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Open access to the next generation of wildfire risk models and information



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BACKDROP

Climate impacts California wildfire risk

Thermodynamic: through temperature, moisture deficits, drought Subsequent tree mortality: buildup of heavy ground fuels could create "mass fires" Changes to atmospheric circulation

Future projections predict wind events decrease, increase, or persist in frequency Seasonality, evolving vegetation

Extreme wind events are a critical factor driving many CA devastating wildfires Reconstruction of historical extrema disagree Expansion of fire risk intelligence: weather station network, state/utility "op centers", Wildfire Mitigation Plans, PSPSs Still, detection & forecasting of wind extrema and fire growth are elusive

Most destructive fires occur in the wildland urban interface and intermix where structures and wildland fuels comingle



"Extreme" fires by the numbers:

- Only 3-5% exceed 100 ha
- Largest 1% account for 80-96% of area burned
- Over the historical satellite record of burned area, days with very large daily fire growth are infrequent
- Occurrence results from a *multi-scale* "Perfect storm":





Fire size, thousand acres

We characterize conditions leading to historic CA extreme fire weather/growth with a 2-track approach: • Extreme Weather Typing Identify archetypal regional weather patterns associated with past days of large fire growth over the satellite fire detection era in distinct regions across CA

- Historical trend analysis
- Identification in climate projections

Fine-scale

deconstruction of key events Refine understanding of the airflow regime and fire behavior in these types with convective-scale simulations of key/typical wildfire events using a coupled weather-fire model

 Identify conditions for extreme winds & "hotspots"

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Characterizing Historical Fires: Extreme weather typing

- **Hypothesis:** limited set of Extreme Weather Types (XWTs) that favor large daily fire growth
- Method:
 - Specify 8 homogeneous, distinct Fire Weather Regions that feature similar fire environment conditions
 - Compare ECMWF 5th generation global reanalyses (ERA5) daily average fields with Global Wildfire Information System (GWIS) dataset (Art´es et al., 2019) Jan 2001 - Nov 2019, NASA FIRMS for 2020
 - Adapt ML cluster analysis (Prein & Mearns, JGR-A, 2021) to identify 2-4 XWTs associated with the days with largest daily burned area in each region

A Prein, J Coen, A Jaye (2021) The character and changing frequency of extreme California fire weather. J. Geophys Res. Atmos. (Submitted)



Extreme Weather Typing (XWT) Analysis

- Use the GWIS daily burned area product to accumulate daily burned area in each region (NASA FIRMS for 2020)
- Select the top N (4, 6, 10, or 16) days that are at least a week apart
- Select atmospheric variables that could characterize the large-scale flow conditions and their impact on fire behavior.
 - Tested 33 variables encompassing dynamical forcing (wind at various heights, pressure), thermodynamic forcing (T and moisture at various heights), and convective forcing indices for ability to predict extreme daily burned areas
 - Test all possible combinations of up to 3 of the 33 variables to ID variables whose spatial gradients have the most predictive skill



200

50

burned area [km² day⁻¹] 20

Summary of XWT results:

- The most extreme fire growth days are associated with archetypal weather patterns (XWTs)
- Some XWTs are familiar (such as Santa Ana/Diablo wind events), others less so
- Clear seasonal cycle with summer and autumn maxima
- Extreme fire days dominate burned area statistics, with top 1% of days accounting for between 35% in the Northern region – 77% in San Diego region.
- The rapid increase and decay in daily burned area indicates that extreme fire days are closely related to short-term weather conditions more so than slowly changing factors, as found elsewhere (Abatzoglou & Kolden 2011; Riley et al. 2013)





Overview of the synoptic conditions (arrow colors) and predominant low-level wind direction of identified XWTs in all eight sub-regions

XWTs allow us to characterize fires by types & flag days with potential for exceptional fire growth Ex.: LA region *Wind-driven fires that occur under*



* Pattern associated with the XWT.
* Duration

- * Monthly occurrence frequency (seasonality)
- * 3 variables found to best characterize XWTs

Sierra-West Region



SW-D: strong NW winds on west side of a trough with surface downslope

SW-TW: SW winds within a high pressure system SW-L: NE winds within a thermal lowpressure system



Sierra-East Region



SE-TW – SW winds in a trough

SE-H –W/SW winds caused by anticyclone over Four Corners area SE- dry, SW winds caused by a ridge





Figure 4. Annual cycle of current climate (1975–2015) XWTs in the NCD20C (gray bars), LENS (blue bars), and future climate (2060–2100) LENS simulations (red line). Results for different fire regions are chosn in rows and XWTs are shown in columns. Month that have significantly different XWT frequencies in the current climate LENS simulations compared to NCD20C are highlighted with a blue asterix. Months with significant changes in future climate XWT frequencies are highlighted with a red astrix. Significance is assessed by a two-sided Mann-Whitney U test (P=0.05).

