1	Smelling sensations: olfactory crossmodal correspondences
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## 9 Abstract

10 Crossmodal correspondences are the associations between apparently distinct stimuli in different sensory modalities. These associations, albeit surprising, are generally shared in most of the population. 11 Olfaction is ingrained in the fabric of our daily life and constitutes an integral part of our perceptual 12 reality, with olfaction being more commonly used in the entertainment and analytical domains, it is 13 14 crucial to uncover the robust correspondences underlying common aromatic compounds. Towards this 15 end, we investigated an aggregate of crossmodal correspondences between ten olfactory stimuli and other modalities (angularity of shapes, smoothness of texture, pleasantness, pitch, colours, musical 16 genres and emotional dimensions) using a large sample of 68 observers. We uncover the 17 correspondences between these modalities and extent of these associations with respect to the explicit 18 knowledge of the respective aromatic compound. The results revealed the robustness of prior studies, 19 as well as, contributions towards olfactory integration between an aggregate of other dimensions. The 20 knowledge of an odour's identity coupled with the multisensory perception of the odours indicates that 21 22 these associations, for the most part, are relatively robust and do not rely on explicit knowledge of the odour. Through principal component analysis of the perceptual ratings, new cross-model mediations 23 24 have been uncovered between odours and their intercorrelated sensory dimensions. Our results demonstrate a collective of associations between olfaction and other dimensions, potential cross modal 25 26 mediations via exploratory factor analysis and the robustness of these correspondence with respect to 27 the explicit knowledge of an odour. We anticipate the findings reported in this paper could be used as 28 a psychophysical framework aiding in a collective of applications ranging from olfaction enhanced multimedia to marketing. 29

## 30 Introduction

31 Olfaction is ingrained into the fabric of our lives, altering the very perception of our favourite commodities and plays a crucial role in the multi-sensory perception of our surrounding environment. 32 Exploring the crossmodal correspondences provided by the chemical senses is pivotal towards solving 33 the crossmodal binding problem, and in turn, their implication on interactive and immersive 34 35 experiences. Crossmodal correspondences can be depicted as the consistent correspondence between 36 stimulus features in different sensory modalities [1]. These correspondences can be matched if they both have the same effect on the observers' mood, emotional state, alertness and/or arousal [1-3]. 37 Aromas are consistently perceived together with other stimuli principally visual, the absence of these 38 39 additional stimuli results in inferior identification [4,5]. Albeit, semantic congruency can enhance the perceived pleasantness [6,7], discrimination [8] and correct identification of odours [9]. Crossmodal 40 correspondences have been shown to induce a bias (i.e., providing a red glass of white wine can bias 41 the judgment of expert wine tasters [10]). In terms of evolution, olfaction is one of the oldest senses and 42 43 plays a major role in social behaviour, communication and emotional evaluation; mood and emotional 44 processes share a common neural substrate with the olfactory pathway, namely the limbic system [11]. It is therefore likely that olfactory information plays a major role in modulating the quality of our 45 immersive multisensorial experiences. 46

47 Crossmodal interactions between smell and both vision and hearing have been of distinct 48 interest, as it has been shown to alter olfactory perception considerably. For example, olfaction-audition [12–14], olfaction-colour [15–18], olfaction-visual motion [19], and olfaction-angularity of shapes 49 50 [18,20]. The mechanisms underlying such correspondences has diverse characterisation within the literature. The most frequently deducted mechanisms are; hedonics [14,20–23], semantics [1,18,22,24– 51 52 27] and natural co-occurrence [1,27,28]. Identifying robust crossmodal olfactory associations has a vast array of practical implications spanning from advertising to human-computer interaction. A 53 contributory factor to idiosyncratic, as opposed to robust associations, is the relatively high inter-54 observer variability of the olfactory sense [29]. There is an increasing demand to provide the chemical 55

56 senses to human-machine interfaces, as modern technology is typically limited to vision, auditory and 57 basic haptic feedback. Understanding how the chemical senses interact with the other senses and their 58 implication on interactive and immersive experiences is the next step towards total sensory immersion 59 and augmenting artificial synaesthesia to expand and create new senses for humans.

50 Synaesthesia is a neurological condition in which input into one modality elicits a simultaneous 51 perception in a second modality [30]. Controversially, synaesthesia could be considered a more severe 52 manifestation of crossmodal associations [26] and antagonistically [31]. It is hypothesized that everyone 53 is born with synaesthesia [32] but is later disinhibited [33] and/or pruned. Synaesthesia can still provide 54 valuable information on the initial hypothesis between the strong intercorrelated sensory dimensions 55 and their potential in cross modal correspondences despite the automatic evocation.

