

# Lidar utility for predictive modeling and mapping of fuel load and consumption

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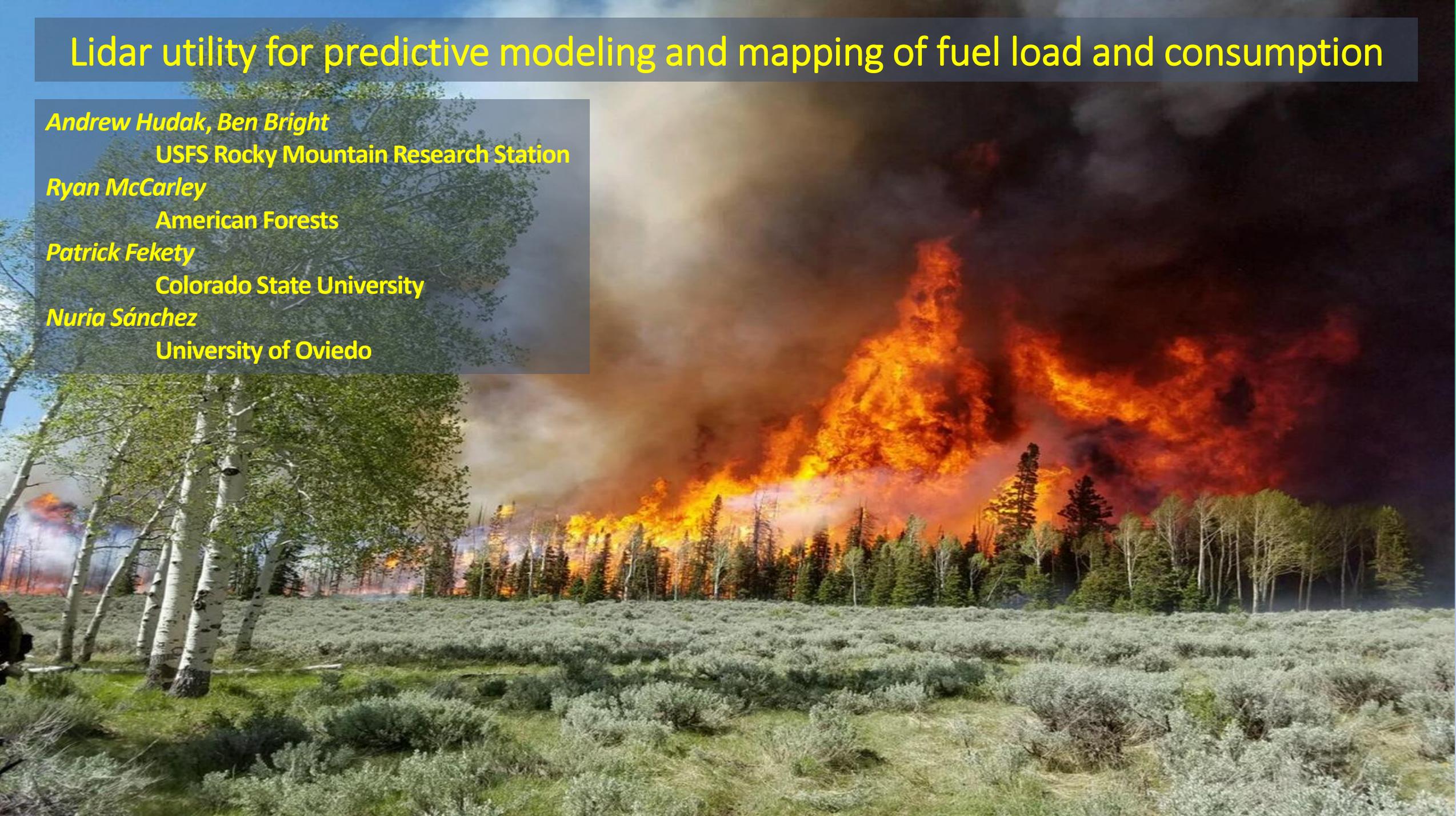
American Forests

*Patrick Fekety*

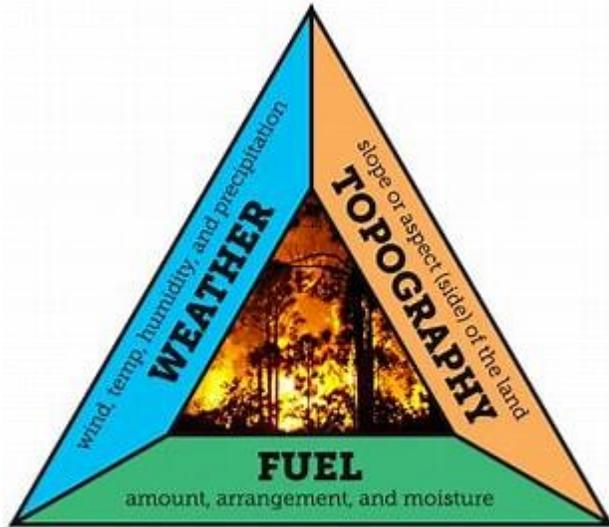
Colorado State University

*Nuria Sánchez*

University of Oviedo



# Why?



**Fire Behavior Triangle**

Only fuels can be managed to affect wildland fire outcomes

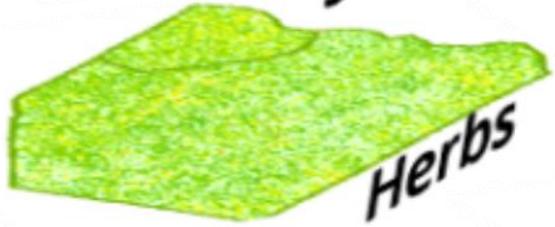


# Introduction and Outline

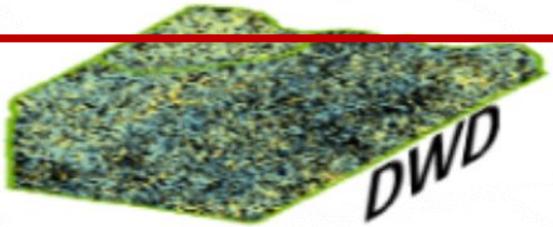
- Airborne lidar: next generation landscape-regional fuel maps
  - Physical fuel attributes as continuous variables; e.g., fuel load (density, Mg/ha)
  - Opportunities for consumption mapping
- Opportunities for estimating fuel consumption
  - Prescribed fires
  - Wildfires
- Coupling surface fuel estimation to canopy biomass
  - Model canopy fuels from lidar directly
  - Model surface fuels from lidar indirectly



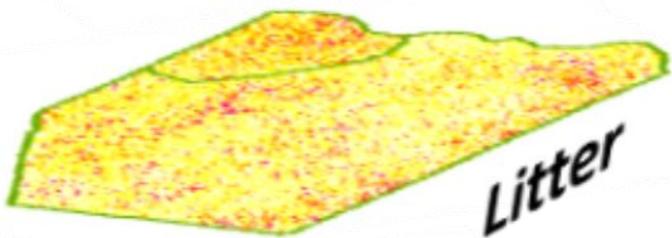
Shrubs



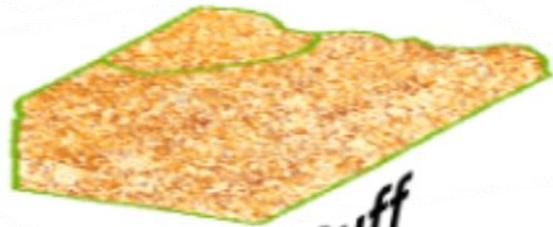
Herbs



DWD

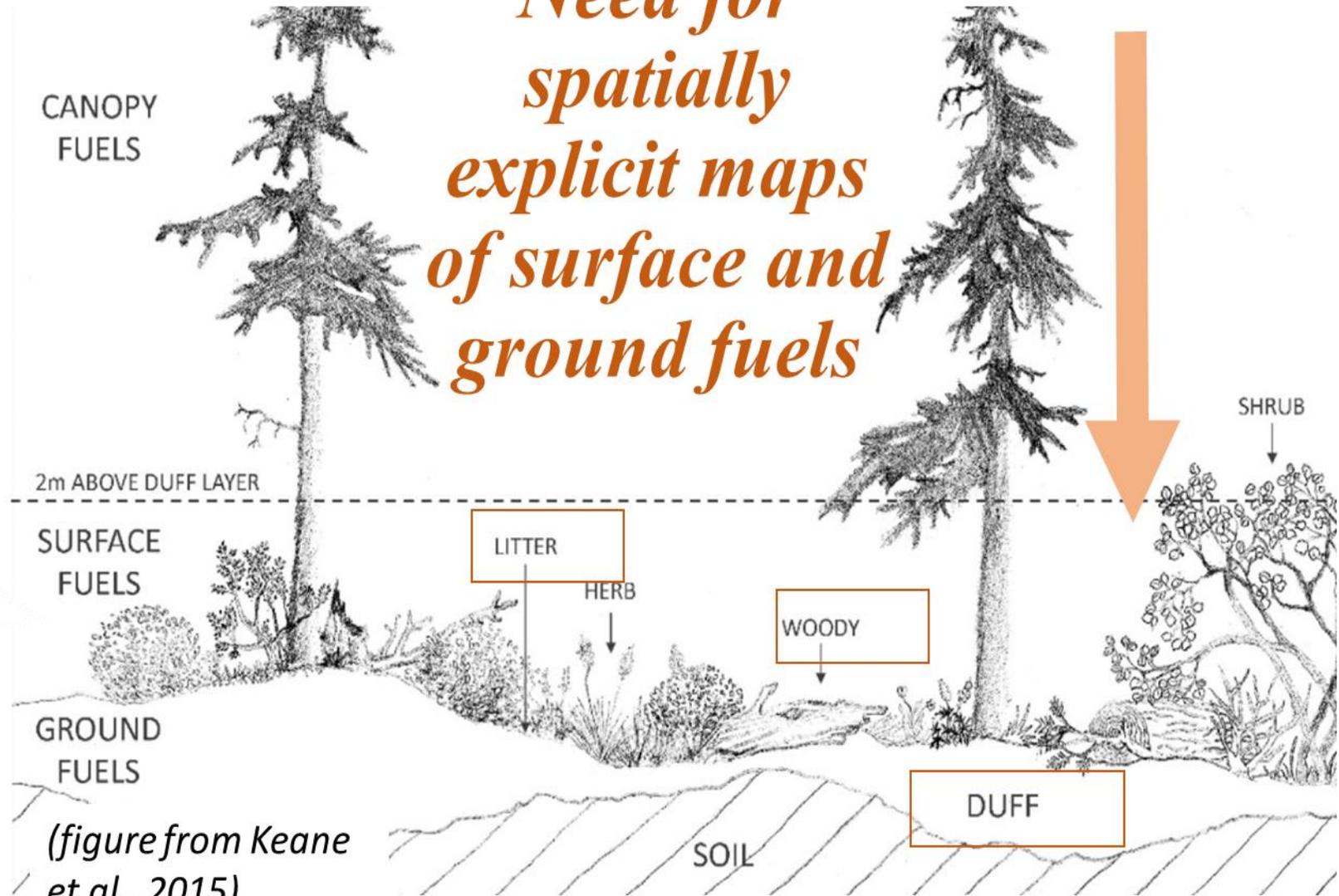


Litter



Duff

*Need for spatially explicit maps of surface and ground fuels*



CANOPY FUELS

2m ABOVE DUFF LAYER

SURFACE FUELS

LITTER

HERB

WOODY

SHRUB

GROUND FUELS

DUFF

SOIL

(figure from Keane et al., 2015)

