Running Head: Reburns Reduce Sagebrush Diversity.

Title: Repeated Fires Reduce Plant Diversity in Low-Elevation Wyoming Big Sagebrush Ecosystems (1984-2014).

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1 Abstract

Sagebrush is one of the most imperiled ecosystems in Western North America, having lost about half of its original 62 million hectare extent. Annual grass invasions are known to be increasing wildfire occurrence and burned area, but the lasting effects (> five years post-fire) that the resulting reburns have on these plant communities are unclear. We created a fire history atlas from 31 years (1984 to 2014) of Landsat-derived fire data to sample along a fire frequency gradient (zero to three fires) in an area of northern Nevada that has experienced frequent fire in this time period. 32\% of our study area (13,000 km²) burned in large fires (over 404 ha) at least once, 7% burned twice, and 2% burned three or more times. We collected plant abundance data at 28 plots (N=7 per fire frequency), with an 10 average time-since-fire of 17 years. We examined fire's effect on plant diversity using species 11 accumulation curves, alpha-diversity (Shannon's dominance, Pielou's evenness and number 12 of species), and beta diversity (Whittaker, Simpson, and Z indexes). For composition, we 13 used non-metric multidimensional scaling. We then used PERMANOVA models to examine how disturbance history, temperature, precipitation and aridity around the time of the fire 15 affected subsequent community composition and diversity. 16

One fire fundamentally changed community composition and reduced species richness, and
each subsequent fire reduced richness further. Alpha diversity decreased after one fire. Beta
diversity declined after the third fire. Cover of exotics was 10% higher in all burned plots, and
native cover was 20% lower than in unburned plots, regardless of frequency. PERMANOVA
models showed fire frequency and antecedent precipitation as the strongest predictors of beta
diversity, while time since fire and vapor pressure deficit for the year of the fire were the
strongest predictors of community composition. Given that a single fire has such a marked
effect on species composition, and repeated fires reduce richness and beta diversity, we suggest
that in lower elevation big sagebrush systems fire should be minimized as much as possible,
perhaps even prescribed fire. Restoration efforts should be focused on timing with wet years

- on cooler, wetter sites.
- 28 Key Words: Bromus tectorum, cheatgrass, fire, sagebrush, fire frequency, repeated fire, biodi-
- 29 versity, community composition, Artemisia tridentata ssp. wyomingensis

30 Introduction

Wildfire activity has been increasing across the western U.S. since the 1980s (Westerling et al. 31 2006, Dennison et al. 2014, Westerling 2016, Balch et al. 2017), and this is leading to concern among land managers in the U.S. Great Basin (Miller et al. 2013, Integrated Rangeland Fire 33 Management Strategy Actionable Science Plan Team 2016, Chambers et al. 2017). This trend will likely continue as rising temperatures and more frequent drought events increase the probability of fire (Krawchuk et al. 2009, Moritz et al. 2012, Liu et al. 2013), and as these climatic factors combine with increased human ignition pressure (Balch et al. 2017) and land use change (Bowman et al. 2011) to increase the length of the fire season (Wotton and Flannigan 1993, Jolly et al. 2015). This increased fire activity is one contributing factor to the loss of approximately half of the area of sagebrush (Artemisia tridentata) shrubland communities, which once occupied over 600,000 km² in the western US. Much of this land is now dominated by cheatgrass (*Bromus tectorum*) (Bradley and Mustard 2008), an introduced annual grass (Davies 2011). This in turn is initiating a positive feedback, wherein invading plants increase the probability of fire, and increased fire activity stimulates more annual grass invasion (D'Antonio and Vitousek 1992, Brooks et al. 2004, Balch et al. 2013). The result is a fire return interval that has decreased from a historical range of 100-342 years for intact sagebrush (Baker 2006, Bukowski and Baker 2013) to 78 years in invaded areas (Balch et 47 al. 2013), to as low as 3-5 years in cheatgrass-dominated areas in the Snake River Plain (Whisenant 1990). This increase in fire activity results in more areas that are burned multiple times, and the lasting effect this has on plant communities' biodiversity and composition is relatively unknown. There are relatively few studies on the impacts of fire after more than 5 years (but see Beck et al. 2009, Reed-Dustin et al. 2016), and fewer still that analyze the

impacts of repeated fires in the same location (Miller et al. 2013).

