# **Estimation of Carbon Sequestration by Lakes Using Satellite Imagery and Digital Technologies**

Supported by AVPN under APAC Sustainability Seed Fund 2.0





### **About Us**

**CEPT University's core focus is human habitat**. Through its education, research and advisory activities, it strives to improve the impact of habitat professions in enriching the lives of people in India's villages, towns and cities.

**CEPT Research and Development Foundation (CRDF)** has been established by the University to manage their research and capacity building activities. There are nine domain-focused centers in the CRDF. The Center for Water and Sanitation (CWAS) is among the first center to be established.

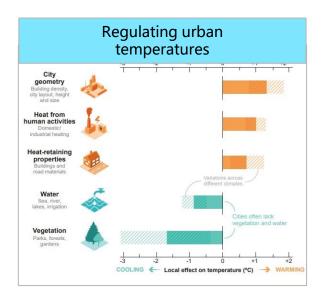
**CWAS began its work in 2009** with focus on improving water and sanitation services in India. It carries out activities related to action research and capacity building – working closely with city and state governments, enabling them to improve delivery of services.



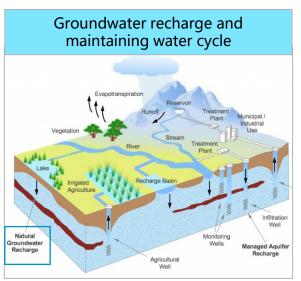


## Lakes are important in context of climate change

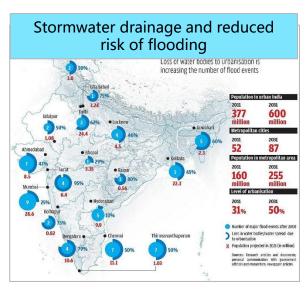
#### For influencing urban water ecosystems...



Intergovernmental Panel on Climate Change (IPCC). (2023). Linking Global to Regional Climate Change. In Climate Change 2021 – The Physical Science Basis: Working Group I Contribution to the Sixth Assessment Report of the Intergovernmental Panel on Climate Change (pp. 1363–1512). chapter, Cambridge: Cambridge University Press.



INOWAS, accessed from <u>inowas.com</u>, Feb 2025. (adapted from California Department of Water Resources)



Source: Two sides of the same coin: Shrinking water bodies and urban floods, Down to Earth, August 2020

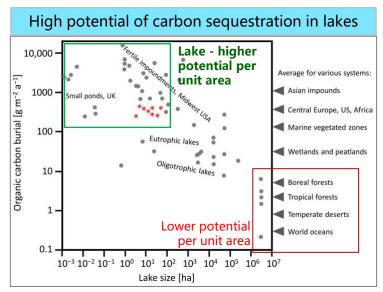






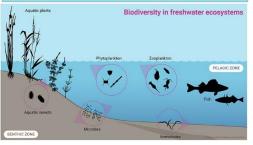
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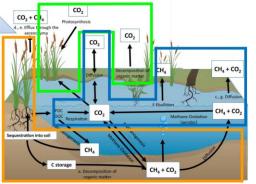
#### For Climate Change mitigation...



Skwierawski A. (2022). Carbon Sequestration Potential in the Restoration of Highly Eutrophic Shallow Lakes. International journal of environmental research and public health, 19(10), 6308. https://doi.org/10.3390/ijerph19106308

## Lakes further support other ecological elements that also sequester carbon





## Focus on water bodies - nature based solutions for carbon neutrality?

#### REACHING NET-ZERO EMISSION BY 2070

Cabinet approves India's updated Nationally Determinea Contribution to be communicated to UNFCC

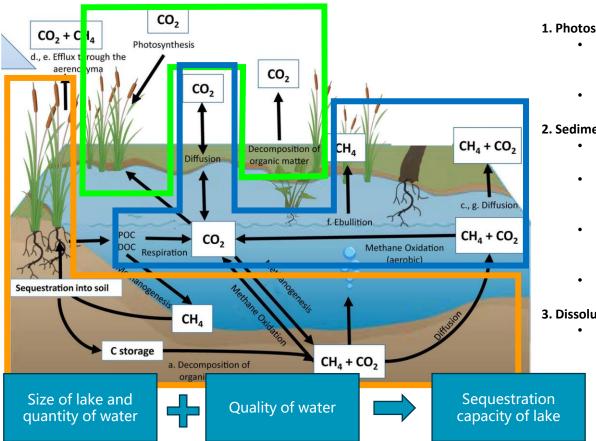
- India now committed to reduce Emissions intensity of its 60P by 45% by 2030
- Updated NDC to enhance India's contributions towards strengthening a global response to climat change







## **Carbon sequestration pathways in lakes**



#### 1. Photosynthesis by aquatic plants and algae

- Aquatic plants and algae absorb CO<sub>2</sub> from the atmosphere and water during the process of photosynthesis.
- They convert CO<sub>2</sub> into organic carbon in the form of biomass (plant material) and store it.

