Contemporary Fire Regimes Provide a Critical Perspective on Restoration Needs in the Mexico-United States Borderlands

Miguel L Villarreal1id, José M Iniguez2, Aaron D Flesch3id, Jamie S Sanderlin2, Citlali Cortés Montaño4, Caroline R Conrad1 and Sandra L Haire5id

1Western Geographic Science Center, US Geological Survey, Moffett Field, CA, USA. 2Rocky Mountain Research Station, USDA Forest Service, Flagstaff, AZ, USA. 3School of Natural Resources and the Environment and The Desert Laboratory on Tumamoc Hill, University of Arizona, Tucson, AZ, USA. 4Independent Researcher, México City, México. 5Haire Laboratory for Landscape Ecology, Belfast, ME, USA.

ABSTRACT: The relationship between people and wildfire has always been paradoxical: fire is an essential ecological process and management tool, but can also be detrimental to life and property. Consequently, fire regimes have been modified throughout history through both intentional burning to promote benefits and active suppression to reduce risks. Reintroducing fire and its benefits back into the Sky Island mountains of the United States-Mexico borderlands has the potential to reduce adverse effects of altered fire regimes and build resilient ecosystems and human communities. To help guide regional fire restoration, we describe the frequency and severity of recent fires over a 32-year period (1985-2017) across a vast binational region in the United States-Mexico borderlands and assess variation in fire frequency and severity across climate gradients and in relation to vegetation and land tenure classes. We synthesize relevant literature on historical fire regimes within 9 major vegetation types and assess how observed contemporary fire characteristics vary from expectations based on historical patterns. Less than 28% of the study area burned during the observation period, excluding vegetation types in warmer climates that are not adapted to fire (e.g., Desertscrub and Thornscrub). Average severity of recent fires was low despite some extreme outliers in cooler, wetter environments. Midway along regional temperature and precipitation gradients, approximately 64% of Pine-Oak Forests burned at least once, with fire frequencies that mainly corresponded to historical expectations on private lands in Mexico but less so on communal lands, suggesting the influence of land management. Fire frequency was higher than historical expectations in extremely cool and wet environments that support forest types such as Spruce-Fir, indicating threats to these systems possibly attributable to drought and other factors. In contrast, fires were absent or infrequent across large areas of Woodlands (~73% unburned) and Grasslands (~88% unburned) due possibly to overgrazing, which reduces abundance and continuity of fine fuels needed to carry fire. Our findings provide a new depiction of fire regimes in the Sky Islands that can help inform fire management, restoration, and regional conservation planning, fostered by local and traditional knowledge and collaboration among landowners and managers.

RESEÑA: La relación entre la gente y los incendios forestales siempre ha sido paradójica: el fuego es esencial como proceso ecológico y herramienta de gestión, pero también puede ser perjudicial para la vida y la propiedad. En consecuencia, los regímenes de incendios se han modificado a lo largo de la historia, mediante quemas intencionales para promover sus beneficios o mediante la supresión activa para reducir sus riesgos. La reintroducción del fuego y sus beneficios a las montañas de las Islas del Cielo, en la frontera entre Estados Unidos y México, tiene el potencial de reducir los impactos adversos de los regímenes de fuego alterados y construir ecossistemas y comunidades humanas resilientes. Para fortalecer la restauración de incendios en la región, describimos la frecuencia y severidad de los incendios recientes en un período de 32 años (1985-2017) de una vasta región binacional de la frontera entre Estados Unidos y México, evaluamos la variación en la frecuencia y severidad de los incendios a lo largo de gradientes climáticos y en relación con la vegetación y la tenencia de la tierra. Sintetizamos bibliografía relevante sobre los regímenes históricos de incendios en nueve tipos de vegetación principales y analizamos si las características observadas de los incendios contemporáneos varían con respecto a expectativas basadas en patrones históricos. Menos del 28% del área de estudio se quemó durante el periodo de observación, excluyendo los tipos de vegetación en climas más cálidos que no están adaptados al fuego (por ejemplo, los Matorrales Desértico y Espinoso). La severidad media de los incendios recientes fue baja a pesar de algunos valores extremos en entornos más fríos y húmedos. En un punto intermedio en los gradientes regionales de temperatura y precipitación, aproximadamente el 64% de los Bosques de Pino-Encino se quemaron por lo menos una vez durante el periodo de estudio. Las frecuencias de incendios tuvieron correspondencia general con las expectativas históricas para las tierras privadas en México, aunque de menor forma en tierras comunales, lo que sugiere que el manejo ejerce influencia sobre los regímenes de incendios. En los entornos extremadamente frescos y húmedos que albergan tipos de bosques como los de Picea-Abies la frecuencia de los incendios excedió las expectativas históricas, lo que indica que las amenazas a estos sistemas pueden atribuirse a las sequías y otros factores. En cambio, los incendios fueron inexistentes o poco frecuentes en grandes zonas de Bosques Abiertos (~73% sin quemar) y Pastizales (~88% sin quemar) debido posiblemente al sobrepastoreo, que reduce la abundancia y continuidad de los combustibles finos necesarios para el transporte del fuego. Nuestros resultados proporcionan una nueva descripción de los regímenes de incendios en las Islas del Cielo que puede contribuir al manejo del fuego, la restauración y la planificación de la conservación regional, fomentada por el conocimiento local y tradicional y la colaboración entre propietarios y responsables del manejo. Palabras clave: incendio forestal, Islas del Cielo, severidad del fuego, tratamientos de combustibles, condiciones de referencia, Landsat, clima

KEYWORDS: Wildfire, Sky Islands, fire severity, fuels treatments, reference conditions, Landsat, climate


FUNDING: The author(s) disclosed receipt of the following financial support for the research, authorship, and/or publication of this article: Funding for this work was provided by the US Geological Survey’s Land Change Science Program and Land Resources Mission Area.

DECLARATION OF CONFLICTING INTEREST: The author(s) declared no potential conflicts of interest with respect to the research, authorship, and/or publication of this article.

