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3	When a tree dies in the forest: Scaling climate-driven tree mortality
4	to ecosystem water and carbon fluxes
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46 Abstract

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Drought- and heat-driven tree mortality, along with associated insect outbreaks, have 47 been observed globally in recent decades and are expected to increase in future climates. Despite 48 49 its potential to profoundly alter ecosystem carbon and water cycles, how tree mortality scales up to ecosystem functions and fluxes is uncertain. We describe a framework for this scaling where 50 the effects of mortality are a function of the mortality attributes, such as spatial clustering and 51 functional role of the trees killed, and ecosystem properties, such as productivity and diversity. 52 We draw upon remote sensing data and ecosystem flux data to illustrate this framework and 53 54 place climate-driven tree mortality in the context of other major disturbances. We find that 55 emerging evidence suggests that climate-driven tree mortality impacts may be relatively small and recovery times are remarkably fast (~4 years for net ecosystem production). We review the 56 57 key processes in ecosystem models necessary to simulate the effects of mortality on ecosystem fluxes and highlight key research gaps in modeling. Overall, our results highlight the key axes of 58 59 variation needed for better monitoring and modeling of the impacts of tree mortality and provide a foundation for including climate-driven tree mortality in a disturbance framework. 60 61 62 63 64

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#### 69 Introduction

Tree mortality is a critical demographic rate for determining forest dynamics and, 70 consequently, ecosystem function and carbon cycling (Stephenson & van Mantgem, 2005). 71 72 Mortality is the dominant driver of aboveground carbon turnover (Carvalhais *et al.*, 2014). 73 Furthermore, mortality has wide-ranging consequences for biodiversity, ecosystem structure and function, and ecosystem services provided by forests (Anderegg et al., 2013a). Yet the effects of 74 mortality remain much less studied than causes of mortality (Anderegg et al., 2013a). Reducing 75 this uncertainty requires more empirical data and long-term monitoring. Mortality is currently 76 77 poorly monitored compared to forest growth and productivity because of its highly stochastic nature (Allen et al., 2010). 78

Climate change is expected to alter tree mortality rates through stress on individual 79 80 plants, biotic interactions among plants, attacks by pests and pathogens, and shifting disturbance regimes (Allen et al., 2010; Hicke et al., 2012). Long-term forest plots have detected increasing 81 mortality rates associated with temperature and drought stress in tropical, temperate, and boreal 82 forests (van Mantgem et al., 2009; Peng et al., 2011; Brienen et al., 2015). Gradual "press" 83 effects of mortality are predicted to occur alongside episodic "pulse" mortality events triggered 84 85 by climate extremes (Smith et al., 2009). Indeed, widespread "pulse" mortality events linked with drought and heat stress have already been widely documented in many regions in the past 86 few decades (Allen et al., 2010; Phillips et al., 2010). 87

The actual effects of tree mortality on ecosystem function and fluxes are still not well understood despite the recognized central role of tree mortality in forest ecosystem carbon cycling (Kurz *et al.*, 2008). In this review, we draw upon the disturbance literature (e.g. Harmon *et al.*, 2011; Edburg *et al.*, 2012; Goetz *et al.*, 2012) to place climate-driven tree mortality in a Anderegg et al. – Manuscript – 4 92 disturbance context and outline a framework for assessing the effects of climate-driven mortality 93 on ecosystem function and fluxes of carbon and water. This framework posits that the effects of 94 mortality are a function of 1) mortality attributes, such as the patch size and functional role of 95 trees killed, and 2) ecosystem properties, such as the system productivity and diversity. We use 96 remote-sensing datasets and synthesize flux data from multiple disturbance types to illustrate this 97 framework and propose cross-system hypotheses.

We first summarize the extensive disturbance literature of how tree losses should affect 98 ecosystem carbon and water fluxes. We next outline our framework for assessing the effects of 99 100 climate-driven mortality on ecosystem function; we place particular focus on compensating 101 mechanisms that could buffer the effect of climate-induced mortality on ecosystem fluxes. We then present hypotheses on how mortality attributes and ecosystem properties will influence the 102 103 impact of mortality on fluxes. Next, we quantitatively synthesize the available flux literature to compare climate-induced tree mortality to other disturbances, such as fire and harvest. We 104 105 conclude with research gaps and promising research avenues in modeling and monitoring of tree 106 mortality.

We focus primarily on climate-driven tree mortality, especially from drought, heat, and
climate-influenced insect infestations, because these are globally important but poorly
understood mortality events, although other global change drivers can induce mortality increases
as well. Some aspects of the consequences of tree mortality from drought (Adams *et al.*, 2010;
Anderegg *et al.*, 2013a) and insect outbreaks (Amiro *et al.*, 2010; Edburg *et al.*, 2012; Hicke *et al.*, 2012) have been examined, but have been based primarily on a small number of individual
cases or mortality events. Thus, our review is timely because it provides a cross-ecosystem

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synthesis and perspective necessary for predicting when and where the functional impacts of tree mortality will be most severe, which is largely missing to date.

