

A Benthic Index for the Nearshore Gulf of Maine: Evaluating Ecological Indicators with Signal Detection Theory

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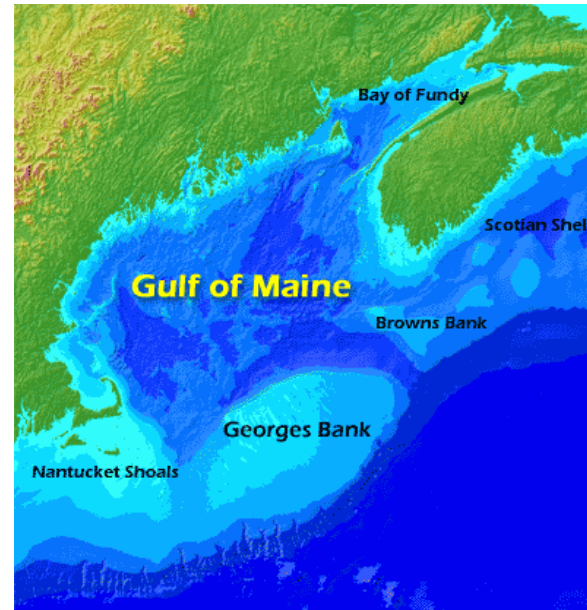


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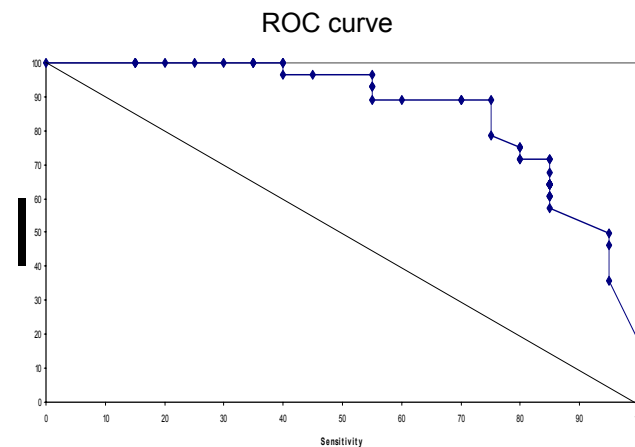
This presentation focuses on:

1. Development of a benthic index for the near-shore Gulf of Maine

2. Use of signal detection theory, a rigorous standard for evaluating ecological indicators

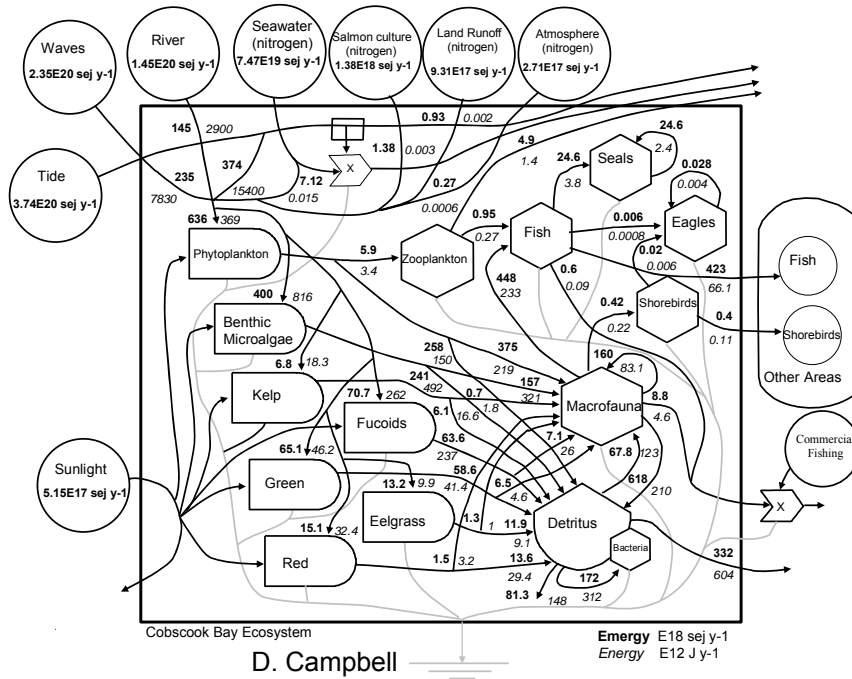


Credit: GOMMI

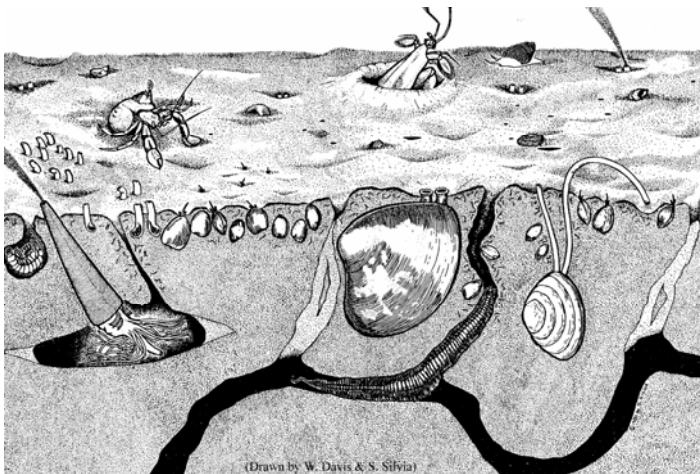


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Station 3
BI = 2.16



Drawn by W. Davis & S. Silvia



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During 2000-2001, states (Maine, New Hampshire, Massachusetts) sampled 182 stations as part of the USEPA's National Coastal Assessment

Nearly 600 benthic invertebrate species

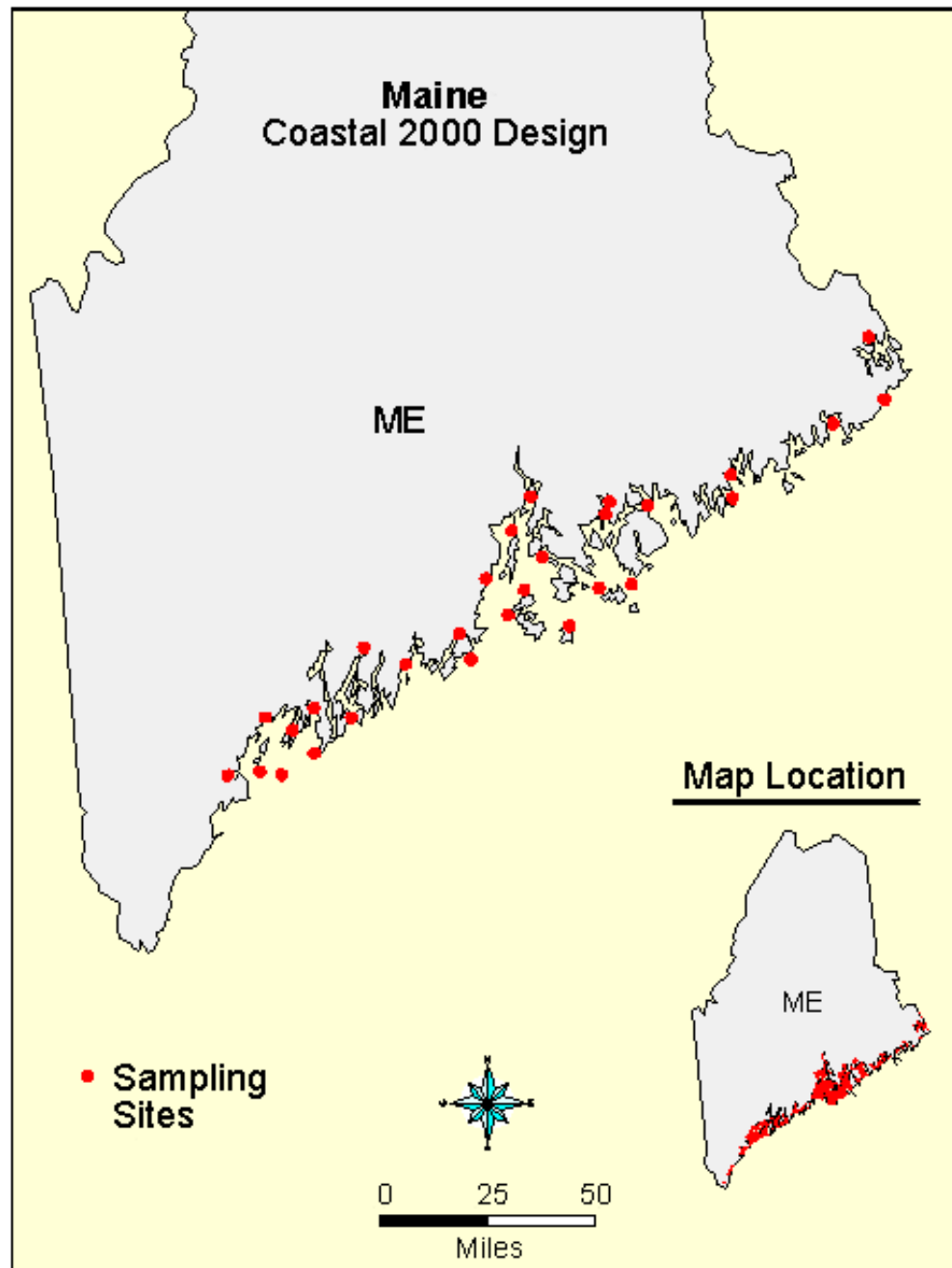
Physical-chemical data in bottom layer of water column

