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Soybean (*Glycine max*) Protein Hydrolysates as Sources of Peptide Bitter-Tasting Indicators: An Analysis Based on Hybrid and Fragmentomic Approaches

Anna Iwaniak *^{,†}, Monika Hrynkiewicz [†], Piotr Minkiewicz[®], Justyna Bucholska and Małgorzata Darewicz *[®]

Faculty of Food Science, University of Warmia and Mazury in Olsztyn, Chair of Food Biochemistry, Pl. Cieszyński 1, 10-719 Olsztyn-Kortowo, Poland; monika.protasiewicz@uwm.edu.pl (M.H.); minkiew@uwm.edu.pl (P.M.); justyna.bucholska@uwm.edu.pl (J.B.)

* Correspondence: ami@uwm.edu.pl (A.I.); darewicz@uwm.edu.pl (M.D.); Tel.: +48-89-523-3722 (A.I.)

+ These authors equally contributed to this work.

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Abstract: The aim of this study was to analyze soybean proteins as sources of peptides likely to be bitter using fragmentomic and hybrid approaches involving in silico and in vitro studies. The bitterness of peptides (called parent peptides) was theoretically estimated based on the presence of bitter-tasting motifs, particularly those defined as bitter-tasting indicators. They were selected based on previously published multilinear stepwise regression results. Bioinformatic-assisted analyses covered the hydrolysis of five major soybean-originating protein sequences using bromelain, ficin, papain, and proteinase K. Verification of the results in experimental conditions included soy protein concentrate (SPC) hydrolysis, RP-HPLC (for monitoring the proteolysis), and identification of peptides using RP-HPLC-MS/MS. Discrepancies between in silico and in vitro results were observed when identifying parent peptide SPC hydrolysate samples. However, both analyses revealed that conglycinins were the most abundant sources of parent peptides likely to taste bitter. The compatibility percentage of the in silico and in vitro results was 3%. Nine parent peptides with the following sequences were identified in SPC hydrolysates: LSVISPK, DVLVIPLG, LIVILNG, NPFLFG, ISSTIV, PQMIIV, PFPSIL, DDFFL, and FFEITPEK (indicators are in bold). The fragmentomic idea of research might provide a supportive method for predicting the bitterness of hydrolysates. However, this statement needs to be confirmed experimentally.

Keywords: bioinformatics; BIOPEP-UWM database; bitter-tasting peptides; hydrolysates; soybean proteins

1. Introduction

Soybean has been known as a food for thousands of years [1] and recently has become increasingly popular among consumers for ecological, ethical, and health-beneficial concerns [2]. Its health-beneficial properties are due to the presence of biologically active components like isoflavones, saponins, protease inhibitors, and peptides. Briefly, their activity is related to their preventive potential against cardiovascular disease, diabetes, menopausal symptoms, osteoporosis, prostate, and breast cancers. According to the literature, peptides derived from soybean proteins are responsible for a variety of activities that regulate body functions, e.g., reduction of blood pressure, cholesterol, and carbohydrate levels, as well as exhibit anti-inflammatory, antioxidative, and anticancer effects. The first three "reducing" functions of peptides are related to the inhibition of the following enzymes: ACE (angiotensin converting enzyme, EC 3.4.15.1),

DPP IV (dipeptidyl peptidase IV; EC 3.4.14.5), and HMGR (3-hydroxy-3-methylglutaryl-coenzyme A reductase; EC 1.1.1.34), respectively [1].

Quite often, the biological function of a peptide is associated with bitter taste; thus, both peptides and protein hydrolysates may not be acceptable by consumers due to the undesired taste profile [3]. Due to the fact that peptides are derived from food proteins, they are considered as "natural". Thus, their sensory acceptance poses a challenge for food scientists and technologists who aim at producing functional foods [3], especially when some of the bioactive peptides negatively affect the taste of a protein hydrolysate [4].

Currently, three approaches are used to study peptides from foods [5]. The first one is called a classical approach, and briefly, it is an experimental protocol consisting of the main methodological steps like hydrolysis of protein, identification of peptides, and determination of the bioactivity of the hydrolysate(s), as well as the peptide(s). The other two approaches benefit from the progress in the development and application of bioinformatics and chemometrics in the food science. This results from the increasing popularity of databases of biomolecules as sources of information about, e.g., peptides, as well as programs serving for peptide analyses. Thus, the method for studying peptides involving the application of bioinformatic and/or cheminformatic predictions is called an in silico approach, whereas the combination of the classical and in silico protocols is defined as a hybrid approach [5].

Some in silico studies were undertaken to analyze the impact of the amino acid composition of peptides on their bitterness. For example, the bitterness of peptides was found to result from the presence of residues with bulky and branched side chains, like Leu, Ile, Tyr, Phe, and Val. According to the literature, the first three of these amino acids were found to be extremely bitter with an unpleasant flavor and odor [6].

The fact that some regularities can be observed between the presence of the specific amino acid(s) and the function of a whole peptide sequence has prompted some scientists to find the foundations for introducing the fragmentomic idea of research. According to this idea, shorter motifs (fragments) with a known property encrypted in a molecule of interest may affect its function [7]. According to Liu et al. [8], motifs are generally understood as reproducible patterns in a protein or peptide sequence that are ascribed to a specific biological function (in this case, taste). This applies also to peptides identified in a food protein hydrolysate. For example, a sequence identified (i.e., precursor/parent peptide) that contains peptide motifs with confirmed bitterness (i.e., bitter-tasting motifs) may suggest the bitter-tasting potential of a parent sequence. Such an idea of research was applied by Iwaniak et al. [9] for the hybrid analysis of bovine milk protein hydrolysates as sources of bitter-tasting motifs, especially those with an "indicator" status.

To sum up, soybean protein hydrolysates are known sources of bioactive peptides. According to the literature, soybean hydrolysates taste bitter, which may be due to the presence of peptide sequences [10]. Taking into account these two facts, the aim of this study was to apply the hybrid protocol for an analysis of soybean protein hydrolysates as sources of peptides likely to be bitter due to the presence of bitter-tasting motifs, particularly those defined as bitter-tasting indicators. According to the definition introduced by Iwaniak et al. [9], bitter-tasting indicators should be literally understood as "shorter motifs with known bitterness, which found in the sequences of peptides, may potentially determine their taste".

2. Materials and Methods

2.1. Soybean Protein Sequences and Computer Simulation of Their Hydrolysis

Five sequences of soybean (Glycine max) proteins, namely: 7S globulin (403 aa, P13917), glycinin (492 aa, P04347), β -chain of β -conglycinin, (414 aa, P25974), α -chain of β -conglycinin (543 aa, P13916), and profilin (130 aa, O65809), were acquired from the UniProt database [11] (accessed December 2018). The number of amino acids in a protein chain, as well as the accession number of proteins in UniProt are provided in brackets.

The BIOPEP-UWM database [12] tool called "Enzyme(s) action" was applied for computer simulation of hydrolysis. Each soybean protein sequence was theoretically hydrolyzed by bromelain, ficin, papain, and proteinase K, respectively. The following steps were required to hydrolyze protein when opening the BIOPEP-UWM tool: Sensory peptides and amino acids \rightarrow Analysis \rightarrow Enzyme(s) action \rightarrow For your sequence \rightarrow Paste the protein sequence (e.g., 7S globulin) \rightarrow Select the enzyme (e.g., bromelain) \rightarrow View the report with the results. Motifs that were theoretically released from a protein, excluding single amino acids, were copied, and each of them was searched for the presence of bitter-tasting peptides, according to the following protocol: BIOPEP-UWM sensory peptides and amino acids \rightarrow Analysis \rightarrow Profiles of proteins potential sensory activity \rightarrow For your sequence \rightarrow Paste the released peptide (e.g., VFDG) \rightarrow Report. Bitter-tasting indicators (see below) were searched manually after making the above-mentioned analysis. Moreover, the potentially released peptide was searched for showing an additional bioactivity (if any) using an analogical procedure, by selecting "Bioactive peptides" instead of the "Sensory peptides and amino acids" tab after opening the BIOPEP-UWM database.

2.2. Bitter-Tasting Peptide Indicators

Peptides possessing a status of bitter-tasting indicators were selected from the BIOPEP-UWM database collection of 102 bitter di- and tri-peptides (51 sequences of di- and tri-peptides each) that were analyzed using multivariate linear stepwise regression (MLR) [13]. Based on the MLR results, those peptides whose experimental measures of bitterness were approximative to the theoretical ones were defined as bitter-tasting peptidic indicators. They were as follows: PK(0.17;0.08), AD(0.17;0.10), VD(0,08;0.10), VE(0.17;0.15), EI(0.25;0.18), YG(0.33;0.27), VL(0.17;0.21), VI(0.17;0.21), LG(0.05;0.16), GV(0.22;0.25), GP(0.17;0.25), RG(0.13;0.21), IG(0.22;0.19), LE(0.33;0.32), KP(0.33;0.33), VF(0.33;0.37), VY(0.33;0.37), LL(0.4;0.37), FI(0.67;0.56), IF(0.67;0.56), FL(0.67;0.60), FF(0.83;0.72), PGR(0.04;0.26), GGP(0.11;0.12), GGV(0.03;0.10), GLG(0.1;0.17), PPG(0.11;0.03), LGL(0.20;0.07), FGG(0.22;0.02), VVV(0.22;0.05), GGL(0.1;0.12), GVV(0.22;0.17), PGP(0.11;0.25), KPK(0.33;0.37), YGG(0.43;0.52), PGI(0.43;0.48), PPP(0.50;0.66), GLL(0.67;0.69), LLL(0.83;0.64), GGF(0.67;0.76), GGY(0.67;0.74), PIP(0.70;0.82), GYY(2.50; 2.32). Finally, 21 dipeptides and 21 tripeptides achieved the status of a bitter taste indicator. Their experimental and theoretical bitterness are provided in the brackets, respectively. The experimental bitterness of a peptide was expressed as Rcaf. value, meaning the threshold concentration for 1 mm caffeine solution as a standard (the higher the Rcaf. value, the bitterer the peptide is) [14].

