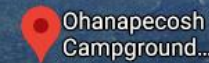


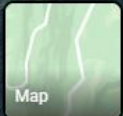


Smoke at Ohanapecosh Campground in Mount Rainier National Park

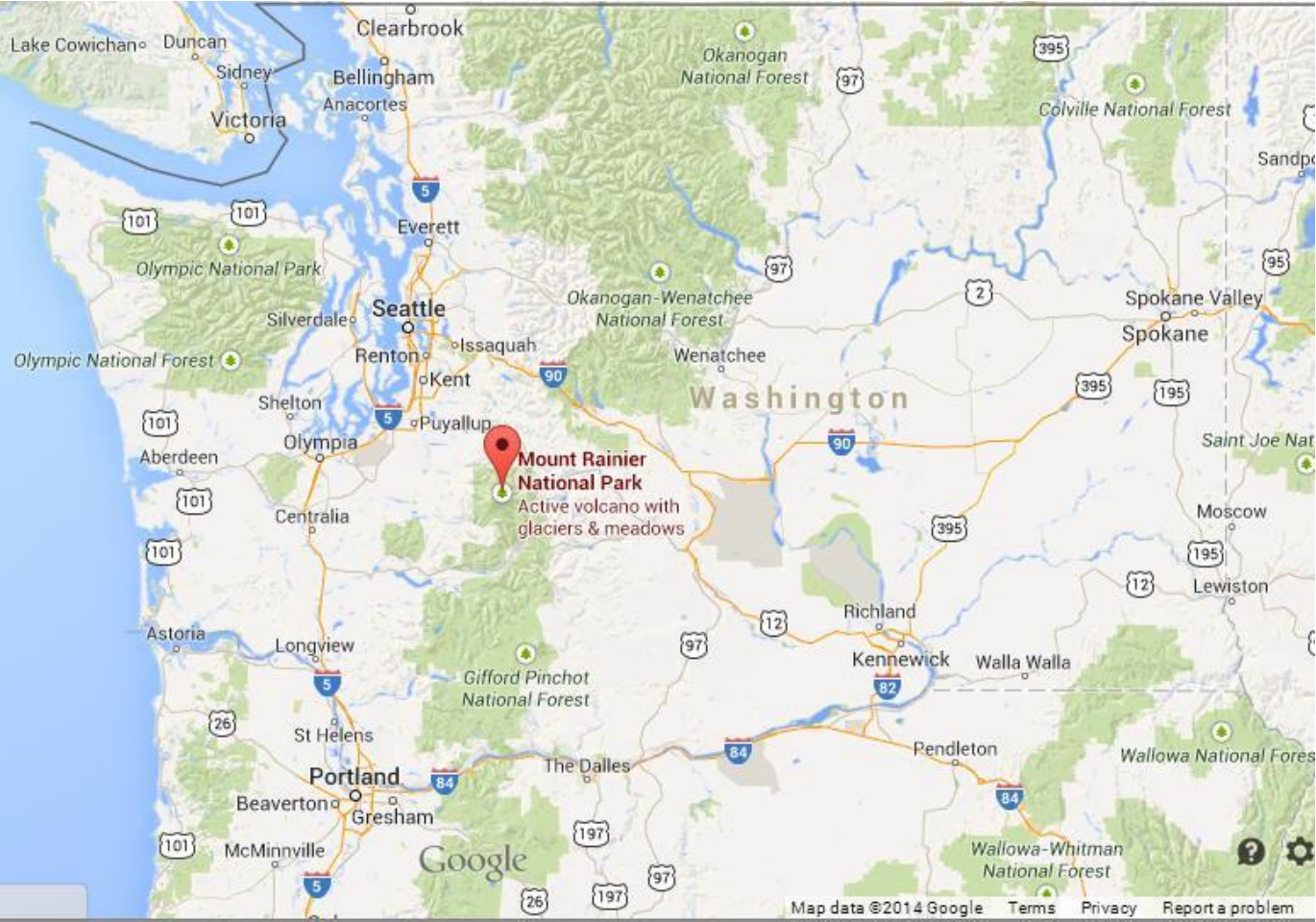


Summer 2020 Findings

Sean Hickey



Google



Some background

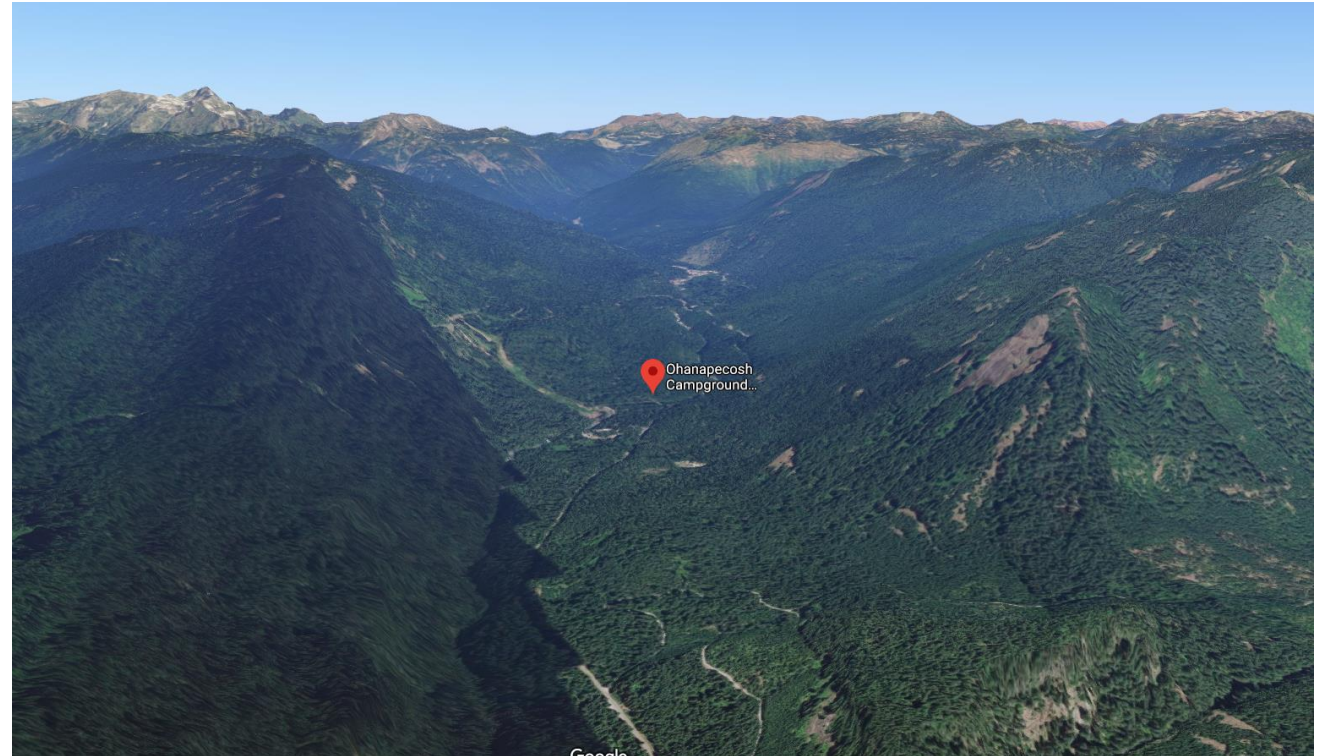
- Buildup of smoke during evenings at Ohanapecosh Campground as a result of campfire burning
- Smoke buildup suspected to be largely meteorologically driven
- Short-term exposure to high amounts of fine particles (i.e. smoke) can be dangerous!



Photo taken by Jeremiah Johnson 2013

Broad Objectives & Goals of Research

1. To better understand how the meteorology and geography of Ohanapecosh relate to smoke build up in the campground.
2. To develop a tool that can forecast nightly $\text{PM}_{2.5}$ concentrations at the campground



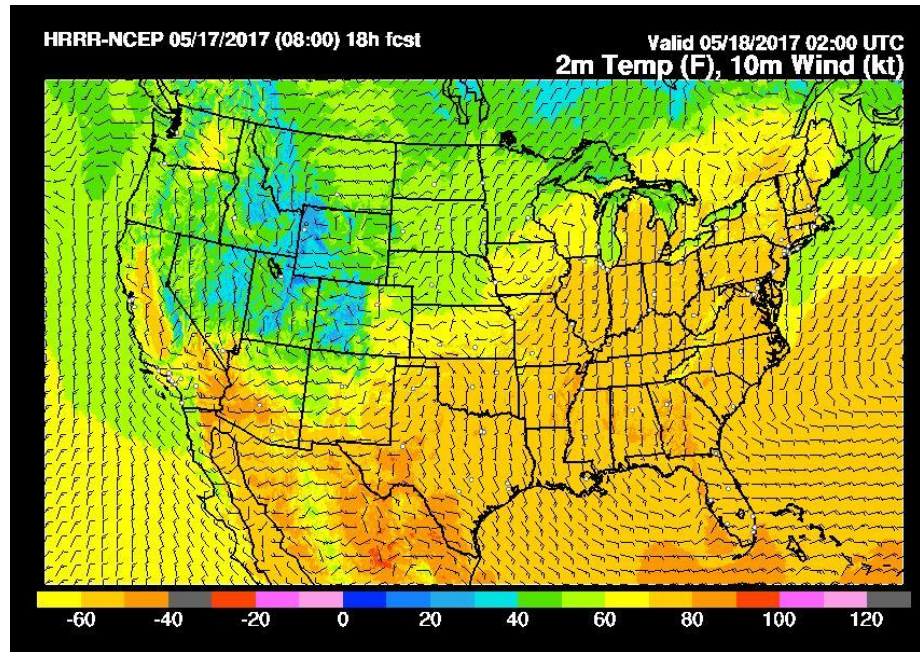
Investigation 1

What influenced $\text{PM}_{2.5}$ levels in the campground at night?

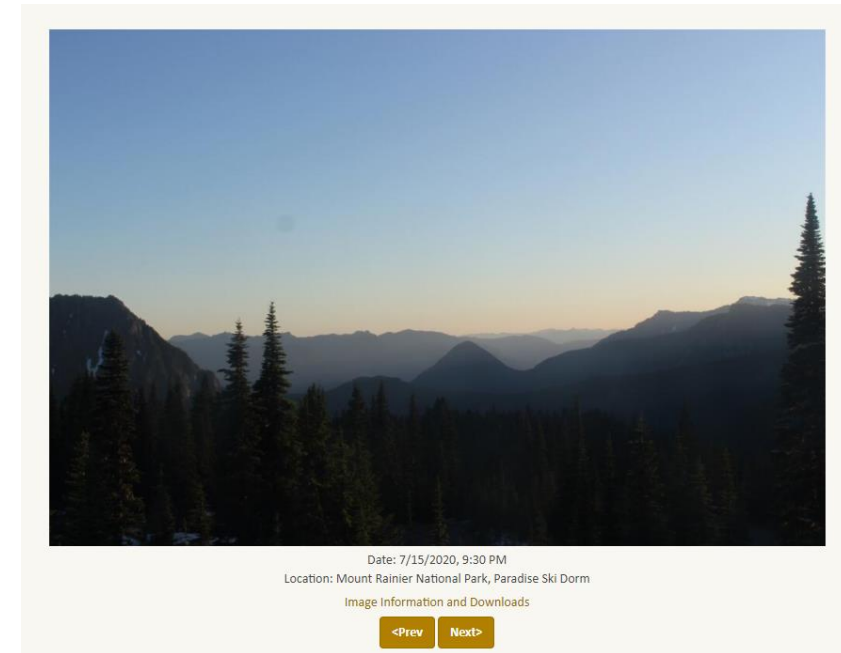
Data Used:



MetOne E-BAM PM_{2.5} concentrations



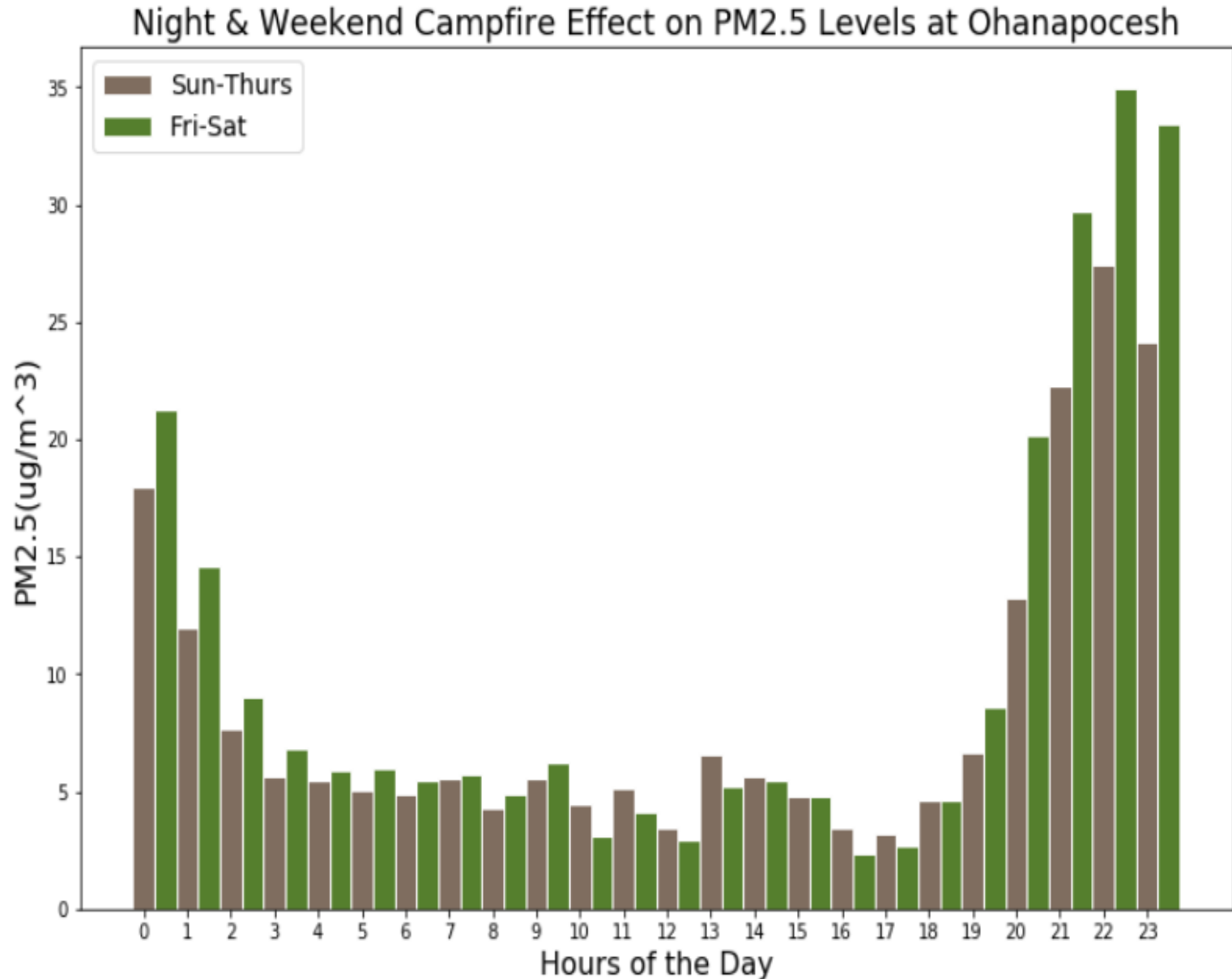
North American Mesoscale Modeled Meteorological Data (12 km resolution)



Visibility webcam at the park to detect cloud presence.

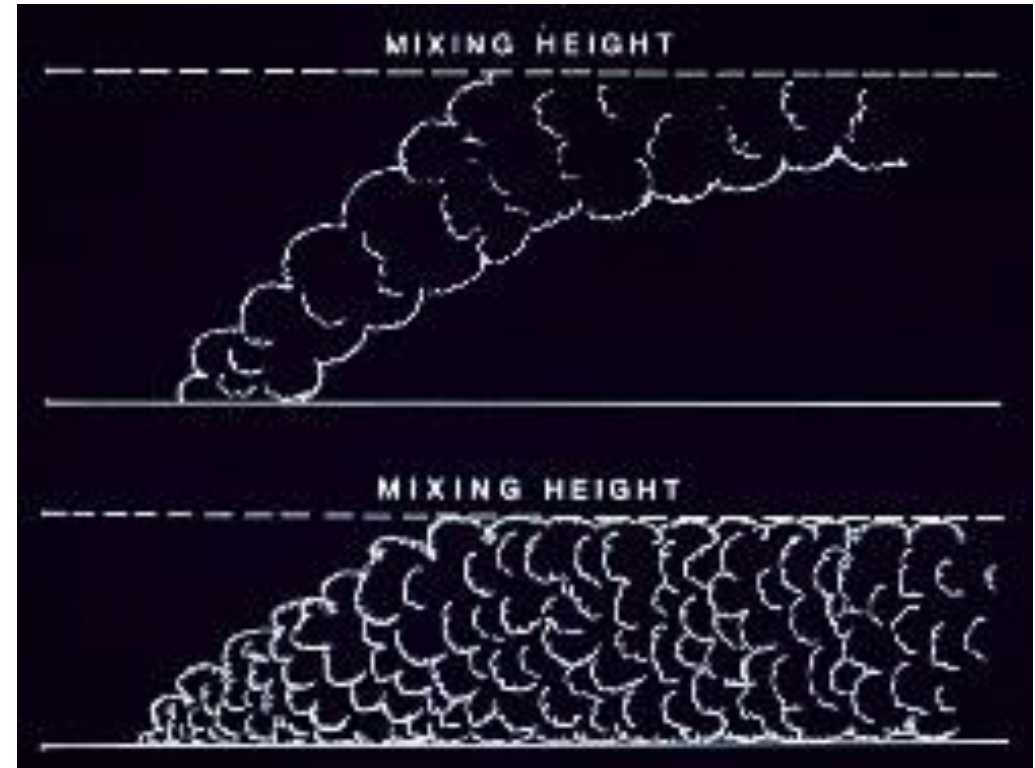
Characteristics of PM2.5 data

- 213 nights of PM2.5 data and meteorological data from summer 2009, 2010, 2013
- Peaks in smoke generally occurred from ~9pm-1am.
- Daily average PM2.5 never exceeds EPA daily limit ($35 \mu\text{g}\cdot\text{m}^3$),
- Nightly average from 9pm-1am exceeded $35 \mu\text{g}\cdot\text{m}^3$ on 65/213 nights



Variables Used

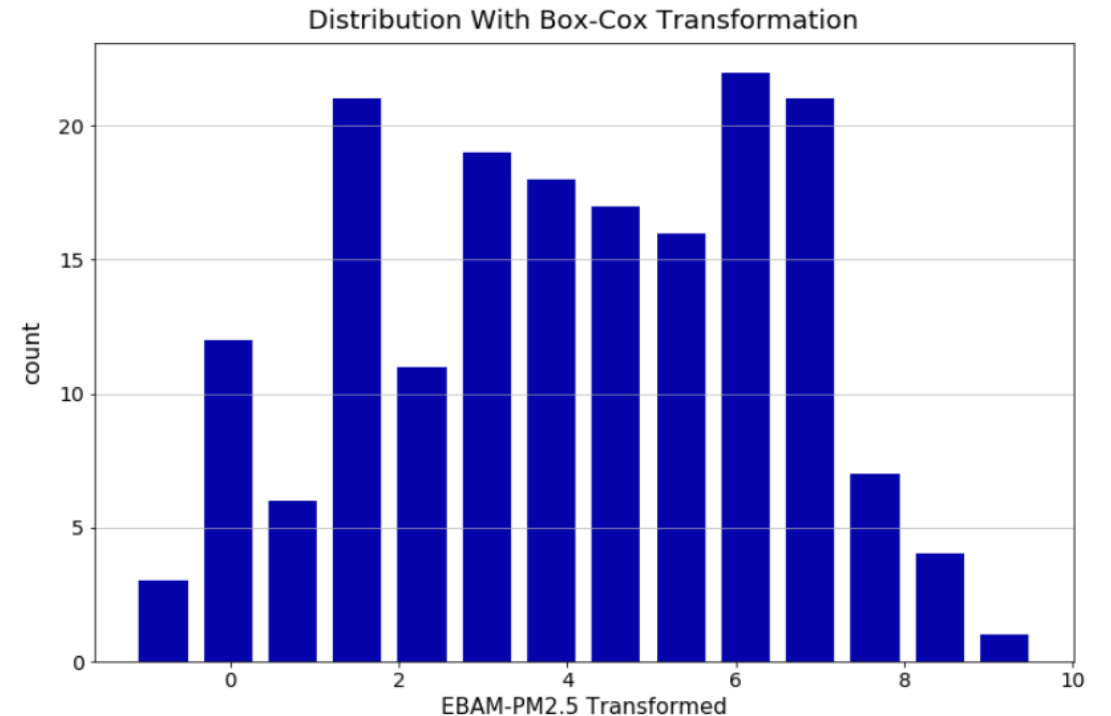
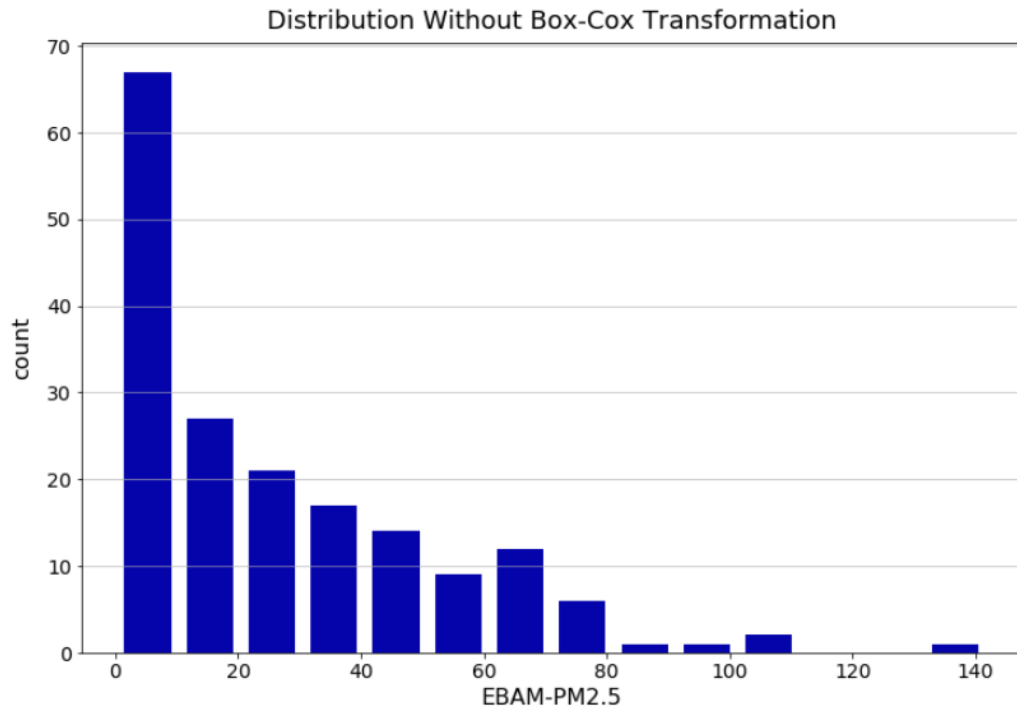
- NAM Meteorological Data
 - Temperature
 - Relative humidity
 - Mixing height
 - Wind speed
- The presence of clouds
- PM_{2.5} from the previous night

