

# ***Ranking Stressors: Prevalence & Relative Risk***

**Based on work by**

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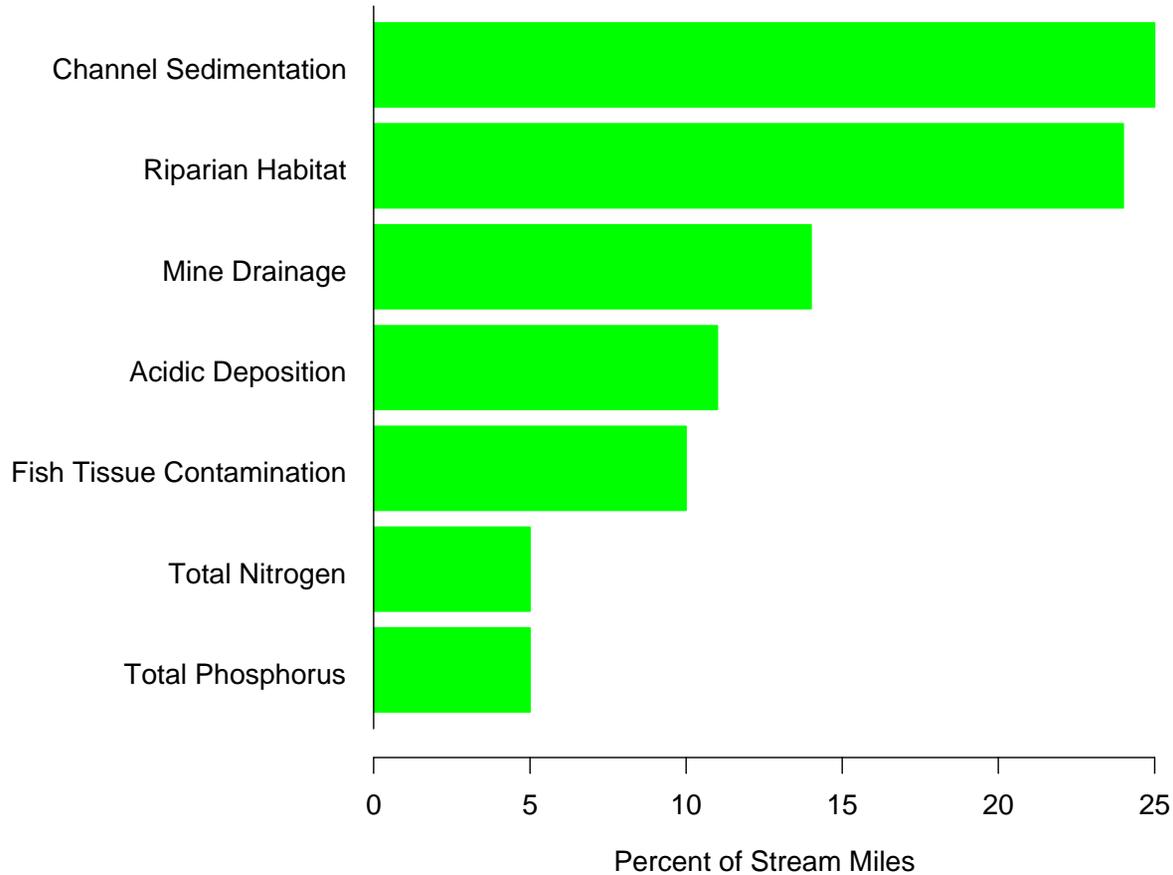
**Problem:** *Assessing the relative importance of multiple stressors.*

*Previous Approach:*

- Compare regional prevalence of each stressor.
  - ***Define “Poor” condition for each stressor.***
  - ***Estimate percent of stream miles in Poor condition.***
  
- Example:
  - Mid-Atlantic Highlands Assessment (MAHA) streams.  
(EPA/903/R-00/015)



## Percent of stream miles in Poor condition



*Limitations of previous approach:*

**1) Stressor “importance” should also be based on the severity of its effects on biological endpoints.**

**2) Definitions of “Poor” and “Good” condition may be arbitrary, either for stressors or endpoints.**

### **To move forward:**

- 1) Assess the strength of association between stressors and endpoints, as a surrogate for “effect severity”.
- 2) Explore association methods for continuous, as well as class-based, stressors and endpoints.



*Explorations – Modeling associations between stressors and the EPT richness of macroinvertebrates.*

**Continuous methods: stres.ranking.cont.ppt**

- More complex: Multiple stressors.
- Language/methods of *correlation* and *multiple regression*.
- Confronts stressor collinearity.
- Does not use EMAP sample weights (Yet!)

**Class-based methods: This presentation.**

- Simpler: One stressor at a time.
- Language/methods of *probability*, *risks*, and *odds*.
- Uses EMAP sample weights.



