

**Canadian Journal of Forest Research** Revue canadienne de recherche forestière

# Fuel-related fire behaviour relationships for mixed live and dead fuels burned in the laboratory

Journal:	Canadian Journal of Forest Research
Manuscript ID	cjfr-2016-0457.R2
Manuscript Type:	Article
Date Submitted by the Author:	06-Apr-2017
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Keyword:	fuel moisture content, spread rate, flame geometry, fuel consumption, wind-driven spread
Please Select from this Special Issues list if applicable:	N/A



# Fuel-related fire behaviour relationships for mixed live and dead fuels burned in the laboratory Carlos G. Rossa, and Paulo M. Fernandes Carlos G. Rossa, and Paulo M. Fernandes C.G. Rossa, and P.M. Fernandes. Centre for the Research and Technology of Agro-Environmental and Biological Sciences (CITAB), University of Trás-os-Montes e Alto Douro (UTAD), Apartado 1013, 5001-801 Vila Real,

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10	Abstract: A laboratory experimental program addressing fire spread in fuel beds composed of
11	dead foliage litter and vertically placed quasi-live branches, representative of many natural fuel
12	complexes, was carried out for either still air or wind conditions. Fuel bed characteristics, fire
13	spread rate, flame geometry and fuel consumption were assessed and empirical models for
14	estimating several parameters were developed. Weighted fuel moisture content (18–163%)
15	provided good estimates of fire behaviour characteristics and accounted for most of the variation
16	in still air and wind-driven spread rate $(0.1-1.3 \text{ m min}^{-1})$ . When predicting still-air fire spread rate,
17	fuel height was the most relevant fuel bed structural parameter and fuel type had significant
18	influence, whereas for wind-driven spread the effect of foliar fuel bed density was dominant and
19	fuel type became irrelevant. Flame length (0.4–2.2 m) increased from still air to wind-assisted (8
20	km h <sup>-1</sup> ) fire spread but its height remained constant. The fraction of total fuel load and mean
21	woody diameter consumed by fire were reasonably predicted from weighted fuel moisture content
22	alone, but predictions for the latter variable improved substantially by adding foliar fuel load.
23	

24 Key words: fuel moisture content, spread rate, flame geometry, fuel consumption.

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# 25 Introduction

26 A century has passed after the first attempts at predicting forest fire behaviour. The models that 27 have been developed since followed a wide variety of approaches, whose nature varied from 28 purely empirical to a virtually complete physical description of the mechanisms of fire spread (Pastor 2003; Sullivan 2009). Spread rate  $(R_p)$  is the parameter most frequently sought to be 29 30 estimated, for which fuel moisture content (M) has been recognized as a critical factor very early 31 on (Show 1919). 32 The effect of dead fuel moisture content  $(M_d)$  on  $R_p$  is well established, but the same does not 33 apply to live fuel moisture content  $(M_1)$ . In fact, evidence from field fires hints at no influence of  $M_1$  on  $R_p$  (Alexander and Cruz 2013) or indicates a relatively weak and not entirely 34 35 consubstantiated effect (Anderson et al. 2015). This contrasts with theoretical formulations (e.g., Rothermel 1972; Van Wagner 1989) and results from laboratory experiments (Plucinski et al. 36 2010; Marino et al. 2012; Weise et al. 2016). Recently, laboratory fire-spread experiments in 37 38 guasi-live fuel beds, i.e., comprised of live plants when collected and whose  $M_1$  (13–180%) varied 39 as a function of storage time, showed a significant  $M_1$  effect on  $R_p$ , albeit low (Rossa et al. 2016).

40 However, the individual roles of  $M_d$  and  $M_l$  for fires spreading in mixtures of dead and live fuels

41 remain to be quantified. Fire-spread moisture damping is expected to differ between dead and live

42 fuel because differences in other fuel properties influence heat transfer and affect the ease with

43 which moisture can be evaporated (Wilson 1990; Catchpole and Catchpole 1991).

Research needs on the influence of fuel bed properties on fire behaviour in mixtures of dead
and live fuels go beyond the effect of *M* alone and extend to fuel bed structure as described by its
load (*w*), height (*h*), and bulk density (*ρ*). Empirical field studies invariably report the difficulties
in identifying and separating the effects of individual fuel properties on fire behaviour (Vega et al.