66 We hypothesize that there will be robust associations that are mediated predominantly by hedonic ratings underlying common aromatic compounds. These associations could, at least in part, be 67 68 affected by knowledge of the odour's identity. We provide evidence to support both hypotheses, we 69 explored a series of potential crossmodal correspondences. Here we present associations between olfactory stimuli and the angularity of shapes, colour, smoothness of textures, pitch, musical genres, 70 and several emotional dimensions. We further investigate whether explicit knowledge of the odours 71 72 modulates these associations by using an odour identification task. Exploratory factor analysis was then 73 conducted on the perceptual ratings, revealing potential crossmodal mediations and the perceptual similarity between the ten aromatic compounds used in these experiments. 74

## 75 Materials & methods

## 76 Participants

77 68 individuals (23 males and 45 females with a mean age of 26.75 (standard deviation: 12.75)) took part in the experiments. No participants reported any impairment that could affect their sense of 78 79 smell (i.e., cold or flu). Participants were briefed about potential allergens and breaks (a minimum of a 10-minute break halfway through, or if the participant felt like they have got a reduced sense of smell). 80 81 The experiment was given ethical approval by the University of Liverpool, lasted approximately 50 82 minutes and conducted in accordance to the standards set in the Declaration of Helsinki for Medical 83 Research Involving Human Subjects. Participants gave written informed consent before taking part in 84 the experiment.

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### 86 Apparatus

All results were obtained through a graphical user interface programmed in MATLAB R2018b.
Participants were placed in a lightproof anechoic chamber equipped with an overhead luminaire (GLEM5/32; GTI Graphic Technology Inc., Newburgh, NY) during the experiment. The lighting in the room
was kept consistent by using the daylight simulator of the overhead luminaire. The speakers were JBL
Desktop speakers; the colour stimuli were shown on a calibrated EIZO ColorEdge CG243W monitor.

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#### 93 Tasks and Stimuli

Participants were instructed to associate a given odour with a value along each of the following
dimensions: visual shapes, textures, pleasantness (using a l scale), pitch, music genre and emotions.
The aromas were presented in a random order (determined by a random number generator in MATLAB)
and all associations were assessed in the same order for a given aroma. At the end of the experiment,

participants were asked to identify the odour (identification task). For three of the experimental tests
(visual shapes, texture, pleasantness) and for the emotion task a neural option was available, but
participants were strongly discouraged to use this option.

#### 101 Odour Stimuli

102 Ten odourants were used; five from Mystic Moments<sup>™</sup>; caramel, cherry, coffee, freshly cut grass, and pine; five from Miaroma<sup>TM</sup>; black pepper, lavender, lemon, orange and peppermint. These 103 aromas were selected as they can be frequently found during everyday life and gives diversity in the 104 chemical makeup of the aromas. For consistency and to avoid any other associations that would affect 105 106 the results of this experiment 4 mL of the respective essential oil was placed in a clear test tube, wrapped in white tape and numbered 1 through 10 in an initial random permutation. The aromas were stored at 107 108  $\approx$  2.5°C to minimize oxidation, all odours were removed and placed back into the fridge at the same 109 time to ensure approximately uniform evaporation. The odours were replaced every two weeks.

#### 110 Shape Stimuli

A nine-point scale was constructed with a rounded shape "bouba" and an angular shape "kiki"
on the left and right side of the scale respectively. Similar to an earlier experiment performed by [20].
The midpoint of the nine-point scale (5) was neutral (no opinion).

#### 114 **Texture Stimuli**

A nine-point scale was constructed with smooth and rough anchored on the left and right side respectively. Participants were supplied with representative textures to aid them in their decision, with silk being a representative for smooth and sandpaper being a representative for rough. The midpoint of the nine-point scale (5) was neutral (no opinion). Participants felt the texture at least once during the questions' first appearance.

#### 120 Pleasantness

A nine-point scale from very unpleasant to very pleasant was used, with 5 being the neutraloption.

#### 123 Pitch Stimuli

The full range of audible frequencies (20Hz to 20kHz) was implemented using a slider where movement from left to right corresponded to an increase in frequency. Every time the slider was adjusted the respective frequency was played, producing a sinusoidal tone lasting 1 second in length. Due to the large volume of potential selections, participants were played a sample from each end of the scale, followed by a sample at 10kHz, if the current pitch didn't match the odour a lower or higher pitch was selected (approximately half way between the last two frequencies played) as indicated by the participant.

#### 131 Music Stimuli

Seven different music genres; classical, country, heavy metal, jazz, rap, classic rock, and soul. Five were selected from [34] with an additional two added due to their wide popularity. Each sample was 15 seconds in duration and played at the same volume across participants. Participants had to listen to each sample at least once during the questions first occurrence, the order was subject to the participants preference.

#### 137 Colour Stimuli

The CIE L\*a\*b\* colour space was used because of its perceptual uniformity, participants could slide through 101 linear interpolated slices from the L\* channel of the colour space increasing or decreasing the lightness. Only colours that fit in sRGB colour gamut were shown. This removed the limitations of earlier studies that let participants choose from a small selection of colours.

#### 142 **Emotions**

A subset of emotions from the Universal Emotion and Odour Scale [9] was included these where; angry, aroused, bored, calm, disgust, excited, happy, sad and scared, additionally an option for neutral (no opinion) was added to negate a tentative assignment.

#### 146 Identification Task

A list of different aromas was compiled consisting of the ten odours used in this experiment along with an additional fifteen and presented in alphabetical order. This was incorporated to increase the number of choices the participant had available, so they were less likely to make inferred decisions when trying to identify the current odour. The identification task was at the end of the experiment.