CORRESPONDING AUTHOR: Miguel L Villarreal, Western Geographic Science Center, US Geological Survey, P.O. Box 158, Moffett Field, CA, 94035 USA. Email: mvillarreal@usgs.gov

Creative Commons Non Commercial CC BY-NC. This article is distributed under the terms of the Creative Commons Attribution-NonCommercial 4.0 License (https://creativecommons.org/licenses/by-nc/4.0/) which permits non-commercial use, reproduction and distribution of the work without further permission provided the original work is attributed as specified on the SAGE and Open Access pages (https://us.sagepub.com/en-us/hum/open-access-at-sage).
Background
Fire shapes ecosystems across the globe through direct and indirect effects on many processes including biogeochemical cycles and the distribution of vegetation communities.\textsuperscript{1,2} Fire is also a major evolutionary force that has shaped adaptations of plant species, composition of vegetation communities, and the ecology and distributions of animal and human populations.\textsuperscript{3,4} Hence, in systems where natural fire regimes have been altered by reducing or augmenting fire frequency or severity, the sustainability of ecosystem structure and function may be threatened.\textsuperscript{5,6} Changes in fuel structure and ignition severity, the sustainability of ecosystem structure and function have been altered by reducing or augmenting fire frequency or severity, the sustainability of ecosystem structure and function may be threatened.\textsuperscript{5,6} Changes in fuel structure and ignition severity, the sustainability of ecosystem structure and function may be threatened.\textsuperscript{5,6} Hence, in systems where natural fire regimes have been altered by reducing or augmenting fire frequency or severity, the sustainability of ecosystem structure and function may be threatened.\textsuperscript{5,6}

Within the context of conservation, adverse impacts of altered fire regimes may be reduced by implementing restoration strategies, such as prescribed burning and managed wildfires that are based on information about historical fire regimes.\textsuperscript{10}

In the Sky Islands region of the United States-Mexico borderlands, innovative restoration projects initiated by grassroots organizations illustrate how local communities can engage directly with their environments to build resilient ecosystems and human communities.\textsuperscript{11} Restoration of fire-adapted landscapes, where frequent low-severity fire was common, has the potential to contribute to multiple restoration goals including protecting water resources, enhancing habitats for wildlife species, and creating and maintaining the flow and connectivity of ecosystem services across landscapes.\textsuperscript{5} Within the context of restoration, information on timing and spatial patterns of fire and its effects on plants and animals can be integrated with conservation.\textsuperscript{3} Importantly, the considerable knowledge and experience of traditional practitioners in the region could contribute significantly to meeting the challenges of designing and conducting vegetation treatments, prescribed burns, or managed wildfire necessary for restoration.\textsuperscript{12-14}

Restoring natural fire regimes at landscape scales in the United States-Mexico borderlands, however, is complicated by several factors. Various local-scale fuels reduction treatments have been applied in parts of the borderlands region over the past 3 decades, but have shown mixed success in mitigating future wildfire risk and improving ecosystem resilience.\textsuperscript{15} Lack of funding for large-scale fuels management and regulatory issues complicate implementation of landscape-scale, multi-jurisdictional fuels treatments in both Mexico and the United States.\textsuperscript{16,17} The region has complex land ownership and land tenure patterns with varying land uses, management objectives, and human population densities.\textsuperscript{18} In the United States, most land is publicly owned and managed by federal, state, and tribal organizations with top-down fire management plans. In Mexico, large-scale fire suppression and management activities were rare historically and most lands are privately or communally owned, with few scattered protected areas overlaid on these lands. Identifying restoration needs and tailoring restoration activities across such a diverse landscape requires recognizing how legacies of management and human activities may have shaped historical and contemporary fire patterns.

Like other parts of western North America where fire suppression was prevalent, this region has seen a general trend toward more and larger fires over the past 3 decades, particularly in the United States.\textsuperscript{19,20} Understanding the natural variability of fire activity in relation to both climate and human activities is critical to evaluating shifts in fire regimes.\textsuperscript{21} Historically, an abundance of ignition sources from both lighting and humans, and a consistent period of dry weather during late spring and early summer fostered wildfire in the Madrean Sky Island region, except at lower elevations in Desertscrub and subtropical Thornscrub, which lacked fuel continuity.\textsuperscript{22,23} Wildfires spread unimpeded and burned extensive areas across the southwestern United States prior to European settlement. On the US side of the border, livestock grazing and active fire suppression essentially eliminated large fires from the late 19th century to the 1980s,\textsuperscript{24,25} whereas in Mexico, fire suppression was highly variable, and frequent fires continued in some areas, based on information from the few remote sites that have been studied.\textsuperscript{26,27}

Evaluating the characteristics of contemporary fires and their relationship to both climate conditions and human activities in the Sky Islands is now possible due to recently developed data sets. Satellite data from the past 32 years shows that large fires were common during this period in both the United States and Mexico, with the largest fires (>25,000 ha) observed primarily in the United States during recent droughts.\textsuperscript{19} Identifying climate conditions where recent fires burned, the severity and frequency of fire, and the influence of land management can provide information that is critical and complementary to historical perspectives, and inform fuels treatments and restoration planning, given the uncertainty about how fires and vegetation communities will respond to future climate change.\textsuperscript{28}

The goal of this study is to describe and analyze patterns of recent wildfires to help guide long-term restoration and fire management in the Sky Islands region of the United States and Mexico. We addressed the following questions:

1. How do recent patterns of fire severity and fire frequency vary across the region?
2. How do recent fires differ across vegetation types, land tenure, and climatic gradients?
3. Where and how do contemporary fire characteristics compare to expected patterns based on known historical fire regimes? What are the climatic, biotic, and land-use characteristics that support these fires?
Methods

Study area

The 74,788 km² Madrean Archipelago Ecoregion of the United States and Mexico is a global biodiversity hotspot situated in a broad transition zone between the Nearctic and Neotropical biotic realms.29,30 Biogeographical and historical complexity of the region is driven by the influences of the Sierra Madre Occidental and lowland Neotropics to the south, the Rocky Mountains to the north, and the Chihuahuan and Sonoran deserts to the east and west.31

Our study area consists of 39 Sky Island mountain complexes within the Madrean ecoregion (22 in the United States and 17 in Mexico), with a surface area of approximately 39,000 km² (Figure 1). These complexes were delineated based largely on physiographic criteria;37 upper elevations range from a minimum of ~1600 m in the west to above 3300 m, with generally larger ranges that reach higher elevations in the north and east. The region is characterized by bimodal precipitation with summer (June to September) monsoon storms from the east, and winter (November to March) storms of Pacific origin that produce snow at higher elevations.38

