1	Using citizen science to measure recolonisation of birds after
2	the Australian 2019-20 mega-fires
3	Joshua S Lee <sup>a*</sup> , Corey T Callaghan <sup>ab</sup> , William K Cornwell <sup>ab</sup>
4	
5	a Centre for Ecosystem Science; School of Biological, Earth and Environmental Sciences;
6	UNSW Sydney, Sydney, NSW 2052, Australia
7	b Ecology & Evolution Research Centre; School of Biological, Earth and Environmental
8	Sciences; UNSW Sydney, Sydney, NSW 2052, Australia
9	
10	*Corresponding author:
11	Joshua S. Lee
12	Centre for Ecosystem Science
13	School of Biological, Earth and Environmental Sciences,
14	UNSW Sydney
15	Email: Joshua.s.lee@unsw.edu.au
16	Phone: +61 432 401 194
17	
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## 19 Abstract

Large and severe fires ("mega-fires") are increasing in frequency across the globe, often 20 21 pushing into ecosystems that have previously had very long fire return intervals. The 2019-20 22 Australian bushfire season was one of the most catastrophic fire events on record. Almost 19 million hectares were burnt across the continent displacing and killing unprecedented numbers 23 of native fauna, including bird species. Some bird species are known to thrive in post-fire 24 environments, while others may be absent for an extended period from the firegrounds until 25 there is sufficient ecosystem recovery. To test for systematic patterns in species use of the post-26 fire environment, we combined citizen science data from eBird with data on sedentism, body 27 size, and the specialisation of diet and habitat. Using generalised additive models, we modelled 28 29 the response of 76 bird species in SE Australia to the 2019-20 mega-fires. Twenty-two species decreased in occurrence after the fire; thirty species increased; and no significant effect was 30 found for the remaining twenty-four species. Furthermore, diet specialism was associated with 31 reduced recolonisation after fire, with diet specialists less likely to be found in burned areas 32 after the fire event compared to before, a result which generates testable hypotheses for 33 34 recovery from other mega-fires across the globe. Being displaced from the firegrounds for an event of this geographic magnitude may have severe consequences for population dynamics 35 and thus warrant considerable conservation attention in pre-fire planning and in the post-fire 36 37 aftermath.

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# 39 Keywords

40 "bird traits", "bushfire", "citizen science", "eBird", "post-fire recovery".

## 42 Introduction

The 2019-20 Australian bushfire season was one of the largest and longest on record (Nolan et 43 al. 2020; Filkov et al. 2020). Almost 19 million hectares were directly affected by the fire 44 including the burning of 5.8 million hectares of temperate broadleaf forest (Boer et al. 2020; 45 Filkov et al. 2020). It is estimated that almost 3 billion native vertebrates will have perished or 46 been displaced because of the 2019-20 mega-fires (Eeden et al. 2020) potentially driving 47 threatened species closer to extinction (DPIE 2020a). In the wake of these immense disturbance 48 49 events it is important to understand the process of ecosystem recovery to implement effective conservation actions. There is a large interest in bird conservation globally (Davies et al. 2019). 50 51 Conservation efforts by both government and non-government organisations have been shown 52 to favour bird species with higher social interest (Ainsworth et al. 2018), making birds an important group for procuring recovery funding, which may benefit the entirety of the 53 ecosystems. Birds are also useful indicators of environmental health since bird populations and 54 diversity may reflect the composition of food and habitat resources in an environment 55 (Eglington et al. 2012; Gregory and Strien 2010; Gregory et al. 2003). Furthermore, birds are 56 vital agents of recolonisation in a post-fire landscape due to their high mobility and 57 reintroduction of seed from nearby unburnt patches (Gill 1996; Pausas and Parr 2018; 58 Cavallero et al. 2013). Therefore, from a conservation and management perspective, predicting 59 60 which bird species recolonise more rapidly and which might be at greater risk from fire is an important goal. 61

