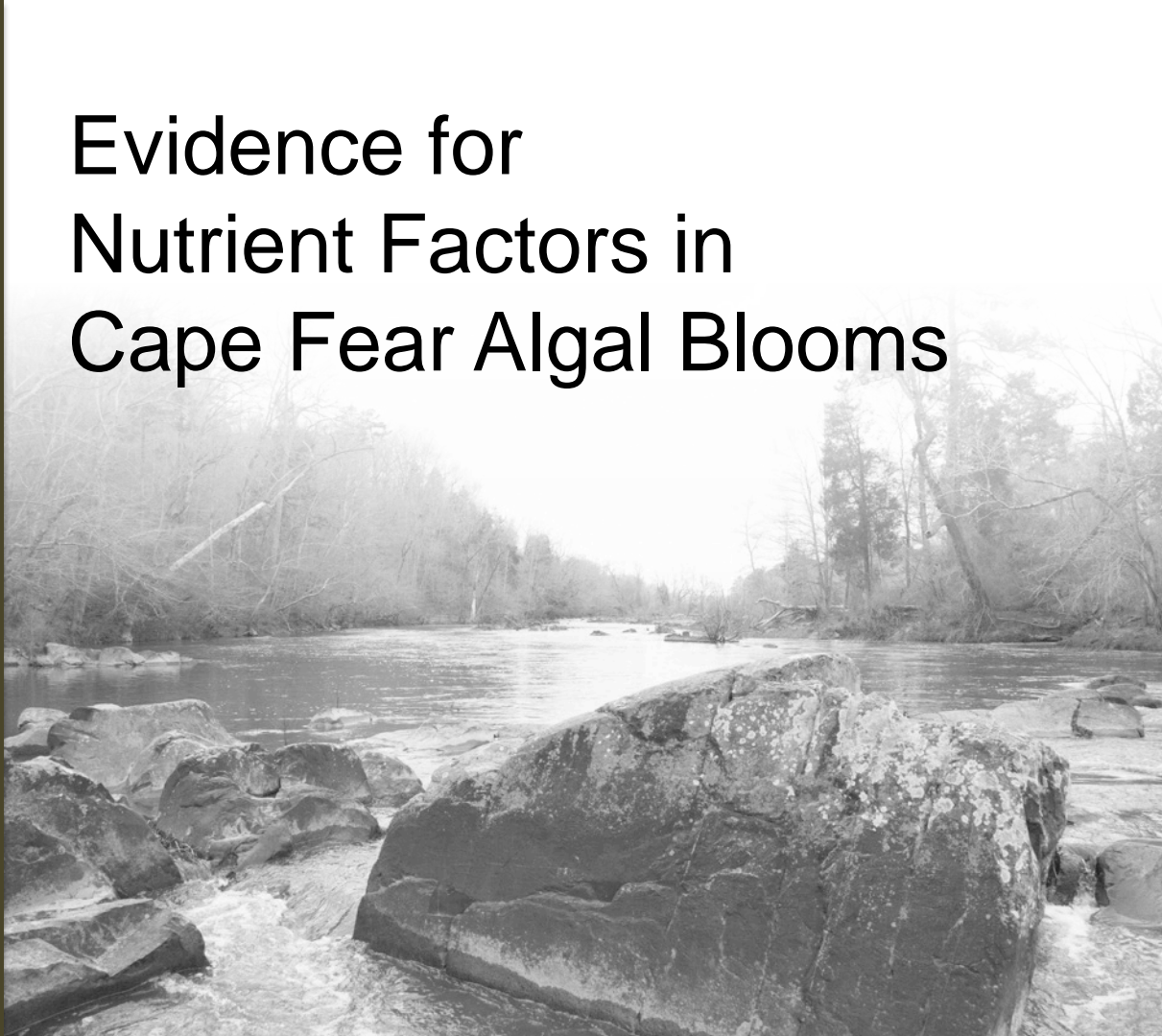


Evidence for Nutrient Factors in Cape Fear Algal Blooms



May 24, 2016
Bradley Saul
UNC Biostatistics

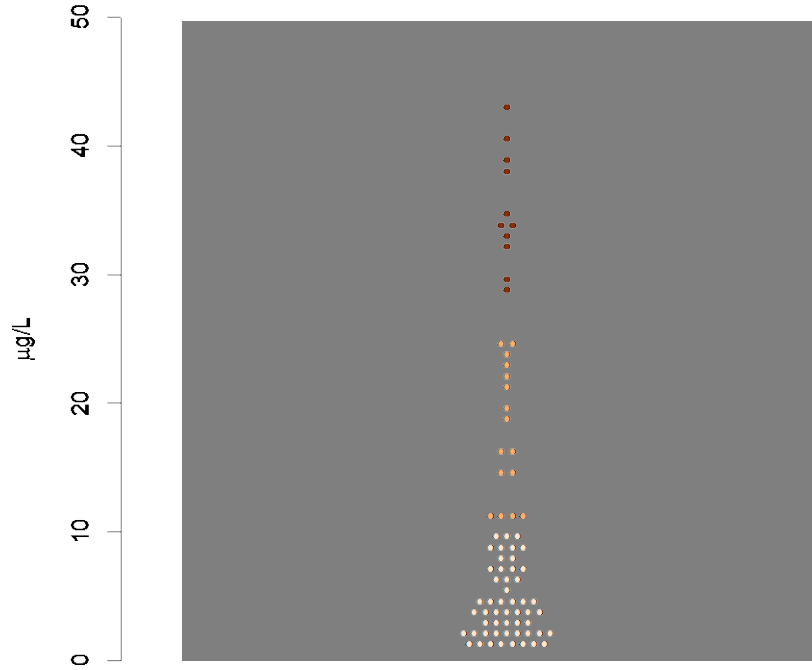
Cape Fear River
Partnership
Meeting

- Chlorophyll-a at Lock 1
- Nutrient patterns above Lock 1
- Causal Question
- Preliminary Results



