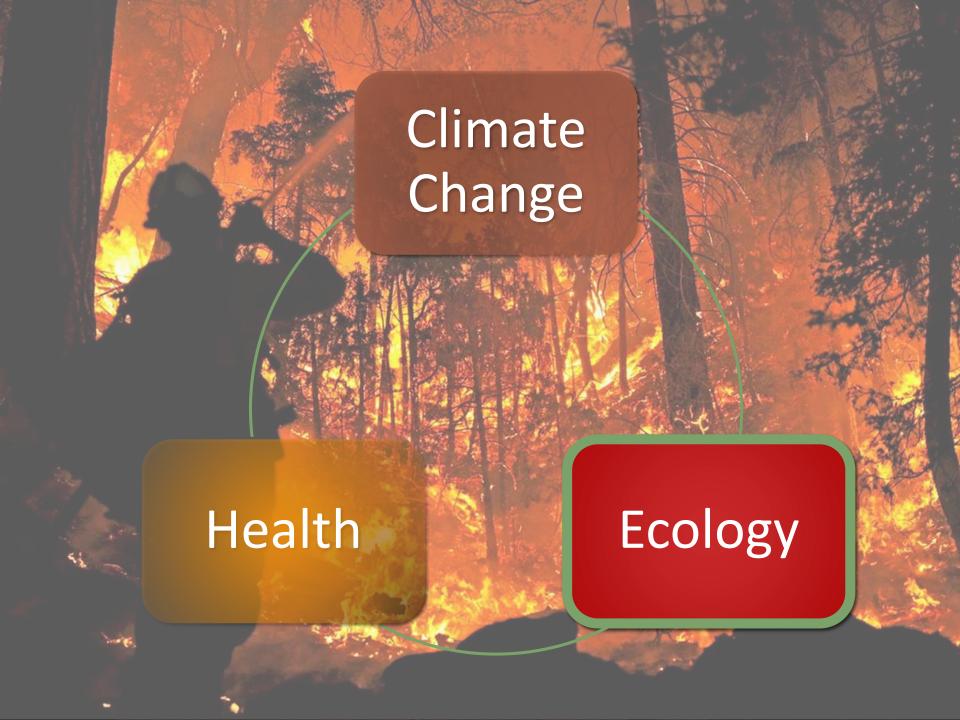
# Wildfire, Smoke & Social Media

#### SONYA SACHDEVA

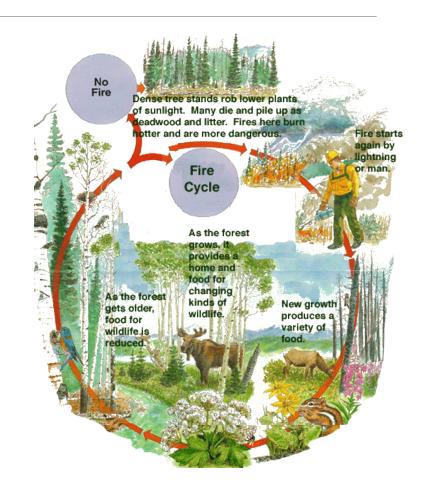
USDA FOREST SERVICE — NORTHERN RESEARCH STATION SONYASACHDEVA@FS.FED.US



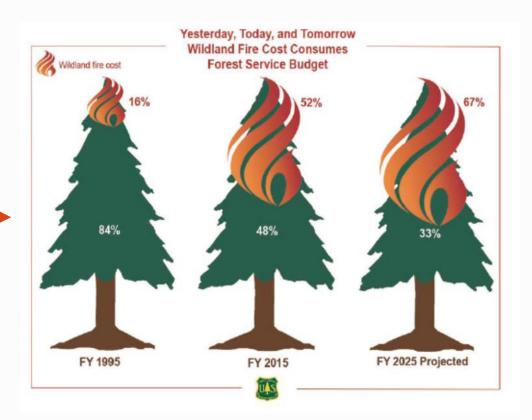


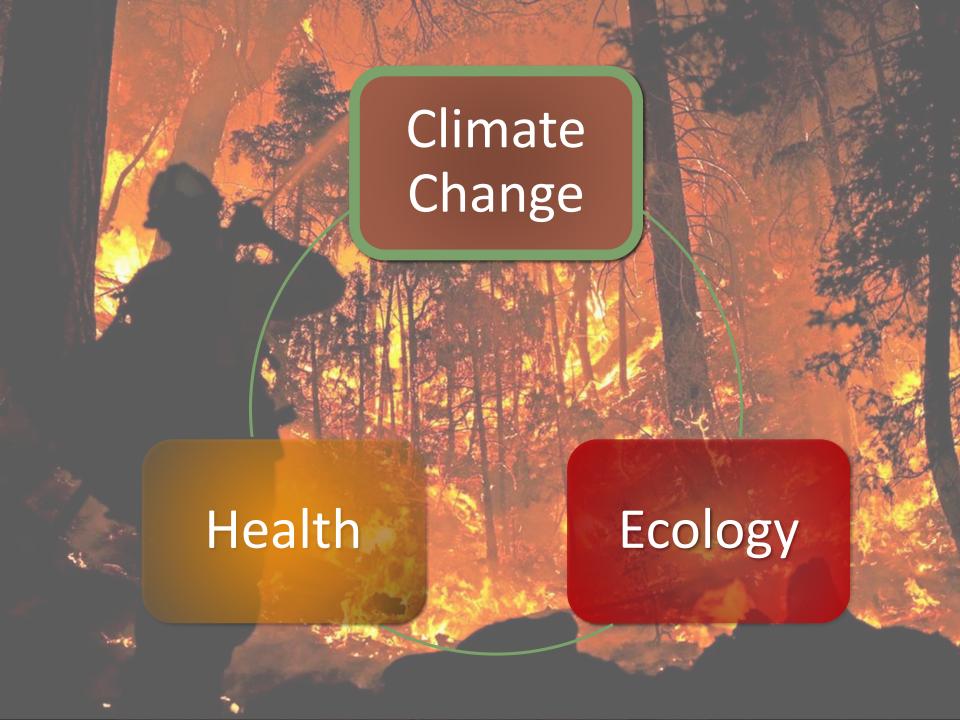
## Fire Ecology

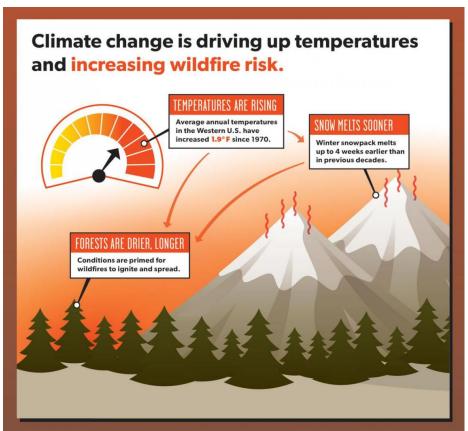
- Fire is a constant/necessary component in many ecosystems
  - Fosters regrowth
  - Creates pasture and grazelands
  - Critical for seed germination
  - Increased biodiversity
  - Soil health
  - Kills pests
  - Safety barriers
- Without fire:
  - Increase fuel
  - Hotter, more severe fires
  - More destruction



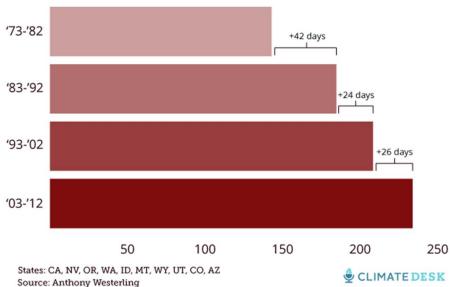








# The season for large fires in the West is getting longer Days between first and last fire greater than 1,000 acres, decade average

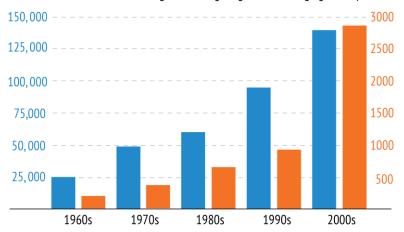


~ 10 million acres is the new norm



#### Living in the danger zone

As the population living in the wildland urban interface has expanded, the average number of structures that have been destroyed by fires each year has grown. Those additional homes at risk of burning make firefighting more challenging and expensive.









