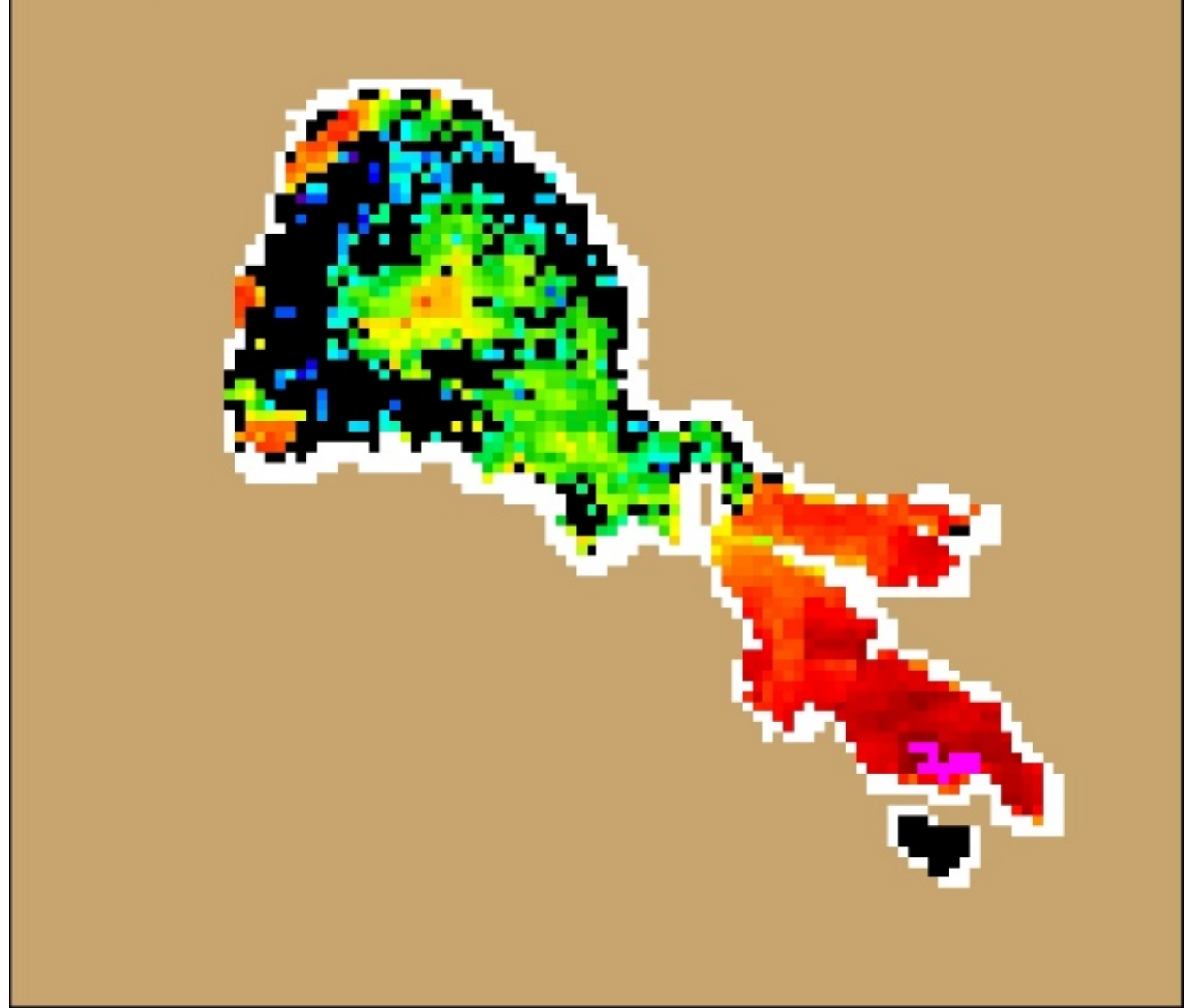


Use of Satellites to Examine Cyanobacteria in California's Large Waterbodies

Randy Turner

San Francisco Estuary Institute



Background

- Cyanobacteria can grow in a diverse range of environments
- Given adequate light and nutrients, cyanobacterial Harmful Algal Blooms (cyanoHABs) can negatively affect aquatic life.
- Some species produce toxins
- SWAMP contracted with SFEI to: Process, analyze and report on satellite imagery provided by NOAA to better understand risks to public health from cyanoHABs

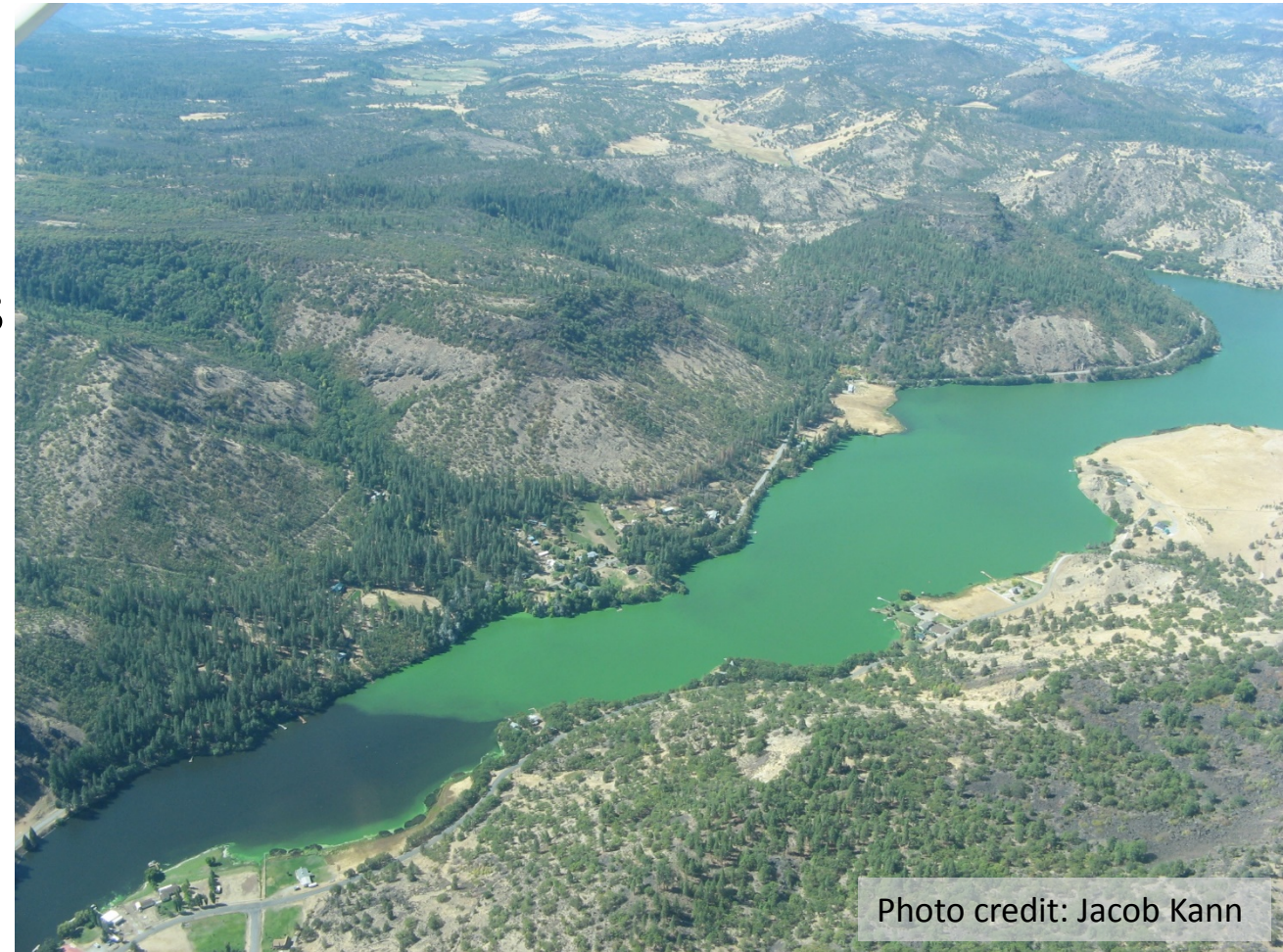


Photo credit: Jacob Kann

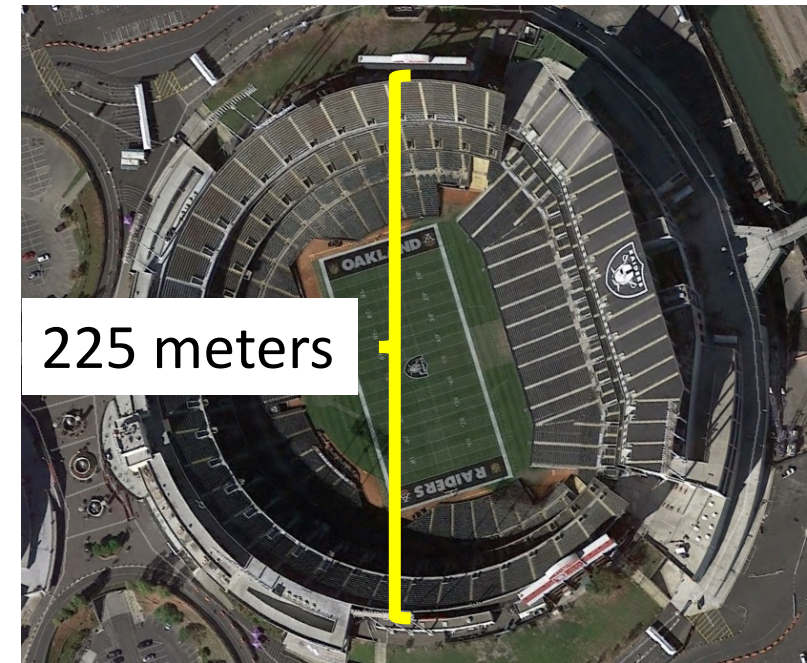
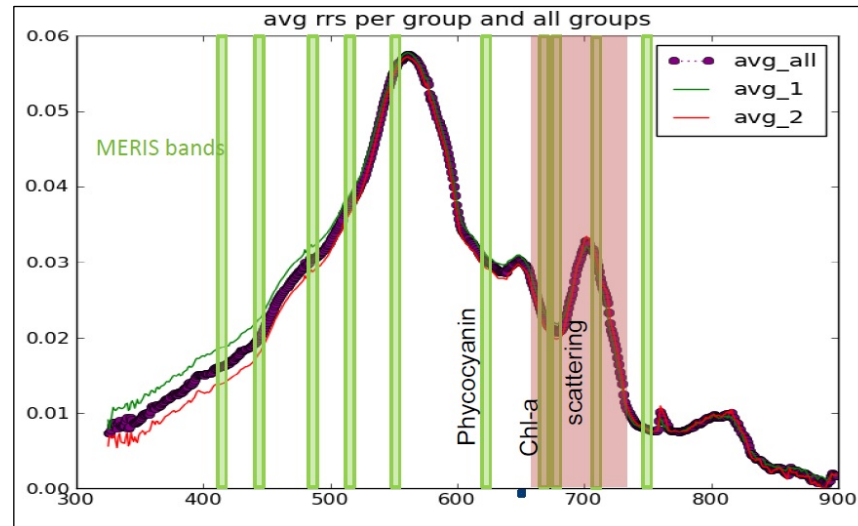
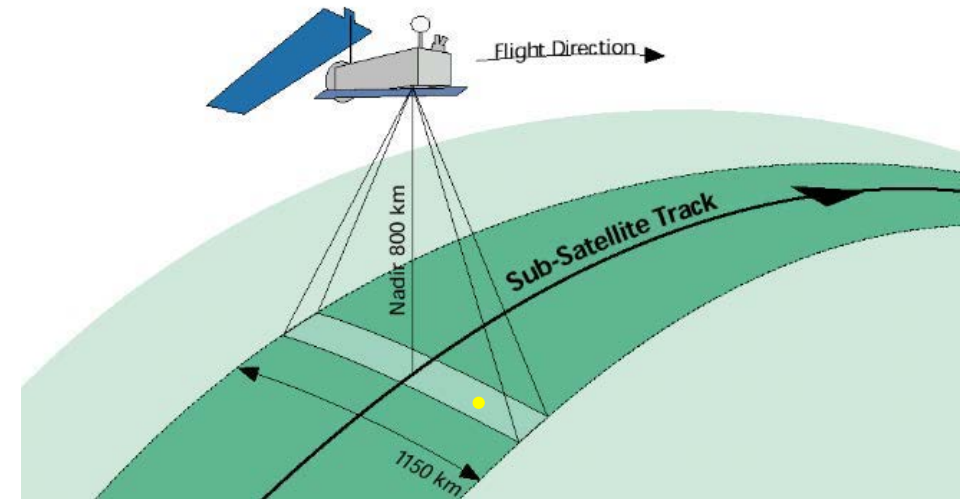
Contract with SWAMP

- Develop infrastructure for processing satellite imagery
- Historic Data
 - Analyze MERIS satellite data for 255 waterbodies (2002-2012)
 - Status and Trends report
- Future Data
 - Analyze data from OLCI on Sentinel-3 satellite (launched Feb. 2016)
- Reporting
 - Create web portal for viewing imagery and related data
 - Inform waterbody managers when bloom conditions occur
 - Issue regular bulletins and newsletters to public



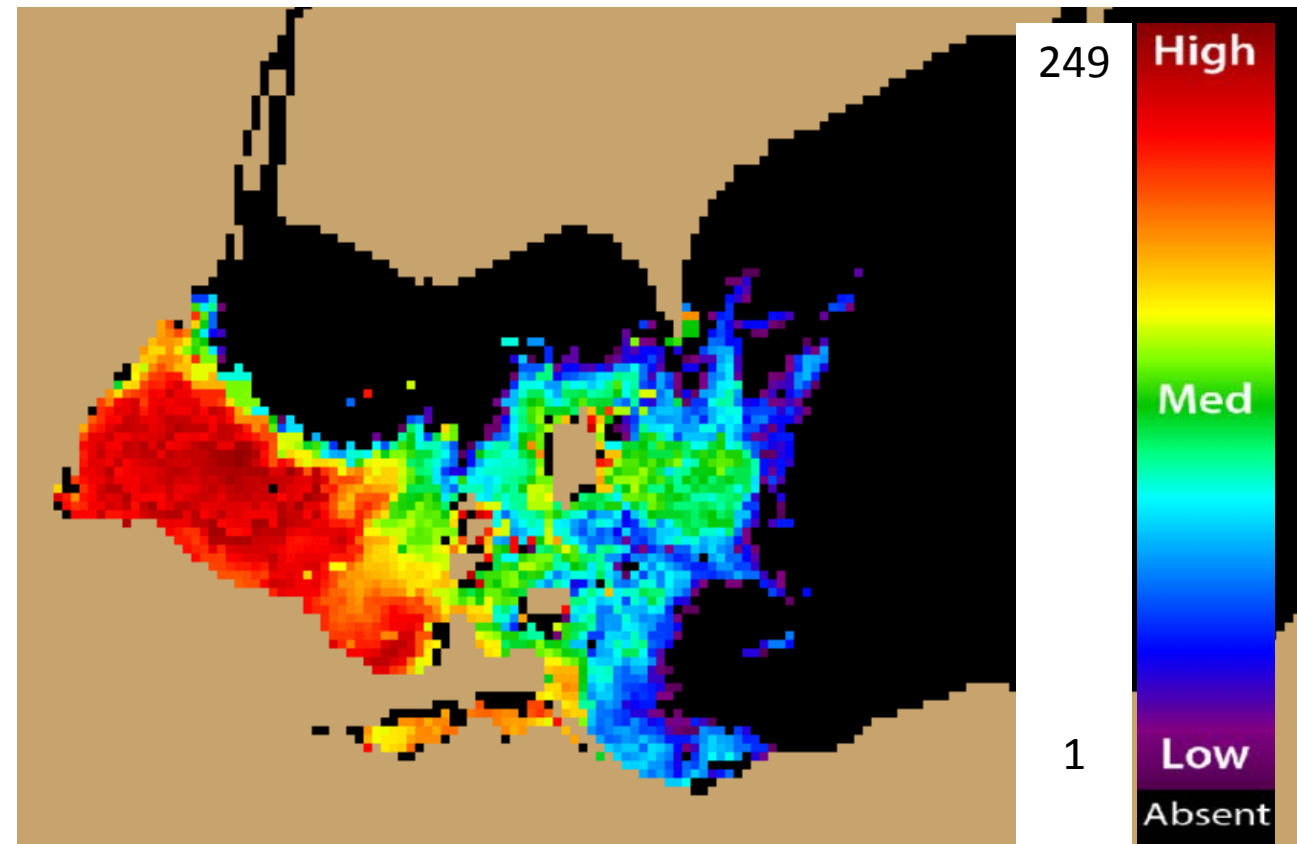
Satellite Basics

- Flyover every few days
 - Swath 1,150 km wide
- Spatial resolution is 300m x 300m (per pixel)
- Satellite analyzes light absorption signature in each pixel at key spectral bands
- Can estimate concentrations separately for:
 - Total algal biomass
 - **Cyanobacteria**
 - Non-cyanobacteria
- All cyanobacteria
- Not toxins