The Sky Islands are generally rugged and remote with limited road access or human populations, especially in Mexico.39 Valleys at the base of the mountains and foothills support a variety of land uses and human settlements that are probable sources of fire ignition and fuels management. The upper-elevation forests and woodlands of the Sky Islands in the United States are primarily managed by the US Forest Service (USFS), Department of Interior (DOI), and Bureau of Indian Affairs (BIA), with state and private lands in foothills and lower elevations (Figure 1A). In Mexico, most upper-elevation forests and woodlands are privately owned and include some scattered protected areas (Figure 1A). The foothills and lower elevations are a mosaic of ejido (communal) and private lands with fewer protected areas, which impose management restrictions but do not affect land tenure (Figure 1A). Although ejidos are sometimes thought to be more intensively managed than private lands, the influence of land tenure on vegetation and land use is complex and varies spatially and with environmental and social factors.40,41

Conceptual models of vegetation-fire relationships in the Sky Islands

The Sky Islands of our study region contains 11 vegetation types originally mapped by Brown et al in 199842 and updated by Rehfeldt et al in 2012 (Table 1, Figure 1B). We merged these types into 9 groups based on shared historical characteristics of fire regimes (fire frequency and severity) and vegetation responses to fire. The resulting groups included 4 broad vegetation formations (Semidesert and Plains Grasslands, Sonoran and Chihuahuan Desertscrub, Chaparral, Foothills Thornscrub) and 5 woodland and forest communities.
Table 1. Vegetation types found within the study region summarizing dominant species, species traits, and fire-regime characteristics. We grouped the original communities into 4 broad vegetation formations and 5 woodland and forest types for analyses. Fire-regime descriptions represent our conceptual model of expectations for each type, based on the literature.

<table>
<thead>
<tr>
<th>VEGETATION TYPE</th>
<th>COMMON SPECIES</th>
<th>TRAITS OF DOMINANT PLANT SPECIES</th>
<th>FIRE FREQUENCY (INTERVAL RANGE IN YEARS)</th>
<th>HIGH-SEVERITY % AVERAGE (RANGE)</th>
<th>HIGH-SEVERITY PATCH SIZE (HA)</th>
<th>POSTFIRE VEGETATION RECOVERY (YEARS)</th>
<th>CITATIONS</th>
</tr>
</thead>
<tbody>
<tr>
<td>Spruce-Fir Forests (41)</td>
<td>Picea engelmannii Abies concolor Pinus ponderosa P. strobiformis Pseudotsuga menziesii Populus tremuloides Quercus gambelli</td>
<td>Early seral resprouters and late seral seed established</td>
<td>Infrequent (30-100)</td>
<td>20 (5-80)</td>
<td>&lt;1000</td>
<td>Slow (50-150)</td>
<td>O’Conner et al; Margolis et al</td>
</tr>
<tr>
<td>Mixed conifer forests (43)</td>
<td>Abies concolor P. ponderosa Pseudotsuga menziesii Populus tremuloides Q. gambelli</td>
<td>Thick barked conifers survive fires; some have high dispersal abilities Deciduous species resprout</td>
<td>Frequent (5-20)</td>
<td>5 (3-10)</td>
<td>Minimal, &lt;100</td>
<td>Slow (50-200)</td>
<td>O’Conner et al; Swetnam and Baisan</td>
</tr>
<tr>
<td>Pine-oak forests (10)</td>
<td>Pinus arizonica P. strobiformis P. engelmannii P. leiophylla P. ponderosa Q. hypoleucoides Q. gambelli</td>
<td>Thick barked conifers survive fires; some resprout; serotiny also present Deciduous species resprout</td>
<td>Frequent (5-15)</td>
<td>5 (3-10)</td>
<td>Minimal, &lt;100</td>
<td>Moderate (10-100)</td>
<td>Barton; Iniguez et al; Kaib et al; Swetnam and Baisan; Swetnam et al</td>
</tr>
<tr>
<td>Madrean evergreen forests and woodlands (33)</td>
<td>P. engelmannii P. leiophylla Q. arizonica Q. emoryi Q. hypoleucoides Q. oblengifolia</td>
<td>Thick barked pines survive fires; some resprout; grass-stage seedlings Oak species resprout</td>
<td>Frequent (3-10)</td>
<td>Unknown</td>
<td>Unknown</td>
<td>Very fast (3-20)</td>
<td>Danzer et al; Kaib et al; Swetnam and Baisan</td>
</tr>
</tbody>
</table>

(continued)
<table>
<thead>
<tr>
<th>VEGETATION TYPE</th>
<th>COMMON SPECIES</th>
<th>TRAITS OF DOMINANT PLANT SPECIES</th>
<th>FIRE FREQUENCY (INTERVAL RANGE IN YEARS)</th>
<th>HIGH-SEVERITY % AVERAGE (RANGE)</th>
<th>HIGH-SEVERITY PATCH SIZE (HA)</th>
<th>POSTFIRE VEGETATION RECOVERY (YEARS)</th>
<th>CITATIONS</th>
</tr>
</thead>
<tbody>
<tr>
<td>Pinyon-juniper woodlands (8)</td>
<td>Juniperus depeanna J. scopulorum P. edulis P. discolor</td>
<td>Mainly species with large seeds dispersed by animals</td>
<td>Infrequent (100-400)</td>
<td>10 (3-40)</td>
<td>Minimal, ≤200</td>
<td>Very slow (100-300)</td>
<td>Baker and Shinneman; Floyd et al; Huffman et al; Romme et al</td>
</tr>
<tr>
<td>Chaparral (6)</td>
<td>Arctostaphylos pungens Berberis fremontii Ceanothus greggii Q. turbinella</td>
<td>Obligate seeders and resprouters reestablish quickly</td>
<td>Infrequent (30-100)</td>
<td>80% avg (70-95%)</td>
<td>≤200</td>
<td>Slow (30-150)</td>
<td>Cable; Brooks et al</td>
</tr>
<tr>
<td>Thornscrub (34)</td>
<td>Bursera spp. Calycanthus floridana Fouquieria macdougalii Ipomoea arborescens Lysiloma spp. Parkinsonia praecox Prosopis spp. Stenocereus thurberi Vachellia campechiana</td>
<td>Few species adapted to fire</td>
<td>Very infrequent (likely ≥200-year intervals)</td>
<td>NA</td>
<td>NA</td>
<td>NA</td>
<td>Van Devender et al</td>
</tr>
</tbody>
</table>

