



San Francisco Bay Delta Water Resources

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

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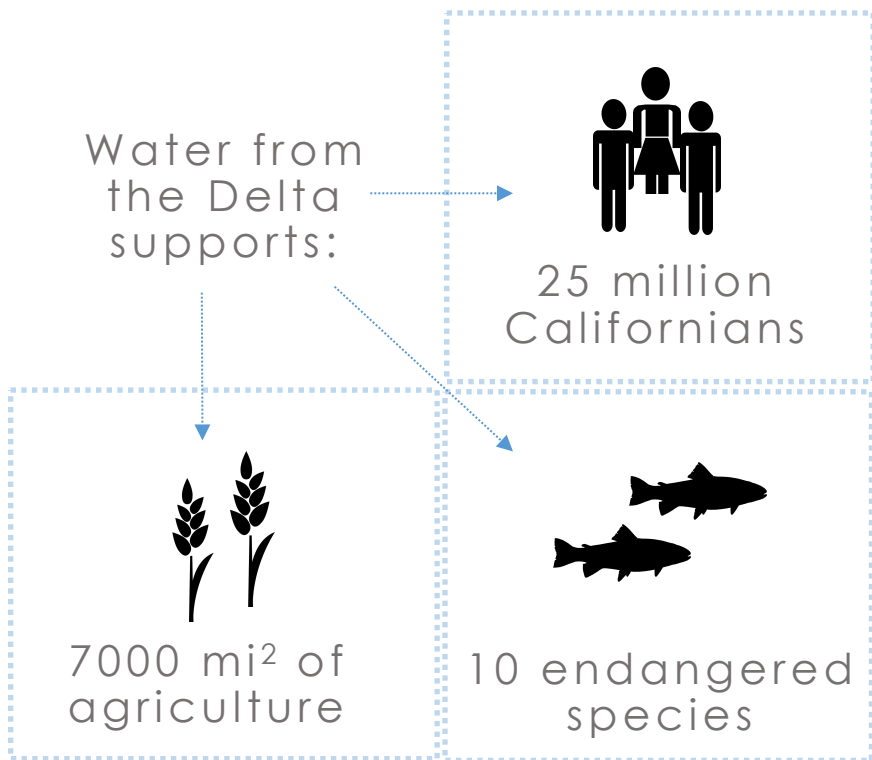
2017 Summer





