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Research Article

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Goldsmiths Musical Sophistication Index (Gold-MSI): Portuguese version and associations with socio-demographic factors, personality and music preferences

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Abstract

The Gold-MSI was recently proposed as a self-report measure of musical skills and behaviours in the general population. Although it is becoming a widely used tool, relatively little is known about its correlates, and adaptations into different languages will be crucial for cross-cultural comparisons and to allow for use beyond the original validation context (English sample, Müllensiefen, Gingras, Musil, & Stewart, 2014). In this study, we adapted the Gold-MSI for use with Portuguese speaking individuals and evaluated it with a Portuguese sample ($N = 408$; age range = 17 – 66 years; 306 women). We demonstrate that the Portuguese version of the Gold-MSI has appropriate psychometric properties, including good internal consistency and very good test-retest reliability. This was observed for the five subscales and for the general musical sophistication index ($\alpha_s \geq .82$, $r_s \geq .84$). Using confirmatory factor analysis, the expected underlying factor structure was also confirmed. Additionally, we identified associations between individual differences on the Gold-MSI and socio-demographic factors (age, sex, education, socio-economic status), personality traits, and music preferences. The Portuguese Gold-MSI is freely available, and it offers a reliable and valid tool that can contribute to the refined assessment of musical sophistication in a range of research contexts.

Keywords

Introduction

Musical behaviours and skills vary widely, both across individuals and across cultural groups. In scientific research and in Western societies more broadly, the assessment of musicality and musical achievements typically emphasizes the ability to play an instrument, or the expertise of formally trained professional musicians. For instance, a large body of work examines differences between professional musicians and ‘non-musicians’ in a range of musical and non-musical abilities, or the impact of learning how to play an instrument in behaviour, cognition, and brain functioning (Coffey, Mogilever, & Zatorre, 2017; Herholz & Zatorre, 2012; Lima & Castro, 2011; Moreno & Bidelman, 2014). This approach has been highly informative, but it does not make justice to the variety of ways people can engage with music and to the multifaceted nature of musical abilities. It also does not capture individual differences in musicality beyond highly specialized groups, i.e., it neglects variation in the general population, and it is known that some music capacities can be achieved without formal training, through exposure and implicit learning (e.g., Bigand & Poulin-Charronnat, 2006).

To address these issues, Müllensiefen, Gingras, Musil, and Stewart (2014) developed a self-report instrument that measures ‘musical sophistication’ in a comprehensive way, considering a range of musical skills and behaviours in addition to instrumental expertise – the Goldsmiths Musical Sophistication Index (Gold-MSI). Musical sophistication is conceptualized as a psychometric construct that refers to music-related skills, achievements, and expertise, and associated behaviours across a wide range of facets, that are reflected on the different subscales of this questionnaire. The development of musical sophistication is thought to occur via active engagement with music in its multiple forms, and higher levels of sophistication would be generally characterized by (1) exerting musical skills and behaviours more frequently, (2) greater accuracy, ease or effect of musical behaviours when applied, and (3) greater and more varied repertoire of musical behaviour patterns. The Gold-MSI includes items that apply to any musical style and any age group, and that cover a variety of potential behaviours of interest as they occur in daily life. It can thus be used equally well with performing musicians with different levels of formal musical training, individuals who use music in functional ways (e.g., music educators, producers, DJs), or with individuals from the general population, without explicit musical training. The subscales of the Gold-MSI comprise *active engagement*, that assesses musical engagement behaviours such as ‘I spend a lot of my free time doing music-related activities’; *perceptual abilities*, that assesses music skills such as ‘I can tell when people sing or play out of time with the beat’; *musical training*, that assesses the extent of musical training and practice with items such as ‘I engaged in regular daily practice of a musical instrument including voice for __ years’; *singing abilities*, that assesses activities related to singing such as ‘I am able to hit the right notes when I sing along with a recording’; and *emotions*, that assesses behaviours related to emotional responses to music such as ‘I often pick certain music to motivate or excite me’. In addition to indexing these distinct dimensions, the Gold-MSI

also provides a global measure of musical sophistication, based on a subset of items from all subscales.