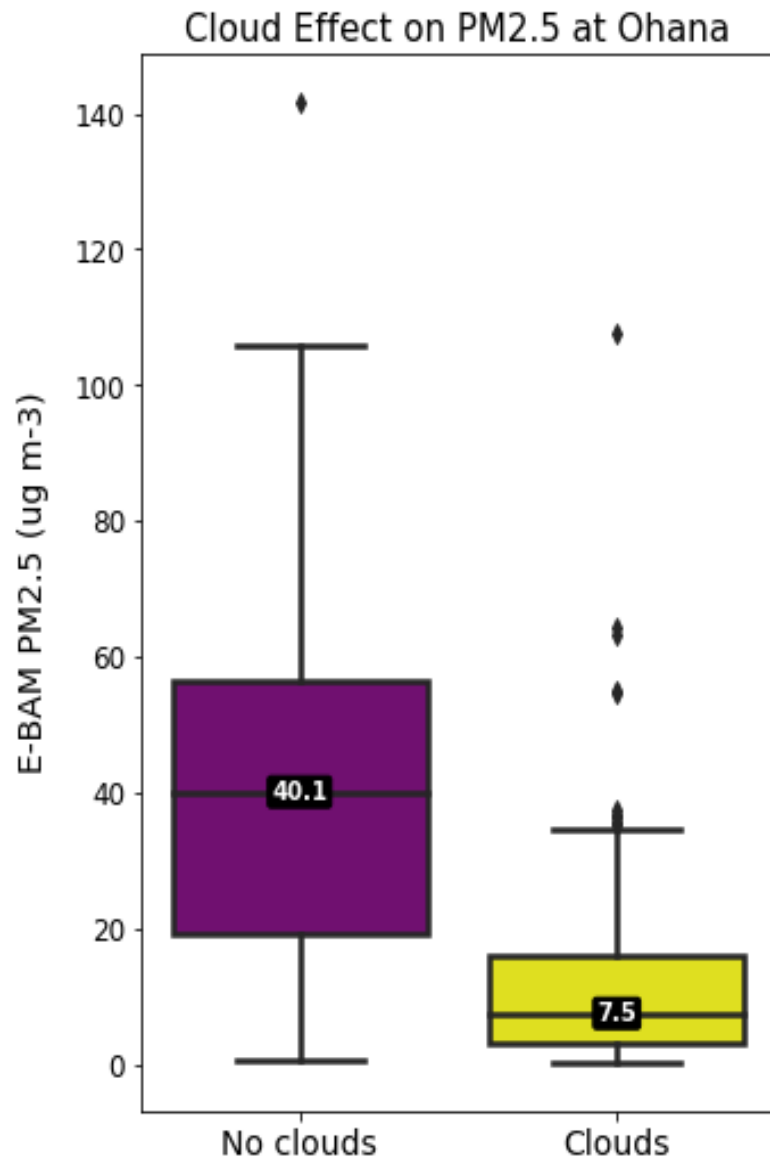


Preparing Data for Analysis

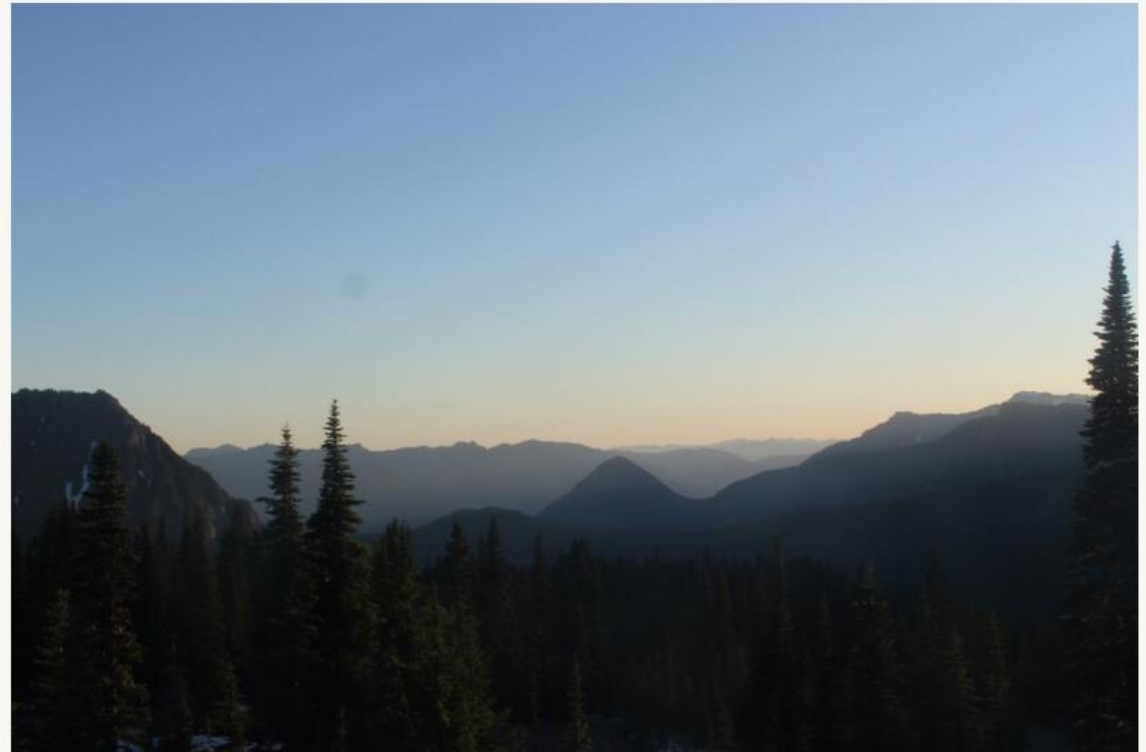
- Grouped dataset by night (from 9pm-1am)
- Developed new time-lagged variables
- Transformed PM_{2.5} data to get normal distribution using Box-Cox Transformation

$$\begin{cases} y = \frac{x^\lambda - 1}{\lambda} \text{ where } \lambda \neq 0 \end{cases}$$





The strongest indicator:



Date: 7/15/2020, 9:30 PM
Location: Mount Rainier National Park, Paradise Ski Dorm

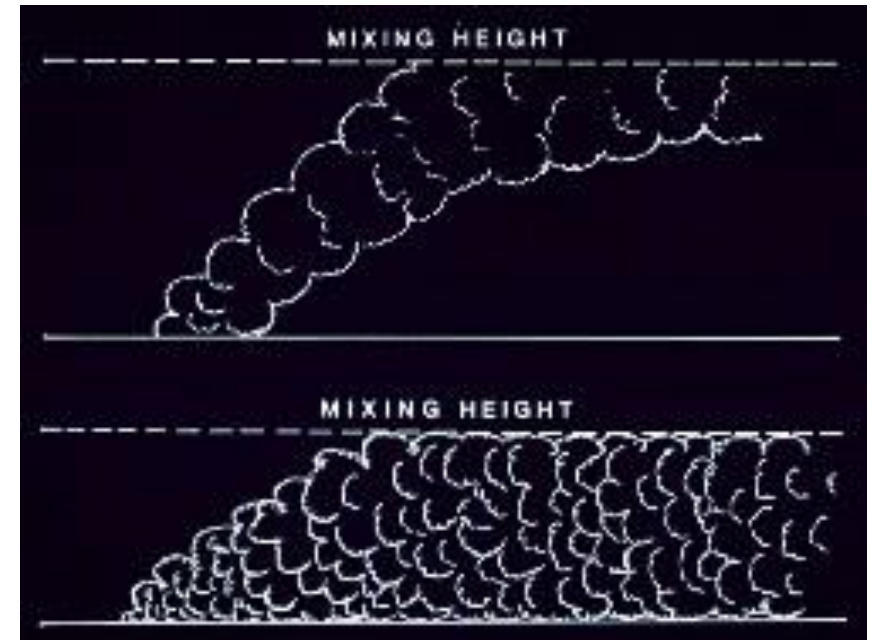
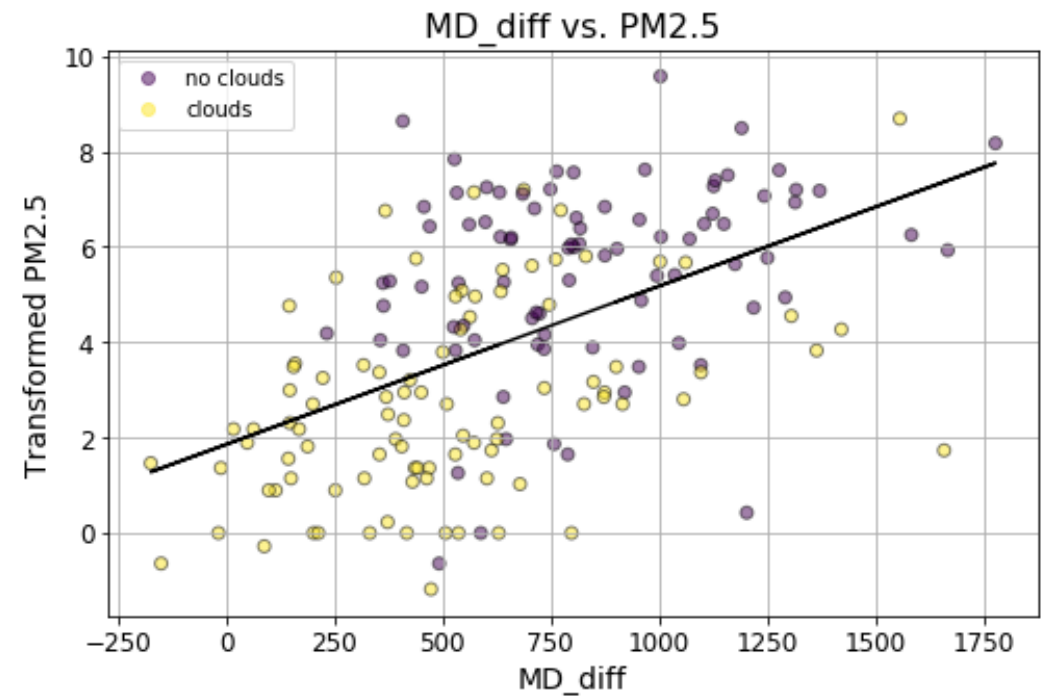
[Image Information and Downloads](#)

[<Prev](#)

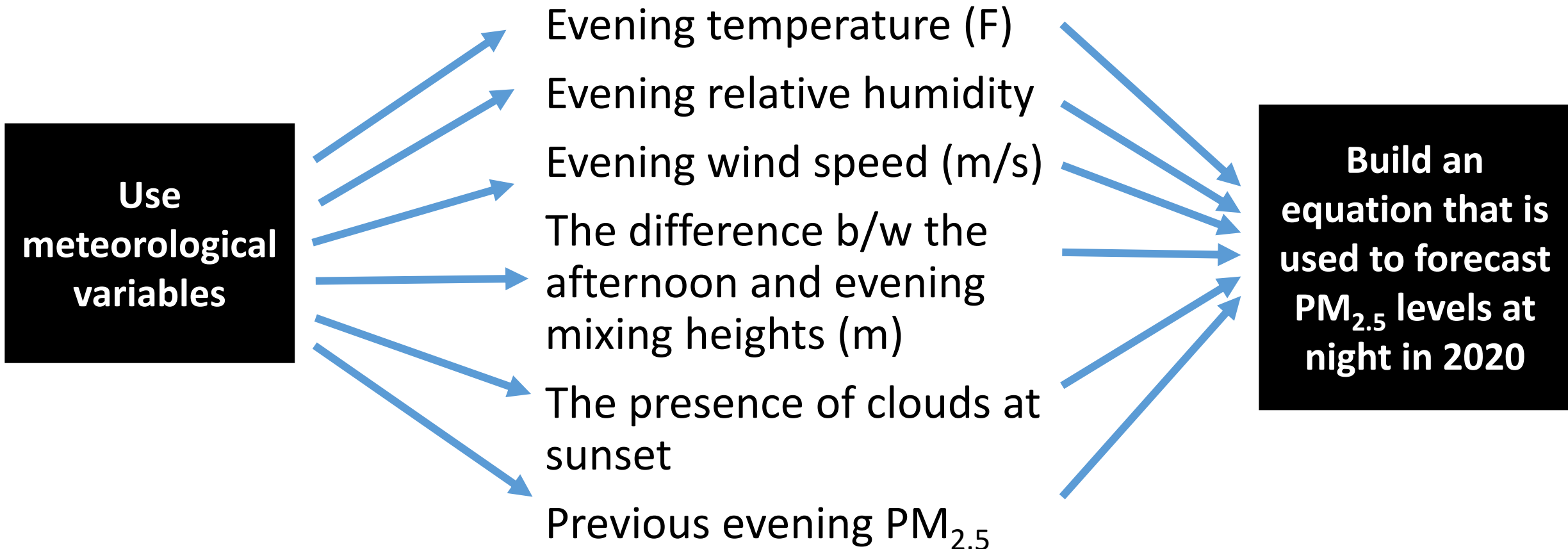
[Next>](#)

PM_{2.5} is noticeably higher at the campground when:

- There are clear skies in the late afternoon and evening
- It is warm at night
- It is dry at night
- Wind speeds are low
- There is a large difference between the afternoon and evening mixing height



Multi-variate regression between meteorological data and E-BAM PM_{2.5} from 2009-2013