#### 2. Sedimentation of organic matter and dissolved organic carbon

- When plants, algae, and other living organisms die, they settle at the bottom of the lake as sediment.
- Over time, the organic carbon in this material gets buried in the sediment and becomes part of long-term carbon storage in lakes
- Some organic carbon dissolves in the lake water and can be transported to the lake through rivers, streams, and runoff from the surrounding land.
- This dissolved organic carbon can be buried in sediments or taken up by organisms in the lake.

#### 3. Dissolution of atmospheric CO<sub>2</sub> into the water

CO<sub>2</sub> from the atmosphere dissolves into lake water and it forms carbonic acid. This further dissociates into bicarbonate and carbonate and gets stored into lake water. This process is influenced by the pH, temperature, and alkalinity of the lake.





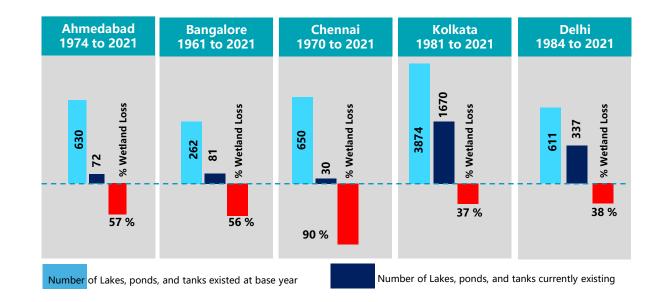


## But lakes are degrading and require urgent attention!

- 70 % of surface water in India is unfit for consumption due to water pollution and contamination issues.
- 50 % of lakes across the
  globe have shrunk from 1992
  2021
- Degradation of lakes also linked to food insecurity and loss of livelihoods



1. "Water Pollution Is Killing Millions of Indians. Here's How Technology and Reliable Data Can Change That." World Economic Forum, October 2019 2. Yao, Fangfang, et al. "Satellites Reveal Widespread Decline in Global Lake Water Storage." Science, vol. 380, no. 6646, 2023, pp. 146–150, May 2023 3. Nayak, P.K. Fisher communities in transition: understanding change from a livelihood perspective in Chilika Lagoon, India. Maritime Studies 16, 13 (2017)



Source: 1. https://www.downtoearth.org.in/governance/as-told-to-parliament-august-5-2024-118-million-rural-households-provided-tap-water-connections-in-last-5-years; 2. https://www.indiatoday.in/india/story/exclusive-how-delhi-lost-its-own-lakes-1559937-2019-07-01; 3. https://www.deccanherald.com/science/disappearing-lakes-2154767; 4. Mondal, Biraj & Kumari, Suchitra & Ghosh, Arijit & Mishra, Prabuddh. (2022). Transformation and risk assessment of the East Kolkata Wetlands (India) using fuzzy MCDM method and geospatial technology. GEOGRAPHY ENVIRONMENT SUSTAINABILITY. 3. 191-203. 10.1016/j.geosus.2022.07.002. 5. https://www.hindustantimes.com/cities/india-lost-one-third-of-its-natural-wetlands-from-1970-to-2014/story-

QmhTehlWAcep0cSHdbzufl.html#:~:text=According%20to%20the%20report%20released,%2C%20and%20Pune%20(37%25). 6. Dean, Walter E. and Gorham, Eville, "Magnitude and Significance of Carbon Burial in Lakes, Reservoirs, and Peatlands" (1998). USGS Staff -- Published Research. 299.

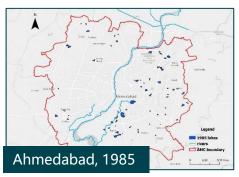


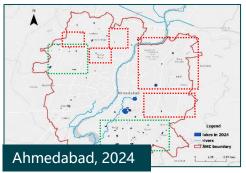




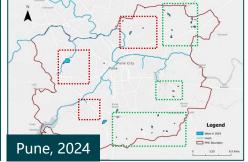
## **Lakes getting Disappeared!**

...but also, visible cases of lake conservation



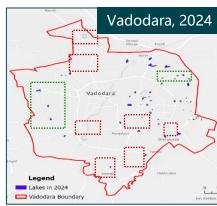


















## **Reasons for degradation?**

## Dried up lake or real estate??

A case of a vanished Lake in Vadodara...

The Lake in the Bhayli area was converted into a residential project.







