

Washington Smoke Forecast System

ECY HYSPLIT Project Team:

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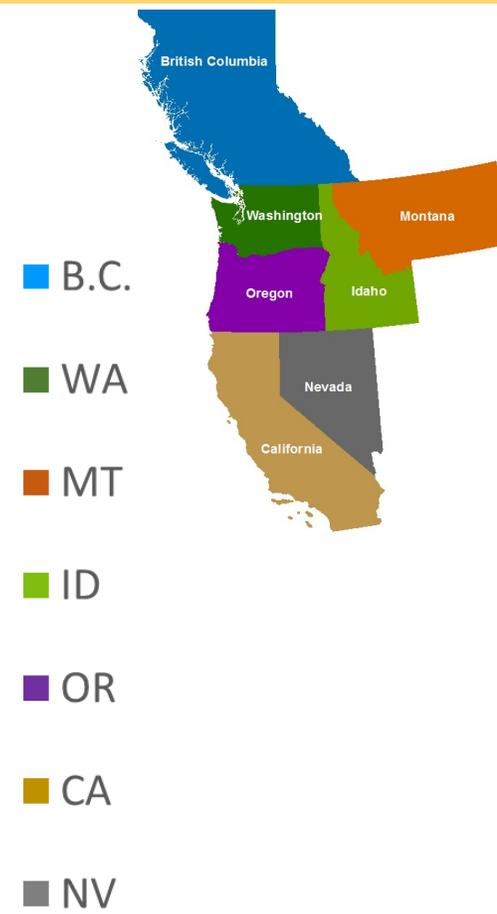
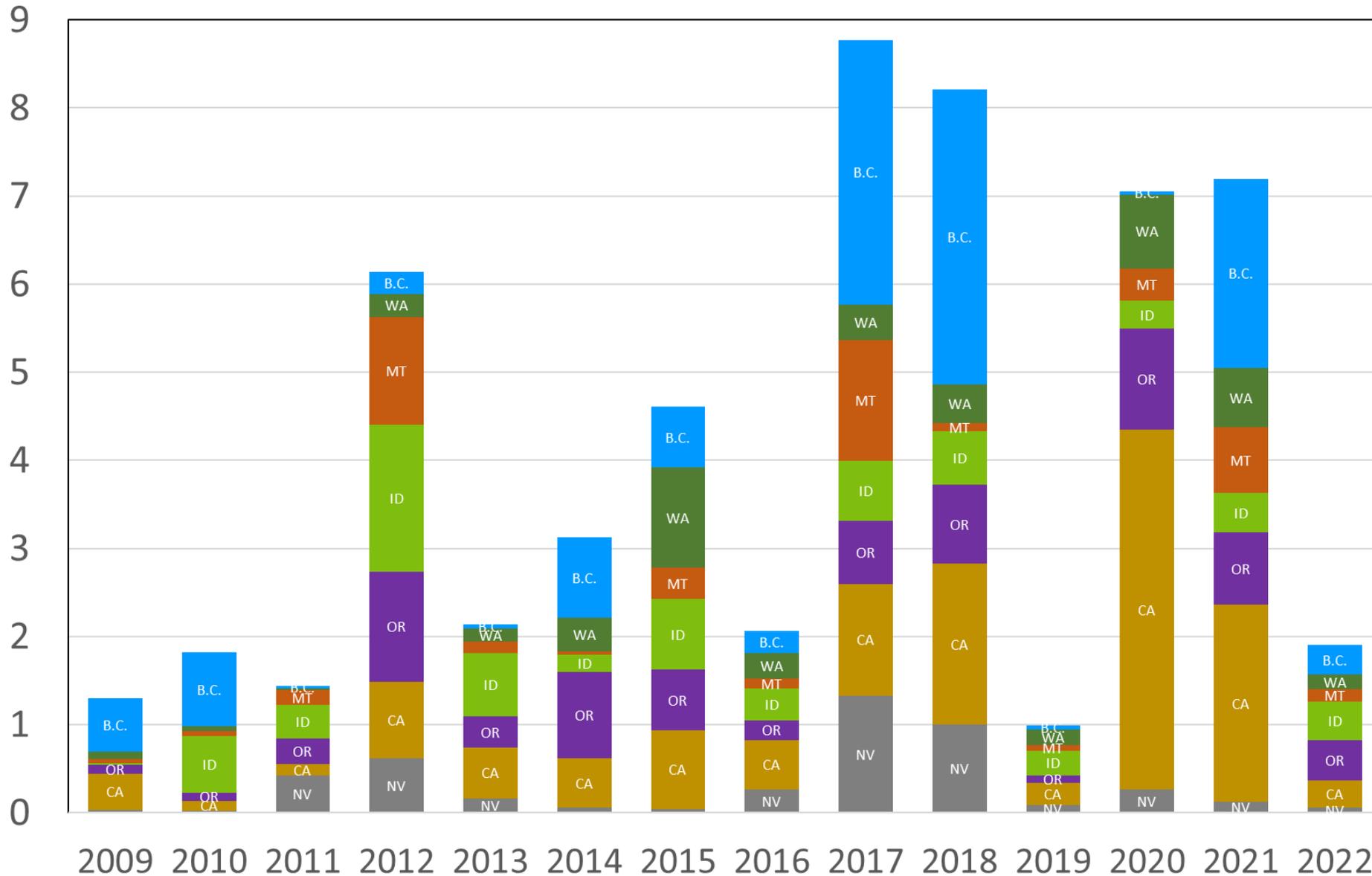
**NW-AIRQUEST Annual Mtg.
June 20, 2023**

