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# The Fire and Tree Mortality Database, for Empirical Modeling of Individual Tree Mortality after Fire

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# SCIENTIFIC DATA

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## **OPEN** The Fire and Tree Mortality Database, for empirical modeling of DATA DESCRIPTOR individual tree mortality after fire

C.Alina Cansler et al.#

Wildland fires have a multitude of ecological effects in forests, woodlands, and savannas across the globe. A major focus of past research has been on tree mortality from fire, as trees provide a vast range of biological services. We assembled a database of individual-tree records from prescribed fires and wildfires in the United States. The Fire and Tree Mortality (FTM) database includes records from 164,293 individual trees with records of fire injury (crown scorch, bole char, etc.), tree diameter, and either mortality or top-kill up to ten years post-fire. Data span 142 species and 62 genera, from 409 fires occurring from 1981-2016. Additional variables such as insect attack are included when available. The FTM database can be used to evaluate individual fire-caused mortality models for pre-fire planning and post-fire decision support, to develop improved models, and to explore general patterns of individual fire-induced tree death. The database can also be used to identify knowledge gaps that could be addressed in future research.

#### **Background & Summary**

Wildfires burn millions of forested hectares annually, influencing regional and global carbon storage, wildlife habitat, hydrology, species diversity, and forest structure, along with human society and economy. Wildland fires directly kill trees, but also interact with other stressors and disturbances to cause additional delayed tree mortality<sup>1</sup>. The impact of a fire on a forest ecosystem (i.e., fire severity) is often quantified by the proportion of fire-caused tree mortality. Likewise, the severity of a fire regime-the aggregated impact of many fires over time—is often described by the range of variability in proportion of trees killed by fire<sup>2,3</sup>. Because of the economic and ecological importance of fire-caused tree mortality, a great deal of work has gone into developing predictive models of mortality and integrating those models into decision support systems for management<sup>4,5</sup>. The most commonly utilized models are based on empirical data: field observations of fire injury and subsequent individual tree mortality in the years following fire. Sometimes injury from fire is measured directly (e.g., crown scorch), while other measurements may be a proxy for injury that can be quickly assessed (e.g., char on bark as a proxy for cambium injury). Measurements of fire-caused injuries used in many individual tree mortality models include percentage crown volume scorched, percentage crown length scorched, percentage crown volume killed, bark char height, and cambium kill rating<sup>5-8</sup>. Many models also use measurements of tree resistance to fire, particularly bark thickness, which scales positively with tree diameter but at different rates among species<sup>4,5</sup>.

The most commonly implemented empirical model predicting post-fire tree mortality was developed by Ryan and Reinhardt<sup>9</sup> and amended by Ryan and Amman<sup>10</sup>. This model relies on three parameters to predict probability of mortality within three years of a fire: tree species, injury to the tree crown (in the form of percentage volume of crown scorched by fire), and tree diameter (used to calculate bark thickness). This model has been implemented in many decision support systems predicting post-fire tree mortality, including the First Order Fire Effects Model (FOFEM)<sup>11,12</sup>, the Fire and Fuels Extension to the Forest Vegetation Simulator (FFE-FVS)<sup>13</sup>, and BehavePlus<sup>14</sup>. Within these decision support systems, the model predicts probability of tree mortality. No differentiation is made between obligate seeders and species capable of resprouting; therefore, mortality predictions are more accurately top-kill predictions for resprouting species. Additional models have been developed that account for species' unique fire resistance traits (e.g., protected buds<sup>15,16</sup>), biotic consumers<sup>7,17,18</sup>, and abiotic stress<sup>19–21</sup>. Models of post-fire tree mortality and top-kill in landscape-scale models and Dynamic Global Vegetation Models (DGVMs)

#A full list of authors and their affiliations appears at the end of the paper.

generally employ simplified approaches to modeling fire injury, but still rely on plant functional traits, such as bark thickness, to make mortality predictions for species' groups<sup>22-24</sup>.

