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14 **Optimal storage method for mackerel fillets and its quality evaluation using**
15 **hyperspectral imaging analysis**

16
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36 **Abstract**

37 This study was designed to compare the quality changes in mackerel fillets stored under
38 different conditions by using hyperspectral imaging (HSI) techniques. Fillets packaged in
39 vacuum were stored for six days under five different conditions: refrigerated at 4°C (R group);
40 iced at $5 \pm 3^\circ\text{C}$ (I group); kept at an ambient of $17 \pm 2^\circ\text{C}$ (A group); frozen at -18°C for 24 h
41 and thawed in a refrigerator at 4°C for 5 h on the sampling day (FTR group); FTR thawed in
42 tap water instead of thawing in a refrigerator (FTW group). The FTR group had the lowest
43 total bacterial count, drip loss, 2-thiobarbituric acid reactive substances, volatile basic
44 nitrogen, and texture profile analysis values among groups during the entire storage period
45 ($p < 0.05$). Scanning electron microscopy revealed that the FTR group had less damage, while
46 the other groups had shrunken muscle tissues. HSI integrated with the partial least squares
47 model yielded reliable and efficient results, with high R^2_{cv} values, for several quality
48 parameters of the mackerel fillets. Overall, the FTR group, involving freezing and thawing in
49 a refrigerator, appears to be the most favorable option for maintaining the quality of mackerel
50 fillets, which could be practically implemented in the industry. HSI is a suitable and effective
51 technique for determining the quality of mackerel fillets stored under different conditions.

52

53 **Keywords:** Mackerel fillets, optimal storage, freshness, frozen-thawed,. hyperspectral
54 imaging.

55 **Introduction**

56 The freshness of muscle food, especially fish, is vital because it influences consumer
57 purchasing decisions. Fish are prone to quality deterioration owing to the rapid degradation of
58 muscle tissues during the post-mortem period during (Hashimoto et al., 2017). Deterioration
59 of fish quality results in organoleptic changes, such as discoloration and off-flavors, making it
60 undesirable for human consumption. The freshness of fish is difficult to sustain for a longer
61 period because of the high moisture and lipid contents, rapid enzymatic activity, neutral pH,
62 and high microbial proteolysis in fish (Prabhakar et al., 2020; Zhou et al., 2021). Proteolytic
63 activity in fish is affected by several factors such as temperature, muscle pH, water content,
64 genetics, nutrition, age, and gender (Matarneh et al., 2017; Singh and Benjakul, 2018).

65 Among storage methods, freezing is the preferred technique to maintain quality for
66 extended preservation of fish freshness because low temperatures slow down proteolysis and
67 endogenous enzyme activities in muscle food (Chan et al., 2020; Roiha et al., 2018). Thus, the
68 freezing method protects fish tissues from rapid degradation by biological, chemical, and
69 physical processes, such as bacterial growth, oxidation, and dehydration, maintaining their
70 flavor and nutritional value (Duarte et al., 2020; Hassoun et al., 2020; Huang et al., 2021). In
71 contrast, high freezing temperatures trigger proteolytic enzyme activities, decreasing the
72 tenderness and increasing the spoilage of fish (Kaur et al., 2021). High ambient storage
73 temperature (10–25°C) results in rapid degradation of fish quality compared to freezing and
74 refrigerating conditions (Chen et al., 2021; Khoshnoudi-Nia and Moosavi-Nasab, 2019). Ice
75 chilling is the traditional method of storage at low temperatures. However, this is not
76 practically applied in the supply chain and long term storage, because the introduction of
77 cooling technology and the use of ice incurs extra costs for controlling the storage
78 temperature (Cropotova et al., 2019; Magnussen et al., 2008). Therefore, the impact

79 of various storage conditions on the thorough information of quality and shelf life of fish
80 should be assessed.

81 Hyperspectral imaging (HSI) has been introduced in food quality evaluation to replace
82 conventional methods, which are time-consuming, expensive, and susceptible to large sources
83 of variation (Hassoun and Karoui, 2017). HSI is a non-destructive spectral method with
84 effective and accurate quality detection abilities (Wu et al., 2018). It extracts spectral and
85 spatial information by absorbing, transmitting, reflecting, and scattering images of food
86 products (Cheng et al., 2017). HSI acquires information on the quality of fishery products in
87 each pixel from different locations without affecting sample integrity (Chen et al., 2021;
88 Govari et al., 2021; Khoshnoudi-Nia and Moosavi-Nasab, 2019; Moosavi-Nasab et al., 2021;
89 Temiz and Ulaş, 2021). However, none of the studies conducted thoroughly compared the
90 physical, chemical, and biological characteristics of fish fillets using the HSI tool. This study
91 aimed to compare the quality changes in mackerel fillets stored under different conditions
92 using conventional and HSI techniques to investigate the potential of HSI for rapid prediction
93 of physicochemical traits in fish. By incorporating fundamental HSI processing, valuable
94 insights can be gained to practically implement in the short-chain supply before reaching
95 consumers.

96

97 **Material and methods**

98 **Raw material and experimental design**

99 A total of 96 live chub mackerels (*Scombus japonicus*), typically ranging in size from 23 to
100 35 cm and weighing around 200 to 300 g, with approximately 24 months of age, were
101 purchased from the fish market in Incheon, South Korea, and transferred to the laboratory.
102 Chub mackerel was chosen because it is a good source of omega-3 fatty acids and is widely
103 distributed in various regions, including the western Pacific Ocean, the eastern Atlantic Ocean,

104 and the Mediterranean Sea. After stunning, the mackerels were filleted and stored at 4°C for 8
105 hours to allow rigor mortis to set in. Approximately 150 g of the sample was vacuumed and
106 packaged (HFV-600L; Hankook Fugee Machinery Co., Ltd., Hwaseong, Korea) in low-
107 density polyethylene/nylon bags (0.09 mm thickness; O₂ permeability of 2 mL/m²/d at 0°C;
108 Sunkyung Co., Ltd., Seoul, Korea). Mackerel fillets were stored for six days using five
109 different methods: refrigerated at 4°C (R group); iced at 5 ± 3°C (I group); kept at an ambient
110 temperature of 17 ± 2°C (A group); frozen at -18°C for 24 h and thawed in a refrigerator at 4°C
111 for 5 h on the sampling day (FTR group); FTR thawed in tap water instead of in a refrigerator
112 (FTW group). Each group had three replicates. Fillets were analyzed on days 1, 3, and 6 of
113 storage. Approximately 10 × 5 × 3 cm fillets (n = 6) were cut for HSI analysis in both sides,
114 while the remaining fillets underwent immediate laboratory analysis or were ground and kept
115 at -20°C until analysis.

116

117 **Chemical analyses**

118 **pH content**

119 One gram of each sample was homogenized with 9 mL distilled water using a homogenizer
120 (Ultra-Turrax T25; Ika Works, Germany) at 1,720 ×g for 30 s. The homogenates were
121 centrifuged (Union 32R; Hanil Co. Ltd., Korea) at 2,265 ×g for 10 min and filtered (Whatman
122 No. 4, Whatman PLC., UK). The pH of each filtrate was measured using a pH meter
123 (SevenGo; Mettler-Toledo International Inc., Switzerland).

