

Development of vocal emotion recognition in school-age children: the EmoHI test for hearing-impaired populations

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Traditionally, emotion recognition research has primarily used pictures and videos, while audio test materials are not always readily available or of good quality, which may be particularly important for studies with hearing-impaired listeners. Here we present a vocal emotion recognition test with pseudospeech productions from multiple speakers expressing three core emotions (happy, angry, and sad): the EmoHI test. Recorded with high sound quality, the test is suitable to use with populations of children and adults with normal or impaired hearing. Here we present normative data for vocal emotion recognition development in normal-hearing (NH) school-age children using the EmoHI test. Furthermore, we investigated cross-language effects by testing NH Dutch and English children, and tested the suitability of using the EmoHI test with hearing-impaired populations by presenting preliminary data from prelingually deaf Dutch children with cochlear implants (CIs). Our results show that NH children's performance improved significantly with age from the youngest group tested on (4-6 years: 48.9%, on average). However, NH children's performance did not reach adult-like values (adults: 94.1%) even for the oldest age group tested (10-12 years: 81.1%). Additionally, the effect of age on NH children's development did not differ across languages. All except one CI child performed at or above chance-level showing the suitability of the EmoHI test. In addition, 7 out of 14 CI children performed within the NH age-appropriate range, and even 9 out of 14 CI children did so when taking their age at CI implantation into account. However, CI children showed great variability in their performance which ranged from ceiling (97.2%) to below chance-level performance (27.8%) and could not be explained merely by chronological age. The strong and consistent development in performance with age, the lack of

significant differences across the tested languages for NH children, and the above-chance performance of most CI children affirm the usability and versatility of the EmoHI test.

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20 Abstract

21 Traditionally, emotion recognition research has primarily used pictures and videos, while audio
22 test materials are not always readily available or of good quality, which may be particularly
23 important for studies with hearing-impaired listeners. Here we present a vocal emotion
24 recognition test with pseudospeech productions from multiple speakers expressing three core
25 emotions (happy, angry, and sad): the EmoHI test. Recorded with high sound quality, the test is
26 suitable to use with populations of children and adults with normal or impaired hearing. Here we
27 present normative data for vocal emotion recognition development in normal-hearing (NH)
28 school-age children using the EmoHI test. Furthermore, we investigated cross-language effects
29 by testing NH Dutch and English children, and tested the suitability of using the EmoHI test with
30 hearing-impaired populations by presenting preliminary data from prelingually deaf Dutch
31 children with cochlear implants (CIs). Our results show that NH children's performance
32 improved significantly with age from the youngest group tested on (4-6 years: 48.9%, on
33 average). However, NH children's performance did not reach adult-like values (adults: 94.1%)
34 even for the oldest age group tested (10-12 years: 81.1%). Additionally, the effect of age on NH
35 children's development did not differ across languages. All except one CI child performed at or
36 above chance-level showing the suitability of the EmoHI test. In addition, 7 out of 14 CI children
37 performed within the NH age-appropriate range, and even 9 out of 14 CI children did so when
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44 Introduction

45 Development of emotion recognition in children has been studied extensively using visual
46 stimuli, such as pictures or sketches of facial expressions (e.g., Rodger et al., 2015), or
47 audiovisual materials (e.g., Nelson & Russell, 2011), and particularly in some clinical groups,
48 such as autistic children (e.g., Harms, Martin & Wallace, 2010). However, not much is known
49 about the development of vocal emotion recognition, even in typically developing children
50 (Scherer, 1986; Sauter, Panattoni & Happé, 2013). While children can recognize facial and vocal
51 emotions reliably and associate them with external causes already from the age of 5 years on
52 (Pons, Harris & de Rosnay, 2004), this ability nevertheless seems to continue to develop to adult-
53 like levels until late childhood (Tonks et al., 2007; Sauter, Panattoni & Happé, 2013). The
54 recognition of vocal emotions relies heavily on the perception of related vocal acoustic cues, such
55 as mean fundamental frequency (F0) and intensity, as well as fluctuations in these cues, and
56 speaking rate (Scherer, 1986). Based on earlier research on the development of voice perception
57 (Mann, Diamond & Carey, 1979; Nittrouer & Miller, 1997), children's performance may be
58 lower compared to adults due to differences in their weighting of acoustic cues and a lack of
59 robust representations of auditory categories. For instance, Morton and Trehub (2001) showed
60 that when acoustic cues and linguistic content contradict the emotion they convey, children
61 mostly rely on linguistic content to judge emotions, whereas adults mostly rely on affective
62 prosody. In addition, children and adults both are better at facial emotion recognition than vocal
63 emotion recognition (Nelson & Russell, 2011; Chronaki et al., 2015). All of these observations
64 combined indicate that the formation of robust representations for vocal emotions is highly
65 complex and possibly a long-lasting process even in typically developing children.

