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Supporting Information for

**Rapid Growth of Large Forest Fires Drives the Exponential Response of Annual Forest-Fire Area to Aridity in the Western United States**

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## 2 **Introduction**

3 For this and future work, we developed a new database of locations and sizes of individual fires  
4 in the western United States (US), which we refer to as the Western US MTBS-Interagency  
5 (WUMI) wildfire database. Below we describe the database in further detail.

### 6 **Text S1. Database production**

7 The cornerstone of the WUMI wildfire database is the set of high-resolution maps of large  
8 wildfires ( $\geq 4.04 \text{ km}^2$ ) provided by the Monitoring Trends in Burn Severity (MTBS) program  
9 (Eidenshink et al., 2007). The MTBS program uses Landsat satellite imagery to map burned areas  
10 at 30-m resolution for thousands of large wildfires across the western US. As of September 2021,  
11 the MTBS database extended from 1984-2019. We excluded prescribed fires from our database.

12 The NWCG dataset has been used in several other western US fire-climate studies (e.g.,  
13 Westerling et al., 2011; Keeley & Syphard, 2018; Williams et al., 2019) and is a  
14 compilation of fire records from six federal government agencies: the Bureau of Indian Affairs  
15 (BIA), Bureau of Land Management (BLM), Bureau of Reclamation (BOR), National Park  
16 Service (NPS), US Fish and Wildlife Service (FWS), and US Forest Service (FS).

17 The records together are referred to as the “Interagency” databases. These NWCG records cover  
18 1972-2019 for FS and FWS, cover 1972-2017 for BIA, BLM, BOR, and NPS, and contain point  
19 locations for each fire. NWCG records also include for each fire, the date that suppression  
20 activities began—which we treat as the ignition date, an estimate of the area burned, and fire’s  
21 name. Because MTBS records are critical to our dataset, we excluded NWCG fires prior to the  
22 beginning of the MTBS dataset in 1984. We also excluded prescribed fires with “RX”,  
23 “RXBURN”, or “PSBURN” in the fire name, and multi-agency assists where a fire in another  
24 agency’s database will be labeled with an agency name and a number, e.g., “USFS 1”.

25 We performed rigorous quality control to remove duplicate fires through a multi-step process.  
26 Duplicate fires were first identified as multiple fires with all the same fields. Then, we identified  
27 more duplicates as fires with similar names, locations, and/or sizes. For example, if two fires with  
28 the same name occurred within 300 km and 10 days of each other, they were flagged as  
29 duplicates. Or, if two fires with different names occurred in the exact same location and date,  
30 those fires were also assumed to be duplicates. Other duplicates were identified by flagging fires  
31 with combinations of very similar names (e.g., “ST FRANCIS” vs. “SAINT FRANCIS”), similar  
32 dates (e.g.,  $\leq 2$  days to  $\leq 10$  days), similar locations (e.g.,  $\leq 0.01$  degrees to  $\leq 1$  degrees), and similar  
33 sizes (e.g., within 20% to 50% of the fire’s reported size), and then manually deciding if they are  
34 duplicates. When duplicates were identified, the fire with the largest-recorded burned area record  
35 and/or the earliest ignition date were retained because often an agency records the burned area  
36 only where and when a fire event occurred within their jurisdiction. For some fire records, we  
37 often kept the FS fire size record but retained the fire name from a different Interagency database  
38 that was consistent with other Interagency and MTBS records. While the BIA, BLM, BOR, and  
39 NPS data only come through 2017, we considered records through 2019 in this study of forest fire  
40 because the vast majority of fires in forested areas are in the FS dataset (Figure S3).

41 The NWCG database was merged with fires  $\geq 1$  km<sup>2</sup> from the California Department of Forestry  
42 and Fire Protection (CalFire) Fire and Resource Assessment Program, which includes dates and  
43 perimeters of fires across most of California from the early 20<sup>th</sup> century through 2020. We also  
44 identified duplicates between NWCG and CalFire databases. Because the CalFire records are  
45 produced by an agency specifically focused on fire, include fire perimeters, and extend beyond  
46 2017, we prioritized the CalFire records over the NWCG records in cases of duplicates. Use of  
47 CalFire fire perimeters undoubtedly leads to a bias toward enhanced accuracy of forest-area  
48 burned in California relative to the rest of the western US, especially among smaller fires not

49 represented in the MTBS database, but we determined that enhanced accuracy in part of the study  
50 region is a net positive contribution to the quality and usefulness of our WUMI database.