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## 152 **Results**

### 153 Angularity, smoothness, pleasantness and pitch

Fig 1 shows the mean ratings (transformed to z-scores) for angularity, smoothness, pleasantness 154 and pitch for each of the 10 odours. Friedman tests were conducted on the z-scores of the angularity, 155 smoothness, pleasantness and pitch ratings to test if the odours influenced the ratings. This revealed 156 that the odours significantly affected all ratings; angularity ( $x^2(9) = 122.15, P < 0.05$ ), smoothness ( $x^2(9)$ ) 157 = 52.32, P < 0.05), pleasantness ( $x^2(9) = 81.85$ , P < 0.05) and pitch ( $x^2(9) = 101.75$ , P < 0.05). A 158 Bonferroni multiple comparison test was conducted to identify which odours where significantly 159 different from each other. A post-hoc one sample t-test with a Bonferroni correct alpha was conducted 160 to determine which of the odours was significantly different from 0 (the original scale's grand mean). 161 The significantly 'rounded' odours are caramel (P < 0.005, t = -9.88) and coffee (P < 0.005, t = -3.87). 162 The significantly 'angular' odours are peppermint (P < 0.005, t = 8.62) and lemon (P < 0.005, t = 3.43), 163 as shown in Fig 1A. The significantly 'rough' odour is black pepper (P < 0.005, t = -3.22) the 164 significantly 'smooth' odour is caramel (P < 0.005, t = 4.64), as shown in Fig 1B. The significantly 165 'pleasant' odours are lemon (P < 0.005, t = 4.27) and orange (P < 0.005, t = 6.87). The significantly 166

'unpleasant' odour is black pepper (P < 0.005, t = -5.84), as shown in Fig 1C. The significantly 'higher pitch' odour is peppermint (P < 0.005, t = 3.47). The significantly 'lower pitch' odours are coffee (P < 0.005, t = -5.64) and caramel (P < 0.005, t = -4.60), as shown in Fig 1D.

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Fig 1. Shape, texture, pleasantness and pitch scores. (A - C) Mean scores for the 10 odours after zscore normalisation using the grand mean, asterisks mark the odours that are significantly different from the scale's original grand mean. Errors bars show a 95% confidence interval of the respective odour. The legend shows markers indicating which odours have significantly different means from the respective odour (e.g., the significantly different odours from coffee in (A) are lemon, peppermint and pine. (D) Shows the same information as (A - C) apart from the mean value used to calculate it z-score is that of log2 of the original ratings.

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#### **Genre and emotions**

To assess if odours affected the genre and emotion selections chi-squared tests of independence 180 were conducted. This revealed that the odours impact both the choice of genre ( $x^2 = 138.20$ , P < 0.05) 181 and participants emotional response ( $x^2 = 187.54$ , P < 0.05). Consequently, chi-squared tests for 182 goodness of fit were conducted to see which of the presented stimuli were significantly different from 183 a chance selection. The odours that were significantly different from a chance selection in the genre 184 association task are black pepper, caramel, cherry, coffee, freshly cut grass, lemon and orange (P <185 0.05) (See Fig 2A). The odours were significantly different from chance selection in the emotion 186 association task (P < 0.05) (See Fig 2B). 187

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Fig 2. Musical genre and emotional association matrices. (A) Association matrix between the 10
odours and the 11 possible emotional selections. (B) Association matrix between the 10 odours and
the 7 genres.

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#### 193 Colours

Due to many possible colour choices, 343 interpolated colours from L\*a\*b\* colour space were 194 195 chosen (See Fig 3A). The colour the user had selected was then mapped to one of the 343 colours based 196 on the lowest delta E 2000 error to determine the perceptually closest colour. This was consequently used as the representative selection, shown in Fig 3B. The median hue angle for the commonly selected 197 colours is shown in, Fig 3C. Each participant only reported one colour for each odour. A one-way t-198 199 tests (test value = 50) was conducted with a Bonferroni corrected alpha of 0.005 (0.05 / 10) to determine if the selected lightness values were significantly different from the range's midpoint and default slice 200 201 of 50. The significantly different odours are; (where  $L^*$  represents the mean lightness score from the L\*a\*b\* colour space) caramel (P < 0.005, t = 4.30,  $L^* = 59.78$ ), cherry (P < 0.005, t = 3.66,  $L^* =$ 202 58.14), coffee (P < 0.005, t = -2.18,  $L^* = 44.73$ ), freshly cut grass (P < 0.005, t = 3.47,  $L^* = 56.91$ ), 203 lavender (P < 0.005, t = 4.82,  $L^* = 60.11$ ), lemon (P < 0.005, t = 15.10,  $L^* = 76.51$ ), orange (P < 0.005), t = 15.10,  $L^* = 76.51$ ), orange (P < 0.005), t = 15.10,  $L^* = 76.51$ ), orange (P < 0.005), t = 15.10,  $L^* = 76.51$ ), orange (P < 0.005), t = 15.10,  $L^* = 76.51$ ), orange (P < 0.005), t = 15.10,  $L^* = 76.51$ ), orange (P < 0.005), t = 15.10,  $L^* = 76.51$ ), orange (P < 0.005), t = 15.10,  $L^* = 76.51$ ), orange (P < 0.005), t = 15.10,  $L^* = 76.51$ ), t = 15.10,  $L^* = 76.51$ , t = 15.10,  $L^* = 76.51$ ), t = 15.10,  $L^* = 76.51$ , t = 15.10, 204  $0.005, t = 12.53, L^* = 70.10$ , peppermint ( $P < 0.005, t = 7.5, L^* = 66.35$ ) and pine (P < 0.005, t = 3.71, 205  $L^* = 58.68$ ). A chi-square test of independence was conducted on the hue angles of the colours. Due to 206 207 the large number of possible angles binning was implemented (N = 15), a chi-square test for goodness 208 of fit was conducted on the binned hue angles to see if the colours selected differ from chance selection, 209 this revealed the colour selections for each odour significantly differ from chance selection (P < 0.005).