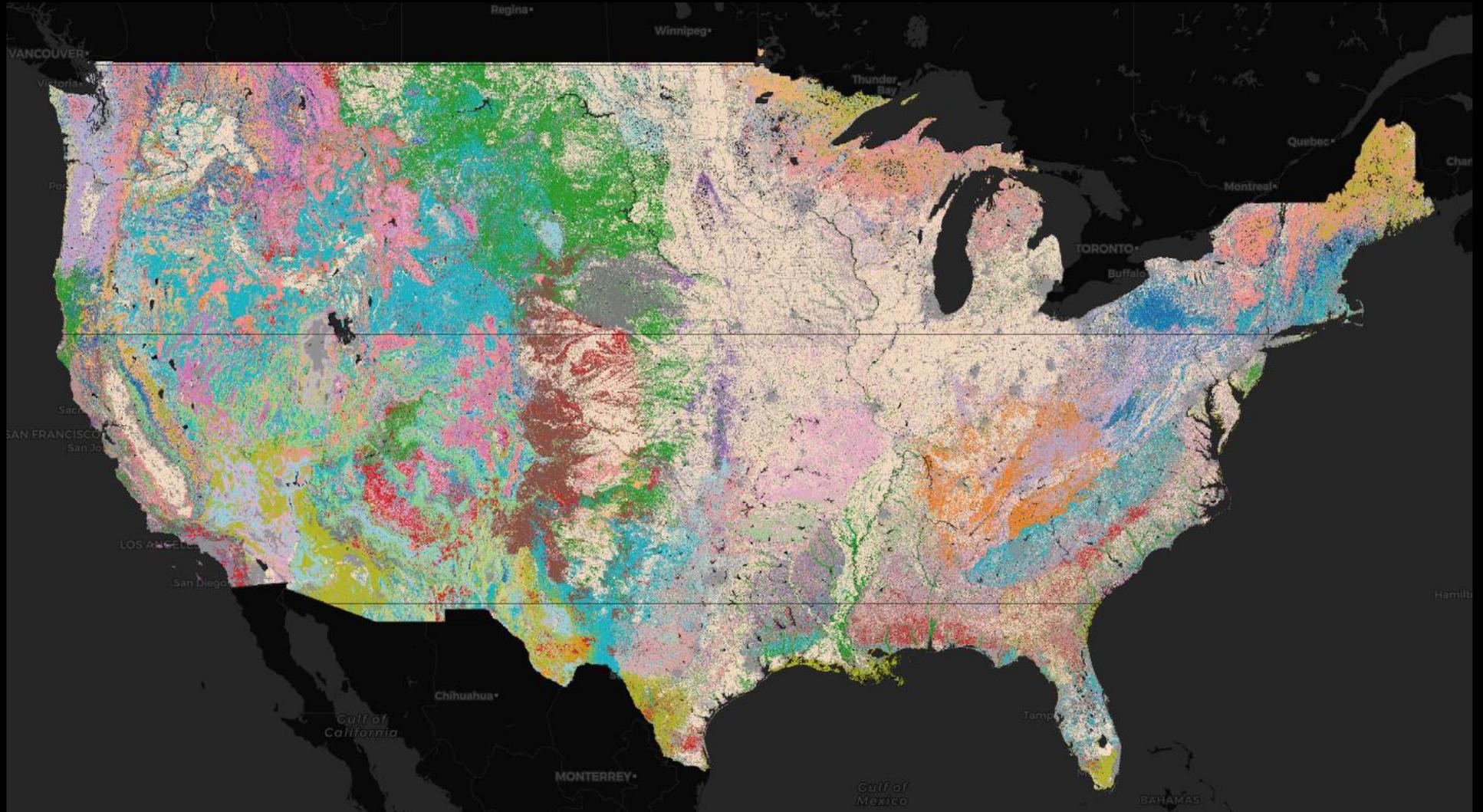
# Limitations of current techniques

# Characterization of fuel properties by classification -- FUEL TYPES

The screenshot displays the LANDFIRE web application interface. At the top left is the LANDFIRE logo. Below it are navigation tabs for 'Contents', 'Legend', and 'Help'. The main map area shows the contiguous United States with a multi-colored overlay representing fuel types. A legend on the left side of the map lists various layers, including 'vegetation', 'Fuel', 'Surface and Canopy', and 'Fuel Disturbance and Vegetation'. Under 'Surface and Canopy', several layers are checked, including 'us\_240 13 Fire Behavior Fuel' and 'us\_240 40 Fire Behavior Fuel'. The map interface includes standard GIS controls like zoom in (+), zoom out (-), and a search icon. On the right side, there are additional tool buttons such as 'Measure Tool', 'Bookmarks', 'Identify Tool', 'Data Download', and 'Spatial Location'. The title bar of the application reads 'Conterminous U.S. LANDFIRE - LF 2023 (LF\_240) - Fuel - Surface and Canopy - us\_240 13 Fire Behavior Fuel Models-Anderson'. The map shows a complex pattern of colors (green, yellow, orange, purple, blue) across the United States, indicating different fuel types. A coordinate system is visible in the top right corner of the map area, showing -126.0910, 49.3290.



# NAWFD: The North American Wildland Fuels Database



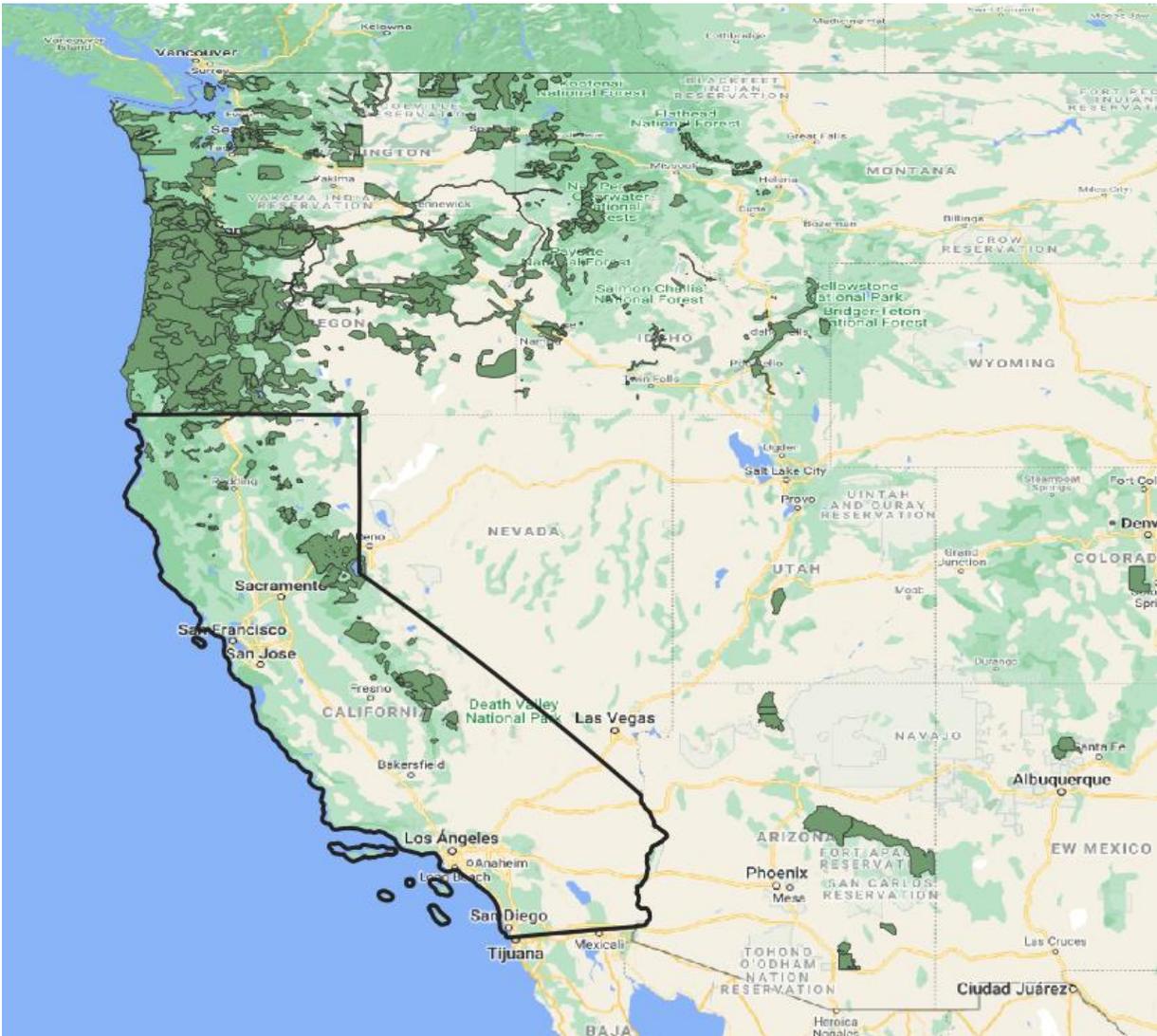
## Existing Vegetation

- 211 groups aggregated from LANDFIRE EVT's
- Landsat-based; CONUS+Alaska mapped at 30m spatial resolution

