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1	Rainfall continentality, via the winter GAMS angle, provides a
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5	Running Title: Woody plant distributions and continentality
6	
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22 Abstract

Aim: Drought stress has focused on water availability during the growing season, thus

24 primarly on summer. However, variation in rainfall continentality can produce striking

vegetation differences. We aim to disentangle summer water balance from winter rainfall

continentality, to better understand how climate regulated the distributions of woody plants in

the western USA.

28 Location: Western USA.

29 **Time period:** Actual.

30 Major taxa studied: Angiosperms and Conifers.

Method: We used Redundancy Analysis (RDA) to investigate correlations between rainfall continentality, summer water balance, minimum winter temperature and length of growing season on the distributions of 130 tree and shrub species in 467 plots. Rainfall continentality was calculated using the Gams (1932) index, modified for winter precipitation, and summer water balance with the ratio of summer precipitation to temperature. We estimated Actual EvapoTranspiration (AET), Deficit (DEF), mean annual temperature and rainfall from global gridded datasets and correlated them with RDA axes.

Results: Rainfall continentality measured with the Gams index and minimum temperatures 38 best explained the contrast between oceanic vegetation in the Pacific Coast Ranges and 39 continental vegetation in the Intermountain Region and Rocky Mountains. Growing Season 40 Length (GSL) was the second strongest factor correlated with vegetation distributions. 41 Summer water balance, despite being the most widely used climatic factor to assess drought 42 43 stress in biogeography, was the third strongest factor correlating with vegetation classes of the western US. AET was equally correlated with RDA axes 1 and 3, and, thus, could not 44 45 discriminate between the contrasts in the RDA.

Main conclusions: Rainfall continentality measured with the winter Gams index provides a
more precise metric than summer water balance for understanding the biogeography of woody
plants in the western USA. Broadly integrating the Gams index of continentality into plant
distributions may improve our understanding of biogeographical distributions and predictions
of responses to climate change.

- 51 Key-words: Drought, Growing season length, Minimum temperature, Rainfall
- 52 continentality, Rain shadow effects, Water balance, Western USA, Winter rainfall

54 Introduction

For decades, water balance during the growing season has been the key measurement used to 55 quantify drought stress in ecological, biogeographical, physiological and climate change 56 studies, likely due to the primary objective of pioneer biogeographers to separate 57 Mediterreanean from temperate climates (Walter & Lieth, 1960; Stephenson, 1990; Rueda, 58 Godoy & Hawkins, 2018; Williams et al., 2020). For example, the ombrothermal diagram 59 proposed by Bagnouls & Gaussen (1953) for the Mediterranean Basin, in Europe and northern 60 Africa, has been widely and successfully used worldwide to describe biogeographical 61 distributions (Walter & Lieth, 1960). Stephenson (1990, 1998) proposed measurements of 62 Actual EvapoTranspiration (AET) and Deficit (DEF), which integrate evaporative demand 63 64 with available water for plant performance. AET and DEF indices have been applied to water balance in several biological and ecosystem processes and to simulate climate change (Franck 65 66 & Inouye, 1994; Rehfeldt, Crookston, Warwell, & Evans, 2006).

However, indices quantifying water balance during the growing season might be 67 limited in biogeographic explanatory power when growing season length exceeds seven to 68 eight months, because they integrate both the effects of summer water balance and the effects 69 of winter and early spring rainfall. This is particularly important in areas with both 70 71 Mediterranean and highly continental climates, such as the western USA. In oceanic 72 Mediterranean climates annual AET (AETy) is highly influenced by the high winter and spring rainfall but not by the very low summer rainfall (AET in winter and in spring 73 contributes to 39 and 36 vs. 2.7% of AETy, respectively, in southern California, USA; Fig. 74 1a). In contrast, in continental subtropical climates, AETy is weakly influenced by the low 75 76 winter and spring rainfall but strongly influenced by the high summer rainfall (AET in winter 77 and in spring contributes to 9.7 and 18 vs. 48.2% of AETy, respectively, in New Mexico, USA; Fig. 1b). These two regions, located at similar latitude and altitude, have very similar 78 AETy and DEFy (Fig. 1c), but they have strikingly different climates in terms of summer 79 water balance and rainfall continentality (Fig. 1d). 80

Rainfall continentality effects, in which continental interior regions are insulated from oceanic influences, is a decrease in precipitation induced by the penetration of low pressure air on a continent (Schermerhorn, 1967; Bach, Price, Dorn, Liu, & Phillips, 2013). Most low atmospheric air pressure systems have oceanic origins, but they can also originate on inland seas, such as the Mediterranean, Black and Caspian seas in Europe (Michalet, 1991; Pache,

Michalet, & Aimé, 1996a; Caccianiga et al., 2008). In temperate and Mediterranean climates, 86 87 rainfall continentality primarily affects winter precipitation, whereas in tropical monsoon climates these effects can also be strong in summer (Michalet, 1991; Bach et al., 2013). 88 Rainfall continentality effects are much stronger where mountain ranges are adjacent to 89 oceans, due to the increase in precipitation with increasing altitude on the windward sides of 90 mountains (orographic effect, Browning & Hill, 1981) and a decrease on their leeward sides 91 (rain shadow effect, Roe, 2005). Since Vapor-Pressure Deficit (VPD) increases and 92 93 cloudiness decreases along gradients of increasing rainfall continentality, temperature range 94 increases in continental climates, due to increasing irradiance, with colder winter nights and 95 warmer days than in oceanic climates (Waring & Franklin, 1979; Bach et al., 2013). The 96 increase in day temperature, in particular in the spring, increases growing season length, which explains shifts in vegetation belts to higher altitudes in continental mountain ranges 97 98 than in oceanic ranges (Ozenda, 1985; Grace, 1987; Michalet, 1991; Desplanque, Rolland, & Michalet, 1998; Michalet et al., 2003; He et al., 2016 and see Fig. 2). 99