2.3. Materials and Reagents

Soy protein concentrate (SPC) called Isomil®(containing 68 % protein, according to the product specification) was produced by Libra Poland Ltd. (Warsaw, Poland). Enzymes: bromelain (EC 3.4.22.32; 5-15 units/mg protein; Cat. No. B5144), ficin (EC 3.4.22.3, \geq 1 unit/mg protein; Cat. No. F4125), papain (EC 3.4.22.2, 10 units/mg protein; Cat. No. P4762), and proteinase K from *Tritirachium album* (EC 3.4.21.64, \geq 30 units/mg protein; Cat. No. P2308), and trifluoroacetic acid (TFA), acetonitrile (ACN), 2,2-bis(hydroxymethyl)-2,2',2"-nitrilotriethanol (Bis-Tris), 2-mercaptoethanol, and urea were purchased from Sigma-Aldrich Sp. z o.o. (Poznań, Poland). All chemicals were of analytical grade. Water used to formulate solutions and buffers was prepared using a Milli-Q PLUS system (Millipore Corp., New York, NY, USA).

2.4. Hydrolysis of SPC

SPC hydrolysis was carried out according to the protocol provided by Peñta-Ramos and Xiong [15] with slight modifications. Firstly, five separate water solutions of SPC containing 3% protein (w/v) each were prepared. All of them had the non-adjusted pH of 7.0±0.1. SPC solutions were continuously and gently stirred, as well as pre-heated for 5 min using a Heidolph Unimax Modular Incubator 1010 (Heidolph Instruments GmbH & CO. KG, Schwabach, Germany). The preincubation temperatures were

typical of the activity of enzymes used, according to their specifications provided by the manufacturer, and were as follows: bromelain and ficin (50 °C), papain (65 °C), and proteinase K (37 °C). Finally, 3 hour hydrolysis of four SPC samples was conducted under continuous stirring and the enzyme-to-substrate ratio (protein) of 1:100 (w/w) [15,16]. The pH values of SPC solutions were optimal for enzyme activity as provided by the manufacturer, i.e.: 7.0 for bromelain, papain, and proteinase K; and 6.5 for ficin. In the case of the last sample, its pH was adjusted using 0.1 M HCl. Afterwards, all hydrolysates were heated at 90 °C for 15 min to inactivate the enzymes and then freeze-dried. Finally, four SPC hydrolysates were produced, namely B-SPC, F-SPC, P-SPC, and PK-SPC, the abbreviations referring to bromelain-, ficin-, papain-, and proteinase-K-SPC hydrolysates, respectively, according to the convention used in the previous paper [9]. The fifth sample, 0-SPC, was a reference sample being the non-hydrolyzed SPC solution. All hydrolysates were prepared in duplicate.

2.5. RP-HPLC for Monitoring the Process of SPC Hydrolysis and RP-HPLC-MS/MS for the Identification of SPC-Originating Peptides

RP-HPLC (reversed-phase high performance liquid chromatography) was applied to observe the progress in the hydrolysis of SPC using the above-mentioned enzymes. The preparation of SPC/SPC hydrolysate samples taken for RP-HPLC and RP-HPLC-MS/MS (reversed-phase high performance liquid chromatography online with tandem mass spectrometry), as well as the parameters of devices for chromatography were exactly the same as in the protocol by Iwaniak et al. [9].

Firstly, two milligrams of freeze-dried SPC/SPC hydrolysate sample were dissolved in 300 μ L of a buffer containing 0.1 M Bis-Tris and 4 M urea. Then, two microliters of 2-mercaptoethanol were added, and the mixture was vortexed and finally incubated at room temperature (1 hour). Then, six-hundred-eighty microliters of 6 M urea solution in a mixture of ACN and H₂O (v/v; 100: 900; pH 2.2 was adjusted by the addition of TFA) were added to the sample and stirred. Finally, the samples were centrifuged (10 min; 10,000× g) [9].

The RP-HPLC analysis was carried out on Shimadzu[®] devices comprised of two LC-20AD pumps, an SIL-20AC HT autosampler, a CBM-20A controller, a CTO-10AS VP thermostat, an SPD-M20A photodiode detector, a DGU-20A5 degasser, and an FRC-10A fraction collector. The Jupiter Proteo Phenomenex[®] column (Torrance, CA, USA; 250 × 2 mm; particle diameter: 4µm; pore diameter: 90Å) was applied for RP-HPLC analysis of the samples. According to the protocol by Iwaniak et al. [9], Solvent A was 0.01 % TFA water solution (v/v), whereas Solvent B was 0.01 % (v/v) TFA dissolved in acetonitrile (ACN). The gradient of Solvent B increased from 0 to 40 % during 60 min. The column was washed with Solvent B (40-100 %, 60–65 min; 100%, 65–70 min, 100 -0 %, 70–71 min; 0 %, 71–80 min). Data registration was between the 0th and 80th minute of the RP-HPLC analysis. The injection volume was 30 µL; the flow rate was 0.2 mL × min⁻¹; and the column temperature was 30 °C. All chromatograms were acquired at 220 nm [9]. Finally, the chromatographic profiles of the samples taken before the 60th min of the RP-HPLC analysis were the subject of discussion.

Similarly, the exact procedure as that described by Iwaniak et al. [9] was applied for the identification of peptides released from SPC hydrolysates using RP-HPLC-MS/MS. Briefly, the identification of peptides was carried out using the VARIAN[®] 500-MS (Agilent Technologies, Santa Clara, CA, USA) ion trap mass spectrometer with an electrospray ion source and an RP-HPLC assembly comprised of two 212-LC pumps, a ProStar 410 autosampler, a Degassit degasser (MetaChem Technologies[®], Torrance, CA, USA), and a nitrogen generator (Parker Domnick Hunter Scientific[®], Gateshead, U.K.). Data were registered between 5 and 60 min. The other parameters for mass spectrometry included: needle and shield voltages: 5000 and 600 V, respectively; spraying and drying gas (nitrogen) pressure: 55 and 30 psi, respectively; drying gas temperature: 390 °C; flow rate of damping gas (helium): 0.8 mL × min⁻¹; positive polarity with current ionization: 600 V; capillary voltage: 100 V; retardation factor loading: 100 %; isolation window: 3.0; excitation storage level m/z = 100–2000 Da; flow rate: 0.2 mL × min⁻¹; injection volume: 15μ L; frequency of data recording: 0.05-0.07 Hz single scan averaged from five microscans. The gradient and column type including its

parameters were identical to those presented above [9]. Peptides were identified by comparison of experimental mass-to-charge ratios, and the ratios were calculated using the Fragment Ion Calculator program (http://db.systemsbiology.net:8080/proteomicsToolkit/FragIonServlet.html) as described in our previous article [9]. All analyses were performed in duplicate.

We introduced an additional parameter to compare the susceptibility of proteins to particular proteolytic enzymes:

$$C = (S_{shorter} - S_{0shorter}) / S_{longer}$$
(1)

where:

 $S_{shorter}$: relative area of peaks between 14.00 and 39.99 min in the chromatogram of the hydrolysate; $S_{0shorter}$: relative area of peaks between 14.00 and 39.99 min in the chromatogram of the

non-hydrolyzed sample;

S_{longer}: relative area of peaks between 40.00 and 60.00 min in the chromatogram of the hydrolysate.

Retention time prediction is a helpful strategy supporting peptide identification by mass spectrometry [17]. To facilitate peptide identification, their theoretical retention times ($t_{R \text{ predicted}}$) were calculated and then compared with the experimental ($t_{R \text{ experimental}}$) ones. The $t_{R \text{ predicted}}$ was predicted using Sequence Specific Retention Calculator (SSRCalc) (http://hs2.proteome.ca/SSRCalc/SSRCalc.html; accessed: December 2019) [18] according to the mathematical formula introduced by Darewicz et al. [19]:

$$t_{R \text{ predicted}} = 0.0002 \times (t_{R \text{ SSRCalc}})^3 - 0.0085 \times (t_{R \text{ SSRCalc}})^2 + 1.0415 \times (t_{R \text{ SSRCalc}}) + 8.6434$$
(2)

where:

t_{R SSRCalc}: retention time (min) calculated with Sequence Specific Retention Calculator (SSRCalc).

The specific parameters implemented in the software to obtain $t_{R SSRCalc}$, like the retention time of the substance not adsorbed on the column (parameter "a"), the parameter dependent on the acetonitrile gradient (parameter "b"), pore diameter, column, and TFA concentration, were as described by Iwaniak et al. [9].

3. Results

3.1. In Silico Analysis

Many data concerning molecules can be found in databases [5]. The BIOPEP-UWM database of sensory peptides and amino acids [20] was used to analyze the in silico fragments released from soybean proteins. These peptides were searched for the presence of shorter bitter-tasting fragments, including indicators. The results are shown in Tables 1 and A1 (in the Appendix A). They include only released fragments that (a) contained bitter-tasting motifs and (b) consisted of four amino acid residues at a minimum. Shorter fragments were not discussed. They were di- and tri-peptides that could already match the sequences with a known taste sensation (i.e., bitterness).