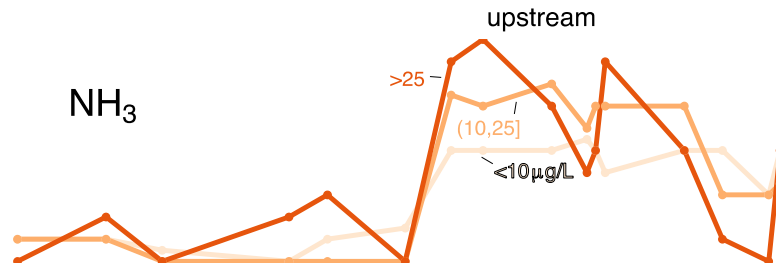
Chlorophyll
at Lock 1

Chlorophyll-a at Lock 1
May-Oct, 1999-2012

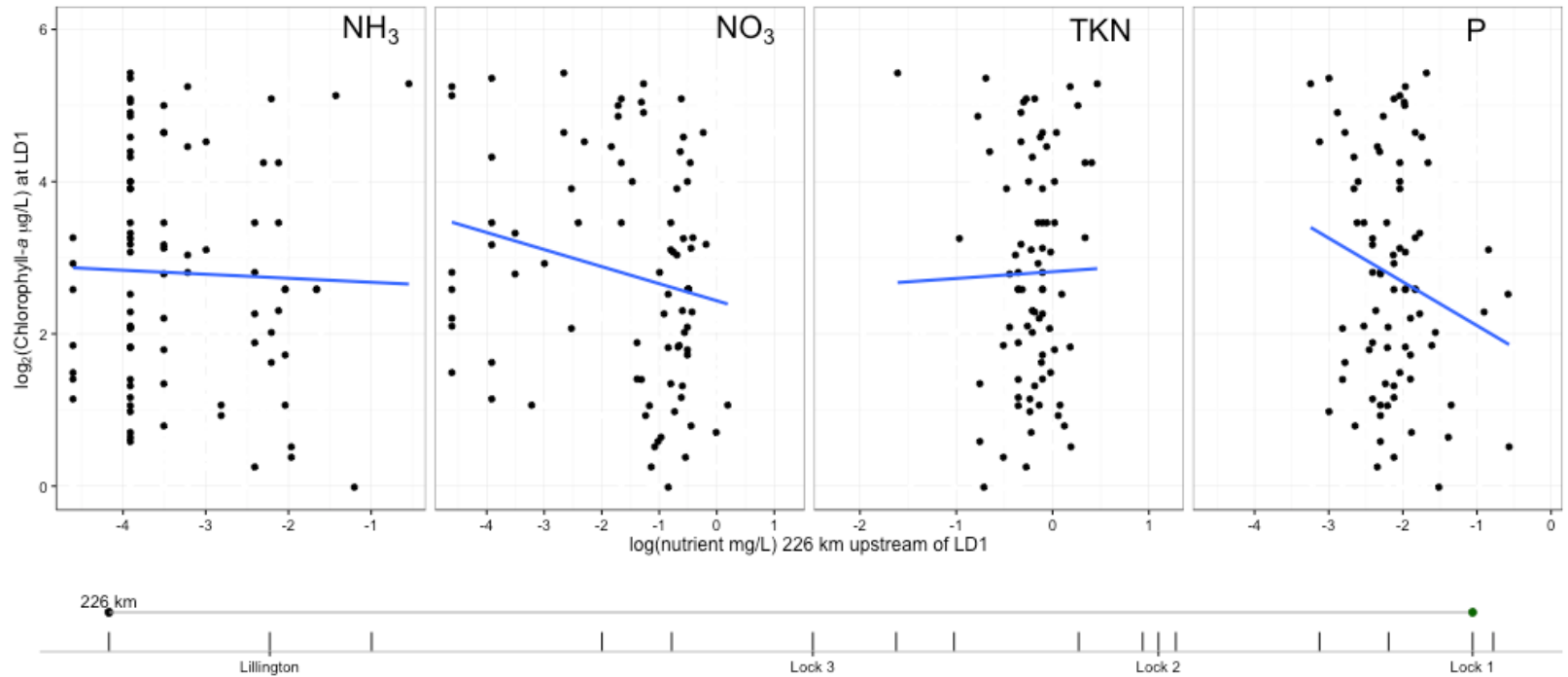


