

Low-cost sensors for informational PM-2.5 monitoring in Oregon

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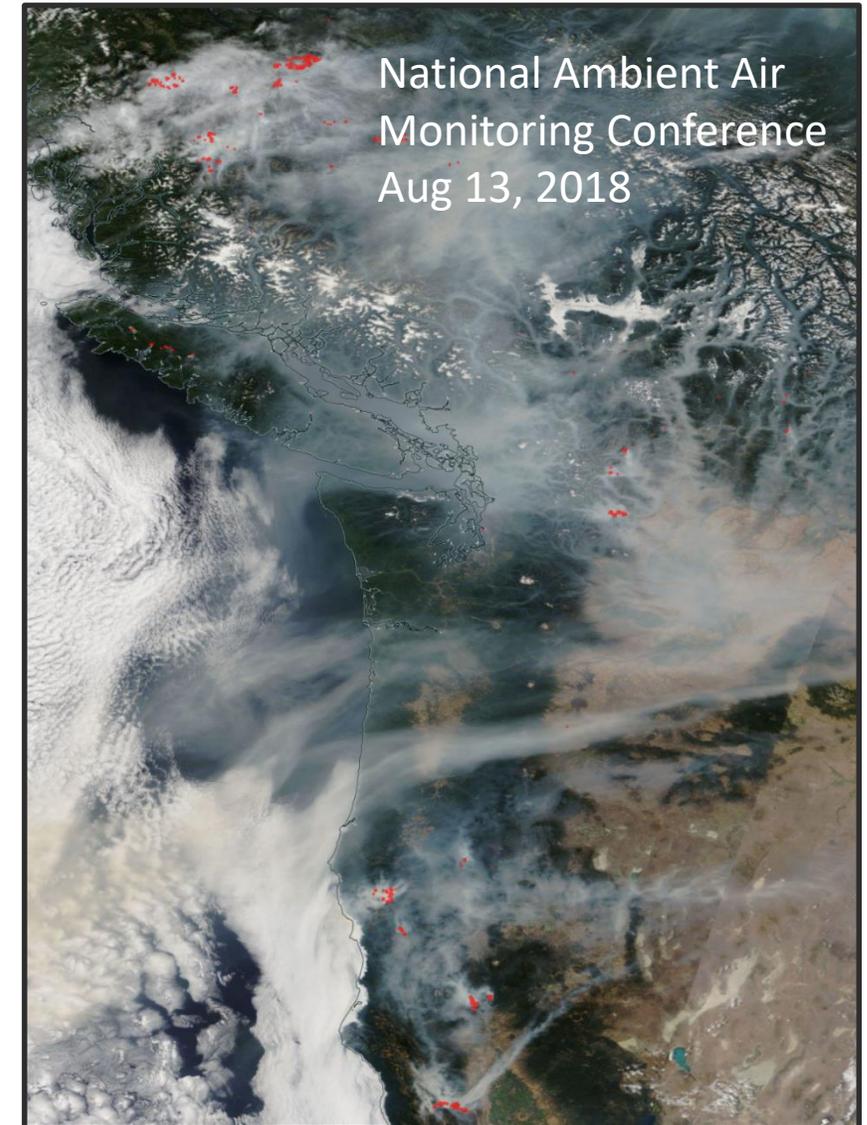
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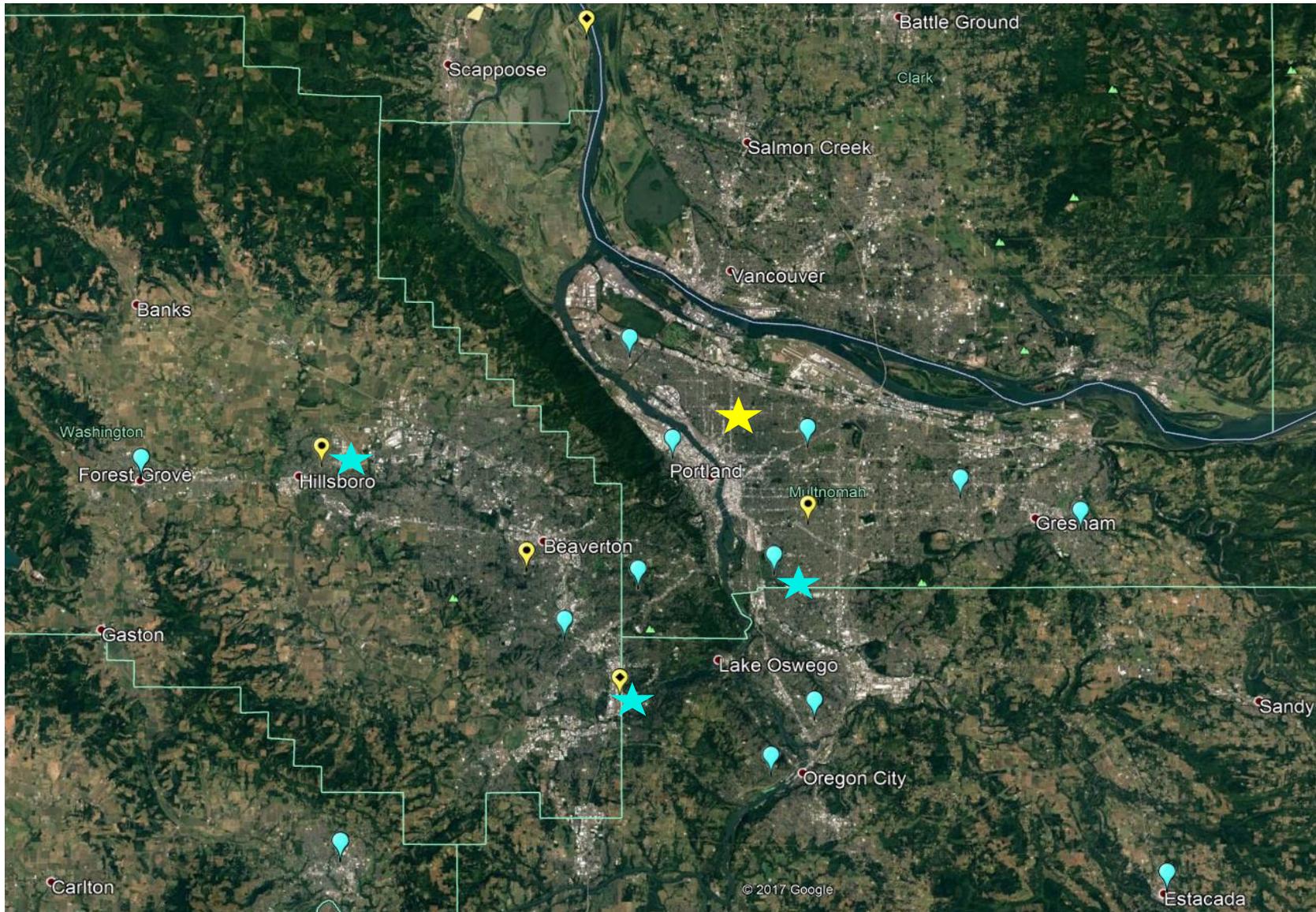


What Do You Know,
and When Do You Know it?



Why build a low-cost PM sensor package at DEQ?

- Received funding in 2017 to add 30 new sites
- Expand PM-2.5 monitoring using an approach that is consistent with existing methods in Oregon
 - Measurement & QA/QC approach
 - Use existing IT and AQM network infrastructure
- Provide publicly-owned near real-time data
- Provide data of known quality (e.g., traceable)
- Data should meet DEQ data quality objectives



Key:

Yellow – Existing monitors, Blue – New Monitors, Star – Air Toxics

Oregon DEQ data quality objectives

- Data completeness $\geq 75\%$

<https://www.oregon.gov/deq/FilterDocs/aqmlowcost.pdf>

<https://www.oregon.gov/deq/FilterDocs/aqmtargets.pdf>

- Air Quality Index data should be within $\pm 20\%$ FRM Data



State of Oregon Department of Environmental Quality

Air Quality Monitoring Performance Targets¹

Application	Pollutants	Precision & Accuracy ²	Examples	Supporting Documentation
Regulatory or compliance monitoring, Air toxics monitoring ³	Ozone, PM _{2.5} , CO, NO ₂ , SO ₂ , Lead, VOCs, HAPs ³	$\pm 10\%$	Filter-based FRM ⁴ sampler, Continuous FEM ⁵ PM monitor, FEM ozone analyzer, EPA laboratory protocols	40 CFR parts 50, 53, and 58, National Air Toxics Trend Station Technical Assistance document
Supplemental monitoring, Special studies, Real-time Air Quality Index	Ozone, PM _{2.5} , H ₂ S, VOCs, Meteorology	$\pm 20\%$	Nephelometer, E-BAM, H ₂ S monitor for odors, Calibrated met station, Sensor-based with quality control and validation	Organization's approved quality assurance plan or sampling analysis plan
Area and source surveys, Screening; Fenceline monitoring, Personal exposure	Ozone, PM _{2.5} , NO ₂ , VOCs, Meteorology	$\pm 30\%$	Calibrated sensors, Home met station	EPA Air Sensor Toolbox
Information, Education, Community monitoring	Ozone, PM _{2.5} , NO ₂ , CO, VOCs and others	$\pm 50\%$	Low-cost sensors, Personal monitors	South Coast AQMD Air Quality Sensor Performance and Evaluation Center

¹ This document is for informational use only. DEQ makes no claim, warranty or guarantee of instrument performance when operated by users for their specific applications.

² These guidelines are likely to evolve as technology and science advance.