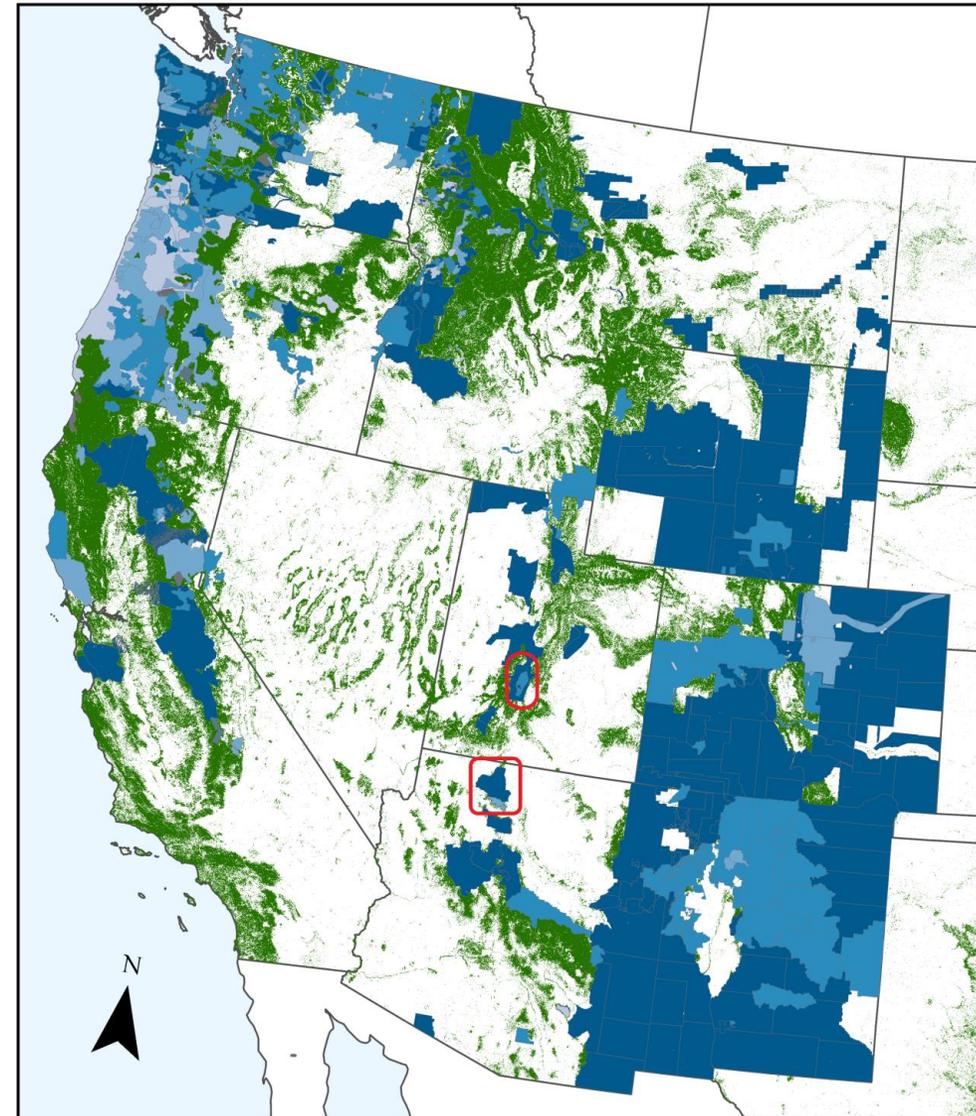
<https://fuels.mtri.org>

# Lidar Coverage in Western US

circa 2019



circa 2023

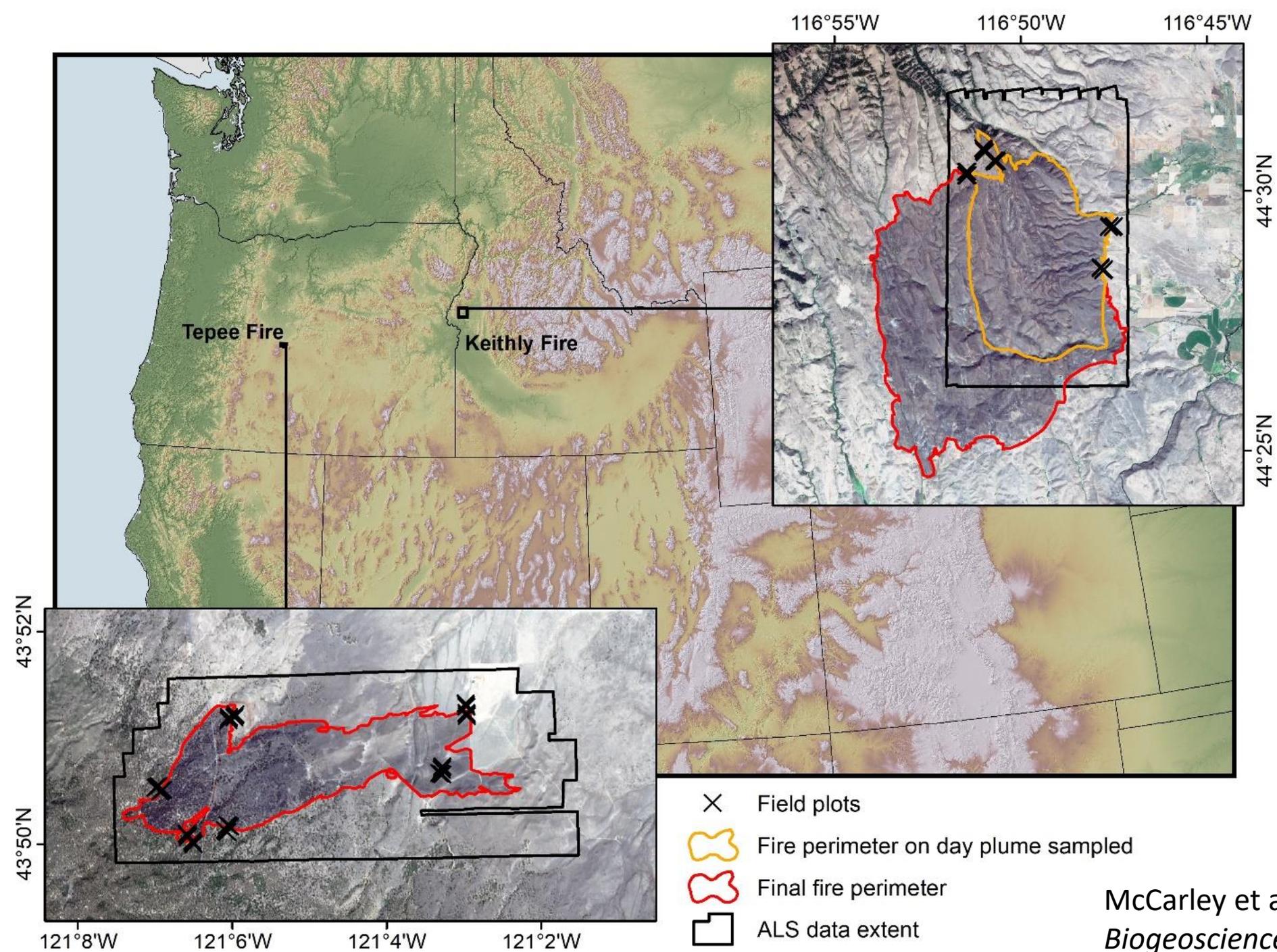


Lidar acquisition year

- 2002 - 2010
- 2011 - 2013
- 2014 - 2017
- 2018 - 2021

Forest

0 200 400  
Kilometers



McCarley et al. (2022) *Geophysical Research: Biogeosciences* 127: e2021JG006733.

A) Keithly unburned



B) Keithly burned



C) Tepee unburned

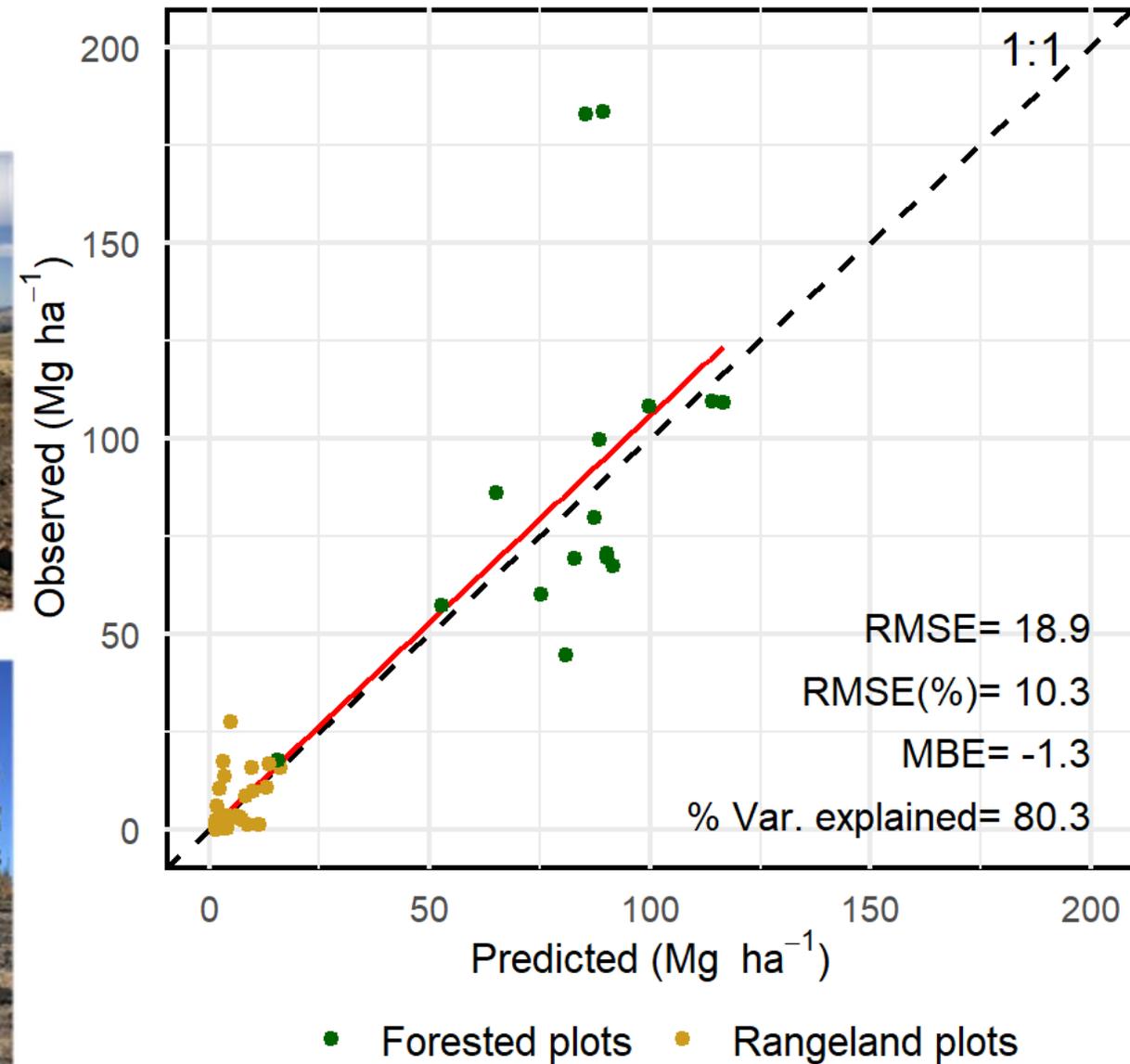


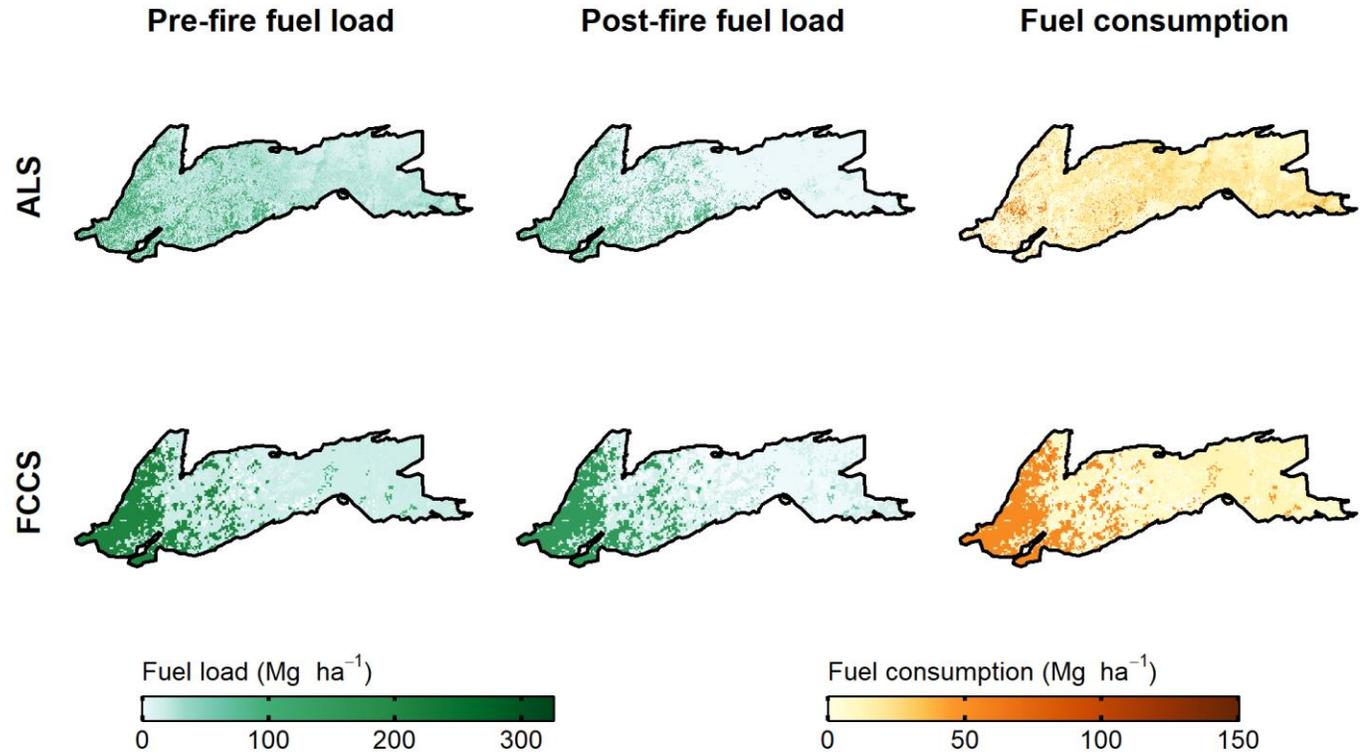
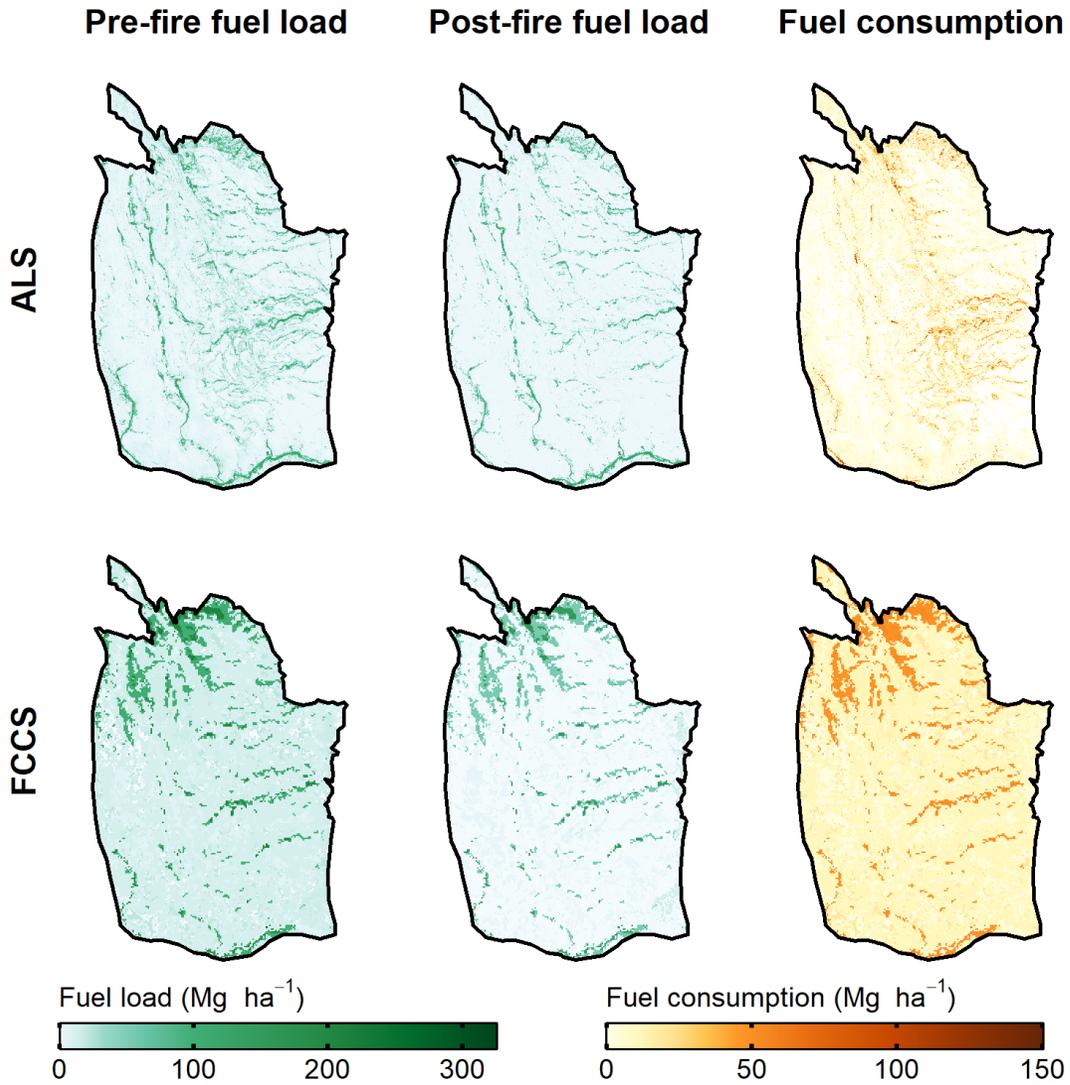
D) Tepee burned

