# ESTIMATION OF HEAT-TREATED BEECHWOOD PROPERTIES BY COLOR CHANGE

Nebojša Todorović,\* Zdravko Popović, Goran Milić, and Ranko Popadić

Changes in color (CIE  $L^*a^*b^*$ ) and properties (density, mass loss, density loss, and bending properties) of heat-treated beechwood were researched, as well as the possibilities of predicting these properties based on color. Considering the different market values of sapwood and red heartwood, the aim of this study was to establish whether these parts of beechwood differ after a heat treatment. Samples were exposed to temperatures of 170°C, 190°C, and 210°C, respectively, for 4 hours. In order to predict the properties, a linear regression with color change ( $\Delta E$ ) and  $\Delta L$  predictors was used, as well as the partial least squares (PLS) regression with 12 color variables. It has been shown that heat treatment reduces the properties of sapwood and red heartwood in the same manner, and equalizes the colors. The PLS-R showed the best results of prediction and presented the very high coefficients of determination for the mass loss, density loss, and modulus of rupture (MOR) in both sapwood and red heartwood. The equalized colors of heat-treated red heartwood and sapwood can significantly increase the use of products made out of red heartwood. Color can be an important indicator of the quality of such beechwood.

Keywords: Beechwood; Red heartwood; Heat treatment; Color; Multivariate estimation

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#### INTRODUCTION

Heat treatment can reduce wood hygroscopicity and improve its dimensional stability and durability, but it may decrease some mechanical properties, mainly bending (Kubojima et al. 2000; Yildiz 2002; Bekhta and Niemz 2003; Johansson and Morén 2006; Esteves et al. 2007; Shi et al. 2007; Kocaefe et al. 2008). Along with the improvement of hygroscopicity and durability, one of the important reasons for heat-treating is the change in wood color (Mitsui et al. 2001; Bekhta and Neimz 2003; Johansson and Morén 2006; Esteves et al. 2008b; González-Peña and Hale 2009; Toung and Li 2010). Heat treatment gives wood a darker color that has become very interesting on the market, which enables a broader use and an increased market value of less-valued species. The changes in color seem to originate from complex changes and degradation of hemicelluloses, lignin, and certain extractive compounds (Tjeerdsma et al. 1998; Sundqvist and Moren 2002; Bekhta and Neimz 2003; Sehistedt-Persson 2003; Sundqvist 2004; Windeisen et al. 2009; Kocaefe et al. 2008; Niemz et al. 2010; Aydemir et al. 2011). Because the process of heat treatment changes both chemical and some of the physical and mechanical properties, color could be used to predict these changes, and it

could, therefore, become an important indicator of the quality of heat-treated wood. Along with color, NIR spectra and ESR spectra are used for assessing the properties and classifying the heat-treated wood (Hinterstoisser et al. 2003; Schwanninger et al. 2004; Esteves and Pereira 2008c; Ahajji et al. 2009; Bächle et al. 2010).

Patzelt et al. (2003) suggested that color could be used as a classification method of treated wood, because it has a significant correlation with mass loss. Brischke et al. (2007) found good correlation between heat treatment intensity and the color of milled wood, with less variation compared to wood surface measurements. Schnabel et al. (2007) used cluster analysis to prove that color can be used to classify bending strengths of heat-treated beechwood and ash wood. Studies of correlation between color and strength of heat-treated wood have shown contradictory results. Bekhta and Niemz (2003) reported a strong correlation ( $R^2 = 0.99$ ) between changes of color and bending strengths of spruce wood, whereas Johanson and Morén (2006) have used partial least squares (PLS) analysis and concluded that there is no strong correlation between changes of color and bending strengths at heat-treated birch wood. These authors have used – as independent variables – color, density, moisture content (MC), modulus of elasticity in bending strength (MOE), thickness, and width of the sample, treatment time, treatment temperature, and position in a board. González-Peña and Hale (2009b) used color to predict the physical and mechanical properties of wood of Scots pine, Norway spruce, and beech, by using both PLS and linear regression. Their results indicate that color could be used to estimate most of wood properties.

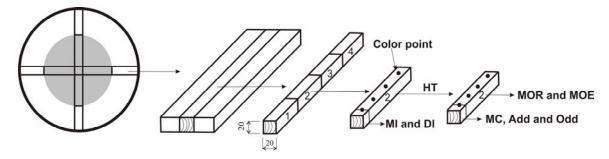
Previous studies indicate that color assessment can be used as an inexpensive and non-destructive method to determine the quality of heat-treated wood. Published results need to be verified in the future research of wood species that have inhomogeneous color and whose value can be significantly increased by heat treatment. Beech is one of the most important wood species in Europe. However, a common problem is red heartwood, out of which products of lower value are made, due to its naturally darker color and a potential presence of fungi. The process of heat treatment modifies the color, and there is a need to establish whether the wood of red heartwood differs from sapwood by its color and properties. Therefore, the aim of this research was to determine changes in color and in properties (density, density loss, mass loss, and bending properties) of heat-treated beech sapwood and red heartwood, as well as to explore the possibilities of predicting the properties by the color itself.

