Effect of Lactic Acid Fermentation on Volatile Compounds and Sensory Characteristics of Mango (Mangifera indica) Juices

Juliana Mandha 1,2*, Habtu Shumoy 1, Jolien Devaere 3, Joachim J. Schouteten 4*, Xavier Gellynck 4, Ann De Winne 3, Athanasia O. Matemu 2 and Katleen Raes 1,4*

1 Research Unit VEG-i-TEC, Department of Food Technology, Safety and Health, Campus Kortrijk, Ghent University, Sint-Martens-Latemlaan 2B, 8500 Kortrijk, Belgium; Juliana.mandha@UGent.be (J.M.); habtu.shumoy@UGent.be (H.S.)
2 Department of Food Biotechnology and Nutritional Sciences, Nelson Mandela African Institution of Science and Technology, P.O. Box 447, Arusha 23306, Tanzania; athanasia.matemu@nm-aist.ac.tz
3 Centre for Aroma & Flavour Technology, Department of Microbial and Molecular Systems (M2S), Cluster Bioengineering Technology, KU Leuven, Technology Campus Ghent, Gebroeders De Smetstraat 1, 9000 Ghent, Belgium; jolien.devaere@kuleuven.be (J.D.); ann.dewinne@kuleuven.be (A.D.W.)
4 Department of Agricultural Economics, Ghent University, Coupure Links 653, 9000 Gent, Belgium; joachim.schouteten@UGent.be (J.J.S.); xavier.gellynck@UGent.be (X.G.)

* Correspondence: katleen.raes@UGent.be; Tel.: +32-(56)-322008

Abstract: Fermentation is a sustainable bio-preservation technique that can improve the organoleptic quality of fruit juices. Mango juices were fermented by monoculture strains of Lactiplantibacillus plantarum subsp. plantarum (MLP), Lactisacebacillus rhamnosus (MLR), Lactisacebacillus casei (MPP), Levilactobacillus brevis (MLB), and Pediococcus pentosaceus (MPP). Volatile compounds were sorbed using headspace solid phase microextraction, separated, and identified with gas chromatography-mass spectrometry. Forty-four (44) volatile compounds were identified. The control, MPP, and MLB had higher amounts of ethyl acetate, ethyl butyrate, 2-hexenal, 2,6-nonadienal, 2,2-dimethylpropanal, β-selinene, γ-γurjunene, α-copaeae, and δ-cadinene, while MLC, MLP, and MLR had higher amounts of 2,3-butanedione and a cyclic hydrocarbon derivate. Consumers (n = 80) assessed their overall liking and characterized sensory attributes (appearance, color, aroma, flavor, consistency, acidity, and sweetness) using check-all-that-apply, and penalty analysis (just-about-right). Overall liking was associated with ‘mango color’, ‘pulp’, ‘mango aroma’, ‘sweet’, ‘natural taste’, and ‘mango flavor’ that described the control, MLP, MLR, and MPP. Juiices MLR and MPP were described as ‘bitter’, ‘sour’, ‘aftertaste’, and ‘off-flavor’. Multivariate analysis revealed relationships between the volatile compounds, mango juices fermented by different lactic acid bacteria, and sensory characteristics. Thus, the type of lactic acid bacteria strains determined the volatile and sensory profile of mango juices.

Keywords: lactic acid bacteria; mango juice; fermentation; aroma; volatile profile; gas chromatography-mass spectrometry; sensory profile

1. Introduction

Mango (Mangifera indica L.) is globally an important commercial fruit with high demand in the international market. It is among the top 10 major fruits cultivated in sub-Saharan Africa with a production of over 8 million tonnes/year [1]. Approximately 35% of produced fruits are lost post-harvest every year given it is a seasonal climacteric fruit with a few harvesting seasons, and its fresh fruit has a very short shelf-life. Thus, there is a need to transform this perishable fruit into products such as fruit juices with a long shelf-life and diversify its products through fermentation.

Fermentation using lactic acid bacteria increases food shelf-life by lowering pH and producing antagonistic metabolites such as organic acids and bacteriocins that are lethal to pathogens [2]. Furthermore, fermentation improves the nutritional and organoleptic quality...
of food [2]. Mango juice is often fermented to wine using yeasts (Saccharomyces cerevisiae) [3] but not as a non-alcoholic fermented juice. The few studies that investigated the use of lactic acid bacteria (Lactobacilli) as starter cultures in mango juice [4–7] lack an in-depth consumer study of the sensory acceptability of fermented non-alcoholic mango juices. Jin et al. [4] suggested consumer sensory evaluation as the next step to the formulation of non-alcoholic fermented mango juices.

Consumers choose food products by relying on sensory attributes and to ensure products’ success in the market, understanding and meeting their needs is vital. Rapid techniques such as check-all-that-apply (CATA) questions and penalty analysis using just-about-right (JAR) scales show important relationships between the samples and sensory characteristics [8]. Food processors, therefore, not only know how much consumers like a food product but also which sensory attributes drive consumer liking.

Food sensory characteristics are related to volatile and nonvolatile compounds which are often affected during processing [9]. During fermentation, microorganisms consume and/or produce volatile compounds in food that may change the overall sensory profile. These volatile changes are specific to microbial species because of their unique metabolic pathways related to their growth needs. Only a few studies have investigated the volatile compounds in lactic acid fermented mango juice. Moreover, this was reported in mango slurries with added sucrose [4] and glucose [10] after fermentation by Lactiplantibacillus plantarum subsp. plantarum, Streptococcus thermophilus, and Lacticaseibacillus casei. Further research without the addition of sugars and fermentation with other strains is required to bridge this research gap.

From literature [11–15], ten strains were selected for screening in mango juice. Mango juice was the sole raw material for microbial growth and metabolism, with no nutrient or pH adjustments. Hence, the selection criterion was based on growth or survival in mango juice in terms of viable cell counts (log CFU/mL) as monoculture strains after 24 h of fermentation. Results showed that among the ten strains—Lactiplantibacillus plantarum subsp. plantarum LMG6907, Lacticaseibacillus rhamnosus LMG25859, Lacticaseibacillus casei LMG6904, Levilactobacillus brevis LMG11437, Pediococcus pentosaceus LMG10740, Lactobacillus acidophilus LMG9433, Lactobacillus johnsonii LMG 24394, Limosilactobacillus fermentum LMG 8896, Limosilactobacillus reuteri LMG 9213, and Leuconostoc mesenteroides LMG6908—the highest growth was recorded in Lactiplantibacillus plantarum subsp. plantarum, Lacticaseibacillus rhamnosus, Lacticaseibacillus casei, Levilactobacillus brevis, and Pediococcus pentosaceus (Table S1).

Different strains of lactic acid bacteria metabolize nutrients depending on their specific transport (Spector & Alabama, 2009). Lactiplantibacillus plantarum subsp. plantarum and Lacticaseibacillus rhamnosus are facultative heterofermentative, Lacticaseibacillus casei and Pediococcus pentosaceus are predominately homofermentative while Levilactobacillus brevis is an obligate heterofermentative bacteria (Costa et al., 2019). Hence, they produce different types and quantities of metabolites and differently influence environmental characteristics such as pH and oxygen availability that may consequently affect the volatile and sensory profiles of fermented juices. In addition, different lactic acid bacteria strains differ in the specific activity of relevant enzymes involved in flavor formation during lactic acid fermentation (Smit, Smit, & Engels, 2005).

Therefore, we hypothesized that there is a discrepancy in the sensory and volatile profiles of mango juice fermented by different lactic acid bacteria, namely Lactiplantibacillus plantarum subsp. plantarum, Lacticaseibacillus rhamnosus, Lacticaseibacillus casei, Levilactobacillus brevis, and Pediococcus pentosaceus. The volatile compounds in the juices were measured by headspace solid phase microextraction (HS-SPME) combined with gas chromatography-mass spectrometry (GC-MS). Untrained consumers assessed the products’ sensory characteristics.

2. Materials and Methods

2.1. Mango Samples and Juice Preparation

Mango fruits (Mangifera indica L. var Kagoogwa) were purchased from Nakaseer market, in Kampala, Uganda (latitude: 00°18′42.34″ N, longitude: 32°34′46.34″ E). The
fruits were selected based on their maturity, uniform color, no visible infection, and no mechanical damage. They were washed using distilled water, peeled, chopped, and mixed using a domestic blender (Joseph, MI, USA) to obtain mango juice without the addition of water. The obtained mango juice was homogenized using an Ultra-Turrax (IKA T18, Staufen, Germany) at 1422 × g (10,000 rpm) for 15 min and pasteurized according to Shaheer et al. [16]. Briefly, 50 mL of mango juice dispensed in a sterile 100 mL flask was pasteurized at 80 °C (internal temperature) for 5 min in a water bath (Memmert WNB 45, Schwabach, Germany) with an external temperature of 100 °C under continuous shaking. The pasteurized juice was rapidly cooled to room temperature using an ice-water bath (0 °C).