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#### 117 How tree mortality affects ecosystem fluxes

The general trajectory of the effects of tree mortality on forest ecosystem fluxes of carbon 118 and water can be predicted from first principles and ecological theory (Harmon et al. 2011; 119 Goetz et al. 2012; Fig 1). Drought-related forest mortality is a disturbance and can be described 120 using classical disturbance theory (White & Pickett, 1985). As trees die, independent of the 121 122 causal agent of mortality, leaf area in an ecosystem will temporarily decline. The corresponding decline of ecosystem photosynthesis leads to declines in gross primary productivity (GPP) over 123 some time period (Fig 1a, #1). GPP recovers as surviving trees and understory vegetation 124 125 produce more leaves (Anderegg et al., 2012) and enhance their light use efficiency (Gough et al., 2013) to better take advantage of newly available light resources and as new trees regenerate into 126 the ecosystem (Stuart-Haëntjens et al., 2015). Lower ecosystem-level leaf area and growth rates 127 will tend to drive decreases in autotrophic respiration (R<sub>a</sub>; Fig 1a, #2). Mortality also leads to a 128 129 pulse input of leaf litter and coarse woody debris (Norton *et al.*, 2015), and thus decomposition of this plant matter is expected to drive lagged increases in heterotrophic respiration (R<sub>h</sub>; Fig 1a, 130 #3). The direct effects of drought, however, will act to suppress  $R_h$  due to soil moisture 131 limitations, which could counteract this litter decomposition pulse in the short term (Rowland et 132 133 al., 2014). Finally, in ecosystems with slower turnover and decomposition rates – particularly 134 colder and drier ecosystems - dead bole snags may remain standing for relatively long periods of 135 time. When these snags fall to the ground their decomposition may be relatively fast (Harmon & 136 Hua, 1991), and an additional pulse of  $R_h$  would be expected (Fig 1a, #4). Net ecosystem And eregg et al. - Manuscript -6

137 productivity (NEP) should follow the trajectory outlined by GPP minus R<sub>a</sub> and R<sub>h</sub>, likely experiencing an initial decline, followed by a period of positive uptake and a gradual return to 138 near equilibrium. Our framework assumes that the ecosystem is able to recover to near 139 140 equilibrium conditions, as assumed by almost all dynamic vegetation models, where GPP is roughly in balance with R, such that NEP tends towards zero in the long-term (Odum, 1969). 141 142 Some ecosystems may, however, transition to alternate stable states (i.e. non-forest) after certain types or magnitudes of climate-triggered mortality (Allen et al., 2010), which we do not discuss 143 144 here.

145 Changes in ecosystem water fluxes following mortality commence with declines in the sum of plant-level transpiration ( $E_{plant}$ ) across the ecological community (Fig 1b, #1). In many 146 cases of both drought and insect-induced mortality, the mortality agent itself will drive this 147 148 decrease in transpiration even before leaf area losses are observed, for example through extensive xylem cavitation (Martínez-Vilalta et al., 2002; Anderegg et al., 2014) or through 149 150 interruption of water transport by fungal pathogens associated with insects (Frank et al., 2014), 151 both in trees that die and potentially in those that survive. Lower transpiration rates are predicted to drive increased run-off – both surface run-off and streamflow (Fig 1b, #2) (Adams et al., 152 153 2012). Declines in transpiration should also lead to increases in soil moisture, which is widely supported by the timber harvest literature (Amiro *et al.*, 2010), although the changes are complex 154 throughout the soil profile (Miller et al., 2011). In ecosystems with lower leaf area indices, there 155 156 also may be increases in soil evaporation rates (E<sub>soil</sub>) due to increased radiation and temperature exposure on bare soils (Raz-Yaseef et al., 2010) (Fig 1b). If snags remain standing, a second 157 pulse of increased run-off is possible as snagfall may allow further erosion and increased surface 158 159 water transport (cf. Edburg et al. 2012) (Fig 1b, #3). Ecosystem evapotranspiration (ET) is the Anderegg et al. – Manuscript – 7 160 sum of precipitation (assumed to be constant in our hypothetical example) minus run-off,

161 groundwater infiltration (also assumed constant, although in reality this could change due to

162 changes in canopy openness), and plant and soil water loss. ET is predicted to decline during and

after the disturbance and then to gradually recover afterwards.

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#### 165 Scaling mortality to fluxes across ecosystems

The net effect of mortality on ecosystem fluxes is the integral of the trajectories in Fig 1 166 over time. This highlights that two key characteristics will determine the magnitude of the 167 impacts: 1) the magnitude of the initial "pulse" response and 2) the recovery rate of the 168 169 ecosystem (Table 1). Both of these characteristics are likely to vary substantially across ecosystems and mortality events. The functional impacts of drought-related tree mortality are 170 171 likely to differ from those of stand-clearing disturbances, such as fire or clearcut harvests, whereas stand-thinning disturbances such as thinning harvests, low-intensity fires, or storms may 172 provide better analogues. There is growing evidence that thinning and defoliation may have 173 174 relatively minor and short-lived effects on ecosystem fluxes (Amiro et al., 2010; Miller et al., 175 2011; Nave et al., 2011; Dore et al., 2012; Gough et al., 2013; Templeton et al., 2015), in 176 agreement with studies showing that ecosystem structure, such as canopy height and root 177 biomass, may recover more slowly than ecosystem function, such as NEP, after disturbance (Beard et al., 2005). While the direct effects of drought on ecosystem physiology can be large 178 179 (Ciais et al., 2005; Schwalm et al., 2012; Gatti et al., 2014), we hypothesize that the functional 180 impacts of drought-related *tree mortality* itself may be relatively mild, at least in some ecosystems, as has been recently shown for climate-triggered mountain pine beetle infestations 181 182 in North America (Rhoades et al., 2013; Biederman et al., 2014; Reed et al., 2014).

