



EVALUATION OF EFFECTIVENESS OF REGULATORY SAMPLING LOCATIONS DURING EMERGENCY RESPONSE SCENARIOS

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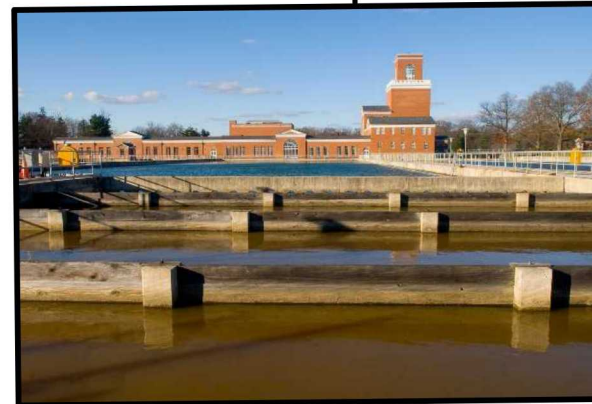
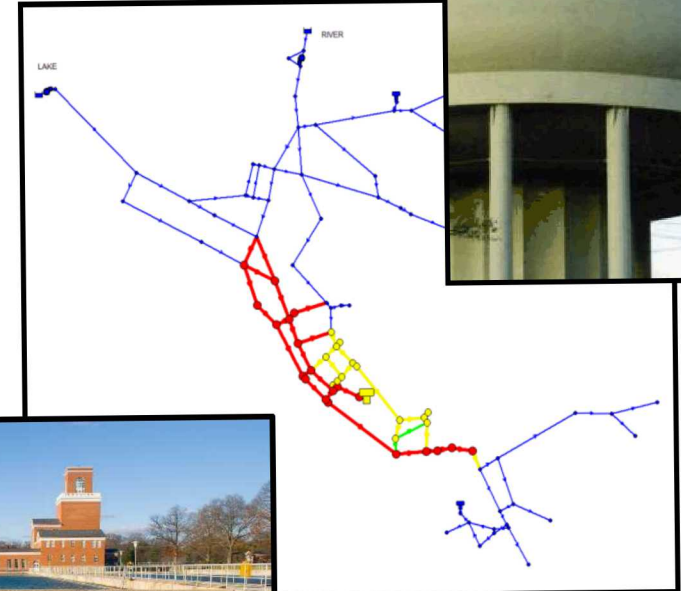
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- Background
- Formulation
- Approach
- Results
- Conclusions/Next Steps

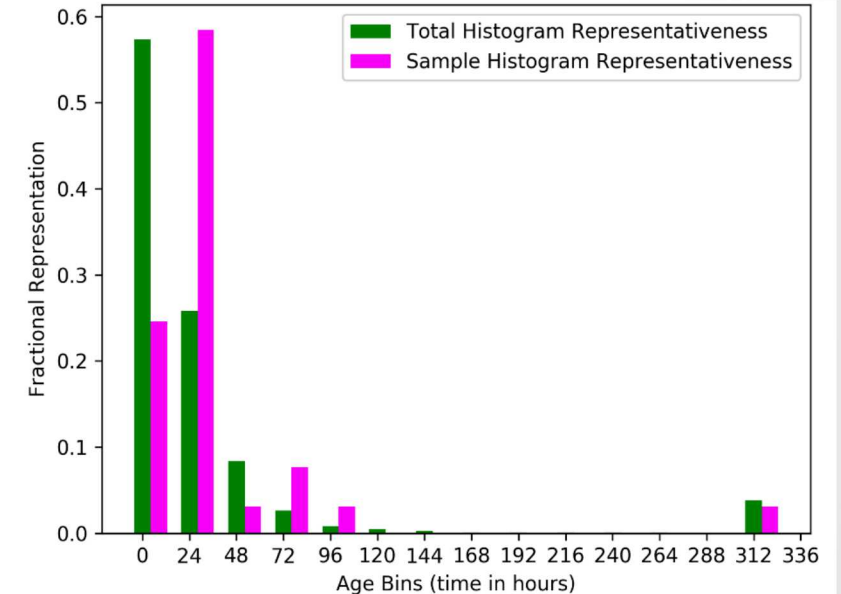
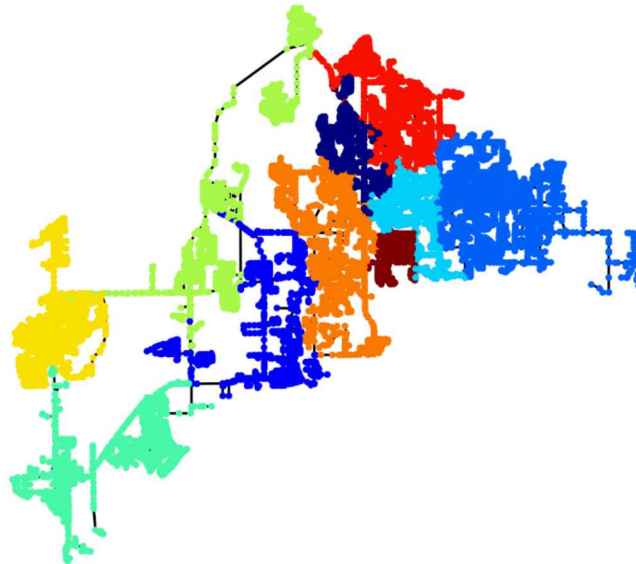
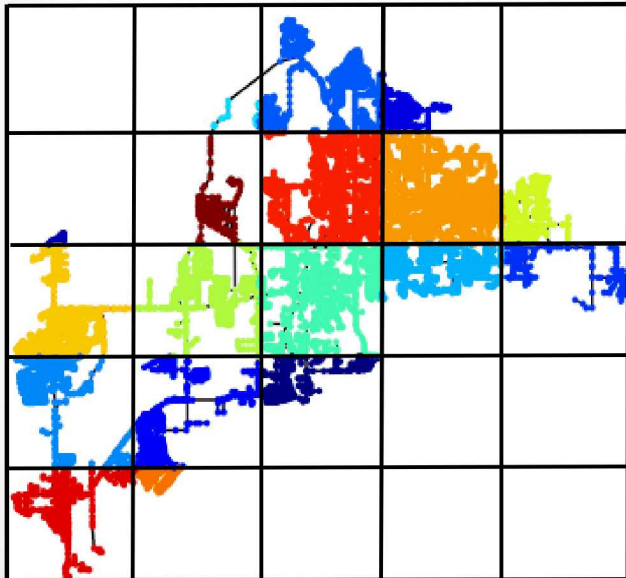


- **Drinking water utilities take grab samples to ensure high quality, potable water and meet regulatory requirements**
- **Water distribution system modeling approaches can help identify regulatory and emergency sampling locations**
- **Scenario coverage is metric used to optimally identify locations**

