# Food & **Function**



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# Chemical characterization and sensory evaluation of a phenolic-rich melanoidin isolate contributing to coffee astringency†

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The tactile flavor sensations of coffee are an important indicator of product quality, yet the stimuli contributing to these percepts remain insufficiently defined. In the present work, compounds that contribute to astringency in coffee were investigated. A multi-dimensional sensory-quided fractionation method was employed whereby preparative-scale liquid chromatography was leveraged to separate the coffee brew into subfractions, and then followed by sensory evaluation to identify fractions with perceptual impact. This process, paired with high-resolution chemical characterization via Fourier-transform ion cyclotron resonance/mass spectrometry, revealed a complex, phenolic-dominant, melanoidin fraction. Further sensory recombination testing confirmed this fraction imparted a perceptible astringent sensation at coffee-relevant concentrations in both water and coffee matrices. We hereby provide the first evidence of melanoidins contributing to the complex tactile flavor profile of coffee.

#### Introduction

Coffee is the third most consumed beverage worldwide, following water and tea,1 and serves as an integral component of daily routines for many individuals. Global demand for coffee has risen by approximately 65% between 2000 and 2020, making it one of the most traded commodities worldwide, with an export value of \$19 billion and a retail market value of \$83 billion.<sup>2</sup> Despite this existing (and growing) demand, only a fraction of green coffee beans goes on to produce coffee considered to be of premium or "specialty" quality. This, combined with increasing consumer discernment, provides abundant opportunities for coffee flavor optimization and quality improvement.

Historically, research on coffee flavor has primarily focused on identifying and characterizing volatile compounds responsible for its distinctive aroma profile (for review, see ref. 3 and 4). More recently, efforts have emerged to elucidate the sensory relevance of the non-volatile coffee fraction, particularly by investigating compounds that contribute to or modulate bitterness, 5-10 and that impact overall flavor quality. 11-13 However, comparatively little research has examined chemical compounds contributing to coffee mouthfeel or "body",

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despite recognition of its role in the overall sensory experience.14-17

Coffee "body" is one of ten attributes established by the Specialty Coffee Association (SCA) to contribute to coffee bean quality and value. The SCA defines "coffee body" as "the tactile sensation of liquid in the mouth". 15 Tactile perceptions are incorporated with olfactory and gustatory inputs (both centrally and peripherally) and play an important role in the multimodal sensation of flavor. 18,19 Previous work ascertained a list of subattributes contributing to the tactile sensation in coffee. 20 In the present work, we aimed to better understand drivers of tactile perception in coffee by pursuing chemical constituents specifically contributing to one of these attributes, astringency.

Astringency is described as a sensation of "puckering", "drying", or "roughness" often resulting from ingestion of polyphenol-rich foods or beverages. 21,22 Multiple mechanisms have been proposed for how the sensation is imparted and perceived. The prevailing mechanism proposes that astringencyimparting phenolic compounds interact with proline-rich proteins in the saliva and promote aggregation and precipitation of these salivary proteins, which in turn disrupt the natural lubrication of the oral cavity. 23-25 This reduction of lubrication is hypothesized to result in increased friction when oral surfaces are brought into contact with each other during oral processing, increasing both physical and perceived roughness as conveyed by mechanoreceptors in the oral cavity. 23,24,26,27

In the present work, a sensory-guided fractionation methodology was implemented to identify chemical compounds in coffee responsible for the tactile perception of astringency. As the SCA definition of coffee "body" refers to the tactile sensation of the liquid in the mouth, understanding chemical compounds contributing to all tactile dimensions, including astringency, would therefore provide targets for prediction, modulation, and optimization of coffee "body" levels and, subsequently, coffee quality.

#### Materials and methods

#### Materials

Food grade formic acid and optima grade methanol and acetone were purchased from Fisher Scientific (Waltham MA, USA). A Barnstead nano-diamond system (Thermo Fisher, Waltham, MA, USA) was used to filter nanopure water. Oasis HLB cartridges (6 g) were purchased from Waters Co. (Milford, MA, USA). For pH adjustment during recombination model preparation, FCC grade NaOH (Fisher Scientific, Waltham MA, USA) and FCC grade HCl (Sigma Aldrich, St Louis MO, USA) were utilized. Methylparaben (methyl 4-hydroxybenzoate) was purchased for use as an internal standard (Sigma Aldrich, St Louis MO, USA). Two commercial drip coffee samples assigned a high body (HB) score of 7.5 out of 10 and a low body (LB) score of 4.8 out of 10, respectively by consensus of 4 licensed Q Arabica graders (Coffee Quality Institute, Aliso Viejo, CA, USA) from Keurig Green Mountain Coffee Co. were used for sensory and chemical analyses. Coffees were brewed using an automatic drip coffee machine (Keurig K475, Keurig Green Mountain, Waterbury VT, USA) as previously reported<sup>20</sup> and pre-portioned coffee brew pods were stored at -40 °C prior to analysis.

# Sample preparation and preparative liquid chromatographymass spectrometry (Prep LC-MS) fractionation

**Sample preparation and LC fractionation.** Sample preparation was conducted as previously reported.<sup>20</sup> Briefly, a high body coffee sample underwent ultrafiltration (UF) and solid-phase extraction (SPE), and the resulting low molecular weight (<5 kDa) organic eluent (95% MeOH) was separated further *via* three dimensions of sensory-guided LC-based fractionation to identify compounds eliciting astringency (Fig. 1C–F).

