

# US Wildfire

What do we know?



# North American Wildfire

- Recent Events
- Changing Risk Environment
- Available Tools
- Evaluation
- Conclusions

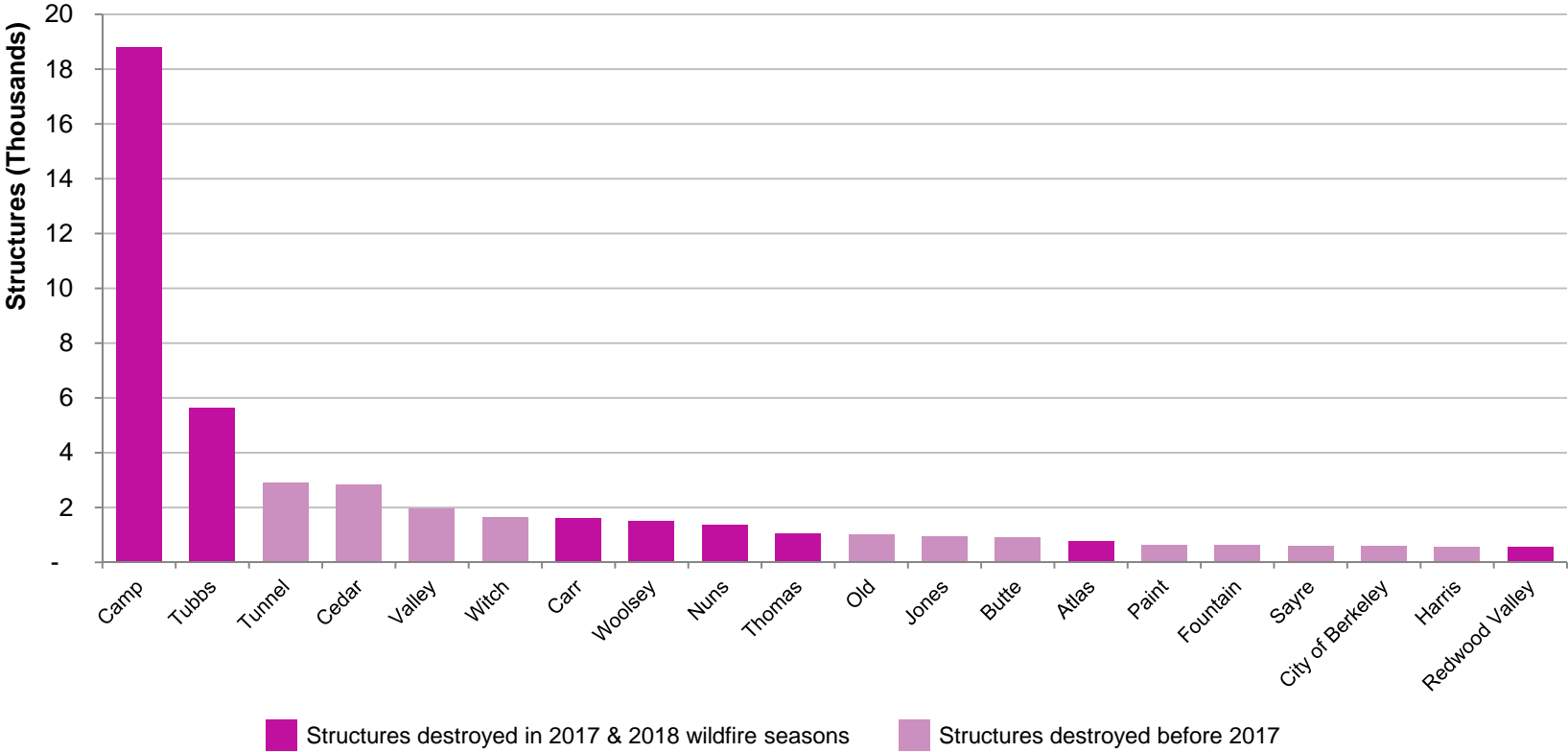
An aerial photograph showing a volcanic eruption. A bright orange and red lava flow is moving down a slope, bordered by a dark, rocky path. To the left of the path is a dense green forest. The sky is dark and smoky. A white rectangular box is overlaid on the top right of the image, containing the text 'Recent Events' in purple.