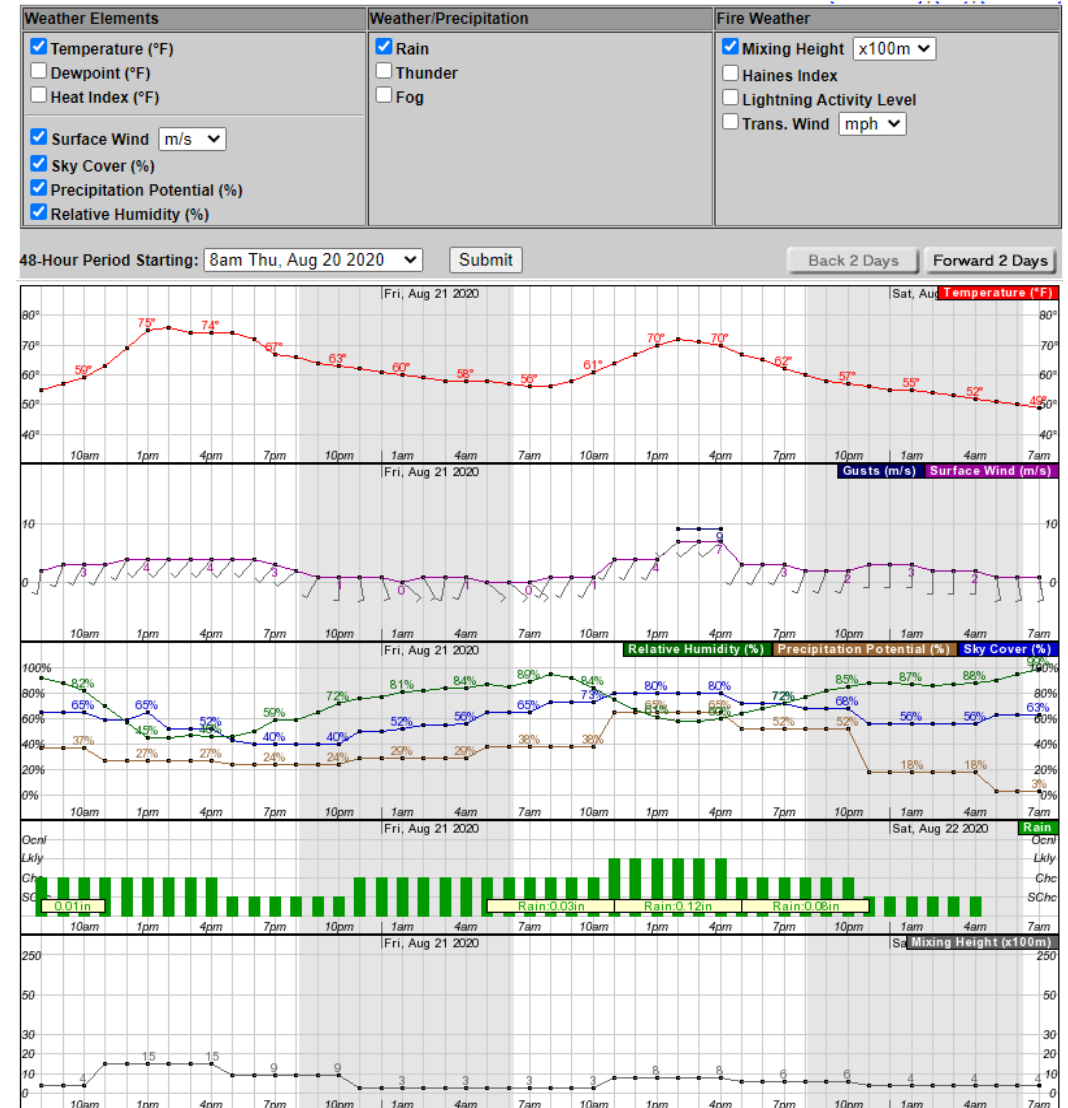


Used data collected in summer 2020 to evaluate the model built from historical data:

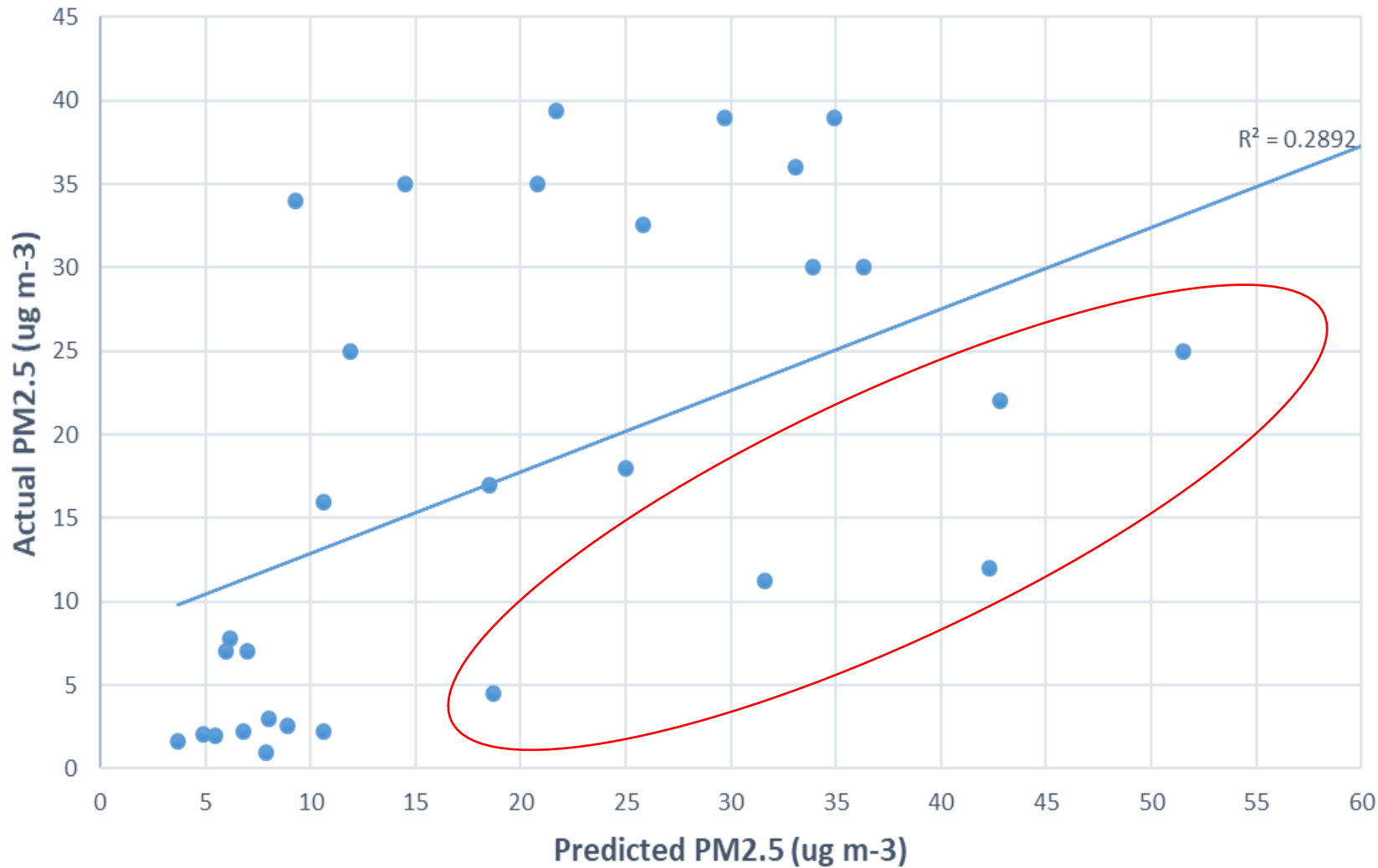
- PurpleAir PM2.5
- Daily NOAA/NWS Forecast



NATIONAL WEATHER SERVICE
NATIONAL OCEANIC AND ATMOSPHERIC ADMINISTRATION



Predicted vs. Actual Forecasting Model: Summer 2020



Results:

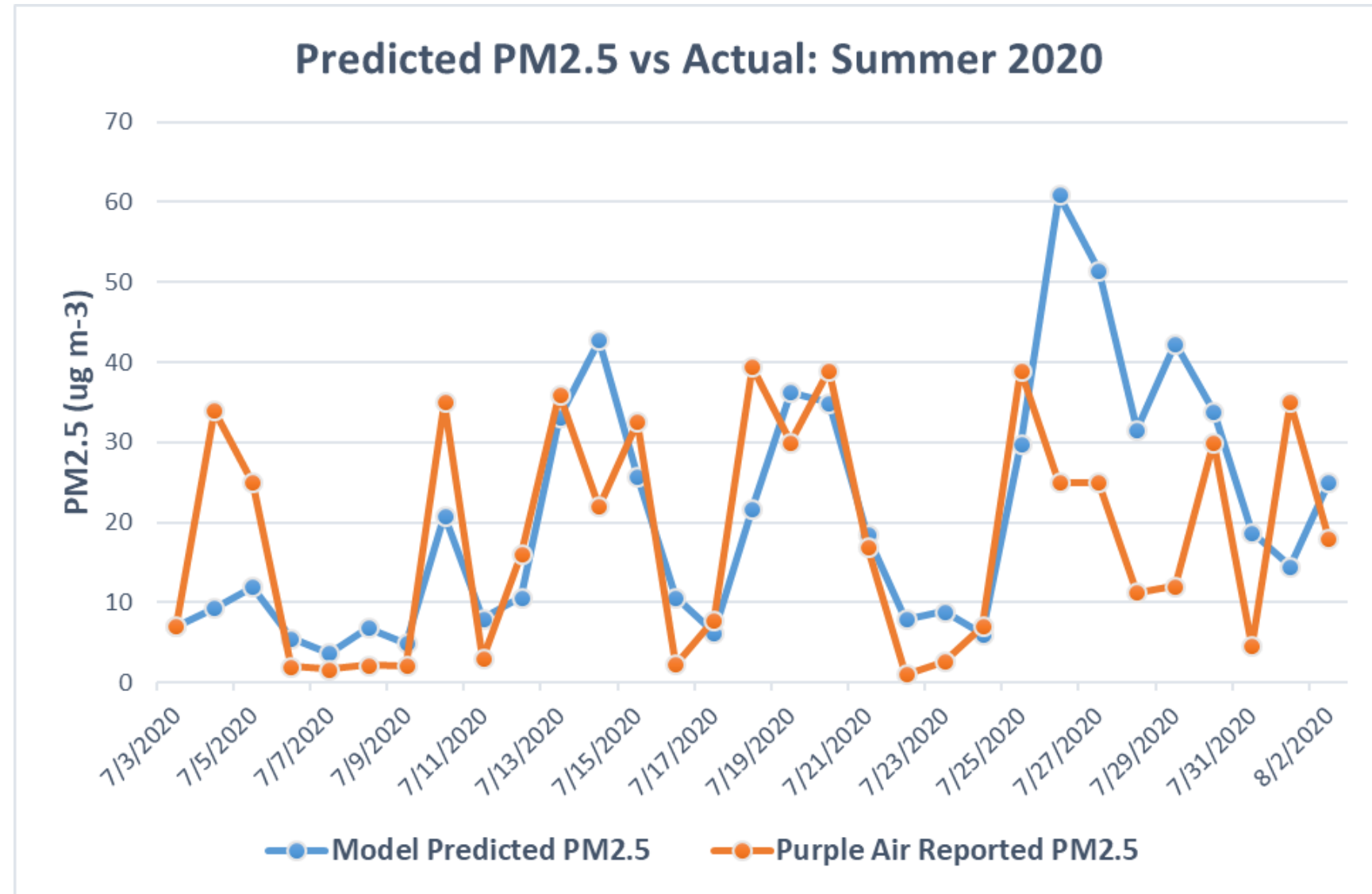
- $R^2 = 0.525$ for 2009-2013 data;
- $R_2 = 0.289$ when tested on data collected in 2020
- Mean Absolute Error = $10.49 \mu\text{g}\cdot\text{m}^3$

**Model is good at predicting
when concentrations will be low!**

78 of 200 campsites were closed during the sampling period in 2020 due to maintenance at the campground → this could lead to over prediction...

The model
predicted general
trends fairly well
considering the
closures...

