

National Aeronautics and
Space Administration



San Francisco Bay Delta Water Resources

Utilizing NASA and ESA Earth Observations to
Monitor Turbidity Distribution in the San
Francisco Bay-Delta

Katherine Cavanaugh (Project Lead)

Leah Kucera

Molly Spater

NASA Jet Propulsion Laboratory

2017 Summer





- ▶ Community Concerns
- ▶ Partners
- ▶ Objectives
- ▶ Study Area & Period
- ▶ Methodology
- ▶ Results & Limitations
- ▶ Conclusion & Future Work



Community Concerns

Water from the Delta supports:



25 million Californians



7000 mi² of agriculture



10 endangered species

- ▶ Increased demand for Bay-Delta water resources
- ▶ Agricultural and municipal water comes at the expense of the Delta smelt
- ▶ Demand for turbidity data in areas not monitored by *in situ* stations

Metropolitan Water District of California (MWD)

- ▶ Largest distributor of treated drinking water in the United States
- ▶ Supply water to 19 million people in Los Angeles, Orange, Riverside, San Bernardino, San Diego, and Ventura Counties.
- ▶ Support research efforts to balance water resource needs with proper ecosystem functioning



34 North

- ▶ Application and Software Development
- ▶ Graphic and user experience design
- ▶ Provide MWD with [website](#) and [data analysis](#) and [visualization](#) support

Anchor QEA

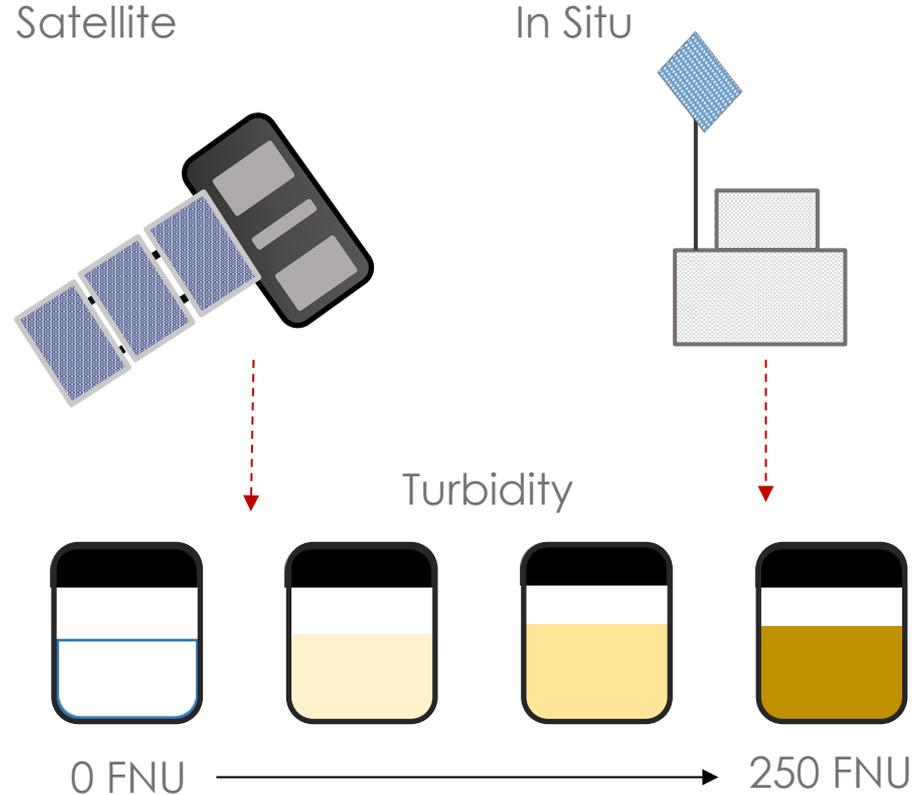
- ▶ Planning, Cleanup, Development and Restoration efforts
- ▶ [Focus](#) on [aquatic](#) landscapes
- ▶ Provide MWD with [turbidity modelling](#) within the Bay Delta