All dimensions of fractionation took place using a preparative-scale LC-MS system (AutoPurification System, Waters Co.) coupled to a triple quadrupole mass spectrometer (Quattro Micro API, Waters Co.) and a UV/Vis detector (Waters Co.). Settings for the mass spectrometer were as follows: ionization mode = ESI $^-$ , capillary voltage = 2.0 kV, cone voltage = 30 V, cone gas flow rate = 50 L h $^{-1}$ , source temperature = 150  $^{\circ}$ C, desolvation gas temperature = 300  $^{\circ}$ C, desolvation gas flow = 500 L h $^{-1}$ . Data were acquired in full scan mode (50–1250 m/z) with a scan time of 1s. UV/Vis data were simultaneously collected at absorbance wavelengths of 280 and 310 nm. For the LC, a mobile phase flow rate of 100 mL min $^{-1}$  was used. Solvent composition, stationary phase, and chromatographic gradient conditions were selected independently for each of the three chromatographic separation dimensions to maximize

orthogonality to the previous separation and are detailed below. After each LC chromatographic dimension of fractionation, solvent was evaporated from collected fractions (Genevac Rocket evaporator, SP Scientific, Warminster, PA, USA) which were then freeze-dried twice (to remove solvent) and reconstituted in nanopure water at a dosage level equivalent to that in coffee (based on UPLC/QToF peak area comparison) in preparation for sensory evaluation.

LC fractionation—1<sup>st</sup> dimension. Separation of the low molecular weight, organic eluent was undertaken using a reversed-phase C-18 column (50 mm × 50 mm, Agilent, Santa Clara, CA, USA) and a binary solvent system consisting of nanopure water (solvent A) and methanol (solvent B), each supplemented with formic acid (0.1% v/v). The following separation gradient was utilized: 0 min, 5% B; 0.5–17 min, 5–60% B; 17–21 min, 60–95% B; 21–22 min, held at 95% B; then returned to initial conditions for re-equilibration (22–23 min). The eluent was collected in 12 fractions (F1–F12) based on time (Fig. 1C).

LC fractionation—2<sup>nd</sup> dimension. Fraction 9 from the 1<sup>st</sup> LC dimension was further separated for analysis. The freeze-dried F9 solid was dissolved in 10:90 v/v methanol/water (nanopure) solution and filtered using a PVDF syringe filter (0.45 μm) in preparation for injection onto preparative-LC system. The LC system was equipped with a phenyl hexyl column (Xselect, 5 μm particle size, 50 mm × 100 mm, Waters Co.) and a binary solvent system consisting of nanopure water (solvent A) and methanol (solvent B), each supplemented with formic acid (0.1% v/v). Separation was performed using the following gradient: 0–1 min, 5% B; 1–2 min, 5–50% B; 2–12 min, 50% B (isocratic); 12–18 min, 50–95% B; 18–21 min, held at 95% B; then returned to initial conditions for re-equilibration (21–23 min). The eluent was collected in a total of 6 fractions separated based on time (Fig. 1D).

LC fractionation—3<sup>rd</sup> dimension. Fraction 9.6 from the 2<sup>nd</sup> LC dimension underwent further separation using a reversed-phase phenyl hexyl column (Xselect, 5 μm particle size, 50 mm × 100 mm, Waters Co.). Chromatography was achieved using a binary solvent system of nanopure water (solvent A) and acetone (solvent B), each with 0.1% formic acid. The following solvent gradient was implemented for separation: 0 min, 20% B; 0-2 min, 20–32% B; 2–12 min, 32–36% B; 12–16, 36–50% B; 16–18, 50–95% B; 18–21 min, held at 95% B; then returned to initial conditions for re-equilibration (21–24 min). The entire eluent was collected and separated based on time into 6 fractions (Fig. 1E).

# Compositional analysis of fraction 9.6.4 using Fourier-transform ion cyclotron resonance/mass spectrometry (FT-ICR MS)

The chromatogram of F9.6.4 presented as a broad hump with no distinct peaks and a diverse mass spectrum with few to no dominant ions (Fig. 1F). Due to its complexity and irresolvability, F9.6.4 was further examined compositionally and sensorially as the whole isolate. To characterize the chemical makeup, a high-resolution mixture analysis was conducted on

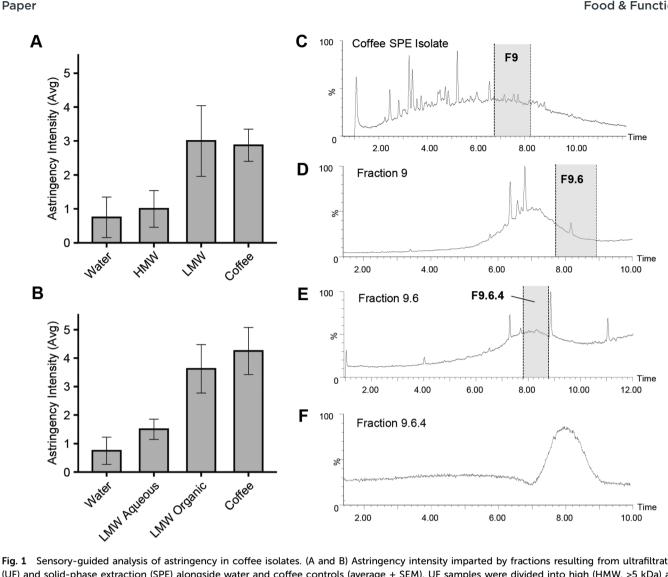


Fig. 1 Sensory-guided analysis of astringency in coffee isolates. (A and B) Astringency intensity imparted by fractions resulting from ultrafiltration (UF) and solid-phase extraction (SPE) alongside water and coffee controls (average + SEM). UF samples were divided into high (HMW, >5 kDa) and low (LMW, <5 kDa) molecular weight fractions (A) and SPE further separated the LMW fraction into organic (95% MeOH) and aqueous (5% MeOH) fractions (B). Astringency intensity was collected on a 0-10 scale, mean values displayed (n = 4, in duplicate). (C-F) UPLC-QToF chromatograms of first, second and third LC dimensions of sensory-quided fractionation in pursuit of compounds imparting astringency. Fraction 9 (C), Fraction 9.6 (D), and Fraction 9.6.4 (E) highlighted in grey (ESI-, total ion chromatograms).

