

TADA (Tools for Automated Data Analysis)

Cristina Mullin, PhD

Water Data Integration Branch

EPA Office of Water

TADA Team

Cristina Mullin, Team Lead Shelly Thawley Elise Hinman, PhD (ORISE Fellow) Trip Hook (Skills Marketplace, EPA OLEM) Katie Healy (Skills Marketplace, EPA ARD) TADA Working Group (~100 volunteers)

Agenda

- Presentation (~25 min)
- Hands-on/Q&A (~65 min)



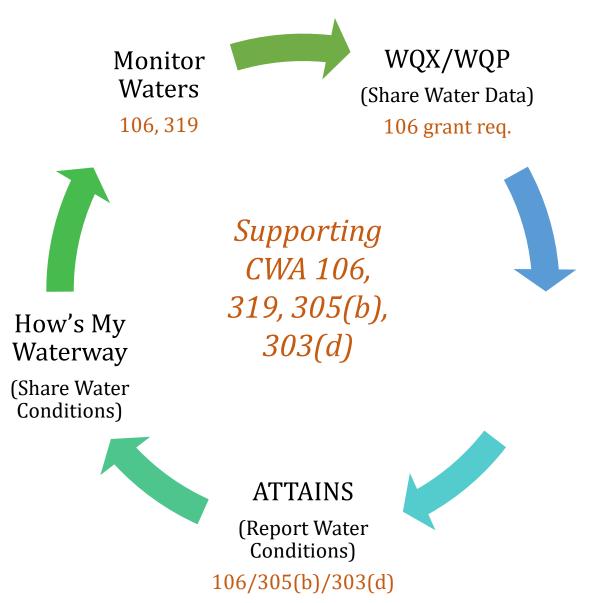


EPA Water Data Integration Branch (WDIB) Products Supporting the Clean Water Act



Internet of Water Principles (Data Standards and Interoperability)

- Water Quality Data (WQX/WQP)
- Hydrography (NHDPlus)
- Assessment Decisions (ATTAINS)





Accessible

Broader Impacts

Centralized tools (like TADA and HMW) have potential to greatly reduce total government costs

- State and tribal agencies
- EPA regions
- EPA HQ
- USGS, other federal agencies
- Applicable even beyond water

Improving data equity

- TADA makes the WQX QAQC service available on the WQP side
- Organizations can use TADA to help find and address data quality issues and then fix them in WQX/WQP

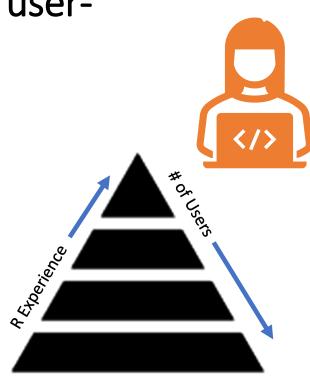
Well received by enthusiastic, engaged user community (open source/collaborative effort from start = more use product)

More efficient assessments may lead to more time for other things, or more waters being assessed! (Or anything else of importance to entity!)

Developing TADA as an R package and series of userfriendly web apps (R Shiny)

- Open-source
- Efficient, reproducible workflows
- Community driven requirements
 - Accessible
 - Standardized but flexible
 - Highly customizable
- Designed to work with Water Quality Portal data
 - Companion to USGS's dataRetrieval package

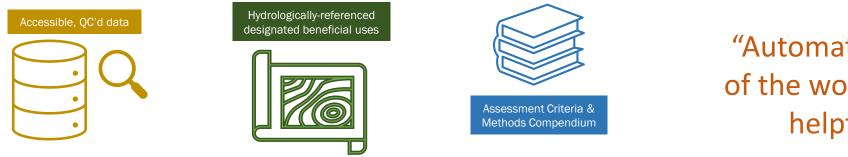




Tools vary in... Scope Application Stage of development

"Serve as a hub for an open-source water quality community"

Working Group Mission Statement: To share and develop R code for evaluating and visualizing WQP data more efficiently though collaboration and open-source programming. This includes working together to find commonalities in assessment processes across the nation, creating flexible tools that can be easily customized to work within existing workflows, supporting each other in learning R, and ensuring products will be accessible to organizations most in need.



"Automating 80% of the workload is helpful"

Inventory of Open-Source R Tools for Water Analyses

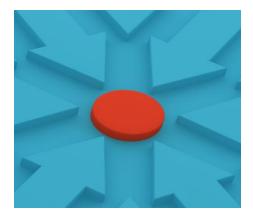
- Over 50 resources to learn from, and build on
- Working Group helps share knowledge, examples, and set priorities
- Faster progress through collaboration and iteration (learning from each other)





Involving end users in the development process

Agile & Community Development via GitHub



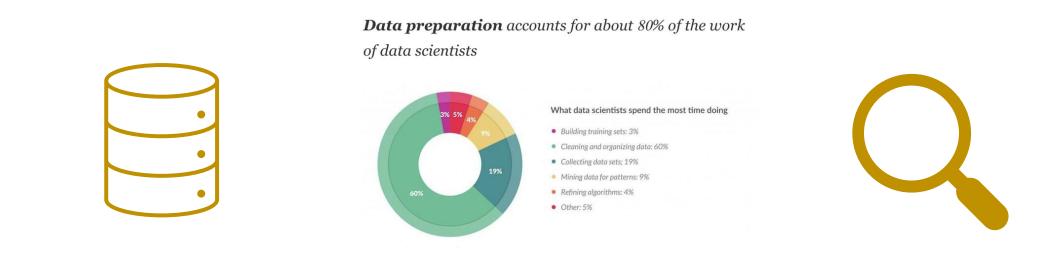
- GitHub: setting stage for community ٠ participation (two public repositories)
 - Community can be anyone
 - EPA/ORISE initial development
 - Contract to support subject ٠ experts with varying R skills

TADA 0.0.1 Reference Articles -	Search for	
Contributing	On this page	
	Contribute to TADA!	
2023-06-07	TADA Working Group Mission	
Source: <u>vignettes/CONTRIBUTING.Rmd</u>	Package Development	
Contribute to TADA!	What is GitHub?	
We encourage you to read this project's CONTRIBUTING policy (you are here), its LICENSE, and its	Required Installations	
<u>README</u> .	lssues	
We're so glad you're thinking about contributing to an EPA open source project! If you're unsure	Branches and Pull Requests	
about anything, just ask — or submit your issue or pull request anyway. The worst that can happen is we'll politely ask you to change something. We appreciate all friendly contributions. No matter who you are, if you spot an error, omission, or bug, you're welcome to open an issue in	Additional References	
	Open-Source Code Policy	
	License	
this repo!	Disclaimer	
TADA Working Group Mission	Contact	
To share and develop R code for evaluating and visualizing Water Quality Portal (WQP) data more efficiently though collaboration and open-source programming. This includes working together to find commonalities in assessment processes across the nation, creating flexible tools that can be easily customized to work within existing workflows, supporting each other in learning R, and	Contact	
ensuring products will be accessible to organizations most in need.		

