



Quality Assurance for Gas & PM Sensors Networks

2023 Air Sensors Quality Assurance Workshop

Section: QA for specific gas and PM sensor applications continued

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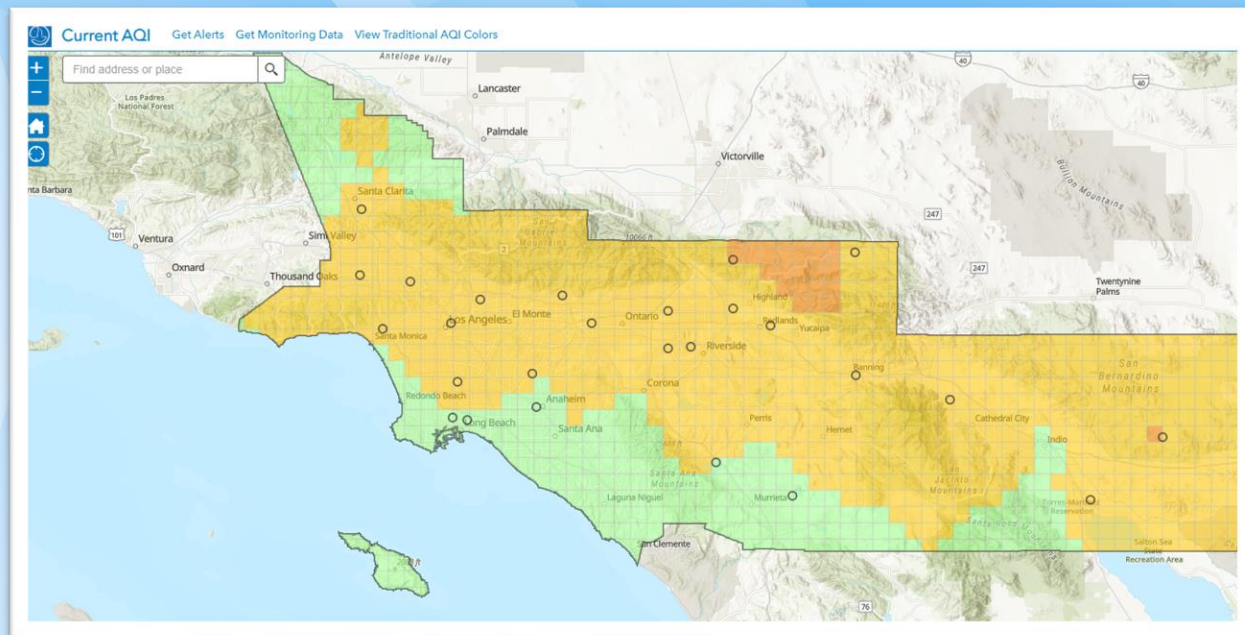
RTP, NC

