Food & Function

Accepted Manuscript

This is an *Accepted Manuscript*, which has been through the Royal Society of Chemistry peer review process and has been accepted for publication.

Accepted Manuscripts are published online shortly after acceptance, before technical editing, formatting and proof reading. Using this free service, authors can make their results available to the community, in citable form, before we publish the edited article. We will replace this *Accepted Manuscript* with the edited and formatted *Advance Article* as soon as it is available.

You can find more information about *Accepted Manuscripts* in the [Information for Authors](http://www.rsc.org/Publishing/Journals/guidelines/AuthorGuidelines/JournalPolicy/accepted_manuscripts.asp).

Please note that technical editing may introduce minor changes to the text and/or graphics, which may alter content. The journal's standard [Terms & Conditions](http://www.rsc.org/help/termsconditions.asp) and the Ethical quidelines still apply. In no event shall the Royal Society of Chemistry be held responsible for any errors or omissions in this *Accepted Manuscript* or any consequences arising from the use of any information it contains.

www.rsc.org/foodfunction

Page 1 of 41 Food & Function

Page 3 of 41 Food & Function

Food & Function Page 4 of 41

Electrophoresis is widely used to follow enzymatic protein digestion. However, the 70 interpretation of electrophoresis gels is mainly qualitative, except when simplified systems such as purified proteins are studied; quantitative analysis is then sometimes herformed⁸. However, when digestion is performed on real food, huge amounts of data are generated rapidly which make interpretation challenging. For example, although egg white is quite a simple food, it contains up to 158 proteins⁹, 13 being **Example 20 Example 20 Example 20 Feasily detected by SDS-PAGE¹⁰. Including peptides generated by** *in vitro* **digestion,** simultaneous analysis of around 20 electrophoresis bands is therefore required to follow egg white proteolysis by SDS-PAGE. Moreover, in order to follow the effects of an external factor (such as dry heating in the present study) on the progress of *in vitro* digestion, sampling has to be performed several times throughout digestion for each condition. A large data set is thus generated, which requires a global statistical 81 analysis approach. The classical data analysis is a univariate approach for which the protein bands are analysed one by one. However, this approach does not take into account all the

information present in the experiment, and it may be negatively affected by the raw structure of electrophoretic data¹¹ (variability due to gel staining and image analysis, large number of missing data, few replications). The use of multivariate methods such as Principal Component Analysis (PCA) has spread in the past few years because it reduces the complexity of the data set and it is less affected by data distribution or **89 Repeative Strutter** variance heterogeneity¹². However, PCA introduces only one set of variables as active, the others being illustrative. With this strategy, the only multidimensional structure really handled is that of the active variables, and the illustrative variables act independently. However, under specific circumstances, such as when following several samples at different times during a given process (digestion in the present study), it may be desirable to consider several sets of variables simultaneously as active elements, in order to take all of them into account in the definition of distance 96 between individuals. Multiple Factor Analysis (MFA) makes this possible¹³. 97 In the study presented here, first PCA, and then MFA were applied to follow the effects of dry-heating temperature and time on the changes in the electrophoretic