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1998; Fernandes et al. 2000; Anderson et al. 2015). Obvious reasons for this are the natural
heterogeneity in fuel complex properties, difficult to describe and to account for, and the existence
of correlations between fuel descriptors, which complicates the detection and isolation of specific
effects. Live fuel complexes have vertical orientation and are often tall and characterized by heavy
fuel load, and for these reasons are difficult to be reproduced in the laboratory, having discouraged
researchers from doing so. Weise et al. (2016) carried out an extensive set of laboratory fire spread
experiments in shrub fuels, reported as 'high-density' and apparently not vertically oriented as in
the field. Nelson and Adkins (1986) performed laboratory experiments of wind-driven fire spread
in fuel beds of pine needles, over layered by vertical saw palmetto fronds, but fuel bed structure
was maintained constant hindering the analysis of its effect on $R_p$ . There is a great need for
improved knowledge on the mechanisms of fire spread in live vegetation (Finney et al. 2013),
because many fuel complexes are typically composed of live and dead fuels. Until those
mechanisms are clearly established the task of predicting fire behaviour in natural fuel beds is
greatly impaired.
We carried out a laboratory experimental burning program in mixed live and dead fuels, either
in still air or wind conditions. The purpose was to increase understanding of the separate role of
$M_{\rm d}$ and $M_{\rm l}$ on fire behaviour and to analyse the influence of relevant fuel structure descriptors such
as $h$ , $w$ , and $\rho$ . Spread rate, flame geometry and fuel consumption were measured and their
variation described through empirical models.

- 68 Methods
- 69 **Burn program**

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70 A total of 102 fire spread experiments in fuel beds composed of a litter layer (dead foliage) over 71 layered by vertically oriented quasi-live fuels, thus approaching the natural fuel structure, were 72 conducted in the University of Trás-os-Montes e Alto Douro (Vila Real. Portugal) between June 73 2015 and April 2016. All burn experiments were carried out on level ground, of which half under still air conditions and half at 8-km  $h^{-1}$  wind speed (U). Wind was measured in the absence of fire 74 just above the center of the fuel bed area, and resulted from a laminar flow induced by a 2.2 kW 75 76 ventilator (Soler & Palau Model CVTT-15/15). The experiments were time consuming, averaging 77 4–5 h per test, between fuel collection and preparation, building the fuel beds, and burning. 78

79 Fuel species, collection, and storage

The branches were obtained from two of the most abundant tree species in the Portuguese 80 81 forest, respectively Eucalyptus globulus Labill. (blue gum) and Pinus pinaster Ait. (maritime pine). We collected one species at a time from a single location by cutting down ~5-year-old P. 82 83 *pinaster* and ~10-year-old *E. globulus* trees, removing the branches from the trunk, and carrying 84 them to the laboratory, where they were cut at 0.4 m and allowed to dry under ambient conditions for a variable amount of time in order to get a wide range of moisture contents.  $M_1$  in this work 85 86 refers to quasi-live foliar moisture only and was measured independently from woody fuel 87 moisture content  $(M_{wd})$ . The former was periodically monitored using a fuel moisture analyzer 88 (Rossa et al. 2015) so that the experiments could be carried out over a well-distributed and wide 89 M<sub>1</sub> range. We used foliar litter from *P. pinaster*, *E. globulus*, and *Pinus resinosa* Ait. (red pine). 90 Litter  $M_d$  is dependent on ambient conditions only, thus control of storage time was not a concern.

91

92 Test rig, fuel bed preparation, and pre-burn sampling

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93	We used a 4-m long and 3.5-m wide combustion table uniformly covered with lightweight
94	expanded clay aggregate particles (LECA), allowing upright stem insertion. Fuel beds were 1-m
95	long and 1.2-m wide (Fig. 1). Three fuel complexes were used: <i>P. resinosa</i> litter with quasi-live <i>P</i> .
96	pinaster canopy (PR), P. pinaster litter with quasi-live P. pinaster canopy (PP), and E. globulus
97	litter with quasi-live <i>E. globulus</i> canopy (EG). The peculiar fuel combination used in the PR
98	experiments was an attempt to obtain fuel beds with a thin litter layer since P. resinosa litter is
99	more compact than <i>P. pinaster</i> litter. We carried out 24 PR tests but then proceeded with using <i>P</i> .
100	pinaster only as it was difficult to acquire the required quantity of P. resinosa needles.
101	Fig. 1 about here
102	We used five nominal levels of litter load, respectively 0.3, 0.5, 0.7, 0.9, and 1.1 kg m <sup>-2</sup> , mostly
103	regularly distributed among the fuel type - wind mode combinations (Table 1). Litter load
104	measurement on a wet basis was adopted to avoid computing the $M_d$ -corrected fuel weight. Actual
105	litter load ( $w_d$ ) was calculated on a dry basis after measuring $M_d$ . Branch load was not set to
106	specific levels. The first test of the day was usually used for determining a weight that would allow
107	a continuous canopy, and it was kept constant throughout the day. Nevertheless, the need for
108	managing the available branches, whose collection and preparation was the most time consuming
109	task, occasionally led to significant differences in the amount of fuel used in the experiments.
110	Because quasi-live fuel load $(w_l)$ considered just the foliar component, the foliar fraction of <i>P</i> .
111	pinaster and E. globulus branches was estimated as the mean of 20 observations per species; each
112	was obtained by randomly selecting a branch from the fuel pile, removing its foliage, and
113	weighing the foliar and woody components. Fuel beds were prepared by spreading the litter fuel
114	first, and vertically inserting the branches afterwards, attaining homogeneous horizontal
115	distribution and vertical continuity with the litter layer (see Fig. 1).

