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Modelling the effect of weed competition on long-term volume yield of *Eucalyptus globulus* plantations across an environmental gradient

Felipe Vargas¹, Carlos A. Gonzalez-Benecke², Rafael Rubilar⁴, Manuel Sanchez-Olate³

¹ Bioforest S.A., Concepción, Chile.

² Department of Forest Engineering, Resources and Management, Oregon State University, Corvallis, Oregon, USA.

³ Departamento de Silvicultura, Facultad de Ciencias Forestales, Universidad de Concepción, Concepción, Chile.

⁴ Cooperativa de Productividad Forestal, Departamento de Silvicultura, Facultad de Ciencias Forestales, Universidad de Concepción, Concepción, Chile.

Abstract: Several studies have quantified the responses of *Eucalyptus globulus* plantations to weed control on its early development (2-3 years after establishment). However, long-term results of competing vegetation effects have been rarely incorporated into growth and yield models that forecast the long-term effects of reducing the intensity of competing vegetation control and its interaction with site resource

availability on stem volume production close to rotation age. We compared several models predicting stand stem volume yield of *Eucalyptus globulus* plantations established across a water and fertility gradient growing under different intensity levels of free area of competing vegetation maintained during the first 3 years of stand development. Four sites were selected encompassing a gradient in rainfall and amount of competing vegetation. Treatments were applied at stand establishment and were monitored periodically until age 9 years. Competing vegetation control intensity levels considered 0, 5, 20, 44 and 100% weed-free cover around individual *E. globulus* seedlings. Maximum competing vegetation biomass production during the first growing season were 2.9, 6.5, 2.2 and 12.9 Mg ha⁻¹, for sites ranging from low to high annual rainfall. As expected, reductions in volume yield at age 9 years were observed as competing vegetation control intensity decreased during the first growing season. A strong relationship was established between stem volume yield loss and the intensity of competing vegetation control, the amount of competing vegetation biomass produced during the first growing season and mean annual rainfall. The slope of the relationship was different among sites and was related mainly to water and light limitations. Our results, suggest that the biomass of competing vegetation (intensity of competition) affecting site resource availability, contribute to observed long-term effects on *E. globulus* plantations productivity. The site with the lowest mean annual rainfall showed the highest volume yield loss at age 9 years. Sites with highest rainfall showed contrasting results related to the amount of competing vegetation biomass.

Keywords: Weed control; Competing vegetation; Yield modelling; *E. globulus*.

1. Introduction

1 Expansion of planted *Eucalyptus* forests has been successful worldwide because of their high
2 growth rates and adaptability to a wide range of environmental conditions. Currently, there are more
3 than 20 million hectares of *Eucalyptus* plantations worldwide [1], including more than 110 species of
4 the genus that have been introduced in more than 90 countries [2]. In Chile, there are approximately
5 850,000 hectares of *Eucalyptus* plantations located mainly in the south-central zone (between latitude
6 -35 and -41), of which 68% corresponds to *E. globulus* [3].

7 Sustainable forest management of these planted forest requires a good understanding of tree
8 growth and site resource availability interaction, and how resources are modified throughout the
9 rotation by forest management [4,5]. It is well known that reducing competing vegetation biomass
10 during stand establishment increases water, nutrient and light site resource availability [6-8] allowing
11 better survival and tree growth [9-12].

12 Previous studies about the managing of the intensity of competing vegetation or weed control,
13 defined as the area free from competing vegetation around each tree, have shown that at lower
14 intensity of control there is a reduction in stem volume production of fast growing species such as
15 *Pinus taeda* [13], *Pinus radiata* [14,15], *Pseudotsuga menziesii* [10], and *Eucalyptus* spp. [16]. The intensity
16 of weed control required to maximize the plantation productivity depends on specific conditions
17 such as the species, resource availability and type and amount of competing vegetation at each site
18 [14,16]. During last decades, there have been substantial research efforts to quantify growth responses
19 associated with competing vegetation control in *Eucalyptus* plantation [8,16,17,18]. However, these
20 results have not been included into growth models that incorporate different treatments of intensity
21 of competing vegetation control on *Eucalyptus* plantations. The stem volume yield loss (or stand yield
22 loss) due to weed competition has been shown to be influenced by several factors including: the
23 amount of competing vegetation biomass, spatial proximity to the plantation trees, soil water holding
24 capacity, rainfall and temperature experienced in the field over the growing season [19]. However, a
25 model can predict the likely yield loss associated with different intensities of competing vegetation
26 control [20]. Modelling plantation-weed interactions can help also to generate scientific insights and
27 a better understanding of ecophysiological processes involved. Empirical approaches have been used
28 to model the response to competing vegetation control on the juvenile growth for *Pinus radiata* [21-
29 23], *Pinus taeda* [24] and *Pseudotsuga menziesii* [25]. A negative hyperbolic curve with downward
30 concavity was a good descriptor for the relationship between stem volume and competing vegetation
31 biomass.

32 The development of a growth model sensitive to competition from competing species would
33 improve our capacity to predict long-term effects of weed competition on tree growth response. From
34 a modelling perspective, there is a strong need to understand the effects of the amount of competing
35 vegetation (intensity of competition) and site resource availability on long-term responses of *E.*
36 *globulus* plantations on a site-specific basis in order to make more sustainable management decisions.
37 The objective of this study was to model the effect of area free of competing vegetation on stem
38 volume response of *E. globulus* plantations. We hypothesize that: i) the relationship between stand
39 yield loss and intensity of competing vegetation control is not linear (there is an optimal level
40 intensity of competing vegetation control, beyond this level the stand volume yield loss would be
41 small). ii) sites with high water availability require smaller area free of competition at establishment
42 than sites with low water availability to reach the maximum growth potential at 9 years of age in *E.*
43 *globulus* plantations.

