# Nutrient Limitation in Three Major Tributaries to Chesapeake Bay

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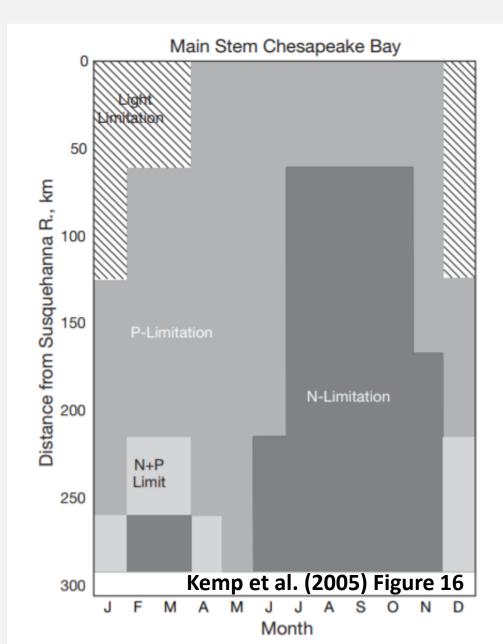
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<sup>h</sup> UMCES Chesapeake Biological Laboratory

## **Background**



- Large-scale dual nutrient reduction goals have been in place across the Chesapeake Bay watershed for decades.
- Chesapeake Bay has well-documented seasonal and spatial variations in nutrient limitation (e.g., Fisher et al. 1999, Kemp et al., 2005).
- In comparison, nutrient limitation patterns in tidal tributaries are less documented.

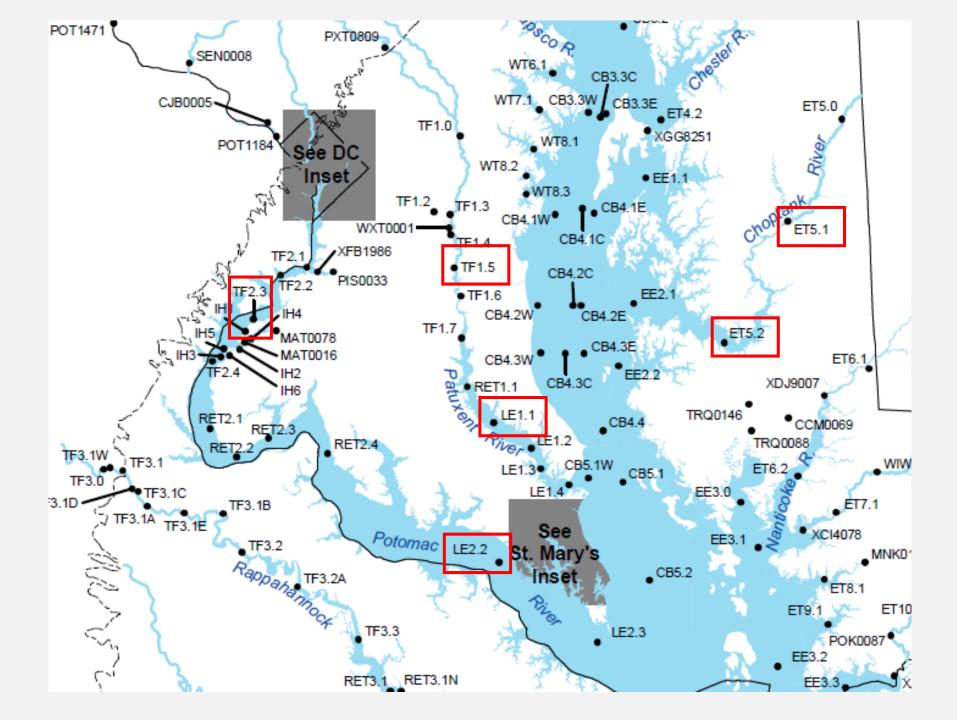
# **Hypothesis**

Given the long-term efforts to reduce nutrients and different trends in N and P loads, nutrient limitation patterns in the <u>tidal</u> <u>tributaries</u> may have changed <u>temporally</u>.

## **Objectives**

- 1. To <u>develop empirical approaches</u> to relate tidal monitoring data to bioassay-based nutrient limitation in the concurrent period of 1990-2003,
- 2. To apply the selected approach to monitoring data in recent periods to predict nutrient limitation and <u>explore potential</u> <u>changes</u> in limitation in response to altered nutrient loading.

## **Sites**



## **Bioassay Data**

**Table 1**. Station descriptions and sampling schedule for bioassays of resource limitation of phytoplankton growth. The number of samples at each station varied due to the sampling schedule (e.g., tidal fresh stations were sampled only 3 times per year), bad weather, boat mishaps, etc., and numbers of bioassays are cumulative since August, 1990. Turkey Point was sampled beginning in 2000, and several stations marked with "#" were sampled only in 2004. We discontinued sampling in Baltimore Harbor in 1993. Abbreviations: tidal fr. = tidal fresh.

