Implementation Of A Workflow For Streaming Sensor Data For A Large-Scale Hydrologic Monitoring Network



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## **Challenges to Managing Sensor Data**

- Volume of data
- Data heterogeneity
- Multiple watersheds
- Multiple institutions
- Multiple personnel
- Scale
- Data quality assurance and quality control
- Standardize data editing
- Synchronize timing, data access, equipment tracking



# Gradients Along Mountain To Urban Transitions (GAMUT) Network

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- Ecohydrologic observatory deployed in 3 watersheds: Logan River, Red Butte Creek, Provo River
- Watersheds with similar water source (high elevation snow) but different land use transitions
- Measures aspects of water inputs and outputs and water quality over mountain-to-urban gradient
- Mix of aquatic and terrestrial in situ and relocatable sensors

# Gradients Along Mountain to Urban Transitions (GAMUT) Network

#### **Climate/Terrestrial Sites**

		Manufacturer	Instrument	Variables Measured
		Campbell	HC2S3	Air Temperature and Relative Humidity
	Wind Speed/Direction	Apogee	ST110	Air Temperature
		Campbell	CS106	Barometric Pressure
N.		RM Young	5303	Wind Speed/Direction
ĺ.		Geonor	TB-200	Precipitation
		Judd	Depth Sensor	Snow Depth
Radiation	Snow Depth	Hukseflux	NR01	Incoming and Outgoing Shortwave and Longwave Radiation
		Apogee	SP-230	Incoming Shortwave Radiation
Temp/RH Precipitation	Barometric Pressure (inside enclosure)	Apogee	SQ-110	Incoming and Outgoing Photosynthetically Active Radiation
		Apogee	SI-111	Surface Temperature
		Acclima	ACC-SEN-SDI	Soil Moisture, Temperature, and Conductivity at 5 cm, 10 cm, 20 cm, 50 cm, 100 cm below ground
		Campbell	CS210	Enclosure Humidity
		Campbell	18166	Enclosure open door sensor

#### **Aquatic Sites**

Pressure Transd housing	lucer	Turbidity Sensor
		housing
	Sonde Sta housing	age plate
Manufacturer	Instrument	Veriebles Messured
manufacturer	instrument	variables Measured
YSI	599100-01	Dissolved Oxygen
YSI	599100-01 599870-01	Dissolved Oxygen Specific Conductivity and Water Temperature
YSI YSI YSI	599100-01 599870-01 599795-02	Dissolved Oxygen Specific Conductivity and Water Temperature pH
YSI YSI YSI YSI	599100-01 599870-01 599795-02 599101-01	Dissolved Oxygen Specific Conductivity and Water Temperature pH Fluorescent Dissolved Organic Matter (fDOM)
YSI YSI YSI YSI YSI	599100-01 599870-01 599795-02 599101-01 599102-01	Dissolved Oxygen Specific Conductivity and Water Temperature pH Fluorescent Dissolved Organic Matter (fDOM) Blue Green Algae and Chlorophyll <i>a</i>
YSI YSI YSI YSI YSI Campbell	599100-01 599870-01 599795-02 599101-01 599102-01 CS451	Dissolved Oxygen Specific Conductivity and Water Temperature pH Fluorescent Dissolved Organic Matter (fDOM) Blue Green Algae and Chlorophyll <i>a</i> Water Depth and Water Temperature

# Gradients Along Mountain to Urban Transitions (GAMUT) Network



# **GAMUT Data Workflow**



# **Sensor Data Acquisition**



### **Datalogger Program Updates**



# **Data Loading and Storage**









Horsburgh, J. S., D. G. Tarboton, D. R. Maidment, and I. Zaslavsky (2008), A relational model for environmental and water resources data, *Water Resources Research*, 44, W05406, doi:10.1029/2007WR006392.