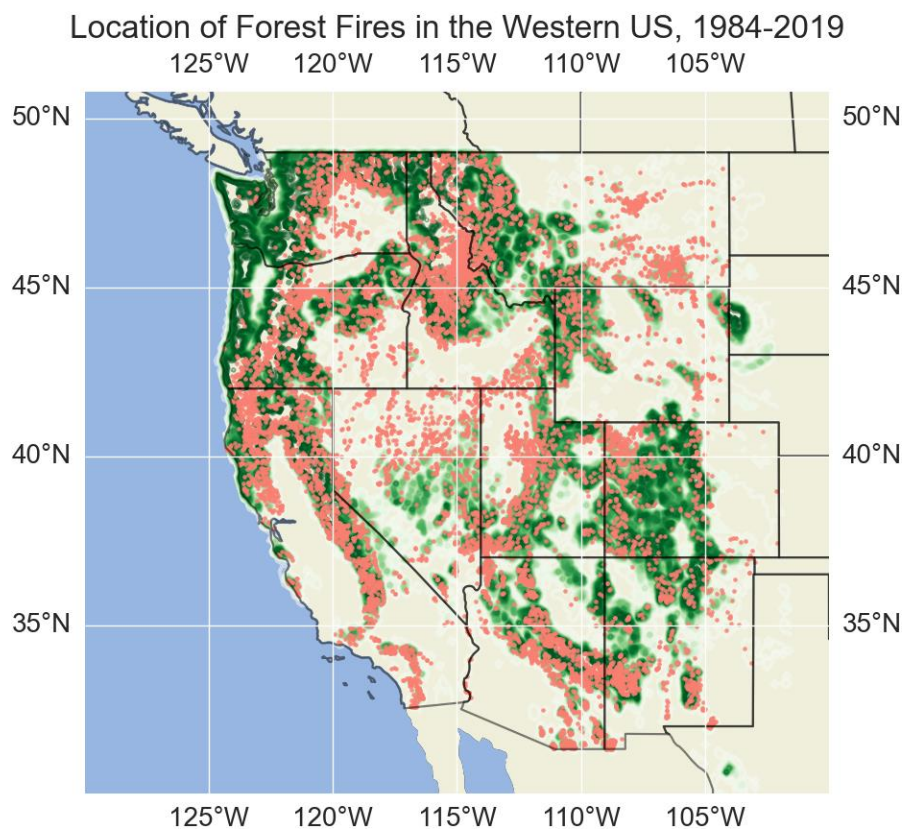
51 Finally, the NWCG-CalFire database was combined with MTBS data, prioritizing MTBS records  
52 in cases of duplicates. Often times, a single fire in the MTBS database is actually composed of  
53 numerous smaller fires. For example, the large 1988 burned area that occurred from many fires in  
54 in and around Yellowstone National Park are represented by just four fires in the MTBS dataset  
55 (e.g. the Storm Creek fire, mt4507511010219880619). Therefore, we chose not to replace any  
56 fires between the Interagency databases and the MTBS database, but we instead “link” fires  
57 (sometimes multiple fires) from the NWCG-CalFire database to a single MTBS fire event using  
58 the following steps. First, we identified and linked fires with the exact same name within 10 days  
59 and 300 km. Next, we identified complex fires (with “COMPLEX” in their name) within a 0.1-  
60 degree buffer of the bounding box of an MTBS fire’s satellite footprint and/or within 50 km and  
61 (2) within 180 days of the MTBS fire ignition date. We identified noncomplex fires as fires (1)  
62 within a 0.1-degree buffer of the MTBS satellite footprint bounding box ignited within 20 days of  
63 the MTBS fire’s ignition date, or (2) fires located within 20 km of the center of the MTBS fire  
64 ignited within 1 day of the MTBS fire’s ignition date. A final step identified and linked fires  
65 between the MTBS database and the NWCG-CalFire database using combinations of similar  
66 location (e.g. within 0.05-2 degrees), similar ignition dates (e.g. within 3-9 days), similar names  
67 (e.g. matching first 2 characters), and similar fire size (e.g. within 50%-80% of the current size).