There have been numerous studies conducted to improve ecological understanding of the many factors that contribute to post-fire tree mortality, and to build predictive models with greater accuracy<sup>4,5</sup>. In an effort to capture the data from these individual studies to facilitate more expansive analyses and to identify knowledge gaps, we assembled the largest and most comprehensive collection of observations of fire-caused individual tree mortality and top-kill in the United States, the Fire and Tree Mortality (FTM) database (https://doi.org/10.2737/RDS-2020-0001)<sup>25</sup> (Fig. 1). The purpose of the FTM database is to provide access to data on individual tree mortality or top-kill from wildland and prescribed fire. The FTM database allows for large-scale evaluation of existing post-fire-mortality models over large geographic and climatic ranges for numerous species. Observational data cover the full range of fire injuries and a large proportion of tree sizes for many species, but they also reveal where data are scant or non-existent. By pooling individual datasets and ensuring comparability among variables, it becomes feasible to explore general patterns of fire-induced tree death and top-kill, to develop improved models, and to identify data gaps to inform future research.

#### Methods

**Soliciting data contributions.** To construct our FTM database, authors Cansler, Hood, Varner, and van Mantgem conducted a literature search for publications reporting on post-fire tree mortality and contacted corresponding authors, related investigators, and managers to inquire if they were willing to contribute data. We also posted data requests on electronic mailing lists, professional management and science exchange networks, and with technical working groups. We identified and obtained archived datasets or entered them manually from archived copies. Lastly, we coordinated with the National Park Service fire ecology program to include the agency's Fire Effects Monitoring data<sup>26</sup>.

Data aggregation and standardization. We developed the FTM database with standardized field observations from 41 contributed databases from researchers, managers, and archived datasets. Some datasets already contained aggregated data from more than one previous study<sup>27,28</sup>. At a minimum, datasets had to contain measurements of individual trees, stem diameter, fire injury, and post-fire status of above-ground stems (i.e., alive or dead). Post-fire injury measurements were collected either in the same season of the fire, or one to two years after fire. Tree diameter and height measurements were recorded either before the fire, or one to two years after fire. For the majority of cases, status of aboveground stems was recorded one to three years after fire; for some trees, status was re-evaluated in the years following fire. A tree or stem was considered dead when no green foliage remained in the crown. For obligate-seeding species, tree status almost always represents the true status of the individual: when the main stem dies, the tree dies. The exception is where the stem splits at or below breast height (BH, 1.37 m); in this situation, stems are considered separate trees, each with its own status. For species that resprout from the base or root structures, tree status in the FTM database represents survival of the main stem (i.e., top-kill). Resprouting from below-ground structures or above-ground epicormic buds are not captured in the database. We included any tree where post-fire status was measured within 10 years of the fire, noting the post-fire year(s) of status assessment. Only trees that were recorded as alive before the fire were included in the database. Many datasets included variables beyond the required minimum; we retained many variables on fire-caused injuries and biotic agents from the original datasets.

For all contributed datasets, we verified and changed all variable names and units for consistency and labelled the levels of categorical variables. We used summary tables and data visualization to identify outliers, impossible values, and duplicate records. We corresponded with data contributors when additional clarification was needed (Fig. 2). Because many of the contributed datasets were used previously for research, error checking and quality control procedures (QA/QC) had been conducted on much of the data prior to transfer to this project. For most datasets, few errors were found during the QA/QC process. Two large datasets from the National Park Service Fire Effects Monitoring Program<sup>26</sup> and the Fire and Fire Surrogate Study<sup>28</sup> contained longitudinal data from many sites. In these datasets, we corrected more errors after extensive checking. In the NPS dataset, we identified and removed individual tree records that were likely duplicates. For example, where two records in the same plot shared the same tag number and species, and a similar tree diameter at breast height ("DBH"; 1.37 m above ground), one record was dropped. Likewise, in the Fire and Fire Surrogate dataset (particularly from sites in the Southern USA), some tagged trees were identified as different species in sequential measurements. In these instances we retained the most recent species code, assuming that identities were corrected over time. For all datasets, we enforced consistency in coding of status (live/dead). If a tree was alive in the final assessment year, it was coded as live in previous years. If a tree was dead, it was coded as dead in subsequent years. If a tree re-burned in a second fire and post-fire injury and status information were available following the fire, a new record (row) was made for the tree after the second fire. Database contributors were able to check and offer corrections following the data standardization procedures.