Based on a large sample of English-speaking participants, Müllensiefen et al. (2014) established that the Gold-MSI possesses appropriate psychometric properties, including good internal consistency, very good test-retest reliability, and appropriate convergent and discriminant validities. They also found that, despite being a self-report measure, individual differences in the Gold-MSI correlate to performance-based levels of music skills, as assessed by the Gordon's Advanced Measures of Audiation (AMMA) and by two listening tests of melodic memory and musical beat perception. Additionally, positive correlations with personality traits were observed, particularly with openness and extraversion, and socio-demographic predictors were identified, such as age, education, and occupation. Since it was published, the Gold-MSI has attracted broad interest, as indicated by its growing use across a wide range of research settings, including neuroscientific and behavioural work with musicians (e.g., Schaal, Banissy, & Lange, 2015; Schaal, Krause, et al., 2015), personality (e.g., Greenberg, Müllensiefen, Lamb, & Rentfrow, 2015), music psychology (e.g., Hadley, Sturt, Eerola, & Pickering, 2018; Hansen, Vuust, & Pearce, 2016; Jakubowski, Farrugia, & Stewart, 2016; Jakubowski, Halpern, Grierson, & Stewart, 2015), emotion (e.g., Taruffi, Allen, Downing, & Heaton, 2017), and auditory attention research (e.g., Bauer, Jaeger, Thorne, Bendixen, & Debener, 2015; Bleichner, Mirkovic, & Debener, 2016).

Adaptations of the Gold-MSI for use in different linguistic and cultural contexts will be crucial, both for cross-cultural research on music behaviours and skills, and to allow for a broader use of this tool beyond the original context in which it was developed (United Kingdom). The Gold-MSI has been translated into German (Schaal, Bauer, & Müllensiefen, 2014), Danish, and French, but a Portuguese version is lacking.

The Current Study

In the current study, we translated the Gold-MSI to European Portuguese (Gold-MSI-P) and evaluated it with a diverse Portuguese sample, that included undergraduate students and individuals from the general population, covering a wide range of age and education levels. We determined the internal consistency, test-retest reliability, and factor structure adequacy of the newly developed Gold-MSI-P. Participants also completed measures of socio-economic status (SES), personality traits, and music preferences. This was for the purpose of advancing knowledge on the correlates of the Gold-MSI, which remain poorly investigated. As for socio-demographic and personality variables, we expected to find similar associations to those found in previous studies with the Gold-MSI (Müllensiefen et al., 2014; Schaal et al., 2014). For instance, we hypothesized that younger participants would report higher levels of musical sophistication, and we also hypothesized that openness and extraversion would be associated with higher Gold-MSI scores. As for music preferences, associations have been found between liking particular musical genres and personality (Rentfrow & Gosling, 2003; Zweigenhaft, 2008), but potential associations with musical sophistication remain unknown. Here we explore associations between music preferences and individual differences in the Gold-MSI for the first time. Since the Gold-MSI was originally designed to assess musical sophistication regardless of preferences, familiarity or engagement with particular genres

of music, we expect associations between liking music and sophistication to be general, i.e., not strongly tied to specific genres of music. However, a potential exception would be the musical training subscale, which could be linked to a more specific preference for ‘art music’ (e.g., classical music), as formal musical training is most common for this kind of music in the Western societies.

Methods

Participants

A total of 474 individuals initially took part in the study¹. From this sample, we excluded participants who did not complete all the Gold-MSI items ($n = 53$), were not Portuguese nationals ($n = 12$), or had missing demographic information ($n = 1$). This excluded 66 participants and left 408 in the final sample (306 female, 75%). These were aged between 17 and 66 years ($M = 33.0$, $SD = 14.4$) and were all native speakers of European Portuguese. According to the European Socio-Economic Classification (ESeC; Rose & Harrison, 2007), that formally evaluates socio-economic status (SES), most participants fell into high socioeconomic classes (classes 1 and 2, 51.8%; classes 3 to 6, 30.4%; classes 7 to 10, 17.8%). In terms of education, most participants completed secondary education (12 years; 53.2%) or a bachelor’s degree (27.7%; 9 or fewer years of education, 11.5%; master’s degree, 6.1%; Ph.D., 1.5%). Part of the sample consisted of undergraduate students, but for generalizability we also ensured that a significant number of participants were from the general population ($n = 218$, 46.6%). These were recruited using a snowball sampling technique. See Appendix A for additional details concerning the socio-demographic characteristics of the sample.