Total nu	ımber	Stations:	16		Bioassays:	1070 Fisher et al. (2005)
	(oligohaline)	E of Gum Pt.	WT1.1	varies	17	
Bush	(tidal fresh)	Otter Point Cr.	—#	varies	16	2
CHOSCOL	(mesohaline)	Deep Landing	—#	varies	14	3
Chester		Rt.290 Br.	ET4.1 #	varies	15	3
Choptan	(mesohaline)	Cambridge	ET5.2	tue.	7	159
Chontan	nk (tidal fresh)	Ganey Wharf	ET5.1	tue.	6	64
Ротошас	(mesohaline)	Ragged Pt	LE2.2	mon. mon.	3	143
Dotomo	(mesohaline) c (tidal fresh)	Jack Bay Indian Head	LE1.1 TF2.3	thurs.	10 2	154 64
	(tidal fresh)	Jug Bay	—# LE1.1	thurs.	13	3
Patuxen	t (tidal fresh)	Nottingham	TF1.5	thurs.	9	66
	re Harbor	Baltimore H.	WT 5.1	NA	8	26
		Point-no-point	CB 5.2	mon.	1	131
		R64 buoy	CB 4.3C	tues.	5	130
		Bay bridge	CB 3.3C	tues.	4	117
Main Ba	ny stations	Turkey Pt	CB 2.1	wed.	11	13
sampling	g area	description	MDE sta.ID	day	ID#	Samples
				sampling	our	# of

## **Bioassay Categories**

Table 4. Weighting factors used to compute indices of N, P, and light limitation of algal growth in Chesapeake Bay using nutrient addition bioassays. Each classified bioassay (see Table 2 and Fig. 2) contributed the amounts shown below to the index, which was then divided by the total number of bioassays. Each index of N, P, or light limitation =  $(\sum w)/n$ , where w is the weighting factor assigned to each of the n bioassays. This results in an index ranging from 0 (no limitation) to 1 (completely limited). Abbreviations: EXN = exclusive N; PRN = primary N; BNP = balanced NP; PRP = primary P; EXP = exclusive P; NOR = no response to added nutrients.

	weighting factors						
Type of Index	EXN	PRN	BNP	PRP	EXP	NOR	
N limitation	1.00	0.75	0.50	0.25	0.00	0.00	
P limitation	0.00	0.25	0.50	0.75	1.00	0.00	
Light limitation	0.00	0.00	0.00	0.00	0.00	1.00	