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46 2. Materials and Methods

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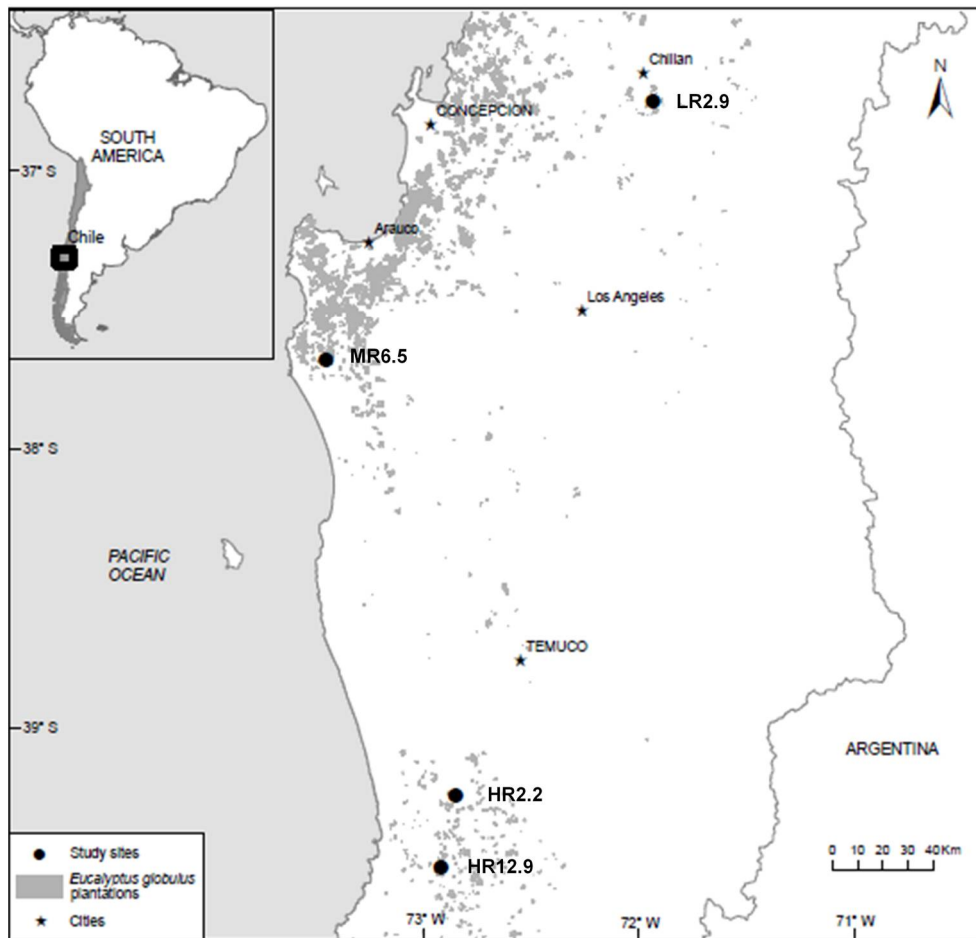
48 2.1. Site characteristics

49

50 Four experimental sites were selected representing an environmental gradient in south central
51 Chile (Table 1), where other work has been completed [18]. Climate at the study sites showed a dry
52 summer and precipitations mainly during winter (June-September). The sites were classified based
53 on their annual mean rainfall (high: HR, medium: MR or low: LR rainfall) and by the amount of
54 accumulated competing vegetation biomass (Mg ha^{-1}) in the control treatment during the first
55 growing season. Thus, site LR2.9 was located in a zone with low rainfall and had 2.9 Mg ha^{-1} of
56 competing vegetation biomass production; site MR6.5 was located in a zone with medium rainfall
57 and had 6.5 Mg ha^{-1} of competing vegetation biomass production; site HR2.2 was located in a zone
58 with high rainfall and had 2.2 Mg ha^{-1} of competing vegetation biomass production; site HR12.9 was
59 located in a zone with high rainfall and had 12.9 Mg ha^{-1} of competing vegetation biomass production
60 (Figure 1).

61 At the LR2.9 site, herbaceous competition was dominated by *Arrhenaterum elatius* L. and
62 common woody shrub was *Acacia dealbata* Link. At the MR6.5 site, herbaceous competition was
63 dominated by *Senecio vulgaris* L. and common woody shrub was *Ulex europaeus* L. At the HR2.2 site,
64 herbaceous competition was dominated by *Digitalis purpurea* L., *Taraxacum officinale* F.H. Wigg and
65 *Holcus lanatus* L. and common woody shrub was *Aristotelia chilensis* (Molina) Stuntz. At the HR12.9
66 site, herbaceous competition was dominated by *Lolium multiflorum* Lam., and common woody shrub
67 was *Rubus constrictus* P. J. Müll. & Lefevre.

68 The LR2.9 site came from a second rotation with a prescribed burn to treat harvest slash in March
69 2004, followed by soil preparation with 80 cm deep subsoiling and bedding (20 cm bed height), in
70 April of the same year. The site was planted in July 2004. The MR6.5 site was second rotation and
71 harvest slash was shredded in June 2004 and the site was planted in July 2004. The HR2.2 site was
72 second rotation and harvest slash was mechanically arranged in strips (windrows) in April 2003. The
73 site was planted in August 2003. The HR12.9 site was a first rotation plantation on a former pasture
74 land and was planted in September 2004. All sites were planted with a mix of the top 5 % half-sib
75 families produced from cuttings and ranked by genetic performance.