To assess test-retest reliability, 79 participants randomly selected from the full sample completed the Gold-MSI and a music preferences questionnaire again 4 weeks after the first testing session.

Written informed consent was collected from all participants, and ethical approval was obtained from the Departmental Ethics Committee, Faculty of Psychology and Education Sciences, University of Porto (reference 3-1/2017). Participants were not paid for their participation, and the questionnaires were completed either in individual sessions or in class groups, using a paper-and-pencil format.

Gold-MSI and Development of its Portuguese version (Gold-MSI-P)

The Gold-MSI contains a total of 38 items (Müllensiefen et al., 2014). For 31 of them, participants indicate their level of agreement with statements (e.g., ‘I can sing or

¹ We aimed for recruiting the largest possible sample of participants. However, we also determined that a sample of $N = 400$ would be sufficient to detect even small correlational effects with an alpha level of .05 and a power of .80, e.g., $r = .14$ found by Schaal et al. (2014) with the German version of the Gold-MSI.

play music from memory’) using a Likert-type scale from 1 (‘completely disagree’) to 7 (‘completely agree’). For the remaining 7 items, participants use ordinal scales with 7 response alternatives, that vary depending on the musical behaviour assessed (e.g., ‘I can play [number from 0 to ‘6 or more’] instruments’). The items are grouped into five subscales: active engagement, 9 items; perceptual abilities, 9 items; musical training, 7 items; singing abilities, 7 items, and emotions, 6 items. A general factor of musical sophistication has also been identified, consisting of 18 items that include exemplars from all the five subscales. The Gold-MSI can thus be used as a multidimensional instrument, covering different facets of musical behaviour, or as a unidimensional one, assessing musical sophistication more generally.

The Portuguese version of the Gold-MSI, Gold-MSI-P, was developed as follows (e.g., Hambleton, 2005, for guidelines for adapting tests into multiple languages). First, the items of the original English Gold-MSI were translated to Portuguese, independently by two translators. They were native speakers of European Portuguese, fluent in English, experienced in the adaptation of questionnaires, and experts in music psychology (C.F.L. and S.L.C.). Second, disagreements between the two translators were sorted out, and a single version was obtained. Third, this version was shown to two lab colleagues to evaluate the items for clarity and naturalness of language and to discuss the equivalence between the original and the new version. Fourth, the Gold-MSI-P was translated back to English by an English native speaker who was fluent in Portuguese and had subject knowledge. Inconsistencies between the back-translation and the original Gold-MSI were sorted out between the three translators, and equivalence across languages was additionally discussed with the D.M., leading author of the original questionnaire. The emphasis was placed on ensuring conceptual equivalence, rather than a literal translation. Finally, in a pilot study, 10 participants completed the Gold-MSI-P, and they all confirmed that the items were clear. The Portuguese items are listed in Appendix B, and the final version of the Gold-MSI-P is freely available from @ links to be added @.

Additional Measures

Socio-economic Status

SES was assessed through a formal inventory, the ESeC (Rose & Harrison, 2007). The ESeC is based on the characteristics of the occupational status, including the occupation itself, the employment status (whether the person is an employer, self-employed or employee), the number of employees at the workplace, and whether the person has supervising responsibilities. It has rules to cover the whole adult population and allows for the classification of individuals into 10 classes, from 1 (‘the higher salariat’) to 10 (‘unemployed’).

We were unable to determine SES for 37 participants due to missing data. These were excluded from the analyses including this variable.