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

Community Concerns



- ▶ 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

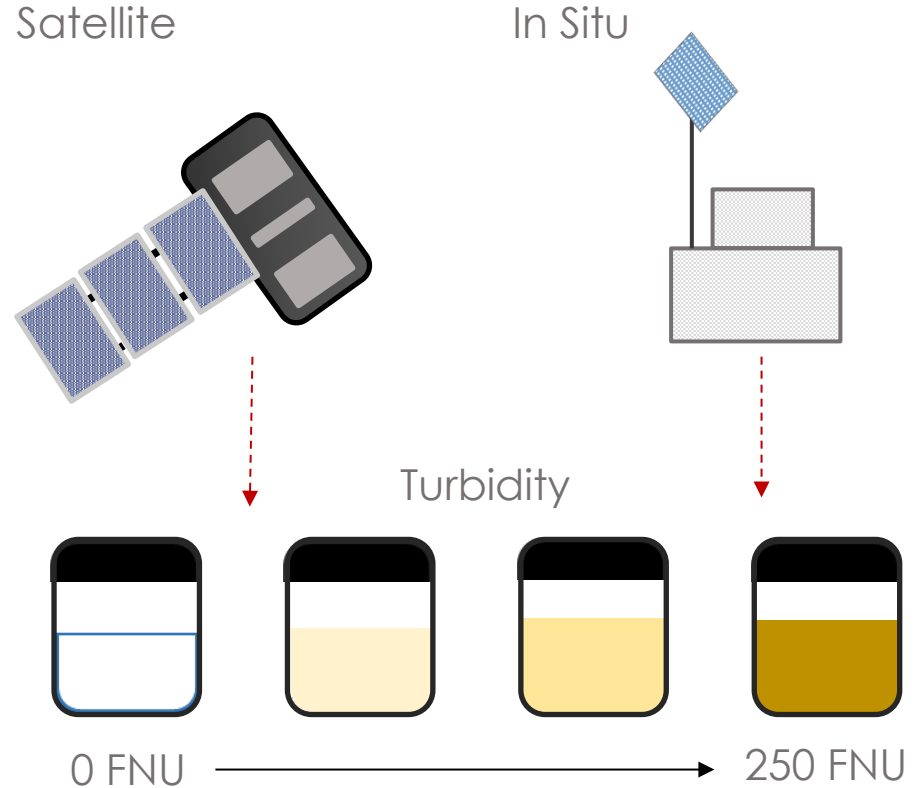
Anchor QEA

- ▶ 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

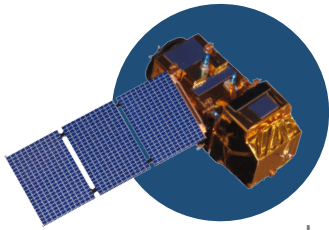


Study Area

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



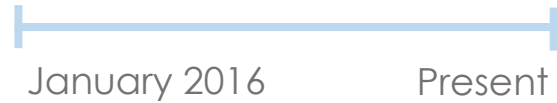
Study Period



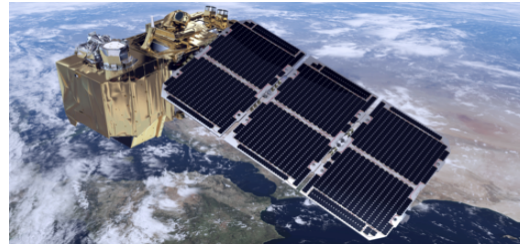
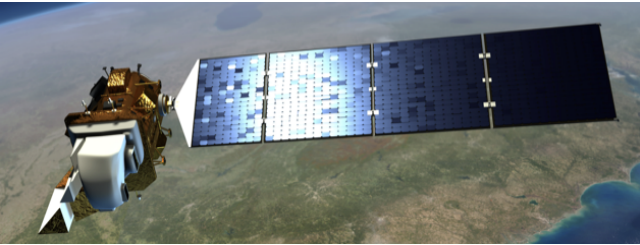
Landsat 8



Sentinel-2



Satellites & Sensors Used



Landsat 8:

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

Sentinel-2:

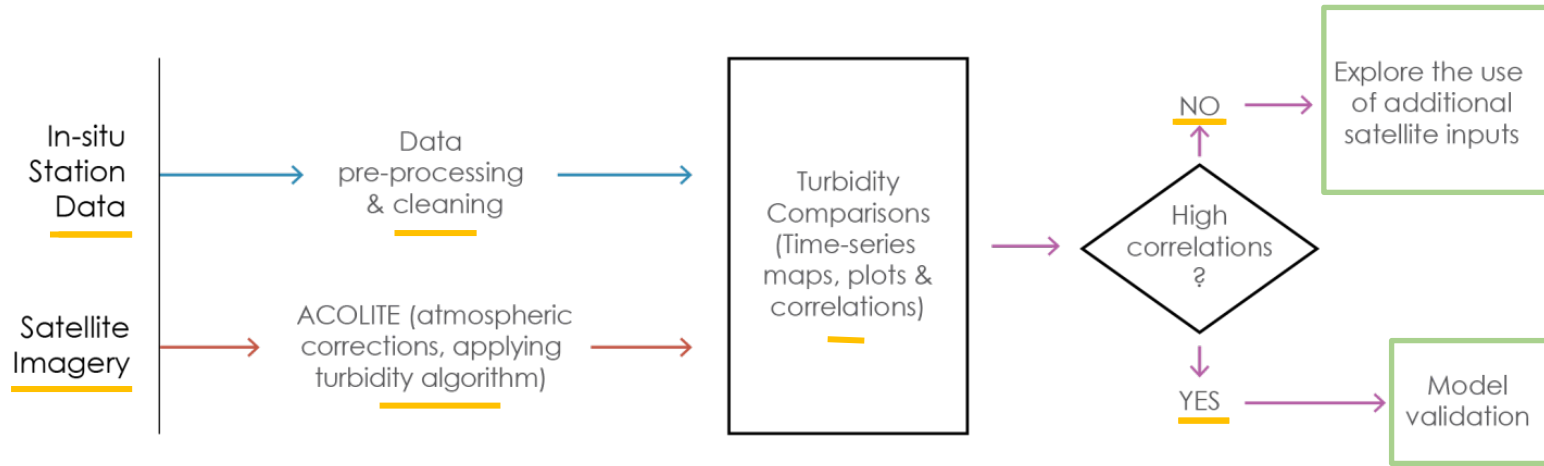
- Launched June 23, 2015
- 10 day orbit
- 10 - 20 m resolution
- Multispectral Imager (MSI)