Page 5 of 41 Food & Function

Food & Function Page 6 of 41

Food & Function Accepted Manuscript Food & Function Accepted Manuscript

aliquoted (gast ti), and the remainder was used for digestion. *In vitro* digestion was performed under continuous stirring (80 rpm) in a KS 4000I incubator (IKA-Werke**,** Germany) at 37°C. Gastric digestion started when porcine pepsin, previously dissolved in SGF, was added at a final concentration of 182 U of pepsin per mg of protein. Aliquots (1 ml) were taken over the 60 min of gastric digestion, at 15 s after the addition of pepsin (gast t+), then at 1 min (gast t1), 2 min (gast t2), 5 min (gast t5), 10 min (gast t10), 20 min (gast t20), 40 min (gast t40), and 60 min (gast tf). After 136 sampling, the reaction was immediately stopped by raising the pH to 7 by adding 0.5 137 M ammonium bicarbonate. Before the intestinal digestion stage, the pH of the gastric digest was adjusted to 6.5 by adding 0.5 M bis-tris pH 6.5, and 0.125 M bile salts mixture (0.0625 M sodium taurocholate and 0.0625 M sodium glycodeoxycholate). One ml of the digest solution 141 was taken (int ti), and the remainder was used for intestinal digestion. Trypsin and α -chymotrypsin previously dissolved in simulated duodenal fluid (SDF, 0.15 M NaCl pH 6.5) were added to the protein solution (34.5 U trypsin per mg of protein and 0.4 U chymotrypsin per mg of protein). Aliquots (1 ml) were taken over the 30 min of 145 intestinal digestion, at 15 s after the addition of enzyme (called int t+), then at 1 min (int t1), 2 min (int t2), 5 min (int t5), 10 min (int t10), 15 min (int t15), and 30 min (int tf). 147 After sampling, the reaction was immediately stopped by adding 100 µl of 0.06 mM soybean Bowman-Birk trypsin-chymotrypsin inhibitor. Digested samples were frozen **at -20°C** until analysis. 2.1.4. Electrophoresis Digested samples were analysed by SDS-PAGE on 12.5% polyacrylamide gels, according to Laemmii¹⁵. Samples were diluted with sample buffer (2% SDS, 20%) glycerol, 1 M DTT, 0.5% bromophenol blue in 62.5 mM Tris-HCl buffer pH 6,8). To

154 take into account the dilution due to the addition of the enzyme, the quantity of sample 155 buffer solution was adjusted so that all samples had a final protein concentration of 5 156 Lug.ul⁻¹. Samples were then heated for 3 min at 100°C. One hundred and fifty ug of protein were loaded onto each lane. Electrophoresis was carried out at a constant current (200 V) for 45 min. Gels were fixed in 20% v/v trichloroacetic acid for 90 min

Page 7 of 41 Food & Function

Food & Function Page 8 of 41

193
$$
GelnCC = \frac{GelnBV}{GelrefBV}
$$
 eq. 1

194 All the band volumes of Gel_n were then multiplied by the Gel_nCC coefficient. 2.3. Statistical methods

The data set was a matrix consisting of the corrected quantified band volumes (21 columns) with a row representing the 17 samples (the control and the 16 dry-heated samples) at each digestion sampling time (i.e. 17x8=136 rows), as described in Supplementary Materials 1.

PCA transformed the variables observed into a new set of independent variables called Principal Components (PCs) which were uncorrelated linear combinations of the original variables. The first PC was the one which explained most of the variance 204 in the data. A large part of the information in the data could thus be plotted on 2-D or 3-D graphs defined by the PCs.The matrix for PCA is described in Supplementary Materials 1. Dry-heating temperature, time and digestion sampling time were added as supplementary variables. PCA was performed using the FactoMineR package of 208 the R software^{16,17}. The variables were automatically standardized (mean centred and scaled) by the software to give them all the same importance.

2.3.2. Hierarchical Clustering Analysis (HCA)

2.3.1. Principal Component Analysis (PCA)

HCA was performed in order to visualize and highlight the similarities between 212 individuals. Briefly, HCA consists of calculating the dissimilarity, usually called the 213 distance, between individuals¹⁸. In the present study, Ward's method was used for hierarchical clustering with the Euclidean distance as a similarity measure. The distances were calculated from the first 5 PCs only to suppress the noise in the data 216 that occurred in the last PCs.