## Recent Events

# CA Wildfire State of the Market

## Top 20 Most Destructive Wildfires

### Top 20 Most Destructive California Wildfires: Number of Structures Destroyed



**67.3% of structures in top 20 were destroyed in last 14 months**

Cal Fire data as of 11/25/2018

## Questions

- Is wildfire risk changing?
- If so, why?
- How well can we quantify wildfire risk?

## Model Performance

### Notable Wildfires

#### Carr (2018)

**1,857**

structures burned



**60%** Extreme

**40%** High

**0** Moderate to  
Negligible risks

#### Camp (2018)

**14,500**

structures burned

**16,000+**

Within perimeter



**16%** Extreme

**64%** High

**20%** Moderate

**0** Negligible risks

#### Woolsey (2018)

**1,500**

structures burned

**18,000+**

Within perimeter



**9%** Extreme

**63%** High

**28%** Moderate

**16** Negligible risks



# Wildfire Modeling

# Choosing a Wildfire Model

## Overview of available tools

	Tool	Geographic Coverage	Willis Re Overview	Market Utilization
Stochastic Model	AIR Wildfire Model (new)		For many portfolios results are increasing	New to market
	AIR Wildfire Model (pre-2018)		Stochastic model that has not been updated since original release 10+ years ago	Most utilized probabilistic model
	CoreLogic® RQE Brushfire Model		Overall vendor has become a distant third to AIR and RMS in the past decade	Some usage
	RMS Probabilistic Model		New RMS Model with a planned release in late 2018 / early 2019	Unreleased
Risk Hazard Score	Willis Re Wildfire Hazard Score		Up to date scientific modeling that outperformed other vendors in 2017 fires	New to market
	CoreLogic® Risk Score		Tool that combines wildfire with 8 other hazards to develop a single score	2nd most utilized risk scoring tool
	FRAP Score		Location based hazard score based upon geography sourcing data from California Department of Forestry and Fire Protection	Limited usage
	Historical Wildfire Frequency		Used to identify the frequency of wildfires affecting individual locations sourcing data from California Department of Forestry and Fire Protection	Limited usage
	ISO FireLine Score		Provides a score for the risk factors of fuel, slope, access and does not consider weather or proximity to vegetation	Most utilized risk scoring tool
	RedZone		Wildfire tracking, exposure assessment and underwriting	Some usage
	RMS Wildfire Hazard Score		Utilizes several data sources to estimate hazard in and around high-risk wildland-urban interface	Some usage
	Wildfire Hazard Potential Score		Hazard score based tool that has not been updated in several years	Limited usage
	Wildfire Defense Systems®		Combines professional wildfire consulting with wildfire suppression services	Limited usage

