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# Consumer perception of wood surfaces: the relationship between stated preferences and visual homogeneity 

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#### Abstract

Information about people's preferences as to wood products is of relevance to several decision makers in the forest sector. Studies revealing consumer preference provide information that can be used for marketing and manufacturing of wood products, but these also provide information of relevance to designers and decision makers involved in building design and construction processes. Previous studies show that the overall harmony of the visual surface is correlated with preference. In this study, perceived visual homogeneity is modeled for five copperimpregnated and five organic biocide-impregnated decking materials with different visual quality. The models are based on visual variables. Homogeneity is a function of material-dependent variables (dry knots, knot shape, and splay knot), production-dependent variables (stain), and surplus color, which is a combination of both wood property and treatment. The results imply that homogeneity is influenced by both wood properties and treatment. Producers of decking should, while maintaining a focus on using highquality raw material, also focus on producing a product with an unstained appearance.


Key words Sawnwood • Preservative treatment • Consumer preference • Sensory analysis • Homogeneity

## Introduction

Studies that reveal consumers' preferences provide relevant information to decision makers in the forest sector, with respect both to the manufacturing and the marketing of

[^0]wood products and to building design and construction. More knowledge about the appearance of wood can provide competitive advantages for the forest industry and will also, if applied to the development of new products in accordance with consumers' needs and requirements, improve consumer satisfaction and welfare. Preference studies are also relevant from a psychological point of view.

Results from previous preference studies indicate that people's preferences are affected by product attributes. Brandt and Shook conducted a comprehensive review of previous attribute research on forest products and concluded that consumers' quality attributions with respect to forest products can usually be ascribed to the visual and tactile, i.e., tangible, properties of the wood. A few studies had also evaluated the importance of intangible attributes, such as service and environmental impact. Furthermore, Brandt and Shook ${ }^{1}$ found only a few published articles that had studied end-consumers' preferences.

A few studies have investigated the relationship between preferences and physical wood properties. In general, these studies have concluded that homogeneous visual properties, for example, wood surfaces with few and evenly dispersed knots and an even growth ring pattern, are preferred by consumers. ${ }^{2-5}$ Preference studies are relevant to the industry because they reveal consumers' taste and preferences, but results from analytical models are particularly important because these studies can be used to predict consumer preferences.

An important aspect with respect to consumer preference is the relationship between wood properties and the aesthetic properties of the material. There is evidence that architects and construction designers choose wooden building materials because wood is perceived as aesthetically appealing, ${ }^{6}$ but there is little knowledge concerning which wood properties of the wood are related to aesthetic characteristics and how they are related. A model developed by Broman ${ }^{3}$ provides insights into the formation of preference for solid wood products, but so far it has not been empirically validated. Broman claimed that there were three properties of wood that influenced consumer preference: harmony, activity, and social status. In this article, the rela-
tionship between consumer preferences and perceived homogeneity is modeled.

The present study evaluates consumers' preferences for wooden decking products. Wooden decking and other outdoor wood applications are usually made from preser-vative-treated wood or naturally durable wood (e.g., heartwood from pine or oak). Preservative-treated wood is usually pressure-treated using water-based or petroleumbased preservatives, but in recent years modified wood products have also been commercially available, for example, heat-treated wood, acetylated wood, and furfurylated wood. In the present study, two pressure-treated decking materials were included: Cu-treated wood, for which a traditional copper treatment was used, and wood subjected to metal-free treatment, a new product without toxic metal preservatives.

Both wood properties and product properties affected by the manufacturing process are studied and modeled after the concept of harmony. ${ }^{3}$ Thus, this study provides new information about how raw material properties relate to end products, how they affect consumer preferences, and how treatment and manufacturing processes influence consumer preferences. Results from the study can be used to improve products made from treated wood, and they also provide information of relevance to the product development and innovation processes.

## Materials and methods

Ten material samples were evaluated by a sensory panel consisting of trained sensory assessors and approximately 120 potential consumers. Thus, two data sets were available for analysis: (1) descriptive sensory data and (2) stated preference from potential customers. Two wooden decking products, made of Scots pine (Pinus sylvestris), that had been subjected to two different pressure treatments, were used: copper treatment (Wolmanit) and organic biocide treatment (Metal Free). The material samples that were evaluated by the sensory profilers and customers were made to resemble outdoor residential decks. These sample decks were rectangular, measuring $1000 \times 62 \times 0 \mathrm{~mm}$, and consisted of five parallel boards, each measuring $1000 \times 120 \times$ 28 mm , fastened to two perpendicular boards on the under-
side of the deck. The pith side of the boards faced up. Five material samples were made for each decking product.