124

125 **Total bacterial count (TBC)**

126 TBC was performed according to the ICMSF (1986) by aseptically transferring 10 g of the
127 sample to a sterile bag containing 90 mL of saline solution. After mixing, serial dilutions (10¹
128 to 10⁴ Log CFU/g) of the samples were prepared. Then, 100 µL aliquots of appropriate

129 dilutions were spread on plate count agar, incubated at 37°C for 48–72 h, and then colonies
130 were counted.

131

132 **Volatile basic nitrogen (VBN)**

133 Protein oxidation was assessed based on the VBN value obtained using the Conway micro-
134 diffusion technique (Conway, 1947). Three grams of sample was homogenized with 27 mL of
135 distilled water using a homogenizer (Ultra-Turrax T25; Ika Works, Germany) at 1,720 ×g for
136 30 s. The homogenates were centrifuged (Union 32R; Hanil Co., Ltd., Korea) at 2,265 ×g for
137 10 min and filtered (Whatman No. 1; Whatman PLC., UK). Subsequently, 1 mL each of the
138 sample, 50% K₂CO₃, and 0.01N H₃BO₃ and 100 μL indicator (0.066% methyl red in ethanol :
139 0.066% bromocresol green in ethanol, 1:1, w/v) were poured into the Conway. Color changes
140 were observed and recorded by adding 0.01 N HCl to the center of the Conway.

141

142 **2-Thiobarbituric acid reactive substances (TBARS) value**

143 Lipid oxidation was measured using the TBARS assay following the process described by
144 (Lee et al., 2016), with a slight modification. Five grams of sample were homogenized with 9
145 mL of distilled water and 50 μL of 2% tert-butyl-4-hydroxyanisole ethanol solution (BHT)
146 using a homogenizer (Ultra-Turrax T25; Ika Works, Germany) at 1,720 ×g for 30 s. The
147 homogenates were centrifuged (Union 32R; Hanil Co., Ltd., Korea) at 2,265 ×g for 15 min
148 and filtered (Whatman No. 1; Whatman PLC., UK). The supernatants (2 mL) were mixed
149 with 4 mL of thiobarbituric-trichloroacetic acid solution. The homogenates were then heated
150 in a water bath at 90°C for 30 min and cooled. Subsequently, 300 μL of the supernatant was
151 placed into a microplate, and the absorbance was measured at 532 nm using a
152 spectrophotometer (X-ma 3100; Human Co. Ltd., Gwangju, South Korea).

153

154 **Drip loss**

155 Mackerel fillets were weighed before and after storage. The samples were wiped using a
156 clean tissue before weighing. Drip loss was determined as the percentage ratio of the removed
157 weight to the initial weight of the sample.

158

159 **Water content**

160 Three grams of each sample were distributed into an aluminum dish. The samples were then
161 oven dried at 110°C for 16 h. The difference in weight before and after oven drying was
162 recorded as a percentage.

163

164 **Color**

165 Color parameters were measured using a colorimeter (CR-400 Chroma Meter; Konica
166 Minolta, Japan) calibrated with a white standard plate (International Commission of
167 Illumination (CIE) $L^* = 96.79$, $a^* = 0.30$, and $b^* = 1.67$). The surfaces of the
168 samples were analyzed six times. There were two types of muscles measured for color: dark
169 muscles, characterized by brown or reddish tissue on the flesh from the presence of
170 myoglobin pigmentation, and white muscles, which exhibited white to off-white tissue on the
171 flesh due to the lower levels of myoglobin. The results were presented as lightness (CIE L^*),
172 redness (CIE a^*), and yellowness (CIE b^*) values.

173

174 **Texture profile analysis**

175 The texture profile was analyzed using a TA1 texture analyzer (AMETEK Lloyd
176 Instruments Ltd., Fareham, UK). Ten grams of ground sample was placed into a petri dish
177 ($35 \times 10 \text{ mm}^2$), cooked in a laboratory water bath at 80°C for 20 min, and cooled. A

178 compression plate of \emptyset 70 mm was attached to the analyzer that compressed the samples
179 twice (test speed of 2 mm/s, maximum cell load 50 kg, compression level 60%, and trigger
180 force of 0.1 N). The data were analyzed using the NexygenPlus software program (AMETEK
181 Lloyd instruments Ltd.) with the following parameters: hardness (N) represents the maximum
182 force required to compress the sample; springiness (mm) refers to the duration ability of the
183 sample to recover its original form after a deforming force has been removed; chewiness (N)
184 is the work required to chew or crunch the sample for swallowing; cohesiveness (N) indicates
185 the extent of total energy required to which the sample can be deformed prior to rupture;
186 adhesiveness (kgf.mm) is the work necessary to pull the compressing plunger away from the
187 sample, represented by the negative area under the baseline between the compression cycles;
188 elasticity represents the ability of sample to regain its original shape or structure after
189 deformation or compression, and gumminess (N) indicates the force necessary to disintegrate
190 a semi-solid sample for swallowing (Bourne, 2002).

191

192 **Scanning electron microscope (SEM) observation**

193 SEM was conducted according to the method described by Andrés et al. (2006), with some
194 modifications. The sample ($0.5 \times 0.4 \times 0.3 \text{ cm}^3$) was fixed with Carnoy's solution at 4°C for
195 24 h. The samples were then dehydrated using ethyl alcohol and immersed in
196 hexamethyldisilazane for 10 min. The dried sample was mounted on an aluminum stub with
197 carbon tape. It was then thinly coated with platinum under vacuum pressure (EM ACE200;
198 Leica, Germany). The samples were observed under a field-emission SEM (SUPRA 55VP;
199 Carl Zeiss, Germany).

200

201 **Hyperspectral imaging (HSI) analysis**

202 **HSI system and data acquisition**

203 HSI analysis was performed using a push broom scanner with an HSI-200 sensor (Korea
204 Spectral Products, Seoul, Korea). Each pixel of an image consisted of 640 wavelengths of the
205 spectrum covering the wavelength region from 400 to 1,700 nm. Ninety-six samples of
206 mackerel fillets were observed using HSI, which indicates two sides of the fillets; inside (Fig.
207 1a) and outside (Fig. 1b). However, the average data was tabulated at only inside of the fish
208 fillets to obtain a better predict information with less variation in each region of interest (RoI).
209 HSI was equipped with an imaging spectrometer with a resolution of 640 spectral x 512
210 spatial generated using a InGaAs PIN-Photodiode hyperspectral camera in the spectral range
211 of visible and short-wave near-infrared regions.

212 The white reference was acquired using a Teflon whiteboard (99.99% reflectivity), and the
213 dark reference was acquired by covering the camera (0% reflectance). This was done to
214 eliminate the dark current effect and reduce the influence of uneven illumination, resulting in
215 small ranged from 0 to 1. Normalized reflectance data were calculated using Eq. (1). After
216 constructing the reflectance data, each spectrum included in the RoI of the same sample was
217 averaged into a single spectrum for analysis.

$$218 \quad \text{Normalized reflectance} = \frac{\text{Reflectance value}}{\text{Reference reflectance value}} \times \text{scale factor}$$

219 Eq. (1)

220

221 **Data processing method**

222 To minimize the noise from the raw reflectance data, only the spectra from 750 to 1,300 nm
223 were used for the analysis. To remove unnecessary baseline drifts among the signals, all
224 signals were scaled into the range of 0 to 1 (min-max normalization). The reflectance spectra
225 were recorded by indicating the raw data and signals after pre-processing.

