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U.S. EPA Office of Research and Development

**Environmental Monitoring and Assessment Program** 

#### Predictive Models for Bioassessment of Large and Great Rivers

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# Outline

- Overview of predictive models
  - River Invertebrate Prediction and Classification System (RIVPACS)
- Examples from National Wadeable Streams Assessment (NWSA)
- Application of models to Great Rivers

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#### **Biological Assessment**

The composition of stream organisms is used increasingly to assess stream condition.

A predictive bioassessment model is one method for analyzing biological data to assess stream condition.

RIVPACS<sup>\*</sup>-type methods

compare the *observed* composition (**0**) to *expectations* (*E*) derived from reference sites.

Sites at which the assemblage composition differs significantly from expectation are declared impaired.

\*Clarke, R.T., Wright, J.F, and Furse, M.T. (2002) RIVPACS models for predicting the expected macroinvertebrate fauna and assessing the ecological quality of rivers. Ecological Modelling 160:219-233.



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#### **Predictive Bioassessment Models**

- 1. Identify and sample *reference* sites.
- 2. Group reference sites into clusters with similar biological assemblages.
- 3. Examine how natural factors vary with clusters of reference sites.
- 4. For each *test* site, use natural factors to predict the clusters in which the site would most likely be grouped.
- 5. The *expected* biological composition of the test site is predicted to be the same as that observed in the reference clusters. Expected composition is expressed as the capture probability,  $p_i$ , for each taxon, *i*.

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#### **Predictive Bioassessment Models**

6. Compare *observed* taxa list to *expected* taxa list.

$$O_{E_{TAXA}} = \frac{\sum Y_i}{\sum p_i}$$

- $Y_i = 1$  if taxon *i* is present and  $Y_i = 0$  if absent.
- $p_i$  is the capture probability predicted by the model.

 $O/E_{TAXA} \sim 1$  in reference sites, and decreases as taxa are lost in test sites.

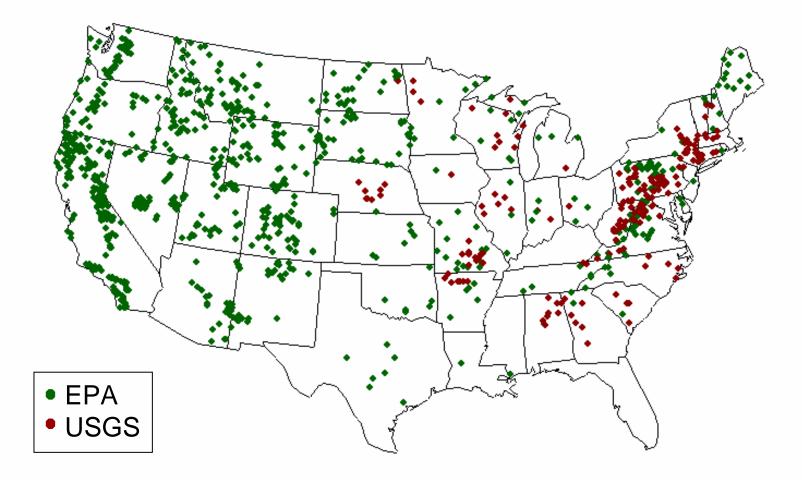
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#### National Wadeable Streams Assessment

- Statistically representative sample of small, wadeable streams across the U.S.
- Macroinvertebrates sampled on reach-wide transects.
- Reference sites sources:
  - Statistical sites attaining reference criteria.
  - Hand-picked sites.
  - USGS sites attaining reference criteria.

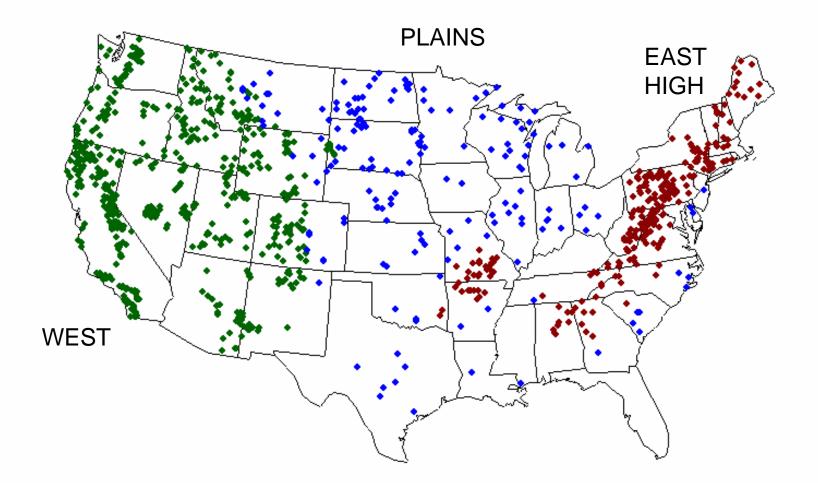
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#### **Reference Sites for National WSA**



