

Analysis of flavour compounds and prediction of sensory properties  
in sea buckthorn (*Hippophaë rhamnoides L.*) berries

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1 **Running title:** Flavour compounds of sea buckthorn berry

2

### 3 **Summary**

4 The aim of this study was to investigate sugars, organic acids, flavonol glycosides (FGs),  
5 proanthocyanidins, and volatiles as flavour compounds in sea buckthorn (SB) berries of five  
6 cultivars and to predict the sensory properties of berries. The profiles of flavour compounds in  
7 SB berries varied significantly among the cultivars. Total proanthocyanidins and FGs were  
8 highest in ‘Pertsik’ and ‘Raisa’, respectively. Total volatiles was highest in ‘Vorobyevskaya’  
9 and lowest in ‘Raisa’. A previously established PLS model was used to predict the sensory  
10 properties of SB berries based on the non-volatile flavour compounds. The mouth-drying  
11 astringency can be predicted the most reliably, which has the highest regression coefficients  
12 with quinic acid, isorhamnetin-3-*O*-sophoroside-7-*O*-rhamnoside and total proanthocyanidins.  
13 Bitterness cannot be predicted using the model. ‘Pertsik’ berries were predicted to be more  
14 mouth-drying astringency and sour than those of ‘Raisa’. **The research supports the cultivar**  
15 **selection in cultivation and industry of SB berries.**

16 **Keywords**

17 Flavour compounds; *Hippophaë rhamnoides*; Predicted sensory properties; Sea buckthorn

## 18 **Introduction**

19 Berries are rich in dietary fiber, micronutrients and different functional bioactive compounds,  
20 such as phenolic compounds, but also a challenge explained by the perceived sensory quality  
21 of the berry (Jimenez-Garcia *et al.*, 2013; Laaksonen *et al.*, 2016). Sea buckthorn (SB,  
22 *Hippophaë rhamnoides* L.) berry is regarded as a food raw material of high value and a source  
23 of many essential nutrients and bioactive compounds that have been linked to various health  
24 benefits, such as reducing the risk of type 2 diabetes and coronary heart diseases (Bal *et al.*,  
25 2011; Olas 2018). Despite these nutritional and health-promoting properties, the sensory  
26 quality of SB berries limited their consumption, due to their intense sourness, perceived  
27 astringency and bitterness, coupled with a very low degree of sweetness (Laaksonen *et al.*,  
28 2016).

29 Chemical constituents of the berries have strong impacts on the sensory quality, thus  
30 affecting the consumer liking and acceptance of berries and berry products. The ratio between  
31 sweetness (sugars) and sourness (acids) has been regarded as a critical factor affecting the  
32 sensory quality of berries (Tiitinen *et al.*, 2005). In SB berry, intense sourness induced mainly  
33 by abundance of malic acid would have a negative influence on the pleasantness (Laaksonen  
34 *et al.*, 2016; Ma *et al.*, 2017a). The astringent and bitter of SB berries have been reported to  
35 have a correlation with the contents of flavonols, proanthocyanins (PAs) and ethyl  $\beta$ -D-  
36 glucopyranoside (EG) (Ma *et al.*, 2017a; Ma *et al.*, 2017b). Besides these non-volatile  
37 compounds, odour-active volatiles have crucial influence on the sensory quality of SB berries  
38 (Lundén *et al.*, 2010). The amount of ethanol correlated with the intensity of pungent odour,  
39 and the concentration of propyl 2-methylbutanoate is related to the fermented odour (Lundén  
40 *et al.*, 2010; Tiitinen *et al.*, 2007). Previous researches has revealed that olfactory stimuli  
41 accompanying with sweet or sour-tasting foods may induce the enhancement of the associated  
42 taste quality in fruit (Schwieterman *et al.*, 2014; Sung *et al.*, 2019). Moreover, aroma is also a

43 good indicator of freshness, quality and authenticity of SB products (Caprioli *et al.*, 2016;  
44 Tiitinen *et al.*, 2006).