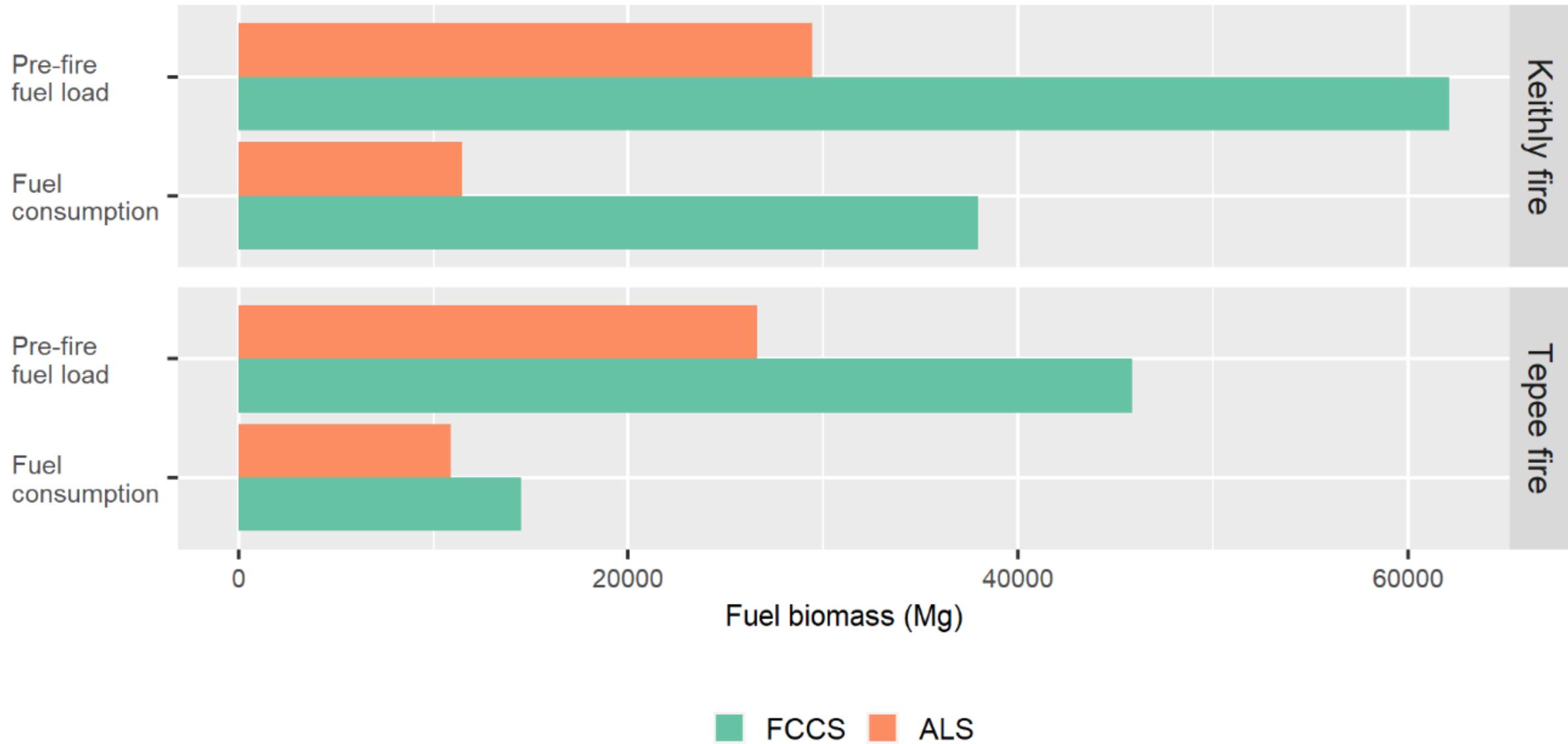


Tepee unburned

Tepee burned

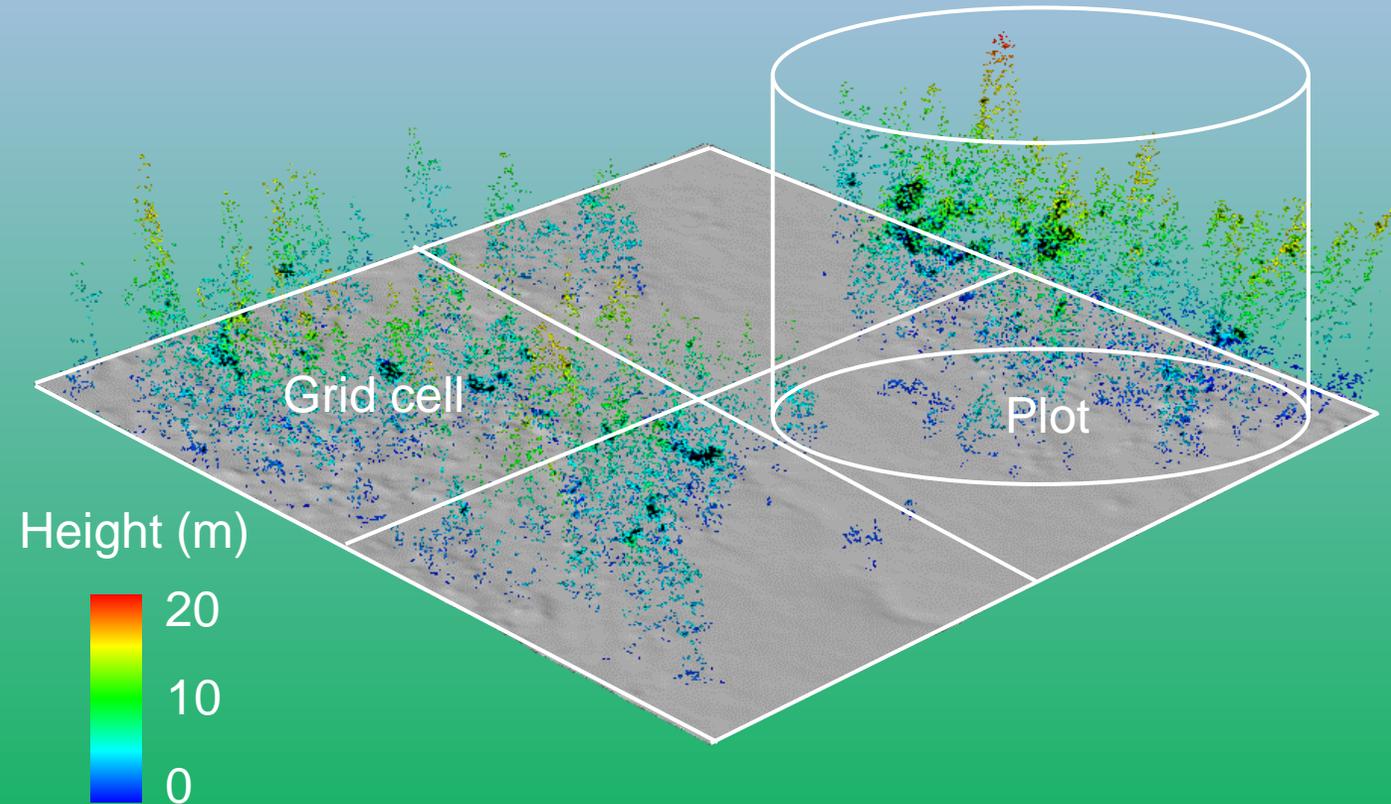






# Airborne lidar data processing to predict forest structure and fuel attributes

- Forest structure attributes measured in forest inventory plots
- Absolute return heights converted to heights above ground level
- Returns coincident with plots summarized to produce metrics
- Models fitted to predict plot attributes from plot-level lidar metrics
- Same lidar metrics calculated in raster grid cells across lidar extents
- Fitted models applied to gridded lidar metrics



# “Living” Database of Project-Level Reference Plots

(This “living” database is comprised of field AND lidar reference data.)

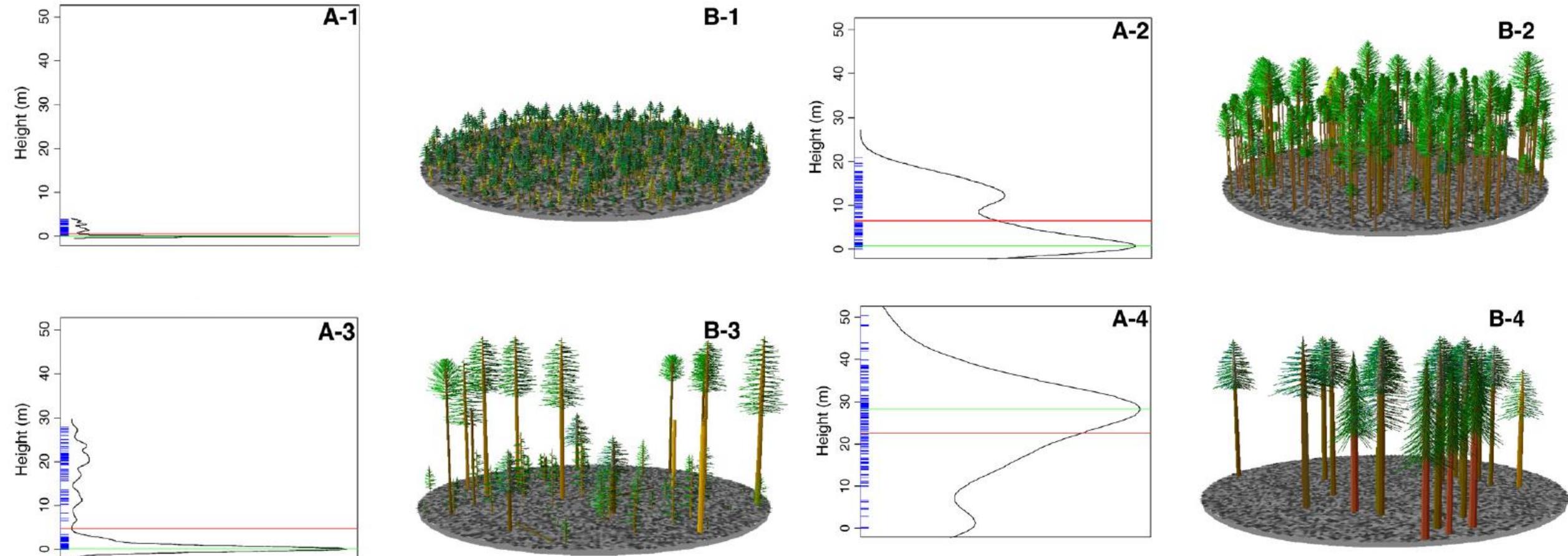


Figure credit: Patrick Fekety

# Expanding database of stakeholder-contributed plots and lidar

## Through Phase 2:

- Processed >1.2M km<sup>2</sup> lidar collections for 604 project areas (colors indicate which cooperators processed the lidar using a divide-and-conquer strategy)
- Assembled 9,988 project-level inventory plots contributed by USFS, other federal, state, tribal, academic stakeholders (n=45...and counting)