68 In cases when multiple non-duplicate fires in the NWCG-CalFire database were linked to an  
69 MTBS fire, we distributed the burned area as recorded by MTBS across the multiple NWCG-  
70 CalFire fires, maintaining the proportional differences in fire sizes originally reported by NWCG-  
71 CalFire. For fires originating from MTBS, burned areas were aggregated to 1-km resolution by  
72 directly summing groups of 30-m resolution maps of burned area. For CalFire, we determined the

73 area within each 1-km grid cell that fell within each fire perimeter. For NWCG fires, fire  
74 perimeters were assumed to be circular and centered around the point locations provided.

75 Forested area burned was estimated by multiplying each fire's 1-km map of area burned by a  
76 corresponding 1-km map of forest fractional coverage using the forest-type map from Ruefenacht  
77 et al. (2008). The Ruefenacht map has a 250-m spatial resolution and covers the coterminous US  
78 and Alaska. Ruefenacht et al. (2008) used observations from the US Forest Inventory and  
79 Analysis (FIA), remotely sensed imagery, the National Land Cover Dataset, and maps of soils  
80 and climate characteristics to classify each 250-m grid cell as forest or non-forest, and, for  
81 forested grid cells, they classified the dominant forest type to be one of 141 forest types, which  
82 included woodland areas composed of piñon-juniper, oak, or mesquite. For each 1-km grid cell in  
83 our forest coverage map, we calculated the fraction of 250-m grid cells within that were classified  
84 by Ruefenacht et al. (2008) as forest.

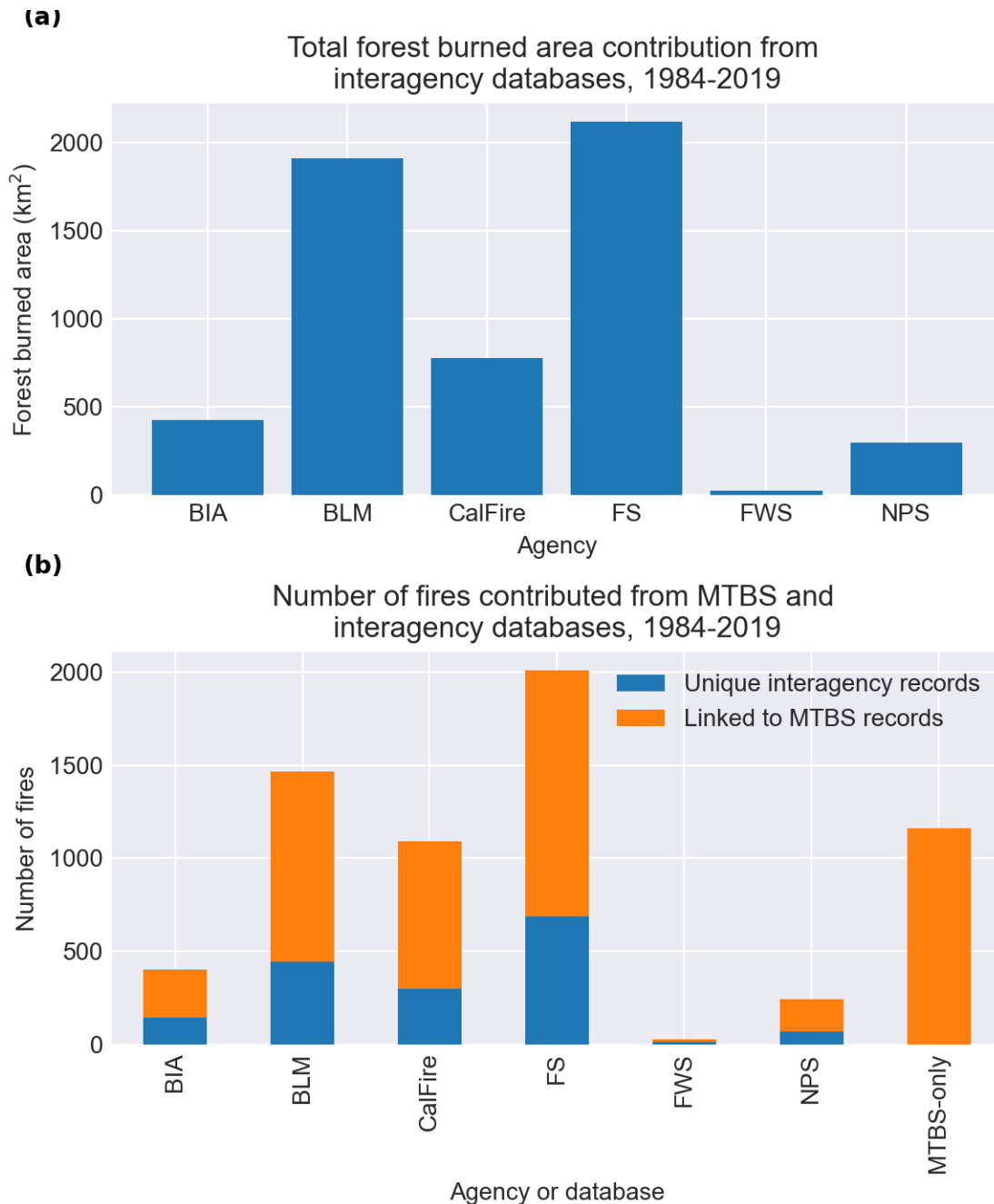
85 Our fire database consists of 18,368 western US fire events from 1984 through 2019. A text file  
86 (`west_US_fires_1984_2020.txt`) provides a list of each fire event, including the fire's name,  
87 discovery date, point location, total area burned, and forested area burned (see the corresponding  
88 `readme.txt` file for column labels). We also include NetCDF files of the 1-km map of forest  
89 fractional coverage and the 1-km maps of monthly burned area over 1984–2019.