Big-Five Inventory (BFI)

The BFI is a questionnaire that evaluates the Big Five dimensions of personality (John & Srivastava, 1999; McCrae & Costa, 1987; Portuguese version, Brito-Costa et al., 2015). It comprises 44 short phrases (e.g., 'Is full of energy'; 'Is generally trusting'), which are categorized into 5 major personality factors: extroversion, agreeableness, openness, conscientiousness, and neuroticism. Each item is rated on a 5-point scale, from 1 ('totally disagree') to 5 ('totally agree'). Internal consistency values for the BFI were acceptable to good in the current dataset ($\alpha = .80$ on average, ranging from $\alpha = .66$ for agreeableness to $\alpha = .87$ for extroversion).

Eight participants had missing data on the BFI and were excluded from the analyses including personality variables.

Short Test of Music Preferences (STOMP)

The STOMP is a questionnaire that assesses individual differences in preferences for musical genres (Rentfrow & Gosling, 2003). For brevity of the testing session, we used the original 14-item STOMP (which we have translated to Portuguese beforehand, see Appendix C) and not the revised 23-item version. Each item is rated on a 7-point scale, from 1 ('dislike strongly') to 7 ('like strongly'), and musical genres can be grouped into the 4 factors: Reflective and Complex (4 items; e.g., classical), Intense and Rebellious (3 items; e.g., rock), Upbeat and Conventional (4 items; e.g., pop), and Energetic and Rhythmic (3 items; e.g., dance/electronica). We obtained test-retest reliability values comparable to those in the original study ($r = .78$ on average, ranging from $r = .69$ for Upbeat and Conventional to $r = .88$ for Reflective and Complex). Additionally, all factors showed acceptable mean inter-item correlations, ranging from $r = .18$ to $r = .35$ (Clark & Watson, 1995).

Twenty-four participants had missing data on the STOMP and were excluded from the analysis including music preferences variables.

Statistical Analysis

We calculated four different indices of internal consistency, including Cronbach's alpha (Cronbach, 1951), McDonald's omega (Zinbarg, Revelle, Yovel, & Li, 2005), Guttman's lambda6 (Guttman, 1945), and mean inter-item correlations. This was done for each of the five Gold-MSI-P subscales and for the general musical sophistication factor.

To assess the degree to which the data from the Portuguese sample fit the structure of the bi-factor model as reported in Müllensiefen et al. (2014; Model 2, 'Schmid-Leiman' variant), we conducted a confirmatory factor analysis using the exact same factor structure and employing a robust maximum likelihood estimator from the R package lavaan (Rosseel, 2012). Four indices were used to assess model fit: the incremental Comparative Fit Index (CFI) and Tucker-Lewis Index (TLI), and the absolute fit indices Root Mean Square Error of Approximation (RMSEA) and Standardized Root Mean Square Residual (SRMR).

Pearson correlation analyses were conducted to assess associations between the Gold-MSI-P subscales, associations between responses at two time points (test-retest reliability), as well as associations with age, personality traits, and music preferences. Kendall's tau-b correlation analyses were conducted to assess associations between the Gold-MSI-P, education level (5 levels), and SES (10 levels). A correlational approach was used to examine associations between musical sophistication and other variables (personality, music preferences, and SES), as it is unclear if there is a causal relationship between these variables and what the directions of causes and effects are (Müllensiefen et al., 2014).

Independent samples *t*-tests were conducted to assess potential differences between men and women in the Gold-MSI-P.

Correlations and *t*-tests were statistically evaluated via Bayesian inference, by estimating a Bayes Factor (BF) statistic, which grades the amount of evidence that the data provide for the alternative as compared to the null hypotheses (BF_{10}). These analyses were conducted using JASP Version 0.8.4 (JASP Team, 2017). Both correlation analyses and *t*-tests were two-sided, and the default priors were used (correlations, stretched beta prior width = 1; *t*-tests, zero-centred Cauchy prior with scale parameter 0.707; Wagenmakers et al., 2017; Wagenmakers, Verhagen, & Ly, 2016). BF_{s10} were interpreted following Jeffreys' guidelines: values between 1 and 3 are considered as anecdotal evidence for the alternative hypothesis; between 3 and 10 as substantial evidence; between 10 and 30 as strong evidence; between 30 and 100 as very strong evidence; and over 100 as decisive evidence (Jarosz & Wiley, 2014; Jeffreys, 1961). A $BF_{10} < 1$ is evidence in favour of the null hypothesis. For completeness, we also evaluated significance based on the standard frequentist approach, reporting significant results ($p < .05$) after Bonferroni adjustments for multiple comparisons.