226 Partial least square (PLS) was used to construct data for analysis and modelling. A
227 comparison was made between the hyperspectral data and twenty-eight different quality
228 parameters of mackerel fillets (n = 96), which revealed that 17 of these parameters yielded
229 reliable results.

230 To enhance data processing performance, the leave-one-out cross-validation method was
231 employed for calibration and validation of the PLS models according to the method by Xu et
232 al. (2018). The optimal number of PLS components (N) for each quality parameter was
233 determined based on the lowest value of the root-mean-square error estimated by cross-
234 validation (RMSECV).

235

236 **Statistical Analysis**

237 Data were analyzed by one-way ANOVA and Tukey's test at a significance level of 95%
238 using SAS 9.4 program (SAS Institute Inc., Cary, NC, USA). Data are presented as mean (n =
239 3) and standard error of the mean. The PLS and PCA models of the entire HSI dataset of
240 mackerel fillets (n = 96) were implemented in Python version 3.7.9 (Python Software
241 Foundation, Beaverton, USA).

242

243 **Result and discussion**

244 **General quality properties**

245 The FTR group showed significantly the lowest drip loss among the treatments on days 1
246 and 6 (Table 1). Significant water loss in the muscle and is lethal to bacterial growth due to
247 the ice crystal formation (Cropotova et al., 2019; Tan et al., 2021). On day 1, drip loss was the
248 highest in the FTW group (2.77%) compared to the other groups (0.51–1.32%) ($p < 0.05$).
249 Water content and pH are the major post-mortem changes in fish muscle due to the water loss
250 or exudation occurring during muscle stiffening. These changes lead to an increase in rigidity,

251 reaching a maximum level after 12 to 24 hours (Chan et al., 2020). Temperature abuse during
252 the thawing process leads to rapid changes in the water content of a previously frozen
253 condition (Negara et al., 2021). The water content in group A increased within three days and
254 then dropped on day 6 ($p>0.05$). Group A was exposed to ambient temperature, which caused
255 muscle contraction and resulted in higher water content compared to other storage methods
256 during three days of storage. Relative humidity of storage was fixed at 40% in all storage
257 methods.

258 Theoretically, an increase in pH reflects an increase in the water content in the muscle
259 protein via charge shielding (Brewer, 2014). However, no significant difference in pH was
260 observed among the groups. When the autolytic processes were initiated, quality deterioration
261 also started due to a favorable environment for bacterial growth (Duarte et al., 2020). Among
262 the different groups, group I had the lowest pH (6.61) at 3 d and the highest pH on day 6 (6.14)
263 ($p>0.05$). This might be due to the effects of temperature on extracellular proteolysis and the
264 increase in pH caused by bacterial accumulation (Toe et al., 2019). The increase in pH on day
265 3 may be due to post-rigor changes (Matarneh et al., 2017). The sudden decrease in pH on day
266 6 was due to the break down of muscle glycogen, producing lactic acid, which caused
267 acidification and post-mortem softening of fish flesh (Liu et al., 2013; Singh and Benjakul,
268 2018).

269 Color represents the constituents of several compounds in muscle tissues. For instance, dark
270 muscles have more prominent fat and myoglobin content than white muscles because of the
271 higher amount of lipid droplets and myofibrillar protein in the tissues (Listrat et al., 2016).
272 Table 2 shows the comparison of dark and white muscles in fish fillets stored using different
273 methods. For lightness, no significant difference was found in dark muscles, except in the
274 FTW group. The frozen mackerel was appeared to be darker after water thawing owing to
275 water loss and destruction of the microstructure (Zhang et al., 2021). Zhou and Xie (2021)

276 agreed that fish had better lightness after thawing in the refrigerator and temperature rise
277 resulted in the worst color values because of protein denaturation.

278 Redness of muscle tissues is primarily influenced by the pigmentation of myoglobin.
279 (McKellar and Greer, 2020). The FTR and FTW groups had lower redness in the dark
280 muscles compared to the other storage groups, which turned the fillets into purple-red due to
281 deoxygenation, freezer burn, or abnormally long storage (Wang and Xie, 2020). In the white
282 muscle, the redness values were contradictory to those of the dark muscle. This might be due
283 to the low myoglobin content in the muscle, which affects color values (Listrat et al., 2016).
284 The yellowness in the dark muscle of fish fillets increased on day 6, except in the FTW and
285 FTR samples, because the freezing condition produced a low TBARS value. The increase in
286 yellowness (b^*) of fish fillets is influenced by the escalation of lipid oxidation, which can be
287 assessed using TBARS. This process leads to the generation of reactive oxygen species and
288 accumulation of oxidation products, eventually leading to discoloration and a tougher texture
289 in the muscle tissue (Sriket and La-ongnual, 2018). The results also proved that the FTR and
290 FTW groups had significantly higher hue angles in the dark muscle than the other groups on
291 day 6, which conformed to the relationship between the redness and yellowness of fish fillets.

292

293 **Biological and chemical properties**

294 As shown in Fig. 4a, the TBC of mackerel fillets was initially 1.80 Log CFU/g and was
295 significantly higher in group A than in the other groups. Ambient temperature is a favorable
296 environment for microorganism growth and activity (Lee et al., 2014). Theoretically, an
297 increase in microorganism growth simultaneously decreases freshness and initiates spoilage
298 (Mohammed et al., 2021). On day 6, all storage methods were below the acceptable limit of
299 TBC in fish, which was 7 Log CFU/g (ICMSF, 1986; Nayma et al., 2020). However, the A
300 group was not suitable for consumption starting from day 6 due to rapid spoilage, unpleasant

301 odor, and unfavorable quality traits. The FTR group had the lowest TBC during the entire
302 storage period. This is because freezing caused slow growth and/or inactivation of bacteria
303 (Mohammed et al., 2021).

304 Slow lipid oxidation primarily resulting in the formation of hydroperoxide is attributed to
305 the low temperature, which subsequently leads to a gradual increase in lipid autolysis and
306 enzymatic activity in fatty fish (Duarte et al., 2020). Mackerel muscle is highly susceptible to
307 lipid and protein oxidation due to its low post-mortem pH, high polyunsaturated fatty acid
308 content, and abundance of pro-oxidants (Sone et al., 2020). Lipids readily decompose into
309 low-molecular-weight volatile compounds such as aldehydes and ketones, producing
310 unpleasant odors (Domínguez et al., 2019). The initial TBARS value of the mackerel fillets
311 was 3.40 mg malondialdehyde (MDA)/kg. On day 1, the FTW group had the highest TBARS
312 value (7.38 mgMDA/kg) compared to other groups ($p<0.05$) as shown in Fig. 4b, because
313 thawing in water triggered rapid lipid oxidation (Wang and Xie, 2020). However, on day 6,
314 TBARS values were the highest in group A (16.59 mgMDA/kg), followed by I, R, FTW, and
315 FTR groups ($p<0.05$). Ambient temperature can cause massive lipid degradation and
316 peroxidation compared to low temperatures (Domínguez et al., 2019). The FTR group had the
317 lowest TBARS values (4.44–7.56 mgMDA/kg) during the storage period because freezing
318 conditions favored higher disulfide bond content and surface hydrophobicity (Li et al., 2020;
319 Sriket and La-ongnual, 2018).