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Fig 3. Commonly selected colours and median hue angles. (A) L\*a\*b\* colour gamut showing the interpolated points used to determine the perceptually closest colour. (B) Common colours selected by the participants where each colour has been mapped more than twice. (C) Cylindrical representation of the L\*a\*b\* colour space showing the median hue angle of the commonly selected hues for each odour

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#### 216 Identification dependencies

217 To determine if the proportions (correct and incorrect) where significantly different, chisquared tests for goodness of fit where conducted this revealed that the proportions for black pepper ( $x^2$ 218 = 85.76, P < 0.05), caramel ( $x^2 = 47.05$ , P < 0.05), coffee ( $x^2 = 7.52$ , P < 0.05), freshly cut grass ( $x^2 = 7.52$ , P < 0.05), respectively. 219 19.88, P < 0.05), lemon ( $x^2 = 51.88$ , P < 0.05), orange ( $x^2 = 7.52$ , P < 0.05), peppermint ( $x^2 = 56.94$ , 220 P < 0.05), and pine ( $x^2 = .73.52 P < 0.05$ ) varied significantly. To access if the variation between correct 221 and incorrect identification was statically significantly a two-way ANOVA was conducted for each 222 odour. This revealed that there was no significant variation for the angularity ratings (see Fig 4A), the 223 significant odours for the smoothness ratings are lavender (P < 0.05) and caramel (P < 0.05) (see Fig 224 4B). The significant odours for the pleasantness ratings are lavender (P < 0.05) and peppermint (P < 0.05) an 225 226 0.05) (see Fig 4C) with the latter also being significant in the pitch ratings (see Fig 4D).

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Fig 4. Angularity, smoothness, pleasantness and pitch identification dependencies. Mean z-scores
asterisks detonate odours where there is significant variation between the correct and incorrect ratings.
The green markers detonate correct classification and the red markers detonate incorrect classification.
The error bars show a 95% confidence interval.

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To access if explicit knowledge of the odour affected the emotional and genre dimensions the relative difference between correct and incorrect identification was calculated for each odour. Fig 5A shows that the knowledge of an odour does affect the emotional dimensions and has Frobenius norm of 323.06. Peppermint, for example, was perceived as less happy and angrier. Generally, the odours were perceived as being more neutral, calming and slightly disgusting. From Fig 5B we can see that knowledge of the odours affects the genre dimensions, for example, peppermint is perceived to be less jazz and more metal and rap the genre association matrix has a Frobenius norm of 339.70.

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Fig 5. Relative musical genre and emotional association matrices. (A) Relative association matrix
between the 10 odours and the 7 genres. (B) Association matrix between the 10 odours and the 11
possible emotional selections.

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Following the same procedure as the colour analysis above, common colours for the 245 246 misclassified odours are shown in Fig 6. To determine if the observed proportions between the common colours and the common misclassified colours were significantly different, chi-squared tests for 247 goodness of fit where conducted this revealed that the proportions for cherry ( $x^2 = 14.00$ , P < 0.05), 248 coffee ( $x^2 = 7.77$ , P < 0.05), lavender ( $x^2 = 4.28$ , P < 0.05), lemon ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.05), orange ( $x^2 = 18.00$ , P < 0.249 10.50, P < 0.05) and peppermint ( $x^2 = 14.00$ , P < 0.05) are significantly different. The same pattern is 250 observed for correct and incorrectly identified odours, which is consistent with the idea that crossmodal 251 correspondences between olfaction and colour do not rely on explicit knowledge of the odour's identity. 252

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Fig 6. Common colours for misclassified odours. Common colour selections where each colour has
been incorrectly classified and been mapped more than twice.