Table 1. Number of parent peptides including these containing bitter-tasting indicators found in soybean protein sequences.

Parent Peptides Released from Profilin Due to the Simulated Action of:					
B ¹	F	Р	РК		
Number of parent peptides/number of parent peptides containing bitter-tasting indicators					
9/7	5/2	7/5	4/1		
Total number of parent peptides/total number of parent peptides containing bitter-tasting indicators = 25/15					
Parent peptides released from globulin 7S due to the simulated action of:					
В	F	Р	РК		

Number of paren	t peptides/number of parer	nt peptides containing bitter-	tasting indicators		
24/16	10/5	20/16	14/4		
Total number of parent pe	l number of parent peptides/total number of parent peptides containing bitter-tasting indicators = $68/41$				
Parent p	eptides released from glyo	cinin due to the simulated a	ction of:		
В	F	Р	РК		
Number of paren	t peptides/number of parer	nt peptides containing bitter-	tasting indicators		
28/17	12/4	18/11	17/8		
Total number of parent peptides/total number of parent peptides containing bitter-tasting indicators = 75/38					
Parent peptides	released from β-conglycir	nin (β-chain) due to the sime	ulated action of:		
В	F	Р	РК		
Number of parent peptides/number of parent peptides containing bitter-tasting indicators					
30/18	9/4	26/17	13/4		
Total number of parent pe	ptides/total number of pare	ent peptides containing bitter	r-tasting indicators = 78/43		
Parent peptides	released from β-conglycir	nin (α -chain) due to the sime	ulated action of:		
В	F	Р	РК		
Number of parent peptides/number of parent peptides containing bitter-tasting indicators					
32/23	16/8	27/17	17/5		
Total number of parent pe	ptides/total number of pare	ent peptides containing bitter	-tasting indicators = 92/53		

Tabl	e 1.	Cont.

¹ B, bromelain; F, ficin; P, papain; PK, proteinase K. The complete list of peptide sequences is presented in the Appendix A (Table A1).

Regardless of the substrate and enzyme applied, all released fragments were the potential sources of motifs matching the sequences collected in the BIOPEP-UWM database and known in the literature as bitter-tasting. Thus, it was the premise to define them as parent peptides. Taking into consideration all enzymes applied in the study, the highest number of parent peptides was potentially released from β -conglycinin (α -chain), while profilin was the protein revealing the smallest number of peptides produced. Generally, the best in silico enzymatic potential aiming to produce parent peptides from all soybean protein sequences was represented by bromelain and papain. Other enzymes, i.e., ficin and proteinase K, produced less parent peptides than the above enzymes. However, in most of the cases, proteinase K was predicted to be slightly better than ficin considering the number of peptides potentially released from soybean proteins. The most abundant potential sources of parent peptides containing one bitter-tasting indicator at minimum were: profilin (7 sequences, enzyme used: bromelain), 7S globulin (16 sequences each, enzymes used: bromelain and papain), glycinin (17 sequences, enzyme used: bromelain), β -conglycinin (β -chain) (18 and 17, enzymes used: bromelain) and papain, respectively), and β -conglycinin (α -chain) (23 sequences, enzyme used: bromelain). The highest total number of parent peptides with encrypted bitter-tasting indicators, regardless of the enzyme used, was determined in the β - and α -chain of β -conglycinin (43 and 53 out of 78 and 93 generally released, respectively). Considering the enzymes that produced such parent peptides (i.e., with encrypted indicators), their ranking was as follows: bromelain > papain > ficin > proteinase K. The criterion in this ranking was the total number of parent peptides (i.e., the higher the number, the better place in the rank) containing one indicator of bitter taste at a minimum.

Dipeptides rather than tripeptides with or without the status of a bitter-tasting indicator were the great majority of motifs found in the parent peptides. Both two and three amino acid fragments were observed in the following peptides: ERPG-RP, RPG (source: profilin hydrolyzed with ficin); RQLEENLVVFDLA-**VF**, **LE**, LV, DL, EEN (source: 7S globulin hydrolyzed with proteinase K); SRPG-RP, RPG (source: 7S globulin hydrolyzed both with bromelain and ficin); EENL-EEN (source: 7S Some of the parent peptides in silico released from proteins contained such bitter-tasting motifs possessing or not possessing the status of indicators that fully or almost fully overlapped their whole sequences. They were for example encrypted in: VIRG-**VI**, **RG** (profilin, enzyme used: bromelain); EITLG-**LG**, **EI** (7S globulin, enzyme used: bromelain); DVLVIPLG-**VL**, **VI**, **LG**, LV (glycinin, enzymes used: bromelain and papain); VVLY/VV, **VL** (glycinin, enzyme used: bromelain); VVFK-**VF**, VV (glycinin, enzyme used: papain); EGGL-EGG, EG (glycinin, enzyme used: proteinase K); DIFL-**FL**, **IF** (α - and β -chain of β -conglycinin, enzyme used: ficin); FVDA-FV, **VD**, DA (α - and β -chain of β -conglycinin, enzyme used: papain); VLFG-**VL**, FG, LF, VIVE-**VI**, **VE**, IV; PFPSILG-FP, PF, PFP, **LG**, IL (β -chain of β -conglycinin, enzyme used: papain); and NILE-**LE**, IL (α -chain of β -conglycinin, enzyme used: papain); and NILE-**LE**, IL (α -chain of β -conglycinin, enzyme used: papain); Alter **V** (α - chain of β -conglycinin, enzyme used: papain); and NILE-**LE**, IL (α -chain of β -conglycinin, enzyme used: papain); and NILE-**LE**, IL (α -chain of β -conglycinin, enzyme used: papain); and NILE-**LE**, IL (α -chain of β -conglycinin, enzyme used: papain); and NILE-**LE**, IL (α -chain of β -conglycinin, enzyme used: papain); and NILE-**LE**, IL (α -chain of β -conglycinin, enzyme used: papain); and NILE-**LE**, IL (α -chain of β -conglycinin, enzyme used: papain).

3.2. Monitoring the Process of SPC Hydrolysis

Taking into account the ranking of enzymes suitable for soybean protein hydrolysis, as well as the number of peptide bitter-tasting indicators produced, the next step was to produce soybean hydrolysates to compare in silico and in vitro results. Five samples representing 0-SPC, B-SPC, F-SPC, P-SPC, and PK-SPC were subjected to RP-HPLC separation to observe the progress in SPC hydrolysis (see Figure 1 and Table 2). Three major time segments could be distinguished in all chromatograms, namely: 0.00–13.99, 14.00–39.99, and 40.00–60.00 min. The first time segment contained the highest peak eluting for about 10 min (not shown in Figure 1). It was an injection peak that could contain non-retained substances like the buffers used for protein/hydrolysate solutions and low molecular weight compounds present in protein concentrates [9].

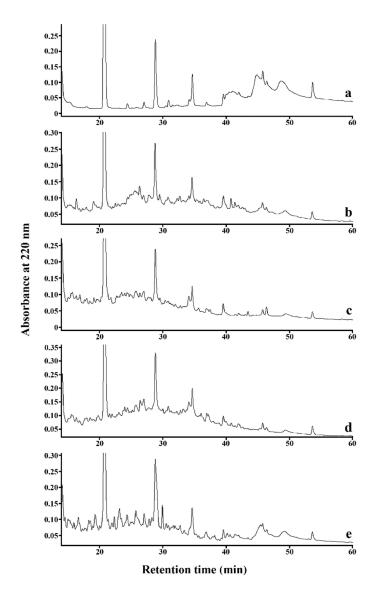


Figure 1. RP-HPLC (Reversed-Phase High Performance Liquid Chromatography) chromatograms of 0-soy protein concentrate (SPC) (**a**), B-SPC (**b**), F-SPC (**c**), P-SPC (**d**), and PK-SPC (**e**). Retention time range displayed in the Figure is between 14th and 60th minute. Chromatograms were acquired at $\lambda = 220$ nm as recommended by Visser et al. [21]. Abbreviations: 0-SPC-soy protein concentrate, B-SPC, F-SPC, P-SPC and PK-SPC: bromelain-, ficin-, papain-, and proteinase K-soybean protein hydrolysate, respectively.

Three major time segments could be distinguished in all chromatograms, namely: 0.00–13.99, 14.00–39.99, and 40.00–60.00 min. The first time segment contained the highest peak eluting for about 10 min (not shown in Figure 1). It was an injection peak that could contain non-retained substances like the buffers used for protein/hydrolysate solutions and low molecular weight compounds present in protein concentrates [9]. In our previous experiment [9], the shape and area of an injection peak were approximately the same in all chromatograms. Therefore, peaks that could be observed within in 0.00 and 13.99 min were not considered for further interpretation. Peaks eluting between 40.00 and 60.00 min corresponded to high molecular weight compounds, like, e.g., proteins [9,22]. On the other hand, the chromatogram of the unhydrolyzed SPC sample contained much material with a short retention time (Table 2) as compared with the unhydrolyzed milk protein concentrate analyzed in our previous experiment [9].

Time Internal (min)	Relati	ve Area of (Chromatog	raphic Peak	s (%) ¹
Time Interval (min) -	0-SPC ²	B-SPC	F-SPC	P-SPC	PK-SPC
14.00-39.99	50.1	83.3	96.7	93.6	85,2
40.00-60.00	49.9	16.7	3.3	6.4	14.8
C ³	0.0	4.0	14.2	6.8	2.4

Table 2. Results of soybean protein hydrolysis as revealed by RP-HPLC (Reversed-Phase High Performance Liquid Chromatography).