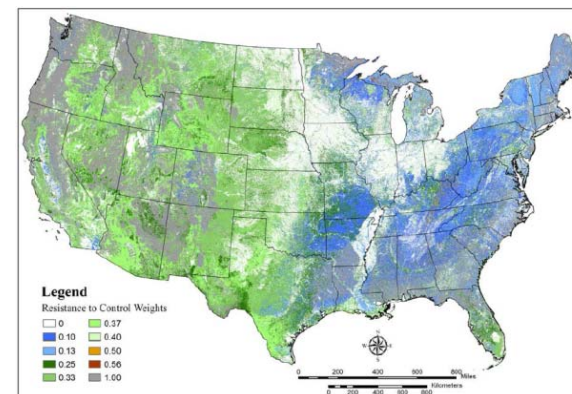


# Willis Re Wildfire Score

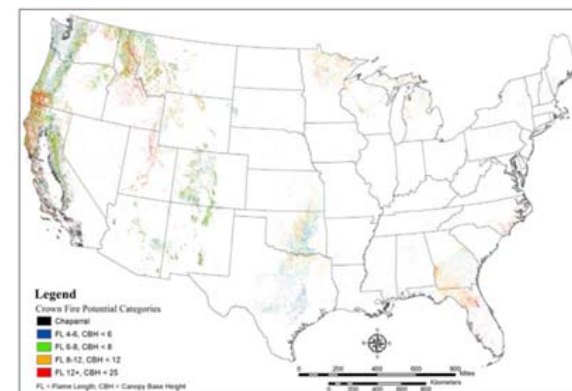
Model Foundation – USFS

- 50,000 years of stochastic wildfires developed by the US Forest Service
- Developed by leading wildfire science research group in the country
- Latest and highest resolution data sources available
  - Dataset updated on regular basis
- Highest resolution data source available
- Employs cutting edge fire physics
- Evaluates the risk of large wildfire occurrence and its interaction with populated regions

Resistance to Control Weights



Crown Fire Events



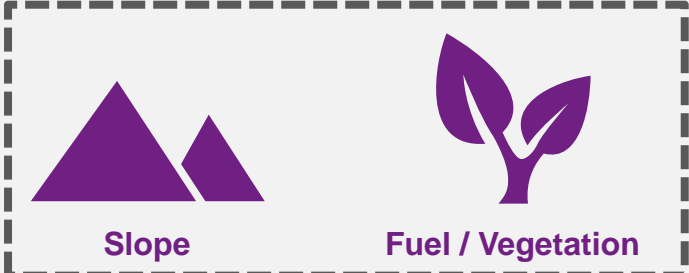
# Willis Re Wildfire Score

## Model Foundation – USFS

Deterministic, physically-based fire propagation considers the following:



Elevation



Slope

Fuel / Vegetation



Wind



Fuel Moisture

*FireLine considerations*

Synthetic weather generated nationally, with hourly characteristics including:



Temperature



Wind Speed

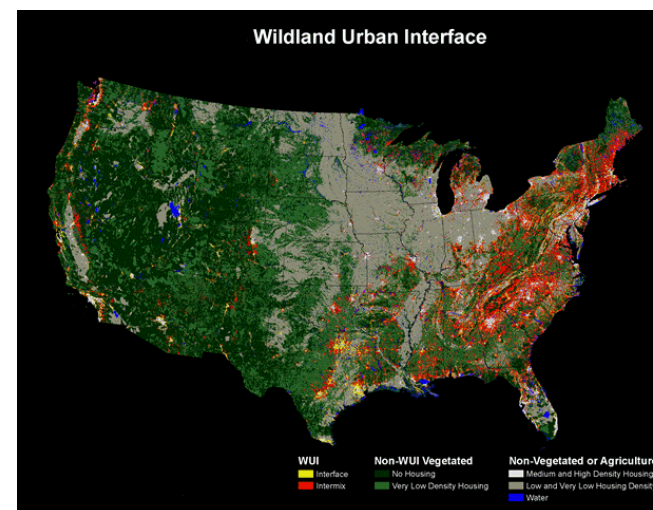
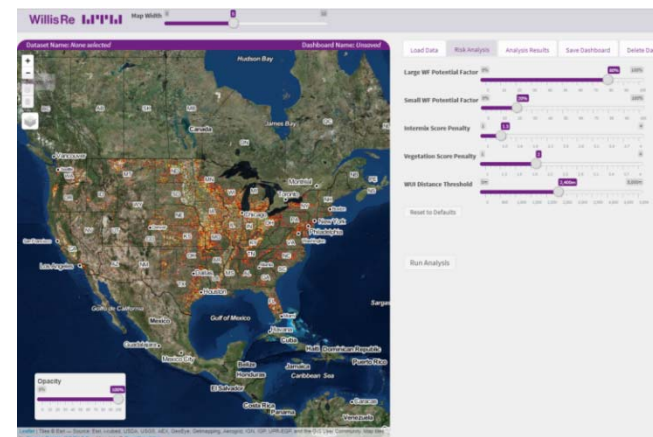