the entire fraction using Fourier-transform ion cyclotron resonance mass spectrometry (FT-ICR MS). Analyses were conducted using both positive and negative electrospray ionization (ESI) modes on a Bruker 15 T solariX FT-ICR instrument (Bruker, Billerica MA, USA). Prior to infusion, F9.6.4 was prepared at a concentration of 1 mg L<sup>-1</sup> in 50/50 acetonitrile/ water. Resulting high resolution complex spectral information was visualized using a van Krevelen diagram and Kendrick mass defect plots to enable compositional inferences.<sup>28</sup> The van Krevelen diagram visualization was produced by using the molecular formulas generated by FT-ICR MS to plot molecular ratio of hydrogen/carbon (H/C) on the y-axis against molecular ratios of oxygen/carbon (O/C) on the x-axis for each ion detected within F9.6.4. Kendrick mass defect plots were generated for mass differences of CH2 and C9H6O3, corresponding to methylation/demethylation and caffeic acid additions/

removals, respectively. Kendrick mass diagrams were generated using the method described by Hughey et al. 29

#### Quantification of astringent coffee isolates

The concentration of F9.6.4 (Fig. 1F) in the coffee was determined by standard addition of F9.6.4 extracted from the HB coffee. F9.6.4 did not contain any prominently visible individual peaks in either positive or negative ESI modes, however direct MS infusion revealed distinct ions that were then selected for multiple reaction monitoring (MRM) method development using a Waters TQ-XS triple quadrupole (QqQ) mass spectrometer (Waters Co, Waltham MA). Evaluation of the specific MRM transition m/z 770.3  $\rightarrow$  385.9 ESI demonstrated good linearity when increasing amounts of F9.6.4 were added to water. Six 1 mL aliquots of HB coffee were prepared in triplicate using three biological replicates with increasing

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volumes from 100-500  $\mu$ L of the 100 mg L<sup>-1</sup> F9.6.4 solution, in addition to 20 µL each of internal standard (methylparaben, prepared at 1000 mg L<sup>-1</sup>). All samples were then made up to a final volume of 1520 µL through addition of nanopure water. SPE was undertaken using an Oasis HLB 96-well plate (30 mg bed) (Waters Co.) that was conditioned and equilibrated with 500 µL of 95% MeOH and 5% MeOH, respectively. The entirety of each 1520 µL coffee sample aliquot (plus standard addition and internal standard) was loaded onto independent SPE plate wells, washed with 5% MeOH (500 µL) (discarded), and then eluted with 95% acetonitrile (500 µL). Eluent was then made up to a final volume of 1000 μL through the addition of 500 μL each of nanopure water.

Samples were analyzed with a UPLC-QqQ/MS on a Waters TQ-XS mass spectrometer paired with an Acuity H Class UPLC system (Waters Co, Waltham MA). For each run, an injection volume of 2 µL was loaded onto a phenyl hexyl column (1.7  $\mu$ M particle size, 2.1  $\times$  100 mm, Agilent Technologies, Santa Clara, CA). A binary solvent system using nanopure water (solvent A), and acetonitrile (solvent B) was used for separation, each dosed with 0.1% v/v formic acid. The following gradient was used for separation at a flow rate of 0.5 mL min<sup>-1</sup>: 0-0.5 min, 20% B; 0.5-11 min 20%-40% B, 11-12 min, 40-95% B, 12-13 min, held at 95% B, returned to initial conditions for 1 min (13-14 min). Settings for the mass spectrometer were as follows: ionization mode = ESI, capillary voltage = 1.0 kV, cone voltage = 20 V, cone gas flow rate = 150 L  $h^{-1}$ , source temperature = 150 °C, desolvation gas temperature = 600 °C, desolvation gas flow = 1000 L h<sup>-1</sup>. Data was acquired in multiple reaction monitoring (MRM) mode using the following optimized transitions and collision energies (CE): F9.6.4, ESI<sup>-</sup> m/z 770.3  $\rightarrow$  385.9 (CE 28 eV); methylparaben, ESI $^-$  m/z 151  $\rightarrow$  92 (CE 18 eV). Waters TargetLynx and MassLynx 4.1 software were used for analysis. The 6-point standard addition calibration curve showed good linearity ( $R^2$ = 0.994).

The concentration of F9.6.4 in LB coffee was determined through gravimetric comparison of a simultaneous extraction of F9.6.4 from 1L of each HB and LB coffee samples. The final amount of F9.6.4 in the LB coffee was finally determined based on the weight ratio of HB to LB and the known amount of F9.6.4 in the HB coffee determined by LC/MS/MS analysis as reported above.

#### Sensory evaluation

Sensory evaluation of UF, SPE isolates. All sensory evaluation methodologies were approved by the local Institutional Review Board (IRB Protocol #2017H0072). Following separation of the HB coffee using ultrafiltration (UF) and solid-phase extraction (SPE), subsequent fractions were evaluated by a four-person descriptive panel (3F, 1M, aged 23-28) as reported in a previous publication<sup>20</sup> (Fig. 1A and B). Briefly, the panel first performed a series of discrimination tasks to determine that samples resulting from both UF and SPE separations were clearly discriminable.20 Astringency intensity ratings were then collected for each sample, along with water and coffee con-

trols, on a 0-10-point categorical intensity scale in duplicate and averaged across panelists. During all astringency evaluations, panelists were provided with a reference (0.35 g  $L^{-1}$  potassium aluminum sulfate; McCormick & Co, Baltimore MD) to ensure conceptual alignment. To standardize each evaluation, panelists were specifically instructed to "swish the entire sample in [their] mouth, expectorate, rub [their] tongue against the roof of the mouth and note the intensity of a sensation of drying or roughness". Samples were presented in 10 mL aliquots in black 1 oz. sample cups and presentation orders were randomized and counterbalanced. All samples were served at room temperature to enable maximum temperature consistency and nose clips were worn throughout to minimize olfactory interference.