#### **EXPERIMENTAL**

## **Materials**

Eleven beech trees that were randomly chosen were obtained from the forest area of Goč Mountain (southwestern Serbia). The average breast height diameter was 45 cm. All the trees had a similar amount of red heartwood (around 50%) with the absence of visible decay and were cut into 2 m long logs. Three logs were cut from each tree (33 logs in total): above breast height, at the middle, and at the height of first green branches. Each log was cut into eight radial boards 30 mm thick (four from sapwood and four from

red heartwood – Fig. 1). From total of 264 kiln-dried boards, 72 sapwood and 72 red heartwood boards (with no visible defects and deformations) were selected. Four samples from the central part of selected boards were cut (1 untreated plus 3 for heat treatment). The samples (marked 1, 2, 3, and 4) had clearly defined anatomic directions and had no visible defects. They were cut into specimens that were used to determine the physical and mechanical properties (Fig. 1). Specimens that were used for determining the moisture content (MC), the density (oven dried-ODD, air dried-ADD), the mass loss (MI), and the density loss (DI) had dimensions: 20x20x20 mm, and specimens for determining the bending properties – modulus of rupture (MOR) and modulus of elasticity (MOE) were 20x20x320 mm (radial, tangential and longitudinal). There were a total of 576 specimens: 288 out of sapwood (72 + 3x72) and 288 out of red heartwood (72 + 3x72).



**Fig. 1.** Sawing pattern and test samples. (1-untreated, 2-170°C, 3-190°C, 4 -210°C, HT – heat treatment, MOR – modulus of rupture, MOE – modulus of elasticity, MC –moisture content, ODD – oven dry density, ADD – air dry density, MI – mass loss, DI – density loss).

#### **Heat Treatment**

Heat treatment was carried out in a laboratory chamber (1 m³, ± 1°C sensitivity) for heat treatment filled with water vapor, where samples were exposed to temperatures of 170°C, 190°C, or 210°C. It took approximately twenty-four hours to heat the samples from room temperature to the treating temperature, after which the temperature was kept constant for four hours. The chosen schedules are often used in industrial heat-treating of beech timber.

## **Determination of the Physical and Mechanical Properties**

Before heat treatments, all specimens (including specimens for MI and DI determination that were previously oven-dried) were conditioned at 23°C and relative humidity of 50% during eight weeks. The same procedure of conditioning was carried out after the heat treatment. Then, the mechanical properties (bending properties) and physical properties (ADD, ODD, and MC) were determined. MOR and MOE were determined by a three-point bending test on specimens measuring 20x20x320 mm. Distance from supports was 280 mm. ADD, ODD, and MC (20x20x20) were determinated gravimetrically subsequent to the bending tests.

Masses and volumes of oven-dried specimens (20x20x20 mm) that were to be heat-treated were measured. Then they were conditioned with other specimens and, after

heat treatment, they were oven-dried and had their masses and volumes measured again. According to these data, MI and DI of heat-treated wood were calculated.

## **Color Assessment**

Color assessments were performed on radial surfaces of untreated and heat-treated samples by BYK (BYK Gardner GmbH) colorimeter. Color was assessed in four locations, and average values were used for further calculations. The sensor head was 11 mm in diameter. Measurements were made using a D65 illuminant and a  $10^{\circ}$  standard observer. The coordinates  $L^*$  (black-white),  $a^*$  (green-red), and  $b^*$  (blue-yellow), measured before and after the treatment, were used to determine:  $\Delta L$ ,  $\Delta a$ ,  $\Delta b$  (exemplified for  $\Delta L = L^*_{\text{treated}} - L^*_{\text{untreated}}$ ),  $\Delta E$  – total color difference,  $h_{\text{ht}}$  – hue after the heat treatment,  $C_1$  – saturation before the heat treatment,  $C_2$  – saturation after the heat treatment,  $\Delta C$  – change in saturation, and  $H_{\text{ab}}$  – change in hue.

One-way ANOVA and Tukey's multiple range test (SPSS 13.0 software) were used for comparing and determining any significant differences in color and wood properties between the groups.