Sediment grain size, TOC, contaminants and sediment toxicity



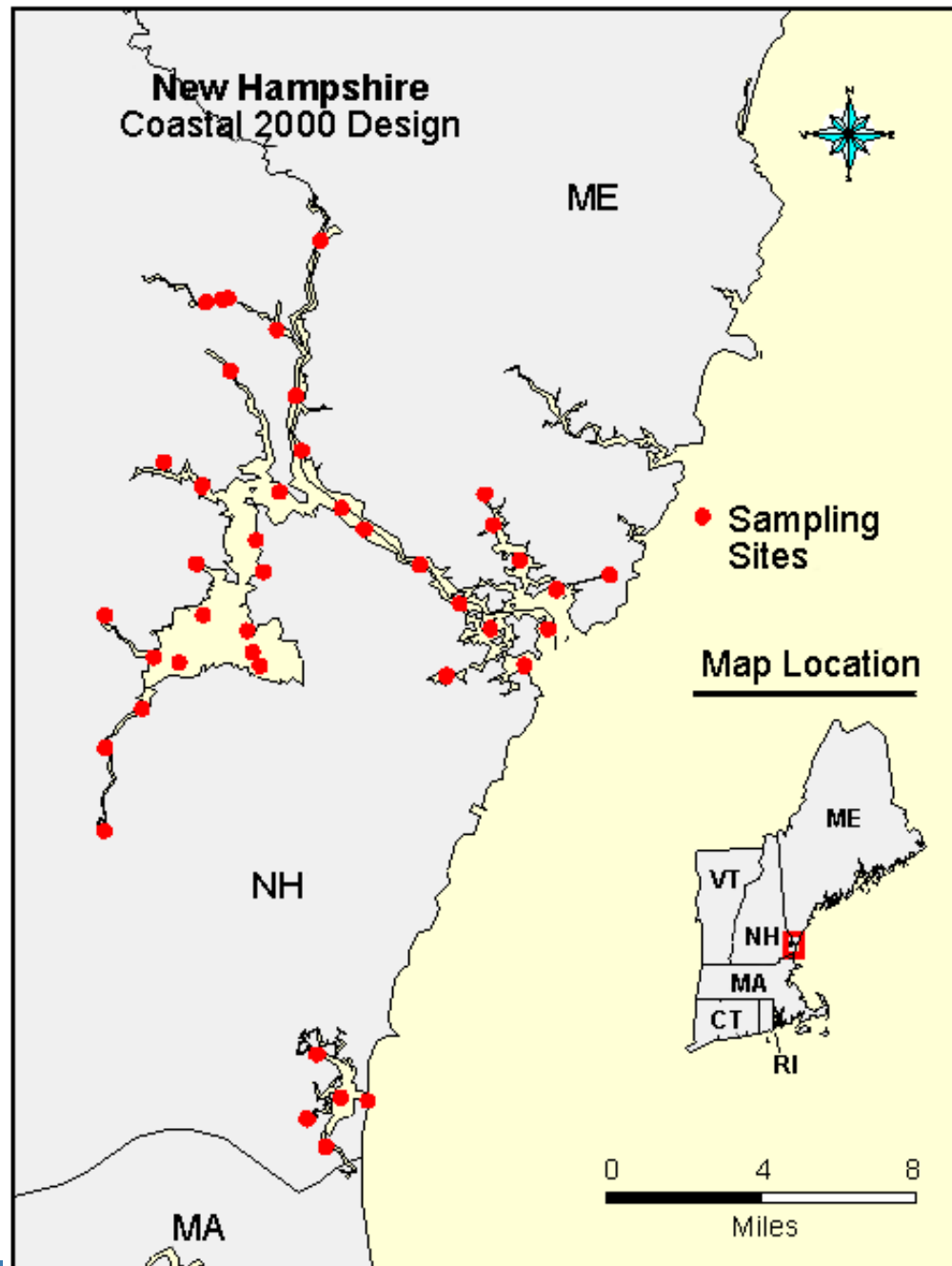
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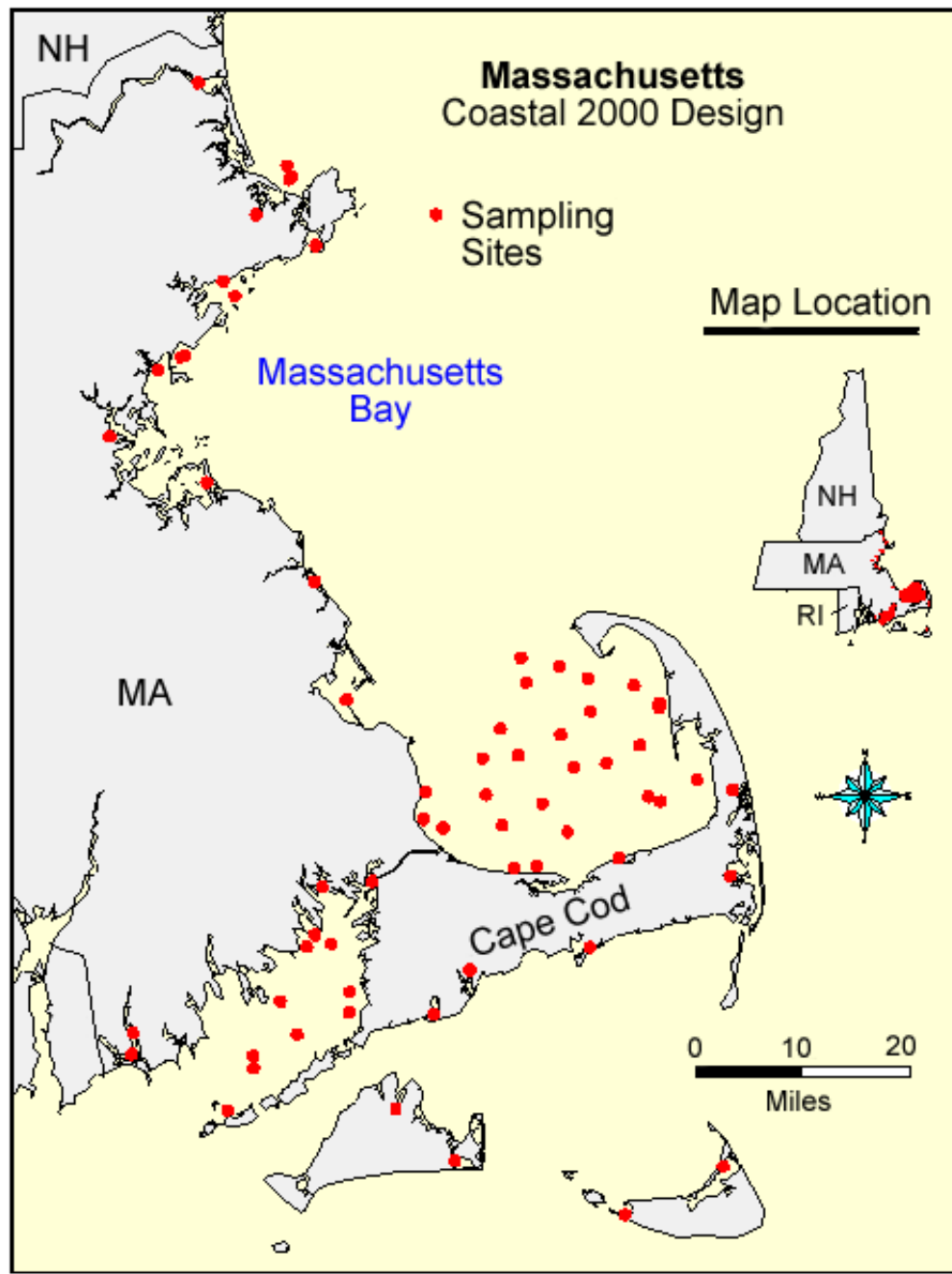
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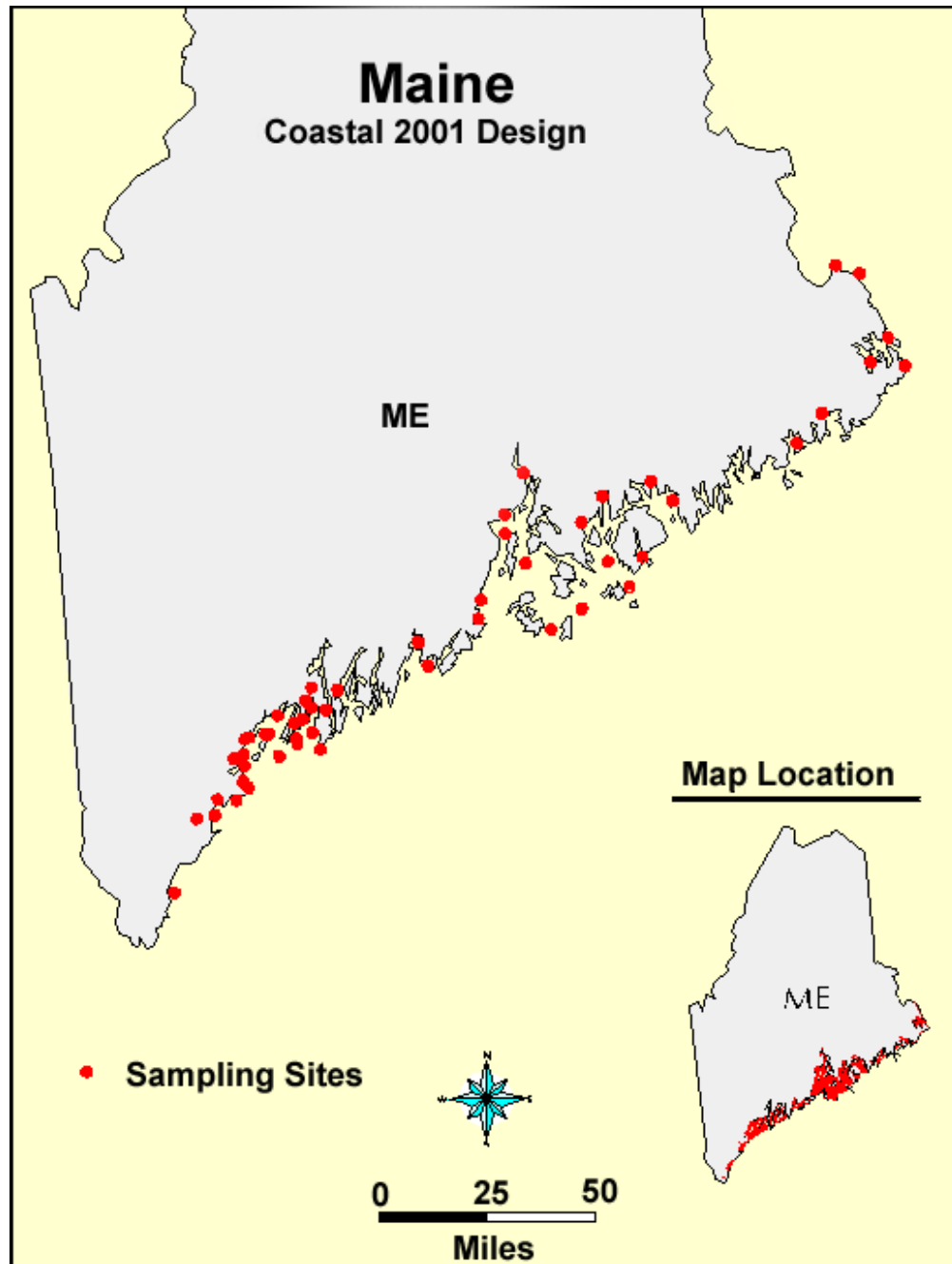