76

77

78 **Figure 1.** Location of the four sites used in this study in Chile

79

80 *2.2. Experimental design and treatments*

81

82 At each site, a randomized complete block design with five replicates (blocks) was used to test
 83 the effect of competing vegetation control intensity. Intensity treatments included five different areas
 84 of control around individual trees: 0 (I_0), 5 (I_5), 20 (I_{20}), 44 (I_{44}) and 100% (I_{100}) weed-free cover. At each
 85 experimental plot 90 cuttings were planted (9 rows \times 10 plants), with an internal measurement plot
 86 of 30 cuttings (5 rows \times 6 plants) and a buffer of two tree rows implemented around each
 87 measurement plot. The plots were laid out contiguously, where possible, before planting. All the sites
 88 were planted at a spacing of 2.4 \times 2.4 m (1736 trees ha^{-1}), except for site LR2.9, where planting was
 89 spaced at 3.0 \times 2.0 m (1666 trees ha^{-1}), because it was subsoiled before planting. To quantify the
 90 amount of competing vegetation biomass at each site, an additional plot (90 plants in total) with no
 91 competing vegetation control was established within each block.

92 At each site, an herbicide application was made prior to planting (glyphosate 2.5 $kg\ ha^{-1}$ +
 93 simazine 3.0 $kg\ ha^{-1}$ + Silwet surfactant 1ml L^{-1}) using backpack sprayers. Herbicides were applied in
 94 the early morning hours when wind speeds were less than 2 $km\ h^{-1}$ using a volume rate of 120 litres
 95 ha^{-1} . Commercial products were Roundup max (48% glyphosate), Simazina 90 WG (90% simazine)
 96 and Silwet (surfactant to improve herbicide uptake). After planting, a second herbicide application

97 was made at each site between February and March of the following year using the same chemicals,
 98 rates, and backpack spray equipment as in the first application prior to planting. A third herbicide
 99 application was made between September and October of the following year using the same
 100 chemicals, rates, and application method as in the previous application at all sites except at HR2.2
 101 due to the low level of observed competing vegetation. The planted *E. globulus* cuttings were
 102 sheltered from the spray.

103 At site LR2.9 and MR6.5 all trees received fertilizer 30 days after planting, and received 32.4, 36.2
 104 and 3.0 g plant⁻¹ of elemental nitrogen, phosphorus, and boron, respectively, using a blend of 180 g
 105 tree⁻¹ of diammonium phosphate and 30 g tree⁻¹ of boronatrocalcite (commercial fertilizers).

106

107 **Table 1.** Average annual rainfall (Rain), mean annual maximum temperature (Tmax), mean
 108 annual minimum temperature (Tmin), clay content (Clay) and organic matter (OM), in the
 109 first 20 cm of soil depth for each site.

110

Sites characteristics	Sites			
	LR2.9	MR6.5	HR2.2	HR12.9
Latitude/Longitude	72°3'/36°42'	73° 29'/37°40'	72°52'/39°13'	72°56'/39°28'
Altitude (m)	82	112	335	73
Rain (mm y ⁻¹)	1198	1454	2055	2103
Tmax (°C)	19.8	17.4	16.7	17.1
Tmin (°C)	6.3	7.5	6.0	6.7
Clay (%)	43.0	40.1	18.3	33.2
OM (%)	5.0	9.2	16.5	13.0
Soil order	Ultisol	Alfisol	Ultisol	Andisol

111

112

113 2.3. Competing vegetation biomass measurements

114

115 During the first growing seasons, all the competing vegetation was monthly removed from two
 116 subplots within the additional biomass plot installed at each block. The detailed explanation of how
 117 samples of competing vegetation were taken from each subplot to determine their dry mass was
 118 reported by Vargas et al. (2018) [18].

119

120

121

122 2.4. Growth measurements

123

124 From age 1 to 9 years total tree height (H, m) and stem diameter over bark at 1.3 m height (DBH,
 125 cm) were measured in each plot during dormant season (May-Jun). Individual stem volume was
 126 estimated using the Kozak's taper function, implemented in EUCASIM simulator version 4.4.1 [26],
 127 considering a top diameter limit (TDL) of 6 cm for each tree.

128

129 2.5. Data Analyses

130

131 The effect of the competing vegetation control treatments was evaluated at age 9 years
 132 considering stand yield losses defined as the percentage response in volume relative to the non-
 133 treated control (I_0).

134

135 2.6. Modelling approach

136

137 We used a non-linear model fitting approach to analyze stand yield losses as a function of site
 138 variables (mean annual rainfall, mean annual maximum temperature, mean annual minimum
 139 temperature) and competition variables (intensity of competing vegetation control and amount of
 140 competing vegetation biomass during the first and second growing seasons). Equations used to
 141 represent stand yield losses are hyperbolic family curves [27,28]. We used Akaike's information
 142 criteria (AIC) to evaluate goodness-of-fit for nonlinear regression models. AIC is an estimator of the
 143 relative quality of the statistical models for a given dataset. This estimator was calculated and ranked
 144 accordingly by minimum AIC. Table 2 presents a list of functions used to model stand yield loss.

145

146 **Table 2.** Equations used for stand yield loss modeling to different treatments of intensity of
 147 competing vegetation control of planted *E. globulus*.

148

Models	References
$Y_{ij} = a + (b - a) \text{Exp}[-\text{Exp}(c)X_j] + \epsilon_{ij}$	Pinheiro and Bates 2000 [29]
$Y_{ijk} = a * \text{Exp}[-\text{Exp}(b)X_j] + c * \text{Exp}[-\text{Exp}(d)Z_k] + \epsilon_{ijk}$	Pinheiro and Bates 2000 [29]
$Y_{ij} = \text{Exp}(-a * X_j) + \epsilon_{ij}$	Ratkowsky 1990 [30]
$Y_{ij} = a / ((b * X) + \text{Exp}(c * X_j)) + \epsilon_{ij}$	Ratkowsky 1990 [30]

149

150 After testing several models, a negative hyperbolic model was selected with the form:

151

$$152 \quad Y_{ij} = a + (b - a) \text{Exp}[-\text{Exp}(c)X_j] + \varepsilon_{ij} \quad (1)$$

153

154 where Y_{ij} is the percentage response in volume relative to the non-treated control at age 9

155 years and X_j is intensity of competing vegetation control (ranging from 0 to 100%) during

156 the first and second growing seasons for the i^{th} site and j^{th} treatment. Exp is base of natural

157 logarithm; ε_{ij} is the error of the model with $\varepsilon \sim N(0, \sigma^2)$; i is to denote 1-5 treatments; j is to

158 denote 1-4 sites; a , b and c are curve fit parameters. Parameter a is the asymptote as $X_j \rightarrow \infty$,

159 b represents the stand yield loss when no competing vegetation control, and c is the logarithm

160 of the rate constant. We used the logarithm to enforce positivity of the rate constant so the

161 model does approach an asymptote.