100 Precipitation-based continentality creates striking differences in vegetation in a wide range of climates, and this has major ecological and evolutionary consequences. One of the 101 102 best examples is in the temperate climate of northwestern America, where mountains and distance from ocean creates the difference between the rainforests of the Pacific Coast and the 103 dry coniferous forests of the Rocky Mountains (Daubenmire, 1946; Franklin & Dyrness, 104 1973; del Moral & Watson, 1978; Waring & Franklin, 1979). This difference in vegetation is 105 106 a major component of classification in the US (Brown, Reichenbacher, & Franson, 1998). 107 Similar differences, though less strong, occur at the same latitudes in temperate Europe between the mixed deciduous-evergreen beech-fir (Fagus sylvatica-Abies alba) forests of the 108 109 external (oceanic) Alps and the larch-pine (Larix decidua-Pinus sylvestris-P. uncinata) forests of the inner (continental) Alps (Gams, 1932; Ozenda, 1985; Pache et al., 1996a; Michalet, 110 111 Joud, Gafta, Rolland, & Callaway, 2003).

112 Although precipitation-based, or rainfall continentality and rain shadow effects, 113 produce striking vegetation patterns on several continents, there has been little attention to 114 winter precipitation in biogeographical patterns, likely because plants are generally dormant 115 during the cold season. An important exception is the use of winter vs. summer precipitation 116 to predict shrub vs. grass dominance, respectively, in US deserts and shrub steppe (Neilson 117 1986, 1987; Paruelo & Lauenroth, 1996; Munson et al., 2013; Reinhardt, McAbee, & 118 Germino, 2019). The most direct physiological stress associated to rainfall continentality is

likely the much higher VPDs in continental climates that affect stomatal conductance, water 119 120 uptake and carbon assimilation (Simonin, Santiago, & Dawson, 2009; Muhamed, Le Bagousse-Pinguet, Touzard, & Michalet, 2013; Novick et al., 2016). Also, the frequency of 121 122 freezing temperatures increases substantially in dry continental air (Bach et al., 2013), and together with higher irradiances, increase photo-inhibition (Manuel et al., 1999). This is 123 highly detrimental for species with high leaf area and Specific Leaf Area (SLA) (Waring, 124 Emmingham, Gholz, & Grier, 1978). Importantly, plants must cope with these constraints 125 during the growing season, since the low cloudiness of continental climates is observed 126 127 yearlong (Peyre, 1983). Sequoia sempervirens, in northern California, is tightly correlated with overcast conditions (Waring & Franklin, 1979; Barbour et al., 2014), perhaps an example 128 129 of distributional limits imposed by high VPD in continental climates through leaf physiological traits. 130

131 In Europe there is a history of using variation in annual rainfall as an indicator of rainfall continentality in mountains (Gams, 1932; Ozenda, 1985). In the Alps of Switzerland, 132 133 Gams (1932) proposed a rainfall continentality index, based on the rate of increase in precipitation with elevation and quantified with the angle of which the co-tangent is equal to 134 the ratio of annual precipitation to elevation. It allows researchers to compare the rainfall 135 continentality of sites differing in elevation, a task that cannot be accomplished with the only 136 comparison of the precipitation of the sites. This is crucial since altitude and rainfall 137 continentality are complex factors that drive different direct factors for plants, both for 138 139 temperature and humidity. Thus, one main interest of the Gams-angle index is to disentangle in mountain ranges the effects of rainfall continentality from that of decreased precipitation 140 with decreasing altitude (i.e., orographic effect). Gams (1932) showed that the distribution of 141 142 European beech (Fagus sylvatica) was tightly related to variation in the index, with values below 45° in the external Alps where beech dominates the mountain belt, vs. above 45° in the 143 144 inner Alps where beech is replaced by Scots pine (Pinus sylvestris) and European larch (Larix decidua). Ozenda (1985) generalized the "Gams-angle" approach throughout the Alpine 145 Chain (see also Michalet et al., 2003 and Caccianiga et al., 2008) and Michalet (1991) applied 146 147 the Gams-angle index to the Mediterranean climate of Morocco.

Michalet (1991) also proposed a climagram combining three important dimensions of
mountain biogeography (rainfall continentality, altitude and aridity), that depicts the
distribution of plant species both in the geographical and ecological spaces, (Fig. 2).
Interestingly, plant species have an oblic distribution in the climagram in direct relation with

the aridity zones of Emberger (1930), due to their occurrences at lower elevations in oceanic 152 153 than continental climates. This means that, consistent with Emberger (1930), species have specific water balance requirements, from very humid to sub-humid for oceanic species, 154 humid to semi-arid for semi-oceanic species and sub-humid to arid for continental species 155 (Fig. 2). These specific water balance conditions can occur at low altitude in oceanic climates, 156 due to high precipitation occurring at low altitude, but only at high altitude in continental 157 climates, due to a lower rate of increasing precipitation with increasing altitude. Thus, this 158 159 climagram allows to better understand the link existing between the humidity (VPD) and cold 160 stress that is only captured by the Gams index of rainfall continentality. Oceanic species are 161 adapted to warmer climates than continental species since the specific water balance 162 requirements can be found at lower elevation for the former than for the latter. Additionally, this climagram allows a display of the above-mentioned shift of vegetation belts to higher 163 164 altitudes with increasing continentality. This shift likely contributes to the strong vegetation turnover occurring from oceanic to continental climates, since nights are colder in continental 165 166 than oceanic climates, thus amplifying cold stress for oceanic species. Crucially, Pache et al. (1996a) proposed a seasonal modification of the Gams-angle index that targeted winter 167 precipitation (December to February), which provided a precipitation-based continentality 168 index. We propose that this index provides a better metric than indices of growing season 169 precipitation for assessing biogeographical patterns from areas with high seasonal variation in 170 rainfall due to large ranges in latitude, like those from the Mediterranean Basin in Europe and 171 Africa or from western North-America. 172