#### Source: Google earth imagery retrieved on 20 January 2025

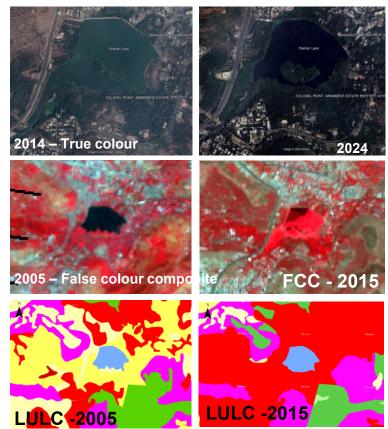




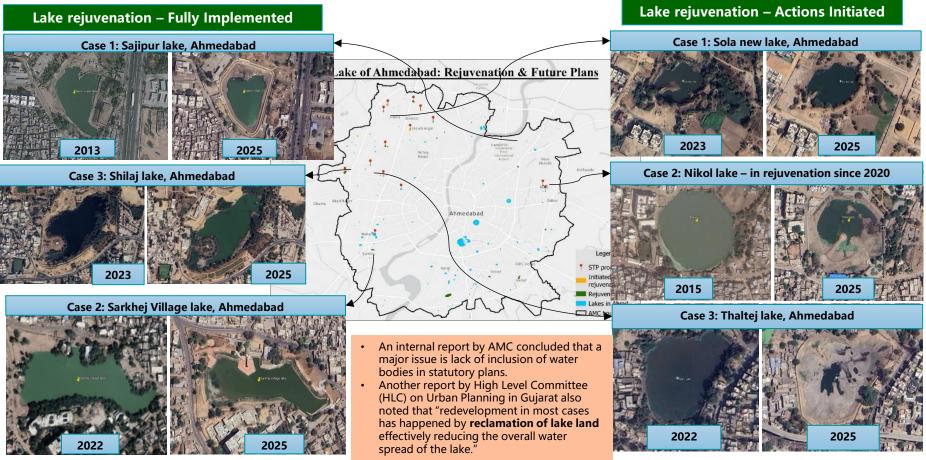


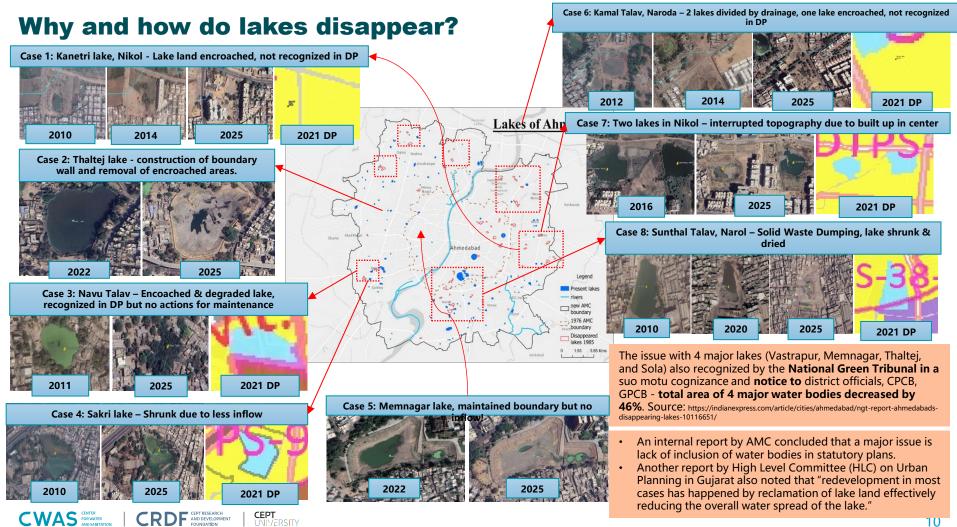
#### Landuse change around the lake affected health-

Case of Pashan Lake in Pune where the surrounding land use has changed from agricultural to built-up leading to eutrophication of lake. The surface area remains the same



## Shrinkage after rejuvenation? Need to focus on urban catchments







## What parameters define "health" of a lake?

Lake health is defined as the overall ecological, physical, and chemical state of a lake, which determines its ability to support biodiversity and sustain its functions over time. A healthy lake maintains a balanced ecosystem, supports diverse aquatic life, and provides clean water for various human and ecological needs.

#### "presence" of water

- Does the lake dry out in certain months?
- Is the dry period increasing?
- Is the average surface area coverage decreasing annually?
- Is the lake perimeter protected?
- Is the lake recognized in local land-use plans?

#### **Use-case fitness**

Water Quality Classes By Central Pollution Control Board, India					
Class	Designated Best Use	Criteria			
A	Drinking Water Source without conventional treatment but after disinfection	- Total Coliform Organism MPN/100ml ≤ 50 - pH: 6.5 - 8.5 - Dissolved Oxygen ≥ 6 mg/l - Biochemical Oxygen Demand (BOD, 5 days, 20°C) ≤ 2 mg/l			
В	Outdoor bathing (Organised)	- Total Coliform Organism MPN/100ml ≤ 500 - pH: 6.5 – 8.5 - Dissolved Oxygen ≥ 5 mg/l - Biochemical Oxygen Demand (BOD, 5 days, $20^{\circ}$ C) ≤ 3 mg/l			
с	Drinking Water Source after conventional treatment and disinfection	- Total Coliform Organism MPN/100ml ≤ 5000 - pH: 6.0 - 9.0 - Dissolved Oxygen ≥ 4 mg/l - Biochemical Oxygen Demand (BOD, 5 days, 20°C) ≤ 3 mg/l			
D	Propagation of Wild life and Fisheries	- pH: 6.5 − 8.5 - Dissolved Oxygen $\ge 4$ mg/l - Free Ammonia (as N) $\le 1.2$ mg/l			
E	Irrigation, Industrial Cooling, Controlled Waste Disposal	- pH: $6.0 - 8.5$ - Electrical Conductivity at $25^{\circ}$ C (µmhos/cm) ≤ $2250$ - Sodium Absorption Ratio ≤ $26$ - Boron ≤ $2$ mg/l			
<b>∠</b> F	Not meeting A, B, C,				