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183 Several compensatory mechanisms explain why substantial tree mortality may not 184 necessarily translate into major changes in ecosystem fluxes (Gough et al., 2013; Rhoades et al., 2013; Reed *et al.*, 2014) (Table 1). Firstly, moderate disturbances may increase canopy structural 185 186 heterogeneity and diffuse light penetration, improving light use efficiency and also resulting in 187 higher photosynthetic performance per unit leaf area (Gough et al., 2013; Frank et al., 2014). In addition, higher resource availability (both water and nutrients) per unit of leaf area normally 188 189 results in higher photosynthetic and growth performance of remaining trees (Martínez-Vilalta et al., 2007; Dore et al., 2012). Third, changes in ecosystem water use efficiency (WUE) can 190 191 modify the relative magnitude of changes in water and carbon fluxes after disturbance shown in 192 Fig 1 (Mkhabela *et al.*, 2009). Finally, leaf area index (LAI) may recover quickly due to the regrowth of vegetation following disturbance, including both remaining trees and new 193 194 regeneration (Templeton *et al.*, 2015). Many forests have a huge capacity to recover leaf area after disturbance if soil fertility is not negatively affected or even enhanced (Norton et al., 2015). 195 196 This is particularly true if resprouting species are involved. For instance, LAI recovered 197 completely in a coppiced Mediterranean holm oak forest within 6 years after removing ~80% of the forest basal area by thinning, despite the fact that the studied system was heavily water-198 limited and that the strongest drought on record occurred two years after the thinning was 199 200 performed (López et al., 2009).

Using the compensatory mechanisms discussed above, we outline a framework to predict the changes in ecosystem fluxes within and across ecosystems after a pulse of mortality (Table 1, Fig 2). These scaling variables (Table 1) should be considered as hypotheses of the mechanistic effects of each variable when all other factors are roughly held constant (i.e. the slopes of a partial regression between the scaling variable and ecosystem flux, while accounting for other Anderegg et al. – Manuscript – 9 206 variables). Quantifying mortality severity is the first crucial component needed to scale from the population to the ecosystem. While a population-level mortality rate (stems  $yr^{-1}ha^{-1}$ ) is the 207 relevant metric to use in demographic studies aimed at predicting long-term community 208 dynamics, we suggest that in most cases the amount of biomass or basal area (g or  $m^2 yr^{-1} ha^{-1}$ ) 209 killed is a more useful quantification of severity of mortality and more likely to be related to 210 ecosystem-level functional consequences in the short- to mid-term. In this paper, we define 211 mortality broadly, including the complete loss of aboveground biomass (absent death of 212 meristem tissue), as this will affect ecosystem fluxes even if resprouting or clonal meristems do 213 214 not die. It is self-evident that the amount of mortality matters for the magnitude of ecosystem response, but less clear about the timescales of ecosystem recovery, which may start to occur 215 while the mortality event is ongoing. In addition, the functional form of the relationship between 216 217 mortality severity and effects on ecosystem fluxes is largely unknown (Fig 2b). How mortality scales to affect fluxes could be linear, non-linear, or threshold-driven (Fig 2b, dashed lines) and 218 219 will almost certainly depend on the ecosystem type and characteristics of mortality. Importantly, 220 the factors promoting fast recovery after mortality do not necessarily coincide with those minimizing the initial effects. 221

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#### 223 Mortality characteristics' influence on ecosystem flux trajectories

We predict that the patch size and the timing of mortality, as well as the size-classes and functional role of the trees killed will influence subsequent changes in ecosystem fluxes (Table 1). Tree mortality has long been known to be unevenly distributed in space and time (Franklin *et al.*, 1987). Some mortality drivers, particularly fire and windthrow, yield large patches of forest loss (Chambers *et al.*, 2013). Other drivers, such as mortality from competition or gap dynamics, Anderegg et al. – Manuscript – 10 229 are likely to yield more dispersed and random patterns of mortality (Espírito-Santo et al., 2014). 230 We posit that the spatial clustering (patch size distribution) of tree mortality will play a central role in determining the effects on ecosystem fluxes (Table 1). All else being equal, large patches 231 232 of forest loss should have larger and longer effects on ecosystem fluxes than the same amount of 233 biomass lost from mortality in many more smaller patches. The theory underlying this essentially derives from the relative importance of patch edge perimeter versus patch area because more 234 edges would be expected to facilitate both the utilization of newly available resources (water, 235 light, etc.) by neighboring trees as well as dispersal and colonization into the disturbed area, 236 leading to faster recovery of ecosystem fluxes (Franklin & Forman, 1987; Turner et al., 1997). 237 The distribution of mortality patch sizes from disturbance has been quantified in some 238 ecosystems, notably the Amazon rainforest. Medium and large-scale disturbances (>1 ha) in the 239 240 Amazon roughly follow power-law relationships (Chambers et al., 2013; Espírito-Santo et al., 2014) (Fig 3). The shape and slope of this relationship is crucial in determining the effects on 241 ecosystem fluxes because the relationship describes the relative frequency of small versus large 242

disturbances and thus their relative impact on regional carbon fluxes (Espírito-Santo et al.,

244 2014).