162

163

164

165 *2.7. Estimating the parameter b*

166

167 The parameter b of model (1) represents the value of Y_{ij} when X_j is equal to zero, so this
 168 parameter may be related with site and competition variables. Thus, the parameter b of the model (1)
 169 was reparametrized through a linear model to account for the influence of the amount of competing
 170 vegetation biomass and mean annual rainfall on stand yield loss.

171

$$172 \quad Y_{ijk} = a + ((b_1 + b_2 V_{ijk} + b_3 R_i + b_4 V_{ijk} \times R_i) - a) \text{Exp}[-\text{Exp}(c) X_j] + \varepsilon_{ijk} \quad (2)$$

173

174 where, Y_{ijk} is stand yield loss (%), V_{ijk} is maximum production of competing vegetation
175 biomass (Mg ha^{-1}) during the first growing season of the k^{th} block at the ij^{th} site-treatment
176 combination, R_i is average annual rainfall at the i^{th} site and X_j is intensity of competing
177 vegetation control of the j^{th} treatment. ε_{ijk} is the error of the model with $\varepsilon \sim N(0, \sigma^2)$; $i = 1-5$
178 treatments, $j = 1-4$ sites, $k = 1-5$ blocks; a , b_1 , b_2 , b_3 , b_4 and c are curve fit parameters.
179 Normality (Kolmogorov–Smirnov’s test) and homogeneity test of variance (Levene’s test)
180 were checked. All statistical analyses were evaluated using a $P < 0.05$ as a significance level.

181

182 2.8. Model validation

183

184 In this study, the yield loss model was fitted to the entire data set. The predictive ability of the
185 final fitted model was assessed by using leave one out (LOO) cross validation technique [31]. This
186 method is an iterative process that is initiated using as training data set with all available observations
187 (plots) except one, which each time is leaving out a different observation to be used as a test. If a
188 single observation is used to calculate the error test, it varies greatly depending on which observation
189 has been selected. To avoid this, the process is repeated as many times as available observations,
190 excluding in each iteration a different observation, adjusting the model with the rest and calculating
191 the error with that observation. Finally, the error rate test estimated by the LOO is the average of all
192 the i errors calculated [32]. Two measures of accuracy were used to evaluate the goodness-of-fit
193 between the observed and predicted values for stand yield loss: (i) root mean square error (RMSE);
194 and (ii) coefficient of determination (R^2). For the variable stand yield loss, we used F-tests to
195 determine if the relationship between predicted and observed values had a slope and intercept
196 different than one and zero, respectively. All statistical analyses were performed using the statistical
197 software program R-Project (version 3.3).

198

199 3. Results

200

201 3.1. Stand volume yield at age 9 years

202

203 Sites under study showed high variability in stem volume yield (Table 3). At age 9, stem volume
204 yield for I_{100} treatment ranged from $127 \text{ m}^3 \text{ ha}^{-1}$ at the site with the lowest annual rainfall (LR2.9, 1198

205 mm), to 288 m³ ha⁻¹ at the site with the highest annual rainfall (HR12.9, 2103 mm). For the I₀ treatment,
 206 stem volume yield at age 9 ranged from 26.8 m³ ha⁻¹ at the site with the highest amount of competing
 207 vegetation (HR12.9), to 164.9 m³ ha⁻¹ at the site with the lowest amount of competing vegetation
 208 (HR2.2).

209

210 **Table 3.** Average stand volume (VOL, m³ ha⁻¹) and survival (SUR, %) at age 9 for *E.*

211 *globulus* stands that received different treatments of vegetation control intensity. The sites

212 were classified based on their annual mean rainfall (high: HR, medium: MR or low: LR

213 rainfall) and the amount of accumulated competing vegetation biomass (Mg ha⁻¹) in the

214 control treatment during the first growing season.

215

Treatments	LR2.9		MR6.5		HR2.2		HR12.9	
	VOL	SUR	VOL	SUR	VOL	SUR	VOL	SUR
I ₀	9.5	41	159.0	58	164.9	97	26.8	31
I ₅	25.4	62	222.0	65	184.6	94	101.5	72
I ₂₀	61.9	83	276.6	73	195.3	99	155.4	89
I ₄₄	71.3	78	324.5	92	222.9	99	233.6	93
I ₁₀₀	127.2	97	343.4	73	251.9	92	288.9	86

216

217

218 3.2. Modelling the effects of weed competition on volume yield

219

220 After applying the step-wise procedure a negative hyperbolic curve with downward concavity
 221 was a good descriptor for the relationship between stand yield loss of *E. globulus* and area free of
 222 competing vegetation at establishment ($R^2 = 0.59$; $P < 0.001$). The b parameter of model (1), that
 223 represents stand yield loss with no competing vegetation control was reparametrized to account for
 224 the influence of mean annual rainfall and the amount of competing vegetation on stand yield loss.
 225 Model (2), was used to model yield losses of *E. globulus* and area free of competing vegetation,
 226 amount of competing biomass controlled during the first growing season and mean annual rainfall
 227 also showed a strong relationship ($R^2: 0.79$; $P < 0.001$). A summary of parameter estimates for model
 228 (2) is shown in table 4.