## Nutrient load, biomass and water quality

			-17	
	Trophic State Index	Chlorop hyll CHLA (µg/L)	Total Phosph orus TP (mgP/L)	Total Nitroge n TN (mgN/L )
	0	0.3	0.003	0.06
Oligotrophic	10	0.6	0.005	0.10
ligot	20	1.3	0.010	0.16
	30	2.5	0.020	0.27
ohic	40	5.0	0.040	0.40
Mesotrophic	50	10.0	0.094	0.70
Mes	60	20.0	0.20	1.2
	70	40.0	0.40	2.0
phic	80	80.0	0.82	3.4
Eutrophic	90	160	0.34	5.6
	100	320	0.58	9.0

#### Water quality index

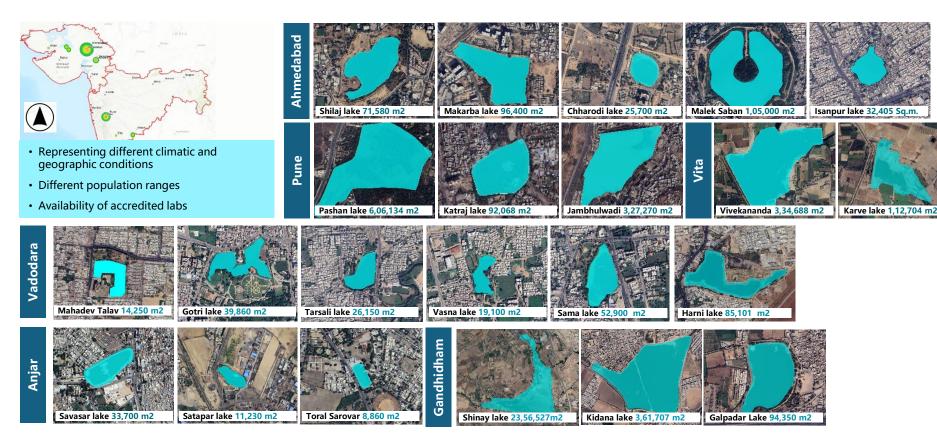
WQI value	Water Quality	Remarks
63-100	Good to Excellent	Non- Polluted
50-63	Medium to Good	Non- Polluted
38-50	Bad	Polluted
< 38	Bad to very Bad	Heavily Polluted





D & F criteria

## 22 lakes selected across 6 cities for studying lake health



Note: Area of lakes has been estimated using satellite imagery on Google Earth for the period of February to April 2025. These are indicative estimates and not based on actual ground measurements.





## Lab-based water quality tests for selected lakes

To understand lake health, water sampling and testing were carried out across 22 lakes in 6 cities, covering 21 water quality parameters. The sampling was conducted from December to July and has been planned systematically.



- From each lakes, two distinct points (opposite sides of the lakes) have been selected, from where water samples have been collected.
- For some of the larger lakes, **two to three individual samples were collected**, and a composite sample was prepared for each lake by mixing equal volumes of water from Point 1 and Point 2.

#### Challenges -

- Frequent cloud cover during Monsoon (July to September) made scheduling of water testing difficult.
- Composite sampling points did not provide consistent results; hence, as per the recommendation by experts, composite sampling was discontinued, and a new distinct sampling location, P3 was introduced for direct collection to improve reliability.
- Due to algae growth and solid waste littering around selected sampling points, collection was bit difficult. However, wherever required, we changed the sampling points for those specific locations.



#### Water quality testing dashboards to understand trends and house lab data

#### By Water Quality Index,

The lake health can be analyzed by Water Quality Index values which is based on water quality parameters like calculation of pH, BOD, %DO Saturation, Fecal coliform and DO score.

WQI value	Water Quality	Remarks
63-100	Good to Excellent	Non-Polluted
50-63	Medium to Good	Non-Polluted
38-50	Bad	Polluted
< 38	Bad to very Bad	Heavily Polluted

City	Lake Name	Jan	Feb	Mar	Apr- May	Jun	Jul
	Makarba						
paq	Chharodi						
Ahmedabad	Isanpur lake						
Ā	Malek Saban lake						
	Shilaj						
	Pashan lake						
Pune	Jambhulwadi						
_	Katraj						
	Sama						
	Gotri lake						
dara	Vasna Village lake						
Vadodara	Mahadev lake						
	Tarsalilake						
	Harni lake						
	Sawasar Lake						
Anjar	Toral Lake						
`	Satapar Lake						
E	Vivekanand lake						
Vita	Karve lake						
man	Galpadar lake						
Gandhidham	Shinay lake						
Gane	Kidana lake						

#### By Central Pollution Control Board, India

Depending on the water quality parameter ranges, their dedicated usage is allotted, and the lake health is monitored. CPCB has categorized 5 classes of lakes mentioned below.