## **Limitation Classes**

## N limitation:

N index > 0.5

## P limitation:

• P index > 0.5

## **N+P limitation:**

both indices ~0.5

## NoR

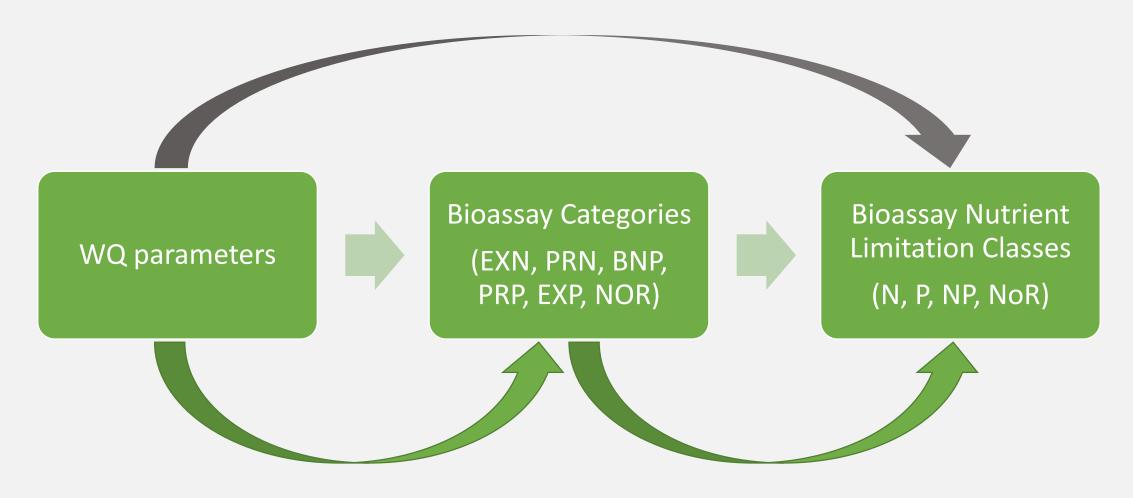
others

## **Data**

- Bioassay data collected in 1990-2003 (Fisher et al.)
  - Bioassay categories: EXN, PRN, BNP, PRP, EXP, NOR
  - Bioassay-based nutrient limitation classes: N, P, NP, NoR
- Tidal WQ Monitoring Data in 1990-2018
  - Chesapeake Bay Program's fixed-station, long-term water-quality monitoring network (provided by MDDNR, VADEQ, etc.)
  - Downloaded from the Data Hub: <a href="https://datahub.chesapeakebay.net/">https://datahub.chesapeakebay.net/</a>
  - Data Manipulations:
    - ✓ missing values;
    - ✓ below-detection-limit values;
    - ✓ aggregation of different depths;
    - ✓ calculation of N:P ratios and indices, etc.

# **Summary of Tributary Bioassay & Tidal WQ Data**

			l Developn 1990-2003)	nent	Model Prediction (2 periods)		
Station	Tributary	Bioassay Categories (Y)	Tidal WQ Samples (Xs)	Matched Pairs	Tidal WQ Samples (1990-2003)	Tidal WQ Samples (2004-2017)	
ET5.1	Choptank	55	249	48	249	191	
ET5.2	Choptank	128	252	114	252	189	
TF1.5	Patuxent	61	252	57	252	168	
LE1.1	Patuxent	136	269	128	269	203	
TF2.3	Potomac	60	241	48	241	211	
LE2.2	Potomac	133	237	120	237	209	



## **CART**

(feature selection) (cross validation)

# **Aggregation Rule**

(N index) (P index)

## **Hypothesis**

Given the long-term efforts to reduce nutrients and different trends in N and P loads, nutrient limitation patterns in the <u>tidal</u> <u>tributaries</u> may have changed <u>temporally</u>.

## **Objectives**

- 1. To develop empirical approaches to relate tidal monitoring data to bioassay-based nutrient limitation in the concurrent period of 1990-2003,
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S1: We previously developed a CART model for the mainstem stations. How well can this model reproduce the bioassay-based nutrient limitation classes in the three tributaries?

### **Mainstem Model**

ET5.1: 5/12

ET5.2: 8/12

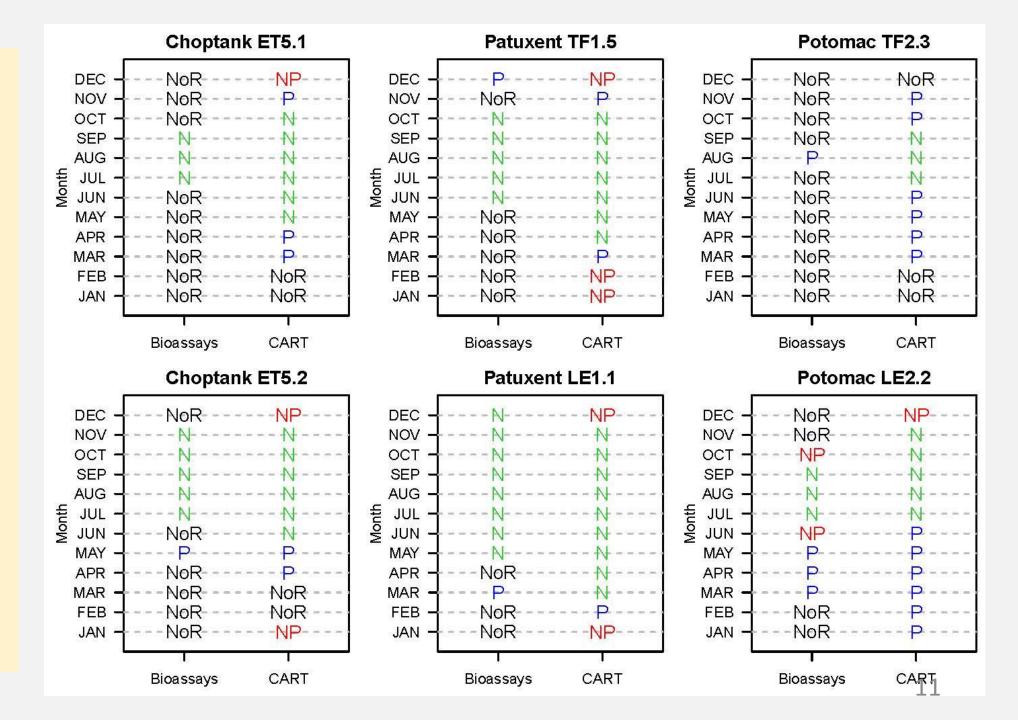
TF1.5: 5/12

LE1.1: 7/12

TF2.3: 3/12

LE2.2: 6/12

Total: 34/72 (47%)



S2: Since the mainstem model works poorly, let's develop a model for the six stations (response = bioassay categories, i.e., EXN, PRN, BNP, PRP, EXP, NOR).

