

Landscape scale risk assessment of cyanobacteria blooms in California lakes

Marcus W. Beck¹, Martha Sutula, Meredith Howard, Eric Stein

¹Southern California Coastal Water Research Project, Costa Mesa, CA
marcusb@sccwrp.org, Phone: 714-755-3217

May 24th, 2018



Wadeable streams are covered statewide

- Reference sites [Ode et al., 2016]
- Macroinvertebrate, algal integrity [Mazor et al., 2016], [Theroux et al., in prep]
- Expectations of constraints [Beck et al., in prep]
- Recent proposal of biological standards



California lakes

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Goal: evaluate the relative risk of lakes in California of exceeding a eutrophication endpoint that is related to bloom occurrence



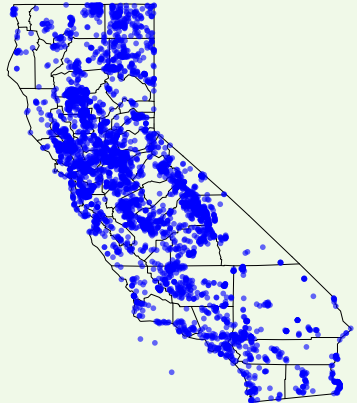
Available data

Limited *in situ* data for California, tons of watershed data

NLA07, NLA12: 59 lakes



LakeCat: 4924 lakes



[USEPA (US Environmental Protection Agency), 2009,

USEPA (US Environmental Protection Agency), 2017, Hill et al., 2018]
Beck et al. (SCCWRP)

Risk assessment for CA lakes

May 24th, 2018

4 / 18



Modelling approach

A four-step approach to make statewide inferences from a limited dataset:

1. Develop link between chlorophyll and microcystin



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4. Identify statewide landscape factors that explain risk