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116	Table 1 about here
117	Litter depth and distance from litter surface to the top of the fuel bed were measured ( $n = 5$ for
118	each), respectively before and after stem insertion. The sum of their means yielded $h$ . Prior to
119	ignition, air temperature $(T)$ and relative humidity $(RH)$ were measured with a pocket weather
120	station. We collected three fuel samples to determine $M_d$ (litter), $M_l$ (quasi-live foliage) and $M_{wd}$
121	(quasi-live woody fuel) by oven-drying at 105 °C during 24 h. Each sample comprised material
122	collected from various locations in the fuel bed and cut into small pieces for faster and thorough
123	drying. Using $M_d$ , $M_l$ , and the fractions of dead ( $f_d$ ) and quasi-live ( $f_l$ ) foliage, we computed the
124	weighted foliar fuel moisture content $(M_w)$ :
125	(1) $M_{\rm w} = f_{\rm d} \cdot M_{\rm d} + f_1 \cdot M_1$
126	where quantities $f_d$ and $f_l$ were calculated using eq. 2 with either $w_d$ or $w_l$ as the numerator, or using
127	eq. 3 when one of the fractions was known:
128	$(2)   f_{\rm d} = \frac{w_{\rm d}}{w_{\rm l} + w_{\rm d}}$
129	(3) $f_{\rm d} + f_{\rm l} = 1$
130	Eq. 2 denominator corresponds to w, which accounts for foliar fuels only. Thus, Eq. 1 is equal to
131	the ratio between the water mass contained in the fuel bed foliage (dead and quasi-live) and the
132	total foliar dry mass. We obtained $\rho$ by computing the ratio $w/h$ .
133	
134	Ignition, fire behaviour, and fuel consumption
135	The burn area was preceded by a 10-cm wide and approximately 2-cm deep strip of <i>P. pinaster</i>
136	litter for facilitating fire spread through the canopy from the beginning of the fuel bed. A line of

137 fire was rapidly established by lighting up a wool thread soaked in a 6:4 gasoline to diesel mixture.

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 $R_{\rm p}$  was determined by measuring the time the base of the flame took to travel the length between 138 139 two cotton strings placed above the litter, which broke almost immediately after flame contact. 140 The strings were placed 0.9 m apart, leaving 5 cm at both the beginning and the end of the fuel bed 141 to diminish border effects during measurement. 142 Flame geometry was assessed when fire reached the fuel-bed midway, by visually estimating 143 average flame height  $(H_f)$ , measured from the base of the fuel bed with the assistance of a tape 144 measure, and angle ( $\varphi$ ). We evaluated  $\varphi$  by visually dividing the 90° between the horizontal and 145 the unburned fuel in two 45° sections, and then each of them in three 15° intervals and 146 approximating the flame angle to the nearest value. Trigonometry was used to calculate flame 147 length ( $L_{\rm f}$ ). We computed the ratio  $h/H_{\rm f}$ , which for no-wind fires spreading on level ground is the 148 same as  $h/L_{\rm f}$  because  $L_{\rm f} \approx H_{\rm f}$ . Flames always develop above the fuel bed  $(H_{\rm f} > h)$  in well-sustained 149 fires, which means that  $h/H_f < 1$ .  $L_f$  cannot directly be inferred from  $h/H_f$  when fire spread is winddriven. Nonetheless, estimating  $H_{\rm f}$  from this non-dimensional ratio should provide some 150 151 independence from fuel bed structure, because w is the structural parameter with greater influence 152 on flame dimensions (Fernandes et al. 2009) and is highly correlated with h in natural fuel 153 complexes (Fernandes 2001). 154 Five measurements were taken of the mean terminal diameter of woody fuels  $(D_{wd})$  after fire 155 extinction. Branch remnants were weighed and assumed to be virtually moist free due to heat 156 exposure. We did not assess the remnants moisture content but they appeared extremely dry when

157 collected. Fuel load consumption was estimated as 90% of the difference between total initial fuel

dry weight and the remaining fuel, to account for ash (Burrows 2001). The fraction of fuel

159 consumed by fire  $(f_{cs})$  was determined as the ratio of fuel consumption to total initial load.