Contributors 11



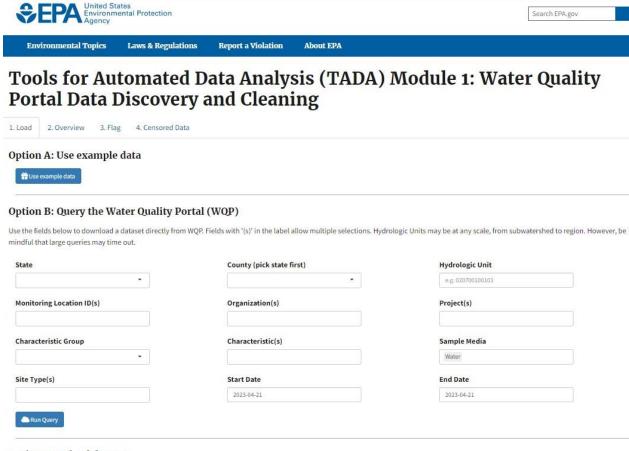
https://usepa.github.io/TADA/articles/CONTRIBUTING.html



Module 1: Data Discovery and Wrangling

In Progress

Finding readily available data



Option C: Upload dataset

Select a file from your computer. This upload feature currently only accepts data in .xls and .xlsx formats. The file can be a **fresh** TADA dataset or a **working** TADA dataset that you are returning to the app to iterate on. Data must also be formatted in the EPA Water Quality eXchange (WQX) schema to leverage this tool. You may reach out to the WQX helpdesk at WQX@epa.gov for assistance preparing and submitting your data to the WQP through EPA's WQX.

Water Quality Portal (WQP)



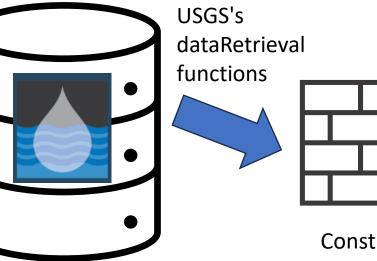








Browse... No file selected



Constructing a unified dataset containing key metadata

Are the data of sufficient quality for my analysis?

What harmonization and formatting steps are needed to use the data?

Improving data equity

Harmonize units/text

Remove duplicates

Flag invalio metadata

Correct data types

Handle censored

User denne metadata filters

Translate synonyms

Many spend 80% of their total analysis time on these steps (wrangling/cleaning – harmonizing, filtering, QAQC'ing, etc.)

Summary of User Decisions

e, or blank
r Well or Waste Irrigation or
value is e, duplicate, or
value is
e, or blank, r Well or Waste Irrigation or
Ir v v

Removal Reasons

Filter: Exclude ActivityTypeCode is Sample-Composite Without Parents - 18 results

Filter: Exclude HydrologicCondition is Rising stage or Falling stage - 18 results

Filter: Exclude MonitoringLocationTypeName is Wetland Undifferentiated or Well or Waste Sewer or Storm Sewer or Land or Facility Other or Canal Transport or Canal Irrigation or Canal Drainage - 1028 results

Filter: Exclude TADA.CharacteristicName is AMMONIA - 72 results

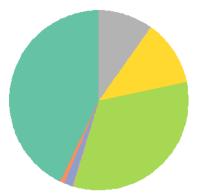
Flag: Conflict between detection condition text and detection limit type or detection limit type is not in WQX domain tables (likely USGS/NWIS-specific) - 12 results

Flag: Measurement activity type code indicates it is a QC replicate, duplicate, or blank - 1729 results

ITΑ

Flag: Result value is not numeric or result value is NA and no detection limit value is provided - 17 results

Data Visualization



Мо	nitoringLocationTypeName
	BEACH Program Site-Ocean
	Estuary
	Lake
	Lake, Reservoir, Impoundment
	Ocean
	River/Stream
	Spring
	Stream

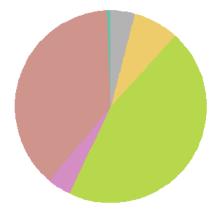
TADA.CharacteristicName

ENTEROCOCCUS ESCHERICHIA COLI FECAL COLIFORM

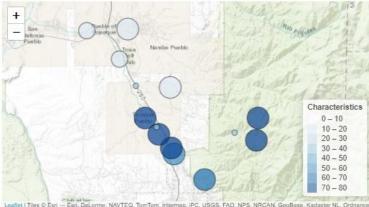
AMMONIA

NITRATE

NITROGEN



Your dataset contains 131,106 unique results from 221 monitoring location(s) and 6 unique organization(s).



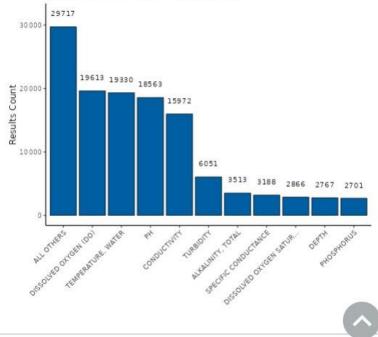
Leadet | Tiles © Esri — Esri, DeLorme, NAVTEO, TomTom, Internap, IPC, USGS, FAO, NPS, NRCAN, GeoBase, Kadaster NL, Ordnance Survey, Esri Japan, METI, Esri China (Hong Kong), and the GIS User Community

Results collected per week over date range queried

Show 10 V entries

OrganizationFormalName	Result_Count	
Chickasaw Nation Environmental Service	4580	
Fond du Lac Band of Chippewa (MN)	20176	
Pueblo Of Tesuque	6795	
Pueblo of Pojoaque	1181	
Red Lake DNR	81734	
Sac and Fox Nation (Tribal)	9815	
howing 1 to 6 of 6 entries	Previous 1 Next	

