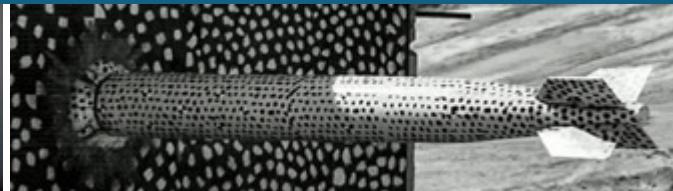
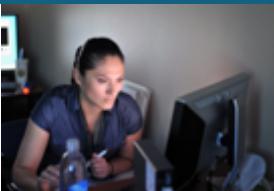




Sandia
National
Laboratories

Near-real-time Live and Dead Fuels Characterization: A Case Study for Infrastructure Resiliency to Wildfire in Southern California



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*Team: Daniel Krofcheck PhD, Forest
Danford, Robert Garrett, Iyare Oseghae,
Brian Pierre, Phillip Kay*



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Wildfire Threat to Critical Infrastructure



- Wildfires are a growing problem in the western US with the 2018 fire season causing \$150 billion in losses and 106 lives lost. Last year, CA experienced it's 2nd largest fire in history.
- Wildfire pose a national security threat by physically threatening critical infrastructure, and by *intentional threat to the electrical grid by exploiting natural fire spread patterns.*