We characterized the disturbance size and frequency for forest loss in a major temperate region where drought- and insect-induced tree mortality has been exceptionally prominent (Allen *et al.*, 2010) from two datasets: 1) Landsat estimates of forest loss from 2000–2013 (Hansen *et al.*, 2013)(which also includes fire-driven losses) across the intermountain west, USA, and 2) an individual widespread drought-driven tree mortality event of trembling aspen (*Populus tremuloides*) (Huang & Anderegg, 2012). We observe that drought-, insect-, and fire-driven forest loss across the intermountain western United States also appears to follow a power-law Anderegg et al. – Manuscript – 11 252 relationship (Fig 3, dark green). Notably, however, the exponent of this relationship is  $\alpha = -0.9$ , whereas the exponent in the Landsat-based analysis of the Amazon is  $\alpha = -2.1$  (Fig 3) (Espírito-253 Santo et al., 2014). The less-steep exponent in this temperate region reveals that drought-, insect-254 255 , and fire-induced mortality, which are the dominant causes of forest loss (Hicke *et al.*, 2013), 256 causes proportionally greater large disturbances than the disturbance distribution observed in the Amazon, where small-scale disturbances dominate (Fig 3). The inclusion of fire-driven forest 257 losses could influence the slope of this power-law by increasing the relative proportion of large 258 patch disturbances. However, the Amazon disturbance data is roughly comparable in that it also 259 260 includes fires and windthrow disturbances. We also observed a power-law relationship in a specific drought-driven mortality event of trembling aspen (*Populus tremuloides*) in Colorado, 261 USA, which has an exponent of  $\alpha = -1.3$  (Fig 3; blue line). Forests in this temperate region 262 263 exhibit much higher frequency of large-scale disturbance than in the Amazon, which would favor larger effects of mortality on ecosystem fluxes (note that the absolute numbers of disturbances 264 per hectare should not be compared between the Amazon and western US due to different bin 265 widths) (Fig 3). 266

The timing of the mortality event, particularly in relation to climatic conditions is also 267 likely to be relevant for ecosystem recovery and fluxes. A clear difference between drought-268 induced mortality and other disturbances, such as commercial thinning, is that stressful 269 conditions are likely to prevail even after the mortality episode has come to an end, implying 270 271 legacy effects (Breda et al., 2006; Anderegg et al., 2013b, 2015a). In principle, recovery should 272 be faster if favorable climatic conditions, particularly with regards to water availability, occur shortly after the mortality event, as increased water availability for the remaining vegetation 273 274 should promote the recovery of leaf area (Breda et al., 2006). This leads to the prediction that Anderegg et al. – Manuscript – 12 mortality episodes occurring relatively late during the dry season are likely to involve shorter
 recovery times, provided that the rains return to normal levels at the beginning of the wet season.

The functional role of the trees killed will also impact the response of ecosystem fluxes to 277 278 a mortality event. Trees fill diverse functional roles and niches in forests, and thus a preferential 279 mortality of some species, which is common in drought- and insect-induced tree mortality (da Costa et al., 2010; Phillips et al., 2010; Anderegg et al., 2013a), may have important 280 consequences. Mortality of trees that fill functionally unique roles - for example in rooting 281 distribution, nitrogen fixation, flammability, a given successional status, or hydraulic 282 283 redistribution – should have larger effects on ecosystem fluxes. In general, we expect faster recovery times if species with traits favoring regeneration after disturbance (e.g., resprouting) are 284 affected, as has been widely established for wildfires (Pausas et al., 2009). Which other axes of 285 286 species' niches matter, however, is likely to vary from system to system and depend on the relative importance of different abiotic constraints of the ecosystem. 287

Finally, the size class of trees affected by mortality is likely to be critical in evaluating 288 289 the ecosystem effects. Large trees play critical roles in many ecosystems and store disproportionately large amounts of carbon (Slik et al., 2013; Stephenson et al., 2014) and, 290 291 obviously, they take longer to be replaced. Larger trees are also likely more susceptible to drought stress, probably because disproportionally larger evaporation demands relative to their 292 larger uptake potential, leading to higher tension in water conducting systems (Merlin et al., 293 294 2015). We thus hypothesize that mortality of larger trees is not only more likely under drought 295 stress but will also generally translate to larger effects on ecosystem fluxes. Consistent with this prediction, simulations of the impacts of insect-driven mortality of *Pinus contorta*, which 296 recently affected more than 20 million ha of forests in North America, revealed that the 297 Anderegg et al. – Manuscript – 13 298 distribution of diameter size classes living and killed had the largest impact on simulated carbon 299 fluxes (Pfeifer et al., 2011). Critically, both plot networks and drought experiments have indicated that drought-induced mortality is likely to preferentially affect large trees in tropical 300 301 forests (Nepstad et al., 2007; da Costa et al., 2010; Phillips et al., 2010) and elsewhere (Merlin et 302 al., 2015), which may induce larger ecosystem effects than if mortality were random. Scaling from the individual tree to ecosystem level responses is, however, far from trivial, implying that 303 the association between larger trees being affected and higher overall functional impacts may not 304 be universal. 305