90

91 **Figure S1. Location of forest fires >1 km<sup>2</sup> in the western United States (US).** Fire locations  
 92 are shown as red point locations representing a central latitude/longitude for each fire event  
 93 recorded in the Western US MTBS-Interagency (WUMI) wildfire database, overlaid on forest  
 94 area fraction, in green. Point locations are not scaled to fire size.

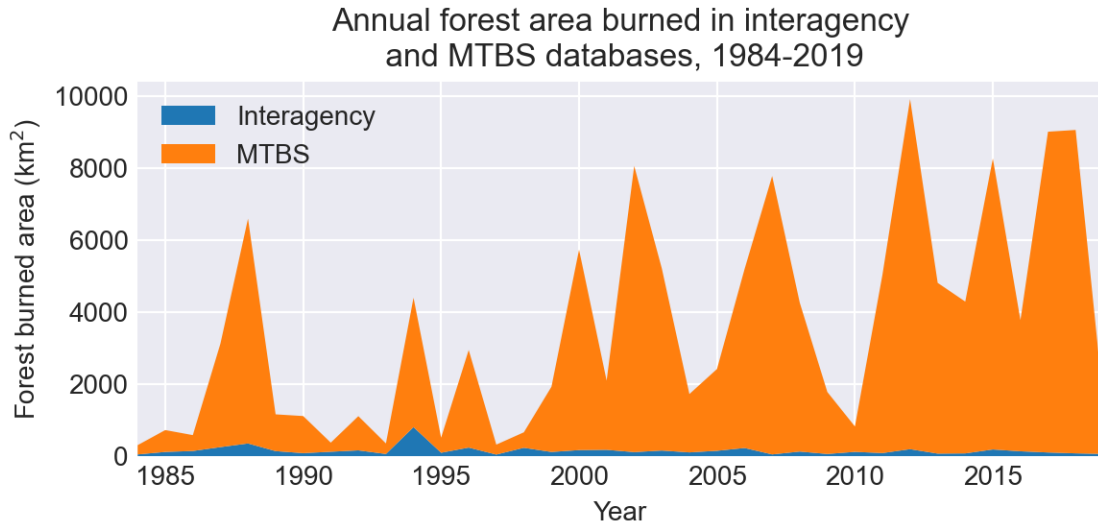
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97 **Figure S2. Total forest burned area and number of fires contribution from NWCG-CalFire**  
 98 **interagency databases.** (a) Sums of forest fire area burned for unique fire event records in the  
 99 Bureau of Indian Affairs (BIA), Bureau of Land Management (BLM), California Department of  
 100 Forestry and Fire Protection (CalFire), US Forest Service (FS), US Fish & Wildlife Service  
 101 (FWS), and National Park Service (NPS) in the WUMI wildfire database. The records shown are  
 102 unique ones that are not associated with a Monitoring Trends in Burn Severity (MTBS) record.  
 103 (b) Number of forest fires for fire event records unique to the interagency databases (in blue),  
 104 interagency records that are linked to MTBS records for a single fire event (in orange), or forest-  
 105 fire events unique to MTBS (MTBS-only, in orange).