Overview

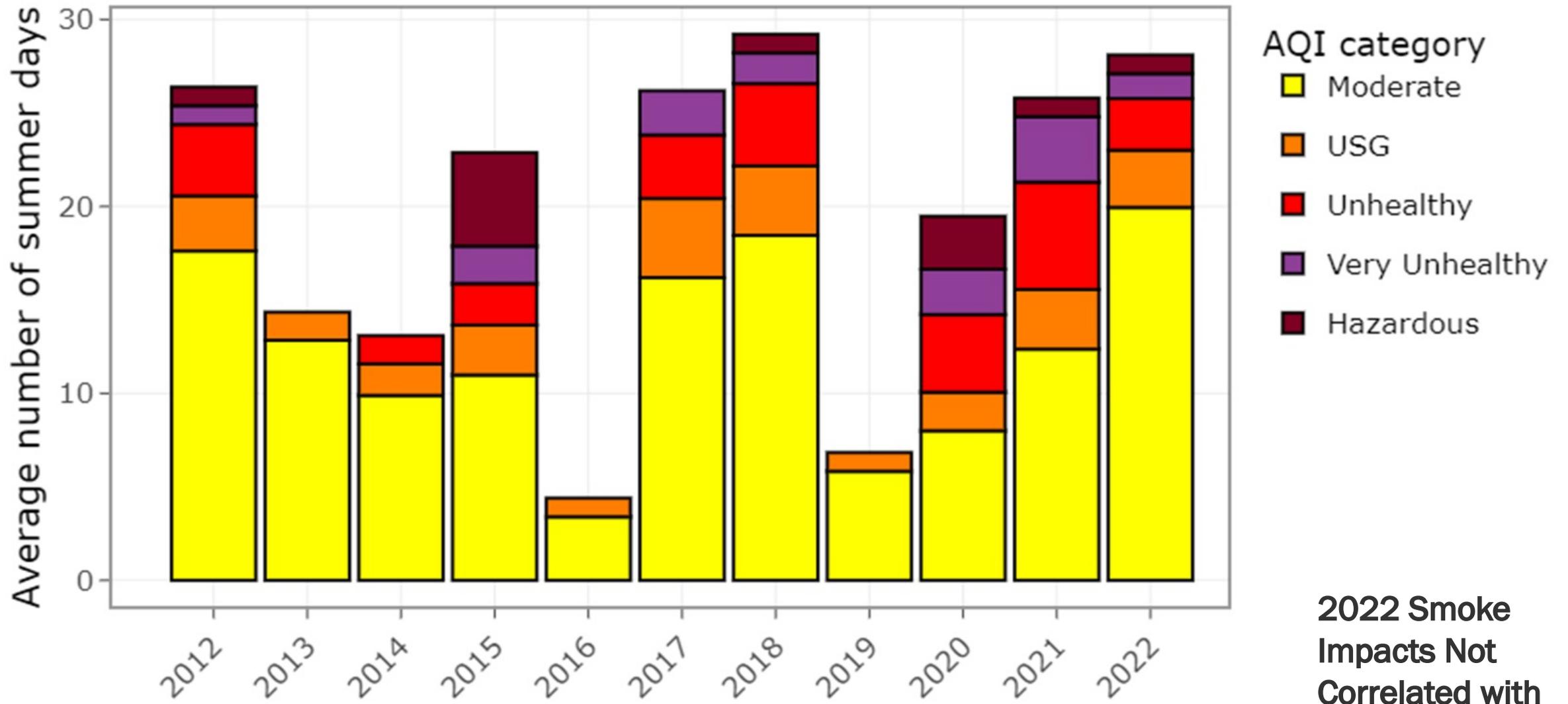
- Brief review of fire activity over the past decade
- Background of wildfire smoke forecasting at Ecology
- Forecast zone changes
- Model setup and comparison
- HYSPLIT processing steps
- Synopsis of model performance (2022)
- Sensitivity analysis for emissions scenarios
- New HYSPLIT scenario details
- Past issues and recent changes



Millions of acres burned



**2023 Lesson:
Add Alberta!**



2022 Smoke Impacts Not Correlated with Acres Burned

Wildfire Smoke Forecasting

Project Background



Purpose:

Provide the public with a forecast of upcoming smoke impacts from wildfires so people can plan ahead and reduce exposure.

Historical Perspective:

Smoke models are often inaccurate and difficult for the public to interpret. Historically, Ecology would use many sources of info to synthesize a forecast to be posted on the WA Smoke Blog (often multiple times per week), using daily PM2.5 AQI categories.

Project Development:

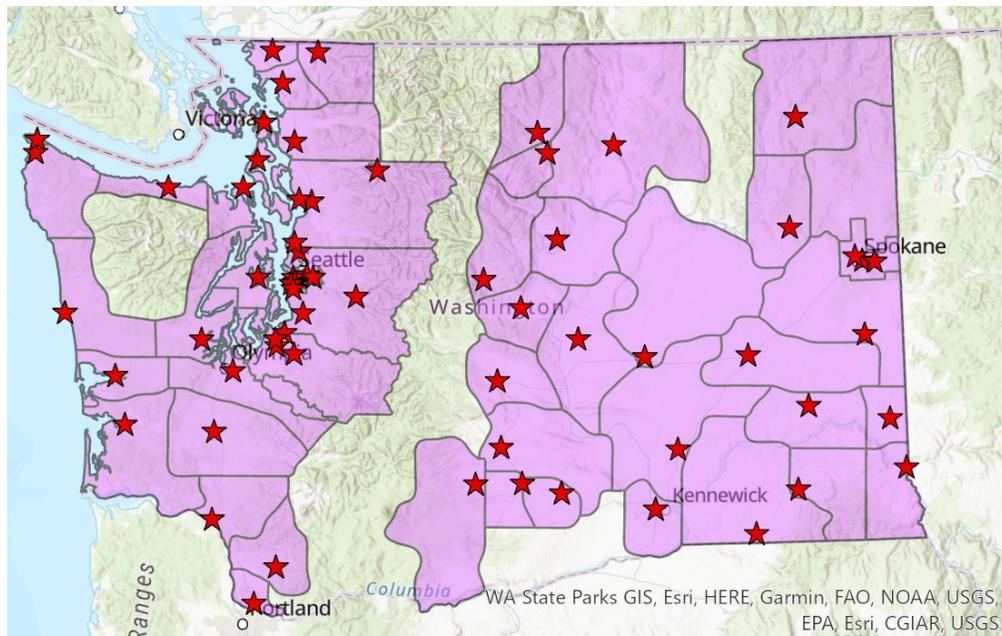
In 2020, WSU launched the 2-day Machine Learning model for PM2.5, which greatly outperformed AIRPACT. Ecology developed a zone-forecast website to share the ML forecasts, with an option for human/AirNow override.

In 2021, Ecology developed a 5-day wildfire smoke forecast using HYSPLIT and global models.

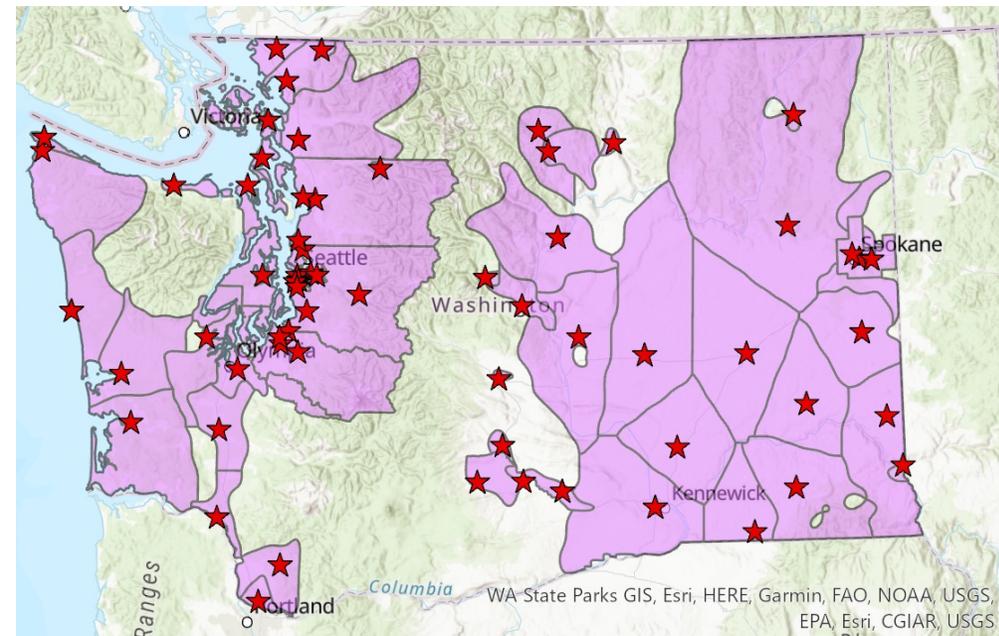
Original Forecast Zone Polygons

Each zone typically experiences similar smoke impacts and can be represented by a single PM_{2.5} monitor. Zone polygons are based on:

- Monitor Locations, Density, Proximity
- AIRPACT 4-km grid cells with similar 98th percentile PM_{2.5} concentrations
- Tribe and County Boundaries
- Burn Ban Zones and Air Quality Management Zones



June thru October (5-day forecast)



November thru May (2-day forecast)

Updated Smoke Forecast Tool

<https://enviwa.ecology.wa.gov/>

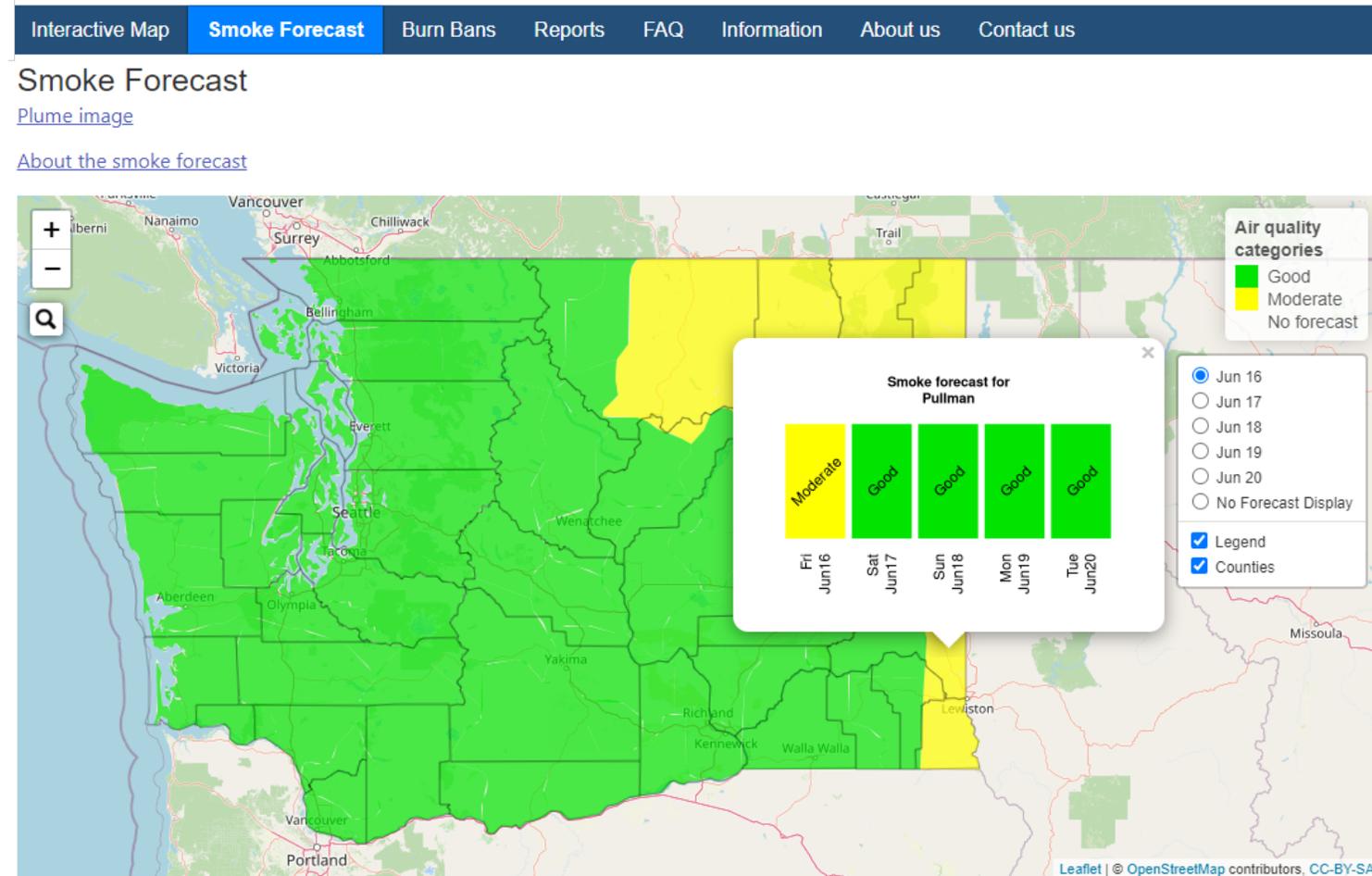
Priority of forecast issued:

1. LCAA's manual forecast submitted to AirNow
2. ECY modelers manually set polygon forecast
3. Automated forecast
 - Days 1-2: WSU Machine Learning model
 - Days 3-5: HYSPLIT Ensemble + background

The Ensemble smoke forecast is based on:

~~• Four global forecast models.~~

- Ecology HYSPLIT forecasts (8 members).
 - Originally based on 4 emissions scenarios and 2 vertical velocity schemes
 - Now based on 8 emissions scenarios with identical meteorology



Model Setup Comparison

| | WSU AIRPACT | WSU ML | ECY HYSPLIT |
|----------------------|-------------------------------------|----------------------|---|
| Days Forecasted | 2 | 2 | 5 |
| Ensemble? | No | No | Yes (8 members) |
| Initial Conditions | Previous day's simulation | N/A | None |
| Boundary Conditions | WACCM (NCAR) | N/A | None |
| Fire Date Inputs | 3-Days Back | N/A | 1-Day Back |
| Fire Locations | BlueSky FIS | N/A | NOAA HMS |
| Fire Emissions/Heat | Assumed Area x FCCS/Consume/FEPS | N/A | Modified FRP |
| Fire Behavior | Persist | N/A | FDR (Can.) and SFP (USA) |
| Chemistry/Deposition | CMAQ | N/A | None |
| Meteorology | 4-km WRF | 4-km WRF | 12-km WRF |
| Forecast Coverage | WA, OR, ID, MT*, CA*, NV* | Monitor Locations | WA, OR, ID, MT, CA, NV, UT, WY, CO, BC*, AB* |

* Partial Coverage Only

HYSPLIT Processing Steps

1. Download NOAA HMS file for “yesterday” fire locations (remove duplicates)
2. Assign 194 acres to each location and merge clusters (sum acres; max FRP)
3. Apply FRP modification formula for emissions; keep original FRP for heat
4. Use hourly emissions basis (66.1 Kg PM_{2.5} / MW) based on Wooster et al, (2005)
5. Apply fire potential (USA) and fire danger (Canada) and vegetation factors
6. Apply hourly diurnal profiles for heat and emissions
7. Create HYSPLIT input files (hourly emissions with heat and area for plume rise)
8. Run all 8 HYSPLIT scenarios for 5 days
9. Report the average PM_{2.5} within each zone on the forecast map
 - Previously we would use a correction term from the ML – now discontinued
 - We now add in a background value (5 ug/m³) since HYSPLIT is wildfire smoke only

HYSPLIT Hourly Emissions Basis

Converting Fire Radiative Power to Emissions

Wooster et al., 2005

$$0.37 \text{ MJ/kg} = 335 \text{ MJ/ton}$$



$$1 \text{ ton} / 335 \text{ MJ} = 0.003 \text{ tons/MJ}$$



Hourly PM_{2.5} (grams) =

$$\begin{array}{c}
 \text{HMS} \qquad \qquad \text{Wooster, Li, Mavko} \qquad \text{units conversion} \qquad \text{AP-42 emission factor (flaming)} \qquad \text{units conversion} \\
 \hline
 \text{FRP (MW)} \times 0.003 \text{ (tons cons./MJ)} \times 3600 \text{ (sec/hr)} \times 13.5 \text{ (lbs PM}_{2.5} \text{ / tons cons.)} \times 453.6 \text{ (g/lb)}
 \end{array}$$