Our main objective is to assess the relative importance of rainfall continentality and 173 summer water balance in driving biogeographical distribution in areas subjected to strong 174 175 variation in winter and summer rainfall. The western USA has striking vegetation contrasts on gradients of rainfall continentality. Rainfall continentality occurs across a seasonal latitudinal 176 177 gradient in rainfall, temperate in the north, Mediterreanean in the southwest and with subtropical influences in the southeast. Thus, this system is very appropriate for assessing our 178 179 main objective. We sampled vegetation throughout the 11 states of western USA, establishing 180 467 vegetation plots near climate stations from which we extracted several climate indices to 181 correlate them to vegetation composition using Redundancy Analysis (RDA). We partitioned vegetation plots in 16 groups with a cluster conducted on RDA results and mapped their 182 183 distribution throughout the 11 states. We also extracted data from the Worldclim database for regional spatial variation in the main climate variables, including the Gam index for rainfall 184

continentality in the winter (Pache et al., 1996a). We finally analysed the relationship between 185 186 the Gams-angle index and AETy, DEFy (Stephenson, 1998), Mean Annual Precipitation (MAP) and Mean Annual Temperature (MAP) that are commonly used in the literature. We 187 made two main hypotheses: (1) variation in rainfall continentality quantified by the Gams-188 angle index provides a better metric for quantifying vegetation in Western USA than summer 189 water balance (2) variation in rainfall continentality quantified by the Gams-angle index 190 provides a better metric for quantifying vegetation in Western USA than the current accepted 191 metric of water availability during the growing season (AETy and DEFy). 192

193 Material and methods

194 Study area

We focused on 11 states in western USA (Fig. 2). This geographical area, well separated from 195 196 the American Prairie further east, may be subdivided into three main geographical units: (1) the western Pacific Coast Ranges sensu lato, located in the western parts of Washington State 197 (WA), Oregon (OR) and California (CA) and including the coastal ranges sensu stricto and 198 the Cascade and Sierra Nevada ranges, (2) the Intermountain Region, including the Great 199 200 Basin, Colorado Plateau and southern deserts, mostly located in the eastern parts of the former states and south-west Idaho (ID), Nevada (NV), Utah (UT) and Arizona (AZ, (3) the Rocky 201 202 Mountains to the east of the study area, in eastern ID, Montana (MT), Wyoming (WY), Colorado (CO) and New Mexico (NM). When considering seasonal rainfall distribution and 203 204 mean temperatures, five main climatic influences characterize the study area following Walter & Lieth (1960), temperate oceanic in the northwest, mostly limited to WA, OR and ID, 205 206 Mediterranean in the south-west, only in western CA, continental temperate in the northeast, in MT, WY and CO, continental and slightly subtropical in the southeast, in AZ and NM, and 207 208 arid-desertic in the southern parts of the Intermountain Region, in UT, NV, eastern CA, and southern AZ and NM. 209

210 Climatic data and vegetation sampling

211 We collected climate data from 800 weather stations in the Western Regional Climate Center

212 (<u>https://wrcc.dri.edu/</u>) for the study area. We used the elevation of the stations and, for the

- period 1971-2000, the precipitation and minimum and maximum temperatures over 12
- 214 months. To address our main goal, separating rainfall continentality from summer water
- balance, we calculated for each weather station the Gams-angle rainfall continentality index

using winter (December, January and February) precipitation (W GAMS, Pache et al., 1996a), 216 217 and a summer water balance index, S ARID, calculating the ratio between the precipitation and the mean of maximum temperatures of the three summer mmonths (June, July and 218 219 August). For cold stress, we used the minimum temperature of the coldest month for coldtolerance (Tmin), and the number of months with a maximum temperature above 12.5°C for 220 the Growing Season Length (GSL). For rainfall continentality, we calculated W GAMS with 221 winter precipitation using three different formulas depending on elevation (after Michalet et 222 al., 2003), which accounted for non-linearity in increasing precipitation with increasing 223 224 elevation (Michalet, 1991):

- From 900 to 1600 m, we used the original formula of Gams (1932):

226 Cotg (α) = 4P/A, Where α is the W GAMS index and P is the winter precipitation in 227 mm and A the elevation in meters.

- Below 900 m, we used a modified Gams formula (Michalet, 1991):

229 $Cotg (\alpha) = (4P - ((900-A)/100)*(4P/10)))/A$

With A = 100 m when elevation below 100 m.

- Above 1600 m, we used a second modified Gams formula (Pache, Aimé, & Michalet, 1996b):

233 $Cotg (\alpha) = (4P + ((A-1600)/100)*(4P/20)))/A$

For vegetation sampling, we selected 467 plots near weather stations (see statistical 234 analyses) in order to get the vegetation composition of sites where climate variables were 235 really measured. This sampled the climatic diversity of the total study area, while spatially 236 distributing the sampling. Fieldwork was carried out between 2000 and 2010, at different 237 times of the year depending on the growing season length and leaf phenology of the 238 239 deciduous species in different areas. We recorded the presence or absence of all tree species 240 and dominant shrubs at less than 5 km from each corresponding weather station, taking care not to sample species at more than 100 m of elevation higher or lower than the weather 241 station. Considering the scale of the study, we sampled at all exposures and on all soil types 242 within the plots. 243

We also extracted from Worldclim2 database (Fick & Hijmans, 2017) the former selected variables for estimating annual Actual EvapoTranspiration (AETy), annual Deficit (DEFy), Mean Annual Temperature (MAT) and Mean Annual Precipitation (MAP) for postanalyses correlations. The water balance-related variables (AETy and DEFy) were calculated according to Stephenson (1990). The Available Water Capacity (AWC) was retrieved from the USDA State Soil Geographic Database (Miller & White, 1998). AWC data for the first
100 cm have been used.