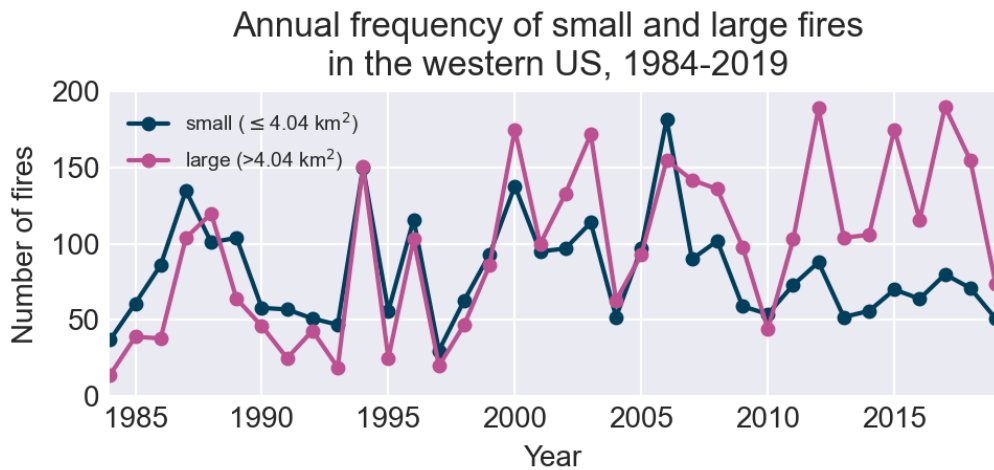
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108 **Figure S3. Annual forest area burned in Interagency (NWCG-CalFire) and MTBS**  
 109 **databases.** Stacked sums of annual forest area burned in the combined Interagency databases (in  
 110 blue) and Monitoring Trends in Burn Severity (MTBS) database (in orange) for all fire events >1  
 111 km<sup>2</sup>.