229

230

231 **Table 4.** Parameters estimated for the model (2)

232

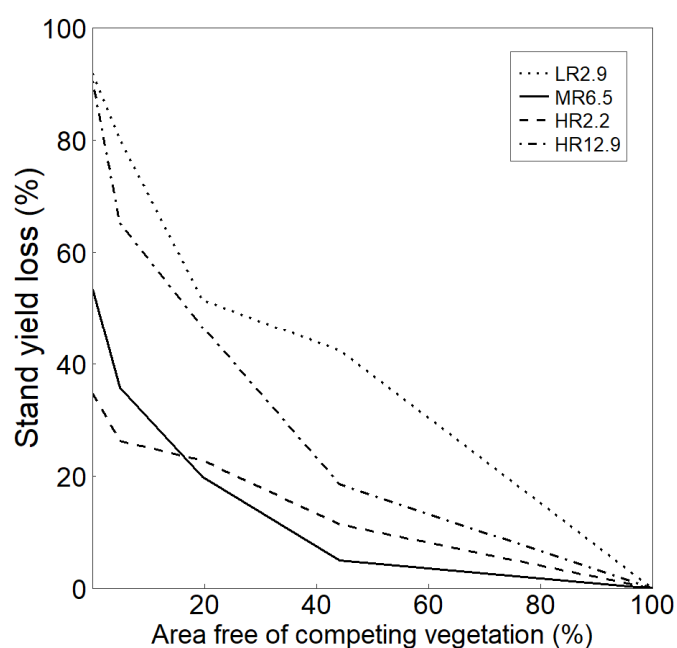
Parameters	Estimate	Error	<i>P</i>
a	-2.4479	4.4838	0.586
b ₁	194.3529	19.6128	< 0.001
b ₂	-19.0421	3.7018	< 0.001
b ₃	-0.0820	0.0106	< 0.001
b ₄	0.0113	0.0018	< 0.001
c	-3.5971	0.1821	< 0.001

233

234 When area free of competing vegetation, amount of competing biomass controlled during the
 235 first growing season and mean annual rainfall were combined, the model explained 79 % of the
 236 variation in stand yield loss (2). The reparametrized model showed a significant improvement over
 237 the univariate model. Mean annual maximum temperature and mean annual minimum temperature
 238 did not improve the reparametrized model.

239 Increases in area free of competing vegetation increased survival at all the sites (Table 3), except
 240 for the site with the lowest amount of competing vegetation biomass (HR2.2). All sites showed a
 241 general trend of stand yield loss as area free of competing vegetation decreased. However, sites under
 242 study showed high variability in plantation yield lost among sites (Figure 2).

243



244

245

246 **Figure 2.** Proportion of stand yield loss under different vegetation control intensity across a

247 rainfall and the amount of competing vegetation biomass gradient. The sites were classified

248 based on their annual mean rainfall (high: HR, medium: MR or low: LR rainfall) and the

249 amount of accumulated competing vegetation biomass (Mg ha^{-1}) in the control treatment

250 during the first growing season.

251 Comparing all sites, maximum stand yield loss occurred when area free of competing vegetation
252 was equal to zero. In average, at age 9 years, stand yield loss ranged from 35 to 91% when no
253 competing vegetation control was applied at establishment. Interestingly, maximum stand yield loss
254 was observed at sites with the highest and lowest mean annual rainfall (LR2.9 and HR12.9).

255

256 3.3. Model validation

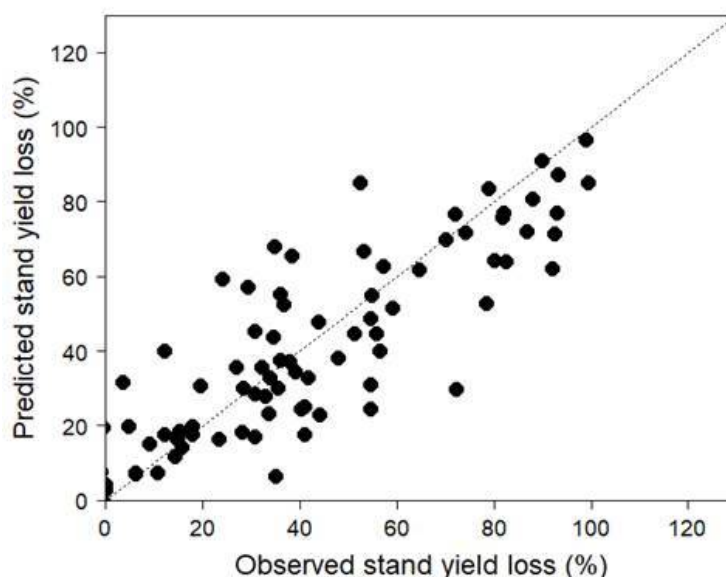
257

258 There was agreement between observed and predicted values, with no clear tendencies to over-
259 estimate for the variable tested. However, there was a tendency to under-estimate when the stand
260 yield loss was higher 70 %. Across all sites, both the slope and the intercept of the relationship
261 between predicted and observed values were not statistically different from one (Estimated value:
262 0.77; $P < 0.001$) and zero (Estimated value: 7.63; $P < 0.001$), respectively (Figure 3). There was a strong
263 correlation between observed and predicted values ($P < 0.001$; $R^2 = 0.76$).

264

265

266 **Figure 3.** Model validation for four tested sites (100 plots total). Observed versus predicted



267 values of proportion of stand yield loss. The dotted line corresponds to the 1-to-1 relationship.