07/27/23

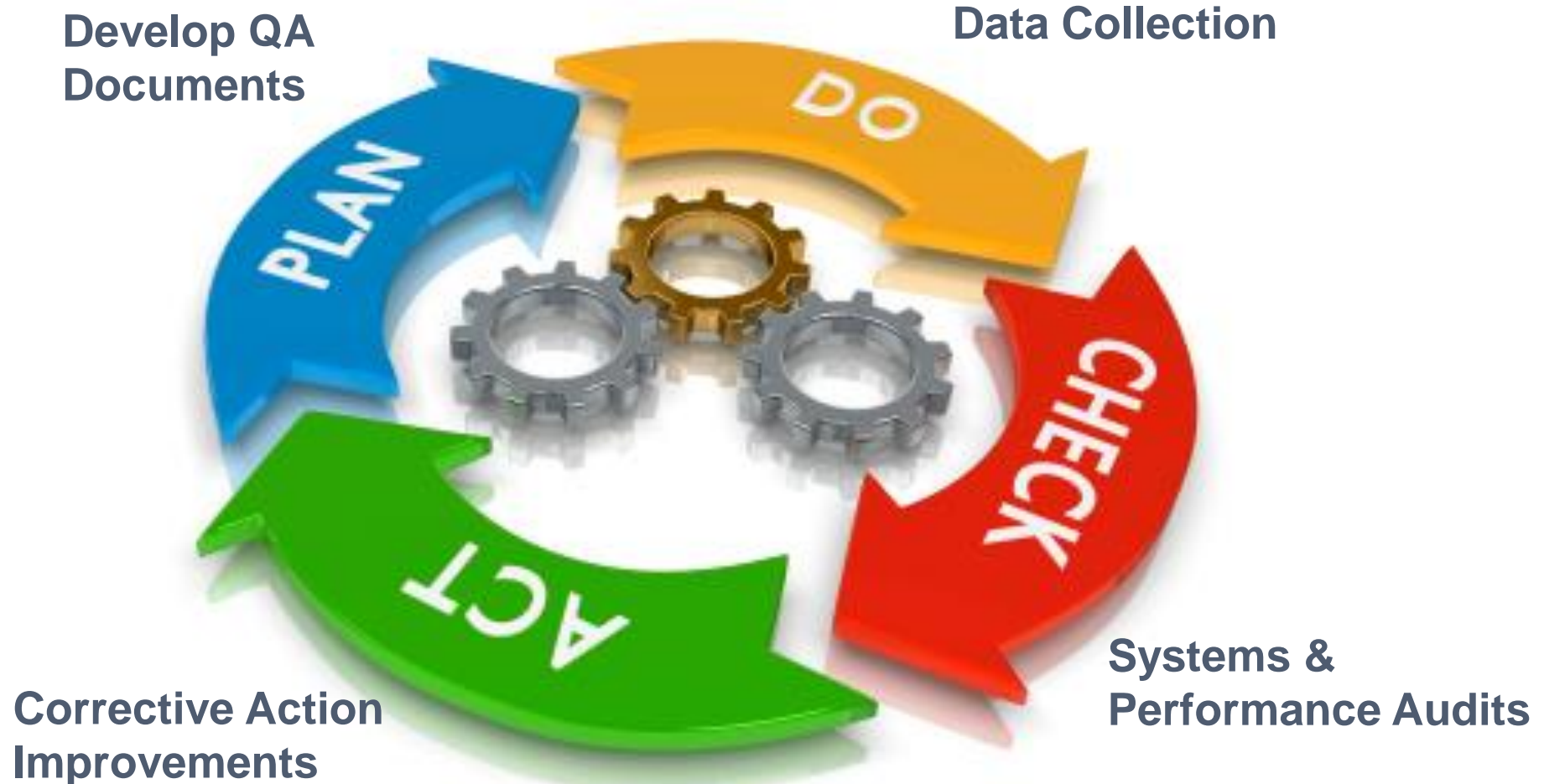


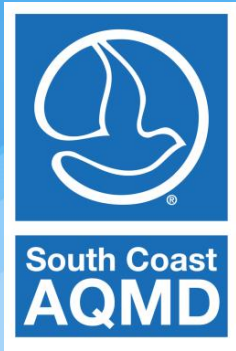
QA Objective = Data Usefulness and Timeliness

- Obtain data of known quality
 - Calibrated data in real-time
 - Validated in near-real-time with appropriate QC checks
- Obtain data fit for purpose
 - Displayed data – filter for QC checks.



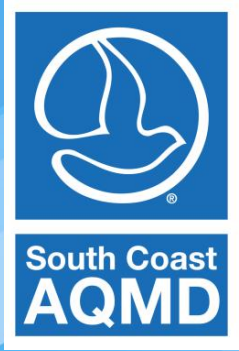
What have we been talking about so far? How to apply the QA lifecycle to sensor data





Presentation Focus

- The Do's and Check's of Sensor Networks
 - Importance of proper siting and collecting meta data
 - Importance of tracking sensor health to manage sensor maintenance
 - Importance of choosing a calibration approach
 - Importance of developing QC metrics
 - Importance of auto alerting and auto flagging of data for real-time data displays
- Upcoming sensor network QA approaches
 - Sensor network evaluations
 - QA verifications



Know your locations and obtain meta data



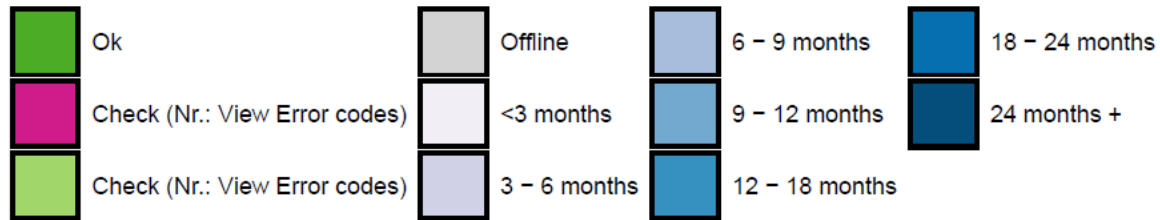
Recommendations:

- Locate sensors at breathing height or above and away from obstructions
- Verify sensor installations with collecting meta data and pictures via surveys
- Know your surroundings and annotate accordingly for data analysis
- Example survey: www.aqmd.gov/aq-spec/special-projects/star-grant



Device Management - Sensor Health Dashboard

Category	5x5 grid	AB 617 ECV	AB617 LA	AMS - CELA	AMS - CMPT	AMS - Palm Springs	AMS - RIVR	AMS - SNBO	AMS - Van Nuys	City of LA	City of Rialto	Coachella Valley	Diamond Bar	Riverside	RUSD	San Bernardino	Seal Beach
Runtime PM2.5 sensor	256	281	316	717	618	484	618	402		492	723	642	158	486	719	440	613
Runtime O3 sensor	417	85	316	720	409	567	527	402		411	419	652	158	277	869	215	
Data Completeness (%)	100	100	100	100	100	100	100	100		67	100	100	100	100	100	100	100
RH sensor	Ok	Ok	Ok	Ok	Ok	Ok	Ok	Ok		Ok	Ok	Ok	Ok	Ok	Ok	Ok	Ok
Temp sensor	Ok	Ok	Ok	Ok	Ok	Ok	Ok	Ok		Ok	Ok	Ok	Ok	Ok	Ok	Ok	Ok
PM sensor	Ok	Ok	Ok	Ok	Ok	Ok	Ok	Ok		Ok	Ok	Ok	Ok	Ok	Ok	Ok	Ok
Ox sensor	22					22						24		22		22	
O3 sensor	12 17		14	11 12	12	12 15	12 15	12 17		12 15		12			12 12	12	
Power	Ok	Ok	Ok	Ok	Ok	Ok	Ok	Ok		Ok	Ok	Ok	Ok	Ok	Ok	Ok	Ok
Comms	Ok	3	Ok	Ok	Ok	Ok	Ok	Ok		Ok	Ok	Ok	Ok	Ok	3	Ok	Ok





Develop Quality Control Rules for Data

- **Sensor-specific**

- Manufacturer-designated bounds
- Environmental operating limits (temperature and humidity)
- Unique features that can be leveraged
- Common failure modes (e.g., “sticky values” or flatlining)
- Behavior that may indicate a failure/drift or an actual air quality event, such as wildfires (e.g., extended elevated readings)

- **Pollutant-specific**

- Typical ranges
- Typical trends (e.g., diurnal trends)

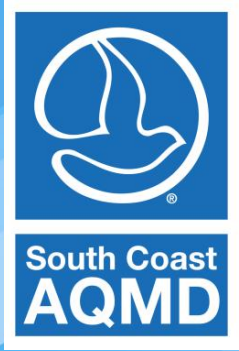
- **Actions**

- Invalidate –malfunctions
- Flag – data indicating failure OR an air quality event of interest
- Requirements – for criteria that must be met (e.g., for completeness)
- Adjust value – in some cases values may be adjusted/calibrated (e.g., to zero)