## Phase 3:

- Continue to add lidar collections and inventory plots contributed by stakeholders

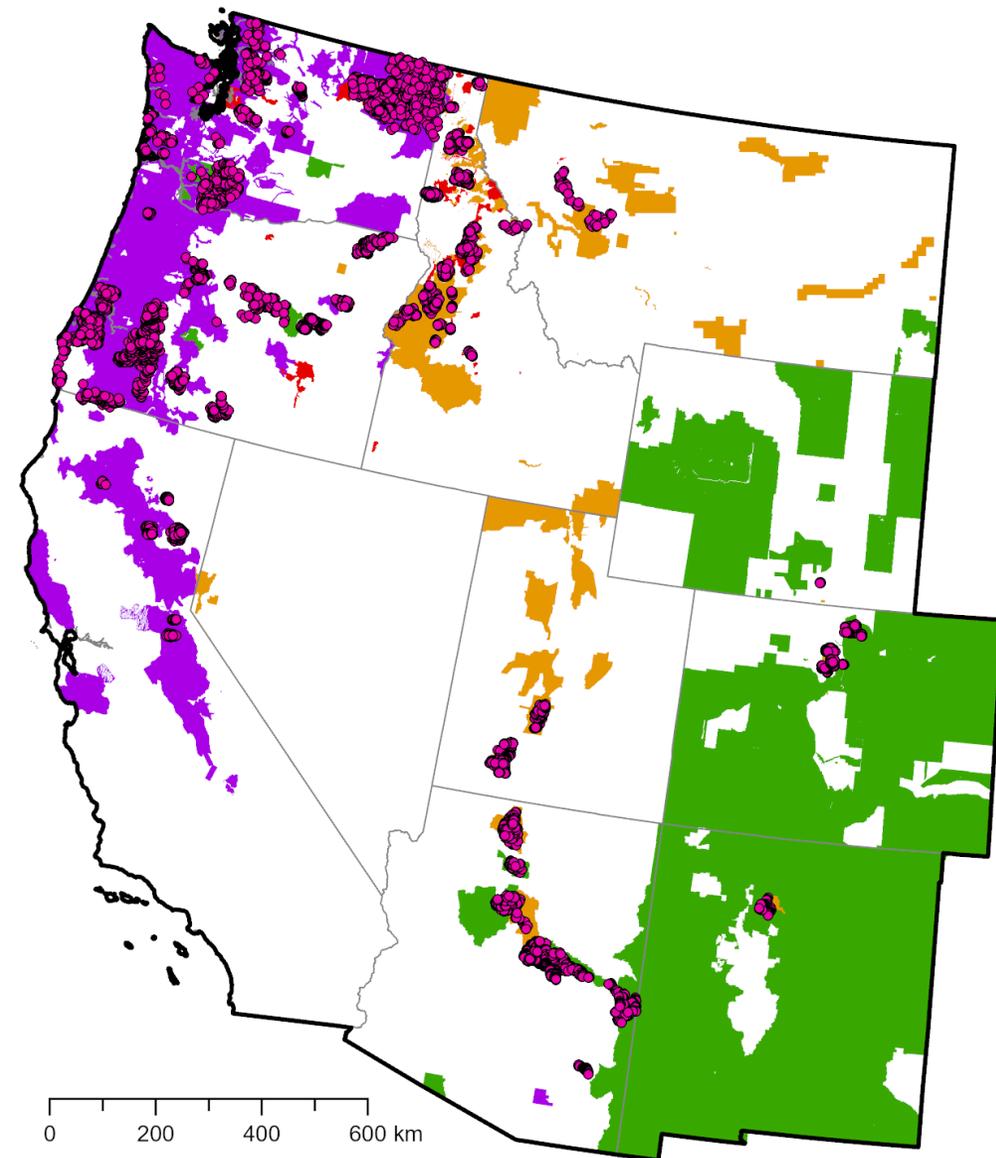
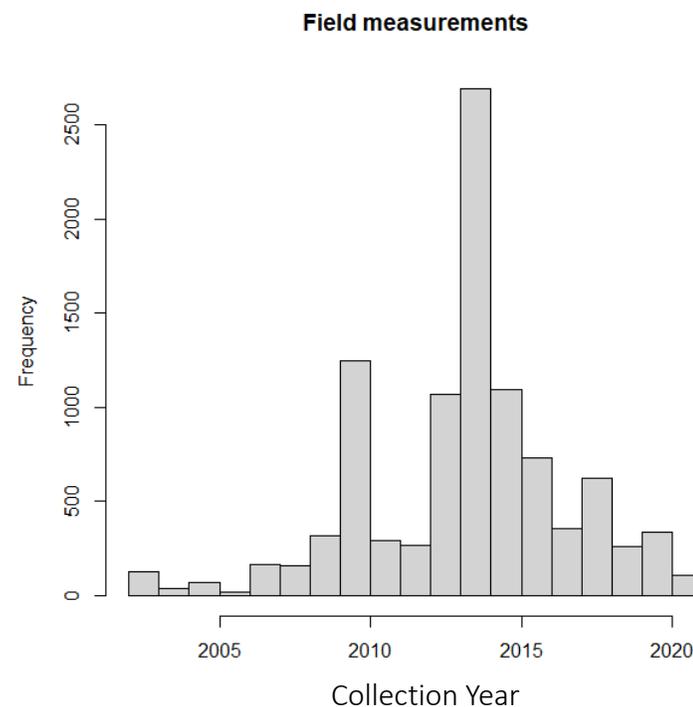
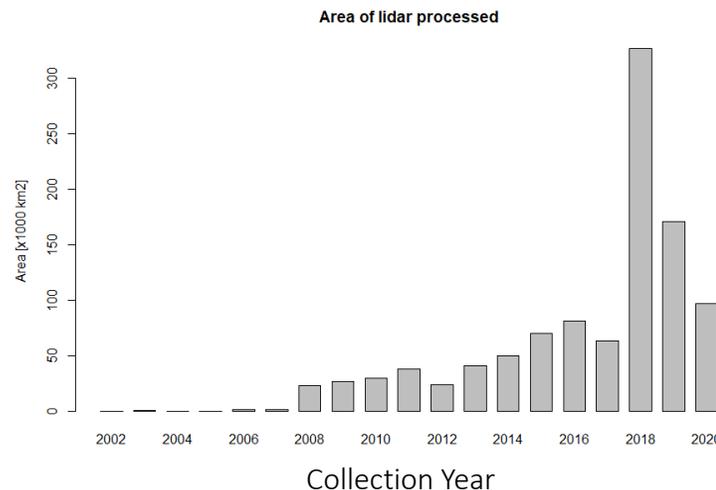


Figure credit: Patrick Fekety

# Forest structure and fuel attributes needed by stakeholders:

- Aboveground Biomass (carbon)
- Basal Area (timber)
- Total Volume (timber)
- Board Feet (timber)
- Quadratic Mean Diameter (timber)
- Stand Density Index (timber)
- Trees Per Hectare (timber)
- Snags Per Hectare (wildlife)
- Canopy Bulk Density (fuels)
- Canopy Fuel Load (fuels)
- Foliage Biomass (fuels)
- Downed Woody Biomass (fuels)

These variables are being mapped wall-to-wall and annually (1985-present); Next step is to provide plot ID maps at 30m resolution that join to tree lists.



## CMS Phase 3: Seeing the forest for the trees -- Survey



NASA Carbon  
Monitoring Systems  
(CMS) project survey

- <https://forms.office.com/r/TSx9CYnGnw>

# Western Prescribed Fire and Wildfire Opportunities

21:38

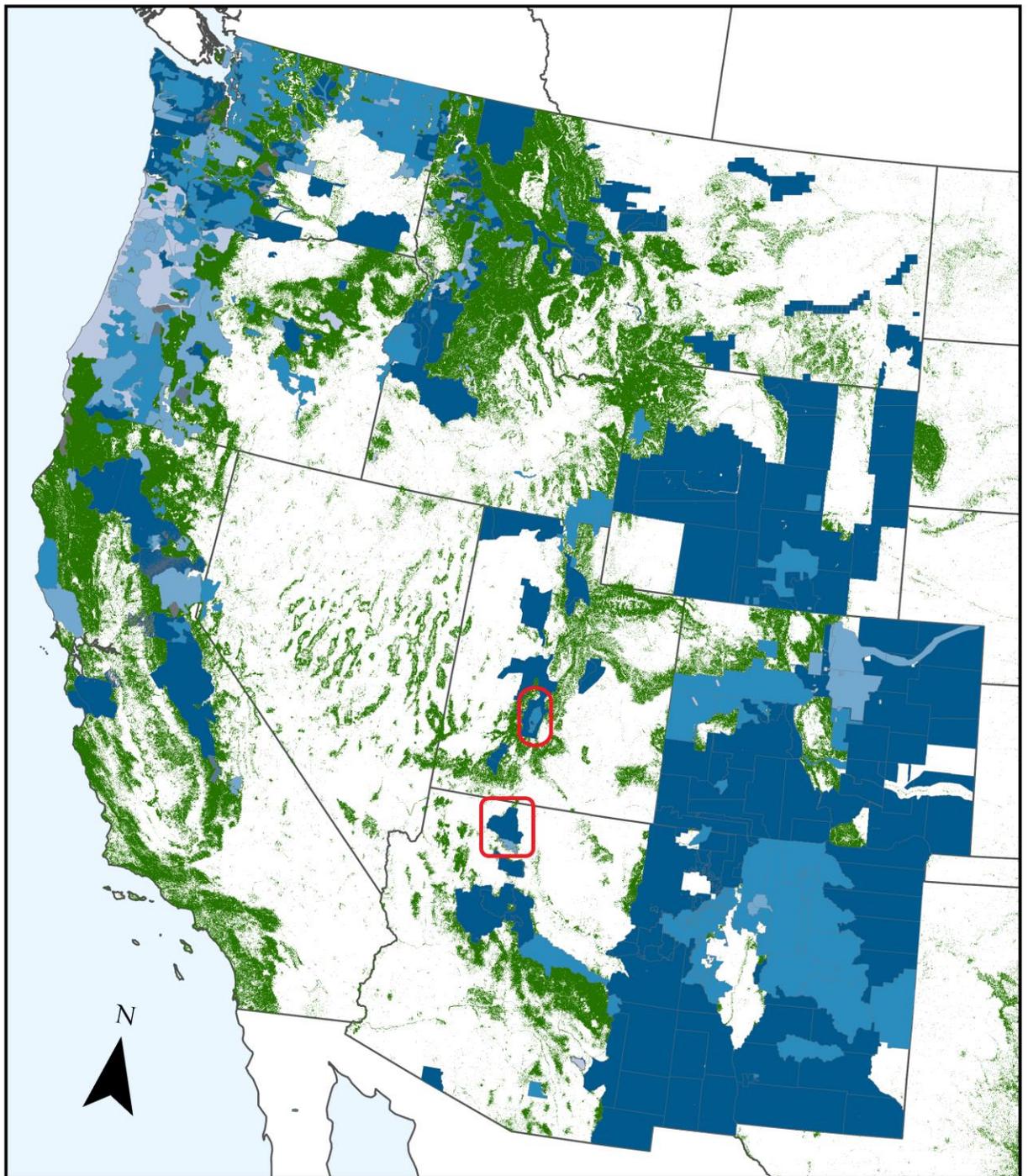
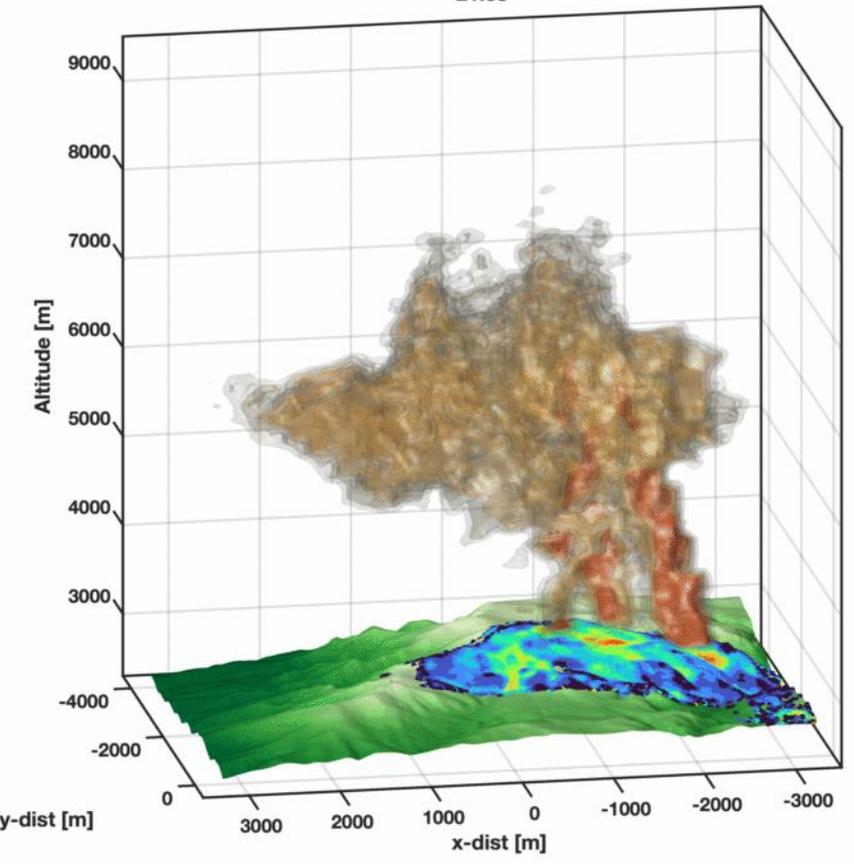