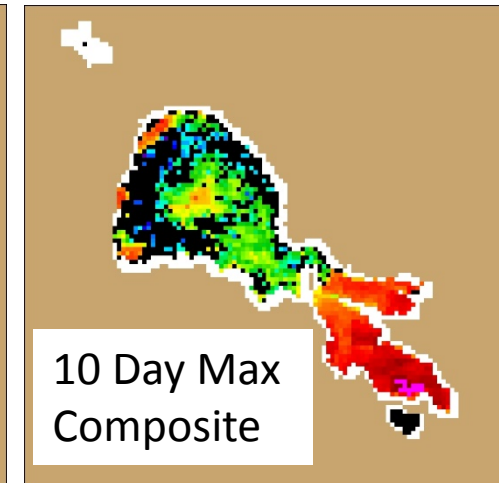
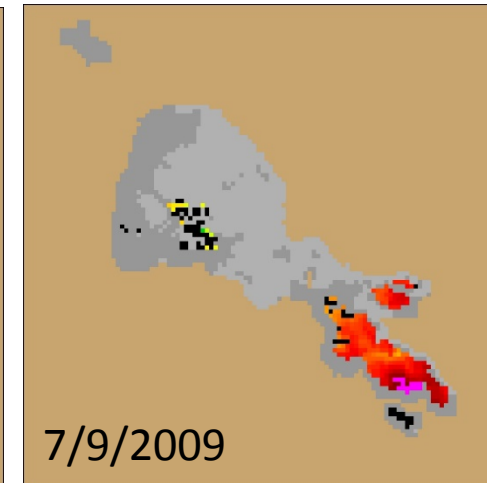
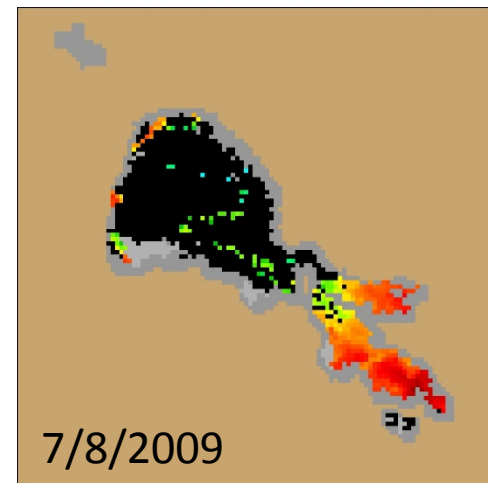
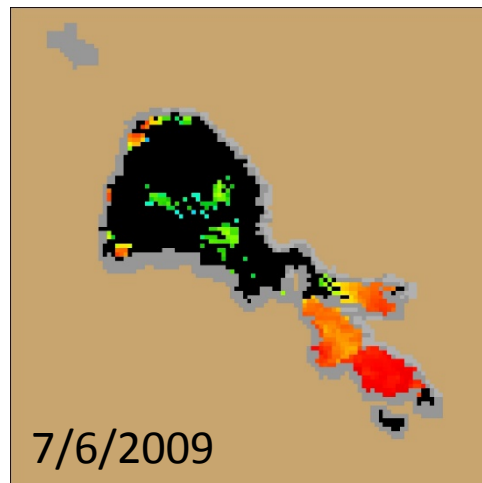
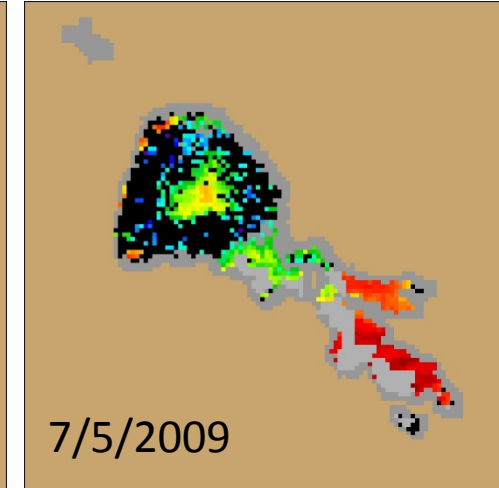
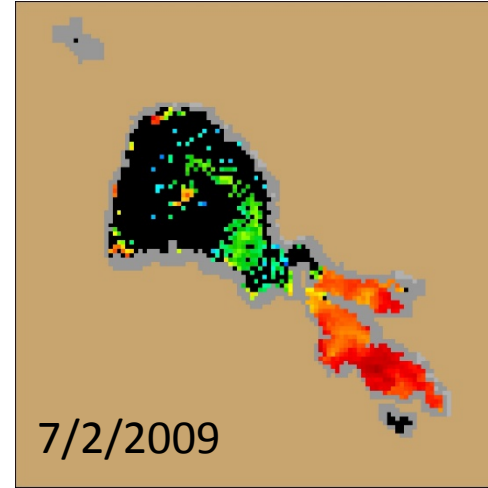
Satellite Basics

- Each pixel assigned a value of N (1-249)
- Wind, clouds, etc. impact blooms
- Generate 10 day max composite
 - testing monthly composites also...



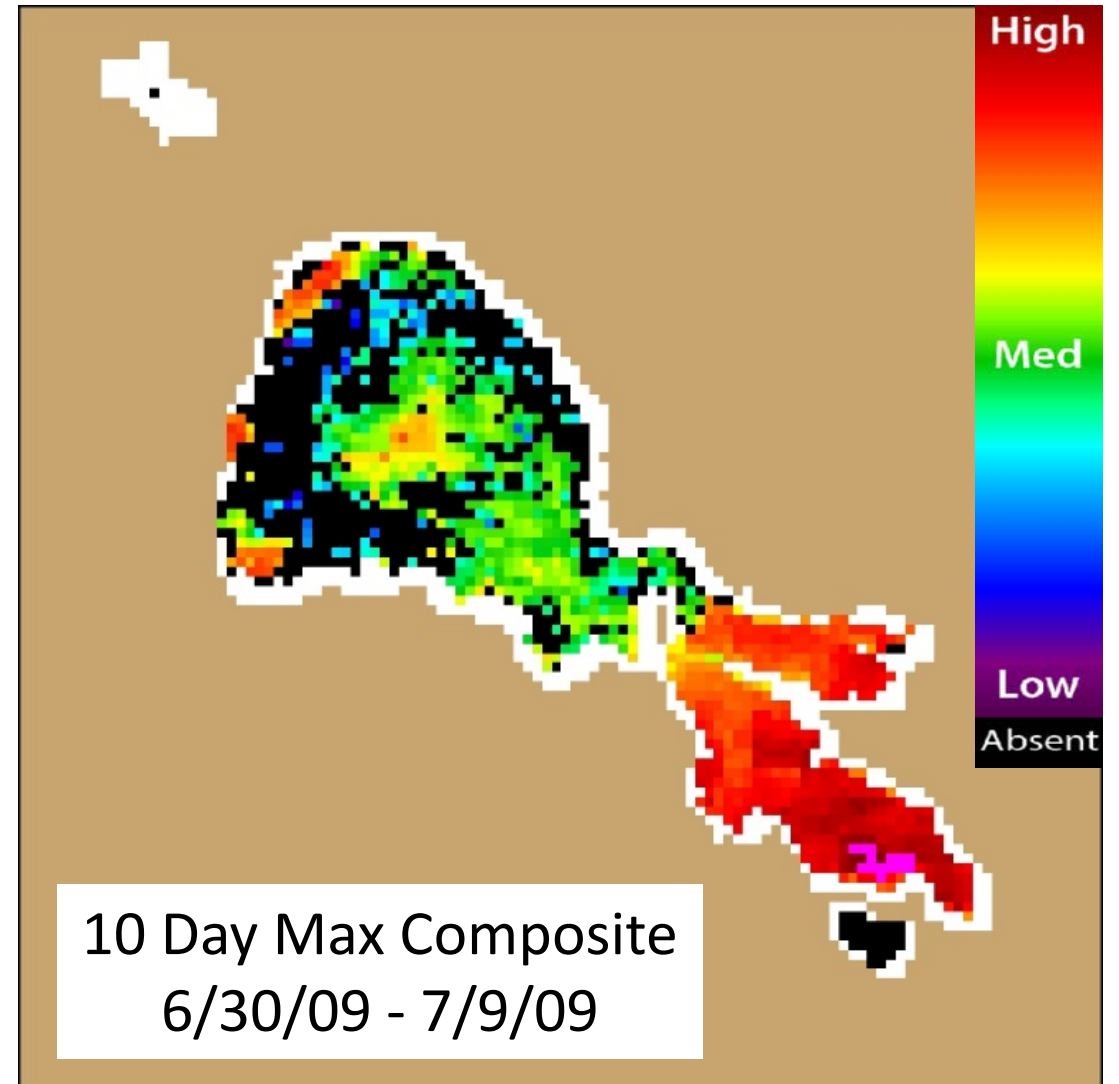
Data Processing

- Review all scenes for previous 10 days
- For each pixel location, determine maximum value
- Generate running 10 day max composites



Generate Statistics

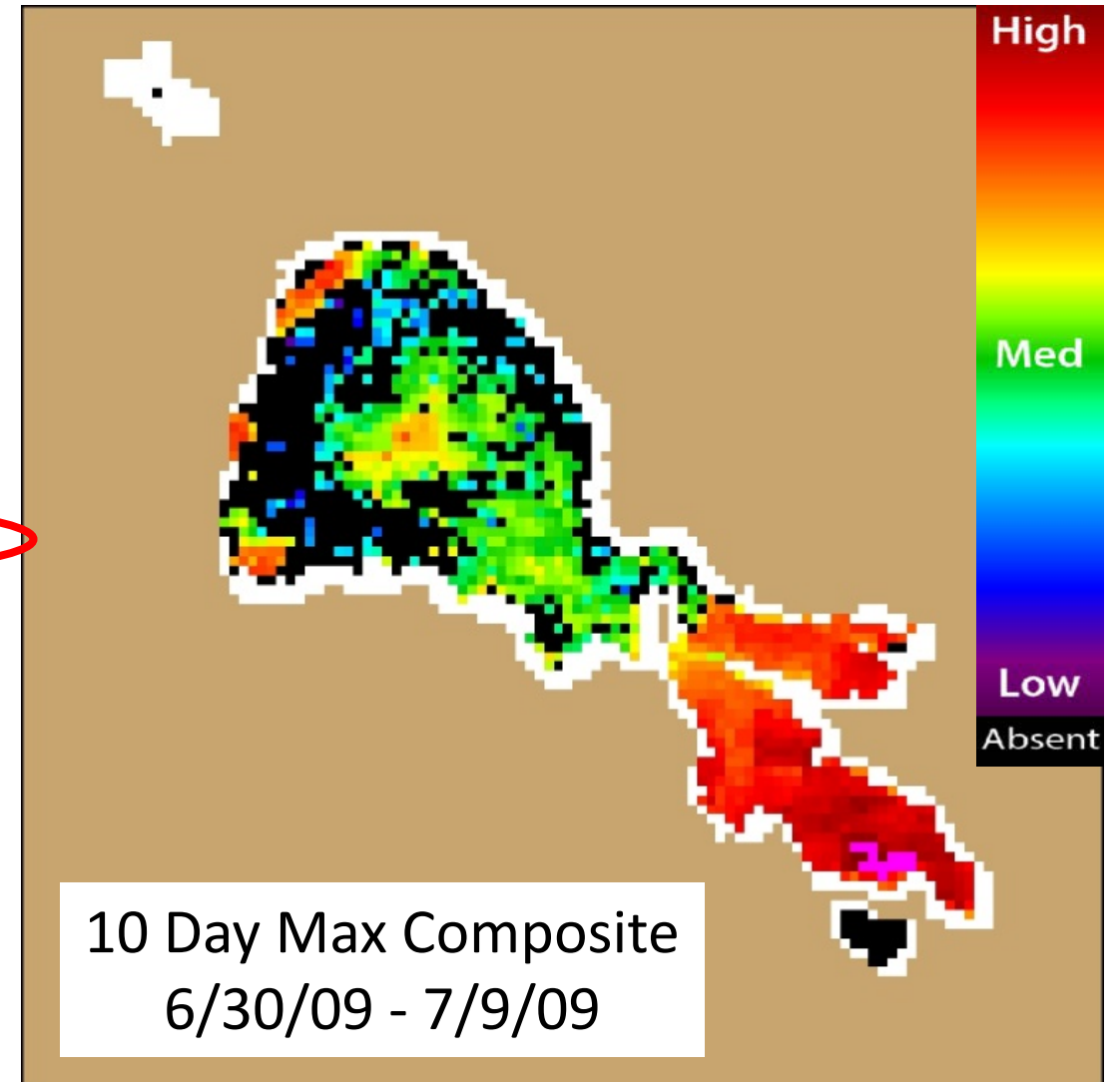
- Valid composites need >17 pixels
 - NOAA recommended
- Estimate concentration in:
 - Cyanobacterial Index (CI)
 - Chlorophyll-a (ug/L)
 - **Microcystis sp. (cells/mL)**
- From each 10 day max composite, generate waterbody-wide estimates for:
 - Mean
 - Median
 - **90th percentile of max**



Generate Statistics

start_date	end_date	Pixels	Cyano	Cyano	Cyano
			Mean	Median	90th %
			>17	>17	>17
start_date	end_date	Pixels	MC (cells/mL)	MC (cells/mL)	MC (cells/mL)
6/22/2009	7/1/2009	1757	109,648	131,826	1,995,262
6/23/2009	7/2/2009	1779	123,027	154,882	1,949,845
6/24/2009	7/3/2009	1739	109,648	134,896	1,949,845
6/25/2009	7/4/2009	1739	109,648	134,896	1,949,845
6/26/2009	7/5/2009	1721	134,896	181,970	1,778,279
6/27/2009	7/6/2009	1709	125,893	186,209	1,548,817
6/28/2009	7/7/2009	1709	125,893	186,209	1,548,817
6/29/2009	7/8/2009	1733	134,896	194,984	1,584,893
6/30/2009	7/9/2009	1721	125,893	186,209	1,621,810

- Mean and Median can underestimate public health risk
- 90th percentile value is region of high public health risk
 - Similar to event response grab samples



Thresholds

start_date	end_date	Pixels	Cyano	Cyano	Cyano
			Mean	Median	90th %
			>17	>17	>17
MC (cells/mL)	MC (cells/mL)	MC (cells/mL)			
6/22/2009	7/1/2009	1757	109,648	131,826	1,995,262
6/23/2009	7/2/2009	1779	123,027	154,882	1,949,845
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6/29/2009	7/8/2009	1733	134,896	194,984	1,584,893
6/30/2009	7/9/2009	1721	125,893	186,209	1,621,810