66 Research with hearing-impaired children has shown that they do not perform as well on
67 vocal emotion recognition compared to their normal-hearing (NH) peers (Dyck et al., 2004;
68 Hopyan-Misakyan et al., 2009; Nakata, Trehub & Kanda, 2012; Chatterjee et al., 2015). Hopyan-
69 Misakyan (2009) showed that 7-year-old children with cochlear implants (CIs) performed as well
70 as their NH peers on visual emotion recognition but scored significantly lower on vocal emotion
71 recognition. Visual emotion recognition generally seems to develop faster than vocal emotion
72 recognition (Nowicki & Duke, 1994; Nelson & Russell, 2011), particularly in hearing-impaired
73 children (Hopyan-Misakyan et al., 2009), which may indicate that visual emotion cues are
74 perceptually more prominent or easier to categorize than vocal emotion cues. For hearing-
75 impaired children, a higher reliance on visual emotion cues as compensation for spectro-
76 temporally degraded auditory input may be an effective strategy, as emotion recognition in daily
77 life is usually multimodal. However, it may lead to less robust auditory representations of vocal
78 emotions and knowledge about their acoustic properties. Wiefferink et al. (2013) suggested that
79 reduced auditory exposure and language delays may also lead to delayed social-emotional
80 development and reduced conceptual knowledge about emotions, which in turn result in a
81 negative impact on emotion recognition. This is also evidenced by CI children's reduced
82 differences in mean F0 cues and F0 variations in emotion production compared to their NH peers
83 (Chatterjee et al., 2019). The effects of conceptual knowledge on children's discrimination
84 abilities have also been shown earlier, for instance, in research on pitch discrimination (Costa-
85 Giomi & Descombes, 1996). Finally, also perceptual limitations, such as increased F0

86 discrimination thresholds (Deroche et al., 2014), may play a role in CI children's abilities to
87 recognize vocal emotions. Nakata, Trehub, and Kanda (2012) found that children with CIs
88 especially had difficulties with differentiating happy from angry vocal emotions. This finding
89 suggests that CI children primarily use speaking rate to categorize vocal emotions, as this cue
90 differentiates sad from happy and angry vocal emotions but is similar for the latter two emotions.
91 Therefore, hearing loss also seems to influence the weighting of different acoustic cues, and
92 hence likely also affects the formation of representations of vocal emotions.

93 Vocal emotion recognition also differs from visual emotion recognition due to the
94 potential influence of linguistic factors. Research regarding cross-language effects on emotion
95 recognition has also demonstrated the importance of auditory exposure on vocal emotion
96 recognition. Most studies have demonstrated a so-called 'native language benefit' showing that
97 listeners are better at recognizing vocal emotions produced by speakers from their own native
98 language than from another language. (Van Bezooijen, Otto & Heenan, 1983; Scherer, Banse &
99 Wallbott, 2001; Bryant & Barrett, 2008). This effect has been mainly attributed to cultural
100 differences (Van Bezooijen, Otto & Heenan, 1983), but also effects of language distance have
101 been reported (Scherer, Banse & Wallbott, 2001), i.e., differences in performance were larger
102 when the linguistic distance between the speakers' and listeners' native languages was larger.
103 Interestingly, Bryant and Barrett (2008) did not find a native language benefit for low-pass
104 filtered vocal emotion stimuli, which filtered out both the linguistic message and the language-
105 specific phonological information. Fleming et al. (2014) also demonstrated a similar native-
106 language benefit for voice recognition based on differences in phonological familiarity. For CI
107 children, reduced auditory exposure may also lead to reduced phonological familiarity, and
108 therefore also contribute to difficulties with the recognition of vocal emotions.