³ Hazardous air pollutants or air toxics

⁴ Federal Reference Method

⁵ Federal Equivalent Method

Designing the Oregon DEQ PM sensor package

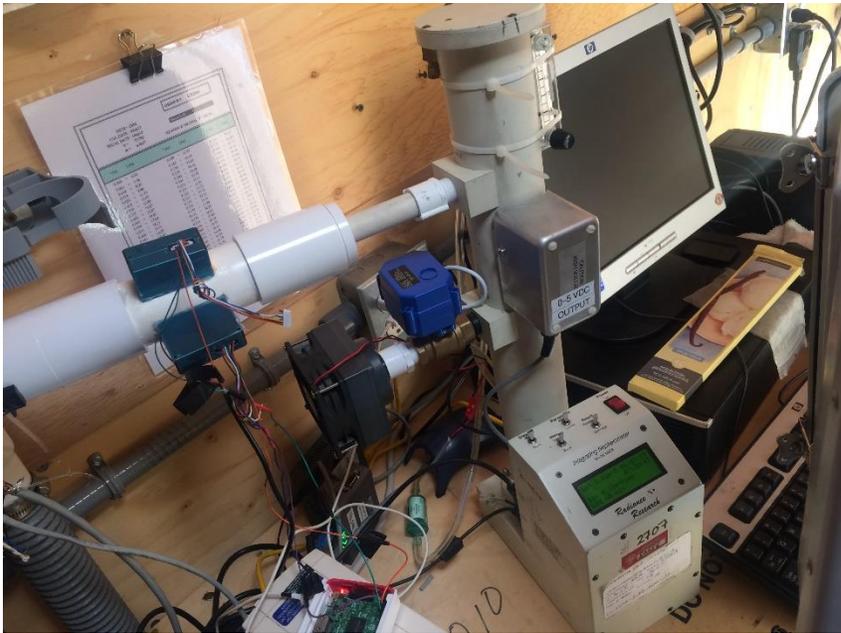
- Sensor selection – Background Research:
 - South Coast AQ SPEC/EPA/academic papers
- Data of known quality
 - Tracking sensor & performance
 - Identify drift & confirm sensor operation
 - Known data pipeline
 - Quality assessment
- Measurement technique
 - Optical PM measurements (composition, RH...)
 - Reduce environmental impacts on sensor
 - Ability to zero
- Provide communities with real time data
 - Cellular communication
 - Community work



2 Parts

Part 1: Inline with Nephelometer (Met One M903)

Examine Plantower sensor performance across Oregon

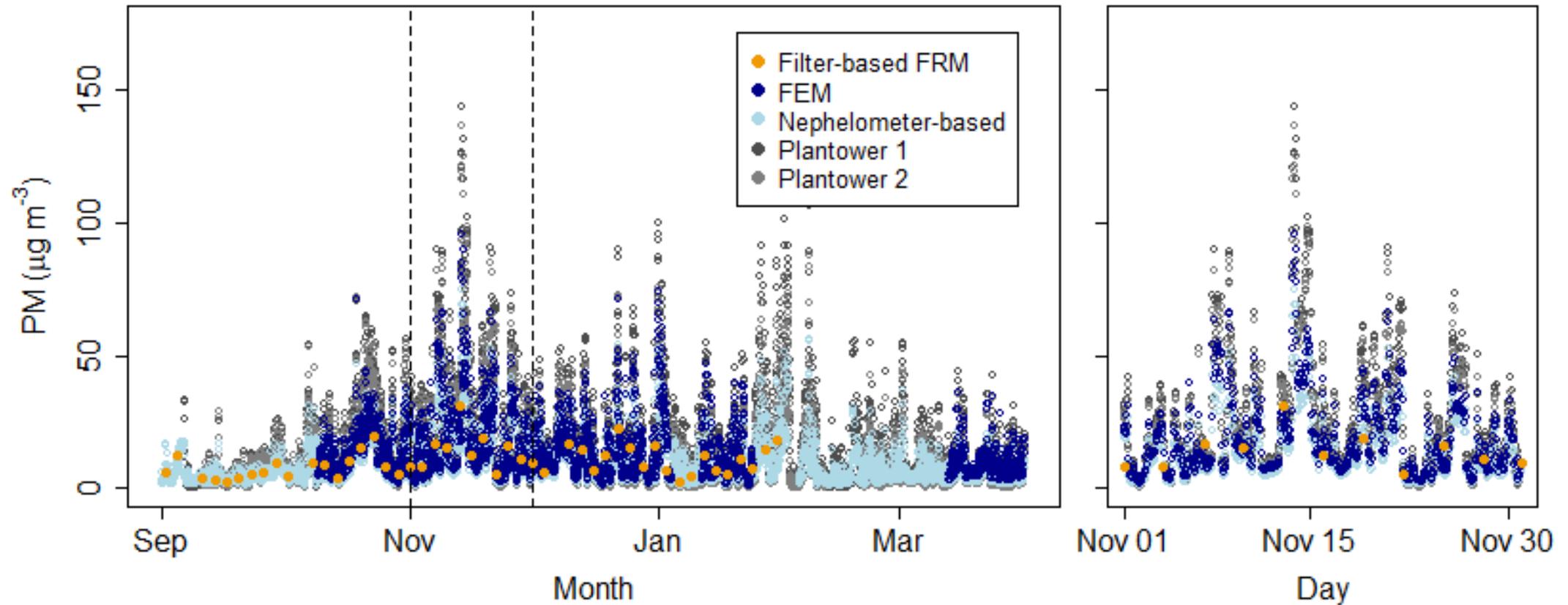


Part 2: SensOR™

Stand-alone package for use in Oregon

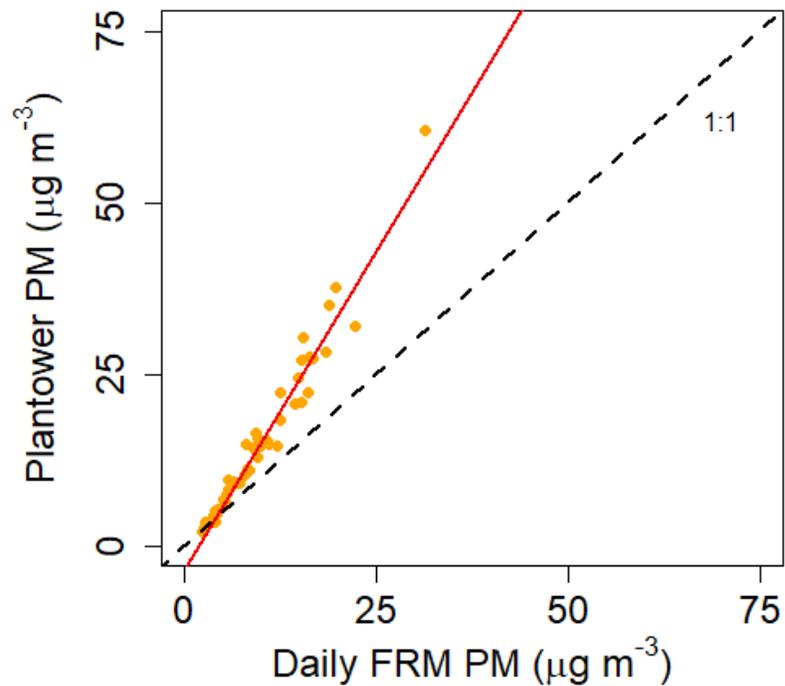


Part 1: Plantower PMS5003ST Vs. Nephelometer Performance

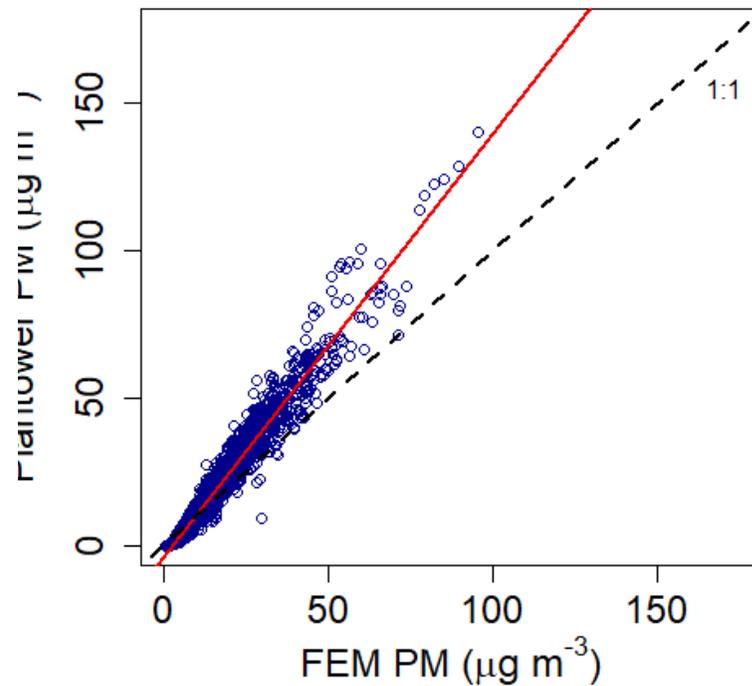


Plantower PMS5003ST comparison with co-located reference and informational-level monitors

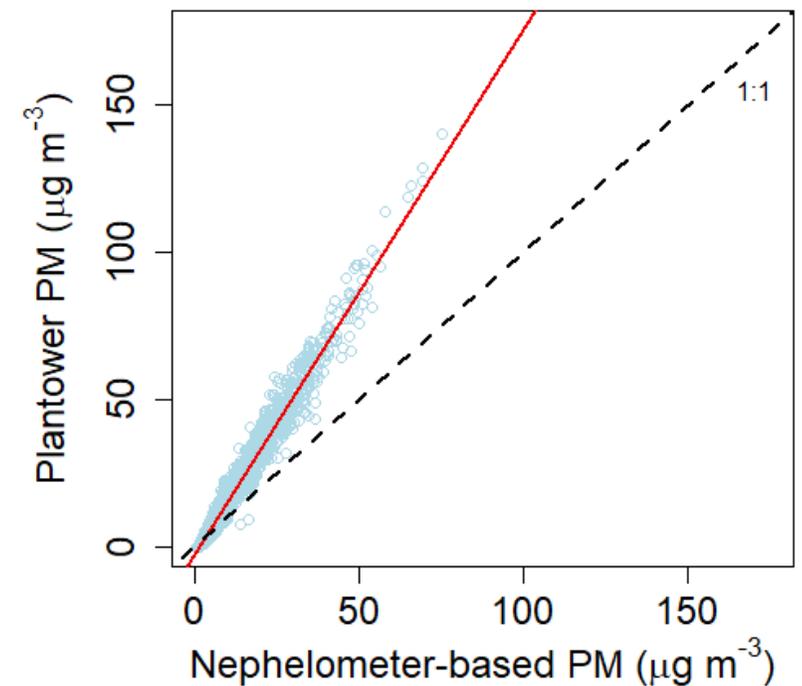
Plantower PM-2.5 = 1.86 * FRM PM - 3.33
 $R^2 = 0.96$