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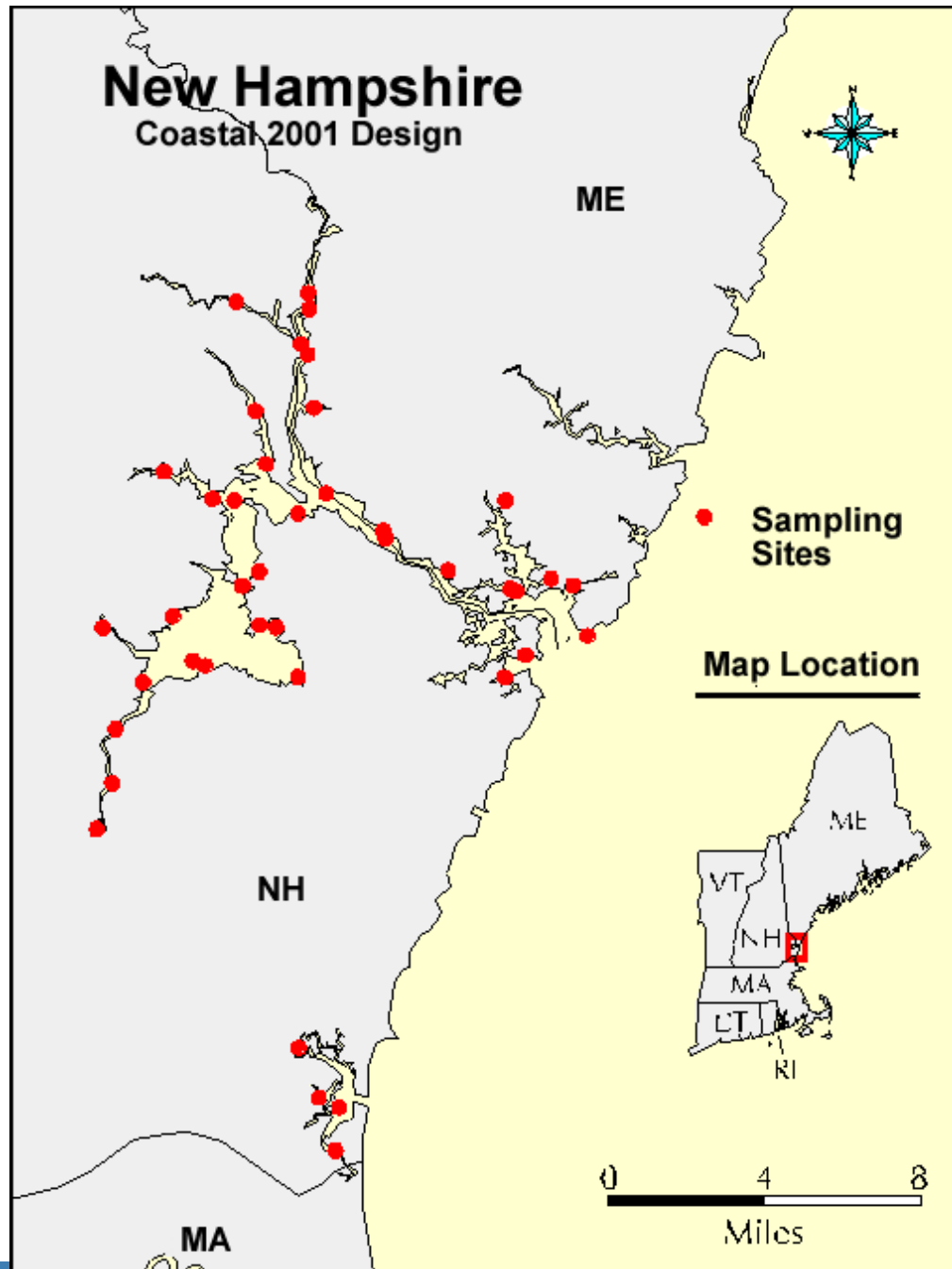
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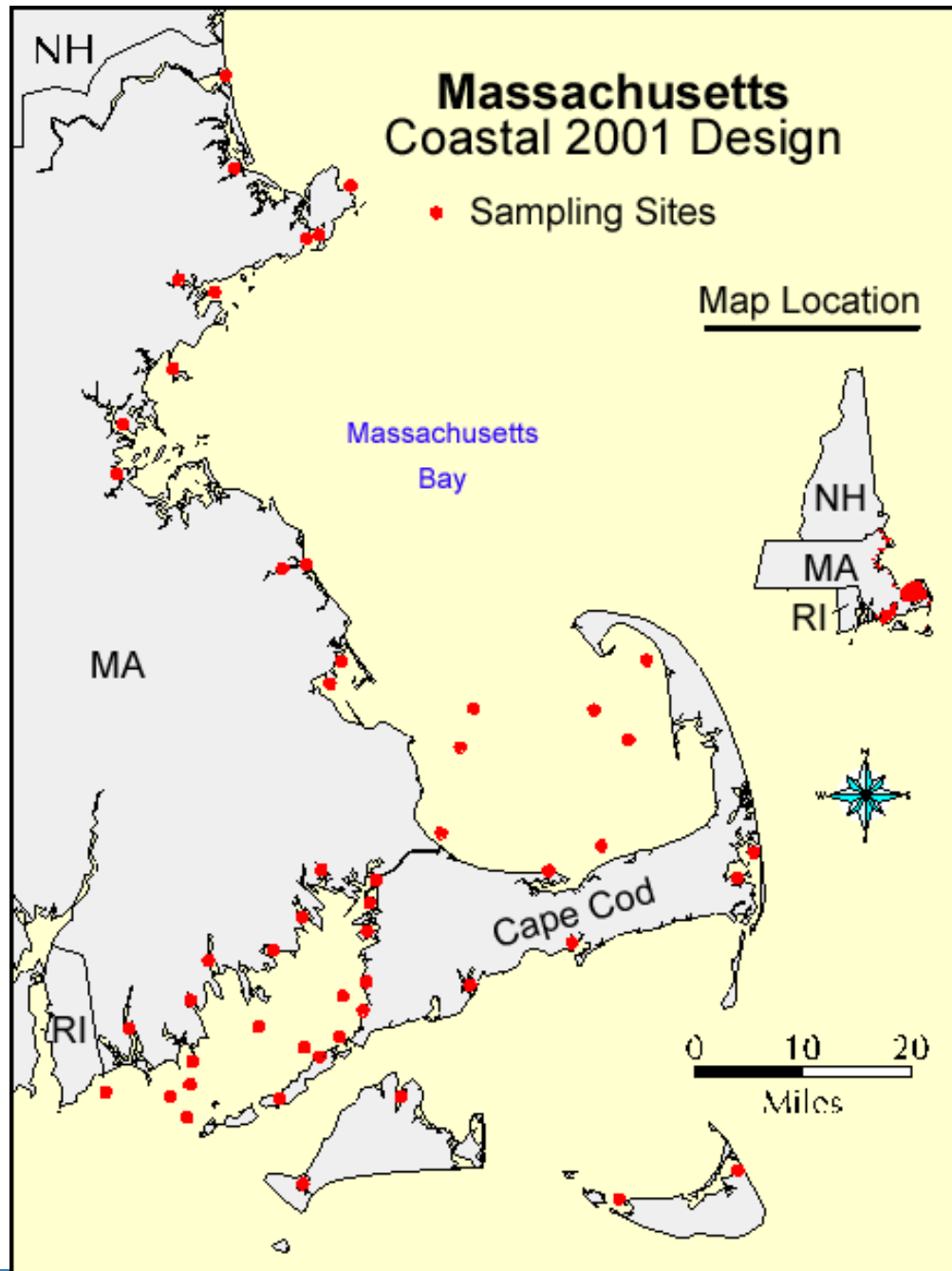
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Data