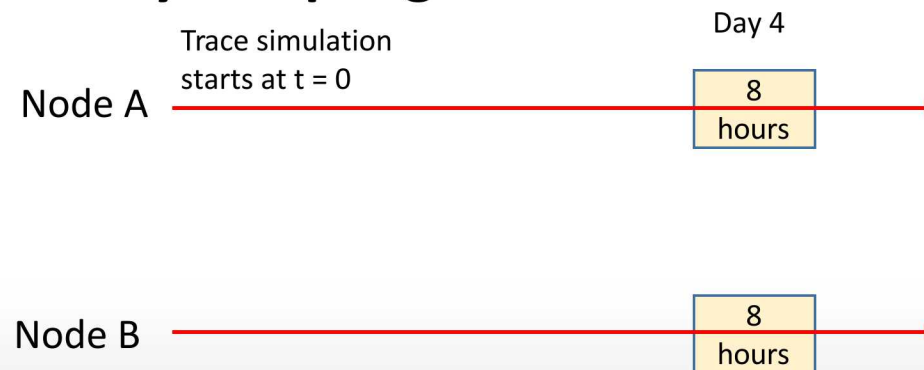
- Extended coverage formulation from Lee and Deininger [1992] to identify grab sample locations
- Included constraints to spatially distribute locations via grid, clustering, water age

$$\begin{aligned} &\text{maximize} && \sum_{a \in A} \alpha_a x_a \\ &\text{subject to} && x_a \leq \sum_{i \in \mathcal{L}_a} s_i && \forall a \in A \\ &&& \sum_{i \in L} s_i \leq N \\ &&& \sum_{i \in \mathcal{B}_j} s_i \leq M_j && \forall j \in B \\ &&& s_i \in \{0, 1\} && \forall i \in L \\ &&& 0 \leq x_a \leq 1 && \forall a \in A \end{aligned}$$

- Uniform square grid layout
- Clustering (community) algorithms
- Water age diversity



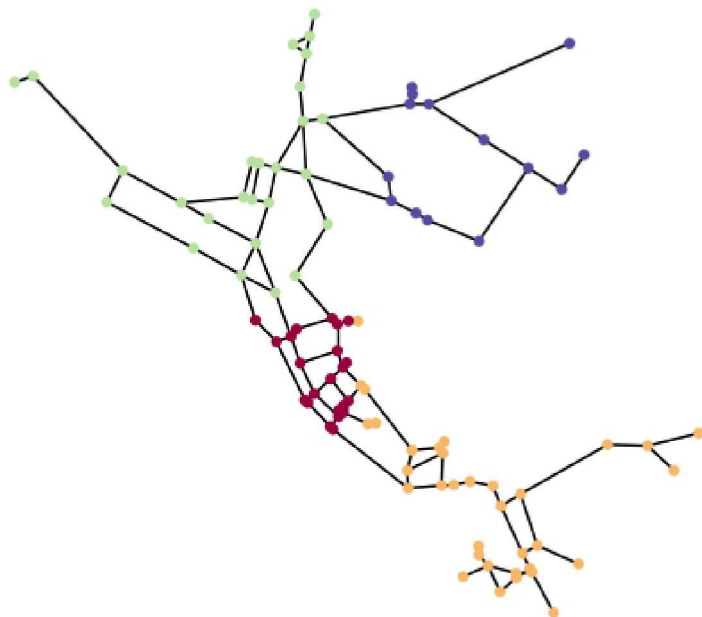
- Simulated persistent water quality issue using tracers
- Assumed samples taken during standard working day (8 hours)
- Modeled representative day
- Selected locations that maximized scenario coverage
- Considered covered if positive detection at all times during 8 hours
- Pre-determined regulatory sampling locations



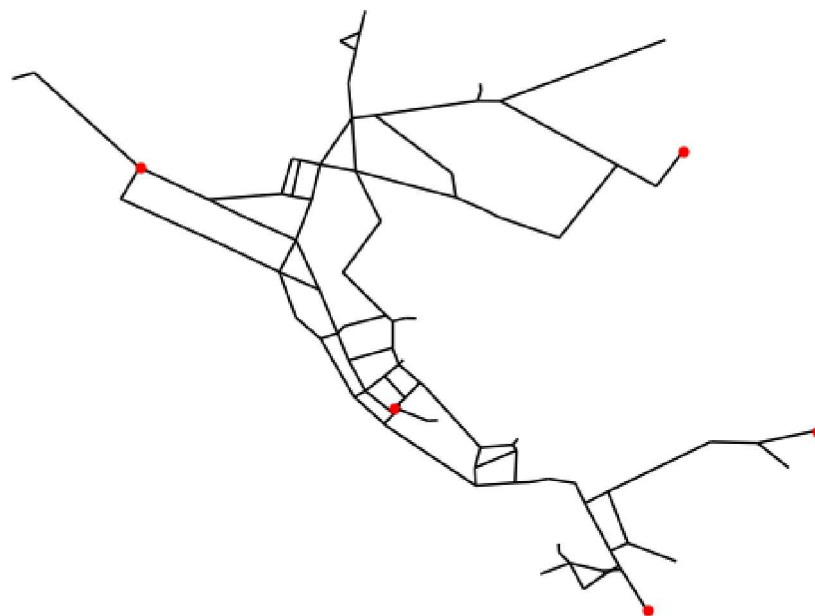
- Solved coverage optimization problem using regulatory scenarios for 1 to 30 locations
- Evaluated regulatory sample locations on security scenarios
- Adjusted objective value using 5 closest locations for each security scenario to determine if scenario is still detected
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- EPANET Network 3