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160

# 161 Data analysis and modelling

162 Fuel bed parameters h, w, and  $\rho$  were considered for  $R_p$  modelling. We analyzed their 163 distributions by computing mean values and standard deviations, and checked for normality with 164 the Shapiro–Wilk test (P > 0.05) or, when significance was below the threshold value, for 165 approximate normality by visually inspecting their histograms. 166  $R_{\rm p}$  was modelled separately for the still air ( $R_0$ ) and wind-driven fire spread ( $R_{\rm U}$ ) datasets. We examined the M effect on  $R_p$  both as an exponential decay (e.g., Wilson 1990; Anderson et al. 167 168 2015) and a power law function (e.g., Burrows 1999; Cheney et al. 2012), and examined whether  $M_{\rm d}$ ,  $M_{\rm l}$  or  $M_{\rm w}$  provided the highest explanation (coefficient of determination,  $R^2$ ) of the observed 169 170 variability. Fuel structure metrics were then examined for their ability to improve the best-fitting 171 *M*-based equation. All functions were fitted in their log-transformed form by least-squares, as often is the case in empirical fire behaviour modelling (Marsden-Smedley and Catchpole 1995; 172 173 Cheney et al. 2012). The bias inherent to back-transformation was corrected according to 174 Snowdon (1991). Model selection for a given fire behaviour variable took into account its practical use and the  $R^2$  value. 175 176 The ratio  $h/H_{\rm f}$  and fuel consumption were modelled from the M metric that best explained  $R_{\rm p}$ . 177 We described  $h/H_{\rm f}$  and  $D_{\rm wd}$  using linear relationships and again tested which fuel structure 178 variables added to the *M*-based explanation. As  $f_{cs}$  varies in the 0–1 range it was modelled using a 179 generalized linear model (GLM), fitted through an iterative process by maximum likelihood 180 estimation with a logit link function. 181 The influence of fuel bed type was examined after accounting for the effects of M and fuel bed

182 structure. In joint analysis of still air and wind-driven trials the effect of wind mode was examined

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183	as a categorical variable. Residuals where checked for approximate normality by visually
184	inspecting their histograms, and independence from predicted values was evaluated by correlation
185	analysis. In models with more than one independent variable the existence of significant
186	correlations between them was also verified. Predictions were evaluated based on deviation
187	measures, respectively root mean square error (RMSE), mean absolute error (MAE), mean
188	absolute percentage error (MAPE), and mean bias error (MBE) (Willmott 1982).
189	
190	Results
191	Data ranges
192	The pre-burn duration of quasi-live fuel storage varied from one to 43 days. We aimed at
193	maintaining $M_1$ above 50%, the typical minimum value for Mediterranean shrubs (Viegas et al.
194	2001), but it was occasionally lower, ranging between 30 and 214% (Table 2). The drying rate of

195 woody fuels was similar to that of foliage because  $M_{wd}$  (33–215%) was always very similar to  $M_{l}$ .

196  $M_d$  varied narrowly (10–22%) as a result of moderate variation in ambient air conditions inside the

197 laboratory.  $M_{\rm w}$  varied nine fold as a result of variation in  $M_{\rm l}$  and  $M_{\rm d}$ . The mass of foliage in *P*.

198 *pinaster* and *E. globulus* branches was 74.8 and 74.2% of the total, respectively. Except for *h*,

199 substantial variation was obtained regarding fuel structure, with  $f_d$ , w, and  $\rho$  varying approximately

- 200 by factors of five, three, and three. Fuel variables were normally distributed according to the
- 201 Shapiro-Wilk test, except the  $R_0$ -dataset w distribution, which from visual inspection of its
- 202 histogram we concluded to be approximately normally distributed.
- 203

# Table 2 about here

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# 204 Fire behaviour and fuel consumption

Table 3 gives the  $R^2$  for the tested models and Table 4 displays the results for those selected for 205 206 further analysis, including the fitted coefficients (a, b, c) and evaluation metrics for each equation.  $R_{\rm p}$  was better related to  $M_{\rm l}$  than to  $M_{\rm d}$ , both under still air and wind conditions, probably because 207 of the much larger range of the former. However, it was  $M_w$  that accounted for more variability. A 208 power law described the effect of  $M_w$  on  $R_p$  better than an exponential function, with  $R^2$  increasing 209 210 ~20% to 0.753 and 0.821, respectively for still air and wind-driven spread.  $M_{\rm w}$  accounted for most of  $R_p$  variation but fuel bed parameters offered further improvement, with h and  $\rho$  producing the 211 greatest increase in  $R^2$ , respectively for  $R_0$  (up to 0.814) and  $R_U$  (up to 0.885) (eqs. 1 and 2 in Table 212 4). Fuel bed type exerted a significant (P < 0.0001) effect on  $R_0$  and increased the  $R^2$  by 17%, with 213 EG>PP>PR. For the sake of generalization, we decided not to include this variable in the model 214 (Fig. 2). The quality of fit was confirmed by MAPE of 18% and 13%, respectively for  $R_0$  and  $R_U$ . 215 Predicted  $R_0$  and  $R_U$  as a function of  $M_w$  are given in Fig. 3, respectively for h = 0.33 kg m<sup>-3</sup> and  $\rho$ 216  $= 4.4 \text{ kg m}^{-3}$ , the experimental means. For comparison purposes, Fig. 3 also displays a model of 217 218 the same form of eqs. 1 and 2 in Table 4, without the effects of fuel structure descriptors, and fitted 219 to Rossa et al. (2016) data for slope-driven spread ( $R_{\rm S}$ ) in guasi-live woody fuel beds; in these experiments slope angle was 20° and h was 0.50-0.55 m. 220 221 *Table 3 about here* 222 Fig. 2 about here 223 Fig. 3 about here

When predicting  $h/H_{\rm f}$  from  $M_{\rm w}$ , the addition of w as an independent variable produced a modest  $R^2$  increase (3.8%). The model retained  $M_{\rm w}$  only (eq. 3 in Table 4) for the sake of parsimony,

resulting in good fit (Fig. 4) with a MAPE of 11%.