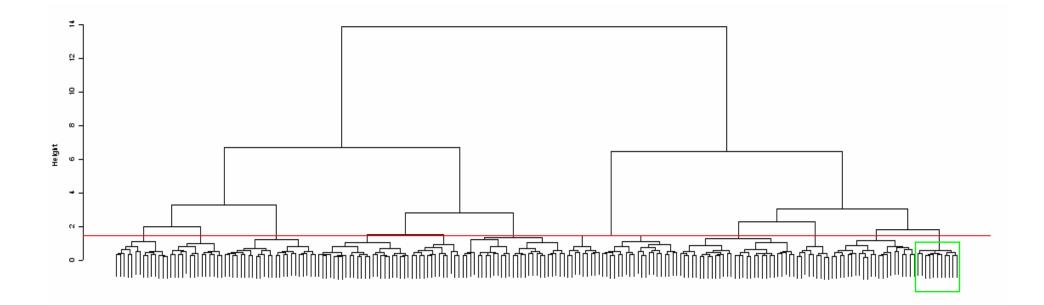
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# Super-Ecoregions



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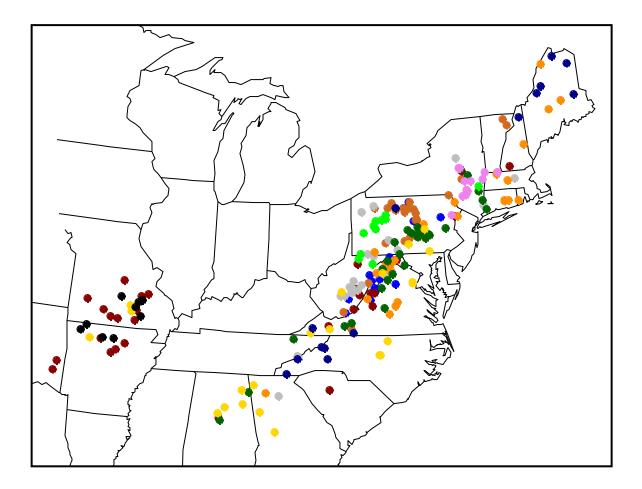
#### **Clusters for Eastern Highlands**



11 clusters with 9-25 reference sites per cluster.

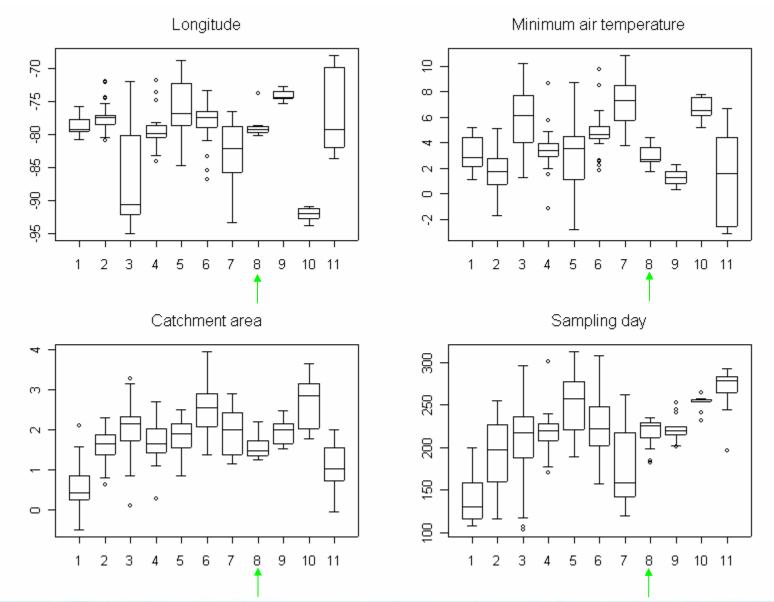
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#### **Clusters in the Eastern Highlands**