¹ The area of all peaks between 14 and 60 min is 100% (See Figure 1); ² 0-SPC, B-SPC, F-SPC, P-SPC, PK-SPC: non-hydrolyzed soy protein concentrate, soy protein concentrate hydrolyzed by bromelain, ficin, papain, or proteinase K, respectively (see the Materials and Methods); ³ Calculated according to Equation (1).

The area of peaks within the range of 14.00-39.99 min and 40.00-60.00 min was almost equal in this experiment (see Table 2), whereas for milk protein concentrate, the ratio of total peak area within a shorter t_R range to a longer t_R range was only ca. 0.05 [9]. Taking the above into account, we introduced the parameter C (Equation (1)) to compare results obtained during experiments performed with soybean proteins (this experiment) and milk proteins [9].

All chromatograms differed when looking at the time interval between 14.00 and 39.99 min. It was also reflected in the differences between the percentages of total peak areas observed in these time segments (Table 2). The order of the C parameter value was as follows: ficin > papain > proteinase K > bromelain, which suggested that ficin was the most efficient among the proteolytic enzymes used for hydrolysis of the soybean protein concentrate. The order of susceptibility of milk protein concentrate (MPC) [9] was reported to be as follows: proteinase K (C = 19.6) > ficin (C = 18.4) > papain (C = 7.8) > bromelain (C = 1.6). Ficin seemed to be sufficient for hydrolysis of both MPC and SPC. Proteinase K hydrolyzed MPC more extensively than SPC. There was a relatively high amount of unhydrolyzed proteins after the hydrolysis of both protein preparations by bromelain.

3.3. Identification of Peptides Likely to Be Bitter Derived from SPC Hydrolysates

The results of identification of parent peptides in SPC hydrolysate samples are present in Table 3. The highest number of such peptides was identified in ficin and bromelain hydrolysates of SPC (five and four, respectively). Peptides derived from F-SPC matched the sequences originally encrypted in: 7S globulin (1 peptide), glycinin (1 peptide), and β -chain of β -conglycinin (3 peptides). In turn, in the case of B-SPC, parent peptides were matched glycinin and the β -chain of β -conglycinin (two peptides each). One parent peptide was reported in papain SPC hydrolysate (source: α -chain of β -conglycinin), whereas no peptides were found in proteinase K soybean protein hydrolysate. To summarize, the most effective enzymes producing in vitro the highest number of parent peptides were ficin > bromelain > papain. One parent sequence, i.e., LIVILNG, was identified in both B-SPC and P-SPC and matched both chains of β -conglycinin analyzed. All parent peptides identified in SPC hydrolysates contained motifs both with and without the status of a bitter-tasting indicator. Taking into consideration 339 parent peptides as the total sum of the sequences predicted as identified after in silico hydrolysis of soybean proteins and 10 parent peptides in vitro identified in SPC hydrolysates, the compatibility of the in silico and in vitro results of peptide identification was ca. 2.95%.

Protein Source	Parent Peptide	m/z (Da)	t _{R predicted} (min)	t _{R experimental} (min)	Motif ¹
		B	-SPC ²		
glycinin	LSVISPK DVLVIPLG	743.466 825.509	25.430 43.140	22.580 39.540	PK, VI VL, VI, LG, LV ³
β-conglycinin (β-chain)	LI VI LNG NP FL FG	741.487 694.356	38.280 41.170	39.390 39.860	VI , IV, LI, IL FG, FL , LF, PF
		Ι	F-SPC		
7S globulin glycinin	ISSTIV PQMIIV	619.367 700.407	25.520 34.500	24.770 40.620	IV II, IV
β-conglycinin (β-chain)	PFPSIL DD FFL FFEITPEK	673.392 656.293 1010.520	27.530 41.170 35.950	27.050 34.782 36.200	FP, PF, PFP, IL FF, FL FF, EI
P-SPC					
β-conglycinin (α-chain)	LI VI LNG	741.487	38.280	39.390	VI, IV, LI, IL

Table 3. Parent peptides identified in SPC hydrolysates using LC-MS/MS (Reversed-Phase High Performance Liquid Chromatography online with tandem Mass Spectrometry).

¹ Bitter-tasting indicators are given in bold; ² B-SPC, F-SPC, and P-SPC: bromelain-, ficin-, and papain-soybean protein hydrolysate, respectively (see the Materials and Methods); ³ peptides with no indicator status are given in normal font.

Parent peptides were considered as identified in SPC hydrolysate if (a) the fragment ions were observed in the particular retention time (t_R) and (b) $t_{R \text{ predicted}}$ and $t_{R \text{ experimental}}$ differed within the range of ±10% [19,22]. Peptide identification was understood as detection of a group of fragment (daughter) ions eluted in the same retention time [19,22,23]. Some of them could be formed via the non-sequential charge-directed pathway, leading to their formation by loss of water or the ammonia neutral molecule [24].

An example of a parent peptide that was identified in SPC hydrolysate fulfilling the above-mentioned criteria was the **FFEI**TPEK sequence (Figure 2) containing two bitter-tasting indicators: **FF** and **EL**. The **FFEI**TPEK was identified in an F-SPC sample and matched the β -chain of β -conglycinin. The m/z of the precursor (M+H)⁺ ion was 1010.500 Da. An intensive peak was observed in t_{R experimental} =36.200 min (t_{R predicted} = 35.950 min). Moreover, the detection of this peptide in an F-SPC sample was confirmed by the presence of eight fragment ions that eluted within the above-mentioned time. They were as follows: X₄⁺, C₄⁺, B₈⁺, B₇⁺, B₆⁺, A₈⁺, Z₇⁺, and Y₅⁺, and their intensity was expressed from several hundred (Y₅⁺ ion) to thousands of counts (kCounts; all other fragment ions).

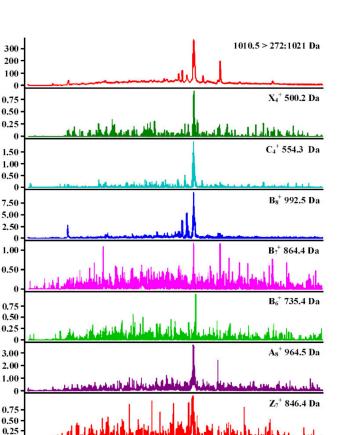
Intensity (kCounts)

0

10

20

0.40 0.20 0



Y5⁺ 587.3 Da

50

60

Figure 2. LC-MS/MS (Reversed-Phase High Performance Liquid Chromatography online with tandem Mass Spectrometry) chromatograms of total ion current (upper chromatogram: 1010.5 > 272:1021 Da) and daughter ions of the **FFEI**TPEK peptide matching the β -conglycinin (β -chain) fragment, identified among products of the soybean protein concentrate hydrolyzed by ficin. Nomenclature of daughter ions according to Roepstorff and Fohlman [25].

30

Retention time (min)

40

One peptide, i.e., DDFFL, with two encrypted indicators: FF and FL, was identified in F-SPC. It matched the β -chain of β -conglycinin. The most intensive peak eluted for about 35 min (see Figure 3); however, the theoretical retention time calculated for this peptide was 41.170 min. The difference between t_{R predicted} and t_{R experimental} exceeded the threshold value of 10% for defining the peptide as identified [21]. The m/z of the (M+H)⁺ precursor ion of the DDFFL peptide was 656.300 Da, and nine intensive peaks were observed in 35 min. They were the following fragment ions: X₂⁺, C₄⁺, B₄⁺, B₃⁺, B₂⁺, A₃⁺, A₅⁺, Z₂⁺, and Z₄⁺. All of them occurred in thousands of counts. Thus, the DDFFL peptide was considered as identified in the F-SPC sample. Some differences between predicted and experimental RT (retention time) were observed during the microLC-ToF-MS (i.e., micro liquid chromatography time-of-flight mass spectrometry) identification of bioactive peptides derived from yoghurt. According to Kunda et al. [26], such an unequivocal identification based on retention time differences is called Type 1 identity conflict.

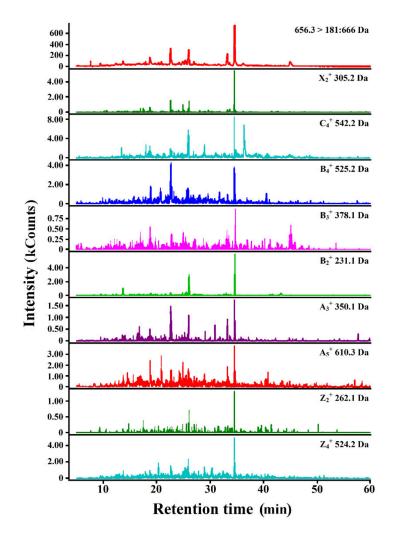


Figure 3. LC-MS/MS chromatograms of total ion current (upper chromatogram–656.3 > 181: 666 Da) and daughter ions of the DDFFL peptide matching the β -conglycinin (β -chain) fragment identified among products of hydrolysis of soybean protein concentrate by ficin. Nomenclature of daughter ions according to Roepstorff and Fohlman [25].

It is well documented in the literature that some biopeptides impart bitter taste, which is a limitation when thinking about their implementation in foods supporting the prophylaxis of diet-related diseases [27]. This especially concerns ACE-inhibiting peptides [28]. Some of the bitter-tasting motifs encrypted in all parent peptides identified in SPC hydrolysates showed an additional biological effect as judged by BIOPEP-UWM database screening (see Table 4). A more comprehensive list of the bioactivities of bitter peptides may be found in the Supplement to our previous review [29]. It was evidenced that the application of different proteases or the fermentation process of soybean proteins leads to obtaining the unique peptide profiles exhibiting, e.g., antihypertensive [30,31], hypocholesterolemic [32], antioxidative [33], and antidiabetic [1] effects. The majority of bitter fragments occurring in parent peptides that were identified in all SPC hydrolysates were associated with ACE-, DPP-IV-, and DPP-III-inhibiting or glucose uptake-stimulating activity. The first activity plays an important role in the reduction of blood pressure [34], while DPP-IV inhibitors are responsible for the antidiabetic effect [35], and the latter ones are involved in prolonging the action of endogenously released or exogenously applied enkephalins (i.e., a promising agent in chronic pain management) [36].