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227

#### Fig. 4 about here

The GLM model for  $f_{cs}$  (eq. 4 in Table 4, Fig. 5) had a MAPE of 15% (n = 88). Residuals of the model differed by wind mode (P = 0.007), showing a slight tendency for higher  $f_{cs}$  in the presence of wind. Using  $M_w$  alone to predict  $D_{wd}$  explained 66.7% of the existing variability. Adding w to the equation increased  $R^2$  by 10%, which justified its inclusion as an independent variable (eq. 5 in Table 4). Predicted v. observed values are displayed in Fig. 6 and a MAPE of 12% indicates good performance.

234 Fig. 5 about here
235 Fig. 6 about here
236 Table 4 about here

# 237 Discussion

238  $M_{\rm w}$  was a good predictor of both  $R_0$  and  $R_{\rm U}$  in fuel beds that combined live and dead fuels in 239 distinct layers, accounting for most of the variation in the dependent variables. This suggests that, 240 at least for practical purposes, vegetation phenology is irrelevant to fire spread in the sense that the 241  $R_{\rm p}$  response to M does not differ between live and dead fuels. The power-function damping effect of  $M_{\rm w}$  was not affected by wind mode, being similar for  $R_0$  (b = -0.7) and  $R_{\rm U}$  (b = -0.6) (Fig. 3), 242 243 and resulting in a  $R_p$  response equal to that observed in fuel beds composed of a single vegetative 244 state, as in Rossa et al. (2016) (see Fig. 3). The weak damping effect at  $M_w$  above ~100% is 245 explained by the ratio between fuel heat content and the energy necessary for fuel ignition variation with M (Rossa 2017). Marino et al. (2012) also found  $M_w$  to be a good predictor of  $R_U$  in 246 247 laboratory-built shrub-litter fuel beds; their  $M_{\rm w}$  range precluded conclusions about the effect on  $R_{\rm p}$ 248 at  $M_{\rm w}$  >80%. It follows that fuel complexes increasingly dominated by live fuels will exhibit more 249 marked seasonal variation in fire behaviour if drought impacts  $M_{\rm w}$ , which is consistent with

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reports of  $M_1$  thresholds for increased fire activity (e.g., Dennison and Moritz 2009). The 'real world' performance of our  $M_w^{-0.63}$  damping effect for wind-assisted tests could be examined using experimental field data, for which the role of  $M_1$  on R remains uncertain (e.g., Anderson et al. 2015).

254 The contribution of fuel bed metrics to improve the prediction of  $R_p$  was modest, first of all because the M effect was the study main focus and fuel structure was much less variable than  $M_{\rm w}$ . 255 Also, most tests were carried out with h, w, and  $\rho$  close to their mean values. In the  $R_0$  dataset the 256 means and coefficients of variation were h = 0.33 m (8.8%), w = 1.5 kg m<sup>-2</sup> (16.5%), and  $\rho = 4.4$ 257 kg m<sup>-3</sup> (18.8%). In the  $R_{\rm U}$  dataset we obtained h = 0.35 m (7.4%), w = 1.5 kg m<sup>-2</sup> (20.3%), and  $\rho =$ 258 4.4 kg m<sup>-3</sup> (19.0%). In the wind-driven fire spread experiments the fuel bed parameter with the 259 highest leverage was  $\rho$ . A decrease of  $R_{\rm U}$  with  $\rho$  is well established, both in the laboratory and in 260 field studies. Our  $\rho^{-0.49}$  effect is stronger than in Marino et al. (2012) ( $\rho^{-0.21}$ ) and very similar to that 261 reported by Anderson et al. (2015) ( $\rho^{-0.48}$ ). 262

As  $\rho$  is given by w/h, a proper evaluation of the individual and interacting influences of w and hrequires measuring  $R_U$  at variable w for fixed h levels and vice versa, using a wide range in both wand h. Catchpole et al. (1998) have shown that  $R_U$  rises with decreased w (at constant h) and increased porosity. Then, it can be speculated that the  $\rho$  influence might be explained by a combination of two effects: (*i*) higher w enhances combustion intensity and flames are more difficult to tilt, diminishing heat transfer; and (*ii*) higher h increases porosity and favours heat transfer (Holdich 2002).

