



## Free Monthly Webinar Series

Challenges and Treatment Solutions for Small Drinking Water Systems

Hosted by EPA's Office of Research and Development (ORD) and Office of Water (OW)

Schedule & Recordings: [epa.gov/water-research/small-systems-monthly-webinar-series](https://epa.gov/water-research/small-systems-monthly-webinar-series)



September 29, 2020

# Wildfires and Resulting Impacts to Water Bodies Used as Drinking Water Sources

A certificate of attendance will be provided for this webinar

**Webinar Slides:** Located under "Handouts" in the right navigation bar on your screen.

**To Ask a Question:** Type in the "Questions" box located in right navigation bar on your screen.

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Join us in our year-long anniversary celebration.  
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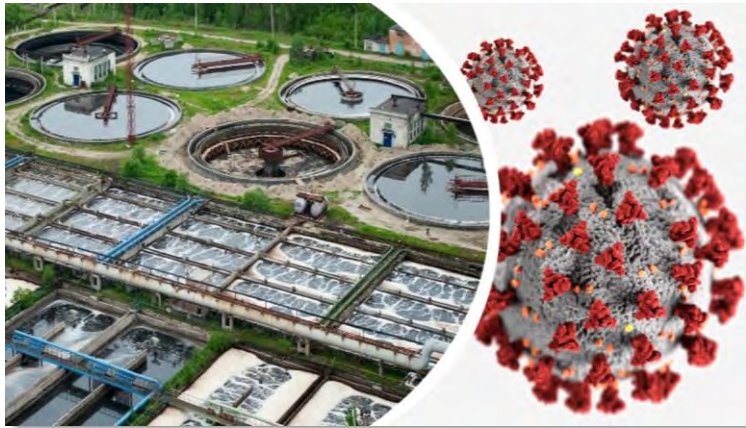
## Requirements:

1. You must be registered or be in a room with someone who is.
2. You must **attend** the live webinar **for 60 minutes**.
3. If in a room with others, the **names of people not logged in must be provided by the person who is logged in**. Type additional names in the “Questions” box or send names to [webcastinfo@cadmusgroup.com](mailto:webcastinfo@cadmusgroup.com).



### Note

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## 💧 Water Research Webinar Series

**September 30:** *SARS CoV-2 in Wastewater Monitoring: Linking Research and Application to Meet Immediate Needs*  
[Registration and Additional Information](#)



## 💧 Tools and Resources Webinar Series

**October 21:** *Lead Action Plan Research Update*  
[Registration and Additional Information](#)





# Solicitation Research Questions

**National Priorities:** Systems-Based Strategies to Improve the Nation's Ability to Plan And Respond to Water Scarcity and Drought

[Additional Information](#)

- How does drought affect water quality and availability?
- How do drought related events, such as surface runoff and wildfire, change water quality and availability?
- How can water quality changes driven by drought, such as changes in timing and intensity of spring snowmelt and runoff, affect water quality?
- What adaptive management strategies and innovative, cost-effective technologies protect against drought impacts?
- How can management strategies and technologies be demonstrated in communities to facilitate adoption?





# Awarded Institutions

## 💧 **Clemson University**

Forest Fuel Reduction Techniques as Effective Watershed Management Practices Against Wildfire: Drinking Water Quality Aspects

*Tanju Karanfil and Alex Chow* [Additional Information](#)

## 💧 **Water Research Foundation**

An integrated modeling and decision framework to evaluate adaptation strategies for sustainable drinking water utility management under drought and climate change

*Kenan Ozekin, Joseph Kasprzyk, Scott Summers, Fernando Rosario- Ortiz, Balaji Rajagopalan, and Benjamin Livens* [Additional Information](#)





# Water Quality After a Wildfire

## Watershed Factors

- Vegetation
- Fire Intensity
- Topography
- Hydrologic factors

## Potential Impacts from Wildfires

- Increased flooding
- Ecosystem harm
- Greater rates of erosion
- Water quality impacts: nutrients and sediment



## Wildfire Impacts on Drinking Water Quality



### Alex Chow, Ph.D.

[achow@clemson.edu](mailto:achow@clemson.edu)

Dr. Chow is a professor of biogeochemistry in the Department of Forestry and Environmental Conservation, with a joint appointment in the Department of Environmental Engineering and Earth Science at Clemson University. His research focuses on watershed perturbation, such as wildfire, flooding, and land use changes on exports of dissolved organic matter and DBP precursors. Dr. Chow holds a Ph.D. in hydrologic science from University of California, Davis.



### Tanju Karanfil, Ph.D.

[tkaranf@clemson.edu](mailto:tkaranf@clemson.edu)

Dr. Karanfil is a professor of Environmental Engineering in the Department of Environmental Engineering and Earth Science and is also a vice president of research at Clemson University. His research focuses on drinking water quality, including DBPs, water treatability, and other emerging contaminants. Dr. Karanfil holds a Ph.D. in environmental engineering from University of Michigan.



EPA

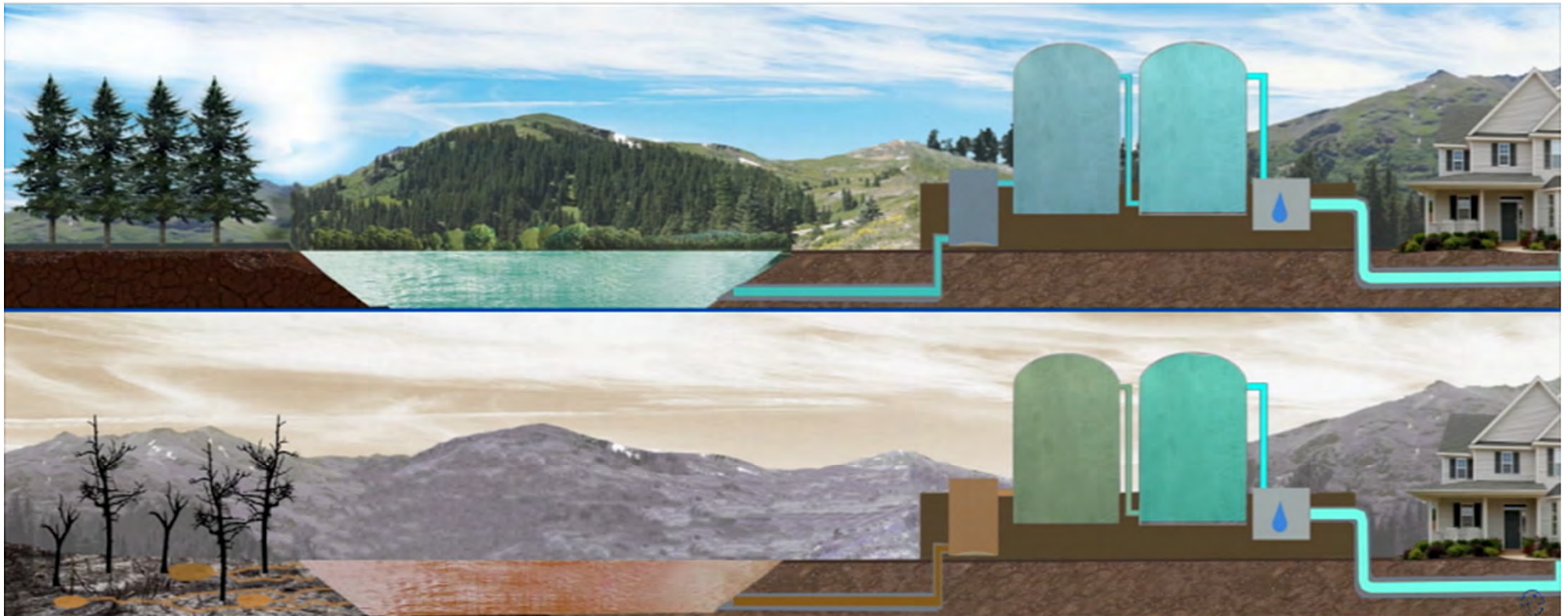
Small Systems  
Webinar Series

# Wildfire Impacts on Drinking Water Quality

## Low-Severity Prescribed Fire and High-Severity Wildfire

Tanju Karanfil & Alex Chow

Sept. 29, 2020



**CLEMSON**  
UNIVERSITY



Clemson University

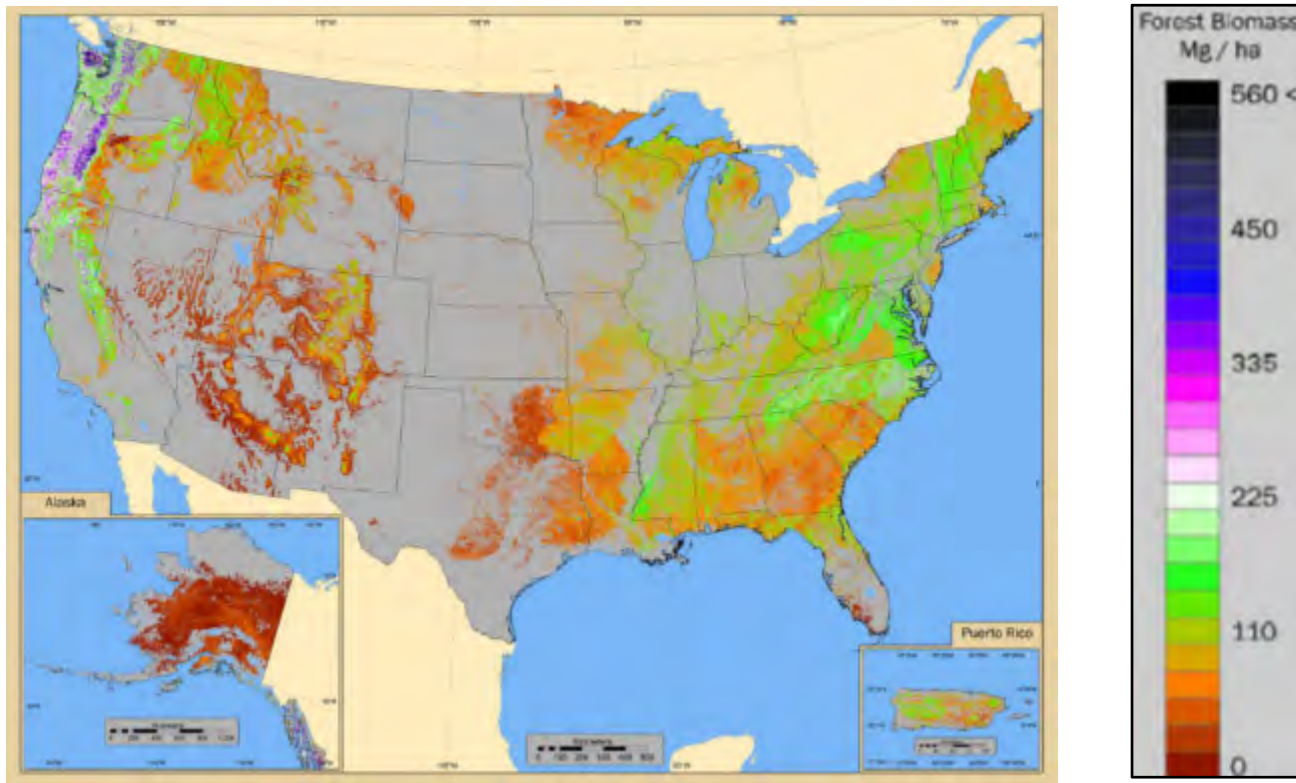
**Biogeochemistry &  
Environmental Quality**





# Forest Land ↔ Source Waters

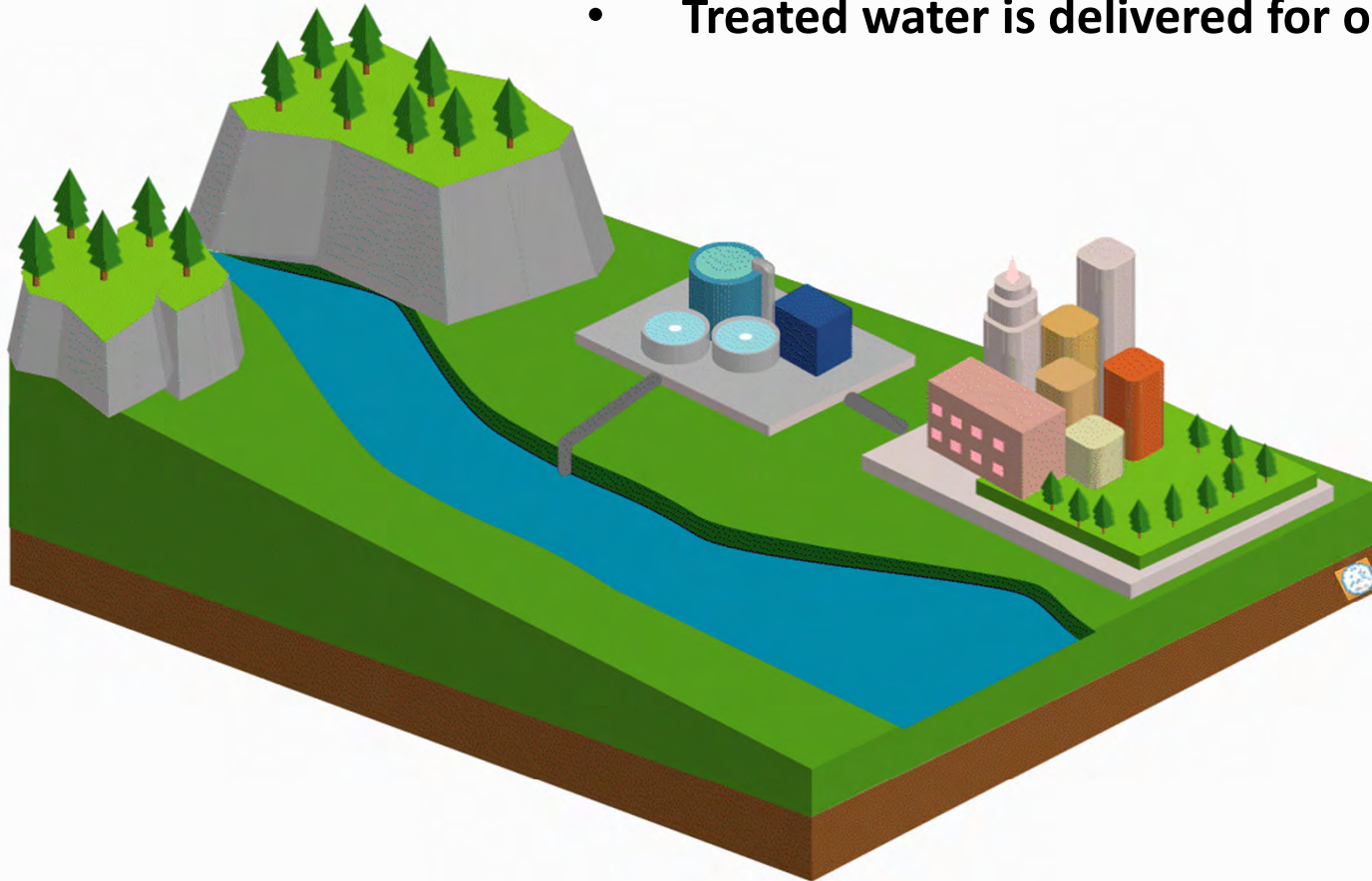
Forest land comprises 766 million acres, or **33%** of the total land area of the United States



About **53%** of the water supply in the US is surrounded by forest land

# From Headwater to Household Tap Continuum

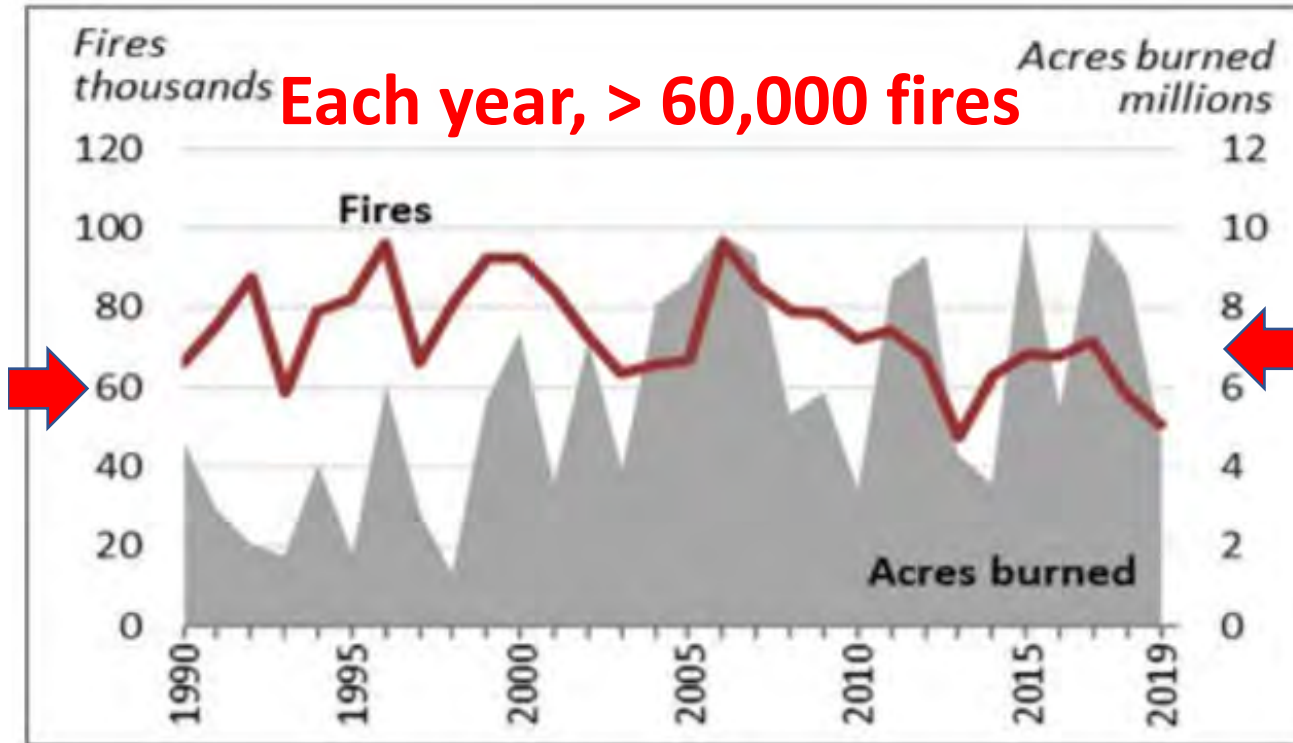
- Water is drained from forested watershed
- It is source water for downstream utilities
- Treated water is delivered for our use



- Wildfire consumes biomass and generates ash
- Post-fire rainstorms flush ash to surface water
- It is a challenge to treat ash loaded water

# Wildfire Statistics

## Annual Wildfires and Acres Burned (1990 – 2019)



County Fire near Lake Berryessa

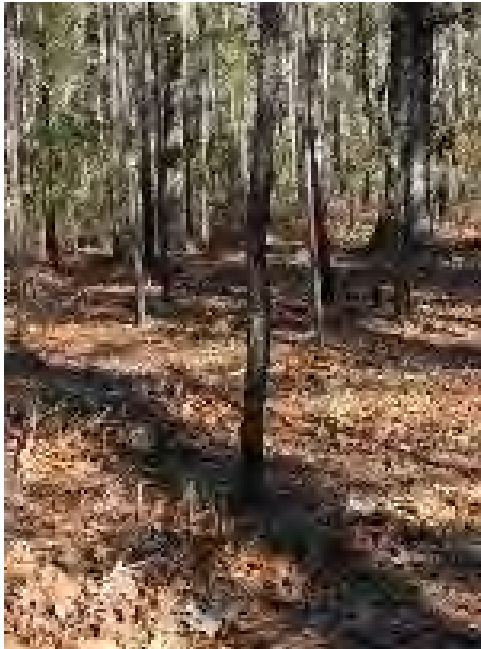


Angora Fire near Lake Tahoe

**An average of 7 million acres burned each year**

**As of September 1, 2020, nearly 40,000 wildfires have burned over 4 million acres this year**

# Detritus in Forested Watersheds



- ❖ Forest detritus is an **ignition source** of forest fire.
- ❖ Forest detritus is a major terrestrial source of dissolved organic matter (DOM) in source water.
- ❖ DOM is a precursor of carcinogenic **disinfection byproducts** (DBPs) during drinking water treatment.