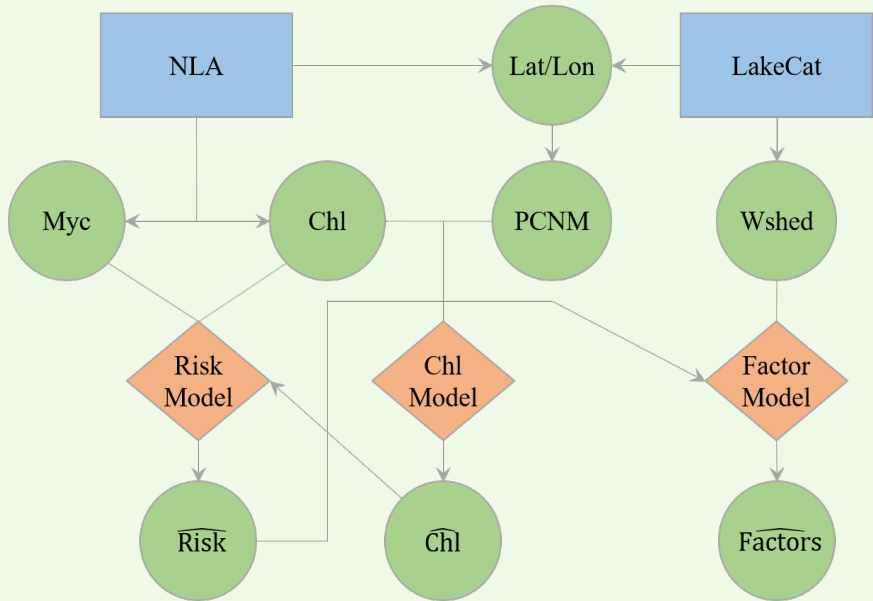


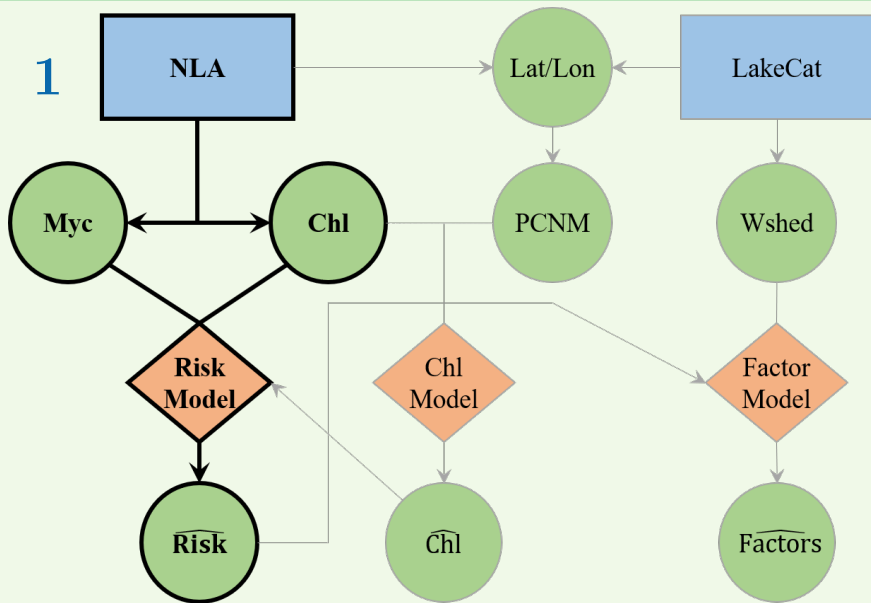
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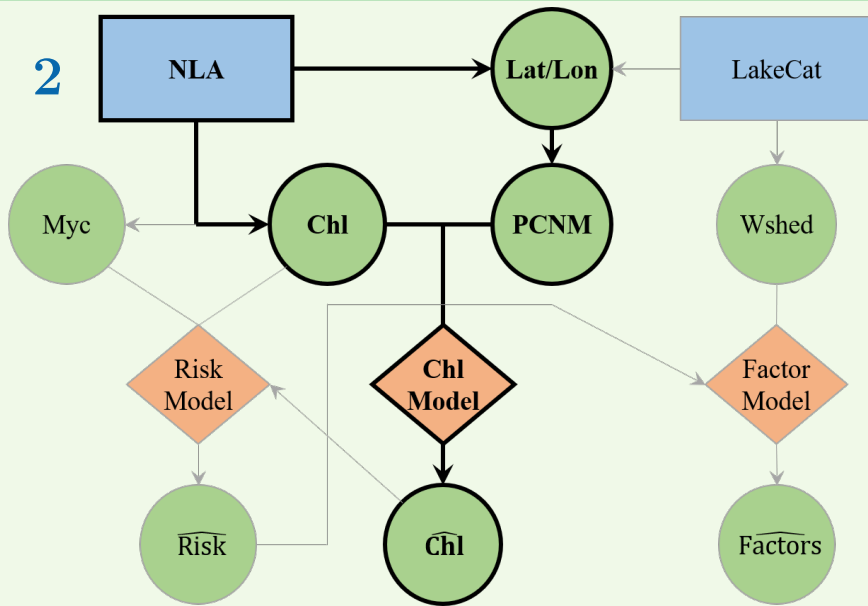
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An exercise in diminishing returns...