The  $h/H_{\rm f}$  equation revealed an interesting trait of flame geometry:  $H_{\rm f}$  remained fairly constant when fire spread was wind-assisted, although  $L_{\rm f}$  increased as expected. Further experimentation is needed for verifying if this relation holds for other wind speeds. If further studies confirm that  $h/H_{\rm f}$ 

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273 can be reasonably predicted based on  $M_w$  alone, its estimation can be operationally useful. Both h 274 and  $H_{\rm f}$  can be visually assessed in the field and used to obtain a gross estimate of  $M_{\rm w}$  in fuel 275 complexes composed of live and dead fuels. 276 The ability to predict  $f_{cs}$  is also useful in fire management but has been neglected in shrub-277 dominated fuel types (Fernandes and Loureiro 2013; Ottmar 2014). The purpose of many 278 prescribed fire operations is to reduce fuel load. Being able *a priori* to predict the degree of fuel 279 consumption is important for planning and evaluating hazard-reduction burns. Predicting  $f_{cs}$  from 280 fuel moisture alone is appealing, although the difficulty in estimating  $M_1$  is a relevant concern. 281 Using  $M_w$  as a single independent variable was less effective when predicting  $D_{wd}$ , and adding w to 282 the equation increased accuracy. The improvement makes sense, as burning a larger amount of 283 fine fuels increases fireline intensity which in turn allows consuming a larger amount of coarse

woody fuels, as found by several studies (e.g., Hollis et al. 2011).

285

# 286 Summary and conclusions

We carried out an experimental burning program in the laboratory in fuel beds composed of litter and vertically arranged quasi-live branches, representative of many natural fuel complexes, under either no-wind or wind conditions. We measured fuel bed characteristics, fire spread rate, flame geometry, and fuel consumption, and fitted empirical equations that describe the effects of the relevant independent variables.

 $M_{\rm w}$ -based models allowed effective prediction of fire behaviour characteristics and fuel consumption. We found no support for a differential role of live and dead fuel moisture content in fire spread.  $M_{\rm w}$  accounted for most of the observed variation in  $R_{\rm p}$  for both still air and winddriven spread, although in no-wind conditions *h* was the most relevant fuel structure variable,

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296 whereas the effect of  $\rho$  dominated wind-driven spread. H<sub>f</sub> remained constant during wind-assisted 297 fire spread although  $L_{\rm f}$  increased. Reasonable predictions of  $f_{\rm cs}$  and  $D_{\rm wd}$  were obtained by using  $M_{\rm w}$ 298 alone, but adding w as an independent variable substantially improved  $D_{wd}$  estimates. 299 Fire behaviour studies dedicated to fuel complexes with a relevant live fuel component are 300 scarce. This study results offer increased understanding of how fuel characteristics affect fire 301 behaviour in mixed live-dead fuels and are useful to inform subsequent experimental efforts in 302 relation to fire behaviour modelling and fire danger rating. As live and dead fuels in this study 303 formed contiguous layers, future efforts could examine whether fuel-related fire behaviour 304 relationships change with alternative fuel arrangements. 305 306 Acknowledgements 307 This work was supported by Fundação para a Ciência e a Tecnologia under post-doctoral grant SFRH/BPD/84770/2012 (financing programs POPH and FSE) to the first author, and financed by 308 309 FEDER – Fundo Europeu de Desenvolvimento Regional funds through the COMPETE 2020 – 310 Operacional Programme for Competitiveness and Internationalisation (POCI), and by Portuguese 311 funds through FCT – Fundação para a Ciência e a Tecnologia in the framework of project POCI-312 01-0145-FEDER-016727 (PTDC/AAG-MAA/2656/2014). Délio Sousa assisted with the logistics 313 of the experiments. Fernando Frazão, José A. Silva and Rafael Figueiredo assisted in fuel 314 collection. Two anonymous reviewers contributed with valuable comments. 315 316 References 317 Alexander, M.E., and Cruz M.G. 2013. Assessing the effect of foliar moisture content on the 318 spread rate of crown fires. Int. J. Wildland Fire 22: 415–427. doi:10.1071/WF12008

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- 402

# 403 List of symbols

- 404 *a*, *b*, c, fitted coefficients used in several equations
- 405  $D_{wd}$  (mm), mean post-fire terminal diameter of woody fuels
- 406  $f_{cs}$ , fraction of the total fuel load consumed by fire (including woody components)
- 407  $f_{\rm d}$ , fraction of dead fuels
- 408  $f_{\rm l}$ , fraction of live or quasi-live fuels
- 409 h (m), fuel bed height

- $H_{\rm f}$  (m), flame height (measured from the base of the fuel bed)
- $L_{\rm f}$  (m), flame length (measured from the base of the fuel bed)
- M(%), fuel moisture content (dry basis)
- $M_{\rm d}$  (%), dead foliage moisture content
- $M_1$  (%), live or quasi-live foliage moisture content
- $M_{\rm w}$  (%), weighted foliar fuel moisture content
- $M_{\rm wd}$  (%), woody fuel moisture content
- $R_{\rm p}$  (m min<sup>-1</sup>), fire spread rate
- $R_{\rm s}$  (m min<sup>-1</sup>), slope-driven fire spread rate
- $R_{\rm U}$  (m min<sup>-1</sup>), wind-driven fire spread rate
- $R_0$  (m min<sup>-1</sup>), basic fire spread rate (i.e., on level ground in the absence of wind)
- *RH* (%), air relative humidity