&



# Prescribed Fire as a Fuel Reduction Technique

## Hypothesis



**Reduce**

Mass of litter &  
duff per unit area



**Reduce**

DOM Exports  
from Watersheds



**Reduce**

DBP Precursor in  
Source Water

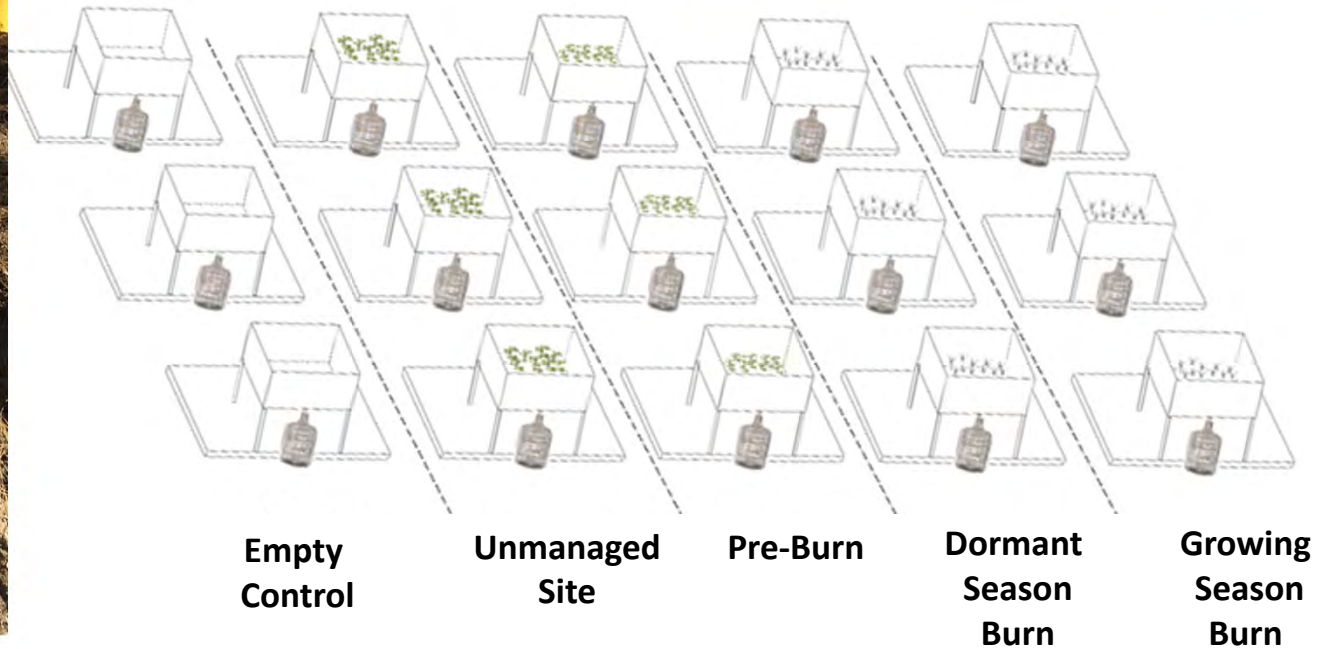
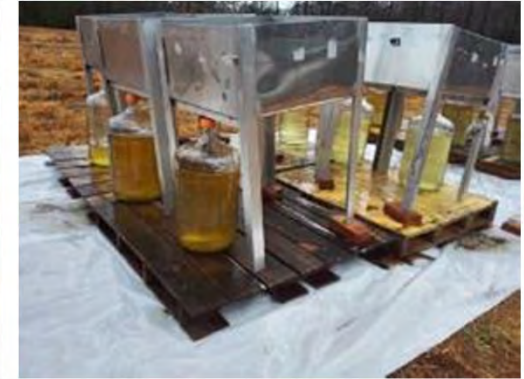
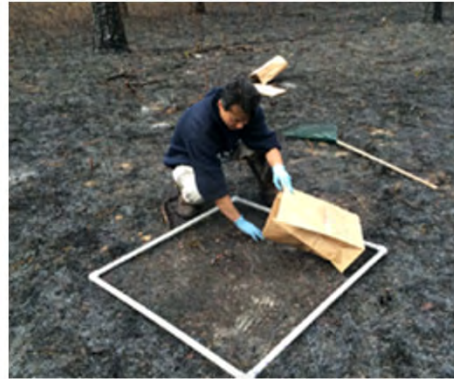
# Low-severity Prescribed Fire on Water Quality and Formation of Disinfection Byproducts



- ❑ **Treatability of Prescribed Fire Derived DOM**
- ❑ **Dynamics of DBP Precursors in Post-Fire Runoffs**
- ❑ **Long-term Effects of Prescribed Fire Practice**

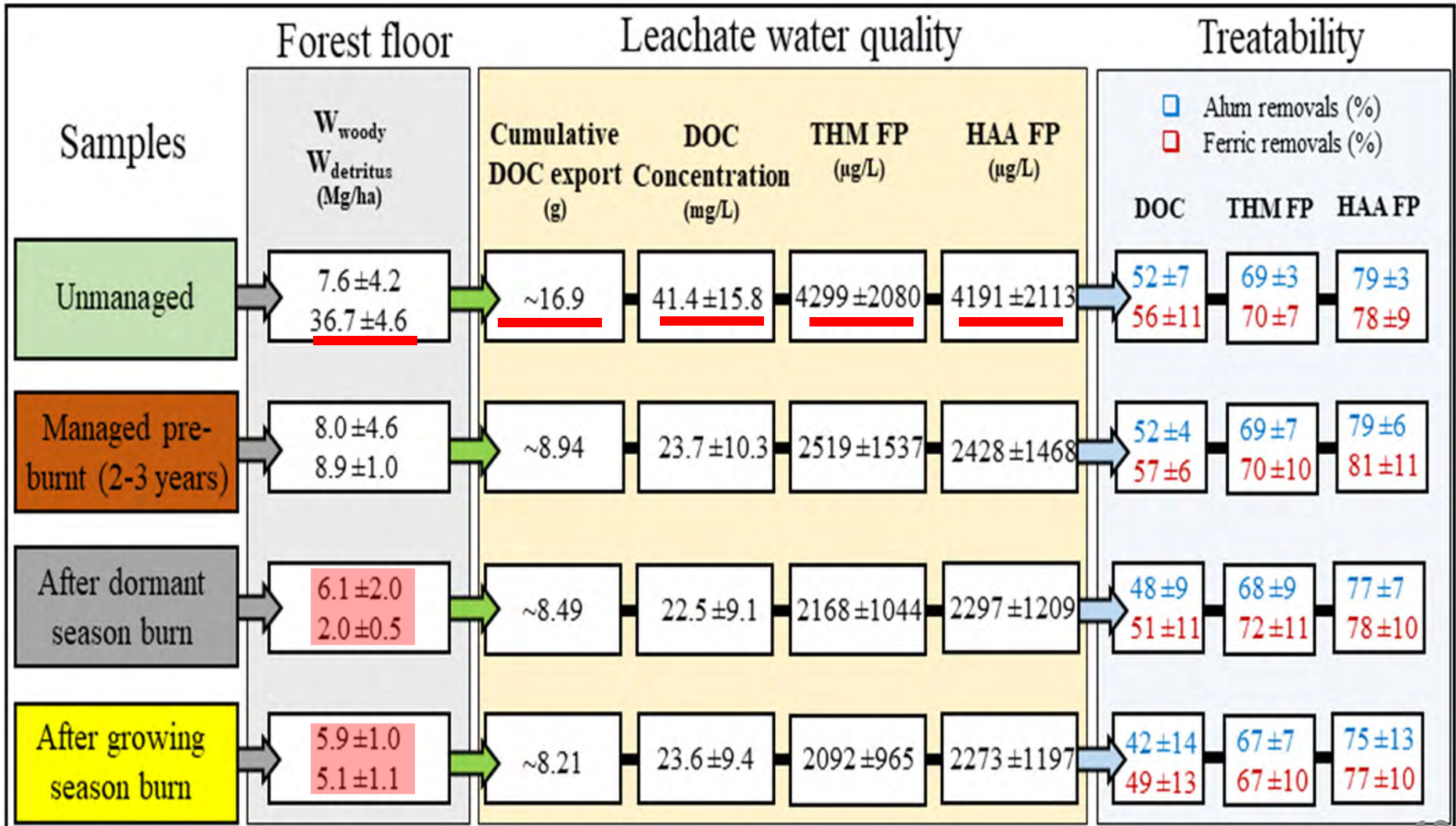
# Treatability of Prescribed Fire Derived DOM

## Controlled Field Study – 1 Year Water Leaching Experiment



# Treatability of Prescribed Fire Derived DOM

## Results – Box Model on the Yields of DBPs and Treatability





# Dynamics of DBP Precursors in Post-Fire Runoffs

## Watershed-scale Investigations

### Study Sites:



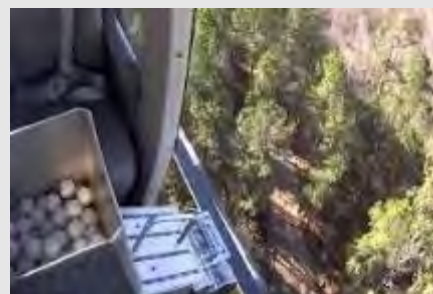
Francis Marion National Forest

US Forest Service

Santee Experimental Forest



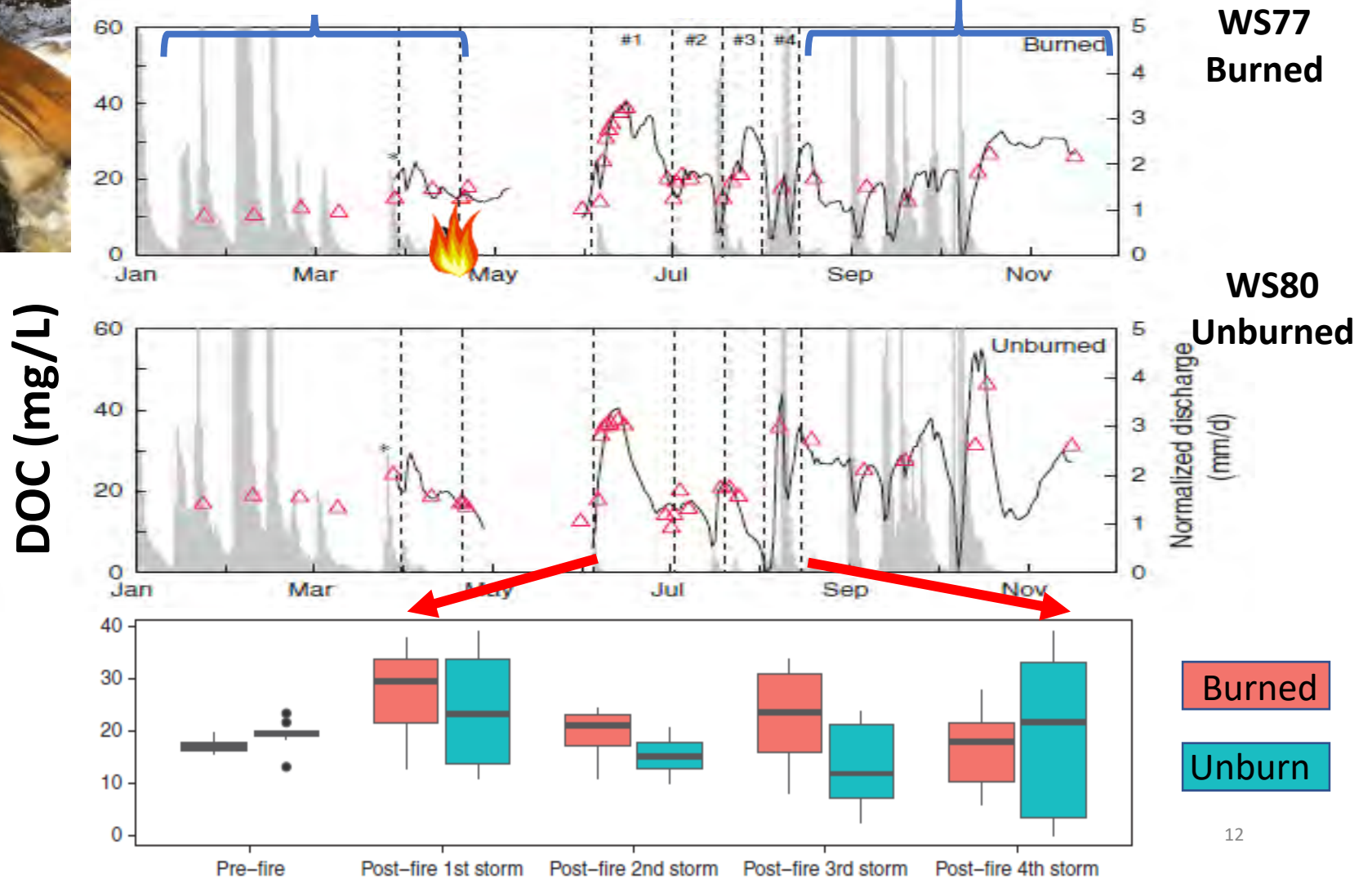
- A paired watershed – 160 ha each
- 1<sup>st</sup> order stream
- Control vs Prescribed burn
- Operation since 1960s
- Burn every 2-4 years



# Dynamics of DBP Precursors in Post-Fire Runoffs

## Results – DOC Concentrations

Before Burn    Post Fire Rain Storms    After Burn

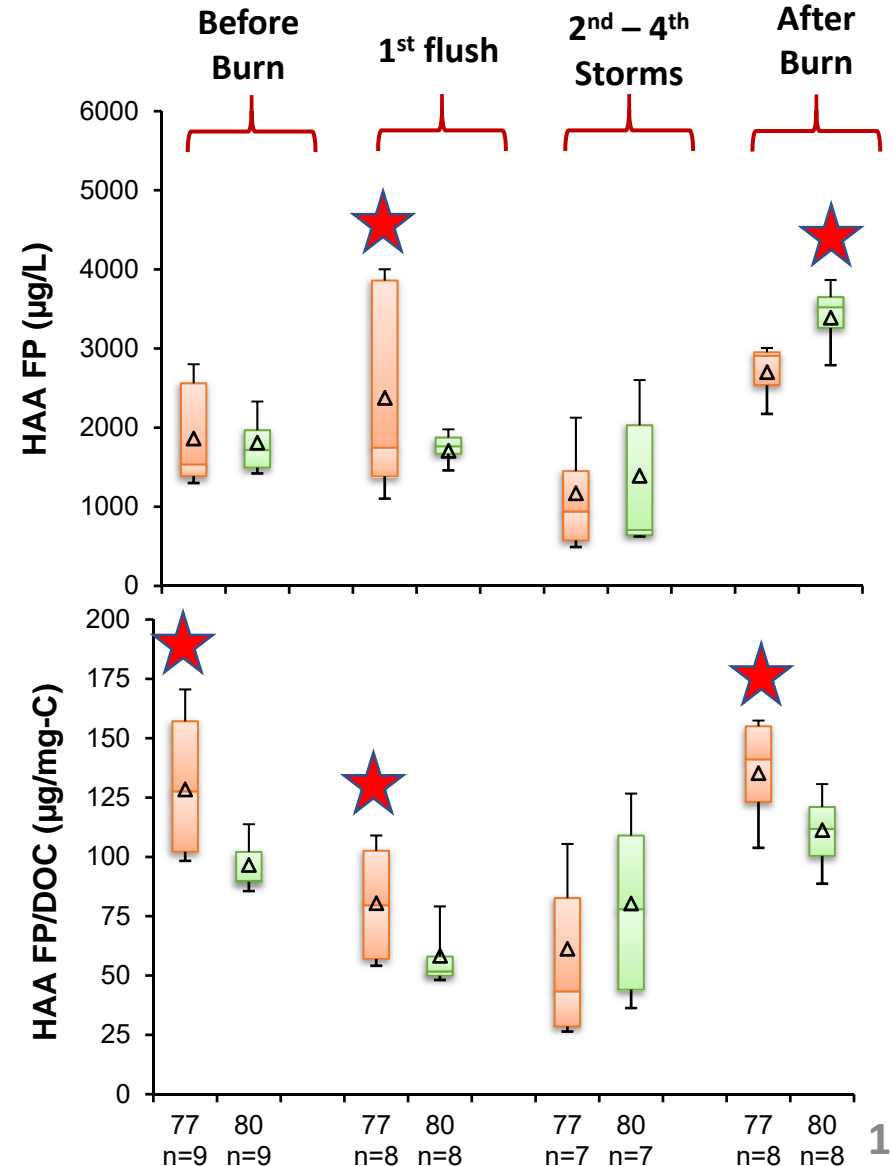
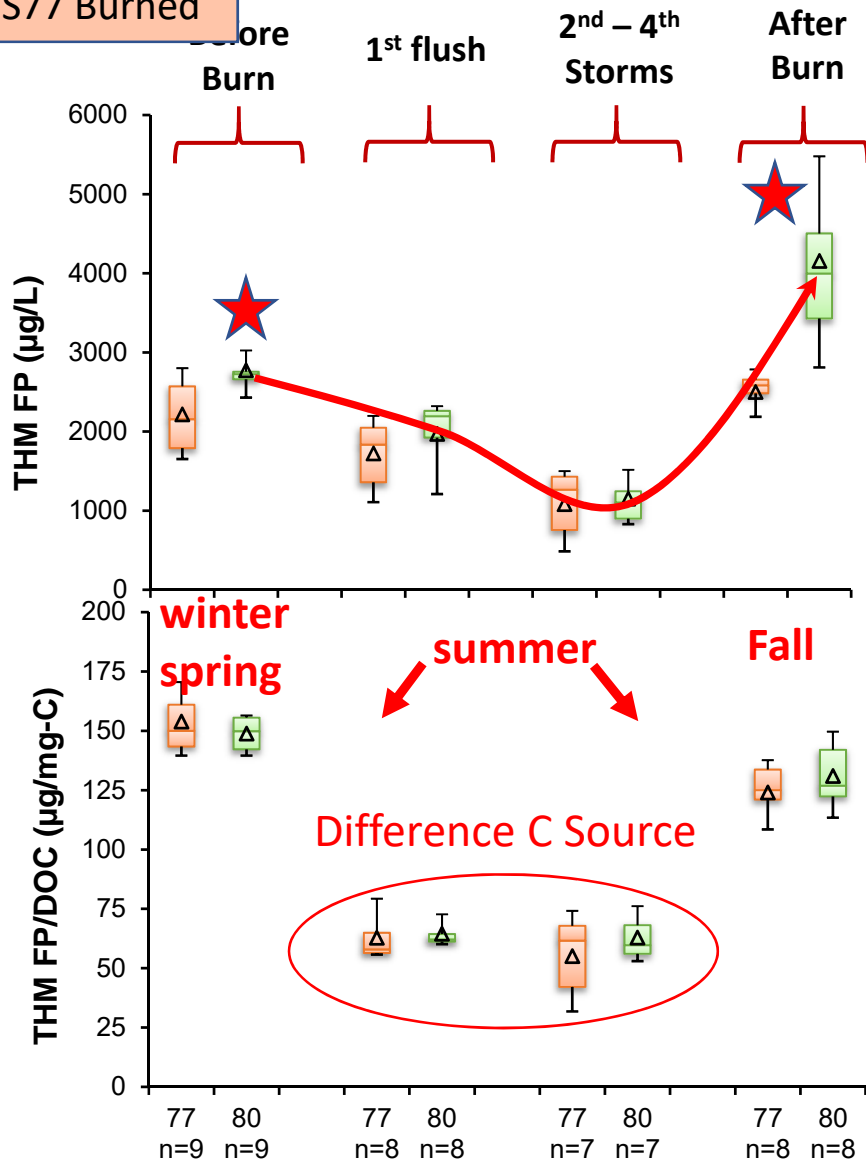


# Dynamics of DBP Precursors in Post-Fire Runoffs

WS80 Unburn

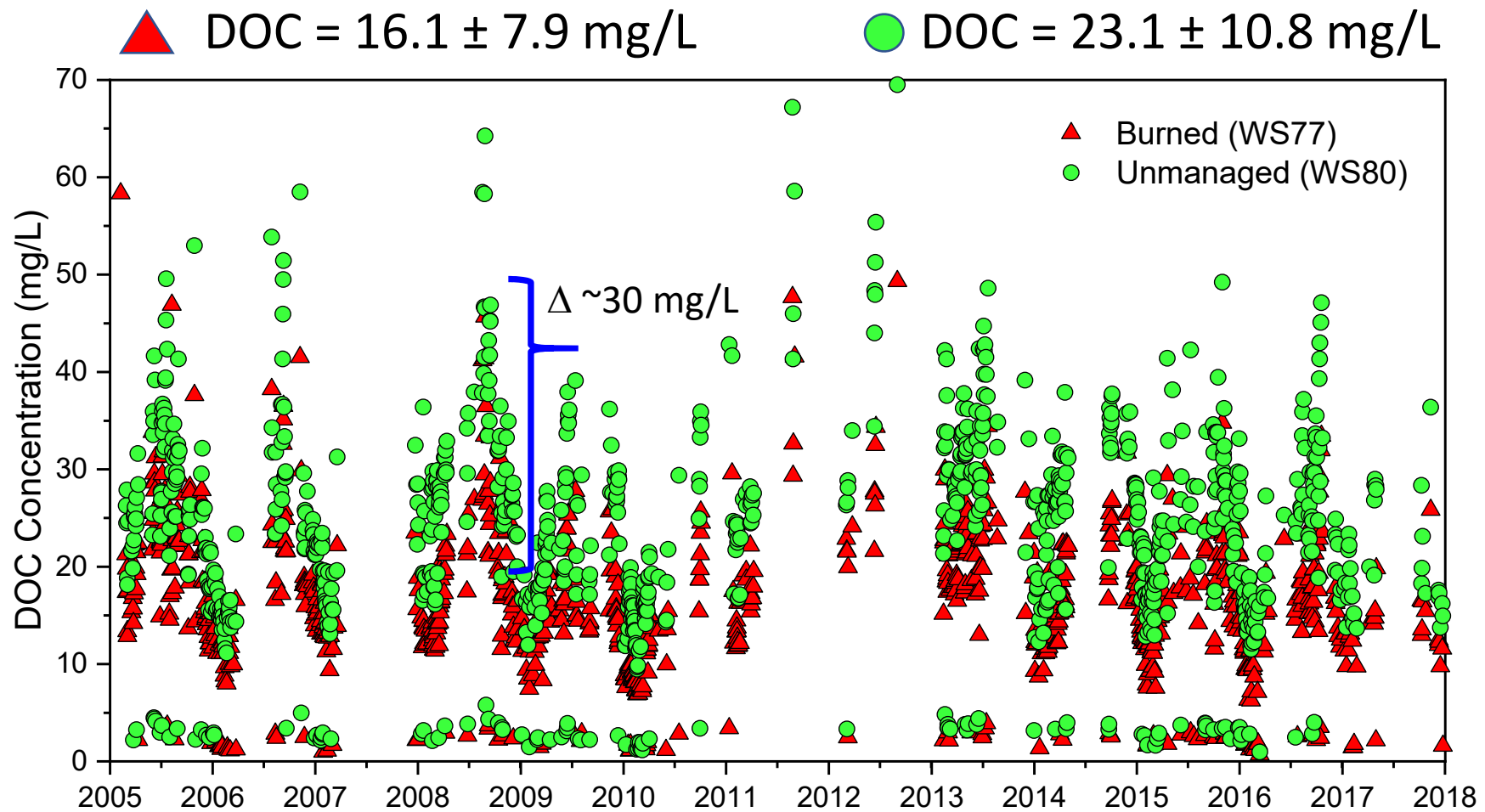
WS77 Burned

## Results – THM and HAA Formation Potentials



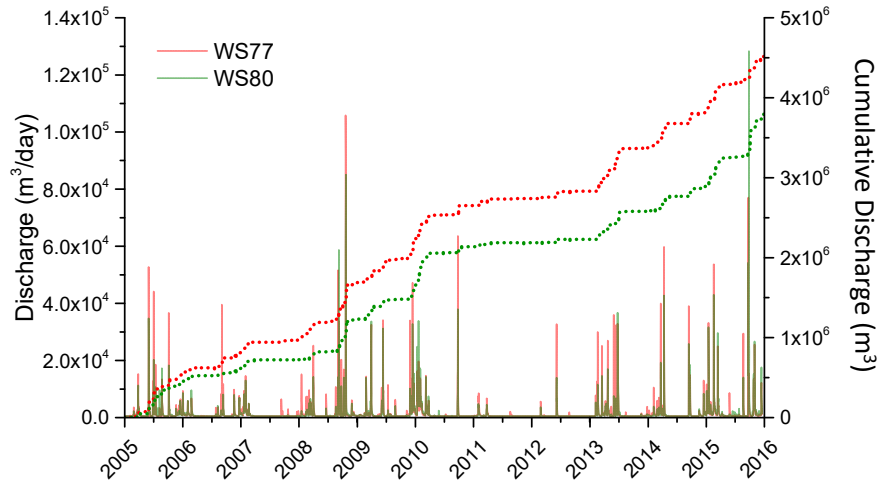
# Long-Term Effects of Prescribed Fire Practice