There are at least 40 vertebrate species of conservation concern associated with sagebrush habitats (Rowland et al. 2006), including the greater sage grouse (Centrocercus urophasianus). Greater sage grouse depends on sagebrush for its habitat and has been a management priority by land managers (Chambers et al. 2017). Optimal shrub cover for sage grouse is 15-25% with over 15% bunchgrasses and forbs (Beck et al. 2009). Fire is one of the top 2 threats to the greater sage grouse in the western part of its range (Brooks et al. 2015), and the loss of sagebrush due to wildfire has contributed strongly to its population declines over the past 30 years (Coates et al. 2016). Land management agencies have linked fire management with long-term conservation goals focused on sagebrush ecosystems and the greater sage grouse (Chambers et al. 2017). There is emerging consensus among researchers and land managers that lower elevation Wyoming big sagebrush (A. tridentata ssp. wyomingensis) ecosystems are not resilient to fire (Chambers et al. 2014) and should be prevented from burning whenever possible, while higher elevation Mountain big sagebrush (A. tridentata ssp. vaseyana) ecosystems may still recover naturally (Hanna and Fulgham 2015) or with restoration by seeding (Knutson et al. 2014). Several authors have recommended attempting to reduce the size and frequency of wildfire, and stopping the use of prescribed fire (Whisenant 1990, Baker 2006, Lesica et al. 2007, Beck et al. 2009), while also reducing grazing (Shinneman and Baker 2009, Ellsworth and Kauffman 2013). Others have urged caution with the use of prescribed fire (Davies et al. 2009, Reed-Dustin et al. 2016, Shinneman and McIlroy 2016). There has been disagreement in the past about the historical fire return interval for Wyoming big sagebrush. It has been characterized as being every 35-100 years (Schmidt et al. 2002), every 100-240years (Baker 2006), to every 171 – 342 years (Bukowski and Baker 2013). This discrepancy has important management implications, leading to disagreement as to which stressors or disturbances (e.g. grazing, fire) need to be increased or decreased in order to manage for

healthy sagebrush ecosystems. The lower estimations imply the system is fire-dependent and requires frequent burning in order to persist, while the upper estimates suggest fire-sensitivity.

Wyoming big sagebrush assemblages are generally agreed to be an endangered ecosystem and fire and the invasive plants that generally colonize afterwards are thought to be two major drivers of declining biodiversity in this system (Davies et al. 2011). Cover of introduced annual grass species have been mostly observed to be negatively related to species richness and native diversity (Davies 2011, Gasch et al. 2013, Bansal and Sheley 2016), but over a 45 year period Anderson and Inouye (2001) found that while introduced annual grass cover was negatively correlated with cover of native species, species richness was unrelated. While fire is strongly correlated with annual grass cover in this system at regional scales (Balch et al. 2013), it has also been shown to be an unimportant predictor variable for both exotic cover and species richness in eastern Washington (Mitchell et al. 2016).

Post-fire communities of introduced annual grasses are affected by both fire frequency and time since fire. Cheatgrass cover can increase initially after fire, then stabilize above its pre-fire cover after 2-5 years (Reed-Dustin et al. 2016), but positive linear relationships between time since fire and cheatgrass cover have also been observed (Shinneman and Baker 2009), as well as areas where cheatgrass declined and was replaced by perennial grasses (West and Yorks 2002, Hanna and Fulgham 2015). Pre-fire community composition might explain the inconsistency in results. Cheatgrass can come to dominate areas with fire-intolerant natives post-fire, but in areas with pre-fire populations of fire-tolerant species (e.g. *Poa secunda*) these species can regenerate following fire (Davies et al. 2012, but see Bagchi et al. 2013).

Precipitation, temperature and aridity affect both fire occurrence and the subsequent recovery of plant communities. Unlike most forested systems in the western US, burned area in Great Basin sagebrush systems is best predicted by antecedent precipitation (Abatzoglou and Kolden 2013, Pilliod et al. 2017). Precipitation also drives the invasion of cheatgrass into

lower elevation sagebrush systems (Chambers et al. 2007), which increases the probability of fire for several years due to the persistence of the litter it leaves behind (Pilliod et al. 2017). Cheatgrass invasion increases the continuity of fuels (Davies and Nafus 2013) and burned 107 area (Balch et al. 2013), thereby reducing the number of unburned patches that provide the 108 native seed sources critical for recolonizing burned areas. Unburned patches are essential for 109 sagebrush regeneration as almost every species in this genus is a seed obligate and the seeds 110 generally fall no more than 30 meters from the mother plant (Meyer 1994). Once established, 111 a sagebrush seedling needs to be able to withstand drought conditions in the summer to 112 survive and be recruited into the population (Meyer 1994). 113