**Standardization of taxa.** We standardized all scientific nomenclature and species acronyms to follow the PLANTS Database http://plants.usda.gov. Data represent 142 species and 62 genera (Online-only Table 1). Some trees were unidentified or identified only to genus (14 genera; Online-only Table 1). In some instances, trees were identified to genus, but data contributors noted that the tree could be only one of two species. In total, there are three such identifiers: *Abies grandis* or *A. lasiocarpa, Pinus jeffreyi* or *P. ponderosa*, and *Picea pungens* or *P. engelmannii* (Online-only Table 1). Finally, some contributed datasets contained unidentified trees that were alive before the fire. We retained those records and with them, a code for "unknown tree", but we caution that unidentified trees may have been removed from other datasets during earlier quality control steps. In total, the FTM database has 161 unique tree identifier codes.



Fig. 1 Map of fire locations by year of occurrence in the Fire and Tree Mortality (FTM) database. If a site burned twice, only the most recent fire is shown.

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**Calculating injury variables.** The FTM database includes several tree injury variables (Table 1). If variables were measured or visually estimated in the field, then we used field-based observations rather than calculated values. When these variables were not measured in the field, if possible, we calculated derived variables from those measured in the field. Specifically, we calculated:

$$CL_{pre} = HT - HCB_{pre} \tag{1}$$

where  $CL_{pre}$  is pre-fire crown length (m), HT is tree height (m), and  $HCB_{pre}$  is the pre-fire height of the base of the crown. If HT or HCB were measured before the fire, we used pre-fire height and crown base height. Otherwise, HT and  $CBH_{pre}$  were measured post-fire, either the season after the fire or within two years. HT measurements taken more than two years after the fire were coded as "NA" (not available) and were not used. Studies have established the validity of reconstructing the pre-fire living portion of the crown after fire to estimate pre-fire height and crown base height<sup>29,30</sup>.

Likewise:

$$CL_{post} = HT - HCB_{post} \tag{2}$$

where  $CL_{post}$  is post-fire crown length (m), HT is tree height (m), and  $HCB_{post}$  is the post-fire height of the base of the crown.

Using the pre- and post-fire crown length, we could calculate the length and percentage of crown length scorched:

$$CLS_{meters} = CL_{pre} - CL_{post}$$
 (3)

and

$$CLS_{percent} = 100 \left( \frac{CLS_{meters}}{CL_{pre}} \right)$$
(4)

where  $CLS_{meters}$  = crown length scorched measured in meters,  $CLS_{percent}$  = percentage crown length scorched,  $CL_{pre}$  = pre-fire crown length (m), and  $CL_{post}$  = post-fire crown length (m). If  $CLS_{meters}$  was measured in the field, we used that measurement of injury, instead of the change from pre-fire to post-fire crown base height for subsequent calculations.

For studies that separated crown injury as scorch, kill, or consumed, we included the amount of crown consumed in all calculations of crown scorch or crown kill.

For trees without observed crown volume scorched values, we followed the equation in the FOFEM Help manual<sup>12</sup> (derived from Peterson and Ryan)<sup>31</sup>.

$$CVS_{percent} = 100 \left( \frac{CLS_{meters} \left( 2CL_{pre} - CLS_{meters} \right)}{CL_{pre}^2} \right)$$
(5)



**Fig. 2** Data collection and processing workflows for individual-tree data and fire-location data used to generate the data outputs. For individual-tree data, we performed quality control measures and developed standardized fields and data from 41 contributed datasets (i.e., datasets 1 through 41). At a minimum, contributed datasets had to contain measurements of individual trees, stem diameter, fire injury, and post-fire status of above-ground stems (i.e., alive or dead). Contributed datasets sometimes contained observations from multiple fires, sites, or studies. Contributed datasets contained post-fire injury measurements and tree status collected either in the same season of the fire, or one to two years after fire. In some datasets tree status was re-evaluated in multiple years following fire. We then combined tree data into a single file. Because locations in contributed datasets were provided at different scales (e.g., tree, plot, research site, and fire) we standardized all location data in the FTM database to the scale of a fire event. QA/QC = Quality assurance and quality control. MTBS = Monitoring Trends in Burn Severity https://www.mtbs.gov.