2.2. Lactic Acid Bacteria Strains and Growth Conditions

Lactic acid bacteria strains (*Lactiplantibacillus plantarum* subsp. *plantarum*, LMG6907, *Lacticaseibacillus rhamnosus* LMG25859, *Lacticaseibacillus casei* LMG6904, *Levilactobacillus brevis* LMG11437, and *Pediococcus pentosaceus* LMG10740) were purchased from the Belgian Coordinated Collections of Microorganisms-Laboratory of Microbiology (BCCM-LMG, Ghent, Belgium). The dried cultures were grown in sterile de Man, Rogosa, and Sharpe (MRS) broth (Basingstoke, Hampshire, England) and stored in cryovials with 20% v/v glycerol (VWR International, Leuven, Belgium) at −20 °C.

Before use, each strain was activated twice in MRS broth at 30 °C (*Lactiplantibacillus plantarum* subsp. *plantarum*, *Levilactobacillus brevis*, and *Pediococcus pentosaceus*) and 37 °C (*Lacticaseibacillus casei* and *Lacticaseibacillus rhamnosus*) for 24 h (stationary growth phase). The cultures were centrifuged (Hermle Z300K, Hermle Labortechnik GmbH, Wehingen, Germany) at 2540 × g (4000 rpm) for 15 min at 4 °C, the biomass washed twice in saline diluent (0.85% w/v sodium chloride, VWR International, Belgium) and then re-suspended in the same diluent [17].

2.3. Fermentation of Mango Juice

Pasteurized mango juices were inoculated with monoculture washed bacterial cells (1% v/v) and incubated at optimal growth temperatures (30 or 37 °C) for 24 h to obtain mango juice fermented by *Levilactobacillus brevis* (MLB), *Lacticaseibacillus casei* (MLC), *Lacticaseibacillus rhamnosus* (MLR), *Lactiplantibacillus plantarum* subsp. *plantarum* (MLP), and *Pediococcus. pentosaceus* (MPP). The control was pasteurized mango juice without the addition of lactic acid bacteria and incubated under the same conditions (30 °C, 24 h). The juices were then kept at 4 °C to stop fermentation and analyzed within 12 h. Three independent fermentation experiments were carried out for each bacterial strain.

2.4. Growth of Microorganisms and pH during Fermentation

Viable bacterial counts were enumerated from the samples at time zero (T₀) and after 24 h (T₂₄). Each sample (1 mL) was vortexed (Vortex-genie 2, Thermo Fishec Scientific Inc., Waltham, MA, USA) mixed in 9 mL of sterile saline diluent and serial dilutions (10⁻¹ to 10⁻⁷) were subsequently plated (0.1 mL) using the spread plate method on MRS agar, Rose Bengal chloramphenicol agar, plate count agar, Xylose Lysine Deoxycholate agar, and Rapid *E. coli* agar (Oxoid LTD, Basingstoke, Hampshire, England). The plates were incubated at optimal growth conditions for the enumeration of *Lactobacillus* (30/37 °C, 48 h), yeast and molds (20 °C, 5 days), total plate counts (20 °C, 3 days), *Salmonella* (37 °C, 24 h), *Escherichia coli* (44 °C, 24 h), and total coliforms (37 °C, 24 h) [18].

pH was measured using a digital pH meter (FC 2020) at 20 °C, previously calibrated with buffer solutions (4, 7, and 10).

2.5. Analysis of Volatile Compounds

2.5.1. Extraction of Volatiles

Volatile compounds in the samples were analysed using HS-SPME GC-MS according to a method described by Hinneh et al. [19] with some modifications. Briefly, 2 g of juice sample was added to each HS-SPME vial (20 mL) and thoroughly mixed with
2 mL of saturated sodium chloride (NaCl) (Merck, Belgium) previously brought to pH 3.0 (with 0.8 M acetic acid solution, Merck, Belgium) and 3 μL of the internal standard, 2-octanol (Sigma-Aldrich, Belgium) at a concentration of 213.6 mg/L methanol (Merck, Belgium). The vial was hermetically sealed and then incubated (Gerstel, Müllheim an der Rur, Germany) at 40 °C for 20 min in a thermostatic agitator to extract the volatiles. The released volatiles in the headspace were subsequently sorbed onto the divinylbenzene/carboxen/polydimethylsiloxane (DVB/CAR/PDMS) fiber (75 μm, Sigma-Aldrich, Belgium) for 20 min at 40 °C. Three independent experiments for each lactic acid fermentation were carried out and between each GC-MS analysis, the fiber was conditioned for 7 min at 270 °C.

2.5.2. GC-MS Analysis

The gas chromatograph (GC) (Agilent 6890, Agilent Technologies, Santa Clara, CA, USA) was connected to a mass spectrometer fitted with a ZB-Wax plus column (30 m × 0.25 mm i.d. × 0.25 μm film thickness, Zebron, Phenomenex, Macclesfield, UK). Helium gas was used as a carrier gas with a constant flow rate of 1 mL/min. The DVB/CAR/PDMS fiber was inserted and desorbed for 180 s into the splitless injection port (250 °C) of the GC oven. The following time-temperature program was applied: 40 °C for 5 min, then increased at 5 °C/min to 80 °C, at 3 °C/min to 134 °C, and at 8 °C/min to 230 °C, where it was held for 2 min. Mass spectrometry was performed at a 230 °C ion source temperature with a mass range from m/z 40 to 300 (full scan mode) and 70 eV ion current using no solvent delay and a threshold of 50 [20]. The extracted volatile compounds detected were identified.

2.5.3. Identification of Volatile Compounds

Volatile compounds were identified by comparing retention indices on the ZB-Wax-column with literature data, matching the MS-spectrum of each peak to those of the Wiley275 library (quality match > 85%), and their retention index (RI) values were calculated using a series of n-alkanes (C9–C16) as standards according to Vandendool & Kratz [21]. An internal standard method was used to quantify the identified volatiles [22]. Therefore, data have been expressed as nanograms of the internal standard (2-octanol) equivalents per mL of sample and were calculated as:

\[ M_s = \left( \frac{M_i \times A_s}{A_i \times M_o} \right) \]  

where \( M_s \) is the identified volatile concentration, expressed as ng/mL; \( M_i \) is the weight of the internal standard, expressed as ng; \( M_o \) is the weight of mango juice used, expressed as mL; \( A_s \) is the peak area of identified volatiles; and \( A_i \) is the peak area of the internal standard. Percentage differences of the volatiles in each fermented mango sample versus the control were calculated to evaluate any differences between the samples.

2.6. Consumer Sensory Acceptability

2.6.1. Participants

Eighty (80) participants were randomly recruited from students, staff, and visitors of the Nelson Mandela African Institution of Science and Technology. Eligibility for participation followed the criteria of Meilgaard et al. [23]: no food allergies (oral allergy syndrome) or dietary intolerances, consumption of fruits, willingness, and availability. All participants’ demographics are described in Table S2. The majority were aged between 18 and 49 years with 55% males and 45% females. No prior information regarding the aim of the study or content of the products was given, and no reimbursements were made for their participation.

This study was approved by the Health Research Ethics Committee of Kibong’oto Infectious Diseases Hospital, the Nelson Mandela African Institution of Science and Technology, and the Centre for Educational Development in Health Arusha under the protocol number KNCHREC0008, and each participant gave informed consent for inclusion before they participated in the study.
2.6.2. Sensory Data Collection

Juice samples (20 mL) were served cold (4 ± 1 °C) in styrofoam cups identifiable by a random three-digit code. Each consumer received six samples (5 fermented and control juices) one at a time and between each different sample, two unsalted crackers and bottled water were provided to rinse their mouths, and a 2 min break was taken. The samples were served in a completely randomized order using William’s Latin square design [24] to balance bias caused by first-order and carry-over effects. This experiment took place in a room with a classroom arrangement, adequate lighting, noise-free uninterrupted environment, and participants did not face each other.

For each sample, consumers first rated their overall liking using a 9-point hedonic scale [25] with 1 = ‘dislike it extremely’, and 9 = ‘like it extremely’. This hedonic scale also assessed the appearance, aroma, sweetness, flavor, consistency, acidity, and color attributes of the juices.

Secondly, consumers used the check-all-that-apply (CATA) method [26] to characterize the samples. This is a multi-choice question that comprises a list of terms from which the consumers select. The terms used were based on prior work [27] and included: ‘mango aroma’, ‘mango color’, ‘mango flavor’, ‘thick’, ‘pulp’, ‘sweet’, ‘sour’, ‘off-flavor’, ‘natural taste’, ‘intense flavor’, ‘light color’, ‘bitter’, and ‘aftertaste’. Consumers were requested to check all applicable terms. For each sample, these terms were randomized in a monadic sequence following a balanced order by using William’s Latin square design [24].

Thirdly, consumers assessed modifiable attributes of the sample, i.e., aroma, sweetness, flavor, consistency, acidity, and color using a 5-point just-about-right (JAR) scale, anchored from 1 = ‘much too low’ to 5 = ‘much too high’ [28].

Finally, consumers stated their intent on whether they would likely purchase the product in the market using a 5-point scale ranging from ‘certainly would not buy’ to ‘certainly would buy’ [29]. Consumers were also asked questions regarding their age, gender, frequency of fruit consumption per month (‘more than once a week’, ‘once a week’, ‘more than once a month but less than every week’ or ‘less than once a month’) [30], and whether they paid attention to their diet.