251 Statistical analyses

We conducted a Principal Component Analysis on the 800 weather stations and four climates 252 253 indices extracted from the Western Regional Climate Center (W GAMS, S ARID, Tmin and GSL). A cluster analysis was conducted on PCA scores in order to select 467 stations among 254 the climate types. We then performed a Redundancy Analysis (RDA) - also known as a 255 multivariate analysis with respect to instrumental variables - to study species-environment 256 257 relationships. RDA is a two-table ordination technique in which the environmental table - i.e., the predicting set of variables - is analyzed by a PCA of a correlation matrix, and the floristic 258 259 table - i.e., the response set of variables - is analysed by a PCA of a covariance matrix. The algorithm searches for the linear combination of environmental variables that best capture 260 community structure (Dray & Chessel, 2003). The environmental table included the same four 261 climate variables as in the PCA, plus winter precipitation (W PREC). Plant species with a 262 263 frequency lower than five out of the 467 plots were excluded from the analysis. The final floristic table contained 130 species. To benchmark our results with other studies, we 264 projected AETy, DEFy, MAT and MAP on the three first RDA axes. Multivariate analyses 265 were conducted in R (R core team, 2017) with the library ade4 (Dray & Dufour, 2007). 266

The partitioning of vegetation plots was performed on a dissimilarity matrix estimated 267 268 with the Jaccard's index (Jaccard, 1901). We used the Partitioning Around Medoids (PAM) technique (Kaufman & Rousseeuw, 2009) implemented in the library CLUSTER (Maechler, 269 270 Rousseeuw, Struyf, Hubert, & Hornik, 2019) to search for k representative objects or medoids among the observations. The algorithm assigns each observation to the nearest medoid with 271 the objective of minimizing the sum of dissimilarities between groups. The method utilizes a 272 prescribed number of medoids. We found that the value k=16 was providing an ecologically 273 274 and biogeographically meaningful partition of relevés while retaining a sufficient number of relevés per group. 275

276 Results

In the RDA, the total unconstrained inertia was 5.55 and the sum of eigenvalues was 1.13,
indicating that 20.4% of the total floristic variance was explained by environmental variables
(Appendix S1). The RDA axes accounted for 40%, 29%, 20%, 8% and 3% of the explained

variance. Given the drop between axis 3 and axis 4, we did not consider the last two RDA

- axes in further analyses. In agreement with our first hypothesis, RDA Axis 1 was more
- 282 positively correlated with rainfall continentality quantified by the Gams-angle index (W

GAMS; r = 0.99) than any other variable, negatively with winter precipitation (W PREC; r = -

- 0.87) and less so with minimum temperatures (Tmin; r = -0.63) (Fig. 4A, Table 1). RDA Axis
- 285 2 was highly negatively correlated with growing season length (GSL; r = -0.87) and less with
- cold temperature (Tmin; r = -0.72).

RDA Axes 1-2 were also highly correlated with the plant biogeography of the western 287 USA. The temperate rain forests of the Pacific Coast Ranges and Mediterranean evergreen 288 oak forests (cluster groups 1 and 11, respectively) aggregated on the extreme left of Axis 1. In 289 290 contrast, the coniferous forest and woodland communities from central Montana and eastern pinion-juniper woodlands in the central and southern Rocky Mountains aggregated on the 291 292 extreme right of Axis 1 (cluster groups 6 and 10, respectively, Fig. 3a, 4a, b, Tables 1, 2). The 293 upper end of Axis 2 was occupied by the northwestern and eastern subalpine coniferous forest 294 communities (cluster groups 12 and 9, respectively) and the lower end by the subtropical desert communities of the Sonoran Desert and evergreen oak woodlands of AZ and NM 295 296 (cluster groups 4 and 5, respectively, Fig. 3a, 4a, b, Tables 1, 2). The west-east climatic contrast on Axis 1 can be seen on the W GAMS and Tmin maps and the north-south contrast 297 on Axis 2 on the Tmin map only (Fig. 3b, c). The contrast between the oceanic vegetation of 298 the Pacific Coast Ranges and the continental vegetation of the Rocky Mountains and 299 300 Intermoutain Region was distinct, with few species in common between the two zones or in 301 intermediate positions on the gradient (see Appendix S2 in supporting information, and the low number of communities occurring at intermediate position along Axis 1 in Fig. 4b, i.e, 302 303 only 12, 16, 8). Species occurring along the whole gradient of continentality were represented by different subspecies in each zone, e.g., Pinus ponderosa var. ponderosa, Pseudotsuga 304 305 menziesii var. menziesii and Pinus contorta var. muryana in the west vs. P. ponderosa var. scopulorum, P. menziesii var. glauca and P. contorta var. latifolia in the east. 306