- -Smoke from wildfires creates haze for hundreds of miles, releases particulate matter
- NRDC analysis shows that about two-thirds of the United States (212 million people) lived in counties affected by smoke conditions

#### Wildfires Often Cause the Worst Air Pollution Days of the Year

Springerville, Ariz., 2011

Best Day

Average Day

Worst Non-Fire Day

During Wildfire Day

4000	COURSE UNIVERSITY	UNHEALTHY		U	VERY UNHEALTHY		HAZARDOUS		
0	45	90	135	180	225	270	315	360	

# Why is smoke dangerous?

Smoke releases microscopic particulate matter (PM2.5)

#### Wildfire smoke has been shown to cause:

- Respiratory illnesses (asthma, coughing, wheezing, COPD)
- Cardiovascular outcomes (heart attacks, chest pain symptoms)
- Other health effects including:
  - Lower birth weight
  - Higher inflammation
  - Bone marrow content
  - Physical strength



Georgia Health News Nov 15, 2016 (0)

Air quality warning extended; residents encouraged to stay indoors

Wildfire smoke leads to air quality alert
Updated: 4:54 PM EST Nov 15, 2016

Pediatrician: Take precautions to protect children with asthma from wildfire smoke

Liv Osby , losby@gannett.com 11:32 a.m. EST November 15, 2016



LOCAL NOVEMBER 15, 2016 10:01 AM

Unhealthy air quality forcing some Middle Georgians to stay inside due to heavy smoke





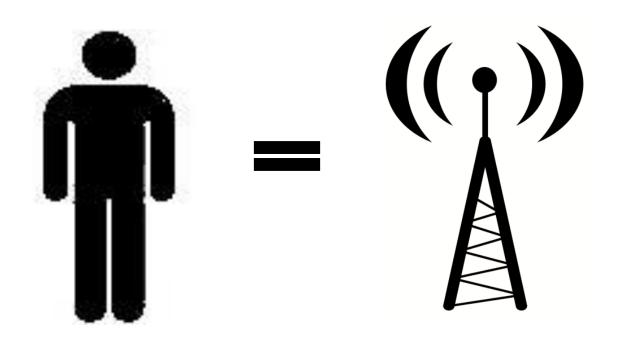
#### **Current Problem:**

Accurate measurements of air quality impacts are often unavailable due to sparseness in monitoring center locations



#### Possible Solution:

Can we estimate air quality without physical monitoring by using other, already available, information sources?

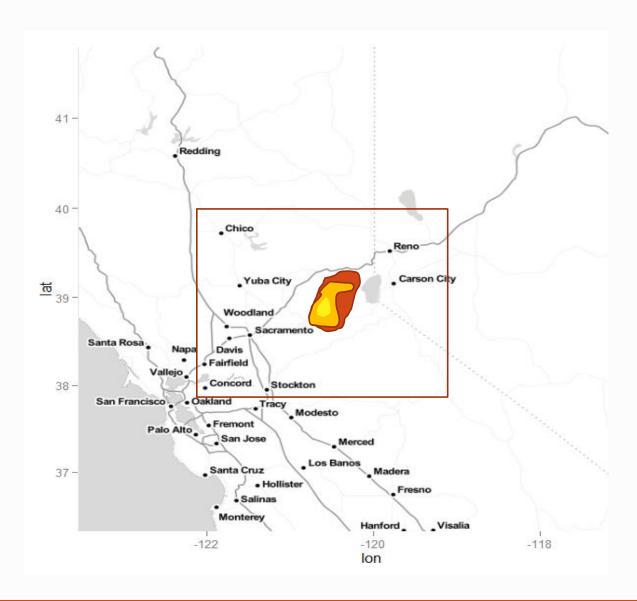


#### ~30 minutes of Twitter geocoded data



- Any way of leveraging more widely available, dynamic data?
  - Social media data
- Twitter data has been applied in meaningful ways to address many societal issues
  - Health problems
  - Earthquake prediction
  - Traffic management

#### King Fire



Northern California wildfire between September 13<sup>th</sup> and October 15<sup>th</sup>