Objectives

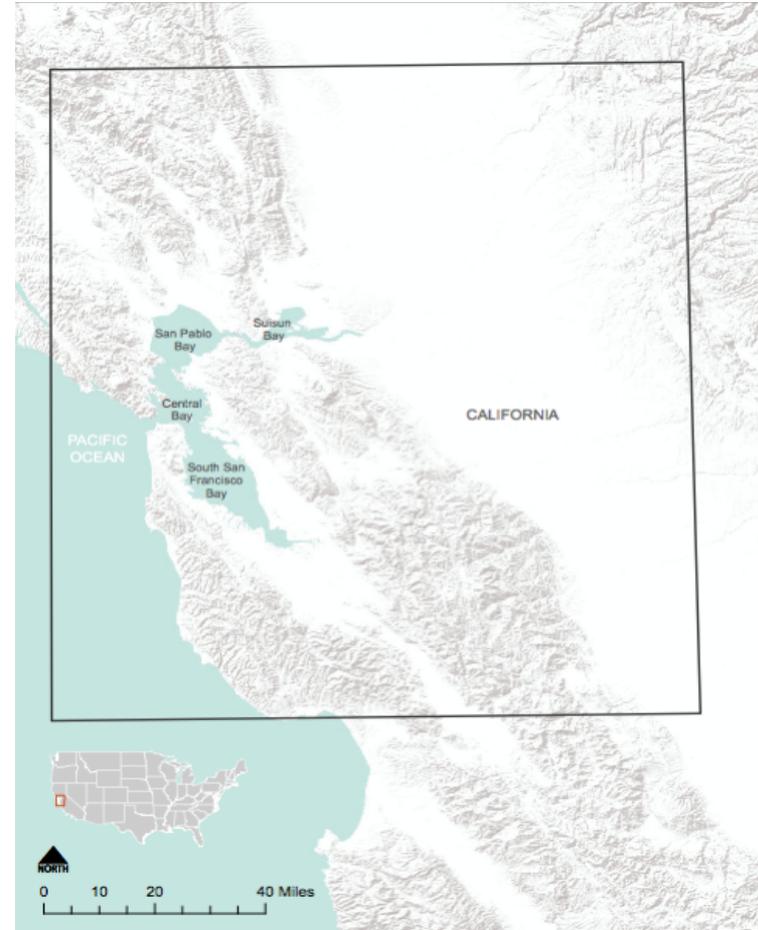


- ▶ Support the development of MWD's **turbidity model** by providing satellite data for validation
- ▶ Compare turbidity values derived from Landsat 8, Sentinel-2, Sentinel 3
- ▶ Explore the **interchangeable use** of **satellite** data and **in situ** data for model validation

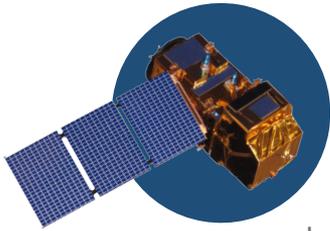


Study Area

- ▶ Western portion of the Bay Delta Watershed
 - ▶ San Pablo Bay
 - ▶ Central Bay
 - ▶ South Bay
 - ▶ Suisun Bay
 - ▶ Tributaries of the Sacramento and San Joaquin Rivers



Study Period



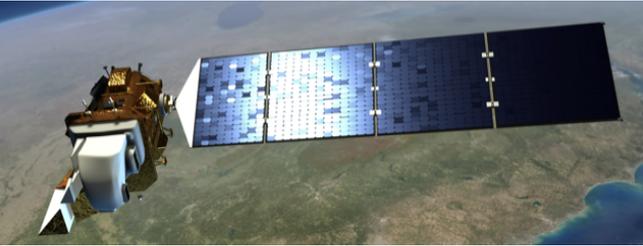
Landsat 8



Sentinel-2



Satellites & Sensors Used



Landsat 8:

- Launched February 11, 2013
- 16 day orbit
- 30 m resolution
- Operational Land Imager (OLI)

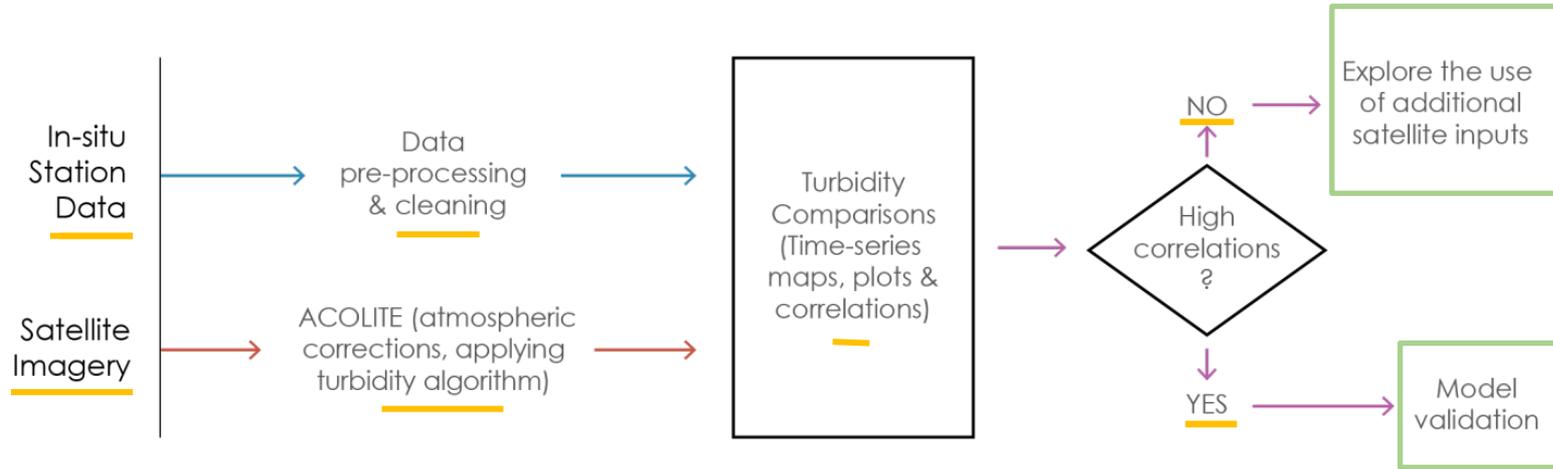
Sentinel-2:

- Launched June 23, 2015
- 10 day orbit
- 10 - 20 m resolution
- Multispectral Imager (MSI)

Sentinel-3:

- Launched February 16, 2016
- 2 - 4 day orbit
- 300 m resolution
- Ocean and Land Colour Instrument (OLCI)