RDA Axis 3 was strongly correlated with summer water balance (S ARID; r = -0.86,
Appendix S3, Fig. 4c) and also weakly with Tmin and GSL (Table 1). Within oceanic
climates, i.e., on the left of Axis 1, Axis 3 separated Mediterranean communities with a dry
summer (cluster 11 and 8 - CA evergreen oak forests and southern chaparral, respectively)
from temperate communities with a wet summer (clusters 1 and 12 - coastal temperate rain
forests and north-western subalpine forests, respectively). Within continental climates, i.e., on

the right of Axis 1, Axis 3 separated communities of the Great Basin with a dry summer, the
mountain Ponderosa pine woodlands and the pinion-juniper woodlands (clusters 2 and 3,

respectively), from mountain and subalpine coniferous forest communities of the Rocky

Mountains (cluster groups 9 and 7, respectively) with wet summers (Fig. 3a, 4d, Tables 2,

317 S1.1).

Oceanic climates with low W GAMS values always had high Tmin, but continental 318 climates with high W GAMS values were highly variable in Tmin (Fig. 5a), consistent with 319 the high positive correlation with RDA Axis 1 (Table 1, Fig. 3b, c). In contrast, there was no 320 321 correlation between W GAMS and S ARID (Fig. 5b), which is consistent with the co-linearity with the two different RDA Axes, 1 and 3, respectively (Table 1, Fig. 4). MAP and MAT 322 323 were only correlated with Axes 1 and 2 (r = -0.80 for the former and r = -0.89 for the latter), Consistent to our second hypothesis, the Gams-angle index provided a better metric than 324 325 AETy and DEFy. AETy was correlated with both Axes 1 and 3 but with lower correlations coefficients than W GAMS and S ARID (r = -0.54 and -0.54, respectively, Fig. 4a and c). 326 327 DEFy was primarily correlated with Axis 2 (r = -0.76) and less with Axis 3 (r = 0.38; Table 1, Fig. 4a and c), as shown by the two climagrams of Fig. 6 where aridity zones delimited using 328 DEFy were highly correlated with the vertical axis (growing season length, i.e., RDA axis 2), 329 both in the dry- and wet-summer climagrams (Fig. 6a and b, respectively). Thus, the two 330 three-dimention climagrams proposed here for western USA are conceptually very similar to 331 the climagram proposed by Michalet (1991) for Morocco, with rainfall continentality 332 distributed horizontally on the climagram, growing season length distributed vertically, and 333 water balance distributed obliquely on the climagram. 334

335 Discussion

We found that rainfall continentality and summer water balance captured two different facets of plant stress. In agreement with our first hypothesis, across the entire breadth of climate we measured, rainfall continentality corresponded much better with vegetation distribution, and took priority over the length of the growing season and summer water balance. These results are of paramount importance, both for our understanding of the relationship between droughtrelated climate variables and plant physiology, and for predicting the ecological and evolutionary responses of plant species to changing climate.

Rainfall continentality and low water balance in the growing season, two different stresses forplants

The rainfall continentality Gams index adjusted for winter precipitation (Pache et al., 1996a) 345 346 was highly predictive of vegetation types – strongly separating those in the Pacific Coast Range, from woodlands and desert communities in the Intermountain Region and Rocky 347 Mountains (see Daubenmire, 1946; Franklin & Dyrness, 1973; Waring & Franklin, 1979). 348 These vegetation types are the foundation for classification in the western USA (Brown et al., 349 350 1998). This dramatic rainfall continentality gradient is induced by both a steep orographic effect on the winward sides of the coastal ranges and a strong rain shadow effect occurring on 351 352 their leeward sides (Bach et al., 2013). Crucially, this continental/rain shadow-driven contrast 353 is independent of the summer water balance contrast of the northwest temperate climate (wet 354 summer) of western WA and OR to the south-western Mediterranean climate of CA (dry 355 summer) and the south-east subtropical climate of AZ and NM (wet summer) to the desert Mediterreanean climate (dry summer) of the Mojave Desert in eastern CA and Great Basin in 356 357 NE and eastern OR.

As noted, most correlations of vegetation distribution with climate in the western USA 358 359 have used growing season or annual water balance indices such as AETy and DEFy (Stephenson, 1990; 1998). However, consistent to our second hypothesis these two metric, 360 commonly used in biogeography to quantify drought stress, had a lower and more complex 361 explanative power than W GAMS. We found that AETy was correlated with both Axes 1 and 362 3, and DEFy to Axis 2. This may be due to the sensitivity of AETy to winter and spring 363 precipitation and to summer precipitation, with the former increasing AETy in oceanic 364 365 climates and the latter decreasing AETy in Mediterranean climates (see Fig. 1). This explains why annual AETy does not capture key climate patterns (i.e., rainfall continentality and 366 summer water balance) and the vegetation differences associated with it. The high correlation 367 368 between DEFy and Axis 2 is due to the increase in precipitation and decrease in temperature with increasing altitude in mountain ranges, both contributing to decreasing DEFy, as also 369 370 observed in the ombrothermal method (Bagnouls & Gaussen, 1953; Walter & Lieth, 1960). This latter result is also consistent with changes in aridity zones of Emberger (1930) and 371 372 DEFy with increasing altitude in the climagram of Michalet (1991) for Morocco and the two 373 climagrams for Western USA (Fig. 6), respectively. However, altitude has very large effects 374 on temperature (Rolland, 2003). Thus, this is not easy to disentangle the effects on vegetation 375 of DEFy and length of the growing season (Ozenda, 1985; Grace, 1987).

Tmin was also strongly correlated with RDA Axis 1, which is consistent with the tight physical relationships between rainfall continentality, cloudiness, VPD and irradiance.

Correspondingly, oceanic climates have high winter precipitation and high night temperatures
in the winter (Waring & Franklin, 1979; Bach et al., 2013). High VPD and irradiance
associated with rainfall continentality have strong effects on canopy microclimate and leaf
physiology (Michalet et al., 2003; Simonin et al., 2009; Novick et al., 2016). This facet of
drought is not captured in the indices of soil water deficit during the growing season
(Bagnouls & Gaussen, 1953; Stephenson, 1990). The winter Gams-angle index is a highly
effective way to capture this VPD-related component of drought.