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where  $CVS_{percent}$  = percentage crown volume scorched,  $CLS_{meters}$  = crown length scorched, and  $CL_{pre}$  = pre-fire crown length. Because this calculation includes assumptions about tree crown architecture, it may introduce error. Thus in a separate column we coded whether the  $CVS_{percent}$  value was based on field observation or derived from the canopy volume equation.

Likewise, for trees with observations of crown length killed ( $CLK_{meters}$ ), but not percentage crown volume killed ( $CVK_{percent}$ ), we calculated  $CVK_{percent}$  using the same equation form as in Eq. 5, above:

$$CVK_{percent} = 100 \left( \frac{CLK_{meters} \left( 2CL_{pre} - CLK_{meters} \right)}{CL_{pre^2}} \right)$$
(6)

Where calculations produced an impossible value (<0 or >100) we assigned the value a code of "NA" (see "Usage Notes" below).

Damage to tree stems was measured in several ways. The most common method measured the amount (e.g., height, circumference, or percentage) of char on the tree's bark (Table 1). Char is blackened residue of bark resulting from incomplete combustion and is a coarse indicator of the duration of bole exposure to flames and heat from the fire. Cambium kill rating (CKR) is an estimate of the amount of cambium kill and stem injury from fire<sup>15,32</sup>. Measurements of CKR require removing a small sample of bark at four locations at a tree's base to determine if the underlying vascular meristematic tissue was killed by the fire. CKR is the number of quadrants (0-4) with dead cambium.

| Variable           | Description  |
|--------------------|--|
| CL_m               | Pre-fire live crown length rounded to the nearest 0.01 meter.  |
| HT_m               | Either the pre-fire tree height, or if pre-fire height is not measured, the post-fire tree height taken at that same time that fire-injury variables were measured; values are rounded to the nearest 0.01 meter.  |
| HCB_post           | Post-fire height to live crown base rounded to the nearest 0.01 meter.   |
| CR_post            | Post-fire live crown ratio. Crown length divided by tree height (proportion rounded to the nearest 0.01).  |
| CSH_m              | Height of crown scorch, assessed as the highest visible heat injury to leaves from ground level, rounded to the nearest 0.01 meter. Includes scorched and consumed portions of the crown.  |
| CLS_m              | Length of the pre-fire crown that was scorched or consumed by fire rounded to the nearest 0.01 meter.  |
| CLK_m              | Length of the pre-fire crown for which fire killed tree buds by scorch or consumption, rounded to the nearest 0.01 meter.  |
| CLS_percent        | Percentage of the pre-fire crown length that was scorched or consumed by fire rounded to the nearest 1.0 percent (ranges from 0 to 100).   |
| CLK_percent        | Percentage of the pre-fire crown that was scorched, resulting in bud kill or consumption by fire, rounded to the nearest 1% (ranges from 0 to 100).  |
| CVS_percent        | Percentage of the pre-fire crown volume that was scorched or consumed by fire (ranges from 0 to 100).  |
| CVS_percent_source | Denotes whether directly assessed in the field or derived as described in FOFEM help document. $F = field$ ; $C = calculated$ .  |
| CVK_percent        | Percentage of pre-fire crown volume killed by fire (range of 0 to 100).  |
| CVK_percent_source | Denotes whether directly assessed in the field or derived as described in FOFEM help document. $F = field$ ; $C = calculated$ .  |
| CVC_percent        | Percentage crown volume consumed or blackened by the fire (range of 0 to 100).   |
| CBS                | Percentage of the circumference of the bole that was scorch (ranges from 0 to 100).  |
| BCHA_m             | Average bark char vertical height from the ground on a tree bole, rounded to the nearest 0.01 meter. Heights were visually estimated or computed as the mean of the maximum and minimum bark char height.  |
| BCHM_m             | Maximum bark char height from the ground on a tree bole, rounded to the nearest 0.01 meter.  |
| BCH_percent        | Percentage of tree height blackened or charred, based on the maximum bark char height (values 0 to 100).   |
| BCA                | Average bark char rating. A bark char rank value (numerical code) was given to each of four quadrants at the base of the tree, then values were averaged. If fewer than four quadrents were measured, this is the average of measered sections. Codes: $0 =$ unburned, $1 =$ light, $2 =$ moderate, and $3 =$ deep <sup>52</sup> . |
| CKR                | Cambium kill rating. Cambium status (live or dead) was assessed in four quadrants of each tree. If fewer than four quadrants were measured, this is the average of measured sections. CKR is the number of quadrants with dead cambium at the ground line (ranges from 0 to 4) <sup>32</sup> .                                     |
| GCA                | Average ground char rating. Severity of soil heating (based on ground char) was assessed in four quadrants around each tree (1 = light, 2 = moderate, and 3 = heavy [or deep]). The four ratings were then averaged <sup>100</sup> . If fewer than four quadrants were measured, this is the average of measured sections.         |