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

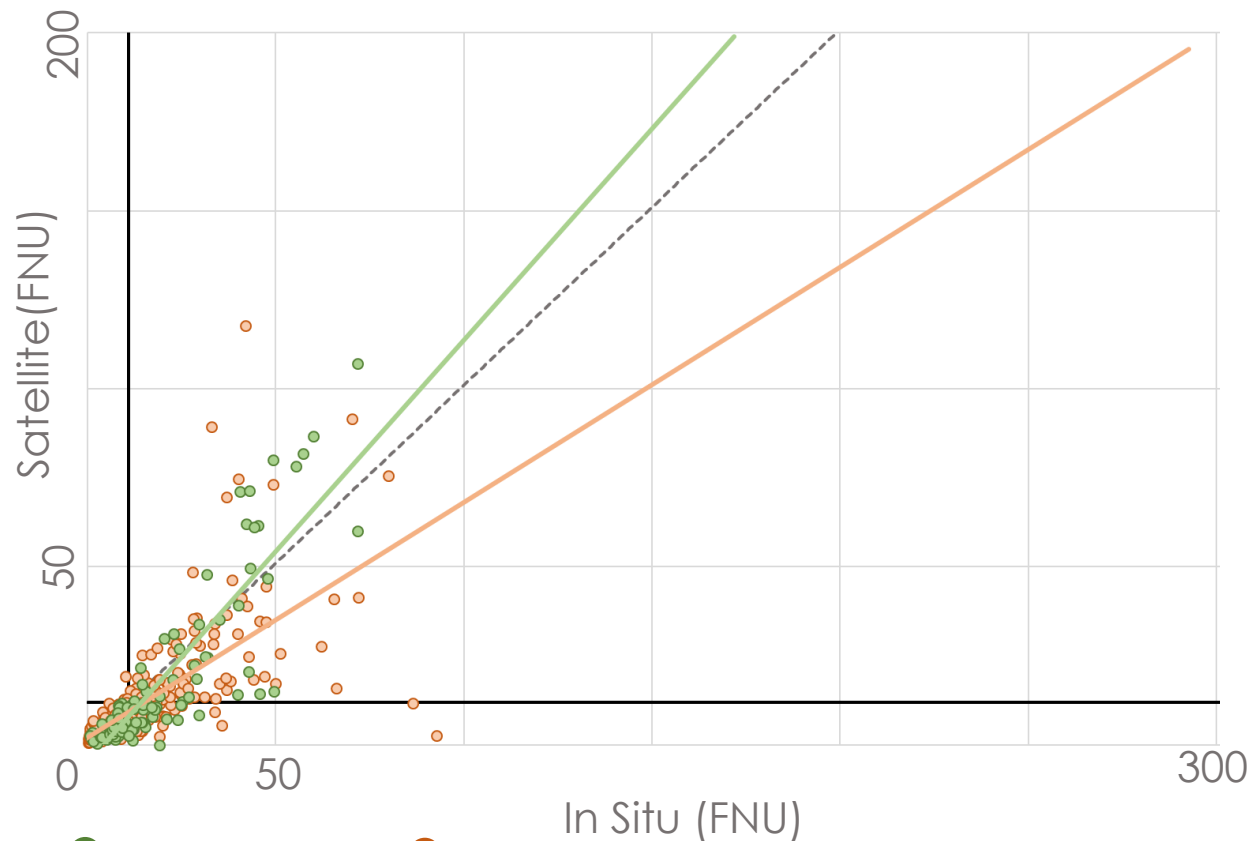


► Landsat 8 ~ In Situ:

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

► 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

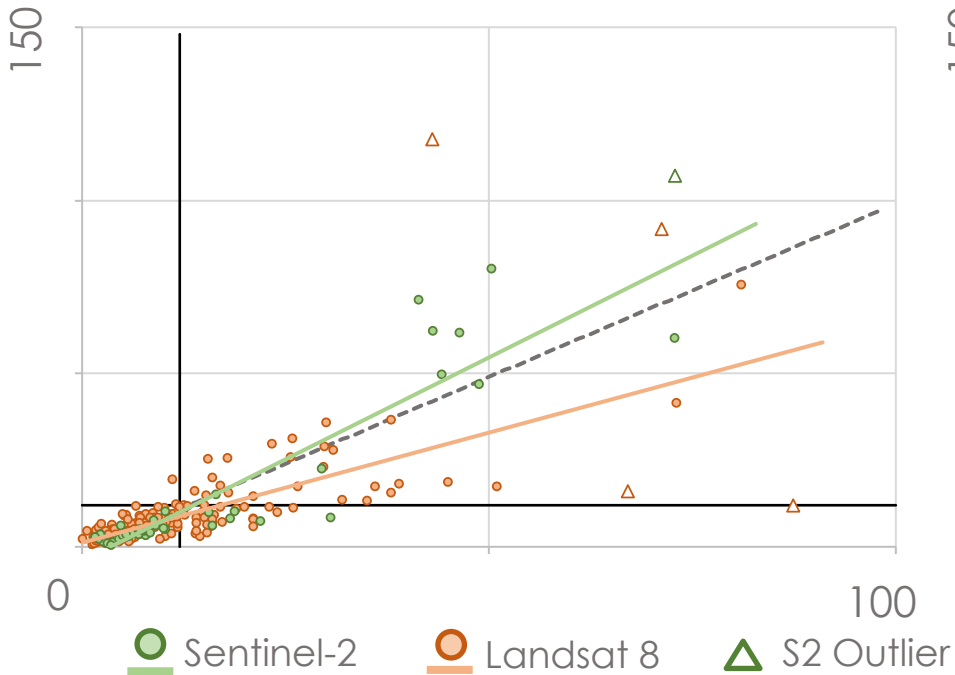


Results: Landsat 8 vs Sentinel-2

Tributaries

Landsat 8: $r^2 = 0.71$ $y = 0.6359x + 1.1669$

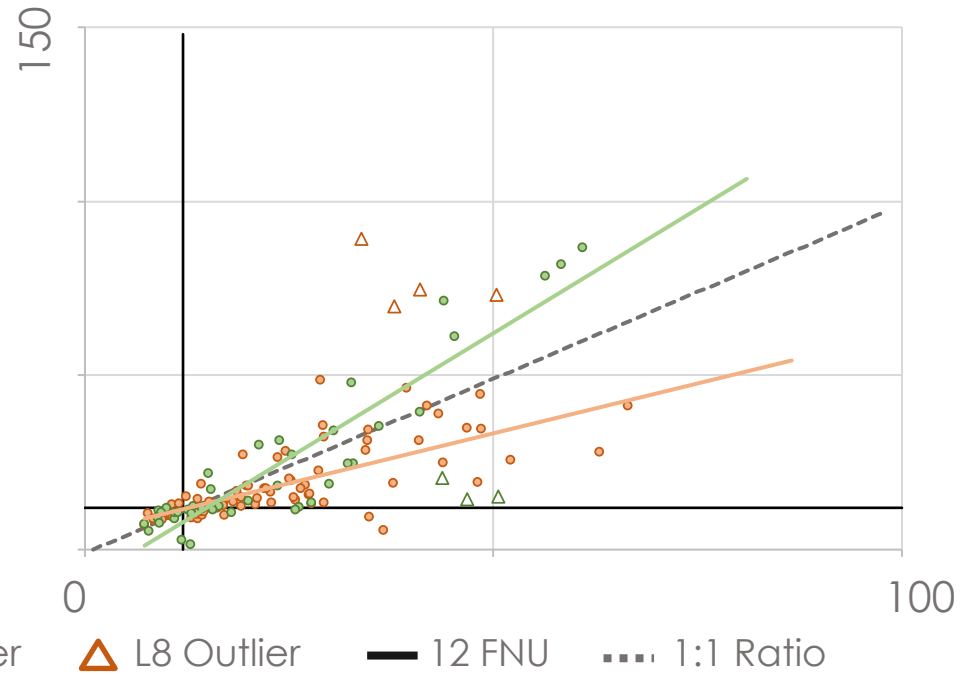
Sentinel-2: $r^2 = 0.83$ $y = 1.1757x - 4.1283$



