

COGNITIVE NEUROSCIENCE

Variations on the theme of musical expertise: cognitive and sensory processing in percussionists, vocalists and non-musicians

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Abstract

Comparisons of musicians and non-musicians have revealed enhanced cognitive and sensory processing in musicians, with longitudinal studies suggesting these enhancements may be due in part to experience-based plasticity. Here, we investigate the impact of primary instrument on the musician signature of expertise by assessing three groups of young adults: percussionists, vocalists, and non-musician controls. We hypothesize that primary instrument engenders selective enhancements reflecting the most salient acoustic features to that instrument, whereas cognitive functions are enhanced regardless of instrument. Consistent with our hypotheses, percussionists show more precise encoding of the fast-changing acoustic features of speech than non-musicians, whereas vocalists have better frequency discrimination and show stronger encoding of speech harmonics than non-musicians. There were no strong advantages to specialization in sight-reading vs. improvisation. These effects represent subtle nuances to the signature since the musician groups do not differ from each other in these measures. Interestingly, percussionists outperform both non-musicians and vocalists in inhibitory control. Follow-up analyses reveal that within the vocalists and non-musicians, better proficiency on an instrument other than voice is correlated with better inhibitory control. Taken together, these outcomes suggest the more extensive engagement of motor systems during instrumental practice may be an important factor for enhancements in inhibitory control, consistent with evidence for overlapping neural circuitry involved in both motor and cognitive control. These findings contribute to the ongoing refinement of the musician signature of expertise and may help to inform the use of music in training and intervention to strengthen cognitive function.

Introduction

There is growing evidence that musical experience shapes the brain both structurally (Gaser & Schlaug, 2003; Hyde *et al.*, 2009) and functionally (Schlaug, 2001; Lappe *et al.*, 2008). Cross-sectional comparisons of musicians and non-musicians have revealed musician advantages in various aspects of cognitive and sensory function including attention and inhibitory control (Bugos *et al.*, 2007; Bialystok & Depape, 2009; Strait *et al.*, 2010; Rodrigues *et al.*, 2013; Moreno *et al.*, 2014; Carey *et al.*, 2015; Costa-Giomi, 2015), frequency discrimination (Tervaniemi *et al.*, 2005; Micheyl *et al.*, 2006) and backward masking (Strait *et al.*, 2010) as well as neural

processing of speech (Schön *et al.*, 2004; Musacchia *et al.*, 2007; Wong *et al.*, 2007; Parbery-Clark *et al.*, 2009; Strait *et al.*, 2014). Although cross-sectional studies cannot differentiate effects of training from pre-existing differences, an increasing number of longitudinal studies shows the emergence of changes within individuals over time (Moreno *et al.*, 2009, 2011; Tierney *et al.*, 2013; Chobert *et al.*, 2014; Kraus *et al.*, 2014; Putkinen *et al.*, 2014; Slater *et al.*, 2014, 2015), suggesting that at least some musician enhancements may be due, in part, to experience-based plasticity rather than innate differences between those who pursue music training and those who do not (see Kraus & White-Schwoch, 2016 for review).

The many forms of music-making present an opportunity to investigate how different elements of musical experience may play a role in shaping cognitive and sensory function. A small number of studies have shown that the imprint of musical experience on neural function may be fine-tuned by the specific instrument played,

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revealing enhancements in the neural processing of relevant sound features, such as an enhanced neural response to the timbre of their instrument (Pantev *et al.*, 2001; Shahin *et al.*, 2008; Margulis *et al.*, 2009; Strait *et al.*, 2012). There is also evidence that vocalists have unique auditory processing benefits over non-musicians and even instrumentalists of a similar level of expertise (Nikjeh *et al.*, 2008; Halwani *et al.*, 2011), however this group has received relatively little attention in research to date.

There are very few studies investigating differential effects of musical expertise on cognitive function, although initial evidence suggests that cognitive enhancements may be independent of instrument (Carey *et al.*, 2015) and extend to vocalists (Bialystok & Depape, 2009). However, Carey *et al.* (2015) found only weak evidence overall for the transfer of musical training to non-musical tasks and the factors contributing to the generalization of effects remain a point of ongoing discussion (for example, see Benz *et al.*, 2015; Costa-Giomi, 2015 for review). It has been suggested that broader cognitive benefits of music training may be mediated by inhibitory control (Degé *et al.*, 2011; Moreno & Farzan, 2015), therefore it is of particular interest to identify the components of musical activity that may be effective in strengthening inhibitory control.

Here we assessed cognitive, perceptual and neural measures in two musician groups (percussionists and vocalists) and in a control group of non-musicians. We recruited musicians from a wide range of musical backgrounds and adopted less stringent musicianship requirements than previous studies with respect to age of onset of musical training, years of practice and current amount of practice, with the goal of teasing apart different dimensions of expertise. We focused on measures that have previously been associated with a musician advantage in young adults and asked whether these advantages are influenced by a relative emphasis on rhythm and timing (percussion) or pitch and melody (voice). In addition, the range of musical backgrounds in our participants allowed us to assess whether cognitive function is influenced by specialization in sight-reading or improvisation.

Cognitive and perceptual measures included attention and inhibitory control, frequency discrimination and backward masking. Neural measures, assessed by the auditory frequency-following response, included encoding of speech harmonics (Parbery-Clark *et al.*, 2009) and the neural differentiation of speech syllables (Parbery-Clark *et al.*, 2012; Strait *et al.*, 2014), which relies upon precise encoding of fast-changing acoustic information. Based on previous work we hypothesized that different primary instruments engender distinct signatures of neural enhancement, reflecting the acoustic properties most salient to that type of musical practice. Specifically, we predicted that musical experience with an emphasis on rhythm and timing precision (i.e. drums/percussion) is associated with greater neural differentiation of fast-changing characteristics of speech syllables, whereas experience with a relative emphasis on pitch (i.e. vocalists) is associated with enhanced neural encoding of speech harmonics during a sustained vowel. However, we hypothesized that there are general cognitive benefits of musical practice, irrespective of instrument, and we predicted both musician groups would outperform non-musicians in attention and inhibitory control.

Materials and methods

Participants

Participants were young adult males, aged 18–35 years, and were recruited from the Northwestern University community, broader Chicago area and via postings on Craigslist. Participants completed an extensive questionnaire addressing family history, musical practice

history and educational background. Participants had no current external diagnosis of a language, reading or attention disorder. All participants had air-conducted audiometric thresholds < 30 dB nHL for octaves from 125 to 8000 Hz, and a click-evoked auditory brainstem response within lab-internal age-based norms. All procedures were approved by Northwestern University's Institutional Review Board and participants were compensated for their time.