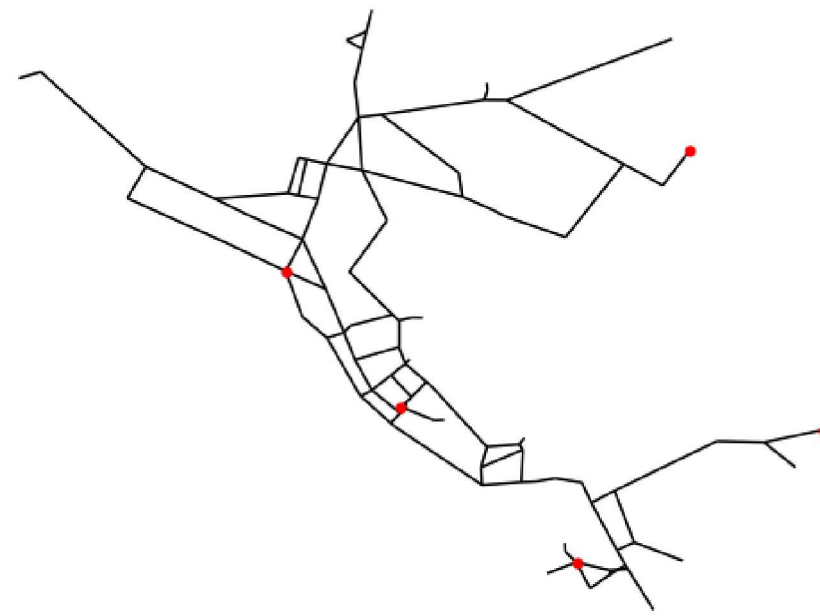
Grid bins



Regulatory sample locations, Grid bins

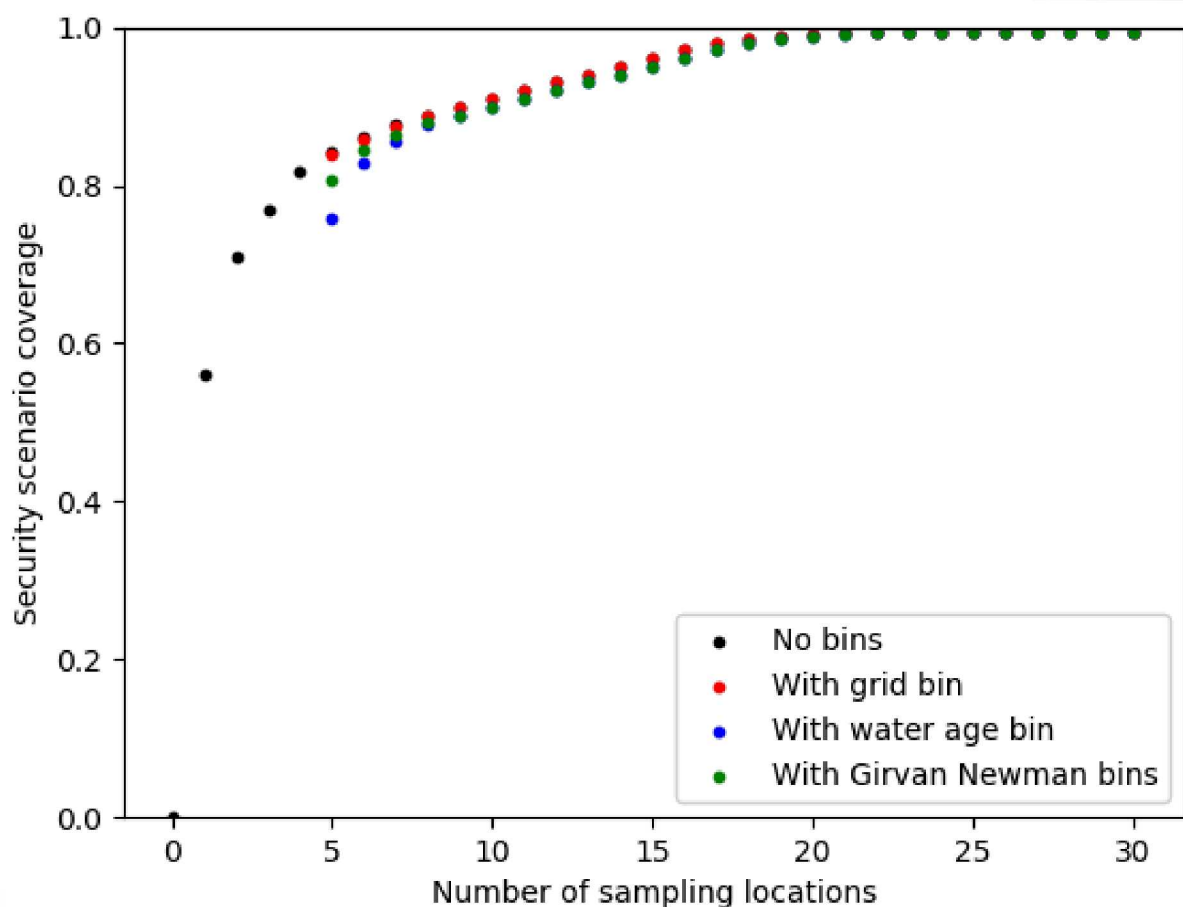
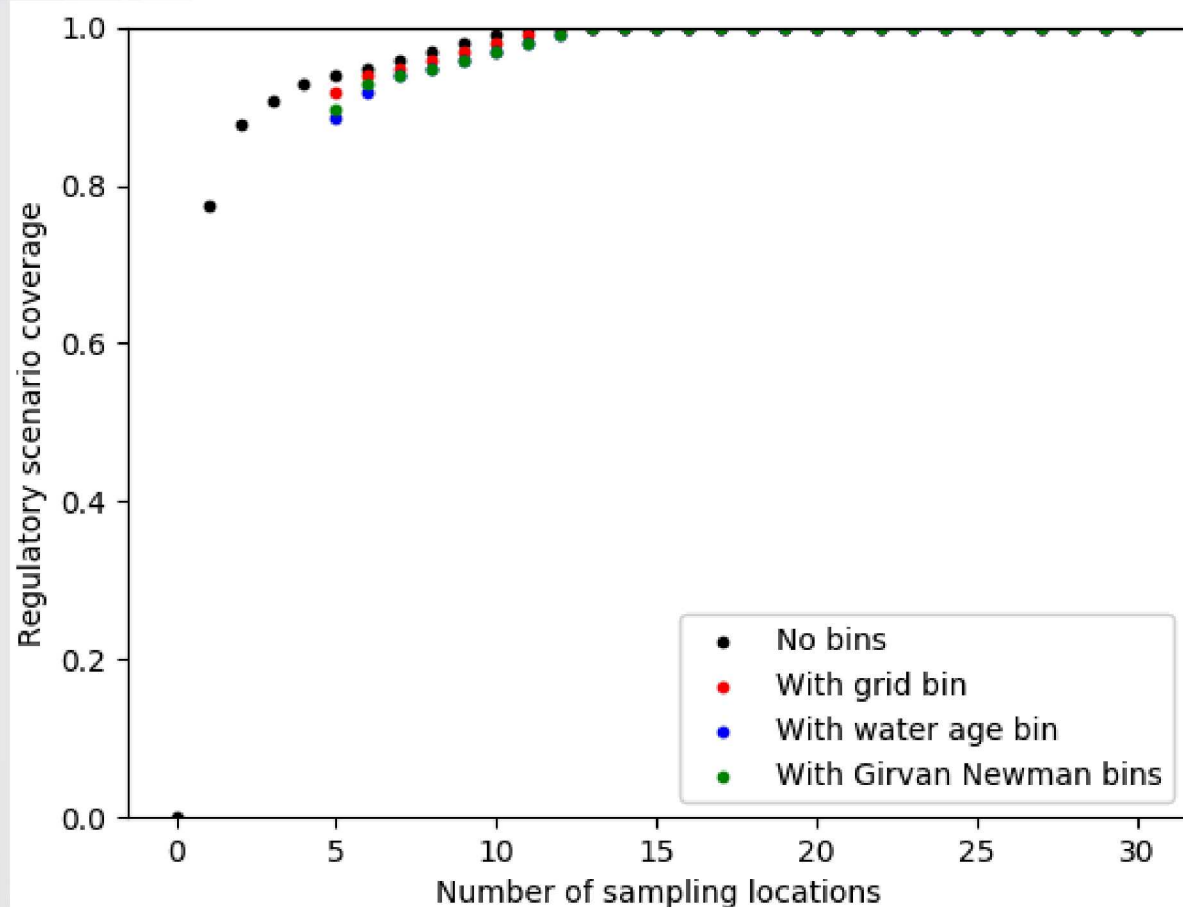