	Action Trigger	Warning TIER 1	Danger TIER 2
Primary Thresholds ^a			
Total Microcystins ^b	0.8 µg/L	6 µg/L	20 µg/L
Anatoxin-a	Detection ^c	20 µg/L	90 µg/L
Cylindrospermopsin	1 µg/L	4 µg/L	12 µg/L
Secondary Thresholds			
Cell Density (<i>Toxin producing cells</i>)	4,000 cells/mL	--	--
Site Specific Indicators of Cyanobacteria	Blooms, scums, mats	--	--

Level	Value (cells/mL)
CA Action Trigger	4,000
Satellite 'background' level	~10,000

Thresholds

start_date	end_date	Pixels	Cyano	Cyano	Cyano
			Mean	Median	90th %
			>17	>17	>17
MC (cells/mL)	MC (cells/mL)	MC (cells/mL)			
6/22/2009	7/1/2009	1757	109,648	131,826	1,995,262
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Level	Value (cells/mL)
CA Action Trigger	4,000
Satellite 'background' level	~10,000
WHO Low Risk	<20,000
WHO Moderate Risk	20,000-100,000
WHO High Risk	>100,000

Thresholds

start_date	end_date	Pixels	Cyano	Cyano	Cyano
			Mean	Median	90th %
			>17	>17	>17
MC (cells/mL)	MC (cells/mL)	MC (cells/mL)			
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Level	Value (cells/mL)
CA Action Trigger	4,000
Satellite 'background' level	~10,000
WHO Low Risk	<20,000
WHO Moderate Risk	20,000-100,000
WHO High Risk	>100,000
'Very High Risk'	>1,000,000

Thresholds

start_date	end_date	Pixels	Cyano	Cyano	Cyano
			Mean	Median	90th %
			>17	>17	>17
MC (cells/mL)	MC (cells/mL)	MC (cells/mL)			
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Cylindrospermopsin	1 µg/L	4 µg/L	12 µg/L
Secondary Thresholds			
Cell Density (<i>Toxin producing cells</i>)	4,000 cells/mL	--	--
Site Specific Indicators of Cyanobacteria	Blooms, scums, mats	--	--

Understand Exceedance of 'thresholds'

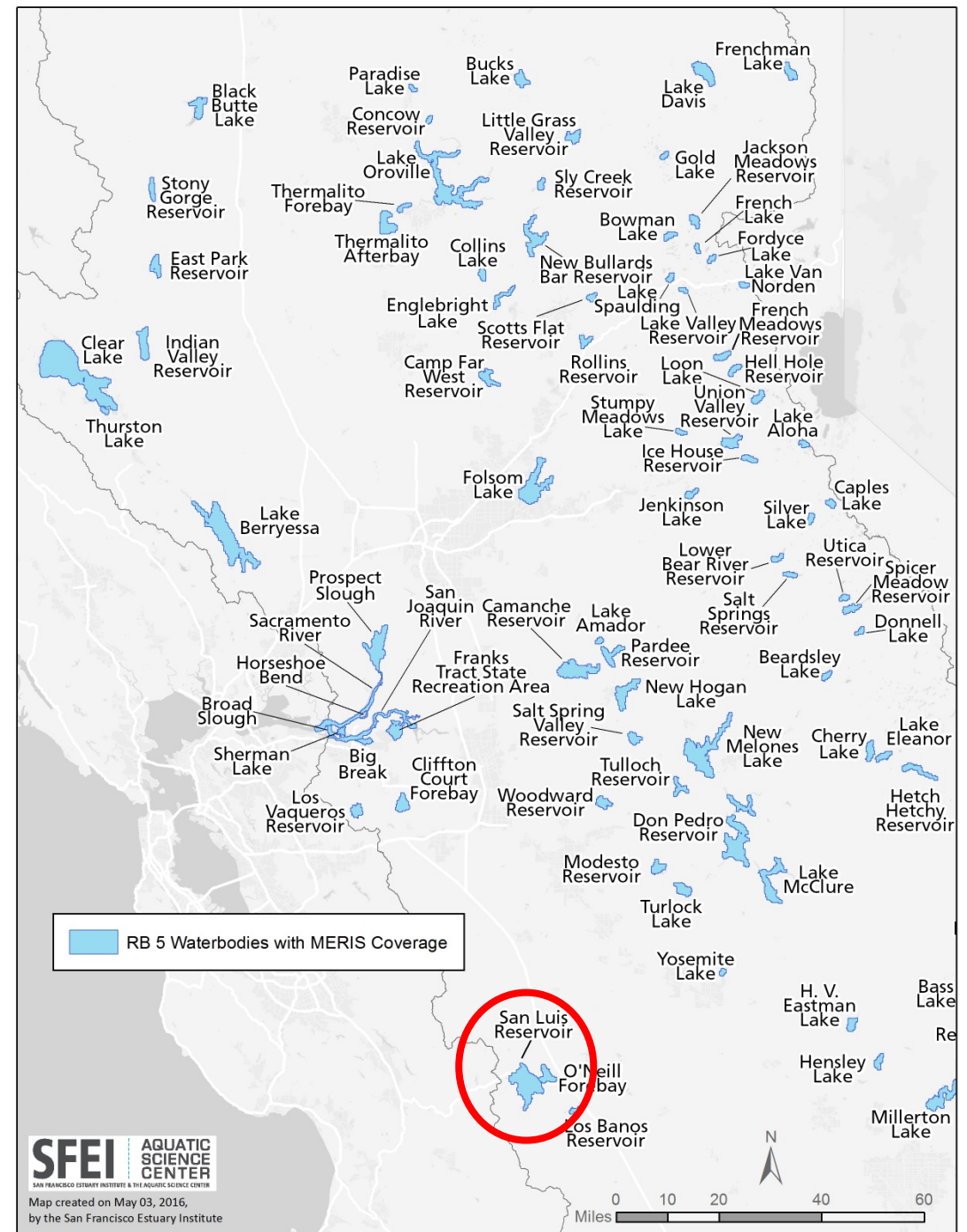
- How often?
- How long?
- How many waterbodies?

Level	Value (cells/mL)
No Data	N/A
Low Risk	10,232- 20,000
Moderate Risk	20,000-100,000
High Risk	100,000-1,000,000
Very High Risk	>1,000,000

Historic Satellite Data for San Luis Reservoir

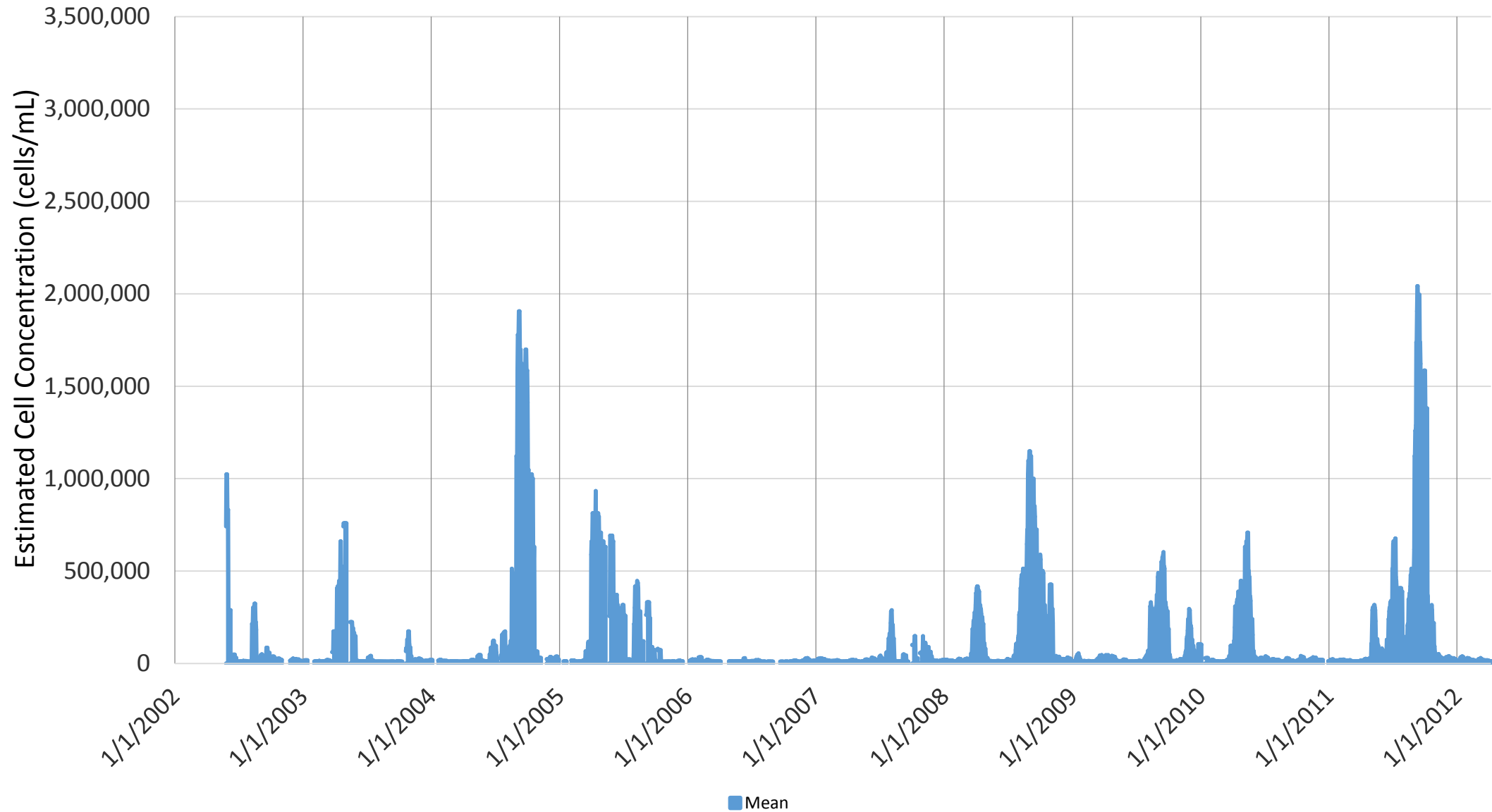
All data is preliminary
Please do not cite

Consider $\pm 15\%$
uncertainty

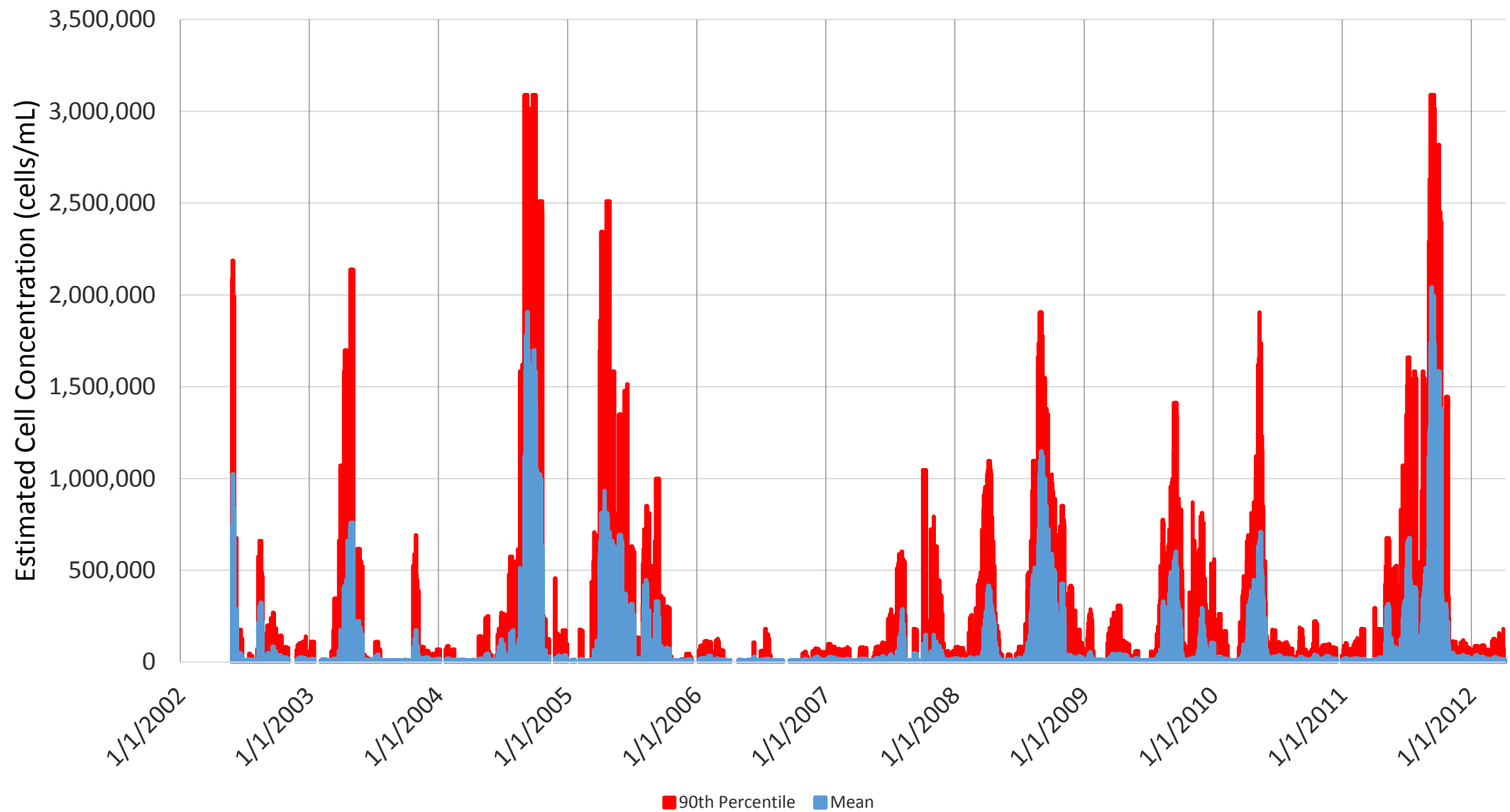




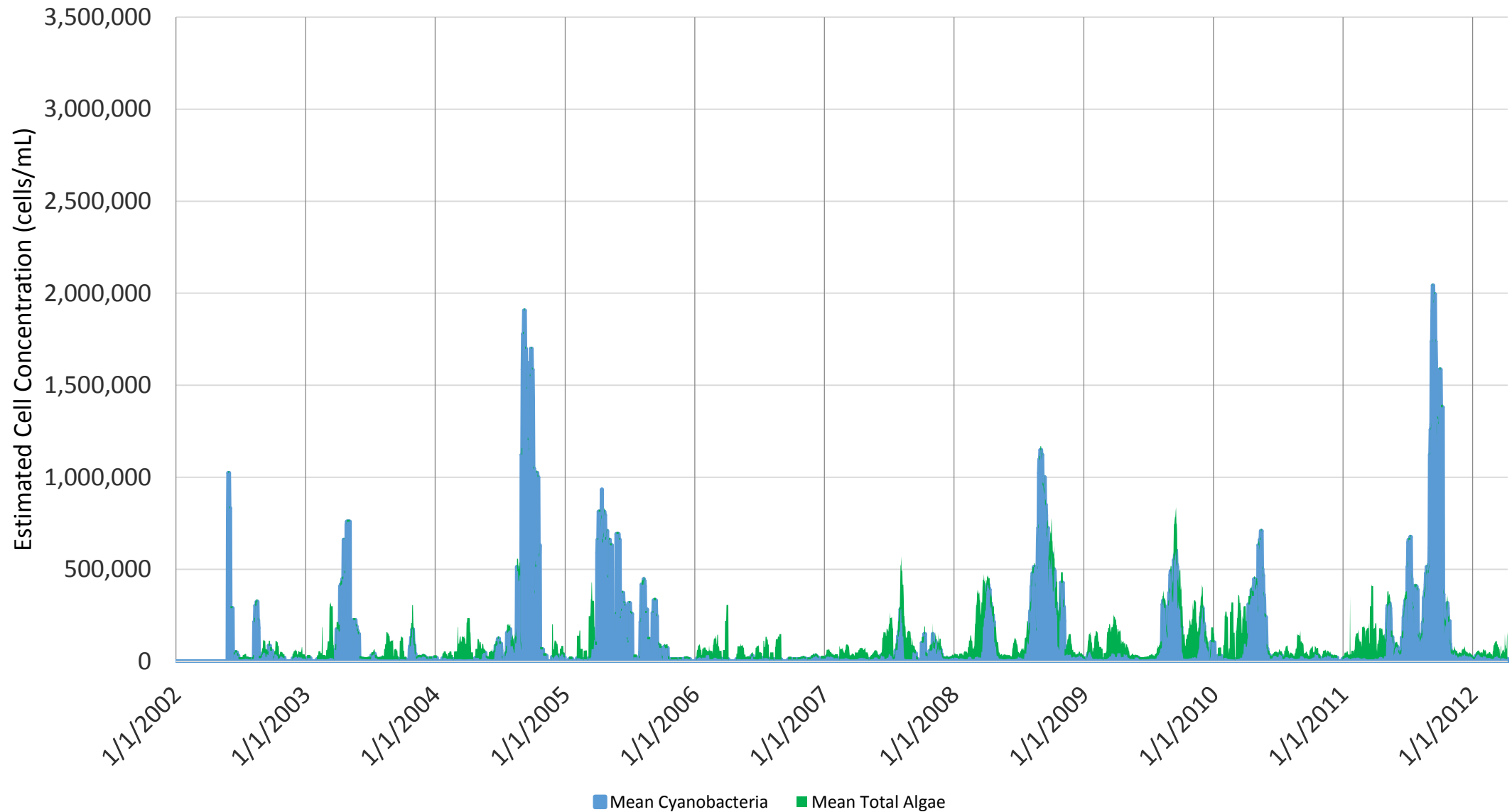
Mean cyanobacteria cell concentration, estimated in Microcystis cells/mL for San Luis Reservoir, CA, 2002-2012