Groups based on primary instrument (percussion vs. voice)

Participants were divided into three groups: percussionists ($n = 21$), vocalists ($n = 21$) and non-musicians ($n = 18$). The groups did not differ on age, IQ, as measured by the Test of Nonverbal Intelligence (TONI) (Brown *et al.*, 1997) or pure-tone hearing thresholds (see Table 1). Musician participants had played consistently for at least the past five years with either drums/percussion or vocals as their primary instrument. The two musician groups (percussionists and vocalists) did not differ with respect to age at which musical training began, years of musical experience, current hours of practice per week, self-rated overall proficiency on their primary instrument or self-rated proficiency in sight-reading or improvisation. Non-musician participants had no more than four years of musical experience across their lifetime, with no regular musical activities within the seven years prior to the study. See Table 1 for summary of group characteristics and statistics, and Table 2 for details regarding instruments played, self-rated proficiency, format of training and total years of musical practice for all participants with musical experience (including non-musicians with prior music training).

Groups based on sight-reading and improvisation proficiency

To assess the impact of specialization in sight-reading vs. improvisation on cognitive functions, we used the musicians' self-reported proficiency scores on their primary instrument (the participants ranked themselves on a scale of 1–10 in each skill). Given the range and combinations of different types of specialization across the participants we grouped the participants by their dominant proficiency rather than treating proficiency as a continuous variable. To assess the extent of specialization, a difference score was calculated by subtracting self-rated proficiency in improvisation from proficiency in sight-reading. We then grouped the musician participants based on their difference score (see Fig. 1): if the participant's self-rated proficiency in sight-reading was at least two points higher than their proficiency in improvisation, they were added to the Readers group ($n = 11$, seven vocalists), and vice versa for the Improvisers group ($n = 18$, eight vocalists); if their proficiency scores differed by less than two points, the participant was added to the Balanced group ($n = 13$, six vocalists). The non-musicians formed a fourth group ($n = 18$). These groups did not differ on age, IQ or pure tone thresholds (all $P > 0.05$). The three musician groups did not differ in their proficiency on primary instrument, age at which musical training began, hours per week or years of musical practice (all $P > 0.05$). The number of percussionists vs. vocalists in each group was balanced ($\chi^2(2) = 1.12$, $P = 0.572$). The distribution of sight-reading and improvisation proficiency across the musician participants is shown in Fig. 1.

Testing procedures

Attention and inhibitory control

Attention and inhibitory control were assessed using the *Integrated Visual and Auditory Plus Continuous Performance Test* (Sandford

TABLE 1. Summary of group characteristics

Demographics	Non-musicians (n = 18)			Vocalists (n = 21)			Percussionists (n = 21)			Test Statistic H (P value)
	M (SD)	Min	Max	M (SD)	Min	Max	M (SD)	Min	Max	
Age (years)	Mdn = 23.5 (3.5)	18	30	Mdn = 23.0 (3.9)	18	31	Mdn = 24.0 (5.4)	18	35	0.208 (0.901)
Non-verbal IQ (percentile)	74.4 (19.5)	21	99	72.7 (23.3)	26	99	72.9 (21.4)	21	95	0.017 (0.991)
Pure-tone thresholds (R)	8.9 (4.2)	1.67	18.33	7.3 (3.6)	3.33	13.33	7.9 (4.2)	-1.7	13.33	1.297 (0.523)
Pure-tone thresholds (L)	7.8 (4.9)	0	20	7.1 (4.8)	-1.67	15	6.5 (4.9)	-5	16.67	0.408 (0.816)
Musical history*	<i>U</i> (P value)									
Age of onset of musical training (yrs)				Mdn = 7.0 (3.5)	3	18	Mdn = 9.0 (2.4)	3	13	291.5 (0.071)
Years of musical experience				16.1 (4.8)	7	25	15.9 (6.7)	8	32	200.0 (0.605)
Current hours of practice per week				10.8 (8.4)	1	30	12.4 (8.0)	1	30	234.0 (0.530)
Self-rated proficiency on primary instrument				8.2 (1.4)	5	10	8.8 (1.2)	6	10	281.5 (0.115)
Sight-reading proficiency on primary instrument				6.9 (2.5)	2	10	6.6 (2.4)	1	10	197.0 (0.548)
Improvisation proficiency on primary instrument				6.9 (1.7)	4	10	7.5 (2.5)	2	10	364.5 (0.262)

*Non-musician participants excluded from group comparisons related to musical history.

& Turner, 1994). The test was administered in a soundproof booth on a laptop computer and was divided into four sections: warm-up, practice, test and cool-down. Instructions came from the test via Sennheiser HD 25-1 headphones and corresponding visual cues. During the warm-up, participants were instructed to click the mouse when they *saw* or *heard* a '1'; the test proceeded with a 20-trial warm-up during which only the number '1' was spoken or presented visually, 10 times each. Next, participants completed a practice session during which they were reminded of the same instructions but were also asked *not* to click the mouse when they saw or heard a '2'; further practice trials were presented (10 auditory and 10 visual targets). During the main test portion of the test, choice reaction time was recorded for participants' responses to the target ('1') and foil ('2') stimuli on five sets of 100 trials for a total of 500 trials. Each set consisted of two blocks of 50 trials, with each trial lasting 1.5 s. The visual targets were presented for 167 ms and were 4 cm high, while the auditory stimuli lasted 500 ms and were spoken by a woman.

The first block of each set of the main test collects a measure of impulsivity by creating a ratio of target to foil of 5.25 : 1.0, resulting in 84% of trials (or 42 out of 50, per block) presenting targets intermixed with eight foils. The second block collects a measure of inattention by reversing the order and presenting many foils and few targets (165 targets over all five sets). Stimuli are presented in a pseudo-random order of visual and auditory stimuli. The entire assessment including the introduction, practice, test and cool down lasts 20 min. The assessment generates age-normed composite scores for the 'full scale attention quotient' and 'full scale response control quotient,' a measure of inhibitory control.