Security sample locations, Grid bins



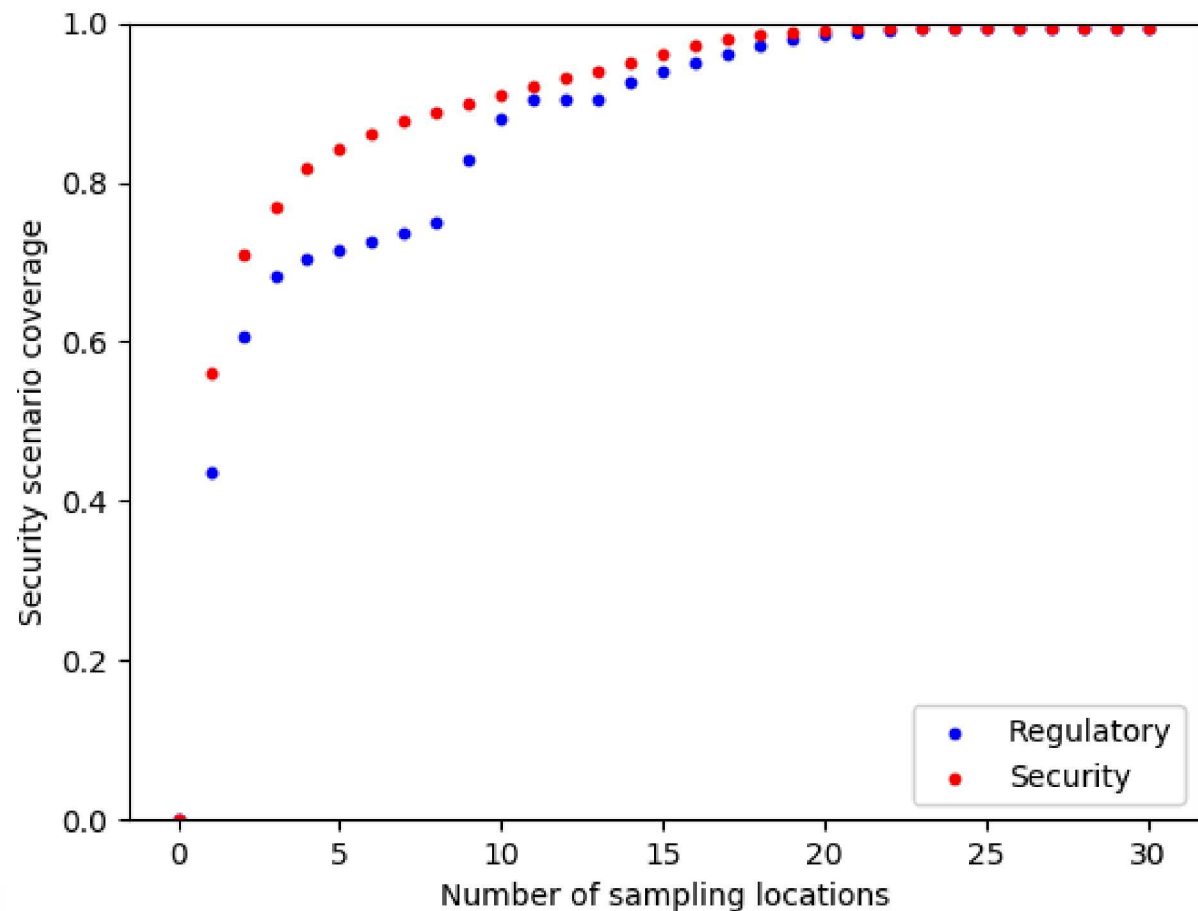
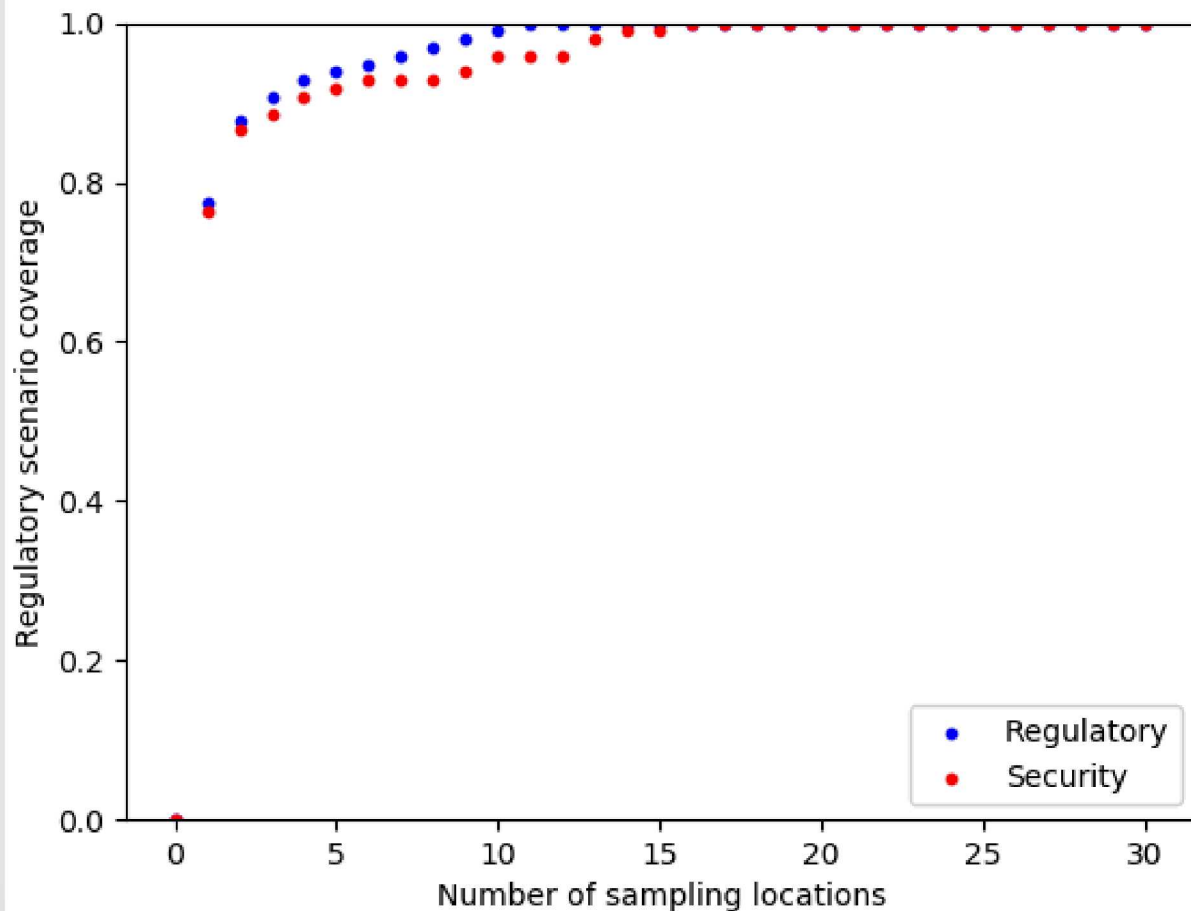