2.3.3. Multiple Factor Analysis (MFA)

Page 9 of 41 Food & Function

MFA was performed on the table containing the quantified band values at each digestion sampling time, with the row representing the 17 samples (the control and the 16 dry-heated samples), as presented in Supplementary Materials 2. Dry-heating **temperature and time were added as supplementary variables.** MFA deals with a multiple table, composed of groups of either continuous, categorical 223 variables or frequency tables¹⁹. MFA balances the influence of the groups on the first **principal dimension by dividing the weights of the variables/columns of a group by the** first eigenvalue of the separate PCA of this group. The highest axial inertia of each group is standardized at 1. MFA provides the classical results of principal component methods. PCA characteristics and interpretation rules are retained. MFA offers tools **for comparing the different groups such as the partial representation of the individuals** 229 (rows). This representation allows comparison of the typologies provided by each 230 group in a common space. In other words, it allows comparison of the PCA results in a common space. A graph of the groups allows global comparison of the groups and evaluation if the relative positions of the individuals are globally similar from one group 233 to another. It also permits the comparison of partial groups and assesses whether they provide the same information. Another graph gives the correlations between the dimensions of the global analysis (MFA dimensions) and each separate analysis

(PCA dimensions).

The aim of the present study was to determine the changes in electrophoretic pattern for each dry-heated sample during digestion. Each group of data was thus composed 239 of the 21 band volume values at one sampling time (Supplementary Materials 2). Only four out of the eight sampling times performed were retained for MFA in order to clarify the results, as further explained in Section 3.2. The four sampling times 242 retained (i.e. gast ti, gast t+, gast tf and int tf) were chosen according to the results of HCA performed after PCA, as described in Section 3.1. MFA provided a 244 representation of the diversity of dry-heating treatments by taking into account the digestion sampling time in a balanced way. Representation of the variables made it **possible to identify the main factors of variance, and to visualize the relationships** 247 between variables within a group (i.e. for one sampling time) and between groups (i.e.

Food & Function Page 10 of 41

Food & Function Accepted Manuscript Food & Function Accepted Manuscript

Page 11 of 41 Food & Function

Food & Function Page 12 of 41

Page 13 of 41 Food & Function

Food & Function Page 14 of 41

control sample first increased up to the dry-heating treatment of 10 days at 80°C, and then decreased for dry-heating treatments at 90°C for 2 days or longer. The volume of the bands positively correlated with PC2, i.e. 130, 121, 112, 55, 42, 35 and14 kDa 371 (Table 2) first increased with dry-heating treatment for up to 10 days at 80°C, but then decreased in samples dry-heated over 2 days at 90°C. 3.5.2. Changes in electrophoretic patterns during the gastric stage As in Section 3.5.1. for comparison of samples before digestion, analyses of the PC1- PC2 plane were undertaken for each digestion time. It is noticeable that for most samples, the partial points at the end of the gastric stage (blue spots) are closer to the centre of the graph than that before digestion (red spots) (Figure 6D). Since the centre of the graph represents mean values for the band volumes correlated with PC1 and PC2, this indicates that the gastric digestion stage decreased the initial electrophoretic **pattern discrepancy due to dry- heating. Only samples dry-heated for 2 days at 70°C,** or for 5 days at 80°C had coordinates on PC1 and/or 2 further from the mean at the end of the gastric stage than at the beginning. These two samples thus had high band volumes for the bands at 130, 93, 42 and 14 kDa, suggesting their low hydrolysis during the gastric stage. For some other samples (60°C-5d, 70°C-1 and 10d, 80°C-2d and 90°C-10 days), partial points corresponding to gast ti and gast tf were close, which suggests hardly any effect of the gastric stage on SDS PAGE pattern. Considering the distances between partial points of a given sample, which represent changes in electrophoresis band volumes that occur during digestion for the sample in question, Figure 6D highlights the effects of dry heating on the progression of the gastric stage. Red, green and blue spots represent the electrophoresis band volumes before, a few seconds after the addition of the gastric enzyme and at the end of the gastric stage, respectively. Red arrows thus illustrate the effects of the addition of the

gastric enzyme on the electrophoretic pattern in the very first few seconds, while green arrows represent the effects of the following 60 min of the gastric stage. It is noticeable that most of the arrows are vertical, indicating that the gastric stage mainly affects the volume of the bands correlated with PC2 (Table 2). However, the relative 397 importance of the very few seconds and of the following 60 minutes differs since the

Food & Function Accepted Manuscript **Food & Function Accepted Manuscript**

Page 15 of 41 Food & Function

sizes of red and green arrows vary from one sample to another. For example, for samples 80°C-1d and 90°C-2d (Figure 6D), the red arrow is smaller than the green arrow . This indicates hardly any difference between gast ti and gast t+ electrophoretic patterns and that hydrolysis mainly occurs during the 60 minutes of the gastric stage. In contrast, for samples 60°C-1d and 70°C-5d, the red arrow is longer and the green arrow shorter, indicating that most of the gastric stage effects occur during the first few seconds after addition of the enzyme. The progression of the gastric stage thus depends on the initial state of the sample.