2.7. Statistical Analysis

Statistical analyses were performed using XL-STAT, (version 2020.1, Addinsoft, Paris, France), IBM SPSS for macOS (Version 23, IBM Corporation, Armonk, New York, NY, USA), and GraphPad Prism (Version 8.0.0 for macOS, San Diego, CA, USA). All the microbiology and volatile assays were performed in triplicates in three independent experiments, and results were expressed as the assay’s average. Data of volatile compounds were analyzed using one-way analysis of variance (ANOVA) followed by a post-hoc Tukey t-test to determine any significant differences (p < 0.05) between samples. Principal component analysis (PCA) was used to study relationships between samples in terms of volatile profiles.

For the sensory data, repeated measures one-factor ANOVA and Bonferroni post-hoc test was used to check for differences in the overall liking and sensory attributes between the different samples. A frequency analysis assessed attributes on the JAR scale and thereafter penalty analysis [31] examined if any of the attributes influenced a mean drop in the overall acceptability for each sample. Based on Pareto’s principle, significant (p < 0.05) results were considered when a proportion of >20% consumers criticized an attribute either as too ‘low’ (−) or too ‘high’ (+) and caused a mean drop of >1 point on overall liking [28]. CATA data were analyzed using Cochran’s Q test [32], which analyses a two-way randomized block design (data matrix) to check if the samples as treatments have similar effects (McNemar post-hoc) when the consumer response is binary (checked/not checked) [8].

A multiple factorial analysis (MFA) [33] was used to determine relationships between the samples based on the overall liking, liking of key sensory attributes, CATA characteristics, and volatiles data.
3. Results

3.1. Growth of Lactic Acid Bacteria in Mango Juice during Fermentation

The mango juices had an initial (T$_0$) lactic acid bacteria concentration of 7–8 log CFU/mL, but after 24 h fermentation (T$_{24}$), the viable counts increased to a maximum of 9.16 log CFU/mL in MLB (Table 1). This increment was significant ($p < 0.05$) in MLB, MLP, and MLR. Counts in the control were below the detectable limit of <1 log CFU/mL.

Table 1. Viable cell counts (log CFU/mL) of lactic acid bacteria in mango juice after 24 h fermentation.

| Mango Juice Sample | Lactic Acid Bacteria Strain | T$_0$         | T$_{24}$        | $p$-Value |
|--------------------|-----------------------------|---------------|-----------------|-----------|
| MLB                | *Levibacillus brevis* LMG11437 | 7.52 ± 0.38 b | 9.16 ± 0.26 a   | 0.039     |
| MLC                | *Lactococcus casei* LMG6904  | 7.22 ± 0.26 a | 8.25 ± 0.87 a   | 0.251     |
| MLP                | *Lactiplantibacillus plantarum* subsp. *plantarum* LMG6907 | 7.31 ± 0.04 b | 8.97 ± 0.10 a   | 0.002     |
| MLR                | *Lacticaseibacillus rhamnosus* LMG25859 | 7.04 ± 0.25 b | 8.83 ± 0.48 a   | 0.043     |
| MPP                | *Pediococcus pentosaceus* LMG10740 | 7.62 ± 0.34 a | 8.72 ± 0.50 a   | 0.125     |

Results are expressed as mean ± SD. Mango juice fermented with MLB—*Levibacillus brevis*; MLC—*Lactococcus casei*; MLP—*Lactiplantibacillus plantarum* subsp. *plantarum*; MLR—*Lacticaseibacillus rhamnosus*; MPP—*Pediococcus pentosaceus*. a, b values within rows with different lowercase letters differ significantly at $p < 0.05. n = 3$.

The microbial analysis also showed that the control had a total plate count (<3 log CFU/mL) and yeast and molds (<2 log CFU/mL) below permitted levels (<4 and <3 log CFU/mL, respectively) according to the Codex Alimentarius Commission of the Food and Agricultural Organization [34]. Similarly, besides the lactic acid bacteria, no other microorganisms were observed using total plate count (<3 log CFU/mL) and yeast and mold were below detectable limits (<2 log CFU/mL) in the samples. Total coliforms in the samples were below detectable limits (<1 log CFU/mL), as well as pathogenic microorganisms *Escherichia coli* and *Salmonella* spp. (<1 log CFU/mL).

The initial pH of the mango juice was 4.45 ± 0.13. The control juice remained at the same pH (4.39 ± 0.12) after 24 h incubation. However, for the fermented juices, pH significantly decreased in MLC (4.09 ± 0.14, $p = 0.03$), MPP (3.94 ± 0.14, $p = 0.009$), MLB (3.83 ± 0.10, $p = 0.003$), MLR (3.81 ± 0.20, $p = 0.01$), and MLP (3.72 ± 0.19, $p = 0.005$).

3.2. Analysis of Volatile Compounds

Forty-four (44) volatile compounds were tentatively identified in the samples (Table 2) and classified into different groups: monoterpenes (16), sesquiterpenes (13), esters (4), alcohols (3), aldehydes (3), hydrocarbons (1), furans (1), sulfurs (1), trihalomethane (1), and ketones (1).

In the control sample, mainly monoterpenes were detected: δ-3-carene, α-pinene, β-myrcene, α-terpinene, limonene, and β-phellandrene (Figure S1). After fermentation (24 h), some variations in volatile concentrations were observed, for instance, the levels of 2,6-nonadienal (cucumber notes) and 2-hexenal (apple and green notes) fell sharply in all samples while a cyclic hydrocarbon derivate, originally not in the control, was detected in all fermented juices (Table 2). The percentage change (%) of volatile compounds in fermented mango juices compared to the control was therefore calculated (Figure 1). Representation of volatile concentrations $-100\%$ mean complete degradation and $+100\%$ mean production after fermentation.

The total level of the monoterpenes (Figure 1a) did not significantly change (<15%) after fermentation. However, there was a significant increase in β-ocimene in MLP ($p = 0.001$), limonene in MLC ($p = 0.010$), and β-myrcene in MLP and MLC ($p = 0.004$) while the p-cymene decreased ($p = 0.033$) in MLC and MLP. Most of the sesquiterpenes decreased (Figure 1b) in MLB, MLP, and MLR except for an unknown sesquiterpene which increased in MLP and MLR by over 40% ($p < 0.05$). In MPP and MLC, a slight increase (<10%) in the total level of sesquiterpenes was observed. Especially for the level of β-caryophyllene, a significant ($p < 0.05$) decrease was recorded in MLB and MLR. In “other volatiles” (Figure 1d), a cyclic hydrocarbon derivate was unique to fermented juices with a production of $+100\%$ after fermentation and was not detectable in the control. The chemical structures of the terpene compounds are shown in Table S3.
Table 2. Volatile compounds in the control and fermented mango juices expressed as ng/mL of 2-octanone equivalents.

| Volatile Compound | RT a | RI b | ID c | Samples d | p-Value e | Odor Quality f |
|-------------------|------|------|------|-----------|-----------|----------------|
| Foods | | | | | | |
| | | | | | | |
| **Alcohols** | | | | | | |
| Ethanol | 3.05 | 924.0 | RI, MS | Control | 0.89 | sweet |
| 1-Hexanol | 14.74 | 1339.8 | RI, MS | Control | 0.001 | resin, flower, green |
| 3-Hexen-1-ol | 15.57 | 1365.7 | RI, MS | Control | 0.027 | grass |
| **Aldehydes** | | | | | | |
| Unknown aldehyde | 3.59 | 958.8 | RI, MS | Control | 0.006 | - |
| 2-Hexenal | 10.26 | 1196.1 | RI, MS | Control | 0.001 | apple, green |
| 2,6-Nonaldehyde | 22.08 | 1555.6 | RI, MS | Control | <0.001 | cucumber |
| **Esters** | | | | | | |
| Ethyl acetate | 2.50 | 897.2 | RI, MS | Control | 0.17 | pineapple |
| Ethyl butyrate | 4.89 | 1022.7 | RI, MS | Control | 0.385 | apple |
| Linalyl propanoate | 26.19 | 1676.4 | RI, MS | Control | 0.006 | citrus-like |
| Ethyl dodecanoate | 31.47 | 1832.1 | RI, MS | Control | 0.011 | waxy |
| **Furan** | | | | | | |
| 2-Pentylfuran | 10.78 | 1212.8 | RI, MS | Control | 0.165 | green bean, butter |
| Ketone | 3.53 | 954.9 | RI, MS | Control | <0.001 | butter |
| **2,3-Butanediol** | | | | | | |
| Monoterpenes | | | | | | |
| α-Pinene | 4.59 | 1012.4 | RI, MS | Control | 0.60 | pine, turpentine |
| α-Fenchene | 5.35 | 1038.5 | RI, MS | Control | 0.668 | camphor |
| Camphene | 5.82 | 1044.4 | RI, MS | Control | 0.702 | camphor |
| β-pinene | 6.53 | 1079.1 | RI, MS | Control | 0.163 | lemon, resin |
| δ-3-Carene | 8.26 | 1134.5 | RI, MS | Control | 0.019 | lemon, resin, turpentine |
| α-Phellandrene | 8.58 | 1144.4 | RI, MS | Control | 0.107 | turpentine, mint, spice |
| β-Mycene | 8.76 | 1149.9 | RI, MS | Control | 0.004 | balsamic, must, spice |
| α-Terpineol | 9.04 | 1158.5 | RI, MS | Control | 0.005 | pine, plastic |
| Limonene | 9.67 | 1177.9 | RI, MS | Control | 0.010 | lemon, orange |
| β-phellandrene | 9.90 | 1185.0 | RI, MS | Control | 0.135 | pepper, turpentine, wood |
| γ-Terpineol | 11.13 | 1224.1 | RI, MS | Control | 0.001 | gasoline, turpentine |
| β-Ocimene | 11.44 | 1234.2 | RI, MS | Control | 0.001 | sweet, herb |
| P-Cymene | 11.83 | 1246.9 | RI, MS | Control | 0.015 | spice, fragrant |
| α-Terpineol (1) | 12.09 | 1255.3 | RI, MS | Control | 0.033 | spice, wood, terpenic |
| α-Terpineol (2) | 12.30 | 1262.1 | RI, MS | Control | 0.167 | resin |
| Sulphur | | | | | | |
| Dimethyl sulfide | 1.82 | 888.4 | RI, MS | Control | 0.355 | cabbage-like |
| Trihalomethane | | | | | | |
| Chloroform | 4.32 | 1003.1 | RI, MS | Control | 0.002 | sweet |
| Sesquiterpenes | | | | | | |
| α-Copaene | 19.01 | 1467.9 | RI, MS | Control | 0.241 | wood, spice |
| α-Gurjunene | 20.24 | 1503.5 | RI, MS | Control | 0.108 | wood, balsamic |
Table 2. Cont.