CPCB class	Designated Best-Use
A	Drinking Water Source Without Conventional Treatment after Disinfection
В	Outdoor Bathing
С	Drinking Water Source after Conventional Treatment and disinfection
D	Propagation of Wildlife and Fisheries
E or Below-E	Irrigation, Industrial Cooling, Controlled Waste Disposal

City	Lake Name	Jan	Feb	Mar	Apr- May	Jun	Jul
	Makarba						
paq	Chharodi						
Ahmedabad	Isanpur lake						
Ā	Malek Saban lake						
	Shilaj						
	Pashan lake						
Pune	Jambhulwadi						
-	Katraj						
	Sama						
	Gotri lake						
Vadodara	Vasna Village lake						
Vado	Mahadev lake						
	Tarsali lake						
	Harni lake						
	Sawasar Lake						
Anjar	Toral Lake						
`	Satapar Lake						
.5	Vivekanand lake						
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• An interactive dashboard developed for lake-wise and city-wise analysis. It presents the Water Quality Index (WQI) and CPCB classification based on key parameters such as DO, pH, BOD, COD, Total Coliform, and Fecal Coliform.







## Application of remote sensing techniques for lakes

#### **Water Quantity**

#### NDWI, or Normalized Difference Water Index,

is a remote sensing index that uses spectral bands from satellite imagery to identify and quantify the presence and amount of liquid water in water bodies. Water strongly absorbs visible light (Green band) and reflects less in the NIR (near infrared) band, resulting in high values for water bodies.

Formula: (Green - NIR) / (Green + NIR)

MNDWI, or the Modified Normalized Difference Water Index improves upon NDWI by more effectively suppressing built-up land and other noise, leading to more accurate water extraction.

### **Floating Vegetation**

#### NDVI, or Normalized Difference Vegetation Index,

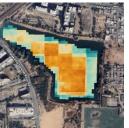
is a remote sensing technique that measures the health and density of vegetation. Healthy green vegetation absorbs strongly in the red light spectrum (used for photosynthesis) and reflects much more strongly in the near-infrared spectrum.

Formula:(NIR - Red) / (NIR + Red)

#### **Water Quality**

No.	Parameters	Research paper title	Source		
1	рН	Satellite Imagery for Monitoring and Predicting Water Quality in Kutch Region	https://www.omdena.com/blog/satellite- imagery-for-water-quality-monitoring - April 2022		
2	Dissolved Oxygen (DO)	Satellite Imagery for Monitoring and Predicting Water Quality in Kutch Region	https://www.omdena.com/blog/satellite- imagery-for-water-quality-monitoring - April 2022		
3	Chlorophyll-A	Normalized difference chlorophyll index: A novel model for remote estimation of chlorophyll-a concentration in turbid productive waters	https://doi.org/10.1016/j.rse.2011.10.016 - Sachidananda Mishra, Deepak R. Mishra, November 2011		
4	Total Suspended Solids (TSS)	Calibration and validation of a generic multisensor algorithm for mapping of total suspended matter in turbid waters	https://doi.org/10.1016/j.rse.2009.11.022 - B. Nechad, K.G. Ruddick, Y. Park, January 2010		
5	Dissolved Organic Carbon (DOC)	Estimation of water quality in a reservoir from	https://doi.org/10.5194/isprs-annals-V-3-2020- 401-2020		
6	Colored Dissolved Organic Matter (CDOM)	Sentinel-2 MSI and Landsat-8 OLI sensors	Fernanda M. C. Pizani, Philippe Maillard, Adrielly F. F. Ferreira, Camila C. de Amorim, August 2020		
7	Biochemical Oxygen Demand (BOD)	Water quality change in reservoirs of Shenzhen, China: detection using LANDSAT/TM data	https://doi.org/10.1016/j.scitotenv.2004.02.02 Yunpeng Wang, May 2004		
8	Turbidity	Satellite remote sensing of water turbidity in Alqueva reservoir and implications on lake modelling	https://doi.org/10.5194/hess-16-1623-2012 M. Potes, M. J. Costa, R. Salgado, June 2012		
9	Alkalinity	Surface pCO2 variability in two contrasting basins of North Indian Ocean using satellite data	https://doi.org/10.1016/j.dsr.2021.103665		
10	Surface temperature	Algorithm for Automated Mapping of Land Surface Temperature Using LANDSAT 8 Satellite Data	https://doi.org/10.1155/2016/1480307 Ugur Avdan, February 2016		
11	Salinity	Mapping water salinity using Landsat-8 OLI satellite images (Case study: Karun basin located in Iran)	https://doi.org/10.1016/j.asr.2019.12.007 Mohsen Ansari, Mehdi Akhoondzadeh, December 2019		