Although the gastric stage tended to standardize the electrophoretic patterns of the samples, there were still significant differences between samples at the end of this digestion stage. In particular, strongly dry-heated samples (i.e. more than 5 days at 80°C or 2 days at 90°C) still had high coordinates on both PC1 and PC2. These samples thus had high band volumes for the bands at 130, 121, 93, 55, 42, 35, 30, 18 and 14 kDa (Tables 1 and 2). Most of these bands (130, 121, 93, 55, 42, 18, 14 kDa) were present in samples before digestion: their high volume at the end of the gastric stage therefore suggests their low proteolysis by pepsin. However, the bands at 35 and 30 kDa appeared only in gastric digests, suggesting that they corresponded to peptides that were released in higher quantities in the strongly dry-heated samples.

3.5.3. Changes in electrophoretic patterns during the intestinal stage The partial points at the end of the intestinal stage (black spots) were closer to the centre of the graph than those before digestion (red spots), and even than those at the end of the gastric stage (blue spots) (Figure 6E). In continuation of the gastric stage, the intestinal stage thus decreased the initial dispersion of the electrophoretic pattern of samples which became confined along PC1. This is consistent with the correlation of int tf variables only with PC1 (Table 1).

However, for samples dry-heated from 2 to 10 days at 60°C and 1 day at 70°C, and 424 for 2 and 10 days at 80 $^{\circ}$ C and 2 and 5 days at 90 $^{\circ}$ C, the coordinates at the end of the intestinal stage were further from the centre of the graph than those at the end of the gastric stage (Figure 6E). At the end of the intestinal stage, samples dry-heated from 2 to 10 days at 60°C and 1 day at 70°C thus had lower band volumes than the mean

Food & Function Page 16 of 41

for the bands at 121, 93, 42, 55, 14 and 10 kDa (Table 1), whereas samples dry-heated for 2 and 10 days at 80°C and 2 and 5 days at 90°C had higher band volumes than the mean for the same bands. This was also the case for the sample dry-heated for 10 days at 90°C since it still had high coordinates along PC1 at the end of intestinal step. PC1 contrasted (left side) low to medium dry-heated samples (clusters 1 and 3), with (right side) high dry-heated samples (clusters 4, 5 and 6); the control and low-treated samples (cluster 2) being in the middle. From the variable correlation with PC1 (Table 436 1), and cluster distribution along PC1 (Figure 7), it can be concluded that slightly to moderately dry-heated samples had lower band volumes than the control sample for the bands at 10, 14, 42, 55, 93 and 121 kDa at the end of the intestinal stage, i.e. at the end of *in vitro* digestion. In contrast, strongly dry-heated samples had higher band volumes for these components at the end of *in vitro* digestion. 4. Discussion 4.1. The digestion time effect accounted for more than half of the data variability and concealed the dry-heating effect on the progression of *in vitro* protein digestion PCA is a method that projects the data in a new space spanned by principal components. These components reduce the number of dimensions in a data set, and can be used to summarize the structure of the data. This is achieved by transforming the variables observed into a new set of independent variables called principal components (PCs) which are linear combinations of the original variables, and whose correspondence to phenomena such as biological processes can be assumed. PCs are not correlated with each other, and are extracted from the sample one by one, the **first PC** being the one which explains most of the systematic variation in the data¹². In the present study, the first two PCs explain 52.4% of the data set variability (Figure 3) and appear correlated with digestion time (Supplementary Materials 3), which makes sense considering the data set. Indeed, enzymatic digestion of protein is a progressive process that aims at hydrolysing proteins and then extensively changes