## **Prediction of Properties According to Color**

In order to determine correlation between color and physical and mechanical properties of heat-treated beechwood, simple linear, multiple linear, and PLS regressions were used. Average values of measured properties were taken as dependent variables in all three treatments. As predictors in simple linear regression,  $\Delta E$  and  $\Delta L$  were used and 12 color variables  $(L^*, a^*, b^*, \Delta L, \Delta a, \Delta b, \Delta E, h, C_1, C_2, \Delta C, H_{ab})$  were used in multiple linear regressions and in PLS. Simple and multiple linear regressions were calculated by SPSS 13.0 software. PLS analysis was done by the Unscrambler (CAMO AS, Norway) software version 9.7. PLS calibration was done with two subsets (calibration set and validation set) with a maximum 10 latent variables (LV). Samples for calibration and validation sets were taken manually. First, the samples were ranked in ascending order of their dependent variables and every third or fourth sample was taken into the validation set. This produced a calibration set (150 samples) and a validation set (66 samples) with roughly the same standard deviation. Secondly, 12 color variables of 150 samples were regressed against the tested properties by cross-validation of five randomly chosen groups. The number of factors used was determined by The Unscrambler software. Model efficiency was then tested by the validation set. The following calibration and validation parameters were used: determination coefficient of calibration set  $(R_c^2)$ , standard error of calibration (SEC), standard error of cross-validation (SECV), determination coefficient of validation set  $(R_p^2)$  (value calculated to show the ability of the calibration to account for the variation in the validation set), standard error of prediction (SEP) (the measure of the calibrations ability to predict wood properties in samples not used in the calibration set), and ratio of performance to deviation (RPD), which evaluates the predictive ability of the calibration and is the ratio of the standard deviation of the measured data to the SEP (Williams and Sobering 1993). According to Workman (2008), values of SEC, SECV, and SEP should be as low as possible, while  $R^2$ and RPD should be as high as possible. For use in the forestry science, Schimleck et al.

(2001) claim that a RPD greater than 1.5 is considered satisfactory for screenings and preliminary predictions, while Schimleck and Evans (2004) consider a RPD of 2.5 sufficient for tree-selection in breeding programs.

#### RESULTS AND DISCUSSION

## **Color Changes**

Mean values of color parameters for untreated and treated beechwood are shown in Table 1, and average values of color differences in all three treatments are shown in Fig. 2. Measured coordinates had positive values both before and after treatment. Colors of untreated sapwood and red heartwood differ significantly. The  $L^*$  values are higher in sapwood than in red heartwood, whereas  $a^*$  and  $b^*$  coordinates are lower (Table 1). The applied heat treatments have had the greatest influence on the change of  $L^*$  coordinate, as it made the wood darker, which was also shown in earlier studies of heat-treated wood (Militz 2002; Bekhta and Neimz 2003; Mitsui et al. 2001, 2003; Johanson and Morén 2006; González-Pena and Hale 2009 a,b). The  $L^*$  coordinate decreased significantly (Fig. 2), and its reduction was greater in sapwood (-36.8) than in red heartwood (-26.1). In sapwood, coordinates  $a^*$  and  $b^*$  increased at 170°C, but decreased at 190°C and 210°C. However, these changes were smaller than the changes of  $L^*$  coordinate. Red heartwood showed a decrease of  $a^*$  and  $b^*$  with the increase of temperature, and the average values of all heat treatments were negative ( $\Delta a$ =-2.0,  $\Delta b$ =-5.8). Sapwood showed average  $\Delta a$  of 0.8, and  $\Delta b$  of (-4.2).

**Table 1.** Mean Values for Three Color Coordinates and Color Difference in Heat-Treated Beech

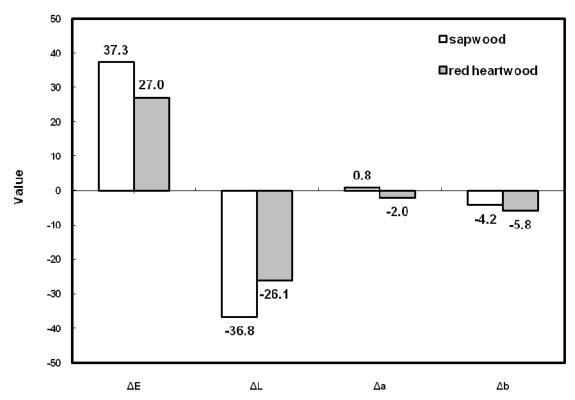
Treated Deech									
Part of beechwood	Treatment	L*	a*	b*	ΔE				
Sapwood	Untreated	79.1 (*)	6.3 (*)	18.9 (*)	-				
	(N=72)	(2.4)	(1.0)	(1.1)					
	170°C	55,9	8,4 (*)	19,8	23,3 (*)				
	(N=72)	(4.9)	(0.5)	(1.1)	(5.8)				
	190°C	39,8	7,7 (*)	15,2	39,5 (*)				
	(N=72)	(3.3)	(0.9)	(2.0)	(4.0)				
	210°C	30,9	5,1	8,9	49,2 (*)				
	(N=72)	(1.2)	(0.5)	(0.9)	(3.4)				
Red	Before	68.3	9.5	20.5	-				
heartwood	(N=72)	(3.4)	(1.1)	(1.1)					
	170°C	55.4	9.2	20.0	12.9				
	(N=72)	(3.9)	(8.0)	(1.4)	(4.3)				
	190°C	40.4	8.3	15.2	28.4				
	(N=72)	(4.5)	(1.0)	(2.3)	(5.7)				
	210°C	30.8	5.1	8.8	39.5				
	(N=72)	(1.7)	(0.6)	(1.3)	(3.4)				
N – number of samples. The standard deviations are in parentheses.									