### **Data Loading and Storage**



### Web-Based Data Access



### Web-based Data Access



### Enhanced Web-Based Time Series Data Access and Visualization

Time Series Analyst					Time Series Analyst			
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Foothill Drive Advanced Aquatic     Green Infrastructure Climate		Rd	North The P		Green Infrastructure Climate     Krewiten Fork Basis Aquatis	B RB CG BA	Oxygen, dissolved, transducer signal	Raw data
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		Blue-green algae (cyanobacteria), phycocyanin     G     Chlorophyll Eluorescence						
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		<ul> <li>✓ Time Stamp</li> <li>✓ Electric Power</li> <li>✓</li> </ul>	October November December	2012 February March April	May June July	August Septembe	r	
		Colored Dissolved Organia Matter						

# **Sensor Data QAQC**



# **Development of a QAQC Plan**

### **Quality Assurance:**

"...protocols developed and adhered to in a way that minimizes inaccuracies in the data produced ... produces high-quality data while minimizing the need for corrective measures to improve data quality."

- Site Standardization
- Data Curation (Datalogger Programs and Files, Data Averaging, Database Structure, Equipment Management)
- Replicate Sensors
- Factory Maintenance
- Field Maintenance Schedule and Procedures
- Field Calibration Schedule and Procedures
- Manual Data Monitoring
- Automated Data Monitoring and Alerts
- Recording Events

### Quality Control: "occurs after

the data are generated and tests whether they meet the necessary requirements for quality outlined by the end users."

- Data Qualifiers and Flagging
- ODM Tools Python (data management software)
- Quality Control Levels
- Data Processing Steps



Campbell, J. L., Rustad, L. E., Porter, J. H., Taylor, J. R., Ethan, W., Shanley, J. B., ... (2013). Quantity is Nothing without Quality. BioScience, 63(7), 574-585. doi:10.1525/bio.2013.63.7.10

### **QAQC: Automated Alerts**

#### Technicians receive email alerts daily

- **1. Power**: batter voltage < **12** volts
- 2. **Persistence**: value of a variable is unchanging
- 3. Updates: data are not being reported
- 4. NaNs: sensor is reporting "NaN" values

Additional alerts will be implemented as needed (e.g., variable-specific range checks, internal consistency, spatial consistency).

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4	LR TWDEF C	25 PAROut Avg	.00 2	2014-02-17	18:45 2014-02-	18 04:00	38
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4	LR TWDEF C	45 SoilCond 50cm	Ava .0	0 2014-02-1	7 06:15 2014-	02-18 04:00	88
4	LR TWDEF C	48 SoilTemp 100cm	Ava -2	06 2014-02	-17 09:15 2014	-02-17 13:1	5 1
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### **QAQC:**

### **Data Visualization and Management**



# QAQC: Data Visualization and Management









### **QAQC:** Post Processing







Data Model developed to relate:

- Equipment
- Field Activities
- Deployments
- Calibrations
- Measured Variables
- Datalogger Programs

Database serves as underlying structure to web interface.



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• Track equipment deployments, calibrations, service events

#### Equipment

- Model
- Serial number
- Owner
- Vendor
- Manufacturer
- Service history



#### Calibrations



- Method
- Standard

#### Deployments



- Deployment type
- Description
- Dates
- Offsets

#### Time Series Observations



#### Site Visits



- Location
- Date
- People
- Conditions

# Field Activities



- Activity type
- Description
- Date

### **Open Source Code Repositories**

- ODM Tools Python Sensor Data Management
  - https://github.com/UCHIC/ODMToolsPython
- ODM2 Sensor Sensor equipment management
  - https://github.com/UCHIC/ODM2Sensor
- WEBTSA Time series data visualization
  - https://github.com/UCHIC/WEBTSA







#### Acknowledgements

iUTAH Watershed Technicians: Chris Cox Joe Crawford Dave Eiriksson

UWRL Student Programmers: Juan Caraballo Jacob Meline Mario Matos Maurier Ramirez



Support: EPS 1208732

NSF

# **Questions?**

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