Number of Results per Characteristic



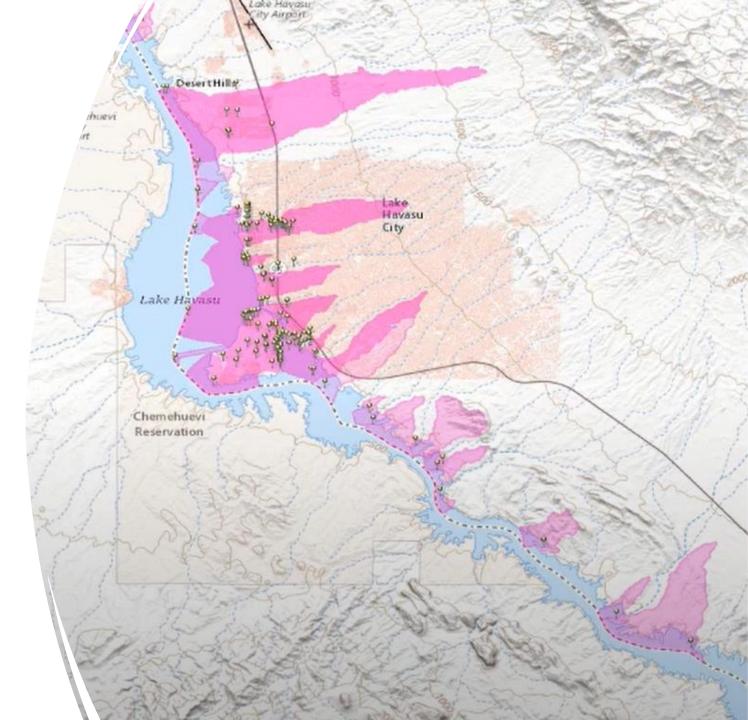


Module 2: Spatial Aggregation & Use Assignments

Vision

Associating Water Quality Criteria, Assessment Units & Uses with WQP Stations

• Integrate ATTAINS





Module 3: Assessment Criteria and Methodologies

Vision

Identified Requirements/Priorities

Scope

- Focusing on quantitative (numeric) water data in the WQP to start
- Focusing on frequently assessed parameters
- Common assessment processed and methodologies

Arsenic	Nickel	
Boron	Nitrate	
Chlorophyll a	Total Nitrogen, mixed forms	
Chromium	pH	
Chromium(VI)	Total Phosphorus, mixed forms	
Cadmium	Depth, Secchi disk depth	
Copper	Selenium	
Dissolved oxygen (DO)	Silver	
Dissolved oxygen saturation	Temperature, water	
Escherichia coli	Total suspended solids	
Lead	Chromium(III)	
Mercury	Zinc	

Common Methodologies

- Spatial aggregation assessment unit and station level assessments
- Characteristic specific assessment start and end dates
- Magnitude, duration (temporal aggregation)
- Criteria context upper or lower limit, range
- n-day mean, n-day mean maximum or mean minimum, nhour mean, geometric mean, arithmetic mean, n-day rolling average
- Frequency criteria (e.g., 10% rule, 1-in-3 years rule applied using binomial test or percentile)
- Custom input equations needed to calculate criteria (e.g., for ammonia and certain metals)
- Incorporating depth
- Acute vs chronic
- Seasonality

Integrate Criteria Search Tool

https://www.epa.gov /wqs-tech/statespecific-waterquality-standardseffective-underclean-water-act-cwa

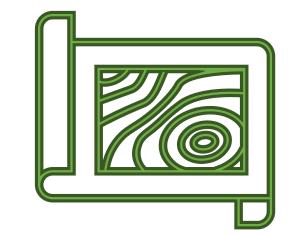
Under development

- Does not include narrative standards, duration and frequency, or methodologies
- This compilation is continuously updated as EPA approves new or revised WQS

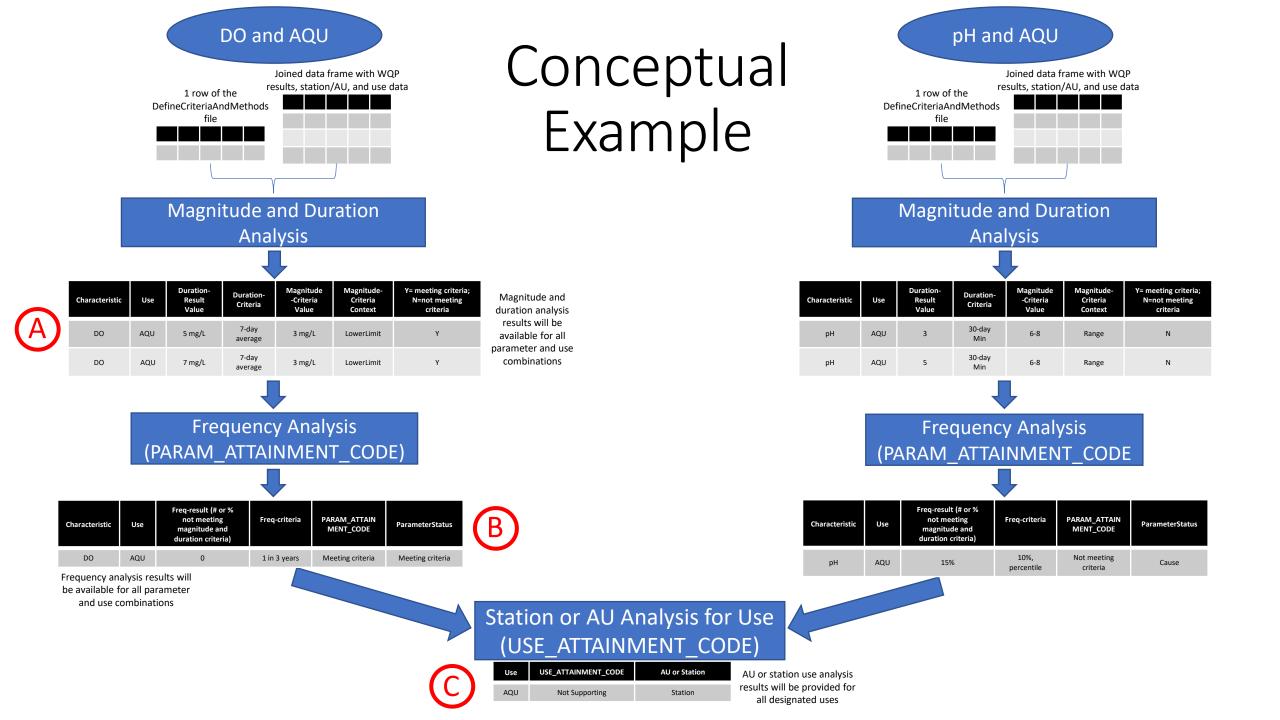
Users can:

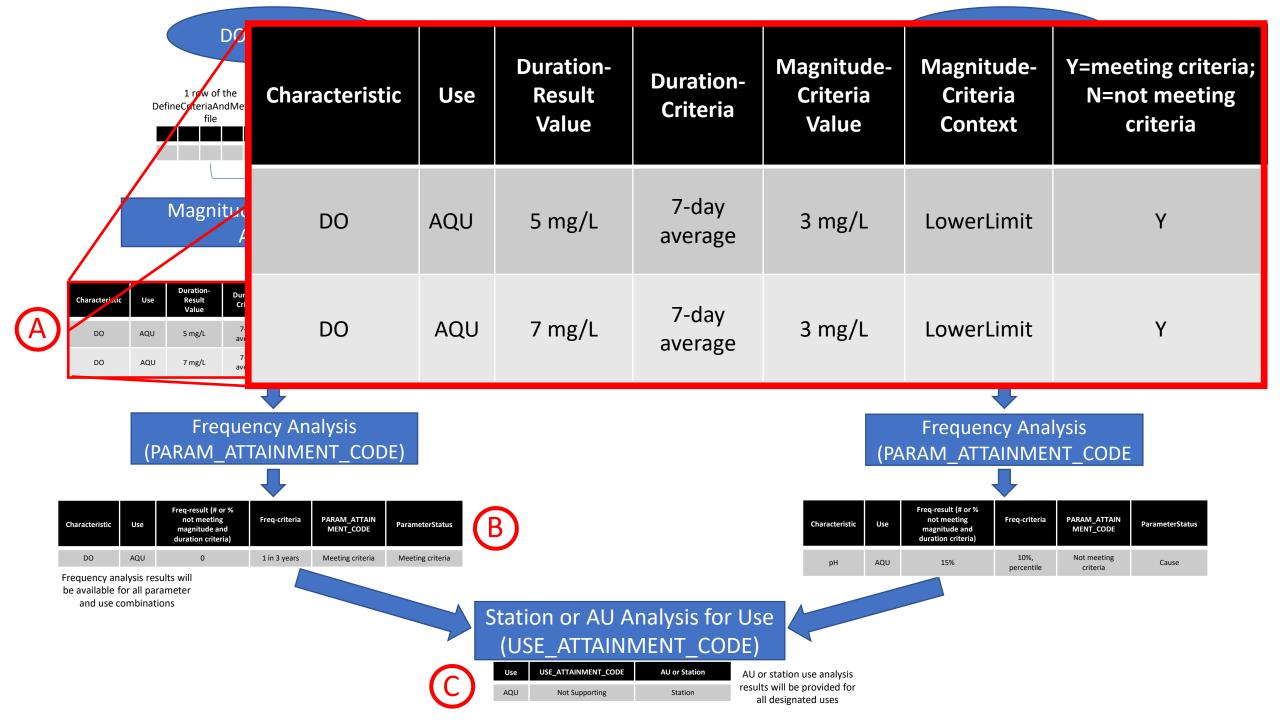
- Query by parameter, application or criteria magnitude value
 - Direct application = designated uses
 - Indirect application = specific waterbody, all other waters, or a class of waters of the parameter
- Query within a state or across all states
- Find National Recommended Water Quality Criteria (304A)
- More detailed webpages for each State, Territory, or Authorized Tribe
- Download as a "flat" spreadsheet file to support custom searches and analyses
- Find source document linking the criterion to EPA-approved state regulation