FRP Emissions Rate (g. PM_{2.5}/hr) =

$$0.003 \text{ (ton veg./MJ)} * 3600 \text{ (sec/hr)} * 6123.6 \text{ (g. PM}_{2.5}\text{/ton veg.)}$$

66,134 g PM_{2.5} / HMS FRP MW

HYSPLIT Notes

- Runs at 2 am and ready for the web before 5:45 am
- UW WRF 12-km 5-day forecast meteorology
 - *Changed from 3-hr avg to 1-hr avg in 2023*
- Gaussian horizontal puff and vertical particle distribution
- Maximum age of particle is 36 hours
- No wet or dry deposition is assumed.
- Does not include initial or boundary conditions
- Scalar factors used for fire behavior (daily value) and vegetation (1993 global dataset - static)

Novel Scalar Factors

| | |
|--|---|
| USA Significant Fire Potential (NIFC) | Moist = 0.25 Dry = 1.00 Lightning = 1.00 Very Dry = 1.25 Hot = 1.25 Burn Env. = 1.25 Windy = 1.25 Hot & Dry = 1.50 |
| Canada Fire Danger Rating | Low = 0.25 Moderate = 0.50 High = 0.75 Very High = 1.00 Extreme = 1.25 |
| Vegetation | Barren = 0.01 Scrub = 0.40 Forest = 1.00 Crops = 0.20 |

HYSPLIT Analysis Page

1. Select forecast issue date

2022-09-12

2. Select smoke level:

0-200m

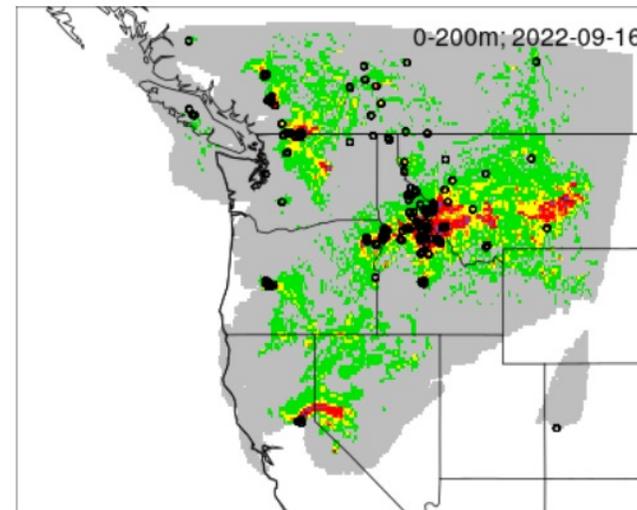
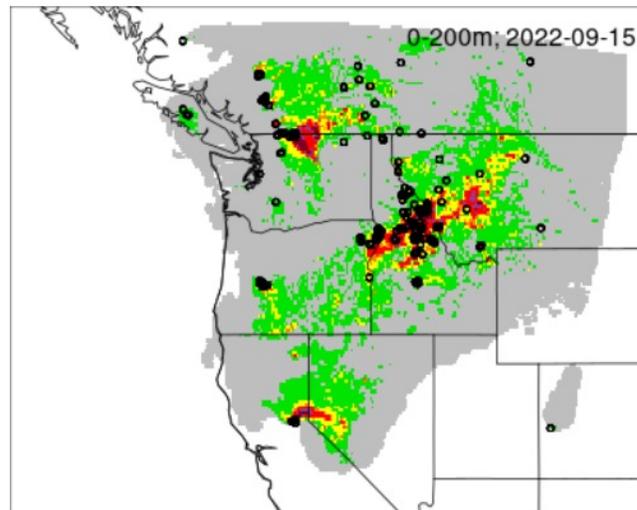
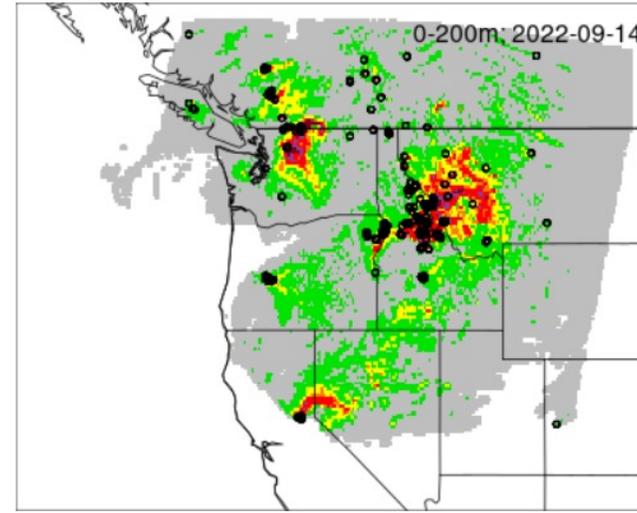
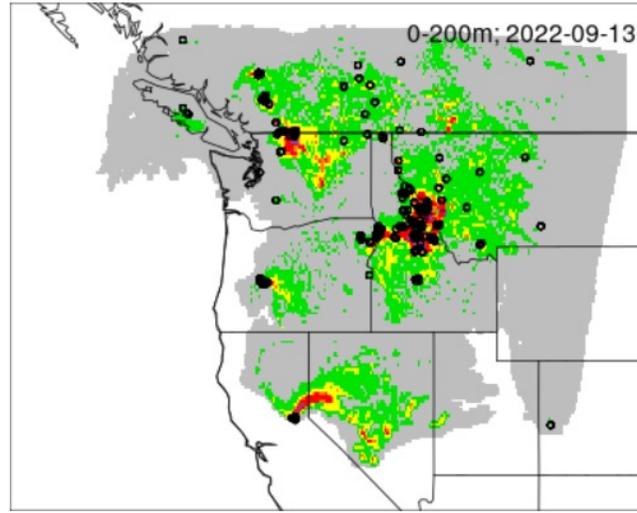
3. Select model config:

MOV6S2

4. Click for map of days 2-5

Map legend

- Good
- Moderate
- USG
- Unhealthy
- Very Unhealthy
- Hazardous
- <1 $\mu\text{g}/\text{m}^3$
- Fires