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#### 307 Ecosystem properties' influence on ecosystem flux responses

We hypothesize that properties of different ecosystem and biomes, particularly 308 309 productivity/turnover time and tree species diversity, will strongly affect ecosystem flux trajectories after mortality. Ecosystems that exhibit higher productivity and faster turnover times 310 311 should, all else being equal, recover more quickly. Aboveground plant carbon turnover times 312 vary substantially across ecosystems and are generally faster in tropical ecosystems (Galbraith et al., 2013), where inputs from gross primary productivity tend to be higher (Carvalhais et al., 313 314 2014). The speed of regrowth and regeneration is generally thought to be much slower in coldlimited and water-limited ecosystems, correlating with growth rate differences (Reich, 2014). 315 The degree of "competitor release" triggered by tree mortality and the growth rates of these 316 317 competitors should greatly influence ecosystem recovery from mortality. For example, thinning 318 and the related reduction in competition for light and water increased growth of the remaining 319 trees in xeric pine stands for up to three decades after the treatment, with higher and longer 320 lasting effects in higher thinning intensities (Giuggiola et al., 2013). Thus, structural and Anderegg et al. – Manuscript – 14 321 compositional changes that occur following mortality will have important impacts on the long 322 term trajectories of ecosystem fluxes.

Finally, higher functional diversity in an ecosystem and associated higher niche 323 324 redundancy should lead to faster recovery times and more muted ecosystem consequences. In 325 particular, we hypothesize that functional diversity specifically pertaining to drought tolerance 326 and recovery strategies should be one of the most important components of diversity. Theoretical and empirical work has shown that biodiversity is crucial in helping systems reorganize and 327 return to a pre-disturbance state (Folke et al., 2004). For example, the occurrence of isohydric 328 329 and anisophydric species or the mix between both has been found a key property to drought vulnerability (Roman et al., 2015). A prominent mechanism underlying the role of biodiversity is 330 termed the "insurance value of biodiversity," describing the observation that the presence in a 331 332 community of a diverse set of species allows for higher likelihoods that some species will be able to a) tolerate a given disturbance and b) utilize available resources post-disturbance to regrow 333 quickly (Morin et al., 2014). 334

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#### **Recovery times of climate-induced tree mortality compared to other disturbances**

It has only been quite recently that severe drought and drought-induced tree mortality has been widely considered in the disturbance literature. In order to locate climate-driven tree mortality (drought-triggered and insect-triggered where insect-driven mortality is related to climate) in context with other disturbances, we performed a literature review to identify studies where: 1) mortality of trees occurred and was quantified and 2) the recovery of ecosystem fluxes of carbon or water after disturbances were measured (Supplemental Material). We located 37 studies that met these criteria and spanned disturbances of drought, insects, windthrow, fire, and Anderegg et al. – Manuscript – 15 344 timber harvest. We present results from 21 studies that included the most widely-reported and relevant carbon flux - Net Ecosystem Productivity (NEP), but similar results were obtained if 345 other ecosystem fluxes were considered (Table S1). We classified disturbances as insect/drought-346 347 driven, low severity fire/harvest, and high severity (i.e. stand clearing) fire/harvest. We found that recovery times differed across these disturbance classes (ANOVA; 348 F=7.13, p=0.004), with the main difference being significantly slower recovery times in high 349 severity fire/harvest (Tukey HSD high severity-low severity: p=0.007; Tukey HSD high 350 severity-insect/drought: p=0.04). Recovery time to where NEP first reached pre-disturbance or 351 352 control values for insect- and drought-driven tree mortality was relatively short, around 4 years 353 on average (Fig 4). This was comparable to low severity fire or harvest, also around 4 years, but much faster than high severity fire or harvest, which was around 26 years (Fig 4). Strikingly, 354 355 these recovery times occurred despite relatively high levels (~60-90% of stems) of tree mortality driven by insects and drought (Table S1). Our sample of studies is likely biased - due to data 356 357 availability – towards temperate and coniferous forests (Table S1), which has several 358 implications. Such forests might be expected to fall along the slower end of recovery rates and tend to have relatively lower productivity. Thus, the impacts of mortality could be of a larger 359 360 magnitude in more mesic, broad-leaved forests, but we would generally predict recovery times to 361 be faster in those systems.