Example # 1 Binning Results

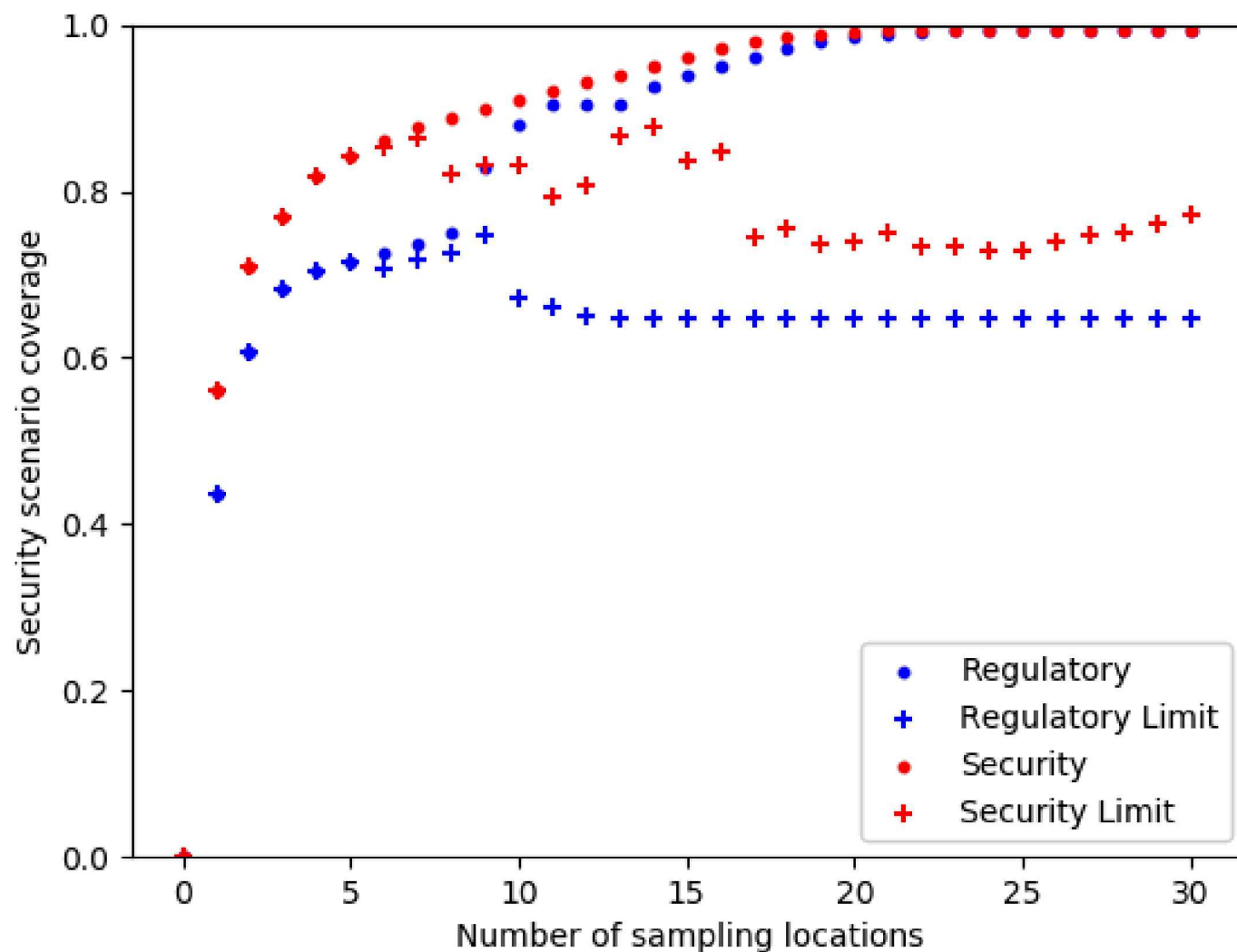




Example # 1 Evaluation Results



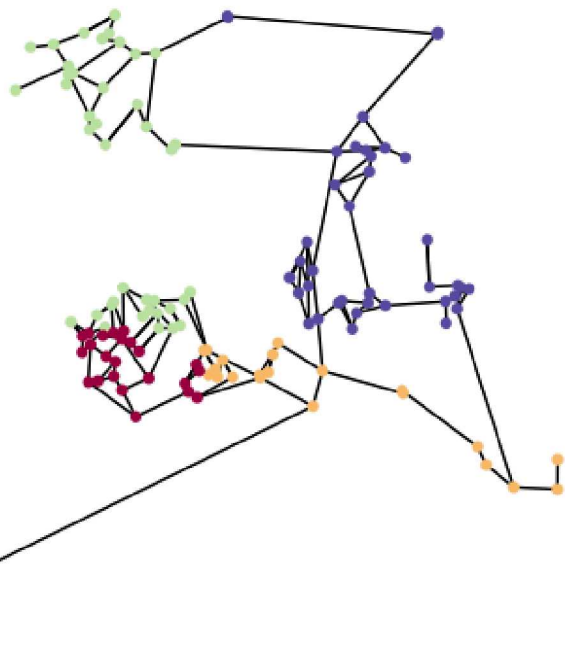
Example # 1 Evaluation with Limitations



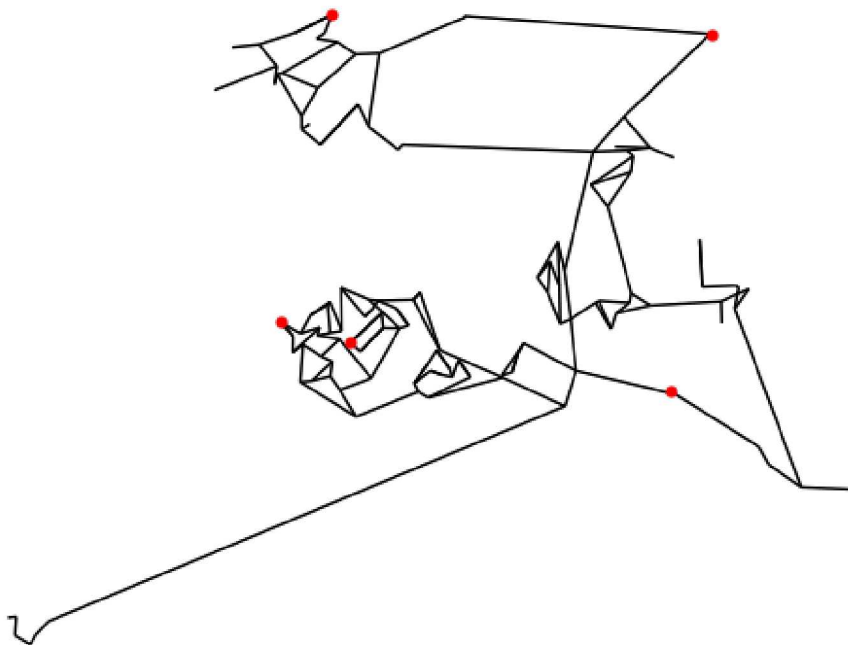