320 As stated by Li et al. (2020), decreased enzymatic activity and minimal oxidative reactions
321 during freezing affected the VBN content. The initial VBN value of the samples was 9.10
322 mg% and it increased linearly with storage time. The FTR group had the lowest VBN values
323 among the different groups ($p<0.05$) (Fig. 4c). This is because muscle protein undergoes slow
324 denaturation during storage due to the slow enzymatic reaction, leading to a decrease in
325 soluble proteins (Crobotova et al., 2019). K-value is a parameter based on nucleotide

326 pathways and is used as an indicator of fish flesh freshness. The K-value of mackerel fillets
327 was 8.99% on day 0 and increased continually over the storage period due to the rapid
328 degradation of proteins and lipids. Fish is considered fresh when the K-value is less than 20%,
329 while it is considered spoilt when the K-value exceeds 60% and sensory rejection is initiated
330 at 63% (Mohan et al., 2009, 2019). Group A had the highest K-value, whereas the FTR
331 samples showed the lowest value during storage ($p < 0.05$) (Fig. 4d). This finding was similar
332 to that of previous studies where storage at ambient temperature for 6 h elevated the K-values
333 for mullet and pearl spot fishes (Lakshmanan et al., 1996). Turbot stored in cold storage
334 (slurry ice) had a lower K-value than those stored in flake ice (Rodríguez et al., 2006). Tuckey
335 et al. (2010) found justified that the K-value of fish fillets rose rapidly from 19.27 to 52.11%
336 when stored at 15°C for 36 h.

337

338 **Physical properties**

339 Textural properties of mackerel fillets stored under different conditions was illustrated in
340 Fig. 5. In general, fish fillets with higher pH have higher water activity, softness, and juiciness
341 (Sun et al., 2018). The decrease in tenderness occurs because of the synergistic effect of
342 numerous endogenous proteolytic systems (Kaur et al., 2021). On day 6, the FTR group showed
343 a hardness and chewiness of 44.06 N and 18.14 N, respectively, which was slightly lower
344 than those (hardness = 45.83 N; chewiness = 19.57 N) in the FTW group ($p > 0.05$). However,
345 the hardness and chewiness of fish fillets in both FTR and FTW groups were significantly
346 lower than those in the other groups, which might be due to microbial proteolysis activity
347 (Matarneh et al., 2017). On day 6, the FTR group had the highest springiness (0.84 mm)
348 among the different storage groups (0.80–0.83 mm) ($p > 0.05$). Hardness and springiness are
349 common textural indicators of fish freshness, resulting from protein denaturation (Bourne,
350 2002). Besides, on day 6, the FTR group had the lowest adhesiveness (0.14 kgf.mm) among

351 the different groups (0.17–0.23 kgf.mm). The elasticity increased over the storage period, and
352 on day 6, the FTR group had the highest elasticity (0.03–0.05 Pa) among the different groups.
353 Slower proteolysis due to the low temperature caused fewer changes in protein linkages,
354 maintaining the textural properties (Cropotova et al., 2019).

355 The SEM images of the mackerel fillets stored under different conditions are shown in Fig.
356 6. Moist environment produces narrowed muscle tissues due to strong muscle contraction
357 (Wang and Xie, 2020). Muscle tissues in mackerel fillets were slightly narrowed in the I and
358 FTW groups on day 1 and were narrower, with more tissue damage on days 3 and 6 compared
359 to the other groups. Shrinkage of muscle tissues at cold temperatures was also observed by
360 (Cropotova et al., 2019). The muscle tissues in the FTR group were smooth and elongated,
361 while those in other groups shrunk. SEM observations revealed that group A showed severe
362 structural destruction from day 1 onwards due to high temperature, moist environment, and
363 large muscle contraction (Huq et al., 2019). Over the storage period, group I showed less
364 muscle destruction than group A but more muscle destruction than groups FTR and FTW.

365

366 **HSI-based predictive model**

367 The reflectance spectra before (Fig. 2a) and after pre-processing using wavelength selection
368 (Fig. 2b) and then underwent minimum-maximum normalization (Fig. 2c) were illustrated.
369 Based on the Fig. 3a, it appears that the presence of first and second overtone peaks at 950
370 and 1160 nm, respectively, suggests that there are molecular vibrations occurring in the
371 sample that could be associated with O-H stretching bonds by moisture or sulfmyoglobin
372 oxidation (Chen et al., 2021; Khoshnoudi-Nia and Moosavi-Nasab, 2019). Score plots with
373 respect to storage period were used as the reference dataset for principal component analysis
374 (PCA) as described in Figure 3b. Spectral data on the quality parameters of the mackerel
375 fillets were obtained using HSI coupled with a PLS-based regression model, as shown in

376 Table 3. PLS showed a relatively high correlation coefficient ($R^2_c = 0.54-0.96$), which is in
377 agreement with previous studies on muscle foods (Chen et al., 2021; Wu et al., 2016; Xiong et
378 al., 2015; Xu et al., 2016).

379 The performance of each chemometric model was attributed to the number of samples and
380 variables, type of samples, wavelength range, waveband selection method, and optimal
381 multivariate analysis (Moosavi-Nasab et al., 2021). From the results, 10 of the 17 quality
382 parameters showed good coefficient of correlation in cross-validation values ($R^2_{cv} \geq 0.31$).
383 The remaining had acceptable positive values of R^2_{cv} . However, there is no limitation or
384 acceptable value for R^2 because this value can be improved by modifying the statistical model
385 for the best performance (Temiz and Ulaş, 2021).

386 The spectral properties of meat change with pH due to changes in the chemical composition
387 and stretching vibrations of the muscle foods (López-Valencia et al., 2019). The pH model in
388 this study indicated the highest correlation coefficients for both R^2_{cv} and R^2_c (coefficient of
389 calibration), which were 0.86 and 0.96, respectively, with high PLS components ($N = 11$). For
390 instance, the R^2_c of pH in Atlantic salmon, determined by He et al. (2014), were 0.87 (R^2_{cv})
391 and 0.89 (R^2_c), which are slightly similar to the current results. Wang et al. (2019) found that
392 the correlation coefficients of pH in crucian carp were 0.72 (R^2_{cv}) and 0.87 (R^2_c). In the
393 present study, VBN obtained using the PLS model had $R^2_c = 0.87$, which was relatively
394 similar to that obtained in other fish fillet studies using PLS and multiple linear regression
395 (MLR; $R^2_c = 0.76-0.89$) and backpropagation – artificial neural network (BP-ANN; $R^2_c =$
396 0.88) (Cheng et al., 2015; Khoshnoudi-Nia and Moosavi-Nasab, 2019; Moosavi-Nasab et al.,
397 2021; Wang et al., 2019).