Here, we explored how sagebrush community composition and diversity responded to increas-114 ing fire disturbance by constructing a fire history atlas and sampling plant communities that 115 burned zero to three times between 1984 and 2014 in the Central Basin and Range ecoregion. 116 We constrained soil, ecological site type, elevation and climate and sampled blocks of plots 117 stratified along a gradient of 0-3 fires. Our first hypothesis was that community composition 118 would change drastically between unburned and burned plots, but remain similar between 119 burned plots of different fire frequencies. This was our expectation because in the Great Basin 120 there are vast areas of sagebrush which are generally unburned in the last 30+ years, and 121 burned areas are almost always completely dominated by cheatgrass, along with a handful 122 of exotic forb species and a native grass, Poa secunda. These cheatgrass-dominated areas 123 all appear very similar, regardless of fire frequency (Figure 1). But we suspected that there 124 would be a signal on plant diversity after multiple fires, due to selective pressure against 125 fire-intolerant plants. Thus our second hypothesis was that alpha diversity (Shannon-Weaver index, Pielou Evenness, and the number of species in a sampling unit), beta diversity (continuity or turnover of species between plots) and the extrapolated species richness (with plots pooled by fire frequency), would decrease with increasing fire frequency. Our third hypothesis 129 was that cheatgrass abundance would have a negative relationship with plant diversity. Our 130 fourth hypothesis was that temperature, vapor pressure deficit and precipitation around the 131

time of the fire would exert a lasting influence over post-fire community composition and diversity. This is based on evidence that the effects of introducing species at the beginning of secondary succession can be long-lasting (Veen et al. 2018), and in this system the assemblage of species that are able to successfully colonize an area after a fire depends on their abilities to compete for moisture and tolerate drought (Meyer 1994).

37 Methods

138 Study Area

We conducted the study in a 13,000 square kilometer region in northern Nevada (Figure 2).

The region has hot, dry summers and cold, wet winters. Annual precipitation averages 293

mm, falling mostly from November to May. Mean temperatures range from 21.8 degrees

Celsius in July to -1.4 degrees Celsius in December (PRISM Climate Group 2016). The region

consists of mountain ranges that run north-south, and the sagebrush ecosystems generally lie

on the lower slopes of the mountains; our sites ranged from 1272 to 1696 meters in elevation

(median 1458, SD 99). From 1984 to 2014, 32% (4096 square kilometers) of the study area

burned in large fires (over 500 acres) at least once, 7% burned twice, and 2% burned three or

more times (Table S1).

148 Site Selection

We used a block sampling design, with each block containing one site from each of four fire 149 frequencies (zero to three), and all fires occurring at least five years before the study. We 150 used geospatial data representing ecosystem state factors (sensu Amundson and Jenny 1997) 151 to design a sampling scheme that constrained all other factors. We used the LANDFIRE 152 (Rollins 2009) biophysical setting layer to eliminate all vegetation types except big sagebrush 153 shrubland. The LANDFIRE data has 62-68% classification accuracy for shrublands (Zhu et al. 2006). We used soil data from the Natural Resource Conservation Service to include only 155 areas in the Loamy 8-10 precipitation zone (Soil Survey Staff, Natural Resources Conservation 156 Service, United States Department of Agriculture (USDA) 2016). We chose this particular zone simply because it was the most common type in our study area within the big sagebrush shrubland biophysical setting. We used the Land Treatment Digital Library to exclude areas that had undergone intensive restoration activities (Pilliod and Welty 2013). Excluding private and military land, and areas more than five miles from a road eliminated impractical plot locations and held human influence somewhat constant.

We accounted for additional, unknown disturbances such as grazing by using a block sampling
design, and stratifying our statistical analyses by these blocks. Long-term grazing data were
not available. Therefore, we assumed that plots within blocks were close enough together that
they had experienced similar grazing pressure. Additionally, we visually assessed the impact
of grazing on-site, aggregated what records we could for the allotments in our study (billed
animal unit months (AUM) provided by the Bureau of Land Management), and normalized
AUM by unit area and included these data in our statistical modeling.

Once we constrained the area to a consistent sampling space, we used Landsat-derived fire 170 data to stratify the space along a fire frequency gradient. To generate fire history maps, 171 we first extracted only the values two to four (low, medium and high severity) from each 172 yearly burn severity mosaic from the Monitoring Trends in Burn Severity project (MTBS; 173 Eidenshink et al. 2007), as these were the values where one can be reasonably certain that 174 they actually burned. Unburned patches and post-fire green-up, which could be caused by 175 a response to fire or an unburned patch, were excluded. To generate fire frequency maps, 176 we reclassified each yearly layer to a binary grid, and summed all 31 layers. To avoid areas 177 with less certain fire frequencies, we then converted the MTBS fire perimeter polygons to 178 layers of fire frequency to extract only the grid cells where the frequency from the polygons 179 matched the frequency from the reclassified raster grid. To generate last-year-burned maps, 180 we reclassified each severity mosaic (values two to four) to the fire year, and calculated the 181 maximum year for the entire time period for each pixel. To eliminate areas that had burned 182 more recently than 2014, we masked pixels that burned in 2015 according to the MODIS 183

MCD64 burned area product (Giglio et al. 2009).

