# California Stream Nutrient Objectives Stakeholder Advisory Group Webinar

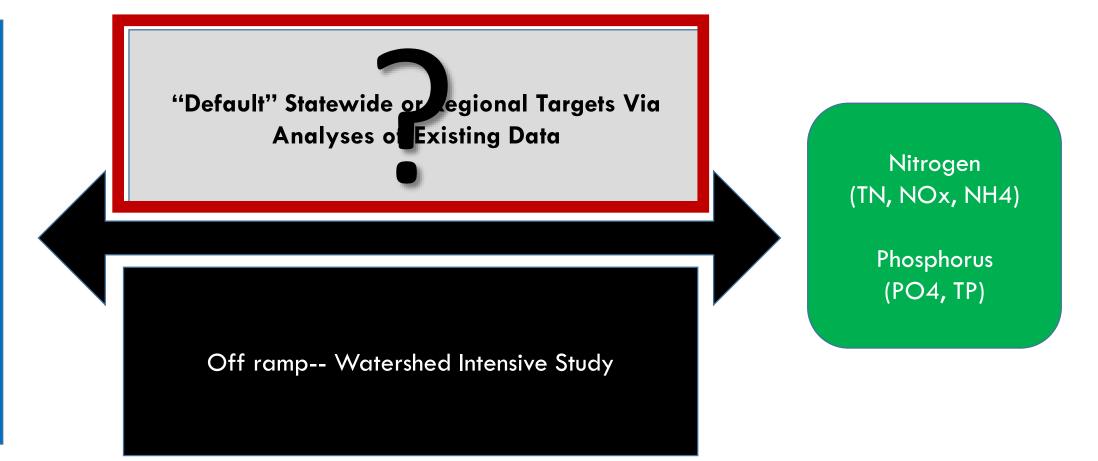
August 21, 2015 1:00 – 2:30 pm

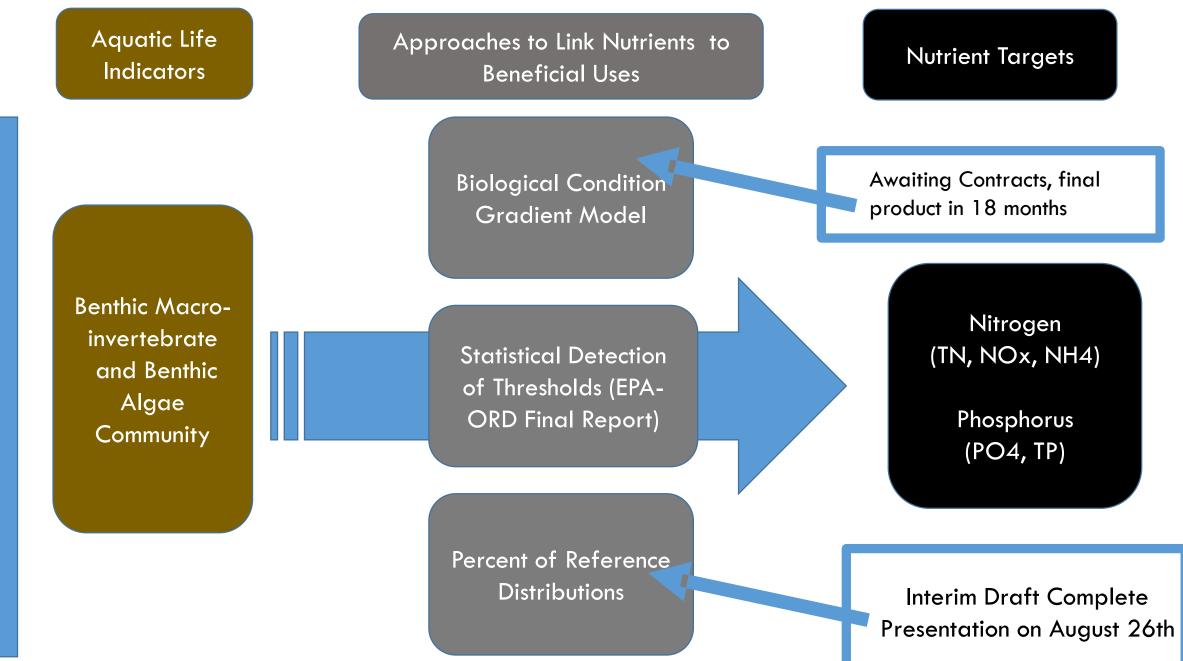


### CONTEXT FOR TODAY'S MEETING

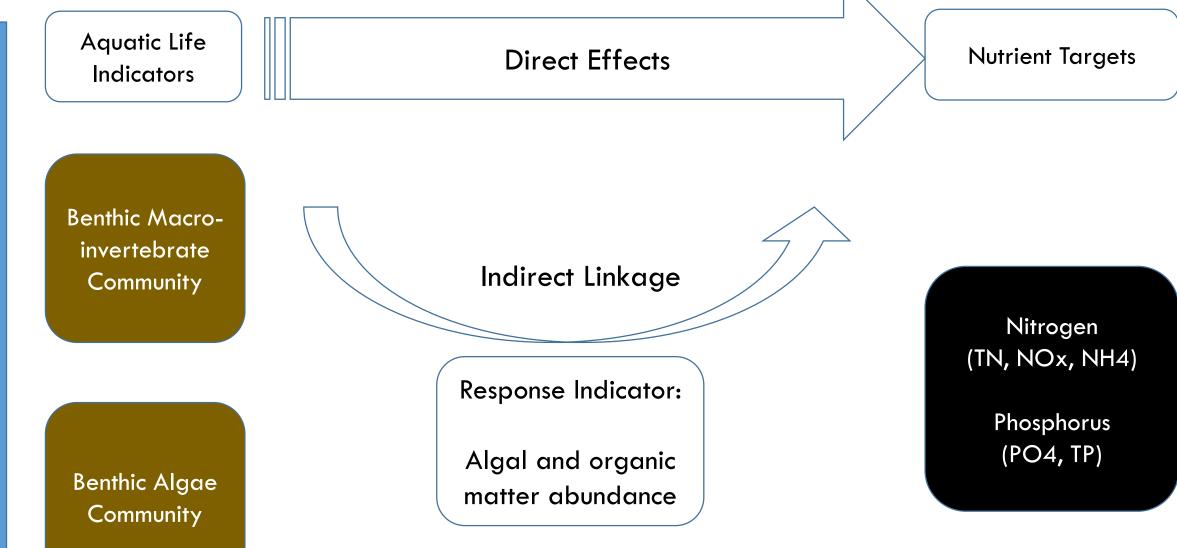
- California State Water Board has a work plan to develop nutrient objectives for the State's waterbodies, focusing first on wadeable streams
- A Science Plan has been produced to describe technical activities that will support policy decisions on nutrient objectives in wadeable streams
  - An independent Science Panel has reviewed this plan; findings and recommendations are available on the Water Board website
- Today (and next week) we will report out on some of the interim products from that Science Plan
- We are planning a fall meeting to provide response to Science Panel recommendations and discuss your feedback on these interim products