**Table 1.** FTM\_trees injury-variable names and descriptions. Also included are variables used to calculate fire-injury variables. Most fire-injury variables were measured in the field the season or year after fire. Fire-injury variables that were derived from field-measured variables are described in the text. Full descriptions are documented in the metadata in Cansler *et al.*<sup>25</sup>.

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Presence or absence of beetles that are primary mortality agents on a given tree species are used in some species-specific post-fire mortality models<sup>5,27</sup>. These beetle species include *Dendroctonus ponderosae* (mountain pine beetle) on *Pinus* spp.; *D. valens* (red turpentine beetle), *D. ponderosae*, *D. brevicomis* (western pine beetle) or *Ips* spp. (engraver beetles) on *Pinus ponderosa*; and *D. pseudotsugae* (Douglas-fir beetle) on *Pseudotsuga menziesii*. Individual studies may have collected more detailed beetle-attack data, but for the FTM database, we simplified all attack data as presence or absence. Some studies noted presence or absence of primary bark beetles without identifying the species: thus, we combined all presence/absence information for identified and unidentified primary bark beetles into a single "beetle" variable. When studies identified beetles to species, we included species-level presence/absence information. We also included presence/absence information for a few beetle species that are not primary agents of mortality, but have been used as predictors in some models<sup>27</sup>, such as ambrosia beetle (subfamilies Scolytinae and Platypodinae) and *D. valens*.

**Tree identification, plot design, and study purpose.** This database was developed for modeling tree mortality and top-kill at the individual-tree scale. In the *FTM\_trees.csv* file we provide plot and tree number identification information to maintain consistency between the FTM database and the original contributed dataset. This ensures that each tree in the FTM database can be connected to its original record. Additionally, plot numbers and fire names can be used to track how observations are spatially grouped. We also provide study design information, including whether sampling was conducted at the individual-tree scale or if fixed-area or variable-radius plots were used. For fixed-area plots we define plot size and the minimum DBH sampled. For variable-radius plots, we provide the BA factor used. Finally, we provide standardized descriptions of the purpose(s) of the original studies.

**Fire locations.** We standardized the fire location and year-of-fire data for all observations to a consistent datum and geographic coordinate system (GCS WGS84; Fig. 2). Because locations in contributed datasets were provided at different scales (e.g., tree, plot, research site, and fire) we standardized all location data in the FTM





database to the scale of a fire event. If tree or plot coordinates were provided, we took the average of those coordinates to provide a centroid for the fire event. If only research site coordinates were provided, but multiple fires occurred with different start dates, we replicated those coordinates for each fire event. If a fire name and year were provided without associated geographic coordinates, we searched the Monitoring Trends in Burn Severity database https://www.mtbs.gov for the fire, downloaded the fire geospatial data, and used the coordinates of the centroid of the fire perimeter. In instances where fires were not large enough to be in the MTBS database and we lacked coordinates, we used fire perimeter data from the local land management agency to identify fire locations. All fire-location data were uploaded to Google Earth Pro<sup>33</sup>, and the available high-resolution pre-fire and post-fire imagery and Google Earth database of place names were used to verify the fire occurrence and location. Errors or discrepancies in fire locations and dates were corrected through correspondence with data contributors.

**Bark thickness coefficients.** We provide data to calculate bark thickness for most of the species in the FTM database, following the method used in FOFEM 6.4. Specifically, bark thickness is estimated from a linear relationship with DBH and a species-specific barkthickness coefficient. FOFEM provides bark thickness coefficients for 192 tree species. If a species is absent, FOFEM users can substitute a species with similar bark thickness for modeling, or use one of the 24 bark-thickness relationships provided at the genus level. For species lacking a species-level bark thickness coefficient in FOFEM, we provide a coefficient from a morphologically similar species or the genus (if available). Of 159 taxa identifiers in the database, we include bark thickness coefficients for 148.