268

269 **4. Discussion**

270 We accepted our first hypothesis because the relationship between stand yield loss and intensity
271 of competing vegetation control was not linear. There is an optimal intensity of competing vegetation
272 control beyond which stand volume yield loss is small (Figure 2). We reject our second hypothesis
273 because sites with high water availability (HR2.2 and HR12.9) do not require necessarily smaller area
274 free of competition at establishment than sites with low water availability (LR2.9) to reach the
275 maximum potential growth at age 9 years in *E. globulus* plantations.

276 The model described in this paper, was developed at sites with contrasting environmental
277 conditions, successfully account for stand yield losses attributable to weed competition. This study
278 represents, to our knowledge, the first reported model to predict the effect of weed competition on
279 long-term volume yield of *E. globulus*. The sites under study showed high variability in productivity
280 with volume yields for treatment I₁₀₀ ranging from 127 m³ ha⁻¹ at the site with the lowest annual
281 rainfall (LR2.9, 1198 mm), to 288 m³ ha⁻¹ at the site with the highest annual rainfall (HR12.9, 2103
282 mm). It was observed a general trend of decreasing stand yield loss as the area free of competition
283 vegetation increased across sites. Similar responses have been reported in other studies that included
284 different levels of intensity of competing vegetation control in *E. globulus* [16,17] and *Pseudotsuga*
285 *menziesii* [10]. In addition, a strong relationship was found between stand yield loss and area free of
286 competing vegetation, amount of competing biomass during the first growing season and mean
287 annual rainfall (Model 2, R²=0.79). This response was consistent with the results reported by Little
288 and Schumann (1996) [33], where stand yield loss related to competing vegetation was correlated to
289 the amount of vegetation biomass present in *E. globulus* plantations. Similar results of stand yield loss
290 as the intensity of competing vegetation control increased were observed in *P. radiata* by Mason and
291 Kirongo (1999) [34]. The approach of stand yield loss, is particularly advantageous because it allows
292 to observe as even slight variations in area free of competition vegetation that might result in
293 substantial changes in stand yield loss. The above approach was observed in the treatment I₅ that
294 covers only 5% of the total treated area, where there was a significant decrease in the stand yield loss
295 compared to the treatment without control at sites with a high amount of competing vegetation
296 biomass (MR6.5 and HR12.9). Similar results have been reported by Wagner (2000) [35], who
297 confirmed that even a low intensity of competing vegetation control might greatly reduce limitations
298 for cutting survival and growth.

299 In our study, the slope of the yield loss model curve increased considerably when area free of
300 competing vegetation was less than 20 %, suggesting that *Eucalyptus* has a low tolerance to
301 interference by competing vegetation during the establishment phase [17,36]. Changes in the slope of
302 the relationship between stand yield loss and area free of competing vegetation were related to
303 differences in the availability and the efficient use of site resources by the competing vegetation. Our
304 results suggest that the effect of competing vegetation control may be associated with an increment
305 in soil water availability for early development of the stand at all sites [37,38,39]. Although seasonal
306 water deficits become less intense as rainfall increases, trees growing in moderate to high rainfall
307 areas are still subject to some degree of water limitation, particularly if rainfall is irregular and soil
308 water storage is low [40]. In addition, decreases in light availability may be critical at sites where
309 competing vegetation had a large shadowing effect on *E. globulus* cuttings at stand establishment
310 phase. Finally, decreased soil nitrogen availability may be of importance at the site with an
311 abundance of graminoids [41]. Fine roots of herbaceous plants are concentrated in surface soil where
312 nitrogen availability is high and root densities of competing vegetation are typically higher than those
313 of trees [6,8].

314 To validate the model, we used data from a long-term experiment using plots with contrasting
315 productivity. The slope of the relationship between observed and predicted stand yield loss was near
316 one (Estimated value: 0.77; P < 0.001), supporting the strength of the model and its utility for assessing
317 the effects of weed competition on long-term volume yield of *E. globulus* across an environmental
318 gradient. Even though the fitted model performed well for the dataset used for validation, the

319 predictions of the model outside the geographical range of the fitting data is uncertain. We
320 recommend using this model only within the range of data used for fitness (see Table 1).

321 On sites with contrasting annual rainfall (LR2.9, 1198 mm, and HR12.9, 2103 mm), the high stand
322 yield loss observed on non-treated control plots at age 9 years (93% and 91%, respectively), may have
323 different explanations. The northern site (LR2.9) had the lowest annual rainfall and higher vapor
324 pressure deficit of all the sites being studied, suggesting lower soil water availability and higher
325 evaporative demand during the growing season increasing severely stand yield loss. Similar findings
326 were reported by Richardson et al. (1993) [44] where studies on dryland sites have also suggested
327 that growth reductions induced by competing vegetation are primarily mediated through
328 competition for water. It is likely that seasonal water deficits will be exacerbated by competing
329 vegetation, which can significantly contribute to evaporative losses. On the other hand, at the
330 southern site (HR12.9), which had the highest annual rainfall, the lowest vapor pressure deficit and
331 the highest competing vegetation biomass production across all sites, a high competition for light
332 may have increased the *E. globulus* cuttings yield loss. These results were consistent with the findings
333 reported by Balandier et al. (2006) [7] and Garau et al. (2009) [17], where *E. globulus* yield loss
334 decreases due to competing vegetation control have been related to increases in available soil water
335 and light. The contrasting stand yield loss levels observed on non-treated control plots (35% at HR2.2
336 and 91% at HR12.9) between the two southern sites that had higher rainfall (HR2.2, 2055 mm; HR12.9,
337 2103 mm), suggest that the high amount of competing vegetation biomass reduced light availability
338 and induced to carbon starvation during early establishment at the HR12.9 site. Similar results for *E.*
339 *globulus* were reported by Garau et al. (2009) [17], where competing vegetation biomass accounted
340 for 98% of the variation in stand volume. Comparable relationships have been reported for other
341 species in different environments [28,36,42,43].