## Results – DOC Concentration



# Long-Term Effects of Prescribed Fire Practice

## Results – Water and DOC fluxes



Prescribed Burn  
WS77

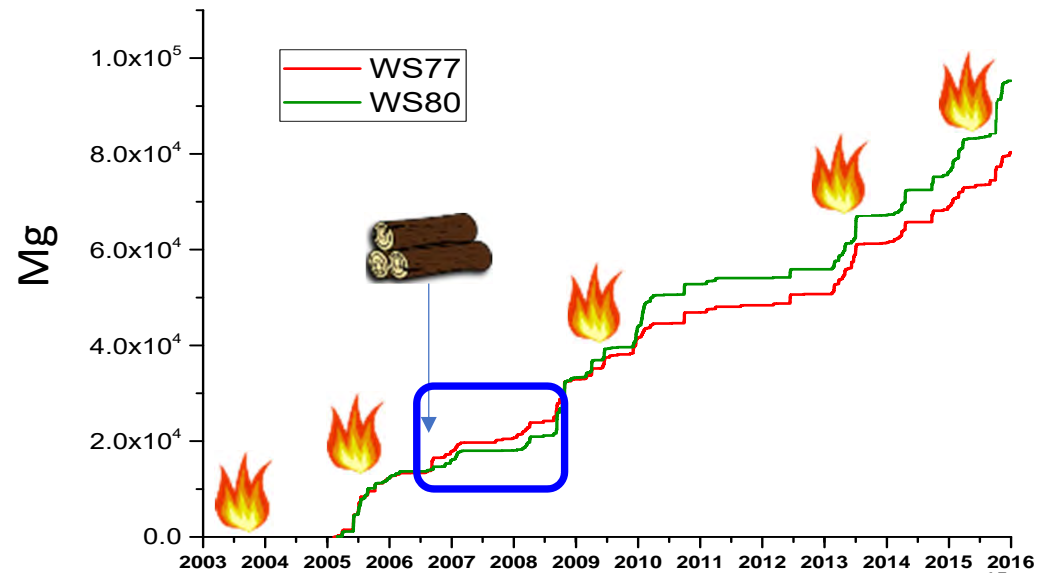
Unmanaged  
WS80

$$[\text{DOC}]_{77} < [\text{DOC}]_{80}$$

$$[\text{Discharge}]_{77} > [\text{Discharge}]_{80}$$

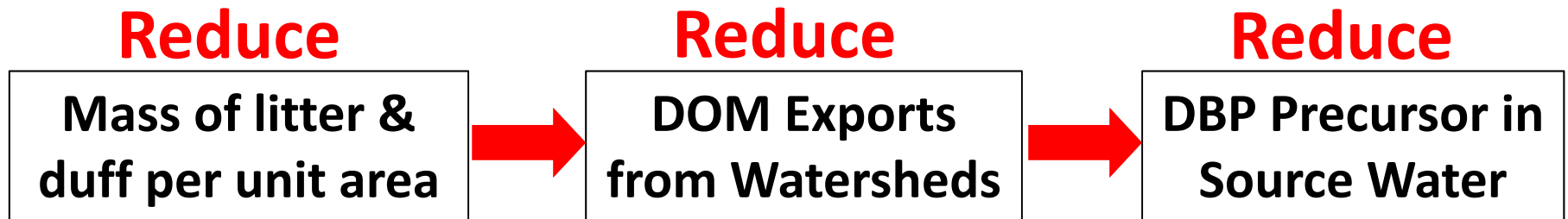
$$[\text{DOC Load}]_{77} < [\text{DOC Load}]_{80}$$

$$\text{DOC Load} = [\text{DOC}] \times [\text{Discharge}]$$



# Long-Term Effects of Prescribed Fire Practice

## Results – Yields of DBP Precursors



| Watershed                   | Forest Floor                           | Surface Water Quality            | DBPs                               |
|-----------------------------|--|----------------------------------|------------------------------------|
| Managed<br>(Watershed 77)   | 12.3 ± 1.1 Mg/ha<br><i>Litter Mass</i> | 21.94 ± 1.8<br><i>DOC (mg/L)</i> | 2143 ± 136<br><i>THM-FP (µg/L)</i> |
|                             | 5.8 ± 1.6 Mg/ha<br><i>Duff Mass</i>    | 0.9 ± 0.08<br><i>TDN (mg/L)</i>  | 43.0 ± 4.2<br><i>HAN-FP (µg/L)</i> |
| Unmanaged<br>(Watershed 80) | 12.5 ± 0.7 Mg/ha<br><i>Litter Mass</i> | 24.95 ± 2.6<br><i>DOC (mg/L)</i> | 2667 ± 192<br><i>THM-FP (µg/L)</i> |
|                             | 10.5 ± 1.4 Mg/ha<br><i>Duff Mass</i>   | 1.0 ± 0.1<br><i>TDN (mg/L)</i>   | 66.5 ± 6.0<br><i>HAN-FP (µg/L)</i> |

# Pile Fire in UC Berkeley Sagehen Creek Field Station



# Benefits of Low-severity Prescribed Fire on Water Quality Formation of Disinfection Byproducts

## ❑ Treatability of Prescribed Fire Derived DOM

- Greater DOC and DBP formation from unburned forest substrates
- No difference was observed in alum / ferric removal efficiency

Uzun et al. 2020. *Water Research* 187, 116385

## ❑ Dynamics of DBP Precursors in Post Fire Runoffs

- Slightly higher DOC but only in first few post-fire runoffs
- No different in yield of THM but higher HAA yield was observed

Olivares et al. 2019. *International Journal of Wildland Fire* 28, 761-768

## ❑ Long-term Effects on DBP

- Prescribed fire increases water yield of the watershed
- Prescribed fire lowers DOC and DBP precursors in source water

Majidzadeh et al. 2019. *International Journal of Wildland Fire* 28, 804-813



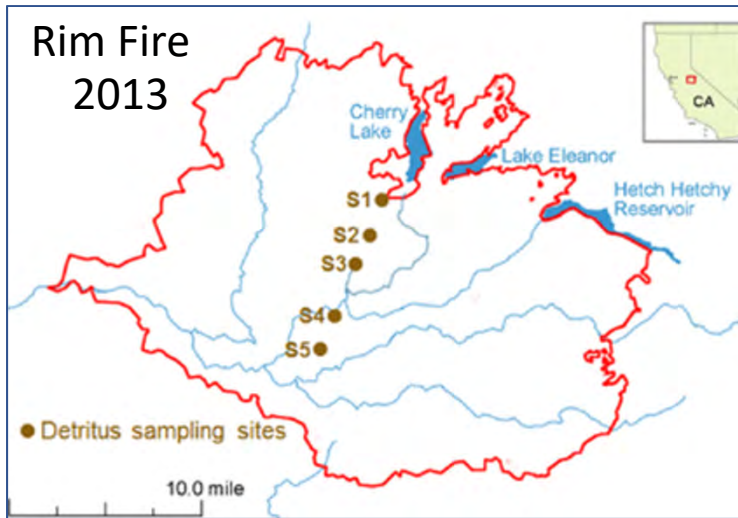
# High-Severity Wildfire on Water Quality and Formation of Disinfection Byproducts



- Treatability of Wildfire-Derived DOM**
- Dynamics of DBP Precursors in Post-fire Runoffs**
- Wildfire at a Previously Burnt Site**

# Treatability of Wildfire-Derived DOM

## Laboratory Study - Water Leaching Experiments



ponderosa pine  
white fir



black ash  
white ash

Filtered with 0.45  $\mu$ m

| Treatments                         | Fir  | Pine | B1   | W1   | B2   | W2   |
|------------------------------------|------|------|------|------|------|------|
| <b>DOC</b>                         |      |      |      |      |      |      |
| <u>DOC (mg/g-material)</u>         |      |      |      |      |      |      |
| Raw                                | 41.1 | 40.3 | 3.05 | 5.79 | 0.45 | 0.15 |
| Treated                            | 23.3 | 23.1 | 2.04 | 3.95 | 0.36 | 0.13 |
| Removal (%) <sup>a</sup>           | 43.3 | 42.6 | 33.3 | 31.8 | 20.0 | 14.4 |
| <b>DON</b>                         |      |      |      |      |      |      |
| <u>DON (mg/g-material)</u>         |      |      |      |      |      |      |
| Raw                                | 1.18 | 0.98 | 0.25 | 0.47 | 0.26 | 0.18 |
| Treated                            | 0.35 | 0.50 | 0.17 | 0.36 | 0.25 | 0.17 |
| Removal (%)                        | 70.6 | 49.2 | 31.5 | 23.5 | 1.83 | 1.91 |
| <b>SUVA</b>                        |      |      |      |      |      |      |
| <u>SUVA<sub>254</sub> (L/mg-m)</u> |      |      |      |      |      |      |
| Raw                                | 3.61 | 3.28 | 3.73 | 4.36 | 5.24 | 3.48 |
| Treated                            | 1.28 | 1.33 | 2.89 | 3.45 | 4.39 | 2.99 |
| Removal (%)                        | 64.5 | 59.6 | 22.5 | 20.8 | 16.2 | 14.2 |

# Dynamics of DBP Precursors in Post-fire Runoffs

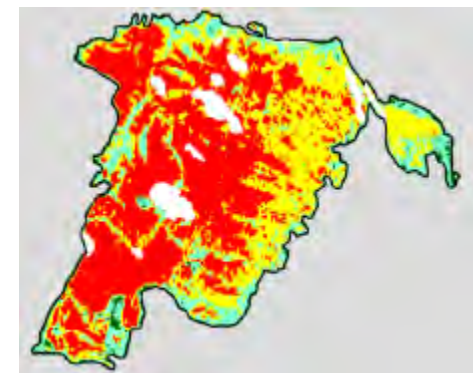
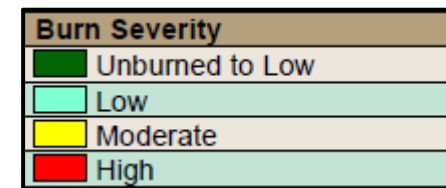
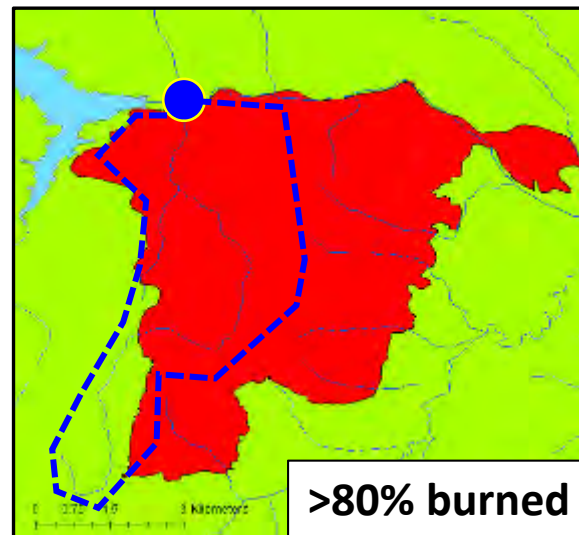
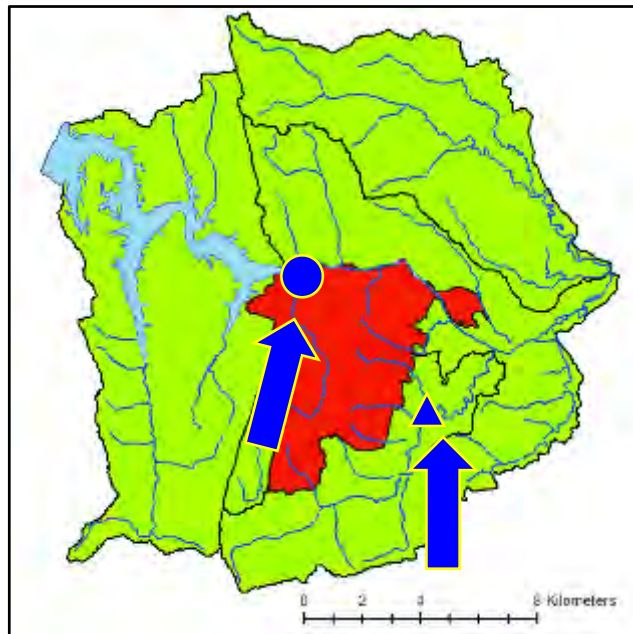
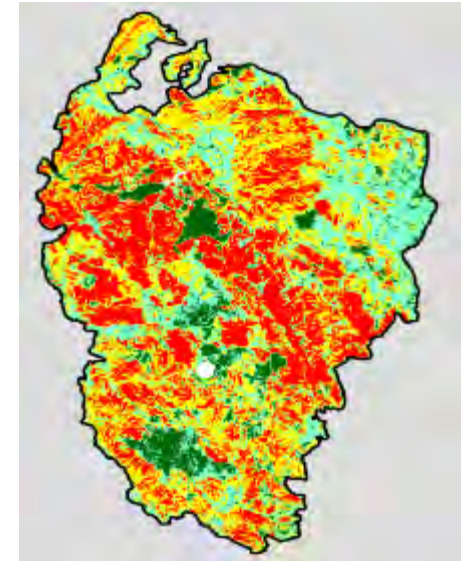
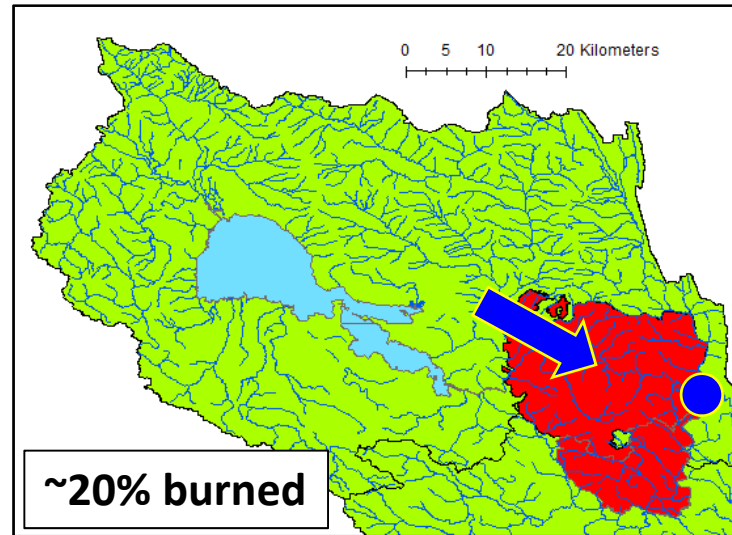
## Field Investigation – California Wildfire

2015



**Rocky Fire**  
383 km<sup>2</sup>  
(Aug 2015)

**Wragg Fire**  
33 km<sup>2</sup>  
(July 2015)



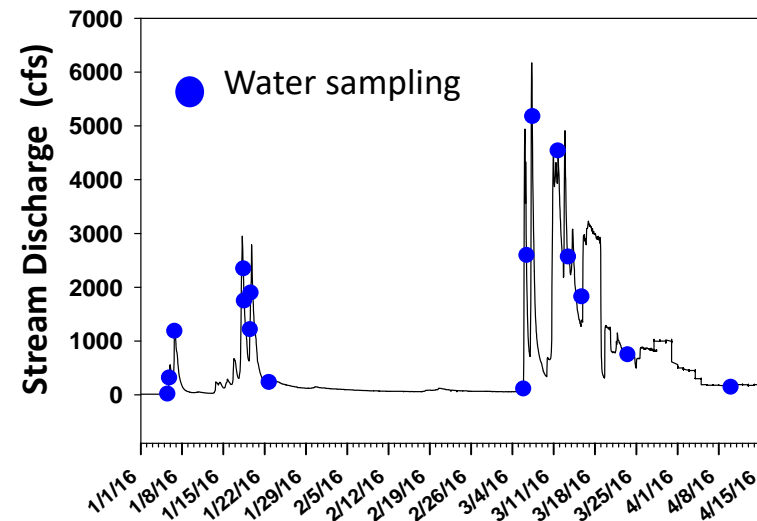
# Dynamics of DBP Precursors in Post-fire Runoffs

## Field Investigation – Post Fire Runoffs

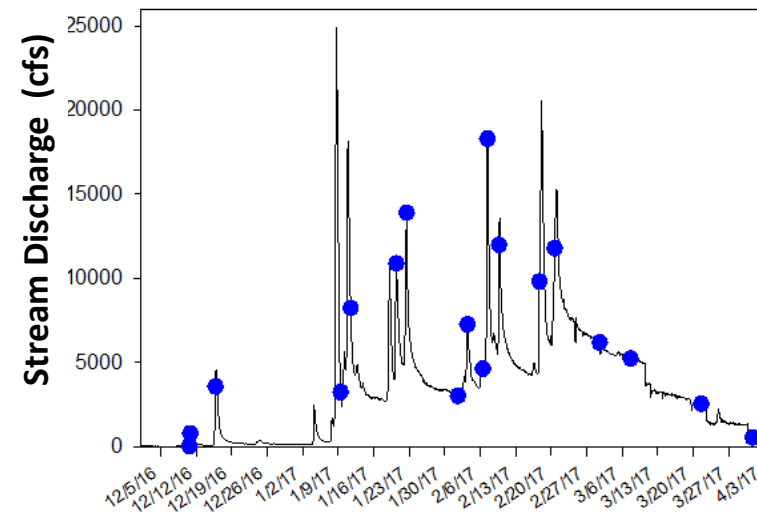
Burned in July/August 2015  
First flush in January 2016