Figure credit:  
Ben Bright

# Western Prescribed Fire and Wildfire Opportunities

Monroe Mountain, Fishlake  
National Forest, Utah



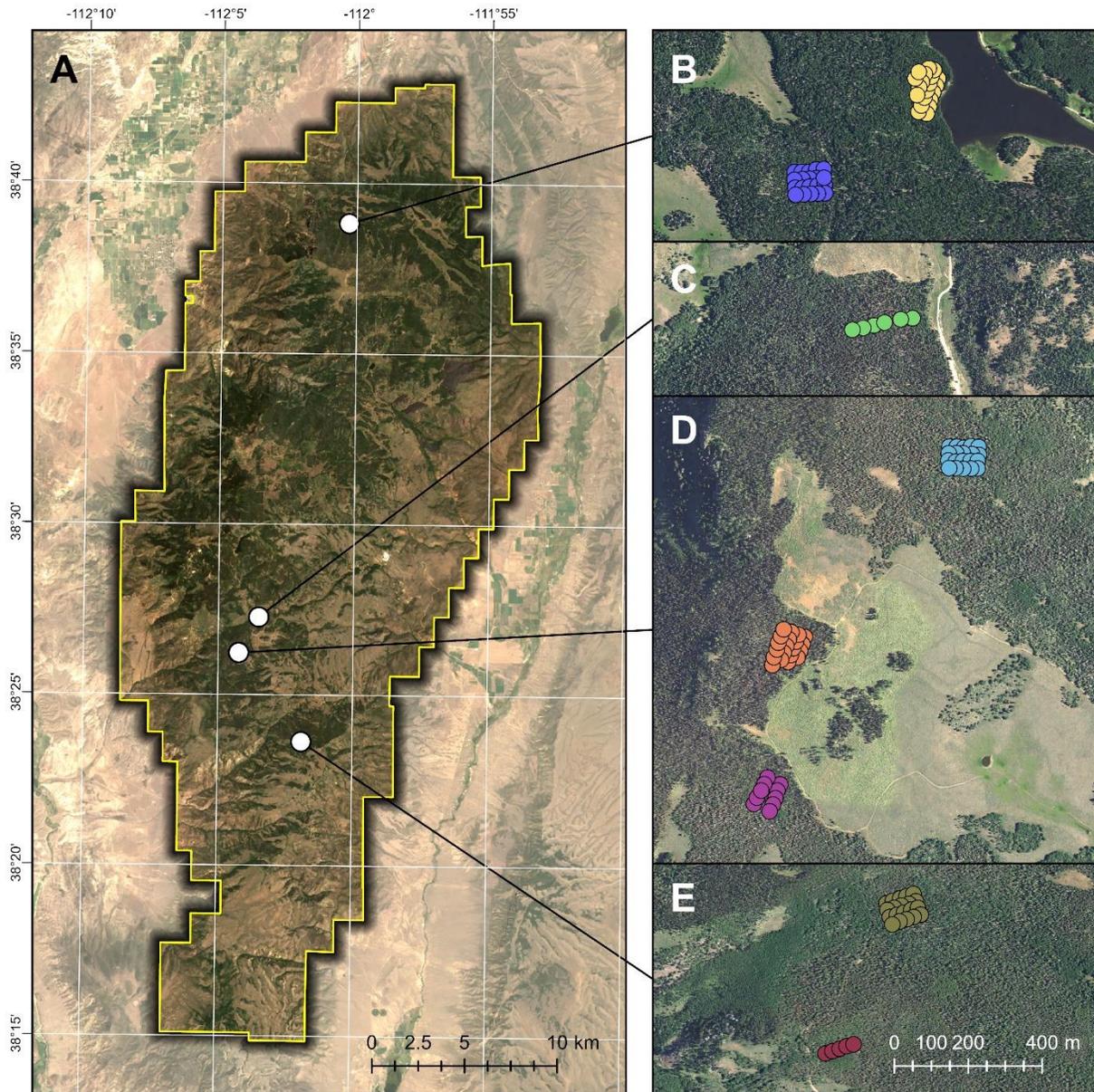
**Pre-fire**

*Prescribed crown fires behaving like wildfires create safer opportunities for co-located pre- and post-fire field plots*