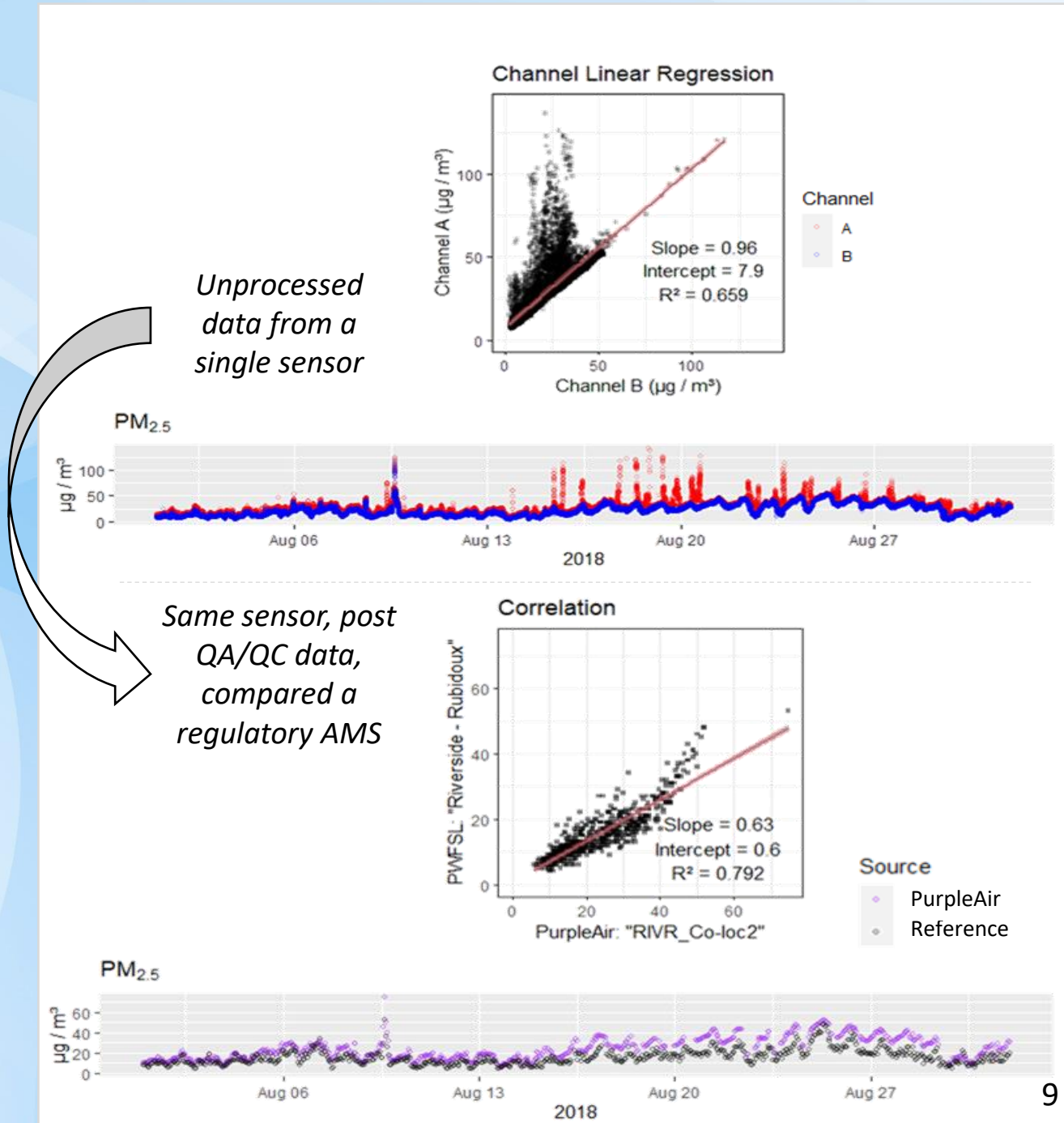
Develop QC Rules - Examples

QC Rule	Logic	Action
High/Low Value Check	If PM _{2.5} concentration value > 300 µg/m ³ for > 4 hr	Flag
High/Low Value Invalid	If PM _{2.5} concentration value > 900 µg/m ³ for > 24 hr If PM _{2.5} concentration value < 0.5 µg/m ³ for > 24 hr	Invalidate
Out of Bounds	If value is out of range of sensor manufacture specs O ₃ > 200 ppb; NO ₂ > 500 ppb; PM _{2.5} > 1000 µg/m ³ ; Temp < -10 or > 60 °C; or RH < 0 or > 100 %	Invalidate
Flatline	If rolling Std Dev < 1 for > 12 hours	Invalidate
Temperature Exceedances	If temp < -15 or > 110 ° F, concentration data flagged as "High Temp"	Flag
Negative Data Filter	If concentration value < - 5 ppb for O ₃	Invalidate
Negative value replacement	If concentration value > -5 ppb and < 0 for O ₃ ; set to zero	Set to zero
Offline	No data from sensor > 12 hours	Flag
Data Averaging	Require 75% valid data recovery to generate time averages	Requirement
Correlation Check	Purple Air: If R ² between A/B < 0.5 for 36 hour Community: If R ² between sensor/community < 0.5 for 36 hour	Flag