N – number of samples. The standard deviations are in parentheses.

<sup>(\*)</sup> statistically significant difference between sapwood and red heartwood (p<0.05).

A significant difference in values of  $L^*$ ,  $a^*$ , and  $b^*$  between sapwood and red heartwood (Table 1) was noticed in  $L^*$  (untreated),  $a^*$  (untreated, 170°C and 190°C), and  $b^*$  (untreated). There was no difference between the values of  $a^*$  and  $b^*$  in red heartwood treated at 170°C in comparison with untreated wood. In all other cases, both sapwood and red heartwood showed significant differences in  $L^*$ ,  $a^*$ , and  $b^*$  as compared to untreated wood.

As was expected, a higher mean value of total color difference (Fig. 2) was obtained for sapwood ( $\Delta E$ =37.3) than for red heartwood ( $\Delta E$ =27.0). According to a table frequently used for color classification (e.g. Allegretti et al. 2008), the color difference between sapwood and red heartwood before treatment was high ( $\Delta E$ = 11.4 (>6)), whereas after heat treatment it was small at 170°C ( $\Delta E$ =0.96<2) and 190°C ( $\Delta E$ =0.85<2), and not visible at 210°C ( $\Delta E$ =0.14<0.2).



**Fig. 2.** Color difference between untreated and heat treated wood (average of all heat treatments)

## **Properties of Heat-Treated Beechwood**

Hygroscopicity of wood decreased significantly as a consequence of heat treatment. Untreated wood (after 8 weeks of conditioning) had an average MC of 9.0% in sapwood and 9.6% in red heartwood. Mean values of MC for treated samples were 4.7% (3.0 to 6.6%) in sapwood and 4.2% (2.3 to 6.2%) in red heartwood. Values of other physical and mechanical properties are shown in Table 2. Properties of untreated and heat-treated sapwood and red heartwood mostly did not differ much and were within the

values from previous research studies. ODD of untreated beechwood was 0.676 g/cm<sup>3</sup> (ADD – 0.703 g/cm<sup>3</sup>) in sapwood and 0.677 g/cm<sup>3</sup> (ADD – 0.700 g/cm<sup>3</sup>) in red heartwood. Densities of untreated sapwood and red heartwood were no different and the values were similar to those in previous research studies (Pöhler et al. 2006; Popadić and Todorović 2008; Popović et al. 2010). As expected, heat treatment was associated with decrease in density (Yildiz 2002; Boonstra et al. 2007; Korkut and Guller 2008). There were no difference in wood density at 170°C compared to untreated samples, but strong reduction was found at 190°C and 210°C.

 Table 2. Physical and Mechanical Properties of Untreated and Treated Samples

<u> </u>			<b>OP 0. 1.00</b>				Campico
Part of	Treatment	ODD	ADD	MI	DI	MOR	MOE
beechwood		(g/cm <sup>3</sup> )	(g/cm <sup>3</sup> )	(%)	(%)	(N/mm <sup>2</sup> )	(N/mm <sup>2</sup> )
Sapwood	Untreated	0.676	0.703			126.9	11739
	(N=72)	(0.048)	(0.048)			(16.0)	(1629)
	170°C	0.667	0.695	4.7	8.0	132.1	12500*
	(N=72)	(0.031)	(0.033)	(0.9)	(0.2)	(15.9)	(1864)
	190°C	0.644*	0.659*	9.2	5.2 (*)	95.7* (*)	12540*
	(N=72)	(0.030)	(0.030)	(1.1)	(1.4)	(16.8)	(1910)
	210°C	0.619*	0.633*	16.9	9.7	69.6*	11721
	(N=72)	(0.027)	(0.029)	(1.1)	(2.5)	(14.1)	(1705)
Red	Untreated	0.677	0.700			124.1	12095
heartwood	(N=72)	(0.051)	(0.049)			(17.9)	(1513)
	170°C	0.674	0.696	5.0	0.7	127.9	12663*
	(N=72)	(0.038)	(0.040)	(0.7)	(0.2)	(21.6)	(1840)
	190°C	0.650*	0.667*	9.3	4.0	88.7*	12624*
	(N=72)	(0.033)	(0.035)	(8.0)	(1.3)	(24.7)	(2076)
	210°C	0.621*	0.635*	17.0	10.0	65.7*	11638
	(N=72)	(0.033)	(0.030)	(1.1)	(2.9)	(17.4)	(1982)

