



# Enhancing Water Distribution Systems: A Network Interdiction Perspective

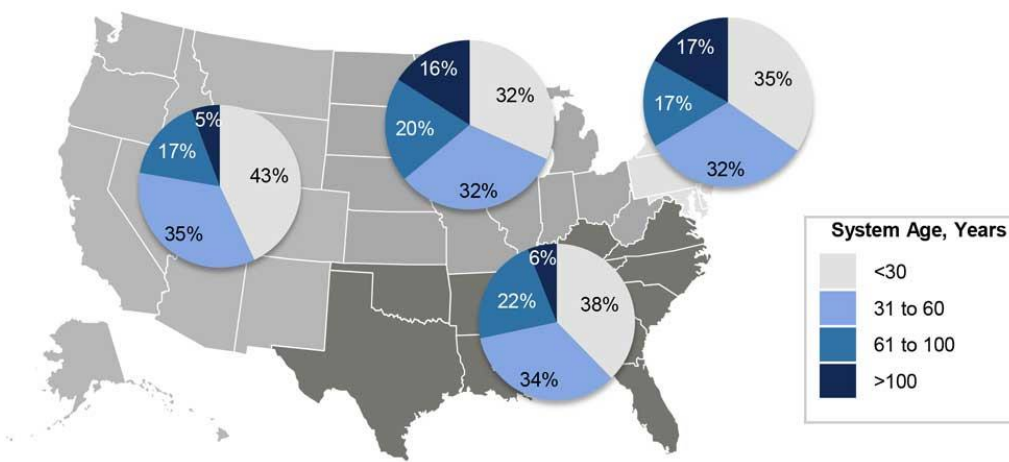
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## MOTIVATION

- Resilient municipal water infrastructure systems are crucial for distributing potable water throughout the nation everyday
- Unfortunately, America's aging water pipeline networks are highly susceptible to leaks and ruptures



- Disruptions in water distribution systems can have numerous and cascading effects:



- unmet demand
- property damages
- sewage overflow
- contamination of treated water

## SIGNIFICANCE OF CONTRIBUTIONS

We aim to

- prescribe optimal sensor placement strategies
- model interdiction (failure of network pipeline components),
- model defense (recovery from the impacts of fortification for a municipal water network)

in order to minimize large-scale disruptions to water distribution networks and prevent the isolation of reservoirs from the rest of a water distribution system.

## METHODS

### Formulation

**MIN**

**First-level Problem**

$$\sum_{i \in [N]} x_i^{(s)} \leq b_1, \quad \forall s \in [S]$$

$$x_i^{(s)} \in \{0, 1\}, \quad \forall i \in [N], \forall s \in [S].$$

- We enforce a maximum on the number of sensors placed in the water pipeline network



**MAX**

**Second-level Problem**

$$\sum_{(i,j) \in L} y_{ij} \leq k,$$

$$y_{ij} - \tau \leq (1 - \tau)u_{ij} - \epsilon(1 - u_{ij}),$$

$$\sum_{i \in [N]} \ell_i \geq |N| - b_2,$$

$$\sum_{j \in N(i) \cap B_r(i)} x_j(1 - u_{ij}) \geq \ell_i, \quad \forall i \in [N],$$

- We ensure that if an arc's interdiction exceeds as threshold  $\tau$ , water cannot be conveyed across it

- A minimum number of nodes must be protected via sensors, i.e., a sensor must be placed within a set radius of that node



**MIN**

**Third-level Problem**

$$\min_{\substack{e, f, d}} \frac{1}{S} \sum_{s \in [S]} \left[ \sum_{i \in [N]} c_i e_i^{(s)} + \lambda_1 \sum_{(i,j) \in L} f_{ij}^{(s)} + \lambda_2 \sum_{(i,j) \in L} d_{ij}^{(s)} \right]$$

s.t.

$$\sum_{i \in [N], (i,j) \in L} (f_{ij}^{(s)} - u_{ij}^{(s)} - p_{ij}^{(s)}) = \sum_{k \in [N], (k,i) \in L} (f_{ki}^{(s)} + d_{ki}^{(s)} - e_i^{(s)}), \quad \forall j \in [N], \forall s \in [S],$$

$$-P_{ij}(1 - u_{ij}) \leq f_{ij}^{(s)}, \quad \forall (i,j) \in L, \forall s \in [S],$$

$$f_{ij}^{(s)} \leq P_{ij}(1 - u_{ij}), \quad \forall (i,j) \in L, \forall s \in [S],$$

$$f_{ij}^{(s)} \leq f_{ij}^c, \quad \forall (i,j) \in L, \forall s \in [S],$$

$$d_{ij}^{(s)} \geq -f_{ij}^c, \quad \forall (i,j) \in L, \forall s \in [S].$$

- We aim to minimize the total cost of unmet demand, pressure loss, and damage costs

- We enforce flow conservation and capacity constraints

### Exact Reformulation



### Column-Constraint Generation

We iteratively update the upper and lower bounds by determining new interdiction decisions

