Development of a cloud-based application to ingest, validate, analyze, and map data from a large PM sensor network

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## Perspective:

Sensor Developer

Single Project Researcher

Government

End User

Multiple projects

## Outline

SCAQMD Sensor Networks

Development Drivers

Requirements (High-level; Back- and front-end)

Current Draft Architecture

Lessons learned

## Sensor Network Model

Model for Internet of Things (Air Quality)

LoRa

Г П Things that Sense: Air Quality Sensors (Stationary and mobile) Weather stations, Satellite Remote Sensing

Local Network: Wi-Fi (Home / Facility), Connected Cars, Bluetooth, Lo-Ra, Cellular, Zigbee radio network, satellite receiver

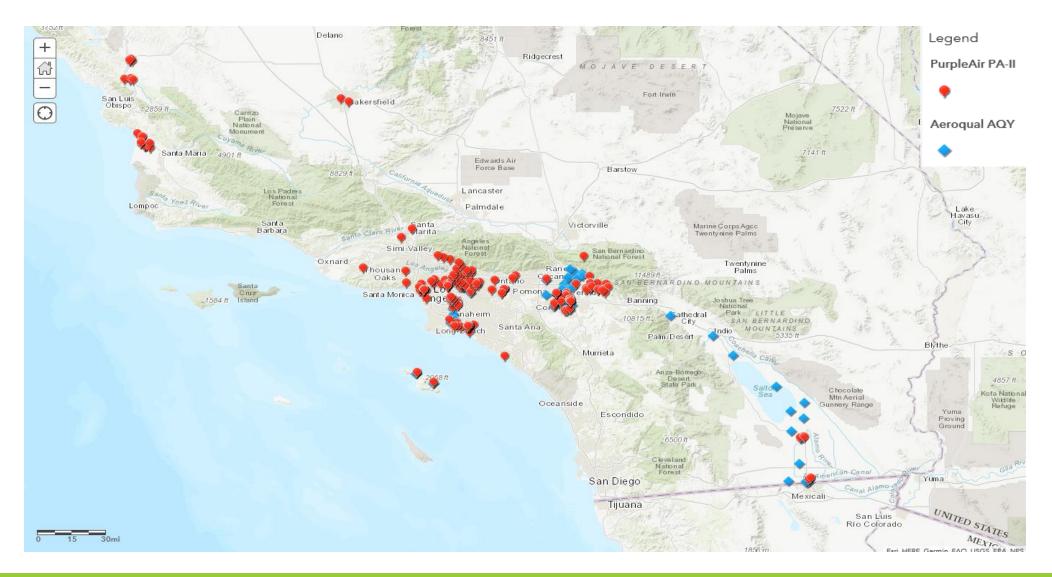
Cloud Services: Data ingestion, transformation, and storage

Analytics: Web-based analytics, dashboards, and applications

## SCAQMD Sensor Networks

Fugitive dust	Regional Monitoring	Community	Future monitoring projects
monitoring	Project	monitoring	
9 PM sensors IoT vendor platform	~ 100 Aeroqual AQY Measuring: O <sub>3</sub> , NO <sub>2</sub> , & PM	~ 390 PM sensors in 14 communities	Mobile monitoring AB617 community monitoring
Cellular to SaaS	Cellular to PaaS	<ul><li>Wi-Fi connected</li><li>Data sent to:</li><li>Purple Air Map</li><li>AQMD Azure</li></ul>	SCAQMD Rule 1180
API Access	API access		implementation
15 million rows	44 million rows/ yr.	50 million rows	> Past

## Sensor Network Deployments



Why is a Data Management Platform needed?