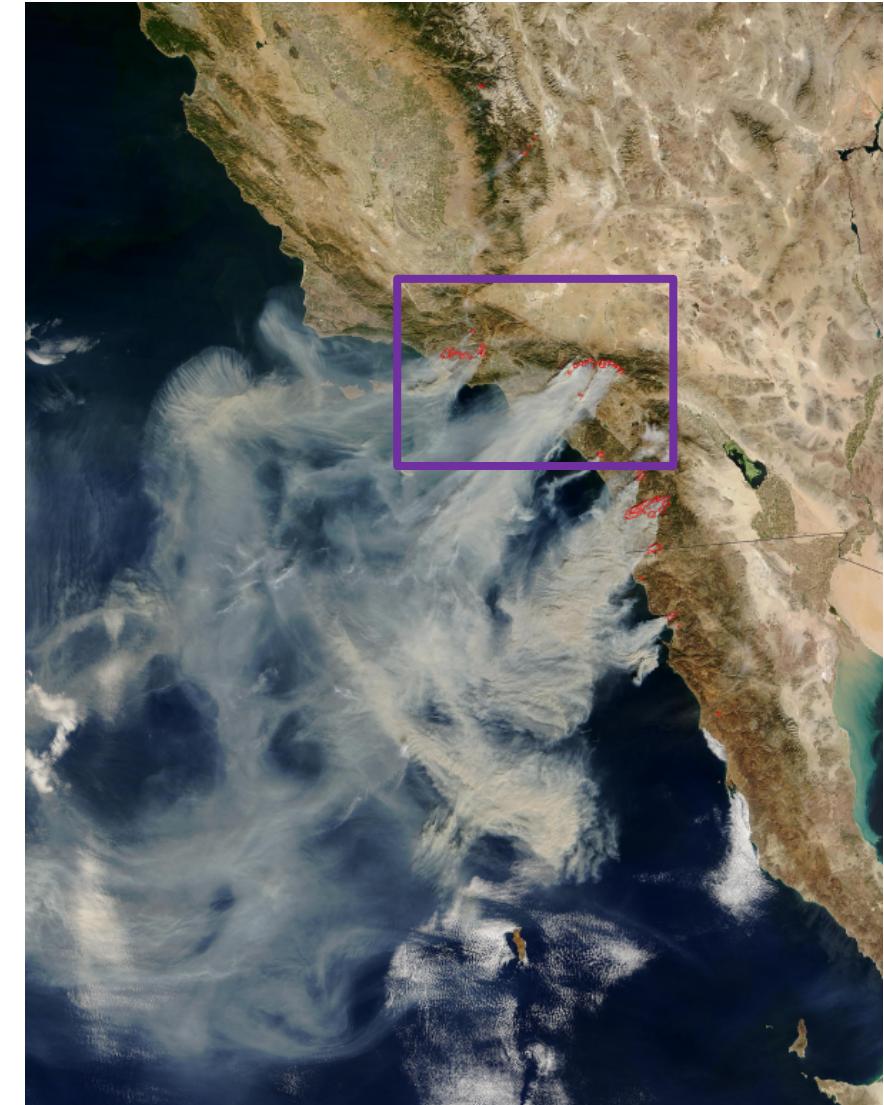


AP

Project Goals



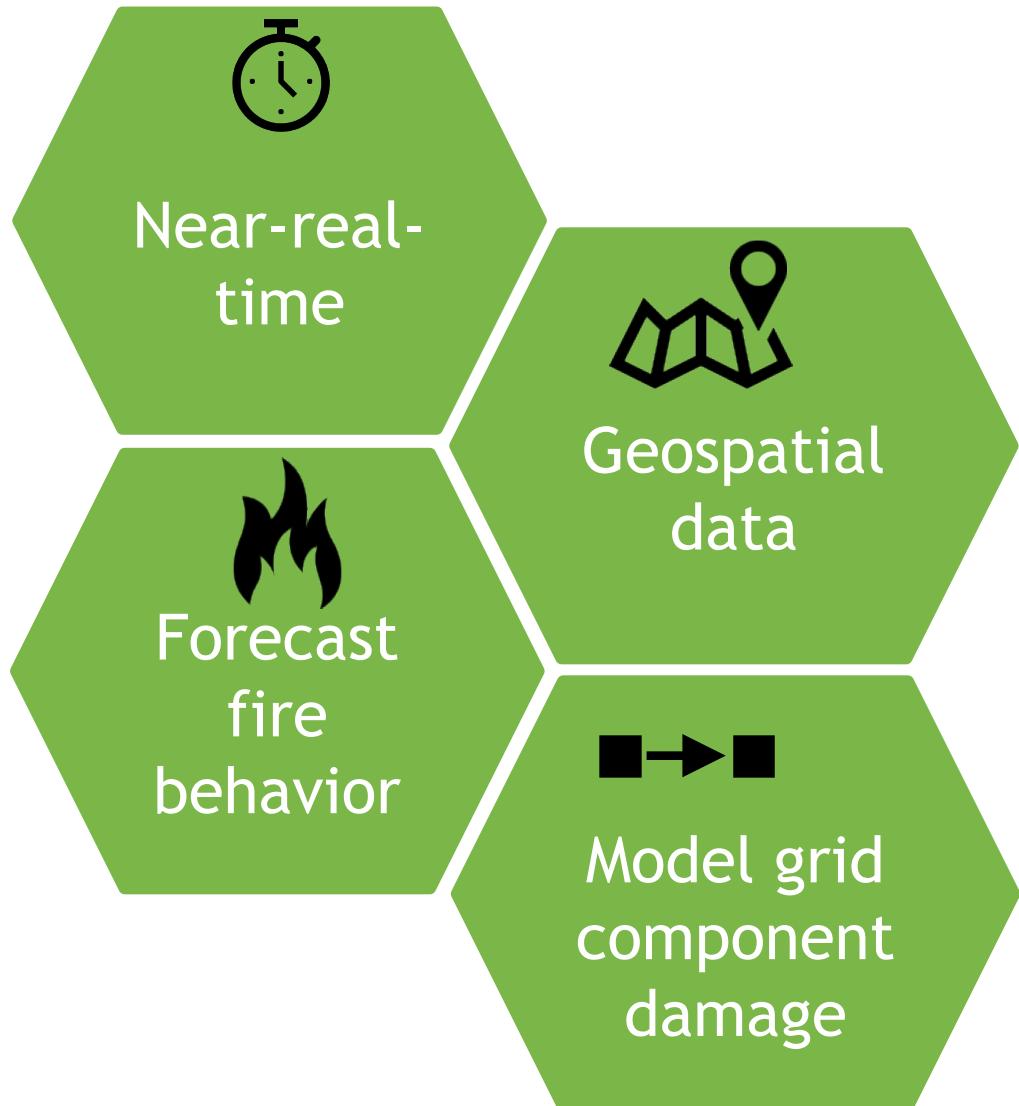
- Identify parts of the grid ***most vulnerable*** to intentional attack that uses fire as a vector
- ***Help utilities plan for, and mitigate a disaster*** from fire and identify grid response strategies
 - **Thrust 1:**
 - Capability to identify fuels conditions at a national scale in near-real-time
 - **Thrust 2:**
 - Quantifying uncertainty of impacts to electrical grid as a result of wildfire