*Numbers correspond to vegetation types of Rehfeldt et al within each category.*
(eg, Spruce-Fir Forest, Madrean Evergreen Forests and Woodlands, etc.). The predominant vegetation type is Madrean Evergreen Forests and Woodlands (~20000 km²) at moderate to high elevations, followed by Desertsrub (~6500 km²) and Thornscrub (~5000 km²) at low elevations in the south, and Grasslands (~4000 km²) at low elevations in the north and central portion of the study area. Pine-Oak (~15000 km²), Mixed Conifer (~200 km²), and Spruce-Fir (~7 km²) forests are restricted to the highest elevations (Figure 1). Chaparral (~900 km²) and Pinyon-Juniper Woodlands (~18 km²) are mapped only in the 2 northernmost Sky Islands, but similar vegetation occurs in northern Sonora. Information on dominant species in each vegetation type and fire adaptation and reproduction and regime traits are summarized in Table 1, and more detailed descriptions are provided in the Supplemental Materials.

Characteristics of historical fire regimes (ie, fire severity, fire frequency, and high-severity patch size) prior to European settlement were identified from various sources including regional dendrochronology and ecology studies and historical accounts (Table 1; see details in Supplemental materials). Fire in forested vegetation communities ranged from infrequent stand-replacing fires (spruce-fir forests; 100-400 years) to frequent mixed-severity (mixed conifer; 10-20 years) and low-severity (pine-oak forests; 5-10 years) (Table 1). Fire regimes in woodland vegetation types ranged from frequent (evergreen forest and woodlands; 3-10 years) to infrequent (pinyon-juniper; 100-400 years) and low frequency in grasslands (2-10 years) and low frequency in thornscrub (30-100 years) (Table 1).

Fire identification and fire severity mapping

In the United States, federal agencies maintain a comprehensive spatial database of large (>400 ha) wildfires mapped from satellite imagery (1984–present) through the monitoring trends in burn severity (MTBS) program. Since an equivalent database does not exist for lands in Mexico, we developed a comparable database of fire perimeters and burn severity products for the Sky Islands in Mexico. Fire perimeter and severity data sets are available from USGS ScienceBase and links are provided in the Supplemental Materials section.

We used Landsat-derived differenced normalized burn ratio (dNBR) images from 335 fires identified across the region from 1984 to 2017 to quantify spatial patterns of high-severity fire, which is an important indicator of potential for vegetation recovery. Before classification, we used the aggregate function to resample the dNBR images; the maximum dNBR value was assigned to ~1 km cells. Determining a threshold value for high severity is a subjective process without prefire and postfire field data to guide the classification. In the absence of field data for the 335 fires, we classified the dNBR images into binary maps of high severity (1) or not (0) using multiple thresholds; high severity was classified using a single value from 450 to 650 in increments of 10 (ie, total of 21 classified maps). The percent high severity for each fire was calculated for each classified map by summing the raster cells with value = 1 and dividing by the total number of raster cells in the dNBR image.

Statistical analyses

To assess regional variation in recent fires (eg, question 1), we summarized observed fire severity and frequency from mapped data and computed descriptive statistics. To assess environmental variation in recent fire severity (eg, question 2), we developed generalized additive models (GAMs) using high-severity composition as the response and mean PC1 and PC2 values within each fire perimeter as predictors. Data for fires in each country were modeled separately (n = 203 fires times 21 thresholds = 4263 data points for United States; n = 132 fires times 21 thresholds = 2772 data points for Mexico). As high-severity composition was measured using multiple thresholds, model fit reflected both variability due to threshold and trends in high severity across PC1 and PC2. Confidence intervals (95%) were developed using 1000 points generated across the climate gradients as a way to evaluate model fit. We displayed the GAM smooth plots in panels to examine differences in relationships across PC1 and PC2, facilitating visualization of
high-severity composition across climate, vegetation types, and land management (eg, question 3).

We calculated 2 fire-regime metrics in addition to high severity (%) described above: (1) number of times burned and (2) mean fire return interval (eg, question 1). Metrics were examined across the PC climate gradients and compared observations to expectations for each vegetation type (eg, question 2 and 3; Table 1). To quantify the number of times burned, we used the fire perimeter data to map the total number of fires within 100-m resolution grid cell. The mean fire return interval within the study period was calculated by generating annual raster maps of each fire year in which grid cell value was set to year if burned or zero if unburned. The annual raster layers were sampled at random locations \( n = 5000 \) to generate a matrix of random locations (rows) and year of burning (columns). The observed mean fire return interval for each random point location was calculated as

\[
\frac{1}{n-1} \sum_{i=1}^{n-1} (\text{fireyear}_{i+1} - \text{fireyear}_i)
\]

where the sum of the lag differences in fire years is divided by the number of intervals (ie, number of fire years \( n \) minus 1). Finally, a data set of the values for times burned and mean fire return interval was combined with values for PC1 and PC2, vegetation types, management, and country at the random point locations. Using the sample data, we identified what range of climatic, biotic and land-use characteristics support contemporary fires that differ in each of the 3 fire-regime metrics (eg, questions 2 and 3). Data and code used for the analysis can be found on Github: https://github.com/HaireLab/Fuego-en-la-Frontera.

### Results

#### Regional patterns of burned area, fire frequency, and fire severity (Question 1)

Approximately 8675 km\(^2\) of the 39 698 km\(^2\) study area (21.8%) burned between 1985 and 2017 (10 480 km\(^2\) total area when including areas that reburned), with much of that occurring in Madrean evergreen forests and woodlands and pine-oak forests (Table 3). As a percentage of total area, 64% of pine-oak forests...
and 27% of Madrean evergreen forests and woodlands burned. Similarly, nearly all spruce–fir and mixed conifer forests burned, and most spruce–fir forest burned twice. Fires in chaparral, pinyon-juniper woodlands, desertscrub, and thornscrub were limited, but a moderate proportion (12–18%) of burned area was observed in desertscrub and grassland relative to total area (Table 3).