112

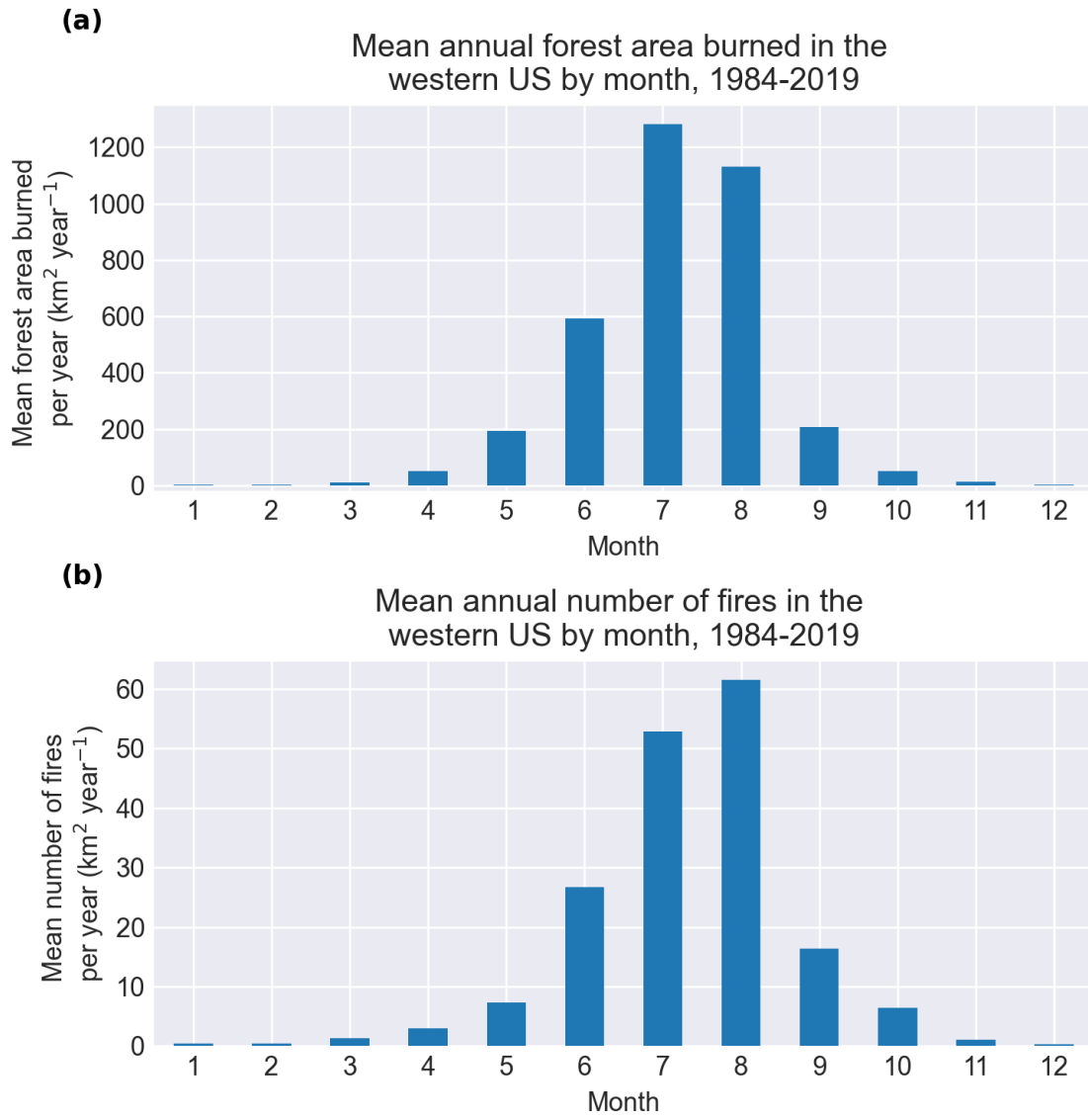


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114 **Figure S4. Annual frequency of small and large fires in the western US.** Line plots of small  
 115 (1-4.04 km<sup>2</sup>, in blue) and large (>4.04 km<sup>2</sup>, in purple) fires in the WUMI wildfire database.