> Drivers for development

Multiple sensor / IoT data platforms used for various projects with data in different formats

Data analysis workloads larger than typical tools can handle - 50 million rows of Purple air data and growing

- 44 million rows of Aeroqual data will be generated in 12 months

- 14 million rows of fence-line monitoring data

Limited data analytics available on individual IoT platforms

Limited external user experience with potential for confusing user experiences

Apply QA/QC functions to create validated data set

Apply correction algorithms for sensor performance limitations

Quickly visualize and provide results to public in a clear and meaningful manner

## High level platform requirements:

Cloud-based computing platform to ingest, store, analyze, and visualize data

- Platform agnostic
- Device/sensor agnostic
- Scalable
- Secure
- Reliable
- Data standards based



## Back-end Requirements

### Server side of platform

- Includes infrastructure that does the heavy lifting of the project
- Not seen, yet requires significant effort to design and implement
- Essential for end-user experience in front-end application

### **Requirements:**

- Ingest IoT air quality sensor data
- Manage IoT devices
- Stream data and perform stream analytics
- Store and process geo-spatial time series

## Front-end Requirements

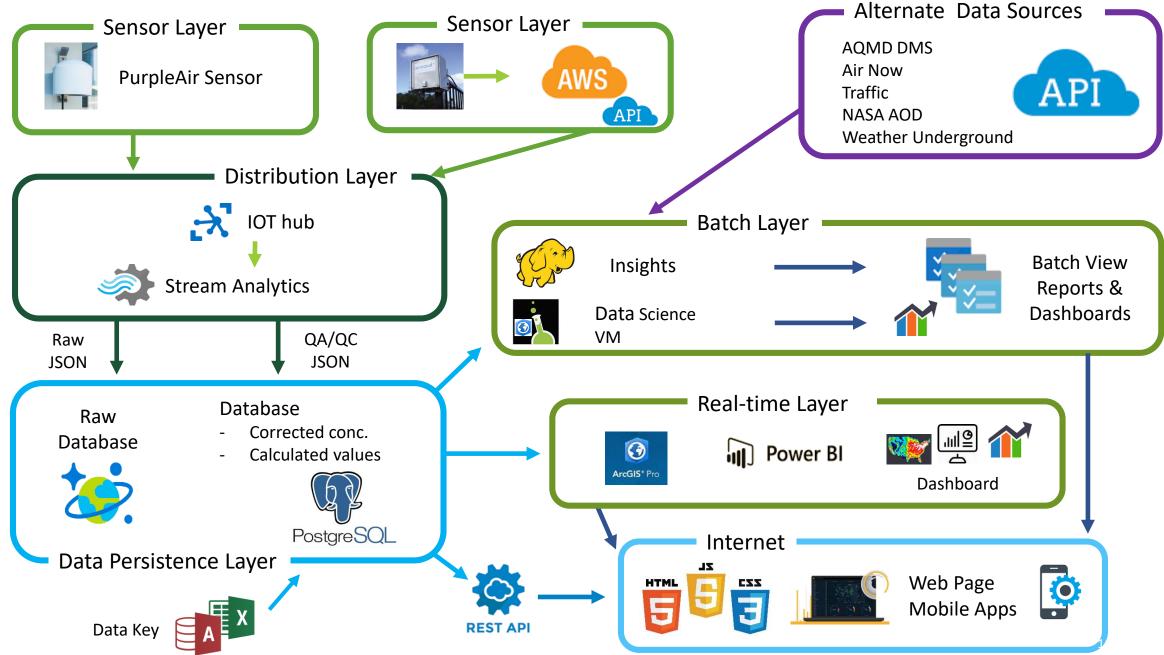
# Visual experience of the platform

- Conversion of data to graphical interface for web viewing
- Dependent on back-end infrastructure
- Involves HTML, CSS, and JavaScript

### **Requirements:**

- Create dashboard through a query builder platform
- Ability publish dashboards
- Ability for geo-spatial time series data analysis