HYSPLIT Analysis Page

Ensemble members in the last 10 days

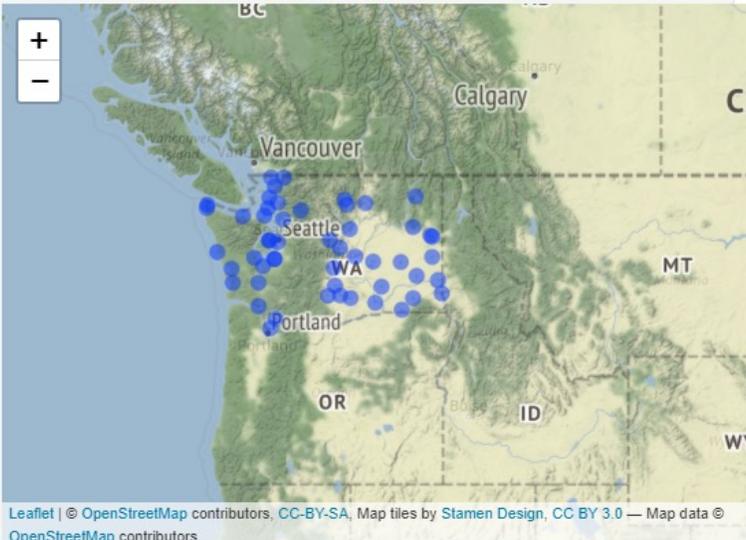
Vertical distribution of smoke

Day 2-5 maps at different heights

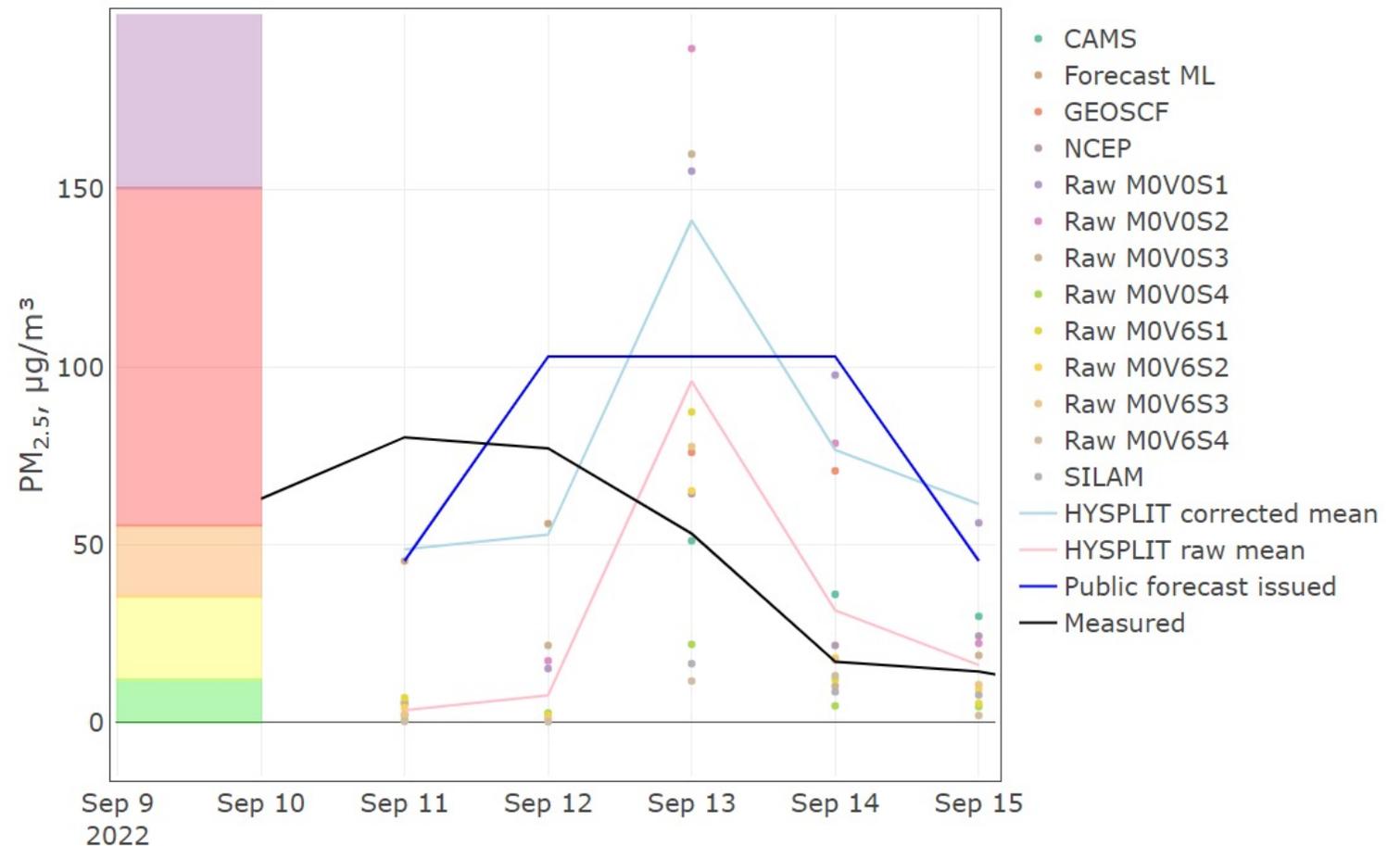
1. Select forecast issue date

2022-09-11

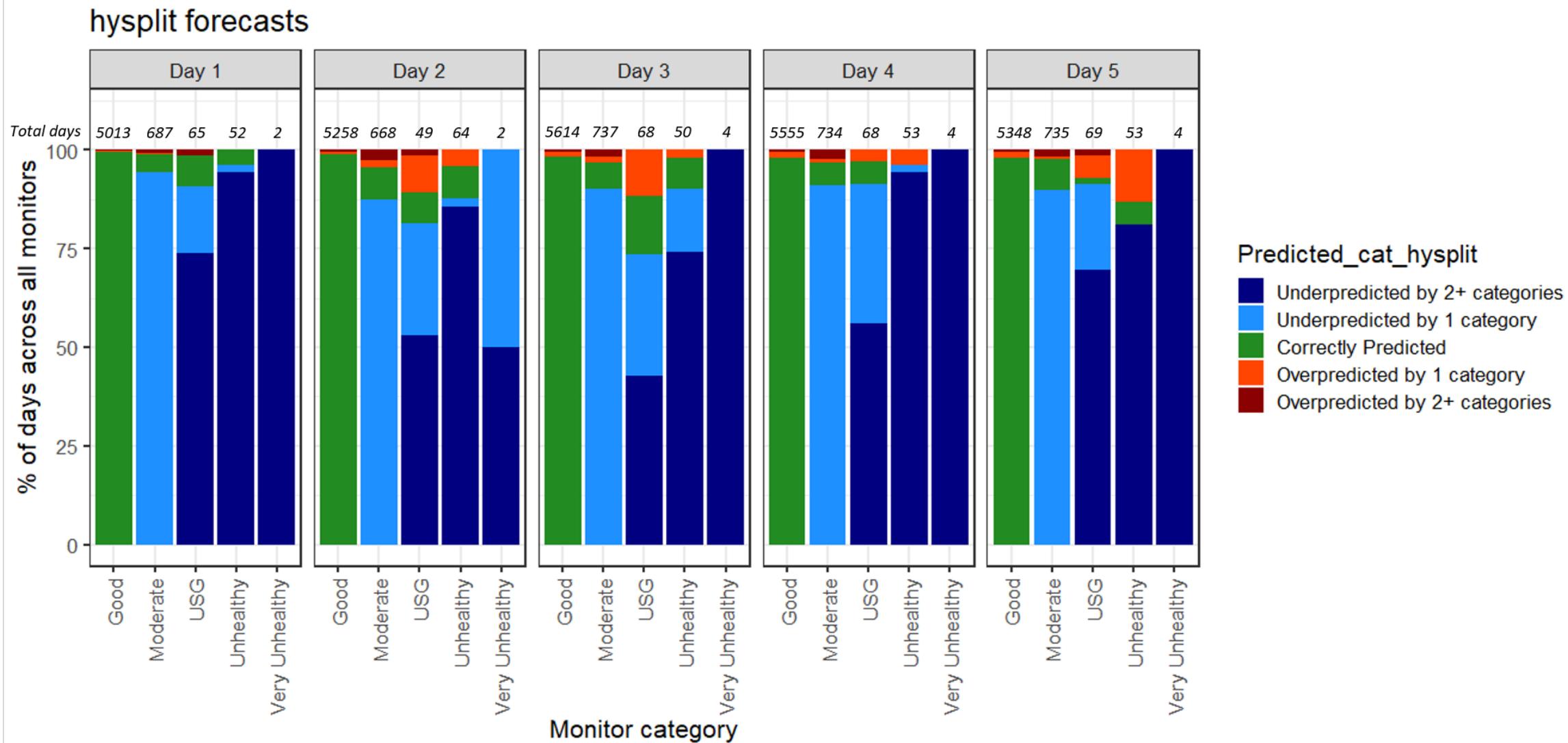
2. Click on monitor for interactive time series