109 As most research on the development of emotion recognition has used visual or
110 audiovisual materials such as pictures or videos, good-quality audio materials are scarce. While
111 the audio quality may only have a small effect on NH listeners' performance, it may be
112 imperative for hearing-impaired listeners' vocal emotion recognition abilities, which have been
113 shown to relate to their self-reported quality of life (Luo, Kern & Pulling, 2018). Hence, we
114 recorded high sound quality vocal emotion recognition test stimuli produced by multiple speakers
115 with three basic emotions (happy, angry, and sad) that are suitable to use with hearing-impaired
116 children and adults: the EmoHI test. We aimed to investigate how NH school-age children's
117 ability to recognize vocal emotions develops with age and to obtain normative data for the
118 EmoHI test for future applications, for instance, with clinical populations. In addition, we tested
119 children of two different native languages, namely Dutch and English, to investigate potential
120 cross-language effects, and we collected preliminary data from Dutch prelingually deaf children
121 with CIs, to investigate the applicability of the EmoHI test to hearing-impaired children.
122

123 **Materials & Methods**

124 **Participants**

125 We collected normative data from fifty-eight Dutch and twenty-five English children between 4
126 and 12 years of age, and fifteen Dutch and fifteen English adults between 20 and 30 years of age
127 with normal hearing. All NH participants were monolingual speakers of Dutch or English and

128 reported no hearing or language disorders. Normal hearing (hearing thresholds at 20 dB HL) was
129 screened with pure-tone audiometry at octave-frequencies between 500 and 4000 Hz. In addition,
130 we collected preliminary data from fourteen prelingually deaf Dutch children with CIs between 4
131 and 16 years of age. The study was approved by the Medical Ethical Review Committee of the
132 University Medical Center Groningen (METc 2016.689). A written informed consent form was
133 signed by adult participants and the parents or legal guardians of children before data collection.
134

135 **Stimuli and Apparatus**

136 We made recordings of six native Dutch speakers producing two non-language specific
137 pseudospeech sentences using three core emotions (happy, sad, and angry), and a neutral emotion
138 (not used in the current study). All speakers were native monolingual speakers of Dutch without
139 any discernible regional accent and did not have any speech, language, or hearing disorders.
140 Speakers gave written informed consent for the distribution and sharing of the recorded materials.
141 To keep our stimuli relevant to emotion perception literature and suitable for usage across
142 different languages, the pseudospeech sentences that we used, *Koun se mina lod belam* [klaun sə
143 mina: lɔd be:lɑm] and *Nekal ibam soud molen* [ne:kɑl ibɑm sɑut mo:lən], were based on the
144 Geneva Multimodal Emotion Portrayal (GEMEP) Corpus materials by Bänziger, Mortillaro &
145 Scherer (2012). These pseudosentences are meaningful neither in Dutch nor in English, nor in
146 any other Indo-European languages. Speakers were instructed to produce the sentences in a
147 happy, sad, angry, or neutral manner using emotional scripts that were also used for the GEMEP
148 corpus stimuli (Scherer & Bänziger, 2010). We chose these three core emotions as previous
149 studies have reported that children first learn to identify happy, angry, and sad emotions,
150 respectively, followed by fear, surprise, and disgust (Widen & Russell, 2003), and hence we
151 could test children from very young ages. The stimuli were recorded in an anechoic room at a
152 sampling rate of 44.1 kHz.