### **Draft Cloud Architecture**



#### STAR Grant Community Deployment Status (Last 7 days)

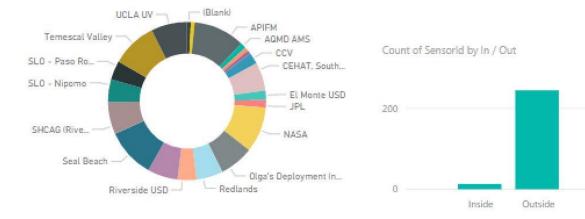
Reporting to Azure ## Distributed



Count of Sensorid by Group

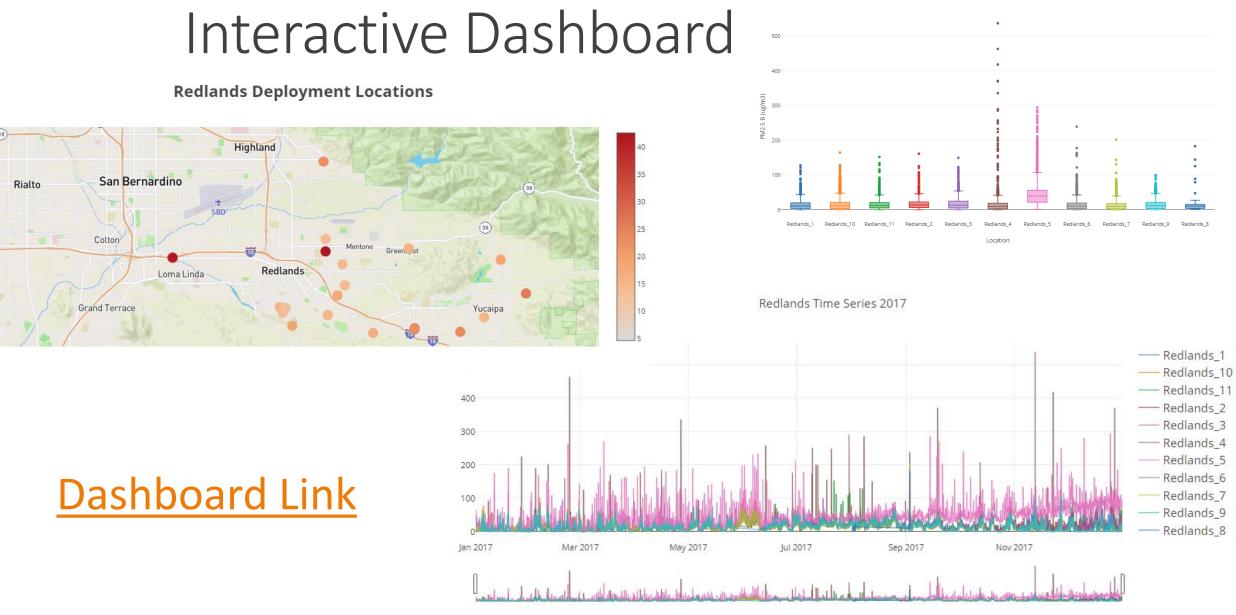
Connected Sensors

258



Sensorid	MAC #	Name	Group	PRA
18:fe:34:ddb0:97	18.fe:34:dd:b0:97	Highland 1	Redlands	Re
18:fe:34:dd:b1:69	18:fe:34:dd:b1:69	Redlands_10	Redlands	Re
18:fe:34:dd:b2:3a	18:fe:34:dd:b2:3a	Redlands_2	Redlands	Re
18:fe:34:ddtb2:b	18.fe:34:dd:b2:b	Redlands_4	Redlands	Re
18:fe:34:dd:b2:d6	18.fe:34.dd:b2:d6	Redlands 9	Redlands	Re
18:fe:34:dd:b3:6f	18.fe:34.ddtb3:6f	Redlands 11	Redlands	Re
18:fe:34:dd:b3:e	18.fe:34:dd:b3:e	Redlands 5	Redlands	Re
18:fe:34:dd:b4:4d	18:fe:34:dd:b4:4d	Yucaipa_7	Redlands	Re
18:fe:34:ddb8:fe	18:fe:34:dd:b8:fe	Redlands_7	Redlands	Re
18:fe:34:ddb9:aa	18:fe:34:dd:b9:aa	Yucaipa 3	Redlands	Rev
2101-100-00			<b>5</b> . 11 - 1	5

Redlands 2017 Box Plots



TimeStamp (UTC)