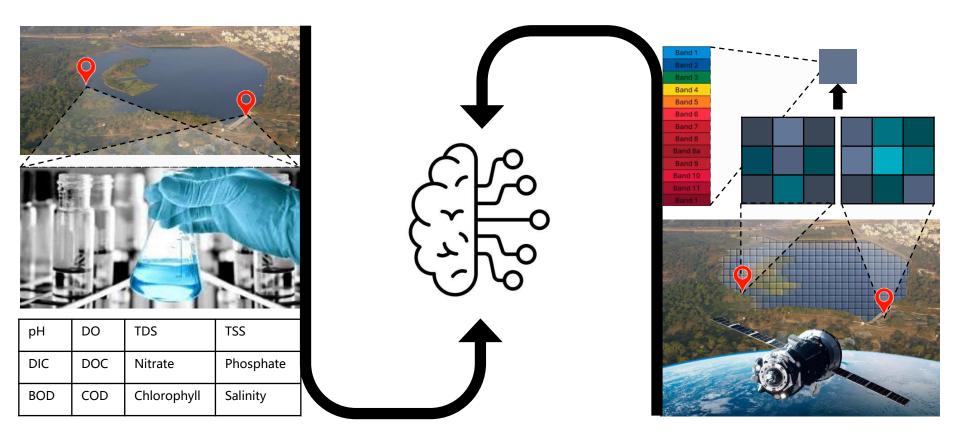








## Machine learning - Equating known water quality values with pixel colors in satellite images to build relationships

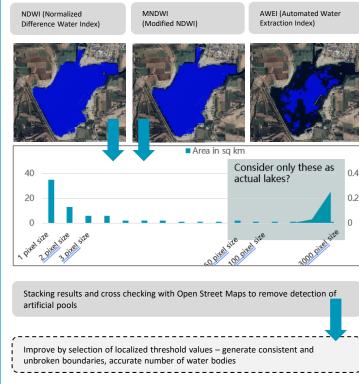




## Testing different workflows to achieve accuracy

#### **Estimating water quality** 1 month lab data Using formulas from existing research 3 months lab data ML for calibrating only the coefficients on existing formulas 40% Training fit ML training raw band values against lab tested values to develop Average band value of all pixels in lake area against average of known fuzzy logic relationships lab value of parameters from sampling location 1, 2 and composite Ridge Regression model Random forest model XGBoost model 4 months lab data 35% Training Accuracy 80% Training Accuracy 51% Training Accuracy Combination of Random forest + XGBoost model 80% Training fit Data cleaning to improve training accuracy. Removing ND / NA / BDL Training Accuracy Regression model with RF with XGB + 50m Lake Area Buffer data 87% Training fit Limiting "unknown value" pixels to 50 m around the sample point instead of average full lake surface. This accounts for variations inside the lake and improvement in accuracy. Dropped composite samples for lab testing and increased point samples at each lake 6 months lab data Ensemble model / "Best of" model / Optimized ensemble Stacking results of different models to give balances results / selecting best fitted result of each model 71% Training fit 7 months lab data Multi output ensemble

#### **Detecting water bodies**



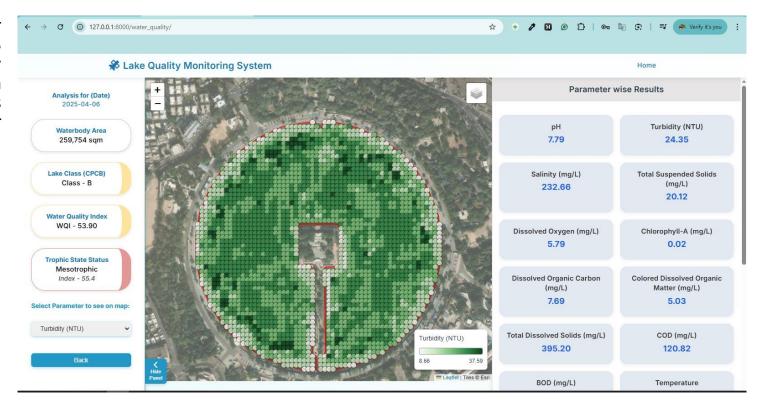






## Developing a user friendly platform using Satellite Imagery

Tool showing water quality as per CPCB class, Water Quality Index (WQI) and area of the waterbodies identified as per satellite imagery.