153 We pre-selected 96 productions, including neutral productions, (2 productions x 2
154 sentences x 4 emotions x 6 speakers) and performed a short online survey with Dutch and
155 English adults to confirm that the stimuli were recognized reliably and to select the four speakers
156 whose productions were recognized best. Table 1 shows an overview of these four selected
157 speakers' demographic information and voice characteristics. The neutral productions and the
158 productions of the other two speakers were part of the online survey, and are available with the
159 stimulus set, but were not used in the current study to simplify the task for children. Our final set
160 of stimuli consisted of 36 experimental stimuli with three productions (one sentence repeated
161 once + the other sentence) per emotion and per speaker (3 productions x 3 emotions x 4 speakers)
162 as well as 4 practice stimuli with one production per speaker that were used for the training
163 session.

164

165

<insert Table 1>

166

167 **Procedure**

168 NH and CI children were tested in a quiet room at their home, and NH adults were tested in a
169 quiet testing room at the two universities. Since the present experiment was part of a larger

170 project on voice and speech perception (Perception of Indexical Cues in Kids and Adults
171 (PICKA)), data were collected from the same population of children and adults in multiple
172 experiments, see, for instance, Nagels et al. (in review). The experiment started with a training
173 session consisting of 4 practice stimuli and was followed by the test session consisting of 36
174 experimental stimuli. The total duration of the experiment was approximately 6 to 8 minutes. All
175 stimuli were presented to participants in a randomized order.

176 The experiment was conducted on a laptop with a touchscreen using a child-friendly
177 interface that was developed in Matlab (Fig. 1). The auditory stimuli were presented via
178 Sennheiser HD 380 Pro headphones for NH children and adults, and via Logitech Z200
179 loudspeakers for CI children. The presentation level of the stimuli was calibrated to a sound level
180 of 65 dBA. CI children were instructed to use the settings they most commonly use in daily life
181 and to keep the settings consistent throughout the experiment. In each trial, participants heard a
182 stimulus and then had to indicate which emotion was conveyed by clicking on one of three
183 corresponding clowns on the screen. Visual feedback on the accuracy of responses was provided
184 to motivate participants. Participants saw confetti falling down the screen after a correct response,
185 and the parrot shaking its head after an incorrect response. After every two trials, one of the
186 clowns in the back went one step up the ladder until the experiment was finished to keep children
187 engaged and to give an indication of the progress of the experiment.

188

189

<insert Figure 1>

190

191 Data analysis

192 NH children's accuracy scores were analyzed using the lme4 package (Bates et al., 2014) in R. A
193 mixed-effects logistic regression model with a three-way interaction between *language* (Dutch
194 and English), *emotion* (happy, angry, and sad), and *age* in decimal years, and random intercepts
195 per participant and per stimulus was computed to determine the effects of language, emotion, and
196 age on NH children's ability to recognize vocal emotions. We used backward stepwise selection
197 with ANOVA Chi-Square tests to select the best fitting model, starting with the full factorial
198 model, in lme4 syntax: `accuracy ~ language * emotion * age + (1|participant) + (1|`
199 `stimulus)`, and deleting one fixed factor at a time based on its significance. In addition, we
200 performed Dunnett's tests on the NH Dutch and English data with *accuracy* as an outcome
201 variable and *age group* as a predictor variable using the DescTools package (Signorell et al.,
202 2016) to investigate at what age NH Dutch and English children show adult-like performance.
203 Finally, we examined our preliminary data of CI children to investigate if they could reliably
204 perform the task.

205

206 Results

207 NH Dutch and English data

208 Figure 2 shows the accuracy scores of NH Dutch (left panel) and English (right panel)
209 participants as a function of their age (dots) and age group (boxplots). Model comparison showed
210 that the full model with random intercepts per participant and per stimulus was significantly
211 better than the full models with only random intercepts per participant [$\chi^2(1) = 393, p < 0.001$] or