#### **Data Records**

The FTM database is available for download from the USDA Forest Service Research Data Archive<sup>25</sup>. The FTM database includes standardized field observations of fire injury and survival from 164,293 individual trees. Of these, 6,670 trees have records relating to two separate fires, resulting in a total of 170,963 observations. The data span 21 states and include 409 prescribed fires and wildfires from 1981 to 2016 (Fig. 1). The data represent 142 species and 62 genera; 97.3% of the trees are identified to species and 99.7%, to genus. The archived data product consists of a metafile in both HTML and XML formats, a TIFF file showing the geographic locations of fires, and five separate data files:

- Dataset\_citations.csv: Comma-delimited ASCII text file containing the main citation for each contributed dataset in the Fire and Tree Mortality (FTM) database.
- *Dataset\_primary\_contacts.csv*: Comma-delimited ASCII text file containing dataset names as they appear in the FTM database and the associated primary contact information.
- *FTM\_fires.csv*: Comma-delimited ASCII text file containing fire names, year, dataset contact, and location for fires in the FTM database.
- *FTM\_trees.csv*: Comma-delimited ASCII text file containing tree-level records of fire injury, tree size, and bark beetle attack.
- *Species\_BarkThickness.csv*: Comma-delimited ASCII text file containing the list of species found in the FTM database and the bark thickness information used to evaluate FOFEM version 6.4 model accuracy.

Figure 3 shows the common fields and connections among each of the five data files.



**Fig. 4** Number of tree-status observations (*n*) by years since fire for live (L) and dead (D) trees. Only species with  $\geq$ 200 samples are shown. We filled in missing values for tree status when possible (e.g., dead trees remained dead after monitoring ceased; live trees were coded as live in previous years). The longer the time since fire, the more likely a database will contain only dead trees for a given species.

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#### **Technical Validation**

The data used to build the FTM database primarily come from high-quality data sources that have been used in other analyses and peer-reviewed publications, or from long-term institutional monitoring studies. The majority of individual-tree observations are derived from peer-reviewed studies<sup>6–8,15,17,18,27,34–74</sup>. Data were contributed by corresponding authors, or came from archived datasets from completed projects<sup>28,40,75–78</sup>. Twelve additional datasets were not peer reviewed, but were summarized in professional reports or theses<sup>79–82</sup> or represent ongoing research or monitoring by land management professionals<sup>26,83–89</sup>. The contributed database with the largest sample of fires is from the National Park Service Fire Effects Monitoring Program, a long-term institutional monitoring program in which permanent field plots are resampled on a standardized schedule with trained staff and established quality controls<sup>26</sup>. These studies and monitoring projects were designed for a range of purposes, listed in the *FTM\_Fires.csv* file, including modelling post-fire tree mortality<sup>6,7,15,17,18,40,42,47,48,50,58,71,74,79,90–92, understanding the effectiveness of prescribed fire at reducing fuel loading, future fire severity, restoring historical forest structure<sup>38,39,56,57,59–61,66,67,69,82,93</sup>, tracking post-fire successional dynamics<sup>43,45,59,62,63,90,94</sup>, developing remote sensing indices to understand landscape fire effects<sup>46,70,95</sup>, carbon emission modeling<sup>65</sup>, plant physiological research<sup>36,53–55</sup>, and research on interactions between fire and bark beetles<sup>4,7,10,18,34,35,37,41,43,44,95,181</sup>. The file *Dataset\_citations.csv* provides the primary citations for each contributed dataset in the FTM database.</sup>

#### **Usage Notes**

We developed the FTM database to validate existing models of individual-stem and tree-scale post-fire tree mortality<sup>96</sup> and to support development of new models. Researchers may find additional uses for these data, but we urge caution in their use. For any use, researchers should consider possible sources of error. Despite multiple procedures for quality control, there are likely to be errors of observation and calculation present in the final FTM database. For example, many post-fire injury measurements, such as crown volume scorch, are subjective