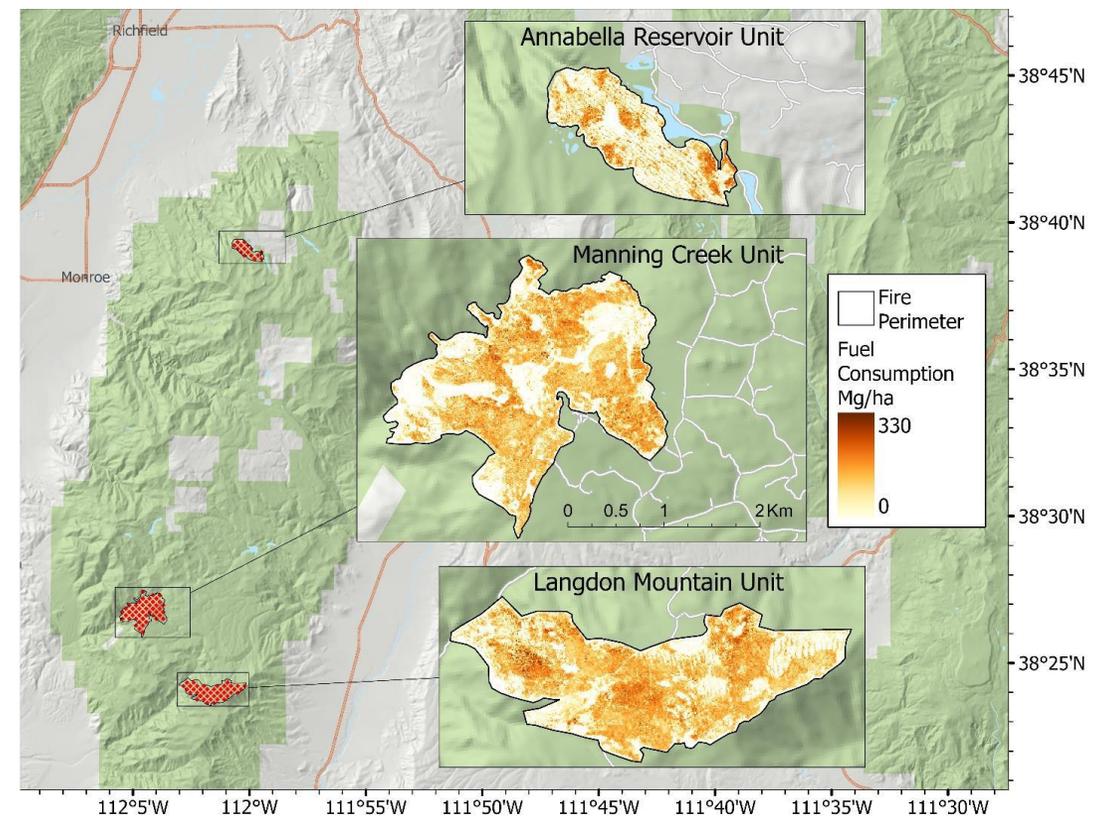


**Post-fire**

# Monroe Mountain, Utah



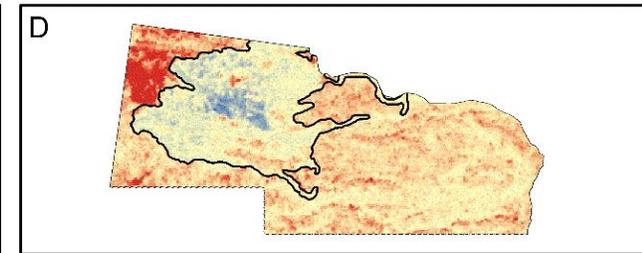
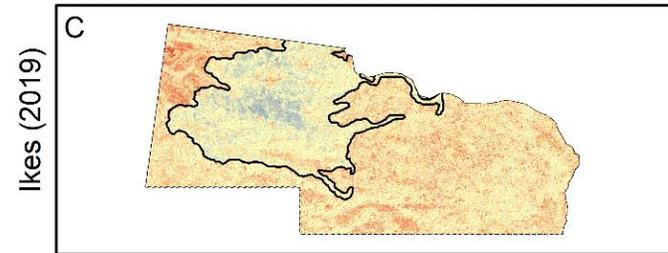
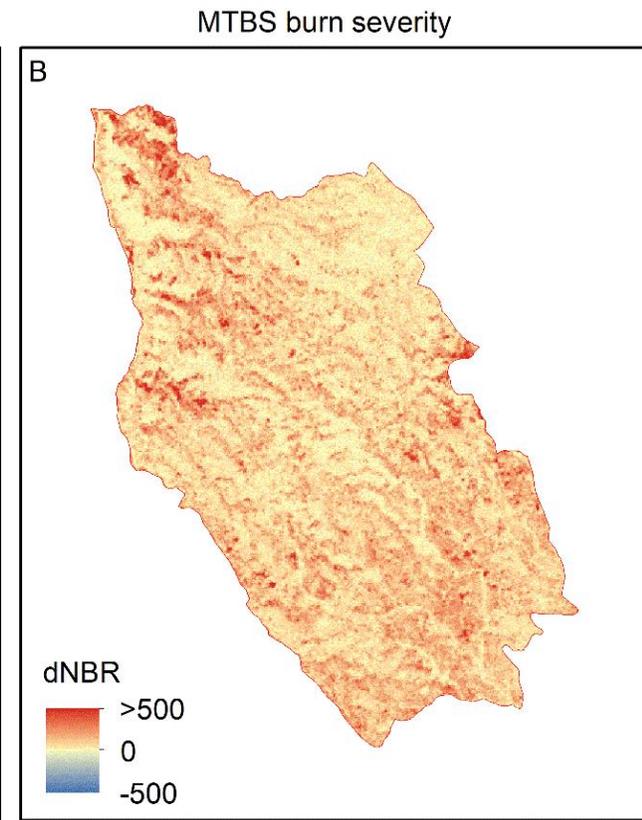
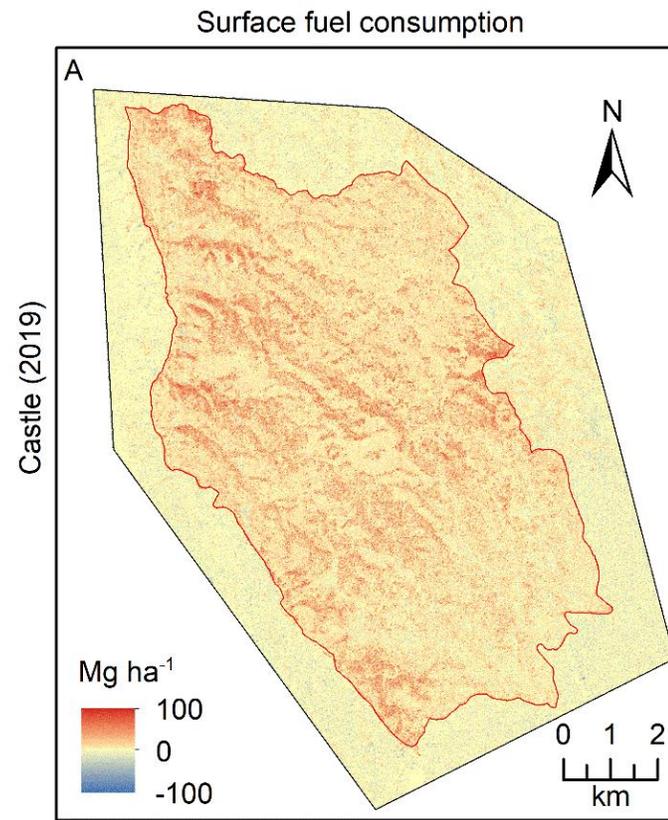
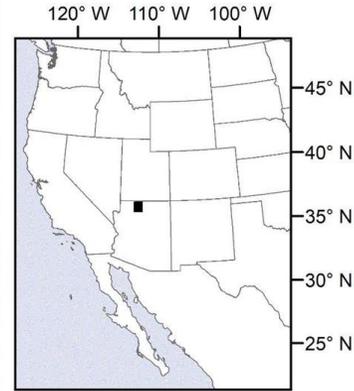
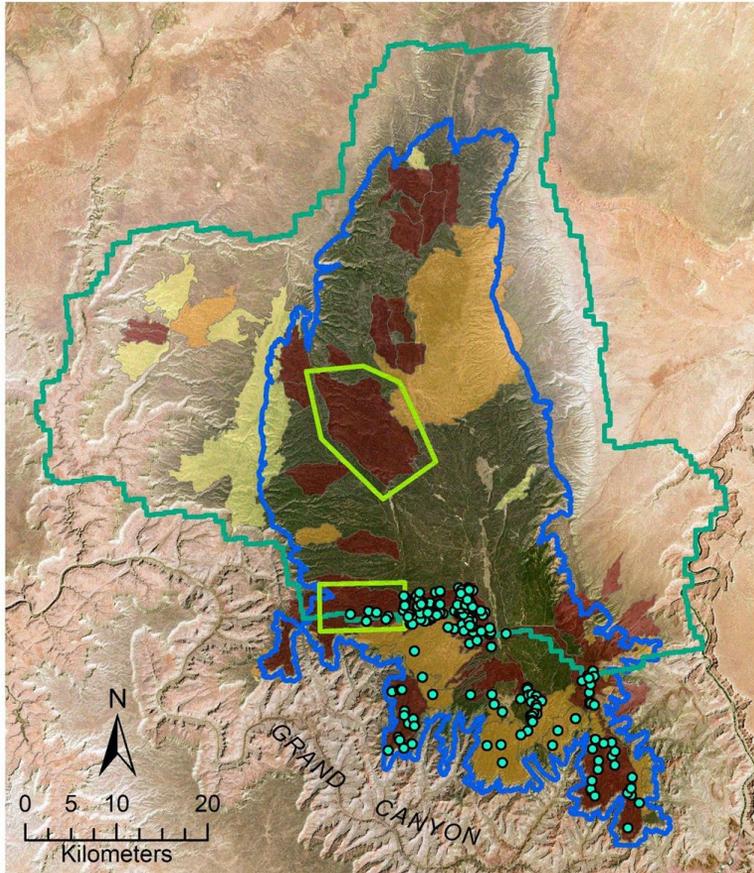
Campbell et al. (InReview), *Science of Remote Sensing*



<i>Fuel Type</i>	<i>% Var. Exp.</i>	<i>RF Model</i>
Canopy	76.0	
DWD	33.9	
Litter	42.9	
Duff	25.6	
Total fuel	64.9	
Subcanopy fuel	31.4	
ACF	73.7	

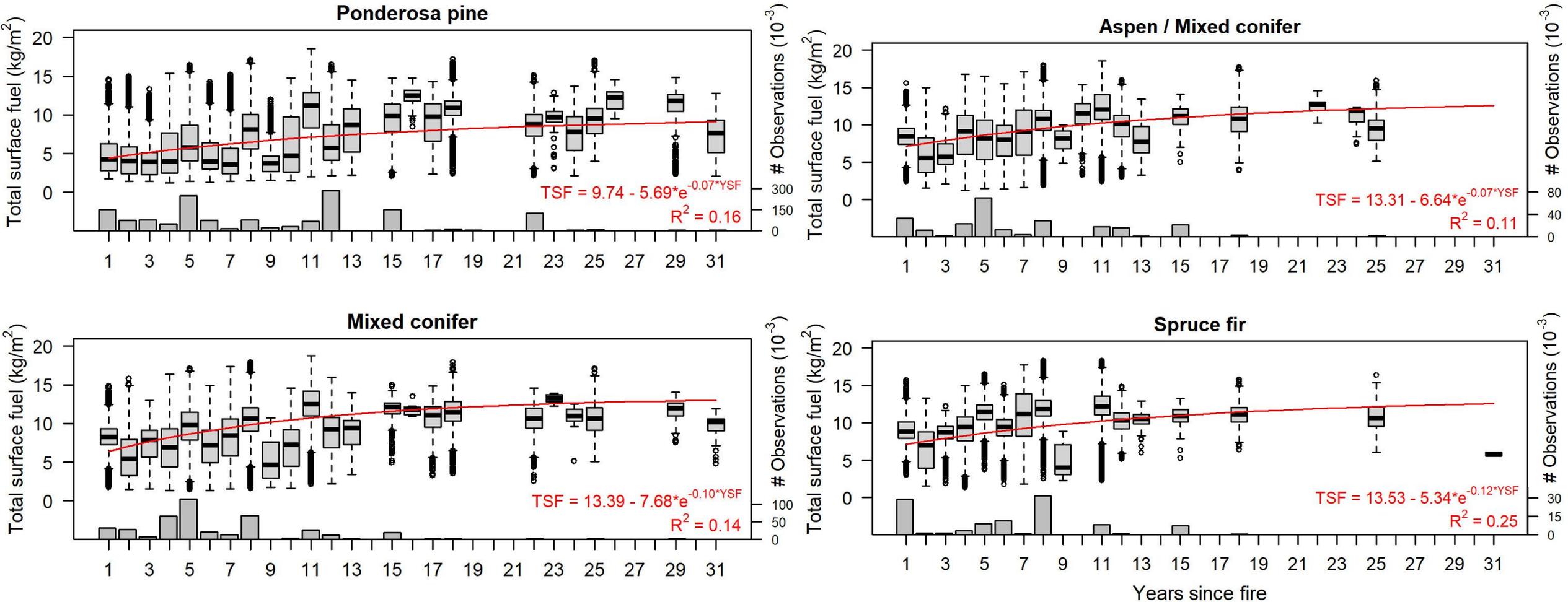
McCarley et al. (2024) *IJWF* 33: WF23160

# Kaibab Plateau, Arizona



Maps of predicted surface fuel consumption versus burn severity at the 2019 Castle Fire and Ikes Fire in Arizona. The black perimeter represents the 2018 Stina Fire within the 2019 Ikes Fire (Bright et al. 2022).

# Surface fuel accumulation with time since fire



# Coupling surface fuelbeds to canopy fuels

Fuel Type	Avg. % fuel
Biomass >10cm	17.08
Shrubs	4.37
Grass	8.17
Litter	42.97
DWD	8.95
Duff	18.66
Other	0.11

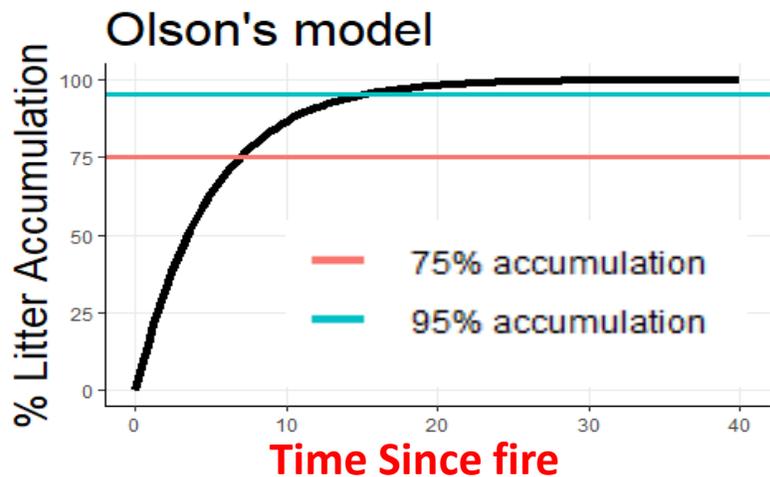
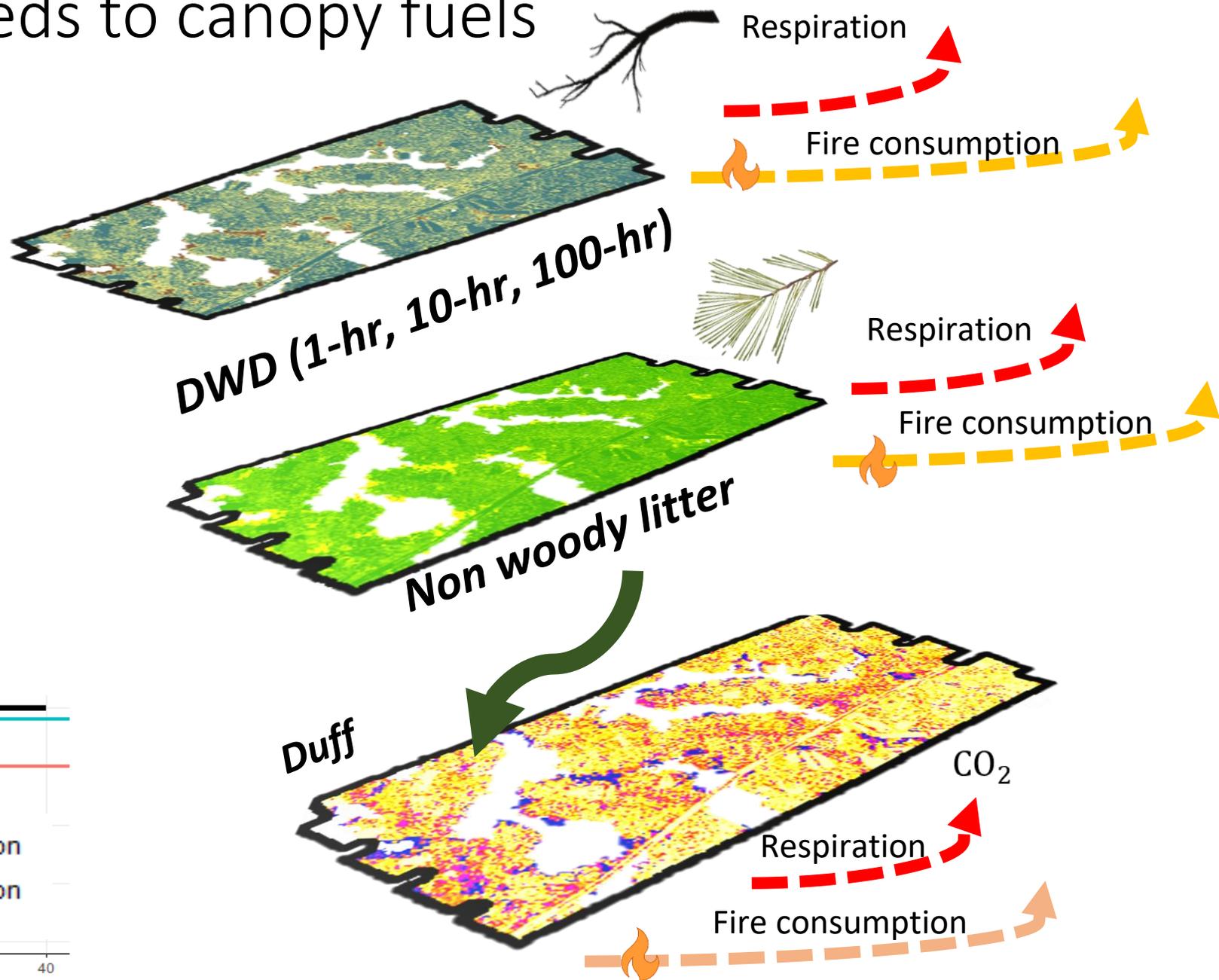


Figure credit: Nuria Sánchez

# Spatially explicit maps of surface fuel components are limited

High heterogeneity and complexity of surface fuel beds



Low sensitivity of remote sensing systems



# AIRBORNE LASER SCANNING (ALS)

## ALS crown attributes

## Tree canopy fuels

- Crown height
- Crown base height
- Crown length
- Crown density
- [...]

