



Vulnerability Analysis of the Bay Area's Water Supply Network



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Motivation

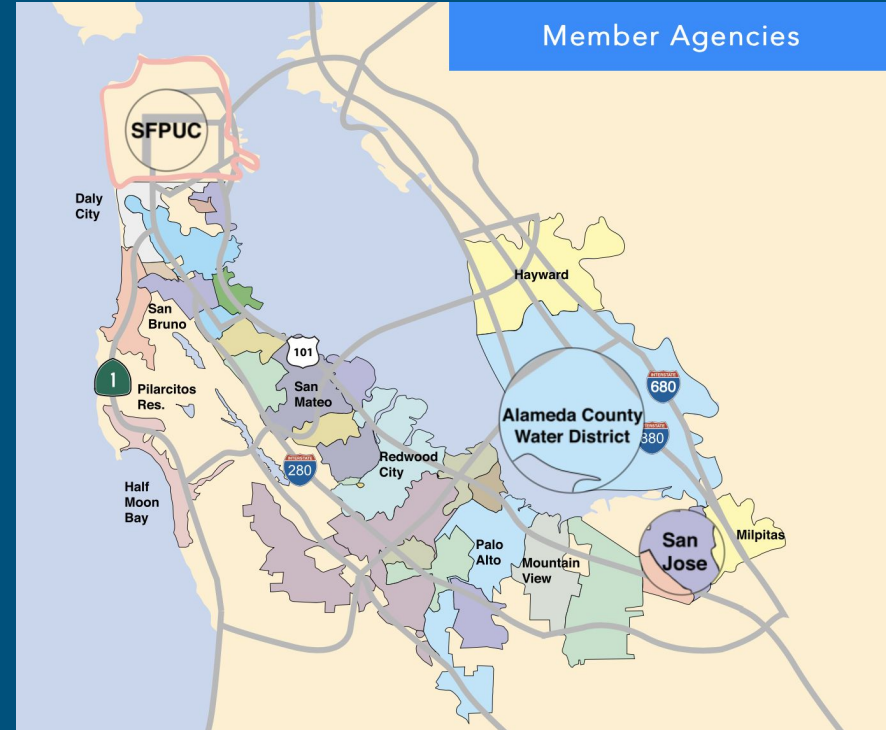
Global Water Crisis - Effects very apparent in California

- Climate Change
 - Rising temperatures
 - Increased drought
 - Decreased reliability of snowpack
- Source Depletion
 - Anthropogenic desiccation
 - Groundwater depletion