Over 25% of areas that burned experienced more than one fire across time, with areas that reburned scattered across mountain ranges (Figure 2A). Some locations burned up to 4 (3500 ha) or rarely 5 times (80 ha) (Figure 2A). Higher incidences of reburning were observed near the United States–Mexico border including in mountains just south of the Mexico border.

Some larger mountain ranges in Mexico had only a few small fires and minimal reburning, especially in thornscrub in the south and southwestern portions of the study region. In the United States, there were instances where very large portions of some ranges burned in a single fire, with scattered reburning by subsequent smaller fires (eg, Santa Catalina, Rincon, and Chiricahua).

Geographic distribution of dNBR values varied among mountain ranges and across latitude, in both the mean and range of values (Figure 2B). The dNBR values were fairly low overall, but ranges extended to ≥900 in 4 ranges: Pinaleño (max = 986), Chiricahua (max = 951), Santa Catalina (max = 933), and Los Ajos (max = 927).

Sky Islands in the central part of the region near the international border in Mexico had greater heterogeneity in fire effects. For example, Atascosa-Cibuta (M = 33; SD = 185; max = 721) and El Pinito (M = 45; SD = 142; max = 632) had among the highest variation, whereas borderland ranges in the United States tended to exhibit less variation with distributions often skewed toward higher values (eg, Huachuca (M = 77; SD = 88; max = 809) and Animas (M = 54; SD = 102; max = 743; Figure 2B).

### Vegetation, land management, and fire severity across climate gradients (Question 2)

The PC1 gradient represented a transition from earlier spring onset and higher temperatures typical of lowlands to later spring onset and cooler temperatures that characterize montane environments. In general, PC1 values were lower in Mexico corresponding to generally lower maximum elevations of mountain ranges to the south (Figure 3A and B). Grassland, Desertscrub, and Thornscrub (found only in Mexico) had much lower values along this gradient. In contrast, values were higher for mesic forests and woodland types that tend to occur at higher elevations and latitudes, especially mixed conifer and spruce–fir forests, which occur mostly or completely in the United States (Figure 3A). True chaparral, which only occurs in the United States, had moderate values along the gradient.

Along the PC2 gradient, vegetation types mirrored PC1 density distributions, with some distinctions in location and interpretation of heat moisture and precipitation (Figure 3C and D). In the United States, spruce–fir forests occur in environments with lower heat moisture and more precipitation, transitioning to dry forests where conditions are somewhat higher in heat moisture but lower in precipitation. In Mexico, thornscrub occurs midway on the PC2 heat moisture/precipitation gradient; while grasslands and desertscrub in both countries, as well as chaparral in the United States, have relatively higher heat moisture and lower precipitation.

Land tenure classes in the United States were unevenly distributed along PC1, with BIA, DOI, and state lands predominant at the lower to middle portions of the PC1 gradient.
(Figure 3E and F). As the gradient shifts to later spring onset and cooler temperatures, these tenure classes are less common and Department of Defense (DOD) and USFS classes become more common. The USFS is the only tenure class at the upper end of the gradient where cooler temperatures and later spring are common. In Mexico, ejidos, private, and protected areas are present across the lower to middle range of this environmental gradient (Figure 3F). Values for ejido lands were lower in areas with relatively later spring and lower mean annual temperature, whereas protected areas were more common in those conditions, indicating distributions at low and high elevations and latitudes, respectively.

Along the second gradient (PC2), USFS and DOD lands were common at the lower to mid-range, where heat moisture is relatively low and annual precipitation is relatively high (Figure 3G and H). A diversity of land tenure classes occupies the middle to upper range of PC2; DOI and state lands were present at the upper end of the gradient in the United States (ie, higher heat moisture and lower annual precipitation). In Mexico, land tenure classes overlap across the range of environments present from the middle to upper range of the gradient (Figure 3H).

High-severity patterns (ie, sites with remarkable prefire to postfire changes) were closely related to environmental gradients along PC1, based on model statistics for both nations (34.7% and 43.6% deviance explained for Mexico and United States respectively; Figure 4A and B). High-severity patches were sparse or absent in places with early growing seasons and warmer annual temperatures. Midway along the PC1 gradient, patterns became more variable, especially for fires in Mexico, but trends indicated low overall amounts of high severity. In general, high severity increased along PC1 gradient; however, the steep upward slope in Mexico was driven by a single outlier at the high end of PC1. High severity in several US fires at the upper end of PC1 (cooler temperatures, later spring) resulted in a steep upward trend. The range in high severity was greater for different threshold values for most fires in Mexico versus the United States (Figure 4A and B) consistent with the heterogeneity of dNBR values noted in section “Regional patterns of burned area, fire frequency, and fire severity.” Mexico fires exhibiting variability in severity composition with different threshold classifications were located within the middle portions of PC1 and PC2.
The heat moisture-annual precipitation gradient (PC2) was a good predictor of high-severity fires in the United States (deviance explained = 53.9%) (Figure 4C). A steady downward trend was observed as climate environments moved from lower to higher heat moisture and from higher to lower precipitation. In Mexico, however, high severity had a significant but weaker relationship with PC2 (deviance explained = 5.09%). Overall, high-severity composition of fires in Mexico was low along this gradient, based on the model fit line (Figure 4D).

Of areas that burned, those that burned only once were most common and occurred across a broad range of PC gradients (Figure 5A to D). Areas with late spring and lower temperature (PC1) and heat moisture and higher precipitation (PC2) burned twice during the study period. Vegetation types at these locations were mixed conifer and spruce-fir forests (Figure 3A; Table 4), and tenure was primarily USFS with some BIA and private land (Figure 5A; Table 4). Areas that burned twice were located in more central portions of the PC gradients in several vegetation types, under a variety of land tenure classes.
of tenures (Figure 3; Table 4). Highest fire frequency (mean ≥ 2.4) was observed in grasslands under state or DOI management and in pine-oak forests in protected areas in Mexico (Table 4).