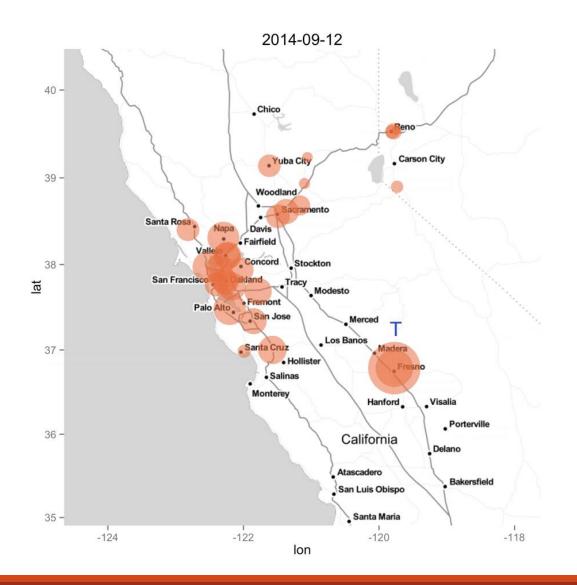
~ 97,000 acres of land

Collected ~15K tweets that related to the King Fire between September and October, 2014

Assessed correspondence with Air Quality Data from the EPA

Sachdeva, S., McCaffrey, S., & Locke, D. (2016). Social media approaches to modeling wildfire smoke dispersion: spatiotemporal and social scientific investigations. *Information, Communication & Society*, 1-16.

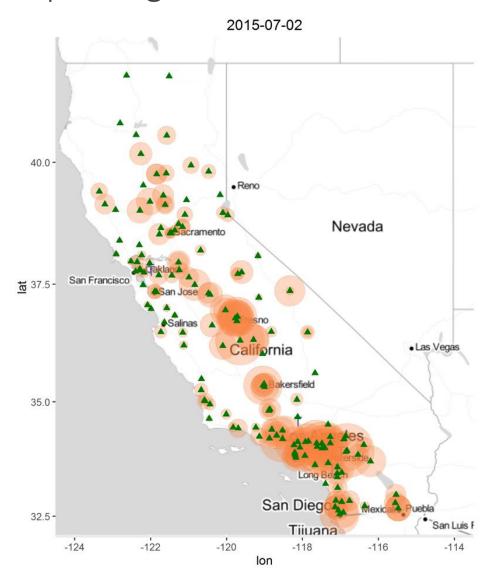
#### Spatio-temporal Model: Air Quality & Frequency of Tweets



23% of daily variation in PM2.5 can be explained by the number of tweets relating to the King Fire

Sachdeva, S., McCaffrey, S., & Locke, D. (2016). Social media approaches to modeling wildfire smoke dispersion: spatiotemporal and social scientific investigations. *Information, Communication & Society*, 1-16.

#### Expanding to Statewide Fires – 2015 Data



8,745 fires burned a total area of 893,362 acres

~40,000 tweets about wildfires

Similar relationship between frequency of tweets about wildfires and PM2.5 levels

Begin to see where there are gaps in monitoring station data.

- Not as much of a concern in California, but useful in more other remote places

# Combining Social Science with Spatio-temporal Modeling

- In addition to geographic information, tweets give realtime insight into how people *encounter*, *adapt* and *manage* wildfire and smoke risk

- Used topic modeling approach to understand semantic content embedded in social media conversations about wildfire

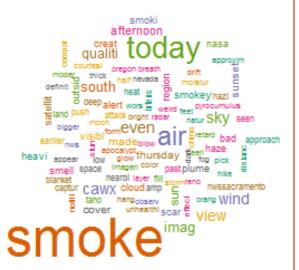
### Examples of Tweets

"my eyes are burning smelling smoke and i am coughing too...staying inside"

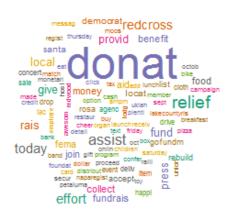
"cough-cough. hazy skies over merced caused by wind change and rough fire smoke."