398 The TBARS and K-value were also evaluated using the PLS model. Cheng et al. (2016)
399 found more feasible to use PLS, multispectral imaging (MLR), least square-sector vector
400 machine (LS-SVM), genetic algorithms, and successive projection algorithm (SPA) with R^2_{cv}

401 = 0.76–0.83. However, the present TBARS values had a slightly lower R^2_{cv} value (0.64) than
402 aforementioned studies. The TBARS value of frozen-thawed pork was higher when using
403 SPA-PLS ($R^2_{cv} = 0.80$) (Wu et al., 2016), while that of chicken meat was higher when using
404 the PLS model ($R^2_{cv} = 0.87$) (Xiong et al., 2015). In this study, the K-value was determined at
405 $R^2_{cv} = 0.48$, using the PLS model. Cheng et al. (2015, 2016) found that the R^2_{cv} of the K-
406 value in fish fillets was 0.94 using the PLS and LS-SVM models, whereas was 0.95 using the
407 MLR model.

408

409 **Conclusion**

410 The HSI and conventional analyses revealed that mackerel fillets stored under FTR
411 conditions were the freshest, with minimal impact on physicochemical traits, compared to
412 those kept under other storage conditions. This valuable information had a greater impact on
413 the seafood industry for practical implementation in the short-chain supply before reaching
414 consumers. Interestingly, thawing in the refrigerator was recommended in this study
415 compared to thawing in tap water. The quality of the fish fluctuated with increasing
416 temperature and storage period. The results showed that group A was inappropriate for storing
417 fish fillets. Furthermore, the freshness of the fish fillets in group I was much lower than that
418 of those in the R, FTW, and FTR groups starting from day 3.

419 The HSI, coupled with the PLS model, yielded positive results for the quality parameters of
420 fish, particularly pH, TBARS, VBN, K-value, and texture. Consequently, the HSI system
421 could replace the conventional method for evaluating the quality of fish fillets, reducing
422 analysis time and costs. These findings provided valuable insights into the potential and
423 effectiveness of using HSI in fundamental applications within the seafood industry. A

424 comprehensive understanding of storage design for fish fillets could enable the industry to
425 employ the best methods for maintaining fish quality.

426 The practical application in these studies undoubtedly offers significant knowledge to the
427 seafood industry regarding the storage of fish fillets and the use of HSI as a non-destructive
428 quality measurement tool. The HSI results for quality parameters using the PLS model could
429 be improved by employing reliable multivariate analyses to achieve higher correlation
430 coefficients and accuracy compared to the presented results. Further studies measuring
431 metabolite contents in fish fillets using the HSI system are recommended to confirm its
432 effectiveness and efficiency in analyzing low-molecular-weight compounds.

433

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612 Table 1. Typical quality properties of mackerel fillets stored under different conditions.

613

Trait	Storage method	Storage period (days)				SEM ¹
		0	1	3	6	
Drip loss (%)	A	-	0.57 ^{bz}	1.58 ^a	1.77 ^{ax}	0.069
	I	-	1.32 ^{by}	2.17 ^a	2.03 ^{ax}	0.128
	R	-	0.74 ^{bz}	1.50 ^a	1.57 ^{ax}	0.123
	FTW	-	2.77 ^{ax}	1.27 ^c	1.95 ^{bx}	0.133
	FTR	-	0.51 ^z	1.05	0.69 ^y	0.125
	SEM ²	-	0.103	0.188	0.135	
Water content (%)	A	60.23	60.64	64.18 ^x	60.58	0.992
	I	60.23 ^{ab}	60.08 ^{ab}	61.52 ^{axy}	58.68 ^b	0.421
	R	60.23	59.56	61.01 ^{xy}	60.90	0.589
	FTW	60.23	58.31	60.79 ^{xy}	60.29	1.211
	FTR	60.23	58.70	59.62 ^y	59.01	1.452
	SEM ²	-	0.639	0.722	0.792	
pH value	A	5.69 ^c	6.00 ^b	6.71 ^a	6.07 ^b	0.059
	I	5.69 ^c	6.01 ^b	6.61 ^a	6.14 ^b	0.034
	R	5.69 ^c	5.98 ^b	6.63 ^a	6.05 ^b	0.036
	FTW	5.69 ^c	6.01 ^b	6.69 ^a	6.03 ^b	0.030
	FTR	5.69 ^c	5.95 ^c	6.65 ^a	6.10 ^b	0.019
	SEM ²	-	0.034	0.024	0.051	

614 A, ambient; I, ice; R, refrigerator; FTW, frozen and thawed in water; FTR, frozen and thawed
 615 in a refrigerator.

616 ¹ (n = 3) and ² (n = 15) of standard error of the least square mean.

617 ^{a-c} (same row) and ^{x-z} (same column) of different superscripts indicate significant difference
 618 between means ($p < 0.05$).

619 Table 2. Color of dark muscles and white muscles of mackerel fillets stored under different conditions.

Type of muscle	Item	Storage method	Storage period (days)				SEM ¹	Type of muscle	Item	Storage method	Storage period (days)				SEM ¹
			0	1	3	6					0	1	3	6	
Dark muscle	L*	A	44.91	40.62	44.41	42.36	1.637	L*	A	52.45	56.55	53.17	55.35	1.518	
		I	44.91	41.37	45.30	42.55	0.826		I	52.45	60.81	51.69	60.11	2.301	
		R	44.91	41.70	41.46	41.62	1.504		R	52.45 ^b	59.39 ^a	50.91 ^b	59.83 ^a	1.355	
		FTW	44.91 ^a	37.68 ^b	39.44 ^b	39.80 ^b	1.583		FTW	52.45	58.31	51.11	53.61	2.050	
		FTR	44.91	43.70	41.13	43.84	1.248		FTR	52.45 ^b	61.33 ^a	55.23 ^{ab}	54.16 ^b	1.363	
		SEM ²	-	1.486	1.737	1.386			SEM ²	-	2.467	1.077	1.423		
	a*	A	11.88	14.42 ^{xy}	12.84 ^{xy}	15.61 ^x	0.928	a*	A	2.91	2.16	4.18 ^{xy}	1.70 ^y	0.524	
		I	11.88	16.36 ^x	15.01 ^x	16.51 ^x	0.639		I	2.91 ^{ab}	1.63 ^b	5.47 ^{ax}	2.56 ^{aby}	0.751	
		R	11.88	14.79 ^{bxy}	16.06 ^{ax}	16.99 ^{ax}	0.436		R	2.91 ^{ab}	1.23 ^b	5.77 ^{ax}	1.99 ^{by}	0.417	
		FTW	11.88	13.41 ^y	11.24 ^y	10.70 ^y	0.826		FTW	2.91 ^{ab}	0.87 ^b	4.44 ^{axy}	1.90 ^{aby}	1.130	
		FTR	11.88 ^b	13.53 ^{ay}	12.90 ^{axy}	10.99 ^{by}	0.215		FTR	2.91 ^{ab}	1.27 ^b	2.73 ^{aby}	5.61 ^{ax}	0.724	
		SEM ²	-	0.510	0.986	0.402			SEM ²	-	0.428	0.537	0.604		
	b*	A	15.25 ^c	17.82 ^{ab}	17.42 ^b	19.47 ^a	0.408	b*	A	15.34	16.17 ^{yz}	15.65 ^{yz}	16.29 ^{xy}	0.279	
		I	15.25 ^b	17.65 ^{ab}	18.44 ^a	18.59 ^a	0.382		I	15.34 ^{ab}	15.42 ^{abyz}	16.43 ^{axyz}	14.60 ^{by}	0.354	
		R	15.25 ^b	17.26 ^{ab}	17.02 ^{ab}	18.52 ^a	0.304		R	15.34	14.50 ^z	15.01 ^z	15.14 ^{xy}	0.451	
		FTW	15.25 ^b	18.10 ^a	17.01 ^{ab}	17.75 ^{ab}	0.991		FTW	15.34	16.98 ^{xy}	16.68 ^{xy}	15.88 ^{xy}	0.493	
		FTR	15.25 ^{ab}	18.41 ^a	18.32 ^a	18.42 ^a	0.428		FTR	15.34 ^b	18.13 ^{ax}	17.42 ^{ax}	17.31 ^{ax}	0.393	
		SEM ²	-	0.627	0.649	0.634			SEM ²	-	0.395	0.322	0.506		
	H	A	52.65	51.62	55.41	51.25 ^y	1.931	H	A	79.14	83.45	77.85 ^{xy}	83.99 ^x	1.542	
		I	52.65	47.22	50.92	48.74 ^y	1.655		I	79.14	84.42	71.86 ^{yz}	80.05 ^{xy}	2.596	
R		52.65	48.82	47.00	47.43 ^y	0.832	R		79.14 ^{ab}	85.15 ^a	69.44 ^{bz}	82.65 ^{axy}	1.687		
FTW		52.65	53.41	56.69	58.85 ^x	1.798	FTW		79.14	86.74	75.27 ^{xyz}	83.11 ^x	3.944		
FTR		52.65 ^b	53.48 ^b	54.82 ^b	59.16 ^{ax}	0.690	FTR		79.14 ^{ab}	86.00 ^a	81.57 ^{abx}	72.19 ^{bz}	2.172		
SEM ²		-	1.283	2.205	1.523		SEM ²		-	1.488	1.716	2.155			

