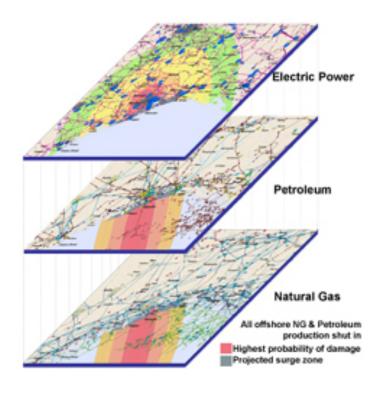


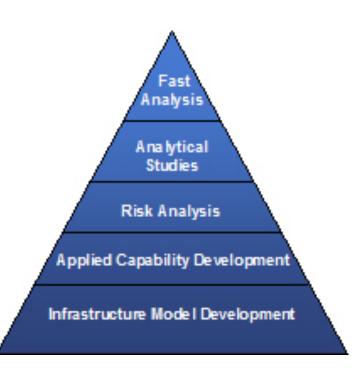
# Infrastructure Systems

- Distributed
- Complex
- Highly Interdependent
- Constantly Changing
- Vital
- At risk:
  - Dilapidation
  - Forces of Nature
  - Supply/Demand
  - Malevolent Threats



### Computational needs

- Population growth model
- Efficient use of resources
- Risk analysis
- Infrastructure modeling
- Analytical studies
- Real-time analysis
- Sensor Placement
- The applications are endless. . .



#### Accurate models are vital for:

- Economic development
- Energy sustainability
- Cost planning
- Ecology
- Environment
- Quality of life
- Many others. . .



### Water Systems

- Are a unique challenge:
  - Availability needs to be high
  - Often built on much older sub-systems
  - Demand is increasing dramatically
    - Population Growth
    - Energy need
  - Resources may be limited
  - Need to be monitored for quality and safety
  - Huge number of possible contaniments/problems in the system

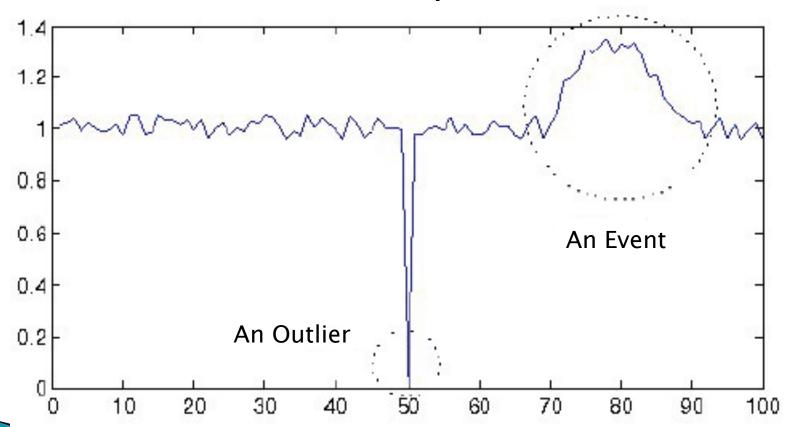
#### System Problems:

- Chemical Contaminants
- Biological Contaminants
- Physical Damage
- Source interruption
- Unauthorized use

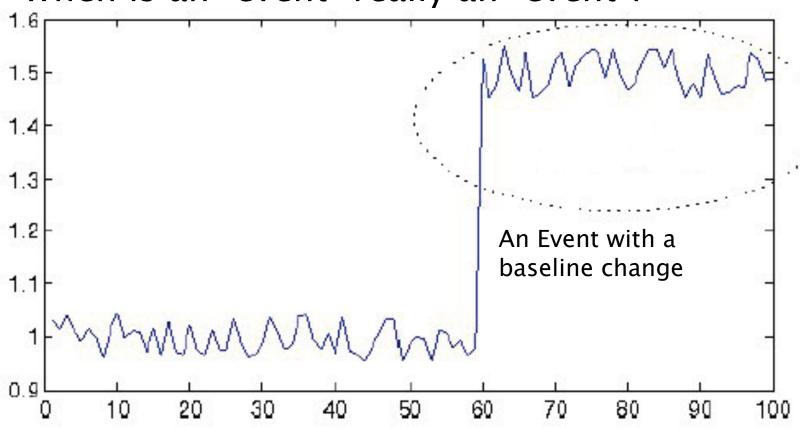
#### Sensors

- Often "secondary" Ph, Chlorine, Alkalinity, volume, etc.
- More advanced (and expensive) sensors may not be feasible, cost prohibitive, etc