Fig. 5 Scatterplots of tree diameter at breast height (DBH) vs. percentage crown volume scorch (CVS) for species with  $\geq$ 200 observations of both variables. These data displays can show gaps in information, such as small or large trees or species for which there are few or no combinations of DBH and CVS.

field estimates, and may vary among observers (although consistency within a study is likely to be higher than

neid estimates, and may vary among observers (although consistency within a study is likely to be higher than consistency across studies). Data from studies that included repeated measurements over time will be more accurate than those based on a single post-fire measurement. Common errors that can be identified and corrected through repeated measurements include misidentified species, duplicate or missing records, incorrect diameter measurements, and incorrect tree status (e.g., mistakenly identifying trees as dead). We excluded trees that were dead prior to fires, and we excluded ingrowth that reached minimum measurement sizes after the fire that were recorded in longitudinal datasets. For studies where plots were measured post-, but not pre-fire, there may be errors in pre-fire status if trees that died shortly before the fire were erroneously coded as alive. Any calculations of carbon stores from this dataset could only include pre-fire live carbon, since contributed datasets did not consistently include measurements of trees that were dead before the fire, and therefore we did not include any trees that were dead before the fire in the database.

Crown injury variables derived from field observations are also susceptible to errors. Most derived variables are based on simple calculations (detailed above) and after each calculation we checked for impossible values. If found, these were coded as "NA". The most common error of this sort occurred when pre-fire crown base height was slightly higher than post-fire crown base height (resulting in a negative value for crown length scorch). This error likely reflects varying precision in the measurement of crown base height before and after the fire, but it could also reflect a data collection or data entry error. For crown volume scorch and crown volume killed (Eqs. 5 and 6), the equation, based on assumptions of tree crown shape and crown length, may introduce error. For transparency, we coded which observations were based on field observations and which were derived from the crown volume equation. Percentages of crown length and crown volume are positively correlated but are not the same or interchangeable<sup>15</sup>, and models using field-based measurements perform better<sup>96</sup>. In addition, users should be aware that observations of crown scorch typically imply that the scorched portions of the crown are killed by the fire (i.e., bud kill or crown kill). However, this is not always true for species with large buds or epicormic sprouting<sup>4</sup>. Thus, the FTM database crown scorch values should be understood to represent the proportion of the tree's leaves that were killed by fire, but not the extent of bud mortality or the potential for branch recovery. For studies

that differentiated between crown scorch and crown kill levels, the percentage of crown scorched must always be greater than or equal to the percentage of crown killed.

For tree mortality and top-kill modelling, we note three limitations in particular. First, because different combinations of injury variables were measured in each study, there are many missing values in the FTM database. Second, tree status observations decline—particularly observations of live trees—as time since fire increases (Fig. 4). Because we extrapolated tree status for years when plots were not measured, modeling of plot-scale proportional mortality would not be an appropriate use of the data. Third, in building empirical models, it is important to consider the data range for the variables used, and not simply for the individual variables, but for the combined predictor space represented in the dataset<sup>97</sup> (Fig. 5).

The FTM database includes information on sampling design, and where applicable, plot size and minimum tree diameter sampled. The best use for the fire-scale and plot-scale identifiers is understanding and accounting for the spatial aggregation or nesting of many of the observations (e.g., by using hierarchical or mixed-effects models)<sup>98</sup>. Although plot-level metrics, such as stem density, basal area, or stand density index can be generated from some datasets, we did not develop the FTM database explicitly for plot-level modeling. Plot-level measurements can be used to quantify variation in forest structure or intensity of competition, but with caution due to variation in how trees were sampled among studies. There are several possible types of unaccounted variation in plot-level statistics: (1) individual tree records that were incomplete and removed from contributed datasets before transfer to the current study; (2) undocumented procedures for subsampling different tree diameter classes; and (3) undocumented exclusion of species (e.g., angiosperms) or growth forms (e.g., tall woody shrubs or hardwoods) that would have influenced stem densities or indices of competition.

Plots were not the sampling units in all contributed datasets. For many studies—particularly physiology and bark beetle studies—the individual tree was the sampling unit. In other studies, plots were used to structure the sampling, but not all trees were measured within a plot (e.g., only the first three stems of a given species or size class were sampled or only a particular species was sampled). When trees were fully censused within a plot, the minimum DBH differed among studies (noted in the *FTM\_fires.csv* file), thus cross-study comparisons of plot-level statistics must be made with caution.