| Volatile Compound | RT  a | R1 b | ID c  | Control | MLB | MLC | MPP | MLP | MLR | p-Value | Odor Quality e |
|-------------------|-------|------|-------|---------|-----|-----|-----|-----|-----|---------|-----------------|
| Unknown           | 21.21 | 1531.0 | RI, MS | 13.9 ± 0.36 c | 14.6 ± 1.31 bc | 17.0 ± 0.16 bac | 15.0 ± 1.31 bac | 20.3 ± 3.59 a | 19.8 ± 2.60 ba | 0.006 | wood, balsamic |
| Sesquiterpene     | 22.36 | 1563.5 | RI, MS | 7.38 ± 0.05  | 6.48 ± 0.43 b  | 6.43 ± 0.49 a  | 7.18 ± 0.57 b  | 5.93 ± 1.18 c | 5.90 ± 1.28 bc | 0.185 | wood, spice |
| α-Guaiene         | 22.43 | 1565.5 | RI, MS | 15.7 ± 0.46 c | 13.9 ± 0.44 c | 17.3 ± 1.67 c | 16.4 ± 2.16 c | 14.9 ± 1.07 d | 14.2 ± 0.43 d | 0.038 | wood, spice |
| β-Caryophyllene   | 24.87 | 1636.7 | RI, MS | 24.3 ± 1.06 c | 21.6 ± 1.02 c | 25.5 ± 2.40 c | 25.5 ± 3.47 c | 23.0 ± 1.07 d | 22.5 ± 1.10 d | 0.129 | wood |
| α-Humulene        | 25.19 | 1646.3 | RI, MS | 8.04 ± 0.23 c | 6.98 ± 0.60 d  | 6.82 ± 0.24 d  | 7.95 ± 0.58 d  | 6.47 ± 1.12 d | 7.04 ± 1.03 d  | 0.105 | musty |
| γ-Gurjunene       | 25.28 | 1649.0 | RI, MS | 25.6 ± 0.98 c | 22.6 ± 0.90 c  | 27.7 ± 3.20 c  | 27.2 ± 4.01 c  | 24.7 ± 1.30 c | 23.5 ± 0.75 c  | 0.094 | wood |
| α-Murolene        | 25.65 | 1660.1 | RI, MS | 7.08 ± 0.44 c | 6.41 ± 0.49 b  | 7.42 ± 0.65 b  | 7.49 ± 0.97 b  | 0.67 ± 0.55 c | 6.54 ± 0.67 c  | 0.268 | - |
| β-Selinene        | 26.58 | 1688.1 | RI, MS | 103 ± 8.65   | 88.9 ± 3.33 a  | 109 ± 13.2 a   | 108 ± 9.48 a   | 95.2 ± 4.40 a | 95.9 ± 4.95 a  | 0.060 | herbal |
| γ-Selinene        | 26.77 | 1693.8 | RI, MS | 19.0 ± 1.43 d | 16.6 ± 1.06 c  | 19.7 ± 2.03 c  | 20.4 ± 2.57 c  | 17.9 ± 1.15 d | 18.17 ± 0.80 d | 0.138 | thyme, medicine |
| δ-Cadinene        | 27.99 | 1729.8 | RI, MS | 34.3 ± 2.79   | 30.4 ± 2.07 b  | 36.5 ± 3.99 b  | 36.50 ± 5.14 b | 32.5 ± 2.35 b | 32.3 ± 1.91 b  | 0.208 | wood |
| Calamenene        | 30.42 | 1801.3 | RI, MS | 10.4 ± 0.64   | 9.41 ± 0.92 a  | 10.3 ± 0.62 a  | 11.0 ± 2.40 a  | 9.99 ± 1.21 a | 9.91 ± 0.94 a  | 0.759 | herb, spice |
| Other Cyclic      | 28.67 | 1749.8 | RI, MS | 0.00 ± 0.00 b | 2.77 ± 0.52 a  | 2.08 ± 0.27 a  | 2.44 ± 0.27 a  | 2.03 ± 0.72 a | 1.97 ± 0.43 a  | <0.001 | - |
| hydrocarbon       |       |       |       |         |    |    |    |    |    |        |                   |
| derivate          |       |       |       |         |    |    |    |    |    |        |                   |

Results are expressed as mean ± SD. a, b, c, d values within rows with different lowercase letters differ significantly at p < 0.05. n = 3. a Retention time (min). b Retention indices according to the equation proposed by Vandendool & Kratz [21]. c ID, volatiles were identified according to abbreviations: RI, comparing retention indices on a ZB-Wax-column with those in the literature; MS, mass spectrum comparisons with those in the Wiley275 library. d Mango juice fermented with MLB—Levlactobacillus brevis; MLC—Lactisaceibacillus casei; MLP—Lactiplantibacillus plantarum subsp. plantarum; MLR—Lactisaceibacillus rhamnosus; MPP—Pediococcus pentosaceus. Control is mango juice with no lactic acid bacteria under the same conditions of fermentation (24 h). e Odor descriptions were cited from www.flavornet.org (accessed on 8 January 2022).
Figure 1. Percentage change of volatile compounds (ng/mL of 2-octanol equivalents). Mango juice fermented with MLB—*Levialactobacillus brevis*; MLC—*Lacticaseibacillus casei*; MLP—*Lactiplantibacillus plantarum* subsp. *plantarum*; MLR—*Lacticaseibacillus rhamnosus*; MPP—*Pediococcus pentosaceus*. Control is mango juice with no lactic acid bacteria under the same conditions of fermentation (24 h). * Significant difference (*p* < 0.05). (a) Monoterpenes; (b) Sesquiterpenes; (c) Alcohols, aldehydes, and esters; (d) Other volatile compounds.

Alcohol concentrations (Figure 1c) significantly decreased in MLR by 63% in 1-hexanol (*p* ≤ 0.001) and 26.1% in 3-hexen-1-ol (*p* = 0.027). Unsaturated aldehydes 2,6-nonadienal and 2-hexenal were degraded by more than 80% and 42% after fermentation in all the fermented juices, but the concentration of an unknown aldehyde significantly increased (*p* = 0.006) in MPP.

Four (4) esters were found in the samples. After fermentation, in all the fermented juices, the levels of ethyl butyrate and ethyl acetate (except MPP) decreased while concentrations of linalyl propanoate significantly increased (35–158%). Among other volatiles (Figure 1d), the amount of 2,3-butanedione increased (*p* < 0.05) tremendously in MLC.
and MLR juices by 282% and 419%, respectively, as opposed to MPP and MLB where it significantly decreased \( (p < 0.05) \) after fermentation.

The relationships among the samples based on their volatile data were illustrated using a principal component analysis (PCA) plot (Figure 2). Considering the 44 compounds, the first two PCA dimensions accounted for 30.8% (PC1) and 22.3% (PC2) of the variance. PC1 separated MLC from MLR, but the results showed PC2 was the main axis for the separation of the control from MLC, MLR, and MLP. The control, MPP, and MLB were localized on the PC2 positive semi-axis due to higher levels of esters (ethyl acetate, ethyl butyrate), aldehydes (2-hexenal, 2,6-nonadienal, and an unknown aldehyde), and sesquiterpenes (\( \beta \)-selinene, \( \gamma \)-gurjunene, \( \alpha \)-copaene, and \( \delta \)-cadinene). MLC, MLP, and MLR were localized on the PC2 negative semi-axis and had higher amounts of 2,3-butanedione, an unknown sesquiterpene, and a cyclic hydrocarbon derivate.

**Figure 2.** Principal component analysis (PCA). Biplot based on values of volatile compounds (ng/mL of 2-octanal equivalents) in mango juice. Mango juices fermented with MLB—Levilactobacillus brevis; MLC—Lacticaseibacillus casei; MLP—Lactiplantibacillus plantarum subsp. plantarum; MLR—Lacticaseibacillus rhamnosus; MPP—Pediococcus pentosaceus. Control is mango juice with no lactic acid bacteria under the same conditions of fermentation (24 h).