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63 The massive geographic scale of this fire event and associated mosaic of different ecosystems 64 that were impacted means that a larger proportion of some species' ranges have been affected 65 compared to previous fire seasons (DPIE 2020a). However, the scale of these fires also creates

a challenge for gathering data on species recovery: data across this geographic scope is beyond 66 the capacity of university or government research groups to easily obtain. Moreover, data needs 67 to be collected relatively quickly because many important post-fire processes occur soon after 68 the event. One solution to this set of problems is mobilizing citizen scientists (Kirchhoff et al. 69 70 2020a). Citizen science is an increasingly popular tool for informing science and policy as more online services improve at storing and collating data. The major advantage of using citizen 71 72 science data is that survey effort can be accomplished at a speed and magnitude that would otherwise be impossible (McKinley et al. 2017). 73

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Fire is a common and widespread phenomenon throughout the continent of Australia 75 (Bradstock et al. 2002). The life histories of many plants and animals in various ecosystems 76 77 have evolved to allow species to cope with fire (Purdie and Slatyer 1976; Cary et al. 2012). The post-fire environment, especially after severe fire, is generally thought to be devoid of 78 79 many resources and habitat features (Loyn 1997a). However, the wasteland is not completely barren: new resources are created in the wake of fire events, making post-fire environments 80 productive foraging grounds for some recolonising species (Pausas and Parr 2018; Albanesi et 81 82 al. 2014; Loyn 1997b; Pons and Prodon 1996; Prowse et al. 2017). However, the heterogeneity of the burn and the patchy and unpredictable nature of the resources in the post-fire 83 84 environment may favour some feeding generalist species and disadvantage other species with very specific dietary requirements (Banks et al. 2011; Lindenmayer et al. 2011). Conversely, 85 species with more flexible behaviours and diets may benefit from the redistribution of resources 86 87 from a fire event (Pausas and Parr 2018). Another key feature of the post-fire environment is the removal of vegetation that acts as cover for predation-sensitive species (LaManna et al. 88 2015). Furthermore, in large-scale fire events where bird mortality and displacement are 89 expected to be high, a species' dispersal ability may be important for recolonisation (Robinson 90

*et al.* 2014; Turner *et al.* 1998; Whelan *et al.* 2002). It is important to understand how bird traits
are associated with post-fire recovery in order to make predictions about the impacts of future
fires across the world.

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We had three main objectives: (1) to quantify the response of species occurrence as either 95 increasing, decreasing, or no change in response to the fire; and (2) to model species' fire 96 responses against four potentially important bird traits (i.e., sedentism, body size, and the 97 specialisation of diet and habitat) for post-fire recolonisation; and (3) to investigate whether 98 increased fire severity is associated with decreased bird recolonisation. We hypothesised that 99 more effective post-fire recolonisation would be associated with larger body size, increased 100 101 mobility, and utilisation of a larger number of food and habitat types. We also expected that 102 birds would recolonise more quickly in less severely burnt fire areas. Species identified in this study to have decreased in occurrence in the months following the 2019-2020 mega-fire event 103 may be worthy of increased conservation attention both in the coming months and in the 104 aftermath of future fires. 105

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# 107 Methods

#### 108 Bird occurrence data

We used the eBird citizen science database (Sullivan *et al.* 2009, 2014) to understand bird occurrences before and after the fires. eBird is a global citizen science project that enlists volunteer birdwatchers to submit bird observations to a database with close to 850 million bird observations globally. Citizen scientists can submit data as isolated species records or through complete checklists with survey effort information (e.g., time spent surveying, distance travelled) and spatiotemporal coordinates. A semi-automated approach to data quality is used where regional filters are set by local experts, and species or counts of species which exceed those filters need to be substantiated before being approved in the database (Wood *et al.* 2011).

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We downloaded data (eBird Basic Dataset version ebd\_relApr-2020) for Australia between the 119 1<sup>st</sup> January 2010 and the 1<sup>st</sup> May 2020. In order to account for potential biases associated with 120 citizen science data (Bird *et al.* 2014), and applied the following additional filters to the dataset 121 by using (*sensu* Johnston et al. 2020): (1) only complete checklists; (2) checklists travelling 122 distance less than 10 kilometres; and (3) checklists with a survey duration between 10 and 300 123 minutes.