All forecasts on 2022-09-11 for Lacrosse



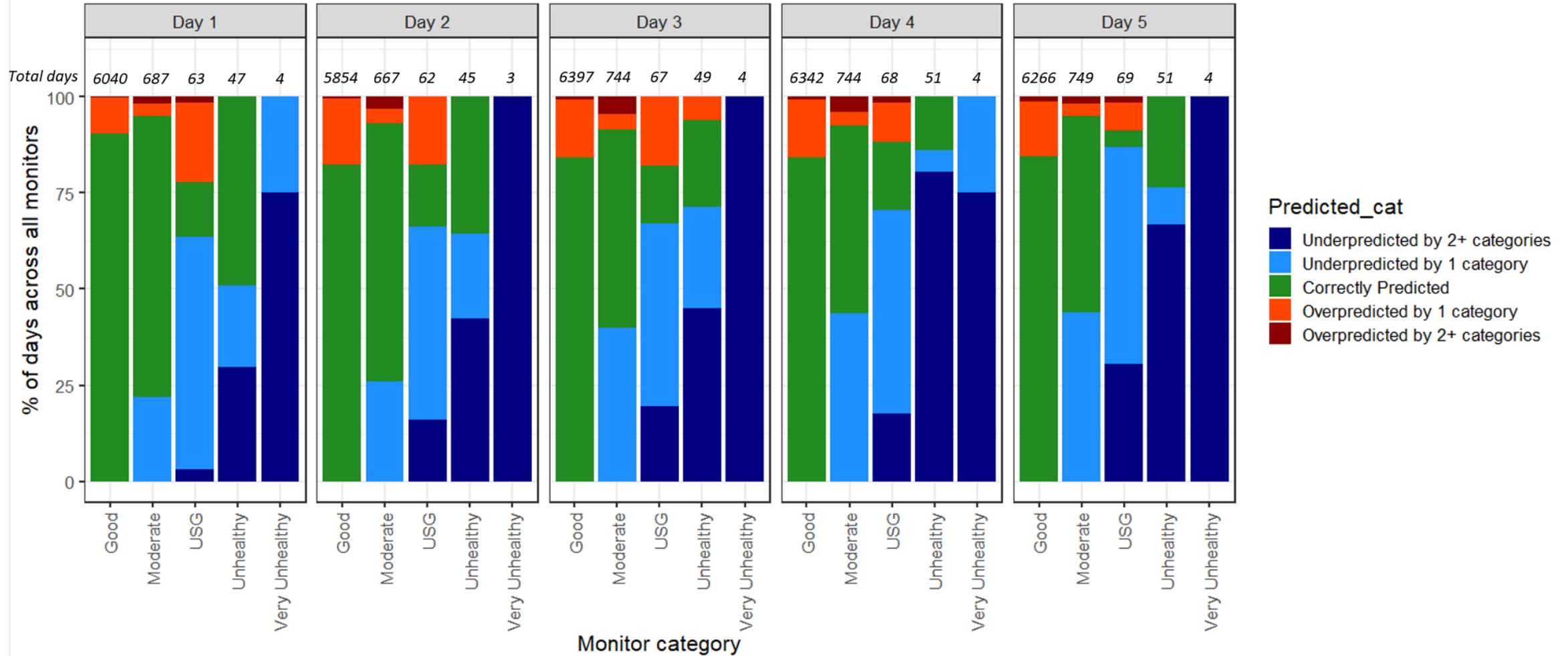
HYSPLIT Forecast Performance (2022)



*24-hr PM2.5 At Monitor Locations

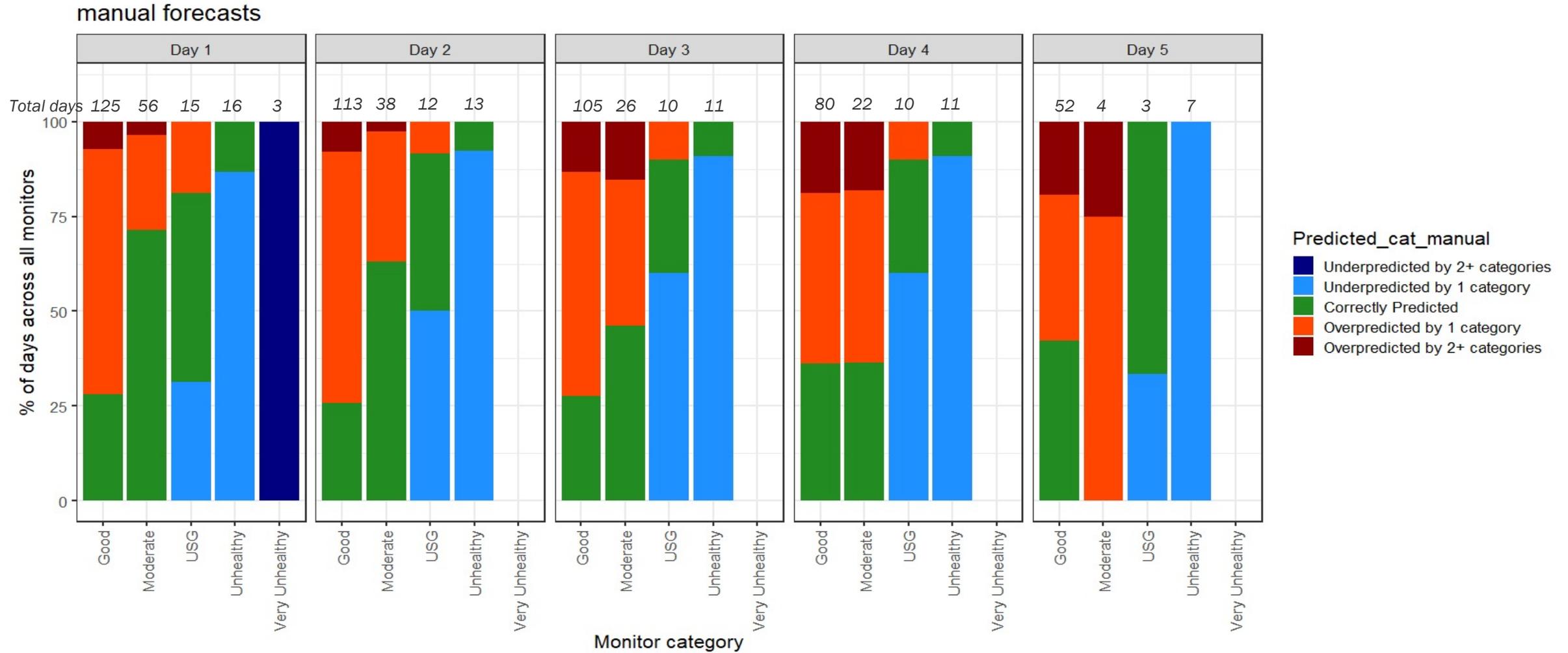
Ensemble Forecast Performance (2022)