#### Science To Support Decisions on Nutrient Targets Protective of Beneficial Uses

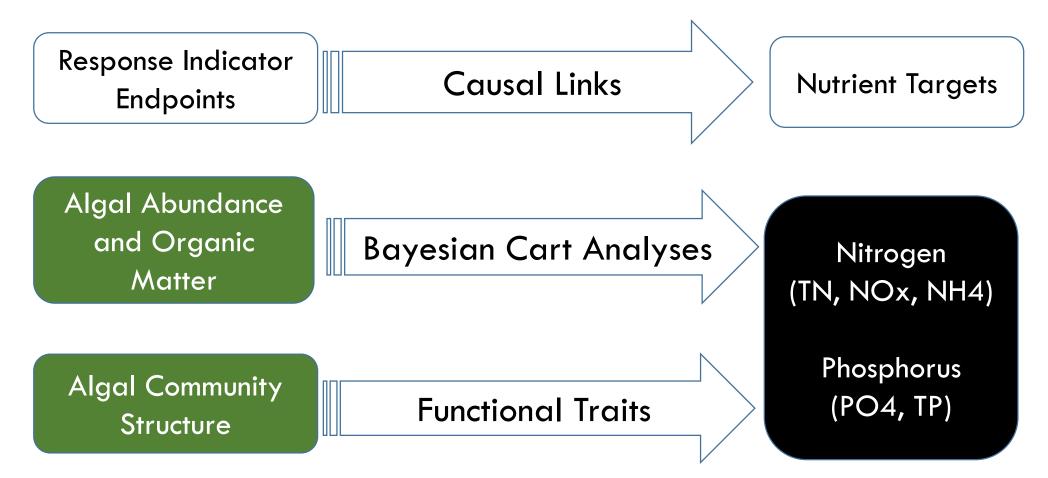




#### TWO APPROACHES TO LINK NUTRIENTS TO RESPONSE INDICATORS



Protection Use Beneficial FOCUS OF TODAY'S WEBINAR: MODELING RELATIONSHIP BETWEEN POTENTIAL RESPONSE INDICATORS AND NUTRIENTS



B-Cart Report in Draft, Focus of Today's Webinar

#### TECHNICAL PRODUCTS STATUS AND SCHEDULE FOR REVIEW

Product	Status	SAG/RG	Science Panel	
Conceptual Approach and Waterbody Classification	Interim report draft complete		Winter 2015	
Candidate Indicator Review	In progress			
Percentile of Reference	Interim report draft complete	Fall 2015		
<b>B-CART Nutrient-Response Modeling</b>	Interim report draft complete			
<b>Biological Condition Gradient Model</b>	Contract pending	14 months	18 months	
Algal Community Nutrient Response Relationships	Analyses complete			
Synthesis and Recommendations	Pending completion of technical elements	16 months	18 months	

### GOAL OF TODAY'S WEBINAR: NUTRIENT-RESPONSE MODELING

Provide an overview of the approach and findings of analyses to relate nutrients to indicators of algal abundance/organic matter (Preview of science that you will see in interim report)

Preview approach to relate algal species composition to nutrient concentration (work in support of Biological Condition Gradient Model)

# Models Relating Algal Abundance to Nutrients and Co-factors in California Wadeable Streams

Betty Fetscher Martha Sutula

## Background

- Biomass-based endpoints under the NNE would require a translation back to nutrient concentrations for management purposes
- Numerous factors modulate biomass response to nutrients and need to be accounted for in models
- Previous ("1<sup>st</sup>-generation") work (Fetscher et al. 2014) generated models with high predictive power, but uncertainty about implementation details means alternative modeling approaches should also be considered

➤Today we will present "2<sup>nd</sup>-generation" models

### Modeling Approach:

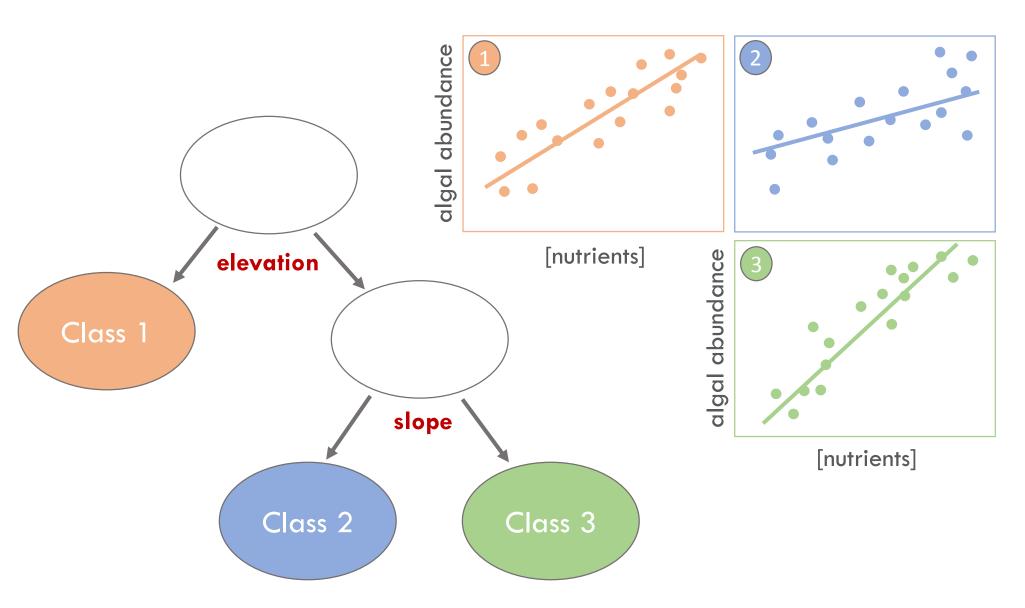
#### Bayesian Classification and Regression Trees (B-CART) analysis

