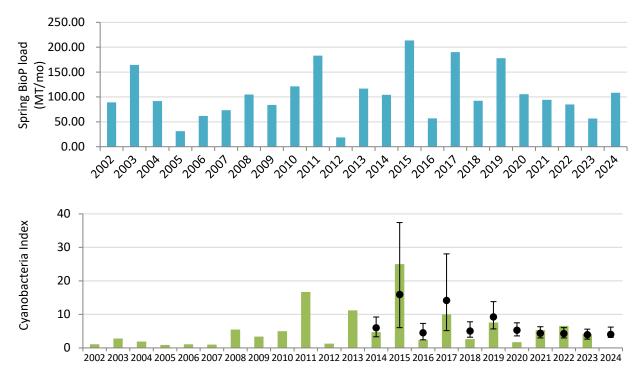
## 2024 Western Lake Erie Harmful Algal Bloom (HAB) Forecast And Measured Size



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**Forecast summary**: A Harmful Algal Bloom of 4.06 Cyanobacteria Index (CI), about 19,488 metric tons (MT) is predicted for the western basin of Lake Erie in 2024, with a 95% predictive interval of 3.15 - 6.21 CI, about 15,120 - 29,808 MT. This forecast is significantly lower than the 2002-2023 average (5.05 CI), and about one-quarter of the 2015 maximum. This forecast is a contribution to NOAA's ensemble bloom prediction.

The model is an adaptation of the one described in Scavia et al. 2023 that includes estimates of the impact of internal phosphorus recycling by including the bioavailable phosphorus load from previous years, similar to that used by Ho and Michalak (2015). This linear, segmented model predicts HAB extent as a function of the load with slopes before and after a model-estimated change point. The model, calibrated with three independent estimates of the 2002-2020 HAB observations and loading of bioavailable phosphorus, explained 77% and 85% of the interannual variability when using loads through June or July, respectively. It also explained 69% of the interannual variability in a leave-one-out cross validation, and 75% of the variability in blind forecasts. In 2024, we modified the model, calibrating it to the 2002-2023 average CI. Re-calibrated models using loads up to July can explain 89% of the interannual variability. The spring bioavailable phosphorus loads and bloom forecasts compared to observed historical blooms are shown below:

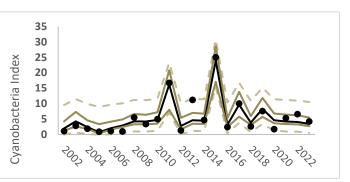


Spring phosphorus loads (top) and mean bloom observations with forecasts (bottom). Error bars represent 95% predictive intervals.

<u>**Phosphorus loads:**</u> Daily TP and DRP loads were downloaded from Heidelberg University's National Center for Water Quality Research (<u>https://ncwqr.org/monitoring/data/</u>), and aggregated to monthly loads. Bioavailable P was estimated as DRP plus a fraction of particulate P (TP-DRP), where the faction was determined during model calibration.

**HAB extent estimates:** The HAB model was calibrated to the average CI. The CI index is based on processing satellite image spectra specific for cyanobacteria (Stumpf et al. 2016). The model is calibrated only to the average CI in Western Lake Erie from 2002 to 2023.

HAB model calibration: Calibration was based on Bayesian inference using a Markov Chain Monte Carlo (MCMC) sampling algorithm implemented within WinBUGS interfaced with the R package, R2WinBUGS (Lunn et al., 2000; R Core Team, 2015; Sturtz et al., 2005). Detailed information on the MCMC algorithm settings, chain convergence evaluation, and parameter prior distributions can be found in Obenour et al. (2014) and Bertani et al. (2016). A new response curve was developed for the revised model based on parameter estimates and model-specific spring loads.



Calibrated HAB Model. The black dots are the average CI. The black line indicates the prediction. The solid lines around the prediction are the 95% credible interval of CI for the parameter error, while the dashed lines are the 95% prediction interval.

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