## **Analysis modules user development**

Spatio-temporal analysis – "detect" lakes



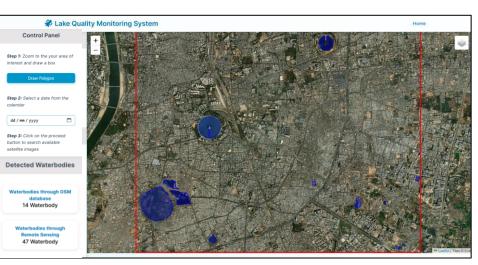
Water quality estimation



Sequestration potential calculation



Temporal prediction











## **Analysis modules user development**

Spatio-temporal analysis – "detect" lakes



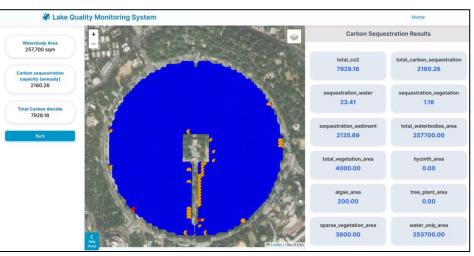
Water quality estimation



Sequestration potential calculation



Temporal prediction





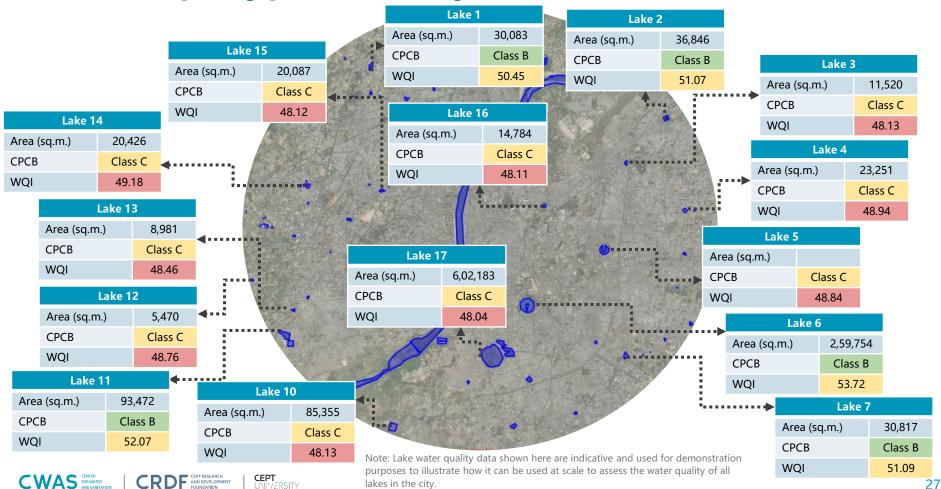




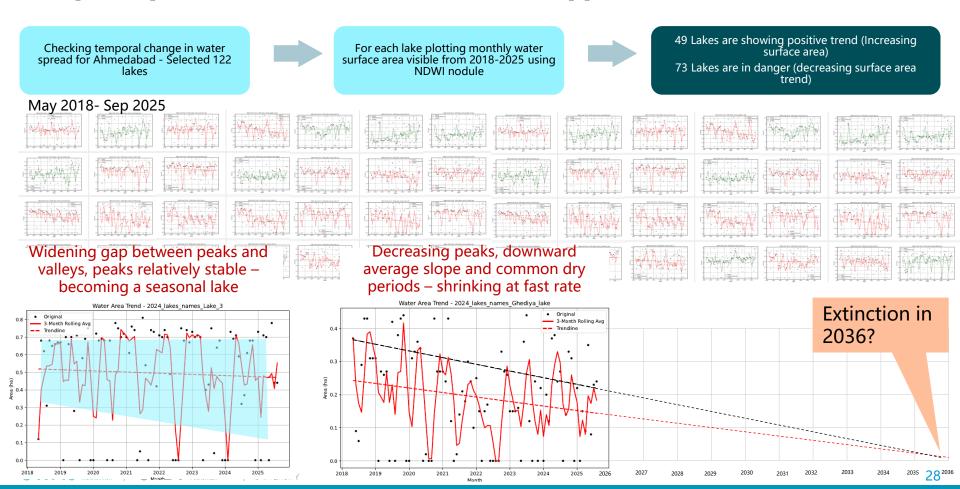




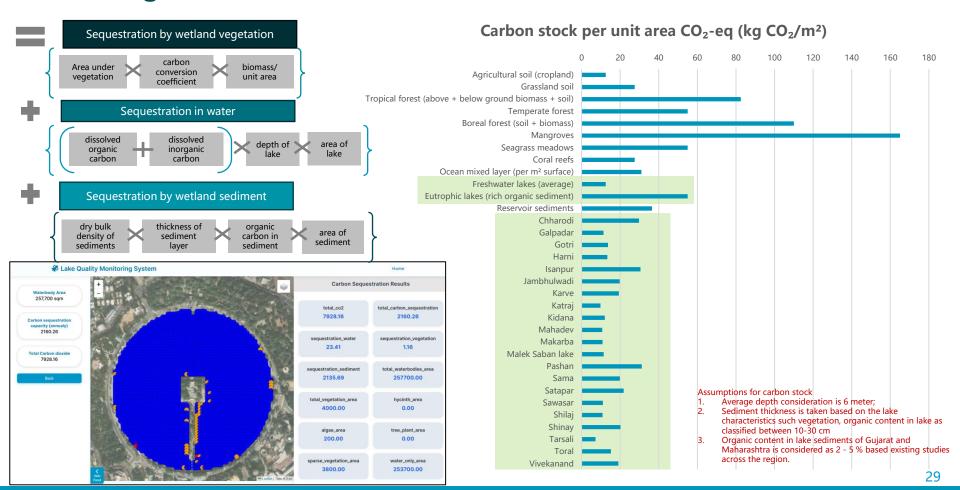
## Lake water quality profile of a city



## Temporal prediction - Will more lakes disappear in the future?



## **Estimating carbon stock – Initial estimates for lakes**





## Moving towards actionable insights that enable conservation measures

Select your area of interest



Remote sensing modules run in the background



Actionable insights translating results



Prompting field visit, priorities in improvement planning and action by city

Dry lake this vear - Check for stormwater blockage



Measurable parameter

Area shrinkage and seasonal drying High turbidity

High NDVI inside lakebed area

Low DO, High phosphorus/ nitrogen

High BOD, COD, Coliforms

High potassium

Alkaline pH

Acidic pH

Potential cause

Surface area of this lake is

vear - Check for

encroachments

High Nitrogen detected - Check sewage outflows

Area Encroachment

Catchment breakdown

Siltation

Algal bloom

Hyacinth invasion

Sewage inflow

Solid waste dumping

Industrial Effluents

Agricultural runoff

Potential improvement action

Boundary and embankment protection, encroachment removal

Catchment rejuvenation, stormwater management, de-siltation

Stormwater inflow debris traps

Buffer vegetation revival

Invasive specie removal

Wastewater diversion or treatment

Aeration mechanisms

Solid waste management







## Further climate analysis possible for researchers

UNIVERSITY

#### Lakes related to flood vulnerability? **Urban temperatures linked to disappeared lakes?** Land Surface Temp (°C) Rainy season 2013 Winter 2013 Summer 2013 32.5 Disappeared Lakes Localities without lake buffers face flooding in monsoons Average surface temperature change over 15 years is about + 1.15°C at lake Rainy season 2023 Winter 2023 Summer 2023 locations and nearby area. In summer, at site of "vanished" lakes, average variation of +3.3°C Legend waterlogging spot Disappeared lake Disappeared lakes City Boundary present lakes 1.63 3.25 Kms Chandoliya and surrounding lakes, Ahmedabad Bibi Talav, Ahmedabad

Summer 2009 - 29.2°C

analysis-studio-ge4004-monsoon-2022/study-of-flash-floods-a-case-study-of-ahmadabad-monsoon-2022-pge22459

Summer 2024 - 39.1°C

Summer 2009 - 35.7°C

Summer 2024 - 37.2°C

## Knowledge partnerships and stakeholder engagement

#### **Urban Decision makers**

- Training of more than 500 municipal officials from over 400 cities of Maharashtra
- Training focussed on lake governance and showcasing the tool to understand their interest and get feedback