- Models primary producer abundance response to nutrients
  - chlorophyll a
  - AFDM
  - macroalgal % cover
- Uses site-specific factors (natural gradients only, for 2<sup>nd</sup>-generation) to assign sites to classes

> This differs from the previous version, which included anthropogenic

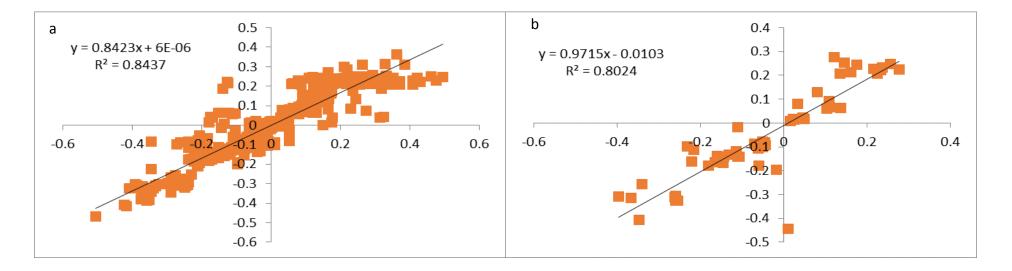
• Yields simplified set of regression models to predict algal biomass by site "class", along with a set of rules to define the classes

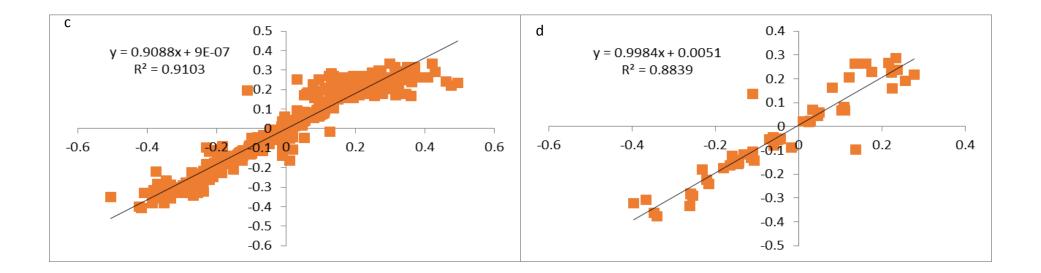
### How B-CART Works



Models predicting biomass from nutrients, customized for site classes defined by (natural) gradients

#### 1<sup>st</sup>-Generation B-CART Model Performance





## Interpreting 1<sup>st</sup>-Generation Model Results

- Very impressive predictive power!
- Anthropogenic gradients (including nutrients themselves) were included as classification & predictor variables, and these were retained (=important) in most of the final models
- But there are questions as to whether to include anthropogenic factors in the models (more on that later...)