45 Extensive variations of SB berries in chemical composition have been revealed among  
46 subspecies or cultivars. Among the cultivars of *H. rhamnoides* ssp. *mongolica*, ‘Chuiskaya’  
47 berries had the most abundant fructose, and level of malic acid was the highest in ‘Pertsik’  
48 (Zheng *et al.*, 2012). The total content of flavonol glycosides (FGs) varied from 23 to 250  
49 mg/100 g fresh berries of *H. rhamnoides* ssp. *sinensis* and ssp. *mongolica* (Ma *et al.*, 2016).  
50 The origin brought the variance in the volatile profile of SB, e.g. the content of ethyl hexanoate  
51 varied from 50 to 1692 µg/kg fresh berries among 4 cultivars, and the concentration of ethyl  
52 butanoate ranged between 1.2–450 µg/kg among 13 cultivars (Lundén *et al.*, 2010; Vítová *et*  
53 *al.*, 2015). These aforementioned compounds have been well documented in previous research,  
54 however, most of the studies on chemical composition of SB berries have been focused on  
55 identifying new compounds or only quantifying specific components. Currently, there is  
56 limited information on the content of compounds contributing to the flavour of SB berries of  
57 specific subspecies and cultivars. Obtaining a comprehensive and systematic quantitative  
58 compositional data is needed in order to improve the current understanding of the flavour  
59 chemistry of SB berries.

60 The present study was focused on investigation and comparison of the profiles and contents  
61 of sensory-related non-volatile compounds (sugars, organic acids and phenolic compounds)  
62 and volatile compounds in berries of five selected SB cultivars cultivated in Finland and  
63 Estonia, as well as the prediction of sensory properties of those berries. The ultimate goal of  
64 the study is to produce comprehensive and systemic knowledge on composition of flavour  
65 compounds in sea buckthorn, and to investigate the correlation of the key components to the  
66 sensory properties in prediction model.

## 67 **Materials and Methods**

### 68 **Berry samples**

69 The berries of sea buckthorn cultivars ‘Pertsik’ and ‘Raisa’ were harvested on August, 2015,  
70 at Turku, Finland. The berries of cultivars ‘Botanitsheskaja ljubitel'skaja (Bot-lju)’, ‘Askola’,  
71 and ‘Vorobyevskaya’ were harvested on September, 2015, at Rõhu Experimental Station of  
72 Estonia. Berries were hand-picked when they were optimally ripe as defined by local  
73 experienced horticulturists, frozen immediately at  $-20\text{ }^{\circ}\text{C}$ , and stored until analyses.

### 74 **Quantification of sugars, ethyl $\beta$ -D-glucopyranoside, and organic acids**

75 Juices were manually pressed from thawed sea buckthorn berries as described before (Ma *et*  
76 *al.*, 2017a). Individual major sugars and organic acids as well as ethyl  $\beta$ -D-glucopyranoside  
77 (EG) were analyzed with gas chromatography (Shimadzu GC-2010 Plus, Kyoto, Japan) as  
78 trimethylsilyl (TMS) derivatives. Briefly, a sample of 1  $\mu\text{L}$  was injected via an AOC-20 auto  
79 sampler, then detected with a flame ionization detector (FID). The parameters were the same  
80 as described earlier (Ma *et al.*, 2017a). The sugars, EG, and acids were identified by analysis  
81 of samples spiked with the reference compounds (Zheng *et al.*, 2009). The internal standards  
82 sorbitol (Fluka, Buchs, Switzerland) and tartaric acid (Merck, Darmstadt, Germany) were used  
83 for quantification of sugars and acids, respectively. EG was quantified as glucose (Fluka, Buchs,  
84 Switzerland).