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## 257 Identification

The task of participant was to identify the given odour by selecting one of the 25 possible 258 odours in the list. Retrospectively, a twofold identification was considered, exact identification and 259 categorical identification. Exact identification was achieved 45.74% of the time by correctly identifying 260 the current odour, participants could select an odour label from a compiled list of 25 different odours. 261 The top three correctly identified odours are peppermint (84.21%), lemon (80.88%) and orange 262 (63.16%). The top three misclassified odours are black pepper (10.29%), pine (12.24%) and caramel 263 264 (20.59%) (see Fig 7). Retrospective category identification was determined by the participants' ability to pick another odour in the same category following the fragrance classes outlined in [35]. An accuracy 265

- rating of 62.94% was achieved for category identification, each potential classification belonged to only one category. A Pearson correlation indicated that there was no strong correlation between the age of the participant and their identification accuracy (P = -0.17).
- 269
- Fig 7. Identification association matrix. Association matrix for the 10 odours, along with an additional
  12 misclassifications.
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## 273 Principal component analysis

Factor analysis using Principal Component Analysis (PCA) was conducted on; the shape 274 ratings, texture ratings, pleasantness ratings, pitch ratings, identification accuracy, the colour dimension 275 (lightness), the emotional dimensions and the genre dimensions. Due to the ratings and dimensions 276 277 being on different scales z-score normalisation using the odour-wise mean and the standard deviation on the original dataset before PCA. Based on inspection of the score plot, four principal components 278 were kept, explaining 81.57% of the total variance and have an eigenvalue of at least 1. The principal 279 components 1 through 4 explain 32.49%, 25.60%, 14.43% and 9.04% of the total variance respectively. 280 The first two principal components are shown in Fig 8A with the loading matrix, shown in Fig 8B. 281

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Fig 8. PCA score and loadings. (A) Score plot of the perceptual ratings for each odour. (B) Loading's
plot showing the covariance coefficients for each of the dimensions used in the PCA.

285

## 286 **Discussion**

Our results further our understanding of crossmodal processing and how olfactory sensationsinteract with the perception of angularity of shapes, smoothness of textures, perceived pleasantness,

289 pitch, genre and emotions. Our first hypothesis was that robust associations exist for common aromatic compounds and we find evidence for such associations, consistent with prior findings; olfactory 290 associations between the angularity of shapes [20], smoothness of texture [36] and pitch [12] suggesting 291 that the hedonic qualities are important factors in crossmodal correspondences. Our second hypothesis 292 293 was that knowledge of a odours identity would affect some of the reported associations, consistent with the findings reported by [18] between odours and colours and angularity of shapes. Odours produce 294 295 reliable and distinct colour profiles, which are more consistent with the explicit knowledge of an odour's 296 identity. Furthering these findings, we show the reliability and extent of these associations, and that the 297 knowledge of an odour's identity partly affects their reported associations between the other modalities 298 with the exemption of the angularity of shapes.

The PCA analysis score plot shows the perceptual similarity between the olfactory stimuli, for 299 example, (lemon, cherry and orange), (lavender, freshly cut grass and pine), (coffee and caramel) 300 301 obtained similar results in most, but potentially not all, ratings analysed using PCA. The PCA loadings 302 plot suggests that the hedonic values are a strongly influenceable factor, that is, the strong loadings of 303 the pleasant (i.e., happy, excited and calm), unpleasant (i.e., sad, angry and scared) and the 'pleasantness 304 dimension' are at least moderately associated to the other dimensions reported in this paper. 305 Additionally, the loadings plot shows strong associations between the angularity of shapes, textures, 306 pitch, emotional and genre dimensions. Odours judged to be the rounded shape tend to be associated 307 with a smooth texture, be lower in pitch, be more soul. Whereas, the angular shape appears to be 308 strongly associated with the genre dimension rock. Moderate associations exist between the angularity 309 of shapes with the angular shape being associated with lighter colours, being more rap, angry, arousing 310 and exciting. Strong associations exist between the odours and the smoothness ratings with smooth being perceived as more soul, happier and less angry. Moderate relationships exist with smooth being 311 perceived as more pleasant, lower in pitch and being more country. With the rough texture being 312 313 associated to be more metal, rock, neutral, sad and angry. The strong associations between pleasant odours are being less metal, disgusted and being happier. With moderate relations being more excited, 314 soul, less sad, easier to identify with an increase in lightness. Higher pitches are strongly associated 315

316 with being lighter in colour and being more rock with moderate relations to being more exciting, arousing, rap, and being less soul. Darker colours are moderately associated with being more metal and 317 318 disgusted while lighter colours are moderately associated with being more rock and exciting. The strong 319 associations between the odours and identification rate are being more happy, exciting and being less 320 sad and disgusting. Moderate relationships exist between a higher identification rate and being more 321 jazz and less metal, classical, neutral, disgusting and boring. All relationships uncovered in the PCA analysis can also be applied in reverse (i.e., the odours perceived as being smoother are generally 322 323 assigned to being less angular and more rounded in shape). Consistent with the findings from [37], The 324 PCA shows strong relationships towards the emotional and musical dimensions, for example, the 325 relationships between the emotion 'happy' are being less more jazz and soul and less metal. The 326 relationships between 'angry' are being more metal and less soul.