Pache et al. (1996a) found that the geographical distribution of Albies alba in the 385 386 European Alps was highly correlated with the W GAMS index, with no occurrence of this species in the most continental inner Central Alps. This is also the case for many Abies 387 388 species in the Mediterranean Basin, which only occur in the hyper humid Mediterranean bioclimate characterized by high winter precipitation (Quezel & Médail, 2003 and see Fig. 2). 389 390 The common occurrence of North-American Abies species in the oceanic cluster groups in our study is consistent with results from Europe and the Mediterranean Basin. Interestingly, the 391 392 two larch species in the study area, Larix occidentalis and L. lyalii, only occur in sites of intermediate continentality (cluster groups 12 and 16), whereas in Europe Larix decidua is 393 common in the most continental inner zone of the European Alps. This may be due to the 394 higher rainfall continentality in the Rocky Mountains (W GAMS is always lower than 70° in 395 the Alps, vs. often over 85° in the Rocky Mountains; Pache et al., 1996a; see Fig. S3.3a in 396 Appendix S3). 397

Another ecological pattern than distinguishes rainfall continentality from summer 398 water balance is the relationship between the climatic distribution of tree species and their 399 responses to neighbours when seedlings. In the European Alps, Saccone et al. (2009) reported 400 401 that A. alba tolerated low summer water balance but not high air atmospheric stress (high 402 VPD) due to rainfall continentality. In this context, A. alba was facilitated by adult canopies during the August 2003 European heat-wave. In contrast, Picea abies tolerated high 403 irradiance due to continentality, but was intolerant to low summer water balance. In turn, this 404 405 species was negatively affected by competition for water during the heat-wave. Similar results were found by Muhamed et al. (2013) and Guignabert et al. (2020) for Q. suber and Pinus 406 407 pinaster, respectively, two Mediterranean species known for their oceanic distribution. In 408 their experiments, seedlings of both species were facilitated by the shade of shrubs in gaps 409 and forest dune communities from south-west France, correlated with lower VPD below shrubs despite lower soil water availability than where shrubs were experimentally removed. 410

411 Relative importance of rainfall continentality and water balance in western USA

412 In the western USA, W GAMS values can be lower than 10° along the Pacific coast and exceed 85° in the eastern Rocky Mountains, whereas in the European Alps the lowest values 413 are around 20° in the north-west and the highest values below 70° in the inner Central Alps 414 415 (Pache et al., 1996a; Michalet, 2001). The very high level of rainfall continentality observed in California and Oregon, immediately to the east of the Sierra Nevada and Cascade Ranges, 416 only 300 km from the Pacific Coast, has its only parallel in Europe at a distance of at least 417 418 3000 km from the Atlantic Ocean, in the Ukraine. In contrast, except in western Washington, 419 summer water balance is very low in the western USA and thus varies much less spatially 420 than in Europe. This may explain the much higher relative importance of rainfall 421 continentality than summer water balance for vegetation distribution in western USA than in Europe (Bagnouls & Gaussen, 1953). Additionally, the strong contrast existing along the 422 423 Pacific coast between the high winter rainfall and low summer rainfall (see Fig. 3 b and d), 424 and not in Europe along the Atlantic Ocean, may explain the rarity of deciduous tree species 425 in western north-America as compared to Europe and eastern north-America (Waring & Franklin, 1979). One of the two deciduous oaks of the Rocky mountains, Quercus gambelii, 426 427 has been shown to occur in the southern Rockies but not the northern ones, because of the higher summer rainfall of the latter due to the the American monsoon originating from the 428 429 gulf of Mexico (Neilson & Wullstein, 1983).

430 Disentangling rainfall continentality from summer water balance for predicting responses to431 climate change

Disentangling rainfall continentality from low summer water balance is crucial for improving 432 the accuracy of our predictions for the effects of climate change on species distributions. Our 433 results indicate that many plant species, and in particular deep rooted woody species, in the 434 western USA may respond differently to changes in winter vs. summer precipitation. Neilson 435 (1986, 1987) have shown that past low-frequency variations in winter and summer rainfall 436 437 and temperatures drove the spatial dynamic of C3 and C4 species in the Chihuahuan Desert. 438 Our results also showed the ability of rainfall continentality to be strongly associated with 439 subspecies formation, with the three most common conifer species of western USA (Pinus ponderosa, Pinus contorta and Pseudotsuga menziesii) represented by different subtaxons in 440 oceanic and continental climates along RDA Axis 1. This supports Ikeda et al. (2017) who 441 found that including genetically informed ecological niche models improved the accuracy of 442 predictions of species distributions under climate change. Thus, if the future climate becomes 443