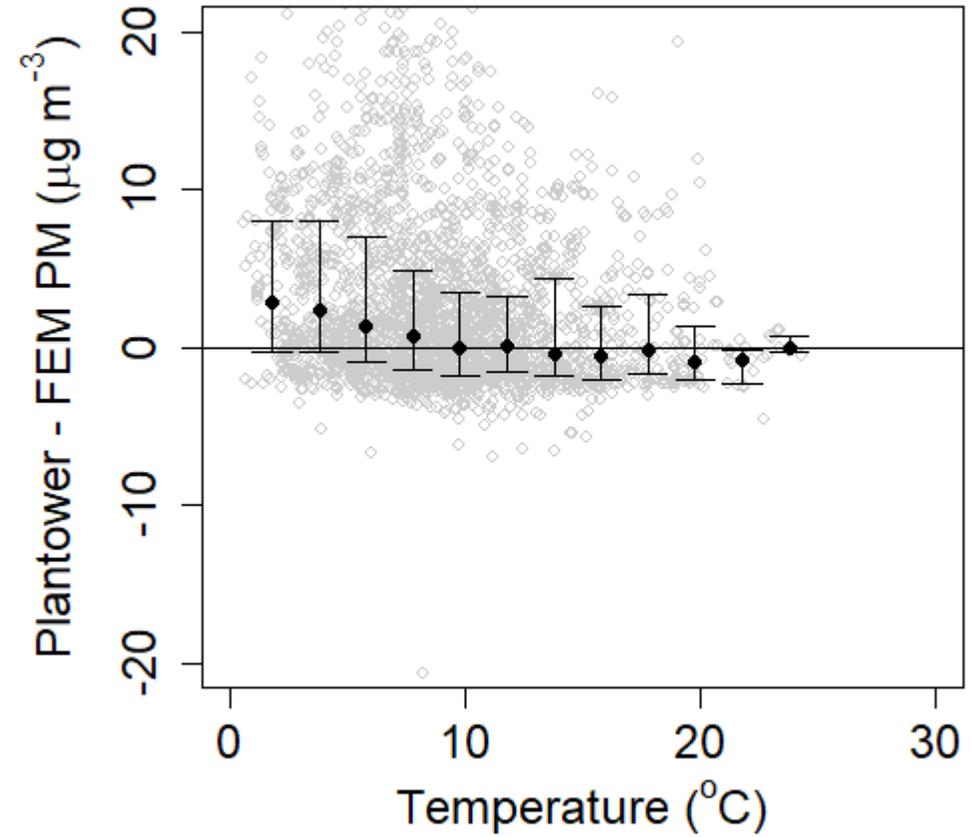
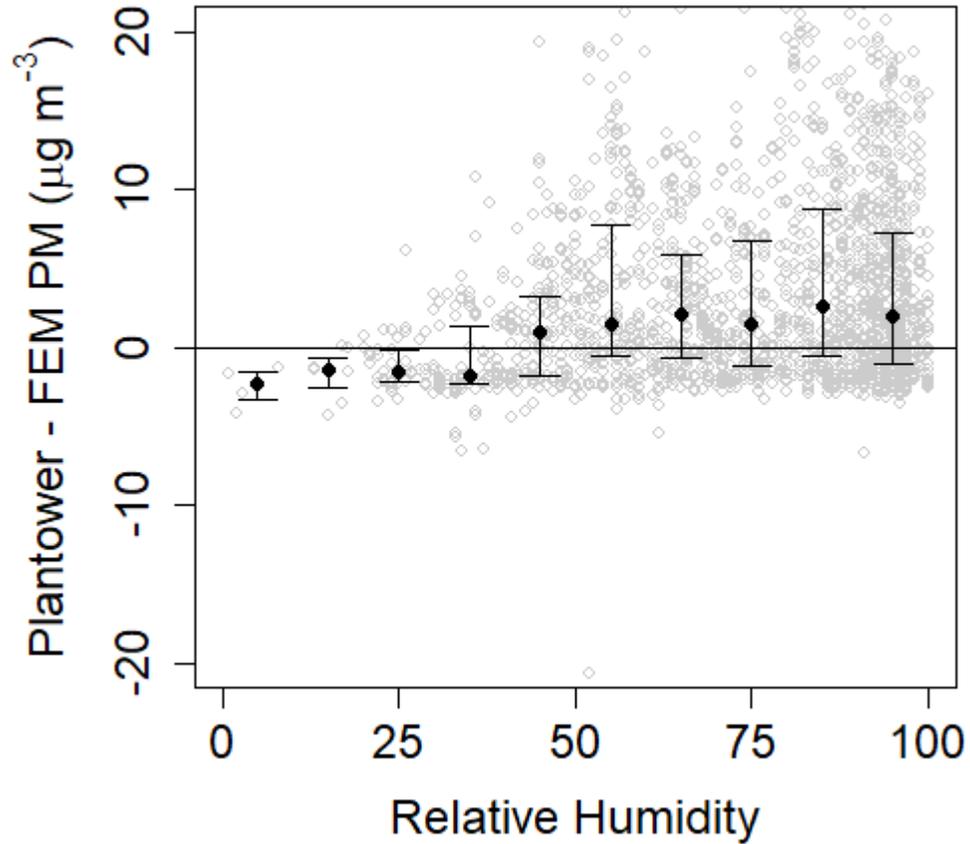
Plantower PM-2.5 = 1.44 * FEM PM - 3.70
 $R^2 = 0.96$



Plantower PM-2.5 = 1.79 * FEM PM - 2.38
 $R^2 = 0.98$



Plantower PM-2.5 Humidity-Temperature Dependence

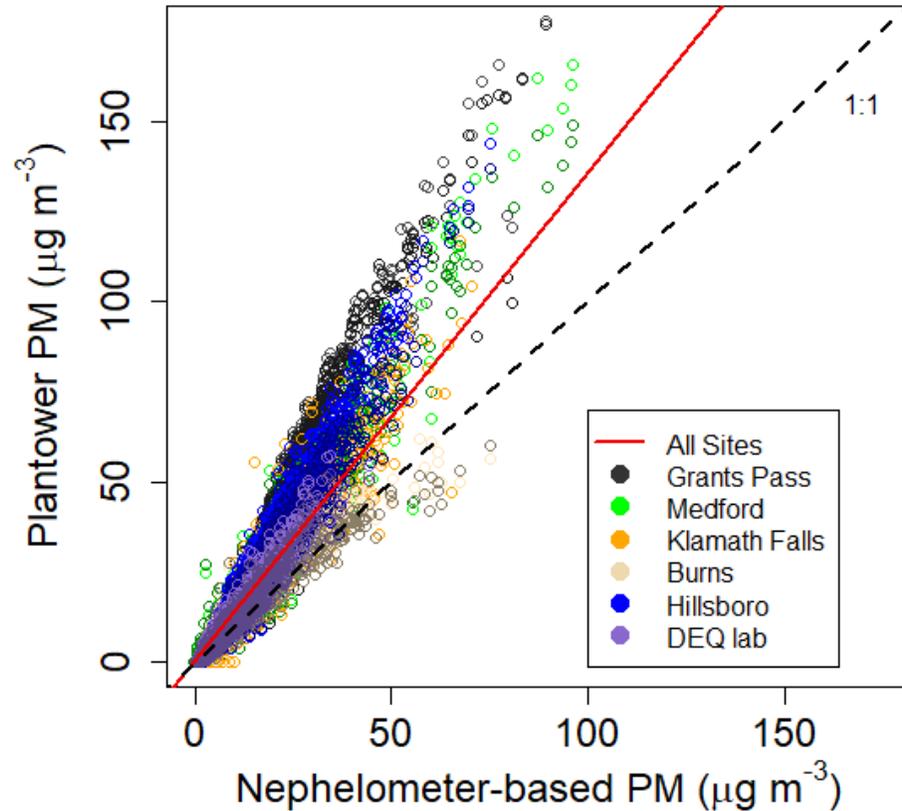


Sensor-Site Regressions

All sites combined:

Plantower PM = 1.35 * Nephelometer-based PM + 0.35

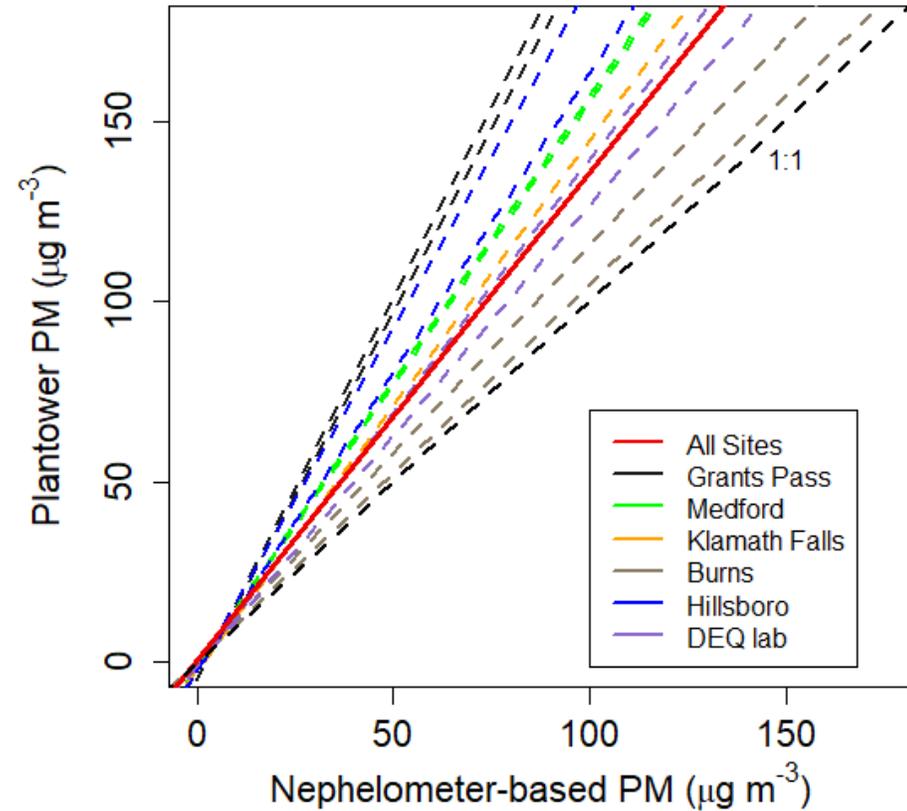
$R^2 = 0.61$



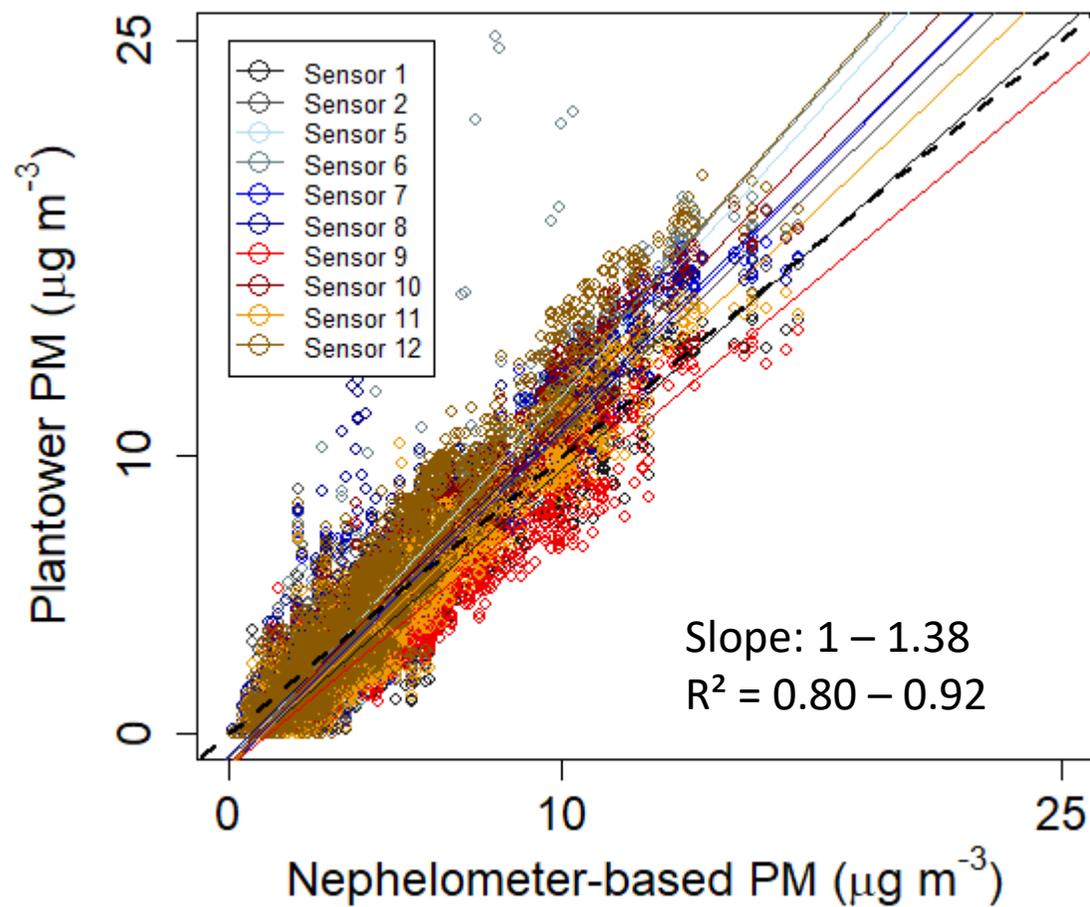
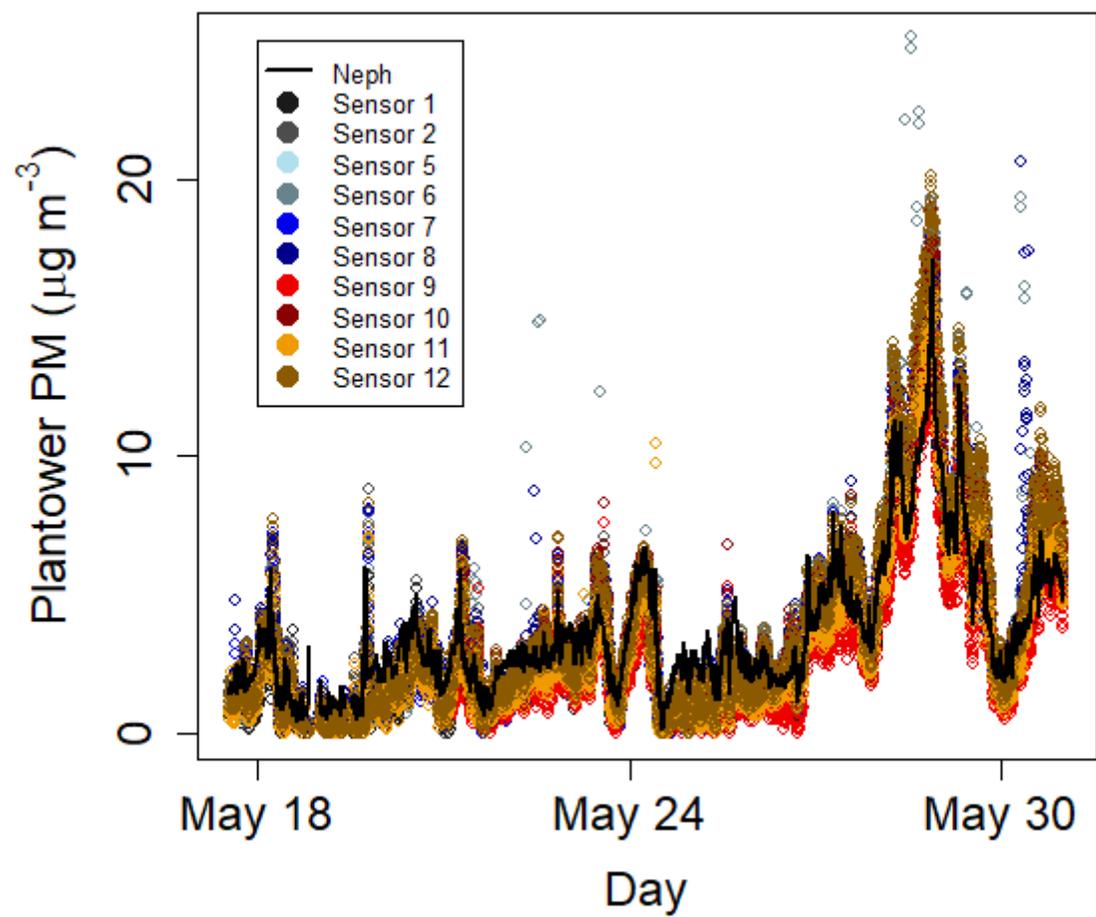
Site specific:

Slope range: 1.04 (Burns) - 2.11 (Grants Pass)

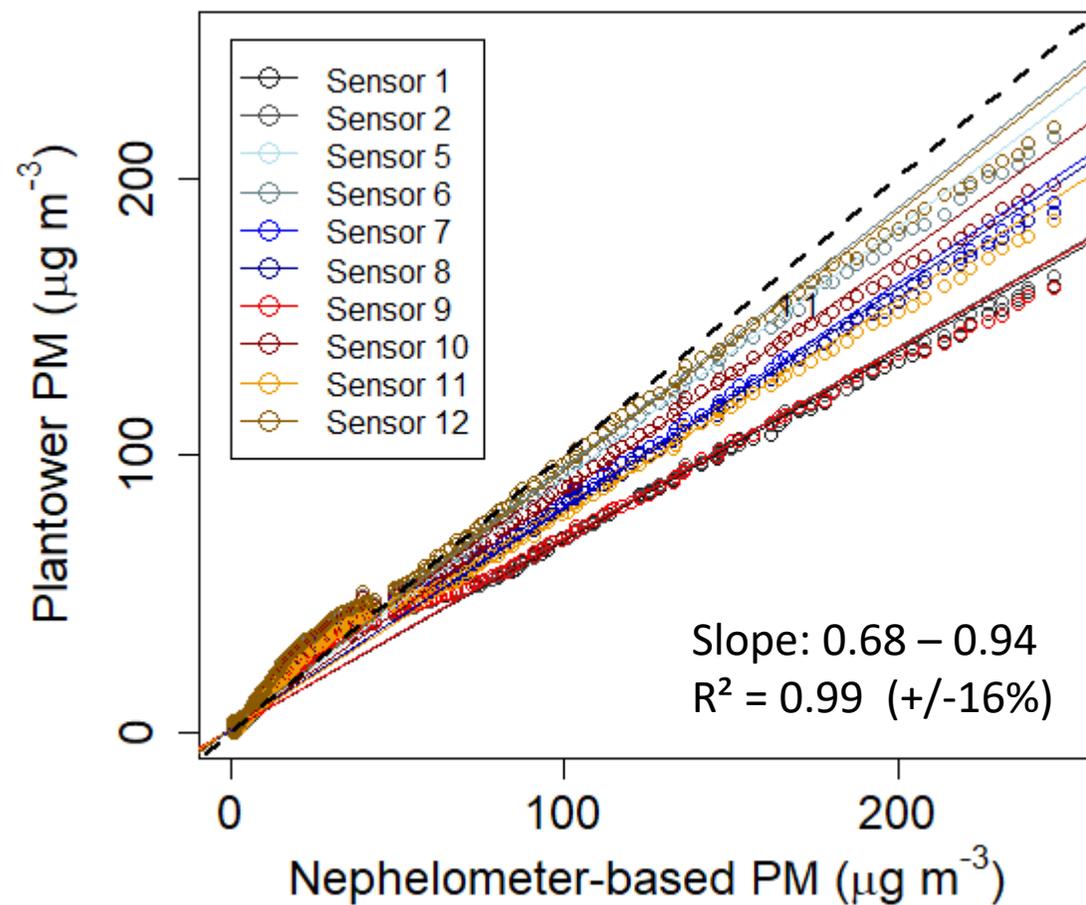
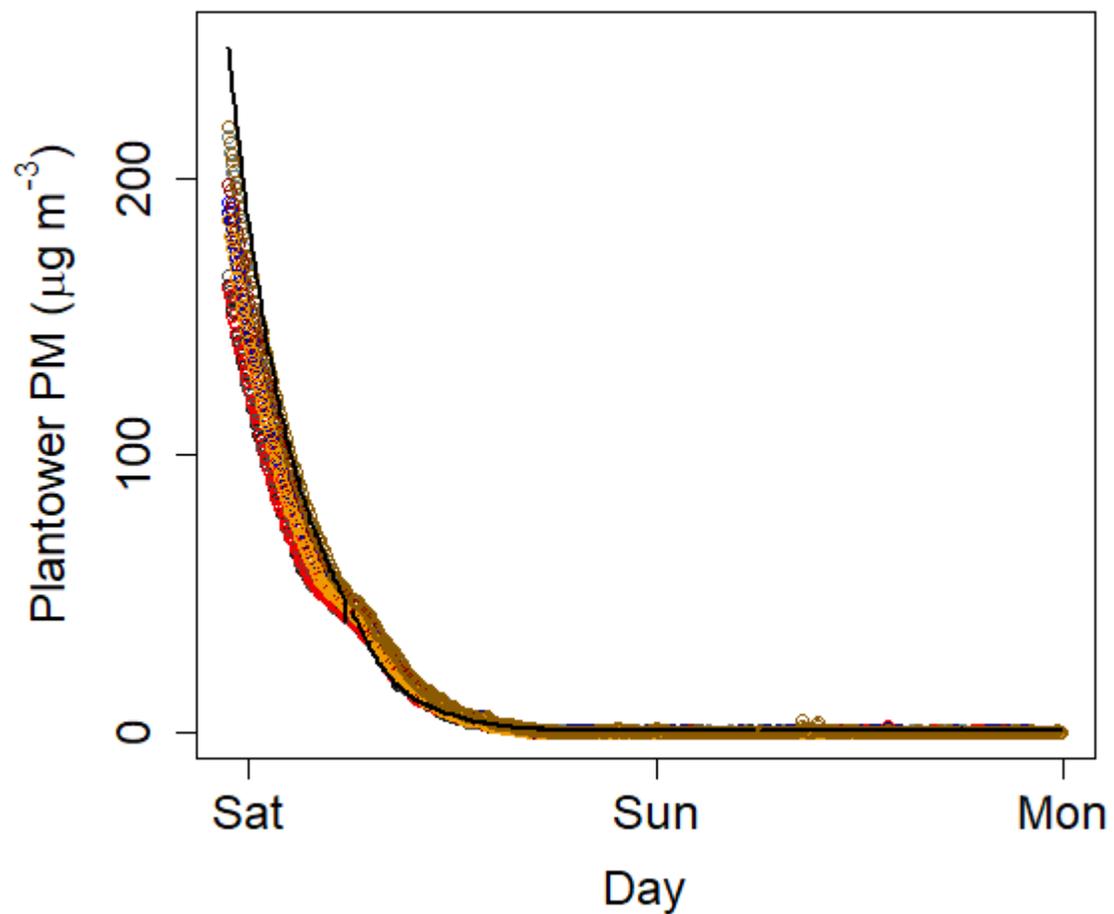
R^2 range: 0.91 (Burns) - 0.98 (Hillsboro)