Future work stemming from these findings could include assessing if congruent vs incongruent 327 328 associations defer any advantages in an objective task. The moderate relations discovered in the PCA analysis, between odours and the different relationships could be explored further with a more tailored 329 330 set of experiments. The cross-model mediations (i.e., the intercorrelated dimensions) uncovered during 331 the PCA may be explored further to uncover the robustness of the associations. Additional sensory 332 dimensions could be added, gustatory could be explored, towards the goal of an olfactory 333 psychophysical framework, to aid in a variety of different applications ranging from olfaction enhanced 334 multimedia to marketing. Due to the nature of olfaction, it may be the case that taste played a minor 335 role in the associations reported in this paper. For example, [38] reported the bitter tastes were associated with angular shapes, whereas, sweet tastes are associated with a more rounded shape. In 336 337 contrast with a later study, [20] reported a strong association between the angularity of shapes and the perceived sourness/bitterness of odours. 338

339

## **340** Author contributions

341	RJW and SMW conceived and designed the experiments. RJW performed the experiments.
342	RJW and SMW analysed the data. AM and SMW contributed reagents. RJW programmed the analysis
343	tools. SMW and AM provided supervision. RJW, SMW and AM wrote the paper.

344

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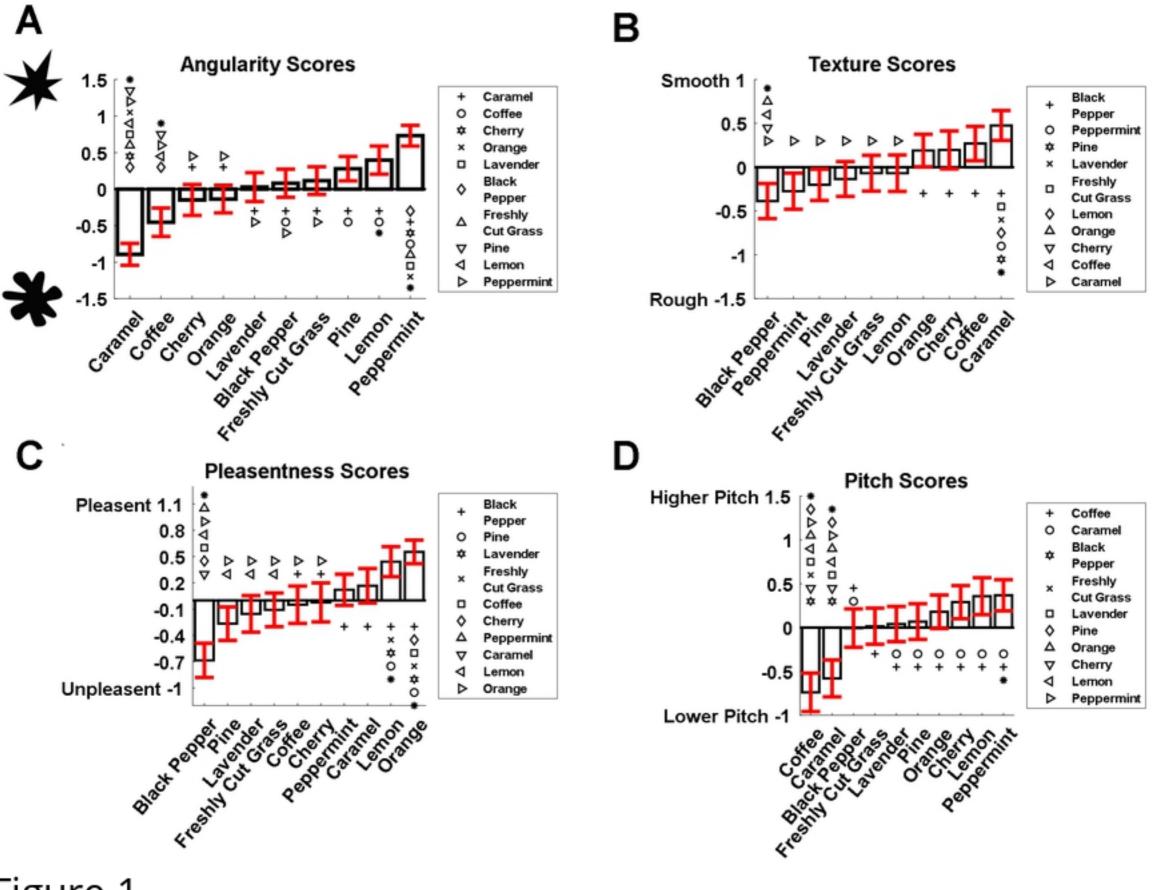
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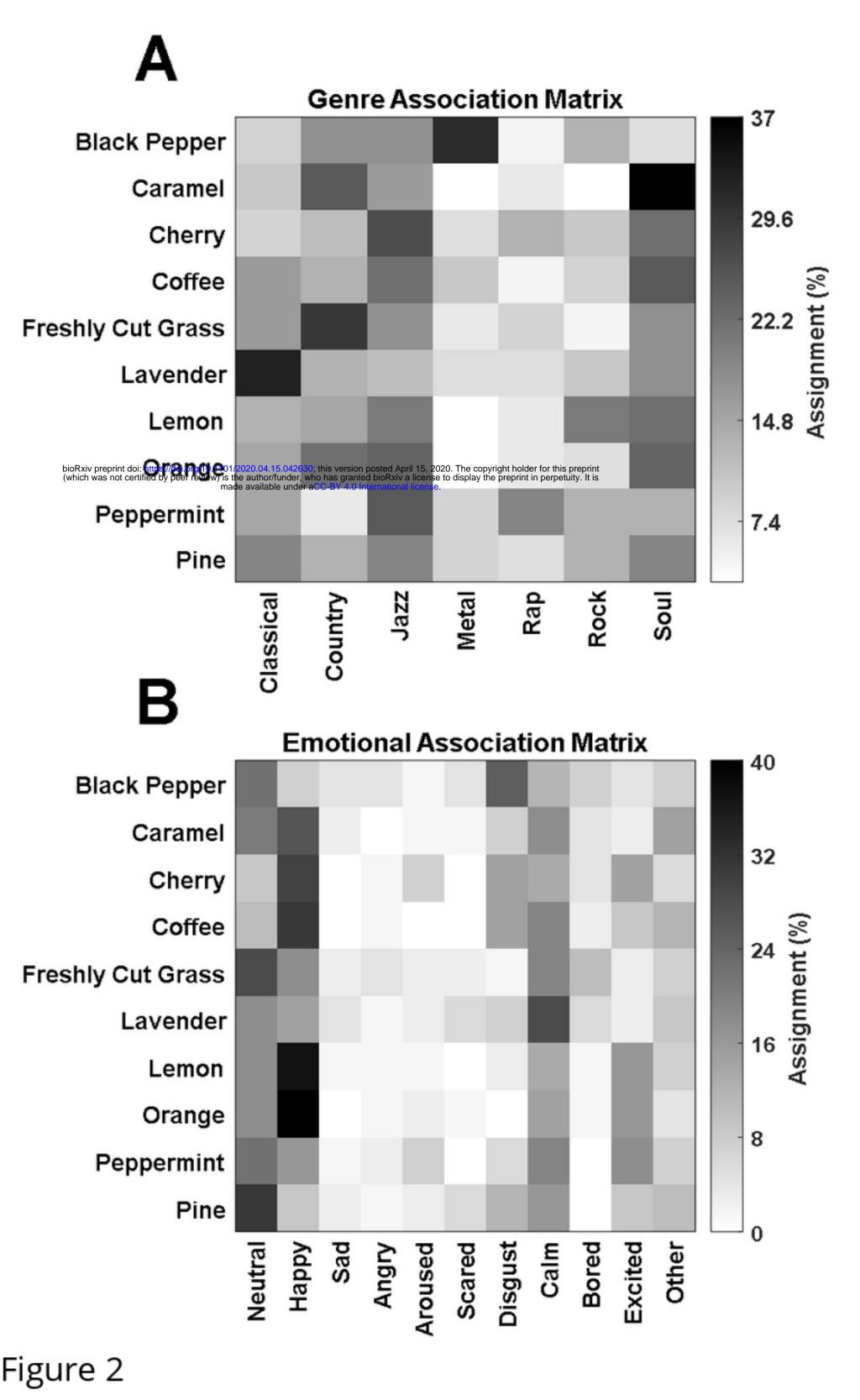
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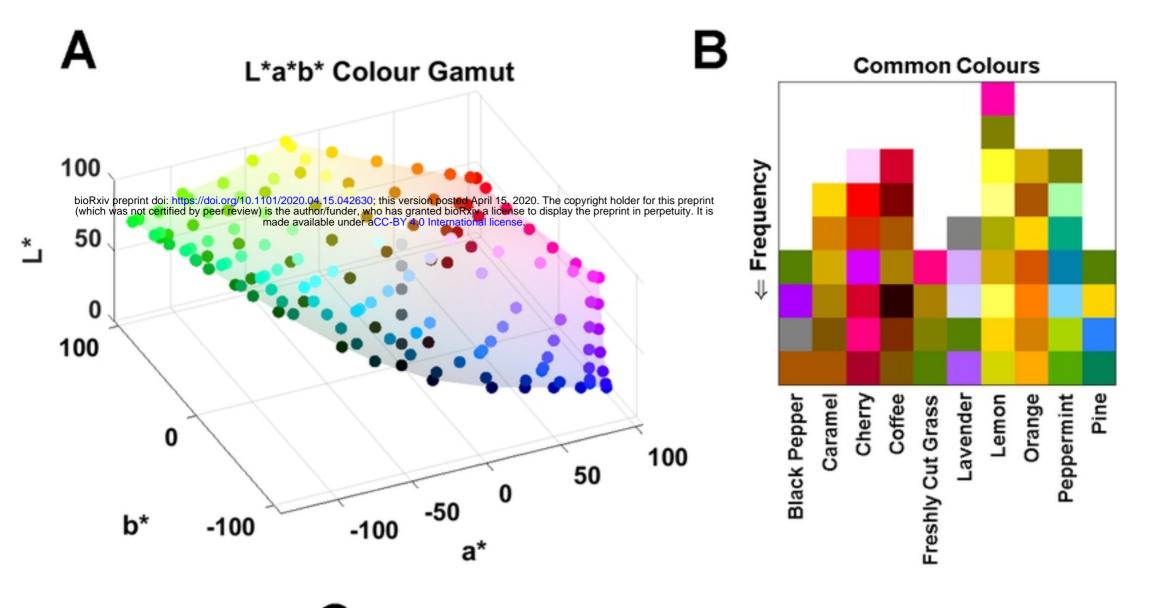
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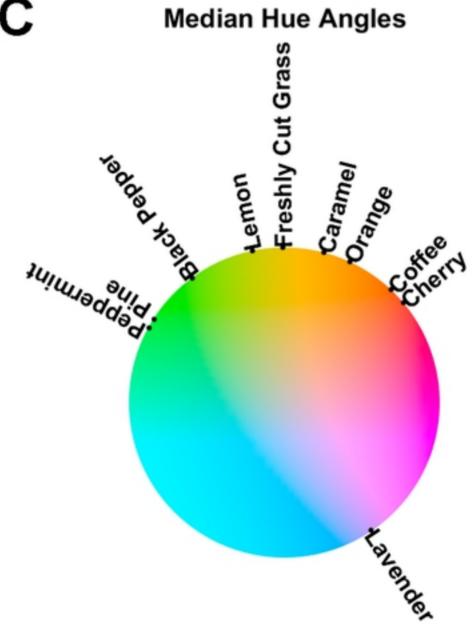
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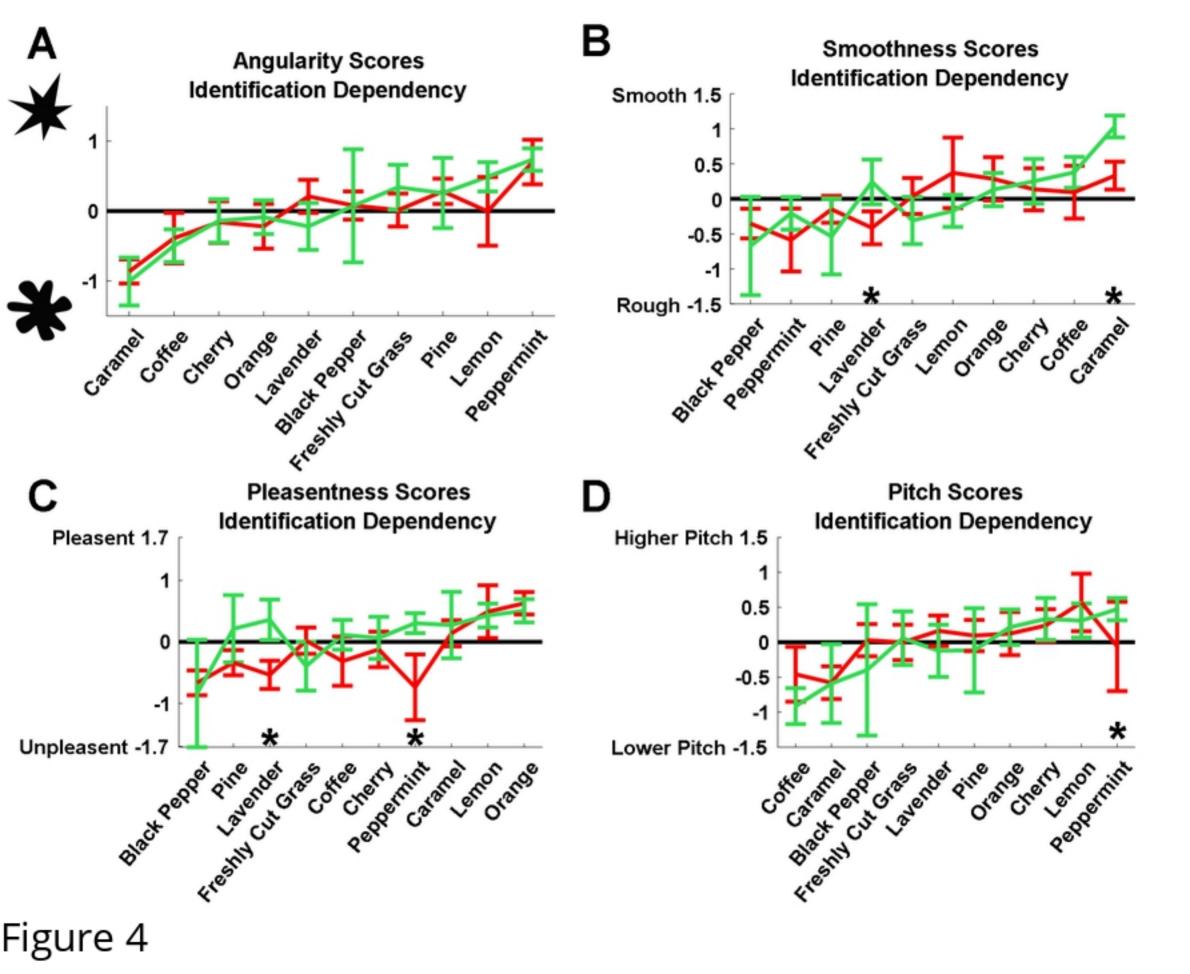
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