Nutrient patterns above Lock 1

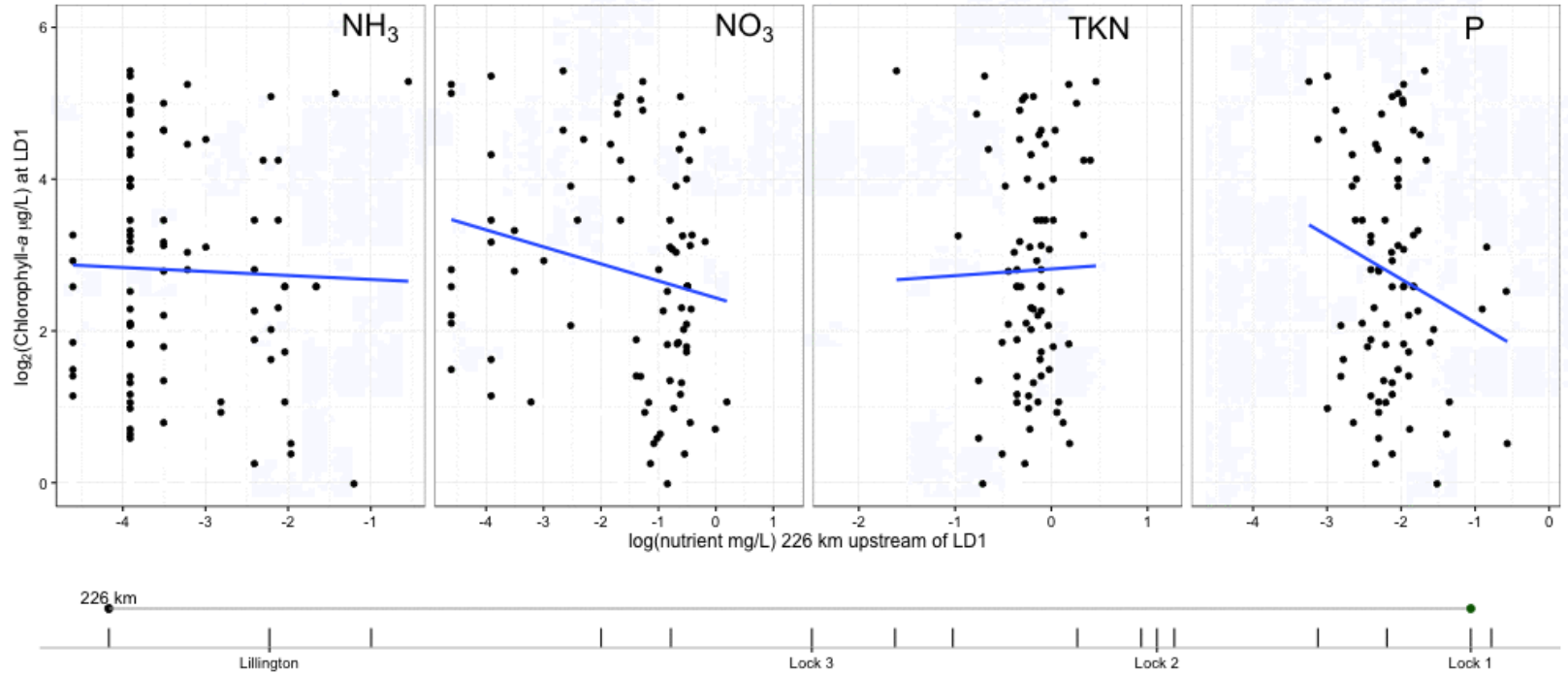
- Uptick in NH_3 , NO_3 , P after Lock 3.
- Maybe: more NH_3 , NO_3 , P \rightarrow more chlorophyll



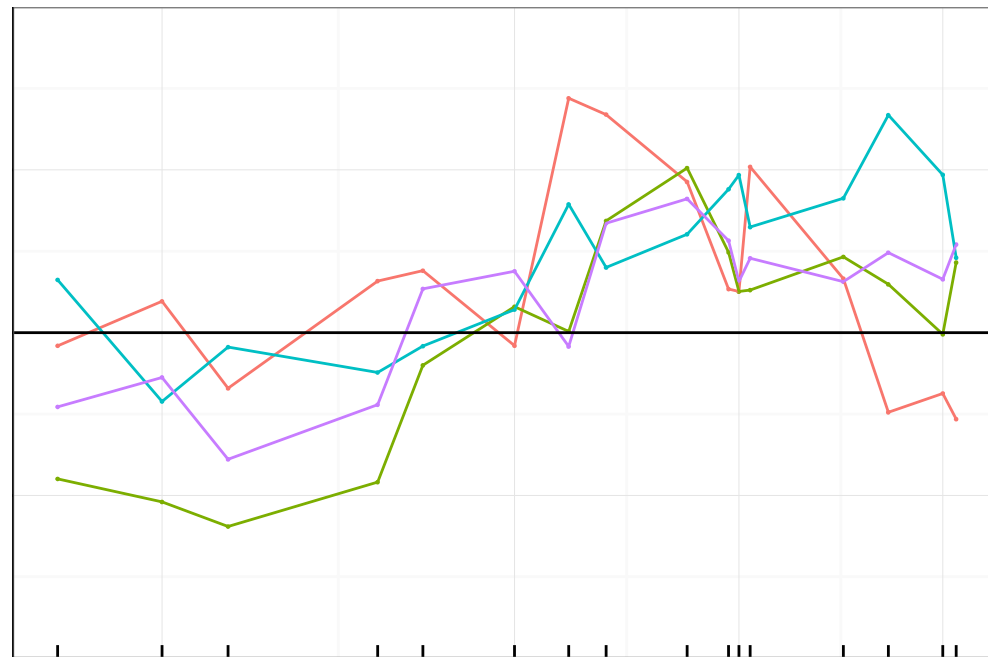
Relationship between Lock 1 Chlorophyll and upstream nutrients