The shortest fire return intervals were rare, but places that burned at intervals of 5.5 to 10 years occurred in warmer, drier environments in both the United States and Mexico (Figure 6). In the United States, longer fire return intervals generally occurred in areas with higher PC1 and lower PC2 values (Figure 6A and C, Table 4). In Mexico, longer fire return intervals (mean 16-20 years) were observed in pine-oak forests; maximum intervals of 21 to 25 years occurred in Madrean evergreen forests and woodlands and pine-oak forests on both ejido and private lands (Figure 6; Table 4). Intervals of 26 to 28 years were also rare but did occur in scattered locations across climate, vegetation, and tenure.
Table 4. Number of times burned, mean fire return interval, and mean principal component values for vegetation types under various land tenure classes. Statistics are based on a random sample of point locations that burned more than once during the study period (1985-2017).

<table>
<thead>
<tr>
<th>LAND TENURE CLASS</th>
<th>TIMES BURNT</th>
<th>MEAN FIRE RETURN INTERVAL</th>
<th>CLIMATE GRADIENT</th>
</tr>
</thead>
<tbody>
<tr>
<td></td>
<td>MEAN</td>
<td>MAX</td>
<td>SD</td>
</tr>
<tr>
<td>Spruce-fir forests</td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>USFS</td>
<td>2.0</td>
<td>2.0</td>
<td>0.0</td>
</tr>
<tr>
<td>Mixed conifer forests</td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>BIA</td>
<td>2.0</td>
<td>2.0</td>
<td>NA</td>
</tr>
<tr>
<td>Private</td>
<td>2.0</td>
<td>2.0</td>
<td>0.0</td>
</tr>
<tr>
<td>USFS</td>
<td>2.0</td>
<td>2.0</td>
<td>0.0</td>
</tr>
<tr>
<td>Pine-oak forests</td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>Ejido</td>
<td>2.0</td>
<td>2.0</td>
<td>0.0</td>
</tr>
<tr>
<td>Private</td>
<td>2.3</td>
<td>4.0</td>
<td>0.5</td>
</tr>
<tr>
<td>Protected</td>
<td>2.9</td>
<td>4.0</td>
<td>0.8</td>
</tr>
<tr>
<td>Evergreen forests and woodlands</td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>BIA</td>
<td>2.0</td>
<td>2.0</td>
<td>NA</td>
</tr>
<tr>
<td>DOD</td>
<td>2.0</td>
<td>2.0</td>
<td>0.0</td>
</tr>
<tr>
<td>DOI</td>
<td>2.3</td>
<td>3.0</td>
<td>0.4</td>
</tr>
<tr>
<td>Ejido</td>
<td>2.1</td>
<td>3.0</td>
<td>0.3</td>
</tr>
<tr>
<td>Private</td>
<td>2.2</td>
<td>3.0</td>
<td>0.4</td>
</tr>
<tr>
<td>Protected</td>
<td>2.2</td>
<td>3.0</td>
<td>0.4</td>
</tr>
<tr>
<td>State</td>
<td>2.2</td>
<td>3.0</td>
<td>0.4</td>
</tr>
<tr>
<td>USFS</td>
<td>2.1</td>
<td>4.0</td>
<td>0.3</td>
</tr>
<tr>
<td>Grasslands</td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>DOI</td>
<td>2.5</td>
<td>4.0</td>
<td>0.6</td>
</tr>
<tr>
<td>Private</td>
<td>2.2</td>
<td>3.0</td>
<td>0.4</td>
</tr>
<tr>
<td>Protected</td>
<td>2.1</td>
<td>3.0</td>
<td>0.3</td>
</tr>
<tr>
<td>State</td>
<td>2.4</td>
<td>3.0</td>
<td>0.5</td>
</tr>
<tr>
<td>USFS</td>
<td>2.0</td>
<td>2.0</td>
<td>0.0</td>
</tr>
<tr>
<td>Thornscrub</td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>Private</td>
<td>2.0</td>
<td>2.0</td>
<td>0.0</td>
</tr>
<tr>
<td>Desertscrub</td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>DOI</td>
<td>2.0</td>
<td>2.0</td>
<td>0.0</td>
</tr>
<tr>
<td>Private</td>
<td>2.0</td>
<td>3.0</td>
<td>0.2</td>
</tr>
<tr>
<td>State</td>
<td>2.0</td>
<td>2.0</td>
<td>0.0</td>
</tr>
<tr>
<td>USFS</td>
<td>2.1</td>
<td>3.0</td>
<td>0.3</td>
</tr>
</tbody>
</table>

*Land tenure classes: BIA, Bureau of Indian Affairs; DOD, Department of Defense; DOI, U.S. Department of the Interior; Private, Protected (Protected Areas in Mexico); State; USFS, United States Forest Service.*
Discussion

Our analyses across this vast, culturally and ecologically diverse region illuminates important contemporary patterns of fire occurrence and fire effects and how they have varied from those experienced historically. Results of this study, in combination with recent work on traits and spatiotemporal distribution of recent fires in this large region of high conservation value\textsuperscript{18,19} are especially significant in Mexico, where past studies in the Sky Islands region were limited to only a few small areas.\textsuperscript{25,27,72}

Understanding fire regimes across climate gradients that underpin plant community composition and structure can aid in evaluating the potential impacts of human activities on fire.\textsuperscript{21} In the middle zone of the climate gradient, the Nearctic-Neotropical transition encompasses forest and shrub communities that are more amenable to fuel management (or restoration activities). In contrast, forests and desert communities in extreme climates are subject to increased fire frequency from human activities, invasive species, and climate change that can result in dramatic shifts in vegetation communities.\textsuperscript{22} Differences observed between recent fire characteristics and expectations based on historical information highlights the many ways past human-ecosystem interactions, land tenure, and bioclimatic settings can interact to influence fire regimes. Addressing interactions between land use, climate, and fire is critical for fostering dialog among diverse stakeholders and guiding restoration and land management objectives, especially in areas at risk of high-severity fire.