More data needed

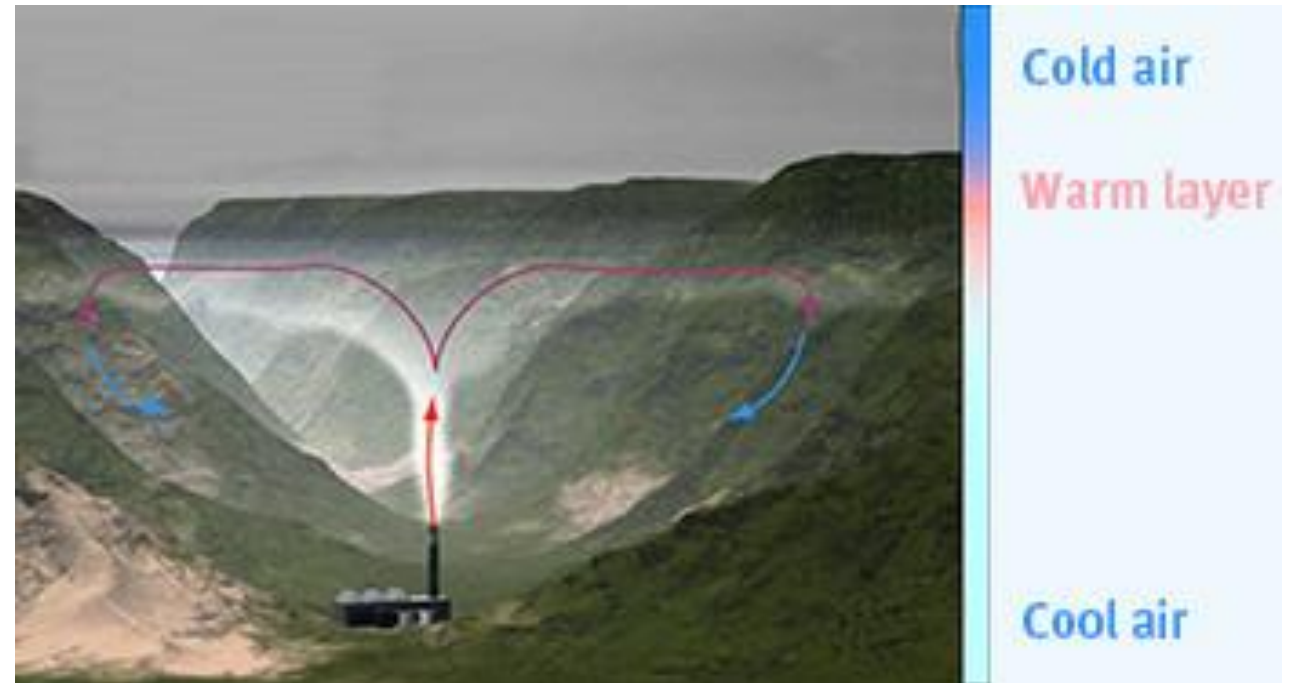
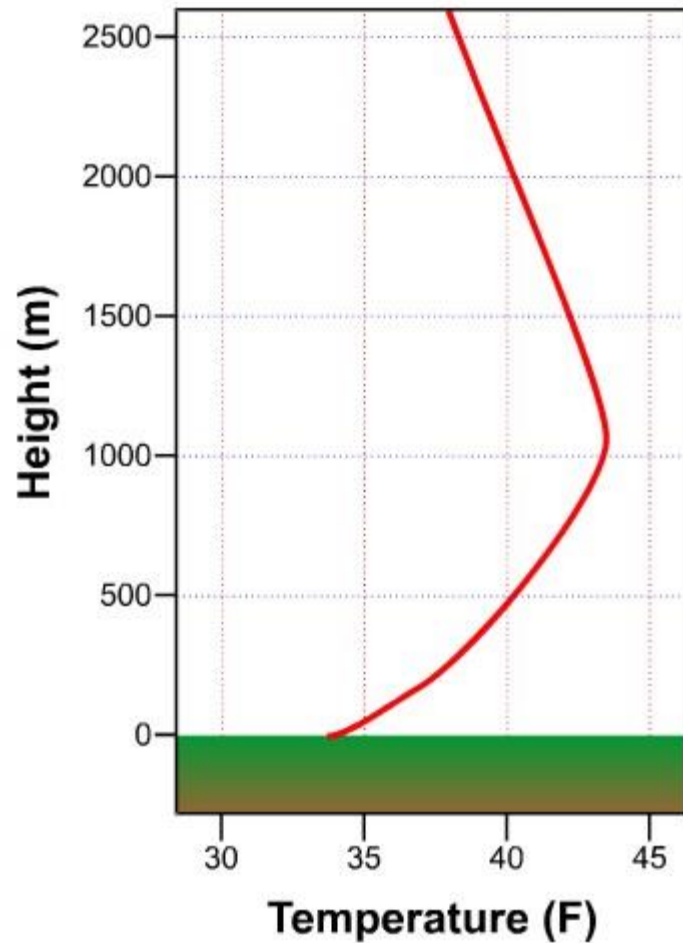


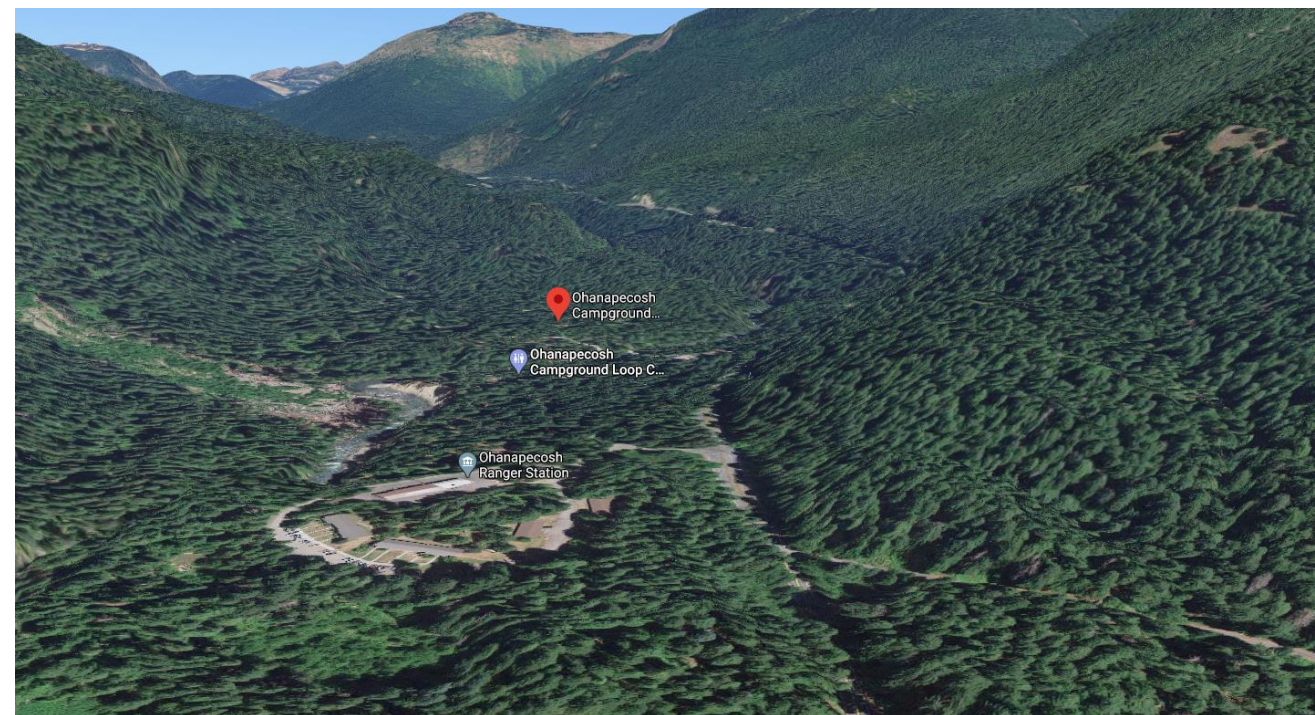
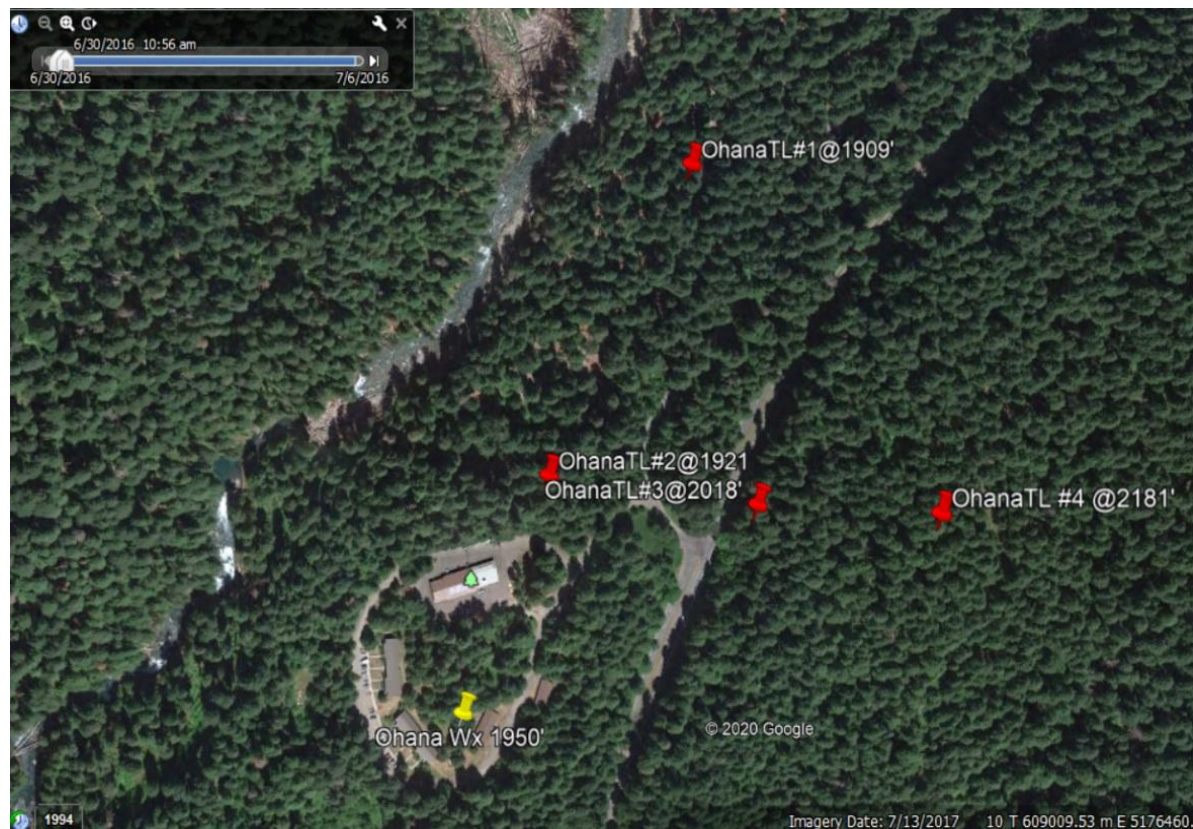
A Spreadsheet for Park Officials

| Forecast | Date | RH_night | T_night | WS_night | MD_diff | clouds_20 | pm25_prev_day | Predicted PM2.5 | Actual PM2.5 | Error +/- | Abs. Error | | | |
|----------|------------|----------|---------|----------|---------|-----------|---------------|-----------------|--------------|-----------|------------|--|---------------|---------|
| NAM12 | 07/03/2020 | 90 | 50 | 2.5 | 264 | 1 | 34 | 7.0 | 7 | 0.02 | 0.02 | | | coef |
| NAM12 | 07/04/2020 | 88 | 51 | 2.2 | 776 | 1 | 7 | 9.3 | 34 | -24.70 | 24.70 | | constant | 3.124 |
| NAM12 | 07/05/2020 | 90 | 51 | 2.2 | 847 | 1 | 34 | 11.9 | 25 | -13.08 | 13.08 | | RELHUMID | -0.0272 |
| NAM12 | 07/06/2020 | 93 | 50 | 3.5 | 388 | 1 | 25 | 5.5 | 2 | 3.55 | 3.55 | | AIRTEMP_F | 0.052 |
| NAM12 | 07/07/2020 | 97 | 48 | 3 | 256 | 1 | 2 | 3.7 | 1.6 | 2.14 | 2.14 | | WS_ms | -0.3143 |
| NAM12 | 07/08/2020 | 91 | 53 | 2.7 | 543 | 1 | 1.6 | 6.8 | 2.2 | 4.60 | 4.60 | | MD_diff | 0.0013 |
| NAM12 | 07/09/2020 | 95 | 53 | 2.7 | 230 | 1 | 2.2 | 4.9 | 2.1 | 2.78 | 2.78 | | clouds_20 | -0.8461 |
| NAM12 | 07/10/2020 | 81 | 51 | 1.2 | 967 | 0 | 2.1 | 20.8 | 35 | -14.17 | 14.17 | | pm25_prev_day | 0.0148 |
| NAM12 | 07/11/2020 | 94 | 52 | 3.5 | 654 | 1 | 35 | 8.0 | 3 | 4.95 | 4.95 | | Lambda | 0.242 |
| NAM12 | 07/12/2020 | 85 | 48 | 2.8 | 544 | 0 | 3.2 | 10.6 | 16 | -5.41 | 5.41 | | | |
| NAM12 | 07/13/2020 | 67 | 50 | 1.9 | 1509 | 0 | 16 | 33.1 | 36 | -2.94 | 2.94 | | | |
| NAM12 | 07/14/2020 | 47 | 53 | 2.4 | 1343 | 0 | 36 | 42.8 | 22 | 20.83 | 20.83 | | | |
| NAM12 | 07/15/2020 | 68 | 57.5 | 2.8 | 945 | 0 | 22 | 25.8 | 32.6 | -6.84 | 6.84 | | Error | |
| NOAA | 07/16/2020 | 90 | 56 | 2.2 | 500 | 1 | 32.6 | 10.6 | 2.25 | 8.34 | 8.34 | | MAE-NAM12 | 8.16 |
| NOAA | 07/17/2020 | 87 | 52 | 3 | 450 | 1 | 2.25 | 6.2 | 7.8 | -1.61 | 1.61 | | MAE-NOAA | 12.10 |
| NOAA | 07/18/2020 | 70 | 58 | 2.6 | 800 | 0 | 7.8 | 21.7 | 39.4 | -17.65 | 17.65 | | MAE-ALL | 10.49 |
| NOAA | 07/19/2020 | 74 | 63 | 0.5 | 700 | 0 | 39.4 | 36.3 | 30 | 6.30 | 6.30 | | | |
| NOAA | 07/20/2020 | 78 | 64 | 1 | 900 | 0 | 30 | 34.9 | 39 | -4.10 | 4.10 | | | |
| NOAA | 07/21/2020 | 80 | 59 | 0.5 | 500 | 1 | 39 | 18.5 | 17 | 1.50 | 1.50 | | | |
| NOAA | 07/22/2020 | 90 | 55 | 2.5 | 400 | 1 | 17 | 7.9 | 1 | 6.87 | 6.87 | | | |
| NOAA | 07/23/2020 | 85 | 53 | 2 | 600 | 1 | 1 | 8.9 | 2.6 | 6.34 | 6.34 | | | |
| NOAA | 07/24/2020 | 90 | 50 | 3.2 | 600 | 1 | 2.6 | 6.0 | 7 | -1.00 | 1.00 | | | |
| NOAA | 07/25/2020 | 72 | 57 | 0.89 | 1000 | 0 | 7 | 29.7 | 39 | -9.34 | 9.34 | | | |