Relationship between Lock 1 Chlorophyll and upstream nutrients



Correlations between LD1 Chlorophyll-a and upstream nutrient concentrations



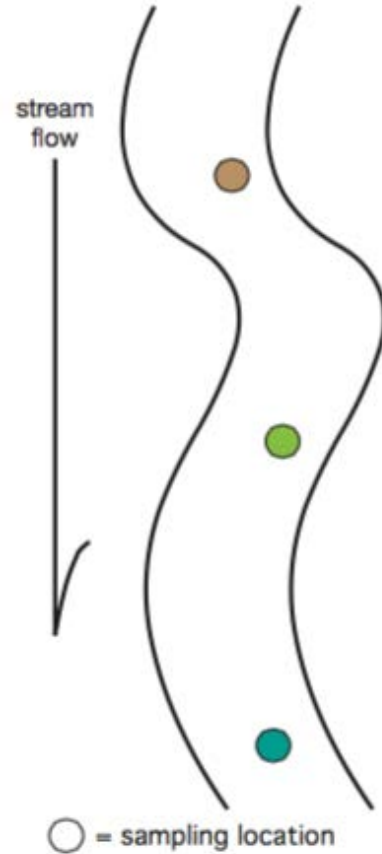
Correlation may increase after Lock 3

t — nh3 — no3 — tkn — p

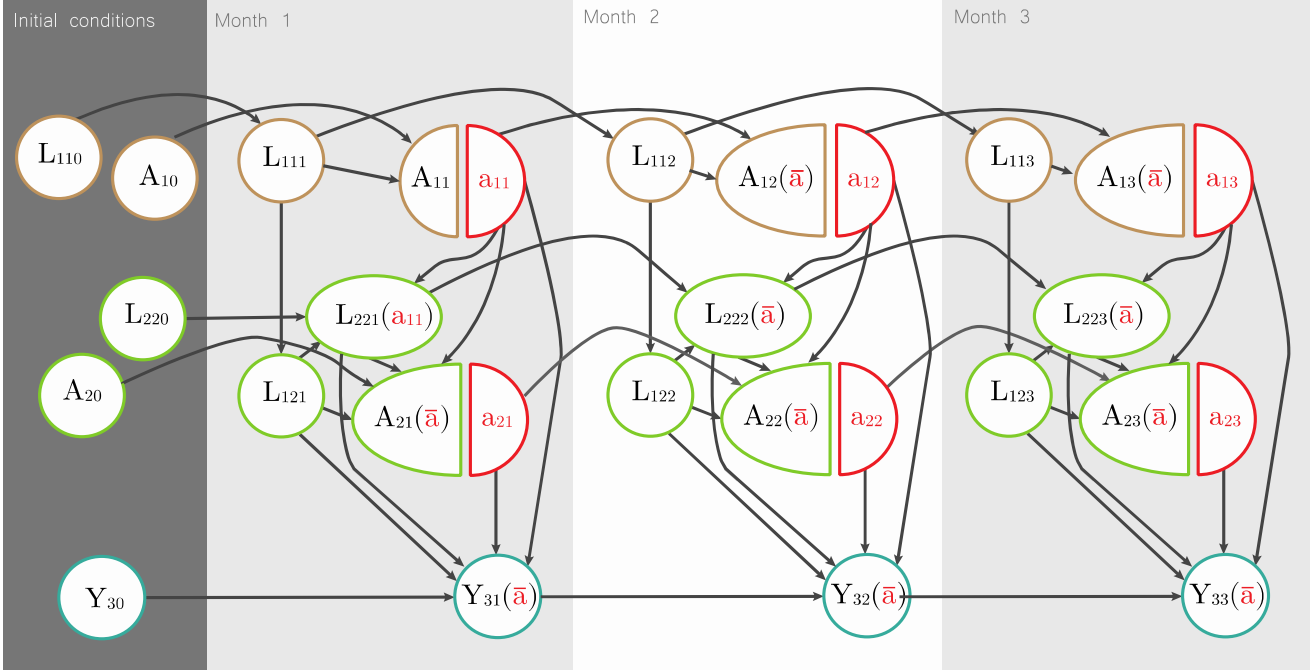
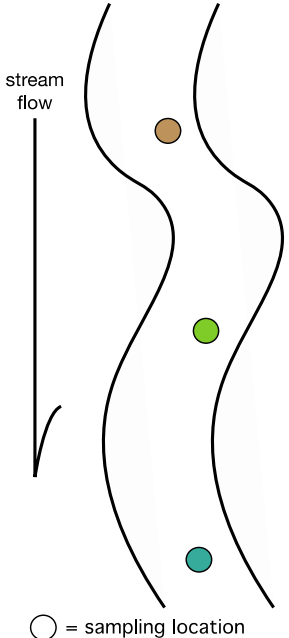
What if...