Suisun Bay

Landsat 8: $r^2 = 0.53$ $y = 0.5731x + 4.7338$

Sentinel-2: $r^2 = 0.86$ $y = 1.429x - 9.2892$



Results – Clifton Court Forebay



► Landsat 8 ~ In Situ:

$$r^2 = 0.0209$$
$$y = 0.0259x + 3.7599$$

► Sentinel-2 ~ In Situ:

$$r^2 = 0.6541$$
$$y = 0.3104x + 0.4832$$

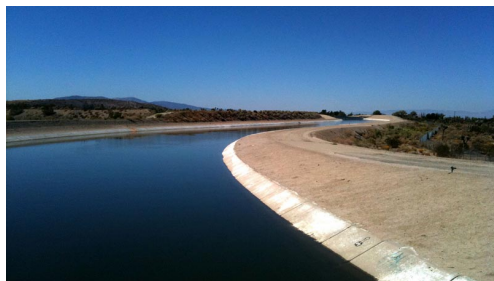
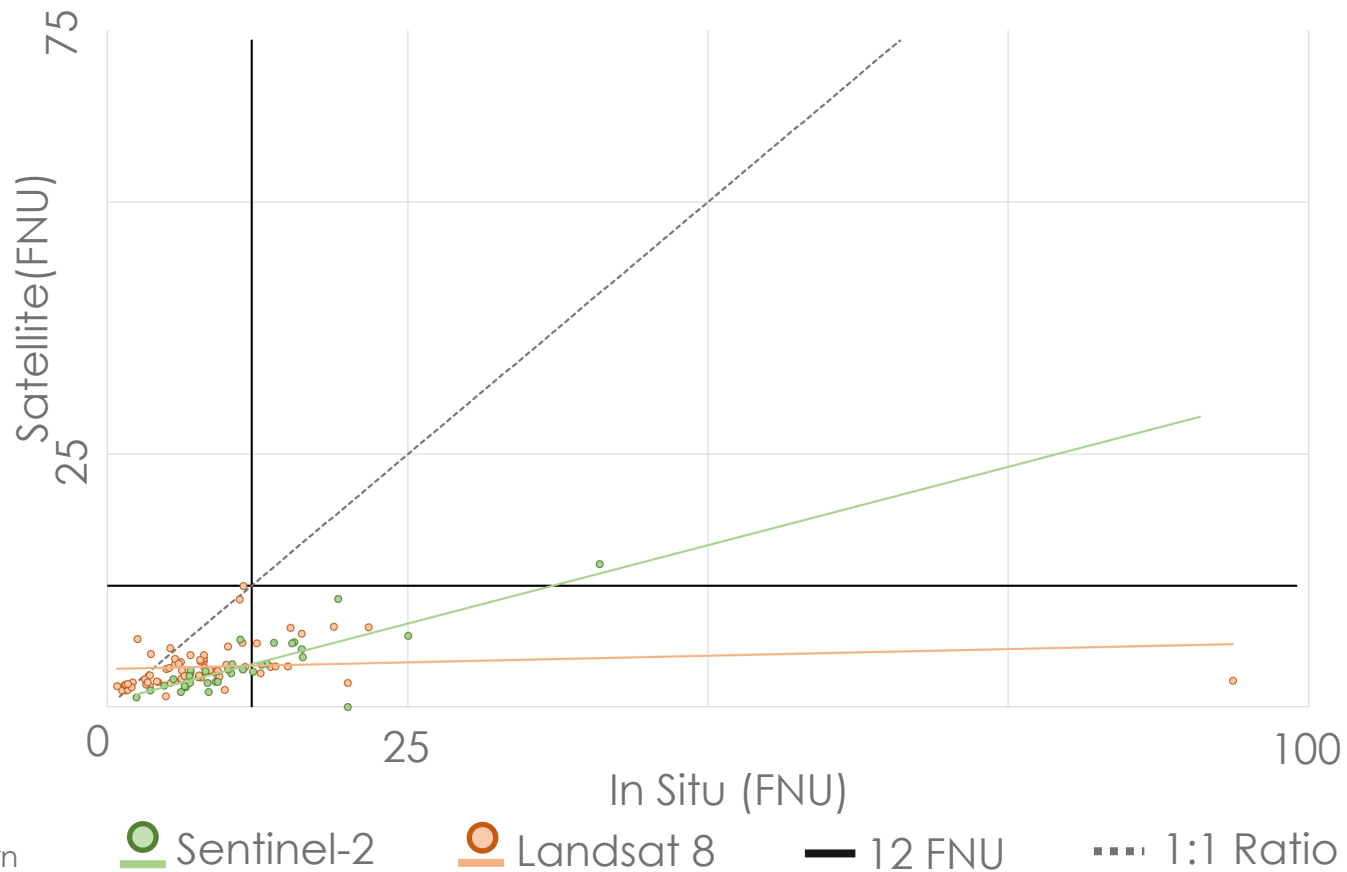