Results

Summary Statistics and Internal Consistency Reliability

Table 1 shows summary statistics and measures of internal consistency and reliability for each of the Gold-MSI-P subscales and for the general sophistication factor (the distribution of the data is depicted in Figure 1). As can be seen in the table, all subscales possess good or excellent estimates across all measures, namely Cronbach's α (range from .82 to .91), Guttman's λ_6 (range from .81 to .93), McDonald's ω (range from .83 to .91), inter-item correlation (range from .36 to .56), and mean item-total correlations (range from .54 to .57; Clark & Watson, 1995; Field, 2005; Revelle & Zinbarg, 2009). These internal consistency values are similar to those obtained for the original Gold-MSI (Müllensiefen et al., 2014) and for the German version (Schaal et al., 2014). Summary statistics, including means and the amount of inter-individual variation, are also comparable to those observed for previous versions of the questionnaire.

Table 1. Summary statistics and reliability for the Gold-MSI-P subscales and general sophistication factor

	Active	Perceptual	Musical	Singing	Emotions	General
Mean (SD)	3.67 (1.15)	4.95 (0.97)	2.64 (1.45)	3.81 (1.21)	5.22 (1.06)	3.60 (1.07)
Minimum	1.00	1.56	0.29	1.00	1.33	1.00
Maximum	6.56	7.00	6.71	7.00	7.00	6.72
Cronbach's α	.85	.85	.89	.83	.82	.91
Guttman's λ_6	.85	.85	.91	.83	.81	.93
McDonald's ω	.85	.85	.90	.84	.83	.91
Inter-item	.38	.38	.56	.41	.44	.36
Mean Item-total	.54	.54	.55	.54	.55	.57

Figure 1. Distribution of the data for the Gold-MSI-P subscales and general sophistication factor

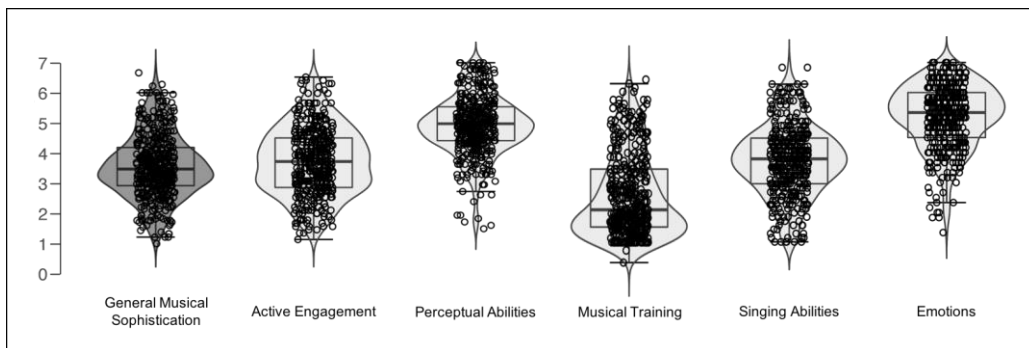


Table 2 shows the correlations between the Gold-MSI-P subscales. As expected, all subscales were significantly correlated with each other, with coefficients ranging from .38 to .74. Similar findings were previously observed for the Gold-MSI (range from .49 to .81, Müllensiefen et al., 2014; range from .37 to .70, Schaal et al., 2014), and they suggest that the subscales cover related, but not identical, constructs.

Table 2. Correlations between the Gold-MSI-P subscales

	Active Engagement	Perceptual Abilities	Musical Training	Singing Abilities	Emotions
Active Engagement	-	-	-	-	-
Perceptual Abilities	.63	-	-	-	-
Musical Training	.46	.51	-	-	-
Singing Abilities	.60	.64	.55	-	-

Note. $BF_{10} > 100$ for all correlations (also significant at the corrected $p < .001$).