212 only random intercepts per stimulus [$\chi^2(1) = 51.9, p < 0.001$]. Backward stepwise selection
213 showed that the best fitting and most parsimonious model was the model with only a fixed effect
214 of *age*, in lme4 syntax: `accuracy ~ age + (1|participant) + (1|stimulus)`. This model
215 did not significantly differ from the full model [$\chi^2(10) = 12.90, p = 0.23$] or any of the other
216 models while being the most parsimonious. Figure 2 shows the data of individual participants and
217 the median accuracy scores per age group for the NH Dutch and English participants. NH
218 children's ability to correctly recognize vocal emotions increased significantly as a function of
219 age [z-value = 8.91, estimate = 0.30, SE = 0.034, $p < 0.001$]. We did not find any significant
220 effects of language or emotion on children's accuracy scores. Finally, the results of the Dunnett's
221 tests showed that the accuracy scores of Dutch NH children of all tested age groups differed from
222 Dutch NH adults [4-6 years difference = -0.47, $p < 0.001$; 6-8 years difference = -0.31, $p < 0.001$;
223 8-10 years difference = -0.19, $p < 0.001$; 10-12 years difference = -0.15, $p < 0.001$], and the
224 accuracy scores of English NH children of all tested age groups differed from English NH adults
225 [4-6 years difference = -0.43, $p < 0.001$; 6-8 years difference = -0.27, $p < 0.001$; 8-10 years
226 difference = -0.20, $p < 0.001$; 10-12 years difference = -0.12, $p < 0.01$]. The mean accuracy
227 scores per age group and language are shown in Table 2.

228

229 <insert Figure 1>

230

231 <insert Table 2>

232

233 Preliminary data of CI children

234 Figure 3 shows the accuracy scores of Dutch CI children as a function of their chronological age
235 (left panel) and hearing age (right panel), the latter based on the age at which they received the
236 CI. The mean accuracy scores per age group are shown in Table 2. All except one CI child
237 performed at or above chance-level. Based on Figure 3, we can see that 7 out of 14 CI children
238 (50%) performed within the NH age-appropriate range. If we consider CI children's hearing age,
239 even 9 out of 14 CI children (64.3%) show performance within the NH age-appropriate range.
240 However, there is large variability in CI children's performance which varies from ceiling
241 (97.2%) to below chance-level performance (27.8%). The development in CI children's
242 performance with age does not seem to be as consistent as we found for NH children, which
243 suggests that their performance is not merely due to age-related development.

244

245 <insert Figure 3>

246

247 Discussion

248 Age effect

249 As shown by our results and the data displayed in Figure 2, NH children's ability to recognize
250 vocal emotions improved gradually as a function of age. In addition, we found that, on average,
251 even the oldest age group of 10- to 12-year-old Dutch and English children did not show adult-
252 like performance yet. The 4-year-old NH children that were tested performed at or above chance
253 level while adults generally showed near ceiling performance, indicating that our test covers a

254 wide range of age-related performances. Our results are in line with previous findings that NH
255 children's ability to recognize vocal emotions improves gradually as a function of age (Tonks et
256 al., 2007; Sauter, Panattoni & Happé, 2013). It may be that children require more auditory
257 experience to form robust representations of vocal emotions or rely on different acoustic cues
258 than adults, as was shown in research on the development of sensitivity to voice cues (Mann,
259 Diamond & Carey, 1979; Nittrouer & Miller, 1997). It is still unclear on which specific acoustic
260 cues children are basing their decisions and how this differs from adults. Future research using
261 machine-learning approaches may be able to further explore such aspects. Finally, the visual
262 feedback may have caused some learning effects, although the correct response was not shown
263 after an error, and learning would pose relatively high demands on auditory working memory
264 since there were only three productions per speaker and per emotion presented in a randomized
265 order.