Kolden et al. (2015) have brought up several shortcomings for the use of the MTBS burn 185 severity mosaics, in particular inconsistent development of class thresholds and a lack of 186 empirical relationships between the classified values and ecological metrics. Because we only 187 used these data to get a more precise estimate of fire occurrence, (i.e. we used it to eliminate areas of uncertainty) rather than using the severity data as an independent variable for 189 analysis, we thought it sufficient to use these data in this state. Another shortcoming that 190 should be noted is that there is no practical way for us to know what these sites looked like 191 before the earliest fires in the fire record. The fact that our unburned control plots were 192 all mature sagebrush is one piece of evidence suggesting these sites were mature sagebrush 193 pre-fire, but we cannot be 100% certain, and this is a shortcoming of all chronosequence 194 studies (Walker et al. 2010). 195

We selected seven blocks in our sampling space in accessible areas where there was a range 196 of fire frequencies and unburned areas for controls within close proximity (0.5 - 10 km). 197 Within each block, we created spatially balanced random points (Theobald et al. 2007) 198 for each fire frequency, and sampled one plot for each fire history class within the block. 190 At each block, we first sampled the unburned control plot to confirm that the area was 200 indeed the correct vegetation type, and then sampled burned plots. After navigating to the 201 predetermined coordinates for each plot we first confirmed the physical characteristics (soil 202 type, lack of obvious restoration, lack of obvious overgrazing) were within the constraints of 203 our sampling design. If a predetermined point was not suitable (e.g. soil was too rocky or 204 sandy, an unburned control plot had obviously burned, or it was the wrong ecological site 205 type), we referred to georeferenced PDFs of our fire history atlas that we accessed with a 206 simple application (Avenza Maps https://www.avenzamaps.com/) on a mobile device and 207 located nearby areas within the site that were suitable. When a suitable area was found we used a random number generator to pick a random bearing and a random distance, and 209

210 navigated to the new plot location.

We sampled 28 plots that fell along a gradient of fire frequency (zero to three fires; N = seven plots per frequency) and a range of times since fire (4-31 years; mean = 17.6, std = 6.6; Figure 2). Because most of the fire effects research in this system has been done within five years of a fire, we aimed to have the time since fire of all of the plots greater than or equal to 5 years. We encountered 53 plant species - 12 were introduced and 41 were native (Table S2).

216 Plot Establishment

We used GPS to navigate to predetermined plot locations. Upon arrival we established a 217 permanent marker at the southwest corner of the plot. We recorded the slope, aspect, distance 218 to the nearest A. tridentata individual or other shrub species, the topographic curvature of 219 the site (convex, concave, flat), evidence of ecological restoration, grazing signs, and evidence 220 of past fires. We then delineated a 50 x 50 meter plot, and placed pin flags at 9 randomly 221 determined 1m² subplots within the plot with a minimum spacing of 3 meters. Pilliod and Arkle (2013) found this sampling density sufficient for this ecosystem, if supplemental 223 methods are used to estimate disparate functional groups like trees and shrubs. Hence, we used the point-quarter method as a supplement to estimate shrub cover (see Pilliod & Arkle 225 (2013) for detailed methods). 226

227 Vegetation Sampling

To explore how fire frequency influences community composition and diversity, we measured
the occurrence and abundance of all species. We identified and recorded occupancy data
for every species within each subplot, and took a photograph from nadir with an Olympus
Stylus TG-870 digital camera to be analyzed later for percent cover.

We used 'Samplepoint' software (Booth et al. 2006) to analyze the digital photographs for percent cover. We prepared photographs for analysis by cropping them to the 1 m x 1 m area of the subplot. Then we used Samplepoint to overlay a regular grid of 100 points on

each picture, and at each point identified whether it was litter, bare ground, rock, dung, or a plant. If it was a plant, we identified it to species with the aid of the occupancy data recorded at the plot. These data were then converted to percent cover. If we recorded a species as present within the subplot, but it was missed by the photographic analysis, we recorded it as 0.5% cover.

240 Environmental Data

Aspect was converted to folded aspect (folded aspect = |180 - | aspect - |225|); McCune and 241 Keon 2002). This results in an approximation of heat load ranging from zero (northeast) to 180 (southwest). Elevation was extracted from 10m resolution digital elevation models. The study sites were situated among six grazing allotments. To learn how climate before, during and after the fire event affected the subsequent community composition and diversity, we extracted monthly maximum vapor pressure deficit, maximum temperature, and precipitation for the years before during and after the most recent fire at each plot. Maximum temperature and maximum vapor pressure deficit were averaged for the entire year before during and 248 after, and precipitation was averaged for the two winters (November - May) prior and one 249 after. We used monthly data provided by the PRISM climate group (PRISM Climate Group 250 2016) for all climate variables. Variables used in modeling are provided in Table 1. We also 251 sampled soil C and N (see Mahood (2017) for detailed methods). 252

253 Statistical Analysis

²⁵⁴ Community Composition and Environmental Variables

To analyze how fire frequency affects community composition, we used non-metric multidimensional scaling (NMDS). We ran a rank correlation test for fire history gradients against a matrix of relative cover of species per plot to determine the best hierarchical clustering method for creating a dissimilarity matrix. We used this index for NMDS to examine how those fire history characteristics affected the floristic composition. To assess which species and environmental variables had the most influence on community composition, we added those variables to the ordinations using the 'envfit' function from Vegan, with 9,999 permutations and stratified by the study block. Then we grouped species by their biogeographical origin (i.e. native or exotic), and used Tukey's test to assess how fire frequency influenced native cover, exotic plant cover and cheatgrass abundance.