Calibration data set:

National Coastal Assessment, 2000-2001 (n = 182)



Validation data sets:

1. Massachusetts Water Resources Authority, Mass. Bay, 1991-1994 (n = 49)
2. National Coastal Assessment data, 2002-2003 (n = 67)
3. Larsen et al. (1983) Casco Bay, 1980 (n = 56)

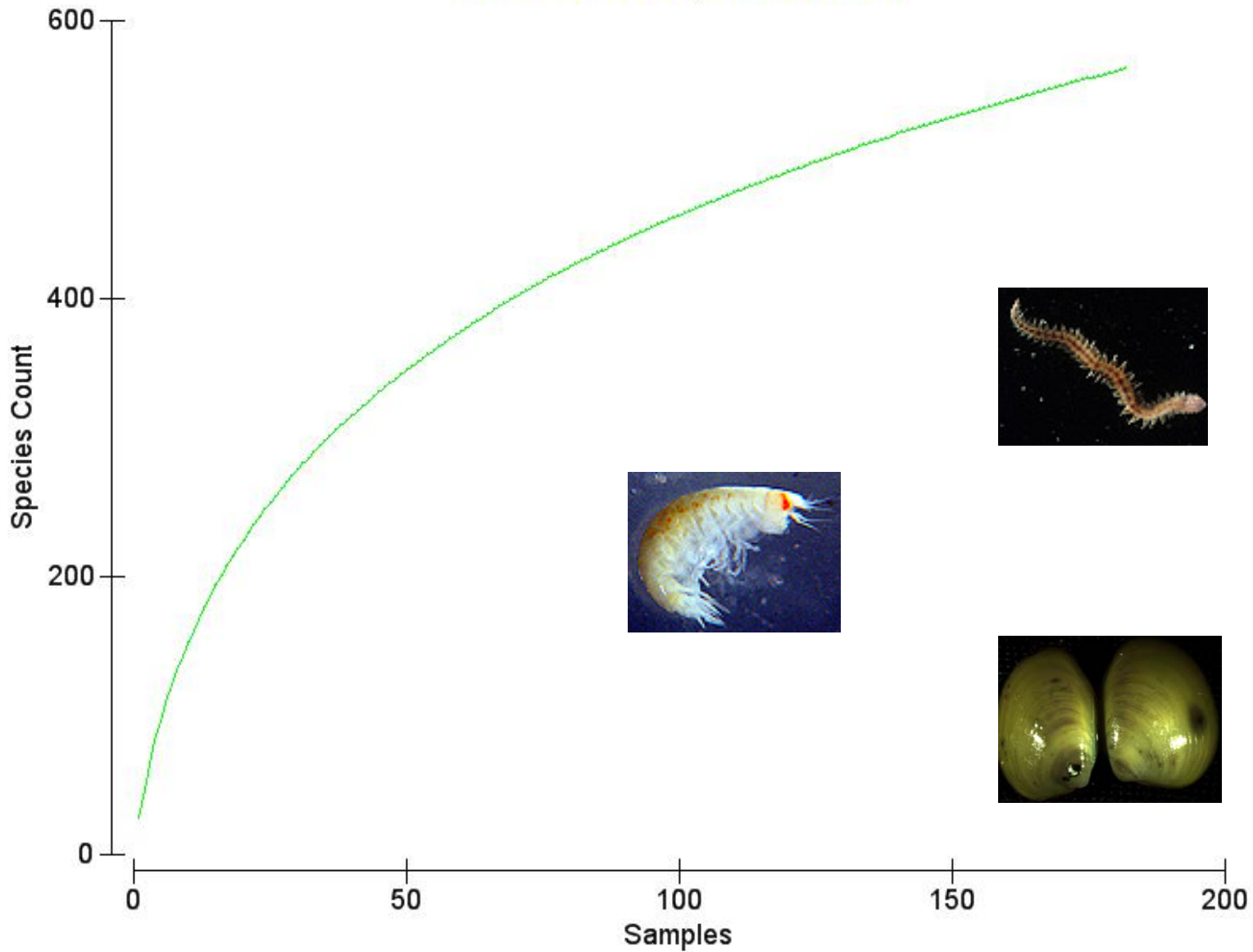
Bottom water. 182 stations.



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Gulf of Maine, 2000-2001



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Can we use metrics derived from benthic community data to create a multivariate function that accurately predicts a degraded benthic environment?

Benthic Environmental Quality (BEQ)

**Candidate benthic metrics
(adjusted for habitat effects, such as salinity)**

Stepwise logistic regression



Photo: G. Cicchetti

Criteria for Benthic Environmental Quality were chosen to provide a “gold standard” of benthic condition

Stations classified as low BEQ had to meet at least one of these criteria:

1. Metal and organic contaminants: At least one exceedance of Long et al. (1995) effects range-median (ER-M) values or ≥ 10 exceedances of effects range-low (ER-L) values
2. Sediment toxicity test: *Ampelisca* survival $< 80\%$ of controls
3. Total organic carbon: $\geq 5\%$ dry wt.
4. Concentration of dissolved oxygen in bottom water: < 4.8 mg/l.

Stations classified as high BEQ had to meet all of these criteria:

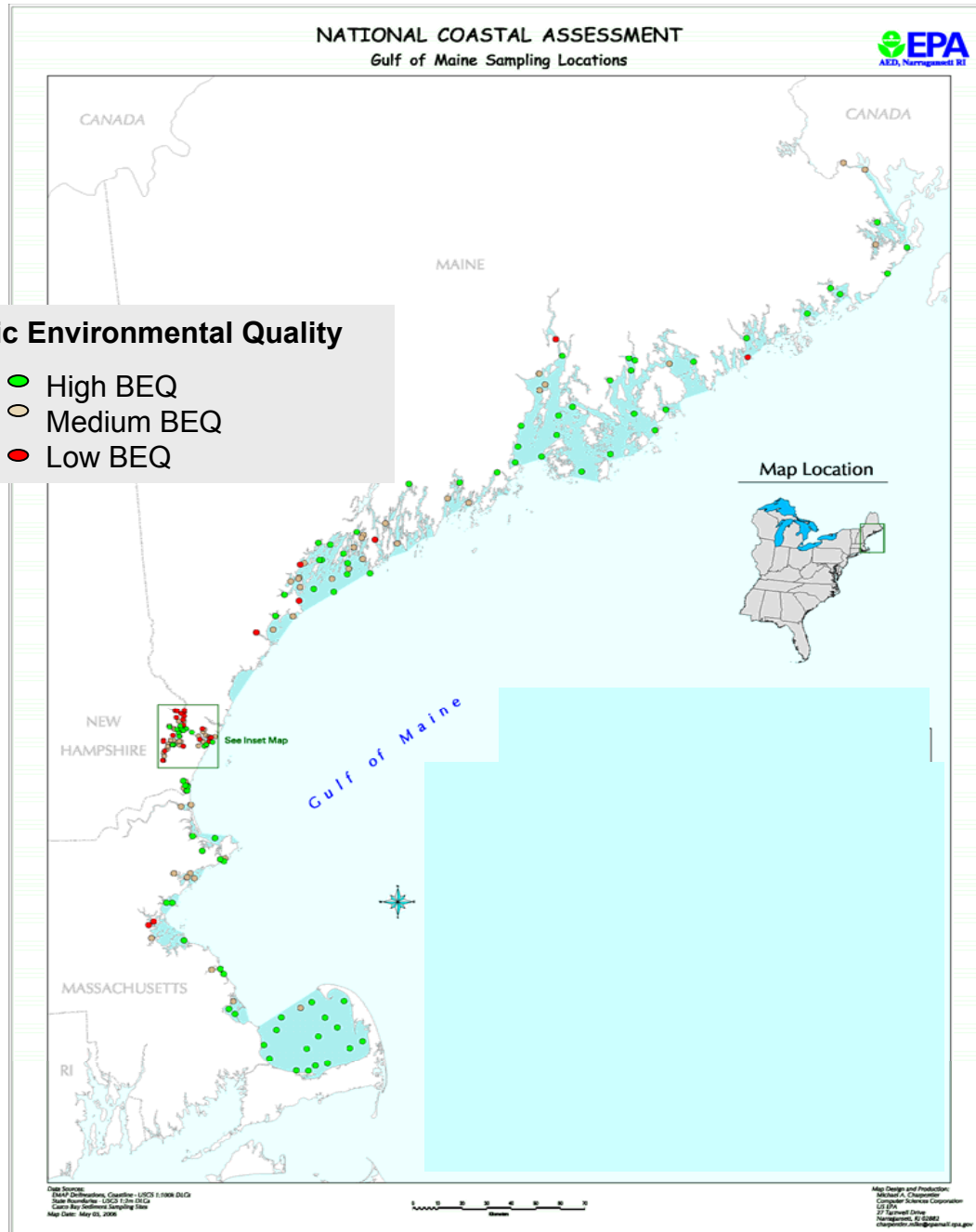
1. Metal and organic contaminants: No exceedances of ER-M values and ≤ 3 exceedances of ER-L values
2. Sediment toxicity test: *Ampelisca* survival $\geq 80\%$ of controls
3. Total organic carbon: $< 4\%$ dry wt.
4. Concentration of dissolved oxygen in bottom water: ≥ 4.8 mg/l.