Future:

Eastern Sierras: increase in frequency in springsummer wind events

Western Sierras: Contraction in the Diablo season and decrease in frequency. Shift in month of the upslope events deeper into fall

Multiscale analysis of historical fires: Joining the scales



Approach: Catalog susceptibility to types of events across CA & place in knowledge framework for practical use

Mechanisms for extreme fire growth:

Rapid fire growth occurs at either end of a spectrum

Wildland **fire events** are often classified as either **wind-driven** or **plume-driven**, depending on which appears to be driving fire growth. Both types are ultimately driven by strong winds, but....





Ambient winds are usually weak. Strong winds are internally generated by fire's heat release ("fire-induced winds")

Ambient winds are strong. Events often associated with exceptional ambient winds.

Currently: Events appear mysterious because extrema at both ends are the weakest links of current tools Whether plume-driven fire-induced winds or complex airflows in mountainous terrain, no simple tool succeeds.

Wind-driven wildfire events - Background (1) Idealized examples

- Airflow over complex terrain: flow regimes
 - Some of important parameters: atmospheric static stability (lapse rate), wind speed, terrain aspect ratio (slope). Flow can do many different things.
 - Whiteman Mountain Meteorology describes many flow regimes





Fig. 1a. Neutrally stratified air is easily carried over a mountain barrier and may produce eddies on the lee side. (From Whiteman, 2000)



Fig. 1b. Depending on air speed and stability, steepness may cause airflow to separate from the ground on the lee side of terrain. (From Whiteman, 2000)

Isentropes – lines of constant "potential temperature"







Fig 2. a) Schematic of generation of gravity waves, b) Vertically propagating mountain wave, and c) trapped lee wave. All figures from Whiteman(2000).

Wind-driven wildfire events: Background (2)

Looking for real analogues in other locations

- In investigations of 2000s Diablo/Santa Ana fire events, analogies made with studies of windstorms. Ex.: CO Front Range of Rocky Mountains
- Hypotheses: atmospheric gravity wave steepening and/or breaking, wave reflections from critical levels....

• Do these apply to CA events?



FIG. 26. Isentrope field for the 11 January 1972 severe wind storm in Boulder (after Lilly, 1978).

Flow regime factors influencing microscale winds in offshore wind-driven events

High speed winds that back (rotate counterclockwise) with height from Surface to mid- atmosphere



Very stable layer (~1-1.5 km deep) of air near the surface 72489 REV Reno ЩĻ, 100 200 300 400 MIN/ MA 500 600 700 800 900 1000 20 12Z 08 Nov 2018 University of Wyoming

Topography features



This combination – very stable surface layer traveling at high speed over a range of terrain features creates unique flow effects (but doesn't support waves).

Wind-driven wildfire events

San Jose

2017 Napa Firestorm 4D weather simulated using CAWFE model Shown: near-surface wind Oct. 8 11 am – Oct. 9 2017 ~4 PM PDT

- Events vary in strength (based on pressure gradient)
- Location of strongest winds passes from north to south
- Great deal of variability across CA
- Little examination of details in Santa Ana or Diablo airflow
- CA events are unique, few resemble existing scientific literature
- Important science gaps.



Phoen

The Diablo wind event created local regions with greater accelerations, stagnation regions, and pulses/surges

Method

- Apply CAWFE coupled weather – fire model optimized for fine-scale simulations in complex terrain to historical fire events
- Value: Captures additional factors that influence fire behavior
 - o fire-induced winds
 - fine-scale accelerations underlying exceptional wind maxima
 - transient weather factors like pyrocu and gust fronts
 - o fire phenomena





The CAWFE[®] model couples Numerical Weather Prediction with a wildland fire behavior module

a. The Clark-Hall Numerical Weather Prediction Model

Solves prognostic fluid dynamics equations of motion for air momentum, pressure, a thermodynamic variable, water vapor, and hydrometeors on a finite difference grid.