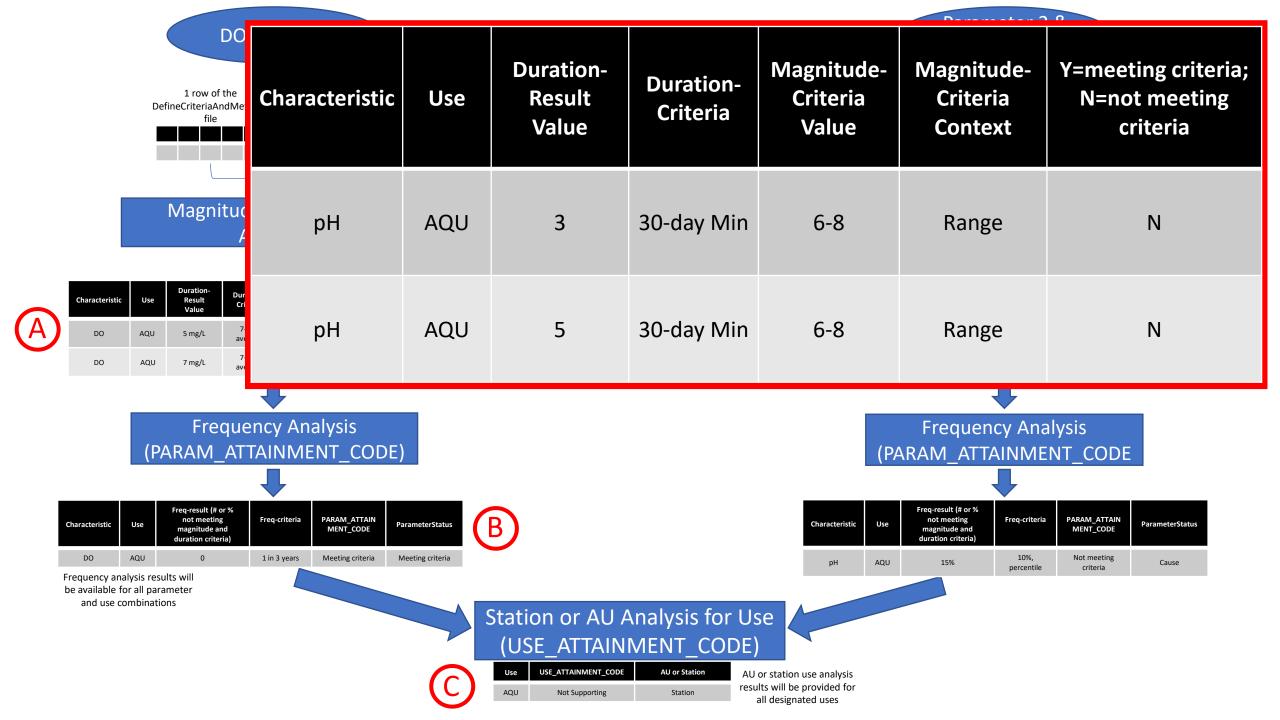
Module 4: Bringing it all together

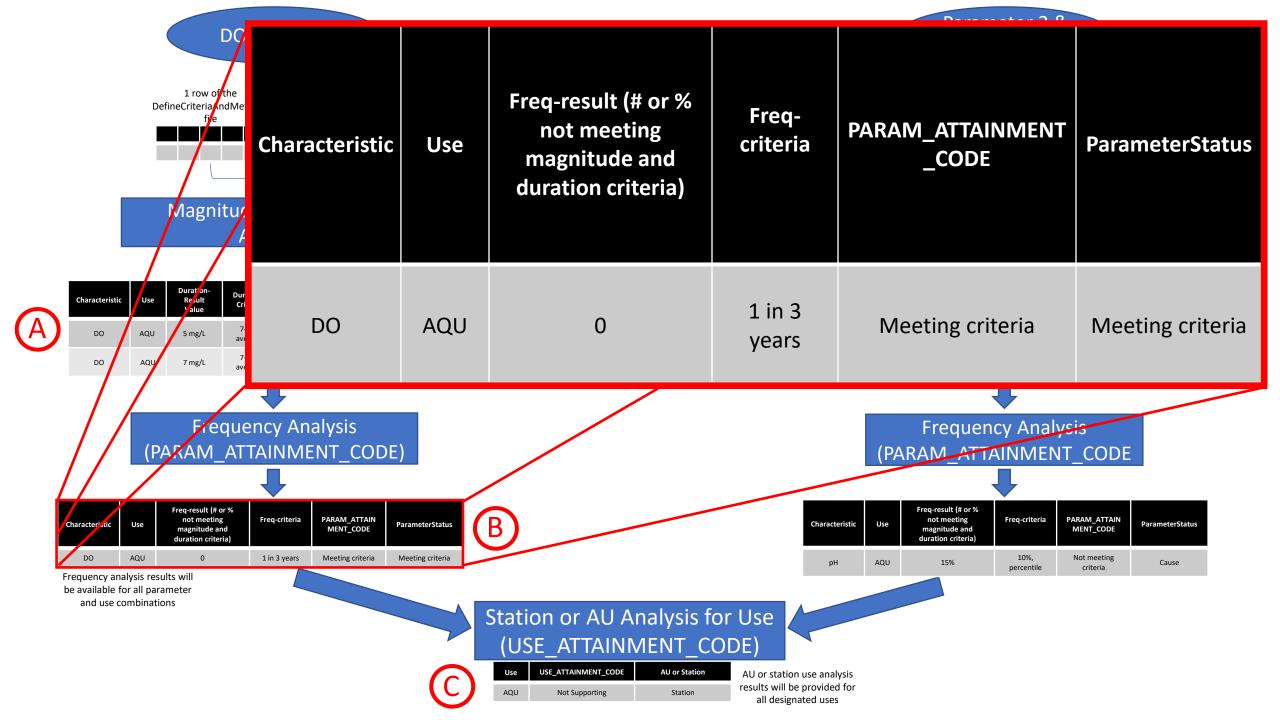


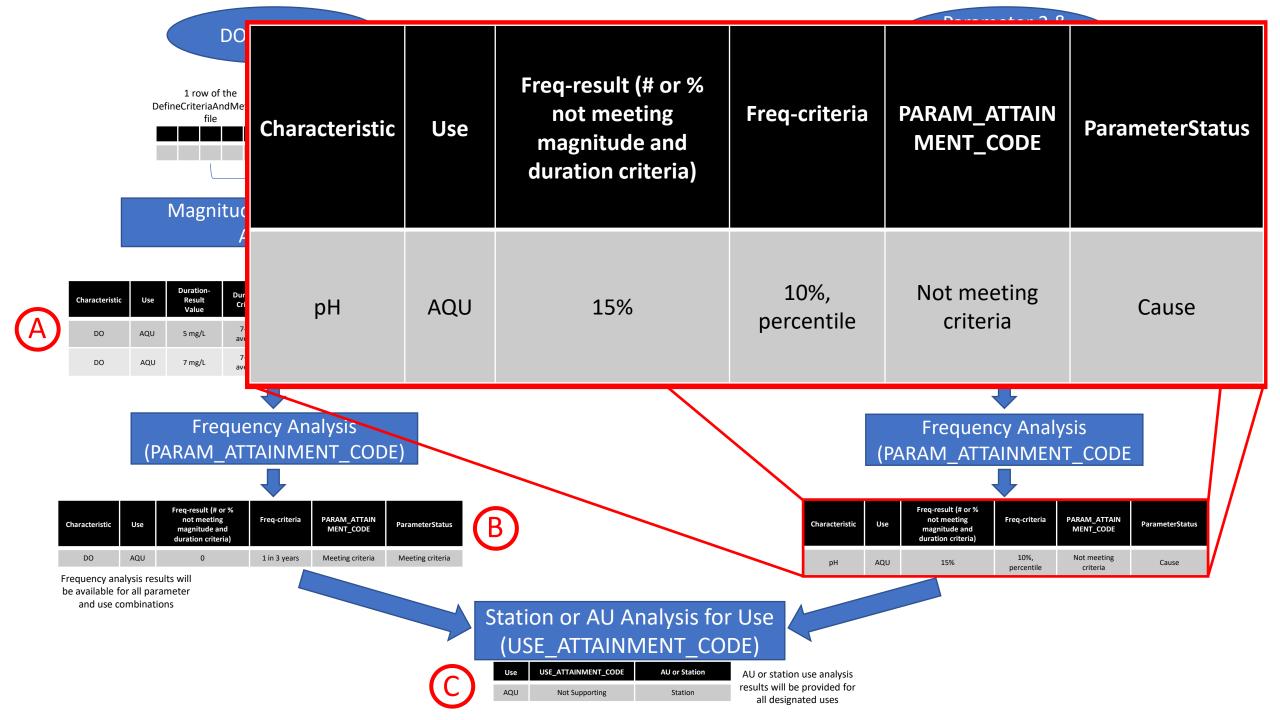
Vision

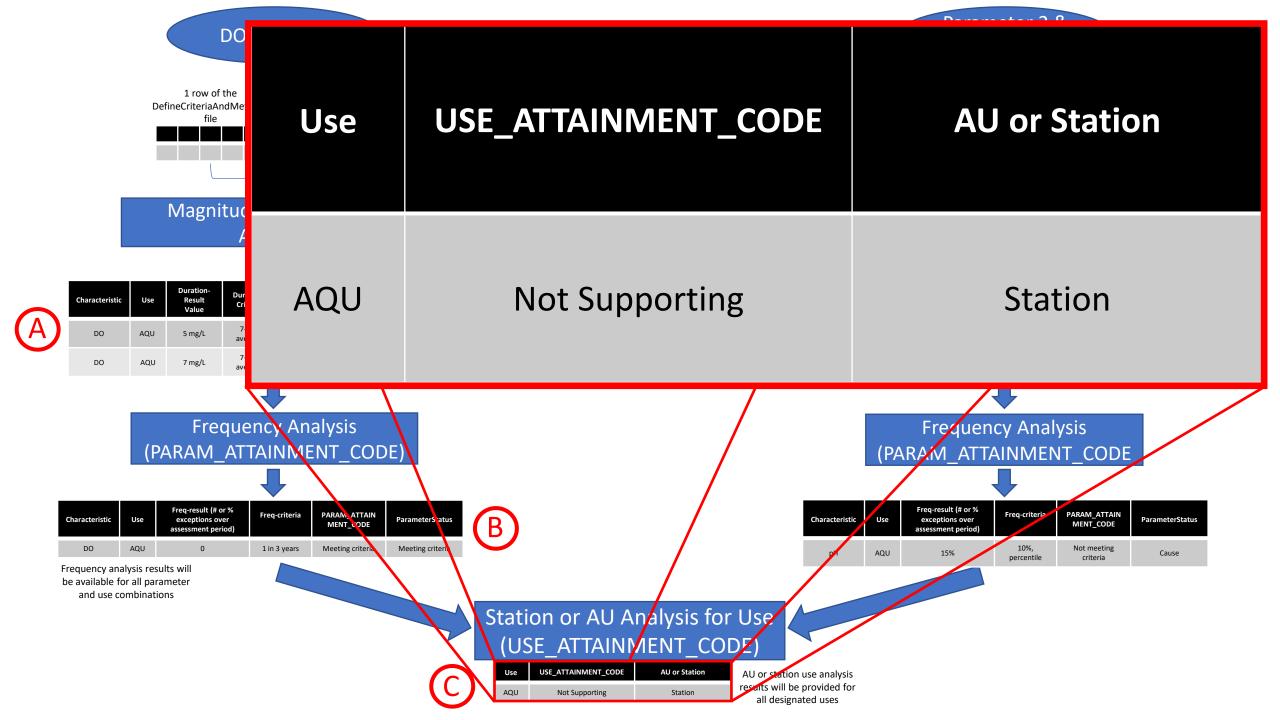






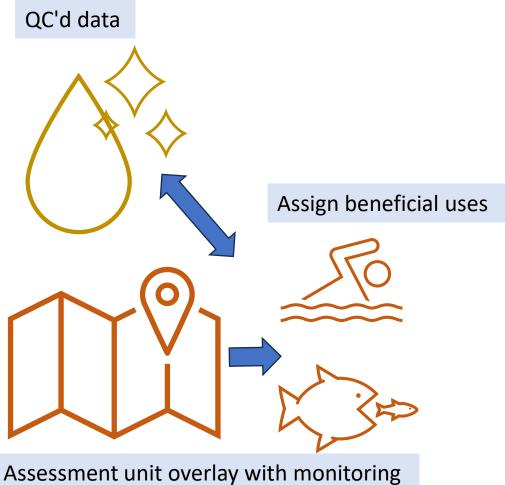




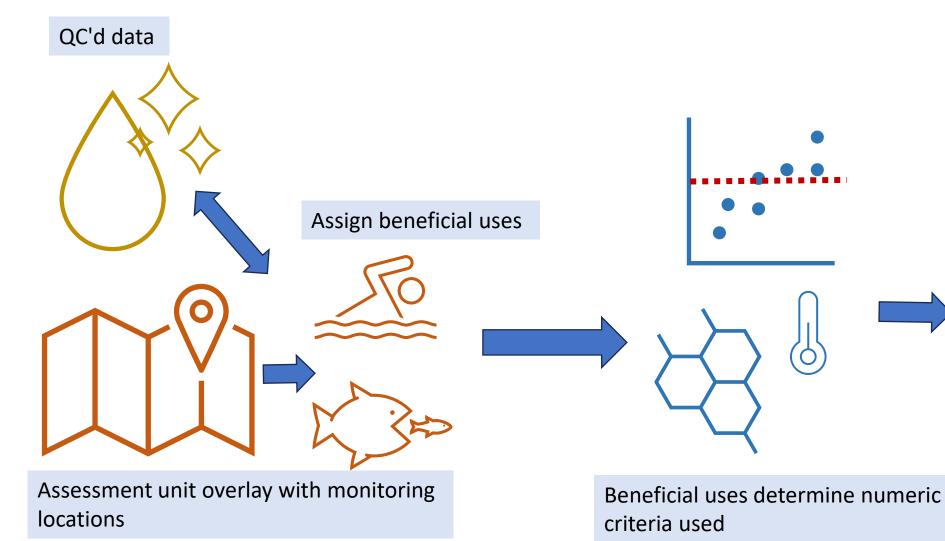


QC'd data



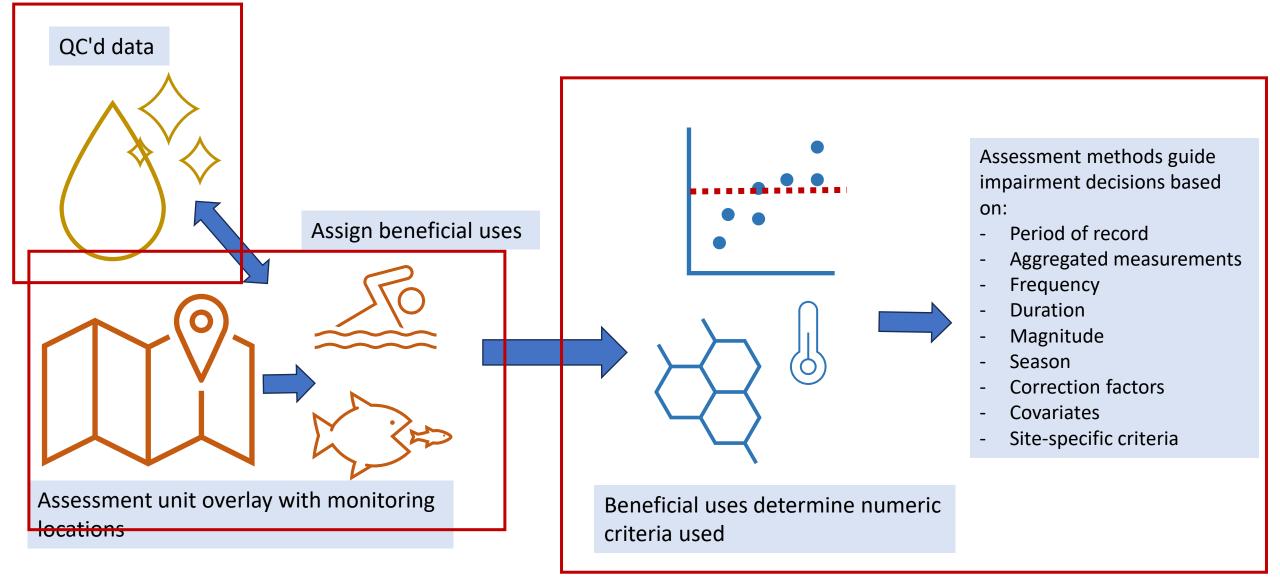


Assessment unit overlay with monitoring locations



Assessment methods guide impairment decisions based on:

- Period of record
- Aggregated measurements
- Frequency
- Duration
- Magnitude
- Season