Group-test



Smoke-test

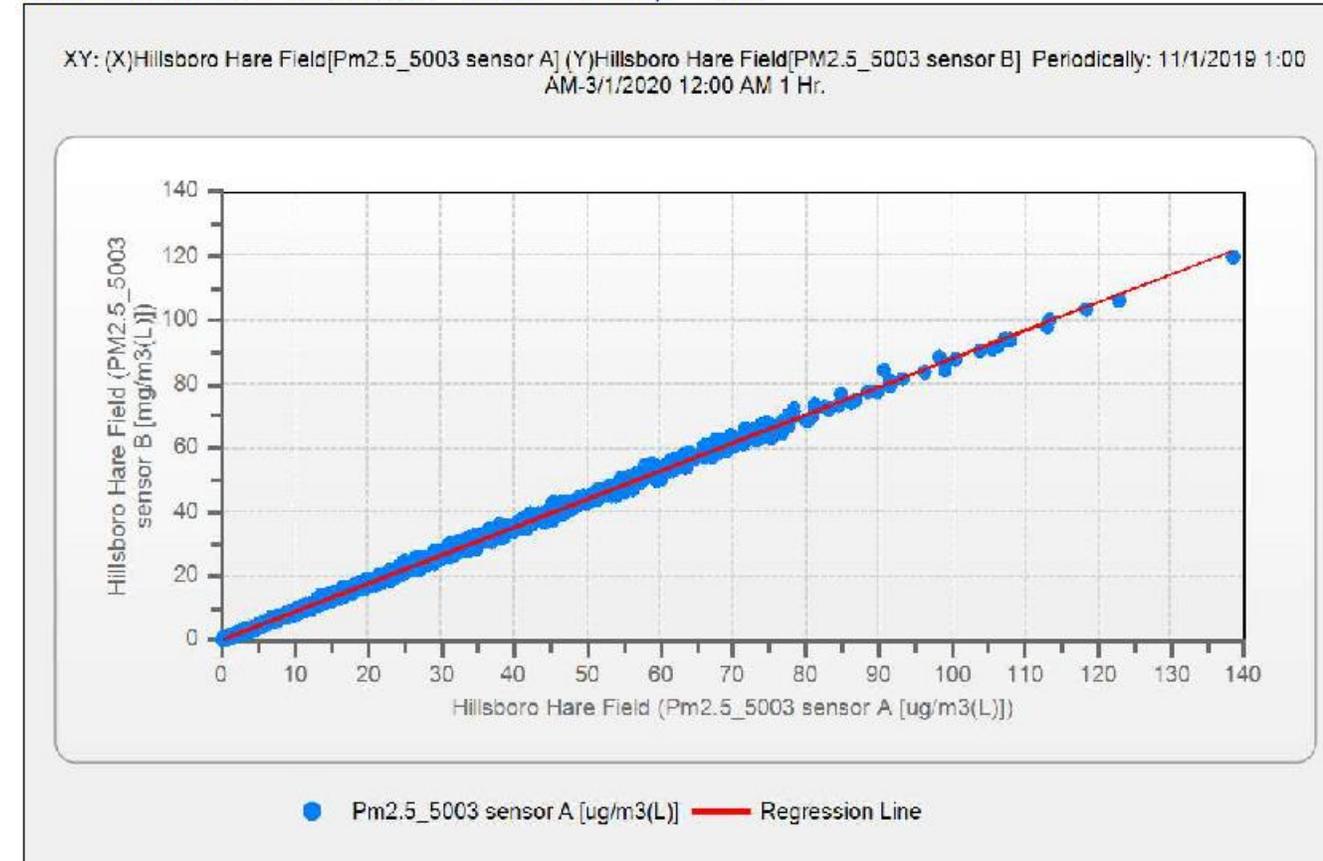


Approach

- Treat SensOR™ similar to the nephelometer
- Inline sensors run at multiple sites for at least 30 days
- Correct Plantower output to Bscat
 - Range of corrections is +/- 20%
- Use Nephelometer to FRM correlations specific to each site as implemented over many years in OR
 - Range of correlations is +/- 15%
 - Wildfire correlation is different from winter time correlations
- Quarterly maintenance checks
 - Doesn't respond to SUVA
- Verify with collocated sites and performance audits

Comparison of inline sensor pair

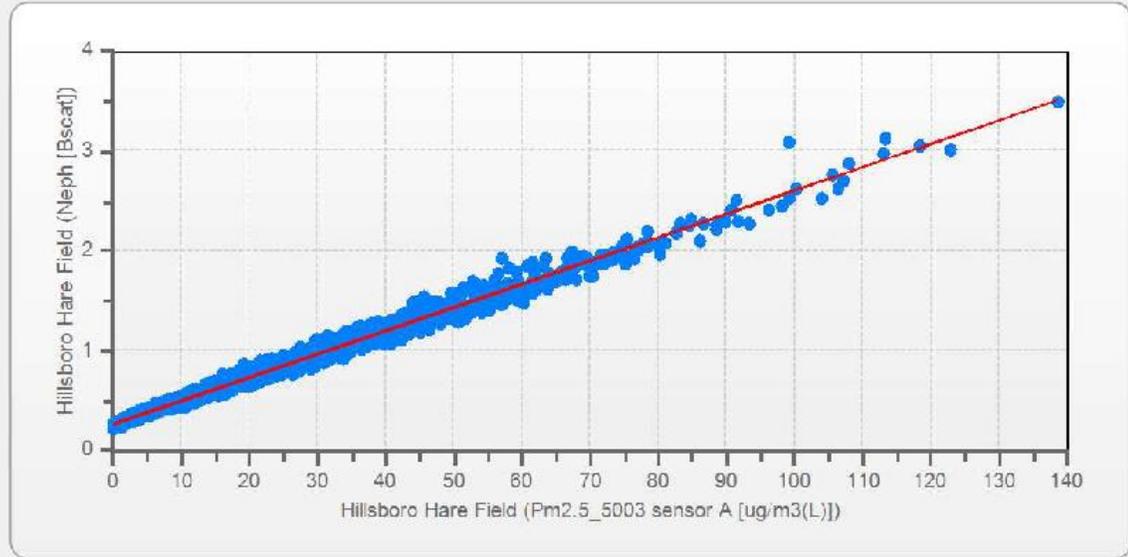
XY: (X)Hillsboro Hare Field[Pm2.5_5003 sensor A] (Y)Hillsboro Hare Field[PM2.5_5003 sensor B] Periodically: 11/1/2019 1:00 AM-3/1/2020 12:00 AM 1 Hr.
Report Type: XY Avg Type: AVG Slope: 0.8789
Date & Time: 11/1/2019 1:00 AM-3/1/2020 12:00 AM Time Base: 1 Hr. Intercept: -0.1310



Comparison of inline sensor to Nephelometer Bscat

XY: (X)Hillsboro Hare Field[Pm2.5_5003 sensor A] (Y)Hillsboro Hare Field[Neph] Periodically: 11/1/2019 1:00 AM-3/1/2020 12:00 AM 1 Hr.
 Report Type: XY Avg Type: AVG Slope: 0.0235
 Date & Time: 11/1/2019 1:00 AM-3/1/2020 12:00 AM Time Base: 1 Hr. Intercept: 0.2562