Sensory evaluation of Prep LC-MS fractions. Five trained panel members (3F, 2M, aged 23-28) evaluated the fractions collected from preparative LC separation in duplicate to identify those with perceptible astringency. Following solvent removal, fractions obtained from the three independent, consecutive LC separation dimensions (Fig. 1C-F) were reconstituted each time in water at equivalent concentration to the high body coffee based on peak area comparison and evaluated using a combined paired-comparison and intensity rating methodology as previously described.<sup>20</sup> Briefly, each fraction was presented alongside a water control as a pair, each in 5 mL aliquots in 3-digit code-blinded black 1 oz. sample cups. Presentation order was randomized across participants as well as across fractions and within fraction/control pairs and nose clips were again worn to prevent olfactory interference Panelists were asked to taste both samples within the pair and select the sample that was most astringent, and to then rate the astringency intensity of both samples on a 0-10 categorical intensity scale. Throughout evaluations, panelists had access to the astringent reference (potassium aluminum sulfate) to maintain conceptual alignment. Fractions were selected for further analysis based on two criteria, a paired-comparison selection count of  $\geq 7$  out of 10, and then, the astringency intensity difference from control.

Sensory validation of recombination models. The astringency of F9.6.4 (Fig. 1F) was evaluated sensorially in both water and coffee matrices by 9 trained panelists (6F, 3M, aged 23-47). In water, F9.6.4 was evaluated at both high and low body coffee concentrations of 15.7 and 7.9 mg L<sup>-1</sup>, respectively, with each maintained at a uniform pH value of 5.3 (equivalent to the coffee samples) using a 0.1 M food-grade HCl solution. For validation in coffee, the LB coffee sample was used as the control (consisted of 7.8 mg L<sup>-1</sup> F9.6.4). The high F9.6.4 coffee recombination sample consisted of the LB coffee with an additional 7.9 mg L<sup>-1</sup> F9.6.4 (mimicking the 15.7 mg  $L^{-1}$  concentration in the HB coffee sample). All samples were served at room temperature in 5 mL aliquots in black 1 oz. sample cups.

Sensory evaluation occurred over five days with either one or two 20-minute sessions per day. On the first day, panelists were reminded of the astringency definition, reference, and evaluation procedure, and were informed that this attribute

enabled the initial selection of this fraction. Then, panelists were given the opportunity to taste F9.6.4 in water as a "warmup" sample and make note of any differences perceived in comparison to a water control, using astringency as a nonrestrictive guideline. For evaluation, a signal detection-based same/different methodology was employed. This entailed presentation of the respective reference (either water or LB coffee) paired with a three-digit code-blinded sample (either water/ coffee with F9.6.4 added or a water/coffee blind control), after which panelists were asked if the blinded sample was "the same" or "different" from the reference. Following the same/ different evaluation, they were then asked to indicate the certainty of their selection ("Sure"; "Unsure"; or "Guess"). If a panelist responded that they believed the samples to be different, they were also asked to describe the perceived difference. Both water and coffee evaluations utilized nine panelists in triplicate (27 total evaluations per sample); presentation order of samples was randomized across panelists and replicates, and nose clips were worn throughout to minimize olfac-

#### Data analysis

tory interference.

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Both fraction screening and recombination sensory evaluations were collected using Compusense Cloud consumer testing software (Compusense Inc, Guelph, CA). For fraction screening, statistical significance was determined using binomial probabilities for a directional (one-tailed) test with 50% chance probability and a p-value  $\leq 0.172$  (7 out of 10) was taken as sufficient for further examination via astringency intensity ratings.

For sensory validation, signal detection results were processed using R-index analysis. "R-index" values were calculated based on pooled comparison of the same/different and certainty responses according to the response matrix and equation provided in the ESI (eqn (S1) and Table S1†), and can effectively be understood as the probability of a subject correctly discriminating between a stimulus and a control sample. <sup>30</sup> Statistical significance of R-indices was determined using the "Reriti" function in RStudio, <sup>31</sup> which determined the r-critical value that must be exceeded to enable rejection of the null hypothesis for a given number of evaluations based on a Wald-type test statistic. <sup>32–34</sup> R-indices were therefore interpreted as indicative of discrimination if they exceeded chance discrimination by more than the corresponding R-critical value ( $\alpha = 0.05$ , one-tailed).

#### Results

# Sensory screening of fractions resulting from UF, SPE, and Prep-LC separations

The HB coffee underwent multiple sample preparation methods and LC dimensions of separation followed by sensory evaluation in pursuit of identifying astringent compounds (Fig. 1A–F). Initially, the coffee was separated into HMW (>5 kDa) and LMW (<5 kDa) isolates *via* ultrafiltration (UF) (Fig. 1A) and subsequently reconstituted in water and tasted alongside water and the HB coffee control. The average astrin-

gency intensity assigned to the LMW fraction sample was nearly identical to that of the HB coffee, while, on the contrary, the HMW fraction was rated similarly to water. When the LMW fraction was divided further using solid-phase extraction (SPE), the LMW organic phase (eluted with 95% methanol) reported similar astringency to the coffee control, while the LMW aqueous phase reported noticeably lower levels (Fig. 1B). The LMW organic phase was subsequently chosen for further sensory-guided liquid chromatography separations to identify astringent compounds.

Following multi-dimensional LC separation and sensory-guided fractionation, fractions 9 (F9), 9.6 (F9.6), and then 9.6.4 (F9.6.4) were pursued from each dimension, based on their observed contribution to astringency (Fig. 1C–F). Finally, fraction 9.6.4 was selected as being higher in astringency than the control sample during 9 out of 10 paired-comparison presentations (p = 0.01) and was assigned an average astringency intensity rating 1.4 points greater than the control. Compositional analysis was thereby undertaken on F9.6.4 (Fig. 1F).