### 85 **Quantification of phenolic compounds in sea buckthorn berry**

86 The method of extracting flavonol glycosides (FGs) sea buckthorn berries was performed  
87 according to our previous method (Ma *et al.*, 2016). FGs were analysed using a Shimadzu  
88 Nexera ultrahigh performance liquid chromatograph UHPLC system (Shimadzu Corporation,  
89 Kyoto, Japan). The analysis procedure was controlled by Shimadzu workstation LabSolutions

90 (version 5.42SP3). The samples were separated on a Phenomenex Aeris peptide XB-C18 (3.6  
91  $\mu\text{m}$ ,  $150 \times 4.60$  mm) column. The chromatographic conditions were the same as described  
92 previously (Ma *et al.*, 2017b). The peaks were monitored at 360 nm. Identification of FGs was  
93 based on reference compounds and the results described earlier (Ma *et al.*, 2016; Zheng *et al.*,  
94 2016). Quantification of all the FGs was carried out as applied earlier, using calibration curves  
95 constructed with quercetin-3-*O*-rutinoside, quercetin-3-*O*-glucoside, isorhamnetin-3-*O*-  
96 glucoside and isorhamnetin-3-*O*-rutinoside ( $\geq 99\%$ , Extrasynthese, Genay, France) as the  
97 external standards (Ma *et al.*, 2016).

98 Extraction and purification of proanthocyanidins from the SB berries were performed as  
99 described previously (Yang *et al.*, 2016b). The quantification of PA oligomers (dimers, trimers  
100 and tetramers) was conducted with HILIC-ESI mass spectrometry in positive ion mode using  
101 single ion recording (SIR) method, whereas the content of total PAs was determined according  
102 to the Brunswick Laboratories 4-dimethylaminocinnamaldehyde (BL-DMAC, Sigma-Aldrich,  
103 St. Louis, MO) assay (Yang *et al.*, 2016b). The contents of oligomeric PAs and total PAs were  
104 detected using the standard curves of procyanidin B2 ( $\geq 99\%$ , Extrasynthese, Genay, France),  
105 and quantified as procyanidin B2 equivalents.

#### 106 **HS-SPME-GC-MS profiling of volatile compounds**

107 Extraction of the volatiles from the SB berries by HS-SPME and GC-MS analyses were  
108 carried out with a method previously employed with some modifications (Marsol-Vall *et al.*,  
109 2018). Weighted (20 g) SB puree mixed with an equal amount of 10% NaCl aqueous solution,  
110 then 1.0 g of the slurry was transferred to a 20-mL headspace vial and spiked with 10  $\mu\text{L}$  of the  
111 internal standard solution (neryl acetate at 100  $\mu\text{g}/\text{mL}$  in methanol, Sigma-Aldrich, St. Louis,  
112 MO). The internal standard fulfilled the criteria as described in our previous study (Marsol-

113 Vall *et al.*, 2018). The samples were incubated and the collection of the volatiles by HS-SPME  
114 was carried out with a 1-cm SPME fiber as described in Marsol-Vall *et al.*, (2018) for 20 min.

115 After the extraction, GC-MS analyses were carried out with a HP 6890 Series (HP Hewlett-  
116 Packard, Little Falls, DE) gas chromatograph system coupled to a 5973 Mass Selective detector  
117 (HP Hewlett-Packard). The SPME fiber was desorbed into the injection port equipped with an  
118 SPME liner at 220 °C for 20 min. Volatile compounds were separated with a DB-WAX column  
119 (60 m x 0.25 mm i.d.; 0.25 µm film thickness) from Agilent Technologies (Palo Alto, CA)  
120 using helium as carrier gas (1.4 mL/min). The oven was temperature programmed from 50 °C  
121 (hold for 3 min) to 190 °C at a rate of 5 °C/min, hold at 190 °C for 10 min. Mass spectra were  
122 recorded in electron impact (EI) mode at 70 eV within the mass range  $m/z$  40–300. The transfer  
123 line and the ionization source were thermostated at 200 and 220 °C, respectively. The system  
124 was operated with HP ChemStation software (B.01.00).

125 Identification of volatile compounds was carried out as detailed in previous works by mass  
126 spectra match (direct match > 800) and comparison of linear retention indexes (RI) calculated  
127 with an homologous series of *n*-alkanes (C<sub>9</sub>-C<sub>30</sub> from Supelco) with those available in the Nist  
128 WebBook (Lindstrom and Mallard 1998; Marsol-Vall *et al.*, 2017; Marsol-Vall *et al.*, 2018).  
129 Total ion current (TIC) was used for peak area integration. Quantitation of volatiles was carried  
130 out using neryl acetate assuming no differences in response factors among the quantified  
131 volatiles.