- Correction factors
- Covariates
- Site-specific criteria

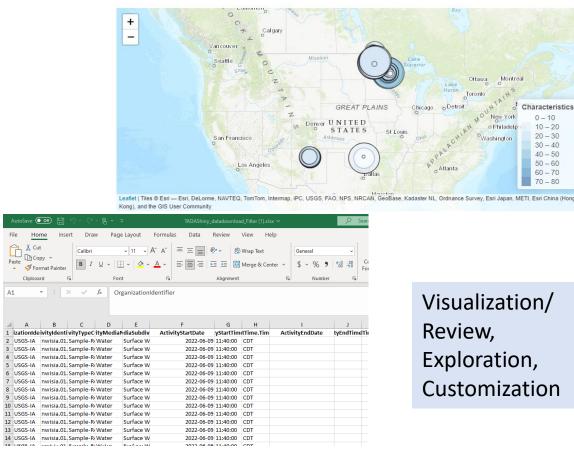


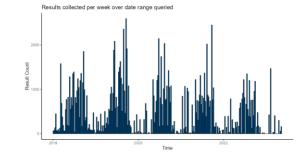
Power happens in the spreadsheets

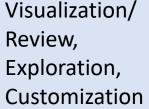
File

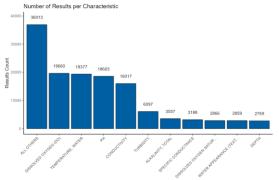
Paste

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Home page Integrated Water Analysis Ambient Water Ouality Community Financing

Drinking Water Water Restoration

Water Quality Models

Automated Data Analysis (TADA)

Water Quality Portal – Tools for

What are the capabilities of TADA?

