

# Developing a PACE Hyperspectral Bio-Optical Algorithm Framework for Detection of Freshwater Harmful Algal Blooms

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PACE Plankton, Aerosol, Cloud, ocean Ecosystem



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## Project Overview

We are developing a new detection application for freshwater harmful blooms of cyanobacteria (CHABs) by integrating information from several different approaches, some of which expand upon current operational algorithms but are not based on hyperspectral data. Hyperspectral data is well suited to monitoring CHABs in freshwater, as there is more information available to differentiate phytoplankton groups and even large species assemblages based on unique spectral features. We are producing a suite of advanced bio-optical products, including from semi-analytic algorithms (SAAs). For the SAAs, we are developing separate products based on optical model inversion incorporating CHAB properties. CHABs have unique absorption and scattering properties, which make them difficult to invert using standard SAAs models, but our approach will use these characteristics to create a unique identification of CHAB populations, among other phytoplankton groups that are typically also present before, during and after CHAB events.

### Overall Goal:

**Generate a suite of validated hyperspectral HABs algorithms to support research and operational HAB monitoring applications such as the NOAA HAB Tracker**

The main application question we are addressing: **Can we improve CHAB detection and assessment including early stages with hyperspectral data?** Our ultimate application product will be a comprehensive CHAB assessment that includes confidence levels tied to bio-optical algorithm uncertainties. Our specific objectives are to:

1. Develop new adaptive CHAB indices based on present approaches but modified by dynamically selecting optimal bands per pixel depending on locations of spectral features expanding algorithm sensitivity and dynamic range.
2. Develop novel adaptive semi-analytic bio-optical models that use spectral libraries for inherent optical properties that themselves are associated with different algal groups and physiological conditions.
3. Develop a CHAB detection product application with confidence levels based on the combination of algorithm outputs and criteria established from objectives 1 and 2.
4. Generate demonstration products from the proposed scheme using PACE analog hyperspectral in situ and remote sensing data over the case study areas.

## Optical and Biogeochemical Database

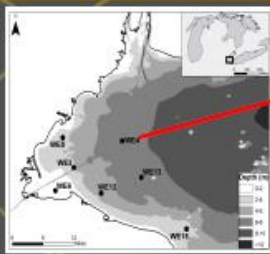


Figure 1. Weekly IOP/AOP measurements are made at standardized locations (left panel) in Lake Erie from May-October beginning in 2015. Additionally, high temporal frequency reflectance measurements are made from a fixed location hyperspectral radiometer system (LPR) co-located with a lake configured SeaPRISM (right panel).

OP Symbol	OP Name	Method	Location	Year Period	N	SD	UMH	QO2
$a_{440}$	Non-water absorption	Lab spec	18, 19	2013-2015, 2015-2018	808	194 (2013-2015)	44	
$a_{490}$	CDOM absorption	Lab spec	18, 19	2004-2015, 2015-2018	1507	940 (2013-2015)	300	477
$a_{675}$	Particle absorption	Lab spec	18, 19	2013-2015, 2015-2018	386		43	319.8
$a_{710}$	Phytoplankton abn	Lab spec	18	2004-12-2015-19	737		418	327
$a_{720}$	Non-algal abn	Lab spec	18	2013-12-2015-19	737		418	327
$a_{760}$	Lab spec	Lab spec	18, 19	2004-2015, 2015-2018				
$a_{860}$	Particle backscatter	Lab spec	18, 19	2013-2015, 2015-2018	808	347	44	
$a_{910}$	Water column	Lab spec	18, 19	2013-2015, 2015-2018	808	764	44	
$a_{940}$	Water column	Lab spec	18, 19	2013-2015, 2015-2018	808	764	44	
$a_{980}$	Water column	Lab spec	18, 19	2013-2015, 2015-2018	808	347	44	
$a_{1020}$	Water column	Lab spec	18, 19	2013-2015, 2015-2018	808	347	44	
$a_{1060}$	Water column	Lab spec	18, 19	2013-2015, 2015-2018	808	347	44	
$a_{1100}$	Water column	Lab spec	18, 19	2013-2015, 2015-2018	808	347	44	
$a_{1140}$	Water column	Lab spec	18, 19	2013-2015, 2015-2018	808	347	44	
$a_{1180}$	Water column	Lab spec	18, 19	2013-2015, 2015-2018	808	347	44	
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$a_{2100}$	Water column	Lab spec	18, 19	2013-2015, 2015-2018	808	347	44	
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