Qualitative and quantitative chemical characterization of F9.6.4. F9.6.4 was observed to contain a single broad chromatographic peak (Fig. 1F). Qualitatively, LC-UV (diode array detector) analysis indicated the entirety of this broad peak exhibited high absorbance at 405–420 nm. This wavelength range is characteristic of brown color development from the Maillard reaction and indicative of the resulting presence of melanoidins or melanoidin precursors/intermediates known to absorb light at this wavelength.<sup>35</sup> Thus, it was hypothesized this fraction consisted of brown colored melanoidin precursors or melanoidins resulting from roasting.

Further chromatographic separation of F9.6.4 proved challenging. The composition of F9.6.4 was thus further investigated with MALDI-TOF MS and FT-ICR MS analyses to define the molecular composition. The limited resolvability of F9.6.4 (Fig. 1F) suggested either the presence of large molecular weight compounds (<5 kDa) that were poorly separated on the LC column and/or that it contained many similarly structured compounds that were unable to be resolved due to similar stationary and mobile-phase affinities. MALDI-TOF MS analysis, which utilizes soft ionization ideal for revealing higher molecular weight components within the fraction, did not reveal the presence of any high molecular weight constituents (between 1.8-5 kDa, data not shown), contradicting the former possibility. Subsequently, FT-ICR MS analysis indicated the fraction was dominated instead by multiple lower molecular weight structurally related compounds. The FT-ICR MS spectrum of F9.6.4 (ESI mode) revealed a complex landscape of compounds with masses ranging from m/z 200–1200 (Fig. 2). When the resulting mass spectrum was examined closely, a repeating mass difference of m/z 0.036 was observed throughout (Fig. 2, inlay) which is a notable mass difference commonly observed in a mixture of condensed phenolics indicating the loss of an oxygen atom and addition of CH4 (or vice versa). This mass difference was observed throughout F9.6.4, suggesting the presence of a variety of related condensed phenolics.

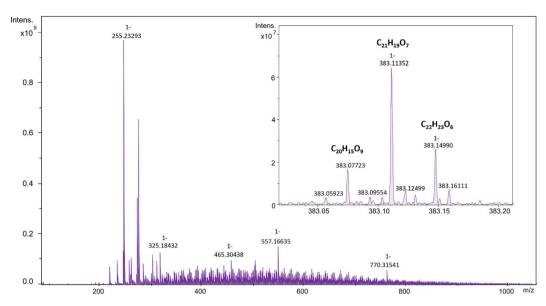


Fig. 2 FT-ICR MS spectra (ESI $^-$ ) of coffee LC fraction 9.6.4. Inlay shows one (of many) sections of the spectrum in which a m/z 0.036 mass difference pattern was observed. This mass difference corresponds to a loss of an oxygen and addition of a CH $_4$  (or *vice versa*), a common pattern observed when looking at a mixture condensed phenolics.

The FT-ICR MS data analysis revealed 308 distinct molecules within the fraction and the elemental compositions were calculated for each with high mass accuracy (top most abundent based on relative intensity are shown in ESI, Table S2†). Observed mass to charge ratios ranged from m/z 227 to m/z1170 with an average of m/z 444. The 308 molecules were further sorted by ion intensity (semi-quantitative) to establish relative compound concentrations,<sup>36</sup> grouped into quartiles, and then plotted using a van Krevelen diagram (Fig. 3A) to characterize the chemical composition of the isolate. The van Krevelen diagram format allows visualization of structural patterns within complex chemical mixtures using atomic ratios of hydrogen to carbon (H/C) and oxygen to carbon (O/C), enabling a holistic understanding of the constituents.<sup>28</sup> For example, if a cluster of data points fall at approximately H/C = 2, this cluster can be inferred to include saturated, lipid-like compounds. Alternatively, if a cluster falls within H/C = 1 to 1.5 and O/C = 0.3 to 0.7, this grouping can be attributed to condensed, aromatic, polyphenolic compounds.<sup>28</sup> Based on the resulting plot, F9.6.4 contains compounds that can be divided into lipid-like (terpenes, fatty acids) and polyphenolic regions of the van Krevelen plot (Fig. 3A). However, examination of the compounds with the highest relative intensity (the 75–100<sup>th</sup> percentile) revealed a majority of the high intensity compounds (60 out of 79) were specifically within the polyphenolic region of the plot, highlighting the dominance of this class of compounds within this fraction (Fig. 3A and Table S2†). This distribution is consistent with the repeated m/z 0.036 mass difference observed within the mass spectrum characteristic of condensed phenolics (Fig. 2). Additionally, 14 of the 308 compounds detected in F9.6.4 were previously reported by Jaiswal et al.1 when utilizing FT-ICR MS to analyze the chemical composition of a heated mixture of chlorogenic

acids (coffee roast model). Thus, at least some of the polyphenolics observed in F9.6.4 appeared to overlap with chlorogenic acid roasting derivatives.