620 Dark muscles, brown or reddish tissue on the flesh; white muscles, white to off-white tissue on the flesh; A, ambient; I, ice; R, refrigerator; FTW,
621 frozen and thawed in water; FTR, frozen and thawed in a refrigerator; L^{*}, lightness; a^{*}, redness; b^{*}, yellowness; h, hue angle.
622 ¹ (n = 3) and ² (n = 15) of standard error of the least square mean.
623 ^{a-b} (same row) and ^{x-z} (same column) of different superscripts indicate significant difference between means (p < 0.05).

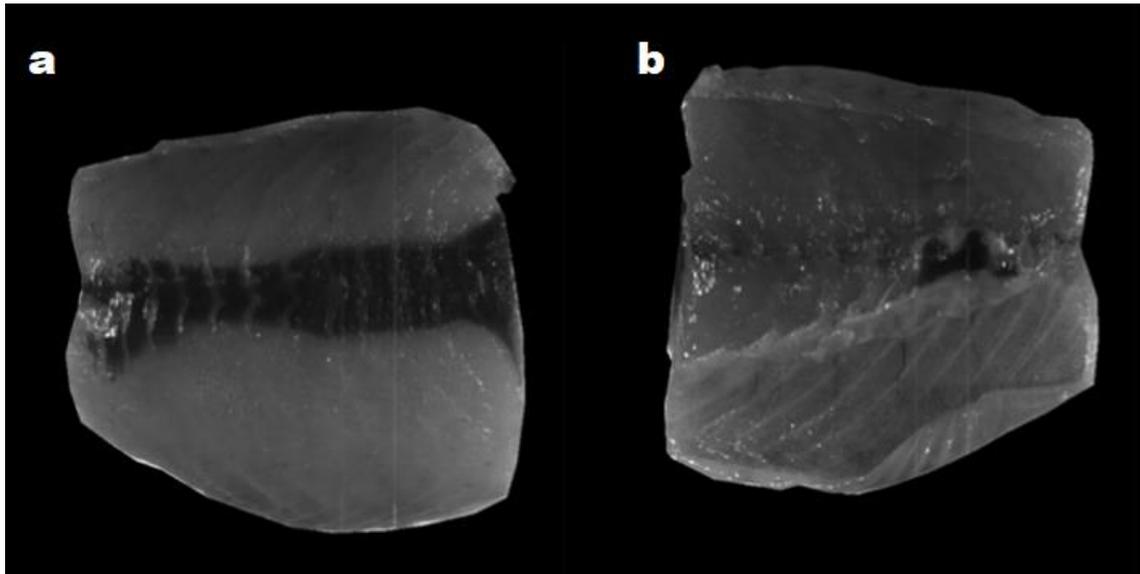
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624 Table 3. Partial least square regression model-based calibration and cross-validation results of
 625 17 quality parameters of mackerel fillets measured using hyperspectral imaging during six
 626 days of storage.

627

Target	N	Calibration		Cross-validation		
		R^2_c	RMSEC	R^2_{cv}	RMSECV	RPD _{cv}
pH	11	0.96	0.06	0.86	0.12	2.64
Cohesiveness	18	0.99	0.00	0.69	0.03	1.80
TBARS	11	0.91	0.91	0.64	1.83	1.66
Elasticity	12	0.91	0.00	0.63	0.01	1.64
VBN	10	0.87	0.91	0.57	1.67	1.53
K-value	9	0.85	3.05	0.48	5.73	1.39
Hardness	4	0.57	16.19	0.47	17.89	1.38
Springiness	4	0.55	0.04	0.45	0.05	1.35
Dark Muscle a*	8	0.74	1.17	0.36	1.86	1.25
White Muscle b*	6	0.55	0.79	0.31	0.98	1.20
Dark Muscle h	6	0.53	3.09	0.26	3.89	1.16
White Muscle a*	6	0.55	1.25	0.19	1.68	1.11
Gumminess	5	0.61	6.57	0.19	9.44	1.11
White Muscle L*	5	0.38	3.44	0.17	3.98	1.09
Adhesiveness	3	0.31	0.13	0.16	0.15	1.09
White Muscle h	6	0.54	4.18	0.15	5.66	1.09
Chewiness	5	0.54	4.01	0.10	5.64	1.05

628 N, latent variables; R^2_c , coefficient of calibration; R^2_{cv} , coefficient of cross-validation;
 629 RMSEC, root-mean-square errors estimated by calibration; RMSECV, root-mean-square
 630 errors estimated by cross-validation; RPD_{cv}, relative percent difference of cross-validation;
 631 TBARS, 2-thioabarbitoric acid reactive substances; VBN, volatile basic nitrogen.