### 3.3. Consumer Sensory Acceptability

All the samples were liked moderately ranging from 7.71 in the control to 6.71 in MLR (Table 3). The fermented mango juices did not differ significantly \( (p > 0.05) \) from the control except for MLR, which was rated significantly lower. Although aroma and flavor were most liked in MLB (7.63 and 7.66, respectively), MLB was similar to the control, MLC, and MPP in these attributes. However, MLP and MLR juices received the lowest scores (6.28–6.96) and differed \( (p < 0.05) \) from the control in terms of aroma, flavor, consistency, and sweetness.
Table 3. Mean ± SD scores (9-point hedonic scale) for overall liking and sensory attributes of the control and fermented mango juices.

| Sample  | Overall Liking | Appearance | Color | Aroma | Flavor | Consistency | Acidity | Sweetness |
|---------|----------------|------------|-------|-------|--------|-------------|---------|-----------|
| Control | 7.72 ± 1.17 ab | 8.00 ± 1.20 | 8.06 ± 1.02 | 7.36 ± 1.43 ab | 7.51 ± 0.76 a | 7.46 ± 1.44 a | 7.11 ± 1.65 | 7.56 ± 1.50 a |
| MLB     | 7.69 ± 0.94 a  | 8.10 ± 0.92 | 8.14 ± 0.71 | 7.63 ± 1.18 ab | 7.66 ± 0.77 a | 7.45 ± 1.17 a | 7.06 ± 1.41 | 7.63 ± 1.30 a |
| MLC     | 7.39 ± 1.11 abc| 8.01 ± 1.00 | 7.98 ± 0.95 | 7.11 ± 1.51 abc| 7.16 ± 0.87 ab| 6.81 ± 1.80 abc| 6.89 ± 1.85 | 7.15 ± 1.60 ab|
| MLP     | 7.03 ± 1.71 bc | 7.98 ± 1.01 | 8.03 ± 0.84 | 6.79 ± 1.59 bc | 6.65 ± 0.85 b | 6.65 ± 1.81 bc | 6.56 ± 1.81 | 6.96 ± 1.76 ab|
| MLR     | 6.71 ± 1.60 c  | 7.76 ± 1.42 | 7.94 ± 0.88 | 6.61 ± 1.66 c  | 6.61 ± 1.00 b | 6.54 ± 1.63 c | 6.28 ± 2.15 | 6.58 ± 1.98 b |
| MPP     | 7.51 ± 1.39 ab | 7.94 ± 1.72 | 7.89 ± 1.44 | 7.43 ± 1.52 ab | 7.55 ± 0.67 a | 7.35 ± 1.64 ab | 6.95 ± 1.79 | 7.61 ± 1.51 a |

p-value <0.001 0.589 0.517 <0.001 <0.001 0.039 <0.001 <0.001

Mango juices fermented with MLB—Levilactobacillus brevis; MLC—Lactocaseibacillus casei; MLP—Lactiplantibacillus plantarum subsp. plantarum; MLR—Lactocaseibacillus rhamnosus; MPP—Pediococcus pentosaceus; a, b, c values along a column with different lowercase letters differ significantly at p < 0.05 using repeated-measures ANOVA with Bonferroni post-hoc tests. Control is mango juice with no lactic acid bacteria under the same conditions of fermentation (24 h). Hedonic scale ranging from 1 = extremely dislike to 9 = extremely like. n = 80.

The CATA question obtained binary responses of terms that consumers perceived to describe the samples. The terms ‘mango flavor’, ‘mango color’, ‘mango aroma’, ‘sweet’, ‘thick’, and ‘natural taste’ were most frequently (>60% of consumers) used to describe the samples (Figure 3). Fermented juices did not differ from the control in most of the sensory terms but 4 out of 14 terms were significantly different, i.e., ‘natural taste’ (p = 0.003), ‘sour’ (p = 0.001), ‘sweet’ (p = 0.011), and ‘watery’ (p = 0.008). MLB had the highest mention of ‘natural taste’ at 64% followed by MPP (59%) and the control (50%), whereas MLR had the highest mention of ‘sour’ (49%) and least mention of ‘sweet’ (41%).

A sensory map from multi-factorial analysis (MFA) evaluated whether the allocation of these terms contributed to overall liking and showed any relationships between the product categories. The first two MFA dimensions (Figure 4) explained 73.9% of the total variability. There was a good correlation between different samples, sensory terms, and overall liking. The positive F1 semi-axis represented the control, MLB, MPP, and MLC. These juices were closely associated with overall liking and characterized with ‘mango color’, ‘pulp’, ‘mango aroma’, ‘sweet’, ‘natural taste’, and ‘mango flavor’ terms. Conversely, MLP and MLR juices were in the negative F1 semi-axis (separate level) and characterized with ‘sour’, ‘bitter’, ‘aftertaste’, and ‘off-flavor’ terms.

Penalty analysis obtained information on the intensity level of modifiable sensory attributes of each sample. Overall, consumers who found the samples to deviate from just-about-right was less than 50% (Figure 5). Moreover, attributes that fell in the upper right corner were considered most concerning as they have the highest skews and had the greatest mean drop, while those in the lower-left corner are those with minimal concern. As observed, the control, MLB, MPP, and MLC had the least penalized attributes in the upper right corner compared to MLR and MLP. No sensory attribute exceeded the 20% threshold for MLB. The control and MPP had only two out of six attributes above the threshold, MLC registered three attributes, MLB had four attributes, while for MLR, all six attributes were criticized by > 20% of consumers.

Sweetness and aroma were the most penalized attributes and were considered too low in the control, MLB, MPP, MLC, MLR, and MLP, causing a mean drop for overall liking scores ranging from 1.10 in MLC to 1.69 in MLP juice. Acidity was penalized for being too high in MLC, MLR (mean drop 1.43), and MLP (mean drop, 1.35). Consumers had conflicting opinions on the flavor of MLP as 21.3% found it to be too high (1.73 mean drop) and 30% too low (1.51 mean drop). Consistency and color were only criticized in MLA as too low and too high, respectively.

Regarding consumers’ purchase willingness, the control had the highest percentage of ‘certainly would buy’ at 46% followed by MLB and MPP at 40% (Figure S2). The highest scores for MLR and MLP juices were recorded at ‘might buy’ at 32.5% and 33.75%, respectively.
Figure 3. Frequency of mention (% respondents, n = 80) of CATA terms. Mango juices fermented with MLB—Levilactobacillus brevis; MLC—Lacticaseibacillus casei; MLP—Lactiplantibacillus plantarum subsp. plantarum; MLR—Lacticaseibacillus rhamnosus; MPP—Pediococcus pentosaceus. Control is mango juice with no lactic acid bacteria under the same conditions of fermentation (24 h). Significant differences * $p < 0.05$, ** $p < 0.01$, *** $p < 0.001$ using Cochran’s Q test.
Figure 4. Multifactorial analysis (MFA) using overall liking ratings and CATA (n = 80). Mango juices fermented with MLB—Levilactobacillus brevis; MLC—Lactoseibacillus casei; MLP—Lactiplantibacillus plantarum subsp. plantarum; MLR—Lactoseibacillus rhamnosus; MPP—Pediococcus pentosaceus. Control is mango juice with no lactic acid bacteria under the same conditions of fermentation (24 h).

3.4. Combination of Volatile and Sensory Analysis

Volatile data were compared with sensory data (CATA, sensory liking of the attributes and overall liking) using multifactorial analysis (Figure 6). The first two dimensions of MFA explained 65% of the total variability. The positive axis of the first dimension (F1) separated the control, MLB, and MPP and associated them with overall liking, desirable CATA terms (‘sweet’, ‘mango flavor’, ‘mango color’, ‘natural taste’, and ‘pulp’), liking of sensory attributes, alcohols, aldehydes, esters (ethyl butyrate), some sesquiterpenes (γ-gurjunene, α-copaene), and some monoterpenes (camphene, α-fenchene). Contrarily, MLR, MLP, and MLC juices were on the negative axis of F1 which was associated with the CATA terms ‘sour’, ‘off-flavor’, ‘intense flavor’, ‘aftertaste’, and ‘bitter’, 2,3 butanedione, linalyl propanoate, 2-pentylfuran, some monoterpenes (limonene, β-myrcene, β-ocimene), and some sesquiterpenes (α-humulene, α and β-selinene).
Figure 5. Cont.
Figure 5. Penalty analysis. A proportion of >20% of consumers (indicated by the — line) who considered an attribute too ‘low’ (−) or too ‘high’ (+) and caused a mean drop of >a point was considered significant (p < 0.05). (n = 80). Mango juices fermented with MLB—Levulactobacillus brevis; MLC—Lactaseibacillus casei; MLP—Lactiplantibacillus plantarum subsp. plantarum; MLR—Lactaseibacillus rhamnosus; MPP—Pediococcus pentosaceus. Control is mango juice with no lactic acid bacteria under the same conditions of fermentation (24 h).
Figure 6. Multifactorial analysis (MFA) showing the relationship between the volatile compounds (ng/mL of 2-octanol equivalents), overall liking, liking of sensory attributes ratings, and CATA characterization. Mango juices fermented with MLB—Levilactobacillus brevis; MLC—Lacticaseibacillus casei; MLP—Lactiplantibacillus plantarum subsp. plantarum; MLR—Lacticaseibacillus rhamnosus; MPP—Pediococcus pentosaceus. Control is mango juice with no lactic acid bacteria under the same conditions of fermentation (24 h). Liking of sensory attributes, a = liking color, b = liking consistency, c = liking sweetness, d = liking flavor, e = liking aroma, f = liking appearance, and g = liking acidity. ($n = 80$).