- Foliage biomass
- Stem branches
- Fine wood components

*Statistical Modeling Random Forest*

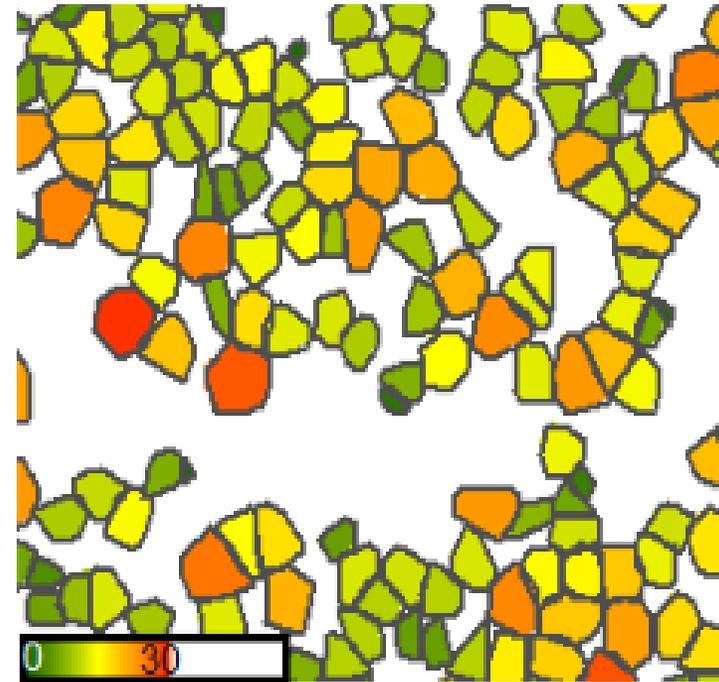
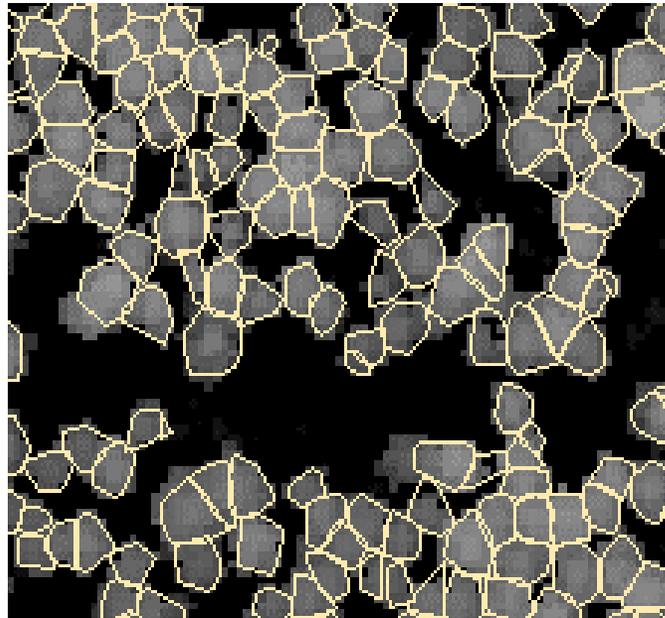
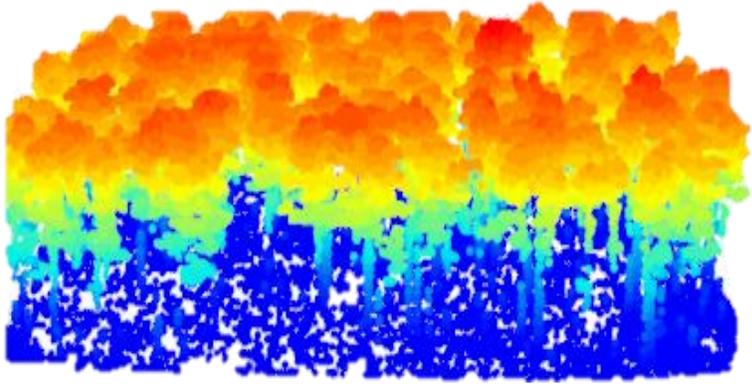
Individual tree crown segmentation

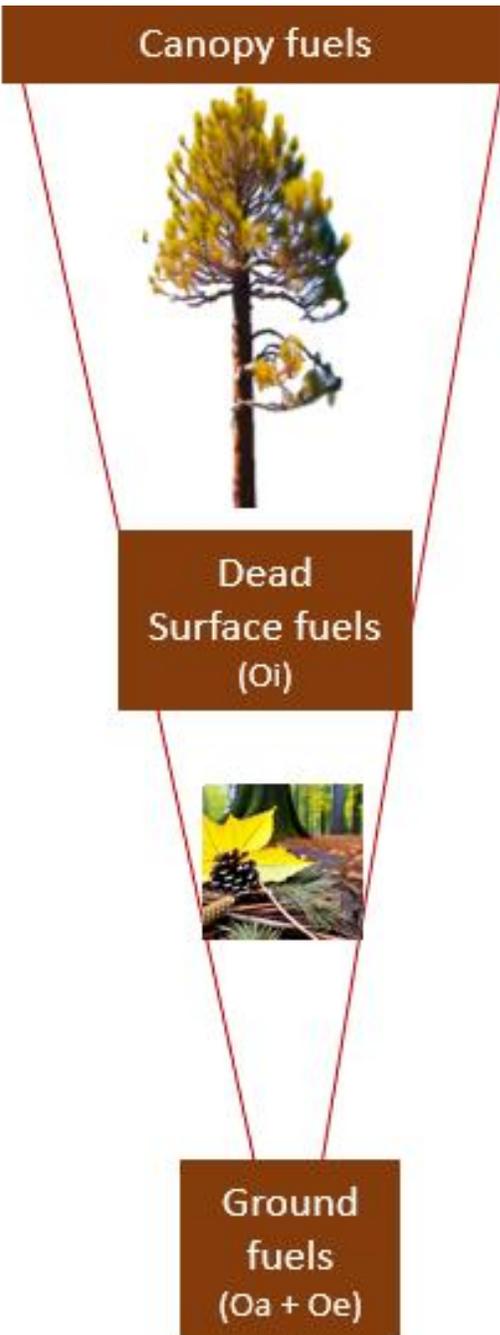
*Tree crown fuels*

*e.g., foliage biomass, branch biomass, fine wood components*

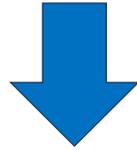
**TREE INVENTORY DATA**

Figure credit: Nuria Sánchez

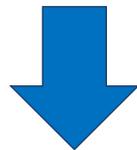




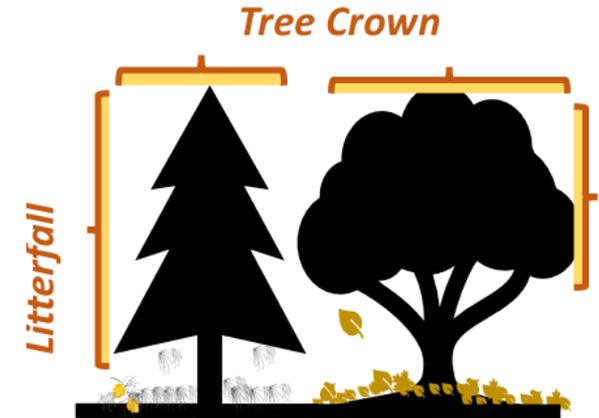
1. Estimation of biomass of different standing tree components



2. Estimation of annual production of surface fuels



2. Estimation of surface fuel accumulation from ancillary data, and ecological based models.



**Litter:**

Leaves, needles, bark, fruits, etc.

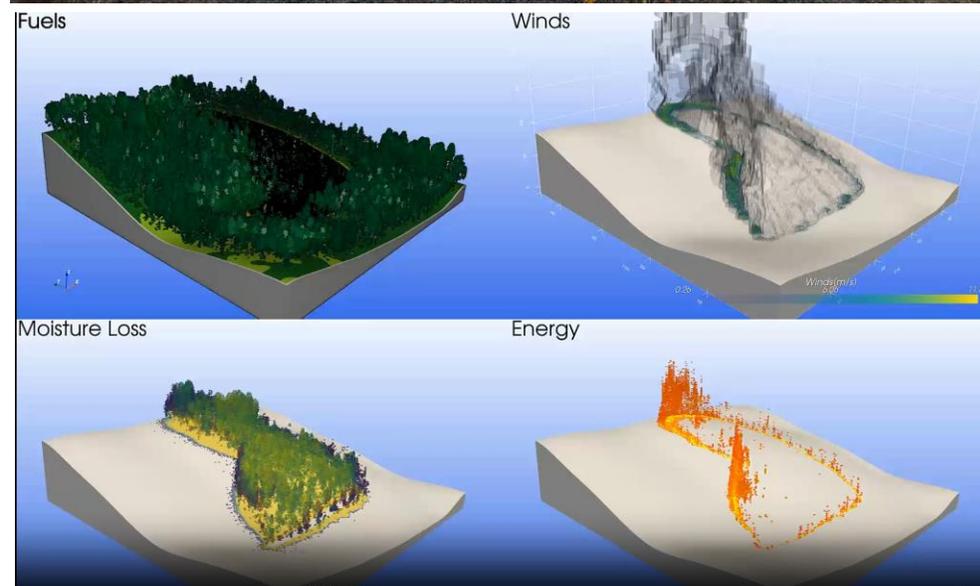
**FWD:**

- 1-hr (<0.635 cm)
- 10-hr (0.635-2.54 cm)
- 100-hr (2.54-7.62 cm)

**CWD:**

- 1000-hr (>7.62cm)

# Maps of surface fuels are *KEY*



*Forest management*

*Fire risk*

*Fire effects*

*Forest productivity*

*Consumption and emissions*

*Synthetic forest simulations*

*Fire behavior modelling*

*Terrestrial carbon fluxes*

Figure credit: Nuria Sánchez

# Conclusions

- Towards mapping fuels as continuous, physical variables
- Lidar data capture spatial heterogeneity in fuel structure
- Lidar data fail to reliably capture surface fuel bed depth
  - However, surface fuel are coupled to the canopy, other driving variables
- Need for traditional field measurements of physical loads will continue
- Prescribed fires present the best research opportunities
  - Ability to choose optimal or workable weather and fuel moisture conditions
  - Ability to collocate pre-fire and post-fire fuel measurements
- Improved consumption estimates relate to other fire science attributes
  - Fire behavior
  - Emissions
  - Fire Effects

# Questions?



## Funding:

### DOD SERDP Awards:

- 2019-2024 RC19-1064 (3D Fuels)
- 2019-2024 RC19-1119 (Fire Behavior & Effects)
- 2020-2026 RC20-1346 (Objects)

### NASA CMS Awards:

- 2014-2018 #NNH15AZ06I (Phase 1)
- 2019-2023 #80HQTR20T0002 (Phase 2)
- 2024-2027 #NNH24OB24A (Phase 3)

### JFSP and USFS Funding:

Fire And Smoke Modeling of Emissions Evaluation (FASMEE)



## CMS Phase 3: Seeing the forest for the trees -- Survey



NASA Carbon  
Monitoring Systems  
(CMS) project survey

- <https://forms.office.com/r/TSx9CYnGnw>