Example Network # 2

- Battle of Water Sensor Networks (BWSN) Network 1

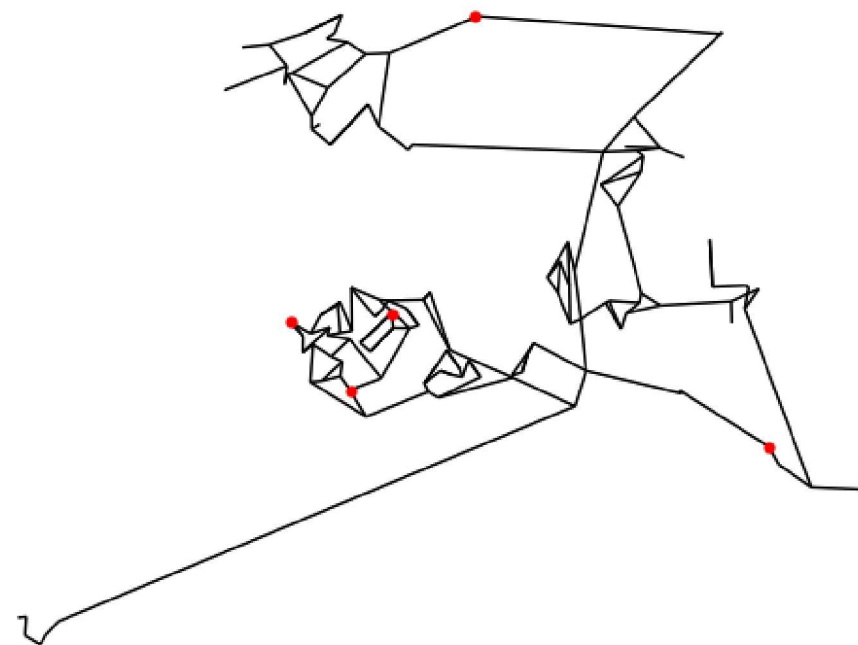
Grid bins



Regulatory sample locations, Grid bins

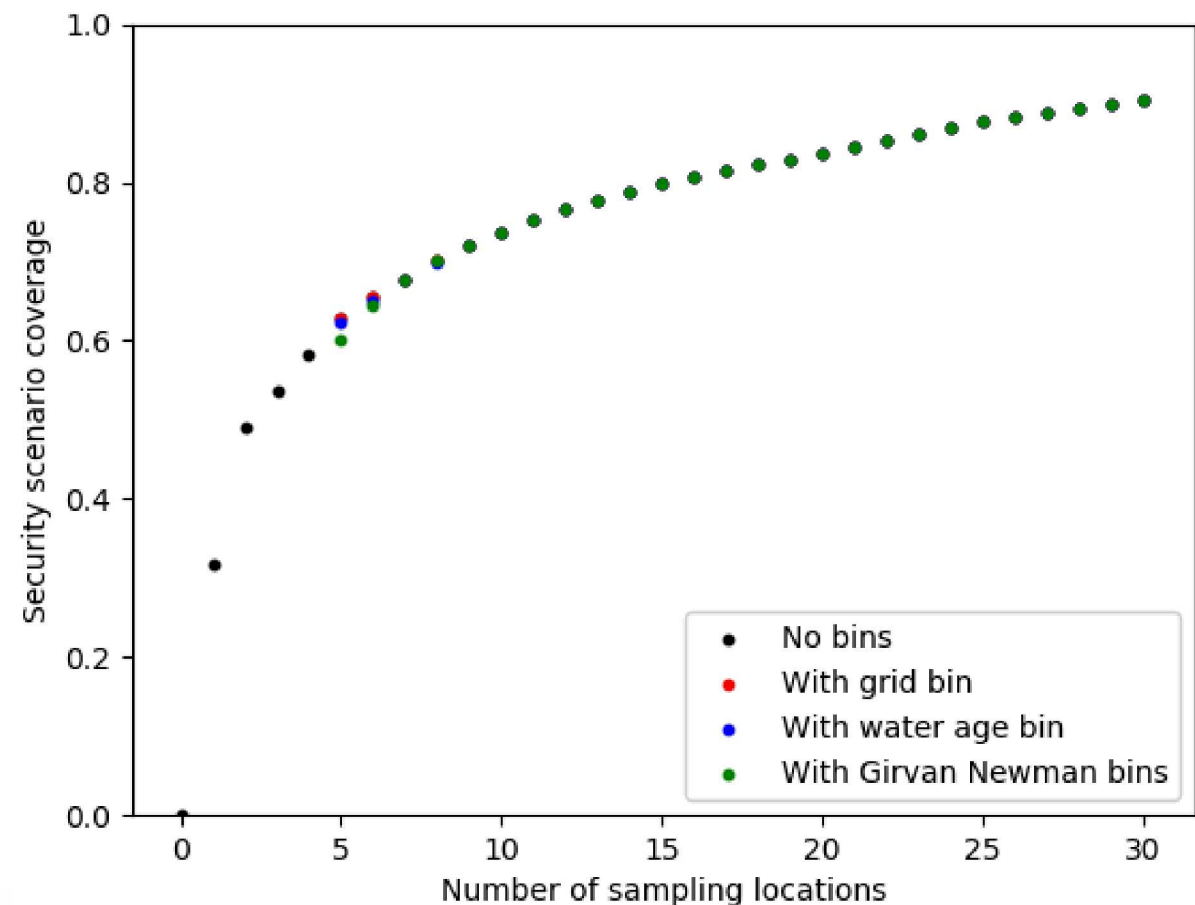
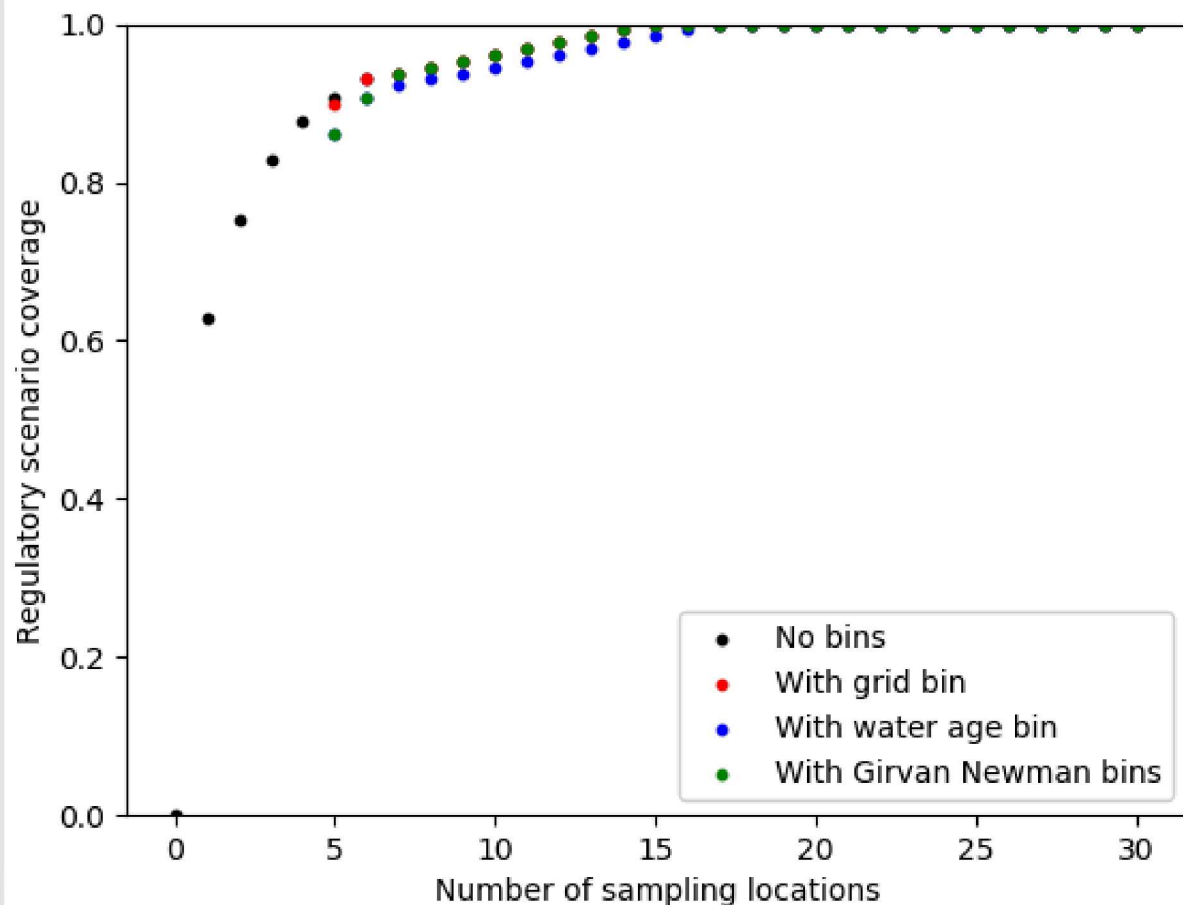