4. Discussion

Lactic acid bacteria grew and survived in mango juice, and this may be attributed to nutrients (carbohydrates, organic acids, vitamins, and minerals) in mango that are a source of energy for metabolism. Other studies have also demonstrated mango as a suitable medium for lactic acid bacteria growth [4–7]. After fermentation, the acidity of fermented mango juices increased, and this may be antagonistic to pathogenic microorganisms increasing juice shelf-life.

Monoterpenes and sesquiterpenes were the key compounds in the mango juices unlike our previous study in watermelon juices [35]. $\alpha$-Terpinolene, 3-carene, and limonene have also been identified as key monoterpenes in Australian mango cultivars [36] and mango pulp [37]. The presence of monoterpenes in both the control and fermented samples could have played a significant role in consumer acceptability, i.e., fermentation of mango juice with Levlactobacillus brevis, Lacticaseibacillus casei, Lactiplantibacillus plantarum subsp. plantarum, and Pediococcus. pentosaceus except Lacticaseibacillus rhamnosus did not
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affect overall liking (acceptability). Monoterpenes give characteristic flavor notes; turpentine, sweet, and fruity notes. However, the significant increase in β-ocimene (MLP and MLC), limonene (MLC), and β-myrcene (MLP and MLC) (Table 2) may contribute a slightly irritating odor [10]. Sesquiterpenes may contribute to juice flavors and the detected sesquiterpenes were β-selinene, α-gurjunene (woody), α-copaene (woody, spice), and δ-cadinene (woody, thyme). Oliver-Simancas et al. [37] reported β-caryophyllene and α-humulene as the most abundant sesquiterpenes in fresh mango pulp. The flavor and aroma of the control, MLB, MLC, and MPP were most liked and least liked in MLP and MLR (Table 3).

During fermentation, lactic acid bacteria produce various products that may directly or indirectly be involved in the decrease or increase in volatile compounds. Although the total level of the monoterpenes did not significantly change after fermentation, a significant increase was observed in β-ocimene, limonene, and β-myrcene. Lactic acid bacteria produce acids such as lactic acid and acetic acid during fermentation that may damage the fruit cells leading to the release of these compounds [38]. In addition, it is generally recognized that monoterpenes originate from the plastids of pyruvate and glyceraldehyde-3-phosphate via the 2-C-methyl-D-erythritol 4-phosphate (MEP) pathway [39]. Lactic acid bacteria possess an extensive array of enzymes including terpene synthases, which can be produced by Llevistibacillus brevis and Pediococcus pentosaceus and are involved in their biosynthesis and biochemical reactions [40]. On the other hand, most sesquiterpenes decreased (Figure 1b) after fermentation, which is in agreement with Park et al. [41] who also found that lactic acid bacteria significantly decreased terpenes in a mixed berry juice. This reduction could be due to their oxidation to secondary products, hydroxylation, acylation, or isomerization [39,42].

2,3-Butanedione was the only ketone detected. Lactic acid bacteria have plasmid-encoded citrate transporter genes and together with enzyme citrate lyase, they can degrade citrate present in mango to 2,3-butandione [43]. Strains such as Lactiaseibacillus casei, Lactiaseibacillus rhamnosus, and Lactiplantibacillus plantarum subsp. plantarum can convert citric acid during citric acid metabolism to acetate and oxaloacetate under the catalysis of citric acid lyase. The oxaloacetate is decarboxylated by oxaloacetate decarboxylase to produce pyruvate [44]. The pyruvate is then condensed by α-acetolactate synthase to α-acetolactate, which is chemically unstable and can be converted to diacetyl (2,3-butanediol) in a non-enzymatic oxidative decarboxylation reaction or by α-acetolactate decarboxylase [45]. After fermentation, 2,3-butanediol tremendously increased by >800% in MLC and MLR (Figure 1d). Lactiaseibacillus rhamnosus produces high amounts of 2,3-butanediol (64 mg/g glucose) [46] which have a profound effect on the flavor and aroma of fermented products as it is characterized by a strong buttery odor that may probably not be organoleptically acceptable. Hence, 2,3-butanediol may be an index for product quality control. Another compound, i.e., 2-pentylfuran, which has odor notes of beany, oxidized, and green could also give an undesirable buttery flavor to the sample of MLC (Figure 2).

Strong fruity aromas such as apple-like (ethyl butyrate) and pineapple-like notes (ethyl acetate) were also found in the samples. After fermentation, their levels decreased (Table 2) unlike in other fruit juices such as apple juice, where a slight increase after Lactiplantibacillus plantarum subsp. plantarum, Lactiaseibacillus rhamnosus, and Lactiaseibacillus casei fermentation was reported [47]. Linalyl propanoate, which gives citrus-like notes, significantly increased (35–158%) in all fermented juices (Table 2). This aliphatic (straight-chain) ester may be formed from the metabolism of fatty acids through β-oxidation.

Aldehydes (2-hexenal and 2,6-nonadienal) could also influence sample sensory attributes as they give fatty-grassy and cucumber notes, respectively. Liu et al. [48] also identified 2,6-nonadienal in fresh Tianong mango pulp. After fermentation, 2-hexenal and 2,6-nonadienal were degraded. This result is in agreement with Jin et al. [4] who reported a decrease in aldehydes in mango slurries fermented by Lactiplantibacillus plantarum subsp. plantarum. During fermentation, aldehydes may be reduced to their corresponding alcohols.
or oxidized to acids [49]. A high level of aldehydes may cause off-flavors which negatively impact the sensory characteristics of fermented food [50].

Sweetness and consistency were most liked in the control, MLB, MLC, and MPP, while MLP and MLR were the least scored. This correlated with volatile analysis which showed that δ-3-carene, with sweet and limonene-reminiscent odor responsible for ripe mango flavor [51], were highly concentrated in MLC while β-ocimene, responsible for the warm, herbaceous, and floral odor characteristic of raw (unripe) mango flavor was mainly present in MLP, MLR, and MLC (Figure 6). MLR had a significant decrease in the concentration of alcohols (Table 2); 1-hexanol (fruity and aromatic flavor) and 3-hexen-1-ol (intense green grassy odor) that give desirable sweet flavor notes.

The CATA data showed that ‘mango flavor’, ‘mango color’, ‘mango aroma’, ‘sweet’, ‘thick’, and ‘natural taste’ (Figure 3) were the main drivers of consumer liking as they were the most frequently used terms. Thus, consumers like fermented mango juices that still maintain the natural taste and flavors of mango juice. Consumers also detected differences between the samples, as there were significant differences in the frequency of mention using Cochran’s Q test ($p < 0.05$) similar to other studies that characterized orange juices [52] and chocolate milk deserts [26]. The MFA (Figure 4) showed relationships between the samples based on their CATA characteristics, overall liking, liking of key sensory attributes, and volatiles. Overall liking was strongly associated with the control, MLB, and MPP which were characterized by ‘mango aroma’, ‘natural taste’, ‘sweet’, and ‘mango flavor’ terms, sesquiterpenes, monoterpenes, alcohols, and aldehydes. MLP, MLR, and MLC were associated with ‘off flavor’, ‘sour’, ‘aftertaste’, and ‘intense flavor’ terms probably due to high levels of 2,3-butanedione.

Regarding penalty analysis, different attributes had a differential effect on the overall acceptability of each product. MLB was highly accepted as none of its attributes led to a mean drop in overall acceptability (Figure 5). Its attributes were perceived as optimal requiring no adjustments, hence this product could be scaled up by food producers but potential changes in flavor during storage should be further investigated. MLR and MLP were the most penalized juices, especially the sweetness, aroma, acidity for MLR; and sweetness, aroma, acidity consistency, flavor, and color for MLP. Hence, these attributes should be modified during reformulation. Consumers disagreed on the ideal intensity of MLP flavor, and this polarity may be attributed to the quality of this attribute rather than its quantity [53]. Furthermore, the use of just-about-right scales has been found to make respondents more aware and critical of imperfections in samples [53].

Consumers rely on sensory attributes to purchase foods and make a re-purchase on products that they like. This study showed that MLB and MPP had a higher purchasing intent than MLC, MLP, and MLR (Figure S2). However, it should be noted that all the samples scored above 30% on ‘would buy’ showing that they would compete favorably on the market. In addition to volatiles, other non-volatile compounds such as sugars and organic acids may be accumulated or depleted by lactic acid bacteria during fermentation, affecting the sensory characteristics of fermented juices.