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#### 125 <u>Matching bird occurrence to fire data</u>

To determine if a checklist was fire affected, we used the national extent of the 2019/20 126 bushfires through the Department of Agriculture, Water and the Environment (DAWE 2020). 127 To estimate the date of arrival of the fire front and assign each checklist as either before or after 128 the fire, we used satellite data from Digital Earth Australia (DEA) Hotspots (Geoscience 129 Australia 2020, see also Rowley et al. 2020). This fire arrival date varied between the 27<sup>th</sup> 130 October 2019 and the 1<sup>st</sup> February 2020 for the sampling locations in this study. Th DEA 131 hotspot detection effort seeks to discover new spatial-temporal hotspots as quickly as possible 132 and as such it provides a record of when the fire front was first detected to have arrived in 133 134 different locations. Gaps in the orbital paths of the satellites means that this may be off by 12-24 hours, but given the paucity of citizen science data at these precise places and times (due to 135 the impeding or actively burning fire), the potential for mis-assigned checklists due to gaps in 136 the orbital paths of satellites is low. 137

We used the Fire Extent and Severity Mapping data (FESM) provided by the Department of 139 Planning, Industries and Environment (DPIE 2020b) to assign bird occurrence data with fire 140 severity information. The FESM raster included fine scale information about the severity of 141 each fire throughout the 2019-20 bushfire season and was used to assign each checklist a 142 143 severity value based on the pixel each checklist coordinate was located in. The median severity for each species included in the study was then calculated using all post-fire checklists that the 144 species occurs on. We produced a linear model comparing each species' modelled fire response 145 with the median severity in post-fire observations. 146

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#### 148 <u>Trait data</u>

Trait data was obtained from Garnett et al. (2015). Average body mass was preserved to be used as a measure for body size. We identified sedentary species by virtue of being exclusively locally dispersing, as opposed to species that move or migrate seasonally or sporadically. We quantified diet and habitat specialism by summing the total number of feeding guilds or habitat types each species is associated with. Species with more generalist diets or habitat preferences therefore received a higher value than species with a more restricted diet or habitat.

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#### 156 <u>Statistical analysis</u>

All analyses for this project was undertaken using the statistical computing software R (v4.0.2) in the integrated development environment RStudio. We relied heavily on the tidyverse for data manipulation and visualization (Wickham *et al.* 2019). We converted the cleaned checklist data and fire extent shapefile to simple features for spatial analysis in R (Pebesma 2018). We then joined these features with a variable added for locating datapoints within the shapefile
extent. We removed all checklists that did not fall within the extent of the 2019-20 mega-fires
and all checklists above 25° South from the study.

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Only species with a minimum of 500 observations in the firegrounds (i.e., presences) were 165 considered for analyses. Nine species from five waterbird families (Anatidae, Ardeidae, 166 Laridae, Pelecanidae, Phalacrocoracidae) were excluded from analysis to remove species 167 which may not be using the terrestrial ecosystems. For our final set of species (N=76), we 168 estimated the effect of the fire (i.e., before versus after) on the probability of the species being 169 observed in a checklist, while also accounting for important covariates. We then compared the 170 171 proportion of checklists each species was present on before and after the fire event. Species 172 that preferentially use the post-fire environment should be on a greater proportion of checklists post-fire compared to pre-fire. Species whose use of those areas declined, following the fire 173 event should be found on fewer. To do this, we used generalised additive models (GAMs) -174 with a binomial error term - to model the change in detection probability before and after the 175 fires, for each species respectively. For each model, the response variable was 176 presence/absence of each species, and the predictor variable was before/after the fire. To 177 account for differences in observer effort, seasonal effects, and biases in location effort, 178 smoothers were included in the creation of the models in order to adjust for seasonality (month), 179 sampling effort (duration and distance), and location. We used thin plate regression splines for 180 the duration, distance and latitude/longitude smooth terms, and a cyclic cubic regression spline 181 with eleven knots for seasonality. 182

In order to assess whether the species' response to fire, generated from the GAMs, was moderated by species' traits, we used four separate linear models with each of the four traits (i.e., feeding specialism, habitat specialism, body size, and sedentism) as the predictor variable. The uncertainty in the GAM coefficient estimate was used for inverse-variance weighting in these models. Bird body size was log-transformed in order to satisfy assumptions of linear regression.