Frequency discrimination and backward masking

Frequency discrimination and backward masking were collected using sub-tests of the IHR Multicentre Battery for Auditory Processing (IMAP, developed by the Medical Research Council Institute of Hearing Research, Nottingham, UK). The test battery was administered in a sound attenuated booth using a laptop computer. Responses were recorded using a 3-button response box. Stimuli were presented diotically through Sennheiser HD 25-1 headphones and were accompanied by animated visual stimuli. The subtests used an identical response paradigm, visual cues and response feedback. Each subtest was initiated by a practice session of easy trials,

consisting of the same stimuli used for initial trials in each subtest [a 90 dB Sound pressure level (SPL) target tone for backward masking and a 50% frequency difference between the target and standard tones for frequency discrimination]. Correct responses on four out of five practice trials were required to continue. All participants achieved a minimum of four out of five correct responses for all practice sessions.

Frequency discrimination. The frequency discrimination paradigm employed a cued three-alternative forced choice presented as an animated computer game in which each of three characters opened their mouths to 'speak' a sound. The target ('odd-one-out') signal was presented with equal probability in one of the three intervals amidst a standard 1000 Hz tone that was presented twice for each trial. All tones had equal durations (200 ms) and were separated from one another by 400 ms. All stimuli incorporated 10 ms cosine ramps. The target differed in frequency from the standard, initially 50% higher in frequency but gaining in proximity to the standard with successful performance according to an adaptive staircase model (three down, one up) that incorporated three diminishing step sizes (see Amitay *et al.*, 2006 for further description). Incorrect responses resulted in a greater percent difference between the target and standard tones. Each of the cartoon characters corresponded to one of the three buttons on the response box and participants indicated which cartoon character presented the target by pressing the corresponding button. After correct responses, the character that 'spoke' the target danced. Participants were given unlimited time to respond (response times were not logged). Trials continued until a total of three reversals was obtained. Threshold was determined by calculating the mean percent difference between the target and standard presented in the final two trials (Amitay *et al.*, 2006; Moore *et al.*, 2008).

Backward masking. The IMAP test battery includes two backward masking sub-tests, one with a 50 ms gap between the target and noise and one with no gap; we limited our analyses to the more difficult 'no gap' condition, described here. Participants were instructed to attend to the computer screen and listen to a sequence of three 'noise sounds' (bandpass noise with a center frequency of 1000 Hz, a width of 800 Hz, a duration of 300 ms, and a fixed spectrum level of 30 dB). A 20 ms, 1000 Hz target tone with 10 ms cosine ramp occurred immediately prior to the noise. Participants pressed the appropriate button on the response box to indicate which of three

TABLE 2. Musical instruments played (including voice) and self-rated proficiency for all participants with musical experience

Primary instrument					
Instrument (overall proficiency rating)	Sight-reading proficiency	Improvisation proficiency	Other instruments (proficiency rating)	Format(s) of training	Years of musical practice
Voice (6)	4	6	Piano (3)	Private	15
Voice (8)	6	8	Piano (3)	Private, group	15
Voice (8)	8	8	Guitar (6), Drums (6), Bass (3), Piano (2)	Private, group, self-taught	15
Voice (7)	7	4	Piano (1)	Private, group	7
Voice (8)	7	4		Group	12
Voice (7)	8	5	Piano (3)	Private, group, self-taught	17
Voice (10)	6	8	Flute (8)	Private, group	13
Voice (9)	10	10	Bass (5), piano (4), percussion (5), guitar (6)	Private, group, self-taught	20
Voice (10)	8	7	Piano (4)	Private, group	19
Voice (8)	2	8	Trombone (3), harmonica (3)	Private, group, self-taught	20
Voice (8)	9	8	Piano (5)	Private	16
Voice (10)	7	10	Piano (5)	Group, self-taught	14
Voice (7)	5	7	Piano (2)	Private, group	9
Voice (9)	8	6	Piano (6), flute (5), violin (3)	Private, self-taught	19
Voice (9)	9	8	Guitar (9), drums (7), piano (6)	Private, self-taught	21
Voice (10)	10	7	Guitar (5), piano (4)	Private, group, self-taught	25
Voice (9)	8	7	Piano (5)	Private, group, self-taught	14
Voice (9)	10	8		Private, group	23
Voice (8)	2	4	Guitar (8), banjo (5), saxophone (5), bass (5)	Private, self-taught	22
Voice (7)	9	6	Piano (2)	Suzuki, private	13
Voice (5)	3	6	Trombone (6)	Private, group	10
Drum set (9)	8	9	Piano, cello	Private, group, suzuki	13
Drum set (7)	7	6		Private, group, self-taught	8
Snare drum, Drum set (10)	1	6		Private, group	10
Drum set (8)	2	9	Guitar (8), piano (2)	Private, self-taught	24
Percussion (10)	7	7		Private	16
Drum set, percussion (6)	8	2		Private, group	8
Drum set, percussion (9)	6	7		Private, self-taught	11
Percussion (9)	7	6		Private	22
Drum set (10)	8	10	Guitar (5)	Group, self-taught	10
Percussion (9)	8	5		Private, group	17
Drum set, mallets, percussion (10)	5	7	Voice (6), piano (4)	Private, self-taught	20
Drum set (8)	2	9	Guitar (8)	Private, self-taught	32
Drum set (9)	7	10	Guitar (7), Piano (6), Bass (5)	Private, mostly self-taught	19
Drum set (10)	8	10	Guitar (4), piano (5)	Private, group, self-taught	26
Drum set (10)	9	9	Piano (5), guitar (6), voice (4)	Private, group, self-taught	24
Percussion (10)	8	10		Private	15
Drum set (10)	10	3		Private, group	14
Percussion (9)	6	4	Piano (2), voice (1)	Self-taught, Suzuki	11
Drum set, percussion (7)	9	8	Piano (4)	Private, group, self-taught	14
Drum set (7), percussion (5)	8	10		Private	10
Percussion (8)	5	10	Voice (4), occarina (2)	Self-taught, group	9
Non-musician	n/a	n/a	Piano (1), trumpet (1)	Group	1
Non-musician	n/a	n/a	Piano (1)	Private	1
Non-musician	n/a	n/a	Trumpet (1)	Group	1
Non-musician	n/a	n/a	Trumpet (4)	Group	2
Non-musician	n/a	n/a	Piano (3)	Private	2
Non-musician	n/a	n/a	Guitar (1)	Private	2
Non-musician	n/a	n/a	Piano (3), trumpet (3)	Private, group	3
Non-musician	n/a	n/a	Piano (2)	Private	3
Non-musician	n/a	n/a	Clarinet (7)	Group	3
Non-musician	n/a	n/a	Sax (4), piano (2)	Private	3
Non-musician	n/a	n/a	Handbell (2), voice (2)	Group	4

trials contained the target tone (as opposed to noise only). From the initial 90 dB SPL presentation, targets decreased in intensity according to an adaptive staircase model (three down, one up) that incorporated three diminishing step sizes (see Amitay *et al.*, 2006 for further description). This procedure yielded a minimum detectable threshold (target dB).