Parent Peptide	Motif ¹	Bioactivities
LSVISPK	PK; VI, SV, SP	DPP IV inhibitor
	VL; VI ; LV; IP; PL	DPP IV inhibitor
DVLVIPLG	LG; PL; IP; PLG	ACE inhibitor
	PLG	Opioid
	VL; LV	Stimulating glucose uptake
	VI; LI; IL; LN; NG	DPP IV inhibitor
LIVILNG	IL; LN; NG	ACE inhibitor
	IV; IL; LI	Stimulating glucose uptake
	FL; PF; NP	DPP IV inhibitor
NPFLFG	FL ; PF	DPP III inhibitor
	FG; LF	ACE inhibitor
	IV	Stimulating glucose uptake
ISSTIV	ST	ACE inhibitor
	TI	DPP IV inhibitor
	II; MI; PQ	DPP IV inhibitor
PQMIIV	IV; II	Stimulating glucose uptake
	PQ	ACE inhibitor
	FP; PFP; IL	ACE inhibitor
PFPSIL	FP; PF; IL; PS; SI	DPP IV inhibitor
rrr51L	IL	Stimulating glucose uptake
	PF	DPP III inhibitor
DDEEL	FL	DPP IV inhibitor; DPP III inhibitor
DDFFL	FFL; DF	ACE inhibitor
FEET DE1/	EI ; TP; EK	DPP IV inhibitor; ACE inhibitor
FFEITPEK	PE	DPP III inhibitor

Table 4. Additional bioactivity of bitter motifs found in parent peptides identified in SPC (soybean protein concentrate) hydrolysate samples.

¹ Bitter-tasting indicators are given in bold, and peptides with no indicator status are given in normal font. Abbreviations: ACE, Angiotensin-converting enzyme (EC 3.4.15.1); DPP III, dipeptidyl peptidase III (EC 3.4.14.4); DPP IV, dipeptidyl peptidase IV (EC 3.4.14.5).

4. Discussion

The study above was divided into two steps: bioinformatic and experimental analyses. According to Tu et al. [37], bioinformatic analyses help in better understanding biological data and hence their application in food and nutrition increases. Moreover, the fact of the presence of some unique fragments within the primary structures of peptides underlies their different biofunctions. Bioinformatic studies enable minimizing the number of experiments involved to determine the impact of the structure of a peptide on its biological function [37]. Moreover, in silico experiments are relatively easy and less costly to carry out, and they do not require reagent and sample preparation [38]. Combining the bioinformatics with an experimental verification of the results is, in turn, a kind of methodology called an integrated (i.e., hybrid) approach. This term was introduced by Udenigwe [38], and ever since, many studies on bioactive peptides, including the present one, have implemented procedures to solve a problem using databases of biological information and then involving laboratory analyses [5].

To the best of our knowledge, the hybrid and fragmentomic approaches have not been applied so far to analyze the potential of soybean proteins as the reservoir of bitter-tasting motifs. Moreover, our protocol of research was partially based on positive selection [39], i.e., finding in the protein the sequential motifs with already known biological function (i.e., provided in a database). Fu et al. [39] employed this strategy to evaluate the potential of patatin (*Solanum tuberosum*; potato protein) as a source of biopeptides. The biological dataset (peptide sequences) was acquired from the BIOPEP-UWM database. The novel aspect of our research was the use of the positive selection to define bitter-tasting motifs (especially peptide indicators) in parent sequences potentially released from soybean. According to Agyei et al. [40], the prediction of the bitter taste of foods may support the development of the procedures for masking this taste. Although such a strategy of research has some limitations, it may help discover new peptides [40]. This is a universal approach that may be applicable to in silico assessment of any protein as the reservoir of peptides with any biological function. Although the term "fragmentomics" is not widely used in publications, it represents one of the common contemporary strategies of research on bioactive peptides. Recent applications of fragmentomics concerning the bioactivity of peptides derived from various food sources have been described by Sutopo et al. [41], Alcaide-Hidalgo et al. [42], and Kinariwala et al. [43].

As was said above, the substrate for bioinformatic analyses was the sequences of five soybean proteins, which were subjected to the theoretical hydrolysis using four enzymes: bromelain, ficin, papain, and proteinase K. According to the literature, soybean is widely used in human nutrition and animal feeding due to the high biological value of its proteins. Moreover, it is the least expensive source of protein, which may be helpful in solving feeding and agronomical problems [44]. However, hydrolysis of proteins, also these from soybean, contributes to the production of peptides that taste bitter and are not accepted by Western consumers, even if they offer a health-beneficial value [45,46]. Our initial bioinformatic predictions also confirmed the potential of soybean proteins as the richest sources of bitter-tasting sequences when comparing them to the other sequences of proteins derived from grains, oil, and leguminous plants (21 sequences in total; data not shown). This comparison was made based on one of the criteria serving to evaluate proteins as sources of peptides with a particular bioactivity (i.e., bitterness in this case) defined as the frequency of the occurrence of bitter peptides in a protein chain, a parameter called "A" available in the BIOPEP-UWM database (data not shown). According to the scientific reports, the higher the A, the better the potential of a protein to release peptides with a specified biofunction [47]. A similar trend was successfully followed by Keska and Stadnik [48], who analyzed 16 sequences of porcine proteins as sources of tastant peptides. The potency of myofibrillar and sarcoplasmic proteins was estimated based on the values of a parameter called "abundance of taste-active peptides/amino acids in a protein sequence" (A_R), being mathematically a twin version of the A value provided in the BIOPEP-UWM database. A_R calculations enabled a theoretical indication about which of the porcine proteins may have the strongest impact on the sensory properties of meat products [48].

Most of the endopeptidases that are applied to produce soybean protein hydrolysates are derived from microorganisms and/or plants. Among them, bromelain, papain, and ficin are stated as the enzymes with large scale availability when comparing them to the proteases originating from animal sources [49]. Although, the analysis of the scientific reports did not show any data about the possible application of the fourth enzyme, i.e., proteinase K, aiming to produce peptides from soybean proteins, this enzyme was included on the in silico part of the study. This decision resulted from the comparison of the effectiveness of almost all enzymes available in BIOPEP-UWM (expressed as the number of peptides released) to produce potentially bioactive peptides, especially tastant peptides (data not shown). The comparison excluded pepsin, trypsin, and chymotrypsin as digestive tract enzymes. They naturally digest proteins when ingested [46].

The results of the enzymatic release of a fragment containing bitter-tasting motifs with and without the status of an indicator are presented in Table 1. This way of data analysis fits the research trend of fragmentomics relying on ascribing the "unknown" biological function of a molecule to the known function of motifs occurring in it and is based on positive selection (see above) [7,39]. In our study, the molecule with no predicted function was a compound called the parent peptide, whereas the motif deciding its possible function was the bitter-tasting peptide. Thus, to be consistent with the fragmentomic idea, data analysis was limited to the released peptides composed of at least four amino acids. Data about the bitterness of such peptides were implemented from the BIOPEP-UWM database of sensory peptides and amino acids [20]. Based on the MLR stepwise regression analysis, some of these peptides were selected as bitter-tasting peptidic indicators, i.e., peptides with approximate predicted

and experimental $R_{caf.}$ values [13]. MLR is one of the chemometric techniques that enables analyzing the relationship between the structure (i.e., sequence) of a peptide and its biological activity, which is called QSAR (i.e., quantitative structure-activity relationship) [50]. According to Chanput et al. [51], the QSAR methodology is one of the important methods for the analysis of the functionality of peptides. The results of MLR showed that the bitter taste of a peptide is attributable to the presence of some specific residues, like Leu, Ile, Val, Phe, and Tyr [13]. This observation was consistent with the statements of other authors studying bitter peptides using QSAR techniques [52].

Ample in silico studies have been undertaken to evaluate proteins as sources of peptides with various bioactivities using the BIOPEP-UWM database [12]. The analysis of data concerning theoretical release of peptides can be considered from several perspectives, namely: how the length of motifs affects their match to the parent peptides; how the length of the parent peptide contributes to the presence of a bioactive motif in it; and finally, how the length of protein affects the number of parent peptides to be produced. As could be seen, parent peptides that were theoretically released from soybean proteins were the sources of bitter motifs with and/or without the status of an indicator. The great majority of such motifs were dipeptides. According to Iwaniak and Dziuba [53], the match of the motif to the query sequence depends on its chain length (i.e., the shorter, the better). The potential of parent peptides as sources of peptides with a specified function can be quantitatively evaluated using the A parameter (see above). So far, the discriminant A had been successfully applied to compare proteins according to the rule: the higher the A value, the better source of biopeptides the protein of interest is [47]. As regards the parent sequences, no regularities were observed between their chain length and the increasing tendency in the occurrence of bitter-tasting motifs. An example in this case is the DIFL/FL, IF peptide (from β -conglycinin β -chain hydrolyzed with ficin). Its A value was 0.500. The ETSFHSEFEEIN peptide was derived from the same source as DIFL and contained two bitter-tasting motifs: EI, EF. Hence, its A value was 0.166. In the case of parent peptides, also their particular amino acid composition is crucial to predict their biological function including the likelihood of them to taste bitter. To exemplify it, these two criteria were fulfilled for parent peptide FSHNILETSFHSEFEEINRVLFG/FG, LF, VL, LE, IL, EI, EF theoretically released from β-conglycinin β -chain hydrolyzed with bromelain. The A value for this peptide was 0.304. Finally, those protein sequences that had the longest amino acid chains represented the best potential to produce several tens of peptides. This rule also suggested the higher probability of peptide release in laboratory conditions [54]. In the case of the in silico results obtained, the highest number of parent peptides likely to be bitter due to the presence of bitter-tasting motifs was produced from α - and β -chains of soybean β -conglycinins. According to literature reports, glycinin and β -conglycinin represent about 65-85 % of the total soybean proteins, and they are known as good reservoirs of bioactive peptides [46].