- Participants includes Municipal Engineers, technical supervisor and sanitary inspectors from the water works and sanitation departments of the cities of Maharashtra.
- Ahmedabad planning large scale water quality testing interested in satellite image applications

#### **Civil society organizations**

- Engaged with stakeholders like local citizens and municipal officials at a seminar organised by SOCLEEN NGO in Vadodara
- The participants expressed their interest in using such technology that simplifies complexity for lake management and supporting their lake conservation efforts.

#### **Sector experts**

 Abstract selected and workshop planned at IWA conference in December















## **Enhanced capacity of the organisation**

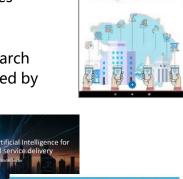
## Enhancement of team capacity

- ✓ Understanding ML/AI industry methods, language
- ✓ Development of user-front end
- Understanding lake science water quality parameters and trends
- ✓ Opportunity for flexible research project – different from regular grant/CSR projects

### CWAS identity as a "tech enabler"

Invitation by Gujarat state (GUDM) to provide feedback on their e-services portal

Student Research projects guided by CWAS team



**Enabling Citizen Services** 



Presentation to CEPT University students on "Emerging tech and urban services"





Presentation at PDEU training program on "Future of Smart Cities: From Challenges to Hands-on Solutions through AI, and Technology"







## **Way forward**

Tool improvement



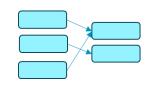
Continuing water quality testing to capture seasonal variability of monsoon and early winter.



Strengthening the training as well as estimation accuracy of machine learning models.



Developing the module of prediction of water quality parameters.



Developing module for "actionable-insights"

Lending credibility and

audiences - Integrating

reaching the right

Knowledge partnership and Stakeholder engagement Roundtables – Consultation with sector experts to validate methodologies



Feedback from users - city governments, citizen groups and more training to incorporate in decision making process



Scaling up usage - Incorporating experience and introducing the tool in ongoing capacity building efforts under SBM, AMRUT and Majhi Vasundhara









Digital Water HUB at CWAS

Leveraging CWAS knowledge of data systems and tech in urban spaces to enhance services







## Thank you

CWAS FOR WATER AND SANITATION



CEPT UNIVERSITY

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cwas.org.in



#### About us

The Center for Water and Sanitation (CWAS) is a part of CEPT Research and Development Foundation (CRDF) at CEPT University. CWAS undertakes action-research, implementation support, capacity building and advocacy in the field of urban water and sanitation. Acting as a thought catalyst and facilitator, CWAS works closely with all levels of governments - national, state and local to support them in delivering water and sanitation services in an efficient, effective and equitable manner.



cwas.org.in



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