Both decking products were from pressure-treated wood, but because of the treatment method the visual properties of the sample deckings differed. Treatment method affects wood properties such as color and wood density. The wood properties of the raw material used to produce pre-servative-treated products can influence the visual properties of the final products; hence, the boards selected for the sample deckings were sorted according to wood quality. Wood properties differ with the quality of the sawnwood used as raw material. Pressure-treated wood products are usually made from sawnwood with a large share of sapwood, which influences the quality. The ten material samples are described in Table 1. Figure 1 shows photographs of the different samples.

## Sensory analysis

Sensory analysis is a method for identification and measurement of product attributes perceived by sight, sound, smell, taste, and touch. ${ }^{7}$ Sensory methods are classified according to their primary use; usually a distinction is drawn between analytical methods, with the purpose of providing objective descriptions of products (analytical sensory profiling), and hedonic methods, in which the purpose is to retrieve information about consumers' preferences and attitudes toward products (hedonic profiling). ${ }^{8}$ Previous experience indicates that sensory analysis can be applied to wood products. ${ }^{5,9,10}$

The sensory panel consisted of 11 assessors (judges) who were trained in defining, understanding, and evaluating product attributes in general. In a discussion with the assessors taking different Nordic visual grading rules into account, a list of 23 attributes was chosen. It was emphasized that the different attributes should be possible to judge by means of a scale from 1 to 9 . The method was used by Nyrud et al. ${ }^{5}$ Before the study, all the assessors were screened for their ability to discriminate between wood samples with small variations in the intensity of the given attribute. All members of the panel were allowed to evaluate the samples at individual speed, and the results were recorded on a $15-\mathrm{cm}$ nonstructured scale. The left side of the nonstructured scale corresponded to the lowest intensity and had a score equal to 1 . The rightmost side of the

Table 1. Description of material samples

| Decking ID number | Treatment | Description of the quality |
| :--- | :--- | :--- |
| 117 | Copper | Few small-sized sound knots |
| 285 | Copper | Medium-sized sound knots |
| 331 | Copper | Large annual rings, board with pith |
| 593 | Copper | Many failures, dry medium-sized knots |
| 939 | Copper | Some rotten and dry knots |
| 730 | Organic biocide | Small-sized sound knots |
| 480 | Organic biocide | Medium-sized sound knots |
| 174 | Organic biocide | Large-sized sound knots |
| 564 | Organic biocide | Board with pith |
| 42 | Organic biocide | Many failures and dry knots |

[^1]Fig. 1. Photographs of the deckings investigated, which are described by the numbers in Table 1


Table 2. Sensory attributes identified by the sensory panel

| Sensory attributes | Definitions | Score 1 | Score 9 |
| :--- | :--- | :--- | :--- |
| Lightness | Degree of white/black in the color | Black | White |
| Hue | Green/yellow to yellow/red | Green/yellow | Yellow/red |
| Saturation | Color saturation | Indistinct | Saturated |
| Homogeneity | Overall homogeneity | Nonhomogeneous | Homogeneous |
| Stained | Stained/mottled | No stains/spots | Stained/spotted |
| Surplus color |  | No surplus color | Surplus color |
| Gloss | Matte | Glossy |  |
| Knot size | Diameter | Small | Large |
| Knot shape | Ovality | Round | Oval |
| Spike knot | Amount of spike knots | No spike knots | Spike knots |
| Dry knots | Amount of dry knots | No dry knots | Abundant dry knots |
| Knot groups | Amount of knot groups | No knot groups | Abundant knot groups |
| Knot homogeneity | Distribution of knots on the surface | Unevenly distributed | Evenly distributed |
| Knot checks | Growth ring density | No knot checks | Abundant knot checks |
| Ring density | Growth ring contrast | No visibgs | Dense rings |
| Ring contrast | Growth ring pattern | No pattern | Distinct rings |
| Ring pattern | Wood density | Low | Clearly visible pattern |
| Density | Wood hardness | Soft | High |
| Hardness |  | Rough | Hard |
| Smoothness |  | Dry | Smooth |
| Pitchy | Choothness when touched | No checks | Pitchy |
| Checks |  | No end checks | Abundant checks |
| End checks |  |  | Abundant end checks |

scale had a score equal to 9 . The samples were evaluated under identical lighting conditions (ISO 1988). The sensory panel identified 23 attributes for each of the ten decks. The different attributes are described in Table 2.