All in silico results encouraged us to continue studies using laboratory analyses, starting from the hydrolysis of SPC. Hydrolysis was conducted for 3% (w/v) water solutions of SPC. According to Arboleda et al. [55], commercial soybean preparations available in the form of powder (as used in our study) are highly soluble in water if the protein solution does not exceed 20 %. The enzyme-to-substrate ratio for all four samples to be hydrolyzed was 1:100 (protein; w/w). Such proportions of enzymes and substrate were applied by Peñta-Ramos and Xiong [15] for the hydrolysis of soy protein isolate using crude enzymes, like papain, pepsin, and chymotrypsin, as well as commercial proteases to measure the antioxidant activity of hydrolysates.

RP-HPLC comparison of the percentages of the peak areas of all SPC hydrolysate samples allowed monitoring the process of their hydrolysis. The analysis of RP-HPLC chromatograms was successfully applied to observe the progress of hydrolysis of carp, herring, and milk proteins [9,22]. The changes in peak areas observed in different time intervals enabled concluding that SPC hydrolysis took place and allowed identifying parent peptides in the SPC hydrolysate samples using RP-HPLC-MS/MS.

Discrepancies were observed between the number of parent peptides that were identified in silico and in vitro, which is a common fact in the literature [56]. One of the possible reasons behind differences between the in silico and in vitro results was the fact that the sequences produced using the

in silico method had to match those already present in the database [9]. The results of this work showed the successful identification of nine parent peptides in total (see Table 3) in all SPC hydrolysates, whereas the in silico simulation of hydrolysis of soybean sequences allowed obtaining 339 parent peptides. Bucholska and Minkiewicz [22] defined the likely reasons that may affect the unsuccessful identification of peptides in a hydrolysate sample. They included no detectable amount of peptide in the sample (e.g., if some peptide bonds likely to be cleaved are actually resistant to hydrolysis) and no detectable fragmentation in an ion trap mass spectrometer. Additionally, peptides identified in SPC hydrolysates are defined as proteotypic peptides, and their identification is dependent on the mass spectrometer used. Finally, there is no method that would serve for the identification of all possible peptides in a protein hydrolysate [22]. The last reason for the discrepancy might be the fact that in silico predictions assume that all peptide bonds are hydrolyzed in a protein chain.

Ficin was the most effective enzyme for producing peptides in vitro, whereas bromelain in the theoretical production of parent peptides likely to be bitter. Enzyme rankings were as follows: bromelain > papain > ficin > proteinase K (in silico results) and ficin > bromelain > papain (in vitro results). There was no correlation between the results of RP-HPLC (C parameter from Table 2) and the number of identified peptides with bitterness indicators. Despite the differences between these rankings, the richest source of parent peptides produced by the applied enzymes turned out to be conglycinins. No parent peptides that were identified in all SPH matched the sequences known as bitter themselves. Moreover, none of these peptides were found as bioactive themselves (see Table 4). Iwaniak et al. [9] identified some parent peptides likely to be bitter in milk protein hydrolysates. For example, the PFPIIV peptide matched the bitter-tasting sequence in the BIOPEP-UWM sensory peptide database (peptide ID in the database: 195). PFPIIV was known as bitter itself, contained PFP, PF, IV, FP, II bitter motifs, and was identified in bromelain, ficin, and papain hydrolysates of milk protein concentrate. Moreover, two milk protein-derived peptides: TTMPLW (source: papain hydrolysate) and VLPVPQK (source: bromelain hydrolysate), served additional biofunctions. Based on information found in the BIOPEP-UWM bioactive peptide database, the first sequence exhibited opioid, immunomodulating, and ACE inhibitory effects (peptide IDs in the database: 3127, 8172, and 3520, respectively). The second one was reported as an antioxidative agent (peptide ID: 7877) [9]. As was said above, bitterness associated with bioactive peptides may be found as an unwanted property when thinking about the production of food that is health-beneficial and sensorially-attractive [57]. Hence, our concept relying on the fragmentomic idea of research was useful to: (1) find out if the parent peptides were bitter/bioactive themselves or (2) motifs like, e.g., peptidic bitterness indicators that are encrypted in a sequence exhibiting other activities, may "suggest" the bioactivity/taste of the parent sequence. This concept shows also the potential of enzymes to produce motifs supposed to be bioactive/bitter. The enzymes' potential to produce unwanted peptides may initially be also an indicative criterion of their "negative" selection (i.e., rejection) when considering the production of non- or less bitter hydrolysates. However, according to Fu et al. [39], it needs to be noted that although the theoretical predictions concerning the potential of proteins as sources of peptides and enzymes involved in their production can support further research, such predictions are never 100% consistent with experimental results. This is also true concerning our concept.

The discrepancies between in silico and in vitro results may be associated with the specificity of bioinformatic and experimental analyses. Bioinformatic issues are related to the tools used for predictions, especially databases of biological information. Many data on biological peptides are published every year. Our quick search in Scopus (accessed: January 2020) showed 188 records reflecting the number of articles that were published in 2018 (about 15.7 per month) and contained the following exact words as queries "bioactive peptides AND food proteins". The same query words were used to the search for the articles published in 2019. This simple search showed 241 papers published in 2019 (i.e., 20.08 per month). Both searches were limited to articles, and they excluded conference abstracts. Thus, it may appear that there are some biological activities represented by both parent peptides and their bitter-tasting motifs that were published after this paper was released,

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and thus, they were not included when we ran these studies. A similar search for the latest publications concerning sensory peptides showed no new sequences with confirmed bitterness that could be downloaded to the BIOPEP-UWM database and used for further analyses. Thus, our results concerning the presence of bitter-tasting motifs in parent sequences seemed to be relatively steady. Nevertheless, it is recommended to carry out the regular update of databases [38], as well as to use curated databases, like, e.g., BIOPEP-UWM [12].

Experimental issues that possibly affect the differences between in silico and in vitro results may be related to the hydrolysis of protein. Theoretical hydrolysis via bioinformatic tools, including BIOPEP-UWM, is based on the specificity of an enzyme, and hypothetically, all peptide bonds are accessible to enzymatic cleavage [58]. The cleavage of peptide bonds is one of the descriptors characterizing the nature of the enzyme [59]. However, the effectiveness of enzymatic hydrolysis depends also on the temperature, the pH, the enzyme-to-substrate ratio [46], and the types of the molecules affecting the inhibition of the enzyme [60], which are difficult parameters to be included as the "elements" of programs serving for theoretical proteolysis. Moreover, such predictive hydrolysis is relatively simple, especially when the protein is not chemically modified. For example, glycosylated amino acids present in a protein may block the breakdown of a peptide bond in experimental conditions [61]. Additionally, the computer simulation of hydrolysis does not consider the complexity of the protein structure that might hinder its interactions with proteolytic enzyme [58]. Rawlings [62] added to this list some other factors likely to affect the results of proteolysis carried out in experimental conditions, i.e.: location of the enzyme and substrate in different extra- and intra-cellular regions and the involvement of inhibitors. They are not considered by programs for theoretical hydrolysis. In turn, Ashaolu [46] highlighted that proteolysis of soybean carried out in experimental conditions enabled the reduction of waste, establishing the mild conditions of reaction, avoiding unwanted reactions; however, the obstacle is the cost of enzymes, as well as the recovery and/or removal of bitter taste [46].

Despite the discrepancies between the in silico and in vitro results of the hydrolysis of proteins aiming to produce biopeptides, scientists use the hybrid approach more often [63]. Iwaniak et al. [9] applied this protocol to hydrolyze milk protein concentrate using exact enzymes as in the study above. They showed that the results of experimental and theoretical analyses differed. Twenty-eight peptides with the potential to affect the bitter taste of hydrolysates were produced in laboratory conditions, which was consistent by ca. 12 % with computer simulations (226 parent peptides identified in silico). Darewicz et al. [19] used the in silico/in vitro/ex vivo analyses to study the potential of salmon (*Salmo salar*) proteins as the source of ACE inhibitory peptides. To verify the in silico results in laboratory conditions, protein hydrolysis was carried out in vitro (with commercial enzymes) and ex vivo (using digestive juices from volunteers). It was confirmed that some ACE inhibitors were identified in both hydrolysate; however, some of them were observed either in the ex vivo or in the in vitro salmon protein hydrolysate [19].