We also examined the data for each item individually: (1) all items were able to capture individual differences (smallest $SD = 1.10$; range from 1.10 to 2.10); (2) item-total correlation coefficients ranged from .25 to .72, indicating that all the items are consistent with the overall scale and are, therefore, representative of the construct they are measuring (Clark & Watson, 1995; Churchill, 1979; Field, 2005); and (3) values of skewness and kurtosis were always below 2 and 7, respectively (skewness range from -1.86 to 1.62; kurtosis range from -1.26 to 3.92), suggesting that there is no large departure from normality in the data (Curran, West, & Finch, 1996; see Appendix D for item-wise summary statistics).

Confirmatory Factor Analysis

The confirmatory factor analysis indicated a satisfactory to good fit between the model and the observed data (Cole, 1987; Hu & Bentler, 1999; Steiger, 1989): $\chi^2(627) = 1615.56, p < .001$; CFI = .86; TLI = .84, RMSEA = .06, SRMR = .06). These fit values are similar to those of the replication sample reported in Müllensiefen et al. (2014) and of the German translation of the Gold-MSI (Schaal et al., 2014).

Test-retest Reliability

As can be seen in Table 3, Gold-MSI-P scores were stable from the first to the second administration, and all test-retest correlations were very high (range from .84 to .94), suggesting very good intra-participant stability over time (4 weeks). We have additionally examined internal consistency for the retest sample, and could confirm that all subscales possess acceptable to good estimates across all values (see Appendix E).

Table 3. Test-retest correlations for the subscales of the Gold-MSI-P ($N = 79$)

	Test <i>M (SD)</i>	Retest <i>M (SD)</i>	Test-retest correlations
Active Engagement	3.82 (1.15)	3.75 (0.98)	.90
Perceptual Abilities	5.08 (1.00)	5.04 (0.92)	.87
Musical Training	2.86 (1.40)	2.83 (1.39)	.94
Singing Abilities	3.99 (1.29)	4.10 (1.12)	.84
Emotions	5.49 (0.85)	5.43 (0.80)	.84
General Musical Sophistication	3.55 (1.06)	3.84 (0.96)	.92

Socio-demographic Correlates

We have examined how the Gold-MSI-P relates to age, sex, education, and SES. These results are summarized in Table 4. Evidence was found for an association between increasing age and lower scores across all Gold-MSI-P subscales and in the general musical sophistication factor. As for sex, no evidence for differences between men and women was found, except for the singing abilities and emotion subscales, in which women scored higher than men. Small size correlations, but yet significant, were also found with SES and education. Higher SES was generally associated with higher musical sophistication across subscales, with the amount of evidence being particularly strong for active engagement and emotions (note that correlations are negative because higher values in the ESeC indicate lower SES). Higher education was associated with higher musical sophistication, particularly for the subscales active engagement, emotions, perceptual abilities, as well as for the general sophistication factor. Note that the associations between SES/education and the musical training subscale, in particular, did not reach significance, not replicating the findings observed with the German sample (Schaal et al., 2014).

Table 4. Demographic and socioeconomic correlates of the Gold-MSI-P

	Active Engagement	Perceptual Abilities	Musical Training	Singing Abilities	Emotions	General Sophistication
Age	-.36** <i>> 100</i>	-.30** <i>> 100</i>	-.27** <i>> 100</i>	-.30** <i>> 100</i>	-.45** <i>> 100</i>	-.36** <i>> 100</i>
Gender	2.11 <i>1.04</i>	0.63 <i>0.15</i>	-.05 <i>0.13</i>	3.46** <i>35.77</i>	3.03* <i>9.71</i>	2.02 <i>0.88</i>
SES	-.12* <i>16.69</i>	-.11* <i>8.97</i>	-.09 <i>1.79</i>	-.08 <i>1.08</i>	-.15** <i>> 100</i>	-.11* <i>6.46</i>
Education	.13** <i>> 100</i>	.09 <i>3.69</i>	.06 <i>0.42</i>	.07 <i>0.47</i>	.12* <i>27.80</i>	.10* <i>6.88</i>

Note. $N = 408$ for all correlations, except for those involving SES, where $n = 371$. BF_{10} values are indicated in italics. *corrected $p < .05$; ** $p < .001$. For age, SES and Education, values represent correlation coefficients; for Gender, they represent t values.