Humidity

## Willis Re Wildfire Score

### Willis Re Proprietary Model Components

- Historical wildfire occurrence based on 100 years of data
  - Considers frequency of small fires that are not modeled in stochastic dataset
- Analyzes the most extreme types of wildfire risk, such as crown fires
- Considers regional efficiency of suppressing wildfires
- Contemplates distance from the wildland urban interface (WUI)
  - The WUI is the intersection of populated and wildland regions



# AIR 2018 Wildfire Model



First updated stochastic wildfire model in nearly ten years.



First stochastic wildfire model with coverage outside of California



Release comes at a time of changing risk perceptions for wildfire



## New Touchstone v6 AIR Wildfire Model

### Expanded model domain:

Arizona, California, Colorado, Idaho, Montana, Nevada, New Mexico, Oklahoma, Oregon, Texas, Utah, Washington, Wyoming

- Previously California only



### Entirely new hazard module,

which uses weather and wildfire relationships in relation to ecological regions (Ecoprovinces)

- **Landscape ecology** considered with historical fire data
- **Fuels data** updated to now include LANDFIRE 2014 along with 40 Scott Burgan fire behavior fuel models
- **Weather patterns** now considered year over year to determine fire size and number of fires per year

*Prior model used LANDFIRE 2007, 13 Anderson fuel models for fire season, and was based on statistical distributions of historical wildfire activity.*

# New event catalog

**10,000 year**  
stochastic  
catalog of  
**729,836**  
**events**

**Includes fire**  
**clusters**  
defined by the  
hours clause

Minimum fire  
size is  
**100 acres**

**17** historical  
events are now  
available  
**New feature!**

1. 1991 Oakland Hills, CA
2. 1993 Laguna Canyon, CA
3. 1993 Old Topanga, CA
4. 2000 Cerro Grande, NM
5. 2002 Rodeo-Chediski, AZ
6. 2003 Cedar, CA
7. 2003 Old, CA
8. 2007 Witch, CA
9. 2010 Four Mile Canyon, CO
10. 2011 Bastrop, TX
11. 2012 Waldo Canyon, CO
12. 2013 Black Forest, CO
13. 2015 Butte, CA
14. 2015 Valley fire, CA
15. 2017 Mendocino Lake Complex, CA
16. 2017 Thomas, CA
17. 2017 Tubbs/Atlas fire, CA

## Previous Model

- Included only 211,040 events
- Did not include fire clusters
- Had 640 acre minimum fire size

## New Touchstone v6 AIR Wildfire Model

**Fire spread model** incorporates four types of fire spread:

- Surface
- Canopy
- Surface to canopy
- Fire branding /spotting

**Wildland Urban Interface (WUI)** penetration algorithm to advance fires into urban areas

- Previously based on distance into the urban area instead of burnable fuels

### **New secondary risk characteristics introduced**

- Defensible space
- Firewise community

**Damage estimation** uses flame length as intensity parameter

- Prior used windspeed.

**New** Loss calculation for risks with unknown characteristics

# AIR 2018 Wildfire Model

## Model Domain & Data Sources


### Model Domain



### Data Sources

- Historical wildfires
- Ecoprovinces
- Weather
- Fuels
- Wildland Urban Interface
- Wind
- USFS Fire Occurrence Database
- USFS Ecoregions
- US CPC
- Landfire 2014
- 2010 USFS WUI (Martinuzzi)
- NOAA NARR Model



An aerial photograph showing a volcanic eruption. A bright orange and red lava flow is moving down a slope, bordered by a dark, sandy path. To the left of the path is a dense green forest. The sky is dark and smoky. A white rectangular box is overlaid on the top right of the image, containing the text 'Model Performance' in purple.

## Model Performance

An aerial photograph showing a wildfire. A dirt road runs diagonally from the top left towards the bottom center. To the left of the road is a dense green forest. To the right of the road, a large area of trees is engulfed in bright orange and yellow flames, with thick black smoke rising from the fire. In the top right corner, there is a white rectangular box containing the title text.