We had an intervention that could set a nutrient level to X at an upstream location.

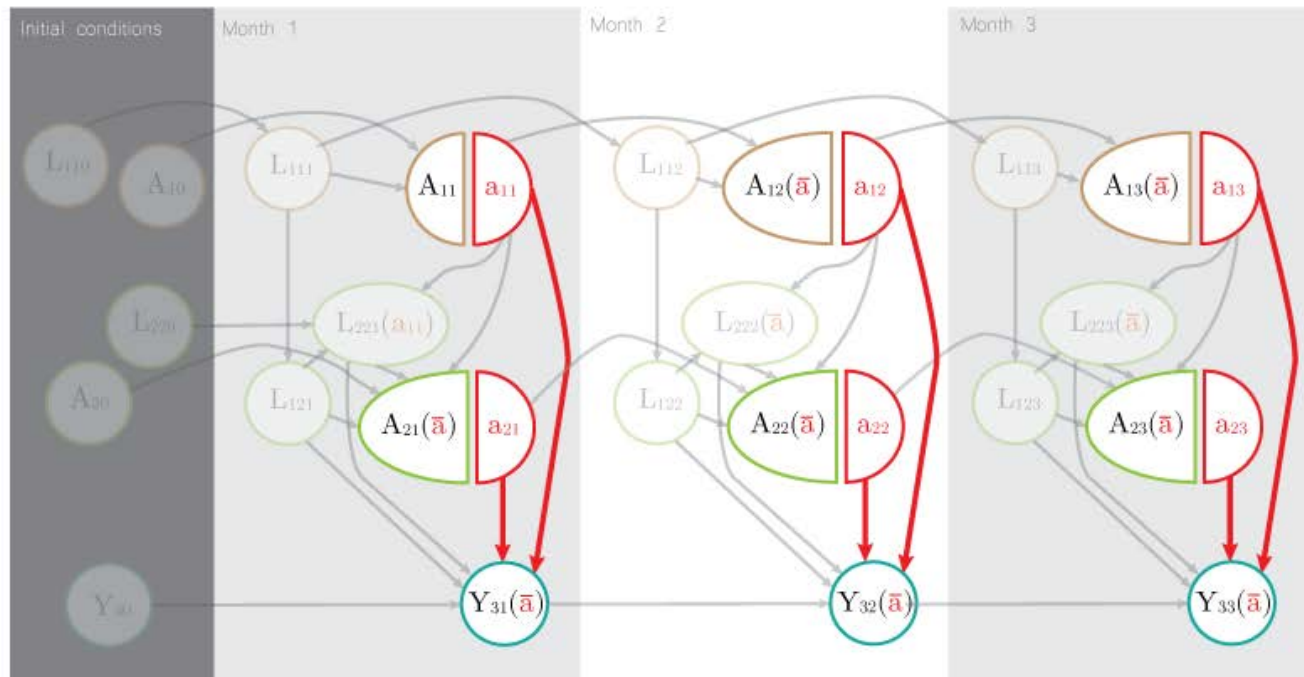
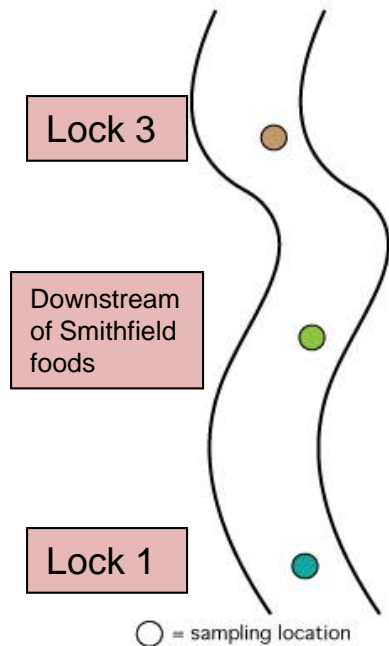
What effect would this have, on average, on downstream chlorophyll?