Electrophysiology

Stimuli

The speech syllables [ba], [da] and [ga] were presented in quiet. All stimuli were constructed using a Klatt-based synthesizer (Klatt, 1980). Their durations are 170 ms with voicing (100 Hz F0) onset

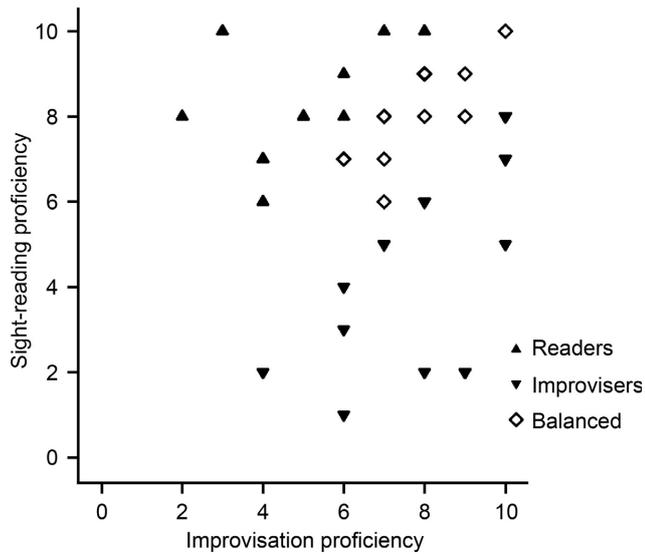


FIG. 1. Participants span a range of proficiency in sight reading and improvisation, and are grouped according to their relative proficiency in each.

at 10 ms. The formant transition durations are 50 ms and comprise a linearly rising F1 (400–720 Hz) and flat F4 (3300 Hz), F5 (3750 Hz), and F6 (4900 Hz). Ten millisecond of initial frication are centered at frequencies around F4 and F5. After the 50 ms formant transition period, F2 and F3 remain constant at their transition end point frequencies of 1240 and 2500 Hz, respectively, for the remainder of the syllable. The stimuli differ only in the starting points of F2 and F3. For [ba], F2 and F3 rise from 900 Hz and 2400 Hz, respectively. For [da], F2 and F3 fall from 1700 and 2580, respectively. And for [ga], F2 and F3 fall from 3000 and 3100, respectively.

Electrophysiological Procedure

The speech syllables were presented in alternating polarities at 80 dB SPL binaurally with an inter-stimulus interval of 83 ms (Neuro Scan Stim 2; Compumedics) through insert ear phones (ER-3; Etymotic Research), using NeuroScan Acquire 4.3 recording system (Compumedics) with four Ag–AgCl scalp electrodes. Responses were differentially recorded at a 20 kHz sampling rate with a vertical montage (Cz active, forehead ground, and linked earlobe references), an optimal montage for recording brainstem activity (Galbraith *et al.*, 1995; Chandrasekaran & Kraus, 2010). Contact impedance was 2 k Ω or less between electrodes. Six thousand artifact-free sweeps were recorded for each condition, with each condition lasting between 23 and 25 min. Participants watched a silent, captioned movie of their choice to facilitate a still yet wakeful state for the recording session. To limit the inclusion of low-frequency cortical activity, brainstem responses were off-line bandpass filtered from 70 to 2000 Hz (12 dB/octave, zero phase-shift). The filtered recordings were then epoched using a –40 to 213 ms time window with the stimulus onset occurring at 0 ms. Any sweep with activity greater than 35 μ V was considered artifact and rejected. The subtracted responses were used in analyses, following Strait *et al.* (2014). Subtracting the polarities emphasizes the temporal fine structure and enables analysis of phase-locked neural activity to the frequency range in which the [ba] and [ga] stimuli differed (900–2480 Hz). Last, responses were amplitude-baselined to the pre-stimulus period.

Analytical and statistical methods

Frequency-following response

Neural encoding of speech harmonics. All data analyses were carried out in MATLAB 7.5.0 (Mathworks) with custom-coded routines. The neural data processing routines are available as part of MATLAB toolbox that is available from the Auditory Neuroscience Laboratory website. To assess the neural encoding of the stimulus spectrum, a fast Fourier transform was performed on the steady-state portion of the response (60–180 ms) using MATLAB routines. Average spectral amplitudes of specific frequency bins were calculated from the resulting amplitude spectrum. As described in Parbery-Clark *et al.* (2009), each bin was 60 Hz wide and centered on the stimulus f_0 (100 Hz) and the subsequent harmonics H2–H10 (200–1000 Hz; whole-integer multiples of the f_0). To create a composite score representing the strength of the overall harmonic encoding, the average amplitudes of the H2 to H10 bins were summed. Analyses were performed on the composite harmonic measure since this is where a musician advantage was previously observed (Parbery-Clark *et al.*, 2009).

Neural differentiation of speech syllables. A cross-phaseogram was constructed according to Skoe *et al.* (2011) and provides a frequency- and time-specific measure of phase differences between two neural responses (/ba/and/ga/). Based on Strait *et al.* (2014), analyses were constrained to 900–1400 Hz. Comparisons were performed on the time region corresponding to the dynamic formant transition (5–45 ms), where differences between musicians and non-musicians were previously observed.

Statistical analyses

All statistical analyses were conducted using standard functions of spss (version 23.0; SPSS Inc., Chicago, IL). Statistical analyses were constrained to those measures in which previous studies had revealed a musician advantage. Kruskal–Wallis H tests were used for comparisons with three or more independent samples (i.e. Percussionists, Vocalists and Non-musicians, or Readers, Improvisers, Balanced and Non-musicians), with subsequent *post hoc* pairwise Mann Whitney U tests conducted where significant group effects were found. Alpha levels were adjusted for multiple comparisons, as indicated in the text.

Results

Scatterplots of individual data for all dependent variables are provided in Fig. 2. Performance across measures is summarized in Table 3, and a summary of group comparison statistics is presented in Table 4.