Security sample locations, Grid bins



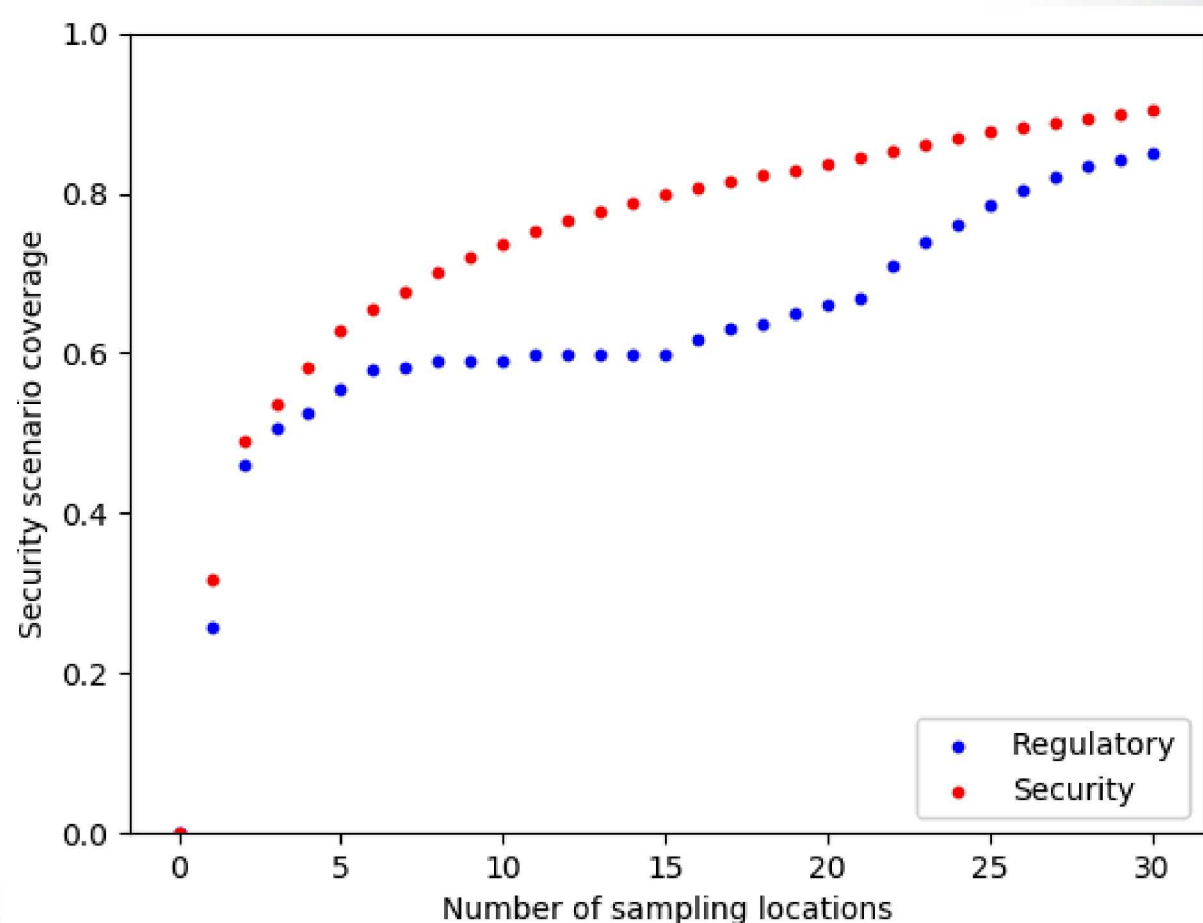
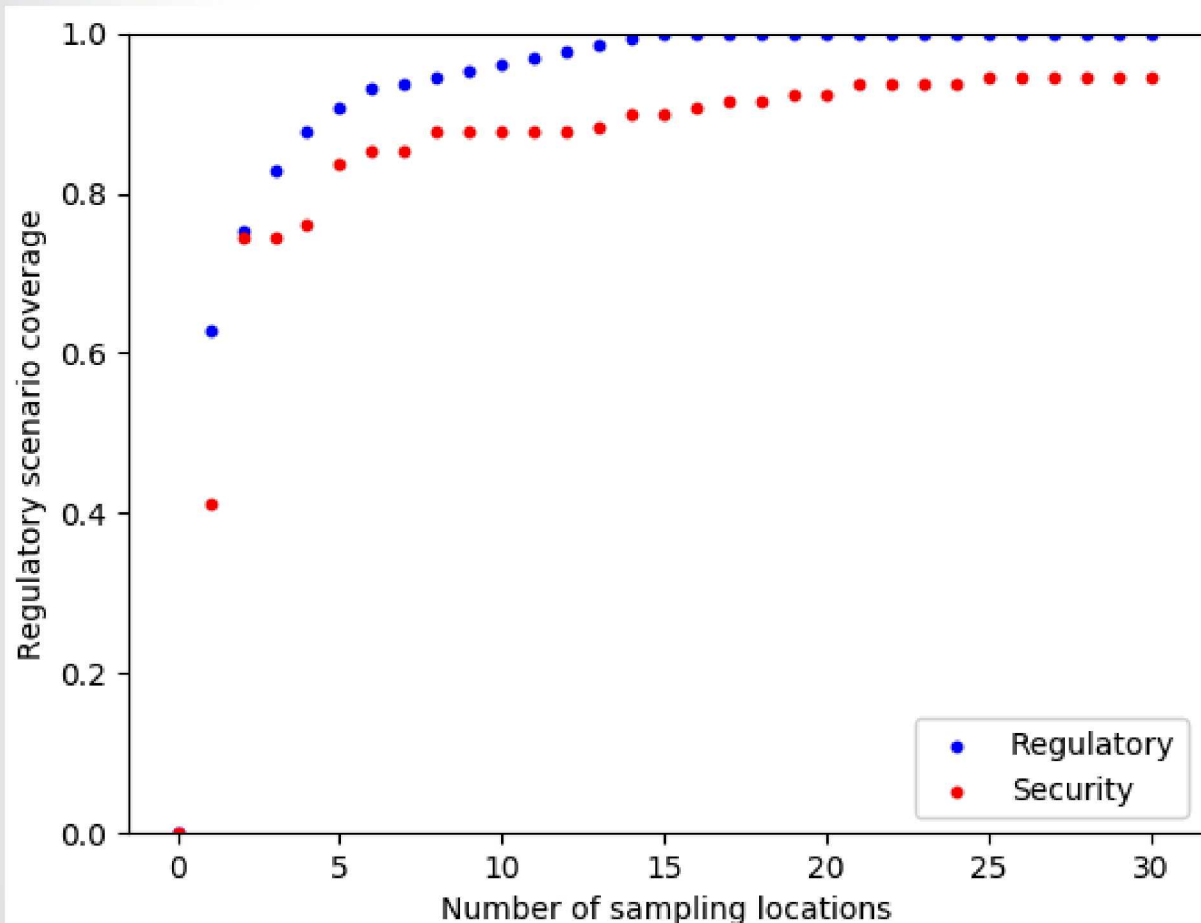