### 132 **The prediction of sensory properties**

133 In previously established PLS model, sensory characteristics of the SB purees were  
134 evaluated using a generic descriptive analysis, and the intensities of the attributes were rated  
135 from 0 (none) to 10 (very strong) with the help of anchored reference samples as described in  
136 the Ma *et al.*, (2017b). The PLS model and the compositional data of the non-volatile

137 compounds (n=41, X-data) were used to predict the sensory properties (Y-data) of SB berries  
138 in this study. The predictions were made for the sweetness, sourness, bitterness, mouth-drying  
139 and puckering astringency, as well as total intensity of flavour of berries.

## 140 **Statistical analysis**

141 All samples were prepared and analysed in triplicates. The SPSS statistical package (version  
142 22.0, SPSS, Inc., Chicago, IL, U.S.A.) was used. All the data were expressed as the means  $\pm$   
143 SD (standard deviations). One-way analysis of variance (ANOVA) with Tukey's honest  
144 significant difference (HSD) post hoc tests was carried out for multiple comparisons.

145 Unsupervised classification with principal component analysis (PCA) was used to  
146 investigate variations in the non-volatile sensory-related compounds (n = 41) and volatiles (n  
147 = 50) of the SB berries of different cultivars. Partial Least Squares (PLS) regression model  
148 from the earlier study was applied to predict the sensory qualities of the five cultivars in this  
149 study with all non-volatile compounds as X-data (n = 41) and sensory variables as Y-dat. An  
150 additional PLS regression model was created using only the most significant X-variables (n =  
151 15) in first model. Full cross-validation was used to estimate a number of factors for statistically  
152 reliable models. Root mean square error (RMSE) of cross-validation was used to examine the  
153 error in the predicted models. Multivariate models were created with Unscrambler 10.3 (Camo  
154 Process AS, Oslo, Norway).

## 155 **Results and Discussion**

### 156 **The contents of individual sugars, organic acids and ethyl $\beta$ -D-glucopyranoside**

157 Glucose appeared the most numerous sugar among all cultivars studied, the content of which  
158 ranged from 0.5 to 4.6 g/100 mL (Table 1). Followed by fructose and L-quebrachitol, the  
159 concentrations of these compounds varied from 0.2 to 1.7 g/100 mL and 0.2 to 0.4 g/100 mL,



160 respectively. 'Raisa' berries had the highest content of EG (0.7 g/100 mL), which indicated  
161 that EG might play a more important role in the sensory quality of 'Raisa' than in other cultivars,  
162 due to the contribution of EG to bitterness (Ma *et al.*, 2017a). Malic acid was as the most  
163 abundant acid with the content varying from 3.0 to 6.9 g/100 mL. Quinic acid had the highest  
164 content in the berries of 'Raisa' (3.9 g/100 mL). Citric acid was present at lower levels  
165 (0.03–0.08 g/100 mL) than malic and quinic acids. The highest sugar to acid ratio was found  
166 in 'Vorobyevskaya' (1.3). Thus, the berries of 'Vorobyevskaya' were expected to be perceived  
167 sweeter than the berries of other cultivars studied (Tiitinen *et al.*, 2005).

### 168 **Phenolic profiles in sea buckthorn berries**

169 Ten major flavonol glycosides (FGs) were detected and quantified in this study as described  
170 previously (Ma *et al.*, 2017b), of which the sum was taken as total FGs (Table 1). Only the  
171 glycosides of isorhamnetin (Is, 85.7–95.2 %) and quercetin (Qu, 4.8–14.3 %) were detected in  
172 studied samples. Isorhamnetin-3-*O*-rutinoside (I-3-R, 21.4–35.6 % of total FGs) and  
173 isorhamnetin-3-*O*-glucoside-7-*O*-rhamnoside (I-3-G-7-Rh, 28.5–35.2 % of total FGs) were the  
174 two most abundant FGs in all the samples (Table 1). The latter compound had been reported to  
175 have a close association with the astringent attributes of SB berries (Ma *et al.*, 2017b). The  
176 content of total FGs varied significantly from 35.0 to 158.4 mg/100g fresh berry among all the  
177 cultivars ( $p < 0.05$ , Table 1), nearly 5-fold. 'Raisa' had the highest content of most FGs,  
178 whereas, the lowest contents of FGs existed in 'Bot-lju' ( $p < 0.05$ ).