## Hedonic study

Data for the hedonic study were collected during a house and garden fair in the Oslo region in Norway. Material samples were displayed on a stand, and visitors passing the stand were invited to participate in the study. One group of consumers evaluated five decking samples made from cop-per-treated wood $(n=102)$ and one group evaluated the
decking samples made from wood treated with biocide ( $n=119$ ). The respondents were asked to rate their preference for the samples on a nine-point scale: from 1 ("dislike very much") to 9 ("like very much"). The respondents were allowed to complete the questionnaire at individual speed. Demographic information was also collected for all respondents, i.e., sex, age, living situation (one-family house/row house, apartment, cabin, owners, or renters), education, annual income, experience in woodwork, and plans for remodeling. Descriptive statistics for both groups of respondents are provided in Table 3.

Partial least squares regression (PLSR), using The Unscrambler, ${ }^{11}$ and logistic regression, using JMP, ${ }^{12}$ was

Table 3. Respondents and descriptive statistics

|  | Copper-treated material samples | Biocide-treated material samples |
| :---: | :---: | :---: |
| Number of respondents | 102 | 119 |
| Sex (\% women/men) | 54/47 | 64/55 |
| Age (years) (\% 16-35/36-55/>56) | 34/49/16 | 13/42/45 |
| Previous experience (professional or do-it-yourself projects) (\%) | 56 | 61 |

Table 4. Sensory attributes and mean scores for copper-treated sample deckings

| Sensory attribute | Decking ID number |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  | 117 | 285 | 331 | 593 | 939 |
| Lightness | $4.42{ }^{\text {A }}$ | $4.47^{\text {A }}$ | 4.60 ${ }^{\text {A }}$ | $4.24{ }^{\text {A }}$ | $4.41^{\text {A }}$ |
| Hue | $1.70^{\text {A }}$ | $1.51{ }^{\text {A }}$ | $1.36{ }^{\text {A }}$ | $1.45{ }^{\text {A }}$ | $1.89{ }^{\text {A }}$ |
| Saturation | $5.55{ }^{\text {A }}$ | $5.65{ }^{\text {A }}$ | 6.75 ${ }^{\text {A }}$ | $5.87{ }^{\text {A }}$ | $5.45{ }^{\text {A }}$ |
| Homogeneity | $5.23{ }^{\text {AB }}$ | $4.35{ }^{\text {BC }}$ | 6.22 ${ }^{\text {A }}$ | $3.12{ }^{\text {C }}$ | $3.69{ }^{\text {C }}$ |
| Stains | $2.65{ }^{\text {A }}$ | 4.64 ${ }^{\text {A }}$ | $2.82{ }^{\text {A }}$ | $4.25{ }^{\text {A }}$ | $4.56{ }^{\text {A }}$ |