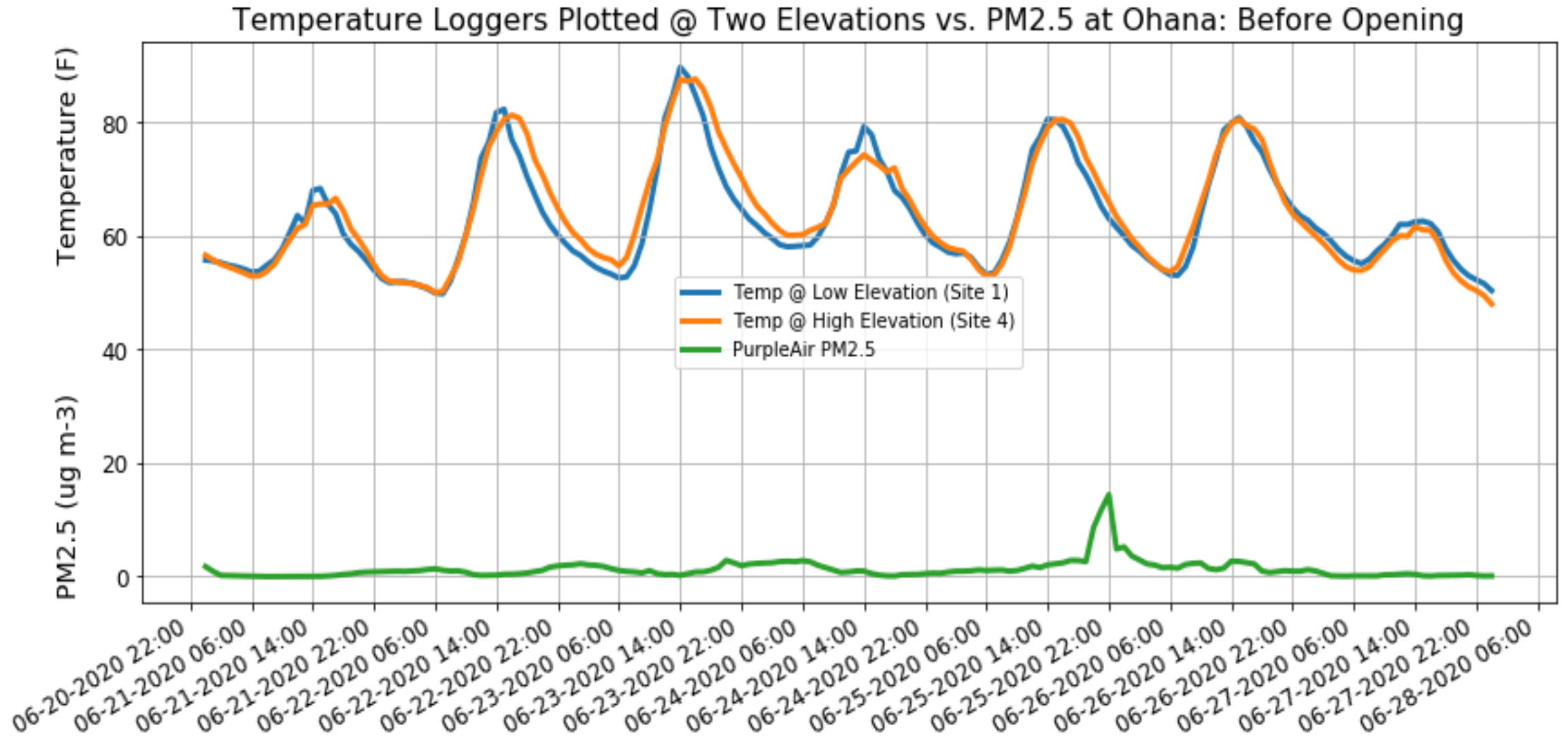
Investigation 2

Check for inversions & their effect:
Temploggers + PM_{2.5} Collection

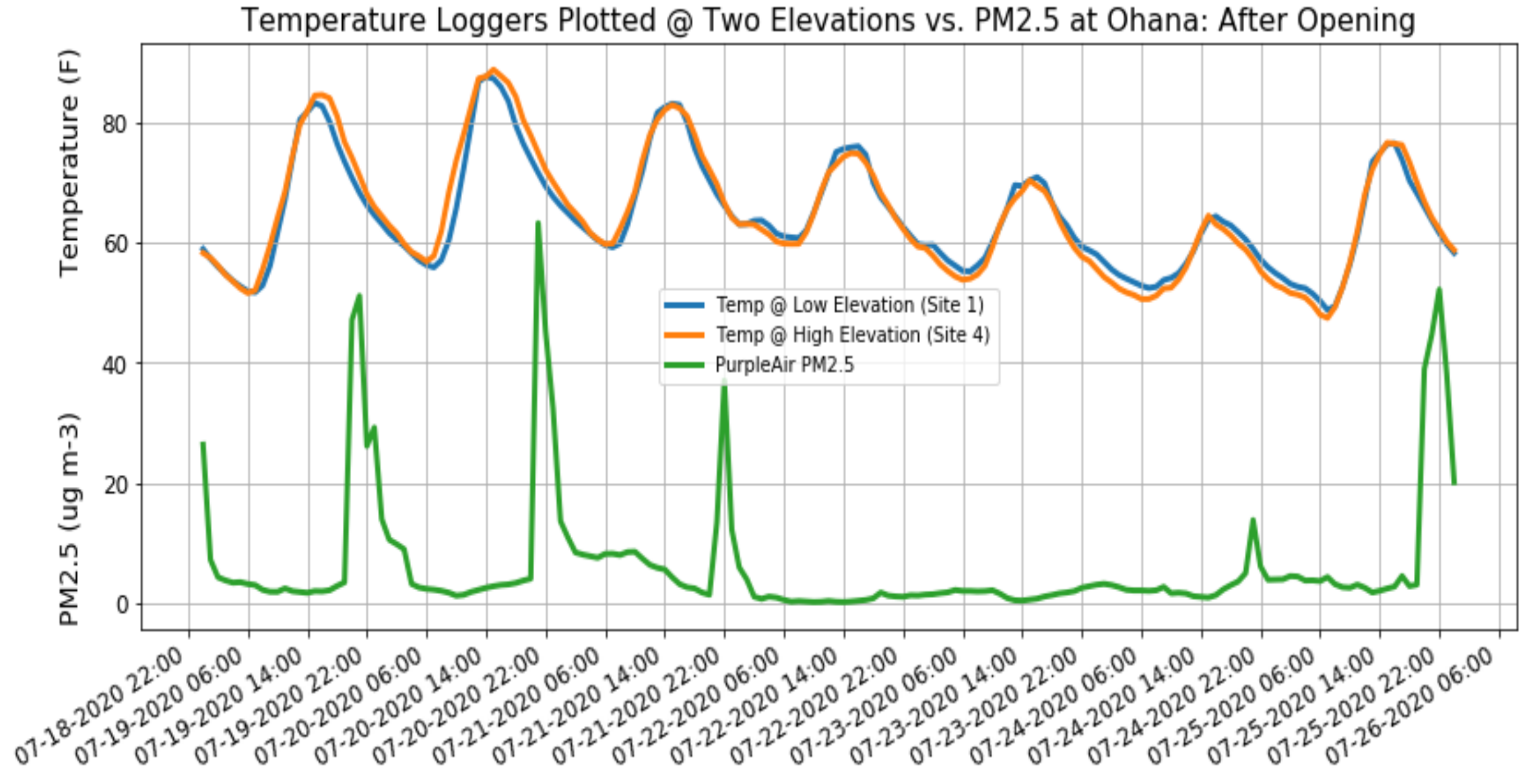


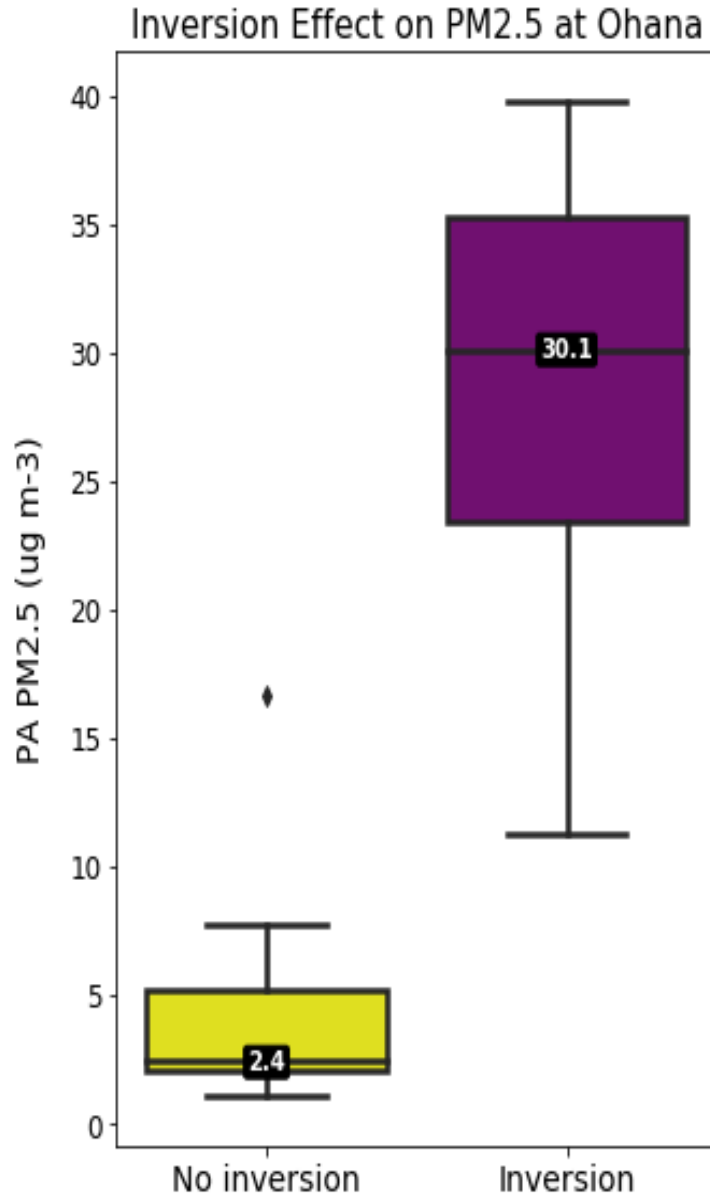


Orange over blue = Inversion



Orange over blue = Inversion



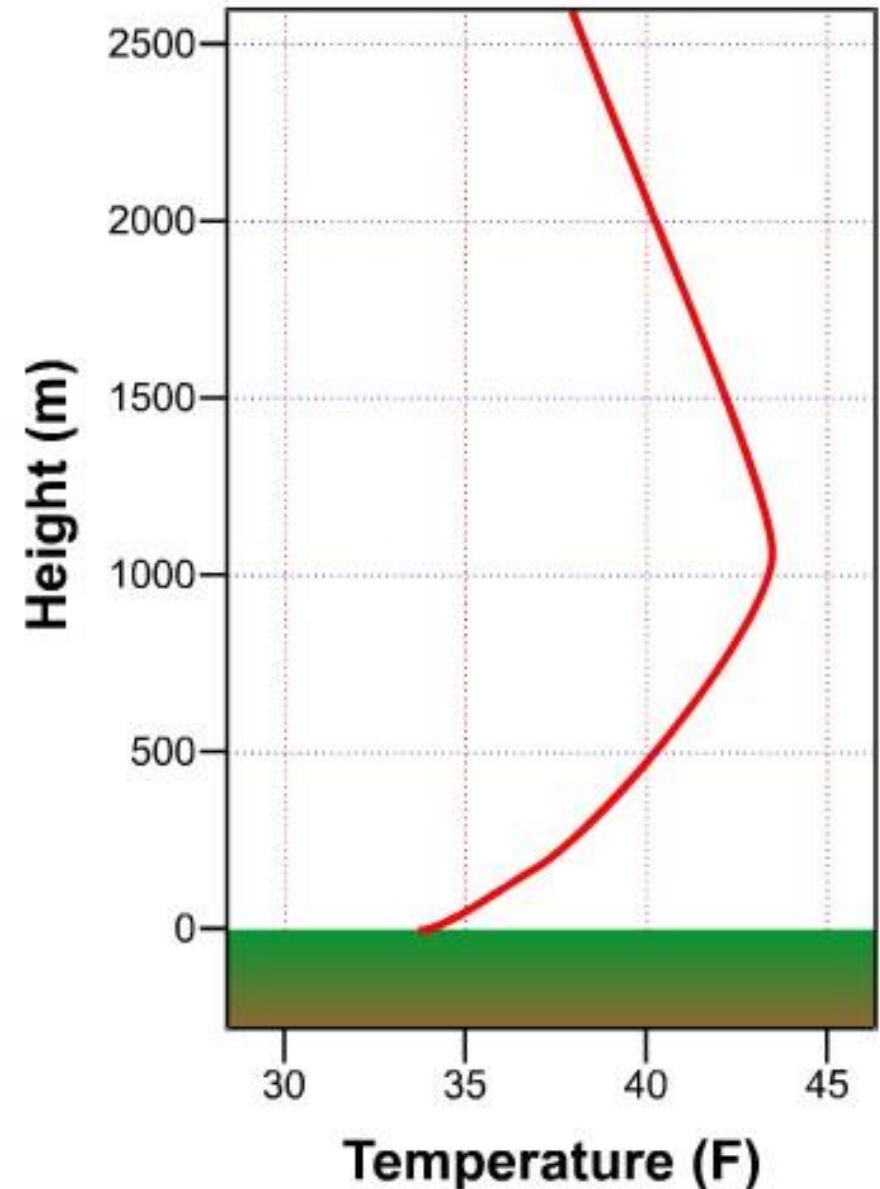


Conclusions

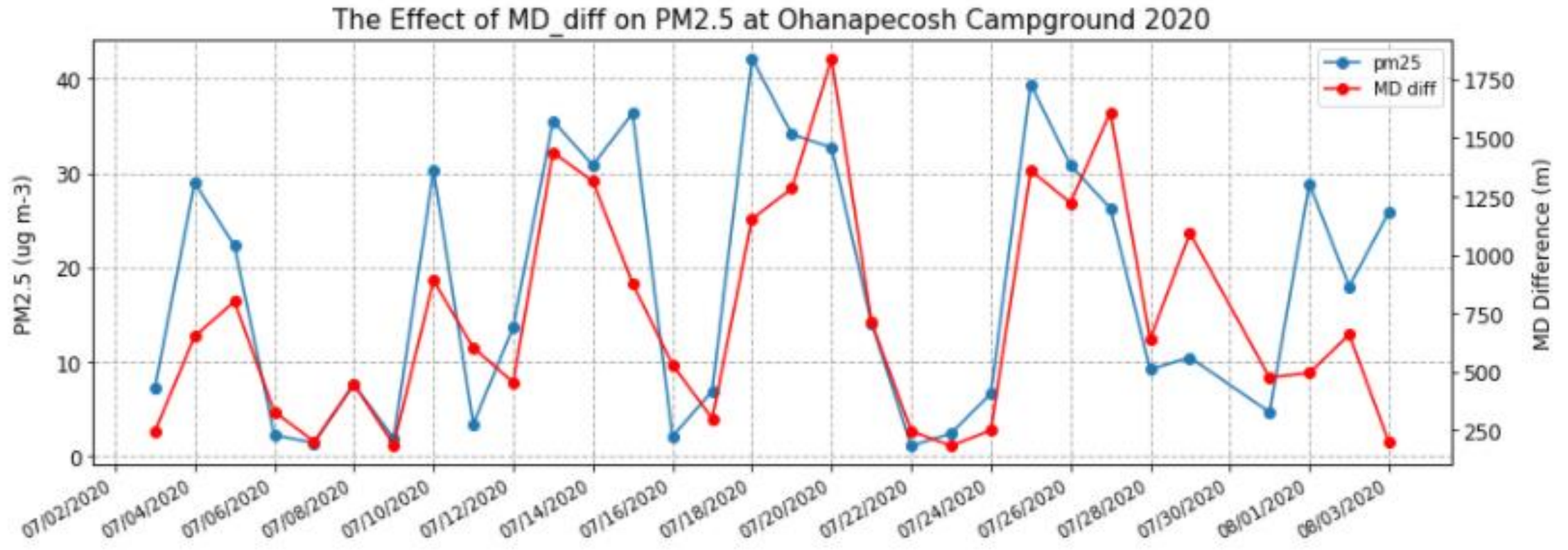
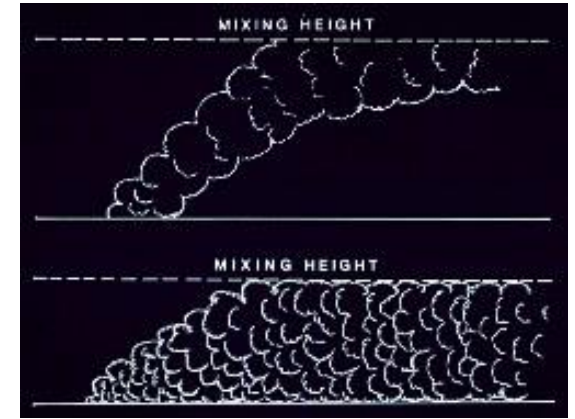
- 20 of 33 nights after campground opened experienced inversions
- PM2.5 was significantly higher on these nights
- Clouds can prevent inversions from forming
- Clouds correctly predicted whether an inversion would occur 72% of the time (24/33 nights)
 - Clouds present at sunset = no inversion
 - Clear skies at sunset = inversion

Relationship b/w Clouds & Inversions

- The Earth's surface cools more rapidly on clear nights and more slowly on cloudy nights
- During the day, clouds can absorb longwave radiation (infrared) from the ground.