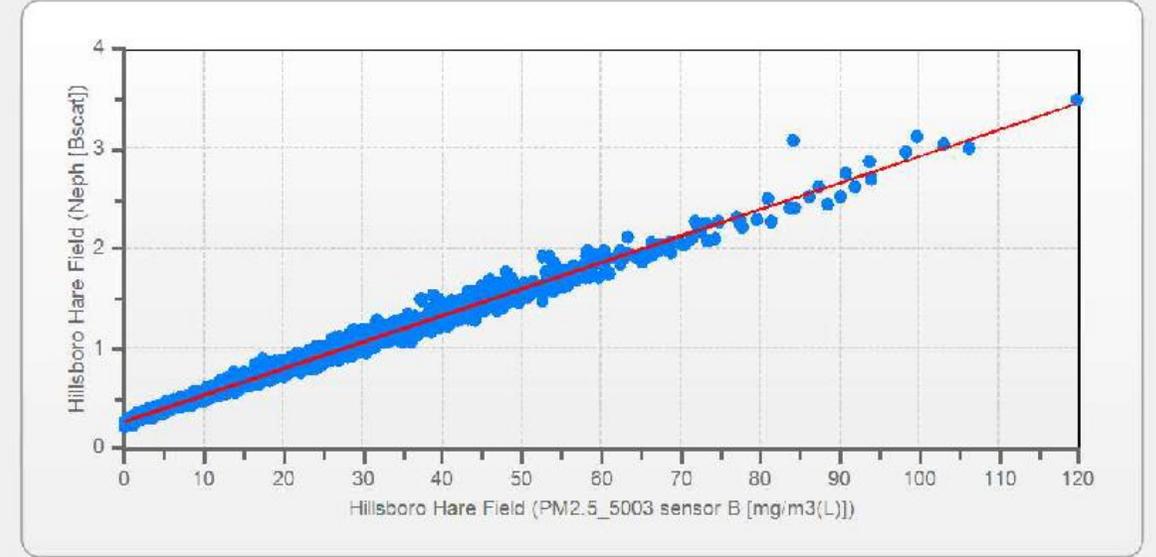
XY: (X)Hillsboro Hare Field[Pm2.5_5003 sensor A] (Y)Hillsboro Hare Field[Neph] Periodically: 11/1/2019 1:00 AM-3/1/2020 12:00 AM 1 Hr.



● Pm2.5_5003 sensor A [ug/m3(L)] — Regression Line

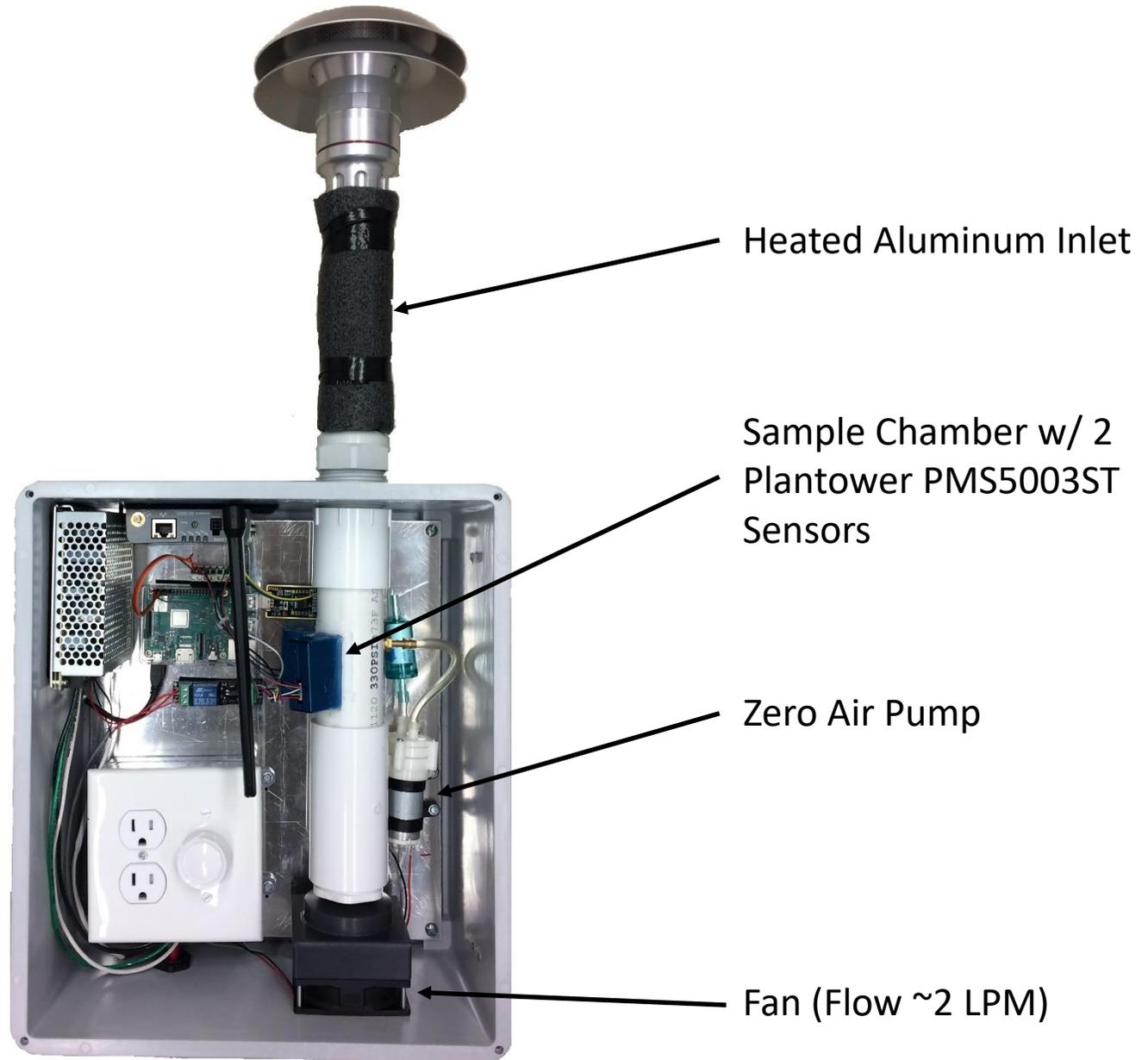
XY: (X)Hillsboro Hare Field[PM2.5_5003 sensor B] (Y)Hillsboro Hare Field[Neph] Periodically: 11/1/2019 1:00 AM-2/26/2020 12:00 AM 1 Hr.
 Report Type: XY Avg Type: AVG Slope: 0.0267
 Date & Time: 11/1/2019 1:00 AM-2/26/2020 12:00 AM Time Base: 1 Hr. Intercept: 0.2603

XY: (X)Hillsboro Hare Field[PM2.5_5003 sensor B] (Y)Hillsboro Hare Field[Neph] Periodically: 11/1/2019 1:00 AM-2/26/2020 12:00 AM 1 Hr.