Methodology



Results: Landsat 8 vs Sentinel-2

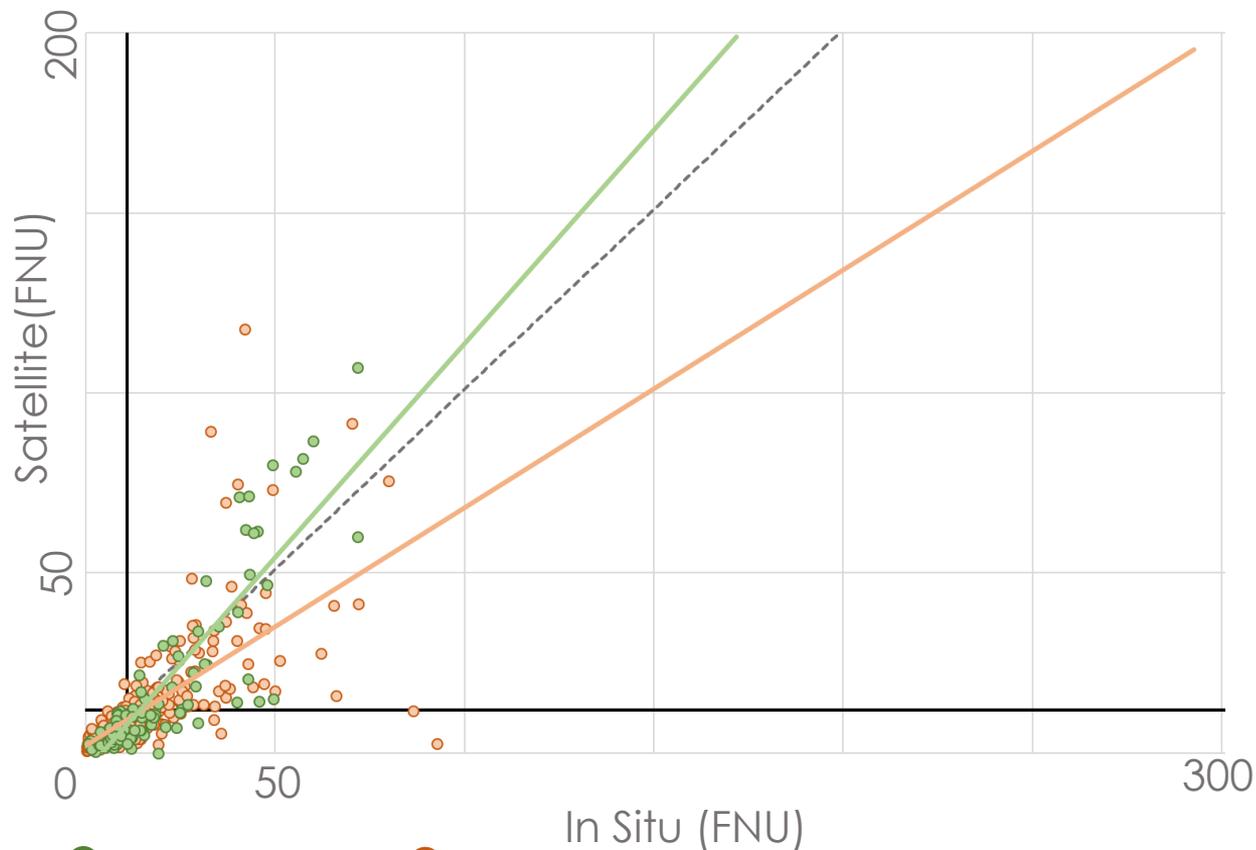


► Landsat 8 ~ In Situ:

$$r^2 = 0.474$$
$$y = 0.6604x + 1.4888$$

► Sentinel-2 ~ In Situ:

$$r^2 = 0.767$$
$$y = 1.187x - 6.1963$$



* Without North and South Bay

● Sentinel-2

● Landsat 8

— 12 FNU

⋯ 1:1 Ratio



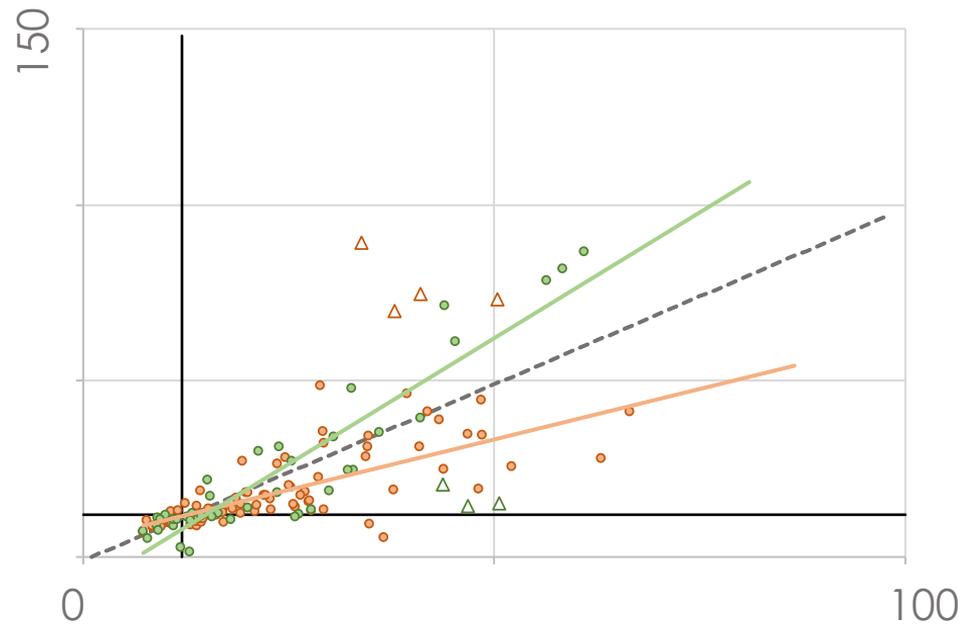
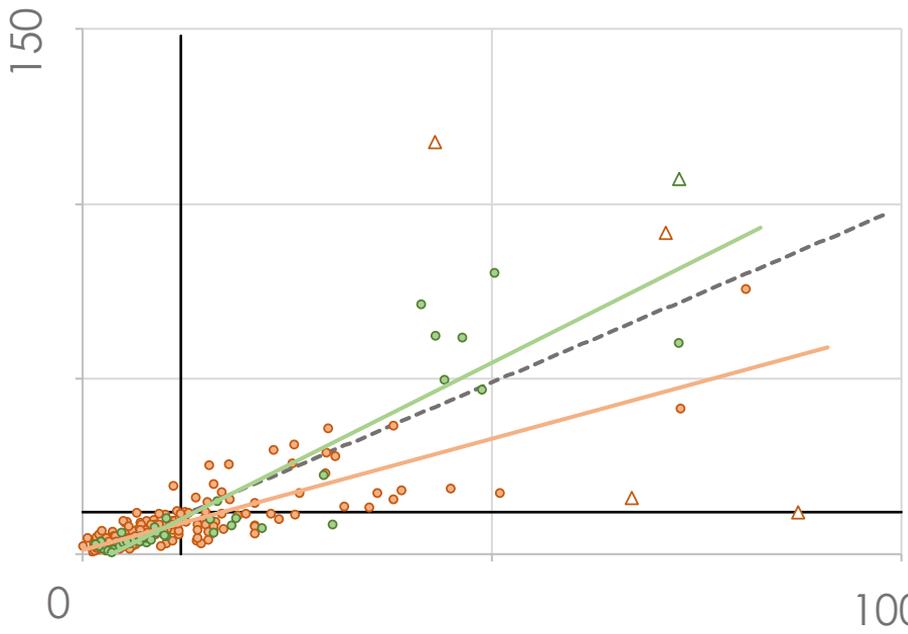
Results: Landsat 8 vs Sentinel-2

Tributaries

Landsat 8: $r^2 = 0.71$ $y = 0.6359x + 1.1669$
 Sentinel-2: $r^2 = 0.83$ $y = 1.1757x - 4.1283$

Suisun Bay

Landsat 8: $r^2 = 0.53$ $y = 0.5731x + 4.7338$
 Sentinel-2: $r^2 = 0.86$ $y = 1.429x - 9.2892$