To recapitulate, the comparison of in silico and in vitro results also differed in our experiment concerning soybean proteins as the material. Nevertheless, they still can be supportive when predicting the bitter-tasting properties of parent peptides based on the fragmentomic approach. Citing the words of Li et al. [64], "the BIOPEP-UWM database is a useful data source that supports the analysis of connections between peptide molecular structures and their sensory properties, and additionally enables users to build a potential sensory profile of peptides". The BIOPEP-UWM database was applied to predict the umami taste of peptides derived from clam *M. meretrix Linnaeus* [64]. Garcia-Vaquero et al. [45] applied the hybrid approach to assess the bitter taste properties of novel peptide ACE inhibitors derived from *U. lactuca* (green algae). To this end, green algae proteins were in vitro (enzyme used: papain) and in silico (tool used: PeptideCutter) hydrolyzed. The bitterness of peptides that were identified in the hydrolysates of *U. lactuca* was predicted based on the calculation of the Q-value introduced by Ney [65]. The Q-value is empirically associated with the hydrophobicity of each amino acid in a peptide sequence. Such a correlation is defined as the Q-rule, according to which the peptide likely to be bitter should have Q over 1400 cal/mole [66]. Based on the Q-rule, it was found that the following

green algae-originating sequences: SAGVLPWK (GV, VL), GAAPTPPSPPPATKPSTPPKPPT (PK, KP, PPP), IECCLLFALV (LL), PVGCLPK (PK), DAVEIWRVK (VE, EI), DEVIPGAL (VI), PKPPALCN (PK, KP), and PPNPPNPPN, were characterized with Q-values ranging from 1440 to 1743.33 cal/mol, which suggested they could taste bitter [45]. Defining these sequences as "parent peptides" and implementing the fragmentomic idea, we found that seven out of eight such peptides contained motifs (in bold) described as bitter-tasting indicators (provided in brackets). Working the opposite way, we calculated Q-values (cal/mole) for all parent peptides that were experimentally identified in SPC hydrolysates. They were as follows: 1611.43 (LSVISPK), 1793.75 (DVLVIPLG), 1780.00 (LIVILNG), 1721.66 (NPFLFG), 1358.33 (ISSTIV), 1908.33 (PQMIIV), 2220.00 (PFPSIL), 1760.00 (DDFFL), and 1741.25 (FFEITPEK). Only one peptide (ISSTIV) had the Q-value below 1400 cal/mole. Based on the Q-value, the other peptides identified in SPC hydrolysates containing bitter-tasting motifs with and without the status of an indicator could be classified as bitter. However, some studies on the bitterness of peptides indicated that some of them with the Q-value lower than 1400 cal/mole also tasted bitter. An example of such a peptide is the EVLN sequence (Q-value = 1162.5 cal/mole) identified in cheddar cheese and matching α_{s1} -case in as a protein precursor [67]. Moreover, taking into account our point of view, this peptide contains the VL bitter-tasting motif, which may be crucial in defining the taste of the whole sequence. Another aspect related to parent peptides likely to be bitter is their size [68]. According to the literature, peptide fractions of soybean protein hydrolysates with molecular weight ranging from 1.9 to 3.3 kDa were characterized by the highest bitterness, whereas the bitterness of other fractions with lower or higher molecular weight than indicated above was milder [68]. Our parent peptides differed in the molecular weight. Thus, the strategy for the elimination of the unwanted taste of a hydrolysate should also be based on the knowledge concerning the amino acid composition of peptides [49]. This point of view fits the fragmentomic idea of the research presented in this article.

The example of positive selection [39] (see above) can be also applicable to enzymes used for the hydrolysis of protein to release peptides. Briefly, the enzyme that is in silico the most effective at producing bioactive peptides may be selected for the hydrolysis of proteins in experimental conditions. This allows identifying the most effective enzymes releasing peptides likely to be bitter (i.e., possessing an unwanted property) from soybean proteins. When thinking about bitterness, such a strategy of research may be the starting point for negative selection, which is the elimination of such enzymes to avoid the production of peptides with the undesired taste. However, the elimination of the enzyme might be problematic if it produces many bitter sequences exhibiting an additional, health-beneficial effect. In such a case, some further procedures should be considered to reduce the bitterness of bioactive hydrolysates. An example of such a procedure is the treatment with exopeptidases [69]. Cheung et al. [69] hydrolyzed whey protein isolates with different commercial endopeptidases and obtained a bitter-tasting ACE-inhibitory hydrolysate. To reduce its bitterness, the hydrolysis was extended with exopeptidases treatment. The taste of this hydrolysate was then more acceptable because of the removal of terminal residues as a result of exopeptidase action [69].

To summarize, our idea of research showed that the potential property of peptides released from proteins might be predicted based on the presence of sequential motifs with already known function (so-called positive selection). This helps understanding some relationships between the structure of a molecule and its activity (e.g., bitter taste). It needs to be noted that although it is possible to prognose the potential of released peptides to taste bitter, such a statement should be confirmed in laboratory conditions [70].

Our methodology might be an effective and universal way to analyze the biological functions of peptides found in protein hydrolysates. Although each of the methodologies contributing to the discovery of bioactive peptides has some limitations and specific character, the strategies involving the wide range of in silico approaches combined with conventional studies can play an important role in the generation and discovery of new peptides [71]. Thus, the employment of several methods for the theoretical prediction of the bitterness of a molecule is inscribed into this trend and is highly recommended.

5. Conclusions

Results concerning the production of peptides likely to be bitter derived from soybean proteins showed the discrepancies between in silico and in vitro results. These discrepancies concerned the number of parent peptides released when applying theoretical and experimental hydrolysis, as well as the ranking of enzymes effective in the production of peptides possessing di- and tri-peptide motifs defined as indicators. The compatibility percentage of in silico and in vitro results was less than 3%. However, all parent peptides that were identified in SPC hydrolysates contained motifs having or not the status of bitter-tasting indicators. Their Q-values suggested they could taste bitter. Thus, it could be concluded that the fragmentomic idea of research analyzing the composition of a parent sequence might be a supportive tool for the prediction of the taste of foods. Moreover, it broadens the knowledge about the structural nature of peptides as bioactive/tastant molecules. However, it is postulated that such statements concerning the peptides likely to be bitter should be evaluated experimentally.

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Abbreviations

0-SPC	Soybean protein concentrate before hydrolysis
А	Depending on the context: one-letter symbol alanine (amino acid) or A-type
A	fragment (daughter) ion according to Roepstorff and Fohlman [25]
ACE	Angiotensin-converting enzyme (EC 3.4.15.1)
ACN	Acetonitrile
В	Depending on the context: bromelain (EC 3.4.22.32) or B-type fragment (daughter)
D	ion according to Roepstorff and Fohlman [25]
BIOPEP-UWM	Depending on the context: database of bioactive peptide sequences [12] or database
DIOI EI -O WIWI	of sensory peptides and amino acids [20]
Bis-Tris	2,2-bis(hydroxymethyl)-2,2',2"-nitrilotriethanol
B-SPC	Soybean protein concentrate hydrolyzed by bromelain
	Depending on the context: parameter to compare susceptibility of proteins to
С	proteolytic enzymes on the basis of chromatograms (calculated using Equation (1))
	or C-type fragment (daughter) ion according to Roepstorff and Fohlman [25]
DPP III	Dipeptidyl peptidase III (EC 3.4.14.4)
DPP IV	Dipeptidyl peptidase IV (EC 3.4.14.5)
F	Depending on the context: ficin (EC 3.4.22.3) or one-letter symbol of amino acid
1	phenylalanine in peptide sequences
F-SPC	Soybean protein concentrate hydrolyzed by ficin
HMGR	3-hydroxy-3-methylglutaryl-coenzyme A reductase (HMG-CoA reductase)
TIMOR	(EC 1.1.1.34)
HPLC	High performance liquid chromatography
MLR	Multivariate linear stepwise regression
MPC	Milk protein concentrate
р	Depending on the context: papain (EC 3.4.22.2) or one-letter symbol of amino acid
1	proline in peptide sequences
P-SPC	Soybean protein concentrate hydrolyzed by papain
РК	Depending on the context: proteinase K (EC 3.4.21.64) or dipeptide prolyl-lysine
	annotated using one-letter code

PK-SPC	Soybean protein concentrate hydrolyzed by proteinase K
Q-value	Average free energy for the transfer of the amino acid chains from ethanol to water [65]
RP-HPLC	Reversed-phase high performance liquid chromatography
RP-HPLC-MS/MS	Reversed-phase high performance liquid chromatography online with tandem mass spectrometry
S	Depending on the context: symbol of relative area of peaks in defined data interval (in Equation (1)) or one-letter symbol of amino acid serine in peptide sequences
SPC	Soybean protein concentrate
SSRCalc	Sequence-Specific Retention Calculator
TFA	Trifluoroacetic acid
t _R	Retention time (e.g., in Equation (2))
UWM	University of Warmia and Mazury in Olsztyn
Y	Depending on the context: one-letter symbol of amino acid tyrosine in peptide sequences or Y-type fragment (daughter) ion according to Roepstorff and Fohlman [25]

Appendix A

Table A1. Parent peptides released in silico from soybean proteins containing bitter-tasting peptides with and without the indicator status (bold and normal font, respectively).