## Single Tributary Model

ET5.1: 8/12

ET5.2: 11/12

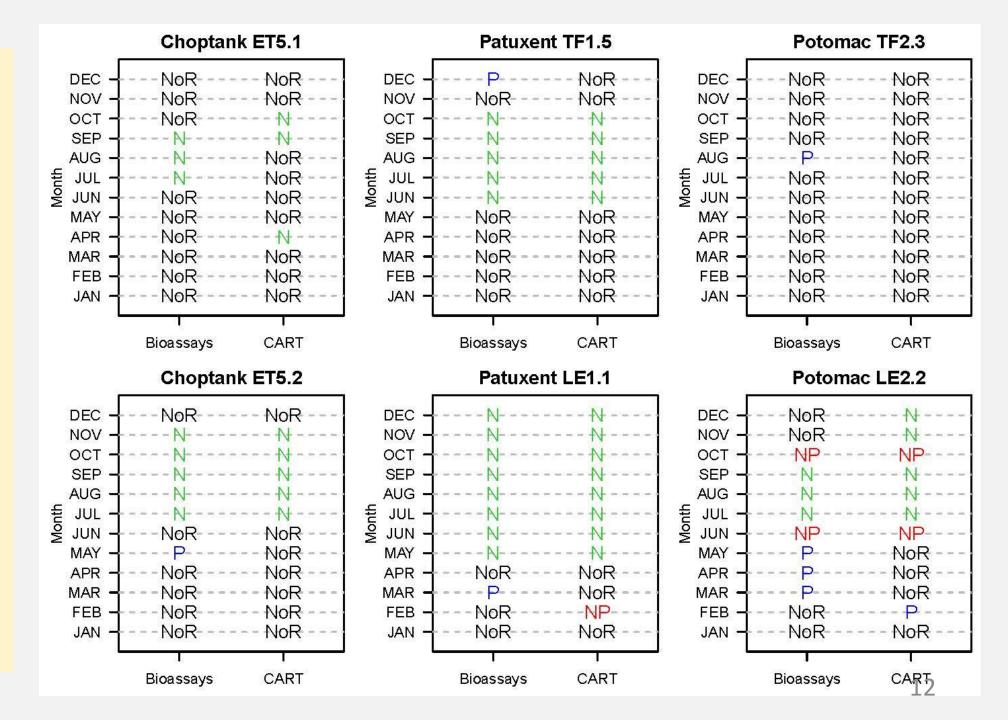
TF1.5: 11/12

LE1.1: 10/12

TF2.3: 11/12

LE2.2: 6/12

Total: 57/72 (79%)



S3: Let's develop two separate models, one for TF stations and the other for MH stations.

