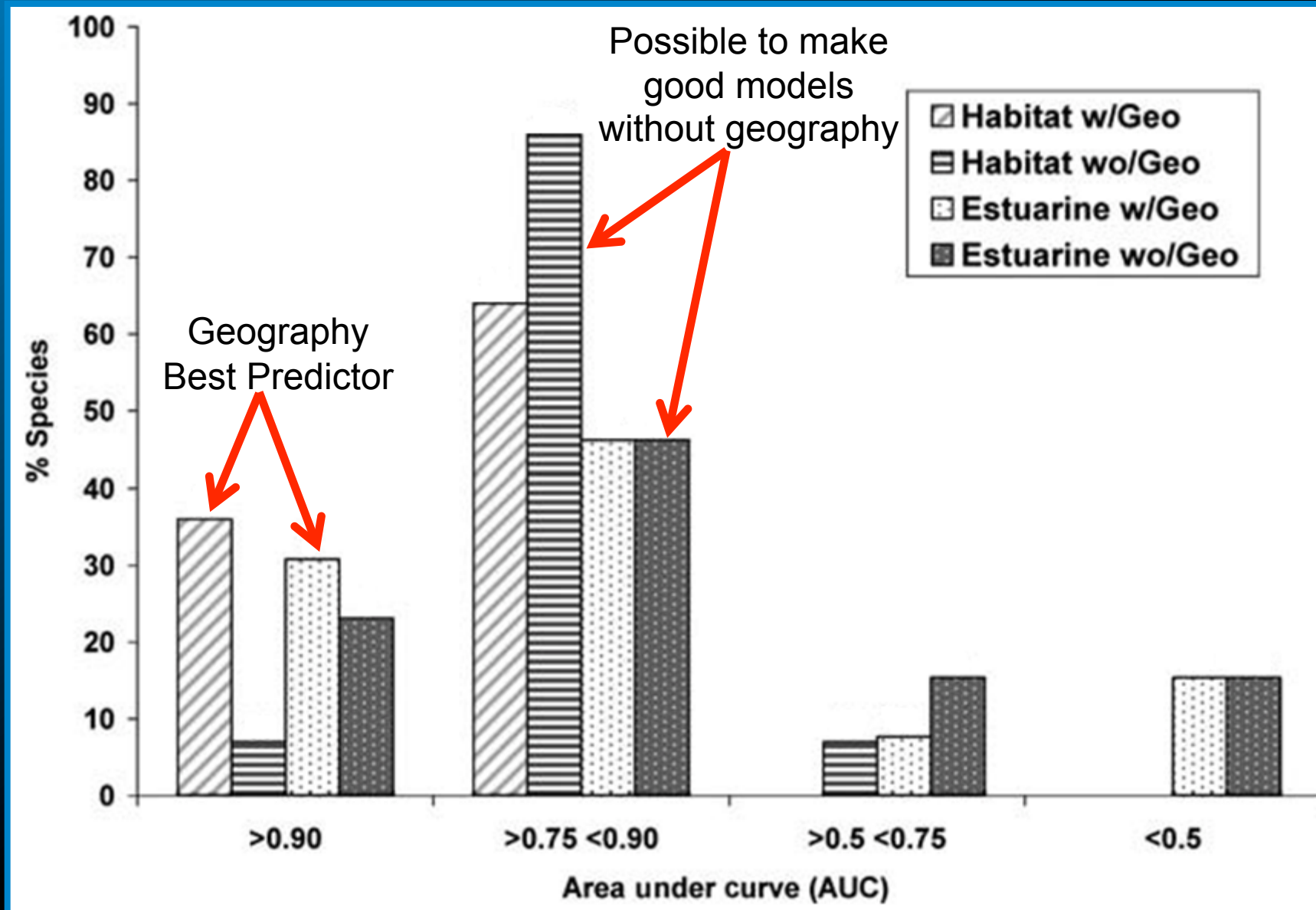
# Measuring Performance of NPMR Models

## Area Under the Curve (AUC)

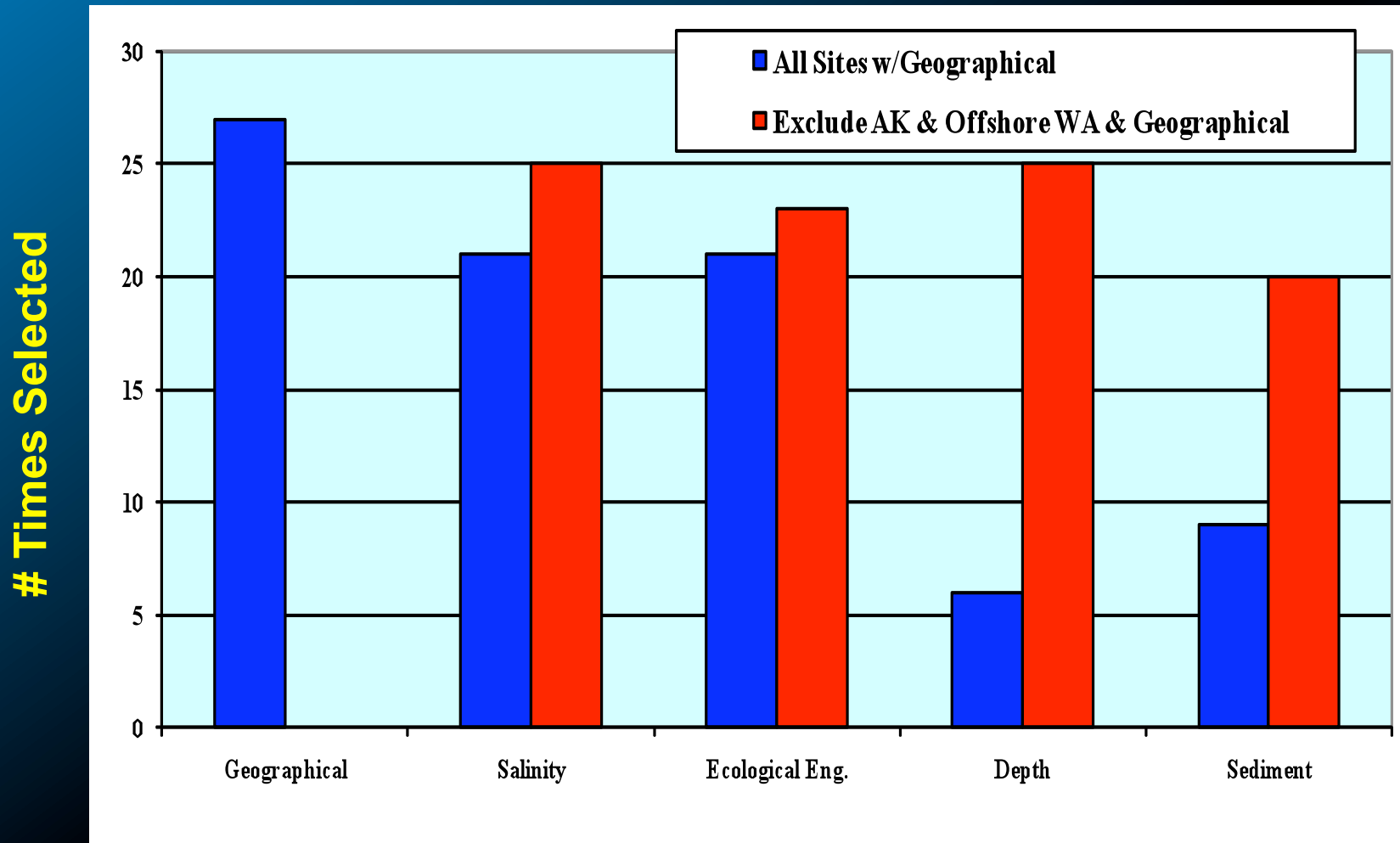


- **AUC > 0.5** model performing better than random
- **AUC > 0.75** useful amount of discrimination
- **AUC > 0.90** high discriminatory power

# Variables Effect Model Performance



# # Times Different Classes of Habitat Variables Were Included in Models



Identify variables independent of scope and scale of samples



# Niche Modeling Results

- **Geographic variables were the strongest single predictor at both scales.**
- **Alternative models without geographic variables have similar predictive power at both scales.**
- **Salinity classes were a viable surrogate to site-specific salinity values.**
- **NPMR predicts equally well for native and NIS at both scales.**

# Conclusions

- **The integrated hierarchical system is a framework for synthesizing biological information for macro-ecological research questions addressing multiple species across regional to global scales.**
- **Management of ballast water discharge is critical to reduce the spread of NIS. The per capita invasion model provides a standard based on historical rates that is being reviewed by the National Academy of Sciences.**
- **Niche models are useful tools to predict where a nonindigenous species has the potential to survive once it has arrived.**

# Acknowledgements

*Yer off the  
edge of the  
map, mate*



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*Here there be  
alien monsters!*

# Questions ?