Group comparisons based on primary instrument

Comparison of the Percussionist, Vocalist and Non-musician groups revealed significant main effects of group (at adjusted alpha level $P < 0.008$) for inhibitory control ($\chi^2(2) = 16.604$, $P < 0.001$), frequency discrimination ($\chi^2(2) = 10.535$, $P = 0.005$), neural encoding of speech harmonics ($\chi^2(2) = 11.336$, $P = 0.003$) and the neural differentiation of syllables ($\chi^2(2) = 9.962$, $P = 0.007$).

Post hoc pairwise comparisons revealed that the Vocalists outperformed Non-musicians on frequency discrimination ($U = 17.7$, $P = 0.004$, $r = 0.539$) and had stronger neural encoding of harmonics than Non-musicians ($U = -18.5$, $P = 0.003$, $r = -0.527$); the Percussionists did not differ from either Vocalists or Non-musicians on these measures.

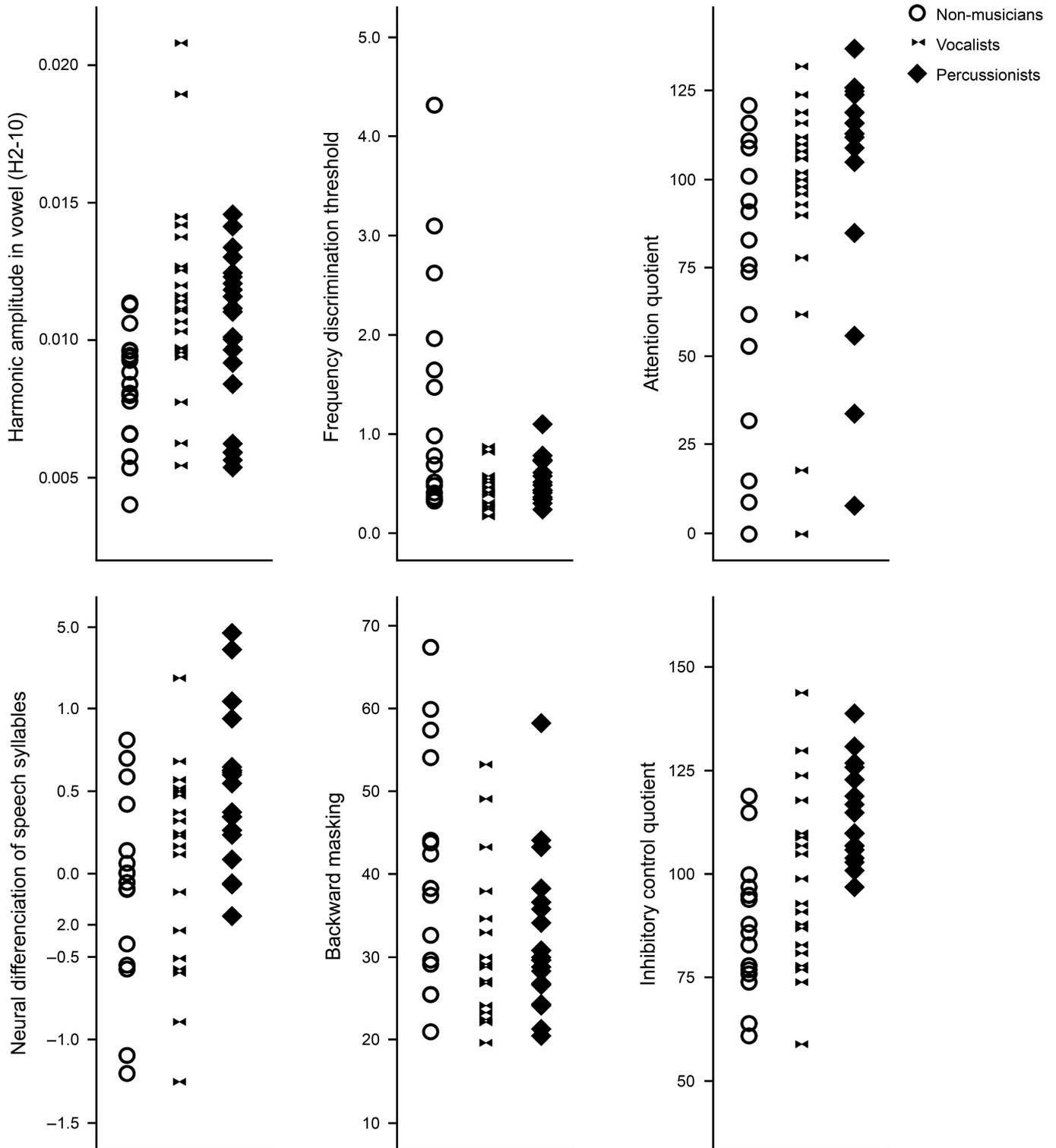


FIG. 2. Scatterplots showing distribution of performance in cognitive and perceptual measures across groups of non-musicians, vocalists and percussionists.

Percussionists had stronger neural differentiation of speech syllables than Non-musicians ($U = 16.262$, $P = 0.009$, $r = -0.496$); Vocalists did not differ from either group on this measure. Individual participants' spectral amplitudes by frequency (F0-H10) are shown in Fig. 3 and the neural differentiation of speech sounds is illustrated by group in Fig. 4.

Contrary to our predictions, Percussionists outperformed both Non-musicians and Vocalists on inhibitory control (Percussionists vs. Non-musicians: $U = -22.160$, $P < 0.001$, $r = -0.691$; Percussionists vs. Vocalists: $U = -13.163$, $P = 0.031$, $r = -0.410$); group differences in attention were not significant with adjustment for multiple comparisons (see Table 4). Group comparisons based on

TABLE 3. Summary of cognitive and perceptual performance by group

	Non-musicians ($n = 18$) M (SD), Mdn	Vocalists ($n = 21$) M (SD), Mdn	Percussionists ($n = 21$) M (SD), Mdn
Attention quotient	71.7 (39.6), 79.5	94.2 (32.5), 102.0	102.4 (34.8), 114.5
Inhibitory control quotient	87.6 (16.2), 87.0	98.9 (20.7), 99.0	114.0 (11.5), 110.0
Frequency discrimination	2.09 (2.89), 0.89	0.45 (0.21), 0.42	0.53 (0.21), 0.47
Backward masking	40.5 (13.6), 38.3	32.4 (10.9), 29.0	32.1 (8.9), 29.8