2015-2016 Water Year



2016-2017 Water Year



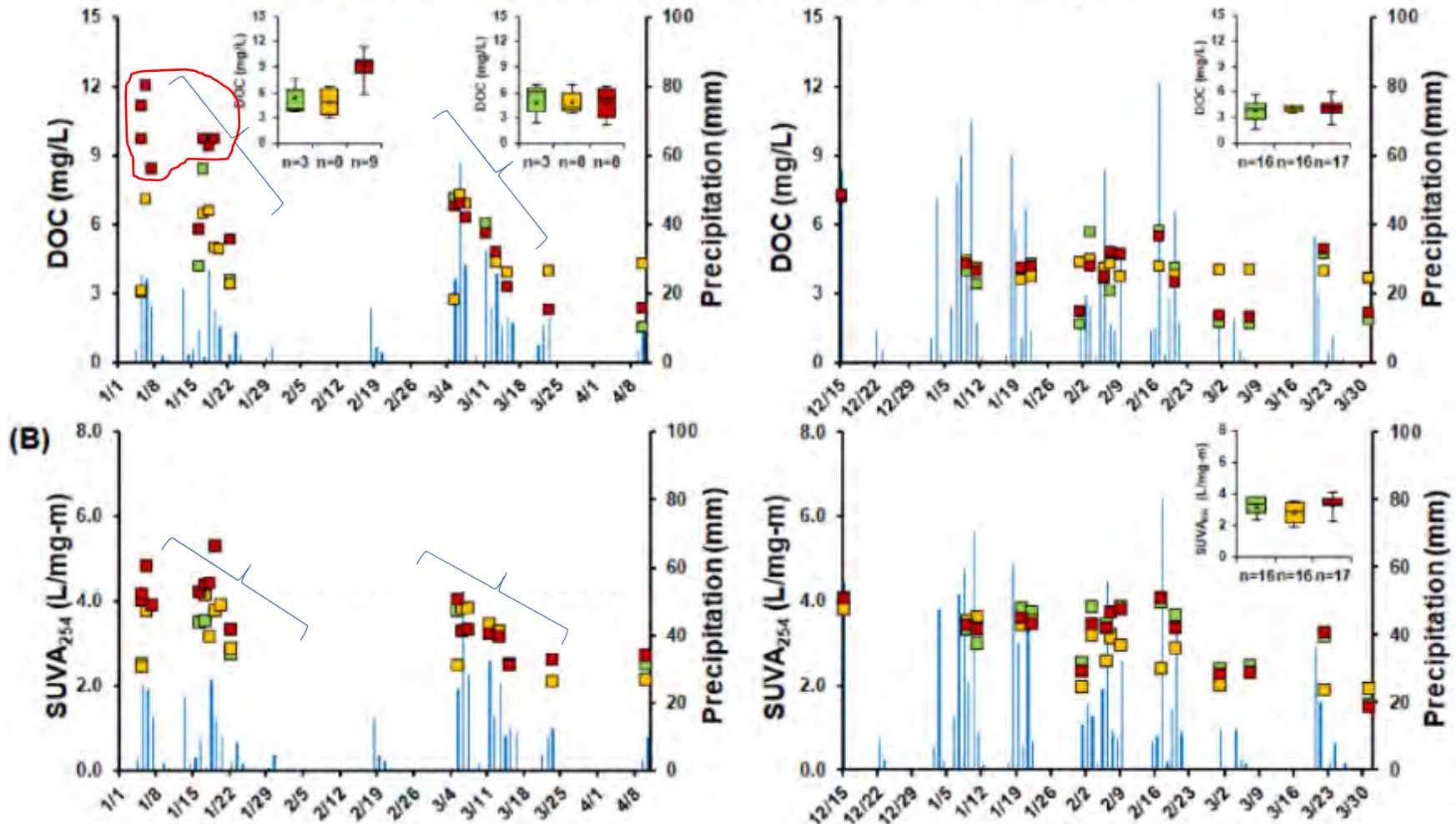
# Dynamics of DBP Precursors in Post-fire Runoffs

## Results – DOC Concentration and SUVA

2015-2016

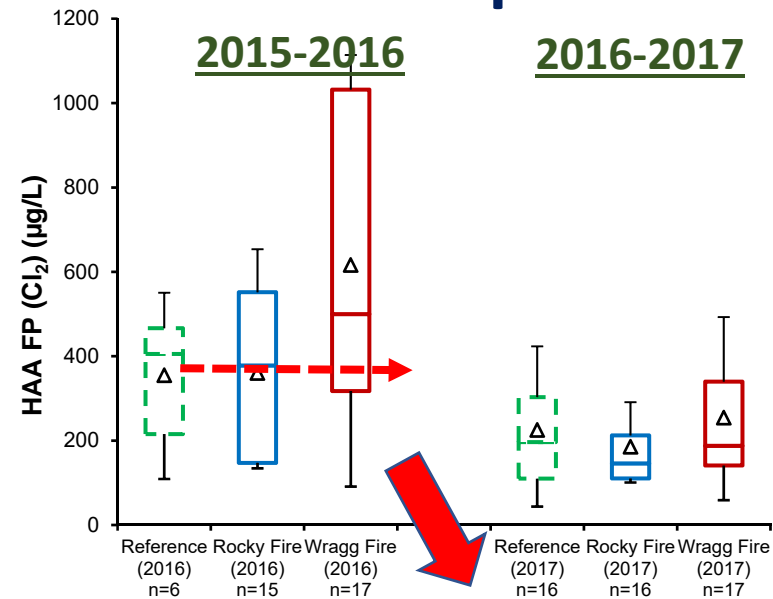
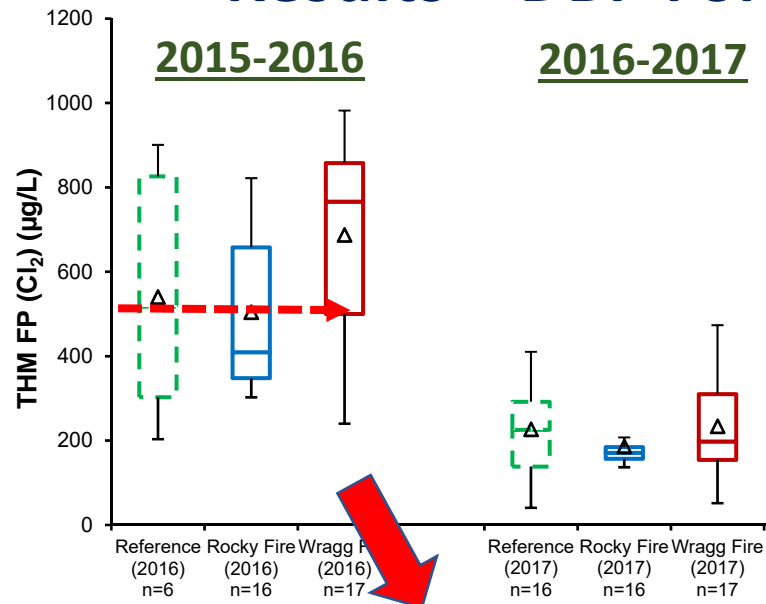
2016-2017

Reference Rocky Fire Wragg Fire — Precipitation



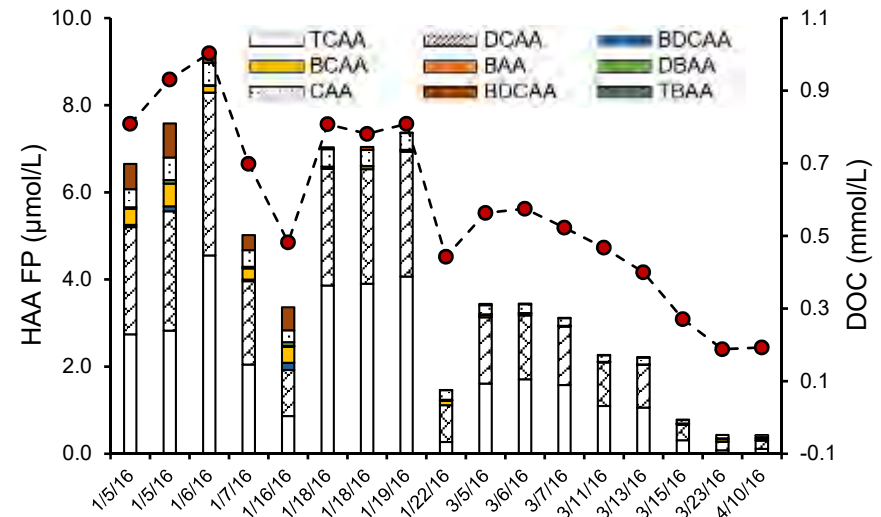
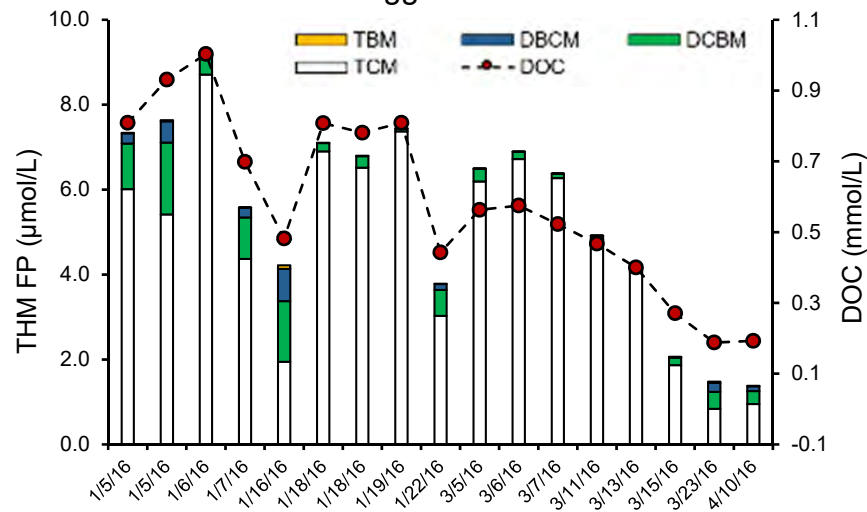
# Dynamics of DBP Precursors in Post-fire Runoffs

## Results – DBP Formation Potential & Speciation



Wragg Fire 2015 - 2016

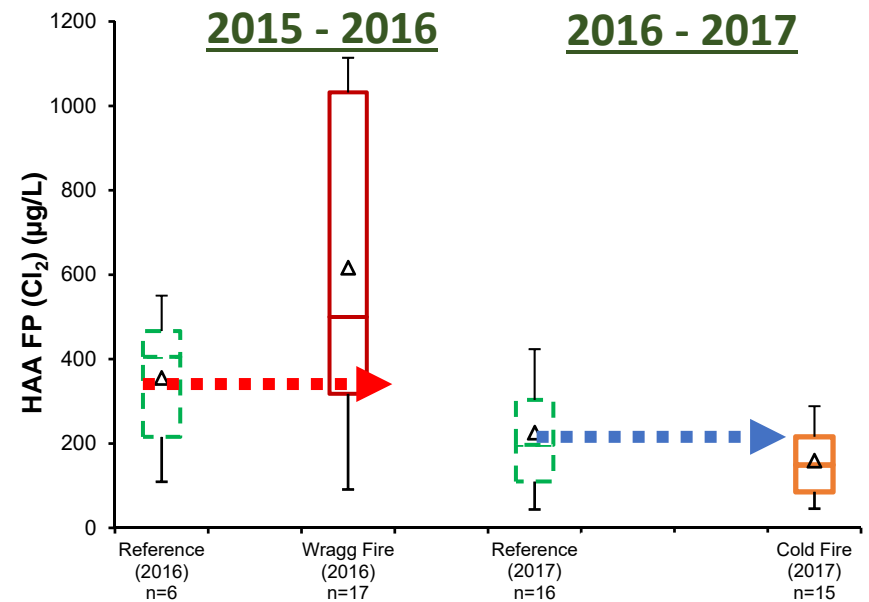
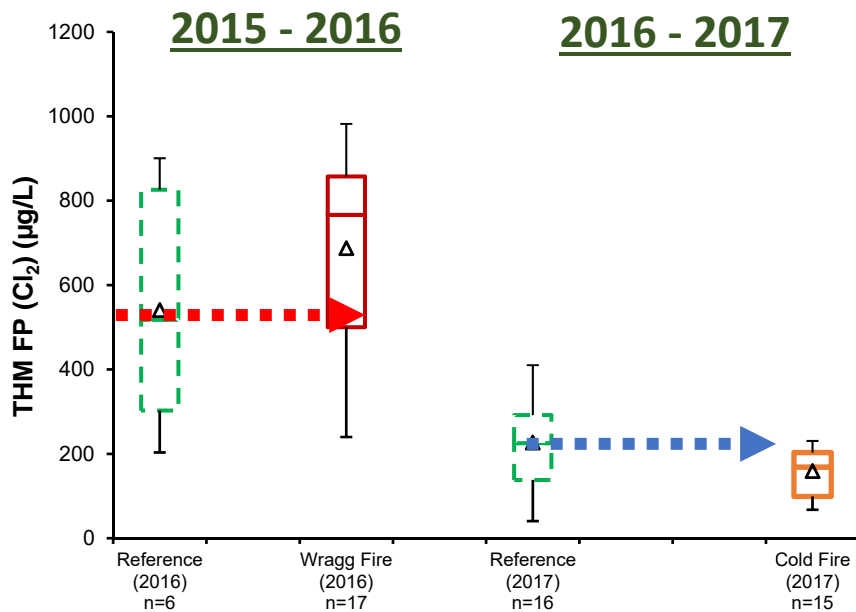
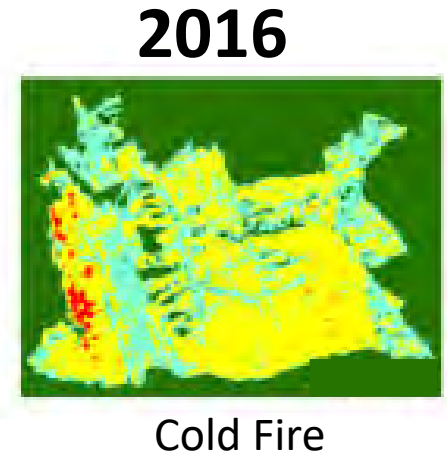
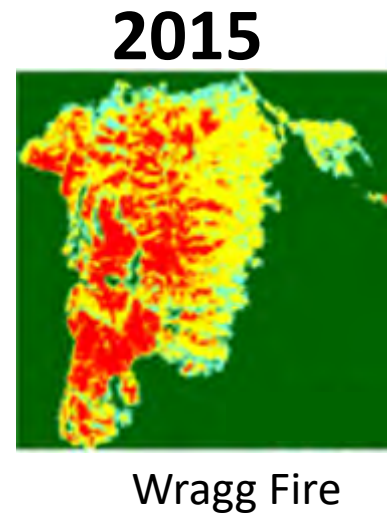
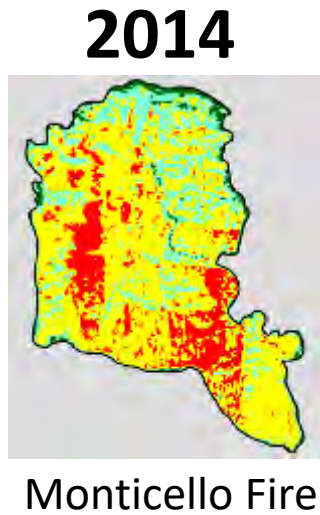
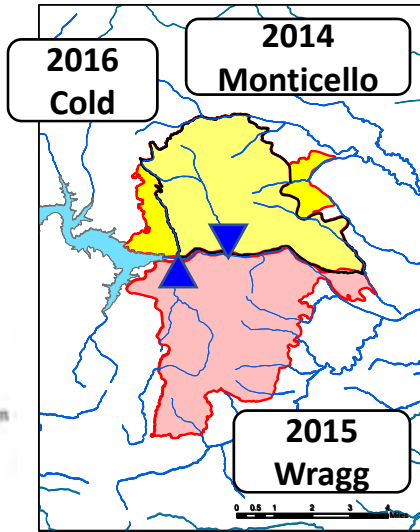
Wragg Fire 2015 - 2016



Br ( $\mu g/L$ )    440 690 117 368 695 73 104 21 189 59 26 10 12 10 49 93 153

440 690 117 368 695 73 104 21 189 59 26 10 12 10 49 93 153

# Wildfire in a Previously Burnt Site



# Impacts of High-severity Wildfires on Water Quality & Formation of Disinfection Byproducts

## ❑ Treatability of Wildfire-Derived DOM

- In the areas we investigated, DOM was more reactive in forming THM and HAA after wildfire
- DOM had low alum removal efficiency

Chen et al. 2020. *Water Research* 184, 116111

## ❑ Dynamics of DBP Precursors in Post-Fire Runoffs

- Increases of DOC and DBP formation in first few post-fire runoffs
- Increases of brominated DBPs in first few post-fire runoffs

Uzun et al. 2020. *Water Research* 181, 115891

## ❑ Wildfire at a Pre-Burnt Site

- No difference in DOC and DBP formation to non-burn reference



# List of Our Publications Related to Wildfire

1. Uzun H, Zheng WB, Olivares CI, Erdem CU, Coates A, and Karanfil T, and Chow AT (2020) Effect of prescribed fires on the export of dissolved organic matter, precursors of disinfection by-products, and water treatability. Accepted by *Water Research* 187: 116385.
2. Chen H, Uzun H, Chow AT, and Karanfil T (2020) Low water treatability efficiency of wildfire-induced dissolved organic matter and disinfection by-product precursors. *Water Research* 184, 116111.
3. Uzun H, Dahlgren RA, Olivares CI, Erdem CU, Karanfil T, and Chow AT (2020) Two-years of post-wildfire impacts on dissolved organic matter, nitrogen, and precursors of disinfection by-products in California stream waters. *Water Research* 181: 115891.
4. Chow AT, Tsai KP, Fegel TS, Pierson DN, and Rhoades CC (2019) Lasting effects of wildfire on disinfection byproduct formation in forest catchments. *Journal of Environmental Quality* 48: 1826-1834.
5. Olivares C, Zhang WB, Uzun H, Cargi E, Majidzadeh H, Trettin C, Karanfil T, and Chow AT (2019) High temporal resolution optical in-situ sensors capture dissolved organic carbon dynamics after wildland fire in blackwater forest ecosystems. *International Journal of Wildland Fire (Special Issue – Forests, Flames and Faucets: Influence of Wildfire on Water Quality and Watershed Processes)* 28: 761-768.
6. Majidzadeh H, Chen H, Coates TA, Tsai KP, Olivares C, Trettin C, Uzun H, Karanfil T, and Chow AT (2019) Periodic prescribed fire is an effective watershed management strategy to reduce organic matter export and disinfection byproduct precursors in source water. *International Journal of Wildland Fire (Special Issue – Forests, Flames and Faucets: Influence of Wildfire on Water Quality and Watershed Processes)* 28: 804-813 & 822.
7. Tsai KP, Uzun H, Chen H, Karanfil T, and Chow AT (2019) Control wildfire-induced *Microcystis aeruginosa* blooms by copper sulfate: Tradeoffs between reducing algal organic matter and promoting disinfection byproduct formation. *Water Research* 158: 227-236.
8. Abney T, Kuhn T, Chow AT, Hockaday W, Fogel M, Berhe A (2019) Pyrogenic carbon erosion after the Rim Fire, Yosemite National Park: role of fire severity and slope on erosional transport of PyC. *Journal of Geophysical Research - Biogeosciences*: 2018JG004787.
9. Chen H, Chow AT, Li XW, Ni HG, Dahlgren RA, Zeng H, and Wang JJ (2018) Wildfire burn intensity affects the quantity and speciation of PAH in soils. *ACS Space and Earth Chemistry* 2: 1262-1270, [Cover story of the issue].
10. Ku P, Tsui MTK, Nie XP, Chen H, Hoang TC, Blum JD, Dahlgren RA, and Chow AT (2018) Origin, reactivity, and bioavailability of mercury in wildfire ash. *Environmental Science & Technology* 52: 14149-14157.
11. Coates TA, Hagan DL, Aust M, Johnson A, Keen C, Chow AT, and Dozier JH (2018) Mineral soil chemical properties as influenced by long-term use of prescribed fire with differing frequencies in a southeastern coastal plan pine forest. *Forests* 9(12): 739.
12. Rhoades C, Chow AT, Covino T, Fegel T, Pierson T, and Rhea A (2018) The legacy of a severe wildfire on stream nitrogen and carbon in headwater catchments *Ecosystems* 21: 1-15.

# List of Our Publications Related to Wildfire

13. Coates T, Chow AT, Hagan DL, Waldrop TA, Wang GG, Bridges Jr. WC, Rogers MR, and Dozier JH (2018) Thermocouple probe orientation affects prescribed fire behavior estimation. *Journal of Environmental Quality* 47(1): 170-176.
14. Coates T, Chow AT, Hagan D, Wang GG, Bridges Jr. W, and Dozier J (2017) Frequent prescribed burning as a long-term practice in longleaf pine forests does not affect detrital chemical composition. *Journal of Environmental Quality* 46: 1020-1027.
15. Tsai KP, Uzun H, Karanfil T, and Chow AT (2017) Dynamic changes of disinfection byproduct precursors following exposures of *Microcystis aeruginosa* to wildfire ash solutions. *Environmental Science & Technology* 51(15): 8272-8282.
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19. Wang JJ, Dahlgren RA, Ersan M<sup>&</sup>, Karanfil T, Chow AT (2015) Wildfire altering terrestrial precursors of disinfection byproducts in forest detritus. *Environmental Science & Technology* 49: 5921-5929.
20. Majidzadeh H, Wang JJ, and **Chow AT** (2015) Forest fire alters dissolved organic matter and disinfection byproduct precursors exports from forested watersheds - Part I: A controlled laboratory study. In, *Disinfection Byproducts in Drinking Water - Occurrence, Formation, Health Effects, and Control*. Karanfil et al. Eds., American Chemical Society Symposium Book, Chapter 15, pp. 271-292, Washington DC, USA.
21. Tsai KP, Rogers MF, **Chow AT**, and Diaz F (2015) Forest fire alters dissolved organic matter and disinfection byproduct precursors exports from forested watersheds - Part II: A controlled field study. In, *Disinfection Byproducts in Drinking Water - Occurrence, Formation, Health Effects, and Control*. Karanfil et al. Eds., American Chemical Society Symposium Book, Chapter 16, pp. 293-306, Washington DC, USA.