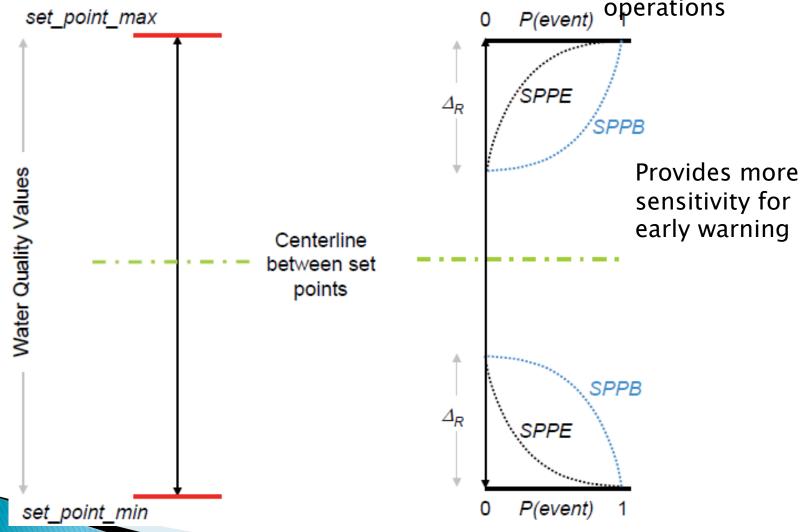
When is an "event" really an "event"?



When is an "event" really an "event"?

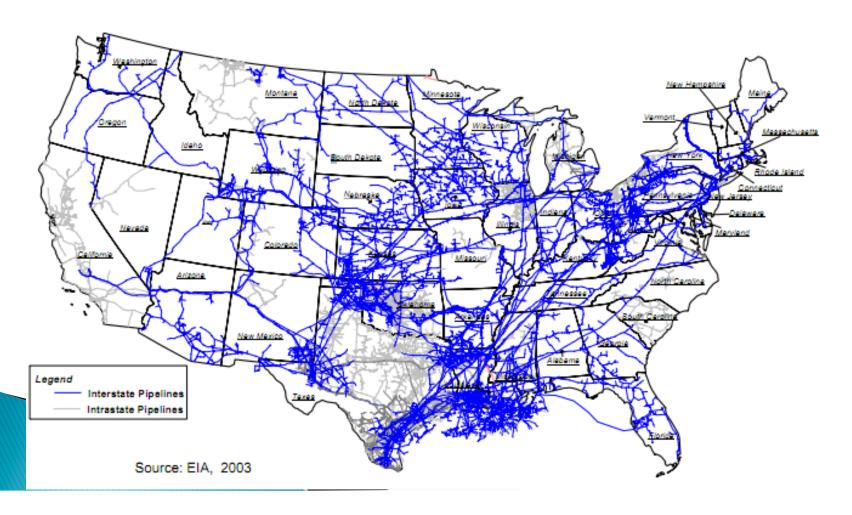


Removes "noise" of day-to-day operations



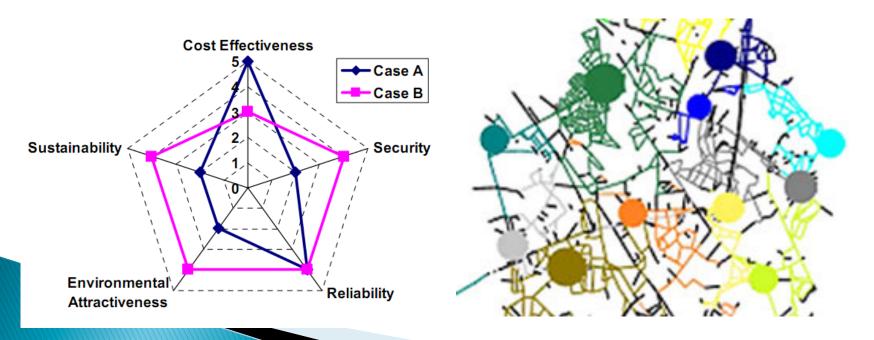
### Sensor Placement

- Huge systems, limited resources
- Many potential points of failure



### Sensor Placement (cont.)

- Need best coverage for lowest cost
- Parameters change drastically from system to system
- Changes in one system can affect others



### Some solutions

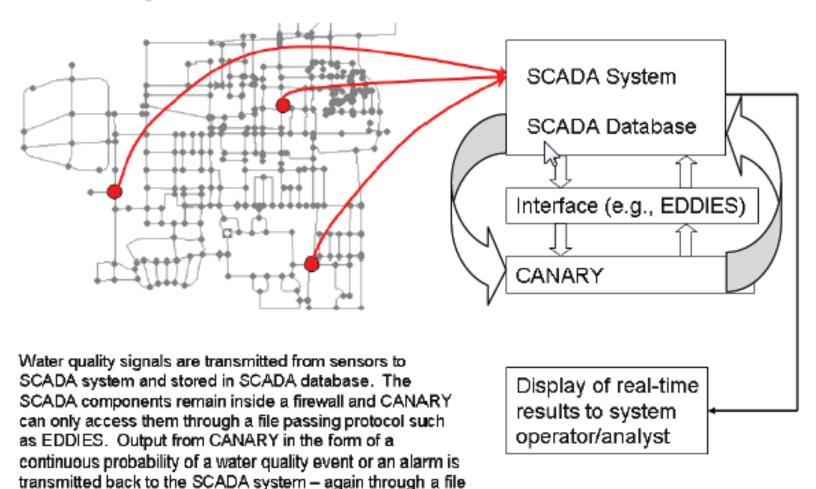
- Contamination warning systems (CWS)
  - EPA:
    - Classification and Analysis of Networked sensor ARraYs for Event Detection Systems (CANARY-EDS)
    - Water Security Initiative (WSI)
    - Vulnerability Self Assessment Tool (VSAT)
    - Water Health and Economic Analysis Tool (WHEAT)
- Sensor Placement
  - Sensor Placement Optimization Tool (SPOT)