The U.S. Environmental Protection Agency (EPA) TADA (Tools for Automated Data Analysis) encompasses an R package and series of R Shiny applications currently under development new features are added every month. These tools are designed to help Tribes, Tribal Nations, Pueblos, States and other stakeholders more efficiently compile and evaluate Water Quality Portal (WOP) Z data collected from surface water monitoring sites.

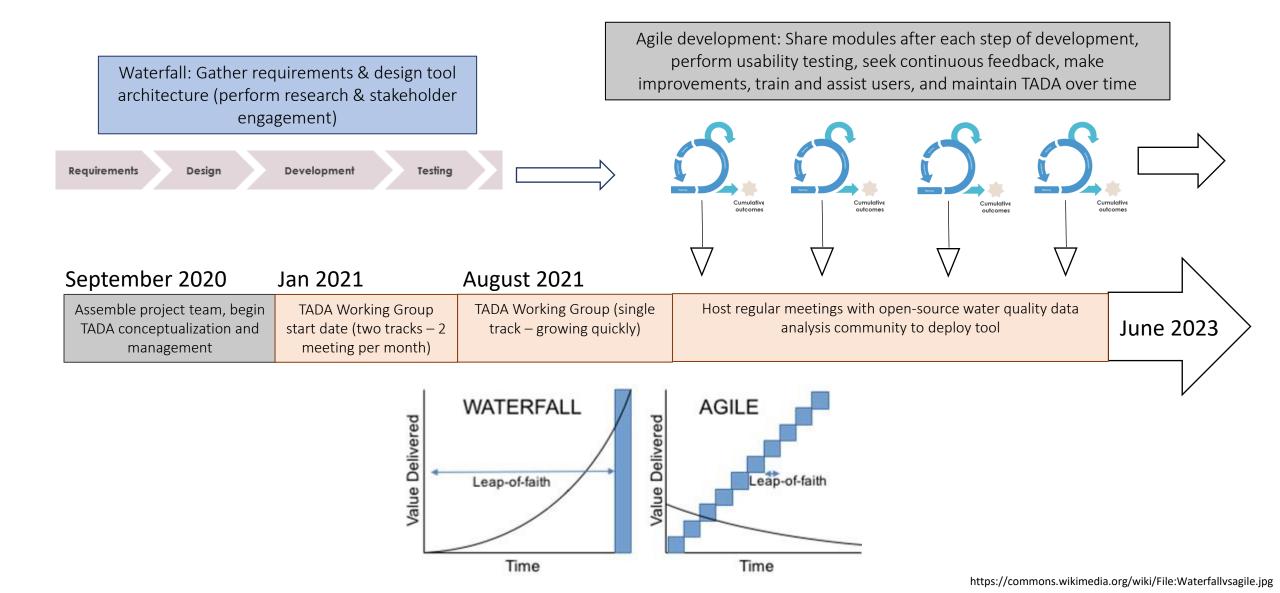
As of Spring 2023, TADAShiny (Module 1: Data Discovery and Cleaning) retrieves data from the WOP and runs it through a series of quality control screens and data wrangling steps. Features include flagging invalid results and metadata using validation reference tables, harmonization of synonyms, result and depth unit conversions, censored (detection limit) data substitutions, dataset filtering, and data visualizations. TADA leverages the EPA Water Quality eXchange (WQX) QAQCCharacterisiticValidation domain value service (available here) to flag invalid results and metadata. Users will be able to review and download summary information about their dataset. along with a data file and that is ready for additional manual review and use in subsequent analyses. Within the application, users decide to flag data for removal or keep data depending on its quality and relevance for their analysis. Data in the WQP are not altered by TADA - if underlying data quality issues are found using TADA, users can contact the WQX helpdesk (WQX@epa.gov) for assistance fixing their organizations data in the WQP. Only data submitting organizations are allowed to make changes to their data. If WQP data users find data quality issues for which they are not the data owner, they may also reach out to the WQX helpdesk who can let the data owner know about the issue.

Once finished, TADA aims to meet the following user requirements: 1) data discovery and cleaning, 2) assessment unit and use integration, 3) criteria and methodologies integration, and 4) assessment unit-use-parameter level analyses in a format compatible with the EPA Assessment, Total Maximum Daily Load (TMDL) Tracking and Implementation System (ATTAINS). The TADA Team is using an agile development approach. User requirements are still being adjusted as needed during development using frequent feedback solicited from the TADA user community.

Current TADA Products

- Different tools for different users
 - R Package (coders)
 - R Shiny Application (non-coders)
- User Guides on GitHub Pages
- **EPA TADA Website**
- Inventory of Open Source and/or Publicly Available Tools that Use WQP Data/Services
- R and R Shiny Learning Resources for Water Community, Collaborative Effort Between TADA Working Group & North American Lake Management Society (NALMS)
- TADA Master List of Requirements (four modules)

TADA Project Timeline





For Today's Training

- TADA Package Vignette: <u>https://usepa.github.io/TADA/articles</u> <u>/TADAModule1.html</u>
- TADA Shiny App: <u>https://github.com/USEPA/TADAShiny</u>
- Bug Form: <u>https://forms.gle/PoTCXEeVAaTnEgLs</u> <u>6</u>
- Feedback Form: <u>https://forms.gle/MAcieQUCqsqywM</u> <u>LY7</u>

Thank you for attending!

- Contact Cristina: mullin.Cristina@epa.gov
- We want your feedback! We are always looking for users to test our products and features
 - Bug/Error Report
 - Feedback Form
 - Submit Issue on GitHub
 - TADA R Package
 - TADA Shiny

EXTRA SLIDES BEYOND





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Water Quality Models

Water Quality Portal – Tools for Automated Data Analysis (TADA)

What are the capabilities of TADA?

The U.S. Environmental Protection Agency (EPA) TADA (Tools for Automated Data Analysis) encompasses an R package and series of R Shiny applications currently under development – new features are added every month. These tools are designed to help Tribes, Tribal Nations, Pueblos, States and other stakeholders more efficiently compile and evaluate <u>Water Quality</u> <u>Portal (WQP)</u> Z data collected from surface water monitoring sites.