## Outreach Products

YouTube video:

- 1) Wildfire Impact on Drinking Water Quality: Link - <https://www.youtube.com/watch?v=XoEuteiGDGk>
- 2) Prescribed Fire Improves Drinking Water Quality: [https://youtu.be/v\\_BOrtPI8z0](https://youtu.be/v_BOrtPI8z0)

# Acknowledgement

**National Priorities: Systems-Based Strategies to Improve The Nation's Ability to Plan And Respond to Water Scarcity and Drought Due to Climate Change**



**Fuel Reduction Techniques as Effective Forested Watershed Management Practices against Wildfire:  
Drinking Water Quality Aspects (USEPA Grant Number: R835864)**

## Co-Investigators

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US Forest Service: [Dr. Carl Trettin](#)

South Carolina Department of Natural Resources: [Mr. Jamie Dozier](#)

Environmental Molecular Science Laboratory (PNNL): [Dr. Errol Robinson](#)  
[Dr. Sarah Burton](#)

## Decision Support for Drinking Water Utilities Impacted by Wildfire



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Dr. Rosario-Ortiz is a professor of environmental engineering and the director of the Environmental Engineering Program at the University of Colorado Boulder. His research centers around environmental chemical processes and implications of forest fires on water quality and treatment. Dr. Rosario-Ortiz holds a D.Env. in environmental science and engineering from UCLA.



# Decision Support for Drinking Water Utilities Impacted by Wildfire

**Investigators:** Kenan Ozekin<sup>1</sup>; Balaji Rajagopalan<sup>2,3</sup>, Joseph Kasprzyk<sup>2</sup>, Ben Livneh<sup>2,3</sup>, Fernando Rosario-Ortiz<sup>2</sup>, R Scott Summers<sup>2</sup>

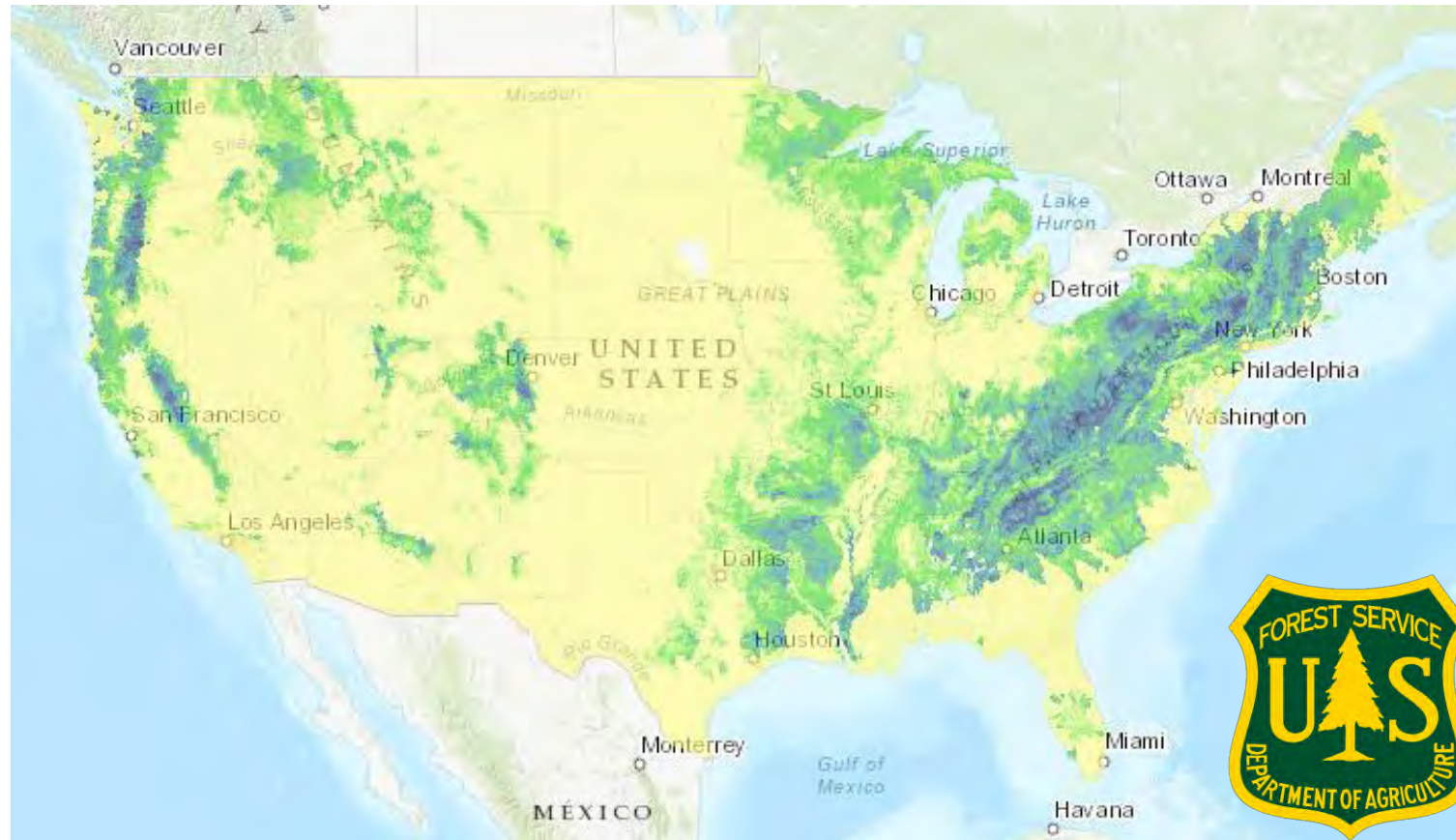
1: The Water Research Foundation

2: Civil, Env., Arch. Engineering, University of Colorado Boulder

3: Cooperative Institute for Research in Environmental Sciences

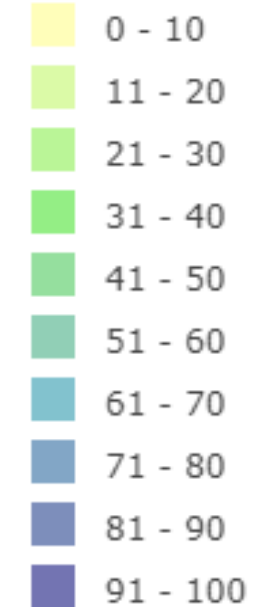
**Presented By:** Joseph Kasprzyk and Fernando Rosario-Ortiz

# Major US cities are dependent on surface drinking water which originate from forested catchments.



*Index of forest importance to surface drinking water*

## National Extent



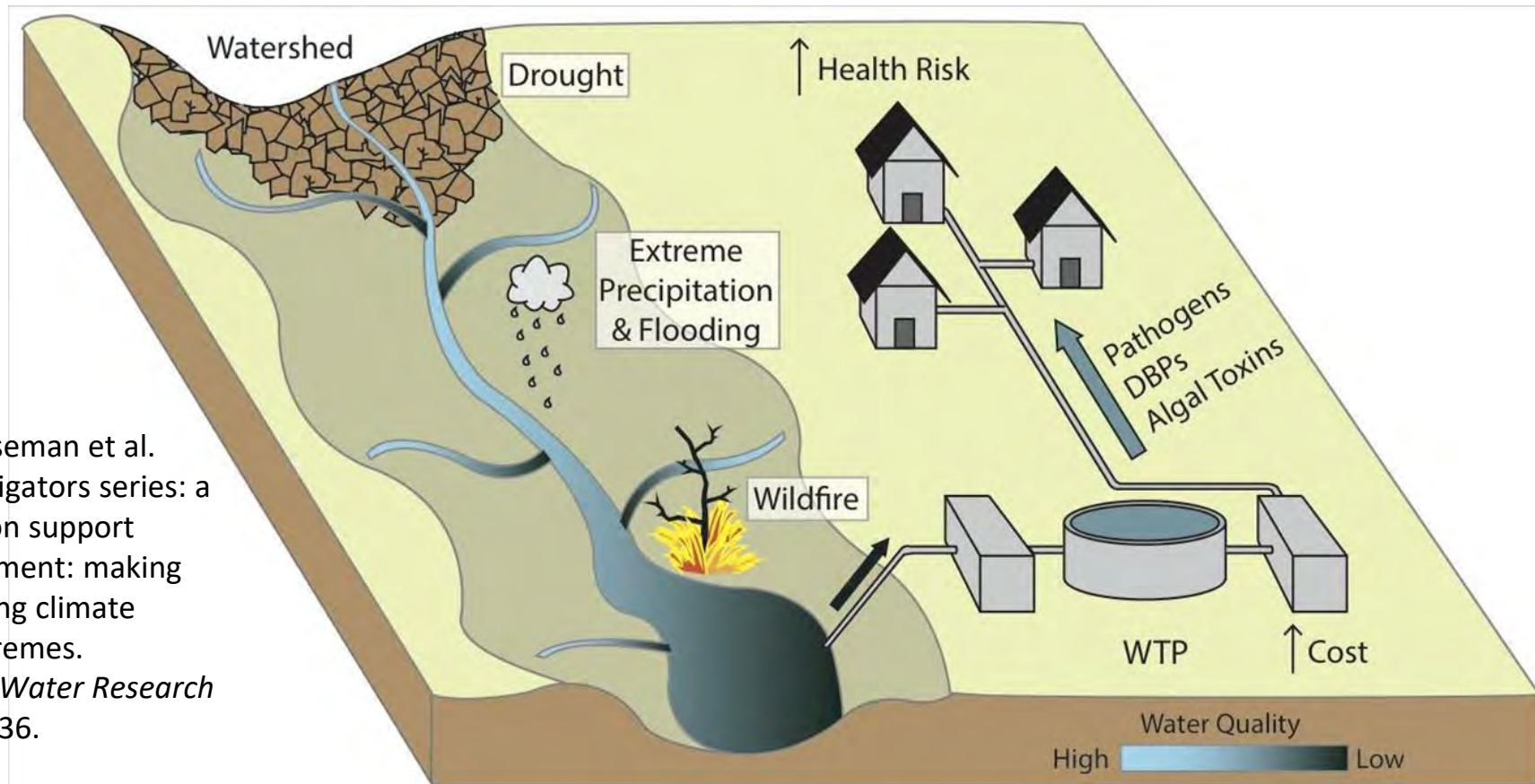
# What does this mean for our water supply?



[Bladon et al. 2012]

- Wildfires can release...
  - Sediments
  - Nutrients
  - Heavy metals
- Water quality degradation (taste, odor, color)
- Decrease life-span of reservoirs

# Our research integrates source watersheds, water quality, and water treatment plants.



**Project publication:** Raseman et al. (2017). Emerging investigators series: a critical review of decision support systems for water treatment: making the case for incorporating climate change and climate extremes. *Environmental Science: Water Research & Technology*, 3(1), 18–36.



Fort Collins is a mid-sized city, serving 133,000 people between its two drinking water sources.



Cache la Poudre River

[[visitftcollins.com](http://visitftcollins.com)]



Horsetooth Reservoir

[Northern Water]

In 2012, the High Park fire burned 90,000 acres just west of Fort Collins—the 3<sup>rd</sup> largest wildfire in state history.

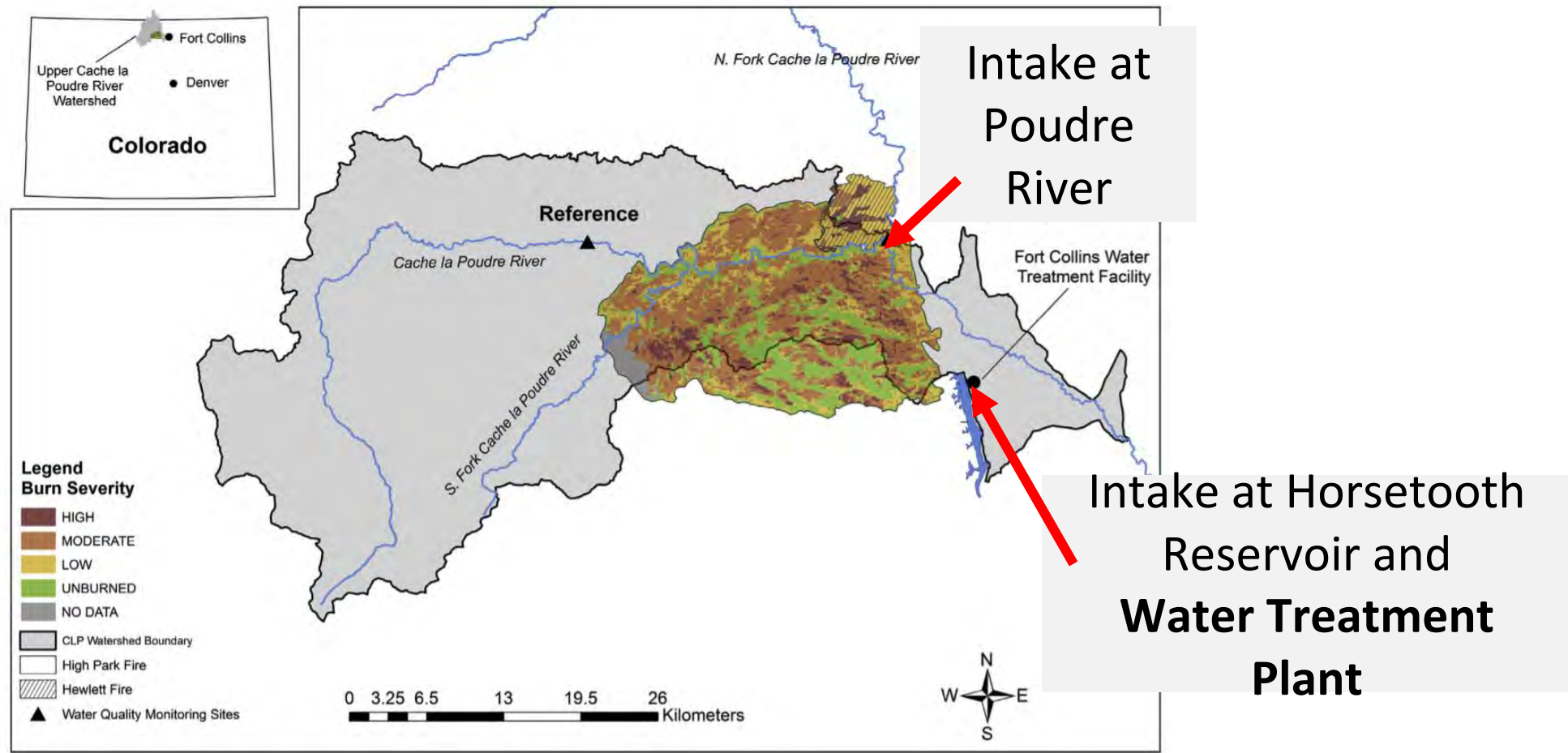


[City of Fort Collins]



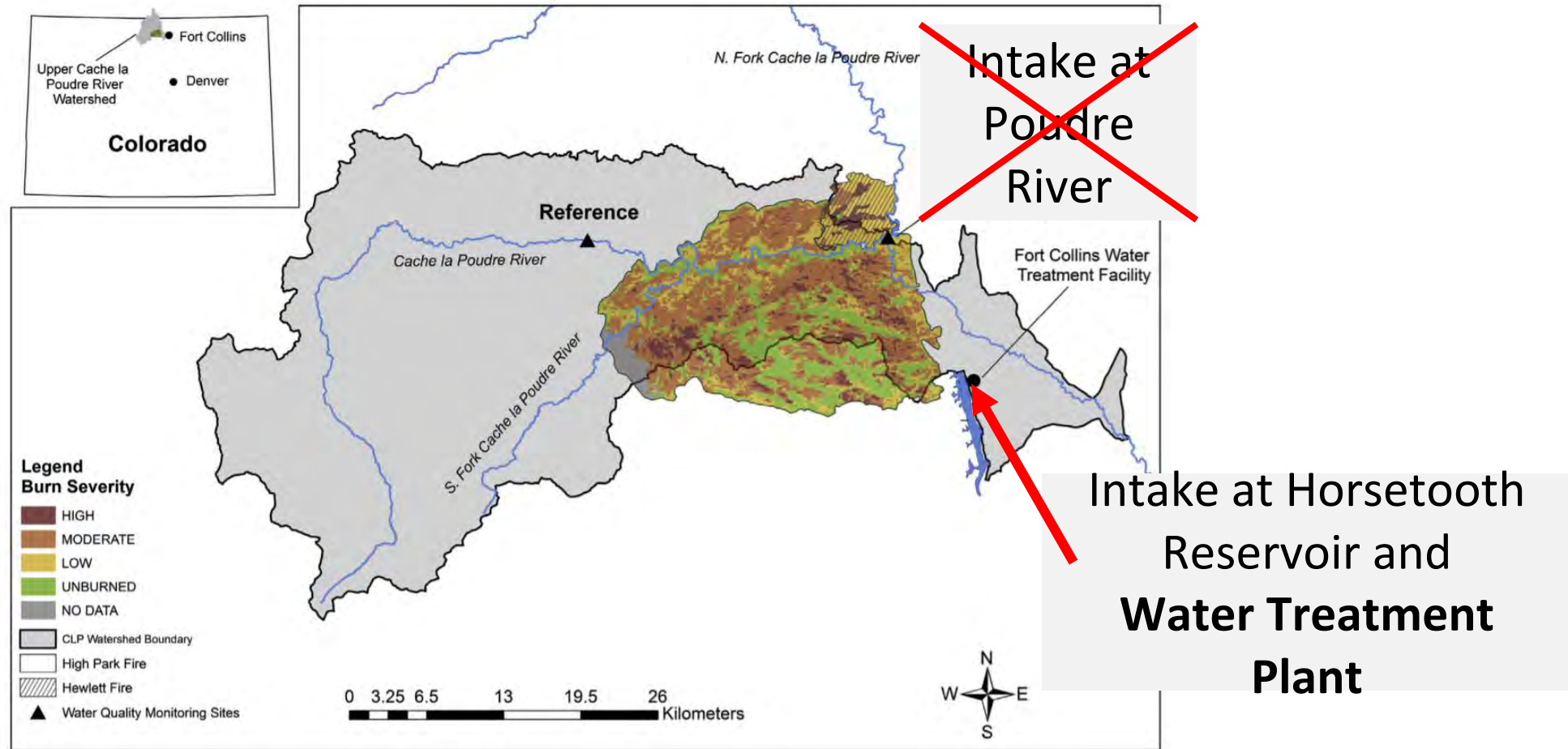
[NASA]

# The Poudre watershed was burned, compromising water quality in Poudre River.



[Hohner et al. 2016]

Due to elevated levels of turbidity, the city closed the intake to Poudre River for nearly 100 days.



# Meanwhile, back at the universities...



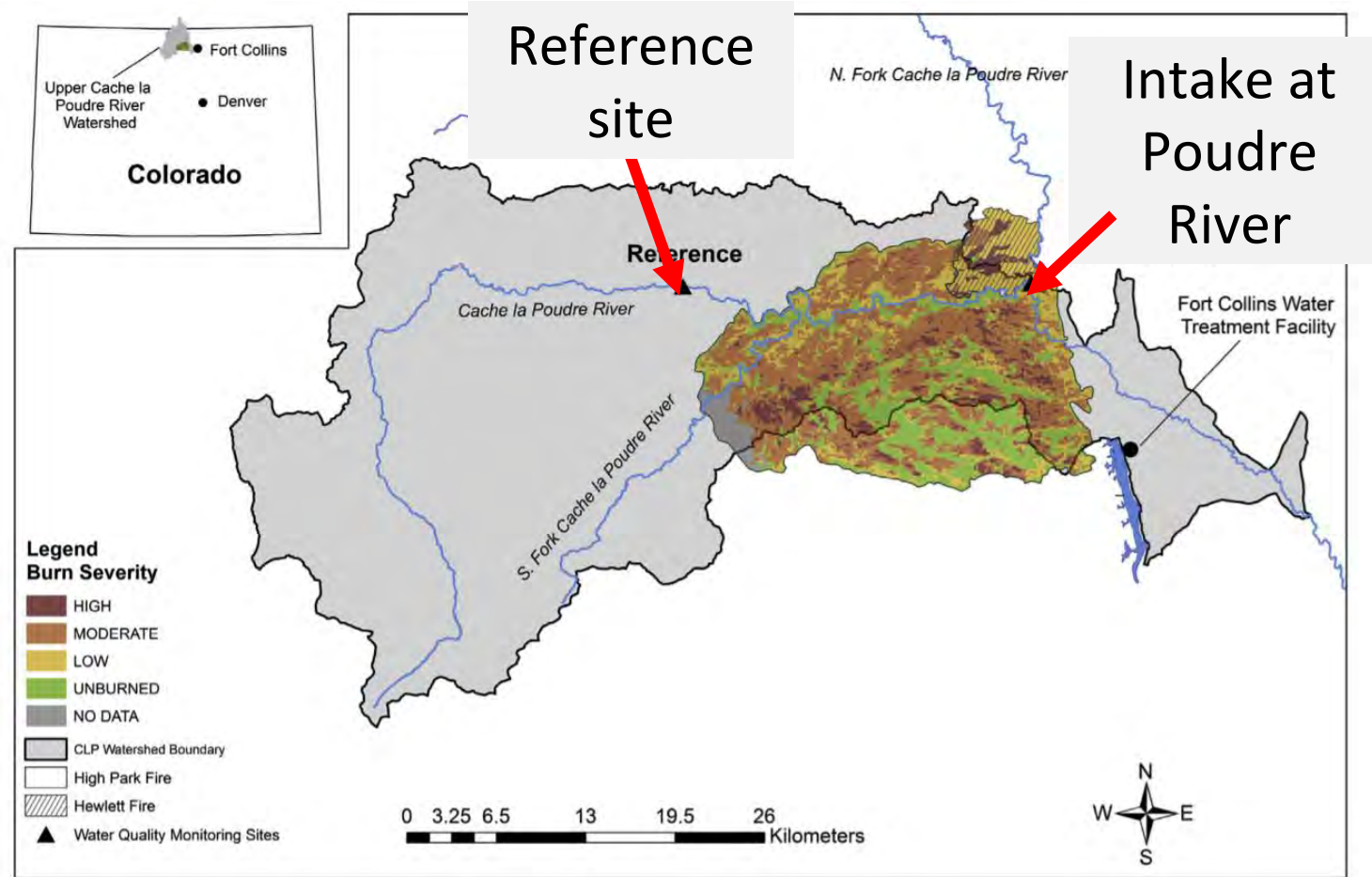
Amanda Hohner



Fernando Rosario-Ortiz



By comparing water quality at a reference (unburned) site and the intake, researchers could isolate impact of fire.