### 2<sup>nd</sup>-Generation B-CART, List of Variables

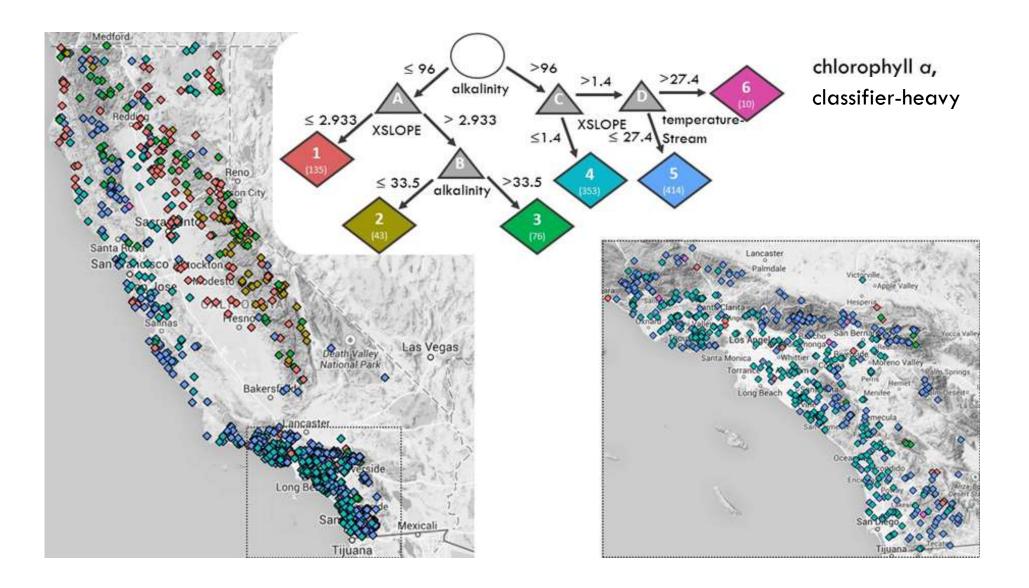
- RESPONSE VARIABLES (algal biomass indicators of eutrophication)
  - $\circ$  benthic chlorophyll a
  - benthic ash-free dry mass (AFDM)
  - macroalgal percent cover (PCT\_MAP)
- EXPLANATORY VARIABLES
  - Nutrients
    - total nitrogen (TN)
    - total phosphorus (TP)
    - nitrate + nitrite (NO<sub>x</sub>)
    - orthophosphate (PO<sub>4</sub>)
    - ammonium (NH<sub>4</sub>)
  - Landscape geographic
    - site elevation
    - watershed area
    - percent sedimentary geology in the catchment
    - modeled atmospheric deposition
  - Landscape meteorological
    - mean monthly % cloud cover (3-mo antecedent mean)
    - mean monthly max temperature (3-mo antecedent mean)
    - mean monthly solar radiation (3-mo antecedent mean)
    - total precipitation (3-mo antecedent total)
    - degree days from onset of growing season to sampling date
    - day of year

- Local physical habitat ("PHab")
  - percent cover of coarse particulate organic matter in streambed
  - percent cover of fine substrata in streambed
  - percent sand + fines in streambed
  - percent canopy cover
  - estimated days of accrual (i.e., number of days since last scour event)
  - mean stream depth
  - mean stream width
  - slope, reach-level
  - stream discharge
  - stream temperature
- Water chemistry (general)
  - alkalinity
  - conductivity
  - turbidity
- 2 model types examined:
- classifier-heavy
- predictor-heavy

#### 2<sup>nd</sup>-Generation B-CART, Final Classifiers

	Model	biomass response variable	alkalinity	day of year	reach slope	percent coarse particulate organic matter (CPOM)	stream temp- erature	canopy closure (XDENMID)	percent fine sub- strata	turbidity x depth
		chlorophyll <i>a</i>	х		х		x			
clas	sifier	AFDM	х	Х		х				
-hea	avy	macroalgal percent cover (PCT_MAP)	х	х				x		
		chlorophyll a	х	х	х					
•	lictor	AFDM	х	х		х				
-hea	vy	macroalgal percent cover (PCT_MAP)	х	x					х	x