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<> Code 🕢 Issues 41 🏦 Pull requests 2 😡 Discussions 🕑 Actions 🖽 Projects 1 🖽 Wiki 🛈 Security 🗠 Insights 🕸 Settings

👔 cristinamullin Merge pull reque	est #286 from USEPA/training_updates	✓ b07f24f last week 🕚 761 commits	This R package can be used to compile and evaluate Water Quality Portal (WQP) data for samples collected from surface
.github	Update R-CMD-check.yaml	last week	water monitoring sites on streams and
R	nctc training materials	last week	lakes. It can be used to create applications that support water quality
data	.rda	last week	programs and help states, tribes, and
inst 📄	Update Detection Limit Reference Table	last month	other stakeholders efficiently analyze the data.
man	nctc training materials	last week	usepa.github.io/TADA/
tests	TADA_AutoClean	last week	ow
vignettes	Update TADATrainingShepherdstown.Rmd	last week	
🗅 .Rbuildignore	documentation, package structure, workflows	9 months ago	CC0-1.0 license
🗅 .gitignore	pkgdown action	3 weeks ago	Cite this repository →
	template function	2 weeks ago	-∿- Activity
LICENSE.md	pkgdown updates	9 months ago	☆ 24 stars ③ 7 watching 얒 10 forks
NAMESPACE	TADA_OrderCols	last week	
README.md	update readme	last week	Report repository
_pkgdown.yml	update gh pages	7 months ago	
			Releases

Welcome to TADA: Tools for Automated Data Analysis!

lifecycle experimental

R-CMD-check passing

We encourage you to read this package's <u>CONTRIBUTING</u>, <u>LICENSE</u>, and <u>README</u> files (you are here).

Tools for Automated Data Analysis, or TADA, is a draft R package being developed to help States, Tribes, Tribal Nations, Pueblos, and other stakeholders more efficiently compile and evaluate <u>Water Quality Portal (WQP)</u> data collected from surface water monitoring sites. TADA is both a stand-alone R package, and a building block to support development of the <u>TADA R Shiny</u> <u>application</u>.

We encourage stakeholders to test the functionality and provide feedback. Moreover, open source software provides an avenue for water quality data originators and users to develop and share code, and we welcome your contributions! More information on how to contribute can be found in the <u>CONTRIBUTING</u> file. This file explains how users can contribute to the R package by submitting a pull request or issue to request a change or provide feedback. We hope to build a collaborative community dedicated to this effort where contributors can discover, share and build the package functionality over time.

More about the TADA Project

Installation

You can install and load the most recent version of the TADA R Package from GitHub by running:

library (remotes)
remotes::install_github("USEPA/TADA", ref = "develop", dependencies = TRUE)

Water Quality Portal

Browse source code

License

Links

Full license

CC0

Citation

Citing TADA

Developers

Cristina Mullin Author, maintainer Michelle Thawley Author Jacob Greif Author Laura Shumway Author Elise Hinman Author Kathleen Healy Author

Search for

Contributing 2023-06-08

Source: vignettes/CONTRIBUTING.Rmd

Contribute to TADA!

We encourage you to read this project's <u>CONTRIBUTING</u> policy (you are here), its <u>LICENSE</u>, and its <u>README</u>.

We're so glad you're thinking about contributing to an EPA open source project! If you're unsure about anything, just ask — or submit your issue or pull request anyway. The worst that can happen is we'll politely ask you to change something. We appreciate all friendly contributions.

No matter who you are, if you spot an error, omission, or bug, you're welcome to open an issue in this repo!

TADA Working Group Mission

To share and develop R code for evaluating and visualizing Water Quality Portal (WQP) data more efficiently though collaboration and open-source programming. This includes working together to find commonalities in assessment processes across the nation, creating flexible tools that can be easily customized to work within existing workflows, supporting each other in learning R, and ensuring products will be accessible to organizations most in need.

Package Development

This article will walk through how to contribute to the TADA package via a pull request workflow. This is also not a complete guide to R package development (a comprehensive guide is <u>R</u> <u>Packages</u>), instead this is meant as more of a checklist for the general steps. Several references are included at the bottom for more information on <u>R-package</u> development and <u>git</u> workflows.

What is GitHub?

GitHub is a third party website that offers version controlled repositories that developers and

On this page

Contribute to TADA! TADA Working Group Mission Package Development What is GitHub? Required Installations Issues Branches and Pull Requests Additional References Open-Source Code Policy License Disclaimer Contact

Function reference

All functions

AboveNationalWQXUpperThreshold()

Check Result Value Against WQX Upper Threshold

<u>AggregatedContinuousData()</u>

Check for Aggregated Continuous Data

BelowNationalWQXLowerThreshold()

Check Result Value Against WQX Lower Threshold

GetActivityTypeRef()

Update Activity Type Reference Table

GetDetCondRef()

Update Result Detection Condition Reference Table

GetDetLimitRef()

0

you are welcome to download any branch you'd like using the ref input in install_github (see code chunk above). This functionality is mainly only useful to TADA package developers/contributors.

The following code block ensures the additional packages needed to run the code in this RMarkdown document are loaded. However, users may also use the package name:: package function notation to avoid the list of <u>library()</u> calls.

```
# Load tidyverse
if(!"tidyverse"<u>%in%installed.packages()){</u>
    <u>install.packages("tidyverse")</u>
}
<u>library(tidyverse)</u>
```

Help pages

All TADA R package functions have their own individual help pages, listed on the <u>Function reference</u> page on the GitHub site. Users can also access the help page for a given function in R or RStudio using the following format (example below): **?TADA::**[name of TADA function]

?TADA:: TADAdataRetrieval

On this page

Welcome! Customize or contribute Install and setup Help pages Upload data Initial data review Data flagging Censored data handling Data exploration TADA R Shiny Modules

Install and setup

Users can install the TADA package from GitHub into their R library using the remotes package. Copy and paste the code below into your R or RStudio console to download and install.

TADA package relies on other packages, therefore you may be prompted in the console to update dependency packages that have more recent versions available. If you see this prompt, it is recommended to update all of them (enter 1 into the console).

```
# Install TADA
if(!"remotes"%in%installed.packages()){
    install.packages("remotes")
}
remotes::install_github("USEPA/TADA", ref="develop")
library(TADA)
```

It's that easy! The most stable branch for TADA right now is the develop branch. Contributors generally create their own branches based on develop, make some improvements, and then submit a pull request to be reviewed by the TADA Team. Once approved, updates are then merged into the develop branch. However, you are welcome to download any branch you'd like using the ref input in install_github (see code chunk above). This functionality is mainly only useful to TADA package developers/contributors.

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