## Is Wildfire Risk Changing

# Changes in Wildfire Risk in the Western US

## Three Possible Mechanisms



**Climate  
Change**



**Exposure  
Change**

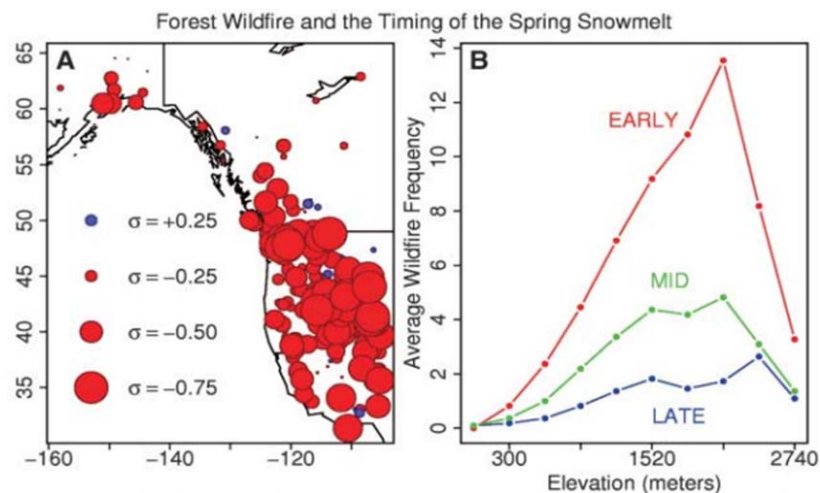
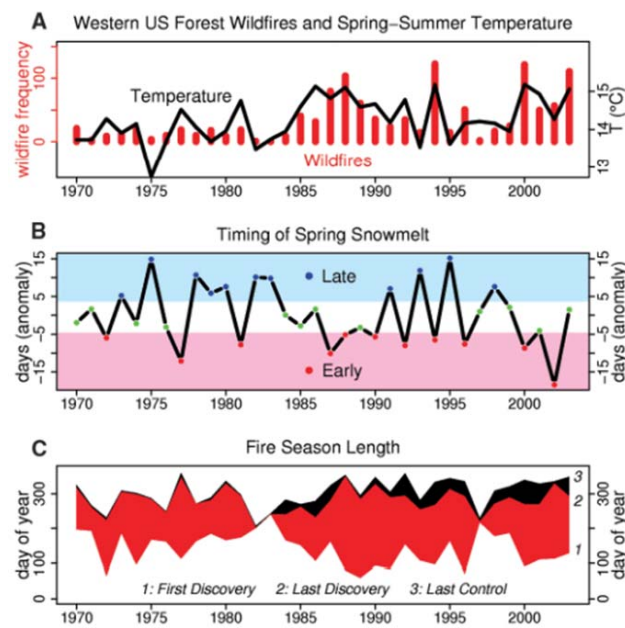


**Land Use  
History**



# Climate Change

- Increase in Moisture Variability
  - PDO
  - ENSO
- Snowmelt Timing
- Spatial Distribution of the Forest Area
- Sensitivity to Water Balance
  - N Rockies
  - N California