Mean and 90% percentile of max value for cyanobacteria cell concentration, estimated in both Microcystis cells/mL and Chlorophyll-a (ug.L), for San Luis Reservoir, CA, 2002-2012

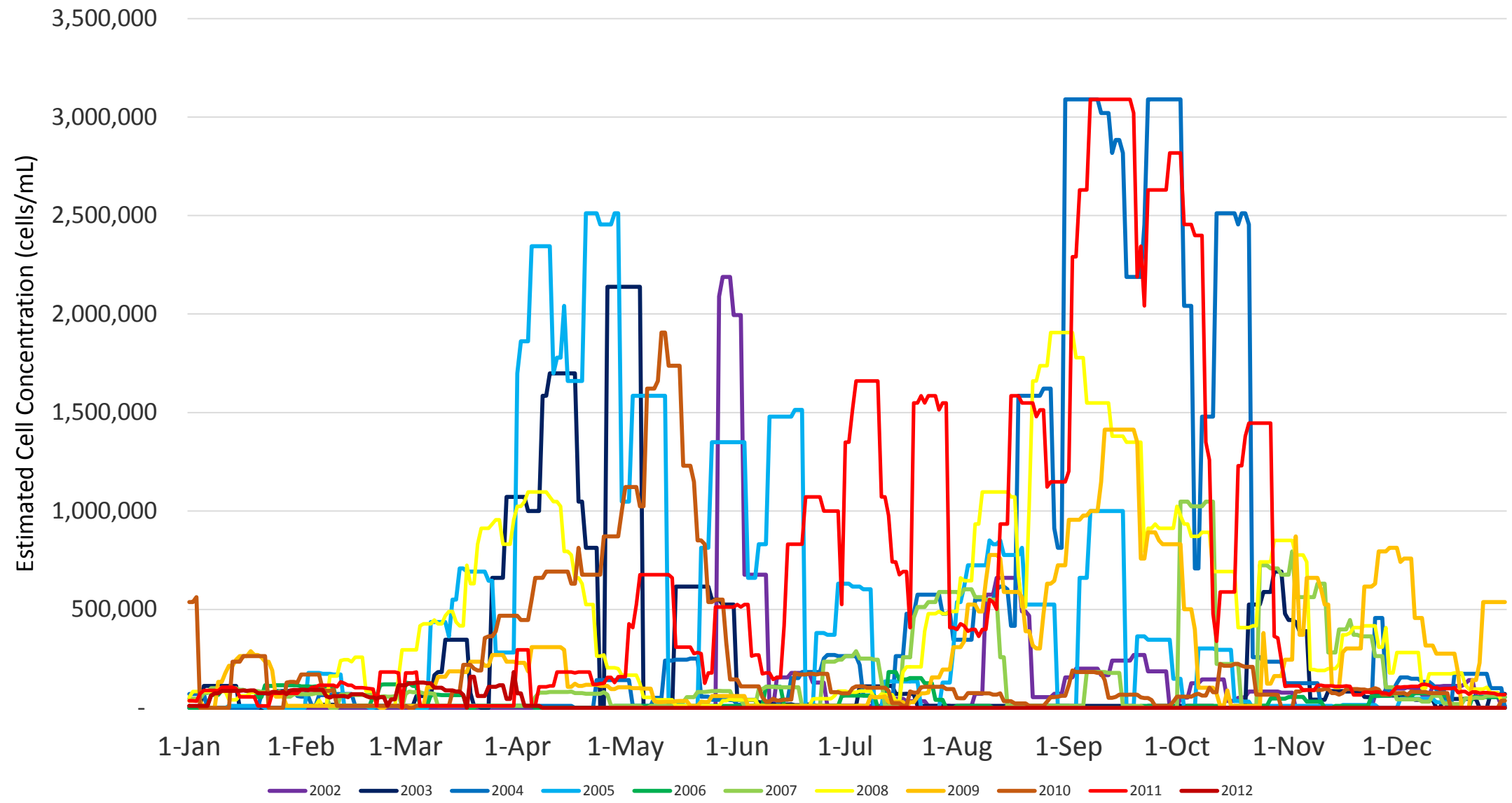


Mean cyanobacteria and mean total algal cell concentration, estimated in *Microcystis* cells/mL for San Luis Reservoir, CA, 2002-2012



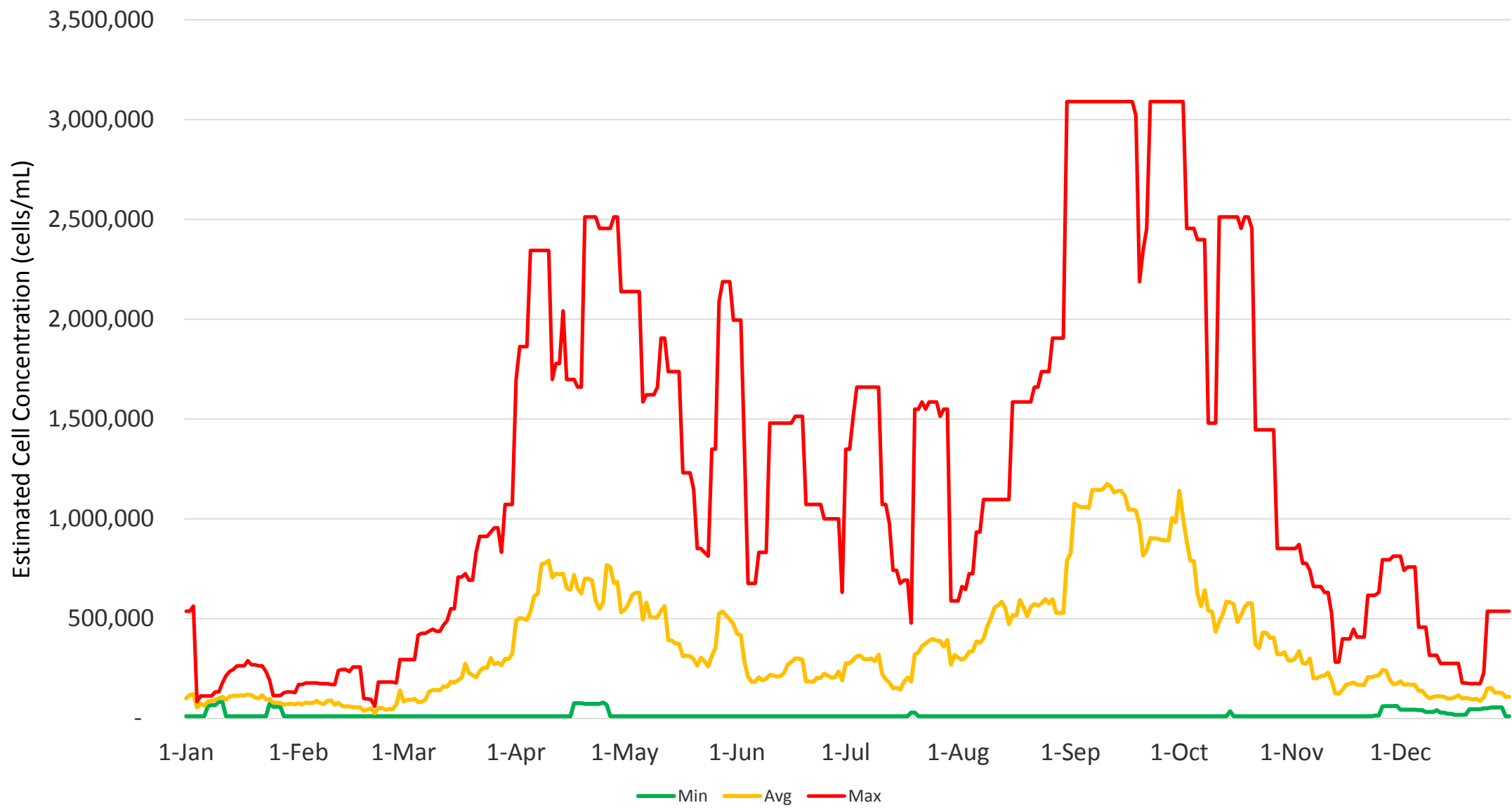


90th percentile of maximum cyanobacteria cell concentration, estimated in Microcystis cells/mL for San Luis Reservoir, CA, 2002-2012



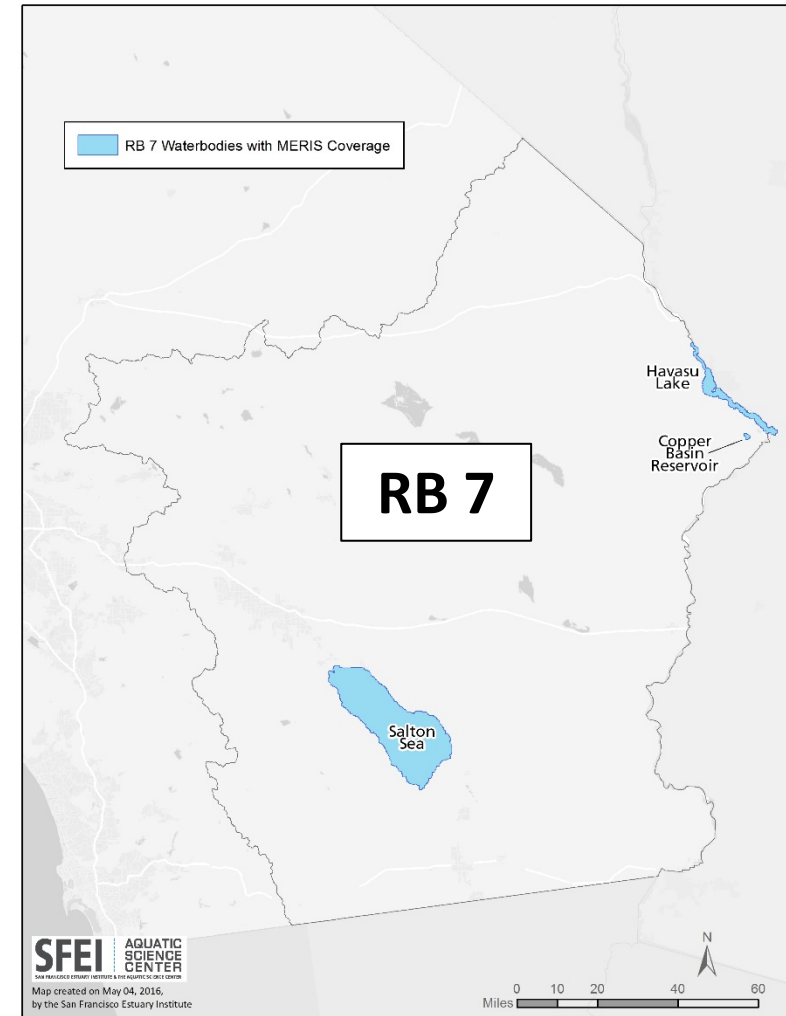
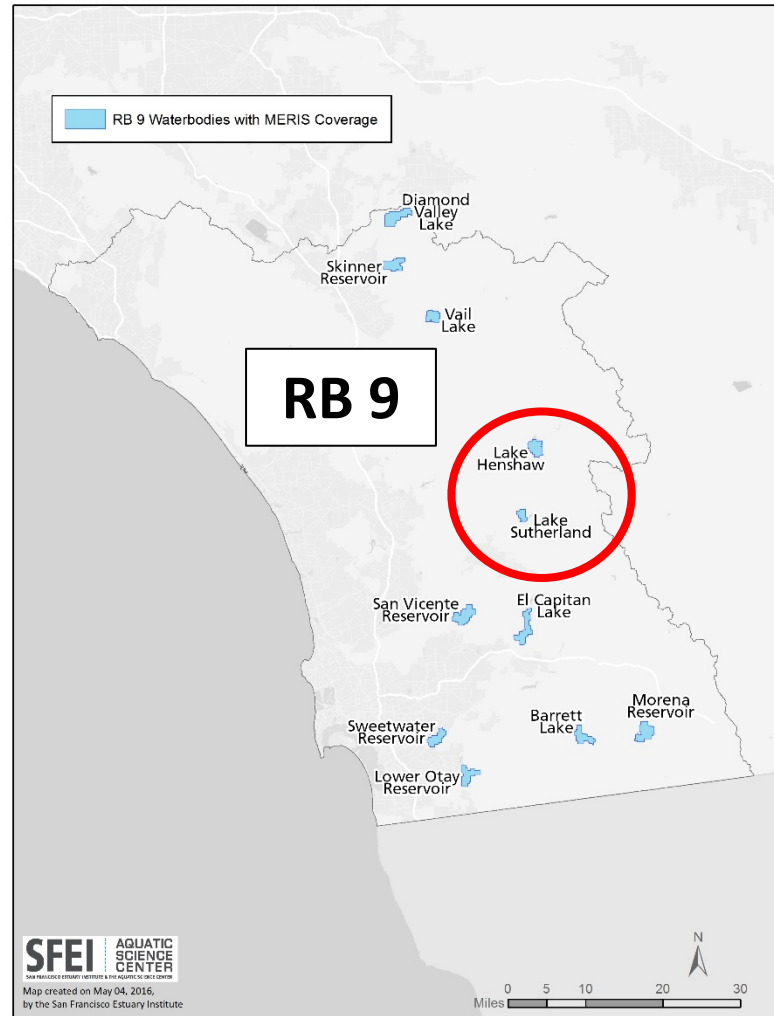
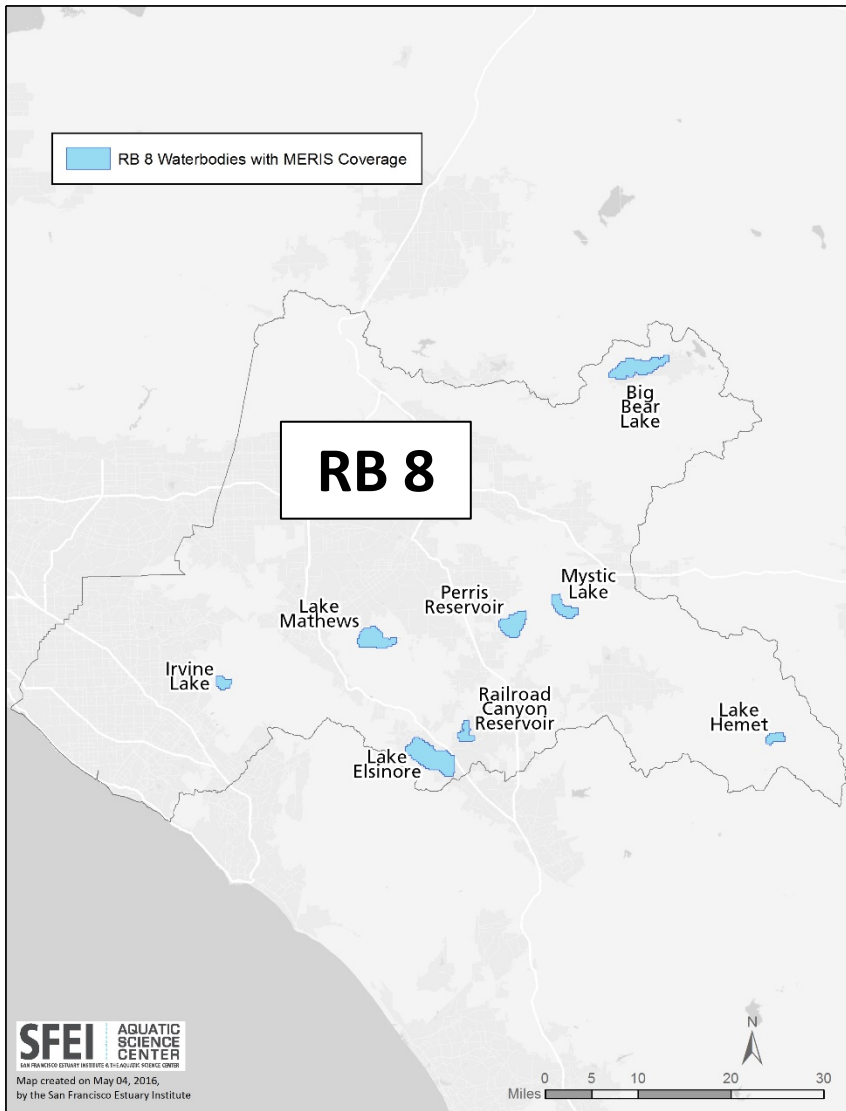