drier in summer and thus more Mediterranean, or drier in winter and thus more continental, 444 445 we might predict strikingly different responses among woody plant species and their subspecies. Most climate change studies have focused on summer, or growing season drought 446 stress (Breda, Huc, Granier, & Dreyer, 2006; Rehfeldt et al., 2006; Williams et al., 2020), 447 even though recent studies also indicate a trend towards increasing winter precipitation, as in 448 Scotland (UK) (Malby, Whyatt, Timmis, Wilby, & Orr, 2007) and in western US deserts 449 (Munson et al., 2013; Palmquist et al., 2016). Munson et al. (2013) have suggested that 450 increasing winter precipitation in western deserts should favour shrubs over grasses, 451 452 considering the current relative dominance of the former functional group in western deserts characterized by higher winter than summer precipitation (Paruelo & Lauenroth, 1996; but see 453 454 Grover & Musick, 1990). In contrast, Palmquist et al. (2016) constructed models suggesting that the benefits of higher winter rainfall for shrubs induced by climate change should be 455 456 overwhelmed by higher evaporative demand later in the growing season. Novick et al. (2016) estimated that soil moisture supply and atmospheric demand for water independently limit 457 458 vegetation productivity and water use during periods of drought stress. The results of our 459 study support their conclusion - conceptual and mathematical models that do not 460 independently resolve VPD and soil moisture limitations (and thus rainfall continentality and low water balance) will not adequately capture the magnitude of ecosystem response to 461 increasing climate stress. In conclusion, we argue that the Gams-angle index proposed here to 462 disentangle water balance from rainfall continentality has exceptional potential for predicting 463 species responses to climate change, as well as contribute to fundamental plant biogeography 464 (Bell, Bradford, & Lauentoth, 2014; Violle, Reich, Pacala, Enquist, & Kattge, 2014; Stevens, 465 Kling, Schwilk, Varner, & Kane, 2020). 466

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640 Table 1: Regression coefficients of the five variables of the RDA for the three axes and post-

RDA correlations of the variables extracted from Worldclim with RDA scores. **: < 0.01,

642 ***: < 0.001.

	RDA Axis 1	RDA Axis 2	RDA Axis 3
w.GAMS	0.99***	-0.06	0.05
w.PREC	-0.87***	0.12**	-0.01
Tmin	-0.63***	-0.72***	0.18***
GSL	-0.33***	-0.87***	0.14**
s.ARID	0.07	0.27***	-0.86***
MAT	-0.22***	-0.89***	0.22***
MAP	-0.80***	0.19***	-0.18***
AETy	-0.54***	0.30***	-0.54***
DEFy	0.30***	-0.76***	0.38***

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Table 2: Vegetation labels, dominant species, continentality (position on RDA Axis 1, Fig.
S3.3a), locations and vegetation zones (position on RDA Axis 2, Fig. S3.3b) of the 16 cluster
groups. Vegetation zones correspond to GSL: high tropical: 10 months, low subtropical: 9 m.,
high subtropical: 8 m., low temperate: 7 m., high temperate: 6 m., boreal: 5 m. Abbreviations:
Rocky Mt. = Rocky Mountains, *Pseudotsuga menziesii m.* or *g. = Pseudotsuga menziesii* var. *menziesii* or
var. *glauca, Pinus ponderosa p.* or *s. = Pinus ponderosa* var. *ponderosa* or var. *scopulorum*.

Cluster	Label	Dominant	Continentality	Vegetation
groups	Vegetation	Species	Location	zone
11	Californian evergreen	Quercus agrifolia, Q. douglasii,	Oceanic	High subtropical
-	oak forests	Q. wislizenii, Q. kellogii. Q. chrysolepis	CA, OR	and low temperate
1	Coastal rain	Pseudotsuga menziesii m.,	Oceanic	Low and
-	temperate forests	Thuya plicata, Tsuga heterophylla	WA, OR, CA	high temperate
8	Southern California	Quercus agrifolia, Q. douglasii, Ceanothus sp.	Intermediate	Low and high
-	Chaparral	Pseudotsuga macrocarpa	СА	subtropical
12	Northwestern Rocky Mt.	Thuya plicata, Abies grandis, Pinus monticola	Intermediate	High temperate
-	subalpine forests	Pseudotsuga menziesii g., Larix occidentalis	ID, MT	and boreal
16	North western Rocky Mt.	Pseudotsuga menziesii g.,	Intermediate	High temperate
-	mountain forests	Larix occidentalis, Pinus ponderosa p.	MT, WA, ID	
4	Sonoran desert	Cercidium microphyllum, Olneya tesota,	Continental	High tropical
-		Prosopis velutina, Opuntia sp.	AZ	and low subtropical
5	Eastern evergreen	Quercus emoryi, Q. arizonica,	Continental	Low and high
-	oak woodlands	Yucca sp., Agave sp.	NM, AZ	subtropical
14	Mojave Desert	Larrea tridentata, Ambrosia dumosa,	Continental	Low and high
-		Yucca brevifolia, Y. shedigera	CA, NM, UT	subtropical
10	Rocky Mt. pinion-	Pinus edulis, Juniperus osteosperma,	Continental	High subtropical
-	juniper woodlands	Quercus gambelii, Artemisia tridentata	UT, NM, CO, AZ	and low temperate