Species Richness, Alpha Diversity and Beta Diversity

We created species accumulation curves grouped by fire frequency to assess how fire frequency 266 affected species richness. This is different from alpha diversity in that the species accumulation 267 curve is estimating number of species across all of the sites within each group with each added plot, as opposed to simply calculating a diversity index for each plot. We used the 269 sample-based rarefaction method (Chiarucci et al. 2008, Oksanen et al. 2016, R Core Team 2016). We used Tukey's Honest Significant Differences test (hereafter, Tukey's test) to see if different fire frequencies influenced alpha diversity (Shannon-weaver, Pielou evenness, and 272 number of species per plot). There are several ways to quantify beta diversity, most of which 273 are grouped into "measures of continuity" and "measures of gain and loss" (Koleff et al. 2003). 274 We used the "Z" index and Whittaker's original beta diversity index for continuity measures, 275 and Simpson's index (based on G. Gaylord Simpson's asymmetric index (Simpson 1943) and 276 modified by Lennon et al. (2001), not to be confused with Edward H. Simpson's Index (1949)) 277 for a measure of gain and loss. To see how beta diversity differed between fire frequencies, we 278 modeled the homogeneity of dispersion of those matrices (Anderson et al. 2006), and ran 270 pairwise permutation tests (Legendre et al. 2011) on these models with 9,999 permutations, 280 stratified by the study blocks. To assess the influence of cheatgrass abundance on alpha and 281 beta diversity, we used linear mixed models (Pinheiro et al. 2017) with the study block as a 282 random effect. We included elevation as a fixed effect in addition to cheatgrass due to its 283 strong correlation with temperature and moisture availability, and ecosystem resistance and 284 resilience (Chambers et al. 2014). We ensured that predictors had no multicollinearity using 285 a variable inflation factor test (Fox and Weisberg 2011), and used the partial coefficient of 286

determination (Jaeger et al. 2016) to determine the cheatgrass component of the model. To aid visualization, we removed the partial effects of elevation from the dependent variables (Hohenstein and Kliegl 2018).

Modeling Which Fire and Climate Variables Drive Post-fire Composition and Diversity

To assess how pre- and post-fire climate, along with soil and other environmental variables 291 (Table 1) affected post-fire community composition and diversity, we used permutational 292 multivariate analysis of variance (PERMANOVA). PERMANOVA uses a dissimilarity matrix 293 as the response variable, and columns from a separate data frame as the predictors. It makes the assumption that groups being modeled have homogeneous dispersions. If the test is run 295 on groups with heterogeneous dispersions, it is vulnerable to type 1 error (Anderson and Walsh 2013). To account for this we built multivariate homogeneity of groups dispersions (MHGD) models on our community clustering and beta diversity matrices grouped by block, fire frequency, and burned vs unburned. We then ran ANOVAs and Tukey's test on each model, with p values below 0.05 considered to be an indication of heterogeneous dispersions. 300 After removing variables with multi-collinearity, we built PERMANOVA models with both 301 community clustering and beta diversity matrices using an additive model-building process, 302 with 9,999 permutations and stratifying the permutations by the study blocks, with the aim 303 of producing parsimonious models. 304

305 Code Availability

Data and code to reproduce the analysis are available at https://www.github.com/admahood/ ff_study.

¹⁸ Results

Community Composition Fundamentally Changed After One Fire

The rank index test showed the Kulczynski index to have the most consistent high scores across gradients of fire history characteristics, so we used this index for our hierarchical

clustering and NDMS analyses. NMDS (Non-metric fit, $R^2 = 0.992$, Linear fit, $R^2 = 0.972$)
showed 7 unburned plots clustered around high abundances of A. tridentata, and 18 burned
plots clustered around B. tectorum (Figure 3). Two thrice-burned plots were dominated by
exotic annual forbs (Sisymbrium altissimum and Erodium cicutarium) and one was dominated
by the native perennial grass P. secunda (these are the three thrice-burned plots outside
of the "burned" ellipse). The ordination showed a clear separation between burned and
unburned plots, but fire frequency was not significantly correlated with the ordination, nor
were any environmental variables.

For the Tukey's tests of exotic versus native cover, there were differences between unburned and burned plots (p < 0.05) for both exotic (increased by 10%) and native cover (decreased by 20%), and no differences among the burned plots. (Figure 4a-b). After dividing the mean cover estimates into native and exotic life form groups (annual and perennial graminoids and forbs, and shrubs), we saw lower native shrub cover for burned plots fire (24% to 3%), coupled with higher annual grass cover (4% to 14%; Figure 5).