Considering carbon fluxes in light of Fig. 1, declines in GPP were broadly observed during and following drought-induced and insect-induced tree mortality in multiple coniferdominated ecosystems in North America, ranging from arid woodlands (Krofcheck *et al.*, 2014) to montane pine forests (Brown *et al.*, 2012; Moore *et al.*, 2013) to high elevation forests (Frank *et al.*, 2014). In the tropics, NPP was observed to recover within about 1 year after drought-Anderegg et al. – Manuscript – 16 367 driven tree mortality (Brando et al., 2008). Flux tower studies in Pinus contorta dominated forests, which have experienced the largest insect-triggered mortality events ever documented, 368 found that total ecosystem respiration (sum of R<sub>a</sub> and R<sub>h</sub>) declined in parallel with GPP and thus 369 370 found little net change in NEP (Moore et al., 2013) or recovery of the ecosystem to a net sink within 2-4 years post-outbreak (Brown et al., 2012). In this case, the limitations of inputs from 371 GPP to R<sub>a</sub> appeared to lead to falling total respiration (Moore *et al.*, 2013). Despite extremely 372 high mortality rates, 60-90% of trees killed at these sites, and relatively low diversity in the plant 373 community, the studies observed that remaining vegetation and regrowth caused GPP and thus 374 375 NEP to recover relatively rapidly at an ecosystem scale (Brown *et al.*, 2010, 2012). However, 376 recent evidence has highlighted large differences between eddy flux estimates and direct chamber measurements of respiration in insect-attacked forests, indicating uncertainty in 377 378 ecosystem respiration and thus NEP quantification (Speckman et al., 2014). In addition, large amounts of trees in these ecosystems are still standing and thus the short timescale of most 379 380 studies (most are <6 years post-disturbance) may not capture a second peak or extended period 381 of respiration after tree fall (Fig 1; cf. Edburg et al., 2012).

Examining water fluxes following mortality, declines in transpiration and increases in 382 383 soil moisture have been observed following extensive insect-driven tree mortality (Biederman et al., 2014; Frank et al., 2014). In most cases, increases in run-off are observed following drought-384 and insect-driven tree mortality (Adams et al., 2012), however in some systems increases in soil 385 386 evaporation and snow sublimation appear to outweigh the declines in transpiration, leading to muted or even declines in run-off and streamflow (Guardiola-Claramonte et al., 2011; 387 Biederman et al., 2014). The average recovery time of run-off and water yield from harvest and 388 389 fire disturbances was 5.4 years (range 2-16 years) (Table S1), and while no studies to our Anderegg et al. – Manuscript – 17 390 knowledge have quantified recovery of run-off after drought-induced mortality, the relatively

391 fast NEP recovery times we observed suggest that the recovery times from these other

392 disturbances are a reasonable approximation.

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#### 394 Research gaps in mortality-flux data and current ecosystem models

Models provide useful frameworks for performing scaling and testing scaling hypotheses, 395 as they include some representation of the biotic and abiotic effects on tree physiology, 396 demography, and forest fluxes (Table 2). How models simulate drought-induced mortality is one 397 398 of the largest areas of uncertainty and while this is either absent (e.g. constant mortality rate 399 independent of climate) or relatively simplistic (e.g. mortality increases outside an arbitrary climate envelope) in most current models (McDowell et al., 2011), this is an active area of 400 401 research (Fisher et al., 2010; Anderegg et al., 2015b; Mackay et al., 2015). In particular, simulation of canopy structure, such as whether trees or cohorts of trees are simulated, and of 402 plant physiology are critical elements that determine how and if models can simulate drought-403 404 induced mortality and its effects (McDowell et al., 2013).

Currently a variety of vegetation models exist which employ different representations of 405 406 canopy structure and ecosystem physiology in order to simulate ecosystem scale responses, some 407 of which we summarize in Table 2. In relation to canopy structure most commonly used vegetation models vary from being a simple "big leaf" model, within which the canopy is 408 409 represented by a single canopy layer (e.g. IBIS, SIB), to multi canopy-layer models (e.g. SPA 410 JULES, CLM, ORCHIDAE), to models which dynamically simulate canopy gaps (e.g. ED, PPA). The representation of water stress and its interaction with canopy structure in models is 411 412 arguably one of the most important determinants of variation in how ecosystem models simulate Anderegg et al. – Manuscript – 18 413 reaction and response to climate-induced mortality events (Powell et al., 2013; Rowland et al., 414 2015). In many models water stress is simplified to the impact of a soil water stress factor (Table 2), which is used to down-regulate stomatal conductance and/or photosynthesis in stressed 415 416 conditions, alongside the direct effects of changes in VPD on stomatal conductance (e.g., 417 JULES, CLM, ED). Other vegetation models take a more process-based approach, for example 418 simulating a connection between leaf and soil water potential in which stomatal conductance is maximized without allowing leaf water potential to fall below a critical threshold (SPA); or 419 simulating the hydraulic pathway from soil to leaf, with multiple resistances (Sperry et al., 1998) 420 421 (Table 2). Variability in both canopy structure and water relations within models will alter both the initial pulse response to a morality event, as well as the feedbacks which control the recovery 422 time, such as gaps allowing increased availability of light (Table 2). 423