NATIONAL COASTAL ASSESSMENT
Gulf of Maine Sampling Locations



Benthic Environmental Quality

- High BEQ
- Medium BEQ
- Low BEQ

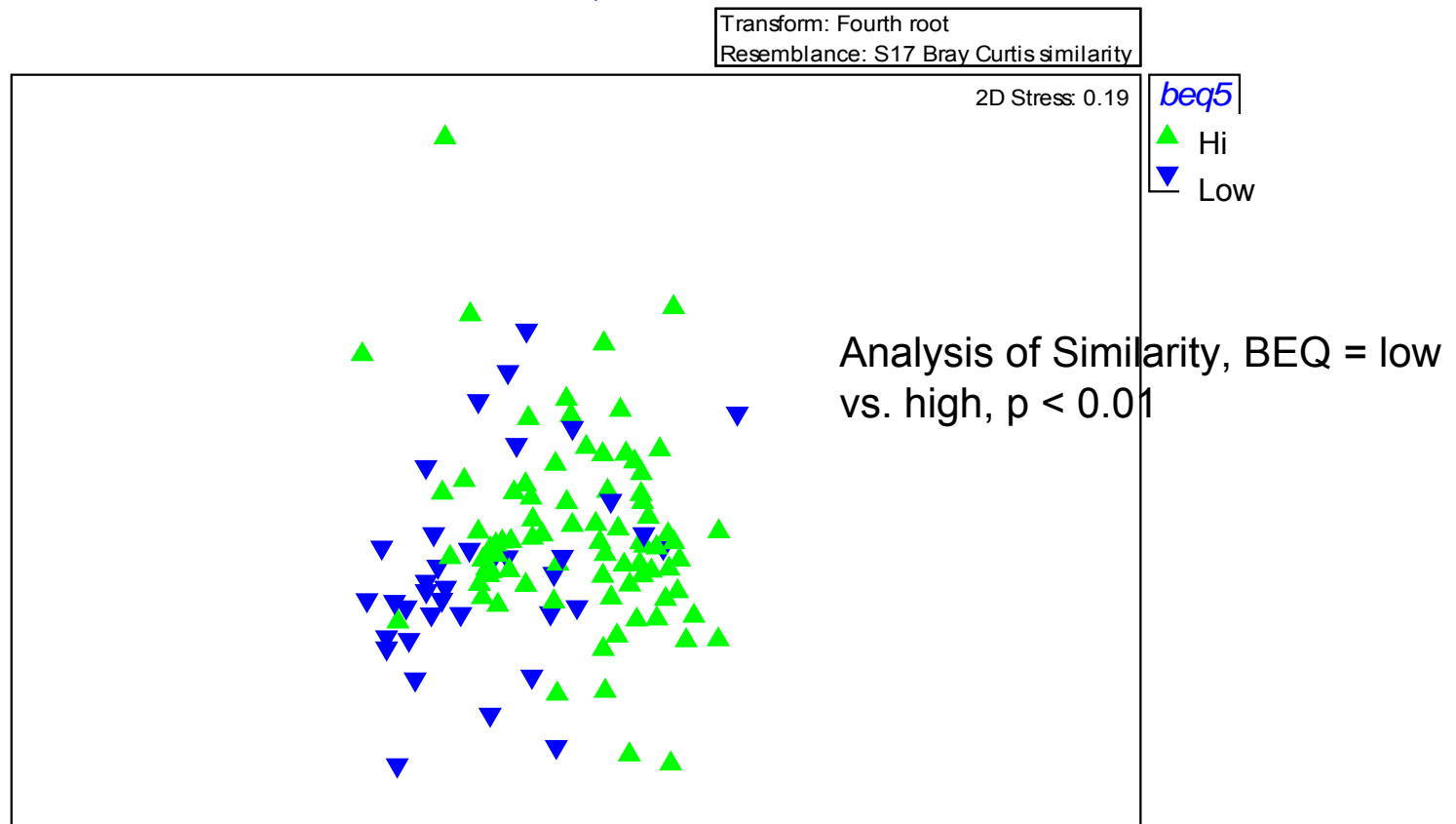


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A non-metric multidimensional scaling of the benthic species abundance data shows that the composition of benthic assemblages at the low BEQ stations is different from that at the high BEQ stations.

AP Data, 2000-2001



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Dominant benthic species at high (n = 81) Benthic Environmental Quality (BEQ) stations.



Scientific name	Abundance
<i>Ampharete arctica</i>	3863
Tubificidae	2672
<i>Prionospio steenstrupi</i>	2659
<i>Nucula proxima</i>	2648
<i>Polygordius</i> spp.	2390
<i>Streblospio benedicti</i>	2211
<i>Ampelisca</i>	1489
<i>Aricidea catherinae</i>	1438
<i>Pygospio elegans</i>	1382
<i>Tharyx acutus</i>	1307
<i>Gemma gemma</i>	1044
<i>Exogone hebes</i>	1027
<i>Prionospio</i> spp.	960
<i>Mediomastus californiensis</i>	956
<i>Polydora cornuta</i>	893
<i>Nephtys incisa</i>	840
<i>Ninoe nigripes</i>	777
Cirratulidae	692
<i>Nucula tenuis</i>	660
<i>Exogone verugera</i>	639

Dominant species at low (n = 37) Benthic Environmental Quality (BEQ) stations

Scientific name	Abundance
Tubificidae	4903
<i>Polygordius</i> spp.	2568
<i>Mytilus edulis</i>	2353
<i>Streblospio benedicti</i>	1518
<i>Exogone hebes</i>	1112
<i>Monocorophium tuberculatum</i>	1057
<i>Parapionosyllis longicirrata</i>	792
<i>Mya arenaria</i>	605
<i>Heteromastus filiformis</i>	567
<i>Polydora cornuta</i>	554
<i>Tharyx acutus</i>	506
<i>Nucula proxima</i>	482
<i>Marenzellaria viridis</i>	450
<i>Prionospio steenstrupi</i>	438
Spionidae	381
<i>Cyathura polita</i>	378
<i>Nereis diversicolor</i>	373
<i>Nephtys incisa</i>	339
<i>Prionospio</i> spp.	330
<i>Capitella capitata</i>	265



Multivariate logistic regression is conducive to evaluation by signal detection theory.

- Probability of the dependent variable (a low BEQ), given the independent variables (the benthic metrics)
- Chose a cutpoint to develop an indicator of benthic condition
 - if $p_i \geq k$, then $Y = 1$
 - if $p_i < k$, then $Y = 0$
- Developed several logistic regression models. Criteria: 80% accuracy
- Evaluated indicators with signal detection theory

A partial list of potential benthic metrics:

Richness, diversity, and evenness measures:

Number of species S

Shannon-Wiener H'

Gleason's D

ES(50) Expected number of species in a random sample of 50 individuals

Average taxonomic diversity (Clarke and Warwick 2001) Δ

Average taxonomic distinctness (Clarke and Warwick 2001) Δ^*

Pielou's evenness J'

% abundance three most dominant species

Pollution tolerance-sensitivity:

mn_es(50).05 - Station mean of Rosenberg et al.'s (2004) species tolerance value

First term of Rosenberg et al.'s (2004) Benthic Quality Index

% abundance pollution-indicative species (from literature)

% abundance pollution-sensitive species (from literature)

Productivity:

Total number of individuals

Species composition (percent of total abundance):

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Means of benthic metrics used in logistic regressions at high and low BEQ (n=118) were compared by t-tests.