| Surplus color | $6.03{ }^{\text {AB }}$ | $6.65{ }^{\text {A }}$ | $4.41^{B}$ | 7.43 ${ }^{\text {A }}$ | $6.00^{\text {AB }}$ |
| Gloss | $2.55{ }^{\text {A }}$ | $2.52^{\text {A }}$ | $2.47{ }^{\text {A }}$ | $2.15{ }^{\text {A }}$ | $2.93{ }^{\text {A }}$ |
| Knot homogeneity | $5.65{ }^{\text {A }}$ | $5.51{ }^{\text {A }}$ | $4.37{ }^{\text {A }}$ | $6.01{ }^{\text {A }}$ | $4.85{ }^{\text {A }}$ |
| Knot size | $2.55{ }^{\text {C }}$ | $3.82{ }^{\text {BC }}$ | $6.09{ }^{\text {A }}$ | $4.23{ }^{\text {B }}$ | $3.95{ }^{\text {BC }}$ |
| Knot shape | $2.59{ }^{\text {C }}$ | $4.00^{\text {BC }}$ | $6.57{ }^{\text {A }}$ | $5.35{ }^{\text {AB }}$ | $4.05^{\text {B }}$ |
| Spike knots | $2.06{ }^{\text {B }}$ | $3.46{ }^{\text {AB }}$ | $4.45{ }^{\text {A }}$ | $4.56{ }^{\text {A }}$ | $3.20{ }^{\text {AB }}$ |
| Ring density | $3.73{ }^{\text {C }}$ | $4.86{ }^{\text {ABC }}$ | $4.03{ }^{\text {BC }}$ | 5.84 ${ }^{\text {A }}$ | $5.25{ }^{\text {AB }}$ |
| Dry knots | $2.75{ }^{\text {AB }}$ | $2.25{ }^{\text {B }}$ | $1.44{ }^{B}$ | $4.22^{\text {A }}$ | 4.46 ${ }^{\text {A }}$ |
| Knot groups | $3.07{ }^{\text {B }}$ | $3.87{ }^{\text {AB }}$ | 5.37 ${ }^{\text {A }}$ | $4.34{ }^{\text {AB }}$ | $2.98{ }^{B}$ |
| Knot checks | $2.06{ }^{\text {A }}$ | $2.23{ }^{\text {A }}$ | $1.66{ }^{\text {A }}$ | $2.64{ }^{\text {A }}$ | $1.98{ }^{\text {A }}$ |
| Ring contrast | $5.57{ }^{\text {A }}$ | $4.63{ }^{\text {AB }}$ | $\mathbf{5 . 7 2}^{\text {A }}$ | $3.83{ }^{B}$ | $5.24{ }^{\text {AB }}$ |
| Ring pattern | 5.51 ${ }^{\text {A }}$ | $4.75{ }^{\text {A }}$ | $5.49{ }^{\text {A }}$ | $3.89{ }^{\text {A }}$ | $5.11{ }^{\text {A }}$ |
| Wood density | $4.61{ }^{\text {A }}$ | $4.77^{\text {A }}$ | $4.29{ }^{4}$ | $4.57^{\text {A }}$ | $5.00{ }^{\text {a }}$ |
| Hardness | $4.79{ }^{\text {A }}$ | 4.93 ${ }^{\text {A }}$ | $4.31{ }^{\text {A }}$ | $4.49{ }^{\text {A }}$ | $4.79{ }^{\text {A }}$ |
| Smoothness | $3.20{ }^{\text {A }}$ | $3.05^{\text {A }}$ | $3.23{ }^{\text {A }}$ | $3.13{ }^{\text {A }}$ | 3.32 ${ }^{\text {A }}$ |
| Pitch | $2.80{ }^{\text {A }}$ | $2.71{ }^{\text {A }}$ | $2.82{ }^{\text {A }}$ | 3.06 ${ }^{\text {A }}$ | $2.80^{\text {A }}$ |
| Checks | $2.74{ }^{\text {AB }}$ | $3.01{ }^{\text {A }}$ | $1.51{ }^{\text {B }}$ | $2.93{ }^{\text {A }}$ | $2.18{ }^{\text {AB }}$ |
| End checks | $2.06{ }^{\text {A }}$ | $1.66{ }^{\text {A }}$ | $1.56{ }^{\text {A }}$ | $1.78{ }^{\text {A }}$ | $2.09{ }^{\text {A }}$ |