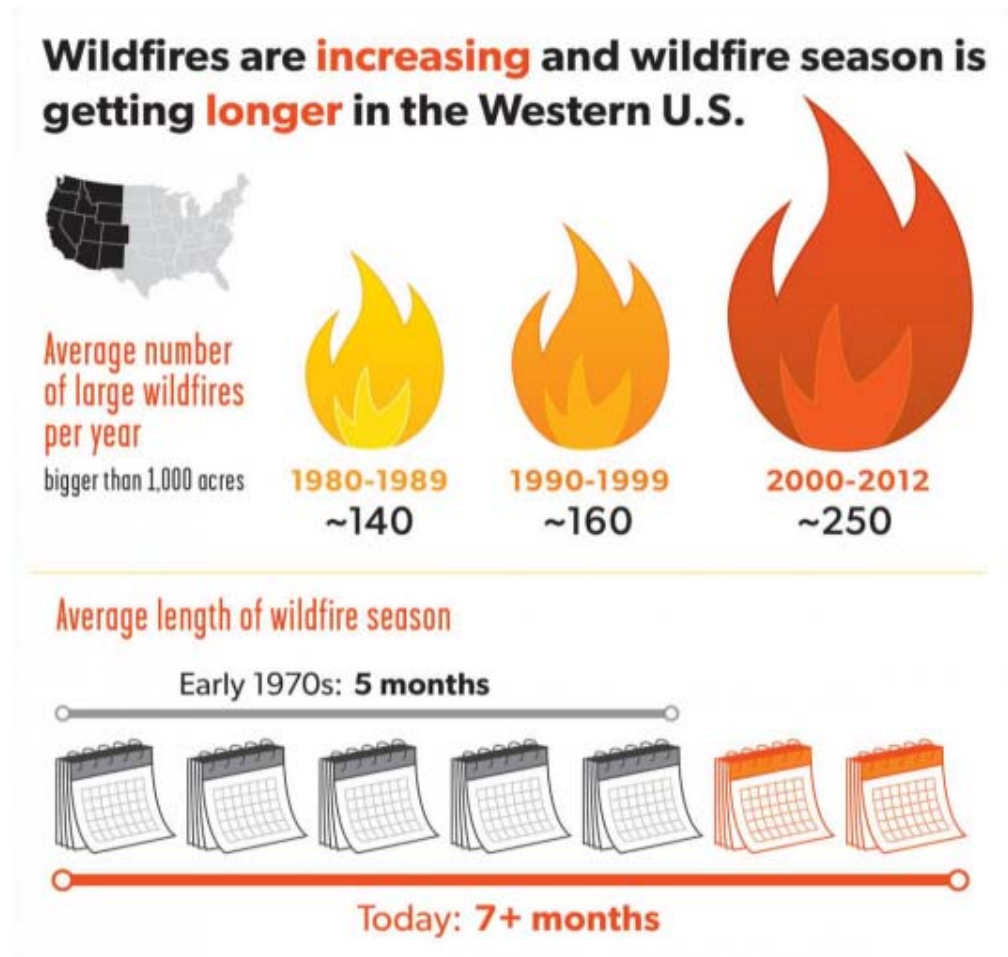
# Climate Change

## Regions of Notable Increase

- Colorado
- Northern California








## Regions of Lower Increase

- Southern California
- Arizona



*If increased risks are largely due to changes in climate during recent decades, then restoration and fuels treatments may be relatively ineffective in reversing current wildfire trends.*

## Exposure Growth

State	Rank	Total area km2	Area of WUI (km2)			Expansion of WUI Area (km2) 1990-2010	Percent Change in WUI Area 1990-2010
			1990	2000	2010		
 Idaho	1	216,442	2,451	3,318	4,220	1,769	72.20%
 Montana	2	380,831	3,168	4,079	5,304	2,135	67.40%
 Colorado	3	269,602	5,713	7,600	9,438	3,725	65.20%
 Utah	4	219,884	2,197	2,735	3,549	1,352	61.50%
 Nevada	5	286,380	1,513	2,069	2,440	927	61.20%
 Wyoming	6	253,334	1,541	1,868	2,412	871	56.50%
...							
 California	41	423,967	22,618	24,375	27,026	4,407	19.50%



# Conclusions

## Summary

- It isn't immediately clear which is driving the most significant changes in wildfire risk, changing weather patterns or changes in exposure.
  - But both are contributing.
- Today's models rely on historical information to predict extreme future event frequencies.
  - Spatial Changes
  - Frequency Changes
  - Intensity Changes
  - All invalidate this assumption
- Modern models are undoubtedly an improvement over prior tools and can assist in pricing, underwriting and portfolio management.



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