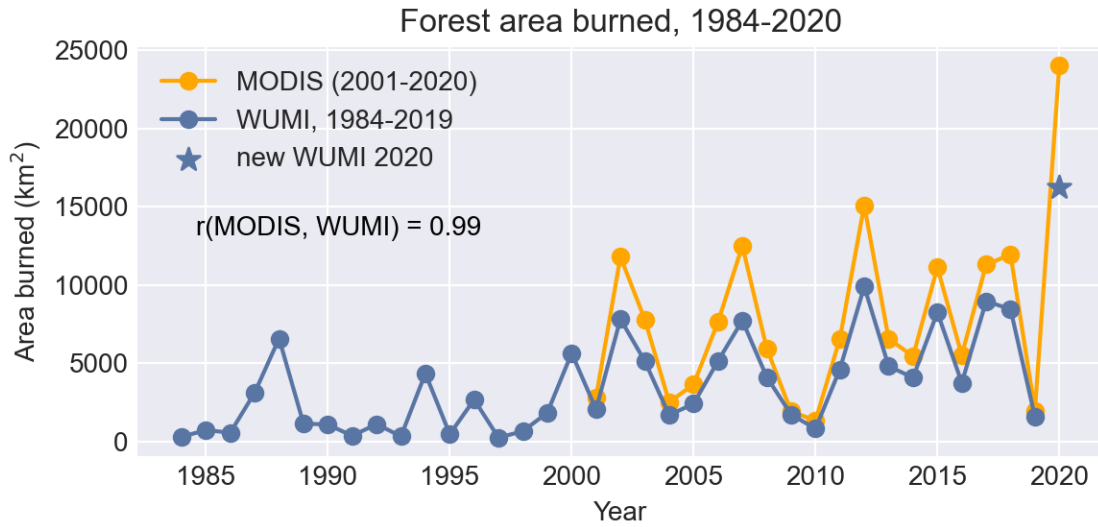
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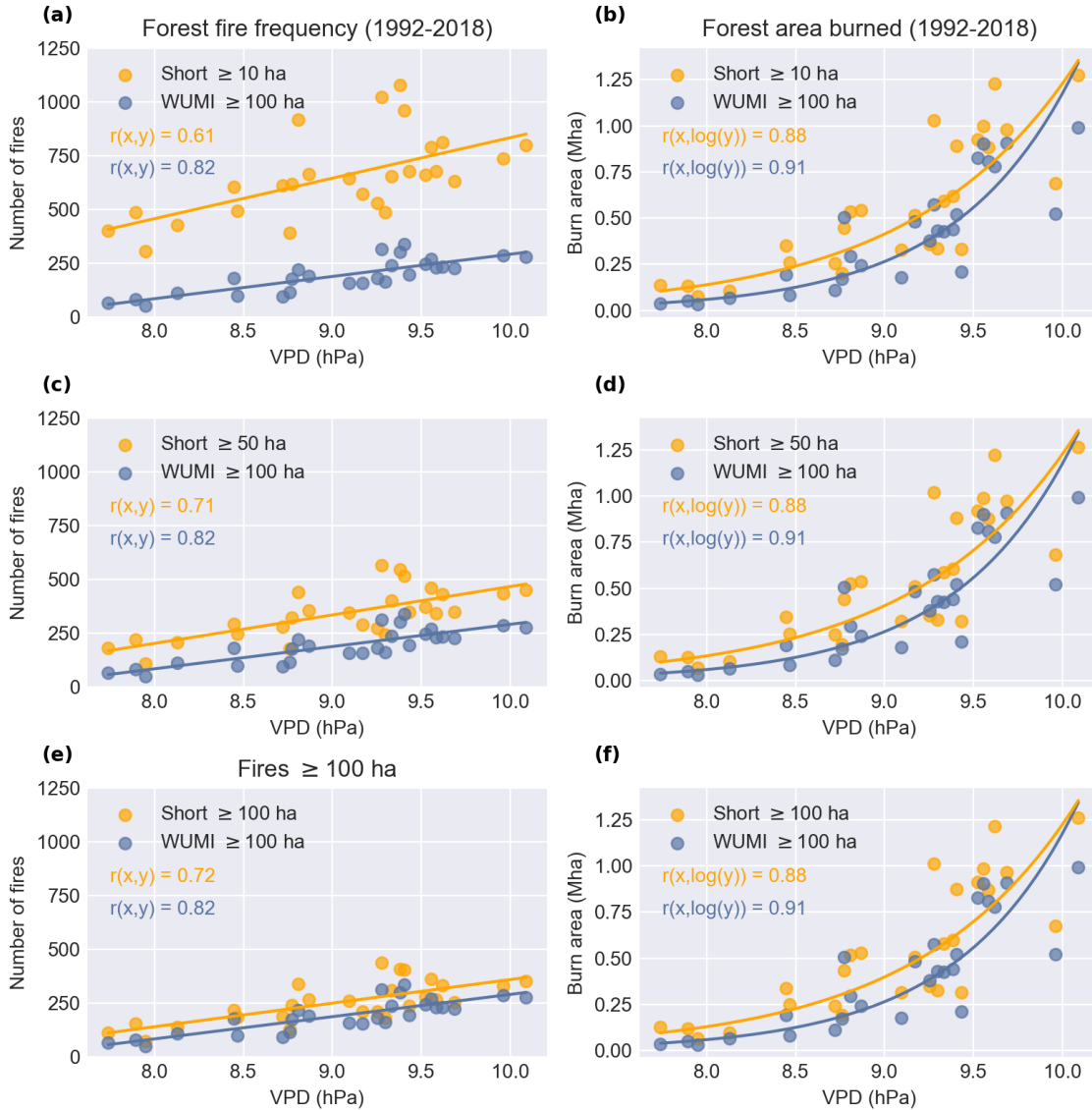
118 **Figure S5. Mean annual forest fire activity by month in the western US.** (a) Mean forest area  
 119 burned per year, classified by month. (b) Mean number of forest fires in the western US per year,  
 120 classified by month. Both panels are averaged over the time period 1984-2019.



121

122 **Figure S6. Western US annual forest area burned, in MODIS satellite data and WUMI**  
 123 **database.** Timeseries of forest area burned for the Western US MTBS-Interagency (WUMI)  
 124 database (1984-2019, in blue) and the Moderate Resolution Imaging Spectroradiometer (MODIS)  
 125 v6 Burned Area Product (Giglio et al., 2016) (2001-2020, in yellow). MODIS data were used to  
 126 extend the WUMI forest burned area measurement through 2020 using a linear relationship  
 127 between 2001-2019 MODIS and WUMI data with a correlation coefficient of 0.99. The resulting  
 128 2020 burned area for 2020 is shown with a blue star.