ML (days 1+2), Ensemble+bias (days 3-5) Note: 2022 Ensemble included 4 global models + 8 HYSPLIT members



*24-hr PM2.5 At Monitor Locations

Manual Forecast Performance (2022)



*24-hr PM2.5 At Monitor Locations

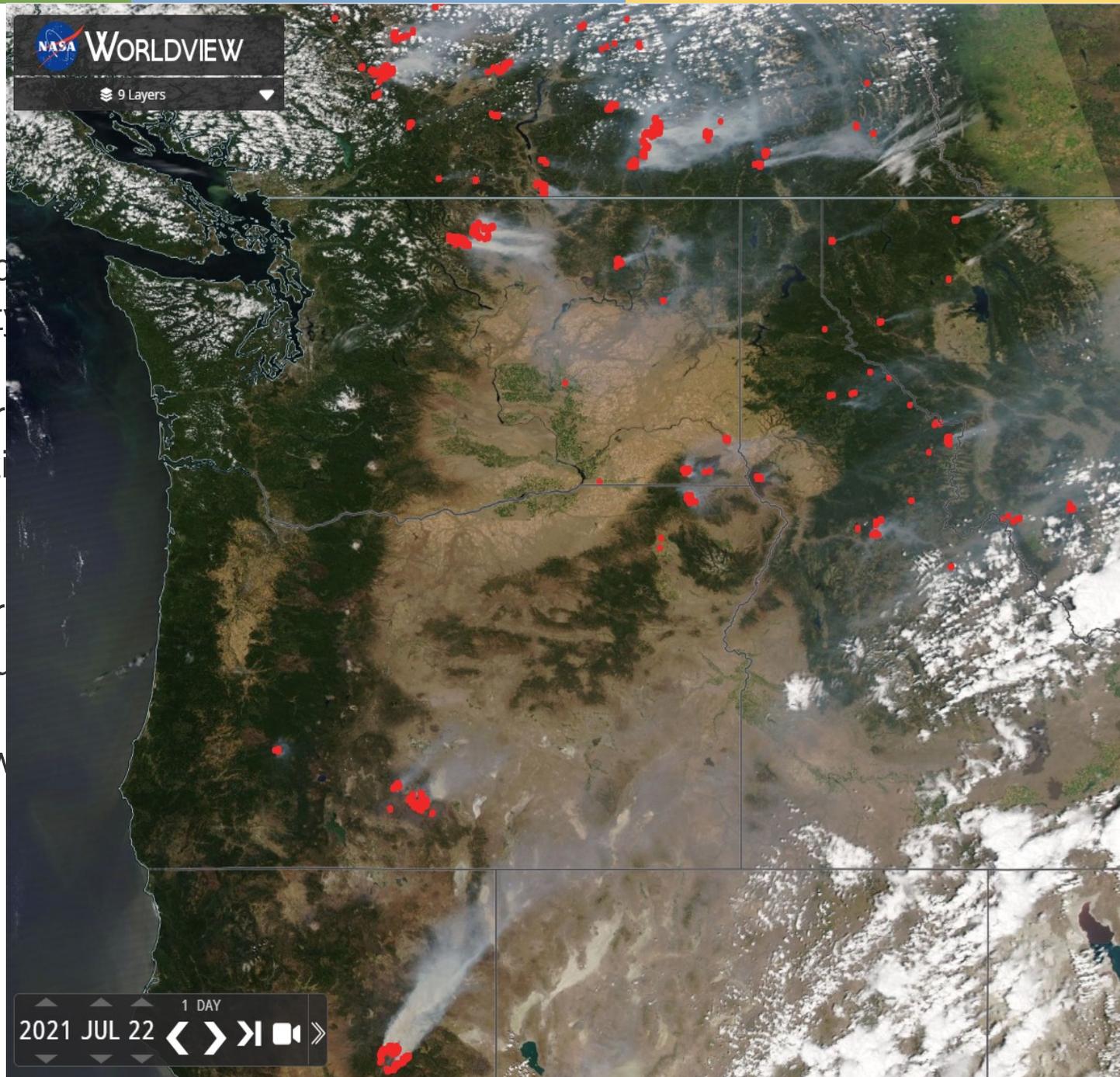
Sensitivity Analysis

Original HYSPLIT members were 4 emissions sources and 2 meteorological scenarios (vertical velocity)

Prior tests showed the FRP to emissions conversion in low to mid-range FRP conditions, but overestimated FRP is large. So, FRP was constrained from 0.3

The linear rate with a 100 MW cap was compared to log functions as part of sensitivity analysis simulation

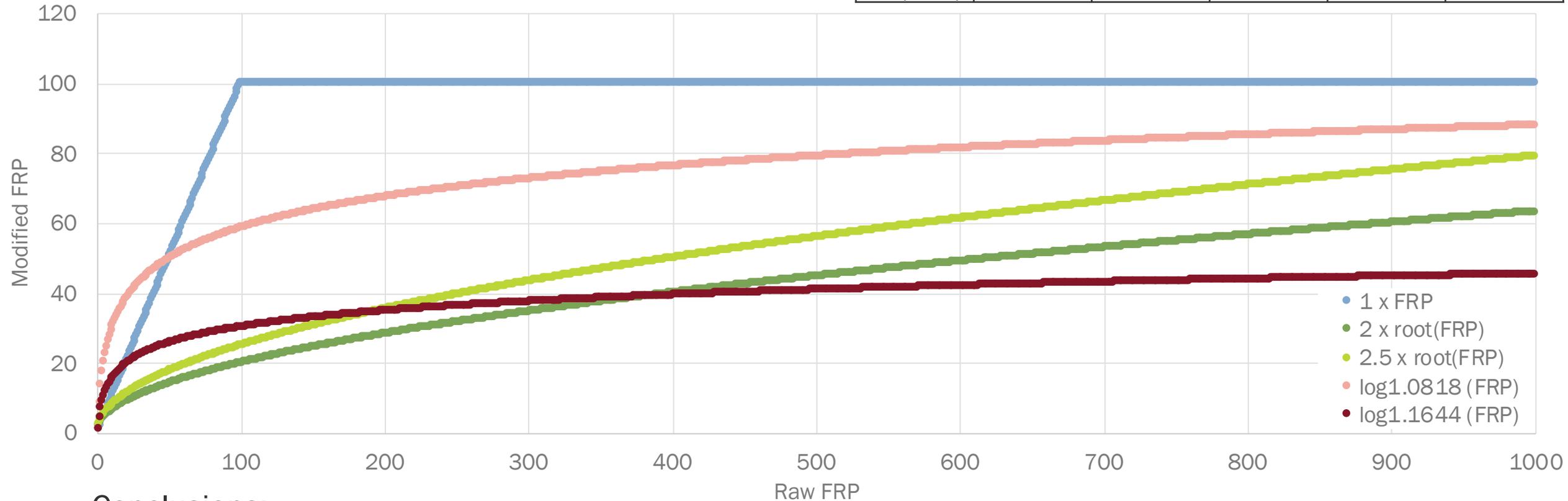
July 17 - July 24 and Aug. 27 - Sept. 7 (2021) with