Regional overview

Recent fires influence landscape pattern and process across the Sky Islands region. Numerous fires occurred during the study period and burned >10,000 km\textsuperscript{2} of land, with over 25% of areas experiencing more than one fire during the period. Average fire severity was low during the study period across the region, with a few notable exceptions. That is, except for a few fires in cold/wet sites that occur exclusively in the United States, most other fires average less than 10% high severity within the fire perimeter (Figure 4). In all, less than 28% of the study area burned across a period of 27 years, excluding vegetation types in warmer climates that are not adapted to fire such as desertscrub and thornscrub. Fires in grasslands were much less frequent than expected, suggesting an overall fire deficit (ie, lack of fire) and the need to promote fire in these warm, dry environments at lower elevations. In contrast, fire was more common in some cooler mesic environments that historically burned very infrequently, suggesting a fire surplus. The occurrence of fires across wide ranging environments and diverse ownership, tenure and land use make interpretation of the fire-regime complex.

Sky Islands adjacent to the United States-Mexico border displayed some novel contemporary fire-regime characteristics. Mountain ranges along the border had the greatest number of fires and mix of severities (Figure 2), with previous research showing high variation of fire size and shape,\textsuperscript{19} and ignition dates\textsuperscript{73} outside the normal fire season. Such contemporary fire-regime characteristics may be attributed, in part, to human activities. This includes a highly heterogeneous mix of land uses along the border, high population densities in border towns, and immigration policies that funnel movements of immigrants who use fire for cooking and warmth, which provides ignition sources, into remote areas.\textsuperscript{74} Fire effects skewed toward higher severity in the Sky Islands just north of the United States border, which are focal areas for immigrants, and mixed and lower severities in Mexico, where immigrant traffic is presumably lower. Apart from anthropogenic ignition sources, the differences in observed fire severity between United States and Mexico are related to differences in historical legacies of land management, fire use, fire suppression, and...
fuel accumulation. Communities living near borderland ranges are likely most impacted by alteration of ecosystem services, including those influenced by wildfire. Information on current fuel conditions and fire history can help guide fuel-reduction treatments and manage wildfires in areas near human communities that are at greatest risk of hazardous fire, and foster continued burning in areas of Mexico that benefit from frequent, low-severity fires.

One of the primary ways that people influence ecosystems is by altering the location and timing of fire. A focus on anthropogenic alterations to fire regimes in the Madrean Sky Islands has added benefits toward restoration because of the potential to highlight the relevance of traditional knowledge systems and practices. Sustained use of fire for active management of forests and woodlands was practiced historically by native peoples of the American Southwest for propagation of wild plants and crop cultivation, and such management supported a continuous frequent fire regime in some locations throughout the 19th and 20th centuries. Recent efforts in Mexico seek to reconcile more recently adopted fire-fighting efforts with the ecological use of fire and community fire management. Systems based on traditional knowledge have evolved to work in concert with social and ecological conditions, and thus it is possible that traditional knowledge and practice may provide management alternatives that restore ecosystems as climatic conditions change.

Restoring natural fire regimes to the Madrean region has important implications for wildlife conservation. Wildlife in these systems have evolved in the presence of frequent fire, which helps foster habitats for many species and promotes landscape heterogeneity. Landscape heterogeneity from varying fire severities, frequencies, and sizes can lead to increased biodiversity, but responses to burn severity can differ based on historical fire regimes, times since fire, and prefire conditions linked to timber harvest. Fire is important for nutrient cycling and invigorating vegetation growth in ways that foster low shrubby, herbaceous, and grassy vegetation, which provides important food and cover for a multitude of wildlife species, including breeding birds. Hence, ensuring land management practices that promote (restore) and maintain natural fire regimes, combined with other active restoration measures are complementary and essential for long-term maintenance of biodiversity and ecosystem services.

Implementation of landscape-scale restoration planning and subsequent actions in the study area, with a focus on fire, requires binational cooperation and coordination between land management agencies, tribes, and private and communal landowners. Moving forward, it is critical to continue to engage a wide range of stakeholders in the United States and Mexico, including First Nations and local communities. Two recent examples from both sides of the international border showcase efforts to implement multistakeholder fire treatments with participation of local communities in the Sky Islands of Sonora and in the FireScape program in Arizona (azfirescape.org).

Climate, land use, and vegetation conditions where fire characteristics diverge from historical regimes

Mesic high elevation forests. Fires with the greatest proportion of high-severity areas occurred predominantly in Mixed Conifer and Spruce-Fir forests in cooler, wetter climates of the United States. In these settings, such fire characteristics largely match historic expectations for severity; however, our analyses found that >85% spruce-fir and mixed conifer forests in the Sky Islands burned during the study period and that fires in spruce-fir forests were much more frequent than they were historically.

Although high-severity fires are part of the historical fire regime within these vegetation types, the size, and frequency of these fires could have deleterious effects on persistence of these forests, which have high conservation value. While it is difficult to correlate the impact of land management and historical fire suppression on high-severity fire events, increased fire frequency combined with recent drought events suggest climate forcing as a likely mechanism. Spruce-fir and mixed conifer systems evolved with high-severity fire and are able to slowly regenerate and recover during fire-free periods, which can last decades to centuries. Extreme drought required to foster fire in mesic spruce-fir forests were historically rare but are becoming more common, particularly in southwestern North America where they augment risk of type conversion into forest communities that are adapted to more frequent fire and drought.

Frequent fire patterns observed within spruce-fir forests will likely continue unless management actions may reduce some of the factors that increase risk. Reducing future fire activity in remaining stands could be accomplished by reducing fuels in adjacent mixed conifer and pine forests to prevent fire spread into upper elevations. While forest restoration in mixed conifer forests has also been proposed to reduce high-severity fire risk for Mexican spotted owl habitat, uncertainty remains with the short-term impacts versus potential long-term benefits of these treatments on this species and effectiveness of treatments in mitigating fire behavior.

Madrean Evergreen Forests and Woodlands. Madrean evergreen forests and woodlands are the dominant vegetation type across the region and in the adjacent Sierra Madre Occidental, and contribute significantly to regional biodiversity. More than half the total area burned in the study region occurred within this vegetation type which is supported by warm to moderate temperatures and relatively early onset of the growing season (Figure 3). However, overall area burned included only 27% of total coverage of this vegetation type, indicating an overall fire deficit. Areas that burned multiple times had slightly less-frequent fire than historical intervals of 3 to
10 years. While approximately 50% of this vegetation type in the region is privately owned, only approximately 22% of private lands burned during the study period, which contrasts sharply with 49% that burned on USFS lands and frequent fire observed on DOI lands (5-28 years; Table 4). Fires were even less common on ejido lands in Mexico, with only 15% burned and high variability in high-severity fire. These contrasts suggest that variation in land management practices on private versus ejido lands may have driven these fire patterns, with important implications for restoration.