424 Considering the elements of mortality that most impact fluxes (Fig 2), some of the critical processes needed to capture ecosystem flux dynamics after mortality are currently present in 425 ecosystem models (Table 2), but other key processes are not well-represented. No large-scale 426 427 ecosystem models to our knowledge can currently represent spatial clustering of mortality 428 (Fisher *et al.*, 2010), although gap models, such as ED, can go some way towards representing 429 mortality patterns through a statistical representation of the spatial distribution of trees of differing canopy heights. Large-scale gradients in productivity are well-represented in most 430 models, however currently none of the models represented in Table 2 sufficiently represent 431 432 functional diversity in a forest and therefore full diversity of variation in drought-response and post-disturbance regeneration strategies between plant functional types (Fisher *et al.*, 2010; 433 Powell et al., 2013; Anderegg, 2014). Individual stem or cohort-based models (e.g. ED, PPA) 434 435 may be able to represent functional diversity more effectively through using a continuum of trait Anderegg et al. – Manuscript – 19 variation (Fyllas *et al.*, 2014), rather than through 1 or 2 discrete types of tree or plant, with the
trade-off that increased representation of diversity is computationally challenging at regional to
global scales.

439 Considering the key compensating mechanisms that would buffer flux responses, we highlighted above the key roles of changes in photosynthetic performance of surviving trees, 440 increased resource availability, and changes in allocation to allow rapid recovery of LAI. Similar 441 to the challenge of simulating the full functional diversity of forests, most models in Table 2 442 have fixed photosynthetic traits, which would result in slower recovery of carbon uptake. 443 444 Dynamic LAI is generally incorporated into most vegetation models (Table 2), albeit with large inter-model variability in absolute values and dynamic changes (Rowland *et al.*, 2015). However, 445 many models have constant carbon allocation to different tissues, which is potentially a major 446 447 limitation in simulating recovery of radial growth after drought (Anderegg et al., 2015a). Finally, in relation to recovery to mortality many of these mechanisms remain relatively untested against 448 observational data, and we suggest that the development of datasets and frameworks for 449 450 calibrating models to simulate such processes may be necessary.

Two major techniques provide most of the observational evidence examining changes in 451 452 ecosystem fluxes in carbon and water following tree mortality. First, several studies have used spatial gradients in mortality severity across regions and/or across different times since mortality 453 (i.e. chronosequences) (Hansen et al., 2015). These studies allow examination of ecosystem 454 455 stocks and fluxes well after mortality occurred and also integrate large spatial scales, such as 456 watersheds. However, the extent to which mortality also covaried with other ecosystem attributes that would affect subsequent fluxes, such as soil type or stand density, is largely unknown and a 457 458 potentially major confounding factor. The second technique involves the continuous

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459 measurement of ecosystem fluxes where mortality is occurring, using for instance eddy 460 covariance methods or streamflow gauges. These studies are more direct, but relatively rare (Table S1). While some of this rarity is due to relatively few flux towers that can be 461 462 opportunistically placed in regions experiencing a pulse of drought- or insect-induced mortality 463 (Brown *et al.*, 2012), another major impediment is that many flux studies often do not report mortality rates within the flux tower footprint, even when it has occurred (Ciais et al., 2005). 464 Both reporting of mortality rates within existing flux towers and additional studies placing flux 465 towers in ongoing disturbance to monitor recovery are greatly needed. 466

467

#### 468 Conclusion

We find here that mortality attributes and ecosystem properties interact to determine the 469 470 effect of climate-driven tree mortality on ecosystem fluxes. The magnitude of the initial impact (e.g. drought) has been much better quantified than recovery dynamics, but both are critical in 471 472 determining ecosystem-level consequences. We argue that the functional effects of drought-473 driven tree mortality are comparable to those of other, non stand-replacing disturbances and should be put in the same theoretical framework, but it is unique in that it co-occurs with a direct 474 stress on ecosystems that can have large impacts on fluxes. Emerging evidence suggests that the 475 effect of tree mortality itself (not the inciting drought) on ecosystem fluxes may be smaller and 476 recovery times may be faster than previously thought, suggesting that compensating mechanisms 477 478 are very strong.

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# 726 Tables

- 727 **Table 1.** Hypothesized mortality characteristics (A) and ecosystem properties (B) that affect the
- scaling of tree mortality (% basal area killed is assumed to be fixed) into ecosystem fluxes.

Variable	Smaller and less durable effects expected whenever	Compensatory mechanism involved	Examples from the literature
(A) Mortality characte	ristics		
Size distribution and spatial clustering	Mortality occurs in relatively small clusters	Easier utilization of newly available resources, enhanced gap colonization and recovery of canopy cover	Turner <i>et al</i> . (1997)
Timing (in relation to climate)	Mortality is followed by a relatively favorable period, particularly with regards to water availability	Increased resource availability and faster recovery of leaf area	Bréda <i>et al.</i> (2006)
Size-class of trees killed	Mortality affects preferentially small trees	Increased resource availability for the remaining trees	Pfeifer <i>et al.</i> (2011)
Functional role of trees killed	Mortality affects species with redundant (as opposed to unique) functional roles or with a high capacity to regrow after canopy loss (e.g., resprouting species)	Niche overlap/redundancy and complementarity; ability to use newly available resources	Roman <i>et al.</i> (2015) Matheny <i>et al.</i> (2014)
(B) Ecosystem propert	ies		1
Turnover time (productivity)	Productivity is high	Faster dynamics; higher capacity to build up biomass after disturbance	Brando <i>et al.</i> (2008)
Diversity	Diversity is high, particularly concerning drought-response functional diversity	Insurance effect	Morin <i>et al.</i> (2014)

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731 **Table 2.** Key responses/mechanisms that will influence the effects of mortality on ecosystem

fluxes and how they are simulated in some current examples of widely-used ecosystem models

- 733 (not an exhaustive list of models that include these processes). Abbreviations match those of Fig.
- 734 1.