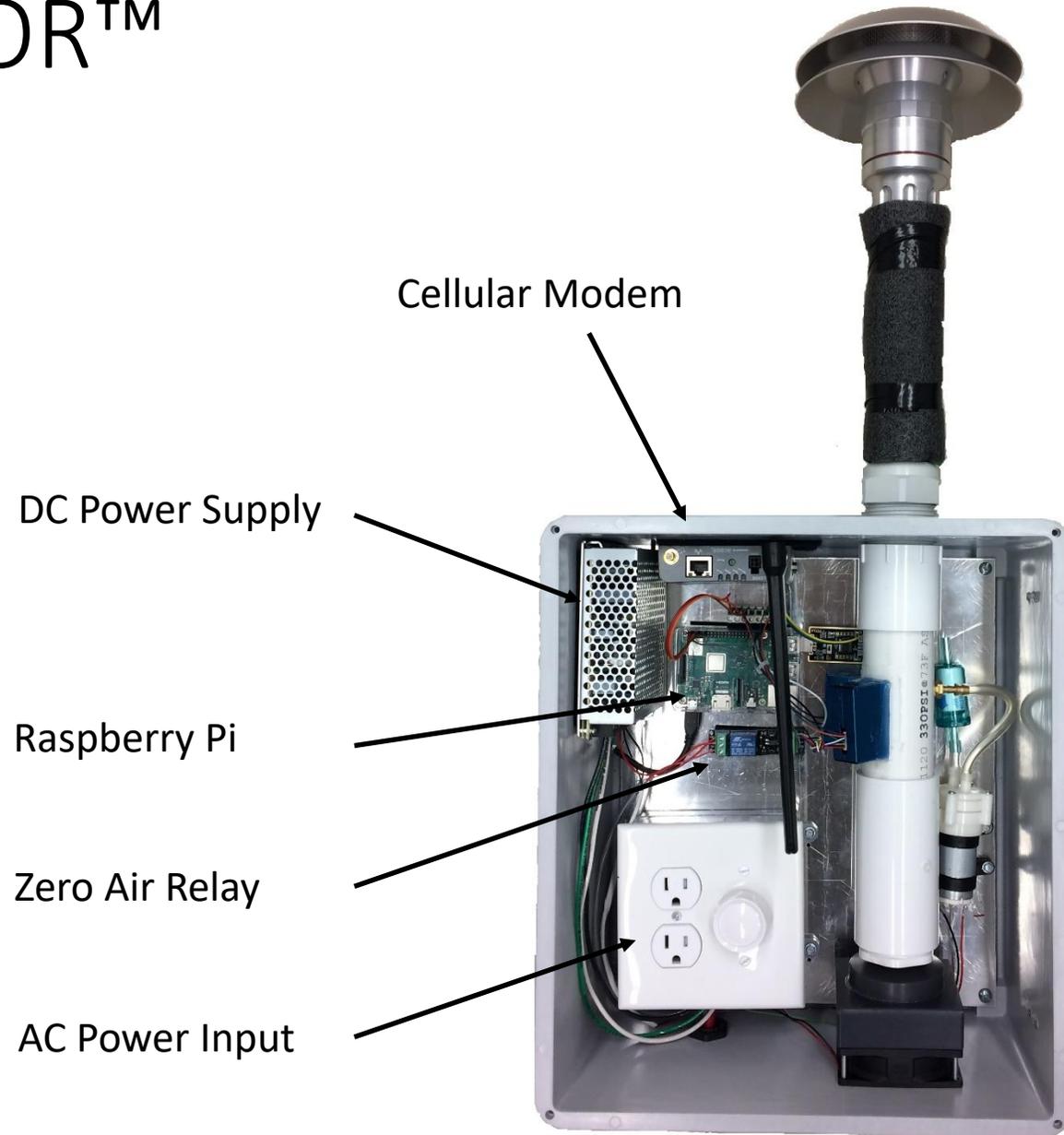


● PM2.5_5003 sensor B [mg/m3(L)] — Regression Line

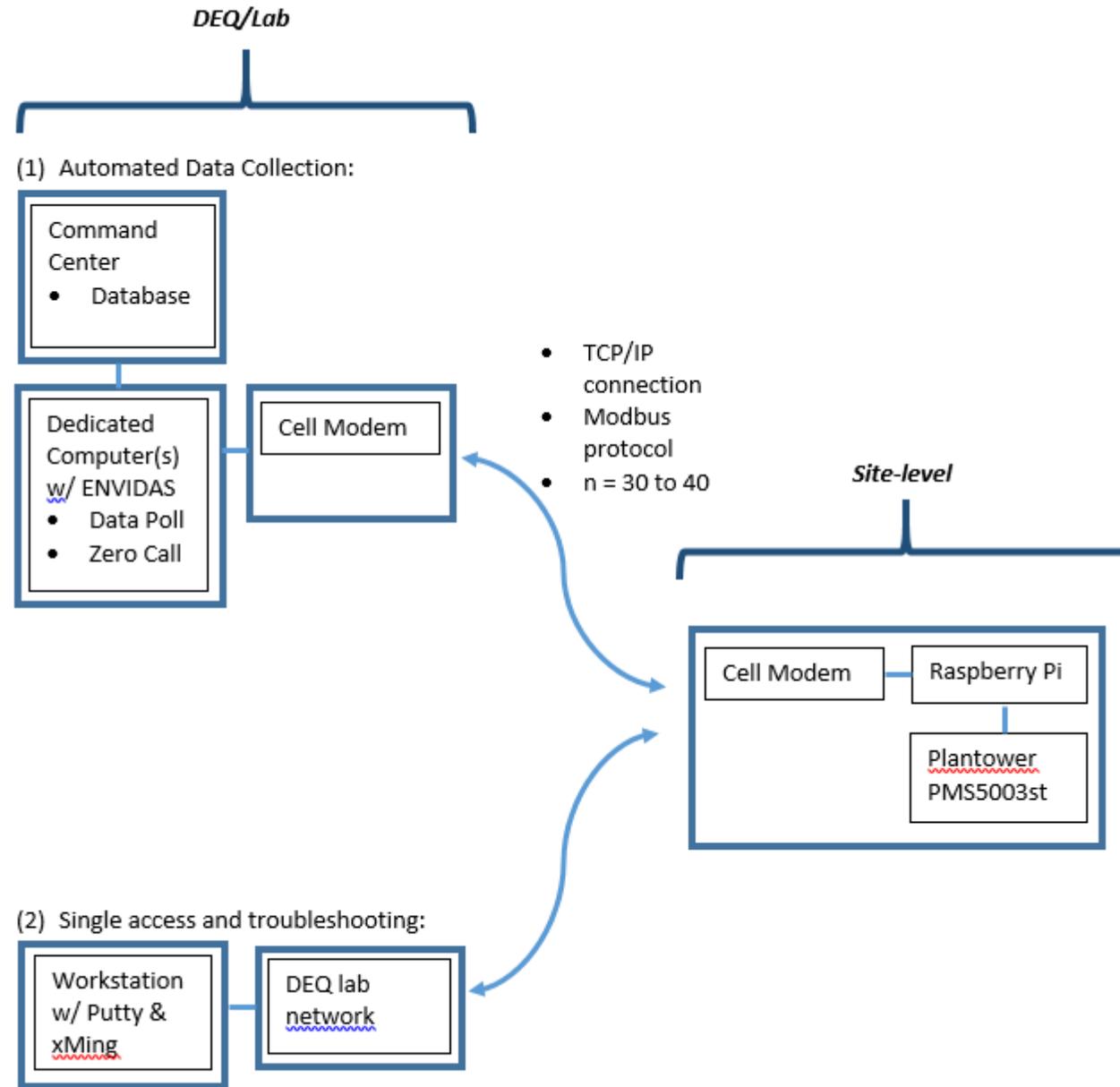
Part 2: SensOR™



SensOR™



Data Flow



File Dynamic Reports Operational Information Edit Tools Setup Views Help

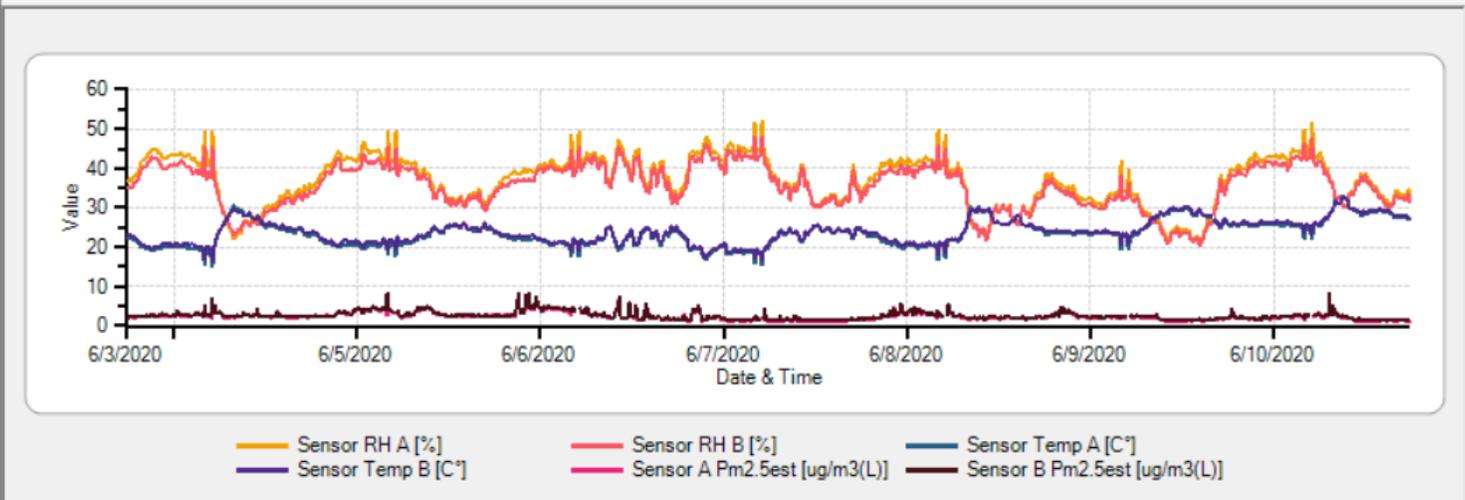
Multi Custom Chart Dashboard Dynamic Network Received Calibration Alerts Open Startup Items

Tabular Station

Tabulars Visuals Maps Last Alerts Startup

Date & Time	Sensor RH A	Sensor RH B	Sensor Temp A	Sensor Temp B	Sensor A Pm2.5est	Sensor B Pm2.5est
	%	%	C°	C°	ug/m3(L)	ug/m3(L)
6/3/2020 11:45 PM	40.3	39.0	21.7	21.0	6.1	6.0
6/5/2020 11:40 PM	40.1	39.1	21.8	22.1	6.0	6.3
6/5/2020 11:35 PM	39.7	38.6	22.0	22.3	6.5	6.9
6/5/2020 11:30 PM	39.7	38.8	22.1	22.4	7.2	7.5
6/5/2020 11:25 PM	39.4	38.3	22.2	22.5	5.9	6.1
6/5/2020 11:20 PM	39.0	37.2	22.2	22.8	5.2	5.4
6/5/2020 11:15 PM	38.8	36.6	22.1	22.9	4.0	4.5
6/5/2020 11:10 PM	38.8	36.8	22.1	22.9	3.8	4.2
6/5/2020 11:05 PM	39.0	37.0	22.1	22.8	5.2	5.5
6/5/2020 11:00 PM	39.0	36.8	22.0	22.8	4.7	4.6
6/5/2020 10:55 PM	39.3	36.8	21.8	22.8	4.3	4.9
6/5/2020 10:50 PM	39.5	36.8	21.8	22.9	3.9	4.2
6/5/2020 10:45 PM	39.5	36.9	21.8	22.8	4.1	4.3
6/5/2020 10:40 PM	39.3	37.3	21.8	22.5	4.4	4.4
6/5/2020 10:35 PM	39.2	37.5	21.9	22.5	8.3	8.2
6/5/2020 10:30 PM	39.3	36.9	21.8	22.8	5.8	6.7

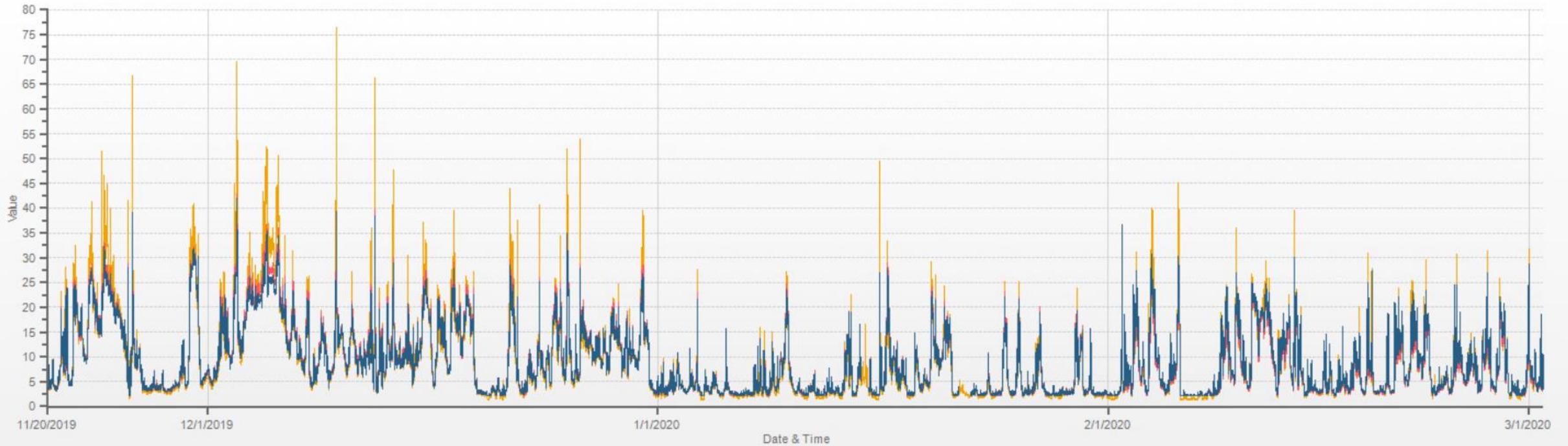
Invalid Alarm Instantaneous Data Warning



Sensor RH A [%] Sensor RH B [%] Sensor Temp A [C°] Sensor Temp B [C°] Sensor A Pm2.5est [ug/m3(L)] Sensor B Pm2.5est [ug/m3(L)]

SensOR™ PM 2.5 – 5 minute average

MultiStation: Periodically: 11/20/2019 12:05 AM-3/2/2020 12:00 AM Type: AVG 5 Mins.