179 Besides flavonol glycosides in SB berries, compounds belonging to other groups of  
180 polyphenols, i.e. oligomeric proanthocyanidins (PAs) and total PAs were also determined in  
181 the samples studied.

182 As reported previously, only B-type PAs were found in the SB berries, PA dimers, trimers  
183 and tetramers were the principal constituents of PA oligomers (Kallio *et al.*, 2014; Yang *et al.*,  
184 2016b). The contents of PA dimers, trimers, tetramers and total PAs were shown in the Table

185 1. Among the cultivars, ‘Pertsik’ presented the lowest contents of oligomeric PAs, but the  
186 highest content of total PAs ( $p < 0.05$ ). The highest contents of oligomeric PAs and the lowest  
187 content of total PAs were found in ‘Vorobyevskaya’ and ‘Bot-lju’, respectively ( $p < 0.05$ ). In  
188 all the samples, the contents of prodelphinidins (PDs), such as Dim-3 and PD-based Tri-3  
189 dominated in oligomeric PAs. It was worth noting that quantified as procyanidin B2  
190 equivalents, oligomeric PAs only accounted for a small portion (4–23%) of total PAs, since the  
191 content of total PAs based on the BL-DMAC method not only covered the oligomeric PAs, but  
192 also covered both monomeric PAs and polymeric PAs (degree of polymerization  $> 4$ ).

### 193 **Volatile profiles in sea buckthorn berries**

194 The 45 volatile compounds were found in the SB berries under study (Table 2), most of  
195 which have already been reported previously in SB (Leung and Marriott 2016; Socaci *et al.*,  
196 2013; Tiitinen *et al.*, 2006). However, it is likely that the few compounds from the ester  
197 chemical group were the major volatile compounds responsible for the particular aroma of SB  
198 as alcohols, aldehydes, hydrocarbons and ketones were all found below their reported odor  
199 threshold (George 2009). It is, however, important to recognize that the analysis method used  
200 in this study is semi-quantitative and the juice matrix has significant impact on the odor  
201 thresholds of aroma compounds. It has to be noted that esters represented at least 88% of the  
202 total volatile profile in all the cultivars. ‘Vorobyevskaya’ was strongly linked to the esters  
203 (41187  $\mu\text{g}/\text{kg}$ ) involved compounds 21, 6 and 16 (Table 2). ‘Raisa’ presented the lowest  
204 content of esters (12915  $\mu\text{g}/\text{kg}$ ). Considering their contents in the samples and the odor  
205 thresholds reported in the literature (George 2009; Lundén *et al.*, 2010), compounds 2, 5, 6, 16,  
206 18, 19, 21, 31, 33 and 41 were considered to be the key volatile components (bold in Table 2),  
207 which were expected to have a contribution on the aroma of the studied cultivars.

208 Compounds 5 and 6 both presented a fruity and apple like odorant, which were found at  
209 higher contents in ‘Vorobyevskaya’, 1147 and 2290  $\mu\text{g}/\text{kg}$ , respectively (Table 2). Compound

210 16, a fruity berry-like odorant, was found in a heterogeneous distribution, being the lowest in  
211 'Askola' (2871  $\mu\text{g}/\text{kg}$ ) and the highest in 'Vorobyevskaya' (7216  $\mu\text{g}/\text{kg}$ ). Compound 21 has  
212 been described as fermented, spoiled and compost in SB berries by GC-O (Lundén *et al.*, 2010)  
213 and was found to be particularly high in 'Bot-lju' (16257  $\mu\text{g}/\text{kg}$ ). Compound 31 had been  
214 reported to have a coconut, synthetic aroma (Lundén *et al.*, 2010) and was found to be  
215 especially high in 'Vorobyevskaya' (2379  $\mu\text{g}/\text{kg}$ ). This compound is reported to have an odor  
216 threshold of 92  $\mu\text{g}/\text{kg}$  indicating its contribution to the SB aroma (George 2009). Moreover, it  
217 has been found that terpene flavour induced by terpene compounds, such as compounds 9 and  
218 13, was related to the consumer negative perception of fruit (Sung et al 2019).