5. Conclusions

Following the lactic acid bacteria fermentation, the content of sesquiterpenes, aldehydes, alcohols, and esters decreased while ketones and furans increased in mango juice. The control, mango juice fermented by *Pediococcus. pentosaceus* and *Levilactobacillus brevis* had higher amounts of ethyl acetate, ethyl butyrate, 2-hexenal, 2,6-nonadienal, 2,2-dimethylpropanal, β-selinene, γ-gurjunene, α-copaene, and δ-cadinene, while juice fermented with *Lactaseibacillus casei*, *Lactiplantibacillus plantarum* subsp. *plantarum*, and *Lactoseibacillus rhamnosus* had higher amounts of 2,3-butanedione and a cyclic hydrocarbon derivate. There was an association between the volatile compounds of the fermented mango juices and their sensory acceptability. Fermentation of mango juice with *Levilactobacillus brevis*, *Lactaseibacillus casei*, *Lactiplantibacillus plantarum* subsp. *plantarum*, and *Pediococcus. pentosaceus* except *Lactaseibacillus rhamnosus* did not affect the overall
liking. Overall liking was related to ‘mango aroma’, ‘natural taste’, ‘sweet’, and ‘mango flavor’. Mango juices fermented by *Levlactobacillus brevis* were most accepted and are a potential product for scaling up. However, juices fermented by *Lactiplantibacillus plantarum* subsp. *plantarum* and *Lacticaseibacillus rhamnosus* were most criticized and require modifications/reformulation. A follow-up study is recommended to confirm if the changes made are effective in improving these mango products. Moreover, the flavor of mango juice fermented by *Lactiplantibacillus plantarum* subsp. *plantarum* received conflicting consumer critiques, hence an appropriate consumer group should be targeted during product development and marketing. Further research may be carried out to investigate the effect of non-volatile compounds on the sensory acceptability of fermented mango juices.

**Supplementary Materials:** The following supporting information can be downloaded at: [https://www.mdpi.com/article/10.3390/foods11030383/s1](https://www.mdpi.com/article/10.3390/foods11030383/s1), Figure S1: Chromatogram of the control juice (pasteurized mango juice with no lactic acid bacteria under the same conditions of fermentation (24 h)); Figure S2: Purchase intent (% respondents, *n* = 80). Mango juices fermented with MLB—*Levlactobacillus brevis*; MLC—*Lacticaseibacillus casei*; MLP—*Lactiplantibacillus plantarum* subsp. *plantarum*; MLR—*Lacticaseibacillus rhamnosus*; MPP—*Pediococcus pentosaceus*. Control is mango juice with no lactic acid bacteria under the same conditions of fermentation (24 h); Table S1: Growth of different lactic acid bacteria (log CFU/mL) in mango juice after 24 h fermentation; Table S2: Socio-demographic information of the consumers (% respondents, *n* = 80); Table S3: Chemical structures of the terpene family a [54–57].

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**References**

1. Food and Agriculture Organization (FAO) FAOSTAT. Food Supply. Statististics. Available online: [http://www.fao.org/faostat/en/#data/QC](http://www.fao.org/faostat/en/#data/QC) (accessed on 28 April 2019).
2. Behera, S.S.; Ray, R.C.; Zdolec, N. Lactobacillus plantarum with functional properties: An approach to increase safety and shelf-life of fermented foods. *Biomed. Res. Int.* 2018, 2018, 936164. [CrossRef] [PubMed]
3. Patel, V.; Tripathi, A.D.; Adhikari, K.S.; Srivastava, A. Screening of physicochemical and functional attributes of fermented beverage (wine) produced from local mango (*Mangifera indica*) varieties of Uttar Pradesh using novel saccharomyces strain. *J. Food Sci. Technol.* 2021, 58, 2206–2215. [CrossRef]
4. Jin, X.; Chen, W.W.; Chen, H.; Chen, W.W.; Zhong, Q. Combination of lactobacillus plantarum and saccharomyces cerevisiae DV10 as starter culture to produce mango slurry: Microbiological, chemical parameters and antioxidant activity. *Molecules* 2019, 24, 4349. [CrossRef]
5. Praepanitchai, O.A.; Noomhorm, A.; Anal, A.K.; Potes, M.E. Survival and behavior of encapsulated probiotics (*Lactobacillus plantarum*) in calcium-alginate-soy protein isolate-based hydrogel beads in different processing conditions (pH and temperature) and in pasteurized mango juice. *Biomed. Res. Int.* 2019, 2019, 9768152. [CrossRef]
6. Furtado, L.L.; Martins, M.L.; Ramos, A.M.; Ribeiro, R.; Ricardo, B.; Leite, D.C. Viability of probiotic bacteria in tropical mango juice and the resistance of the strains to gastrointestinal conditions simulated in vitro. *Semin. Ciências Agrárias Londrina* 2019, 40, 149–162. [CrossRef]

7. Liao, X.-Y.; Guo, L.-Q.; Ye, Z.-W.; Qiu, L.-Y.; Gu, F.-W.; Lin, J.-F. Use of autochthonous lactic acid bacteria starters to ferment mango juice for promoting its probiotic roles. *Prep. Biochem. Biotechnol.* 2016, 46, 399–405. [CrossRef]

8. Varela, P.; Ares, G. Sensory profiling, the blurred line between sensory and consumer science. A review of novel methods for product characterization. *Food Res. Int.* 2012, 48, 893–908. [CrossRef]

9. Bonneau, A.; Boulanger, R.; Lebrun, M.; Maraval, J.; Valette, J.; Guichard, É.; Gunata, Z. Impact of fruit texture on the release and perception of aroma compounds during in vivo consumption using fresh and processed mango fruits. *Food Chem.* 2018, 239, 806–815. [CrossRef]

10. Jin, X.; Chen, W.; Chen, H.; Chen, W.; Zhong, Q. Comparative evaluation of the antioxidant capacities and organic acid and volatile contents of mango slurries fermented with six different probiotic microorganisms. *J. Food Sci.* 2018, 83, 3059–3068. [CrossRef]

11. Duarte, F.N.D.; Rodrigues, J.B.; da Costa Lima, M.; Lima, M.d.S.; Pacheco, M.T.B.; Pintado, M.M.E.; de Souza Aquino, J.; de Souza, E.L. Potential probiotic properties of cashew apple (*Anacardium occidentale*) agro-industrial byproduct on Lactobacillus species. *J. Sci. Food Agric.* 2017, 97, 3712–3719. [CrossRef]

12. Espírito-Santo, A.P.; Carlin, E.; Renard, M.G.C.C. Apple, grape or orange juice: Which one offers the best substrate for lactobacilli growth?—A screening study on bacteria viability, superoxide dismutase activity, folates production and hedonic characteristics. *Food Res. Int.* 2015, 78, 352–360. [CrossRef] [PubMed]

13. Guer gollet, K.B.; Saori, C.; Mauro, I.; García, S. Juçara (*Euterpe edulis*) pulp as a substrate for probiotic bacteria fermentation: Optimisation process and antioxidant activity. *Emirates J. Food Agric.* 2017, 29, 949–959. [CrossRef]

14. Perricone, M.; Corbo, M.R.; Sinigaglia, M.; Speranza, B.; Bevilacqua, A. Viability of Lactobacillus reuteri in fruit juices. *J. Funct. Foods* 2014, 10, 421–426. [CrossRef]

15. Sharma, V.; Mishra, H.N. Fermentation of vegetable juice mixture by probiotic lactic acid bacteria. *Nutrafoods* 2013, 12, 17–22. [CrossRef]

16. Shaheer, C.A.; Hafeeda, P.; Kumar, R.; Kathiravan, T.; Kumar, D.; Nadanasabapathi, S. Effect of thermal and thermosonication on growth?—A screening study on bacteria viability, superoxide dismutase activity, folates production and hedonic characteristics. *Food Res. Int.* 2014, 21, 2189–2194. [CrossRef] [PubMed]

17. Garcia, E.F.; Luciano, W.A.; Xavier, D.E.; da Costa, W.C.A.; de Souza Oliveira, K.; Franco, O.L.; de Morais Júnior, M.A.; Lucena, B.T.L.; Picão, R.C.; Magnani, M.; et al. Identification of lactic acid bacteria in fruit pulp processing byproducts and potential probiotic properties of selected lactobacillus strains. *Front. Microbiol.* 2016, 7, 1371. [CrossRef] [PubMed]

18. Downes, P.F.; Ito, K. *Compendium of Methods for the Microbiological Examination of Foods*, 4th ed.; American Public Health Association: Washington, DC, USA, 2001.

19. Hinneh, M.; Semanhya, E.; Van de Walle, D.; De Winne, A.; Tzompa-Sosa, D.A.; Scalone, G.L.L.; De Meulenaer, B.; Messens, K.; Van Durme, J.; Afoakwa, E.O.; et al. Assessing the influence of pod storage on sugar and free amino acid profiles and the implications on some maillard reaction related flavor volatiles in Forastero cocoa beans. *Food Res. Int.* 2018, 111, 607–620. [CrossRef]

20. Pang, X.; Guo, X.; Qin, Z.; Yao, Y.; Hu, X.; Wu, J. Identification of aroma-active compounds in Jiashi Muskmelon juice by GC-OMS and OAV Calculation. *J. Agric. Food Chem.* 2012, 60, 4179–4185. [CrossRef] [PubMed]

21. Vandendool, H.; Kratz, P. A generalization of the retention index system including linear temperature programmed gas-liquid partition chromatography. *J. Chromatogr.* 1963, 11, 463–471. [CrossRef]

22. Zhang, W.; Dong, P.; Lao, F.; Liu, J.; Liao, X.; Wu, J. Characterization of the major aroma-active compounds in Keitt mango juice: Comparison among fresh, pasteurization and high hydrostatic pressure processing juices. *Food Chem.* 2019, 289, 215–222. [CrossRef]

23. Meilgaard, M.; Civille, G.; Carr, B.; Strauss, S. *Sensory Evaluation Techniques*; CRC Press, Inc.: Boca Raton, FL, USA, 1999.