Dataset

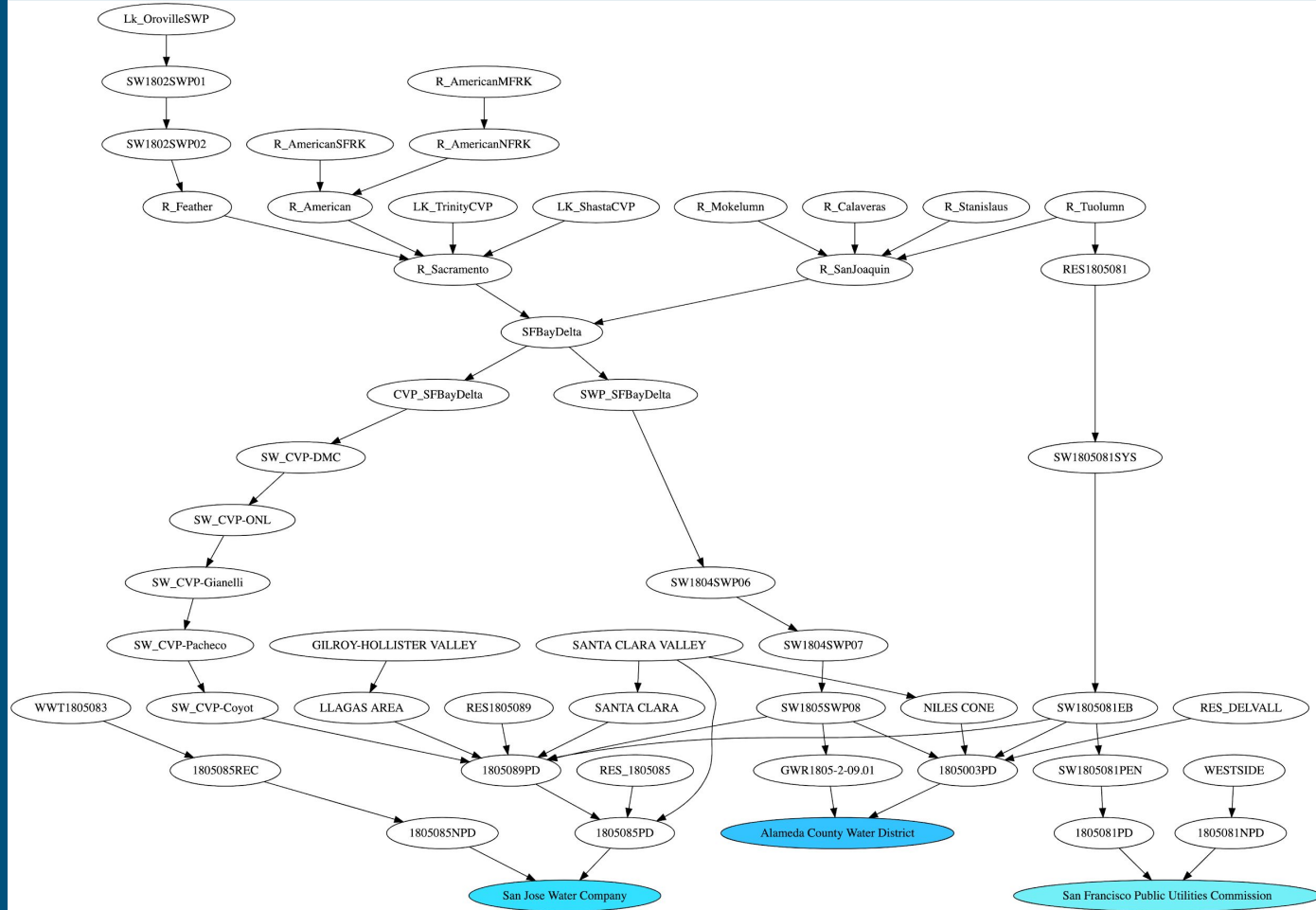
- Aggregation of 2010 CA UWMP data
 - Utilized **2020** projections
- Data attributes
 - **Consumption & transmission volumes**
 - Transmission & treatment electricity consumption
- Selected 3 **Bay Area** water systems
 - SFPUC, ACWD, SJWC



Network

Bay Area Water Supply Network:

- **SFPUC:** San Francisco Public Utilities Commission
- **ACWD:** Alameda County Water District
- **SJWC:** San Jose Water Company