Flux	Response	Model function	Example models
GPP	1) Competition for light	Dynamic LAI	SPA, CLM, ED, JULES, ORCHIDAE
		Canopy layers	SPA, CLM, ED, JULES, ORCHIDAE
		Different PFTs	CLM, ED
		Simulation of gap development (i.e.	
		succession)	ED
		Senescence	ORCHIDAE
	2) Competition for water	Representation of rooting profile	SPA, CLM, ED, JULES, ORCHIDAE
		Different rooting profiles for different size	FD
		Dumennia reat vistor untaka	
	3) Impact of water stress	Senesence	
	on stomatal conductance	Water Stress Factor	ED, CLM, JULES, ORCHIDAE
	and gross primary	Minimum leaf water potential	SPA
	productivity	Water potential and hydraulic pathway	Sporg, model
R	1) Impact of temperature	Temperature response function	SPA CIM ED III ES OPCHIDAE
	2) Impact of moisture	Moisture response function	Many models
	3) Impact of	Separate microbial model / decomposition	
	Decomposers	model	
R <sub>a</sub>	1) Impact of temperature	Temperature response function	SPA, CLM, ED, JULES, ORCHIDAE
	2) Impact of moisture	Moisture response function	JULES
	3) Impact of GPP on Ra	Ra fixed fraction of GPP	SPA
		Ra a function of GPP + temp	SPA, CLM, ED, JULES
		Ra a function of GPP + temp + water	
		stress	
		Ra modelled independently	
ΔSWC	1) Changes in	Representation of rooting profile	SPA, CLM, ED, JULES, ORCHIDAE
	Evapotranspiration	Different rooting profiles for PFTs	
		Soil hydraulic properties	SPA, CLM, ED, JULES, ORCHIDAE
E <sub>soil</sub>		Simulation of canopy gaps	ED
E <sub>plant</sub>		Representation of plant surface area	SPA, CLM, ED, JULES, ORCHIDAE
		Representation of plant height / surface	
		roughness	SPA, CLM, ED, JULES, ORCHIDAE
Runoff		Simulation of runoff	CLM, ED, JULES, ORCHIDAE

#### 736 Figure Legends

Figure 1: Expected changes in ecosystem fluxes of carbon (a) and water (b) during and following 737 738 a tree mortality event (after Harmon et al. 2011; Edburg et al. 2012). A dashed line 739 indicates the beginning of the mortality event. Carbon fluxes include a decline in gross primary productivity (GPP) driven mostly by reductions in leaf area index (1), a decline 740 741 in autotrophic respiration  $(R_a)$  due mostly to reductions in leaf area and growth rates (2), an increase in heterotrophic respiration  $(R_h)$  driven mostly by decomposition of dead 742 leaves and roots (3), a decrease in net ecosystem productivity (NEP), and in some 743 744 systems a second pulse of heterotrophic respiration driven mostly by decomposition of 745 fallen stems and snags (4). Water fluxes include a decline in plant transpiration ( $E_{plant}$ ) 746 driven mostly by reductions in leaf area (1), increases in run-off, including both run-off and streamflow (2), and in some systems a potential secondary increase in run-off due to 747 increased surface water movement after snag fall (3). 748 749 Figure 2: Cross ecosystem-scaling of the effect of mortality on fluxes. (a) Flux (e.g. GPP, NEP,

ET) deviation from a baseline over time as a function of mortality severity (dashed versus solid) and the ecosystem and mortality attribute scaling variables (green and blue). (b) Integrated impact on ecosystem flux as a function of ecosystem and mortality attribute scaling variables (polygon) (e.g. Table 1); white lines represent hypothetical linear and non-linear scaling.

Figure 3: Mortality frequency versus area affected (events per bin width per hectare per year) in
the Amazon basin (light green; data from from Espirito-Santo *et al.* 2014 from lidar for
the upper line and satellite remote sensing for the lower line), intermountain western
United States (dark green), which has been affected by large-scale drought- and insectAnderegg et al. – Manuscript – 31

759	induced tree mortality, and a drought-driven widespread mortality event (blue) of
760	trembling aspen (Populus tremuloides) in Colorado, USA. Red lines are best fit
761	regressions for a power law relationship.
762	Figure 4: Observed recovery time in years of net ecosystem productivity (NEP) after disturbance
763	from insect/drought-driven mortality, low severity fire or harvest, and high severity (i.e.
764	stand- clearing) fire or harvest. Letters indicate statistically significant differences (Tukey
765	HSD p<0.05). Numbers beneath indicate the number of studies and number of sites (in
766	parentheses).
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# 780 Figures

### 781 Figure 1



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810 Figure 3





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