Benthic metric	Mean Low BEQ	Mean High BEQ	p
Shannon-Wiener H'	0.71	0.94	0.0001
Gleason's D	2.91	5.05	0.0001
PctDom3	80.0	64.4	0.0001
ES(50)	8.12	12.78	0.0001
mn_es(50) _{.05}	6.28	7.58	0.0001
First term of BQI	5.11	6.32	0.002
Δ Taxon. diversity	50.86	55.50	0.09
Pct Capitellidae	11.2	4.2	0.03
Pct Capitella	3.29	0.53	0.0001
Pct Tellinidae	0.4	1.2	0.08

Results of Pearson correlation of final list of benthic metrics with six habitat variables. Significance at $p < 0.10$.

Habitat variables	# Signif. Corr.	# $R^2 \geq 0.25$
Latitude	2	0
Longitude	4	0
Depth, m	7	2
Bottom Temperature, °C	8	2
Bottom Salinity, PSU	8	1
Percent silt-clay	2	0

A candidate benthic index:

$$\text{logit}(p) = 6.13 + 0.05 \text{ pctCap} - 0.76 H' - 0.84 \text{ mn_es}(50).05$$

$$p = e(\text{logit}(p)) / 1 + e(\text{logit}(p))$$

$$\text{BI} = 10(1 - p)$$

where:

H' = Shannon-Wiener H' diversity index

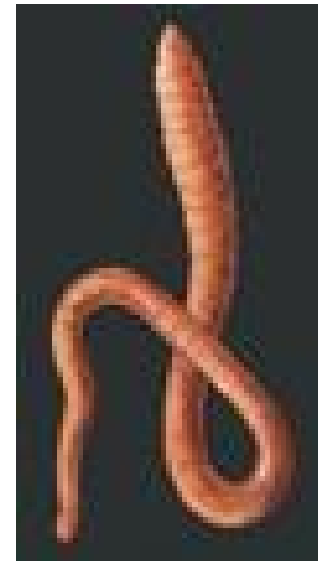
$\text{mn_es}(50).05$ = Station mean of species tolerance value of
Rosenberg et al. (2004)

PctCap = percent abundance of capitellid polychaetes

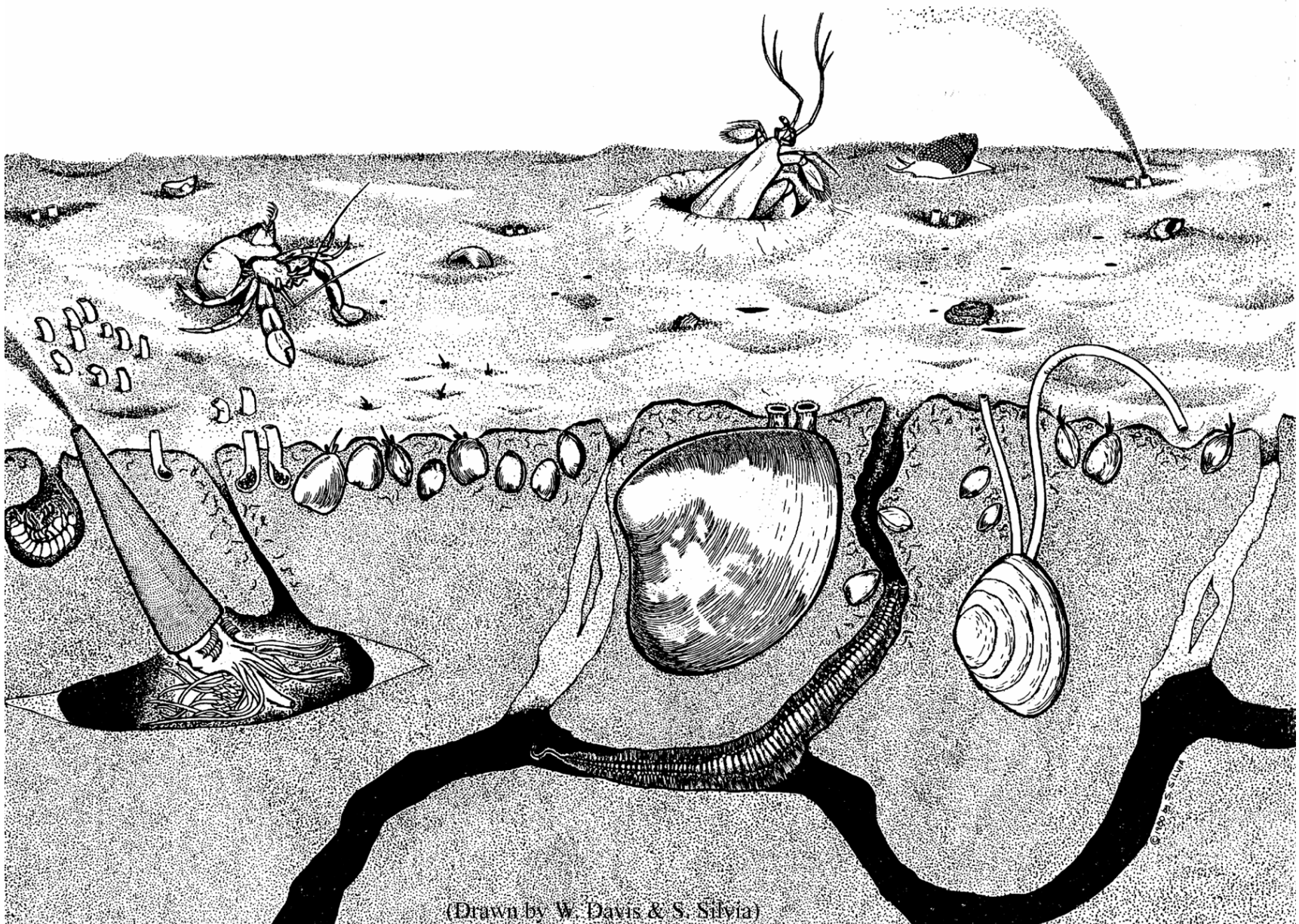
$n = 118$

$c = 0.82$

accuracy on calibration dataset = 80%



photo



(Drawn by W. Davis & S. Silvia)

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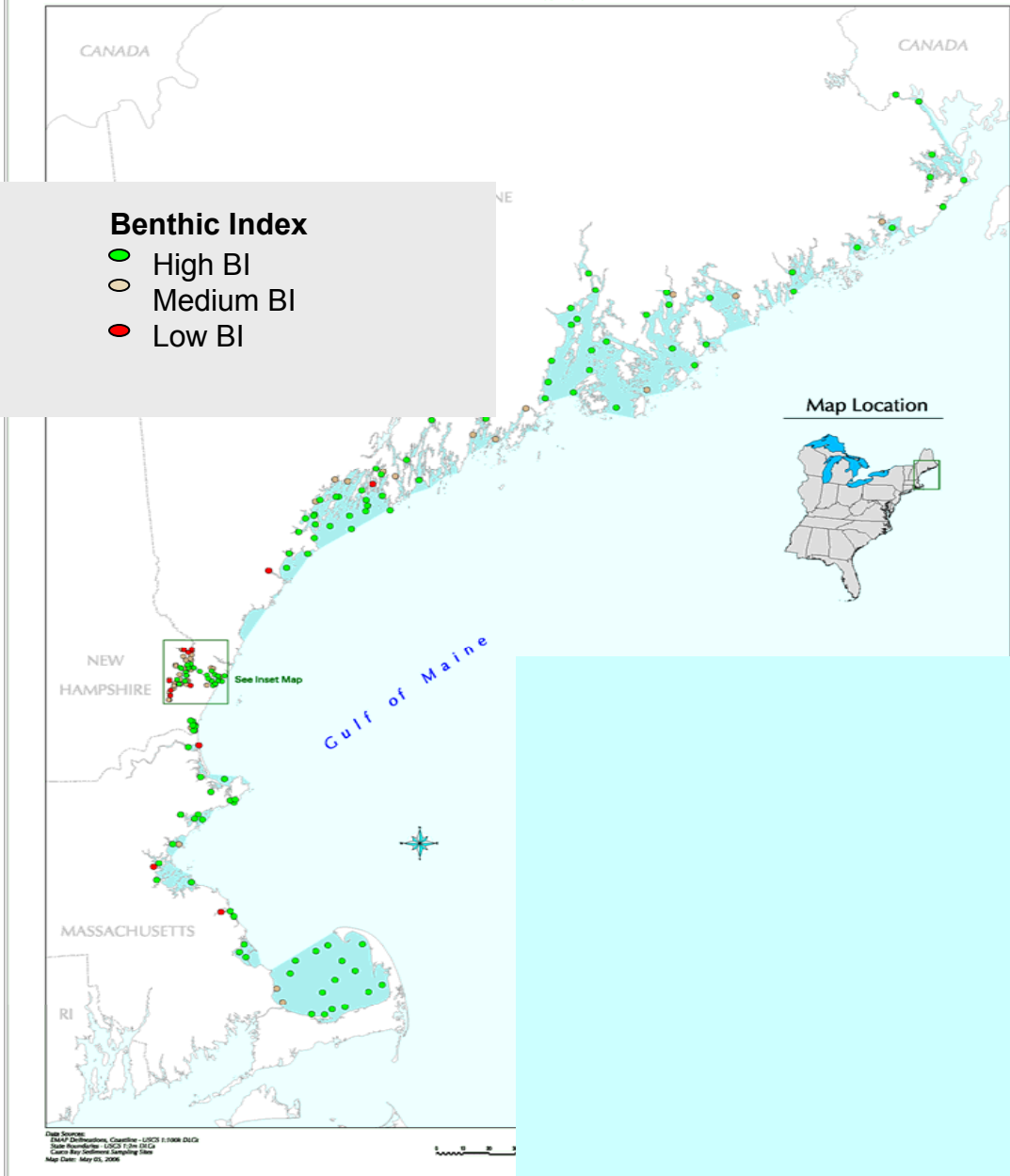
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NATIONAL COASTAL ASSESSMENT
Gulf of Maine Sampling Locations