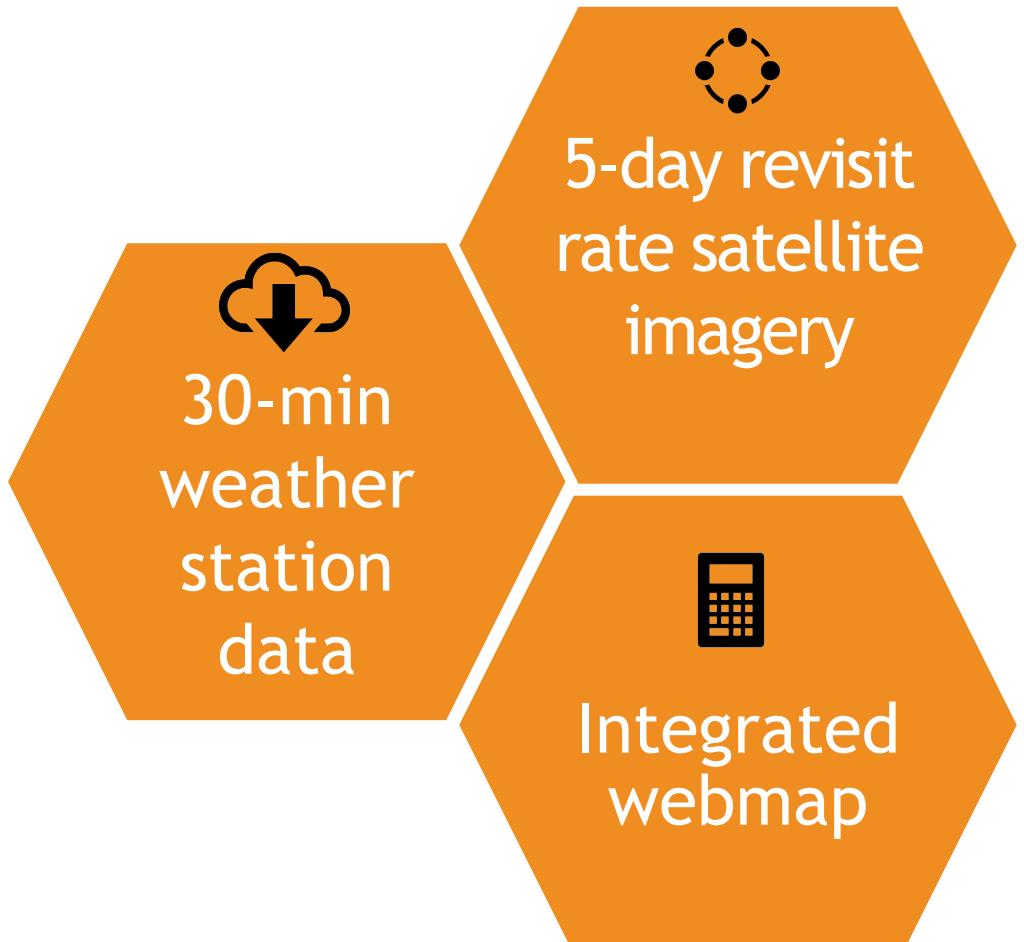
Situational Awareness and Planning Tool



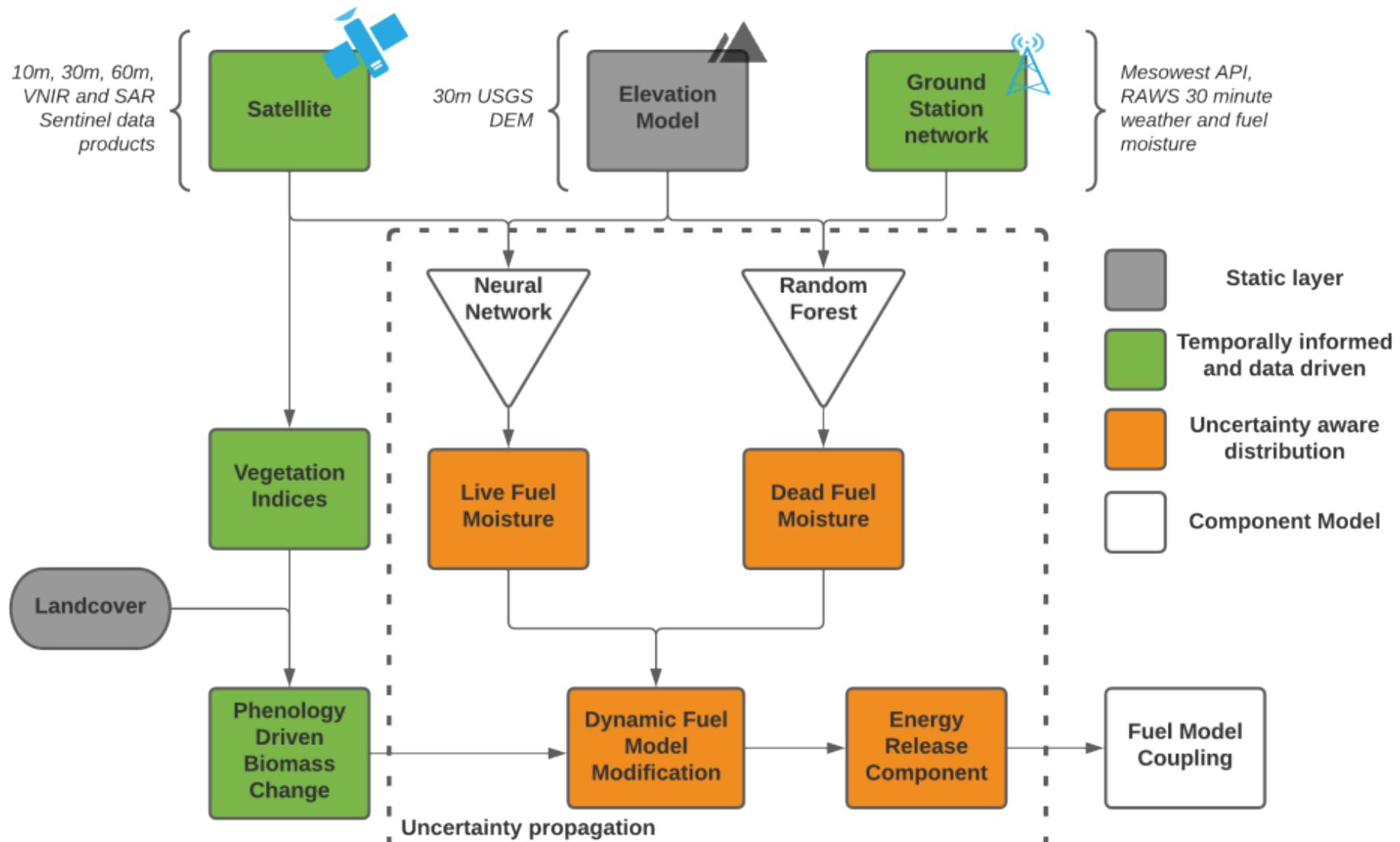
Requirements:



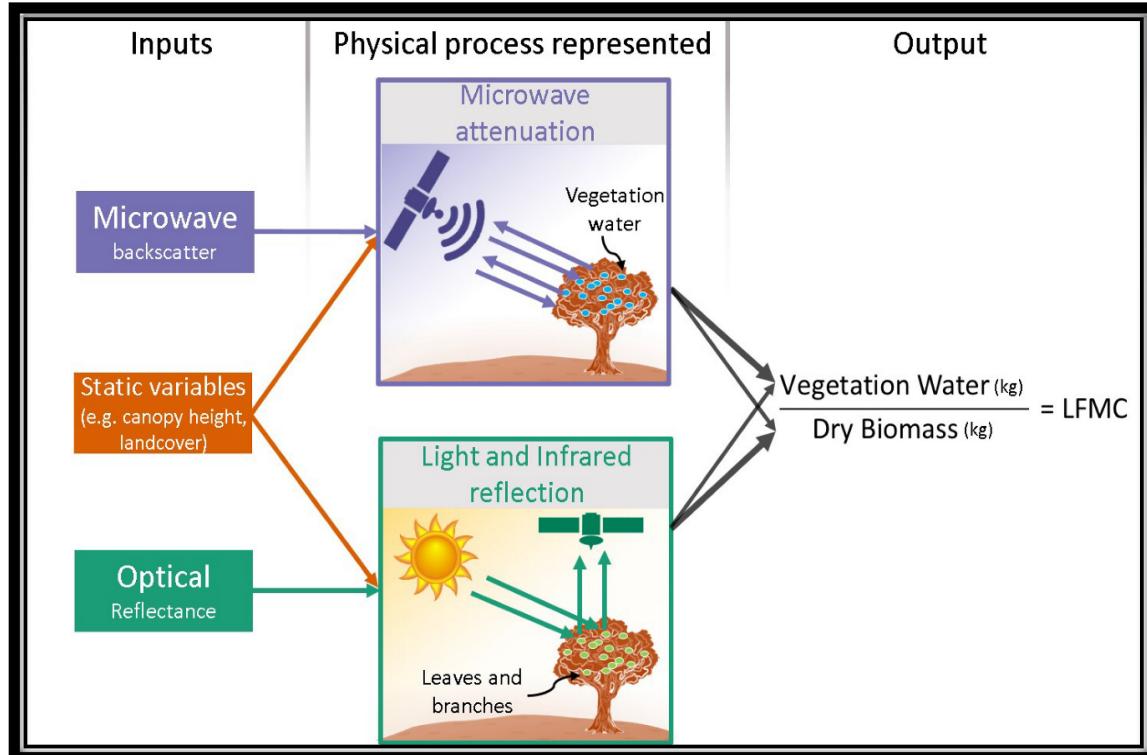
Approach:



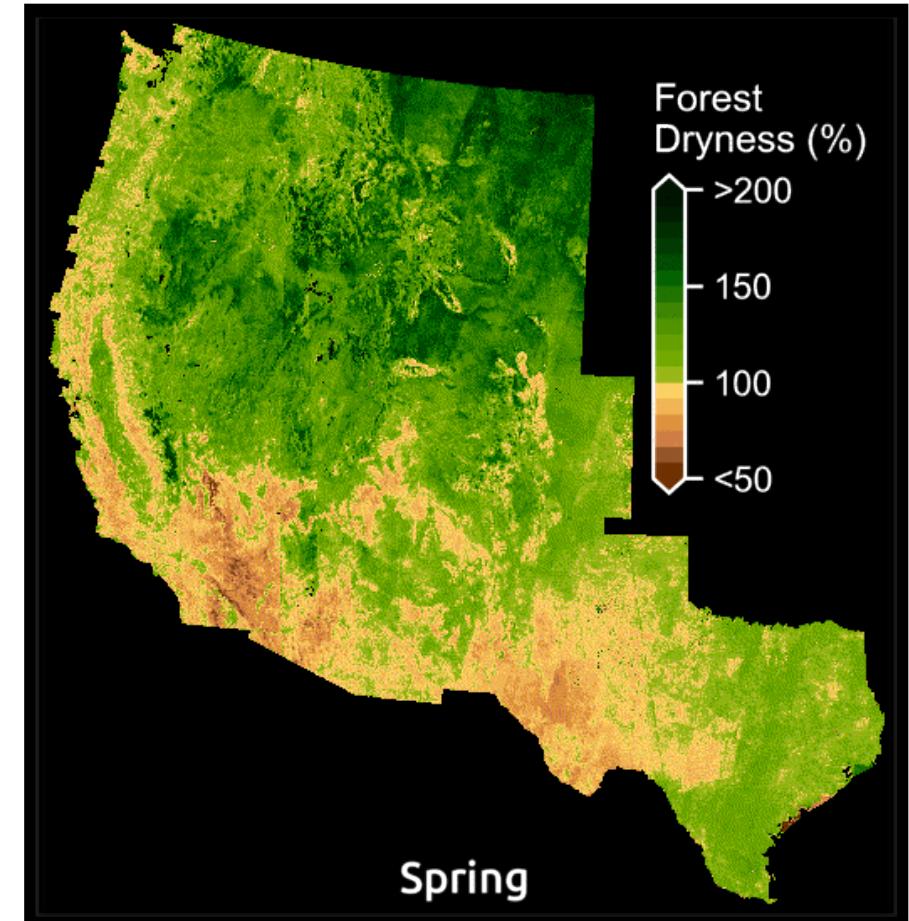
Algorithm for near-real-time fuels condition



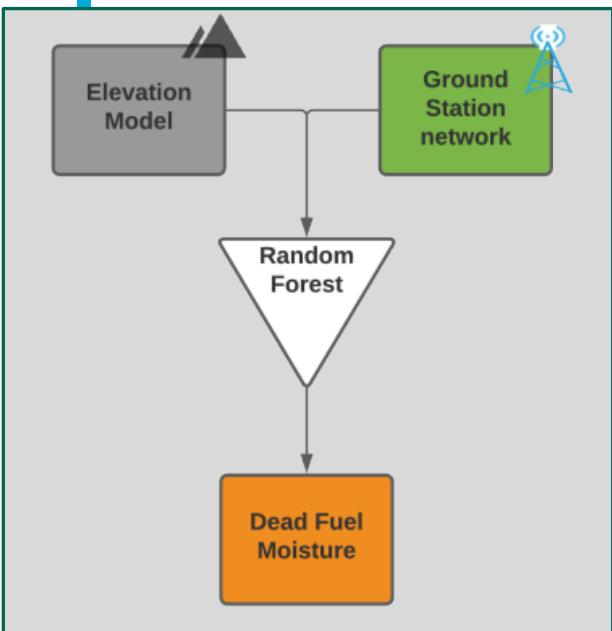
Calculating Live Fuel Moisture



Rao, Krishna; Williams, A. Park; Flefil, Jacqueline Fortin; Konings, Alexandra G. 2020. SAR-enhanced mapping of live fuel moisture content. *Remote Sensing of Environment* 245:111797.

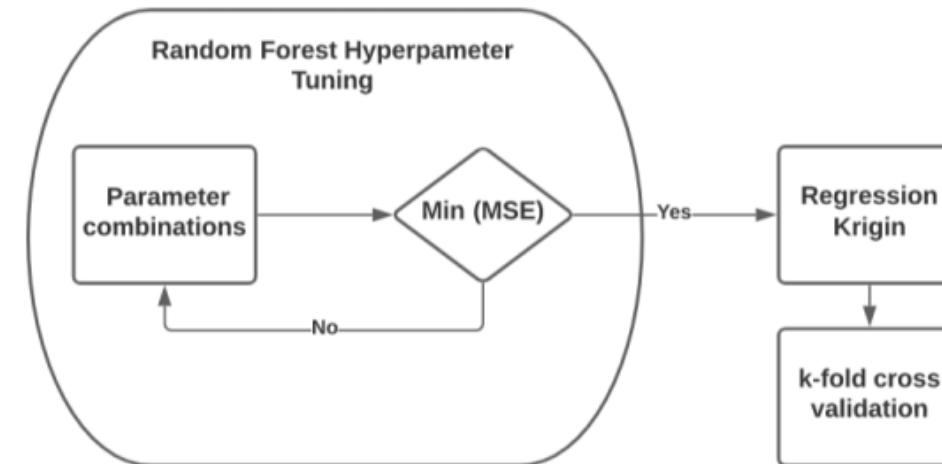


Calculating Dead Fuel Moisture

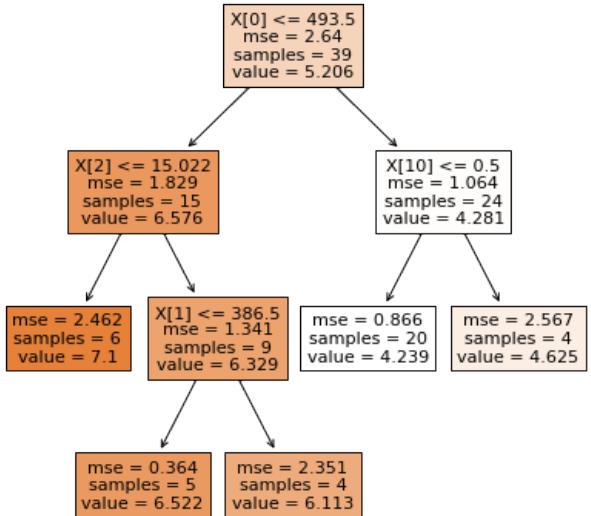
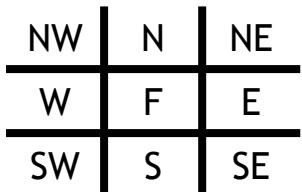