TABLE 4. Group comparisons by primary instrument

	Main effects		<i>Post hoc</i> pairwise comparisons				
	PERC vs. VOC vs. NM	PERC vs. NM		VOC vs. NM		PERC vs. VOC	
		$\chi^2(2)$ (P value)	U (P)	Effect size (r)	U (P)	Effect size (r)	U (P)
Attention quotient	9.315 (0.009)						
Inhibitory control quotient	16.604 (< 0.001)	-22.160 (< 0.001)	-0.691	-8.997 (0.271)	-0.286	-13.163 (0.031)	-0.410
Frequency discrimination	10.535 (0.005)	11.000 (0.133)	0.335	17.7 (0.004)	0.539	-6.700 (0.582)	-0.206
Backward masking	4.730 (0.094)						
Harmonic encoding of vowel (H2-10)	11.336 (0.003)	-13.278 (0.054)	-0.379	-18.5 (0.003)	-0.527	5.190 (1.0)	0.149
Neural differentiation of syllables	9.962 (0.007)	-16.3 (0.009)	-0.496	-4.212 (1.0)	-0.128	-12.050 (0.058)	-0.369

Main effects were assessed using Kruskal-Wallis H tests. Pairwise comparisons were carried out following main effects that were significant at the adjusted alpha level ($P < 0.008$), using Mann Whitney U tests. *Post hoc* P values are adjusted for multiple pairwise comparisons.

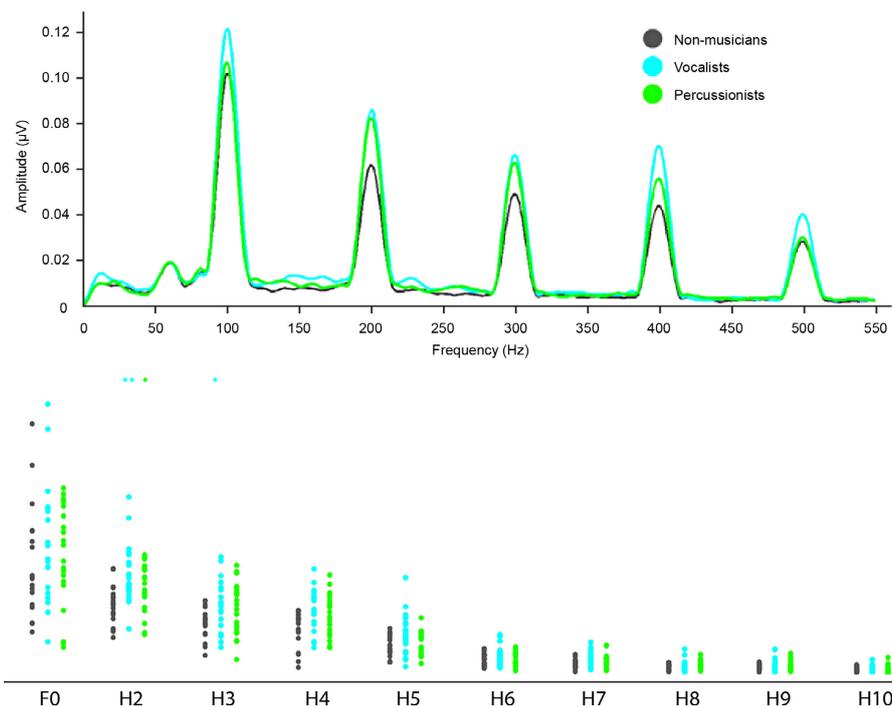


FIG. 3. Group average waveforms show the spectral energy in response to the vowel portion of the speech sound /da/ presented in quiet, at frequency bins centered at the fundamental frequency (100 Hz) and its harmonics. Vocalists have stronger encoding of speech harmonics in quiet at H2, 3 and 4. Percussionists also show stronger encoding of H2 than non-musicians. Scatterplots show individual spectral amplitudes for each participant, up to the tenth harmonic. [Colour figure can be viewed at wileyonlinelibrary.com].

proficiency bias revealed a significant effect of group for inhibitory control ($\chi^2(3) = 10.643$, $P = 0.014$). *Post hoc* pairwise comparisons determined that the Balanced group significantly outperformed the Non-musicians ($U = 17.841$, $P = 0.017$, $r = 0.536$). No other pairwise comparisons were significant ($P > 0.05$).

To confirm that the effect of primary instrument on inhibitory control was not driven by general factors (age and non-verbal IQ) we performed a hierarchical regression analysis with inhibitory control as the dependent variable. In the first step we included age and non-verbal IQ as predictive variables. The resulting model did not