# T (°C), air temperature

- $U(\text{km h}^{-1})$ , wind speed
- w (kg m<sup>-2</sup>), total foliar fuel load (dry basis)
- $w_d$  (kg m<sup>-2</sup>), litter fuel load
- $w_1$  (kg m<sup>-2</sup>), live or quasi-live foliage fuel load

### 428 Greek symbols

- $\varphi$  (°), flame angle (measured between the flame and the unburned fuel bed)
- $\rho$  (kg m<sup>-3</sup>), foliar fuel bed density

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# 431 **Tables and table captions**

432 **Note:** The tables below embedded as pictures were uploaded separately as individual files.

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434 **Table1.** Nominal litter fuel load (wet-basis) repetitions per fuel bed and wind mode

Fuel load	PF	र	PF	2	EG		
(kg m <sup>-2</sup> )	no-wind	wind	no-wind	wind	no-wind	wind	
0.3	4	4	4	5	4	5	
0.5	4	4	4	5	4	5	
0.7	4	4	4	5	4	5	
0.9	-	-	9	9	-	-	
1.1	-	-	6	-	-	-	

- 436 Note: PR, litter of dead *Pinus resinosa* needles and canopy of quasi-live *Pinus pinaster*
- 437 branches; PP, litter of dead *P. pinaster* needles and canopy of quasi-live *P. pinaster* branches; EG,
- 438 litter of dead *Eucalyptus globulus* leaves and canopy of quasi-live *E. globulus* branches.



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# 439 **Table 2.** Range of main experimental parameters (see 'List of symbols' for an explanation of

440 variables).

Fuel bed	$U(\text{km h}^{-1})$	n	<i>h</i> (m)	T (°C)	RH (%)	M <sub>d</sub> (%)	$M_1$ (%)	$f_{ m d}$	$M_{ m w}$ (%)	w (kg m <sup>-2</sup> )	$\rho$ (kg m <sup>-3</sup> )	$R_p$ (m min <sup>-1</sup> )	φ (°)	$L_{\rm f}$ (m)	D <sub>wd</sub> (mm)
PR	0	12	0.309-0.361	20.8-26.3	57.5-81.0	14.0-22.4	81.2-213.6	0.19-0.38	69.3–161.7	1.27-1.62	3.87-4.69	0.127-0.281	90	0.35-0.75	1.0-4.5
	8	12	0.292-0.380	20.8-26.3	57.5-81.0	14.8-19.4	74.8-221.1	0.20-0.39	59.1-163.0	1.24-1.65	3.91-4.85	0.143-0.540	45-75	0.37-0.92	2.0-4.2
PP	0	27	0.263-0.380	14.7-26.8	48.3–71.3	12.3-19.7	55.7-155.5	0.18-0.64	35.7-123.1	1.17-1.85	3.51-5.77	0.111-0.308	90	0.40-0.95	2.6-6.3
	8	24	0.305-0.374	14.7-26.8	47.5–71.3	12.7-21.6	47.1–158.7	0.18-0.47	34.3-124.0	1.14-1.92	3.57-5.88	0.249-0.666	45-60	0.57-1.27	2.6-5.8
EG	0	12	0.336-0.398	20.4-23.5	43.7-73.0	10.0-14.8	30.3-90.9	0.20-0.62	21.1-66.5	0.67-1.69	1.98-4.34	0.199-0.656	90	0.60-1.20	3.5-6.2
	8	15	0.327-0.406	20.0-23.5	43.7-73.0	9.8-12.8	28.9-95.8	0.13-0.61	18.0-77.1	0.66-2.43	2.02-6.10	0.416-1.285	30-45	1.27-2.20	3.5-6.0

- 442 Note: PR, litter of dead *Pinus resinosa* needles and canopy of quasi-live *Pinus pinaster*
- 443 branches; PP, litter of dead *P. pinaster* needles and canopy of quasi-live *P. pinaster* branches; EG,
- 444 litter of dead *Eucalyptus globulus* leaves and canopy of quasi-live *E. globulus* branches.



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- 445 **Table 3.** Coefficient of determination  $R^2$  for the tested models; for each variable the highest  $R^2$  is
- shown in bold font (see 'List of symbols' for an explanation of variables).