342

343 5. Conclusions

344

345 A strong relationship was established between stand yield loss and the intensity of competing
346 vegetation control, the amount of competing vegetation biomass produced during the first growing
347 season and mean annual rainfall. The relationship between stand yield loss and intensity of
348 competing vegetation control was not linear. Accordingly, there is an optimal intensity of competing
349 vegetation control beyond which stand volume yield loss is small.

350 The site with the lowest mean annual rainfall showed the highest volume yield loss at age 9
351 years. Sites with highest mean annual rainfall showed contrasting results of volume yield loss related
352 to the amount of competing vegetation biomass.

353 Developing appropriate experimental approaches to interpret the effects of competing
354 vegetation types, plantation trees and site resource availability is an important challenge to
355 understand long-term responses on a site-specific basis. Understanding these interactions involves
356 research about how weeds affect resource availability, and how the trees respond to this change in
357 resource availability. One of the most important contributions of the model developed in this study,
358 is to be able to predict the effect of weed competition on long-term volume yield of *E. globulus* across
359 an environmental gradient.

360

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362 conducted the statistical analysis, contributed to the writing of the paper and data
363 interpretation. M.S. contributed to the writing of the paper.

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370 **References**

- 371 1. FAO. *Global Forest Resources Assessment 2010*; FAO Technical Paper: Food and
372 Agriculture Organization of the United Nations, Rome, Italy, 2013.
- 373 2. Booth, T.H. Eucalypt plantations and climate change. *For. Ecol. Manag.* **2013**, *301*, 28–
374 34.
- 375 3. INFOR. *Anuario Forestal 2017 Boletín Estadístico N° 159*; Instituto Forestal, Santiago,
376 Chile, 2017.
- 377 4. Albaugh, T.; Allen L.; Dougherty, P.; Johnsen, K. Long term growth responses of
378 loblolly pine to optimal nutrient and water resource availability. *For. Ecol. Manag.* **2004**,
379 *192*, 3–19.
- 380 5. Powers, R.; Reynolds, P. Ten-year responses of ponderosa pine plantations to repeated
381 vegetation and nutrient control along an environmental gradient. *Can. J. For. Res.* **1999**,
382 *29*, 1027-1038.

- 383 6. Nambiar, E.K.S.; Sands, R. Competition for water and nutrients in forests. *Can. J. For.*
384 *Res.* **1993**, *23*, 1955-1968.
- 385 7. Balandier, P.; Collet, C.; Miller, J.; Reynolds, P.; Zedaker, S. Designing forest vegetation
386 management strategies based on the mechanisms and dynamics of plantation tree
387 competition by neighboring vegetation. *Forestry* **2006**, *79*, 3-27.
- 388 8. Eyles, A.; Worledge, D.; Sands, P.; Ottenschlaeger, M.L.; Paterson, S.C.; Mendham, D.;
389 O'Grady, A.P. Ecophysiological responses of a young blue gum (*Eucalyptus globulus*)
390 plantation to weed control. *Tree Physiol* **2012**, *32*, 1008–1020.
- 391 9. Adams, P.; Beadle C.; Mendham N.; Smethurst, P. The impact of timing and duration of
392 grass control on the growth of a young *Eucalyptus globulus* Labill plantation. *New For.*
393 **2003**, *26*, 147-165.
- 394 10. Rose, R.; Rosner, L.; Scott, J. Twelfth-year response of Douglas-fir to area of weed
395 control and herbaceous versus woody weed control treatments. *Can. J. For. Res.* **2006**,
396 *36*, 2464–2473.
- 397 11. Wagner, R.; Little, K.; Richardson, B.; McNabb, K. The role of vegetation management
398 for enhancing productivity of the world's forests. *Forestry* **2006**, *79*, 57–79.
- 399 12. Little, K.; Rolando, C.; Morris, C. An integrated analysis of 33 Eucalyptus trials linking
400 the onset of competition-induced tree growth suppression with management,
401 physiographic and climatic factors. *Ann. For. Sci.* **2007**, *64*, 585–591.
- 402 13. Dougherty, P.; Lowery, R. Spot-size of herbaceous control impacts loblolly pine
403 seedling survival and growth. *South. J. Appl. For.* **1991**, *15*, 193-199.

- 404 14. Richardson, B.; Davenhill, N.; Coker, G.; Ray, J.; Vanner, A.; Kimberly, M. Optimizing
405 spot weed control: first approximation of the most cost-effective spot size. *N.Z. J. For.*
406 *Sci.* **1996**, *26*, 265–275.
- 407 15. Kogan, M.; Figueroa, R.; Gilabert, H. Weed control intensity effects on young radiata
408 pine growth. *Plantation Protection* **2002**, *21*, 253-257.
- 409 16. Little, K.; Rolando, C. Regional vegetation management standards for commercial
410 *Eucalyptus* plantations in South Africa. *Southern Forests* **2008**, *70*, 87–97.
- 411 17. Garau, A.; Ghera, C.; Lemcoff, J.; Barañao, J. Weeds in *Eucalyptus globulus* subsp.
412 maidenii (F. Muell) establishment: effects of competition on sapling growth and
413 survivorship. *New For.* **2009**, *37*, 251–264.
- 414 18. Vargas, F.; Rubilar, R.; Gonzalez-Benecke, C.; Sanchez-Olate, M.; Aracena, P. Long-
415 term response to area of competition control in *Eucalyptus globulus* plantations. *New*
416 *For.* **2018**, *49*, 383-398.
- 417 19. Henkel-Johnson, D.; Macdonald, S.; Bork, E.; Thomas, B. Influence of weed
418 composition, abundance, and spatial proximity on growth in young hybrid poplar
419 plantations. *For. Ecol. Manag.* **2016**, *362*, 55–68.
- 420 20. Renton, M.; Chauhan, B.S. Modelling plantation-weed competition: Why, what, how
421 and what lies ahead? *Plantation Protection* **2017**, *95*, 101-108.
- 422 21. Mason, E.G.; Whyte, A.G.D. Modelling initial survival and growth of *Pinus radiata* in
423 New Zealand. *Acta For. Fenn.* **1997**, *255*, 1–38.
- 424 22. Zhao, W. Growth and yield modelling of *Pinus radiata* in Canterbury, New Zealand.
425 Ph.D. thesis, University of Canterbury, Christchurch, New Zealand, 1999.