Personality and Music Preferences Correlates

Associations between the Gold-MSI-P and personality and music preferences are summarized in Table 5. These correlations were conducted on residual values, after having removed the effects of socio-demographic variables (age, sex, education, SES), to ensure that the identified associations cannot be attributed to these factors. As for personality, openness is the trait for which the evidence for links with musical sophistication was strongest: participants scoring higher on openness scored higher across all Gold-MSI-P subscales and on the general musical sophistication factor. Associations

were also found for extraversion, with higher levels of extraversion being linked with higher singing abilities, active engagement, emotions, and general musical sophistication (anecdotal evidence was also found for perceptual abilities). As for the remaining traits, no clear evidence (i.e., $BF_{10} > 3$) was found for associations other than the one between agreeableness and perceptual abilities.

Table 5. Correlations between the Gold-MSI-P, personality traits (as measured by the BFI), and music preferences (as measured by the STOMP).

	M (SD)	Active Engagement	Perceptual Abilities	Musical Training	Singing Abilities	Emotions	General Sophistication
Personality							
Extraversion	3.38 (0.78)	.17* <i>15.70</i>	.13 <i>1.56</i>	.06 <i>0.13</i>	.21* <i>> 100</i>	.18* <i>21.37</i>	.16 <i>8.18</i>
Agreeableness	3.95 (0.48)	.12 <i>0.78</i>	.15 <i>3.71</i>	.10 <i>0.34</i>	.08 <i>0.23</i>	.11 <i>0.52</i>	.14 <i>2.22</i>
Conscientiousness	3.71 (0.64)	-.04 <i>0.09</i>	.00 <i>0.07</i>	-.12 <i>0.78</i>	.00 <i>0.07</i>	-.07 <i>0.18</i>	-.07 <i>0.16</i>
Neuroticism	2.95 (0.84)	-.11 <i>0.51</i>	-.11 <i>0.47</i>	-.12 <i>0.71</i>	-.11 <i>0.64</i>	-.09 <i>0.32</i>	-.13 <i>1.60</i>
Openness	3.57 (0.66)	.43** <i>> 100</i>	.37** <i>> 100</i>	.25** <i>> 100</i>	.30** <i>> 100</i>	.46** <i>> 100</i>	.39** <i>> 100</i>
Music Preferences							
Reflective & Complex	4.34 (1.12)	.28** <i>> 100</i>	.24** <i>> 100</i>	.19* <i>34.38</i>	.13 <i>1.29</i>	.37** <i>> 100</i>	.26** <i>> 100</i>
Intense & Rebellious	4.00 (1.30)	.38** <i>> 100</i>	.20* <i>87.22</i>	.10 <i>0.34</i>	.16 <i>6.50</i>	.32** <i>> 100</i>	.23** <i>> 100</i>
Upbeat & Conventional	4.33 (0.99)	.16 <i>5.35</i>	.16 <i>7.33</i>	.16 <i>6.41</i>	.19* <i>35.53</i>	.18* <i>16.80</i>	.21* <i>> 100</i>
Energetic & Rhythmic	3.95 (1.27)	.29** <i>> 100</i>	.15 <i>2.62</i>	.00 <i>0.07</i>	.09 <i>0.29</i>	.26** <i>> 100</i>	.14 <i>2.19</i>

Note. $N_s = 359$ (for BFI) and 349 (for STOMP). BF_{10} values are given in italics.

*corrected $p < .05$; ** $p < .001$.

Regarding music preferences, we found an association between enjoying music (i.e., providing higher ratings on the STOMP) and scoring higher on the general sophistication factor. The amount of evidence was decisive for all dimensions/genres except for energetic and rhythmic, for which the effect was in the same direction but weaker (see Table 5).

Enjoying music was also associated with the active engagement and emotions Gold-MSI-P subscales, regardless of the genre (evidence for these associations was substantial to decisive in all cases). For the remaining subscales, more selective associations with specific musical genres were found: musical training was more strongly related to preferences for reflective and complex music, as predicted; singing abilities

were more strongly related to preferences for upbeat and conventional music; and perceptual abilities were more strongly related to preferences for reflective and complex, and intense and rebellious music.