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# 191 **Results**

We included a total of 163,685 species observations originating from 8,910 eBird checklists in
our analysis (Figure 1). Across the 76 species included in our analysis the average number of
observations for each species was 1,636 +/- 126, ranging from Grey Fantail with 4,907
observations to Variegated Fairywren with 502 observations.

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Of the 76 species included in the study, we found that 26 species showed a positive response, 23 showed a negative response, and 27 showed no significant response (Figure 2). Species with the highest estimated increases after fire included Crested Pigeon (*Ocyphaps lophotes*) and Sulphur-crested Cockatoo (*Cacatua galerita*), whereas the largest decrease in occurrence was in Fan-tailed Cuckoo (*Cacomantis flabelliformis*) and Olive-backed Oriole (*Oriolus sagittatus*).

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We found a significant relationship between species' modelled fire responses and diet specialism (p=0.011) explaining over 8% of variation ( $R^2=0.085$ ) (Figure 3: A). This indicates that a higher number of feeding guilds (i.e., generalist species) was associated with improved 207 post-fire recolonisation. Similarly, specialist species with a narrower diet were more likely to208 have decreased after fire.

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Conversely, the model run on habitat specialism did not indicate a significant relationship with species fire responses (p=0.134;  $R^2=0.030$ ; Figure 3: B). The correlation between fire response and sedentism was also non-significant (p=0.3;  $R^2=0.014$ ; Figure 3: C). The final linear regression comparing fire response to body size also failed to detect a significant relationship (p=0.248;  $R^2=0.018$ ; Figure 3: D). The final linear model comparing species' median fire severity and fire response did not detect a significant relationship (P=0.141;  $R^2=0.029$ ).

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### 217 **Discussion**

218 We identified 23 species that were observed significantly less after the 2019-20 summer megafires compared to before. The extent to which this reduction persists will be very important for 219 the conservation status of these species, especially with a predicted increase in severity and 220 frequency of such mega-fires (Clarke and Evans 2019; van Oldenborgh et al. 2020; Pitman et 221 al. 2007). There are two alternate hypotheses that could help explain our results. First, 222 individuals of these species could have moved to unburned parts of the region and will return 223 to the firegrounds once the vegetation has regrown sufficiently. Second, the fires led, directly 224 or indirectly, to higher than typical mortality in these species. In contrast, 26 species were 225 226 observed significantly more after the fire event, highlighting that there are some 'winners' as well as 'losers' in response to fires. This is likely due to new resources that are created in the 227 post-fire environment (Pausas and Parr 2018). Identifying general patterns in species responses 228 to fire will help differentiate which species are predicted to be able to adapt to future fire events 229 more readily. 230

Our results suggest that species with a more specialised diet may be less effective at post-fire 232 recolonisation. Highly specialised animals may be common under stable environmental 233 conditions, however become vulnerable to rapid decline when there is environmental change 234 (Lindenmayer et al. 2011). In the event of fire, drastic and lasting changes occur to food 235 236 resources which favour species that can take advantage of this change while disadvantaging other species (Banks et al. 2011; Pausas and Parr 2018). This finding confirms our hypothesis 237 that bird species with a greater diet breadth would have improved post-fire recolonisation than 238 species with specialist diets. This result may have important implications future fire events and 239 disturbance ecology more generally. Our results failed to confirm our hypotheses that body 240 size, sedentism or habitat specialism was important for species recolonisation after fire. This 241 result may be due to a general adaptability of much of the Australian fauna to fire (Nimmo et 242 al. 2019; Woinarski 1990; Ward et al. 2020). 243