 Dynamic core 3-dim., time dependent Nonhydrostatic, anelastic Solution method Terrain-following coordinates, vertically stretched grid Vertical + horizontal grid refinement 2-way interacting nested domains OpenMP^a and MPI^b parallelization 	 Large-scale initialization of atmospheric environment using gridded analyses or forecast Models formation of clouds, rain, ice, and hail in "pyrocumulus" clouds over fires Tracks smoke transport Physics packages Aspect-dependent solar heating 	INCARTECHNICAL NOTE May 1993 Source Code Documentation for the Clark-Hall Cloud-scale Model Code Version G3CH01
 OpenMP^a and MPI^b parallelization Designed for high-resolution (~ 10) 	Os m) simulations in steep, complex terrain.	MESOSCALE AND MICROSCALE METEOROLOGY DIVISION NATIONAL CENTER FOR ATMOSPHERIC RESEARCH BOULDER, COLORADO

Introduction of wx

^a Clark, Hall, Coen 1996: Source Code Doc. for the Clark-Hall Cloud-scale Model. NCAR Tech Note. ^b Clark et al. 2003: Numerical simulations of grassland fires. J. Geophys. Res.

b. A Fire Behavior Module

Overview of Components

1. Represent & track the (subgrid-scale) **interface** between burning and nonburning regions (the 'flaming front')

3. Post-frontal heat & water vapor release. Once ignited, the fuel remaining decays exponentially, acc. to lab experiments (BURNUP).



2. Rate of spread (ROS) of flaming front calculated as function of **fire-affected** wind, fuel, and slope using semiempirical equations (i.e. Rothermel (1972))

4. Heat, water vapor, and smoke fluxes released by surface fire into lowest layers of atmospheric model



by crown fire into atmospheric model

Atmosphere-fire "Coupling" allows the effects of environmental factors to *amplify* and *reinforce* each other through the atmospheric medium

Semi-empirical Spread Rate of a Flaming Front Rothermel (1972)



Wind: has the strongest effect on fire but is "invisible" and the most variable in time and (perhaps) space



CAWFE model configuration for real event

INPUT DATA: (1) Gridded synoptic/global weather analyses (past) or forecast (future)

INPUT DATA: (2) Terrain elevation data

INPUT DATA: (3) Fuel map (surface + canopy fuels)→ spatial variability and fuel moisture INPUT DATA: (4) Fire ignition: Time and location

5 simultaneous nested weather modeling domains with horizontal grid spacing 10 km, 3.33 km, 1.11 km, 370 m, and 123 m telescope from a national forecast...



Grid refinement



...to, for example, a 25 km x 25 km area near a fire.



VIIRS data can be used to start the fire 'in progress' and evaluate the prediction 12 h later



Yellow perimeter: VIIRS fire perimeter used for model initialization Red perimeter: VIIRS fire perimeter 12 h later

Wind-driven wildfire events

Classify problematic areas by:

- Terrain aspect ratio
 - Sierras vs gentler Transverse ranges and west coastal ranges
- Over vs. through:
 - Flow over the top of continuous ranges
 - Flow over but there are notches/saddles
 - Broad dips
 - Narrow breaks aligned along airflow (e.g. narrow river valleys, narrower than NWP forecast)
 - Flow between: Not over, but through broad valleys & passes
- Intersecting airflows
- Local anomalies
- Transience magnitude & period of pulses
- Contribution of built structures on event dynamics



Woolsey Fire November 8, 2018



5 nested modeling domains telescope from regional to microscale resolution

Grid size: D1: 10.0 km D2: 3.3 km D3: 1.1 km D4: 370 m D5: 185 m

D1 starts at 11/08/18 10 a.m. local time



Woolsey Fire

- Santa Ana
- Narrow river of strong winds
- Relatively simple Bernoulli-like (airfoil) acceleration in flow over shallow features but...
- +/- 4 m/s pulses in winds from upwind mountain range, 2 min interval









Woolsey - evaluation





On Oct. 8-9, > 170 wildfires ignited in the Wine Country, northern coastal ranges, and Butte and Nevada Counties to the west, north, and east of CA's northern Sacramento Valley and spread rapidly during local peaks of an unusually strong Diablo wind event

Local mesonet provided an unclear message about what was happening



Regional simulations with a mesoscale model tell *some* of what happened

WRF simulations of Oct. 8, 2017

- Operational models produce strong winds over ridges
 - HRRR: 25-28 m/s near Santa Rosa
- Mesoscale model (WRF) research simulations
 - C. Bowers, R. Fovell WRF sims: peak ~ 31 m/s



Wind Damage suggests extreme winds in area

(photos courtesy of M. Mehle, NWS)



WRF simulated energy spectrum



Skamarock, W.C. Evaluating mesoscale NWP models using kinetic energy spectra. *Mon. Weather Rev.* **2004**, *132*, 3019–3032.