Page 17 of 41 Food & Function

electrophoretic patterns. PCA thus makes it possible to highlight the effects of enzymatic digestion on sample electrophoretic patterns, with an individual distribution on the PCA plane mainly governed by digestion time (Figure 3A). In addition, HCA analysis (Figure 4) makes it possible to determine the key digestion times to describe the progression of digestion in a relevant way: before and after addition of pepsin, beginning and end of the gastric stage, before and after addition of trypsin and chymotrypsin. In contrast, the information about the progression of digestion depending on the dry-heating treatment previously applied to the samples remains difficult to extract from the PCA analysis, although a tendency can be seen (Figure 3B). This is a consequence of the strong effect of digestion time described above (52.4% of the variability explained on PCs 1 and 2), meaning that the dry-heating treatment effect appeared significant only on PCs 4 and 5; the dry-heating treatment effect explains only 14% of the variability of the data set. In other words, the digestion time effect conceals the dry-heating treatment effect. Thus the digestion time effect had to be cancelled out to investigate the impact of dry-heating conditions specifically. Multiple

4.2. Dry-heating induced protein aggregation

Factor Analysis was implemented for that purpose.

MFA made it possible to take into account several sets of variables as active elements simultaneously in the definition of distances between individuals. It brought out main factors of data variability, individuals being described by several groups of variables in a balanced manner. In the present study, MFA highlighted the dry-heating effect according to PC1 and PC2 (Figure 6A), the variability induced by digestion time being controlled by the groups defined. The map of the partial individuals before digestion showed high degrees of difference in electrophoretic patterns according to the dry-heating treatment (figure 6C). The coordinates of the samples increased along PC1 when dry-heating intensity increased, whereas along PC2, the coordinates first 486 increased from the control sample up to 10 days' treatment at 80°C, before decreasing for stronger treatments (from 2 to 10 days at 90°C). Since high molecular

Page 19 of 41 Food & Function

Food & Function Page 20 of 41

as suggested by their position on the right of the MFA map (Figure 6E). Such intense dry-heating treatments are believed to lead to the formation of around 40% of soluble aggregates²² and also unfolded proteins, that are more flexible and prone to aggregation²⁸. It can then be assumed that, after the strongest dry-heating treatments, protein aggregation is thus extended or the shape of aggregates is such that it prevents the enzyme from accessing cleavage sites. The overall extent of pepsinolysis has indeed been shown to be mainly governed by the degree of protein **Showed** unfolding in the material prior to ingestion³⁴. Furthermore, Nyemb et al³⁰ showed that the surface area to volume ratio and the degree of unfolding of proteins inside aggregates are the major contributing factors governing the extent and nature of 558 digestion. Jimenez Saiz et al 35 also showed that a high proportion of intact lysozyme may reach the duodenum in an *in vivo* situation. Intact lysozyme then precipitates under duodenal conditions, probably due to electrostatic interaction with negatively charged bile salts at pH 6.5, and this helps it to resist digestion by pancreatic enzymes. Moreover, dry-heating at 80°C increases the lysozyme net charge due to isoaspartate formation³⁶. This increase in protein net charge could thus enhance its reactivity towards bile salts, increasing its resistance to digestion.

5. Conclusion

The nutritional quality of proteins depends on both their amino acid composition and their digestibility. Industrial processes applied to food stuffs to ensure their safety, especially heat treatments, are known to denature proteins. In the present study, we investigated the effects of dry-heating on the progression of *in vitro* digestion of egg white proteins. To do so, the use of multiple factor analysis (MFA) was extended to electrophoretic follow up of *in vitro* digestion kinetics. Classically used in the field of sensory analysis, MFA is designed to analyse data tables in which individuals are described by different groups of variables that could be the same variables observed 575 in different conditions or times. This method can thus be applied to every case where variables can be gathered according to their nature (sensorial, physicochemical variables,etc), time or space (same variables measured at different times or in