Identical superscripts indicate no statistical difference in sensory score (Tukey-Kramer test, $P<0.05$ )
Maximum score in bold; minimum score in italic
used to analyze the sensory data and the data from the hedonic study. In addition, Tukey-Kramer tests, using JMP ${ }^{12}$ were used to test whether the different attributes differed between the different decks.

## Results

Results from the sensory evaluation are presented below. Tukey-Kramer tests were applied to determine whether the sensory scores differed between the sample deckings and to provide information concerning which sensory scores are determined by wood quality. Identical superscripts in the tables indicate that there is no statistical difference between the sample deckings. Results for the five copper-treated material samples are reported in Table 4; results for the five biocide-treated material samples are reported in Table 5.

According to the Tukey-Kramer test, sample deckings made from copper-treated wood differed significantly

Table 5. Sensory attributes and mean scores for biocide-treated sample deckings

| Sensory attribute | Decking ID number |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  | 174 | 42 | 480 | 564 | 730 |
| Lightness | $6.21{ }^{\text {A }}$ | $4.28{ }^{\text {B }}$ | $5.86{ }^{\text {A }}$ | $4.71{ }^{\text {B }}$ | $5.88{ }^{\text {A }}$ |
| Hue | $5.45{ }^{B}$ | $7.85{ }^{\text {A }}$ | $6.06{ }^{\text {B }}$ | $7.38{ }^{\text {A }}$ | $6.07{ }^{\text {B }}$ |
| Saturation | $3.91{ }^{\text {B }}$ | $5.77{ }^{\text {A }}$ | $4.44{ }^{\text {AB }}$ | $5.13{ }^{\text {AB }}$ | $4.25{ }^{\text {AB }}$ |
| Homogeneity | $6.42{ }^{\text {a }}$ | $3.61{ }^{\text {C }}$ | $5.20{ }^{\text {ABC }}$ | $4.16{ }^{\text {BC }}$ | $5.94{ }^{\text {AB }}$ |
| Stains | $1.61{ }^{\text {C }}$ | $4.16{ }^{\text {AB }}$ | $2.93{ }^{\text {ABC }}$ | $4.55{ }^{\text {A }}$ | $1.96{ }^{\text {BC }}$ |
| Surplus color | $2.48{ }^{\text {A }}$ | $3.95{ }^{\text {A }}$ | $1.94{ }^{\text {A }}$ | $3.59{ }^{\text {A }}$ | $2.37{ }^{\text {A }}$ |
| Gloss | $2.85{ }^{\text {A }}$ | $2.25{ }^{\text {A }}$ | $3.05{ }^{\text {A }}$ | $2.06{ }^{\text {A }}$ | $3.00^{\text {A }}$ |
| Knot homogeneity | $5.73{ }^{\text {A }}$ | $5.40{ }^{\text {A }}$ | $5.94{ }^{\text {A }}$ | $4.58{ }^{\text {A }}$ | $5.80{ }^{\text {A }}$ |
| Knot size | $6.55{ }^{\text {A }}$ | $4.66{ }^{\text {B }}$ | $4.47{ }^{\text {B }}$ | $5.33{ }^{\text {AB }}$ | $2.88^{\text {C }}$ |
| Knot shape | $5.80{ }^{\text {AB }}$ | $4.27{ }^{\text {BC }}$ | $2.75{ }^{\text {CD }}$ | $6.70{ }^{\text {A }}$ | $2.07{ }^{\text {D }}$ |
| Spike knots | $2.06{ }^{\text {BC }}$ | $3.72{ }^{\text {AB }}$ | $1.35{ }^{\text {c }}$ | $5.05{ }^{\text {A }}$ | $1.15{ }^{\text {C }}$ |
| Ring density | $4.86{ }^{\text {A }}$ | $5.75{ }^{\text {A }}$ | $4.51{ }^{\text {AB }}$ | $4.39{ }^{\text {AB }}$ | $3.23{ }^{B}$ |
| Dry knots | $1.45{ }^{\text {C }}$ | $5.51{ }^{\text {A }}$ | $1.48{ }^{\text {C }}$ | $1.66{ }^{\text {C }}$ | $3.41^{\text {B }}$ |
| Knot groups | $5.54{ }^{\text {AB }}$ | $6.07{ }^{\text {A }}$ | $2.95{ }^{\text {C }}$ | $3.69{ }^{\text {BC }}$ | $3.07{ }^{\text {C }}$ |
| Knot checks | $1.95{ }^{\text {B }}$ | $5.48{ }^{\text {A }}$ | $2.28{ }^{\text {B }}$ | $2.54{ }^{\text {B }}$ | $1.74{ }^{B}$ |
| Ring contrast | 5.21 ${ }^{\text {A }}$ | $3.48^{B}$ | $4.10{ }^{\text {AB }}$ | $3.52^{\text {B }}$ | $4.58{ }^{\text {AB }}$ |
| Ring pattern | $5.13{ }^{\text {A }}$ | $2.91{ }^{\text {B }}$ | $4.22^{\text {AB }}$ | $3.15{ }^{\text {B }}$ | $5.16{ }^{\text {A }}$ |
| Wood density | $4.47^{\text {A }}$ | $4.40^{\text {A }}$ | $4.60{ }^{\text {A }}$ | $4.18^{A}$ | $4.80{ }^{\text {A }}$ |
| Hardness | $4.80{ }^{\text {A }}$ | $4.59{ }^{\text {A }}$ | $4.95{ }^{\text {A }}$ | $4.22{ }^{\text {A }}$ | $4.78{ }^{\text {A }}$ |
| Smoothness | $4.16{ }^{\text {AB }}$ | $3.07{ }^{\text {B }}$ | $4.48{ }^{\text {A }}$ | $3.43{ }^{\text {AB }}$ | $4.27{ }^{\text {AB }}$ |
| Pitch | $3.04{ }^{\text {A }}$ | $2.65{ }^{\text {A }}$ | $3.06{ }^{\text {A }}$ | $2.79{ }^{\text {A }}$ | $3.24{ }^{\text {A }}$ |
| Checks | $1.00^{B}$ | $2.65{ }^{\text {A }}$ | $1.00^{B}$ | $1.40^{\text {B }}$ | $1.05^{\text {B }}$ |
| End checks | $1.00^{4}$ | $1.12{ }^{\text {A }}$ | $1.22^{\text {A }}$ | $1.23{ }^{\text {A }}$ | $1.00^{4}$ |

Identical superscripts indicate no statistical difference in sensory score (Tukey-Kramer test, $P<0.05$ )
Maximum score in bold; minimum score in italic
for ten sensory attributes: homogeneity, surplus color, ring contrast, ring density, checks, knot groups, dry knots, spike knots, knot shape, and knot size (see Table 4).