Sensitivity Analysis

Typical FRP Distribution

| FRP (MW) | 0 to 1 | 1 to 10 | 10 to 100 | 100 to 1000 | 1000+ |
|-----------|--------|---------|-----------|-------------|-------|
| Frequency | 20% | 50% | 20% | 10% | 1% |



Conclusions:

- Linear with cap and root functions performed best
- Root function coefficients sometimes too low
- Log functions too high when FRP is low
- WRF-based vertical velocity always performed better

HYSPLIT – New Scenario Details

Fire Location Treatment

| | S1 | S2 | S3 | S4 | S5 | S6 | S7 | S8 |
|--------------------------|-------------------------|------------------------------|--------------------------------|--------------------------------|--------------------------------|--------------------------------|-------------------------|--------------------------------|
| First Hour Kept from HMS | Noon (-1 Day) | Noon (-1 Day) | Noon (-1 Day) | Noon (-1 Day) | Noon (-1 Day) | Noon (-1 Day) | Midnight (-3 Days) | Midnight (-3 Days) |
| Duplicate Dist. | 10m | 10m | 10m | 10m | 10m | 10m | 50m | 50m |
| FRP Modification Formula | FRP max = 100 min = 0.3 | 1.25 FRP max = 100 min = 0.3 | 2 sqrt FRP max = N/A min = 0.3 | 2 sqrt FRP max = N/A min = 0.3 | 4 sqrt FRP max = N/A min = 0.3 | 4 sqrt FRP max = N/A min = 0.3 | FRP max = 100 min = 0.3 | 3 sqrt FRP max = N/A min = 0.3 |
| Diurnal Profile | Legacy | Legacy | Legacy | WRF-CHEM | BlueSky | WRF-CHEM | BlueSky | Legacy |

Diurnal Profile Hourly Factors

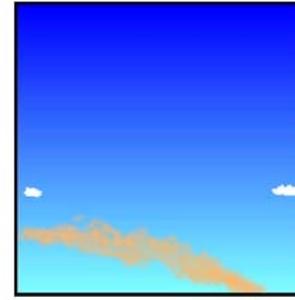
| Hour (PST) | 0 | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 | 13 | 14 | 15 | 16 | 17 | 18 | 19 | 20 | 21 | 22 | 23 |
|------------------|------|------|------|------|------|------|------|------|------|------|------|------|------|------|-------|-------|-------|-------|------|------|------|------|------|------|
| Emis. (Legacy) | 0.1 | 0.1 | 0.1 | 0.1 | 0.1 | 0.1 | 0.1 | 0.3 | 0.6 | 1 | 1.5 | 1.9 | 2.3 | 2.4 | 1.7 | 1 | 0.6 | 0.1 | 0.1 | 0.1 | 0.1 | 0.1 | 0.1 | 0.1 |
| Heat (Legacy) | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0.5 | 1 | 1 | 10 | 20 | 20 | 20 | 10 | 1 | 0.5 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| Emis. (BlueSky) | 0.14 | 0.14 | 0.14 | 0.14 | 0.14 | 0.14 | 0.14 | 0.14 | 0.14 | 0.14 | 0.28 | 0.55 | 0.97 | 1.39 | 1.80 | 2.22 | 2.36 | 1.66 | 0.97 | 0.55 | 0.14 | 0.14 | 0.14 | 0.14 |
| Heat (BlueSky) | 0.29 | 0.29 | 0.29 | 0.29 | 0.29 | 0.29 | 0.29 | 0.29 | 0.29 | 0.29 | 0.65 | 2.04 | 5.52 | 8.95 | 12.21 | 15.43 | 16.47 | 11.13 | 5.52 | 2.04 | 0.29 | 0.29 | 0.29 | 0.29 |
| Emis. (WRF-CHEM) | 0.2 | 0.2 | 0.2 | 0.2 | 0.2 | 0.2 | 0.2 | 0.3 | 0.4 | 0.6 | 0.8 | 1 | 1.2 | 1.5 | 1.7 | 1.5 | 1.2 | 1 | 0.8 | 0.5 | 0.2 | 0.2 | 0.2 | 0.2 |
| Heat (WRF-CHEM) | 0.66 | 0.66 | 0.66 | 0.66 | 0.66 | 0.66 | 0.66 | 0.75 | 0.83 | 1.41 | 2.91 | 5.65 | 8.81 | 12.3 | 13.46 | 12.13 | 8.81 | 5.65 | 2.74 | 1.25 | 0.66 | 0.66 | 0.66 | 0.66 |

• Past Issues with Forecast Methods

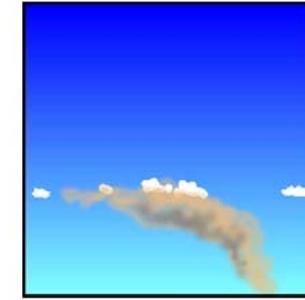
▪ *and current status*

- Adjusting HYSPLIT based on ML – HYSPLIT difference (“bias correction” not based on obs.)
 - *Removed “correction” but added static background*
- Still stuck on the original monitors used, monitors added in past few years have no ML forecast
 - *Still an issue, need WSU ML forecast updated to include current monitors (may move in-house)*
- If ML fails for Days 1-2 (e.g. no monitoring data), no forecast is shown
 - *HYSPLIT is now used for Days 1-2 if ML is unavailable*
- Gaps in polygons where there is no representative monitor
 - *New polygons rely on nearest polygon for ML, all gaps are now filled*
- Original forecast source (e.g. LCAA, ML, Ensemble, or manual override) is unknown
 - *Internal page for manually assigning forecast now shows source of zonal forecast*
- Only one value per day per polygon (no spatial or temporal details)
 - *Still doing this but created plume animation.*
- Only used HYSPLIT forecast at monitor locations
 - *Now averaging all values within the polygon*

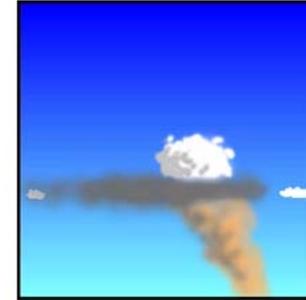
Final Thoughts



Low wispy plume.



Raised columnar plume.



Pyro-Cu plume.

- Zonal forecasts provide a simple and effective way to communicate with the public, and are available on both the smoke blog and on Ecology's dot map
- Manual forecast overrides continue to be an essential part of the system, for which we greatly rely on the Canadian FireWork forecast.
- Boundary conditions should be implemented next year (or maybe Cliff can expand the 12 km domain to include more of Canada?)
- New HYSPLIT emissions scenarios will provide a better forecast ensemble
 - More refinements to the system will be made through the summer
- Vegetation and fire behavior factors remain as novel values, which could benefit from scrutiny