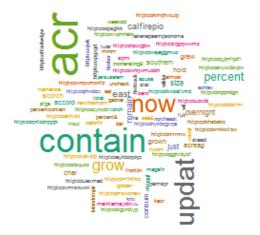
"over last 72 hours er visits from cough up 90% other resp. er visits up 411% according to fresno cty dept of public health roughfire"

"thank you butte fire you just reduced my life expectancy by about 3 years. <cough&gt; &lt;gag&gt; &lt;wheeze&gt; lotsasmoke"



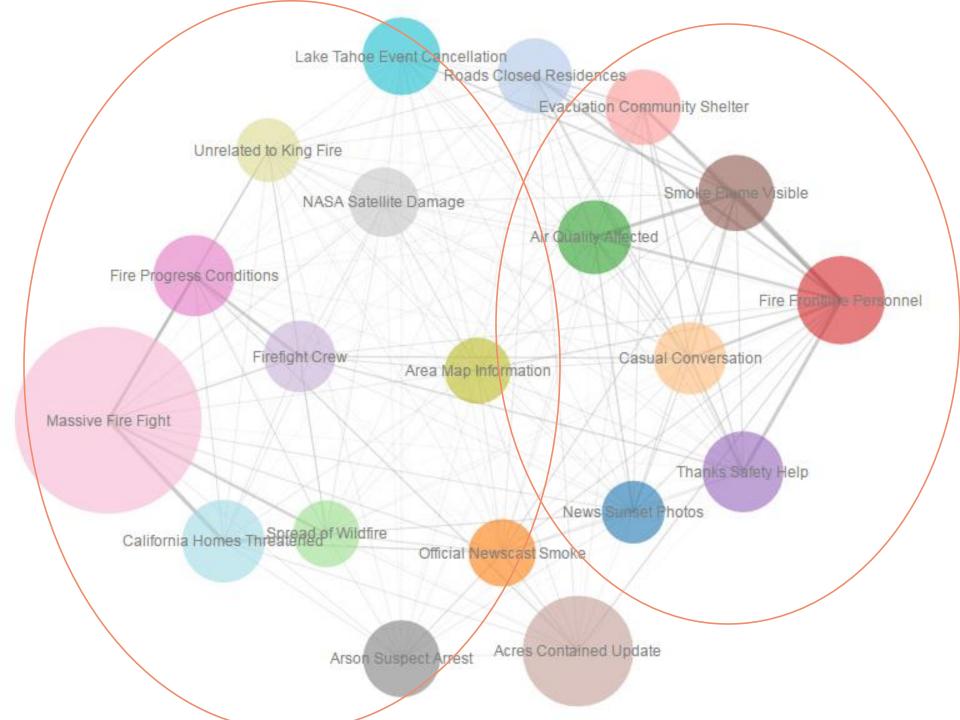




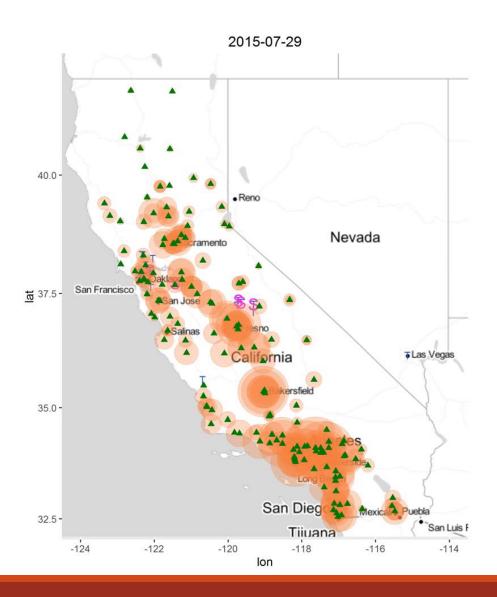








#### Expanding to Statewide Fires – 2015 Data



 Tweets that discussed smoke more often were better predictors of air quality than others

 Novel approach of combining the content of people's tweets with the location, yields greater insight into areas of concern

# Fires beyond the US



- Indonesian wildfires in 2015 have burned 6.5million acres
- Estimates suggest that 100,000 premature deaths could be caused by respiratory effects from wildfire smoke
- Wildfires are not a strict ecological component within tropical rainforests
  - Result from slash and burn practice of deforestation, conversion to farmland
- Our model could be essential in these regions