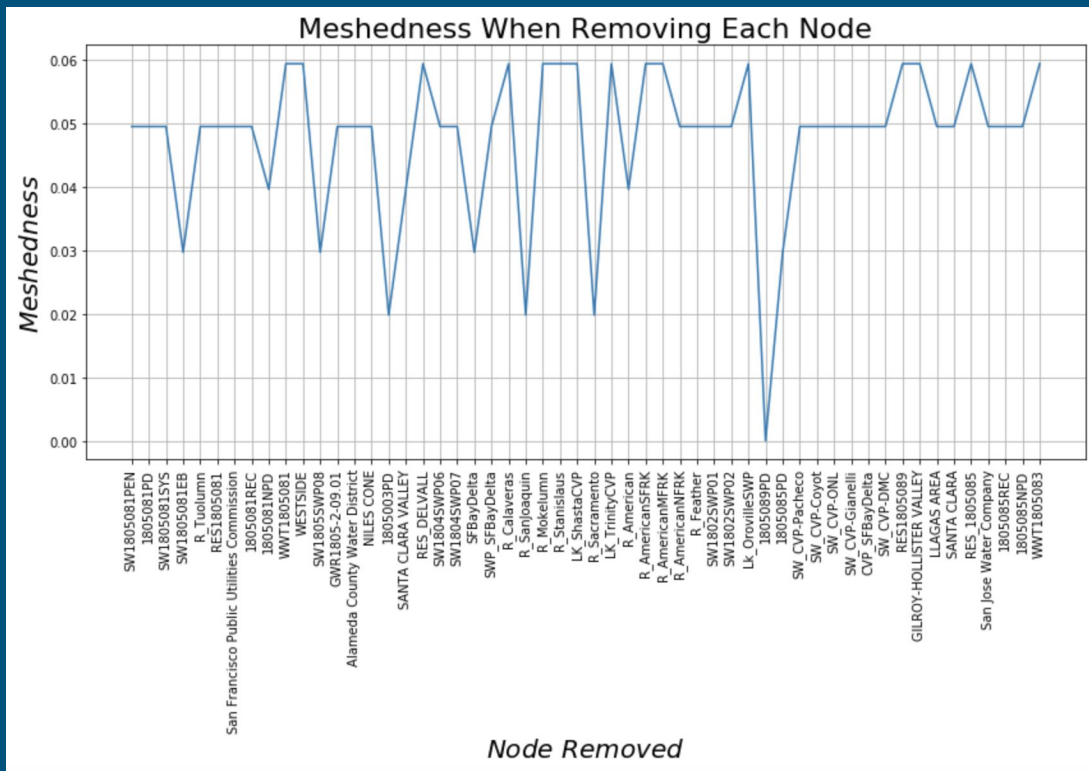
Methods & Metrics

- Selective network **fragmentation**
 - Determine each node's impact
- **Metrics** analysed

| Metric | Meaning | Equation | Method of Calculation |
|--------------------------------|---------------------------------------|--|---|
| Meshedness | Network connectivity & redundancy | $\alpha(r_m) = \frac{e-v}{2v-5}$ | momepy.meshedness() from the momepy package |
| Average Path Length | Efficiency of mass transport | $L = \frac{1}{v(v-1)} \sum_{i \neq j} d_{ij}$ | nx.average_shortest_path_length() from Networkx |
| Average Clustering Coefficient | Node clustering & density | $C_N = \frac{1}{n} \sum_{i=1}^n \frac{e_i}{k_i(k_i-1)}$ | nx.average_clustering() from Networkx |
| Average Node Centrality | Node's importance in bridging network | $C_b(v) = \sum_{s, t \in V} \frac{\sigma(s, t v)}{\sigma(s, t)}$ | Average of nx.betweenness_centrality() from Networkx |