N – number of samples. The standard deviations are in parentheses.

This research confirmed that mass loss increases with the rise of temperature (Bourgois and Guyonnet 1988; Zaman et al. 2000; Alén et al. 2002; Esteves et al. 2008a) both in sapwood and in red heartwood. Average mass loss (for all three treatments) was 10.3% in sapwood and 10.4% in red heartwood. Average density loss was lower than mass loss and it was 5.2% in sapwood and 4.9% in red heartwood. There was no difference between sapwood and red heartwood in density loss, except for treatment at 190°C. Compared to untreated samples, MOR decreased significantly at higher temperatures (190 and 210°C), which is in agreement with results in previous studies (Schnabel et al. 2007; Esteves et al. 2007; Kocaefe et al. 2008; Windeisen et al. 2009;). There was no difference between sapwood and red heartwood in MOR both for untreated and samples treated at 170°C and 210°C. Higher value in sapwood than in heartwood at 190°C was found, mainly as a consequence of similar trend in density loss.

The heat treatment at 170°C and 190°C slightly improved MOE, while at 210°C it was not different compared to untreated wood. No difference between sapwood and red heartwood in MOE was obtained both in untreated and treated samples.

<sup>\*</sup> statistically significant difference as compared to untreated wood (p<0.05).

<sup>(\*)</sup> statistically significant difference between sapwood and red heartwood (p<0.05).

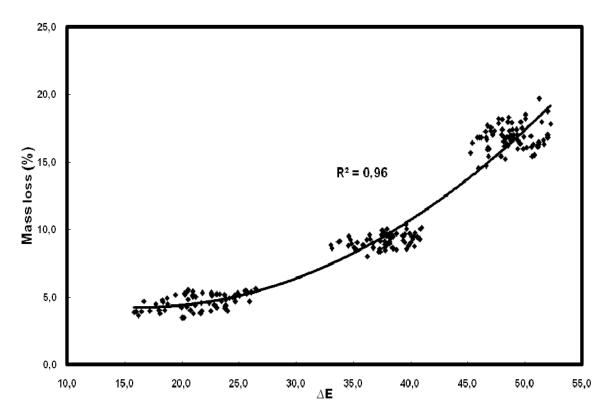
## **Prediction of Properties by Linear Regression**

**Table 3.** Linear Regression Analysis of Prediction of Physical and Mechanical Properties of Heat-Treated Beechwood using  $\Delta L$  or  $\Delta E$  as Predictors