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Identifying species' post-fire occurrences can be an indicator of successional processes and 245 246 resource redistribution of fire disturbances, and thus further contribute to an understanding of how fire can benefit some species while disadvantaging others. The species with the highest 247 estimated increase in occurrence after the fire event was Crested Pigeons (Ochyphaps 248 249 lophotes). This species was most likely able to profit from the extensive fires due to increases in their main food sources: Crested Pigeons eat seeds and herbaceous material from grasses 250 and forbs (Mulhall and Lill 2011). These resources have been shown to increase significantly 251 252 in fire disturbed environments since ephemeral herbs and grasses are rapid post-fire colonisers (Romme et al. 2011; Bell et al. 1993) and seeds are dropped en masse by many woody plants 253 following fire events (Andersen 1988; Specht 1981). Crested Pigeons' efficacy in utilising 254

these resources also contributes to their success in highly disturbed urban areas (Mulhall and 255 Lill 2011). In contrast, many species with the lowest recolonisation rates were specialised on 256 terrestrial invertebrates including Fan-tailed Cuckoo (Cacomantis flabelliformis) and Black-257 faced Monarch (Monarcha melanopsis). This may be due to the relative time taken for these 258 resources to become large enough to support fauna species that are reliant on them (Purdie and 259 Slatyer 1976). Increased seed availability from woody-fruited plants is believed to occur 260 261 rapidly after a fire event (Andersen 1988). In contrast, terrestrial invertebrates may experience a greater lag in returning to pre-fire levels since insect grazing, which occurs at high rates in 262 263 Eucalyptus forests (Springett 1978), must wait for sufficient regrowth before increasing biomass to pre-fire levels. Species with diets specialised on food that takes longer to recover 264 from a fire event may be more deserving of management attention. 265

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The massive firegrounds of the 2019-20 fires dwarfed all possible attempts at data collection 267 by professional scientists in the immediate aftermaths. However, citizen scientists were able to 268 collect data at scale in the aftermath (Callaghan and Gawlik 2015; Kirchhoff et al. 2020). That 269 said, there are some limitations to consider when using such a data source. The fire itself was 270 very patchy, with both unburned patches inside the firegrounds and variation in fire severity 271 on the scale of meters. The nature of eBird data does not allow us to examine the nature of the 272 273 patches that different species were using or how they were using them, e.g., foraging for food or resting (Sullivan et al. 2009, 2014; Callaghan and Gawlik 2015; Johnston et al. 2020). 274 Furthermore, the sampling effort for post-fire observations may have been greatly reduced due 275 to a reduction in travel because of Coronavirus restrictions. Therefore, while citizen science 276 data such as eBird are clearly valuable to inform macorecological patterns, on-the-ground data 277 should be integrated with these findings in the future to better inform our understanding of the 278 impacts of bushfires on bird diversity and usage in post-fire environments. 279

Immediate post-fire observations, available through citizen science, provided important 281 information into the long-term effects of the massive 2019-20 fires. The decline of 23 species 282 identified in this study and the extent to which this decline persists through time will be an 283 important concern for the conservation status of these species. The unprecedented scale of the 284 285 mega-fires produced an enormous amount of public attention on conservation problems and objectives, as well as an unprecedented strain on the biota of Australia's forest ecosystems. 286 Fire events are expected to become more severe and frequent under the influence of 287 anthropogenic climate change, exacerbating the need for efficient and effective conservation 288 policies and management (Clarke and Evans 2019; van Oldenborgh et al. 2020). To effectively 289 address the conservation concerns raised by this unprecedented bushfire season and fire events 290 to come, it is important for efforts to be targeted at species with the greatest need, and citizen 291 science will likely play a key role in this effort. 292

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# 431 **Tables and Figures**





433 Figure 1- Map of burned area over the Australian 2019-20 summer fire event (Red) and eBird

434 checklists inside fire boundary below 25 degrees South (Blue).





<sup>437</sup> represent standard error.





439 Figure 3- Plot of modelled fire response against degree of diet specialism (A), degree of habitat

440 specialism (B), sedentism (C) and average body mass (log-transformed) (D), for each bird species.



442 Figure 4- Scatterplot of modelled fire response against median fire severity grouped by feeding
443 habit, where generalists are species belonging to more than one feeding guild. Interactive version

444 at: https://josh-lee1.github.io/eBird-Fire-Index/interactive\_figure.html