Benthic Index

- High BI
- Medium BI
- Low BI



Map Source:
Bathy Coordinates, Coastal - USCG 8 1998 DNG
State Boundaries - USGS F 10m 10CG
Coastal Bay Sediment Sampling Sites
Map Date: May 01, 2006

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Validation from Massachusetts Water Resources Authority data set (n = 49 stations)

		Benthic Index		
		Low	High	
BEQ	Low	22	6	28
	High	4	17	21
	Total	26	23	49

$$\text{Accuracy} = (22 + 17) / 49 = 80\%$$

Casco Bay: overall accuracy = 74% but too few low BEQ stations to validate positive responses.

Validation from National Coastal Assessment 2002-2003 data set. (n = 67 stations).

		Benthic Index		
		Low	High	
BEQ	Low	17	4	21
	High	12	34	46
	Total	29	38	67

$$\text{Accuracy} = (17 + 34) / 67 = 76\%$$

How do environmental managers use a benthic index or ecological indicator?



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Signal Detection Theory provides a rigorous standard for evaluating ecological indicators and can guide environmental mgmt decisions.

Sensitivity of an indicator is the probability of a positive indicator, given that the true response is positive.

Specificity is the probability of a negative indicator, given that the true response is negative.

Receiver Operating Characteristic (ROC) curve is a plot of sensitivity versus specificity.

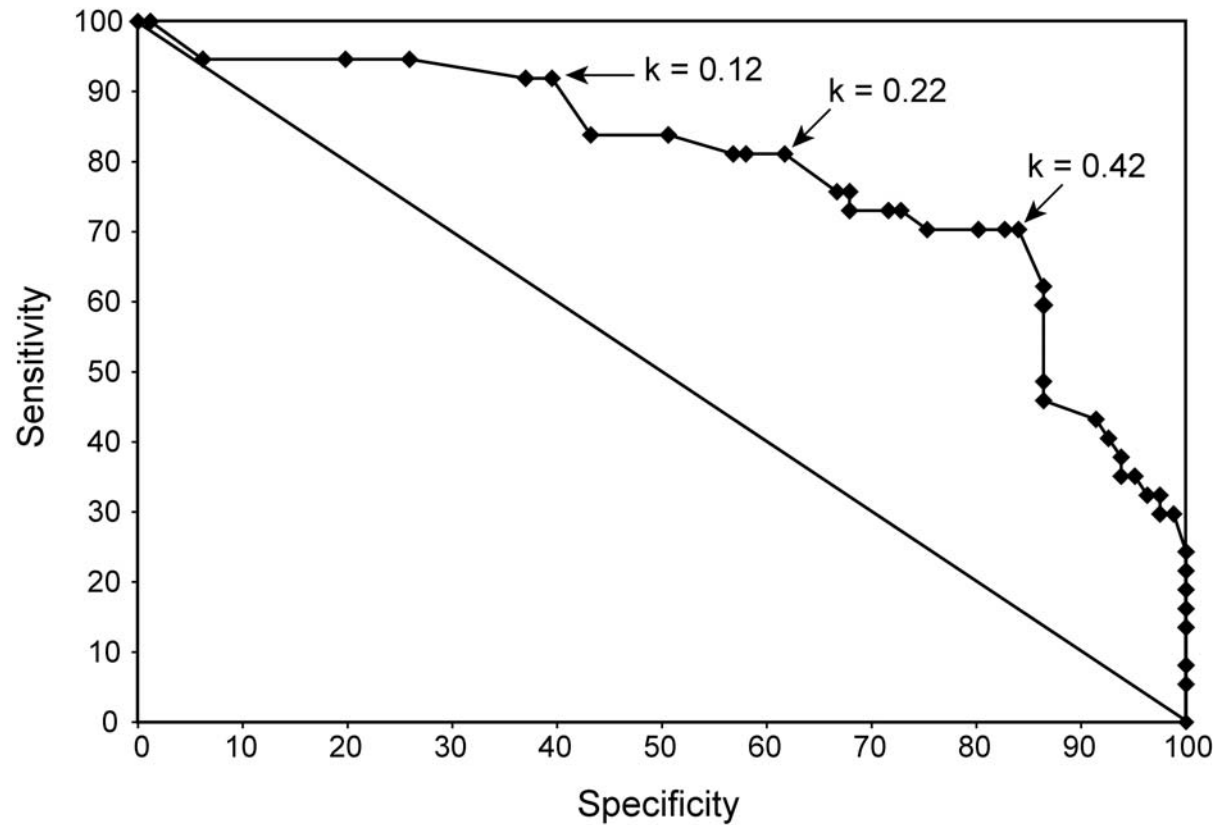
Positive predictive value (PPV) is the probability of a positive response, given that the indicator is positive.

Negative predictive value (NPV) is the probability of a negative response, given that the indicator is negative.

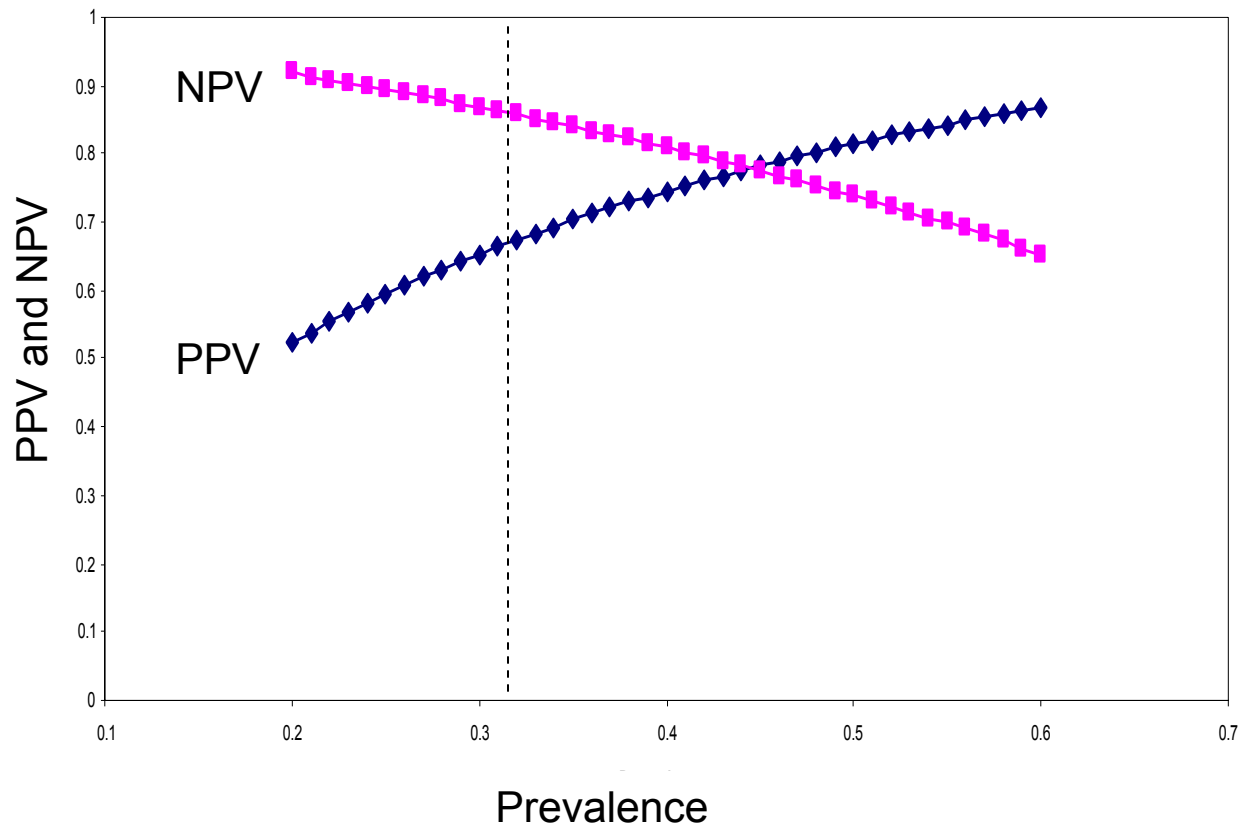
Receiver Operating Characteristic (ROC)