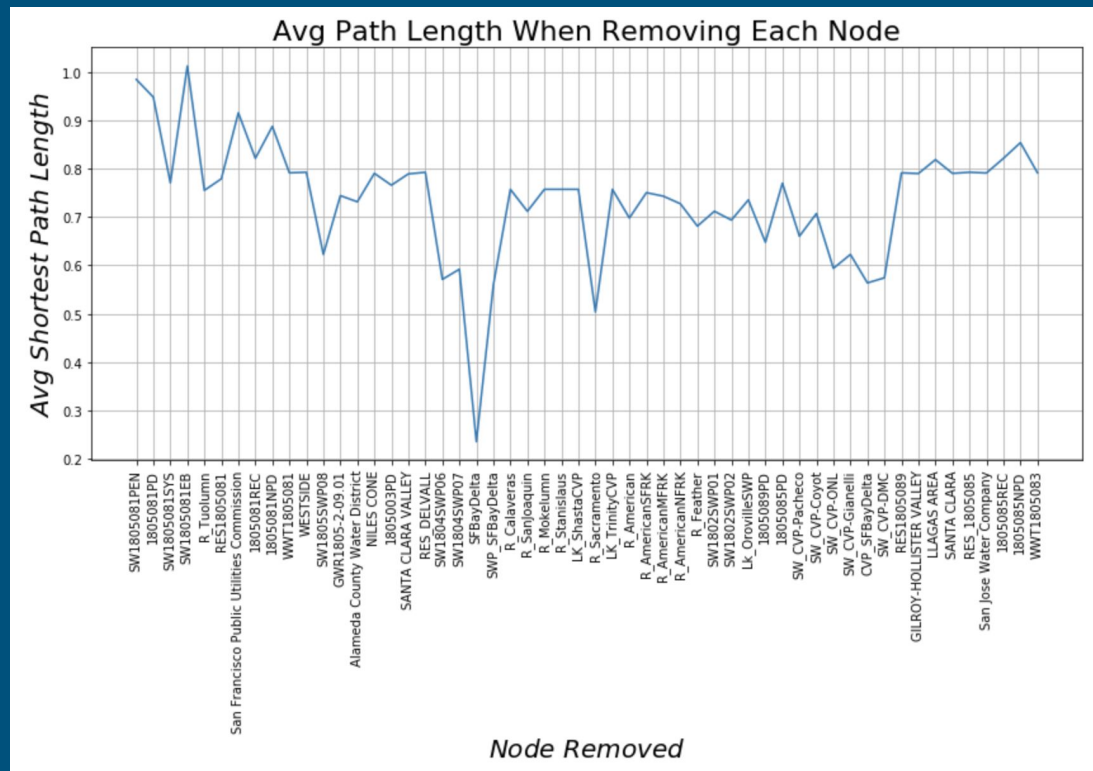
Meshedness

- Low values -> node removal caused decrease in network connectivity
- Most important nodes:
 - 1805003PD
 - San Joaquin River
 - Sacramento River
 - **1805089PD**



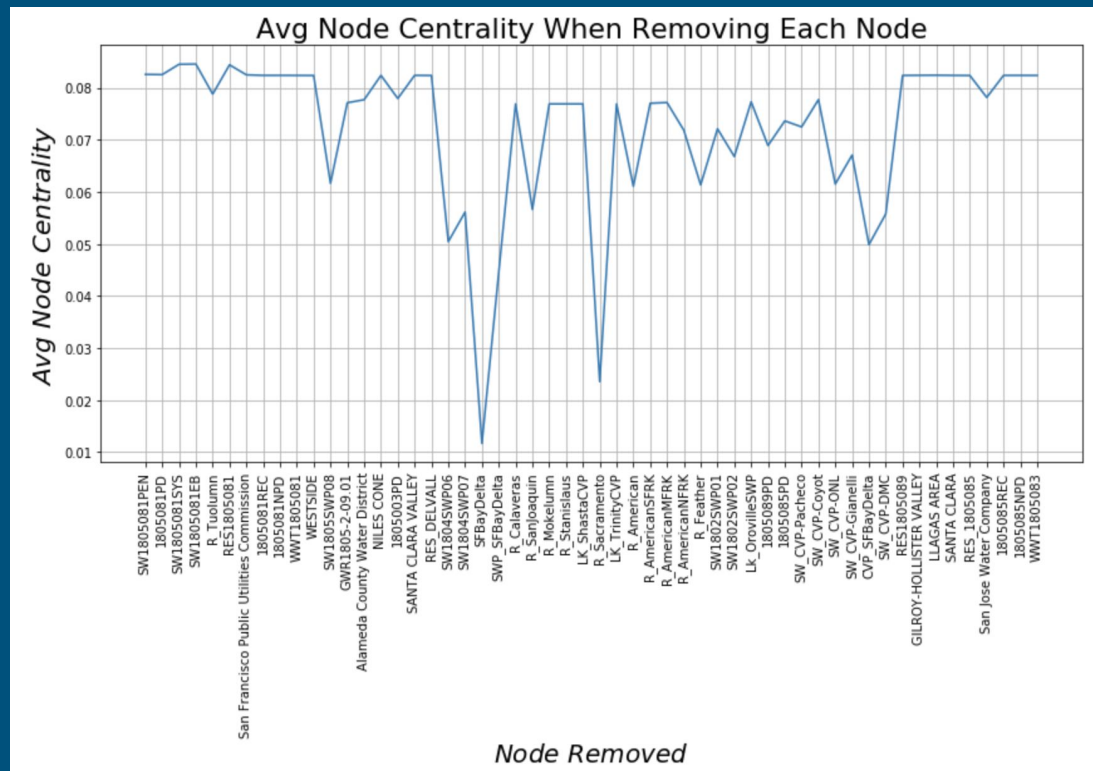
Average Shortest Path Length

- High value -> node removal negatively impacted mass transport ability
- Misleading result due to ill defined metric: San Francisco Bay Delta
- Important node:
 - **SW1805081EB**



Average Node Centrality

- Significantly lower value
-> node removed was
integral in bridging
network
- Important nodes:
 - Sacramento River
 - San Francisco Bay Delta



Conclusions

- Important nodes based on analysis
 - San Francisco Bay Delta
 - San Joaquin and Sacramento Rivers
 - Certain reservoirs/storage of potable water
- Recommendations
 - Investment in upkeep and maintenance of identified important nodes
 - Consider alternatives if important nodes become unreliable
- Potential additional research areas
 - Additional research on weighting the network differently
 - Look into modeling different types of resilience