### Example of 2<sup>nd</sup>-Generation B-CART Tree

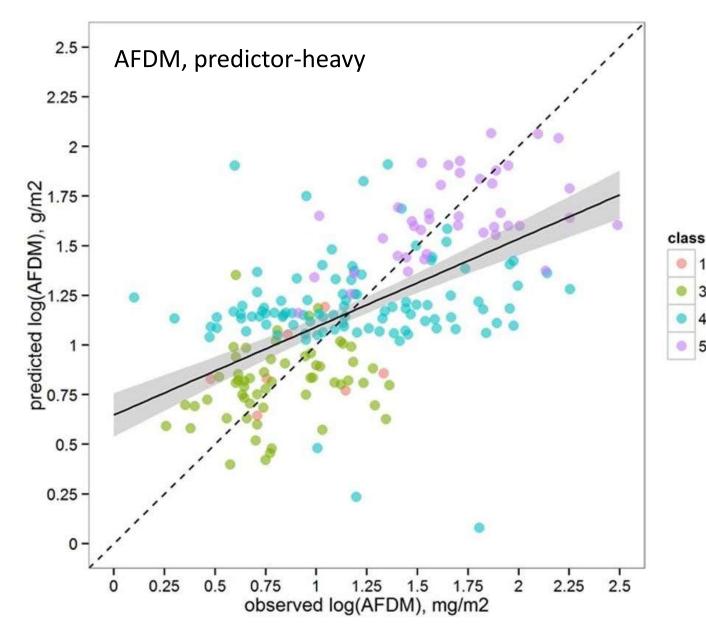


## Predictive Power of 2<sup>nd</sup>-Generation B-CART Models

Model	<b>Biomass Response</b>	Intercept	Slope	Adjusted R <sup>2</sup>
; <b>(</b> ;	AFDM	0.761 (0.083)	0.364 (0.062)	0.348
classifier -heavy	chlorophyll <i>a</i>	0.867 (0.070)	0.343 (0.046)	0.375
-neavy	macroalgal percent cover	0.594 (0.068)	0.376 (0.056)	0.440
predictor -heavy	AFDM	0.694 (0.067)	0.389 (0.052)	0.209
	chlorophyll <i>a</i>	0.448 (0.082)	0.497 (0.064)	0.435
	macroalgal percent cover	0.812 (0.027)	0.247 (0.023)	0.261

### Example of 2<sup>nd</sup>-Generation Observed vs. Predicted

- Suboptimal fit
- Biased



## Pros/Cons of Including Anthropogenic Factors (nutrients, etc.)

Cons:

- Including nutrients as classifiers can truncate nutrient gradients within classes
- Some anthro factors are confounded with nutrients, thus risking the removal of an unquantified portion of the nutrient variance from the nodal regression relationships

> Concern about the cons prompted the 2<sup>nd</sup>-generation analysis

## Pros/Cons of Including Anthro Factors (nutrients, etc.)

Pros:

- B-CART forces linear regression relationships within tree nodes, and allowing nutrient concentrations to classify sites can accommodate any potential non-linear relationships
- Certain anthropogenic factors can be important in modulating biomass response to nutrients, and thus perhaps should not be ignored (e.g., % imperviousness → peak flows → scouring; herbicides)

## B-CART Models – Sum Up

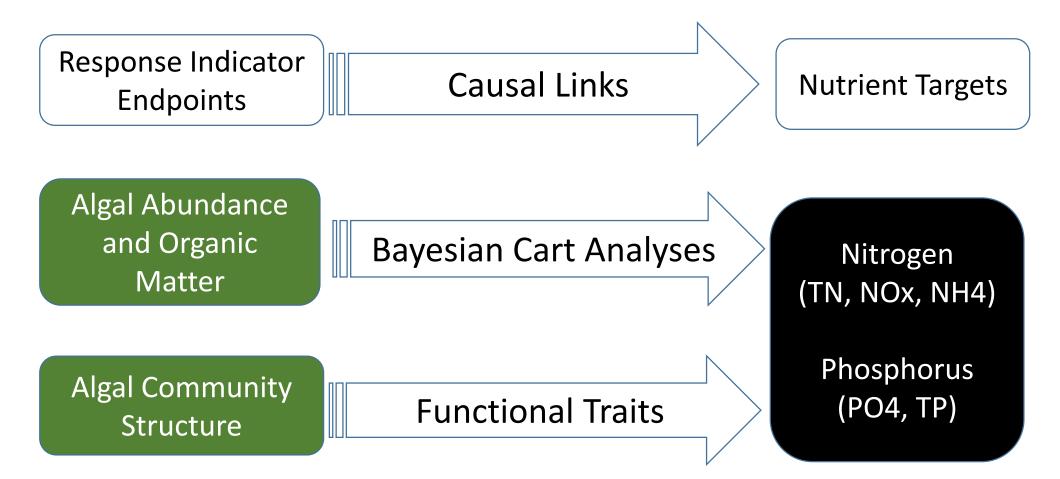
- 1<sup>st</sup>-generation models performed much better than 2<sup>nd</sup>
- Excluding anthropogenic factors in 2<sup>nd</sup>-generation increased noise (weakening predictive power) and may have contributed to bias in model results
- Will need to understand how the models might be used, in order to determine what modeling approach is most appropriate (i.e., is it OK to leave in nutrients and other anthropogenic factors in order to reap improved model performance?)