³²⁶ Plant Biodiversity Decreased with Each Successive Fire

We found a decline in plant diversity at sites that had burned more frequently. Species 327 richness estimates declined as fire frequency increased (Figure 6, Table S3). The number of 328 species and the Shannon-weaver index were higher in unburned plots, but the differences were 329 not significant, and Pielou evenness was not different between frequencies (Figure 4c-e). All 330 three indexes of Beta diversity followed very similar patterns, so we only report on Whittaker's 331 index here. It was not different between zero and two fires, and lower for thrice-burned plots 332 (Figure 4f), meaning that there is less dissimilarity within the group of thrice-burned plots, 333 and more dissimilarity within the other groupings. 334

335 Alpha Diversity and Evenness Decreased with Cheatgrass Abundance

Cheatgrass abundance had a negative relationship with Shannon-weaver diversity (p << 0.05, partial $R^2=0.65$) and Pielou evenness (p << 0.05, partial $R^2=0.51$), a weak negative

relationship with the number of species (p < 0.05, partial $R^2 = 0.24$), and no relationship to beta diversity (p > 0.5, partial $R^2 = 0.08$; Figure 7, Table 2). Elevation was important in all models except Pielou evenness (Table 2).

Different Climate and Fire Variables Predict Post-Fire Compsition and Diversity

PERMANOVA models showed that fire history and environmental factors influenced com-342 munity composition and beta diversity differently. ANOVAs and Tukey's tests on MHGD 343 models showed no heterogeneity in groups dispersions for both beta diversity and hierarchical clustering (p > 0.05 for all models). Community composition after fire was most affected by fire frequency, time since fire, maximum vapor pressure deficit of the year of the fire, and the interaction between fire frequency and time since fire (Table 3, $R^2 = 0.55$). The relatively low amounts of variation accounted for by the individual variables indicates these are subtle effects. Beta diversity on the other hand was influenced most by winter precipitation one and 349 two years prior to the fire, fire frequency, and the interaction between winter precipitation 350 one year prior and max temperature for the year after the fire (Table 4, $R^2 = 0.62$). Here, the 351 effect was more pronounced, as more variation accounted for by the three most statistically 352 significant variables (fire frequency and precipitation one and two winters prior to the fire). 353

Discussion

The purpose of this study is to assess how Wyoming big sagebrush plant communities respond to being burned repeatedly before returning to their prior condition. The combination of 356 a 32-year fire history atlas and the use of the RRQRR (Theobald et al. 2007) to randomly 357 stratify the sampling blocks over a large area provides broad-scale statistical inference for the 358 lower elevation (<1500 m) portion of the Wyoming big sagebrush ecosystem. These lower 359 elevation sites generally experience higher temperatures and lower soil moisture, and it is 360 well documented that they have lower resilience after wildfires (Chambers et al. 2014). We 361 did not detect recovery of Wyoming big sagebrush at our sites, and also found that while the 362 cover of Bromus tectorum does not change with successive fires, the number of species in the species pool does decrease, and that biodiversity decreases with cover of *B. tectorum*. The results of this study may seem to conflict with other recent studies documenting Wyoming big sagebrush sagebrush recovery in the Great Basin (Ellsworth et al. 2016, e.g. Shinneman and McIlroy 2016). But all of the studies we are aware of showing sagebrush recovery were conducted at cooler, wetter sites, where Wyoming big sagebrush is more resilient after fire (Chambers et al. 2014).

Coupling the 30+ year fire history atlas created here with intensive field sampling offers a unique opportunity to explore plant diversity and composition changes in areas that have 371 relatively high fire frequencies, such as grass-dominated or grass-invaded areas (Balch et al. 372 2013). As annual grass invasions and their alterations to fire regimes are a global phenomenon 373 (D'Antonio and Vitousek 1992, Brooks et al. 2004), this type of study design will be useful 374 for understanding the consequences of changing fire regimes in other regions. Additionally, 375 new algorithms are being developed that will lead to more accurate and precise fire data 376 products (e.g. Hawbaker et al. 2015), leading to more nuanced fire history at lases, and thus 377 more precise sampling stratifications – especially now that burn severity information can be 378 easily incorporated (Eidenshink et al. 2007). 379