Topographic Covariates

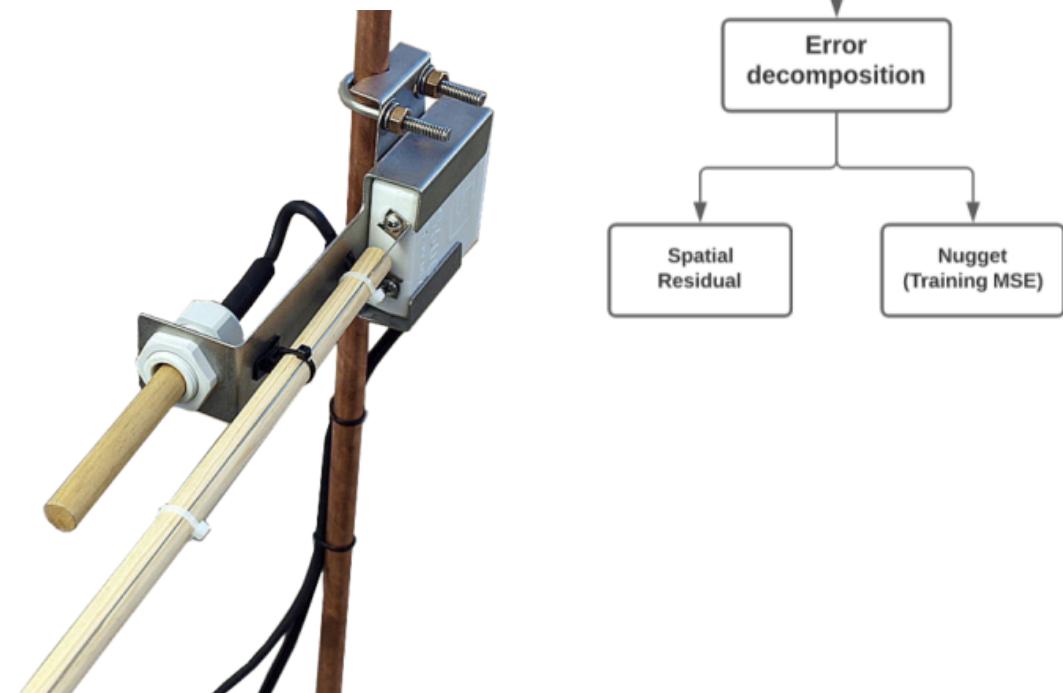
Latitude
 Longitude
 Elevation (m)
 Slope (deg)
 Hillshade (deg)
 Aspect (factor)

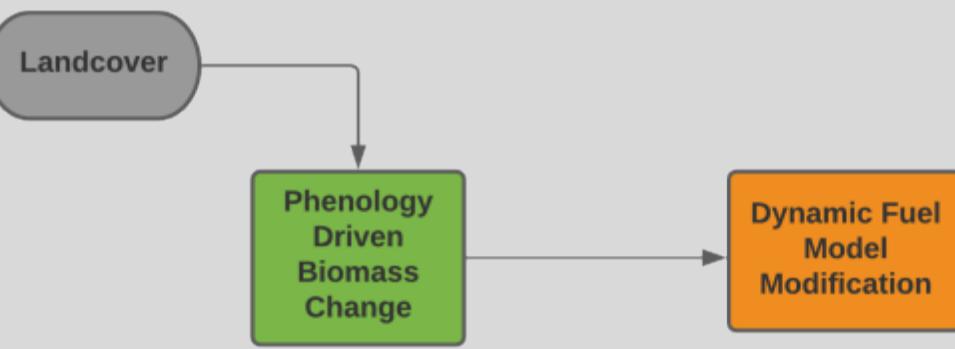


Aspect Bins

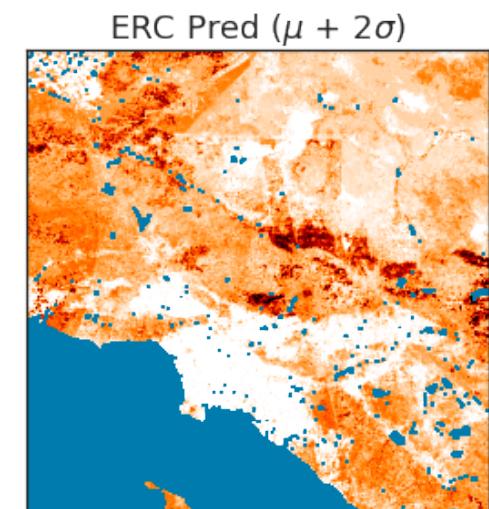
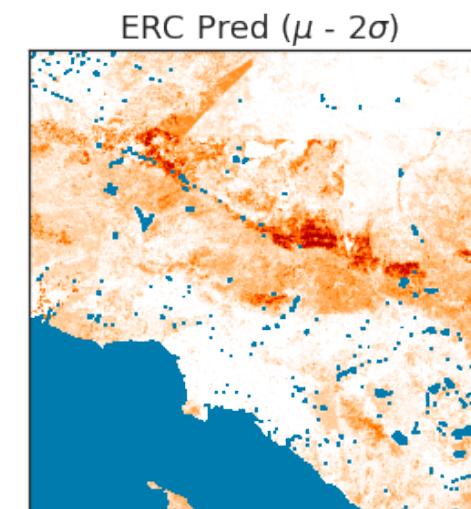
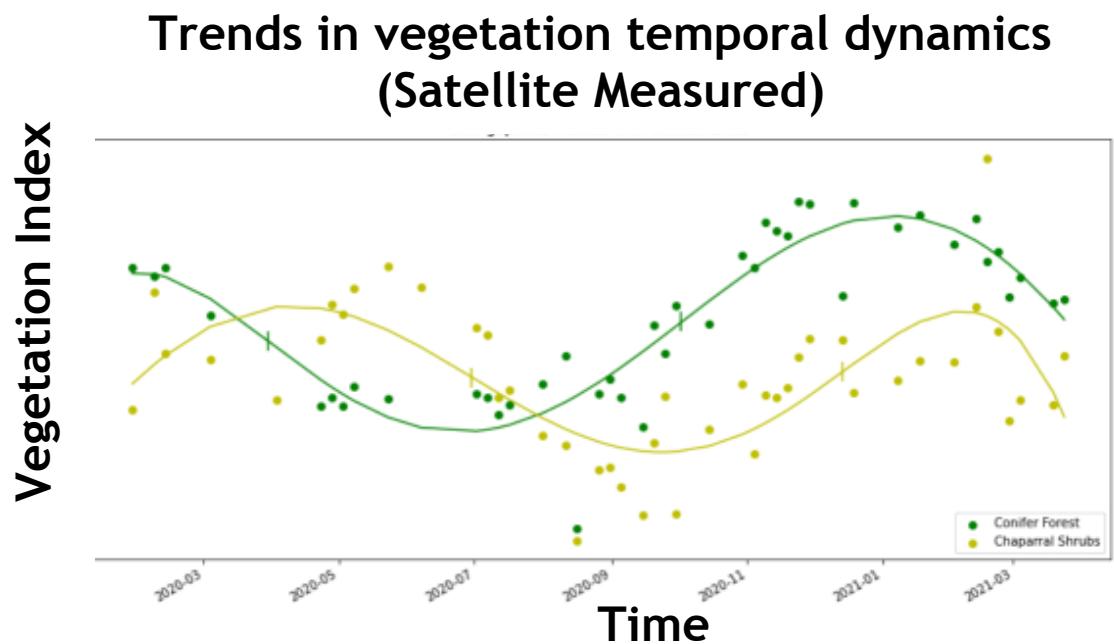