#### Looking Ahead:

Quantifying Algal Taxon Relationships to Nutrients

- Exploratory exercise that can help with the upcoming Biological Condition Gradient (BCG) development effort
- Uses Indicator Species Analysis to identify relationships between algal (diatom/soft) taxa relative occurrences and binned (quartiles) nutrient concentration categories
- Has identified taxa with affinities to low vs. high nutrient concentrations for 5 nutrient types (TN, TP, NO<sub>x</sub>, NH<sub>4</sub> OPO<sub>4</sub>)

#### MODELING RELATIONSHIP BETWEEN POTENTIAL RESPONSE INDICATORS AND NUTRIENTS



B-Cart Report in Draft, Focus of Today's Webinar

## Example: Diatom Indicator Taxa for TN

maxGroup	diatom	maxGroup	diatom	maxGroup	diatom
	Achnanthidium minutissimum		Bacillaria paradoxa		Achnanthidium exiguum
	Cocconeis placentula var euglypta		Fallacia pygmaea		Cocconeis pediculus
	Diatoma mesodon		Gomphonema parvulum		Cyclotella meneghiniana
	Epithemia adnata		Halamphora veneta		Denticula kuetzingii
	Epithemia sorex	Л	Luticola mutica		Eolimna subminuscula
	Fragilaria capucina var gracilis	4	Navicula gregaria		Nitzschia communis
1	Fragilaria vaucheriae		Navicula schroeteri	5	Nitzschia desertorum
	Gomphonema sp B SWAMP JPK		Nitzschia amphibia		Nitzschia microcephala
	Gomphonema sp C SWAMP JPK		Nitzschia palea		Planothidium delicatulum
	Hannaea arcus		Tabularia fasciculata		Pleurosira laevis
	Navicula cryptotenella				Pseudostaurosira elliptica
	Nitzschia dissipata				Sellaphora pupula
	Synedra ulna				Tryblionella constricta

- 2 Reimeria sinuata
- 3 Nitzschia frustulum Nitzschia inconspicua

## Example: Soft Algae Indicator Taxa for TN

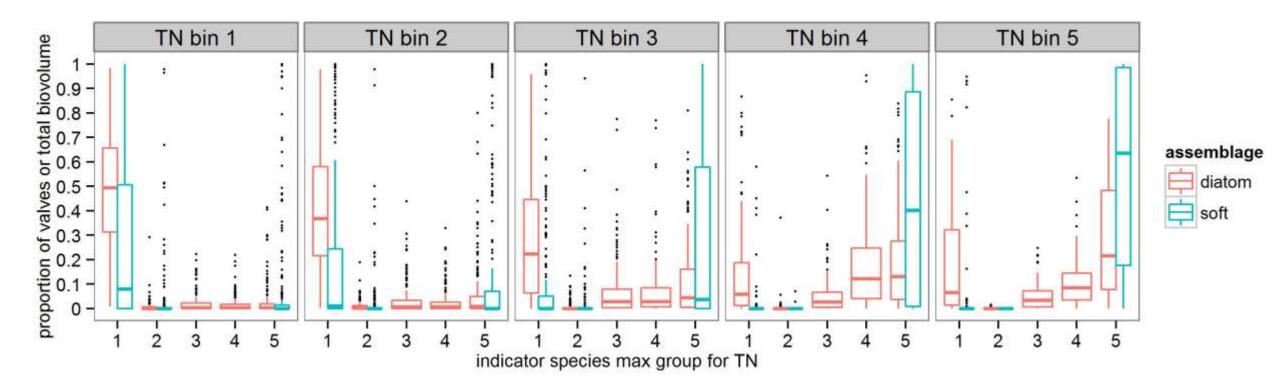
r	naxGroup	soft algae
	1	Calothrix epiphytica
	1	Chantransia sp 1
	1	Nostoc verrucosum
	1	Phormidium subfuscum
	1	Tolypothrix distorta
	2	Chamaesiphon polymorphus
	5	Cladophora glomerata
	5	Leptolyngbya foveolarum
	5	Pediastrum integrum
	5	Rhizoclonium hieroglyphicum
	5	Scenedesmus abundans
	5	Scenedesmus dimorphus
	5	Scenedesmus ellipticus