Example # 2 Binning Results

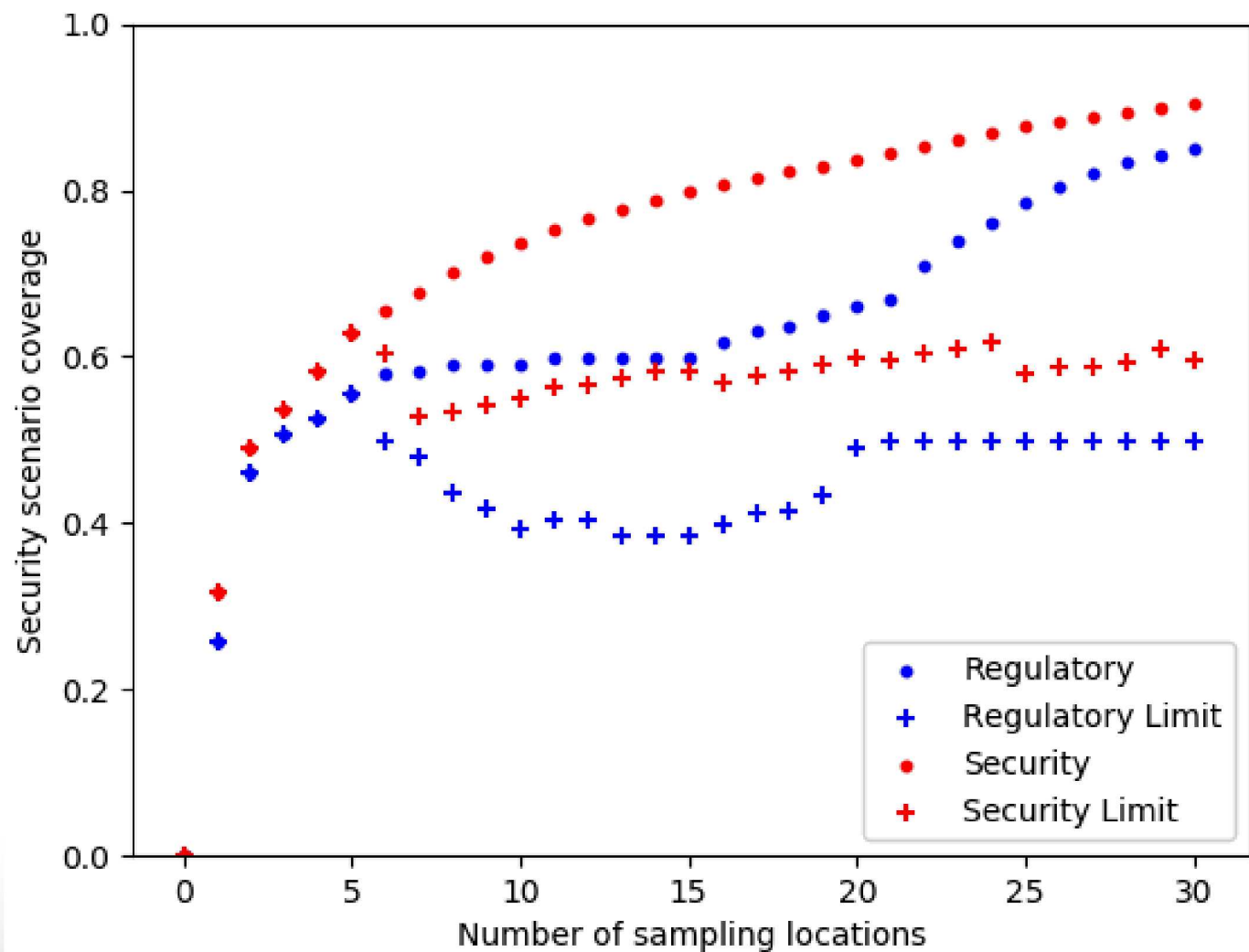




Example # 2 Evaluation Results



Example # 2 Evaluation with Limitations





Conclusions/Next Steps

- **If grab sample locations are determined using security scenarios, they will still be good locations for regulatory purposes**
- **If grab sample locations are determined using regulatory scenarios, they will not perform as well for security**
- **Binning constraint did not have much affect on coverage**
- **Additional studies are needed**
 - **With larger, more detailed networks**
 - **Include equal distribution in bins**
 - **Include binning constraints in evaluation**

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