To compare water quality at the two sites, a pairwise difference was calculated.

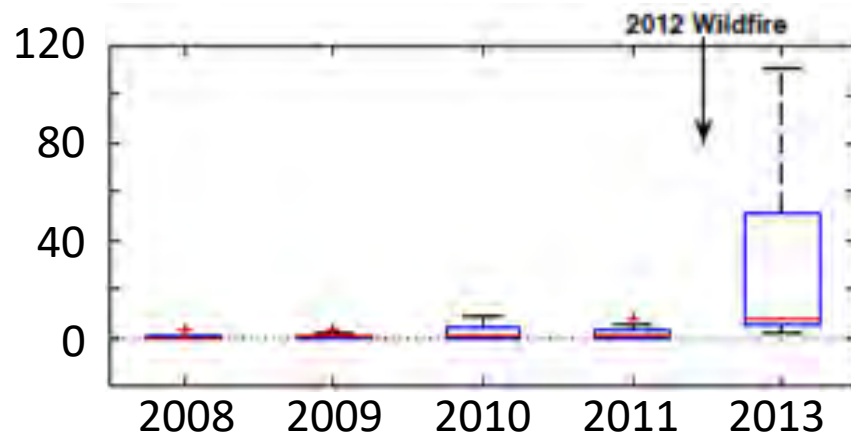
Burned site: 2.1 ntu

Reference site: 1.0 ntu

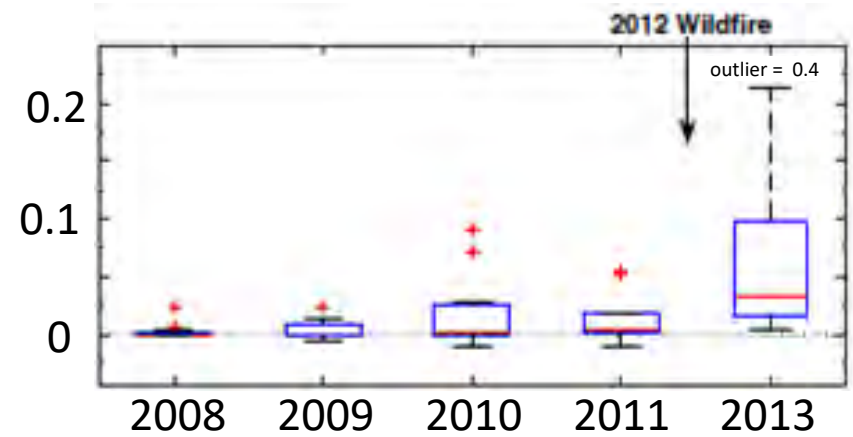
Pairwise difference:  $2.1 - 1.0 = \mathbf{1.1 \text{ ntu}}$

Found significant differences in turbidity, nutrients, and organic carbon between the two sites and increased variability.

**Turbidity  
Difference  
(ntu)**



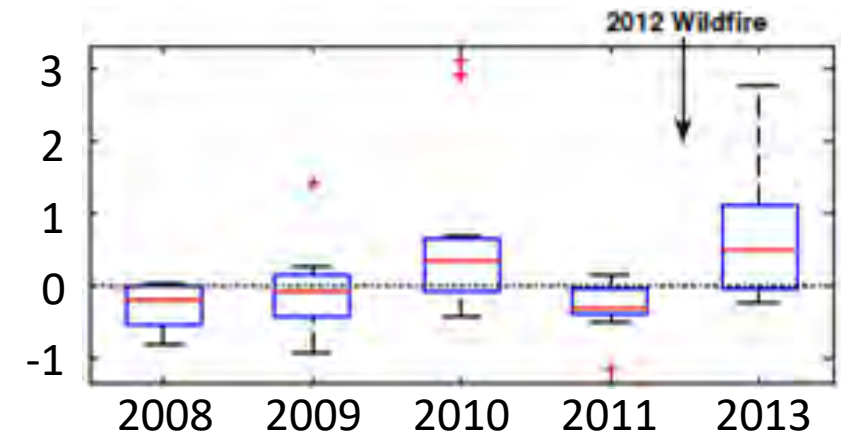
**TP  
Difference  
(mgP/L)**



**TN  
Difference  
(mgN/L)**



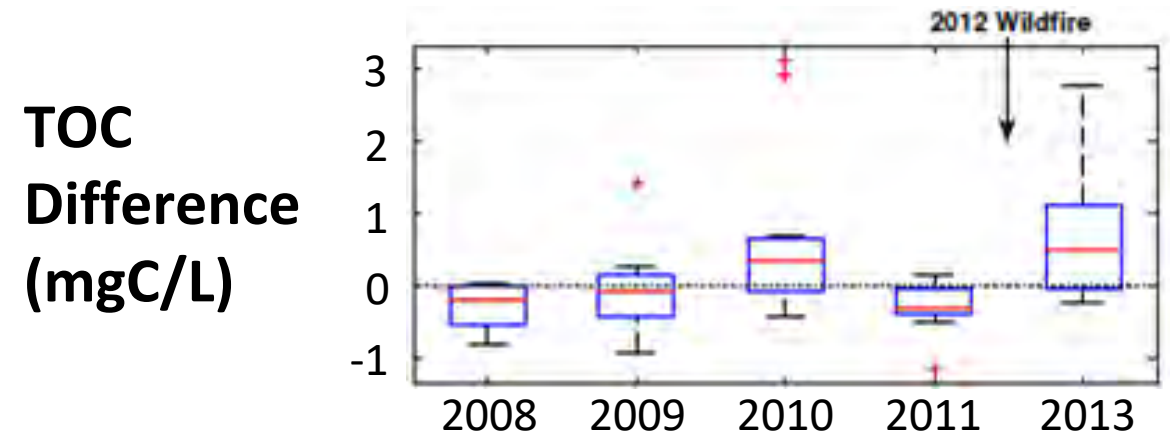
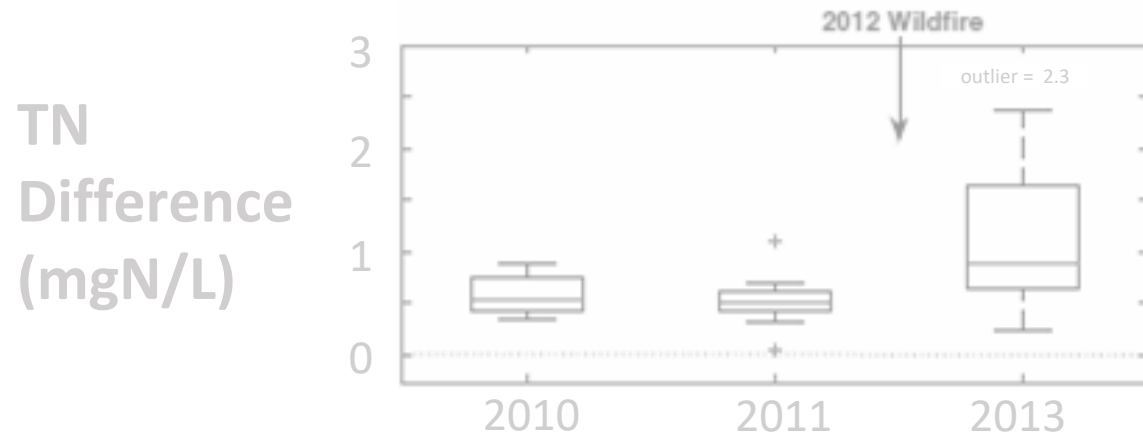
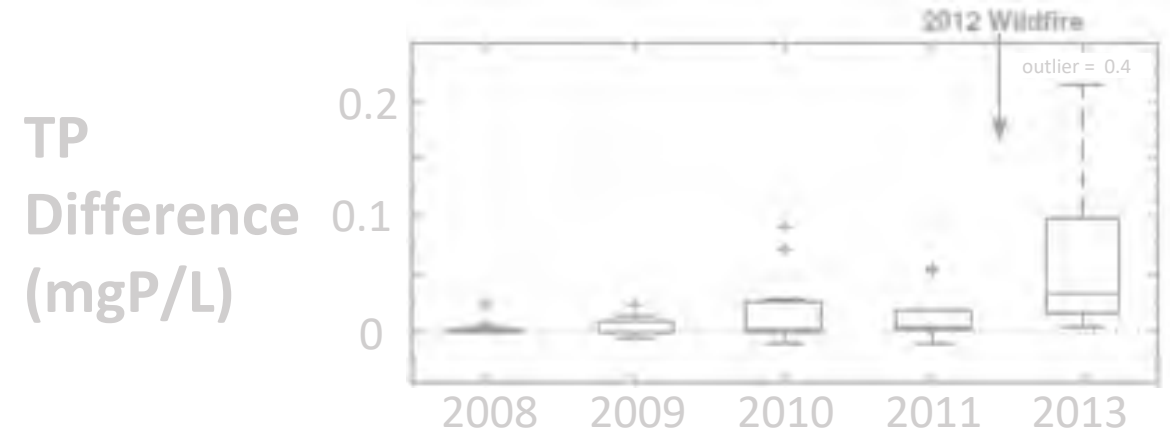
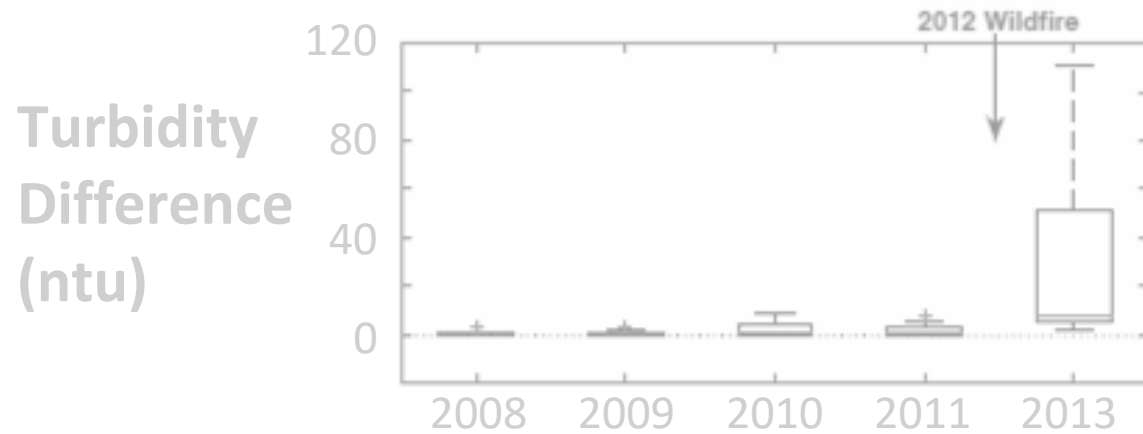
**TOC  
Difference  
(mgC/L)**



[Hohner et al. 2016]



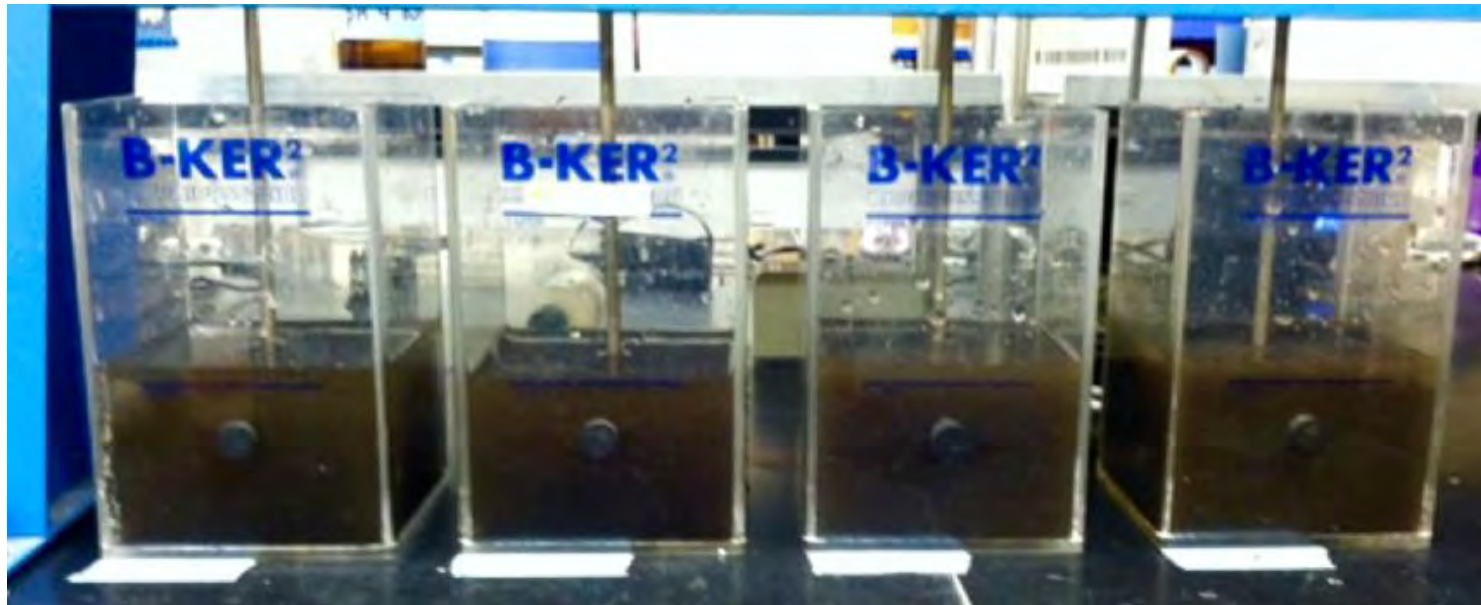
Found significant differences in turbidity, nutrients, and organic carbon between the two sites and increased variability.



[Hohner et al. 2016]

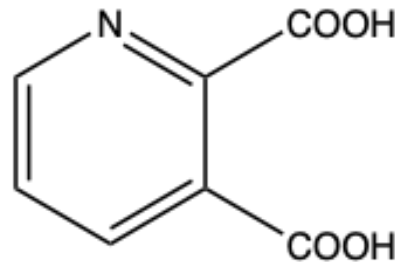
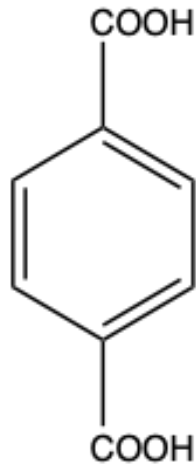
Treatability experiments, including DBP formation potential and jar tests, revealed that most samples could be treated but had:

- High costs due to **increased coagulant doses**
- **High levels of DBPs** (disinfection byproducts)



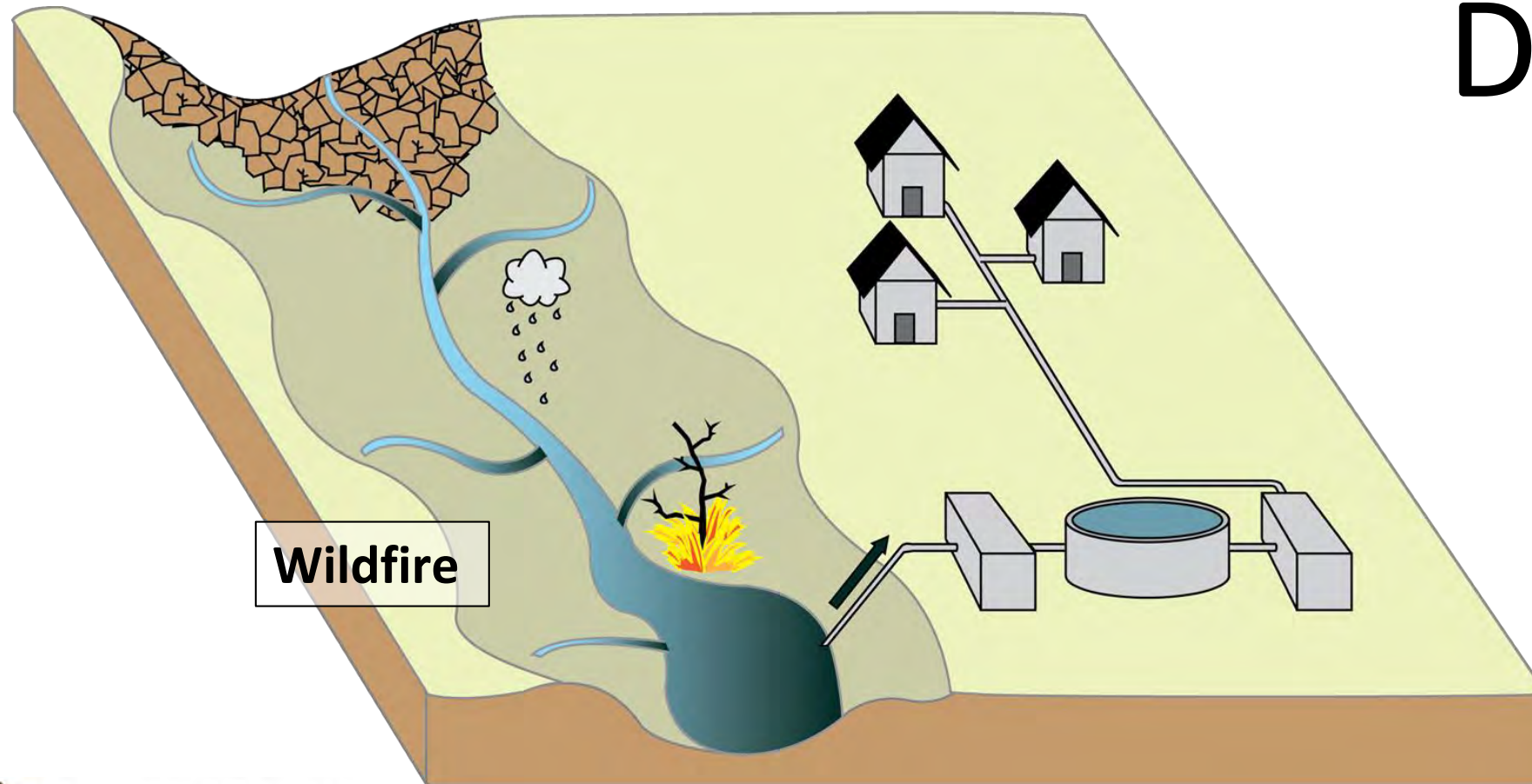
More recently, we have evaluated the presence of other organic compounds:

- Benzoic acid-derivatives, pyridines, etc.
- Compounds found in simulated samples and also in the field



Thurman et al (2020). Molecular Identification of Water-Extractable Organic Carbon from Thermally Heated Soils: C-13 NMR and Accurate Mass Analyses Find Benzene and Pyridine Carboxylic Acids. *Environmental Science and Technology*, 54, 5, 2994-3001

Simulation can be used to test management strategies for impacted water quality scenarios.



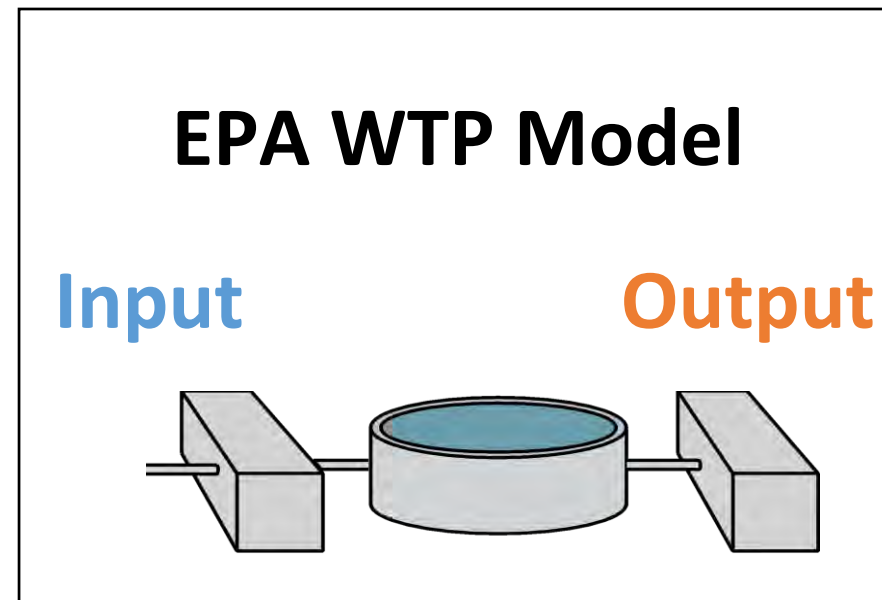
DBPs?

Cost?