Gulf of Maine: All Stations

Fig. 4



Positive and Negative Predictive Values Gulf of Maine: All Stations Rule: $Y > 0.42$



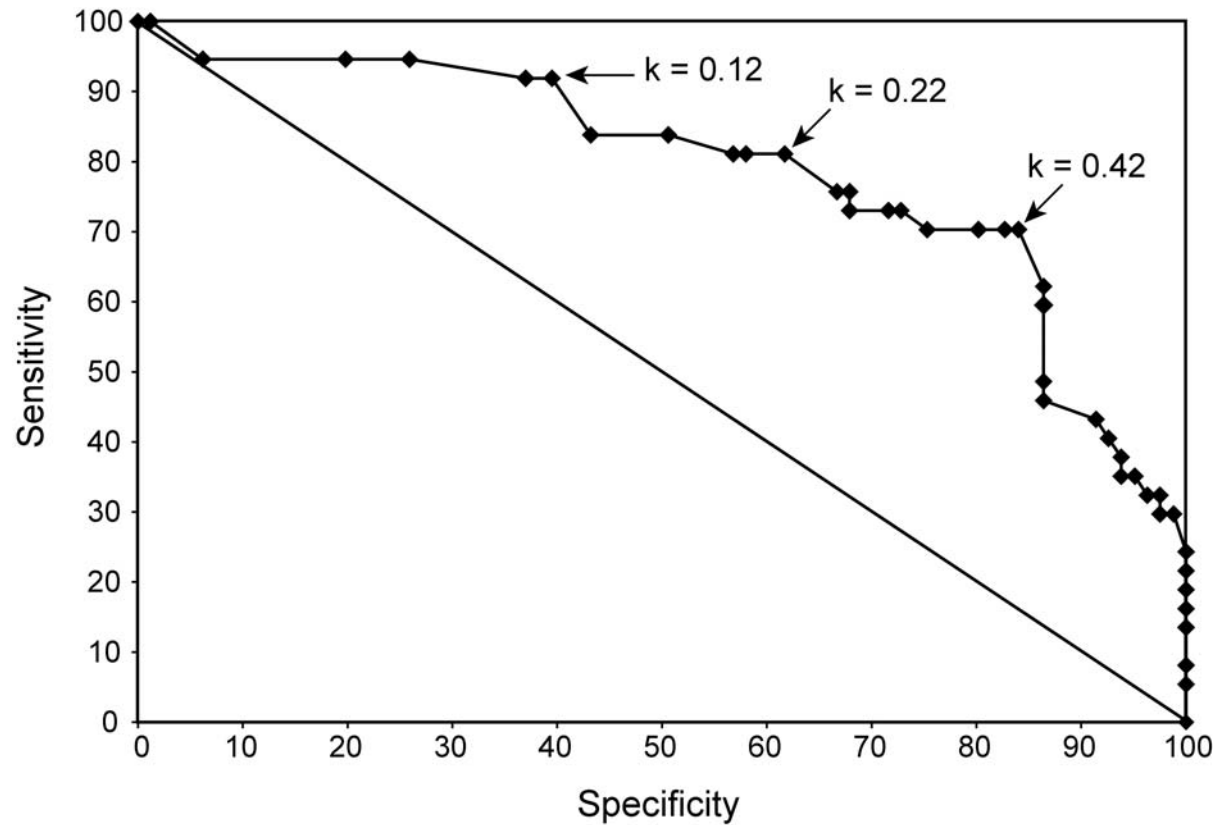
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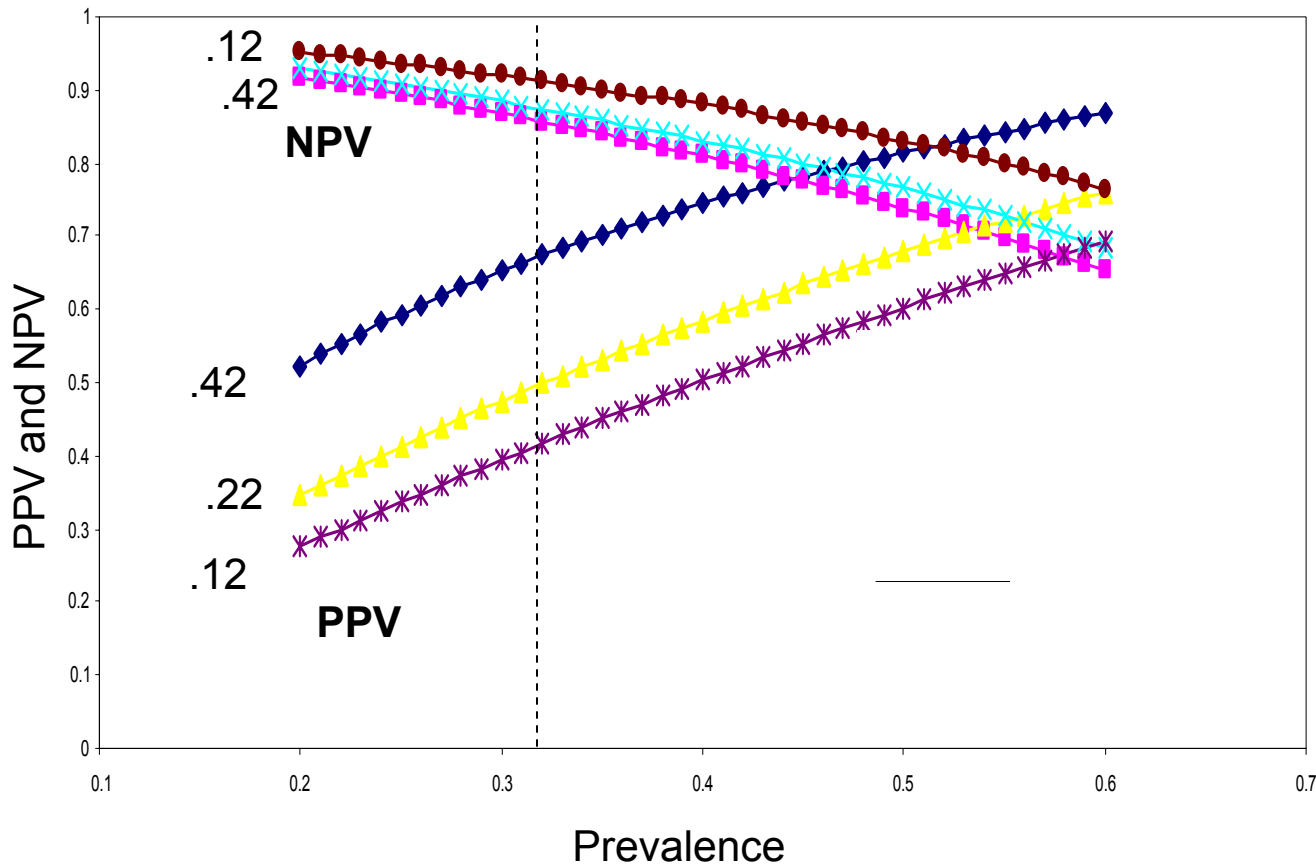
Receiver Operating Characteristic (ROC)

Gulf of Maine: All Stations

Fig. 4



Positive and Negative Predictive Values Gulf of Maine: All Stations Rules: $Y > 0.42$; $Y > 0.22$, $Y > 0.12$



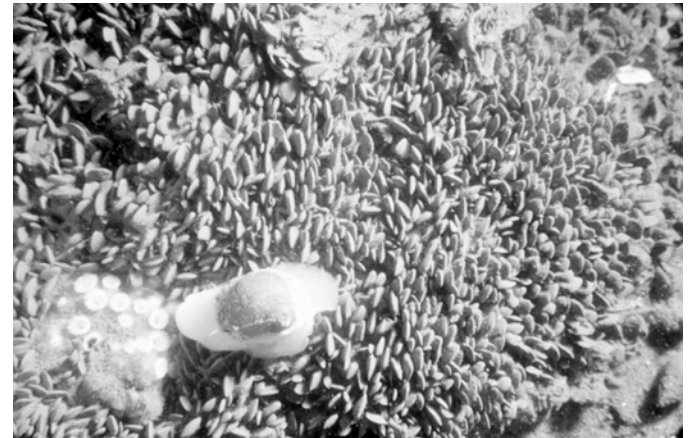
In summary, this benthic index will be useful for marine monitoring by showing spatial and temporal changes in benthic condition

> 80% correct classification with ecologically meaningful metrics

Stations with higher H' and $mn_es(50)_{.05}$ and lower $pctCap$ had higher benthic index values

Validated by 75-80% correct classification of independent datasets

Indicator evaluated with signal detection theory



H. W. Pratt

Next steps

- Further refine and validate candidate indices (2004-2006 data)
- Better account for habitat differences
- Testing by other people, other datasets
- Inter-calibration exercise with Virginian Province benthic index
- Expand to Canadian portion of the Gulf of Maine?

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