Daily minimum, average, and maximum of 90th percentile of maximum cell concentration, estimated in Microcystis cells/mL for San Luis Reservoir, CA, 2002-2012

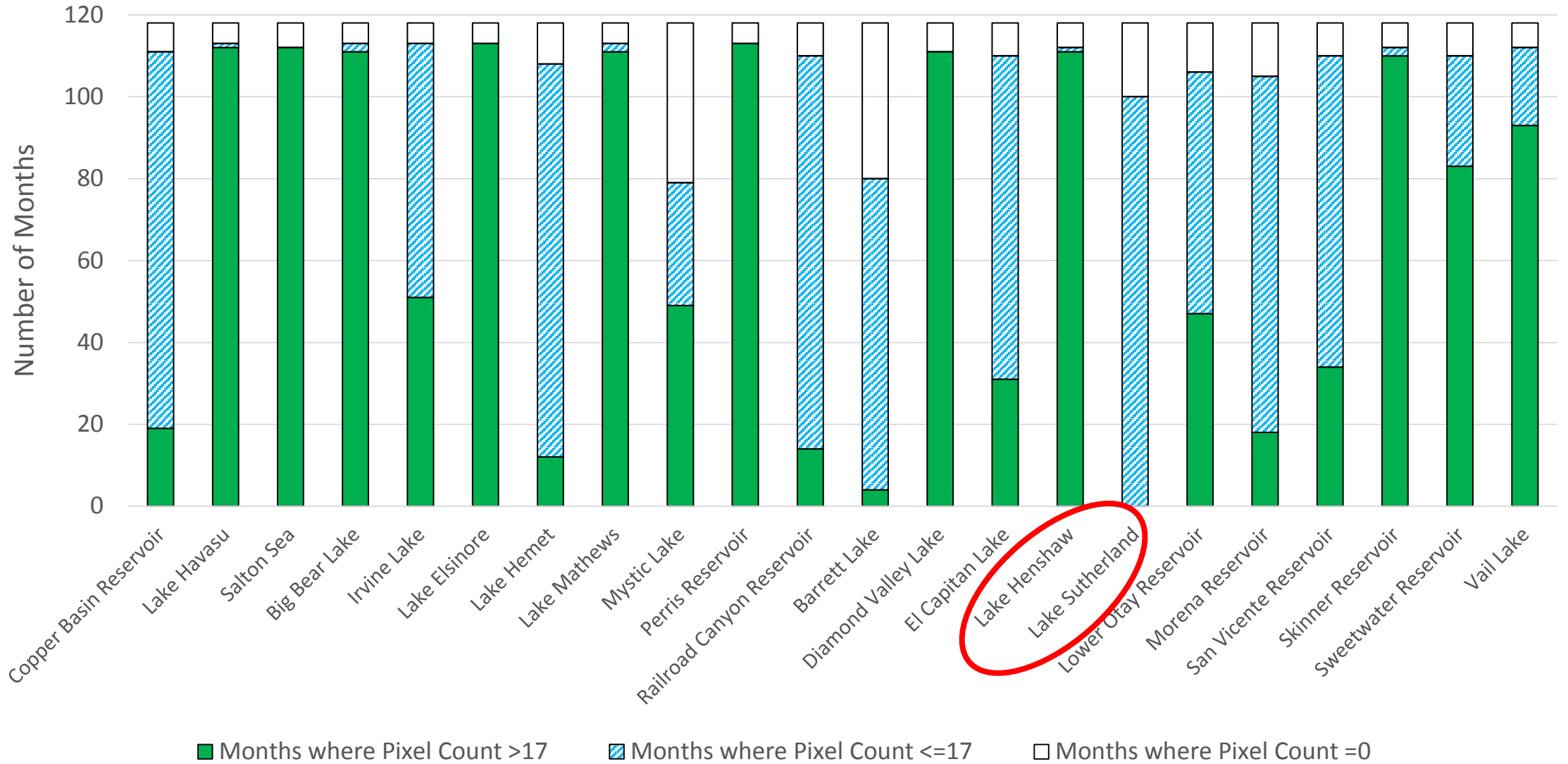


Region 7,8, and 9 Summary

Monthly composites (not 10 day)

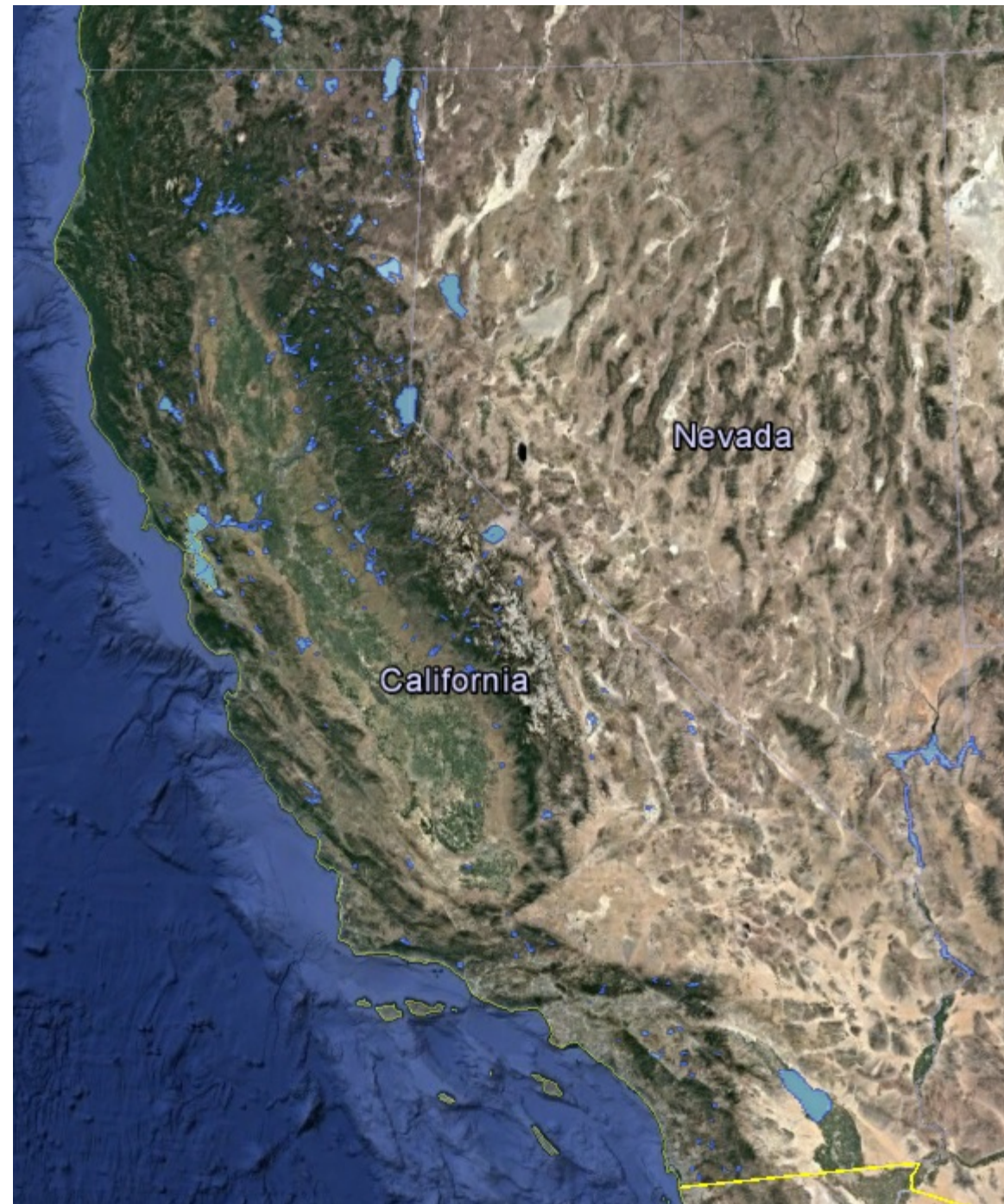


Number of months where composites meet >17 pixels threshold for waterbodies within Regions 7, 8, and 9 for June, 2002- March 2012

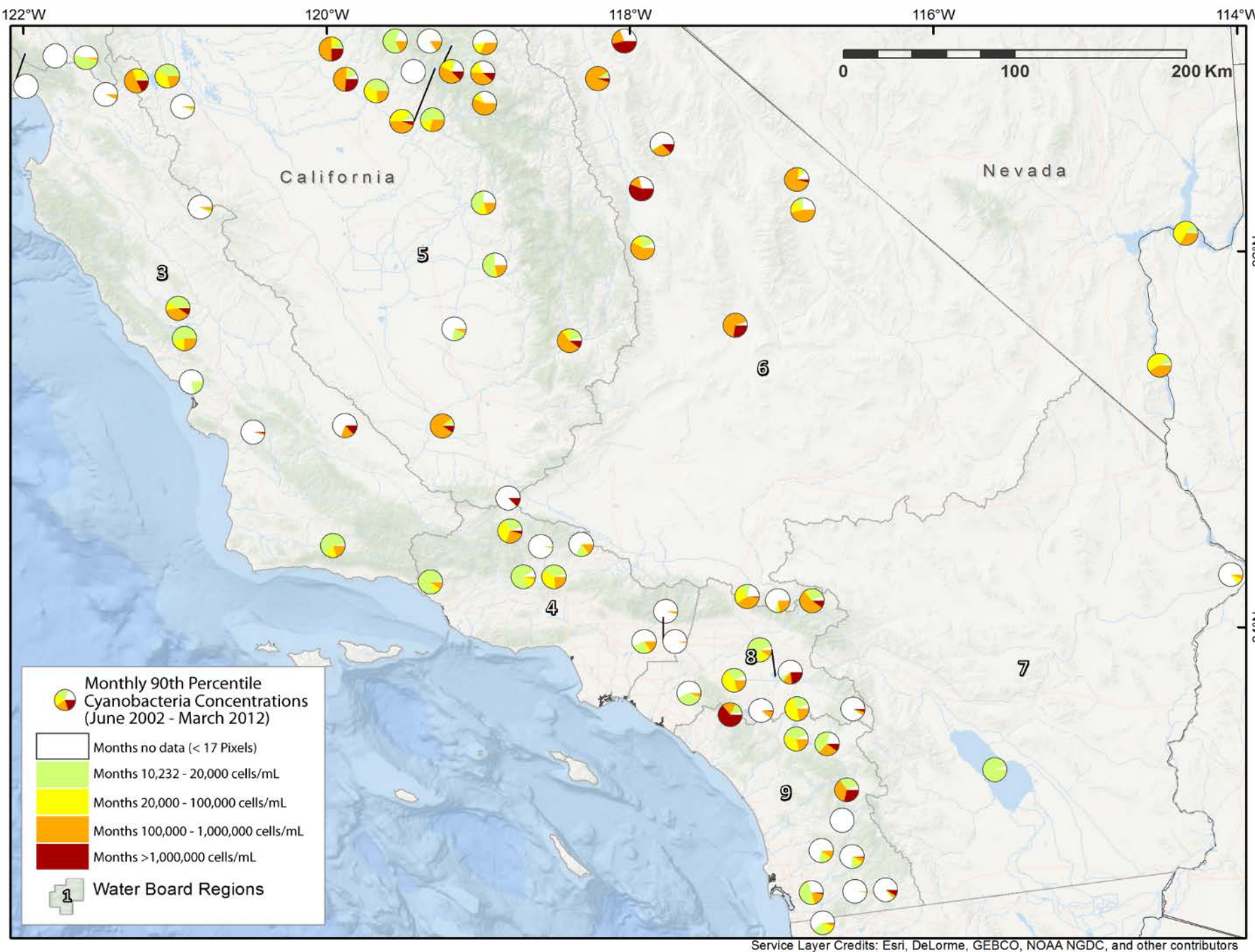


Statewide Summary

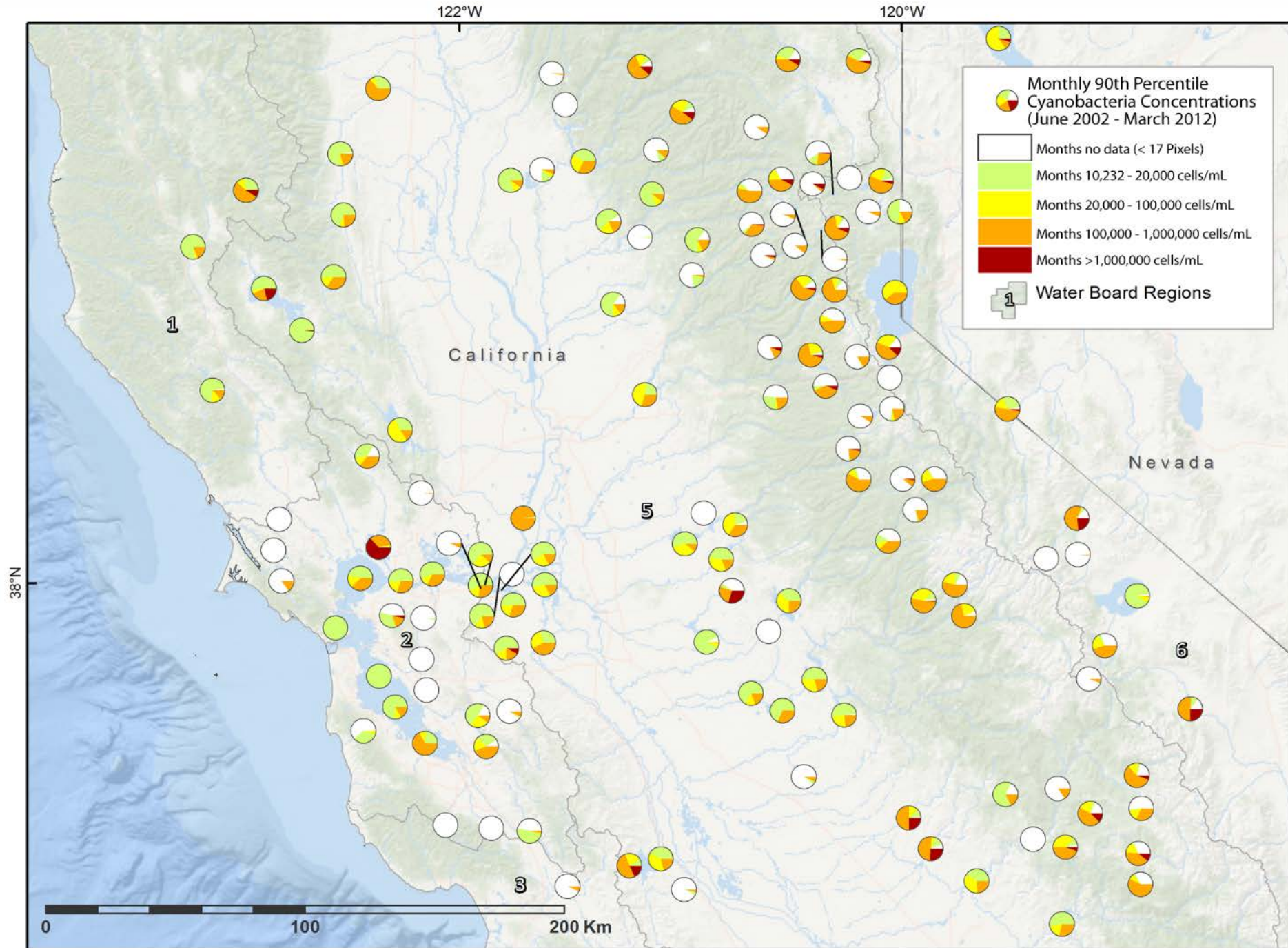
- 255 waterbodies
- Monthly composites (not 10 day)