- At night, clouds prevent the ground from cooling off quickly because they supply the ground with radiation they absorbed before, keeping the air temperature at the surface warmer than the overlying air and preventing the inversion
- The opposite is true on clear nights. The ground cools off quickly, and the air just above the ground loses its heat to the ground by conduction throughout the night, resulting in the air near the surface being cooler than the air above it, creating an inversion.



Difference in afternoon and evening mixing depth a good predictor of Inversions?

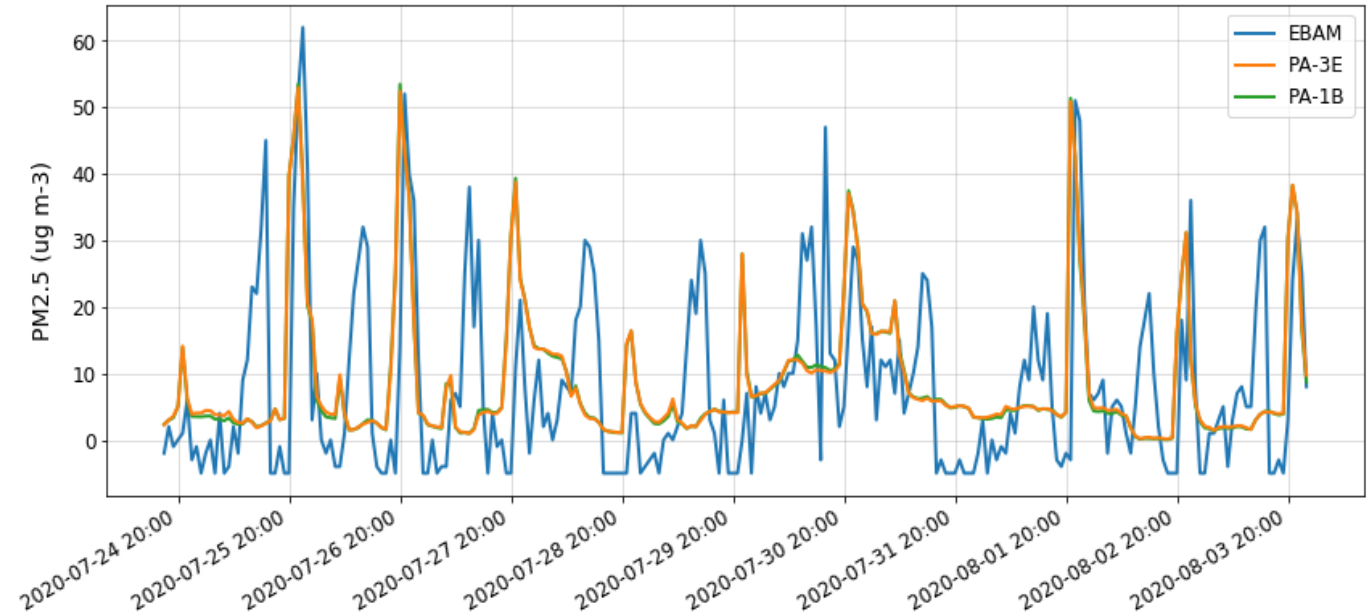


Investigation 3

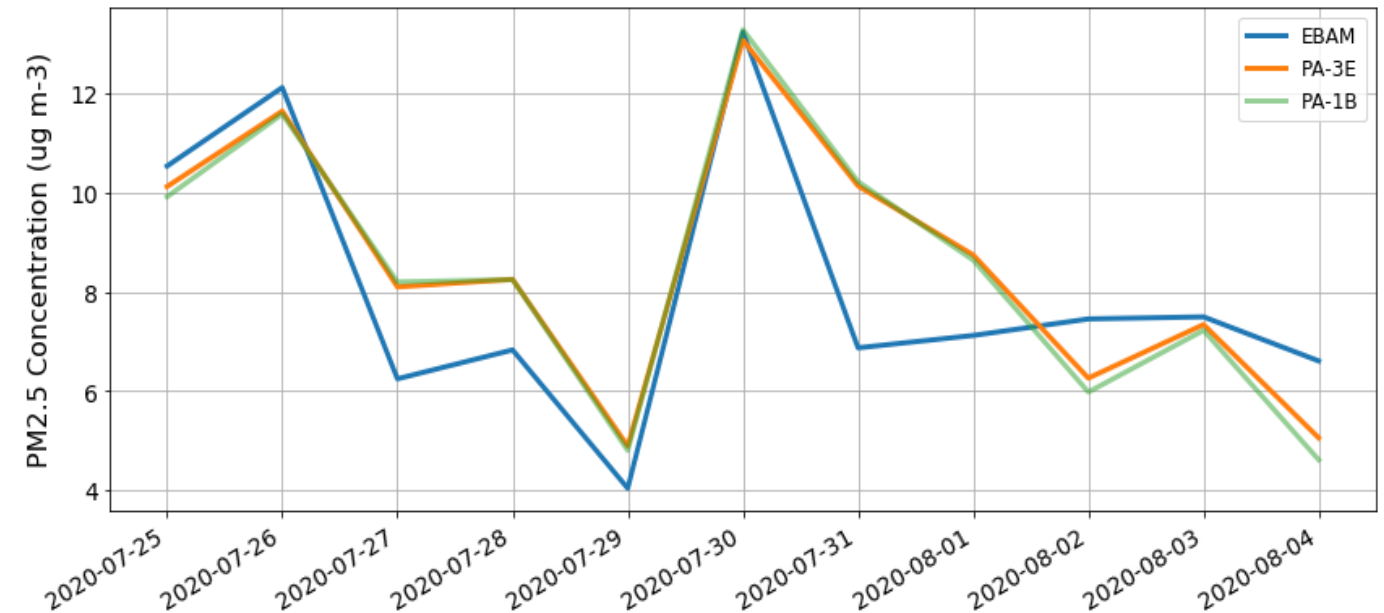
Compare low-cost
Purple Air Sensors with
MetOne E-BAM



Hourly E-BAM Concentrations vs 2-PurpleAir Sensors at Ohana: 07/24/2020-08/03/2020




Daily E-BAM & PurpleAir Concentrations at Ohanapocesh Campground: 07/25/20-08/04/20



An aerial photograph of a vast mountain range. The mountains are covered in dense green forest, with some rocky peaks visible in the distance. A river winds through a valley in the center of the image. The sky is clear and blue.