According to the Tukey-Kramer test, sample deckings made from biocide-treated wood differed significantly for 16 sensory attributes: lightness, hue, saturation, homogeneity, stain, ring density, ring contrast, ring pattern, smoothness, checks, knot groups, dry knots, spike knots, knot shape, knot size, and knot checks (see Table 5).

Differences between the copper-treated sample deckings and the biocide-treated sample deckings were also evaluated using mean scores for each deck as the basis (Table 6). The copper-treated sample deckings had significantly lower scores for hue compared to the sample deckings from bio-cide-treated wood. The copper-treated sample deckings were somewhat more saturated, somewhat darker, and had more surplus color. The copper-treated sample deckings also had somewhat more checks. Knot properties did not differ significantly between the copper-treated and the bio-cide-treated sample deckings (see Table 6).


Fig. 2. Partial least squares (PLS) 1 plot (one dimension, only one principal component, $P$ C1). Loadings for the different sensory attributes (independent variables) for the ten decks and the consumer preference (dependent variable, italic bold)

Table 6. Comparison of mean scores for copper-treated sample deckings and biocide-treated sample deckings using $F$ tests

| Dependent variable | Mean score <br> (copper/biocide) | DF | F | Probability <br> $>F$ |
| :--- | :--- | :---: | :---: | :---: |
| Lightness | $4.43 / 5.39$ | 1.8 | 6.39 | 0.035 |
| Hue | $1.58 / 6.57$ | 1.8 | 117 | $<0.0001$ |
| Saturation | $5.85 / 4.70$ | 1.8 | 7.97 | 0.022 |
| Homogeneity | $4.52 / 5.07$ | 1.8 | 0.51 | 0.49 |
| Stains | $3.78 / 3.04$ | 1.8 | 1.04 | 0.34 |
| Surplus color | $6.10 / 2.87$ | 1.8 | 26.6 | 0.0009 |
| Gloss | $2.52 / 2.64$ | 1.8 | 0.26 | 0.62 |
| Knot homogeneity | $5.28 / 5.49$ | 1.8 | 0.31 | 0.59 |
| Knot size | $4.13 / 4.78$ | 1.8 | 0.63 | 0.45 |
| Knot shape | $4.51 / 4.32$ | 1.8 | 0.032 | 0.86 |
| Spike knots | $3.55 / 2.67$ | 1.8 | 1.01 | 0.34 |
| Ring density | $4.74 / 4.55$ | 1.8 | 0.12 | 0.74 |
| Dry knots | $3.03 / 2.70$ | 1.8 | 0.11 | 0.75 |
| Knot groups | $3.93 / 4.27$ | 1.8 | 0.19 | 0.68 |
| Knot checks | $2.11 / 2.80$ | 1.8 | 0.94 | 0.36 |
| Ring contrast | $5.00 / 4.18$ | 1.8 | 2.93 | 0.13 |
| Ring pattern | $4.95 / 4.11$ | 1.8 | 2.21 | 0.18 |
| Wood density | $4.65 / 4.49$ | 1.8 | 1.03 | 0.34 |
| Hardness | $4.66 / 4.67$ | 1.8 | 0.0018 | 0.95 |
| Smoothness | $3.19 / 3.88$ | 1.8 | 6.5 | 0.034 |
| Pitch | $2.84 / 2.95$ | 1.8 | 0.93 | 0.36 |
| Checks | $2.47 / 1.42$ | 1.8 | 6.1 | 0.038 |
| End checks | $1.83 / 1.11$ | 1.8 | 37.9 | 0.0003 |

Loadings from the PLS1 (partial least squares regression model to set a single dependent variable) analysis are plotted in Fig. 2. Both samples from copper-treated sample deckings and biocide-treated sample deckings are included. Visual inspection indicates that the loadings for homogeneity are close to the consumer preferences for PC1 (principal component 1 , the only principal component in this analysis), compared with most of the other sensory attributes. The loadings in a PLS plot map the positional relationship of the different sensory attributes. The result indicates that the sensory attribute homogeneity (i.e., overall visual texture and evenness) is correlated with the respondent's preferences through the other sensory attributes important for homogeneity. Results from the sensory study concluded that the mean value for homogeneity varied between 3.12


Fig. 3. Logistic regression between the dependent ordinal variable preference and overall homogeneity
and 6.22 for the copper-treated sample deckings (see Table 4 ) and between 3.61 and 6.42 for the biocide-treated sample deckings (see Table 5). The variables with loadings farthest away from the consumer preference (preference) were dry knots, surplus color, ring density, stains, and knot homogeneity (see Fig. 2).