Parent peptides released from profilin due to the simulated action of:			
B^1	F	Р	РК
VDDHLLCDIEG/ VD , LL, EG	CDIEG/EG	VDDH/ VD	EGNHL/EG
IIG/II, IG	IIG/II, IG	LLCDIE/ LL	QGEP/GE
QSTDFPQFK/FP	QSTDFPQFK/FP	QSTDFPQFK/FP	RGKKGP/ RG , GP
PEEITA/EI	PEEITA/EI	MVIQG/ VI	DQGY/GY
MVIQG/ VI	ERPG/RP, RPG	LIIG/II, IG , LI	
VIRG/ VI, RG		QCNMVVE/VE	
LIIG/II, IG		LIDQG/LI	
QCNMVVERPG/RP, RPG, VE			
LIDQG/LI			
Parent peptid	les released from globuli	n 7S due to the simulated action of	of:
В	F	Р	РК
PINLVVLPVQNDG/ VL , LV	PFCHSTQCSRA/PF	PINLVVLPVQNDG/ VL , LV	QNDGSTGL/GL
RTPLMQVPVLVDLNG/VL, VD, LV,	SRPG/RP, RPG	TPLMQVPVLVDLNG/VL,	AASRP/RP
DL	PQFL/FL	VD, LV, DL	GCHKNTCGL/GI
PFCHSTQCSRA/PF	PSFL/FL	DVLA/VL	TQQTGL/GL
SRPG/RP, RPG	SHFG/FG	STQQLG/LG	GEDV/GE
EDVLA/ VL	IIFG/FG, IF, II	PLVTVPQFLFSCA/FL, LF,	QKGL/GL
STQQLG/LG	QDIFHDL/IF, DL	LV	RNTQGV/GV
PLVTVPQFLFSCA/FL, LF, LV	ISSTIV/IV	PSFLVQK/FL, LV	GDAP/DA
PSFLVQK/ FL , LV	MQPRA/PR	IIFG/FG, IF, II	QGEY/GE, EY
LPRNTQG/PR	EITL/EI	QFQNQDIFH/IF	SGEDL/GE, DL
SHFG/FG		SVFPLNK/FP, VF	RAEI/EI
IIFG/FG, IF , II		ISSTIVG/IV	EENL/EEN
PNNMRQFQNQDIFHDLA/ IF , DL		MVLQQSVY/ VY, VL	HSHGV/GV
NVRVNSIRINQHSVFPLNK/FP, VF		FTQVFA/ VF	KCADL/AD, DL
ISSTIVG/IV		QQLPK/ PK	
TMISTSTPHMVLQQSVY/ VY , VL		PSVDLVMDK/ VD , LV, DL	
FTQVFA/ vf		DLMVQA/DL	
QQLPK/ PK		VTCLG/ LG	
PSVDLVMDK/ VD , LV, DL		MQPR/PR	
EDLMVQA/DL		ITLG/ LG	
VTCLG/ LG		NLVVFDLA/ VF , LV, DL	
MQPRA/PR		DLFNFA/LF, DL	
EITLG/ LG , EI			
RQLEENLVVFDLA/ VF , LE, LV, DL,			
EEN			
DLFNFA/LF, DL			

Table A1. Cont.			
LEPDHRVESEG/VE, LE, EG	ESEG/EG	PQMIIVVQG/IV, II, VV	TSSKF/KF
LIETWNSQHPELQCA/LI, EL	SQHPEL/EL	DVLVIPLG/VL, VI, LG, LV	ESEGGL/EGG, GL, GGL,
PQMIIVVQG/IV, II, VV	PQMIIV/II, IV	PVVA/VV	EG
PQQQSSRRG/RR, RG	PQQQSSRRG/RR, RG	ISPLDTSNFNN	QCAGV/GV
IRHFNEG/EG	QHRQQEEEG/EG	QLDQNPR/PR, LD	QQQSSRRGSRSQQQL/RR,
DVLVIPLG/VL, VI, LG, LV	ISPK/PK	SVLSG/VL	RG
DEPVVA/VV	WQEQEDEDEDEDEY/EY	QIVTVE/ VE , IV	NEGDV/EG
ISPLDTSNFNNQLDQNPRVFY/PR,	PPRRPSHG/RR, PP, RP,	LSVISPK/ PK, VI	QQQQQKSHGG
VF, LD	PR	DQPR/PR	RKQGQHRQQEEE
QHRQQEEEG/EG	HEDDEDEDEEEDQP	PPQR/PP	GGSV/GR, EGG, EG
SVLSG/VL	RPDHPPQRPSR	VVLY/VV, VL	EGGL/EGG, EG, GGL ,
HFLA/ FL	PEQQEPRG/PP, RG, RP,	VVNCQG/VV	GL
QIVTVEG/ VE , IV, EG	RP, RP, PR, PR	VFDG/ VF	QEQEDEDEDEDEY/EY
LSVISPK/ PK , VI	RPSRA/RP	QLLVVPQNPA/LL, LV, VV	GRTP/GR
WQEQEDEDEDEDEY/EY	RQFG/FG	VVFK/ VF , VV	RGRGCQTRNGV/ RG ,
PPRRPSHG/RR, PP, RP, PR	TMTRG/ RG	DVFR/ VF	RG , GR, GV
HEDDEDEDEEED		VIPSE/VI	SRADF/AD
QPRPDHPPQRPSRPEQQ		VLSNSY/VL	KAGRI/GR
EPRG/PP, RG , RP, RP, RP, PR, PR		PLVNP/LV	TRGKGRV/ RG , GR
VEENICTMK/ VE , EEN			DGEL/GE, EL
RPSRA/RP			RRGQL/RR, RG
LRQFG/FG			AEQGGEQGL/GE, GL
VVLY/VV, VL			QGNSGP/GP
NSVTMTRG/ RG			
RVRVVNCQG/VV			
VFDG/ VF			
ELRRG/RR, RG , EL			
QLLVVPQNPA/LL, LV, VV			
VVFK/VV, VF			
DVFRVIPSEVLSNSY/VF, VL, VI			
PLVNP/LV			

Table 11 Cont

Parent peptides released from β -conglycinin (β -chain) due to the simulated action of:				
В	F	Р	РК	
	,	•		
PFPSILG/FP, PF, PFP, LG, IL LY				

Parent peptides released from β -conglycinin (α -chain) due to the simulated action of:				
В	F	Р	РК	
EECEEG/EG EIPRPRPRPQHPEREPQQPG/RP, RP, RP, PR, PR, PR, PR, EI EEDEDEQPRPIPFPRPQ PRQEEEHEQREEQEWPRK/RP, RP, PR, PR, PR, PR, FP, PF, PFP, PIP SEEEDEDEDEEQQDE RQFPFPRPPHQK/PP, RP, PR, FP, FP, FPF, PF, PFP EERNEEEDEDEEQQRE SEESEDSELRRHK/RR, EL NPFLFG/FG, FL, LF, PF SNRFETLFK/RF, LF RIRVLQRFNQRSPQLQNLRDY/RF, VL RILEFNSK/LE, IL, EF PNTLLLPNHA/LL, LL, LLL LIVILNG/VI, IV, LI, IL ILSLVNNDDRDSY/LV, IL VVNPDNNENLRLITLA/LI, VV RFESFFLSSTEA/FF, RF, FL FSRNILEA/LE, IL FEEINK/EI VLFSREEG/LF, VL, EG EQRLQESVIVEISK/VI, VE, IV, EI PFNLRSRDPIY/PF FFEITPEK/FF, EI NPQLRDLDIFLSIVDMNEG/FL, IF, IV, VD, LD, DL, EG LLLPHFNSK/LL, LL, LLL IVILVINEG/VI, VI, IV, U, IL, EG NIELVG/LV, EL, VG EQQQEQQQEEQPLEVRK/LE ELSEQDIFVIPA/FV, IF, VI, EL PVVVNA/VVV, VV, VV TSNLNFFA/FF ENNQRNFLA/FL SQDNVISQIPSQVQELA/VI, EL FVDA/FV, VD, DA	EECEEG/EG EIPRPRPRPQHPER EPQQPG/RP, RP, RP, PR, PR, PR, EI EEDEDEQPRPIPFPR PQPRQEEEHEQR EEQEWPRK/RP, RP, PR, PR, PR, PR, FP, PF, PF, PIP SEEEDEDEDEDEQ DERQFPFPRPPHQK/PP, RP, PR, FP, FP, FPF, PF, PFP EEEDEDEEQQR ESEESEDSEL/EL RRHK/RR RFETL/RF QRFN/RF RFESFFL/FF, RF, FL FEEIN/EI FSREEG/EG EISK/EI FFEITPEK/FF, EI DIFL/FL, IF SEQDIFV/FV, IF SSIL/IL	PIPFPR/PR, FP, PF, PFP, PIP PQPR/PR QFPFPR/PR, FP, FP, FP, FF, PFP NPPLFG/FG, FL, LF, PF TLFK/LF VLQR/VL PNTLLLPNH/LL, LL, LLL LIVILNG/VI, IV, LI, IL ILSLVNNDDR/LV, IL VVNPDNNE/VV LITLA/LI SFFLSSTE/FF, FL NILE/LE, IL VLFSR/LF, VL SVIVE/VI, VE, IV PFNLR/PF DLDIFLSIVDMNE/FL, IF, IV, VD, LD, DL LLLPH/LL, LL, LLL VILVINE/VI, VI, IV, IV, IL QDIFVIPA/FV, IF, VI PVVVNA/VVV, VV, VV TSNLNFFA/FF NFLA/FL SQDNVISQIPSQVQE/VI FVDA/FV, VD, DA PLSSILR/IL	EKEECEEGEI/GE, EG, EI GEKEEDEDEQP/GE RKEEKRGEKGSEEED EDEDEEQDERQF/RG, GE HQKEERNEEEDEDEE QQRESEESEDSEL/EL RRHKNKNP/RR GSNRF/RF NSKP/KP NHADADY/AD, AD, DA QSGDAL/DA DTKF/KF SREEGQQGEQRL/GE, EG SSEDKP/KP NEGAL/EG NEGDANI/DA, EG RAEL/EL DAQP/DA KKKEEGNKGRKGP/GR, GP, EG	

Table A1. Cont.

¹ B, bromelain; F, ficin; P, papain; PK, proteinase K.

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PLSSILRA/IL

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