380 Community Composition Fundamentally Changes After One Fire

In lower elevation A. tridendata ssp. wyomingensis systems, our results show that one fire 381 can convert this shrub-dominated system to one composed mainly of introduced annual 382 grasses and forbs, and we demonstrate that this new state can persist for decades with 383 little sign of recovery to its prior condition. While almost all of our burned plots were 384 dominated by cheatgrass, several thrice-burned plots were dominated by P. secunda or exotic 385 annual forbs (see figure 3, where there are 3 plots that are outside the confidence envelope 386 containing all other burned plots). This corroborates previous work showing that fire can push 387 cheatgrass-invaded grassland and shrubland communities into those dominated by cheatgrass, 388 P. secunda, and exotic forbs, while uninvaded sites, or sites that are invaded but still have

significant bunchgrass communities, can persist in a state of native bunchgrasses and forbs (Davies et al. 2012, Reisner et al. 2013, Condon and Pyke 2018). Other studies have found 391 that topography can be a mediating factor, with native bunchgrasses more likely to persist 392 on steeper, more north-facing slopes in the face of invasion and disturbance (Rodhouse et al. 393 2014, Reed-Dustin et al. 2016). One hypothesis that we were not able to test in this study is 394 that increasing fire frequency may select for more fire-resilient plant functional traits. More 395 research is needed to investigate the relationship between fire frequency and functional traits. 396 While it has been demonstrated that B. tectorum establishes immediately post-fire and can 397 persist in the shorter term (Davies et al. 2012, Hanna and Fulgham 2015), we show that this 398 novel grass state can persist for long periods (i.e. > 17 years), corroborating recent work 390 (Reed-Dustin et al. 2016). If there was recovery our study design would have enabled us to 400 detect it, as Wyoming big sagebrush has been found to recover from disturbance in as little 401 as nine (Wambolt et al. 2001) to 20 years (Shinneman and McIlroy 2016) following fire, and 402 our fire history atlas goes back 32 years. 403

404 Biodiversity Decreases with Each Subsequent Fire

Here we show that over a three decade period repeated fires had long-lasting effects on 405 community composition and biodiversity in Wyoming big sagebrush ecosystems. Species 406 richness declined with increasing fire frequency, but measures of alpha and beta diversity 407 decreased after one and three fires, respectively (Figure 4a-b). Species accumulation curves 408 demonstrated that repeated fires are decreasing the overall pool of species from which an 400 individual patch might draw from. So while there may not have been significant differences 410 in alpha diversity as fire frequency increased, as the number of species each plot can draw 411 from decreased, this signal manifested itself when beta diversity declined after three fires. 412 We found negative relationships between cheatgrass abundance and alpha and beta diversity, 413 as we hypothesized, but no relationship between cheatgrass abundance and the number of 414 fires. Establishment and dominance of cheatgrass after fire is well documented (Whisenant 415

1990, Balch et al. 2013), and the relationship between fire and species richness is clear from
this work. This implies that once an area is invaded by cheatgrass, the competitive effects
from its increased abundance combine with its effect on fire frequency to exclude species that
either cannot compete for moisture or cannot survive fire. It should be noted that because
we selected sites that had burned at least three times since 1984, we may have biased our
results to be applicable to only those areas that are susceptible to initiating a grass-fire cycle.

Time Since Fire and Vapor Pressure Deficit Drive Community Composition

PERMANOVA models showed that fire history and climate variables affect diversity and 423 community composition differently. Composition was found to be influenced by both fire 424 frequency and time since fire, and high vapor pressure deficit the year of the fire. This 425 suggests that drought stress exerts a significant influence on the particular plant species that will survive and persist after a fire, and this effect can still be detected decades after the 427 fire burned. Shinneman and McIlroy (2016) also found that climatic variables around the 428 time of the fire influence the eventual composition, namely winter precipitation the year 420 after the fire was beneficial for sagebrush recovery, but winter precipitation 2 years later had 430 a negative effect. Elevation and recovery have been shown to be positively related in this 431 system (Knutson et al. 2014), and most of the studies showing fast recovery times were done 432 at higher elevations and latitudes (Wambolt et al. 2001, Hanna and Fulgham 2015, Ellsworth 433 et al. 2016), in areas with long-term grazing exclusion (Ellsworth et al. 2016), or on sites 434 that were specifically selected because their topographic position was such that there was 435 potential for sagebrush recovery (Shinneman and McIlroy 2016). Here, we found that on 436 low elevation sites, even after an average of 17 years, post-fire sagebrush cover was very low 437 (<6%; also see Reed-Dustin et al. 2016). These differences in recovery rates (i.e. 9-20 years 438 at cooler sites vs no detectable recovery at hotter sites) could be due to a slowing down of 439 recovery rates as the system loses resilience with increasing drought stress at hotter sites, while cooler sites have not yet experienced sufficient drought stress to hamper recovery (sensu 442 Leemput et al. 2017).