Causal Question (Mathematically)



Causal Question (Mathematically)



- time- and space- varying confounding
- small sample size
- methods complicated
- methods not (yet) implemented in software

Average causal effect of $\text{NO}_3 > 1\text{mg/L}$ at Tar Heel on chlorophyll-a concentration at Lock 1:

1.88 (95% CI: 0.47, 3.3)



Setting NO_3 at the sampling location 86km upstream (near Smithfield Foods) from below 1mg/L to above 1mg/L is expected to increase, on average, chlorophyll-a concentrations at Lock and Dam 1 by 3.5 times ($1.88^2 \approx 3.5$).

Good news

- surveillance data is useful beyond just monitoring
- may be some measureable effects with important policy and scientific implications

Limitations

- unable to make direct link to toxic blooms
- monthly sampling scheme does not give complete picture

Recommendations

- measure the outcome(s) of interest – perhaps banking genetic samples
- augment regular surveillance with short-term, intensive sampling during bloom and non-bloom periods

Thank you

- Dr. Rebecca Benner (TNC)
- Dr. Mike Mallin (UNCW)
- Madi Polera (UNCW)

Causal inference with
interference research group
(UNC-Chapel Hill)

- Dr. Michael Hudgens
- Brian Barkley
- Sujatro Chakladar

Questions?



Cutpoint (e.g $\text{NH}_3 < 0.1$ vs ≥ 0.1)
 Causal effect estimate (\log_2 scale)
 95% confidence interval

NH_3	<u>0.1</u>	<u>0.2</u>	<u>0.3</u>
	0.14	-0.15	-0.65
	(-1.44, 1.71)	(-1.75, 1.45)	(-2.81, 1.52)
NO_3	<u>0.8</u>	<u>1.0</u>	<u>1.1</u>
	1.34	1.88	0.33
	(0.4, 2.29)	(0.47, 3.3)	(-1.11, 1.77)
TKN	<u>0.65</u>	<u>0.75</u>	<u>0.85</u>
	-0.29	0.74	0.71
	(-1.21, 0.63)	(-0.08, 1.57)	(-0.21, 1.63)
P	<u>0.1</u>	<u>0.2</u>	
	0.29	-0.12	
	(-2.48, 3.06)	(-1.42, 1.17)	

confidence intervals based on t distribution with 14 degrees of freedom (13 for P).