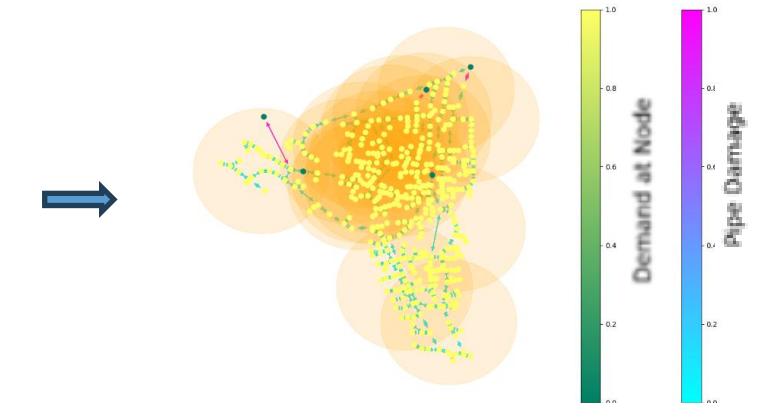
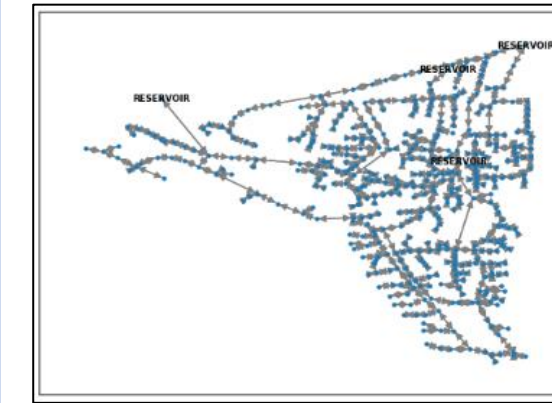
- Let  $\hat{Y}_k$  be the collection of interdiction decisions at iteration  $k$  and  $x_k$  be the fortification decisions at iteration  $k$
- At iteration  $k + 1$ :
  - Upper Bound: update  $y_{k+1}$  with the previous fortification decision  $x_k$  and add  $y_{k+1}$  to  $\hat{Y}_k$  by solving the reformulated max problem
  - Lower Bound: update  $x_{k+1}$  with  $\{\hat{Y}_k, y_{k+1}\}$

### Bender's Decomposition (a subroutine in the column-constraint generation)

- Master Problem: the reformulated inner problem
- Subproblem: the dualized third-level problem
- We solve the primal third-level problem to obtain optimality cuts for the master problem

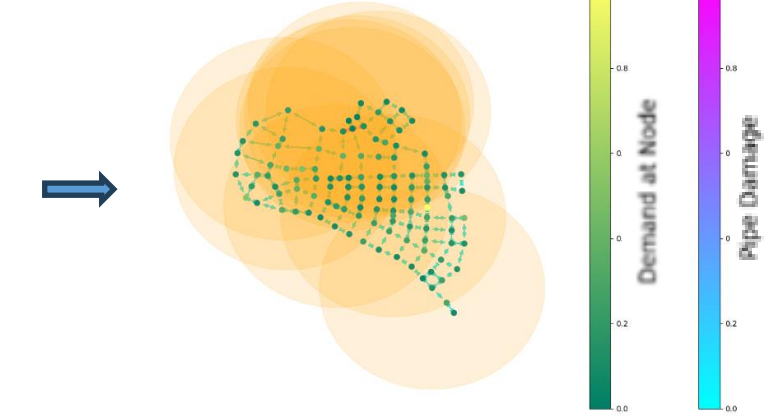
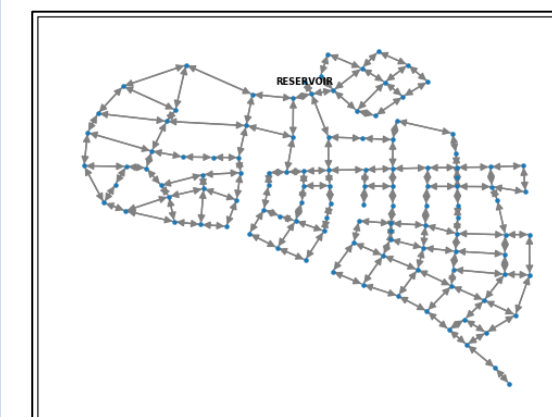
## RESULTS

### Balerma Network



- Arcs linking 3 out of 4 of the reservoirs to the network have been interdicted
- The 2 reservoirs that are linked to the network via multiple nodes and covered by more than 1 sensors have a lesser chance of being disconnected from the network and causing disruptions throughout the network

### ZJ Network



- 2 of the 3 arcs linking the single reservoir to the rest of the nodes in this network are interdicted
- The interdicted pipeline components covered by multiple sensors are well-protected

Sensitivity Analysis for Number of Sensors