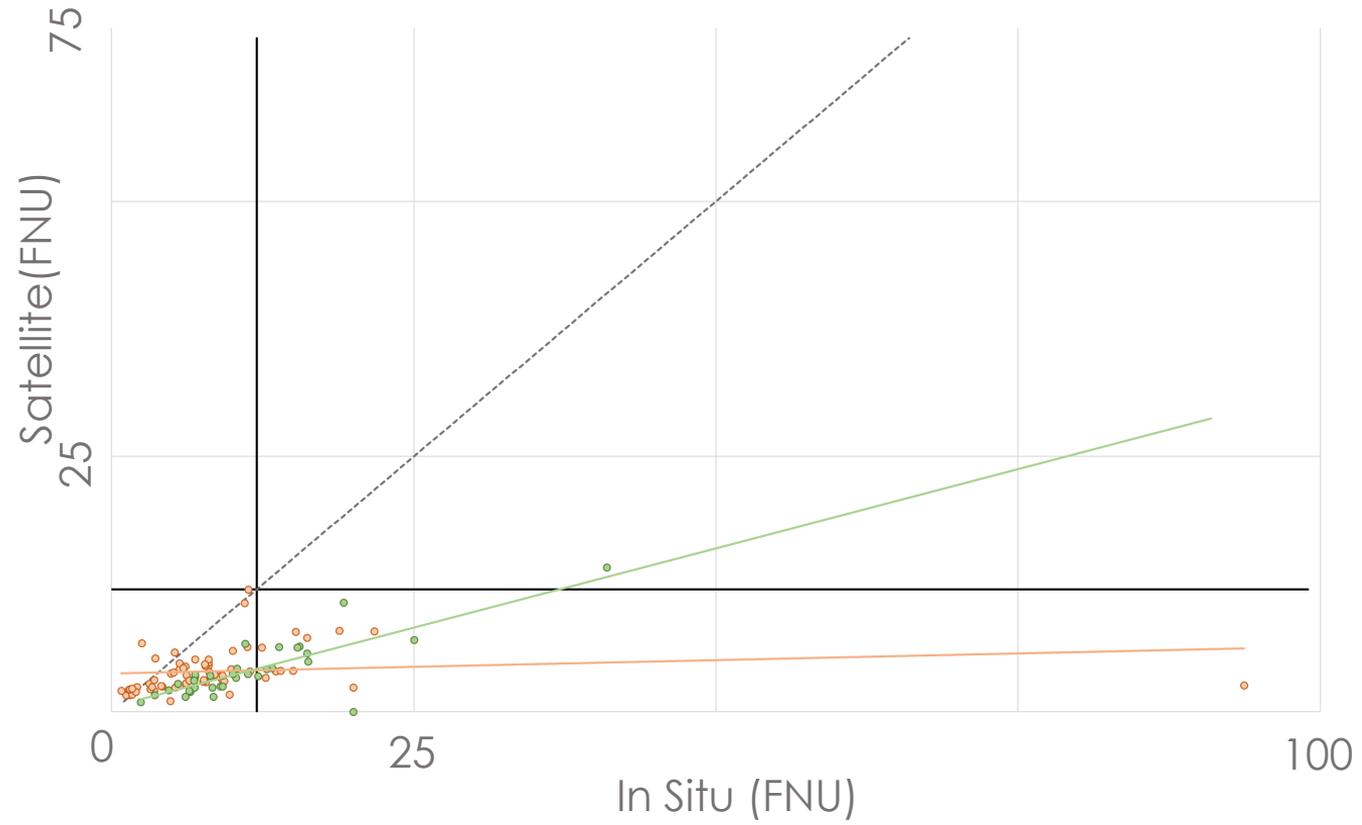
● Sentinel-2
 ● Landsat 8
 △ S2 Outlier
 △ L8 Outlier
 — 12 FNU
 - - - 1:1 Ratio

Results – Clifton Court Forebay



▶ Landsat 8 ~ In Situ:
 $r^2 = 0.0209$
 $y = 0.0259x + 3.7599$

▶ Sentinel-2 ~ In Situ:
 $r^2 = 0.6541$
 $y = 0.3104x + 0.4832$



○ Sentinel-2 ○ Landsat 8 — 12 FNU ···· 1:1 Ratio

Image: Marianne Muegenburg Cothern

Limitations



- ▶ Data availability due to temporal resolution
- ▶ T. Dogliotti turbidity algorithm is global rather than regional
- ▶ In Situ monitoring sites are shoreline