Fire wx forecasters using mesoscale forecasts report **success** at capturing regional wind events' timing and strength.

All finite-difference models stray from natural energy spectra at small scales*, however....

Dynamic core factors like divergence dampener (a result of WRF compressible formulation) and other design choices damp small motions and smooth sharp gradients

- Under-represent small, strong wind phenomena/extrema
- WRF-based coupled weather-fire simulations lack features in fire shape and underrepresent fire phenomena

*LES mode – TKE, periodic boundary conditions etc. trickery



CAWFE simulation of the Tubbs Fire Oct. 8 9 PM – Oct. 9 6:45 AM





Visible and Infrared Imaging Radiometer Suite (VIIRS) active fire detections at 3:09 A.M. Oct 9. 2017

Coen, Schroeder, and Quayle (2018) Atmosphere.

Simulated wind peaks exceed 40 m s⁻¹ (~90 mph) on secondary ridges

Vertical cross section along flow over Tubbs fire Contours: speed in plane



- Shallow (< 1500 m) high speed flow of stable air
 - Surges from upstream move through
- But, Fr >> 1
 - kinetic forces >> buoyancy forces i.e. too fast for stability effects (like waves).
- Meteorological lore: Behaves like neutrally-stratified flow, with acceleration over ridges
 - Our results: *Mostly*, but eddies of extremely fast air shed & flow downstream
- Eddies get additional acceleration over secondary ridges, boosting peak winds over 40 m s⁻¹.
 - Ex: Tubbs ignition area

Coen, Schroeder, and Quayle (2018) Atmosphere.

Redwood Valley Fire

10:40 PM 10/8



Mesonet stations reporting on 10/8/17



Further north, the pressure gradient drover air over a lower barrier in the Sierras, creating a shallow, narrow river of high speed air that reportedly ignited the Redwood Valley Fire.





Date/Time: 2017-10-08 21:00:00

Camp Fire - Paradise, CA 6:15 a.m. - 2:00 PM Nov. 8 2018 1 frame = 1 minute dx=dy=370 m

Satellite Active Fire Detections



Landsat OLI 10:45 a.m. Nov. 8, 2018



Landsat OLI SW image, 11/8/18 10:45 a.m.





Shear instability created pulses of strong winds near the surface over the Camp Fire

Vertical cross section of potential temperature along flow

Vertical cross section of speed in plane



WRF-based simulations of Camp Fire weather and fire growth



20

VIIRS fire detection data



The Camp Fire reached Paradise in about 4 h (~10:45 am). WRFbased coupled models would have predicted that the Camp fire would not have reached Paradise even by the end of the first day (17.5 h).

Or the second - a catastrophic prediction.

Fire growth predictions with WRFbased coupled weather-fire models



The numerical algorithms in WRF community atmospheric model vigorously suppress small scale motions and smooth gradients



Skamarock, W.C. Evaluating mesoscale NWP models using kinetic energy spectra. *Mon. Weather Rev.* **2004**, *132*, 3019–3032.

<u>Results:</u>

- WRF unable to represent small, strong wind phenomena - Small, sharp gradients (i.e. extrema) are smoothed out
 - PSPS intelligence still underestimates wind maxima
- WRF-based coupled weatherfire models are unable to reproduce fire behavior. Local winds driving the wildfires, fire phenomena, and wildfire shape are unnaturally smoothed out
 - This is nevertheless being promoted as an operational forecast tool.

As high pressure inland pushed air over the Sierras toward the coast, a relatively low barrier upwind of Paradise/Oroville allowed a cross-barrier flow stronger than elsewhere in the range



D2: 3.3 km grid spacing

D3: 1.1 km grid spacing

D4: 0.37 km grid spacing

A "wind extrema map" - A worthy goal?