443 Fire Frequency and Antecedent Precipitation Drive Beta Diversity

Beta diversity was most heavily influenced by fire frequency, precipitation for the two wet 444 seasons prior to the fire, and an interaction between antecedent precipitation and maximum 445 temperature for the year after the fire. Antecedent precipitation has been shown in other 446 studies to be an important predictor of fire occurrence and burned area in this system (Abatzoglou and Kolden 2013, Balch et al. 2013). Since this is a fuel-limited system, high 448 precipitation increases fine fuel loads and continuity (Davies and Nafus 2013), leading to higher fire probability, more homogeneously burning fires, and larger extents. Increased 450 fine fuel loads could also be the driving factor behind decreasing diversity. Following highly 451 contiguous and extensive fires there would be fewer unburned patches as seed sources which 452 are essential for the seed-obligate sagebrush to reestablish quickly (Shinneman and McIlroy 453 2016). In addition, Wyoming big sagebrush is an opportunist in reproduction, setting most of 454 its seed in wet years (Meyer 1994) during the short window in early spring when enough water 455 is available in the soil for plants to uptake nutrients (Ryel et al. 2010, Schlaepfer et al. 2014). 456 So, in the years that Wyoming big sagebrush is maximizing its expenditure on reproductive 457 resources, increased horizontal fuel continuity of invasive annual grasses (Davies and Nafus 458 2013) a) increases the probability of burning, and b) increases interspecific competition for 459 resources post-fire. This may result in a more homogeneous post-fire landscape populated 460 mostly by fire-tolerant plants. 461

462 Management Implications

This work adds to the existing body of literature that suggests that in low elevation (< 1700m) Wyoming big sagebrush systems wildfire should be minimized due to the negative effects of single and repeated fires on community composition and biodiversity. The reality is that wildfire can not be prevented, but fire suppression policies and practices could be crafted to maximize the number and size of unburned patches within burns to increase the

probability that Wyoming big sagebrush and other native seed-obligates recover post-fire. These results also imply that prescribed burning is a risky proposition with potentially 469 disastrous consequences for biodiversity and ecosystem structure and function. However, we did not directly assess the influence of prescribed fires in this study. Prescribed fires typically 471 are conducted at a cooler time of year outside of or at the shoulder of the fire season, and 472 may have different ecological effects due to the phenological stage plants would be in at this 473 different time of year, as well as the lower burn severity that would be expected due to cooler 474 ambient air temperatures and higher soil moisture. At a cooler, wetter site where grazing has 475 been excluded since 1994, Ellsworth et al. (2016) detected the recovery of sagebrush 17 years 476 after prescribed fires were conducted in late September 1997, which is the natural end of the 477 fire season at that location. Two other studies at higher latitudes concluded that prescribed 478 burning to be an unwise action even at those wetter sites. Beck et al. (2009) studied an area 470 in southeast Idaho that was burned in late August 1989 by prescribed fire 14 years post-fire 480 for its utility in improving sage grouse habitat. They recommended against prescribed fires 481 due to the lack of recovery of sagebrush. Wambolt et al. (2001) found minimal benefit to 482 the herbaceous plant community at 13 sites that had burned in prescribed fires in Western 483 Montana, with little shrub recovery 6-15 years after fire. Thus, there is conflicting evidence on the use of prescribed fires for management objectives even at cooler wetter sites, providing less optimism for the use of prescribed fires in the lower elevation portion of the Wyoming big sagebrush ecosystems studied here. Future research could focus on comparing low elevation 487 Wyoming big sagebrush sites that have been burned in prescribed fires in the past paired 488 with nearby areas that burned in wildfires, with particular emphasis on teasing out the effects 489 of seasonality and burn severity. 490

Our results from PERMANOVA modeling suggest that the success of post-fire restoration efforts will depend not only on elevation and topographic conditions (Arkle et al. 2014), but also the climatic conditions that occur around the time of the fire. This could mean that in a very dry year less money is spent on restoration efforts on low elevation sites, focusing instead on higher elevation sites and cooler aspects, and in wet years directing more funding towards those more vulnerable low elevation, southwest-facing sites.

Disagreement on the actual historical fire rotation limits our ability to determine if Wyoming 497 big sagebrush is fire-sensitive or fire-resistant. However, this question may be irrelevant given 498 the disruption and interaction between invasive annual grasses and fires. We demonstrate that when both fire and invasive annual grasses operate in conjunction, sagebrush is fire-sensitive. Moreover, we show that an alternate exotic grass state can persist for 17 years post-fire even 501 with only a single burn. This makes the use of prescribed burning problematic, as the risk 502 of a fire-prone grassland establishing after a fire likely outweighs the potential benefits of a 503 prescribed fire. Our results are specific to lower elevation (< 1700m), dryer, hotter Wyoming 504 big sagebrush sites, and it remains to be explored how sagebrush at higher elevations and 505 latitudes responds to increasing fire frequency, and how it will respond under future climate 506 change scenarios. However, if temperatures continue to rise as projected in this region (Garfin 507 et al. 2014), those areas may also become susceptible to a strong grass-fire cycle. Overall, 508 this effort demonstrates that sagebrush communities are vulnerable to repeated fires (Seipel 500 et al. 2018), which should be taken into account in land management decisions (Chambers et 510 al. 2017) that attempt to conserve or restore these valuable ecosystems, and the threatened 511 species that they harbor. 512

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