Thanks for listening!

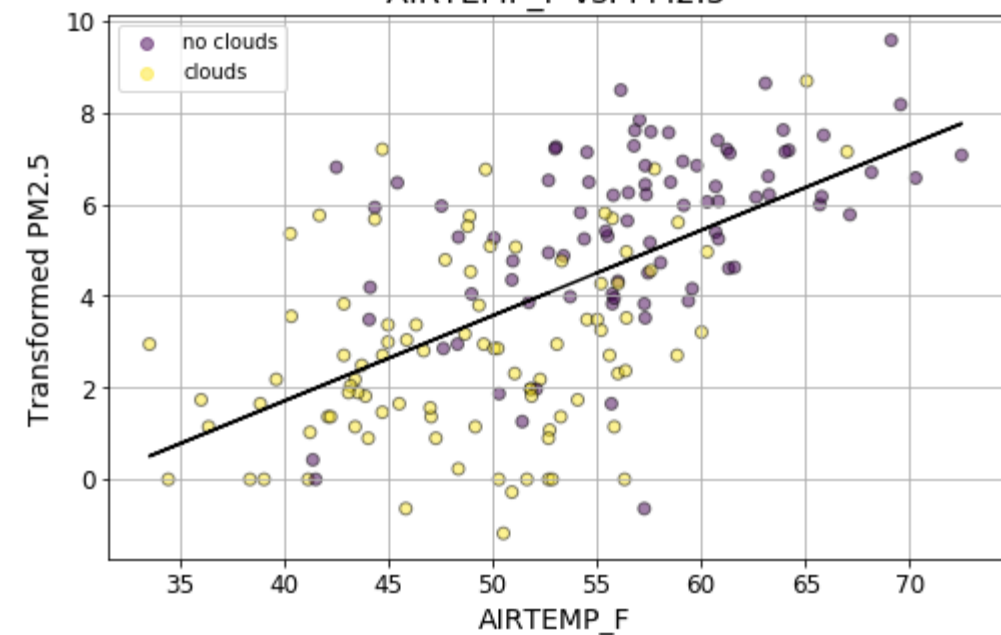
 Ohanapecosh
Campground...

Any questions?

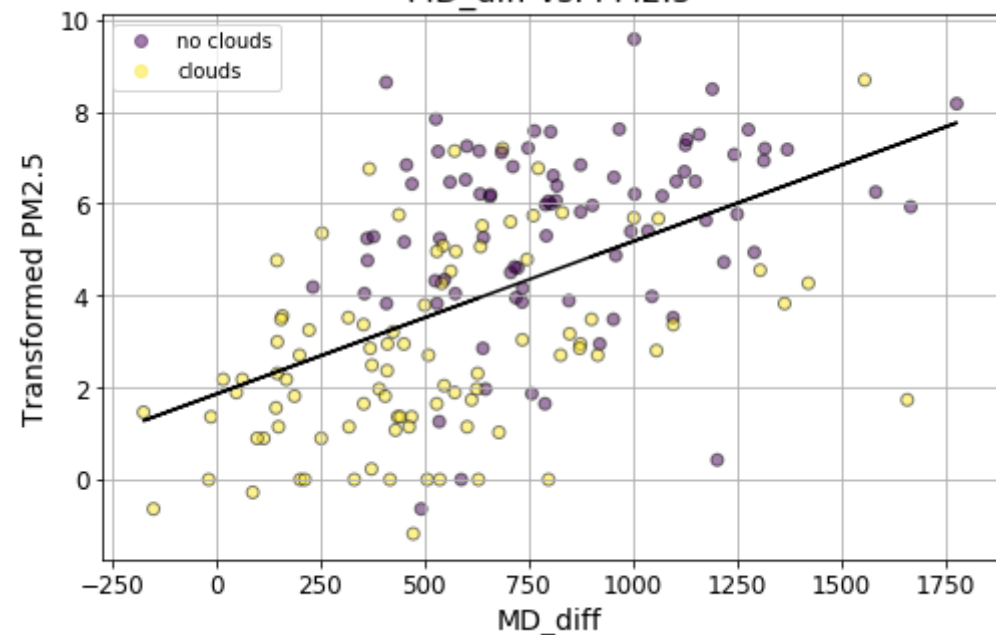
Backbone
Ridge

Plots

AIRTEMP_F vs. PM2.5

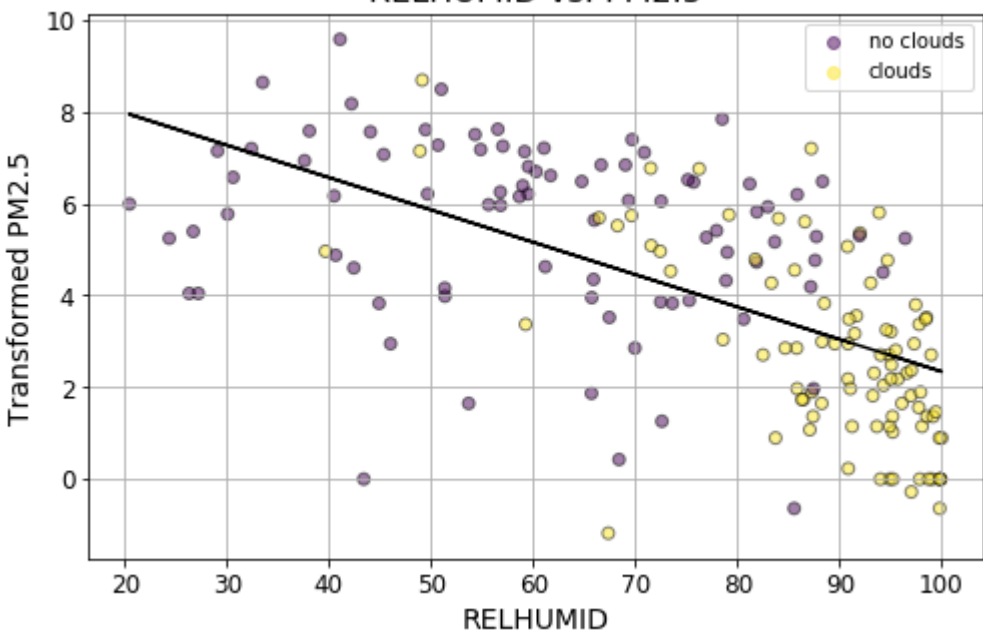


MD_diff vs. PM2.5

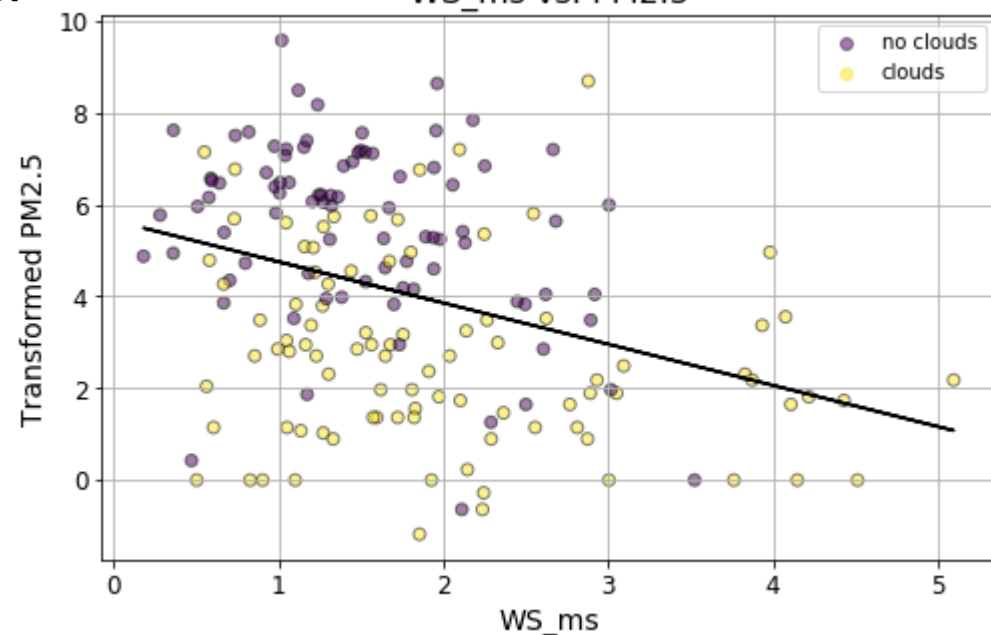


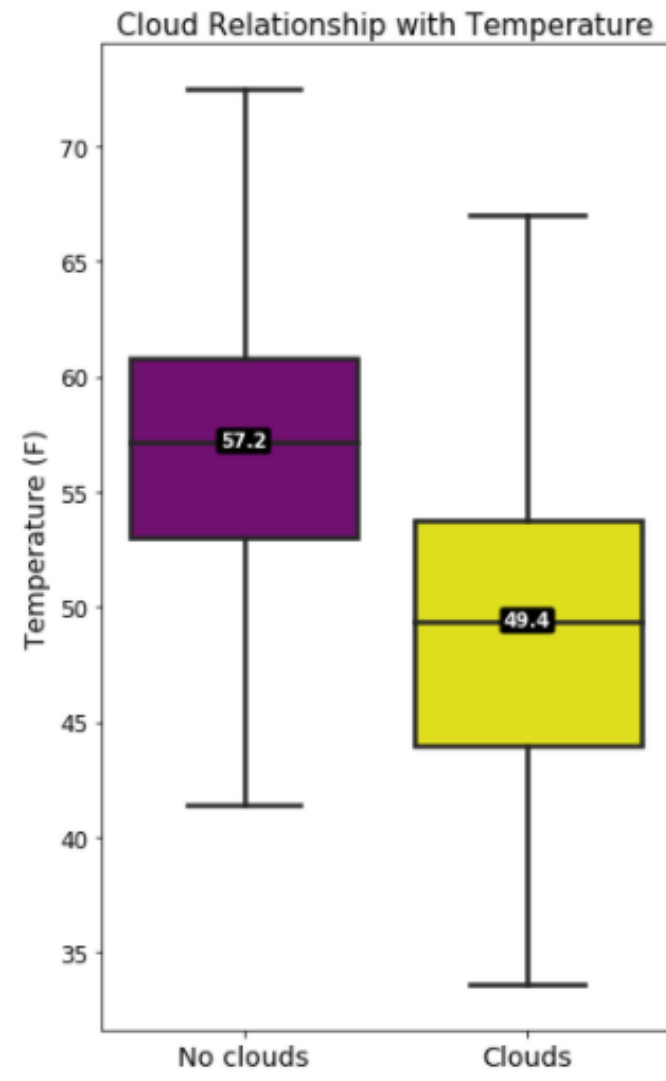
Box-Cox
transformed

RELHUMID vs. PM2.5



WS_ms vs. PM2.5





Regional Campfire Ban Decision- Making Flowchart

What AQI category does the park (and its immediately surrounding regions) fall under according to AirNow.gov?

Can one or more current readings validate AirNow forecast?:

- Nearby AirNow PM2.5 station
- Tahoma Woods PM2.5 nephelometer
- Regional PurpleAir Sensors

Can field validation of unhealthy air quality be provided?

- Difficulty breathing?
- Eye-irritation?
- Reduced visibility distinct from fog (webcam)?
- Smoke present?

If the case to support poor air quality in the park is:

- Weak – follow the above procedures again at 11:30am
- Supportive – refer to the corresponding procedures
- Worse than forecasted – refer to the corresponding procedures and provide a final update at 11:30am

| Moderate | Unhealthy for Sensitive Groups | Unhealthy | Very Unhealthy | Hazardous |
|--|---|--|--|--|
| AQI (50-100) | AQI (101-150) | AQI (151-200) | AQI (201-300) | AQI (301-500) |
| PM _{2.5} (12.1-35.4 ug/m ³) | PM _{2.5} (35.5-55.4 ug/m ³) | PM _{2.5} (55.5-150.4 ug/m ³) | PM _{2.5} (150.5-250.4 ug/m ³) | PM _{2.5} (>254.5 ug/m ³) |
| <ul style="list-style-type: none">• Recommend groups to not use campfires if anyone in the group is sensitive to poor air quality• Encourage small groups to keep campfires small or to combine with other groups• Encourage groups to completely extinguish campfires upon completion | <ul style="list-style-type: none">• Prohibit individual campfires and setup group campfire locations in the major campgrounds• Require all campfires to be completely extinguished by 11pm | <ul style="list-style-type: none">• Prohibit the use of campfires across the park. | <ul style="list-style-type: none">• Prohibit the use of campfires across the park. | <ul style="list-style-type: none">• Prohibit the use of campfires across the park. |