219 Importantly, internal-standard mixture was employed to correct any possible analytical  
220 deviation caused by variations in the performance of the fiber and instrumentation, considering  
221 negligible difference in the affinity of the fiber with the volatiles. Hence, quantitation of  
222 volatiles was based on this approach. This limitation of volatile analysis should be considered  
223 when the results are interpreted.

#### 224 **Comparison of the sea buckthorn cultivars**

225 PCA models were applied as a multivariate data analysis technique to display more detailed  
226 information of the differences and similarities among the cultivars (Figure 1). In the PCA  
227 model of non-volatile sensory-related compounds, the first two validated principal components  
228 shown in Figure 1A explained 73% of the variance of the data ( $n = 41$ ). 'Raisa' was located on  
229 the right side of the plot with a higher content of FGs and organic acids, such as I-3-R and  
230 quinic acid. 'Askola' was located in the middle of the plot with the least abundance of glucose  
231 and total sugars, but the highest abundance citric acid. Whereas 'Vorobyevskaya' berries had  
232 the closest association with the content of oligomers of PAs and sugars locating on the left of  
233 the plot. The second component (PC2) discriminated 'Bot-lju' and 'Pertsik' from the other

234 cultivars. The ‘Bot-lju’ berries had the lowest content of most phenolic compounds, while the  
235 berries of ‘Pertsik’ contained the highest content of total acids and total PAs. This highlights  
236 the importance of the non-volatile composition, which could be most influential in  
237 discriminating among the different cultivars of sea buckthorn.

238 In the PCA model of volatile compounds, the first two validated principal components  
239 shown in Figure 1B explained 74% of the variance of the data (n = 50). ‘Raisa’ was located on  
240 the right side of the plot with the lowest content of total volatiles and compound 33, but the  
241 highest content of compound 41 (Table 2). The ‘Bot-lju’ was located on the left side with the  
242 least abundance of compounds 5, 6, 31, 41, but the highest content of compounds 21 and 33.  
243 The compound 21 was described as fermented and spoiled odor by GC-O (Lundén *et al.*, 2010).  
244 The cultivars ‘Pertsik’ and ‘Askola’ were located in the middle of the plot. ‘Pertsik’ was rich  
245 in compound 17 and the berries of ‘Askola’ had the highest content of compounds 28 and 30.  
246 The second component (PC2) discriminated ‘Vorobyevskaya’ from all other 4 cultivars  
247 correlating with the most abundant compounds 2, 5, 6, 19 and 31.

248 **Importantly, besides cultivars, other climatic and environmental conditions affected by the**  
249 **location of the growth sites may also have contributed to the contents and compositions of**  
250 **compounds in the berries, which have to be considered when interpreting the results.**

### 251 **The prediction of sensory properties**

252 The chemical composition has strong correlation with the intensities of sensory attributes in  
253 the SB berries (Ma *et al.*, 2017b; Ma *et al.*, 2017a; Tiitinen *et al.*, 2005). **The predicted attributes**  
254 **of the berries of five cultivars commonly were associated with sugars, acids and phenolic**  
255 **compounds (Table 3).** The attribute sourness had the highest  $Q^2$  value (0.808, with 4 factors),  
256 indicating the reliable prediction among attributes, regardless of the high RSME value. The  
257 lowest predictive value was shown in bitterness ( $Q^2$  0.023, with 4 factors) with higher error

258 (RMSE 0.460). The original regression model published in Ma *et al.*, (2017b) showed only  
259 weak interaction between the chemical variables and bitterness, thus indicating that the  
260 bitterness of the five cultivars could not be explained well by the non-volatile chemical  
261 variables studied. Moreover, the variations in the predictions varied notably among the  
262 cultivars (model deviations in Table 3). Variations are the lowest with the cultivar ‘Pertsik’ and  
263 ‘Raisa’, whereas the attributes for other cultivars were not predicted with equal level of  
264 confidence.