24. Williams, E.J. Experimental designs balanced for the estimation of residual effects of treatments. *Aust. J. Sci. Res.* 1949, 2, 149–168. [CrossRef]

25. Lawless, H.; Heymann, H. *Sensory Evaluation of Food Principles and Practices*, 2nd ed.; Heldman, D.R., Ed.; Springer: New York, NY, USA, 2010; ISBN 978-1-4419-6487-8.

26. Ares, G.; Barreiro, C.; Deliza, R.; Giménez, A.; Gámbaro, A. Application of a check-all-that-apply question to the development of chocolate milk desserts. *J. Sens. Stud.* 2010, 25, 67–86. [CrossRef] [PubMed]

27. Schouteten, J.J.; Gellynck, X.; Slabbinck, H. Influence of organic labels on consumer’s flavor perception and emotional profiling: Comparison between a central location test and home-use-test. *Food Res. Int.* 2019, 116, 1000–1009. [CrossRef] [PubMed]

28. Popper, R. Use of just-about-right scales in consumer research. In *Novel Techniques in Sensory Characteristics and Consumer Profiling*; Ares, G., Varela, T.P., Eds.; CRC Press: Boca Raton, FL, USA, 2014; pp. 137–156. ISBN 9781466566309.

29. Davidov-Pardo, G.; Moreno, M.; Arozarena, I.; Marin-Arroyo, M.R.; Bleibaum, R.N.; Bruhn, C.M. Sensory and consumer perception of the addition of grape seed extracts in cookies. *J. Food Sci.* 2012, 77, S430–S438. [CrossRef] [PubMed]

30. Danner, L.; Ristic, R.; Johnson, T.E.; Meiselman, H.L.; Hoek, A.C.; Jeffery, D.W.; Bastian, S.E.P. Context and wine quality effects on consumers’ mood, emotions, liking and willingness to pay for Australian Shiraz wines. *Food Res. Int.* 2016, 89, 254–265. [CrossRef] [PubMed]
31. Pagès, J.; Berthelo, S.; Brossier, M.; Gouret, D. Statistical penalty analysis. Food Qual. Prefer. 2014, 32, 16–23. [CrossRef]

32. Manoukian, E.B. Mathematical Nonparametric Statistics; Gordon & Breach: New York, NY, USA, 1986.

33. Martínez-Navarrete, N.; Camacho, M.M.; Agudelo, C.; Salvador, A. Sensory characterization of juice obtained via rehydration of freeze-dried and spray-dried grapefruit. J. Sci. Food Agric. 2019, 99, 244–252. [CrossRef] [PubMed]

34. FAO/WHO Codex Alimentarius Commission. Joint FAO/WHO Food Standard Program Codex Alimentarius Commission, 13th Session; Report of the Thirty Eight Session of the Codex Committee on Food Hygiene; ALINORM 07/30/13: FAO: Houston, TX, USA, 2017.

35. Mandha, J.; Shumoy, H.; Devaere, J.; Schouteten, J.J.; Gellynck, X.; de Winne, A.; Matemu, A.O.; Raes, K. Effect of lactic acid fermentation of watermelon juice on its sensory acceptability and volatile compounds. Food Chem. 2021, 358, 129809. [CrossRef] [PubMed]

36. San, A.T.; Joyce, D.C.; Hofman, P.J.; Macnish, A.J.; Webb, R.L.; Matovic, N.J.; Williams, C.M.; De Voss, J.J.; Wong, S.H.; Smyth, H.E. Stable isotope dilution assay (SIDA) and HS-SPME-GCMS quantification of key aroma volatiles for fruit and sap of Australian mango cultivars. Food Chem. 2017, 221, 613–619. [CrossRef] [PubMed]

37. Oliver-Simancas, R.; Muñoz, R.; Díaz-Maroto, M.C.; Pérez-Coello, M.S.; Alaño, M.E. Mango by-products as a natural source of valuable odor-active compounds. J. Sci. Food Agric. 2020, 100, 4688–4695. [CrossRef] [PubMed]

38. Zhao, D.; Tang, J.; Ding, X. Analysis of volatile components during potherb mustard (Brassica juncea, Coss.) pickle fermentation using SPME-GC-MS. LWT-Food Sci. Technol. 2007, 40, 439–447. [CrossRef]

39. Dudareva, N.; Negre, F.; Nagegowda, D.A.; Orlova, I. Plant volatiles: Recent advances and future perspectives. Crit. Rev. Plant Sci. 2006, 25, 417–440. [CrossRef]

40. Cappello, M.S.; Zapparoli, G.; Logrieco, A.; Bartowsky, E.J. Linking wine lactic acid bacteria diversity with wine aroma and flavour. Int. J. Food Microbiol. 2017, 243, 16–27. [CrossRef]

41. Park, J.B.; Lim, S.H.; Sim, H.S.; Park, J.H.; Kwon, H.J.; Nam, H.S.; Kim, M.D.; Baek, H.H.; Ha, S.J. Changes in antioxidant activities and volatile compounds of mixed berry juice through fermentation by lactic acid bacteria. Food Sci. Biotechnol. 2017, 26, 441–446. [CrossRef] [PubMed]

42. Krings, U.; Berger, G.R. Terpene bioconversion—How does its future look? Nat. Prod. Commun. 2010, 5, 1507–1522. [CrossRef] [PubMed]

43. Smid, E.J.; Kleerebezem, M. Production of aroma compounds in lactic fermentations. Annu. Rev. Food Sci. Technol. 2014, 5, 313–326. [CrossRef]

44. Wang, Y.; Wu, J.; Lv, M.; Shao, Z.; Hungwe, M.; Wang, J.; Bai, X.; Xie, J.; Wang, Y.; Geng, W. Metabolism Characteristics of Lactic Acid Bacteria and the Expanding Applications in Food Industry. Front. Bioeng. Biotechnol. 2021, 9, 612285. [CrossRef]

45. Petrovici, R.; Ciocanu, D. Natural flavours obtained by microbiological pathway. In Generation of Aromas and Flavours; Vilela, A., Ed.; IntechOpen: London, UK, 2018; pp. 34–52.

46. De Souza Oliveira, R.P.; Perego, P.; de Oliveira, M.N.; Converti, A. Effect of inulin on the growth and metabolism of a probiotic strain of Lactobacillus rhamnosus in co-culture with Streptococcus thermophilus. LWT-Food Sci. Technol. 2012, 47, 358–363. [CrossRef]

47. Chen, C.; Lu, Y.; Yu, H.; Chen, Z.; Tian, H. Influence of 4 lactic acid bacteria on the flavor profile of fermented apple juice. Food Biosci. 2019, 27, 30–36. [CrossRef]

48. Pino, J.A.; Mesa, J. Contribution of volatile compounds to mango (Mangifera indica L.) aroma. Flavour Fragr. J. 2006, 21, 207–213. [CrossRef]

49. Liu, H.; An, K.; Su, S.; Yu, Y.; Wu, J.; Xiao, G.; Xu, Y. Aromatic characterization of mangoes (Mangifera indica L.) using solid phase extraction coupled with gas chromatography–mass spectrometry and olfactometry and sensory analyses. Foods 2020, 9, 75. [CrossRef] [PubMed]

50. Lyu, Y.; LaPointe, G.; Zhong, L.; Lu, J.; Zhang, C.; Lu, Z. Heterologous expression of aldehyde dehydrogenase in Lactococcus lactis for acetaldehyde detoxification at low pH. Appl. Biochem. Biotechnol. 2017, 184, 570–581. [CrossRef] [PubMed]

51. Xu, X.; Bao, Y.; Wu, B.; Lao, F.; Hu, X.; Wu, J. Chemical analysis and flavor properties of blended orange, carrot, apple and Chinese jujube juice fermented by sodium-enriched probiotics. Food Chem. 2019, 289, 250–258. [CrossRef]

52. Lee, Y.; Findlay, C.; Meullenet, J.F. Experimental consideration for the use of check-all-that-apply questions to describe the sensory properties of orange juices. Int. J. Food Sci. Technol. 2013, 48, 215–219. [CrossRef]

53. Popper, R.; Rosenstock, W.; Schraidt, M.; Kroll, B.J. The effect of attribute questions on overall liking ratings. Food Qual. Prefer. 2004, 15, 853–888. [CrossRef]

54. Zielinski-Blajet, M.; Feder-Kubis, J. Monoterpenes and their derivatives—Recent development in biological and medical applications. Int. J. Mol. Sci. 2020, 21, 1–38. [CrossRef]

55. Huang, A.C.; Sefton, M.A.; Sumby, C.J.; Tiekink, E.R.; Taylor, D.K. Mechanistic studies on the autoxidation of α-guaiene: Structural diversity of the sesquiterpenoid downstream products. J. Nat. Prod. 2015, 78, 131–145. [CrossRef]

56. Ehret, C.; Ourisson, G. Le gamma-Gurjunene, Structure et Configuration: Isomerisation de l’alpha-Gurjunene. Tetrahedron 1969, 25, 1785–1799. [CrossRef]

57. Merck, K. GaA. Structure Search. 2022. Available online: https://www.sigmaaldrich.com/BE/en/product/aldrich/ (accessed on 19 January 2022).