Image: Marianne Muegenburg Cothorn



Limitations



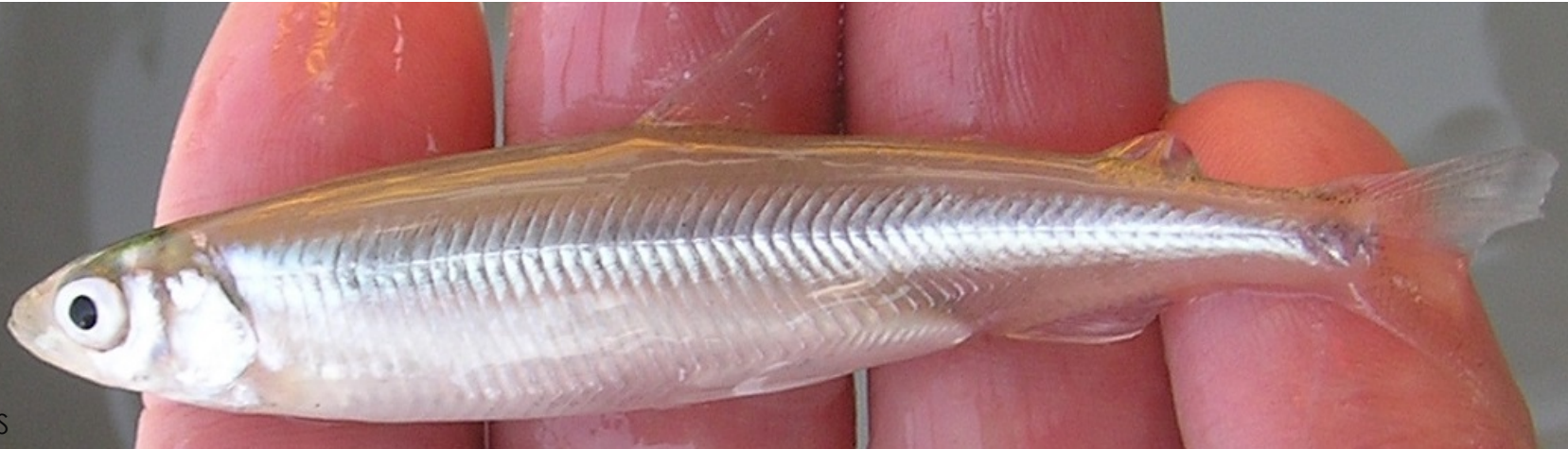
- ▶ Data availability due to temporal resolution
- ▶ T. Dogliotti turbidity algorithm is global rather than regional
- ▶ In Situ monitoring sites are shoreline



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

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Image: Oregon Environmental Council