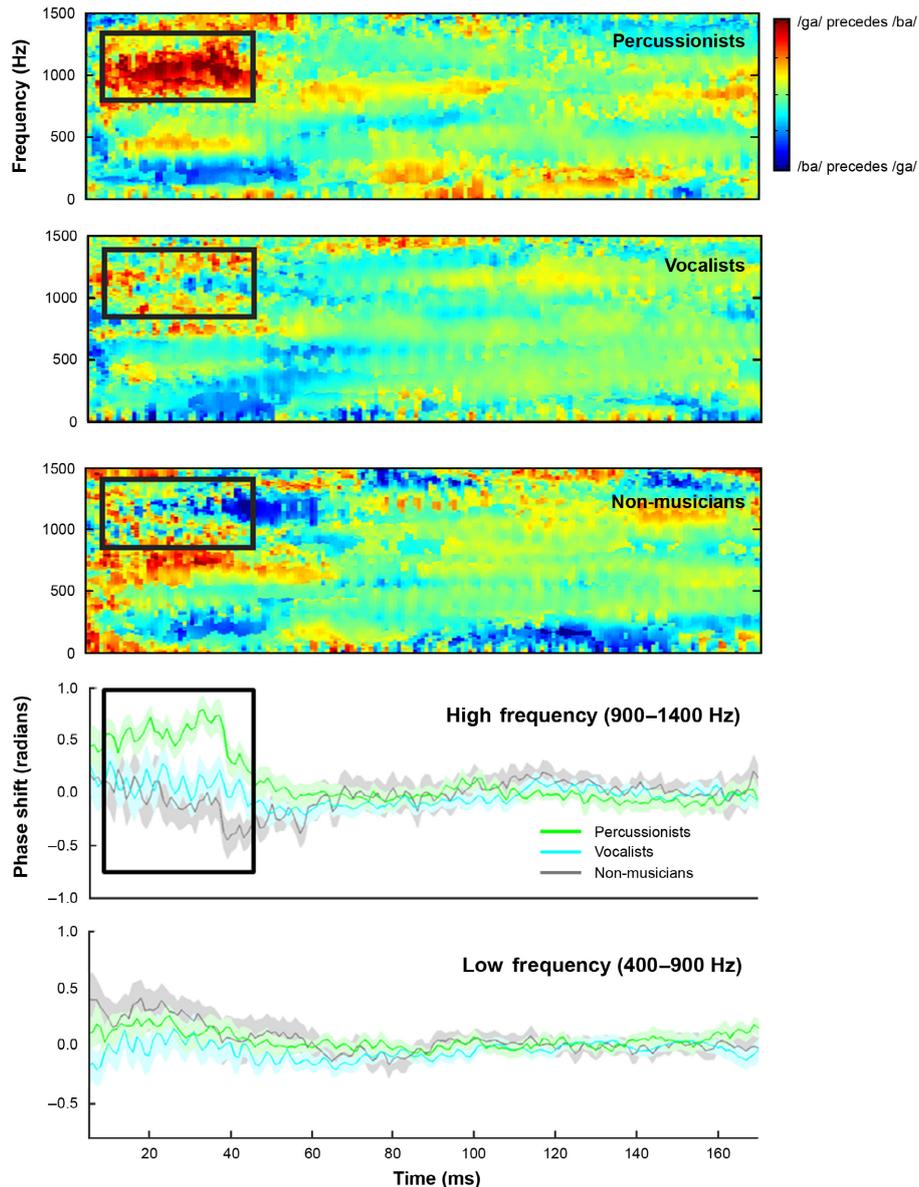


FIG. 4. Percussionists show greater neural differentiation of speech syllables [ba] and [ga] than the vocalist and non-musician groups, reflecting more precise encoding of the fast timing characteristics of speech. In the top three panels, this is visualized by the darker patch in the high frequency range (900–1400 Hz) in the consonant-vowel transition portion of the response (between 5 and 45 ms). In the lower two panels, percussionists show greater phase shifts during the transition portion. This is evident in the high frequency range, but not in the low frequency range, shown for comparison. The black rectangle indicates the region of interest (5–45 ms, 900–1400 Hz). [Colour figure can be viewed at wileyonlinelibrary.com].

predict variance in inhibitory control ($F = 1.091$, $P = 0.343$, $R^2 = 0.040$, adjusted $R^2 = 0.003$). In the second step we added group (Percussionist, Vocalists, Non-musicians) as a predictive variable. This resulted in a significant improvement in the model (R^2 change = 0.281, $P < 0.001$) with the overall model significantly predicting 28% of variance in inhibitory control ($F = 8.038$, $R^2 = 0.321$, adjusted $R^2 = 0.281$).

Inhibitory control and proficiency in secondary instruments

To further elucidate the factors contributing to inhibitory control performance, we included an exploratory analysis to determine whether the wide range of scores in the Vocalist and Non-musician groups could be explained by variation in experience with other

instruments (i.e. Vocalists' secondary instruments or Non-musicians' prior instrumental experience). Within these participants (i.e. excluding the Percussionists) we found a significant correlation between self-rated proficiency on non-vocal instruments and inhibitory control ($r = 0.400$, $P = 0.014$, see Fig. 5), which was strengthened when age and IQ were added as covariates ($r = 0.437$, $P = 0.009$).

Discussion

We set out to examine whether musical experience with an emphasis on rhythm (percussionists) vs. pitch (vocalists) is reflected in distinct signatures of expertise. Consistent with our hypotheses we found modest evidence for nuances in the musician signature: In

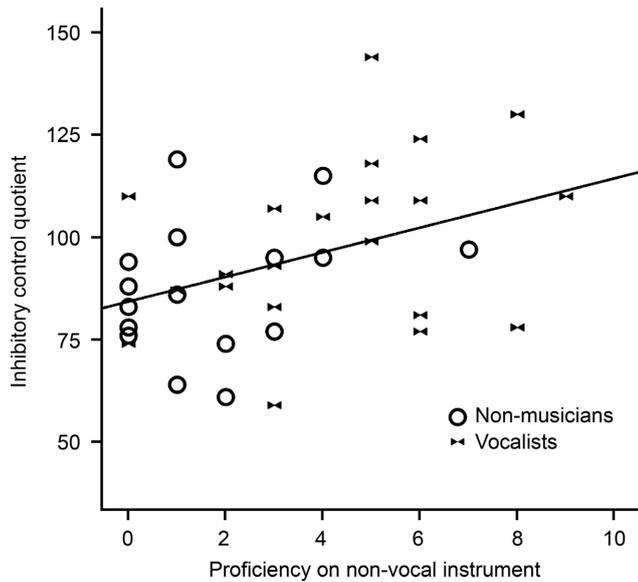


Fig. 5. Vocalist and non-musician groups do not differ in inhibitory control, however non-vocal instrumental proficiency is correlated with inhibitory control within these participants.

comparison with non-musicians, the vocalists show stronger encoding of speech harmonics, while the percussionists show greater neural differentiation of syllables, which relies upon precise encoding of the fast timing characteristics of speech (e.g. consonants). These outcomes are consistent with the relative emphasis on spectral vs. temporal characteristics of sound in these musicians' practice.

We also observed enhanced inhibitory control in the Percussionist group, which we had not predicted based on previous research. However, there is accumulating evidence of overlapping neural circuitry between motor and cognitive control, particularly in relation to aspects of coordination and timing (Graybiel, 1997; Brown & Marsden, 1998; Schwartz & Kotz, 2013) and also in processing musical rhythm (Grahn & Brett, 2007; Chen *et al.*, 2008; Grahn, 2012). It is therefore possible that the particular demands of playing percussion, including the extent of motor activation and the coordination of complex rhythmic sequences in time, may provide a 'sweet spot' for strengthening neural networks important for cognitive control. Our *post hoc* observation that Vocalists and Non-musicians with more extensive experience in (non-vocal) instrumental playing showed better inhibitory control, is consistent with the idea that more extensive motor activation associated with instrumental playing could contribute to the transfer of musical practice to cognitive control. This interaction of rhythm, motor and cognitive factors represents a promising area for future research.