129



130

131 **Figure S7. Database comparison using forest fire frequency and area burned versus vapor-**  
 132 **pressure deficit (VPD) relationships, including Short (2021) forest fires  $\geq 10$  ha,  $\geq 50$  ha, and**  
 133  **$\geq 100$  ha ( $\geq 0.1$  km<sup>2</sup>,  $\geq 0.5$  km<sup>2</sup>, and  $\geq 1$  km<sup>2</sup>).** The Short (2021) database of forest fires (in yellow)  
 134 is compared with forest fires in the Western US MTBS-Interagency (WUMI) wildfire database  
 135 (in blue) for the same period of time, 1992-2018. **Left column: (a), (c), and (e)** show fire  
 136 frequency vs. VPD for WUMI fires  $\geq 100$  ha and Short (2021) fires  $\geq 10$  ha,  $\geq 50$  ha, and  $\geq 100$  ha,  
 137 respectively. **Right column: (b), (d), and (f)** show forest area burned (in Mha, millions of  
 138 hectares) versus VPD for WUMI and Short fires. Records of burned area appear visually identical  
 139 but are different in (b), (d), and (f) because including smaller fires contributes a very tiny fraction  
 140 to overall forest area burned. Least-square regression lines for number of fires and  $\log_{10}$ (burn  
 141 area) and their  $r$ -values are also shown for both databases.

142

143 **Table S1. Readme.** A file uploaded with the WUMI database to describe the data columns.

144

145 Dataset: Western US MTBS-Interagency (WUMI) Wildfire database

146

147 Format: TXT

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149 Last updated: 08/16/2021

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151 =====

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153 How to read this dataset:

154

155 Columns labeled "intagency" store information from six federal government agencies: BIA, BLM,  
156 BOR, NPS, FWS, and FS; and from one state agency database: CalFire. Collectively, these are  
157 referred to as interagency databases.

158

159 Columns labeled "MTBS" store information from the Monitoring Trends in Burn Severity  
160 (MTBS) database.

161

162 Columns labeled "final" are the data used in our investigations. The final fire name, location, and  
163 size used in our main investigation were decided on by order of priority (MTBS, CalFire, and  
164 then interagency databases), and included in the WUMI fire database labeled "final". Each row in  
165 the database is for one fire event, which contains information about the fire as listed in the  
166 interagency databases, the associated information from the MTBS database for the same fire, and  
167 the final information that was used for analysis.

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169 =====

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171 Column headers in the WUMI wildfire database:

172

<b>Column Name</b>	<b>Type and units</b>	<b>Description</b>
<b>intagency_agency</b>	Text	Agency abbreviation for the database entry used
<b>intagency_name</b>	Text	Fire name as listed in the interagency database(s)
<b>intagency_year</b>	Numeric, 4 digits	Fire discovery date, year
<b>intagency_month</b>	Numeric, 1 to 12	Fire discovery date, month
<b>intagency_day</b>	Numeric, 1 to 31	Fire discovery date, day
<b>intagency_lon</b>	Numeric, decimal degrees (-180 to 180 °E)	Location of the fire center provided by the agency, longitude
<b>intagency_lat</b>	Numeric, decimal degrees (-90 to 90 °N)	Location of the fire center provided by the agency, latitude
<b>intagency_area_ha</b>	Numeric, in hectares (ha)	Fire size
<b>intagency_forest_area_ha</b>	Numeric, in ha	Forested area fire size
<b>MTBS_name</b>	Text	Fire name as listed in the MTBS database
<b>MTBS_year</b>	Numeric, 4 digits	Fire discovery date, year
<b>MTBS_month</b>	Numeric, 1 to 12	Fire discovery date, month
<b>MTBS_day</b>	Numeric, 1 to 31	Fire discovery date, day
<b>MTBS_lon</b>	Numeric, decimal degrees (-180 to 180 °E)	Location of the fire center from MTBS polygon, longitude
<b>MTBS_lat</b>	Numeric, decimal degrees (-90 to 90 °N)	Location of the fire center from MTBS polygon, latitude
<b>MTBS_area_ha</b>	Numeric, in ha	Fire size
<b>MTBS_forest_area_ha</b>	Numeric, in ha	Forested area fire size
<b>MTBS_filename</b>	String of letters and numbers	Unique fire ID in the MTBS database
<b>final_year</b>	Numeric, 4 digits	Combined WUMI database fire discovery date, year
<b>final_month</b>	Numeric, 1 to 12	Combined WUMI database fire discovery date, month
<b>final_day</b>	Numeric, 1 to 31	Combined WUMI database fire discovery date, day
<b>final_lon</b>	Numeric, decimal degrees (-180 to 180 °E)	Combined WUMI database location of the fire center, longitude
<b>final_lat</b>	Numeric, decimal degrees (-90 to 90 °N)	Combined WUMI database location of the fire center, latitude
<b>final_area_ha</b>	Numeric, in ha	Combined WUMI database fire size
<b>final_forest_area_ha</b>	Numeric, in ha	Combined WUMI database forested area fire size

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