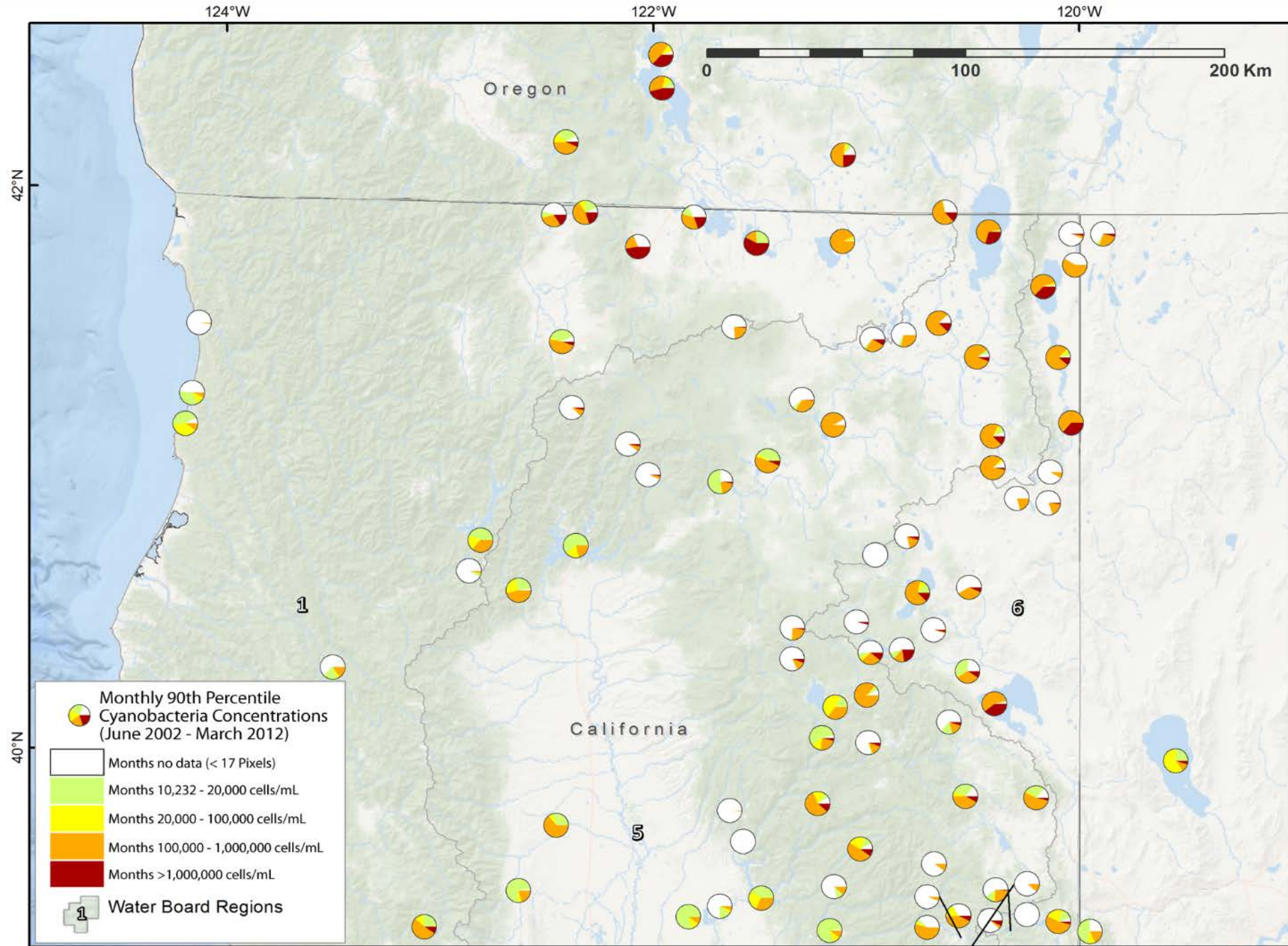
Monthly Exceedances Southern California



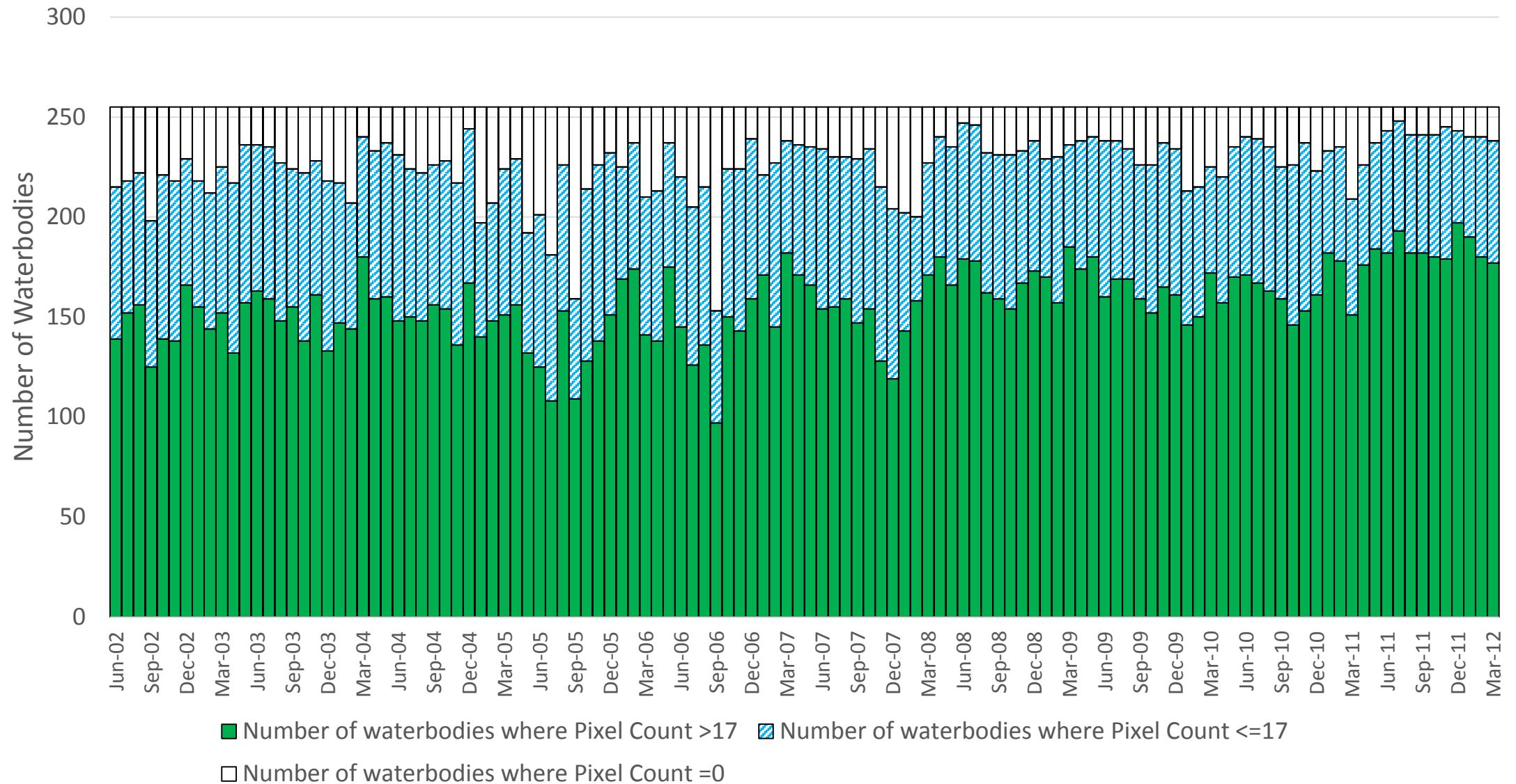
Monthly Exceedances Central California



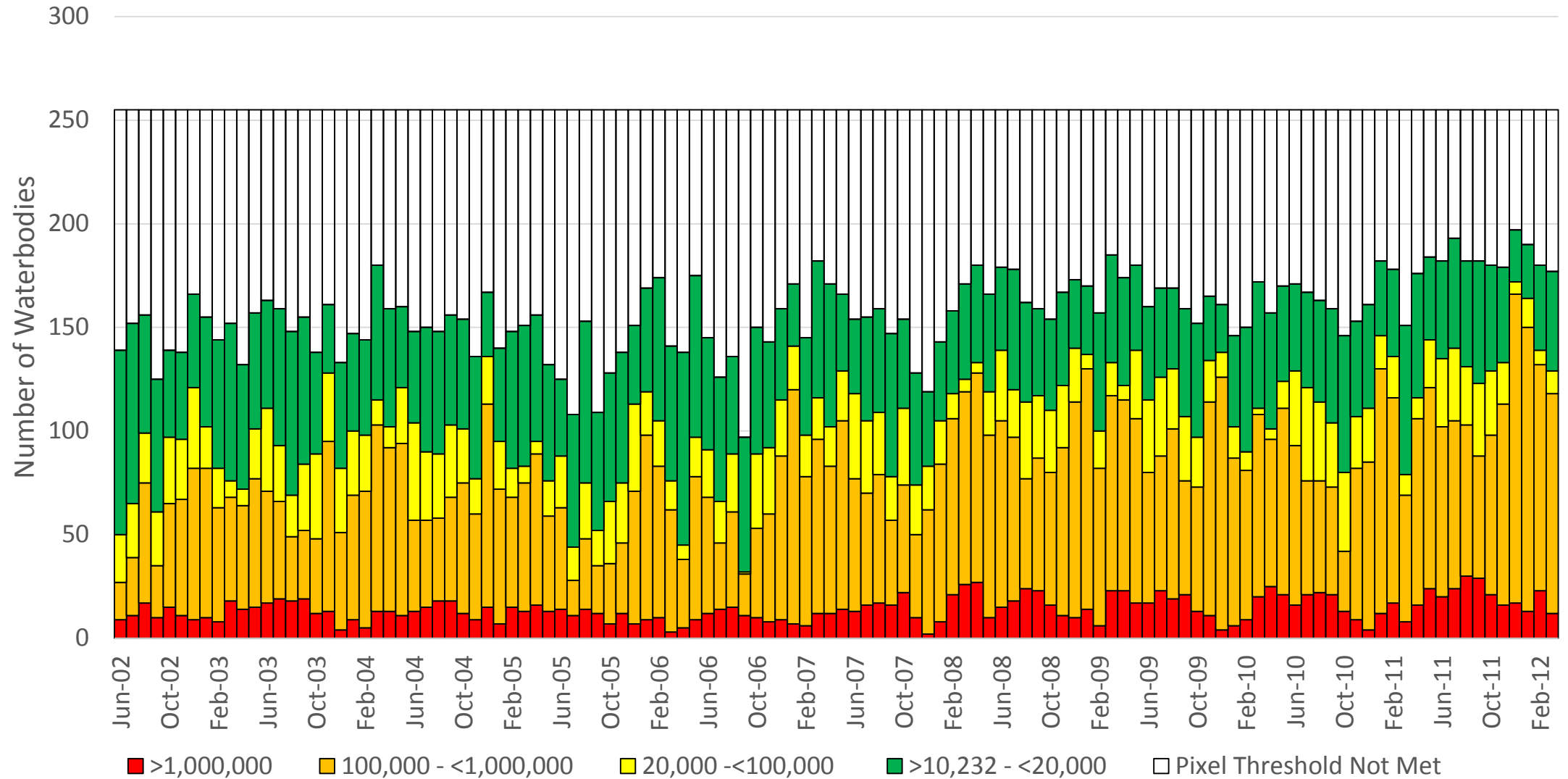
Monthly Exceedances Northern California



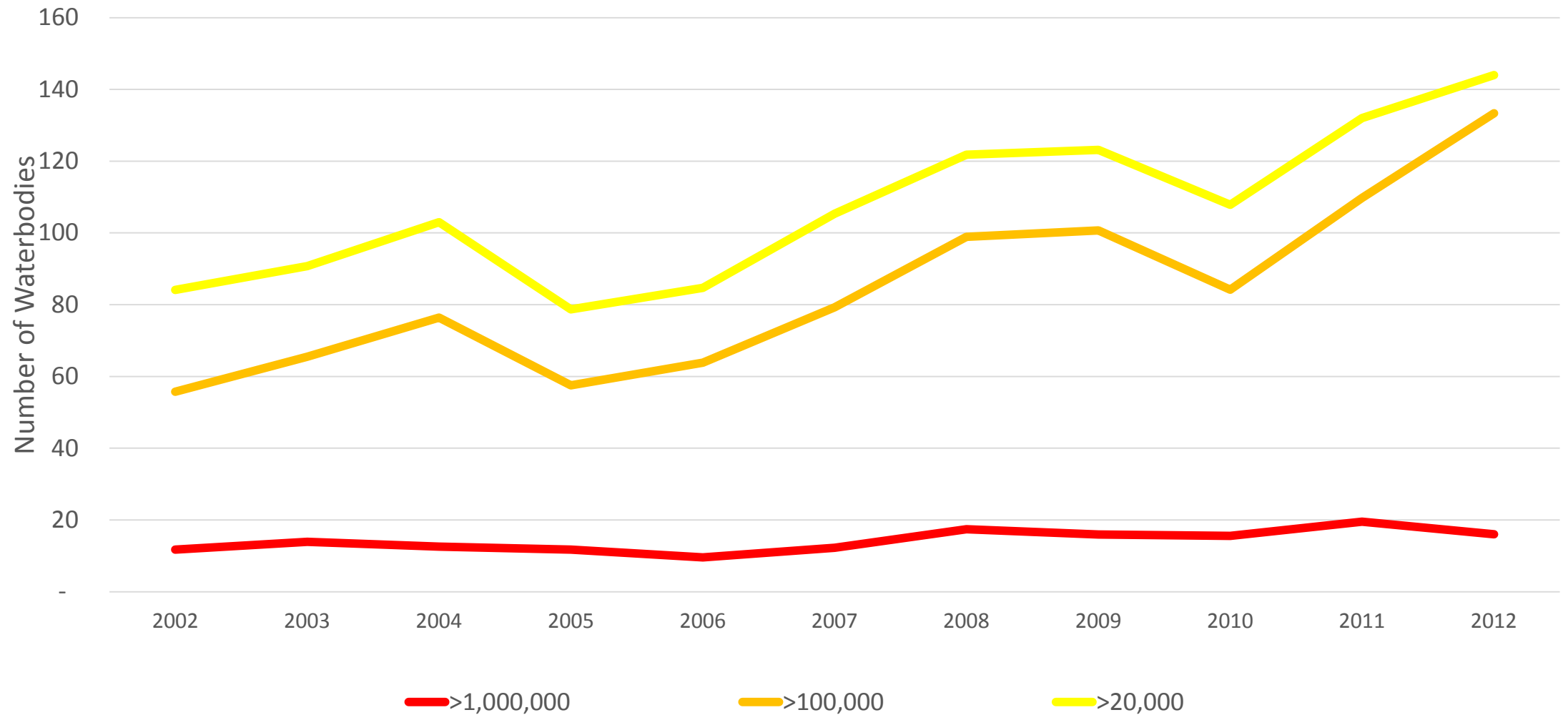
Number of 255 selected waterbodies where monthly composite pixel counts are >17; <=17; or 0, for June 2002 to March 2012