Notably, we found no difference between musicians specialized in either sight-reading or improvisation; rather, it was the Balanced group (musician participants who rated themselves equally proficient in both skills) who outperformed non-musicians in inhibitory control. These preliminary outcomes suggest that, if anything, it may be versatility in playing style that leads to cognitive transfer of training, rather than specific expertise in one format or another. Although these analyses were based on small groups of participants, we note that the effect of instrument was clearly present despite the wide range of proficiency in reading vs. improvisation, suggesting that instrument was a more dominant factor than reading vs. improvisational proficiency in driving this effect. It is also possible that proficiency-based differences may emerge in other measures of neural or cognitive function that were not included in the present study. There

is neuroimaging evidence to suggest that the style of playing influences does influence patterns of brain activation, for example improvisation is associated with deactivation of dorsolateral prefrontal, lateral orbital and limbic regions, in combination with activation of medial prefrontal and sensorimotor regions, when contrasted with memorized playing or note reading (Limb & Braun, 2008; Donnay *et al.*, 2014).

It is also important to note that primary instrument and style of playing are only some of the potential aspects of musical experience that may influence cognitive and sensory function. The method of teaching used to lay down the fundamentals of music can also affect musical proficiency later on, and may in turn affect the transfer of musical expertise to other domains. When learning rhythms, for example, studies show that the method used affects the speed and accuracy with which musicians learn (Colley, 1987; Pierce, 1992). Typically used training techniques, such as ear playing, continuous practice, and silent analysis, have each been found to offer distinct benefits, showing that learning methods can be strategically used to develop and improve upon different aspects of musical proficiency (Rosenthal *et al.*, 1988). Interestingly, there is also evidence that continued aural training shapes the way musicians listen to and think about music. It has been found that aurally trained musicians employ different and seemingly more effective strategies to remember melodies. For example, when asked to comment on their thought process during sight reading performance tasks for both instrument playing and singing, a majority of the musicians who had more experience with non-traditional music styles where aural skills are emphasized (i.e., jazz) commented that they could often predict where rhythms and melodies would go (Woody & Lehmann, 2010). These comments, in combination with the finding that the aurally-trained musicians required significantly fewer trials to play or sing the sight-read excerpts than the musicians trained with greater emphasis on reading, suggest that the musicians whose training focused more on aural experience were able to construct more meaningful and effective mental representations. The present findings suggest that versatility could be an important feature of musical experience to consider, in addition to expertise in one specific skill or another. For example, it is possible that an additional factor contributing to the stronger inhibitory control performance in vocalists who are also proficient in additional instruments, or in the musicians with balanced proficiency across reading and improvisational playing, is their experience juggling multiple musical 'languages,' similar to the observed bilingual advantage in executive function (Bialystok & Depape, 2009; Bialystok *et al.*, 2012; Krizman *et al.*, 2012; Moreno *et al.*, 2014), and this provides further motivation to investigate not only distinct elements of experience in isolation, but the ways in which the multiple facets of musical practice may complement one another in an 'enriched diet' of expertise.

Our cross-sectional outcomes cannot speak to the causal effects of musical training, and could reflect pre-existing differences as well as experience-based effects. However, our findings are consistent with previous studies showing instrument-specific enhancements of auditory processing, and consistent with a model of auditory learning in which sound features that are meaningful to an individual become enhanced through repeated exposure and engagement with sound. In conjunction with increasing longitudinal evidence showing the emergence of the musician signature with music training (Kraus & White-Schwoch, 2016), these findings suggest that musical training is at least one of the factors contributing to these neural and cognitive enhancements. Most likely there are both genetic and environmental factors at play, for example it has been shown that personality traits play an important role in the likelihood of an

individual continuing with musical practice (Corrigall *et al.*, 2013). Understanding this interaction between inherent predisposition and training is itself an important area for future investigation. It is also important to consider how an individual's enthusiasm and suitability for their instrument affects outcomes, since it is well established that emotional engagement and reward are important factors in the potential for music to engender neural plasticity (Herholz & Zatorre, 2012).

The rewarding nature of music also makes it an especially powerful vehicle for training and remediation. Musicians have shown advantages in many of the same neural processes that are impaired in individuals with learning and language deficits such as dyslexia and autism, suggesting that music-based programs may be effective in educational and clinical settings to support the development and remediation of language and listening skills (reviewed in Tierney & Kraus, 2013b). Converging evidence reveals links between rhythm abilities and language skills (Thomson & Goswami, 2008; Corriveau & Goswami, 2009; Huss *et al.*, 2011; Tierney & Kraus, 2013a; Slater & Kraus, 2016), suggesting that the transfer of skills from music to speech processing may be mediated in part by enhanced rhythm skills (Shahin, 2011). Rhythmic expertise therefore provides a particularly interesting context for future research given the potential role of rhythm and timing abilities as markers of language development (Holliman *et al.*, 2008; Dellatolas *et al.*, 2009; Tierney & Kraus, 2013a; Woodruff Carr *et al.*, 2014). Intervention studies focusing on rhythm skills have shown some success in the remediation of language difficulties such as dyslexia (Overy, 2000, 2003; Bhide *et al.*, 2013), suggesting not only an association between these abilities but the potential for training in rhythm to strengthen underlying mechanisms of language processing.

Finally, we reveal a specific advantage for the percussionists in inhibitory control, who outperform both non-musicians and vocalists. This has interesting implications in the context of recent work identifying executive function as an important factor in determining whether skills developed through musical practice transfer to other domains (Degé *et al.*, 2011; Moreno & Farzan, 2015). Our findings may therefore help to inform future research by highlighting specific aspects of musical experience, such as rhythm and coordinated movement, which may be of particular value in clinical and educational settings.

Conclusions

The imprint of musical experience on the brain may be fine-tuned by specific elements of musical practice, and the rich diversity of music-making activities within a typical population provides a wealth of opportunity for research. To help bridge the gap between life-long expertise and short-term training and intervention, it is especially important to assess more readily accessible forms of musical activity, such as singing and drumming, which might more easily be incorporated into educational and clinical contexts. Understanding the nuances of the complex relationship between music and the brain may shed light on mixed outcomes within the literature, for example, studies comparing musician and non-musician groups may be influenced by other factors such as extent of rhythmic expertise, number of instruments played, or the specific motor activities associated with a given instrument. Further, this line of research may help to inform training strategies for the development of musical skills as well as their transfer to non-musical domains.

Conflict of interests

The authors declare no competing financial interests.

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Data accessibility

Data are available on the Open Science Framework at <https://osf.io/vx3f7/>. These data include performance on the behavioral tests as well as the frequency-following measures used in reported analyses.

Author contributions

Conceived and designed the experiments: JS, NK. Performed the experiments: JS, BS, AA. Analyzed the data: JS, TN. Wrote the paper: JS, AA.

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