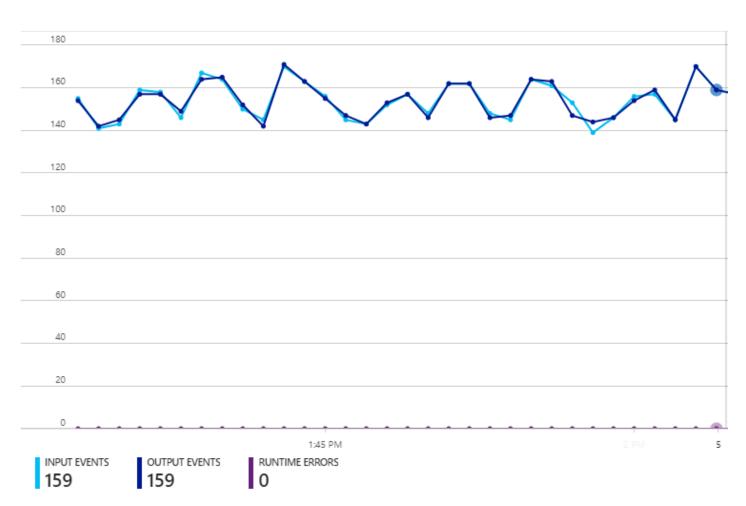
### **Best Practices**

### **Data Streams**

#### Inputs / Outputs

- Track metrics
- Provision appropriately
- Set alerts
- Know your anomalies

Monitoring Stream Analytics Input and Outputs NO SUBTITLE



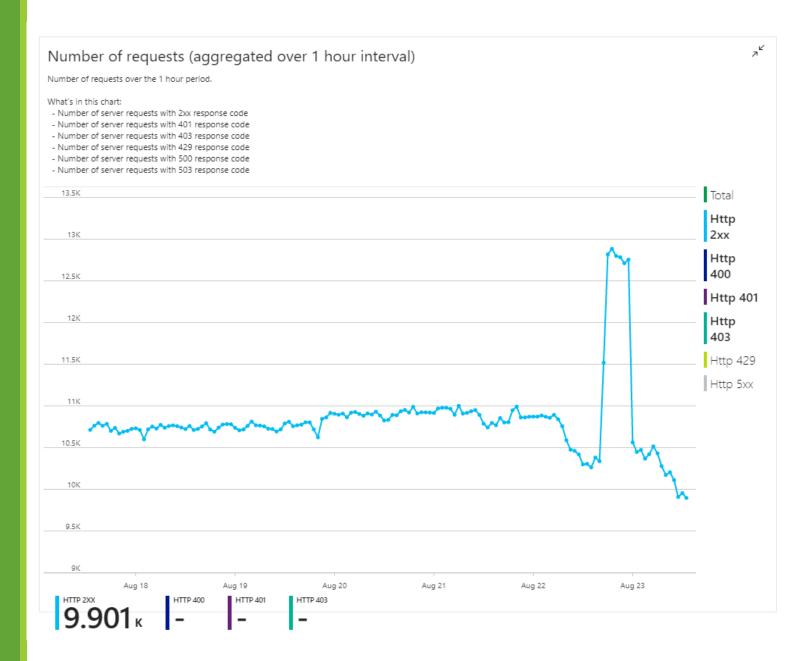
View alerts for this resource (1 configured)

### **Best Practices**

### Database

#### **#** of Request / hour

- Track metrics
- Provision appropriately
- Set alerts
- Know your anomalies



## Thank you

South Coast Air Quality Management District

AQ-SPEC team

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## Extra Slides

## Solution Approaches

Ground up custom build

- Time intensive, costly, potentially limited flexibility for future changes
- More difficult to keep device agnostic

#### Open source implementation

- Less time intensive as build upon prior work
- Pay for development of features that need that are not already available with OS

#### Data standards based approach

- Leverage tools (visualization and analysis) already built on data standards
- More likely for broad acceptance of work when based on a data standard

Hybrid approach