The fire deficit on ejido and private lands suggests activities such as grazing may have altered the abundance and spatial continuity of fine fuels, thereby precluding fire spread. Such drivers had major impacts on fire regimes in southern Arizona after the 1890s, and approximately 40 years later in a northern Sky Island in Mexico. Observed differences between private and ejido lands in Mexico may be due to more intensive management of communal lands, lower elevation settings and thus greater aridity, or closer to human population centers, which is associated with more intensive land uses. Given limited understanding of the ecology and fire histories of Madrean evergreen forests and woodlands, high relative abundance of this vegetation type in the study area, and resilience to fire (shown, for instance, through resprouting), they present a unique opportunity for land managers to experiment with different restoration strategies to achieve desired future conditions.

Grasslands. Historically, frequent low-intensity fires were relatively common in the warm, dry environments that support grasslands in the region (Figure 3), but livestock grazing since the late 19th century effectively reduced fine fuels that foster fire spread, interrupted the fire cycle, and ultimately contributed to changes in species composition and structure. In the past, grassland fires were important ignition sources for fires in higher elevation Madrean woodlands and forests. We found that only a small percentage of Grasslands experienced fire within the study period, and those that did burn in the United States showed fire frequencies within the historical range \((\bar{X} = 8.1 – 9.7\) years) with slightly longer intervals in Mexico \((\bar{X} = 11 – 12\) years). Restoration of grassland fire regimes is a management priority in some US landscapes where private landowners and federal agencies often collaborate on managed burns in an effort to reduce woody vegetation cover, increase native grass cover, and reduce stream channel erosion. However, elsewhere in the region livestock grazing may be contributing to the observed fire exclusion, particularly in Mexico and within state lands in the United States, where fire exclusion is likely a key factor in reduced fire frequency in the adjacent uplands.

Vegetation types where fire characteristics are similar to historical regimes

Fire regimes observed in some pine-oak forests, prevalent in wetter and cooler environments in the upper elevations of Mexico, appeared to be within the range of historical variability. In fact, 64% of these forests burned at least once during the study period, and the greatest number of reburns was observed in protected areas like the Área de Protección de Flora y Fauna Ajos-Bavispe in Mexico. On private lands in Mexico, fire frequency roughly corresponded with historic fire-return intervals but was less frequent than that found historically on ejido lands (18.6 years), which suggests land management has limited fire in some areas. Frequent fires observed in pine-oak forests in Mexico, suggest a need to restore frequent fire in other vegetation communities across the region and maintain fire regimes in areas with mixed land tenures. Therefore, it is critical to understand the environmental conditions that set the stage for these fires, as well as how private and communal landowners engage with fire when they occur, to design a robust regional fire strategy that can be implemented in other areas.

The mix of high- and low-severity fires in pine-oak forests suggest that these communities may still be at risk of conversion from high-severity fire. Recent high-severity fires may limit pine regeneration and drive conversion of mixed pine-oak stands to oak woodlands in some places. Pine regeneration requires significant fire-free intervals, and thus reburning high-severity patches may be detrimental to regeneration. However, managing for continued burning within areas that burned at lower severities can help to reduce tree densities and accumulated fuels.

Conclusions

Until recently, our understanding of contemporary fire regimes in the Madrean Sky Islands was derived from data and research conducted primarily in the southwestern United States. We investigated wildfire regimes in both Mexico and the United States and across a range of land tenure types, resulting in new findings and a more complete picture of regional fire regimes that can help inform fire management, restoration, and regional conservation planning.

We identified areas in upper-elevation pine-oak forests of Mexico with characteristics similar to estimated historical fire regimes, while high-elevation spruce-fir and mixed conifer forests in the United States appear to be burning more frequently than historically, which represents a potential threat to these regionally rare vegetation types. Our results suggest that while fire remains an active natural disturbance in some parts of the Madrean Sky Islands, human land uses and the legacies of fire suppression continue to shift fire regimes away from historical patterns. Woodlands and grasslands experienced an overall fire deficit compared to historical, suggesting a need to implement large- and local-scale fire treatments in these vegetation types. Sky Islands on the United States-Mexico border exhibited the greatest fire-regime variability corresponding to human activities; communities along the border may be especially vulnerable to wildfire risks, and cross-boundary, multifacultative fire management may be
necessary to counter the potentially deleterious effects of possible high-severity fire in remaining unburned areas.

Restoring wildlife habitats and landscape connectivity, protecting water sources, and sustaining cultural and economic values associated with traditional livelihoods can benefit from restoration programs that include fire. Regional conservation partnerships like Sky Islands Research Collaborative, Malpai Borderlands Group, and Wildlands Network Mexico, are important for fostering regional and international relationships and collaborations necessary to achieve these goals. Promoting connections across landscapes and people in the borderlands through restoration, collaborative conservation, and communication is essential for sustaining these landscapes into the future.

Acknowledgements
The authors would like to thank Laura Norman of the USGS, section editor Jesús Rodrigo-Comino, and 2 anonymous reviewers for their constructive reviews of the manuscript. They appreciate support from the McGarigal laboratory at the University of Massachusetts. Methods and code used in the climate analysis were developed by E. Whitman and E. Battlori. Any use of trade, firm, or product names is for descriptive purposes only and does not imply endorsement by the US Government.

Author Contributions
MLV, SLH, JMI and CCM conceived the study. MLV and CRC developed remote sensing fire products. SLH and MLV analyzed the data. JMI, ADF, CCM, JSS and MLV developed the conceptual models of historical fire regimes. SLH, MLV and CCM developed visualizations and maps. All authors contributed to writing the paper. CCM translated the manuscript to Spanish.

ORCID iDs
Miguel L Villarreal https://orcid.org/0000-0003-0720-1422
Aaron D Flesch https://orcid.org/0000-0003-3434-0778
Citlali Cortés Montaño https://orcid.org/0000-0002-1916-1985
Sandra L Haire https://orcid.org/0000-0002-5356-7567

Supplemental material
Supplemental material for this article is available online.

REFERENCES