Page 21 of 41 Food & Function

Food & Function Accepted Manuscript Food & Function Accepted Manuscript

Page 23 of 41 Food & Function

Food & Function Accepted Manuscript Food & Function Accepted Manuscript

Food & Function Page 24 of 41

Page 25 of 41 Food & Function

699

700

In vitro digestion of egg white powders: Multiple Factor Analysis to follow dry-heating effect

Food & Function Page 28 of 41

Table 1: MFA : significant correlation coefficients (p<0.05) between band volumes at a given sampling time and PC1. NS = non-significant. Band molecular weights in italics = bands that appeared during digestion.

Page 29 of 41 Food & Function

Table 2: MFA: significant correlation coefficients (p<0.05) between band volumes at a given sampling time and PC2. NS = non-significant. Band molecular weights in italics = bands that appeared during digestion.

Figure 1: In vitro digestion of egg white followed by SDS PAGE analysis for gastric (A) and intestinal (B) stages. Lane frames (gast ti, gast t+; gast t2, gast tf; int ti, int t+, int t2 and int tf) correspond to digestion times used for quantification by ImageQuant software. Bands marked with spots correspond to the quantified bands. Ovotransferrin (ovt), ovalbumin (ova) and lysozyme (lyso) bands are identified (A). The two electrophoresis gels presented here as examples show the digestion progression of egg white dryheated at 80°C for 2 days. 89x117mm (96 x 96 DPI)

Figure 2: Projection of variables (electrophoresis bands) onto the plane defined by the first two principal components (PCs) of Principal Component Analysis (PCA). The coordinates of each variable are the correlation coefficients with the two first PCs: the closer the arrow to the circle, the better the representation of the variable. Of the variables significantly correlated with PC1 and 2, the correlations between two variables were all the highest, given that the angle between their directions was small. 192x191mm (150 x 150 DPI)

257x150mm (150 x 150 DPI)

Figure 3: PCA map of individuals projected on the 2D plane defined by PC1 and PC2. A) Individuals identified according to digestion time: gast ti (1) , gast $t+ (2)$, gast $t2$ (3) , gast tf (4) , int $t1$ (5) , into $t+ (6)$, int $t2$ (7) and int tf (8). B) Individuals identified by empty circles and representation of the "dry-heating treatment" qualitative variable by grey squares. In the zoom, the position of the barycentres for the different dryheating treatments. 254x115mm (150 x 150 DPI)

Figure 4: Hierarchical Clustering Analysis (HCA) applied to the first two principal components of PCA. Ward's method was used for hierarchical clustering, with the Euclidean distance as a similarity measurement. 254x182mm (150 x 150 DPI)

Figure 5: Projection of variables (electrophoresis bands) onto the plane defined by the first two principal components (PCs) of Multiple Factor Analysis (MFA). Only variables with a correlation coefficient >0.5 are presented. 192x191mm (150 x 150 DPI)

206x188mm (150 x 150 DPI)

200x170mm (150 x 150 DPI)

186x169mm (150 x 150 DPI)

184x168mm (150 x 150 DPI)

Figure 6: MFA maps of the individuals projected on the 2D plane defined by PC1 and PC2. Each dry-heated sample is represented by five points: the middle point (Figure 6A) corresponds to characterization of variables by the four groups; each extremity (three full symbols) corresponds to characterization by one group of variables: gast ti (red), gast t+ (green), gast tf (blue) and int tf (black), respectively (Figure 6B). Figures 6C to 6E represent MFA maps of the individuals before digestion, during the gastric stage, and during the intestinal stage, respectively; arrows illustrate the effects of digestion stages on the coordinates of the individuals, i.e. on their electrophoretic pattern.

184x170mm (150 x 150 DPI)

Figure 7: Hierarchical Clustering Analysis (HCA) applied to the first two principal components of MFA; this HCA takes into account the balance of the groups of variables considered with MFA. Ward's method was used for hierarchical clustering, with the Euclidean distance as a similarity measurement. 224x177mm (150 x 150 DPI)