EXAMPLE: QA/QC Applied

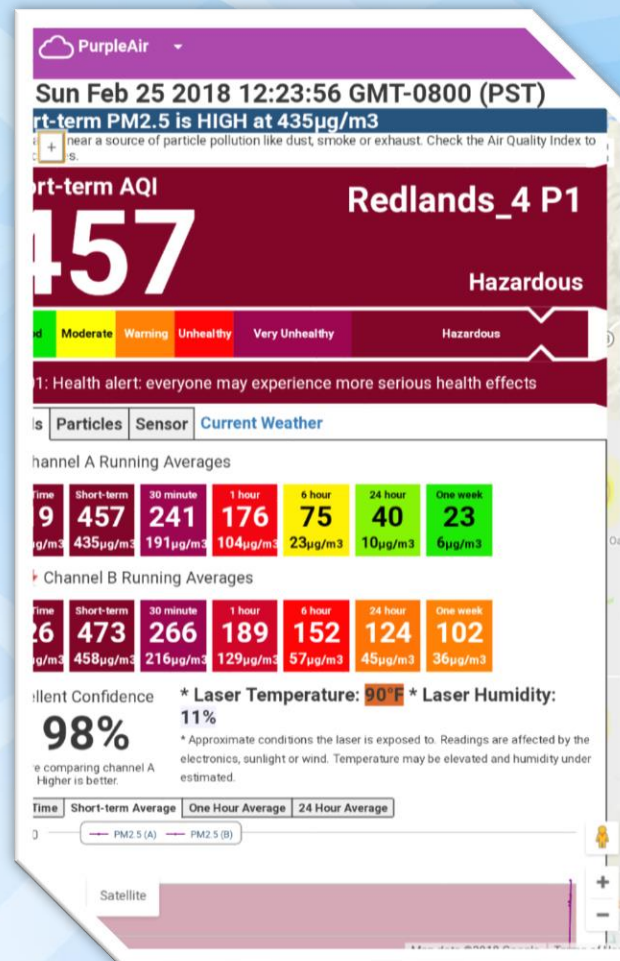
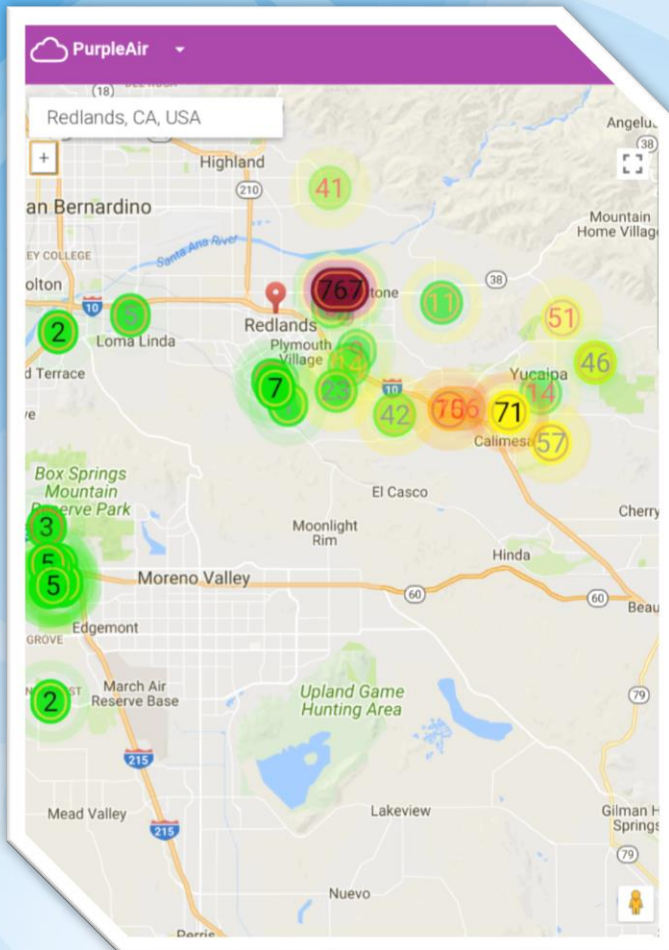
- The top plot depicts high-time resolution data from a sensor co-located at a regulatory air monitoring station
- Here there is disagreement between the duplicate channels (i.e., noise in the Channel A data, though in general trends agree)
- Filtering, applying a QA/QC Algorithm, and aggregating the data results in the processed data (bottom plot)
- The result is post-QA/QC data, for which trends agrees fairly well with the corresponding regulatory data





Correlation check: Sensor to community

Hyper-local effects





Develop a Calibration Approach

Types	Overview	Pros	Cons
Factory Calibration	High throughput batch calibrations, resulting in correction factors (often linear)	All sensors in a batch calibrated under the same conditions	Occurs once by manufacturer



Upcoming Approaches for QA of Sensor networks

- Sensor Network Performance Evaluations
 - How well do calibration approaches work?
 - How well do QC measures / approaches work in real-time?
- Alternative options for obtaining QC verifications
 - Park and verify with mobile monitoring platform
 - Drive-by verification with mobile monitoring platform
 - Hierarchical co-locations / buddy checks



Key Takeaways

- Collect meta data on sensor deployments and obtain pictures of install
- Develop device management dashboard to direct network maintenance scheduling and track sensor lifetime
- Develop QC metrics to flag data to be filtered from real-time visualizations if not pass QC rules
- Choose and implement a calibration approach
- Develop additional QC checks to verify performance and collect QC data



Thank you!

Contact information

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