#### TF Model + MH Model

ET5.1: 10/12

ET5.2: 10/12

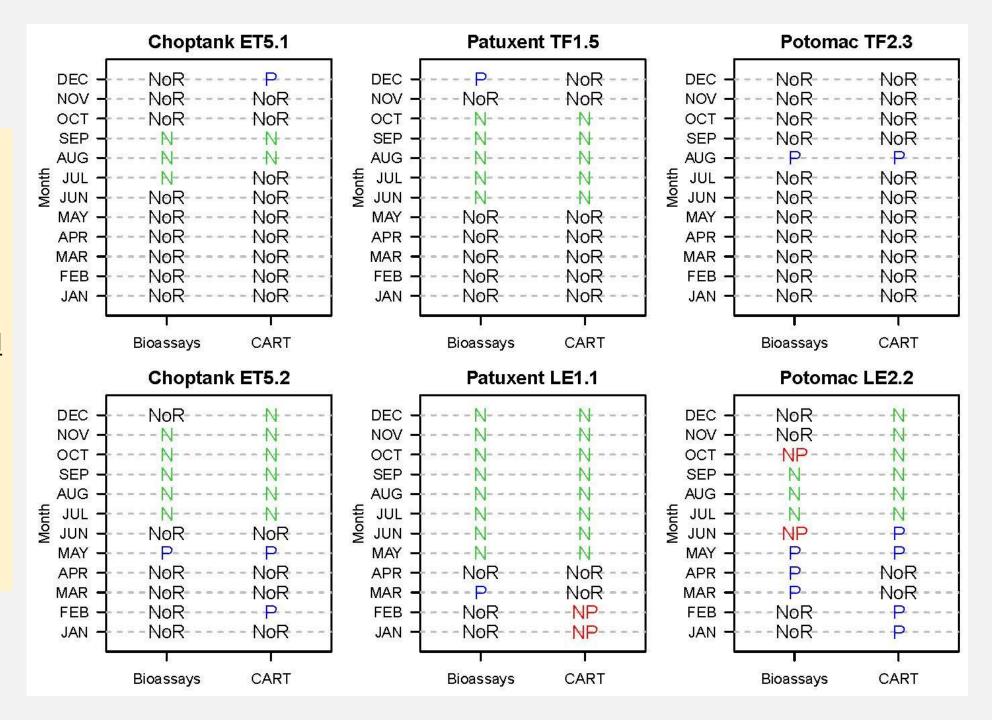
TF1.5: 11/12

LE1.1: 9/12

TF2.3: 12/12

LE2.2: 4/12

Total: 56/72 (78%)



S4: Let's develop a separate model for each tidal station.

### Station-level Model

ET5.1: 12/12

ET5.2: 12/12

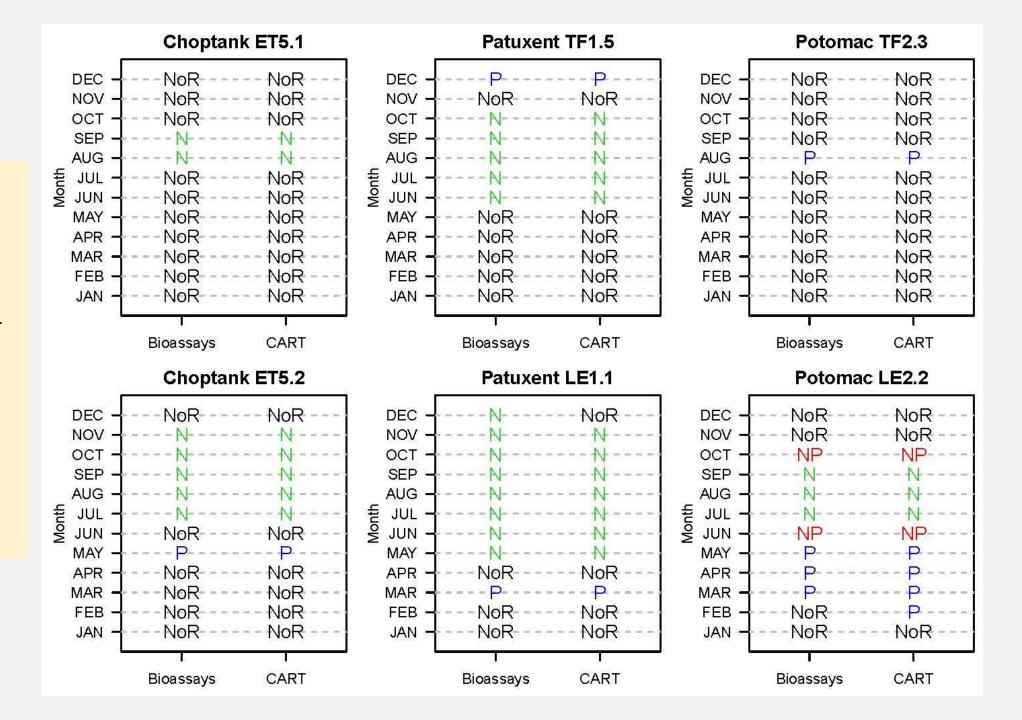
TF1.5: 12/12

LE1.1: 11/12

TF2.3: 12/12

LE2.2: 11/12

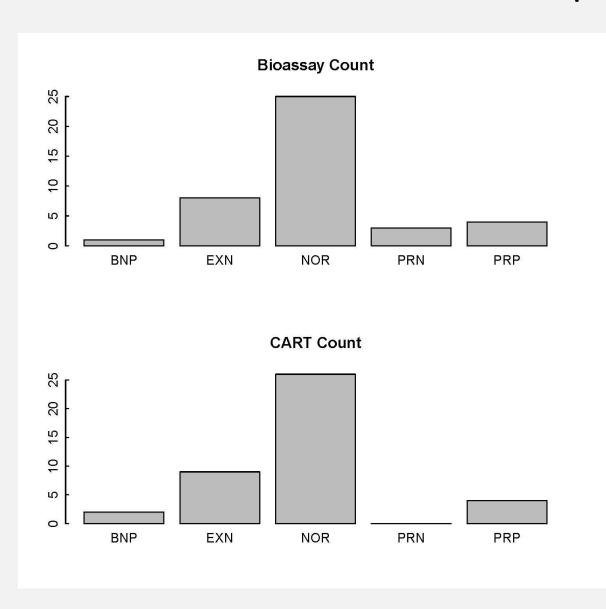
Total: 70/72 (97%)