Part of beechwood	Predictor	N	Stand.	$R^2$	$F_{\text{sig}}$	$b_0$	$b_1$	$b_2$
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			ODD (g/	cm <sup>3</sup> )	I.			I.
Sapwood	$\Delta L$	216	0.029	0.35	117.0	0.71	0.002	
·	ΔΕ	216	0.029	0.41	150.3	0.72	-0.002	
Red heartwood	$\Delta L$	216	0.034	0.31	97.3	0.71	0.002	
	ΔΕ	216	0.032	0.26	74.6	0.69	-0.002	
Total	$\Delta L$	432	0.032	0.30	184.1	0.70	0.002	
	ΔΕ	432	0.031	0.31	192.7	0.70	-0.002	
			ADD (g/	cm³)				
Sapwood	$\Delta L$	216	0.029	0.41	150.3	0.72	-0.002	
	ΔΕ	216	0.030	0.45	174.0	0.75	0.002	
Red heartwood	$\Delta L$	216	0.033	0.47	188.8	0.75	0.003	
	ΔΕ	216	0.030	0.42	156.6	0.74	-0.002	
Total	$\Delta L$	432	0.033	0.40	291.4	0.74	0.002	
	ΔE	432	0.031	0.43	322.9	0.74	-0.002	
		•	MI (%		T	,		r
Sapwood	$\Delta L$	216	2.32	0.86	667.2	11.8	0.72	0.018
	ΔΕ	216	1.32	0.96	2501	13.4	-0.80	0.019
Red heartwood	$\Delta L$	216	2.16	0.87	731.8	5.86	0.26	0.016
	ΔΕ	216	1.40	0.95	1896	6.97	-0.30	0.015
Total	$\Delta L$	432	3.68	0.64	381.8	1.42	-0.21	0.004
	ΔΕ	432	2.81	0.80	862.4	4.81	-0.09	0.009
			DI (%					
Sapwood	ΔL	216	1.82	0.74	298.3	0.48	0.11	0.006
	ΔΕ	216	1.62	0.77	357.3	-0.14	-0.06	0.005
Red heartwood	<u>ΔL</u>	216	2.28	0.57	142.1	-1.66	-0.17	0.002
	ΔΕ	216	1.88	0.67	211.1	-1.72	0.16	0.002
Total	ΔL	432	2.36	0.55	262.3	-1.72	0.16	0.001
	ΔΕ	432	2.04	0.62	347.8	-1.72	0.15	0.001
0		040	MOR (N/		007.4	4047	0.00	
Sapwood	ΔL	216	14.8	0.76	667.1	184.7	2.38	
Dad bacifus ad	ΔΕ	216	15.4	0.76	662.2	186.7	-2.44	
Red heartwood	ΔL	216	21.6	0.58	299.1	160.6	2.53	
Tatal	ΔΕ	216	19.9	0.65	392.8	159.6	-2.46	
Total	ΔL	432	22.7	0.49	417.2	156.8	1.93	
	ΔΕ	432	21.9 MOE (N/	$\frac{0.54}{mm^2}$	512.1	159.2	-2.01	
Convioed	Λ1	216	1152	mm ) 0.32	104.4	15140	72.0	
Sapwood	$\Delta L$ $\Delta E$	216	1236	0.32	104.4	15140 15398	72.0	
Red heartwood	ΔΕ	216 216	1649	0.36	122.6 80.0	15019	-82.6 98.6	
IZEU HEALLWOOD	ΔΕ	216	1519	0.27	98.9	14990	-94.8	
Total	$\Delta L$	432	1485	0.31	124.3	14537	65.5	
iotai	$\Delta E$	432	1431	0.22	174.4	14785	-75.1	
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Table 3 shows the results of linear regression assessment of basic physical and mechanical properties of beech wood, based on  $\Delta L$  and  $\Delta E$  as predictors. Most of properties had a linear correlation with  $\Delta L$  and  $\Delta E$ .

According to coefficient of determination  $(R^2)$ ,  $\Delta L$  and  $\Delta E$  had the best correlation with mass loss (Fig. 3), density loss, and MOR.  $R^2$  for mass loss were roughly the same for both parts of wood and were 0.86 ( $\Delta L$ ) and 0.96 ( $\Delta E$ ) in sapwood, and 0.87 ( $\Delta L$ ) and 0.95 ( $\Delta E$ ) in red heartwood. Density loss and MOR had roughly the same prediction efficiency by  $\Delta L$  and  $\Delta E$ , but lower than mass loss.  $R^2$  in density loss varied between 0.57 ( $\Delta L$  in red heartwood) and 0.77 ( $\Delta E$  in sapwood). Similar results were found in MOR – the lowest  $R^2$  was in red heartwood – 0.58 ( $\Delta L$ ) and the highest was in sapwood – both  $\Delta L$  and  $\Delta E$  had  $R^2$  values of 0.76.



**Fig. 3**. Correlation between mass loss and  $\Delta E$  in sapwood of heat-treated beechwood. Grouped data originate from different heat treatments

A parabolic correlation was present between  $\Delta L$  and/or  $\Delta E$  and mass loss, which coincides with the results of González-Peña and Hale (2009b), but there was a linear correlation between these predictors and bending properties (Fig. 4), which differs from the results reported by same authors. Standard errors of mass loss, MOR, and MOE were significantly higher in red heartwood than in sapwood. Compared to results reported by González-Peña and Hale (2009b), standard errors in assessment of MOR and MOE in sapwood were smaller, and those of density loss were similar. The reason for this is

probably a narrower range of applied temperatures and therefore a narrower range of color change ( $\Delta E$ =15-56).