Discussion

The current paper describes the development and validation of the Portuguese version of the Gold-MSI, a self-report measure of musical sophistication in the general population. It also examines the socio-demographic, personality and music preferences correlates of this measure. Converging evidence from several indices established that the newly developed Gold-MSI-P displays appropriate internal consistency (Cronbach's α , Guttman's λ_6 , McDonald's ω , inter-item correlation, and mean item-total correlations), and an examination of test-retest reliability established that this measure is highly stable over time. This was observed for all subscales and for the general musical sophistication factor. Additionally, a confirmatory factor analysis showed fit values that are satisfactory and similar to those reported in previous work with the English (Müllensiefen et al., 2014) and German Gold-MSI (Schaal et al., 2014).

We found that several socio-demographic variables are associated with individual differences in the Gold-MSI, though these were mostly small size correlations. In particular, younger participants, those with higher education levels, and those from higher socioeconomic classes tend to report higher musical sophistication. In general, this pattern extends to the Portuguese sample the findings previously obtained with the English (Müllensiefen et al., 2014) and German samples (Schaal et al., 2014). Sex differences, on the other hand, were restricted to two of the five subscales and were not seen for the general sophistication index. This confirms the observation by Müllensiefen et al. (2014) that this variable is less predictive of musical sophistication than other socio-demographic variables. It is currently unclear why we did not replicate the association between SES/education and the musical training subscale observed with the German sample (Schaal et al., 2014; such association was left unexplored in the original English study). A possible explanation is that the distribution of education and SES in our sample was relatively narrow, with many participants being highly educated and from high socioeconomic classes.

As for personality, consistent with previous work (Müllensiefen et al., 2014; Greenberg et al., 2015), we observed that higher Gold-MSI scores correlate with higher levels of openness and extraversion. The association with openness, in particular, is in line with the fact that this personality trait has been associated with musical engagement and with aesthetic and emotional responses to music (e.g., McManus & Furnham, 2006; Vuoskoski & Eerola, 2011).

Finally, we report for the first time associations between musical sophistication and music preferences. Individuals scoring higher in the general musical sophistication factor reported to enjoy music more, and this was observed for all music dimensions covered by the STOMP (reflective and complex, intense and rebellious, upbeat and conventional, and at trend level for energetic and rhythmic music). This association with general musical sophistication is potentially mostly driven by the links with the active

engagement and emotions subscales, as these were the only two subscales for which correlations with all music dimensions were also observed. A possible interpretation is that stronger preferences for particular musical genres could motivate individuals to engage more in music-related activities and to display music-related emotion behaviours, resulting in more sophisticated musical skills and behaviours. The direction of causes and effects of these associations will need to be examined in future research, though. Another interesting finding was that the musical training and perceptual abilities subscales were more strongly related to preferences for reflective and complex music, a dimension that includes classical music, blues, folk, and jazz. This could suggest that more developed perceptual systems (namely via training) could contribute to a higher appreciation of more intricate music, or it could also reflect the fact that musical training typically emphasizes classical/complex music, which could contribute to stronger preferences for these genres over time (e.g., Getz, Marks, & Roy, 2014; Hargreaves, Comber, & Colley, 1995). Future studies should further examine how musical sophistication relates to music preferences, namely using a more comprehensive assessment of music preferences than the one used here, and focussing on the developmental trajectories of both preferences for musical genres and musical skills and behaviours.

To conclude, the present study (1) makes available a new tool for research on music behaviours and skills with Portuguese speaking participants – the Gold-MSI-P; (2) provides support for the validity and reliability of this tool; and (3) contributes to advance general knowledge on the correlates of musical sophistication, namely regarding socio-demographic, personality, and music preferences variables. The Gold-MSI-P is freely available from the corresponding author, and it provides an easy to use measure that will be useful across a wide range of contexts, from cross-cultural work to neuroscience, music psychology, and education research.

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Disclosure of interest

The authors report no conflicts of interest.

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