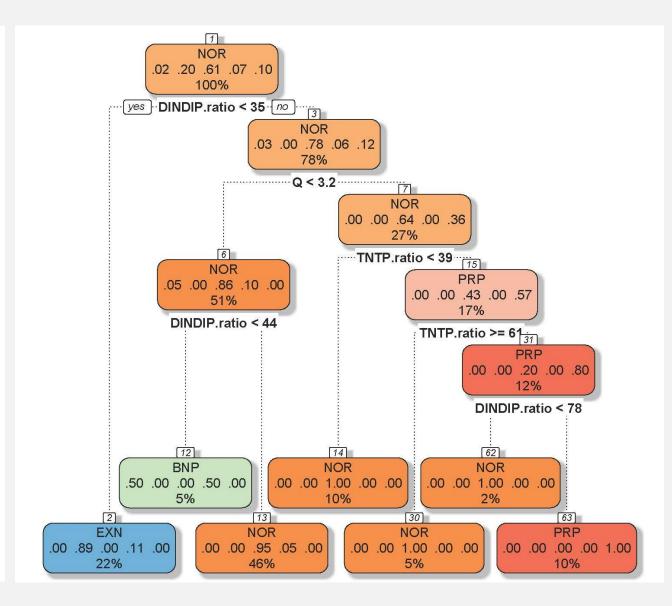


# **Summary of Model Performance**

Models	ET5.1	ET5.2	TF1.5	LE1.1	TF2.3	TF2.3	Classification Rate
A. 1 model using mainstem data	5/12	8/12	5/12	7/12	3/12	6/12	34/72 = 47%
B. 1 model using tributary data	8/12	11/12	11/12	10/12	11/12	6/12	57/72 = 79%
C. 1 model for TF + 1 model for MH	10/12	10/12	11/12	9/12	12/12	4/12	56/72 = 78%
D. 6 models, one for each station	12/12	12/12	12/12	11/12	12/12	11/12	70/72 = 97%

# Choptank ET5.1





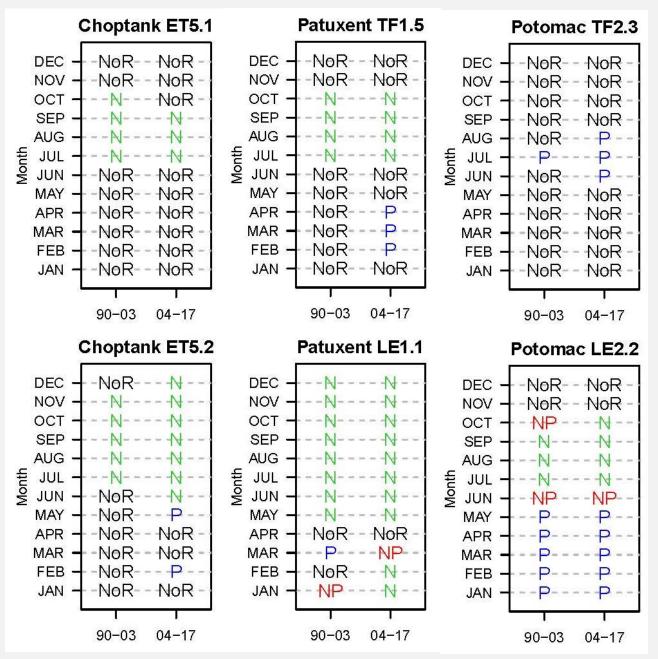
# **Hypothesis**

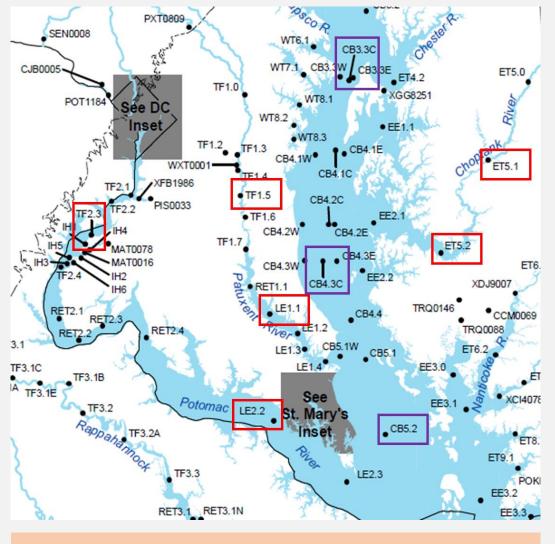
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# Predicted Limitation by 14-yr Periods