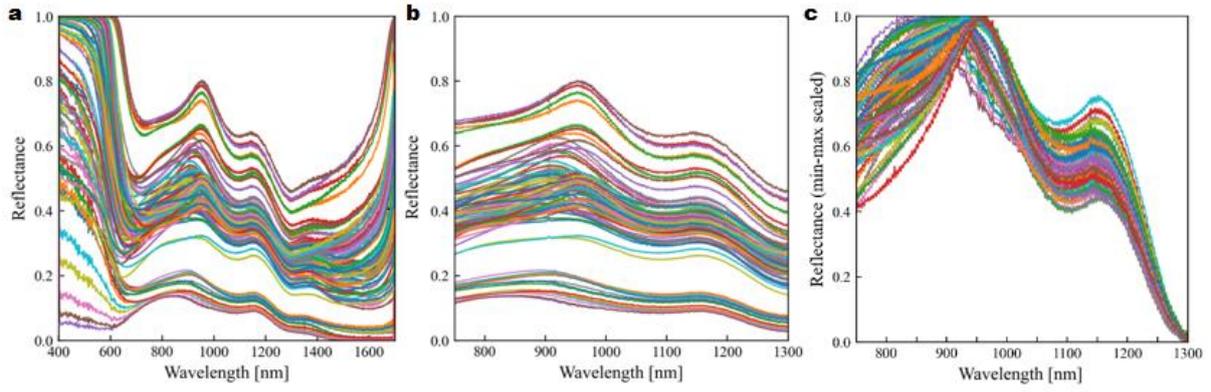


632

633 **Fig. 1. The fillets near the skin (a) and the fillets near the internal organs (b) of**
634 **mackerel from hyperspectral images.**

635

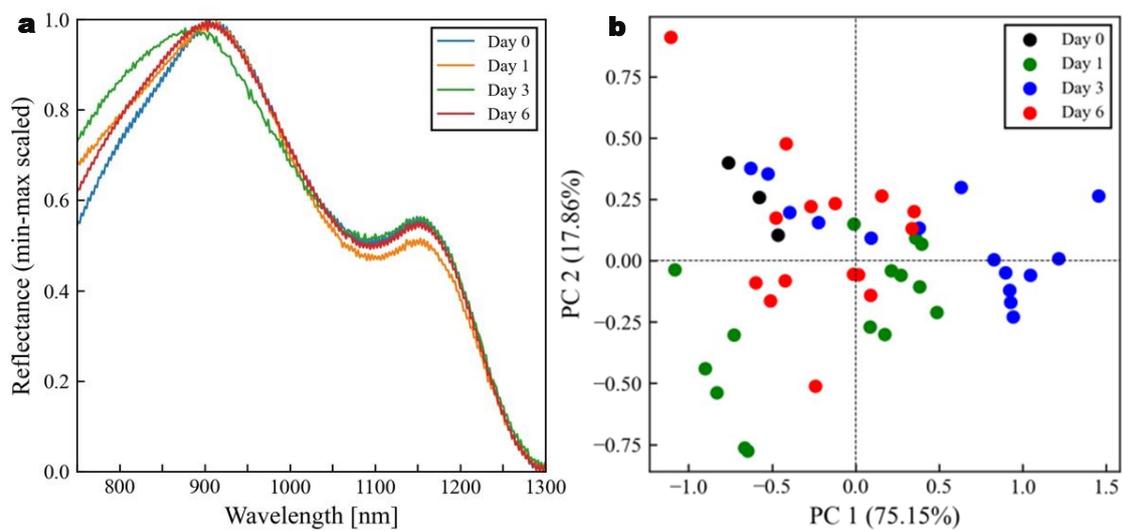
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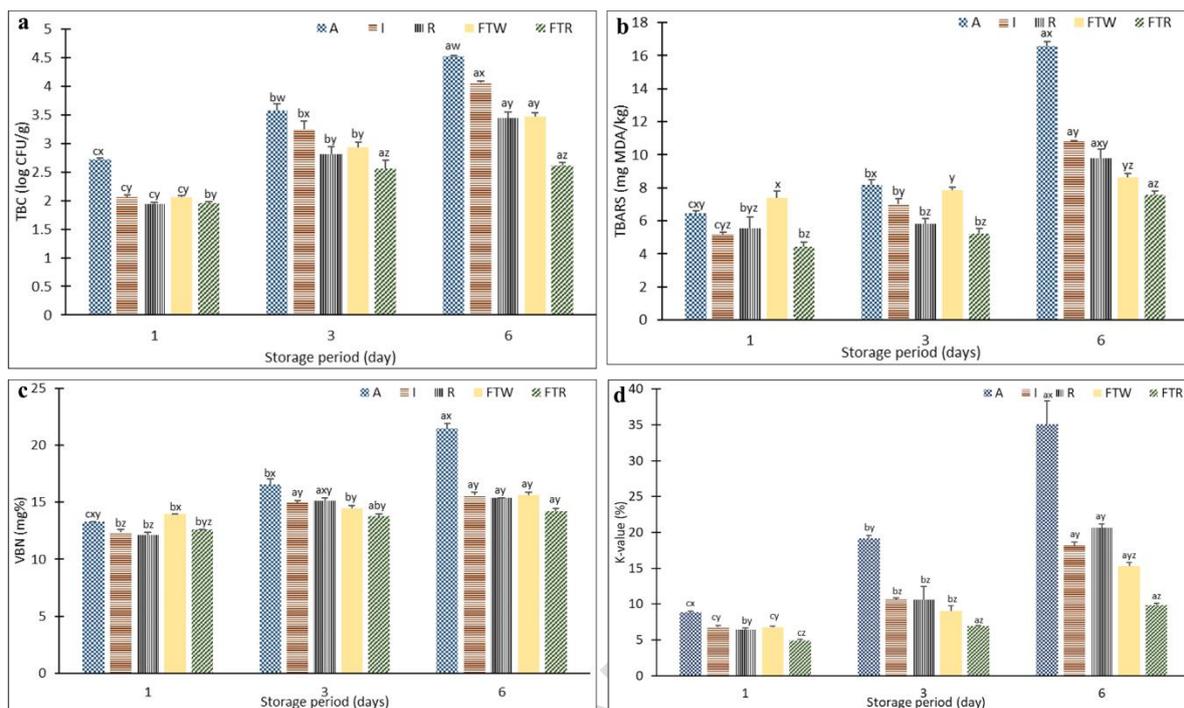
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637 **Fig. 2. The raw data (a), data after wavelength selection (b) and data after wavelength**
638 **selection and minimum-maximum normalization (c) of reflectance spectra before and**
639 **after pre-processing.**