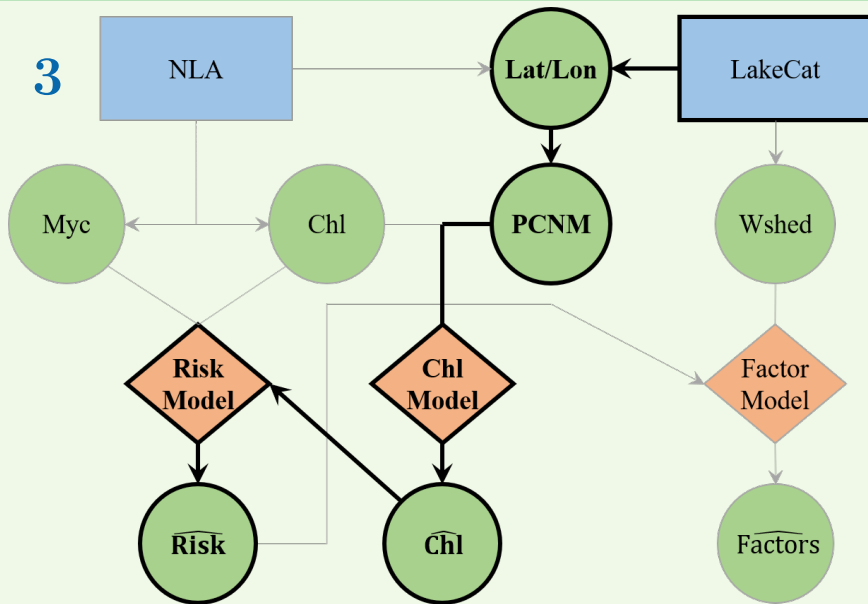




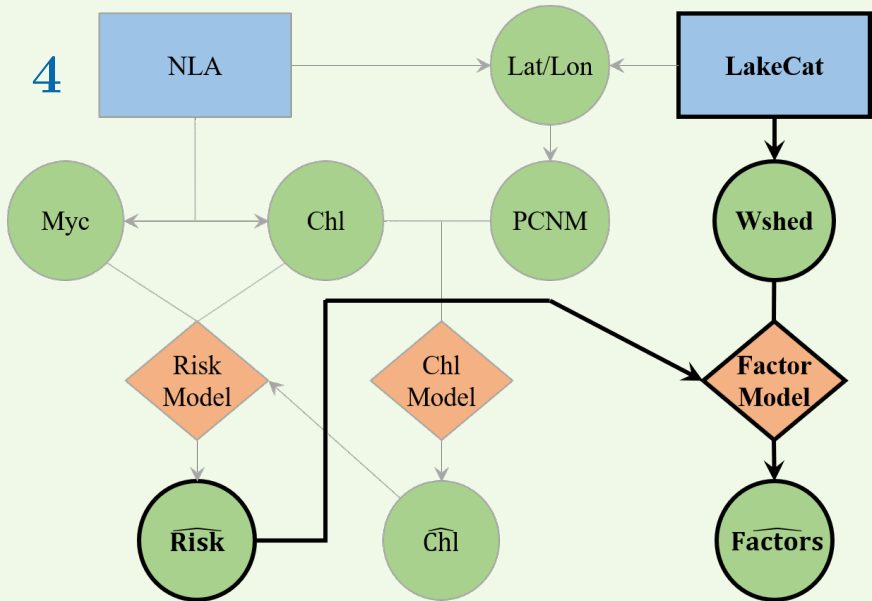
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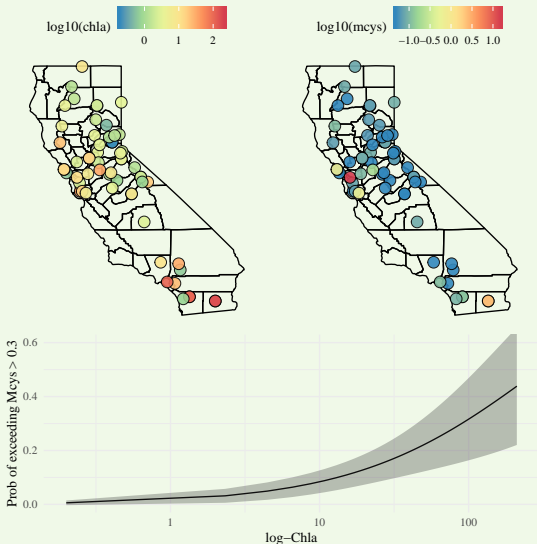
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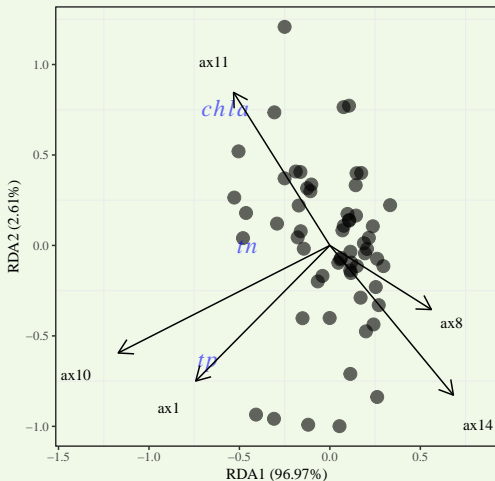
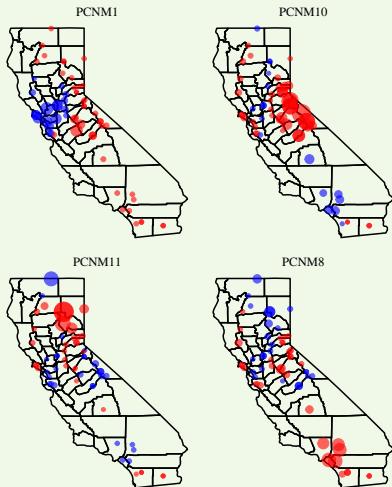
1) Link between chlorophyll and microcystin



- *In situ* NLA data
- Build a simple model of the likelihood of exceeding some threshold
- WHO criteria for children drinking water

2) Link between chlorophyll and location

Making data using a spatial PCA





2) Link between chlorophyll and location

Making data using a spatial PCA



3) Predict statewide risk from chlorophyll prediction from landscape position



4) Identify statewide landscape factors that explain risk



Results



Results



Results



Issues and future work

Assumptions and limitations



Issues and future work

Alternative data acquisition

Acknowledgments:

Research staff and employees at Southern California Coastal Water Research Project


Blake Schaeffer (USEPA, ORD) for CyAN data

Ryan Hill (USEPA, ORISE) for LakeCat data

Funding sources and contact:



marcusb@sccwrp.org, 7147553217

 GitHub (project):
https://github.com/fawda123/cali_lake

 GitHub (presentation):
https://github.com/fawda123/SFS_2018

 Twitter: @fawda123

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