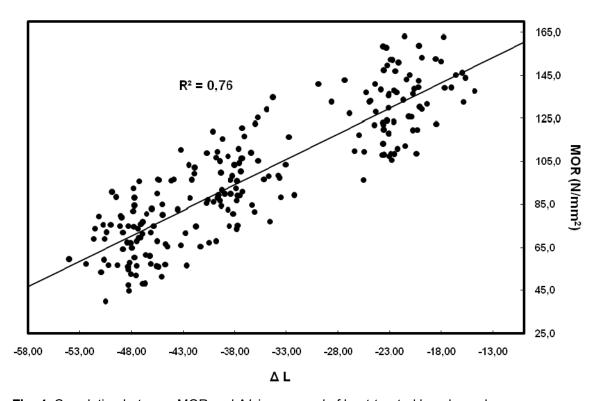


Fig. 4. Correlation between MOR and  $\Delta L$  in sapwood of heat-treated beechwood

 $\Delta E$  was a better predictor than  $\Delta L$  for most of the properties, except for red heartwood density. Sapwood had higher  $R^2$  than heartwood for all investigated properties. This was probably caused by sapwood more homogeneous color that provided a better correlation between color parameters and the tested properties.

Multiple linear regression based on twelve independent color variables showed a higher  $R^2$  than simple linear regression for density loss and MOE in sapwood ( $R^2 = 0.89$  and  $R^2 = 0.42$ ). In all other cases, simple linear regression was equally or more efficient in predicting.

### **Prediction of Properties by PLS Regression**

PLS regression improved ability of properties prediction (with density loss this goes up to 70%) compared to simple and multiple linear regressions (Table 4). Red heartwood had higher values of  $R^2$  than linear regression in mass loss ( $R^2$ =0.97), density loss ( $R^2$ =0.89), and MOE ( $R^2$ =0.38). PLS regression in sapwood showed higher values of RPD with all tested properties. Highest values of RPD in sapwood were with mass loss (RPD=6.42), density loss (RPD=3.92), and MOR (RPD=2.69). ODD had the lowest values of RPD. Compared to linear predictors  $\Delta L$  and  $\Delta E$ , PLS was better with ODD in red heartwood ( $R^2$ =0.34) and with ADD in sapwood ( $R^2$ =0.50).

**Table 4.** Summary of Statistics for Calibration and Predictions of Physical and Mechanical Properties of Heat-treated Beechwood

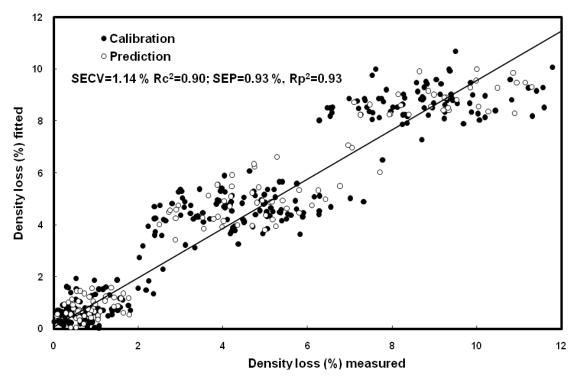
Part of beechwood	Calibration					Validation					
	N <sub>c</sub>	Factors	SEC	SECV	$R_{\rm c}^{2}$	$N_{p}$	SEP	$R_{p}^{2}$	RPD		
ODD (g/cm <sup>3</sup> )											
Sapwood	150	2	0.037	0.038	0.36	66	0.038	0.38	1.29		
Red heartwood	150	4	0.034	0.036	0.31	66	0.036	0.34	1.22		
Total	300	1	0.037	0.038	0.34	132	0.030	0.36	1.23		
	ADD (g/cm <sup>3</sup> )										
Sapwood	150	3	0.026	0.027	0.47	66	0.025	0.50	1.44		
Red heartwood	150	3	0.030	0.031	0.38	66	0.030	0.38	1.33		
Total	300	1	0.033	0.033	0.40	132	0.027	0.43	1.33		
			MI (9	6)							
Sapwood	150	2	1.05	1.06	0.97	66	1.05	0.97	6.42		
Red heartwood	150	2	1.16	1.19	0.97	66	1.10	0.97	5.74		
Total	300	3	1.05	1.07	0.97	132	0.97	0.98	6.14		
			DI (%	6)							
Sapwood	150	2	0.95	0.99	0.93	66	0.92	0.94	3.92		
Red heartwood	150	2	1.16	1.26	0.87	66	1.08	0.89	2.98		
Total	300	2	1.12	1.14	0.90	132	0.93	0.93	3.81		
			MOR (N	/mm²)							
Sapwood	150	4	11.5	12.05	0.83	66	11.6	0.86	2.69		
Red heartwood	150	2	19.7	20.4	0.53	66	19.2	0.60	1.57		
Total	300	5	15.3	15.7	0.71	132	15.3	0.74	2.00		
MOE (N/mm <sup>2</sup> )											
Sapwood	150	3	992	1040	0.57	66	823	0.56	1.52		
Red heartwood	150	2	1460	1506	0.38	66	1350	0.38	1.27		
Total	300	5	1206	1242	0.46	132	1061	0.45	1.45		

RPD values were higher in sapwood than in red heartwood. Considering the limit value of 1.5 (Schimleck et al. 2001), the color of heat-treated beechwood is a good predictor of mass loss, density loss (Fig. 5), and MOR. In sapwood, RPD was on the limit for MOE, but it was a weak predictor for red heartwood. Color was a poor indicator of density in both sapwood and red heartwood.