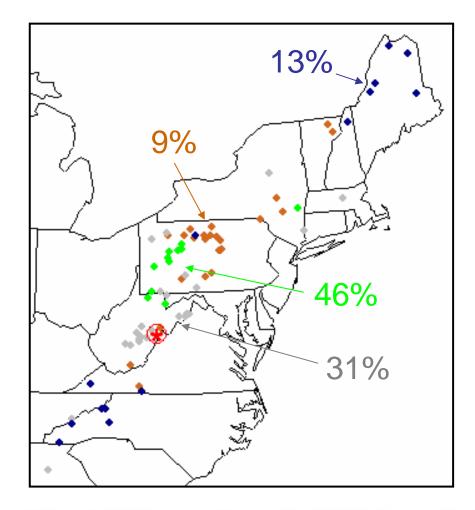
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#### **Predictor Variables within Clusters**



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#### Predicted clusters for a single test site



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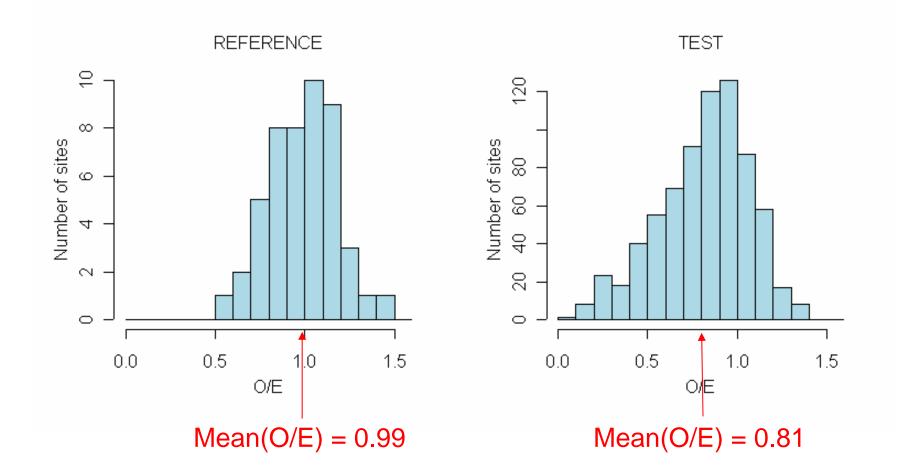
## Computing Probability of Occurrence (Acroneuria)

Frequency of Occurrence in Cluster	Probability of Cluster Membership
0.58	0.09
1.00	0.31
0.18	0.46
0.50	0.13

 $p = 0.58 \times 0.09 + 1.00 \times 0.31 + 0.18 \times 0.46 + 0.50 \times 0.13 = 0.51$ 

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#### Model Results: Eastern Highlands



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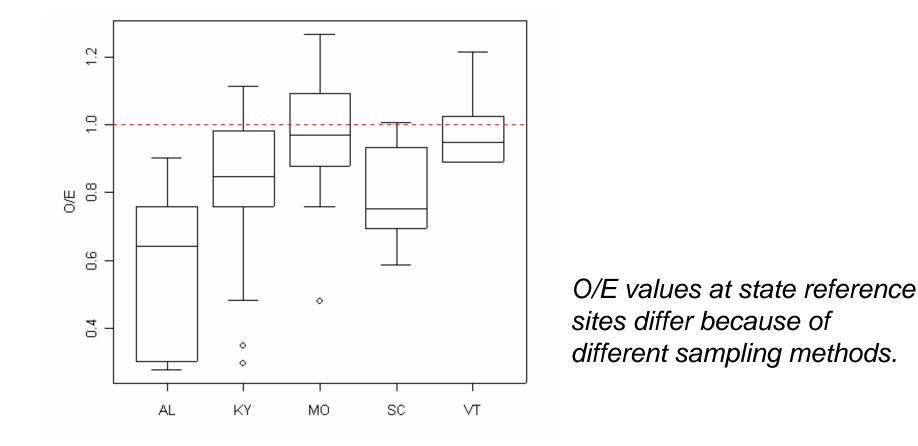
#### Useful Properties of O/E

- Index value has an intuitive ecological meaning.
  - e.g., O/E = 0.5 suggests that only half of the taxa that are expected were observed.
- Index value is expressed in scaled units and can be compared across different locations.
- One model can account for variability across a large region.
- Model is developed without any assumptions regarding stressor gradients.

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#### Other properties

• Predictions can be sensitive to sampling method.



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## Other properties (2)

- Predictive models are most useful for controlling for many different natural gradients.
- In regions where natural gradients are weak, or dominated by a single factor, simpler models can be as effective as RIVPACS.

	WEST	PLAINS	EAST HIGH
% improvement over null model	17%	8%	27%

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#### Conclusions

- RIVPACS-style predictive models can provide a very useful measure of biological condition.
- Further testing is required to establish whether and how predictive models can be applied in Great River.

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