Variable	Model	n	R <sup>2</sup>
R <sub>0</sub>	$a \exp(b M_d)$	51	0.067
	$a \exp(b M_{\rm I})$		0.641
	$a \exp(b M_w)$		0.647
	a M <sub>w</sub> <sup>b</sup>		0.753
	a M <sub>w</sub> <sup>b</sup> h <sup>c</sup>		0.814
	a M <sub>w</sub> <sup>b</sup> w <sup>c</sup>		0.770
	a M <sub>w</sub> <sup>b</sup> ρ <sup>c</sup>		0.799
R <sub>U</sub>	$a \exp(b M_d)$	51	0.143
	$a \exp(b M_{\rm I})$		0.655
	$a \exp(b M_w)$		0.665
	a M <sub>w</sub> <sup>b</sup>		0.821
	a M <sub>w</sub> <sup>b</sup> h <sup>c</sup>		0.819
	a M <sub>w</sub> <sup>b</sup> w <sup>c</sup>		0.881
	a M <sub>w</sub> <sup>b</sup> ρ <sup>c</sup>		0.885
h/H <sub>f</sub>	$a + b M_w$	102	0.833
	$a + b M_w + c h$		0.833
	$a + b M_w + c w$		0.865
	$a + b M_w + c \rho$		0.864
D <sub>wd</sub>	a + b M <sub>w</sub>	102	0.667
	a + b M <sub>w</sub> + c h		0.676
	a + b M <sub>w</sub> + c w		0.732
	$a + b M_w + c \rho$		0.712



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- 448 **Table 4.** Coefficients and evaluation metrics for the selected models; 95% confidence intervals for
- 449 *a*, *b* and *c* are shown in parenthesis (see 'List of symbols' for an explanation of variables).

Model	а	b	С	RMSE	MAE	MAPE	MBE
[1] $R_0 = a M_w^b h^c$	12.657 (5.078–31.55)	-0.7443 (-0.85920.6295)	0.8090 (0.1389–1.479)	0.0556	0.0432	17.7	0.00
$[2] R_{\cup} = a M_{w}^{b} \rho^{c}$	13.14 (8.035–21.50)	-0.6253 (-0.72120.5293)	-0.4895 (-0.73350.2456)	0.0723	0.0545	12.7	0.00
[3] $h/H_{\rm f} = a + b M_{\rm w}$	0.1998 (0.1687–0.2310)	0.00443 (0.004036-0.004823)	-	0.0689	0.0535	11.1	0.00
[4] $f_{cs} = 1 / (1 + \exp(-(a + b M_w)))$	2.647 (1.415-4.047)	-0.03064 (-0.049740.01346)	-	0.0757	0.0586	14.9	0.00
[5] $D_{wd} = a + b M_w + c w$	4.316 (3.617–5.015)	-0.02553 (-0.028860.02221)	1.041 (0.621–1.461)	0.5782	0.4441	12.2	0.00

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# 451 **Figures and figure captions**

- 452 **Note:** The figures below embedded as pictures were uploaded separately as individual files.
- 453
- 454 **Fig. 1.** Combustion table with a fuel bed of *Eucalyptus globulus* leaves litter over layered by
- 455 quasi-live vertical *E. globulus* branches during a wind-driven  $(8 \text{ km h}^{-1})$  fire spread test.



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- 457 **Fig. 2.** Predicted v. observed: (a) basic fire spread rate  $(R_0)$ ; (b) wind-driven fire spread rate  $(R_U, U)$
- $458 = 8 \text{ km h}^{-1}$ ). The solid lines correspond to perfect agreement. Model equations, coefficients, and





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461 **Fig. 3.** Predicted basic fire spread rate ( $R_0$ ) for constant fuel bed height (h = 0.33 m, experimental 462 mean), wind-driven fire spread rate ( $R_U$ , U = 8 km h<sup>-1</sup>) for constant foliar fuel bed density ( $\rho = 4.4$ 463 kg m<sup>-3</sup>, experimental mean), and slope-driven fire spread rate (laboratory data of 50 tests in fuel 464 beds of quasi-live vertical branches with a slope angle of 20° retrieved from Rossa et al. 2016,  $R_s =$ 465 8.98  $M^{-0.579}$ ,  $R^2 = 0.667$ ), as a function of foliar fuel moisture content (M). Model equations, 466 coefficients, and evaluation metrics for  $R_0$  and  $R_U$  are in Table 4.



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- 468 Fig. 4. Ratio between fuel bed height (h) and flame height ( $H_f$ ) (measured from the base of the fuel
- bed) as a function of weighted foliar fuel moisture content ( $M_w$ ). The solid line corresponds to the
- 470 model equation whose coefficients and evaluation metrics are in Table 4.





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- 472 **Fig. 5.** Fraction of the total fuel load consumed by fire  $(f_{cs})$  as a function of weighted foliar fuel
- 473 moisture content  $(M_w)$ . The solid line corresponds to the model equation whose coefficients and

474 evaluation metrics are in Table 4.





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- 476 **Fig. 6.** Predicted v. observed mean post-fire terminal diameter of woody fuels  $(D_{wd})$ . The solid line
- 477 corresponds to perfect agreement. Model equation, coefficients, and evaluation metrics are in
- 478 Table 4.