 $R^2$  had the lowest values in predicting ADD, ODD, and MOE in both linear and PLS regression. The explanation for this is that the color change in heat-treated wood is an indicator of the change in chemical composition and mass loss; therefore color was a better indicator of properties that change more with the change in chemical composition and mass loss. This means that color of heat-treated beechwood can be used more accurately in predicting the strength than density and elasticity in bending. A small change in density was caused by the simultaneous mass loss and volume loss; still volume loss was significantly lower than mass loss (Popadić and Todorović 2008).

The research confirms that the increase in temperature makes sapwood and red heartwood darker while bending strength decreases, which could be directly associated with thermal degradation of wood components (Ponscak et al. 2006; Esteves et al. 2008b). With heat treatment, the color of wood is modified, acquiring a darker tonality,

which is often justified by the formation of colored degradation products from hemicelluloses (Sehistedt-Persson 2003; Sundqvist 2004).



**Fig. 5.** Calibration plot for DI of heat-treated beechwood using PLS 12 color variables (all 432 samples)

Fengel and Wegener (1989) explained that the reason for the color change is the production of chromophores as a result of the hydrolytic reactions that occur during heat treatment. The decrease of hemicelluloses content has a smaller effect on change in elasticity than on bending strength, for which a strong correlation was reported by several authors (Winandy and Lebow 2001; Esteves et al. 2008a; Windeisen et al. 2009; Niemz et al. 2010). This research didn't examine the content of chemical compounds; however there was a distinctive difference between NIR spectra recorded on beechwood radial surface before and after treatment (Todorović et al. 2010). NIR spectra (resolution 8 cm<sup>-1</sup> and 100 scans) were recorded on the same samples that were used in this research. The heat treatment was observed in the second derivative mode of the NIR spectra. The hemicelluloses are more sensitive to high temperature than are lignin and cellulose. There is a decrease of the band at 5800 cm<sup>-1</sup>, the first overtone of CH stretching vibrations, which is caused by the degradation hemicelluloses and to a decrease of the absorption band assigned to the amorphous region cellulose at 7000 cm<sup>-1</sup> (Windeisen et al. 2009: Bächle et al. 2010; Schwanninger et al. 2003; Mitsui et al. 2008). The increase of the bands 5950 cm<sup>-1</sup> and 5981 cm<sup>-1</sup>, the first overtone of aromatic skeletal CH stretching vibrations, may be due to a relative increase of lignin. Also, there is an increase of the absorption band around 6900 cm<sup>-1</sup>, which can be assigned to the phenolic hydroxyl groups originating from lignin (Mitsui et al. 2008).

#### **CONCLUSIONS**

This research assessed colors and properties of heat-treated beech sapwood and red heartwood and the possibilities of estimation their properties by color were examined. The following conclusions can be drawn:

- 1. Coordinates of sapwood and red heartwood color have positive values both before and after treatment. Untreated sapwood had  $L^*$  values higher than red heartwood, while  $a^*$  and  $b^*$  coordinates were lower. Changes in color after heat treatment were caused by the decrease in  $L^*$ , whereas the influence of changes in  $a^*$  and  $b^*$  was small. Differences in color ( $\Delta E$ ) between sapwood and red heartwood before treatment were high, but after treatment they were small at 170°C and 190°C, and not visible at 210°C.
- 2. Most of properties of sapwood and red heartwood showed no significant difference both before and after treatment. Higher temperatures caused a rise in mass loss and density loss, and a reduction of bending strength, whereas the effect on MOE was small.
- 3. In general, color could be used for predicting the properties of sapwood and red heartwood. In linear regression, the majority of examined properties had a linear correlation with  $\Delta L$  and  $\Delta E$ , while  $\Delta E$  was a better predictor for all properties, except for density of red heartwood. PLS regression based on twelve independent color variables  $(L^*, a^*, b^*, \Delta L, \Delta a, \Delta b, \Delta E, h, C_1, C_2, \Delta C,$  and  $H_{ab})$  considerably enhanced the estimation of most of the examined properties. Both linear and PLS regressions made the best estimations on sapwood mass loss, density loss, and MOR.
- 4. Heat treated red heartwood and sapwood had similar color and properties, which can increase the usage of beech red heartwood for products made out of heat-treated wood.

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