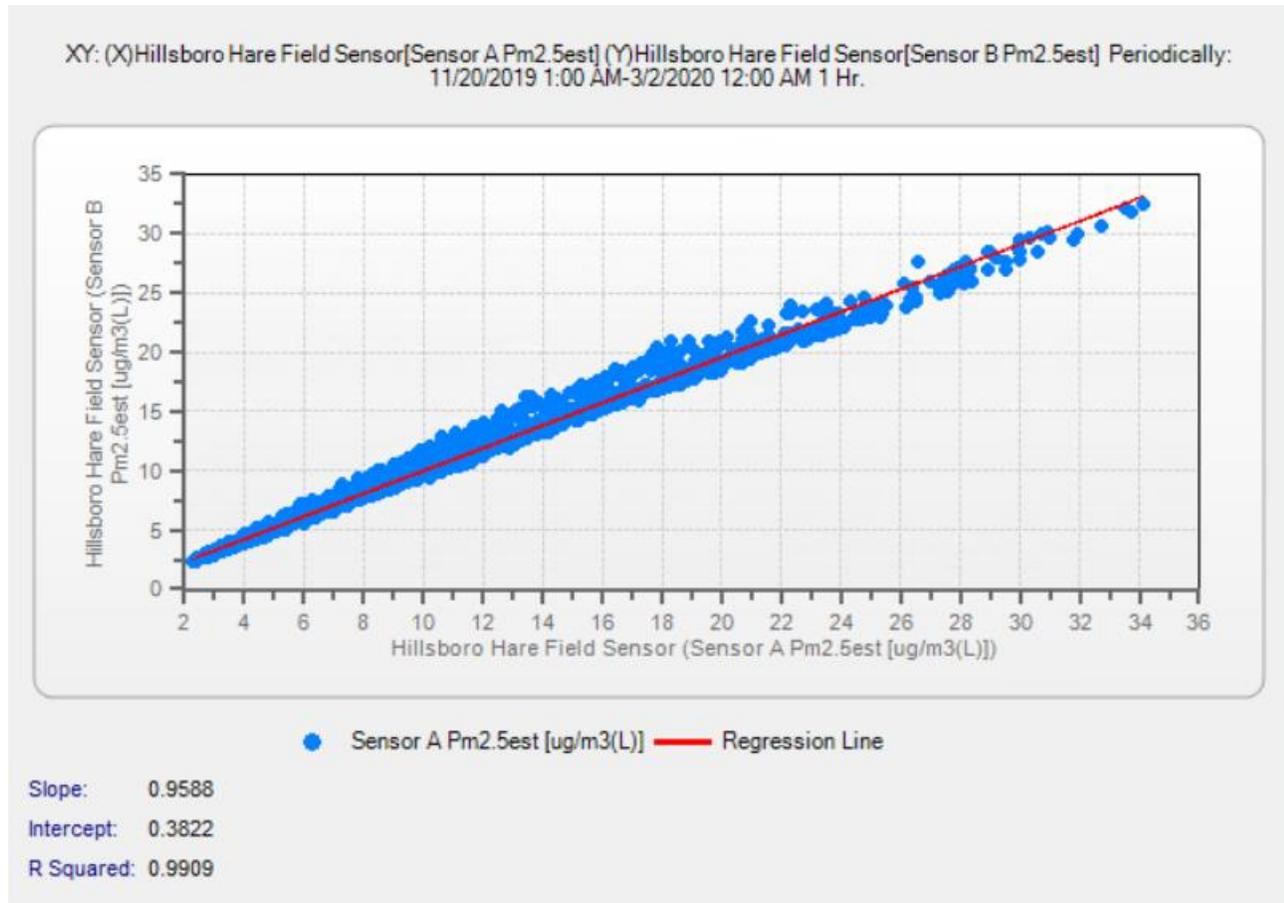
Hillsboro Hare Field(PM2.5 Est [ug/m3(L)])

Hillsboro Hare Field Sensor(Sensor A Pm2.5est [ug/m3(L)])

Hillsboro Hare Field Sensor(Sensor B Pm2.5est [ug/m3(L)])

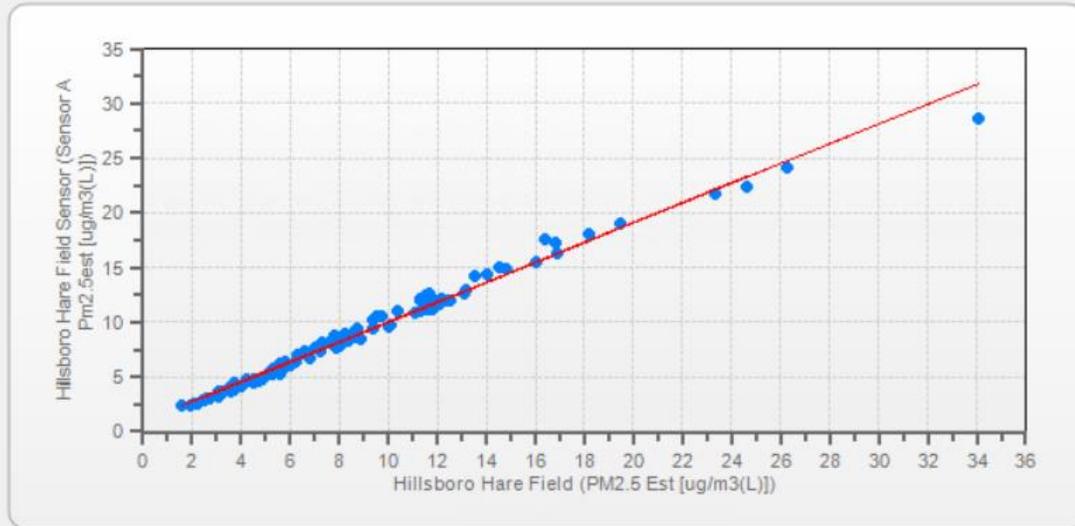


Comparison of SensOr™ Plantower pair



Comparison of SensOR™ PM 2.5 to Neph PM 2.5

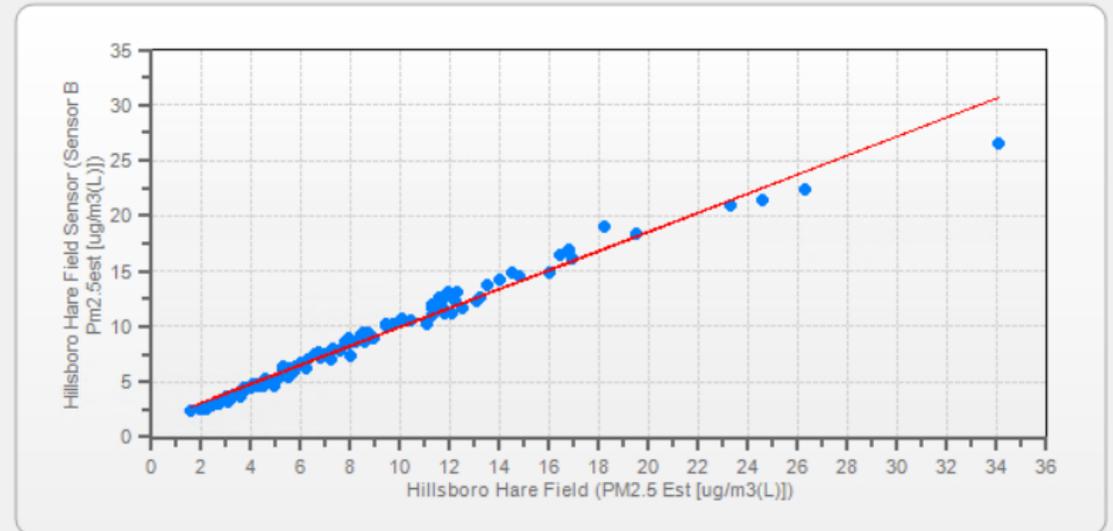
XY: (X)Hillsboro Hare Field[PM2.5 Est] (Y)Hillsboro Hare Field Sensor[Sensor A Pm2.5est] Periodically: 11/20/2019 1:00 AM-3/2/2020 12:00 AM 1 Day



● PM2.5 Est [ug/m3(L)] — Regression Line

Slope: 0.9078
Intercept: 0.9231
R Squared: 0.9860

XY: (X)Hillsboro Hare Field[PM2.5 Est] (Y)Hillsboro Hare Field Sensor[Sensor B Pm2.5est] Periodically: 11/20/2019 1:00 AM-3/2/2020 12:00 AM 1 Day



● PM2.5 Est [ug/m3(L)] — Regression Line

Slope: 0.8572
Intercept: 1.3850
R Squared: 0.9762

Next steps

- Current focus
 - 9 sites on line
 - 10 more sites to be added very soon
 - Address network-scale challenges (eg. Maintenance, data QA)
 - Community building/sensor hosting
 - Explore use for PM monitoring during field burning & wildfires
 - Implement QA performance audits
- Long-term possibilities
 - Incorporate other pollutants/meteorology
 - Validate/improve PM forecasting models
 - Feedback/collaboration from the larger community

Community Monitoring

- DEQ is working with several community monitoring groups
- Produce defensible data that supports their monitoring objective
- Offer collaboration and technical support
- Encouraged to follow guidelines presented in EPA's ***Handbook for Citizen Science Quality Assurance and Documentation***

Pilot Project to Show Sensor Data on AirNow's Fire and Smoke Map

- EPA presented a pilot project which adds data from PurpleAir to the Fire and Smoke Map. Prototype online June 12.
- Collocated PAs compared to FRM
- Would screen for data issues, apply a universal correction equation to concentrations, and present as NowCast AQI.
- $0.534 * PA(CF1 \text{ avg}) - .084 * RH + 5.6$
- Correct within one AQI level 93%
- States & local agencies may opt out
- Comments to sensordatapilot@epa.gov



*Is this good enough?
Or do we want to know?*