Hillshade

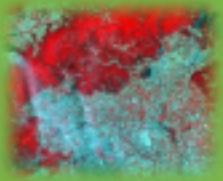




Plant lifestages represent a critical and dynamic part of fuel for fires



9
Sentinel-2
Multi-spectral Imagery



Sentinel-1 SAR
Backscatter



RAWS Weather Station
Data



Forest Inventory Plot Data



Spatial Statistics and Random Forest Regression Trees

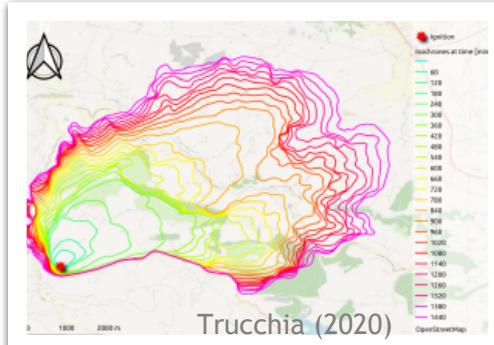
Dynamic Fuel
Model

Active Fire Perimeter



+
Current
Weather
Data

Model fire arrival time contours
with fire behavior software
(FlamMap, eventually QUICFire)



NASA
FIIRMS

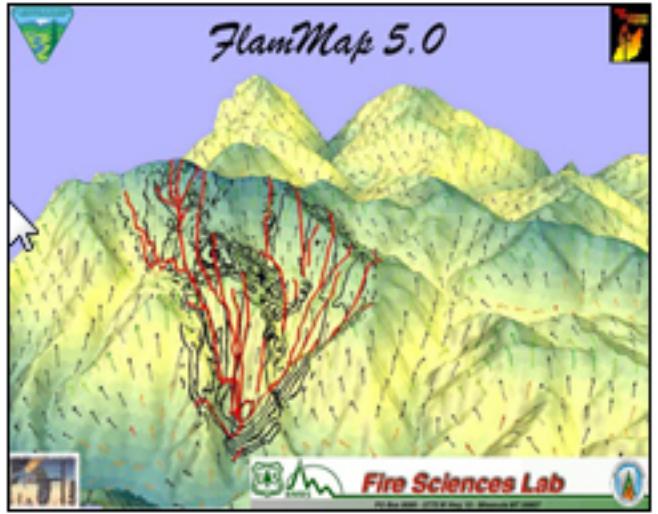
GIS data of
infrastructure



Wildfire Resilience and Mitigation Strategies

- Cost/benefit of different vegetation management strategies
- Assess fire threat to area of future grid expansion and propose alternative locations.
- Cost of maintenance/hardening of grid at key failure points.
- Monte Carlo simulation of wildfire spread, modelling components that would be turned off in pre-emptive blackouts
- Model the damage if those components stay on

Example of wildfire simulation



Raster Layers required to run fire spread simulation

Band #	Band Name	Units - GeoTIFF
1	Elevation	meters
2	Slope	degrees
3	Aspect	degrees
4	Fuel Model	categorical
5	Canopy Cover	%
6	Stand Height	meters * 10
7	Canopy Base Height	meters * 10
8	Canopy Bulk Density	kg/m ³ * 100

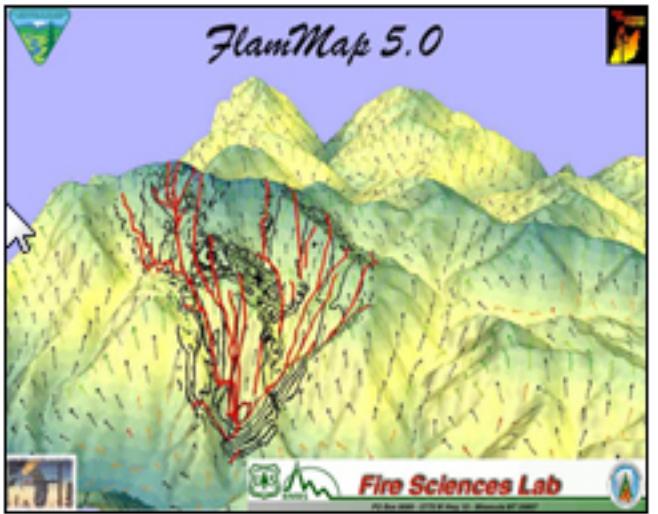


Parameters to run simulations:

- Live Fuel moisture by fuel class (1hr/1000hr)
- Dead Fuel moisture by fuel class (1hr/1000hr)
- Weather
 - Relative Humidity
 - Wind Speed
 - Wind Direction
 - Temperature



Example of wildfire simulation



Updated Data from Sentinel Imagery and Weather Stations to *Characterize Fuel Conditions in Near-real-time*:

Live and Dead Fuel Moisture
Canopy Cover
Canopy Base Height
Canopy Bulk Density

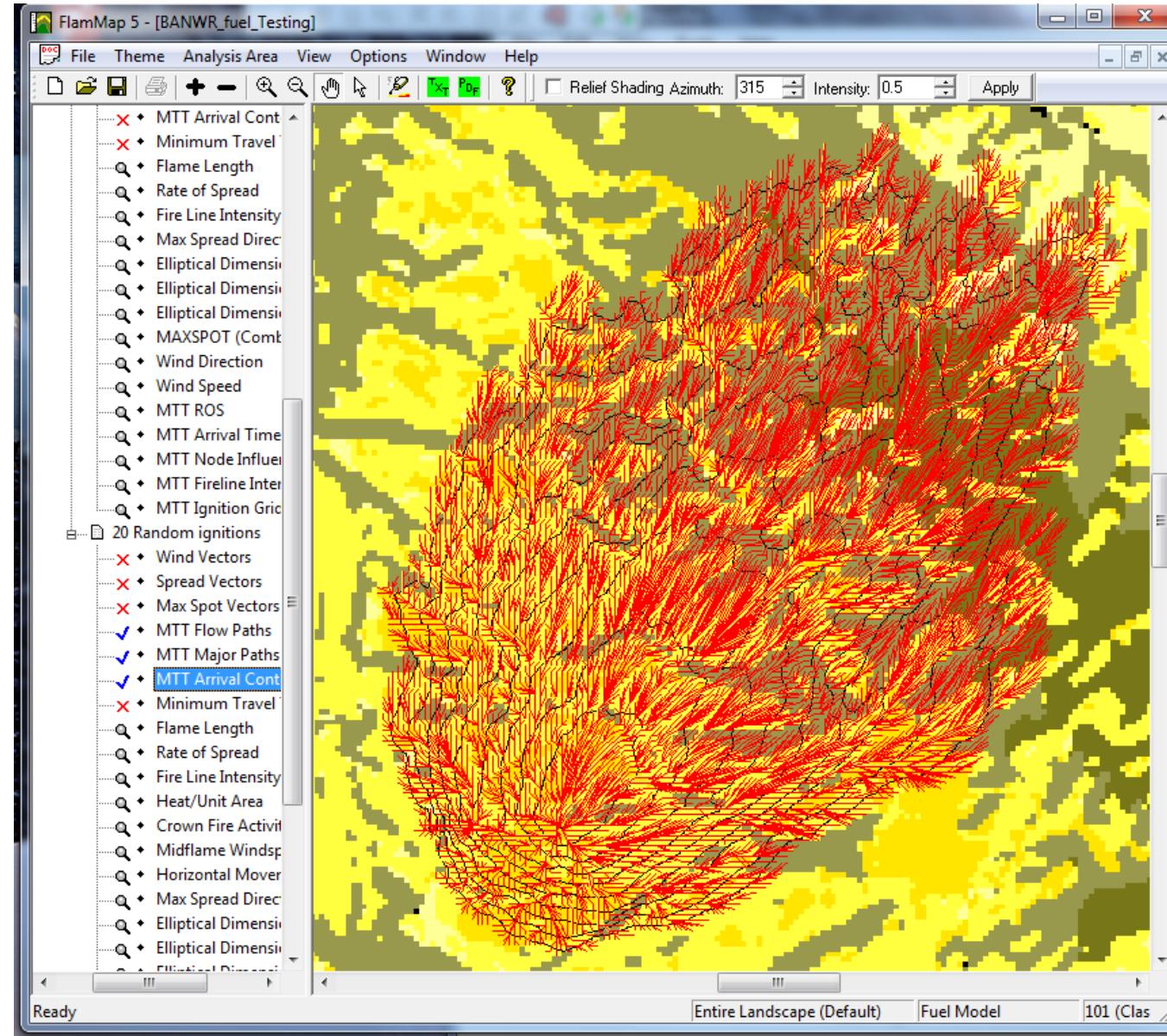
Raster Layers required to run fire spread simulation

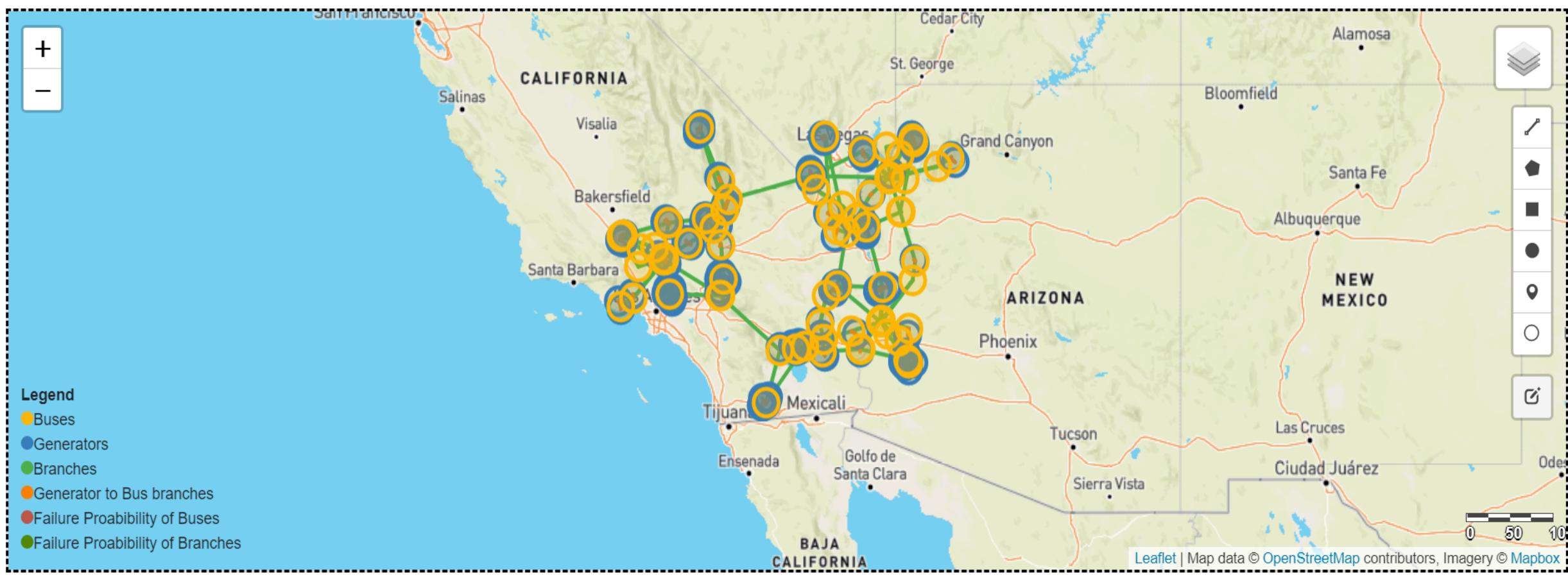
Band #	Band Name	Units - GeoTIFF
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Example of wildfire simulation



[Configure wildfire-res scenario](#)[Load MTT Results](#)[Run PSLF simulation](#)[View PSLF Data](#)Debug mode 

Running wildfire scenarios with updated fuel map



Wildfire-RES Scenario Configuration X

UNCLASSIFIED

scenario Load MTT Results Run PSLF simulation View PSLF Data Debug mode

Step 1: Load LCP File

LCP File

Choose File No file chosen

Step 2: Configure simulation options

FMS File

Choose File No file chosen

Wind Speed (mph)

20

Wind Direction (degrees)

0

Fire behavior outputs:

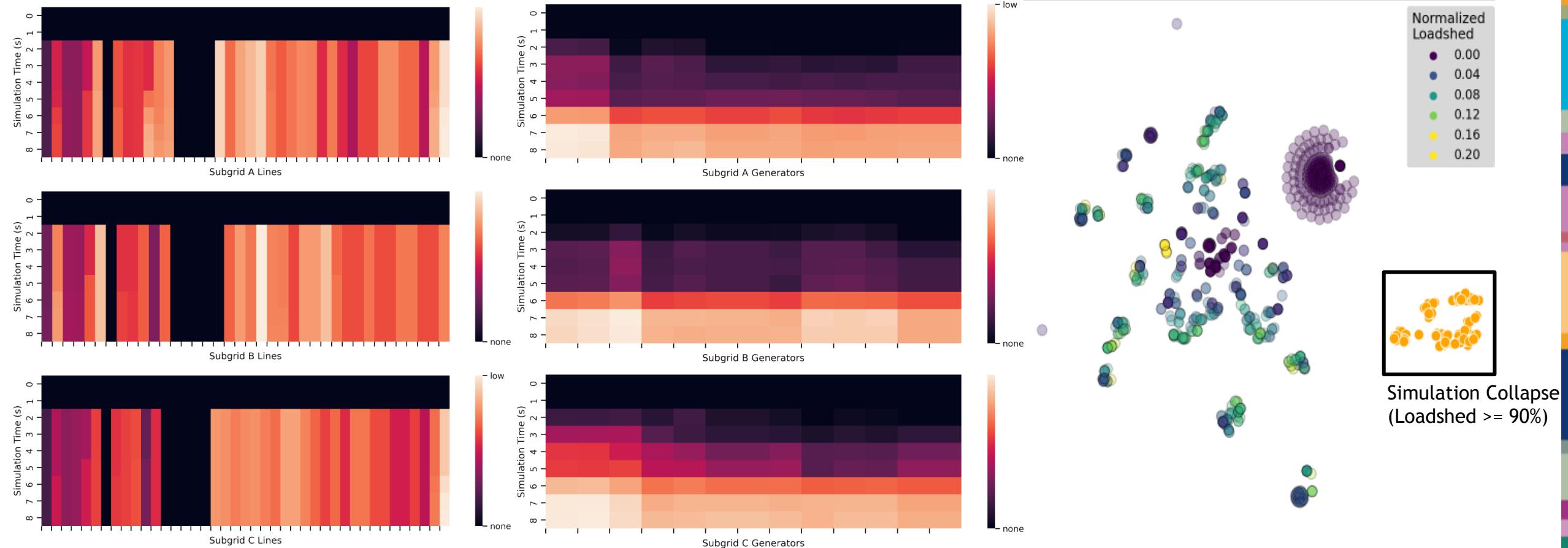
Fireline int

[Lat, Long]:

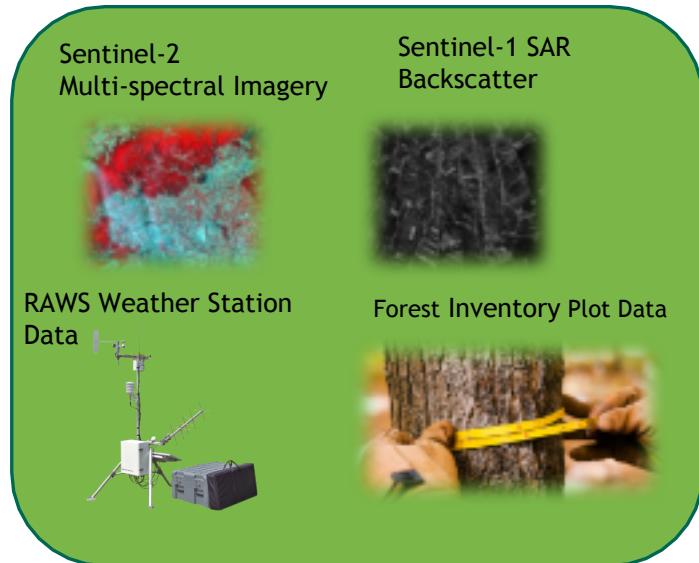
Geojson:

UNCLASSIFIED

Probability of Component Failures Over Time

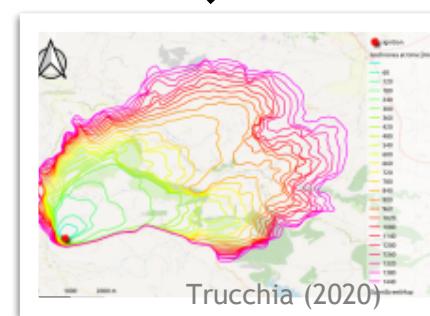


Next Steps: Grid mitigation recommendations



Spatial Statistics and Random Forest Regression Trees

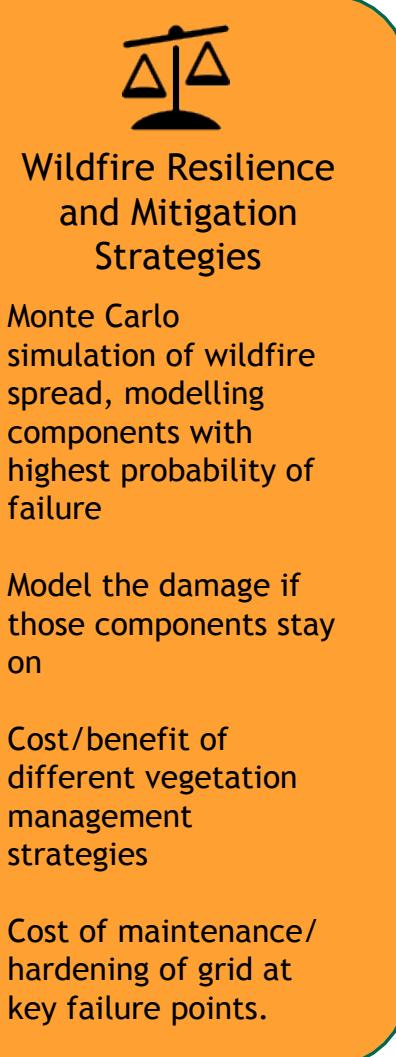
Dynamic Fuel Model



Model fire arrival time contours with fire behavior software (FlamMap, eventually QUICFire)



GIS data of infrastructure



Applications

- Through fire risk modelling and grid simulations, we will **help utilities plan for and mitigate a disaster** from fire and identify grid response strategies and resilient designs that reduce vulnerability leveraging past work on cascading failures.
- Current fuel models from LANDFIRE are refreshed once per couple of years and are taken from one point in time, our models refresh every 5 days for fuels, and every hour for live fuel moisture, providing **more accurate datasets for wildfire behavior analysis**
- Potential users:
 - **Utility Managers** - Southern California Edison, PG&E
 - **Wildfire Response** - USFS/CALFIRE
 - **Wildfire Resilience** - long-term planning applications for utilities, land management agencies and municipalities