Results from an ordinal logistic regression between stated consumer preferences and mean sensory homogeneity (mean score for the judgment of the 11 assessors) for each of the ten sample decking materials are presented in Fig. 3. The relationship between homogeneity (overall visual texture and evenness) and the stated preference was positive and statistically significant ( $n=221, D F=1, \chi^{2}=$ $28.9, P<0.0001$ ) for both the copper- and the biocidetreated sample deckings. Probability for preference scores 1,2 , and 3 ("do not like") was high when the homogeneity score was low, and the probability for preference scores 7, 8 , and 9 ("like the sample decking") increased with increasing overall homogeneity (Fig. 3).

The significant relationship between homogeneity and preference data indicates that consumer preferences can be predicted from the homogeneity of the surface of the samples. A model for homogeneity was estimated by the means of PLS1: homogeneity was the dependent variable and the remaining sensory attributes were independent variables. The PLS1 regression was performed on data for all sample deckings.

Departing from a full model, including all 22 sensory attributes, a recursive modeling procedure was used to achieve a parsimonious model. Irrelevant sensory variables were discarded based on the loading values and warnings given by the statistical software Unscrambler. The final model is presented in Fig. 4. The model included six explanatory variables (dry knots, splay knots, knot checks, knot shape, stains, and surplus color) and two principal components.

Surplus color and stains are related to the manufacturing process of the decking products. All remaining sensory attributes were related to knots, indicating that properties
related to knots constitute the most important wood properties related to surface homogeneity of wooden decking materials. To model homogeneity based on wood properties only, a PLS1 model containing dry knots, splay knots, and knot shape was estimated (Fig. 5, Table 7). When ana-


Fig. 4. PLS1 analysis: loadings from model 1 (dependent variable in italic bold)


Fig. 5. PLS1 analysis: loadings from model 2 (dependent variable in italic bold)
lyzing the same relationship with a multiple regression, spike knot contributed significantly $(P=0.008)$, whereas dry knot and knot checks received $P$ values of 0.06 and 0.05 , respectively. The $P$ value for knot shape was as low as 0.15 .

Parameter estimates and loadings for both PLS1 models are reported in Table 7. All parameter estimates are negative, except knot shape in model 1, implying that increased intensity of the variables has a negative effect on homogeneity. The effect of knot shape is ambiguous because the parameter estimates have opposite signs in model 1 and model 2 (Table 7). Also, in model 2 the parameter estimate for knot shape is close to zero. Because all the independent variables have the same range (values from 1 to 9 ), the size of the regression coefficients implies the relative importance of the variables in the regression model. Furthermore, the loadings give information about the relative importance of each variable on the dependent variable. Independent variables with loadings that differ substantially from the loading of the dependent variable are of more importance than loadings close to the dependent variable. The $r^{2}$ values in Table 7 are the coefficients of determination from the cross-validation of the models (The Unscrambler).

## Discussion

The study explores the concept of visual homogeneity, which has been identified in various previous studies but has not been subject to elaborate investigation. Furthermore, the study presents an empirical model for surface homogeneity of wood surfaces made from pressure-treated pine. Results from previous empirical studies indicate that there is a close relationship between the visual impression of wood surfaces and stated preference for wood products. ${ }^{3-5}$ Broman ${ }^{3}$ analyzed aesthetic features of wood and identified a set of key concepts that described respondents' attitudes toward wood products. According to his results, the most important feature of a wooden surface is the perceived harmony of the surface. Nyrud et al. ${ }^{5}$ provided empirical evidence that Broman's concept of harmony is related to the degree of homogeneity in the surface of wood

Table 7. Partial least squares (PLS)1 models predicting surface homogeneity of sample deckings, loadings, and parameter estimates: model 1 refers to Fig. 4 and model 2 refers to Fig. 5

| Model | $r^{2}(\%)$, <br> cross-validation $^{\text {a }}$ | Variable | Parameter <br> estimates | Loading |  |
| :--- | :--- | :--- | :--- | :--- | ---: |

[^2]products. Therefore, harmony can be identified with homogeneous visual texture (homogeneity).