## Groundtruthing Results:

Occurrence of algal taxa within TN maxGroup categories across TN gradient

eX1_toldis -	-								11 percentations
eX1_Synuln -									assemblage
eX1_phosub -									<ul> <li>diatom</li> </ul>
eX1_nosver -									
eX1_nosver-									soft
					1.2				1952.025
eX1_Navcrl -			-						
eX1_Hanarc -	-								
eX1_GomsCJ -	-								
eX1_GomsBJ -	-								1
eX1_Fravau -									-
eX1_Fracvg -									
eX1_Episor -	-								
eX1_Epiadn -	-								
eX1 Diames -	-								
eX1_Cocpve -	-								
eX1_chnsp1 -									
eX1_calepi -									
eX1_Achmin -									
dV2 Poinin	and the second s								
dX2_Reisin -									2
dX2_chapol -							_		
cX3_Nitinp -								20-0	3
cX3_Nitfru -	Contraction of a c								J
bX4_Tabfas -									
bX4_Nitpal -								**	
bX4_Nitamp -	A 100 100 100 100 100								
5 bX4_Navscr-									
bX4_Navscr-	COLUMN TWO IS NOT							**	Δ
bX4_Lutmut -									
bX4 Halven -				0 00 0					
bX4_Gompar-									
bX4_Falpyg -									
bX4_Bacpar -				-					
aX5_Trycon -	ACCESSION 100110-001								
aX5_Selpup -									
aX5_sceell -					1.000				
axo_sceen								1 S	
aX5_scedim -									
aX5_sceabu -									
aX5_rhihie -									
aX5_Pseell -					•				
aX5_Plelae -									
aX5_Pladel -									5
aX5_pedint -		0.00 0.0000							5
aX5_Nitmic -									
aX5 Nitdes -									
aX5 Nitcom -	-								
aX5 lepfov -								-	
aX5_Eolsum -									
aX5_Denkue -									
aX5_Cycmen -									
aX5_Cocped -					1	-			
aX5_claglo -								**	
aX5_Achexi-									
	ò	5	10		15	20		25	30
		0	10			20		£	00

### Groundtruthing Results: proportions of taxa belonging to to the indicated maxGroups, across TN bins



#### Quantifying Algal Taxon Relationships to Nutrients – Sum Up

- Indicator Species Analysis was successful at identifying taxa with strong fidelity to sites with different nutrient concentrations
- Results align well with values in the literature, where available
- This information has several applications within the context of BCG development

#### **Questions?** Comments?

#### Next Steps

- Next technical webinar August 26, 1-2:30 pm Pacific Time
  - -Response indicator endpoints and nutrient targets as a percentile of reference (Michael Paul, Tetra Tech)
- Release of draft (interim) reports in September 2015
- Targeting October 2015 for next stakeholder meeting focused on technical elements
  - Response to Science Panel recommendations
  - Feedback on interim reports
  - BCG workplan discussion and technical approach for mapping channels in "developed landscapes"<sup>1</sup>
- Next Science Panel Meeting: January/February 2016

<sup>1</sup>Pending new Water Board contract start

#### Water Board Staff Policy Schedule

Milestone	Estimated Date			
Focus group meetings (Dischargers – Industry, Publicly Owned	September 2015- December 2015			
Treatment Works - , Agriculture, Stormwater, Concentrated				
Animal Feed Operations/Grazers/Dairy, Environmental				
Groups, Non-governmental organizations and Tribes)				
Publicly available draft plan and technical staff report	January 2017			
Scientific peer review and staff responses	January 2017			
Draft substitute environmental documentation (i.e. project	April 2017			
alternatives, environmental impacts, economic factors)	April 2017			
Public comment period: Draft plan, staff reports, and draft	Summer 2017			
substitute environmental documentation	Sommer 2017			
Board Workshop	2017			
Board Adoption Meeting	2017			