Raseman et al (2020). Multi-objective optimization of water treatment operations for disinfection byproduct control. *Environmental Science: Water Research and Technology*, 6, 702-714

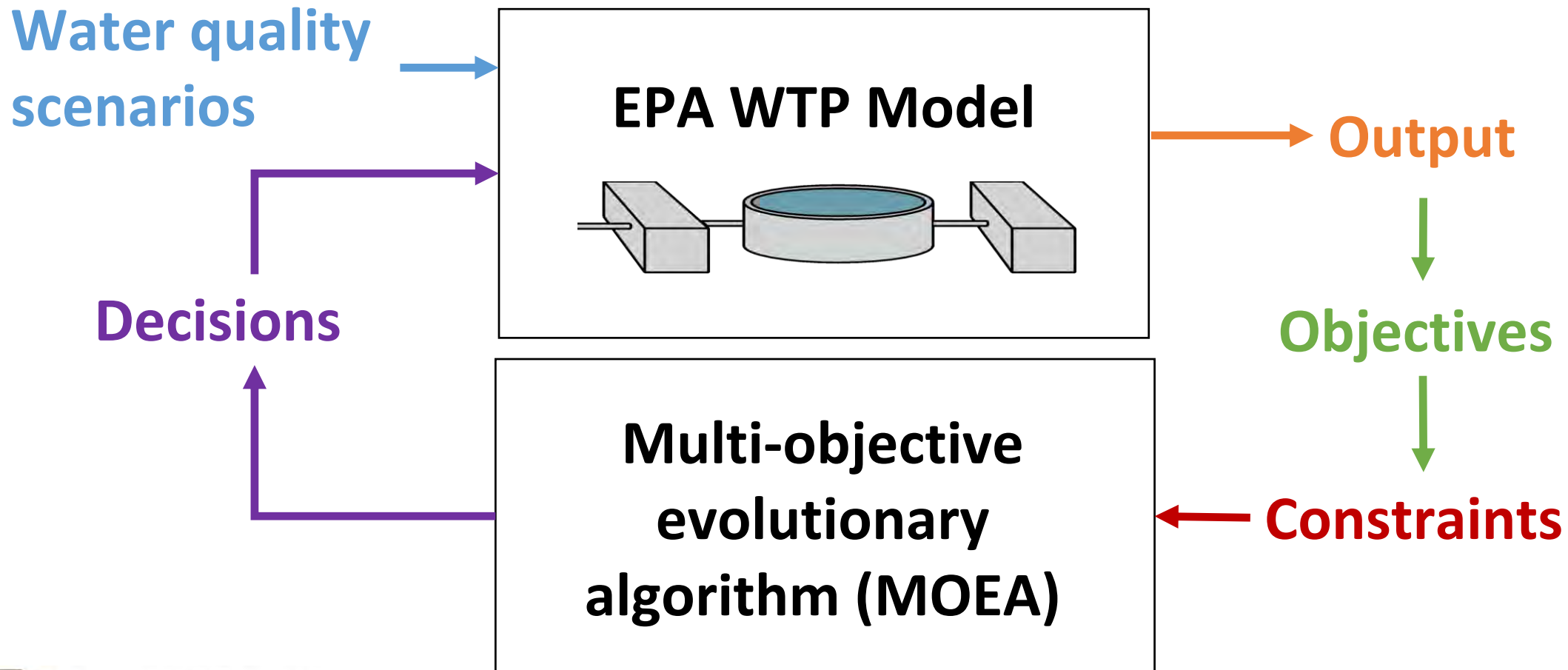
# Operational policies, such as chemical dosing strategies, can impact performance.

- Raw water quality
- Treatment train
- Distribution system
- Chemical doses (decisions)

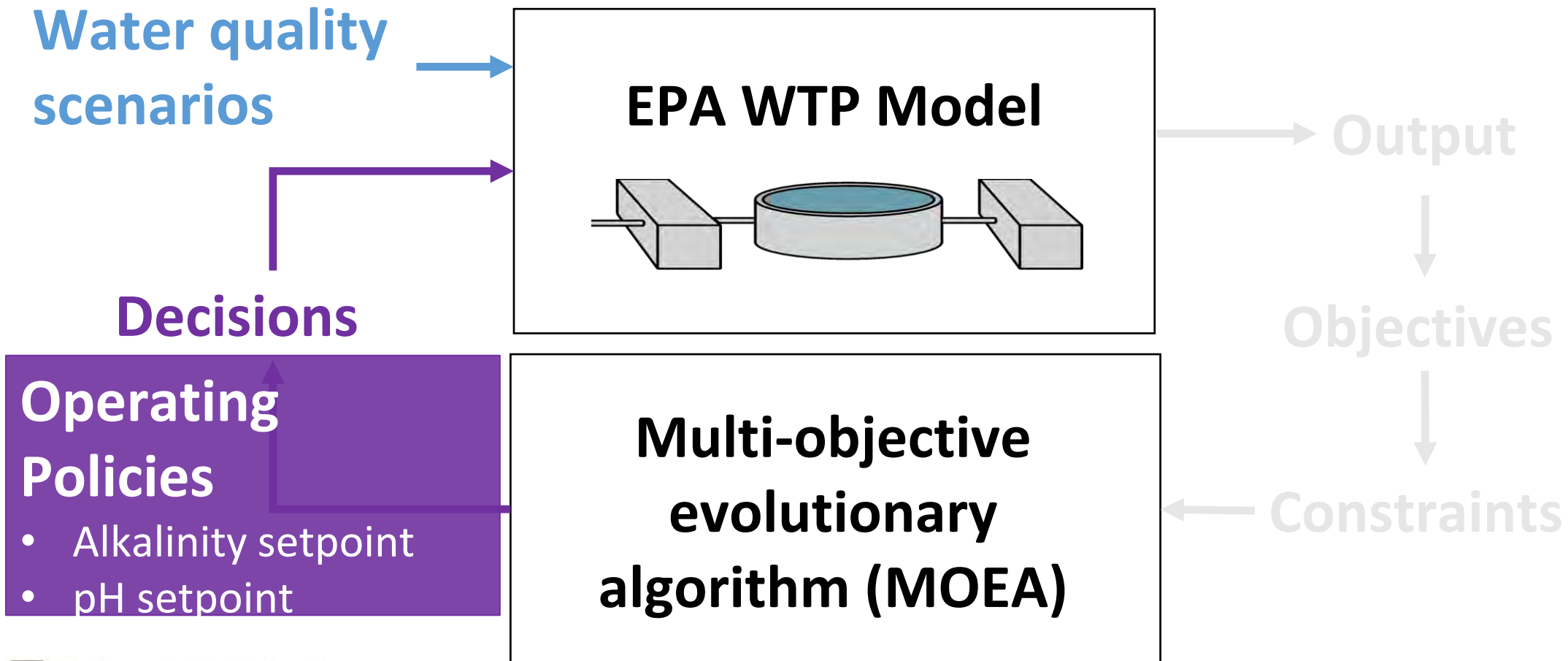


- Finished water quality
- DBPs
- Chemicals used

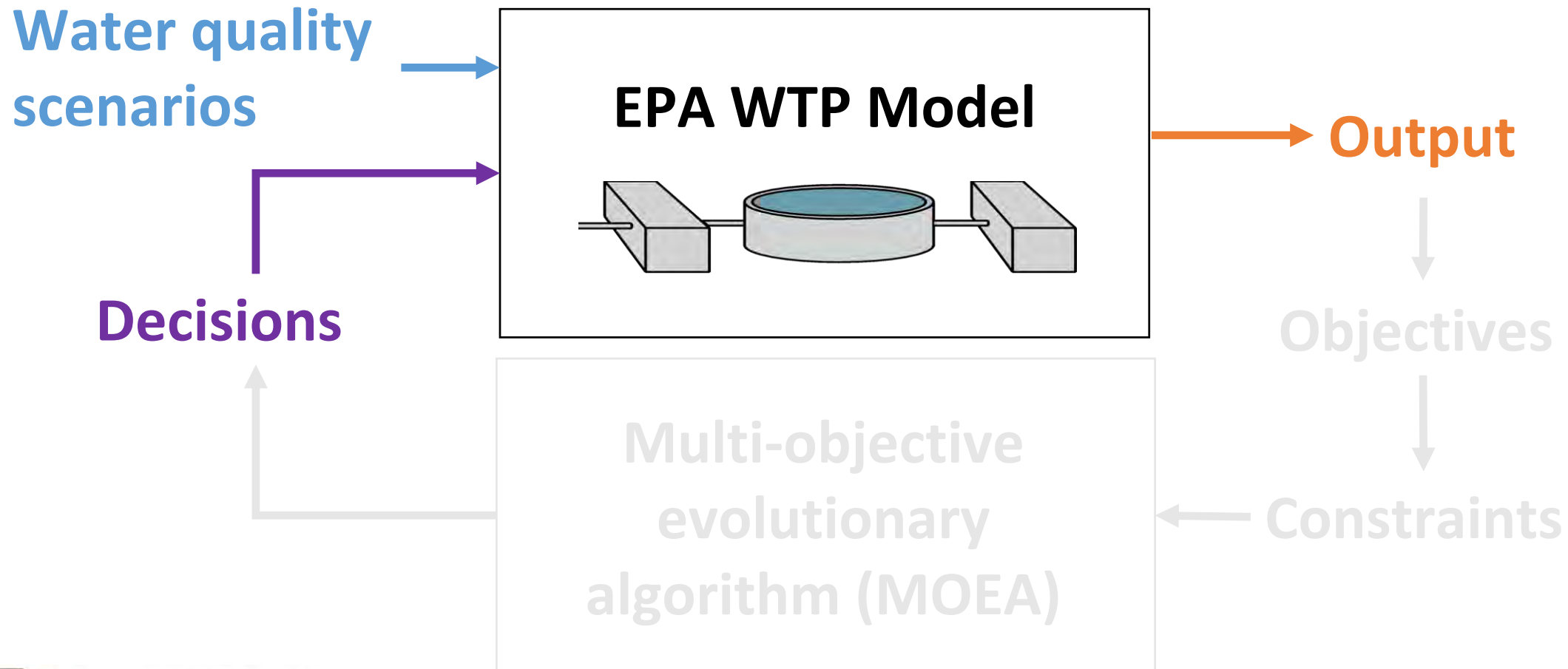
Our decision support system (DSS) tests thousands of operating policies to find the top performers.



# Step 1: The MOEA suggests operating policies which are input into the model.

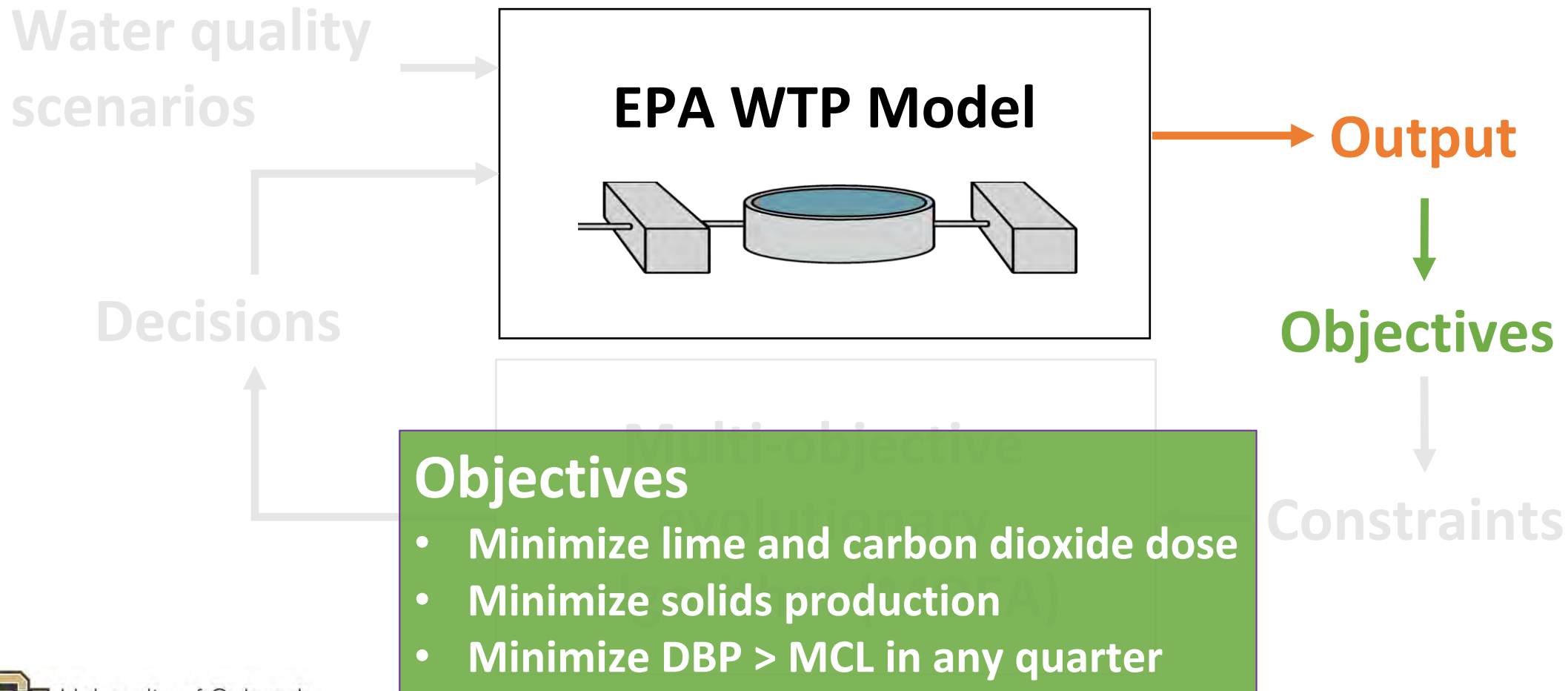


Step 2: The WTP model tests the operating policy on a number of water quality scenarios.

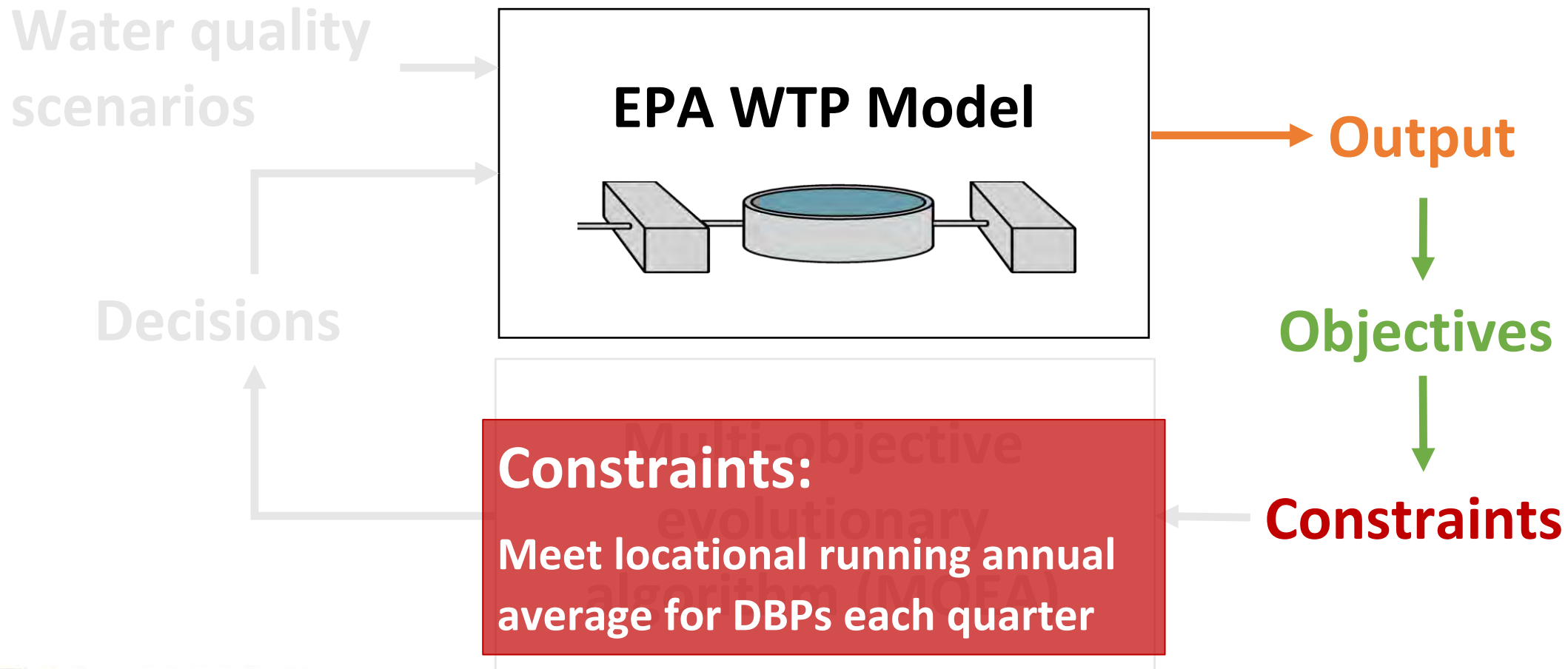




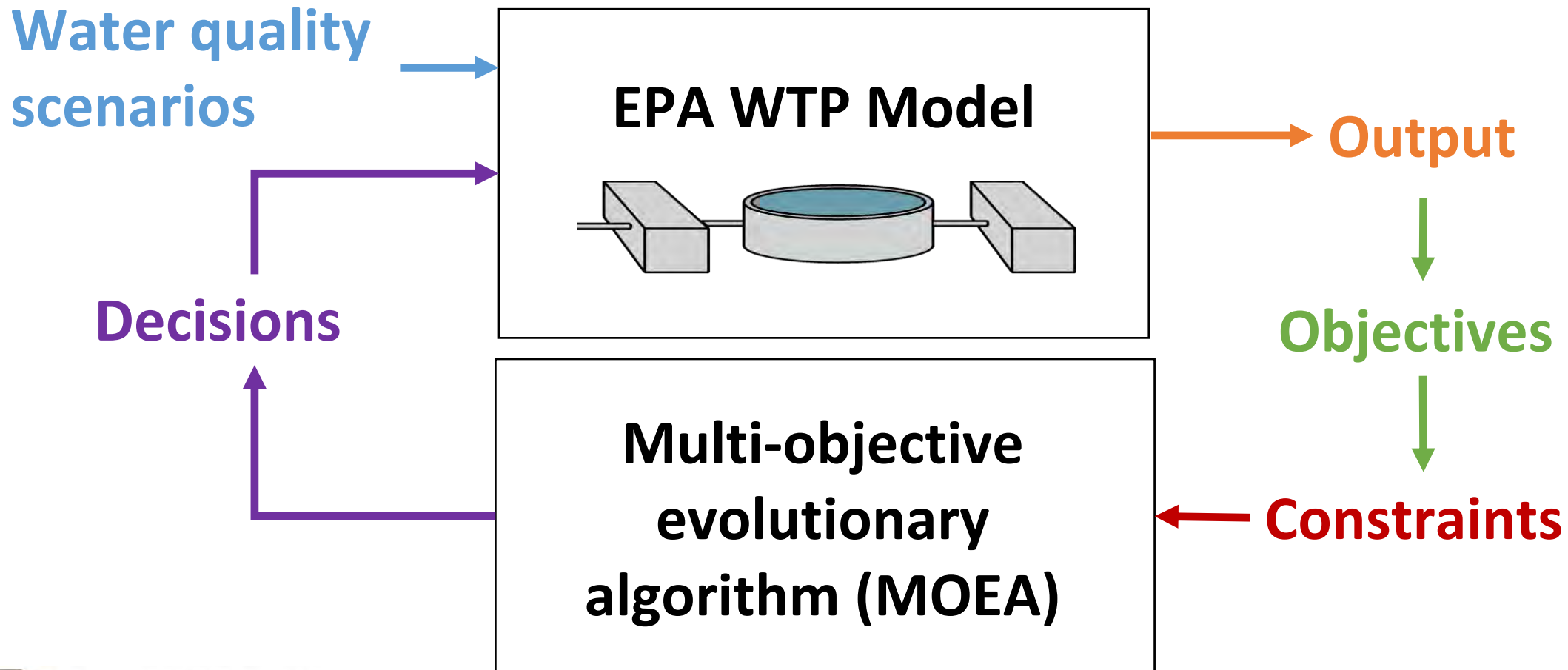
# Step 3: Model outputs are translated into objectives (measures of performance).