Results from multivariate statistics and logistic regression indicate that consumers' stated preference for wood products is closely related to the sensory attribute homogeneity. This attribute is subsequently modeled based on the remaining sensory attributes measured by the sensory panel. The results imply that measurements of visual wood properties can be used to model the visual homogeneity of a wooden surface and that the perceived harmony of a surface can successfully be modeled from data about wood features such as knot properties. The result corresponds to previous research and implies that subjective evaluation of wood surfaces, such as preference, can be modeled using wood properties.

The results demonstrate that surface homogeneity is influenced by visual wood properties. According to the results from the statistical model, surface homogeneity can be modeled as a function of knot shape and knot defects as well as residual color from the pressure treatment. It is concluded that homogeneity can be given as a parsimonious model with only six independent variables (stains, surplus color, knot shape, dry knots, spike knots, and knot checks). The results therefore indicate that surface homogeneity is determined by wood quality and by properties related to treatment method and the manufacturing process.

Focusing on wood quality, a second model was estimated using only wood properties (i.e., knot shape, dry knots, spike knots, and knot checks). The explanatory power of this second model is inferior to the previous model, but it still provides sufficient results for predicting surface homogeneity, and Broman's ${ }^{3}$ concept of visual harmony can therefore be modeled using information about the wood quality of a given product. Thus, it is likely that surface homogeneity can be modeled using wood properties for all types of visual wood products.

From the models, it is evident that knot properties influence the visual homogeneity of, and thus the preference for, wood surfaces. The results coincide with previous research conducted in Japan. Nakamura and Kond ${ }^{13}$ examined why knots are perceived to be a poor visual characteristic of the wood surface; they compared the number of knots in wood panels with subjective perception of knots. The results revealed that there was a clear linear relationship between the number of knots in the wood and the subjective perception of the knots. Nakamura and Kondo concluded that clear wood leads to more relaxed eye patterns than knotty wood. This opinion corresponds with the results reached in the present study and in Broman's previous studied. ${ }^{3}$

Most consumers have no experience in evaluating wood products and are, in particular, less experienced with differentiating wood material samples according to quality compared to professional graders. In particular, persons with little or no experience can have difficulties detecting small variations in quality, as was the case in the present study; the quality difference between some of the sample decking materials was fairly small. Furthermore, discrete variables, such as the nine-point scale, usually exhibit larger measurement error than continuous variables. Because
preference is a subjective matter, the dependent variable will exhibit considerable variation for all values of the independent variables. Because of this, the diagnostic statistics ( $P$ values and $r^{2}$ values) from PLS1 models and the multiple regressions were low (see Table 7). The models explaining product homogeneity had plausible parameter estimates.

In general, the results should be relevant for decision makers involved in forest product sales and marketing as well as architects and professionals in building design and construction. Raw material quality is important with respect to providing a harmonious surface property; wood qualities with few knots and an even knot structure should be preferred for visual products. However, the results indicate that it is equally important to avoid production defects. The wood processing industry should therefore take care to choose appropriate raw material quality as well as conduct manufacturing and treatment properly to avoid color stains.

Architects and professionals in building design and construction should take into account the results from the present study when using visual wood products. To exploit possible beneficial effects of wood surfaces and create a pleasant, harmonious visual atmosphere, the wood used should exhibit homogeneous surface properties. Results obtained from the model indicate that homogeneous surface properties are wood properties with few knots and/or even knot structure. Visual defects such as dry knots should be avoided. In addition, surface-treated wood should not exhibit visual defects from the manufacturing process such as stains or cracks.

Future research should evaluate the relationship between surface homogeneity and consumer preferences for other wood products. The results discussed here are probably relevant for other visual wood products, but this relationship should also be established through research. Furthermore, the relationship between surface homogeneity and Broman's concept of harmony should be elaborated. Previous research indicates that there is a relationship between the use of building materials from wood and the well-being of the building's inhabitants ${ }^{14,15}$ The present study is of relevance in this respect as the beneficial effects of wood will probably be strengthened by using wood surfaces that have advantageous visual characteristics, i.e., when the surface has a homogeneous, harmonious appearance. It is likely that the perceived harmony of a visual wood product has beneficial psychological effects on the consumer's environment, but there may also be a reverse effect of disharmonious wood surfaces. For visual wood products used in outdoor environments, the effects of weathering should also be investigated. Exposure to outdoor climate affects the appearance of wood products, and such weathering effects will probably influence people's preferences as well.

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[^1]:    ID, identification
    All deckings were made of Scots pine

[^2]:    PC, principal component
    ${ }^{\text {a }}$ The $r^{2}$ values are the coefficients of determination from the cross-validation of the models (The Unscrambler)