Because the FTM database was developed to support individual-tree scale modeling, we devoted considerable effort to identifying incomplete or duplicate records. These were detectable only in datasets with repeated measurements (e.g., National Park Service datasets). However, optimizing for complete and non-duplicate records may produce erroneous plot-level metrics (e.g., tree density). Finally, for all datasets, tree locations within plots were not recorded, thus indices of neighborhood competition at the individual-tree scale (or any finer scale than the plot) cannot be calculated. Users can refer to the primary literature contained in *Dataset\_citations.csv* for additional information on study designs and dataset contents.

Pooling data from across the United States incorporates taxa that are not well represented in previous studies, such as junipers and oaks. Nevertheless, geographic and taxonomical gaps remain. Data are primarily from the western USA, with some representation of the southeastern USA (Fig. 1). Gymnosperms are better represented than angiosperms (Online-only Table 1). We encourage researchers to identify geographic or taxonomic gaps in the existing data and to target sampling to fill those gaps. We plan to update the FTM database as additional data are collected and made available from the USA and internationally.

#### **Code availability**

Fire and Tree Mortality Database (FTM) is available from Forest Service Research Data Archive https://doi. org/10.2737/RDS-2020-0001. All reformatting of contributed data was completed in R version 3.6.1<sup>99</sup>. Original contributed data are only available by contacting data contributors. The code used to reformat the data may be obtained contacting C. A. Cansler.

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#### **Author contributions**

C. Alina Cansler solicited data contributions, co-developed the database structure, reformatted all contributed data, developed the fire-location database, entered and formatted hard-copy data, and co-wrote the manuscript. Sharon M. Hood conceived of the database idea, solicited data contributions, provided input into the database structure and development, co-wrote the manuscript and provided data. Phillip J. van Mantgem and J. Morgan Varner co-developed the project, solicited data contributions, provided input into the database structure and development, assisted with reformatting contributed data, contributed to writing the manuscript, and provided data. Michelle C. Agne, Robert A. Andrus, Matthew P. Ayres, Jonathan D. Bakker, Michael A. Battaglia, Barbara J. Bentz, Carolyn R. Breece, Daniel R. Cluck, Tom W. Coleman, R. Greg Corace III, Douglas S. Cram, James B. Cronan, Adrian J. Das, Ryan S. Davis, Darci M. Dickinson, Jim L. Hanula, Brian J. Harvey, MaryBeth Keifer, Tara L. Keyser, Leda N. Kobziar, Karen E. Kopper, Andrew P. Lerch, Virginia L. McDaniel, Joseph J. O'Brien, Daniel D.B. Perrakis, Susan J. Prichard, Robert A. Progar, John P. Roccaforte, Brendan M. Rogers, Carolyn H. Sieg, Rebecca J. Smith, Mary Steuver, Jens T. Stevens, Nicole M. Vaillant and Douglas J. Westlind, oversaw data collection and analysis of original data, contributed data to the database, helped inform data reformatting, reviewed the FTM database, and contributed to the manuscript. Timothy M. Shearman, Lindsay M. Grayson and Micah Wright helped conduct and inform data reformatting. Bruce D. Ayres, James K. Brown, W. Wallace Covington, Joseph E. Crouse, Stephen A. Fitzgerald, Lisa M. Ganio, Charles B. Halpern, J. Kevin Hiers, David W. Huffman, Tom E. Kolb, Crystal A. Kolden, Jason R. Kreitler, Jesse K. Kreye, Andrew M. Latimer, Maria J. Lombardero, Charles W. McHugh, Joel D. McMillin, Jessica J. Page, David W. Peterson, Kenneth F. Raffa, Elizabeth D. Reinhardt, Joe C. Restaino, Kevin C. Ryan, Hugh D. Safford, Alyson E. Santoro, Alice M. Shumate, Sheri Smith, Nathan L. Stephenson, Michael T. Stoddard, Walter G. Thies, Shelby A. Weiss and Travis J. Woolley oversaw original data collection and analysis and contributed to the manuscript.

#### **Competing interests**

The authors declare no competing interests.

#### **Additional information**

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