The chemical composition of F9.6.4 was further explored using Kendrick mass defect analysis, an approach complimentary to van Krevelen analysis. 29,36 Using Kendrick analysis, complex mixtures can be normalized to a mass corresponding to a particular molecular addition (typically CH2), and then a series of compounds differing only in this substructure addition can be observed based on their identical Kendrick mass defect values. Two Kendrick mass defect plots (Fig. 3B-D) were produced for all compounds which fell within the condensed phenolic region of the van Krevelen diagram (Fig. 3A), and each were normalized to two specific mass additions CH<sub>2</sub> (Fig. 3B) and C<sub>9</sub>H<sub>6</sub>O<sub>3</sub> (Fig. 3C and D) which correspond to additions of methyl and caffeic acid groups, respectively. These two mass differences have been observed to be prevalent in both roasted mixtures of chlorogenic acids and in arabica coffee melanoidin extracts. 1,36

In the Kendrick mass defect plot normalized to CH<sub>2</sub> additions (Fig. 3B), visualization of multiple families of up to eight compounds differing only in methylation (CH<sub>2</sub> additions) can be observed due to their identical mass defect values and regular mass increments forming a line parallel to the *x*-axis. Additionally, perpendicular to these lines, periodic hydrogenation reactions can also be observed. Often the compounds that fall within homologous CH<sub>2</sub> addition/loss families also fall into perpendicular families of H<sub>2</sub> additions/losses (green points) suggesting occurrence of complex, multi-directional derivatization during roasting. The compounds within the condensed phenolic cluster were explored further using another Kendrick mass defect plot normalized this time for caffeic acid additions corresponding to a mass difference

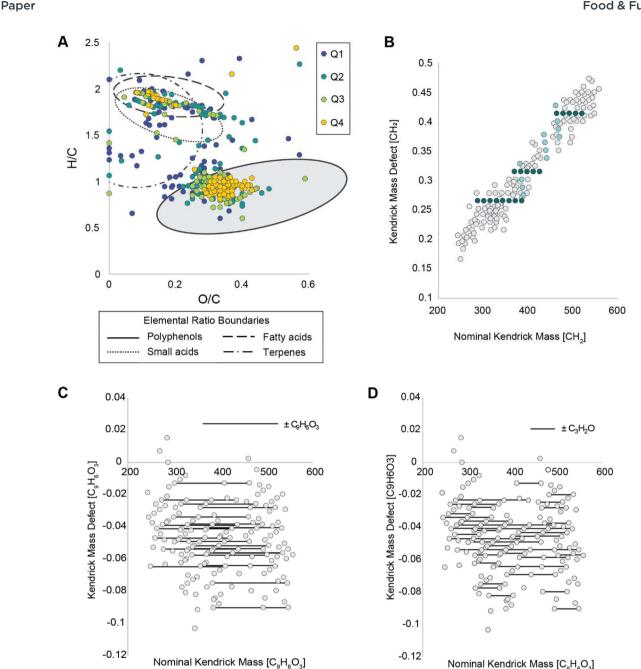


Fig. 3 Chemical composition of LC fraction 9.6.4 though visualization of high-resolution FT-ICR MS outut. (A) Van Krevelen diagram of compounds detected in F9.6.4 plotted as hydrogen to carbon (H/C) vs. oxygen to carbon (O/C) ratios and compounds are broken into 4 color-coded quartiles (Q1-Q4) based on observed ion intensity (e.g., Q4 (yellow) encompasses the top 25% most intense ions observed). Ellipses indicate typical elemental ratio boundaries for select chemical classes as determined by Kuhnert et al. 36 (B) Kendrick mass defect analysis for methylation (+CH<sub>2</sub>) of compounds found within the van Krevelen polyphenol ellipse. Green points highlight a sample of the homologous compound families related by CH<sub>2</sub> additions and blue points indicate select homologous families of hydrogenation/dehydrogenations (+H<sub>2</sub>). Kendrick mass defect analysis at the  $C_9H_6O_3$  (C and D) reveal additional families of  $C_9H_6O_3$  (C) and  $C_3H_2O$  (D) additions, indicated by line segment connections.

of ±C<sub>9</sub>H<sub>6</sub>O<sub>3</sub> (Fig. 3C and D). This plot revealed multiple pairs of C<sub>9</sub>H<sub>6</sub>O<sub>3</sub> additions (>20) (Fig. 3C) and drew attention to an even more prolific number of homologous pairs of C<sub>3</sub>H<sub>2</sub>O additions (>50, Fig. 3D). The interconnected network of multiple moiety additions (CH<sub>2</sub>, C<sub>9</sub>H<sub>6</sub>O<sub>3</sub>, C<sub>3</sub>H<sub>2</sub>O) reveals an observable compound homology and apparent derivative nature of compound formation within F9.6.4.

Based on standard addition and gravimetric comparison, the concentrations of F9.6.4 in the HB and LB coffee was determined to be 15.7 and 7.9 mg  $L^{-1}$ , respectively.

Validation of the astringent isolate's sensory impact in water. F9.6.4 was evaluated in water at two concentrations representative of the HB and LB coffee samples, respectively. Recombination samples were evaluated using a same/different **Food & Function** 

signal detection methodology which entailed comparison of a reference (water) to each of the two recombination samples as well as to a blind control (Fig. 4). For the present number of evaluations, an  $\alpha$  of 0.05 corresponds to an R-index of 62.5%. Discrimination results from all 9 panelists revealed that both low (7.9 mg L<sup>-1</sup>) and high (15.7 mg L<sup>-1</sup>) concentrations of F9.6.4 were perceptibly distinct from water alone, with R-indices of 70.8% ( $p \le 0.01$ ) and 76.1% ( $p \le 0.002$ ), respectively. Open comment feedback provided panelists the opportunity to elaborate on characteristics enabling differentiation between the samples with and without F.9.6.4 additions. Comments collected for both high and low concentrations were consistent, with frequent descriptions for both indicating discrimination to be based on a "drying" and/or "astringent" perception(s). The observed difference in discrimination probabilities suggest that, of the two samples, the high concentration (15.7 mg L<sup>-1</sup>) was less challenging for the panel to distinguish from the control, suggesting a positively correlated relationship between concentration and perceptual intensity.