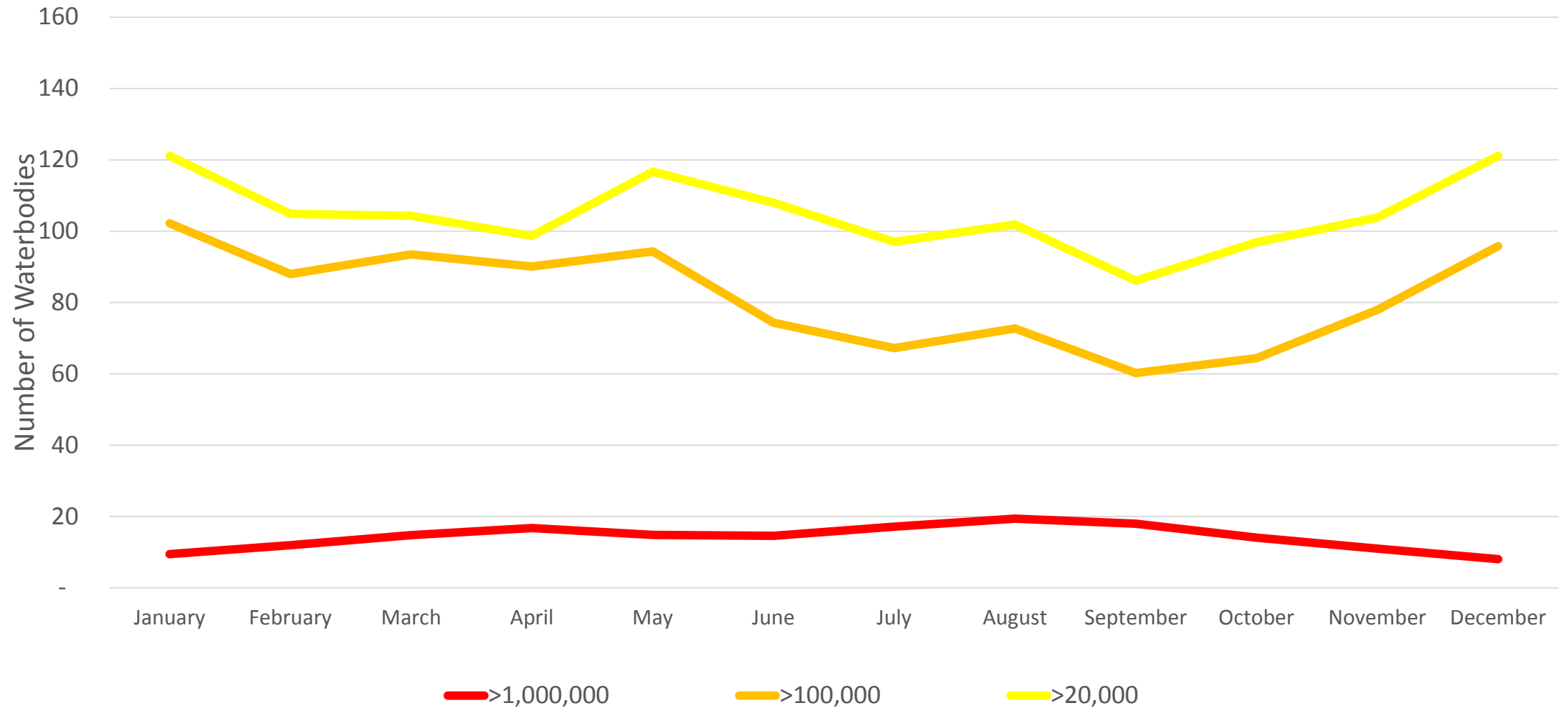
Number of 255 selected waterbodies where 90th percentile values within monthly composites exceed defined cells/mL thresholds, for June 2002 to March 2012



Average number of 255 selected waterbodies in California where 90th percentile values for monthly composites exceed thresholds of 20,000; 100,000; or 1,000,000 cells/mL, for 2002 to 2012

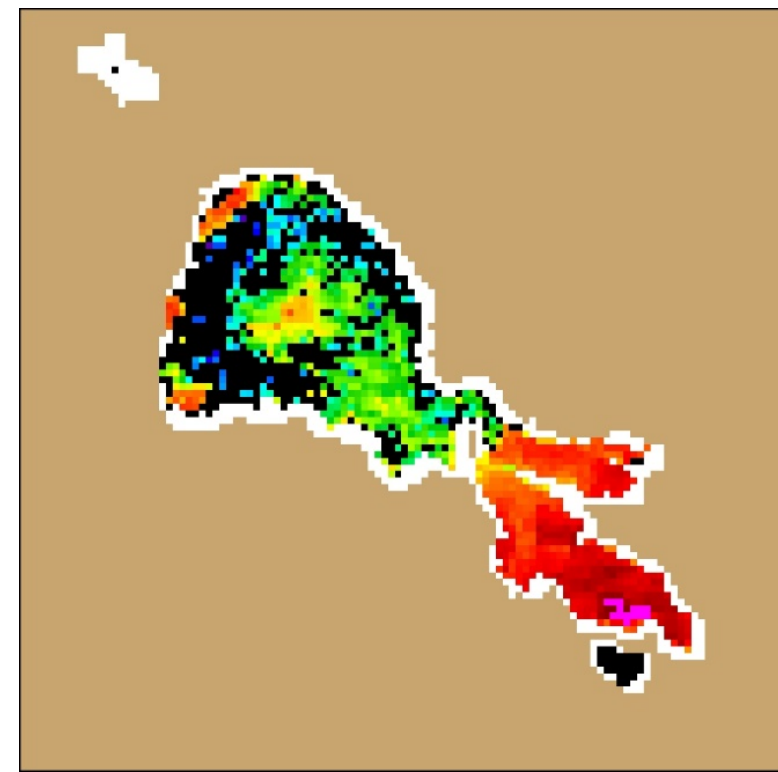


Monthly average number of 255 selected waterbodies in California where 90th percentile concentration estimates of Microcystis concentrations exceed thresholds of 20,000; 100,000; or 1,000,000 cells/mL, for 2002 to 2012



Satellites- What They Can't Do

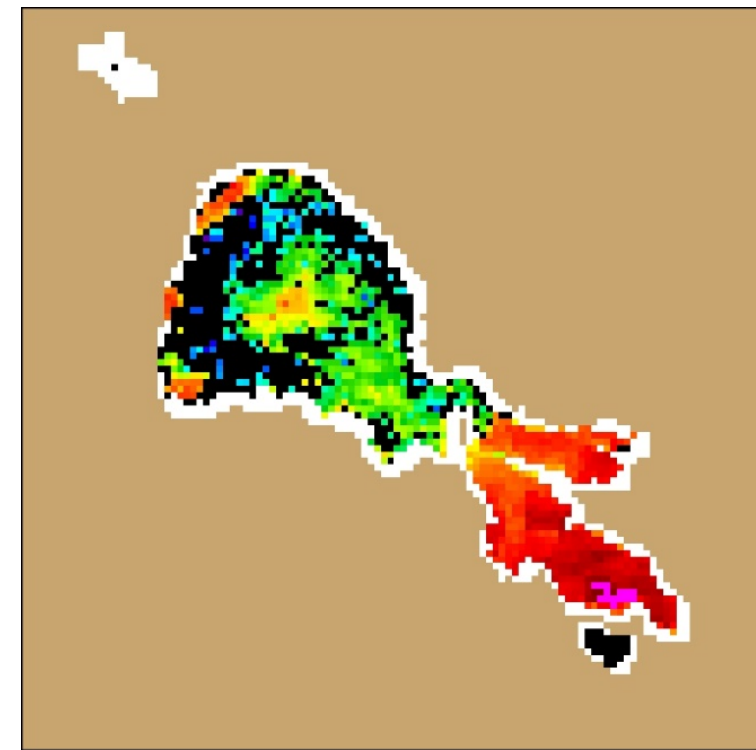
- Cyanobacteria blooms can be detected but...
 - Clouds block images
 - Screening tool
 - No direct comparisons to HAB thresholds
 - Values are estimates (NOAA recommends +/-15% uncertainty)
 - Estimates all cyanobacteria (including non-toxin producers)
 - Doesn't measure toxin levels
 - Less confidence with data for lowest algal densities
 - False positives can occur
 - Limited to large lakes (currently)



Satellites- What They Can Do

- Cyanobacteria blooms can be detected and...
 - Provide understanding of bloom conditions from 2002-2012
 - Identify trends and severity of blooms
 - Data can help understand bloom drivers, management
 - Monitor ~150 waterbodies in CA at once
 - Inform public about changing bloom status and location
 - Communicate data to help guide event response monitoring by:
 - Waterbody managers
 - County public health officials
 - Regional Board/SWAMP

Bev needs YOUR contact information!



Further Research Needed

- Continue testing satellite data for interference/accuracy
 - Alkali lakes?
 - Halobacteria? (Owens Lake)
 - High elevation/clear water? (Lake Tahoe)
- Satellite raster data is available through SFEI. Compare against:
 - Water quality/cyanoHAB data
 - Weather
 - Inflow/lake levels
 - Geology
 - 303 (d) listings
 - Etc.



Questions?



Randy Turner
San Francisco Estuary Institute
randyt@sfei.org
707-499-5521

Interactive Maps for MyWaterQuality Portal

- DRAFT mock-ups of what interactive maps may look like
- Posted Waterbody map
- Satellite Data map

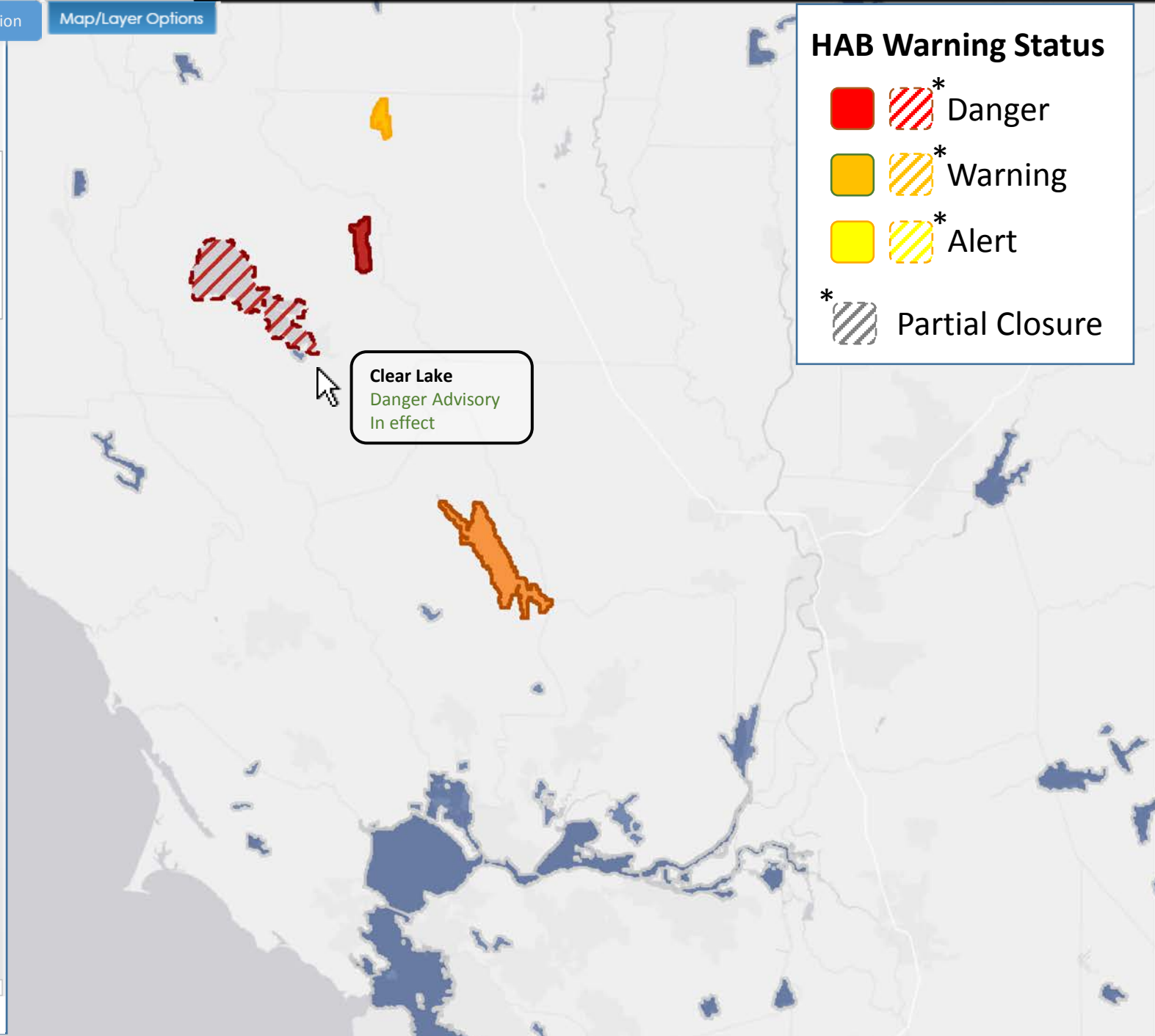


Water Board Region 2

- [Anderson Lake](#)
- [Broad Slough](#)
- [Calaveras Reservoir](#)
- [Carquinez Strait](#)
- [Central Bay](#)
- [Laguna Lake](#)
- [Lake Curry](#)
- [Lake del Valle](#)
- [Lake Hennessey](#)
- [Lower South Bay](#)
- [Napa River island slough complex](#)
- [New York Slough](#)
- [Nicasio Reservoir](#)
- [Quarry Lakes](#)
- [Richardson Bay](#)
- [Sacramento River](#)
- [San Antonio Reservoir](#)
- [San Joaquin River](#)
- [San Pablo Bay](#)
- [South Bay](#)
- [Suisun Bay](#)
- [Upper Crystal Springs Reservoir](#)