North Complex (Bear Fire)

- Moderate (frontal) wind event
- Winds on downslope faces but strongest within the drainage
- "Drano" effect









North Complex - evaluation



Labor Day wind event

Refining from regional-scale modeling to the microscale brings out locations experiencing strong winds.

Moderate strength events produce strongest winds more within

the canyons.



D1: 10.0 km grid spacing

D2: 3.3 km grid spacing

D3: 1.1 km grid spacing





2014 King Fire VIIRS IR fire maps



The 2014 King Megafire (Sierra Nevada Mtns)

Though widely attributed to drought and fuel accumulation, the King Fire owed its unanticipated rapid growth to (1) microscale circulations within the Rubicon Canyon and (2) fire-induced winds.

> CAWFE simulation 9/16/14 9:45 pm – 9/18/14 10:45 am (37 hr)



Coen,. Stavros, and Fites-Kaufman, 2018: Deconstructing the King megafire. Ecol. Applic.

Photos courtesy of Jeff Zimmerman

Other phenomena:

Multiple plumes



Figure S2. Simulated fire heat flux (in W m⁻², according to color bar at right) from the Control experiment at 2:31 A.M. 17 September showing the King fire's multiple plume



PyroCu at top of canyon







To what extent did dry conditions (through surface fuel dead fuel moisture content) affect fire growth or extent?



To what extent did surface fuel accumulation contribute to rapid growth or extent?

at t=12 h 36 h



Fuel load

Standard properties assoc. with each fuel model

¹/₂ the fuel load in half the depth

Fuel amount has weak effect on how fast fire spreads on flat ground.

Rim Fire

L. Tarnay et al. (2020) Smoke symposium. "Modeled effects of fuel reductic

What if we had been able to treat Rim area with fire beforehand?

- Previous treatments aided the suppression of the Rim fire
 - And help limit September smoke impacts
- · Can we model those fuels and see a difference in fire spread
- Would it have made a difference to have brought fire down farther out of Yosemite?
- Figure adapted from Long et al., 2017





- 15000 - 12000 - 9000 - 6000

- 3000

Date/Time: 2013-08-20 21:00:00



Poorly characterized winds



Uncertainty in fuels exceeds treatment effects



VIIRS fire progression, Courtesy W. Schroeder

Identifying areas at risk for rapid large fire growth

Simulated 12-h of growth from *hypothetical* ignitions along the Yuba River Valley

On 9/17/14 (the day of the King fire run), weather was typical for fall – weak southwesterlies.



3 of 4 hypothetical ignitions along the Yuba River generated small fires.

Yuba River Valley



#3 had the same weather and fuel conditions, but the ignition near Goodyears Bar grew rapidly - 12,140 ha (30k acres) in a 12 h burning period - due to fine-scale atmospheric circulations and fire-atmosphere feedbacks.

"Plume-driven" fire takeaways:

- "Extreme" fires can occur during conditions (weather) that are not extreme.
- Primary factors shaping a fire and driving the rapid growth (microscale circulations and fire-induced winds) may not be apparent.
- Fuel moisture and load may only have noticeable impact where fires are growing upslope, where they can reinforce each other.
- Small factors and luck (ignition location) can make or break large fire growth among several ignitions in similar conditions



Susceptibility in river valleys in Sierra West & coastal regions

What controls the growth of plume-driven fires?

- Varying fuel & moisture content had small effect on ROS, effect was limited to inclined terrain, where their effect was combined.
- Weather window closed (recall XWTs)
- Some are topographically limited. But...

Prein et al.: Back to back XWTs increasing?



CO East Troublesome fire: spotted over Continental Divide



Summary



- Risk: regional weather patterns, local wind flows, seasonality of weather patterns overlapping susceptibility
 - "Camp Fire" scenarios can't happen everywhere
 - Weather station network and mesoscale forecast models (and associated products) are much coarser than topography here, and still do not indicate the strength of wind maxima
- Filling a scientific gap.
 - Because of unique flow factors, certain topographic configurations in wind events can produce local rivers of strong, gusty winds
 - Problem areas vary with strength of event
- Cataloging mechanisms/locations with potential for factors to combine creating an extreme growth day
- Multiscale aspects to risk
 - Not every fire has potential to become megafire
- Fire weather index, hot dry windy, etc. attempt to get at danger. XWT typing, trends in their frequency, and mechanisms for generating rapid fire growth are another approach to identifying a high risk day/location

Thank you.

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