Validation of the astringent isolate's sensory impact in coffee. Sensory evaluation of F9.6.4 was also conducted in coffee. To accomplish this, the LB coffee was used as the reference (and blind control) due to its lower inherent concentration of F9.6.4. The recombination sample consisted of the LB coffee with an addition of 7.9 mg L<sup>-1</sup> of F9.6.4 to achieve a final concentration of 15.7 mg L<sup>-1</sup> (mimicking the HB coffee) (Fig. 4). This evaluation aimed to determine whether ecologically relevant concentration differences in this complex frac-

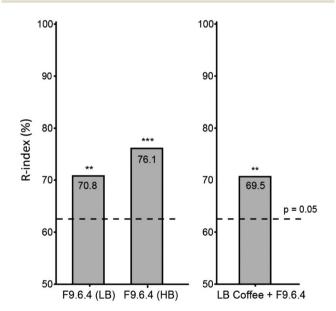


Fig. 4 Sensory impact of coffee fraction (F9.6.4) in water and coffee recombination models. Discrimination probabilities (expressed as R-index) of low (LB) and high body (HB) concentrations of F9.6.4 in water compared to water control (left) and addition of F9.6.4 to LB coffee compared to LB coffee control (right). Dashed line indicates critical value which must be exceeded for sample to be considered discriminable from control based on an  $\alpha$  of 0.05 (62.54) (n = 9, 27 evaluations per sample; \*\* $p \le 0.01$ , \*\*\* $p \le 0.001$ , one-tailed).

tion (in the absence of any additional matrix differences) would result in a perceptible mouthfeel difference in the coffee itself. The recombination sample was observed to be perceptibly distinct from the LB coffee control, with an R-index of 69.5% ( $p \le 0.01$ ). Open comment feedback was again in line with astringency being the sensation underlying discrimination ("drying", "astringent"), suggesting that the recombination sample was detected for qualitatively imparting a similar sensory character in coffee as in water. Differentiation in coffee was slightly lower than that in water, implying F9.6.4 addition to be slightly more challenging to detect in the complex coffee matrix.

#### Discussion

Isolate F9.6.4 imparted perceptible astringency in both water and coffee matrices. When added to water or coffee, F9.6.4 imparted a subtle astringent sensation. In water, while an R-index of 100% would be indicative of perfect discrimination, R-indices of 70.8% and 76.1% instead depict a statistically significant yet imperfect chance of correctly discriminating the LB and HB solutions from the water control (Fig. 4). In coffee, the 7.9 mg L<sup>-1</sup> F9.6.4 addition was again statistically significantly discriminable, but imperfect, at an R-index of 69.5% (Fig. 4). While subtle, the impact of these effects should not be overlooked. Indeed, in many craft products such as coffee, wine, and beer, nuanced sensations are important drivers of product differentiation and acceptance. As such, identifying compounds that contribute to these subtle sensations remains important for understanding the foundations of coffee flavor and quality.

Astringent isolate F9.6.4 contains a variety of structurally related, condensed polyphenolic-dominated melanoidins or melanoidin precursors. The FT-ICR MS analysis and van Krevelen plot indicated that F9.6.4 was dominated by condensed phenolics (Fig. 3A). This is consistent with previous reports of melanoidins containing significant proportions of condensed phenolics.<sup>37-40</sup> The condensed phenolic cluster is centered around a point located at O/C, H/C coordinates (0.33, 1) (Fig. 3A) that corresponds to two compounds exhibiting the  $44^{\text{th}}$  and  $48^{\text{th}}$  most intense responses—(m/z) 385.1293 and m/z495.1661)—with proposed molecular formulas of C21H21O7 (M-H,  $\Delta$  ppm = 0.105) and  $C_{27}H_{27}O_9$  (M-H,  $\Delta$  ppm = 0.316), respectively. F9.6.4 also exhibited a proportion of either fatty acids or other small acids, though these were observed as the minority of the compounds detected.

Compounds located within the condensed phenolic cluster were examined further using a Kendrick mass defect analyses and visualizations standardized to both CH2 and C9H6O3 mass differences (Fig. 3B-D). This analysis revealed that a majority belonged to one or more homologous families of CH2, H2, C<sub>9</sub>H<sub>6</sub>O<sub>3</sub> and/or C<sub>3</sub>H<sub>2</sub>O additions, illustrating the diverse yet functionally derivative nature of the compounds contained within this fraction. Additions of CH2 and C9H6O3 groups correspond to periodic methylations and caffeic acid additions, respectively, reactions both known to occur during roasting of chlorogenic acids.36 Quinic acids can be esterified

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up to 4 times and cinnamic acids can also undergo multiple methylations. Single and double methylations of caffeoylquinic acid effectively result in feruloylquinic and dimethoxycinnamoyl acids, respectively.36 For F9.6.4, CH2 homologue families were observed to contain up to 8 molecules differing only in periodic CH<sub>2</sub> additions with one of the longest visible CH<sub>2</sub> homologous series comprised of a horizontal line parallel to the x-axis all with Kendrick mass defect values of 0.264 (Fig. 3B). For illustration, this series starts with a compound with m/z 287 and ends with m/z 385 and depicts a series of 7 methylation/demethylation reactions indicated by periodic CH<sub>2</sub> additions between these, resulting in detection of intermediate masses m/z 301, 315, 329, 343, 357 and 371. The proposed molecular formula for the lowest mass within the series, m/z 287, is  $C_{16}H_{15}O_5$  (M-H) and it has been observed before in FT-ICR MS analysis of a model roasted mixture of chlorogenic acids found in coffee, suggesting this entire homologous series to result from derivatization of chlorogenic acid thermal reaction products during roasting. Multiple series of hydrogenation/dehydrogenation (±H2) and C3H2O additions are also observed, indicating the astringent F9.6.4 was dominated by a grid of homologous compounds differing in additions and removals of (at least) the four functional group patterns identi-

fied (CH<sub>2</sub>, H<sub>2</sub>, C<sub>9</sub>H<sub>6</sub>O<sub>3</sub> and/or C<sub>3</sub>H<sub>2</sub>O).