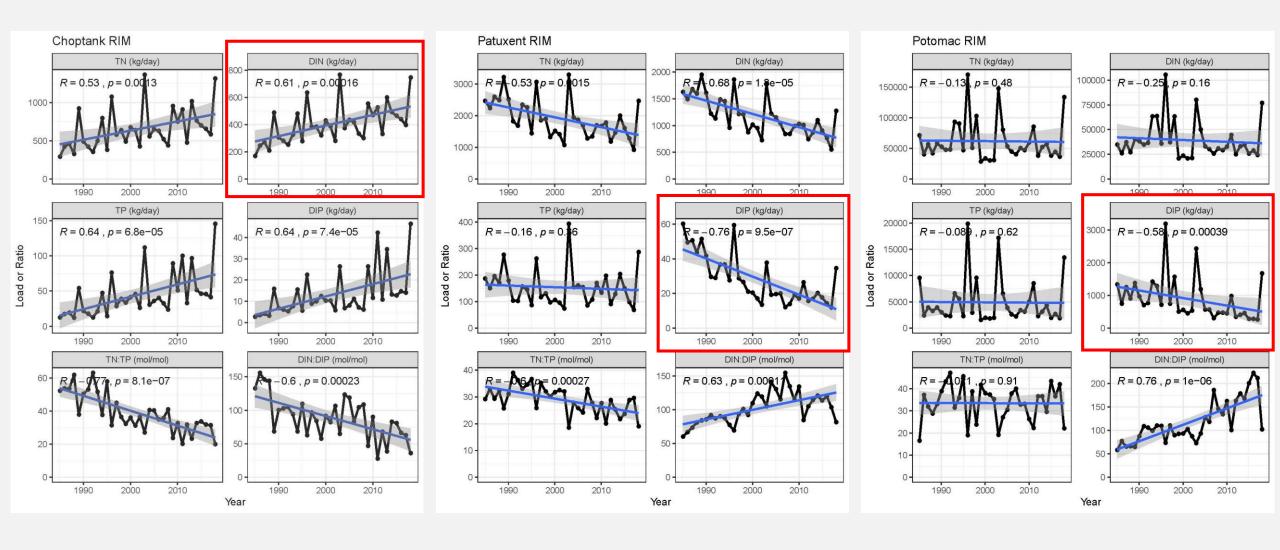
#### **Upstream station:**

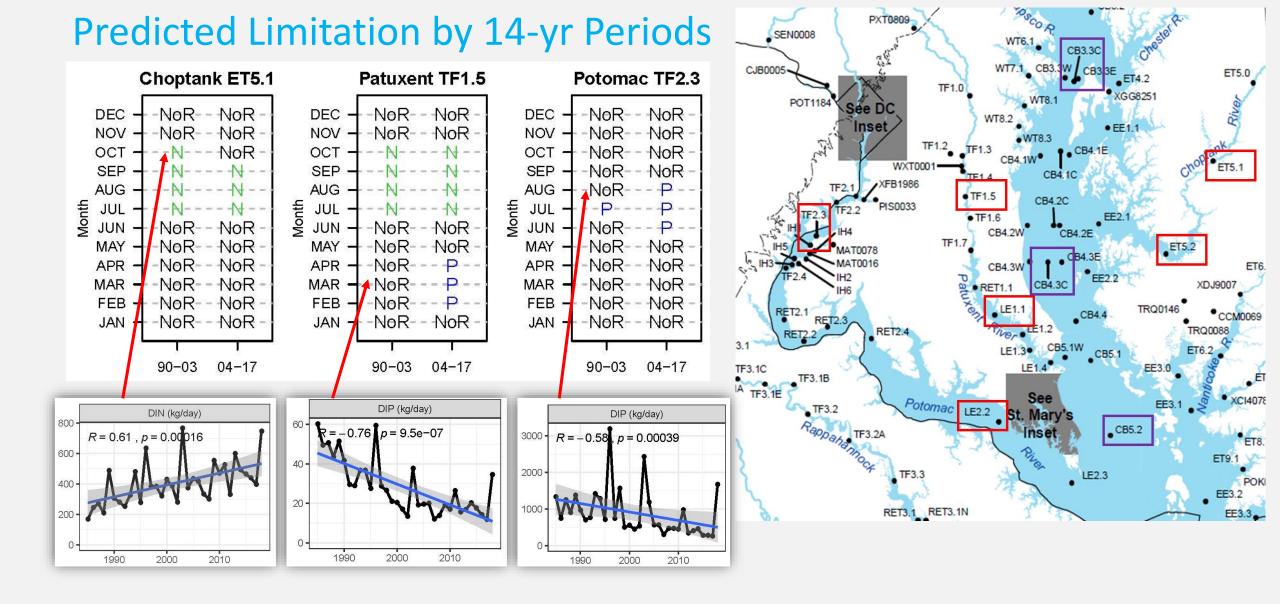
Mostly NoR and N, seldomly P, never NP.