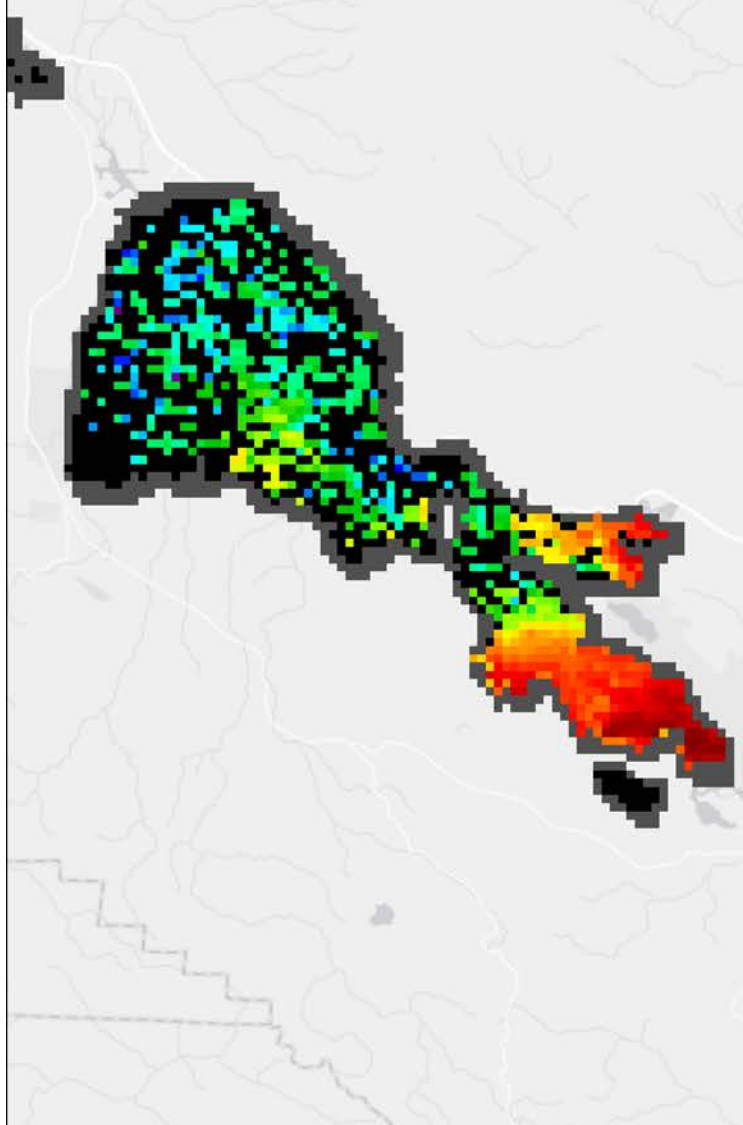
Water Board Region 3

- [San Felipe Lake](#)
- [Hernandez Reservoir](#)
- [Lake San Antonio](#)
- [Nacimiento Reservoir](#)
- [Whale Rock Reservoir](#)
- [Soda Lake](#)
- [Lopez Lake](#)
- [Lake Cachuma](#)



HAB Warning Status

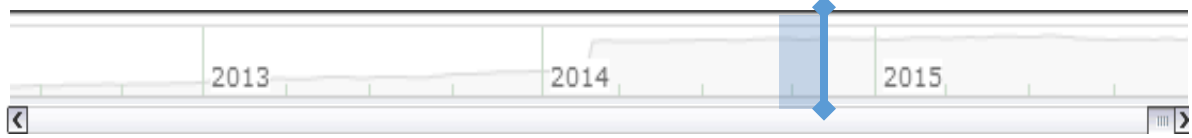
-   Danger
-   Warning
-   Alert
-  Partial Closure



MERIS 10-Day Composite Biomass Estimate
 May 20, 2014 – May 30, 2014

Clear Lake, Lake County, CA

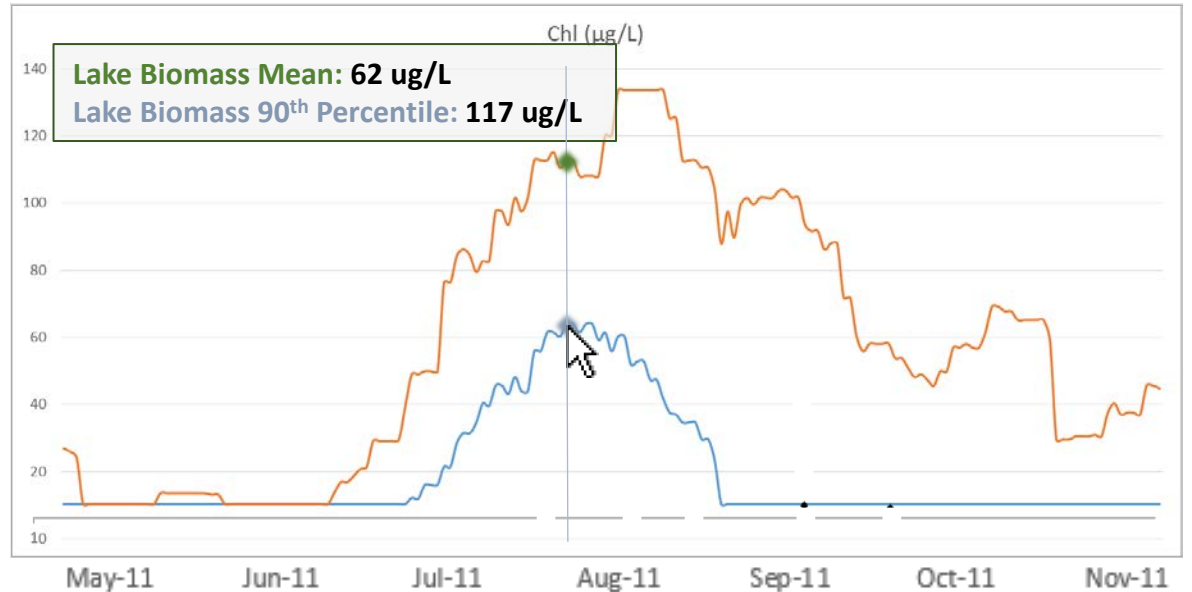
Current Advisory: State and county agencies are urging swimmers, boaters and recreational users to avoid contact with blue-green algae now blooming in Clear Lake located in Lake County, CA. The lake has been posted with advisories warning of any contact with the water because of possible toxins associated with the algae. [Read More](#)



Display Last **10** Days

- Trends
- Water Quality
- Data Table

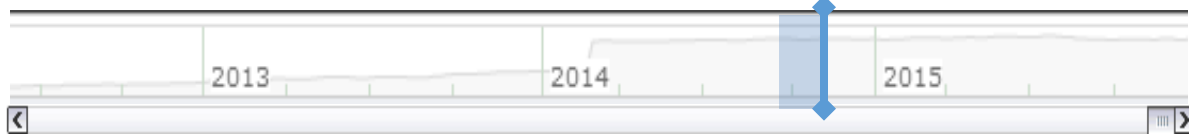
Cyanobacteria Estimated Biomass & Toxicity



- Clear Lake CEDEN Analytes
- Select One
 - Lake Biomass Mean
 - Lake Biomass 90th Percentile

Clear Lake, Lake County, CA

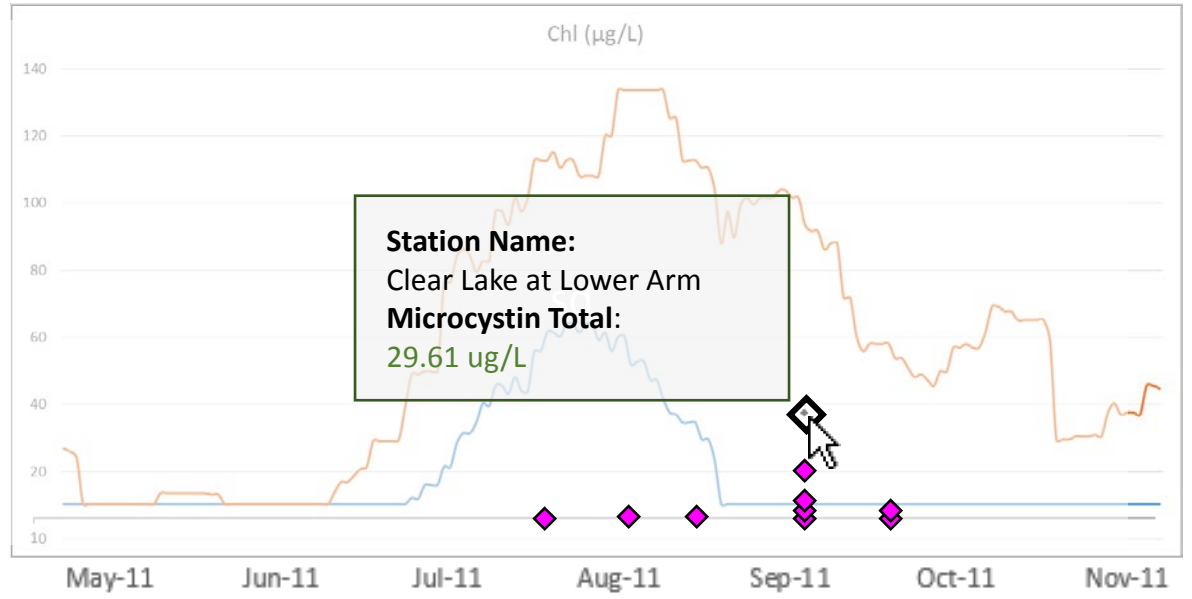
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- Water Quality
- Data Table

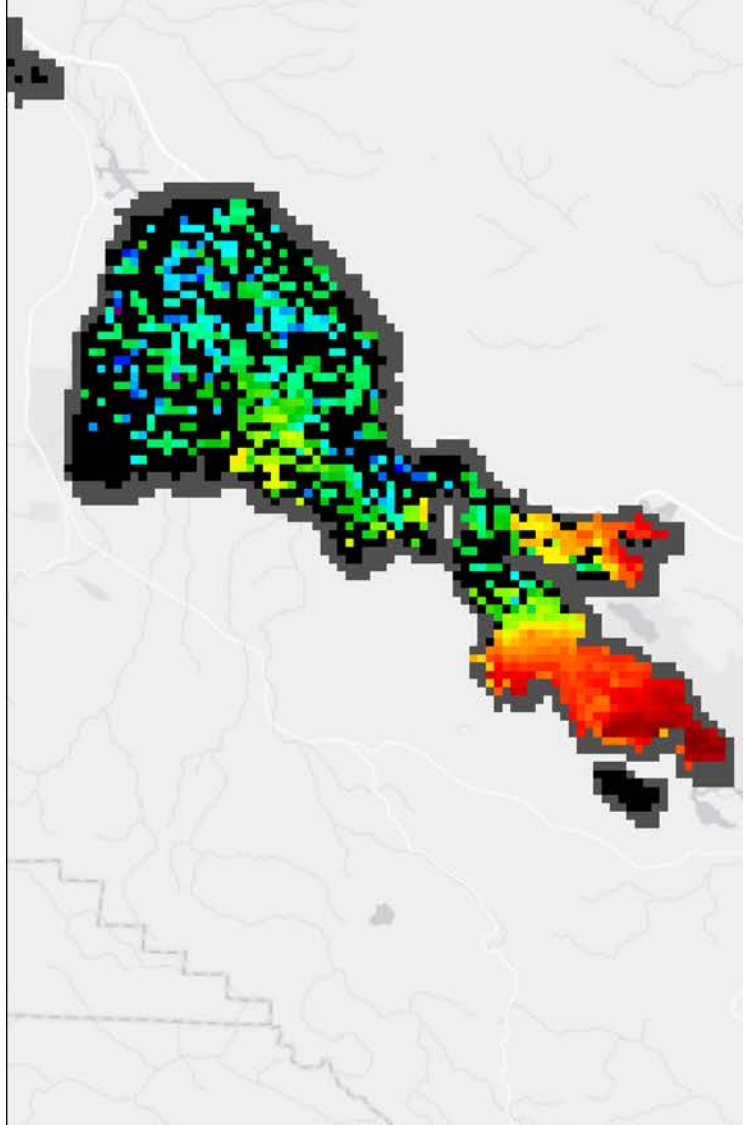
Cyanobacteria Estimated Biomass & Toxicity



Station Name:
 Clear Lake at Lower Arm
Microcystin Total:
 29.61 ug/L

- Clear Lake CEDEN Analytes
- Lake Biomass Mean
 - Lake Biomass Median
 - Microcystin Total (ug/L)

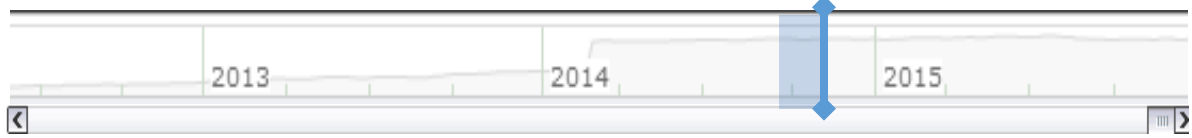
◊ CEDEN Sample Location
 MERIS 10-Day Composite Biomass Estimate
 May 20, 2014 – May 30, 2014



MERIS 10-Day Composite Biomass Estimate
 May 20, 2014 – May 30, 2014

Clear Lake, Lake County, CA

Current Advisory: State and county agencies are urging swimmers, boaters and recreational users to avoid contact with blue-green algae now blooming in Clear Lake located in Lake County, CA. The lake has been posted with advisories warning of any contact with the water because of possible toxins associated with the algae. [Read More](#)



Trends Water Quality **Data Table**

Select Data for Waterbody

CEDEN Data
 MERIS Analysis Data

From Jan 8, 2016 To Feb 8, 2016 **Download Table**

					Pixel Values				ug/L			
	H	I	J	K	L	M	N	O	P	Q	R	
	median	mean	perc90	var	min	max	stdev	median	mean	perc90	var	
5	1	1	24	1	10.41	33.02	10.44	10.41	10.41	10.70	10.41	
5	1	1	24	1	10.41	33.02	10.44	10.41	10.41	10.70	10.41	
6	1	1	24	1	10.41	33.02	10.44	10.41	10.41	10.70	10.41	
7	1	1	24	1	10.41	33.02	10.44	10.41	10.41	10.70	10.41	
8	1	1	24	1	10.41	33.02	10.44	10.41	10.41	10.70	10.41	
9	1	1	31	1	10.41	33.02	10.45	10.41	10.41	10.80	10.41	
10	1	1	31	1	10.41	33.02	10.45	10.41	10.41	10.80	10.41	
11	1	1	30	1	10.41	14.81	10.45	10.41	10.41	10.80	10.41	
12	1	1	46	1	10.41	16.79	10.46	10.41	10.41	11.13	10.41	
13	1	1	46	1	10.41	16.79	10.46	10.41	10.41	11.13	10.41	
14	1	1	46	1	10.41	16.79	10.46	10.41	10.41	11.13	10.41	
15	1	1	46	1	10.41	16.79	10.46	10.41	10.41	11.13	10.41	
16	1	1	46	1	10.41	16.79	10.46	10.41	10.41	11.13	10.41	
17	1	1	211	3	10.41	19.38	10.55	10.41	10.41	61.53	10.43	
18	1	1	211	3	10.41	19.38	10.55	10.41	10.41	61.53	10.43	
19	1	1	211	3	10.41	19.38	10.55	10.41	10.41	61.53	10.43	
20	1	1	374	5	10.41	21.80	10.62	10.41	10.41	133.61	10.44	
21	1	1	374	5	10.41	21.80	10.62	10.41	10.41	133.61	10.44	
22	1	1	368	5	10.41	21.80	10.62	10.41	10.41	133.61	10.44	
23	1	1	411	6	10.41	21.80	10.63	10.41	10.41	133.61	10.45	
24	1	1	411	6	10.41	21.80	10.63	10.41	10.41	133.61	10.45	
25	1	1	431	6	10.41	21.80	10.63	10.41	10.41	133.61	10.45	
26	1	1	431	6	10.41	21.80	10.63	10.41	10.41	133.61	10.45	
27	1	1	281	4	10.41	21.80	10.58	10.41	10.41	133.61	10.44	
28	1	1	562	8	10.41	21.80	10.68	10.41	10.41	133.61	10.47	
29	1	1	562	8	10.41	21.80	10.68	10.41	10.41	133.61	10.47	
30	1	1	418	6	10.41	21.54	10.63	10.41	10.41	133.61	10.46	
31	1	1	418	6	10.41	21.54	10.63	10.41	10.41	133.61	10.46	
32	1	1	417	6	10.41	21.54	10.63	10.41	10.41	133.61	10.46	
33	1	1	417	6	10.41	21.54	10.63	10.41	10.41	133.61	10.45	