3	Great Basin pinion-	Pinus monophylla, Juniperus osteosperma,	Continental	Low temperate
-	juniper woodlands	Artemisia tridentata	UT, NV, WY, CA	
2	Great Basin	Pinus ponderosa p., Juniperus occidentalis,	Continental	Low and high
-	mountain woodlands	Artemisia tridentata,	CA, OR, NM, ID	temperate
13	Northeastern	Pinus ponderosa s., Juniperus scopulorum,	Continental	Low and
-	mountain woodlands	Artemisia frigida, A. cana	MT, WY	high temperate
15	Great Basin	Artemisia tridentata,	Continental	Low and high
-	sagebrush steppe	Chrysothamnus nauseasus	ID, OR, WA	temperate
- 6	sagebrush steppe North eastern	Chrysothamnus nauseasus Pseutsuga menziesii g., P. flexilis,	ID, OR, WA Continental	temperate Low and
- 6 -	sagebrush steppe North eastern Rocky Mt. woodlands	Chrysothamnus nauseasus Pseutsuga menziesii g., P. flexilis, Artemisia tridentata, Juniperus scopulorum	ID, OR, WA Continental MT, WY, CO, ID	temperate Low and high temperate
- 6 - 7	sagebrush steppe North eastern Rocky Mt. woodlands Southern Rocky Mt.	Chrysothamnus nauseasus Pseutsuga menziesii g., P. flexilis, Artemisia tridentata, Juniperus scopulorum Pinus ponderosa s., Pseudotsuga menziesii g.,	ID, OR, WA Continental MT, WY, CO, ID Continental	temperate Low and high temperate High temperate
- 6 - 7 -	sagebrush steppe North eastern Rocky Mt. woodlands Southern Rocky Mt. mountain forests	Chrysothamnus nauseasus Pseutsuga menziesii g., P. flexilis, Artemisia tridentata, Juniperus scopulorum Pinus ponderosa s., Pseudotsuga menziesii g., Picea pungens, Abies concolor	ID, OR, WA Continental MT, WY, CO, ID Continental NM, CO, AZ	temperate Low and high temperate High temperate
- 6 - 7 - 9	sagebrush steppe North eastern Rocky Mt. woodlands Southern Rocky Mt. mountain forests Eastern Rocky Mt.	Chrysothamnus nauseasus Pseutsuga menziesii g., P. flexilis, Artemisia tridentata, Juniperus scopulorum Pinus ponderosa s., Pseudotsuga menziesii g., Picea pungens, Abies concolor Abies lasiocarpa, Picea engelmanii,	ID, OR, WA Continental MT, WY, CO, ID Continental NM, CO, AZ Continental	temperate Low and high temperate High temperate Boreal

Fig. 1: Left: ombrothermal diagrams and actual evapotranspiration (AET) and deficit (DEF) 652 of weather stations with oceanic Mediterranean (a) and continental subtropical (b) climates 653 from similar latitude and altitude. Right panels show that annual AET (AETy) and DEF 654 (DEFy) (c) are very similar, although rainfall continentality (W GAMS) and summer water 655 balance (S ARID) (d) are very different. Note that the vegetation of stations (a) and (b) were 656 classified in cluster 11 and 5 in Table 2, i.e., CA evergreen oaks and eastern evergreen oak 657

woodlands, respectively. 658



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Fig. 2: Distribution of oceanic (in blue, from high to low altitude *Abies pinsapo ssp.* 661 Moroccana in the picture and Quercus canariensis, Quercus suber and Quercus coccifera), 662 semi-oceanic (in green, from high low altitude Cedrus atlantica, Quercus rotundifolia in the 663 picture and Tetraclinis articulata) and continental species (in red, from high to low altitude 664 Juniperus thurifera in the picture, Juniperus phoenicea and Stipa tenacissima) from Morocco 665 within the climagram of Michalet (1991). The climagram includes a horizontal axis for the 666 rainfall continentality gradient quantified with the annual Gams angle index (driving VPD and 667 cold stresses), a vertical axis for the altitudinal gradient (driving the length of the growing 668 season) and, in an oblique dimension, the water balance gradient calculated with the 669 Emberger index (1930). The latter was inspired by the De Martonne (1926) aridity index and 670 is primarily based on the ratio of annual precipitation to mean temperature. Coloured frames 671 along the horizontal axis represent the different zones of continentality delimited using the 672 annual Gams angle index and oblique plain white lines along the vertical axis delimit the 673 vegetation belts in relation to altitude and latitude (see also legend of Table 2 for GSL). 674 Oblique dashed lines delimit the aridity zones of Emberger (1930) indicated with white 675 frames. 676



- **Fig. 3:** Location of our 467 plots and 16 cluster groups in the 11 states of western USA (a),
- and maps of W GAMS index (b), Tmin (c) and Summer Aridity (d). Color legends of symbols
- 680 of cluster groups are in Fig. 4. Abbreviations: AZ: Arizona, CA: California, CO: Colorado,
- ID: Idaho, MT: Montana, NE: Nevada, NM: New Mexico, OR: Oregon, UT: Utah, WA:
- 682 Washington State, WY: Wyoming.



Fig. 4: RDA results, with in (a) 1-2 diagram for climate variables and in (b) for mean scores $(\pm 1 \text{ SE})$ of the 16 cluster groups, and in (c) 1-3 diagram for climate variables and in (d) for mean scores $(\pm 1 \text{ SE})$ of the 16 cluster groups. Dashed arrows in panels (a) and (c) show correlations for supplementary variables not included in the RDA.



- 689 Fig. 5: Relationships between Tmin and W GAMS (a) and S ARID and W GAMS (b) for the
- 690 467 plots (black dots) and Worldclim datas (grey clouds).



Fig. 6: Mean $(\pm 1 \text{ SE})$ positions of cluster groups from (a) dry-summer (upper part of RDA 692 axis 3, Fig. 3d) and (b) wet-summer sites (lower part of RDA axis 3, Fig. 3d) along the 693 rainfall continentality and growing-season length gradients. Ellipses delimit the positions of 694 sites with increasing DEFy following Stephenson (1998), with in blue humid (DEFy 38-200), 695 green sub-humid (DEFy 201-640), yellow semi-arid (DEFy 640-820) and red arid sites (DEFy 696 697 821-1770). Legends of cluster groups are indicated by their numbers and colours (see Fig. 4). 698 Continentality zones are indicated below the horizontal axis and vegetation belts along the vertical axis (and see Table 2 for their delimitations). 699



- 702 Short titles for the appendices:
- 703 Appendix 1:
- **Fig. S1.1:** Eigenvalues of the five RDA axes.
- 705 **Appendix 2:**
- **Table S2.2:** Occurrence of species in the 16 cluster groups.
- 707 Appendix 3:
- **Fig. S3.3:** Means (± 1 SE) of W GAMS (a), Tmin (b) and S ARID (c) for the 16 cluster
- 709 groups.
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