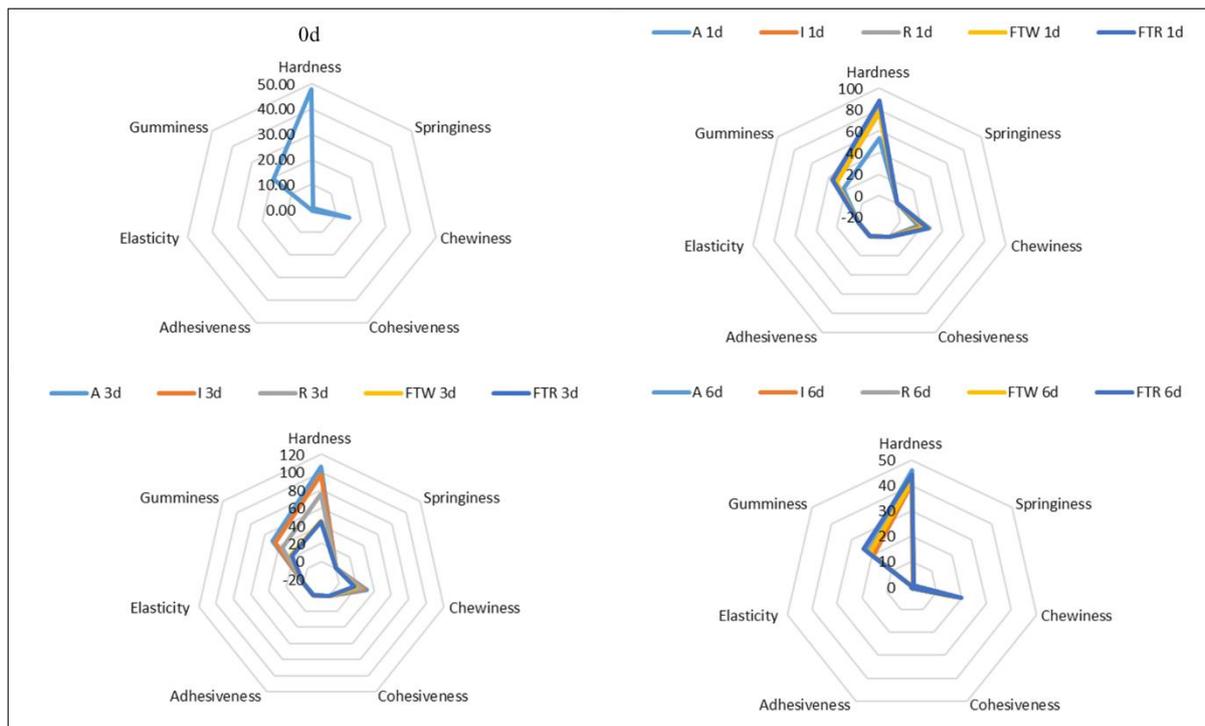
640



642 **Fig. 3. Average reflectance (a) and score plots (b) of spectral images throughout the**
643 **storage period.**

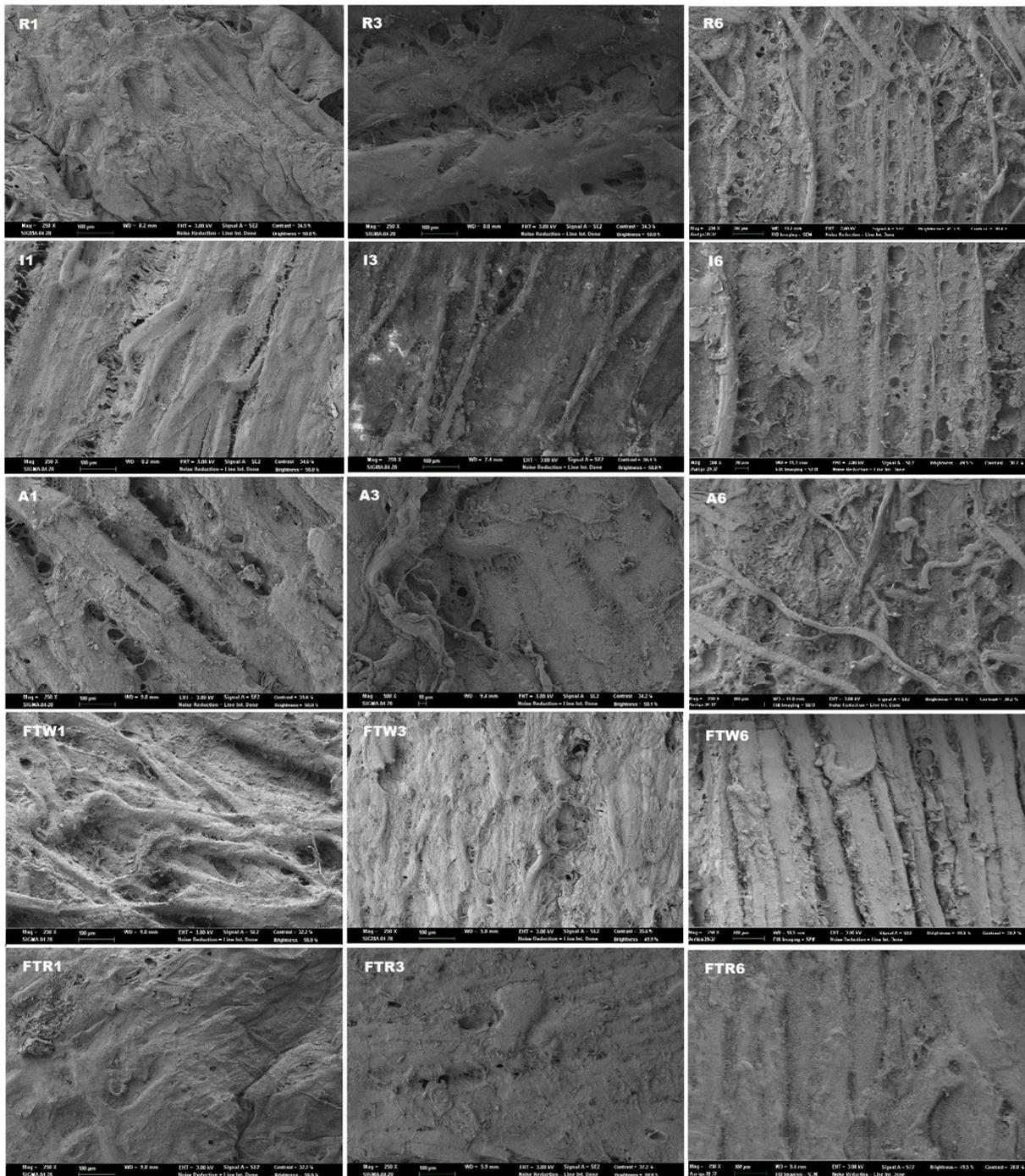


644
 645 **Fig. 4. The total bacterial count (TBC) (a), 2-thiobarbituric acid reactive substance**
 646 **(TBARS) (b), volatile basic nitrogen (VBN) (c) and K-value (d) of mackerel fillets stored**
 647 **under different conditions. A, ambient; I, ice; R, refrigerator; FTW, frozen and thawed in**
 648 **water; FTR, frozen and thawed in a refrigerator. Different superscripts ^{a-c} (same row) ^{w-z}**
 649 **(same column) represent significant differences between means ($p < 0.05$).**



650

651 **Fig. 5. Textural properties of mackerel fillets stored under different conditions for 0, 1,**
 652 **3, and 6 days. A, ambient; I, ice; R, refrigerator; FTW, frozen and thawed in water; FTR,**
 653 **frozen and thawed in a refrigerator.**



654

655 **Fig. 6. Scanning electron microscope images of mackerel fillets stored under different**
 656 **conditions during the entire storage period. Scale bar: — = 100 μ m. A, ambient; I, ice;**
 657 **R, refrigerator; FTW, frozen and thawed in water; FTR, frozen and thawed in a refrigerator; 1,**
 658 **1 day; 3, 3 days; 6, 6 days.**