- 426 23. Mason, E.G. A model of the juvenile growth and survival of *Pinus radiata* D. Don
427 adding the effects of initial seedling diameter and plant handling. *New For.* **2001**, *22*,
428 133–158.
- 429 24. Westfall, J.; Burkhart, H.; Allen, H. Young stand growth modeling for intensively-
430 managed loblolly pine plantations in Southeastern U.S. *For. Sci.* **2004**, *50*, 823-835.
- 431 25. Knowe, S.A.; Radosevich, S.R.; Shula, R.G. Basal area and diameter distribution
432 prediction for young Douglas-fir plantations with hardwood competition: Coast Ranges.
433 *West. J. Appl. For.* **2005**, *20*, 73–93.
- 434 26. Real, P. *Reajuste de Funciones Implementadas en Simulador EUCASIM documento de*
435 *trabajo N° 12*; Proyecto modelo nacional de simulación, Concepción, Chile, 2010.
- 436 27. Cousens, R. An empirical model relating plantation yield to weed and plantation density
437 and a statistical comparison with other models. *The Journal of Agricultural Science*
438 **1985**, *105*, 513-521.
- 439 28. Wagner, R.; Petersen, T.; Ross, D.; Radosevich, S. Competition thresholds for the
440 survival and growth of ponderosa pine seedlings associated with woody and herbaceous
441 vegetation. *New For.* **1989**, *3*, 151–170.
- 442 29. Pinheiro, J.; Bates, D. *Mixed-effects models in S and S-Plus*, Third ed.; Springer-Verlag,
443 New York, USA, 2000; pp. 528; ISBN 0387989579.
- 444 30. Ratkowsky, D. *Handbook of nonlinear regression models*, First ed.; Marcel Dekker Inc:
445 New York, USA, 1990; pp. 241; ISBN 0824781899.

- 446 31. Neter, J.; Kutner, M.H.; Nachtsheim, C.J.; Wasserman, W. *Applied Linear Statistical*
447 *Models*, fourth ed.; McGraw-Hill/Irwin: New York, USA, 1996; pp. 770; ISBN
448 0256086010.
- 449 32. Hawkins, D.; Basak, S.; Mills, D. Assessing Model Fit by Cross-Validation. *J. Chem.*
450 *Inf. Comput. Sci.* **2003**, *43*, 579-586.
- 451 33. Little, K.; Schumann, A. A new systematic trial design for the optimization of
452 interspecific weed control. Proceedings of the eleventh Australian weeds conference,
453 Melbourne, Australia, 1996; Weed Science Society of Victoria Frankston.
- 454 34. Mason, E.G.; Kirongo, B.B. Responses of radiata pine clones to varying levels of pasture
455 competition in a semiarid environment. *Can. J. For. Res.* **1999**, *29*, 934-939.
- 456 35. Wagner, R.G. Competition and critical period thresholds for vegetation management
457 decisions in young conifer stands. *For. Chron.* **2000**, *76*, 961–968.
- 458 36. George B, Brennan P. Herbicides are more cost-effective than alternative weed control
459 methods for increasing early growth of *Eucalyptus dunnii* and *Eucalyptus saligna*. *New*
460 *For.* **2002**, *24*, 147–163.
- 461 37. Nambiar, S.; Zed, P. Influence of weeds on the water potential, nutrient content and
462 growth of young radiata pine. *Aust. For. Res.* **1980**, *10*, 279-288.
- 463 38. Little, K.; Van Staden, J. Interspecific competition affects early growth of a *Eucalyptus*
464 *grandis* × *E. camaldulensis* hybrid clone in Zululand. *S. Afr. J. Bot.* **2003**, *69*, 505–513.
- 465 39. Garau, A.; Lemcoff, J.; Ghera, C.; Beadle, C. Water stress tolerance in *Eucalyptus*
466 *globulus* Labill subsp. *maidenii* (F. Muell.) saplings induced by water restrictions
467 imposed by weeds. *For. Ecol. Manag.* **2008**, *255*, 2811–2819.

- 468 40. Watt, M. Modelling the influence of weed competition on growth of juvenile *Pinus*
469 *radiata* at a dryland site. Ph.D. Thesis, University of Canterbury, Christchurch, New
470 Zealand, 2003.
- 471 41. Smethurst, P.; Nambiar, S. Role of weeds in the management of nitrogen in a young
472 *Pinus radiata* plantation. *New For.* **1989**, *3*, 203–224.
- 473 42. Coll, L.; Balandier, P.; Picon-Cochard, C. Morphological and physiological responses
474 of beech (*Fagus sylvatica*) seedlings to grass-induced belowground competition. *Tree*
475 *Physiol.* **2004**, *24*, 45-54.
- 476 43. Harper, G.; Comeau, P.; Biring, B. A comparison of herbicide and mulch mat treatments
477 for reducing grass, herb, and shrub competition in the BC Interior Douglas-Fir zone-Ten
478 years results. *West J. Appl. For.* **2005**, *20*, 167–176.
- 479 44. Richardson, B. Vegetation management practices in plantation forests of Australia and
480 New Zealand. *Can. J. For. Res.* **1993**, *23*, 1989-2005.
481