### Downstream station:

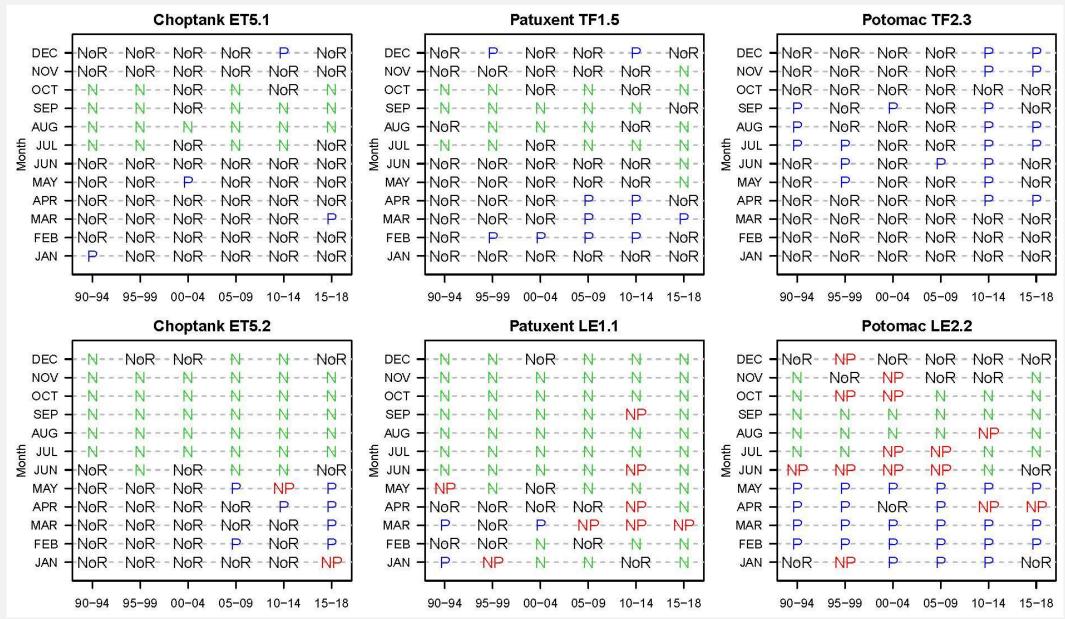
Mostly N, fewer NoR, more P and NP. 18

## **RIM Loads**

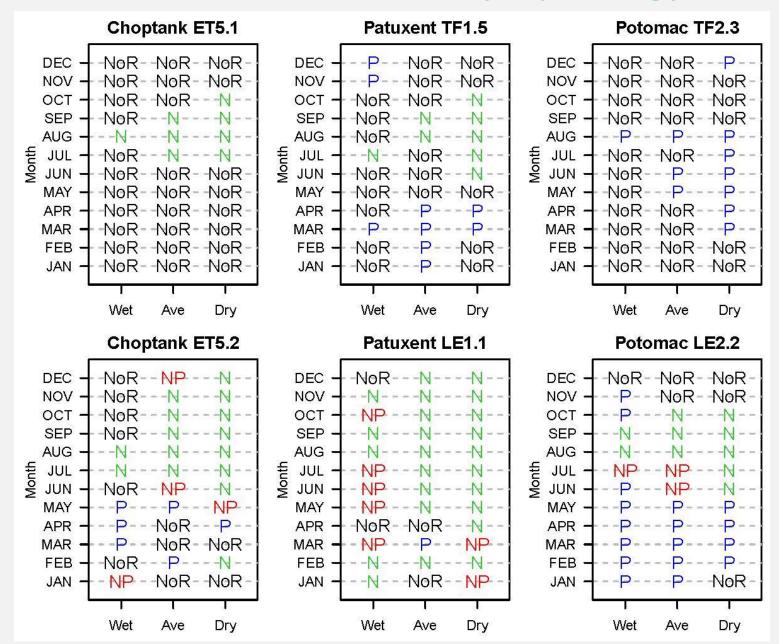




## Predicted Limitation by 5-yr Periods



# **Predicted Limitation by Hydrology**



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## **Objectives**

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## **Next Steps**

- 1. To <u>develop empirical approaches</u> to relate tidal monitoring data to bioassay-based nutrient limitation in the concurrent period of 1990-2003.
  - Refine residence time and RIM/below-RIM loads calculation
  - Consider ensemble models
  - WWTP signals in the three tribs
- 2. To apply the selected approach to monitoring data in recent periods to predict nutrient limitation and <u>explore potential</u> changes in limitation in response to altered nutrient loading.
  - Link to RIM and below-RIM load trends for specific months
  - Add uncertainties to CART predictions
  - Validate CART using additional bioassays from other tributaries