#### **CANARY**

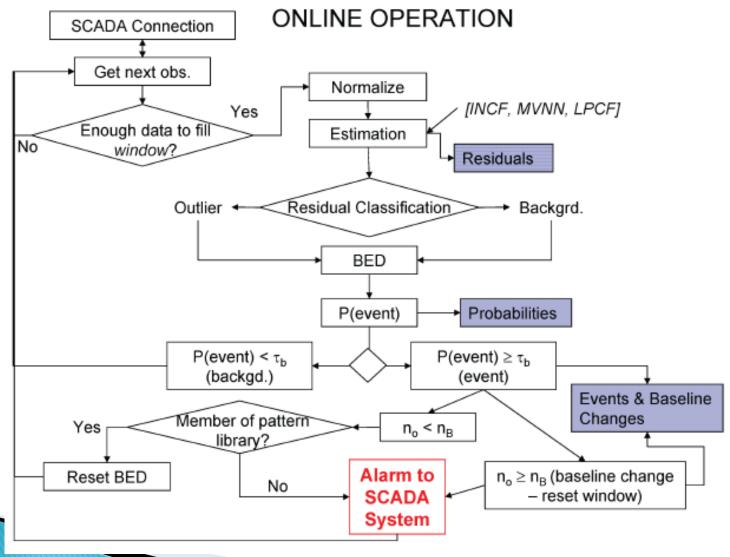
- Contamination warning system
- Originally designed to test algorithm feasibility on historical data (offline mode)
- Expanded to include an on-line mode to monitor real-time data provided by SCADA systems
- Analyzes one step of data at a time, compares actual to predicted based on the previous information

## Canary (cont.)

passing protocol using EDDIES or a similar system.



### Canary (cont.)



## Canary (cont.)

Data is normalized

 $X_{s} = \frac{X_{h} - \overline{x}}{\sigma_{x}}$ 

- Algorithms include:
  - Linear Prediction Filter
  - Multivariate Nearest Neighbor
  - Set-point Proximity Algorithms (SPPB and SPPE)
  - Consensus Algorithms
    - CAVE
    - CMAX
  - Binomial event Discriminator and Event Time-out
  - Pattern Matching based on historical data
  - Home-grown algorithms

#### **SPOT**

- Designed to solve generic placement problems
- Make decisions based on contaminant impact based on external data
- Allows for trade-offs between minimizing exposure, illness, spatial extent, detection time, and cost.
- Designed to solve complex systems (order of 10,000 pipes and junctions) on simple hardware (i.e. a desktop computer)
- Heuristic methods used to calculate mean impact sensor placement formulation

### Reference

- Information and graphics from:
  - "Infrastructure Surety and Sustainability", Mike Hightower, Sandia National Labs ( <a href="http://www3.abe.iastate.edu/biobased/Hightower.pdf">http://www3.abe.iastate.edu/biobased/Hightower.pdf</a>)
  - Case Study Application of the CANARY Event Detection Software (Murray et al., 2010)
  - SPOT A Sensor Placement Optimization Tool for Drinking Water Contamination warning System Design (Hart et al. 2007)
  - CANARY User's Manaual v. 4.3 (Hart et al.)
  - (Hall et al., 2007) Hall, J, Zaffiro, AD, Marx, RB, Kefauver, PC, Krishnan, ER, Haught, RC & Herrmann, JG, "On-line water quality parameters as indicators of distribution system contamination", Journal of the American Water Works Association, vol 99, no. 1, pp. 66-77. 2007.

### Reference

#### Additional Resources

- (McKenna et al., 2006) McKenna, SA, Klise, KA & Wilson, MP, "Testing water quality change detection algorithms", Proceedings of the 8th Annual Water Distribution Systems Analysis Symposium (WDSA), ASCE, Cincinnatti OH. 2006.
- (Klise & McKenna, 2006b) Klise, KA & McKenna, SA, "Water quality change detection: multivariate algorithms", Proceedings of SPIE Defense and Security Symposium 2006, Internation Society for Optical Engineering (SPIE), Orlando FL. 2006
- (Hart et al., 2007) Hart, DB, McKenna, SA, Klise, KA, Cruz, VA & Wilson, MP, "CANARY: A water quality event detection algorithm development and testing tool", Proceedings of ASCE World Environmental and Water Resources Congress 2007, ASCE, Tampa FL. 2007.

#### Reference

- Additional Resources
  - https://software.sandia.gov/trac/canary
  - https://software.sandia.gov/trac/spot
  - http://www.sandia.gov/nisac/
  - http://www.epa.gov/nhsrc/news/news112607.html