During thermal processing of plant-based food materials such as the roasting of coffee beans, multiple reactions occur (repeatedly), ultimately resulting in the transformation of limited numbers of plant primary and secondary metabolites into numerous derivatives. The reported structural interrelatedness of compounds contained within the isolated fraction likely contributed to the observed chromatographic separation challenges of the individual components. In many foods, numerous compounds are anticipated to be unresolved by chromatographic analysis and could have the potential to contribute sensory and/or nutritional benefits. Other researchers have similarly employed FT-ICR MS techniques in order to understand the composition of complex food matrices including tea, cocoa, and coffee melanoidins and have found each of these matrices to contain as many as 10 000, 30 000, and 2000 distinct molecular components, respectively.<sup>36</sup> Consequently, without examination of these complex mixtures, vast segments of processed food complexity could be overlooked. This risk is highlighted by the distinct astringency of fraction F9.6.4, which consists of a diverse array of similarly structured compounds, underscoring the importance of not disregarding complex segments that may hold meaningful chemical information. The findings of this study support the contribution of a complex fraction dominated by a subset of structurally related compounds to coffee astringency and advocate for further investigation into the contribution of other complex chemical populations to flavor perception.

Melanoidins and their potentially overlooked contribution to flavor. The observed brown color and high UV absorbance at 405–420 nm implied that F9.6.4 contained melanoidins or melanoidin precursors. As much as 50% of the dry green bean weight is understood to be converted into colored "melanoi-

din" products upon roasting, yet the chemical class remains inadequately defined. Melanoidins have been described by some as the "high molecular weight brown end products of the Maillard reaction", with emphasis on their molecular size as a defining factor. 41 Others, such as Bekedam et al., 35 have defined melanoidins as "nitrogenous, macromolecular, browncolored, final Maillard reaction products that absorb light at 405 nm", while still others, such as Jaiswal et al., define melanoidins more simply as "the non-volatile products of coffee roasting" formed during the roasting process from chlorogenic acids, carbohydrates, and proteins. Despite discrepancies in these definitions, there is general alignment on the lack of definitive melanoidin structural information due to their inherent chemical complexity as roasting reaction products. One reason for this lack of clarity is the isolation and analytical characterization challenges associated with coffee melanoidins.

Multiple studies have attempted to chemically characterize melanoidins, however a distinct challenge encountered is the difficulty of separating "melanoidin" from "non-melanoidin" material. Bekedam et al. 35 specifically examined the "low molecular weight" melanoidin fraction of coffee. They defined low molecular weight as <12 kDa and quantified the melanoidin content based on absorption at 405 nm using a spectrophotometer and an extinction coefficient calculation using the law of Lambert-Beer. 35,42 During these experiments, coffee brew was separated into high and low molecular weight portions using a 12-14 kDa size membrane filter. A non-trivial amount of the total coffee brew melanoidins (29%) were observed to partition into the LMW fraction, and, subsequently, into 40%, 60%, and 100% methanol eluents during solid-phase extraction (each contributing 25%, 34%, and 5% of the mass of the LMW melanoidins, respectively).

In the present study, the initial 5 kDa LMW cutoff resulted in a fraction reported to be the primary astringent component compared to its HMW counterpart (Fig. 1A). Further, during 1<sup>st</sup> dimension preparative-LC separation the fraction observed to be most astringent (F9, Fig. 1C) eluted between 50–60% MeOH, likely overlapping with the fraction that Bekedam *et al.*<sup>35</sup> determined to contain the highest quantity of LMW melanoidin material (the 60% MeOH eluent). The researchers similarly found this isolate to be composed of large quantities of phenolic groups (41% w/w), hypothesizing this to be driven by incorporation of chlorogenic acids into these melanoidins. Thus, the melanoidin chemical composition described by Bekedam *et al.* was likely similar to the LMW phenolic-rich astringent isolated reported in the current study.

Despite the known role of phenolics in astringency perception and the acknowledged role of phenolics in melanoidin formation, melanoidins have not been discussed in prior literature as imparting astringency. While melanoidins have been associated with various biological activities—including antioxidant, anti-tumor, nitrosamine inhibition, antimicrobial, bacterial suppression, anti-carcinogenic, prebiotic functions, and amine binding<sup>41</sup>—research on their role in flavor perception remains limited. In coffee, melanoidins have been identi-

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fied to bind with key odorants and alter the aroma profile over time after brewing. 43,44 Our results indicate a more multifaceted role of melanoidins on flavor perception and therefore support further examination of this complex and prevalent class of compounds in both coffee and beyond.

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### Conclusions

A brown-colored isolate from coffee brew that primarily contained a complex mixture of structurally related melanoidin- or melanoidin precursor-associated condensed phenolics was reported to impart astringency in both water and coffee at coffee-relevant concentrations. This is the first evidence of a direct sensory impact of melanoidins in coffee and provides new avenues for expansion of our broader understanding of coffee quality.

These findings also underscore the potential flavor impacts of complex, derivative fractions resulting from food processing reactions such as roasting, heating, and fermentation. Though such fractions may traditionally be overlooked due to chromatographic resolution challenges, their contributions should not be ignored for a better understanding of the chemical underpinnings of flavor perception.

#### Author contributions

Brianne M. Linne: methodology, investigation, validation, data curation, formal analysis, visualization, writing - original draft. Edisson Tello: supervision, validation, writing - review & editing. Christopher T. Simons: conceptualization, methodology, validation, project administration, supervision, writing review& editing. Devin G. Peterson: conceptualization, methodology, validation, project administration, supervision, funding acquisition, resources, writing - review& editing.

## Data availability

The data supporting this article have been included as part of the ESI.†

#### Conflicts of interest

The authors have no conflicts of interest to declare.

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