265 Table 4 summarized the regression coefficients of the PLS-model of non-volatile chemical  
266 components (n=41) for each attribute. In general, organic acids and phenolic compounds had  
267 positive association with the all predicted attributes, except sweetness. On the other hand, the  
268 pH and sugars showed positive correlation with the sweetness, negative with all the other  
269 attributes. These results were in accordance with previous findings showing that sugars  
270 contributed to the sweetness, phenolic compounds contributed to the astringency, and organic  
271 acids and pH influenced not only sourness but also astringency (Ma *et al.*, 2017a; Peleg and  
272 Noble 1999; Tiitinen *et al.*, 2005). In particular, isorhamnetin-3-O-sophoroside-7-O-  
273 rhamnoside (I-3-S-7-Rh) was a strong factor for all attributes except bitterness (Table 4).  
274 Previously, the content of I-3-S-7-Rh had been found to be closely related to the astringent  
275 attributes of SB purees (Ma *et al.*, 2017b). Besides I-3-S-7-Rh, the contents of I-3-R, Dimer-2  
276 and total PAs were correlated strongly to the predicted mouth-drying astringency. Only one  
277 phenolic compound, isorhamnetin-glucoside, was closely related to the puckering astringency.  
278 EG and quinic acid had close correlation with bitterness (Table 4).

279 In order to improve prediction of the sensory attributes, another model was created based on  
280 the factors showing the highest regression coefficients (n=15, X-data) in the first PLS-model  
281 (Tables 3 and 4). The prediction of the attributes sweetness, sourness and mouth-drying  
282 astringency had notably higher Q<sup>2</sup> values (0.801, 0.866 and 0.900, respectively, with 4 factors)

283 and with lower errors (RMSE values 0.206, 0.450 and 0.114, respectively), indicating the better  
284 explanation compared with other attributes. Especially, mouth-drying astringency can be  
285 predicted the highest reliability. With the more efficient model, the cultivars ‘Raisa’ and ‘Bot-  
286 lju’ were predicted to be less mouth-drying astringent and sour than ‘Pertsik’ and ‘Askola’.  
287 Similarly to the first model, however, model variations were the highest for ‘Askola’ and  
288 ‘Vorobyevskaya’, indicating their significant compositional difference from the original  
289 cultivars in the previous study (Ma *et al.*, 2017b). Again, bitterness was not predicted by these  
290 key components (Table 3).

291 It is important to note here that the prediction in this study was made based on only the non-  
292 volatile compounds, although the volatile compounds will definitely influence the flavour of  
293 SB berries. The prediction of sensory properties of food is a challenging task because of the  
294 influence of complex food matrices. The taste-taste interaction and the taste-aroma interaction  
295 should be taken into account, which may suppress or enhance the perception of individual  
296 compounds in food matrices (Breslin 1996; Keast and Breslin 2003).

## 297 **Conclusions**

298 **The profiles of flavour compounds varied significantly in SB berries of 5 cultivars**  
299 **correlating with the distinct sensory qualities.** Total volatiles was highest in ‘Vorobyevskaya’  
300 and lowest in ‘Raisa’. In ‘Pertsik’ the highest total PAs and in ‘Raisa’ the highest FGs were  
301 noted. The mouth-drying astringency was predicted with high level of reliability using the new  
302 model created with 15 variables of the highest regression coefficients of the first PLS-model.  
303 Bitterness of SB cultivars studied could not be predicted by those variables. Based on the  
304 predictive models, the berries of ‘Pertsik’ were predicted to be more mouth-drying astringency  
305 and sour than those of ‘Raisa’. The composition of flavour compounds can be correlated with

306 the predicted sensory qualities of sea buckthorn berries, which could be used in the future  
307 selection and breeding of superior sea buckthorn cultivars.

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### 311 **Declarations of interest**

312 The authors declare no competing financial interest.

### 313 **Statements**

314 Research data are not shared.

315 **Ethics approval was not required for this research.**

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