## *Stressor Ranking: Classes, Odds and Risk*

**Goal:** To rank stressors, based on their strength of association with biological response indicators.

**Approach:** Use stressor and response classes (MAHA report).

**Responses:** EPT Richness and Fish IBI

**Stressors:**

- Excess sediment
- Riparian condition
- Acid mine drainage
- Acid deposition
- Total P
- Total N



*Basic tool -- 2-way table*  
*Example: EPT Richness vs. Excess Sediment,*  
*(“Base grid” sites, n=80)*

**Site counts**

	SED GOOD	SED MARG	SED POOR	Total
EPT GOOD	14	8	0	22
EPT MARG	13	18	5	36
EPT POOR	2	8	12	22
<b>Total</b>	<b>29</b>	<b>34</b>	<b>17</b>	<b>80</b>

**Percent of Stream Length**

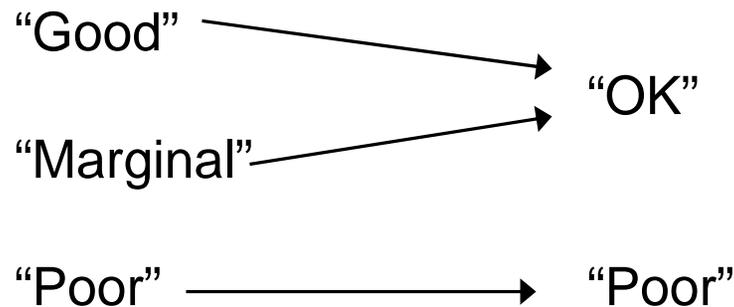
	SED GOOD	SED MARG	SED POOR	Total
EPT GOOD	17	12	0	29
EPT MARG	15	21	7	43
EPT POOR	3	7	18	28
<b>Total</b>	<b>35</b>	<b>40</b>	<b>25</b>	<b>100</b>



## *Combining classes, to simplify.*

Old

New



Also:



Association strength: Calculate the Relative Risk of “Poor” EPT richness, in streams having “Poor” sediment, versus streams having “OK” sediment.

$$RR = \frac{\text{Pr(Poor EPT, given Poor SED)}}{\text{Pr(Poor EPT, given OK SED)}}$$

$$RR = \frac{.18/.25}{.10/.75} = 5.4$$

**So: “The risk of Poor EPT is 5.4 times greater in streams with Poor SED than in streams with OK SED.”**

Proportion of stream length  
(Pearson  $X^2 = 24.7$ )

	SED OK	SED POOR	Total
EPT OK	.65	.07	.72
EPT POOR	.10	.18	.28
Total	.75	.25	1.00



## Odds, and Odds Ratios

**Odds** of finding Poor EPT, in streams having Poor sediment

$$= \frac{\text{Pr(Poor EPT, given Poor SED)}}{\text{Pr(OK EPT, given Poor SED)}} = \frac{.18 / .25}{.07 / .25} = 2.60$$

Odds of finding Poor EPT, in streams having OK sediment = 0.15.

**Odds Ratio**, of Poor-SED odds to OK-SED odds =  $\frac{2.60}{0.15} = 16.7$

So: “The odds of finding Poor EPT are 16.7 times greater in Poor-sediment streams than they are in OK-sediment streams.”

	SED OK	SED POOR	Total
EPT OK	.65	.07	.72
EPT POOR	.10	.18	.28
Total	.75	.25	1.00



*Stressor ranks, based on odds ratio of “Poor” EPT, for “Poor” vs. “OK” conditions of each stressor.*

Stressor	Odds Ratio	Stressor Rank	Relative Risk	Pearson X <sup>2</sup>	Data set
Excess Sediment	14.3	1	5.1	24.7	Base (n=80)
Acid Mine Drainage	14.1	2	4.0	71.0	Enhanced (n=355)
Total P	4.8	3	2.4	12.0	Enhanced
Riparian Condition	4.6	4	2.7	8.2	Base
Total N	2.0	5	1.6	1.7	Enhanced
Acid Deposition	0.7	6	0.7	.84	Enhanced



## *“Effects” and “Prevalence” of Stressors*

Stressor	“Effect” of Poor Stressor (Odds Ratio of Poor EPT)	“Prevalence” of Poor stressor (% stream length)
Excess Sediment	14.3	24
Acid Mine Drainage	14.1	14
Total P	4.8	5
Riparian Condition	4.6	25
Total N	2.0	4
Acid Deposition	0.7	9



## *“Correlation” between stressor classes?*

YES –

*Consider the top 2 stressors:*

- Odds of “Poor” Acid mine drainage are only 11%, over all sites.
- But the odds are 8.5 higher in Poor-sediment streams than in OK-sediment streams.
- ◆ “Poor” sediment and “Poor” Acid mine drainage co-occur.
- ◆ Cannot clearly separate their effects on EPT.



## *Modeling the effects of multiple stressors and natural gradients:*

-- Use multiple logistic regression.

-- Example: A “best model” is:

$$\log(\text{Odds of Poor EPT}) = -8.11 + 3.14(\text{SED}) + 2.52(\text{RIP}) + 6.36(\log\text{SIO}_2)$$

where SED = 1, if “Poor” sediment  
= 0, if “OK” sediment

RIP = 1, if “Poor” Riparian condition  
= 0, if “OK” Riparian condition

-- Model explains 42% of “deviance” (like R<sup>2</sup>).



## Interpreting the logistic regression model

$$\log(\text{Odds of Poor EPT}) = -8.11 + 3.14(\text{SED}) + 2.52(\text{RIP}) + 6.36(\log\text{SIO}_2)$$

- **Effect of SED:** If RIP and SIO<sub>2</sub> are held fixed, then:

$$\frac{\text{Odds of Poor EPT, for Poor Sediment}}{\text{Odds of Poor EPT, for OK Sediment}} = e^{3.14} = 23.1$$

- **Effect of SIO<sub>2</sub> :**

“If RIP and SED are held fixed, then a doubling of SIO<sub>2</sub> yields a predicted 7-fold increase in the odds of Poor EPT.”



## *Issues for class-based associations*

### **Sample sizes**

- Strong constraint on estimates and their uncertainty.

### **Defining classes.**

- Strive for only 2 classes per variable.
- Avoid rare classes.

### **Need statistical methods that use sample weights.**

- For testing  $H_0$ : “No association”
- For CI's on RR and odds.
- For logistic regression modeling.