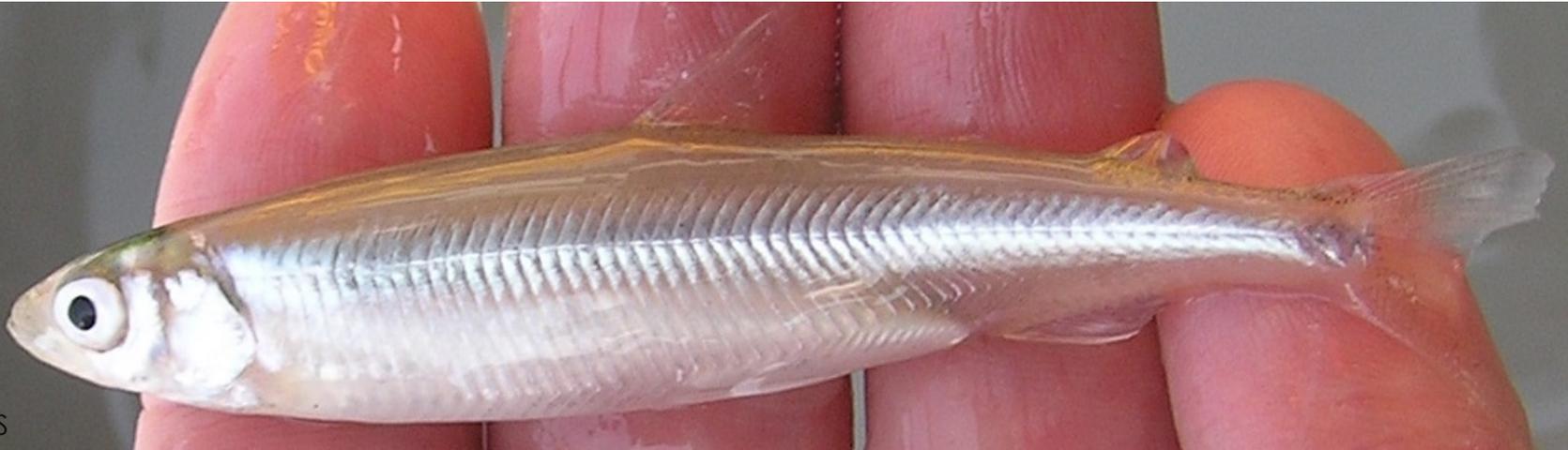


Image: Maven

Conclusions



- ▶ The **accuracy** of Sentinel-2 and Landsat 8 **derived** turbidity **varies** regionally, but is a **promising** method for **filling** in data gaps between in situ monitoring sites
- ▶ The relative **strength** of correlations between both satellites and in situ data might allow incorporation of **both** in models to allow for **greater** temporal coverage





- ▶ San Francisco Bay Delta Water Resources II – Fall 2017
 - ▶ Evaluate water quality through the use of hyperspectral imagery (AVIRIS and PRISM)
- ▶ San Francisco Bay Delta Water Resources III – Spring 2018
 - ▶ Evaluate the benefits of hyperspectral vs. multispectral for water quality monitoring

Acknowledgements

We'd like to thank our partners at the MWD - David Fullerton, Russ Ryan, and Sean Acuna - for their input and guidance. We'd also like to thank Amye Osti and David Osti from 34 North, and Michael McWilliams of Anchor QEA.

We'd like to thank our science advisors - Michelle Gierach and Christine Lee - for their continued support and encouragement throughout the term.

We'd like to thank Ben Holt & the whole Summer DEVELOP team for the opportunity and the completion of a great term!



Image: Oregon Environmental Council