# Step 4: Operations which do not meet constraints (restrictions on performance) are filtered out.

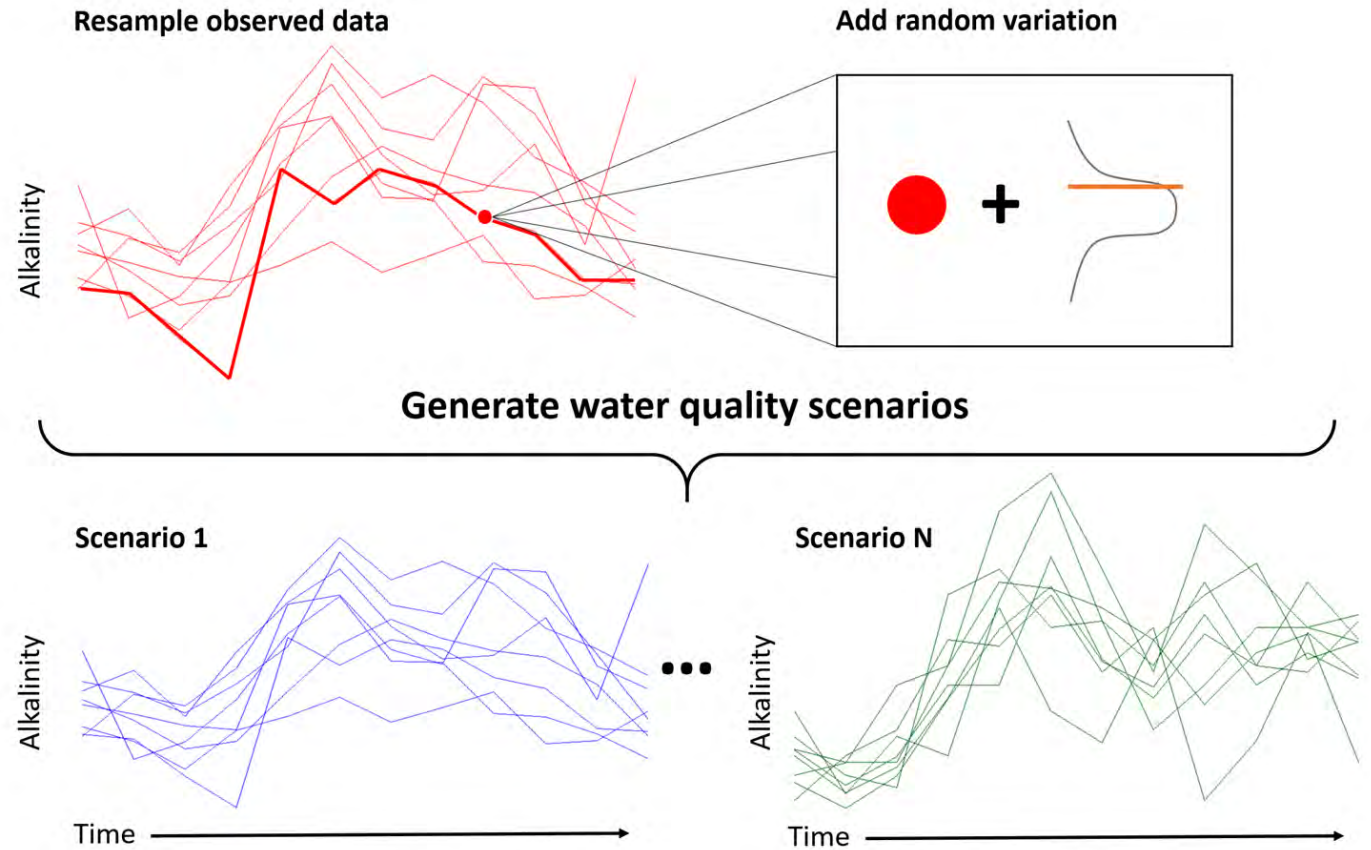


Step 5: The process repeats and the MOEA mimics evolution to identify the best operating policies.

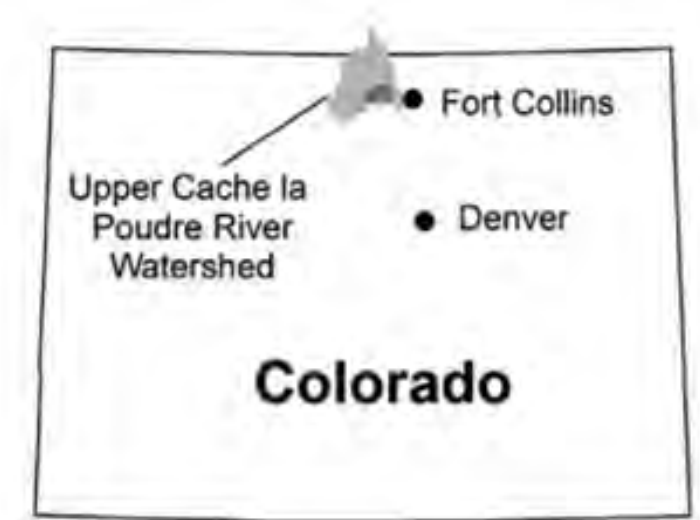
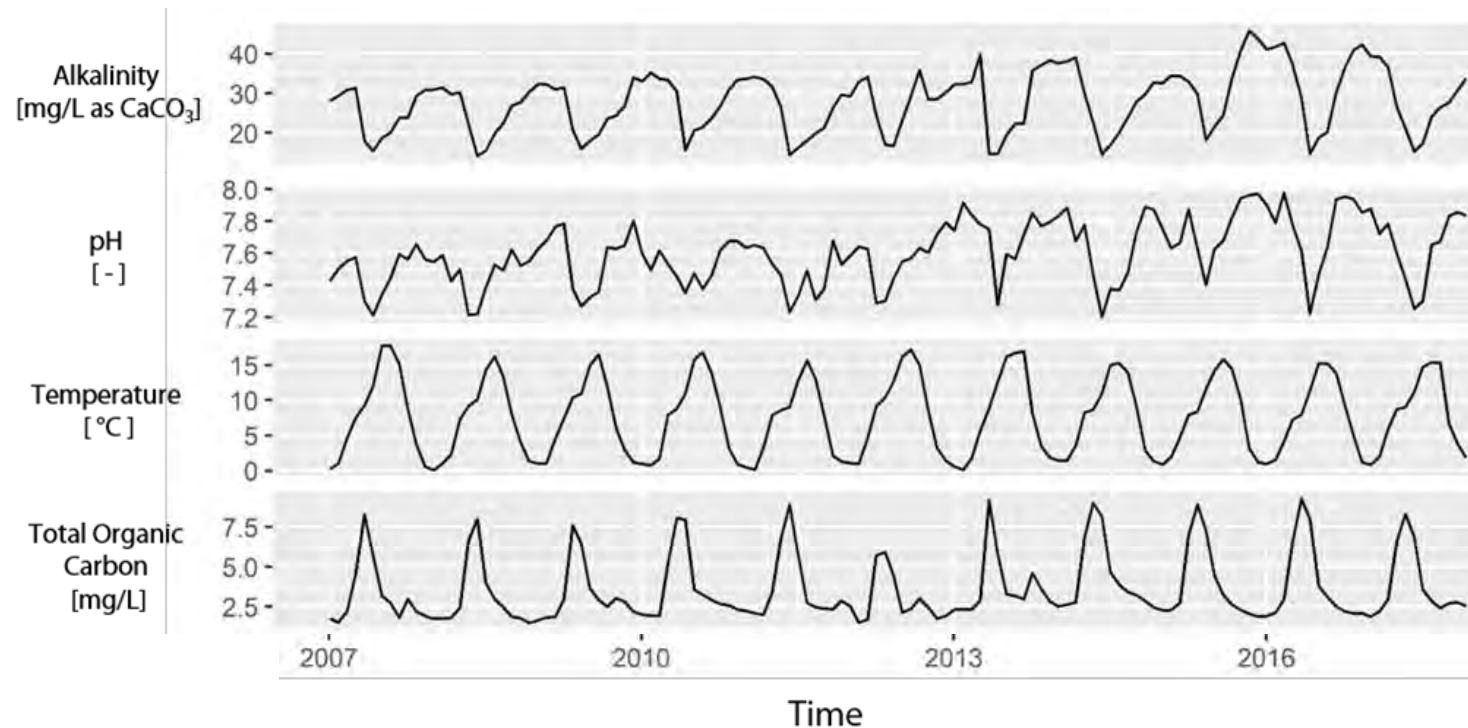


# Modified $k$ -Nearest Neighbor algorithm

- Want to capture important statistics of observed data
  - **Median and variance**
  - **Seasonality**
  - **Autocorrelation** (i.e., persistence)
  - **Joint correlation** among water quality variables
- Generate values beyond the observed record

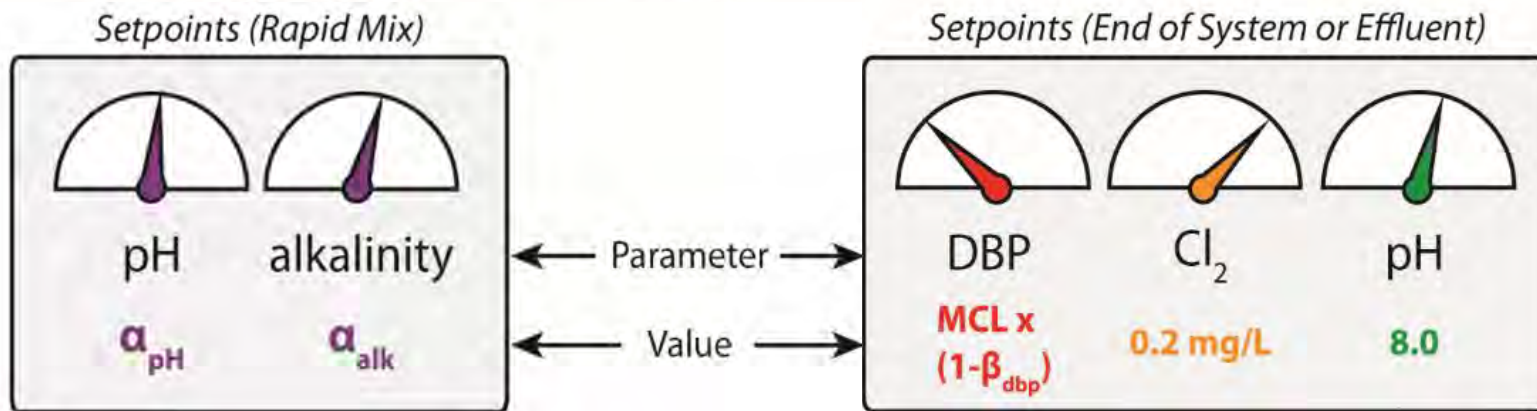
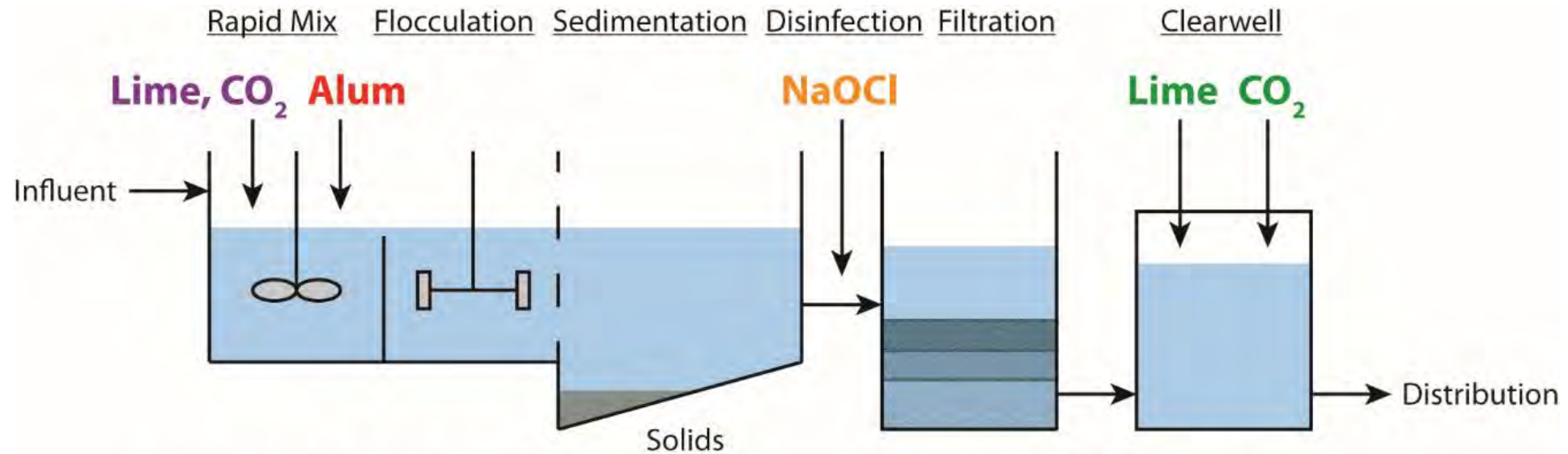


Using Cache la Poudre River data, created 2,500 realizations using a monthly simulation of four water quality parameters.



[Hohner et al. 2016]

# Decision variables: water quality setpoints, quarterly



# Constraints: drinking water regulations

| Constraint   | USEPA Regulation  |
|--|---|
| <b>Locational running annual average disinfection byproducts concentration must not exceed the maximum contaminant level</b> | Stage 1 and 2 Disinfectants and Disinfection Byproducts Rules |
| <b>Total organic carbon percent removal must be achieved</b>   | Stage 1 and 2 Disinfectants and Disinfection Byproducts Rules |
| <b>Contact time ratio for disinfection must be at least one</b>  | Long Term 2 Enhanced Surface Water Treatment Rule             |

$$c_{mcl} \geq \frac{\gamma_{t-3} + \gamma_{t-2} + \gamma_{t-1} + \gamma_t}{4}$$

where,  $\gamma_t$  refers to the DBP concentration of the current quarter being simulated

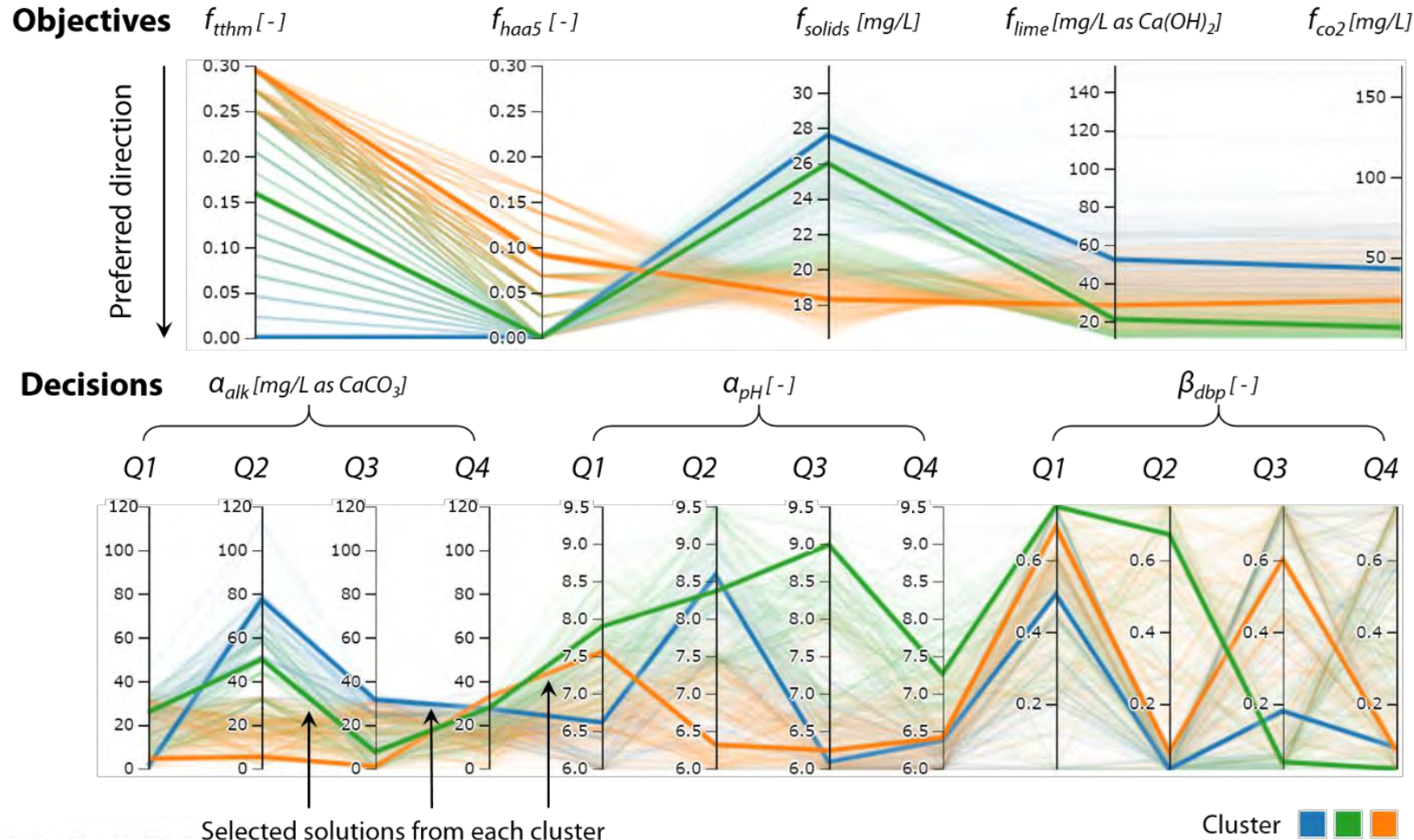
# We developed Parasol, an interactive visualization library, to alleviate these issues.

- High-quality, shareable **web applications**
- Parasol apps can be used in **environmental management and beyond**
- **Interactivity will be an essential** aspect of visualization with the rise of big(ger) datasets





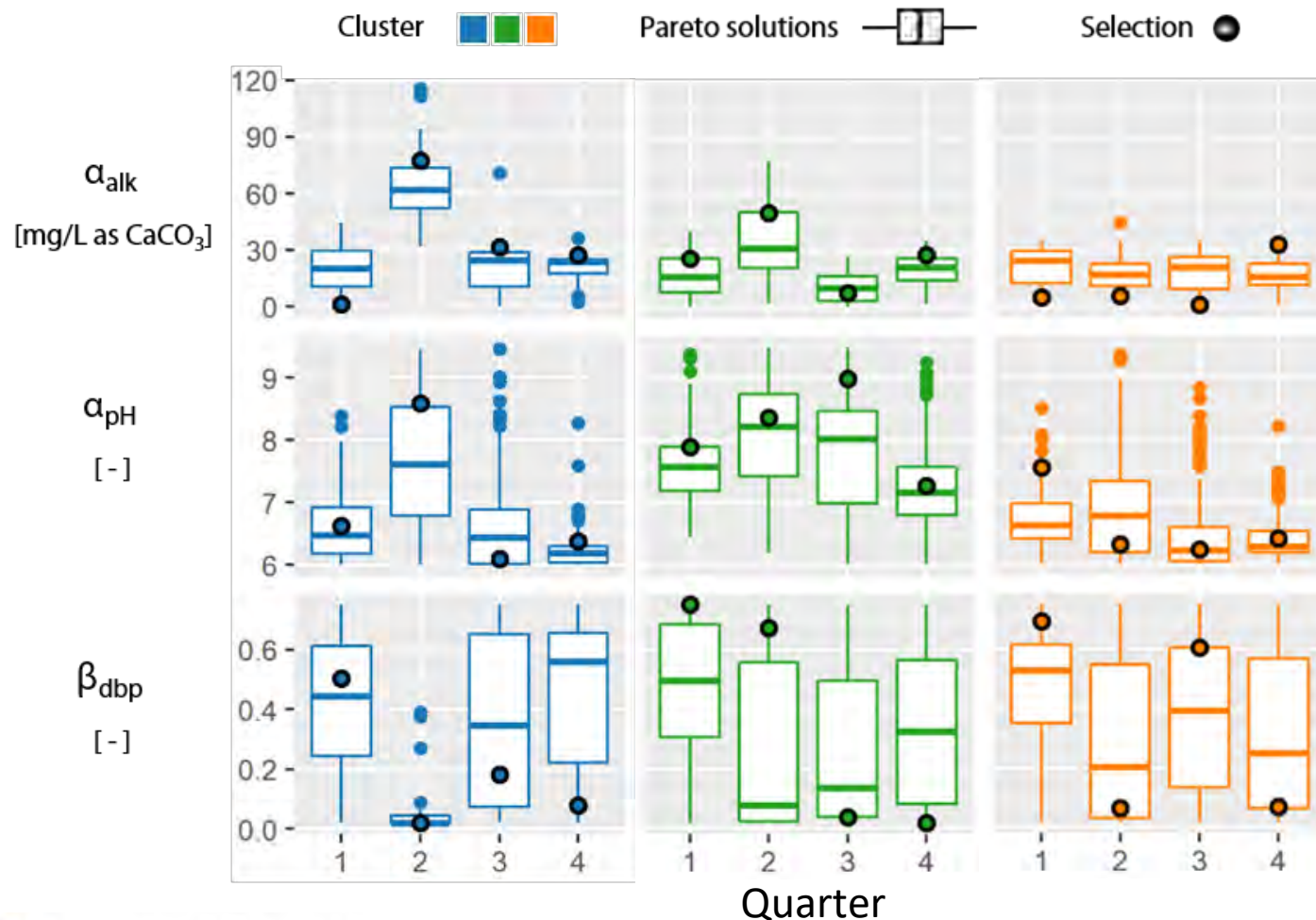
# We visualize MOEA-generated solutions using linked, parallel coordinates plots.



Interactive example:

<https://wraseman.github.io/parasol/demo/water-treatment.html>

# *k*-means clustering reveals distinct operating choices.



- **Blue cluster**

- Strongly seasonal decisions
- Alkalinity and pH mimic TOC profile
- Least elevated DBP risk

- **Green cluster**

- Intermediate risk
- High pH setpoints

- **Orange cluster**

- Little to no pH and alkalinity adjustment
- Highest risk, lowest cost

We acknowledge the gracious support of EPA Office of Research and Development National Priorities Grant Program (Cooperative Agreement No. R835865) and The Water Research Foundation (Project 4636)

**Title:** An Integrated Modeling and Decision Framework to Evaluate Adaptation Strategies for Sustainable Drinking Water Utility Management under Drought and Climate Change

**Investigators:** Kenan Ozekin<sup>1</sup>; Balaji Rajagopalan<sup>2,3</sup>, Joseph Kasprzyk<sup>2</sup>, Ben Livneh<sup>2,3</sup>, Fernando Rosario-Ortiz<sup>2</sup>, R Scott Summers<sup>2</sup>

1: The Water Research Foundation

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3: Cooperative Institute for Research in Environmental Sciences

**Researchers:** Ariel Retuta, Amanda Hohner, Billy Raseman, Josh Jacobsen

**Presented By:** Joseph Kasprzyk and Fernando Rosario-Ortiz