266

267 **Language effect**

268 Comparing data from NH children from two different native languages, we did not find any
269 cross-language effects between Dutch and English children's development of vocal emotion
270 recognition, even though the materials were produced by Dutch native speakers. Earlier research
271 has demonstrated that although adults are able to recognize vocal emotions across languages,
272 there still seems to be a native language benefit (Van Bezooijen, Otto & Heenan, 1983; Scherer,
273 Banse & Wallbott, 2001; Bryant & Barrett, 2008). Listeners were better at recognizing vocal
274 emotions that were produced by speakers of their native language than another language.
275 However, it should be noted that five (Scherer, Banse & Wallbott, 2001; Bryant & Barrett, 2008)
276 and nine (Van Bezooijen, Otto & Heenan, 1983) different and more complex emotions were used
277 in these studies which likely poses a considerably more difficult task than differentiating three
278 basic emotions. In addition, the lack of a native language benefit in our results may also be due to
279 the fact that Dutch and English are phonologically closely related languages. This idea is also in
280 line with the language distance effect (Scherer, Banse & Wallbott, 2001) and phonological
281 familiarity effects (Bryant & Barrett, 2008). We are currently collecting data from Turkish
282 children and adults to investigate whether there are any detectable cross-language effects for
283 typologically and phonologically more distinct languages.

284

285 **CI children**

286 The preliminary data from the CI children show that only one CI child performed below chance-
287 level, which shows that almost all CI children could reliably perform the task and the task seems
288 sufficiently easy to capture their vocal emotion recognition abilities. In addition, 7 out of 14 CI
289 children performed within the NH age-appropriate range, and if we consider CI children's
290 hearing age instead of their chronological age, even 9 out of 14 CI children fell within that range.
291 Vocal emotion recognition performance was generally lower in CI children compared to NH
292 children and did not seem to follow the same consistent improvement trajectory that we found for
293 NH children. The general lower performance of CI children and the lack of a strong relation
294 between CI children's performance and chronological or hearing age is in line with findings from
295 previous studies (Hopyan-Misakyan et al., 2009; Nakata, Trehub & Kanda, 2012; Chatterjee et

296 al., 2015). The variability was large and covered the entire performance range, which also
297 demonstrates that the EmoHI test can capture a wide range of performance. In addition to age, CI
298 children's performance seems to be heavily affected by differences in social-emotional
299 development causing reduced conceptual knowledge on emotions and their properties
300 (Wiefferink et al., 2013; Chatterjee et al., 2019), and differences in their hearing abilities causing
301 perceptual limitations (Nakata, Trehub & Kanda, 2012). For instance, individual differences in CI
302 children's vocal emotion recognition abilities may also rely on their F0 discrimination thresholds,
303 which are generally higher and more variable in CI children compared to NH children (Deroche
304 et al., 2014). We are currently working on an in-depth analysis of CI children's data, as their
305 performance seems to also be largely related to their hearing abilities (Nakata, Trehub & Kanda,
306 2012), an acute effect, and social-emotional interaction and development (Wiefferink et al.,
307 2013), a long-term effect, in addition to age.

308

309 **Conclusions**

310 The results of the current study provide baseline normative data for the development of vocal
311 emotion recognition in typically-developing, school-age children with normal hearing using the
312 EmoHI test. Our results show that there is a large but relatively slow and consistent development
313 in children's ability to recognize vocal emotions. Furthermore, the preliminary data from the CI
314 children show that they seem to be able to carry out the EmoHI test reliably, but the improvement
315 in their performance as a function of age was not as consistent as for NH children. The evident
316 development observed in NH children's performance as a function of age and the generalizability
317 of performance across the tested languages show the EmoHI test's suitability across different
318 ages and potentially also across different languages. Additionally, the above-chance performance
319 of most CI children and the high sound quality stimuli also evidence that the EmoHI test is
320 suitable to use for testing hearing-impaired populations.

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331

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Figure 1

The experiment interface of the EmoHI test.

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Figure 2

Emotion recognition in NH children and adults.

Accuracy scores of NH Dutch and English children and adults for the EmoHI test per age group and per language (Dutch in the left panel; English in the right panel). The dots show individual data points at participants' age (Netherlands (NL): $N_{\text{children}} = 58$, $N_{\text{adults}} = 15$; United Kingdom (UK) : $N_{\text{children}} = 25$, $N_{\text{adults}} = 15$). The boxplots show the median accuracy scores per age group, and the lower and upper quartiles. The whiskers indicate the lowest and highest data points within plus or minus 1.5 times the interquartile range.

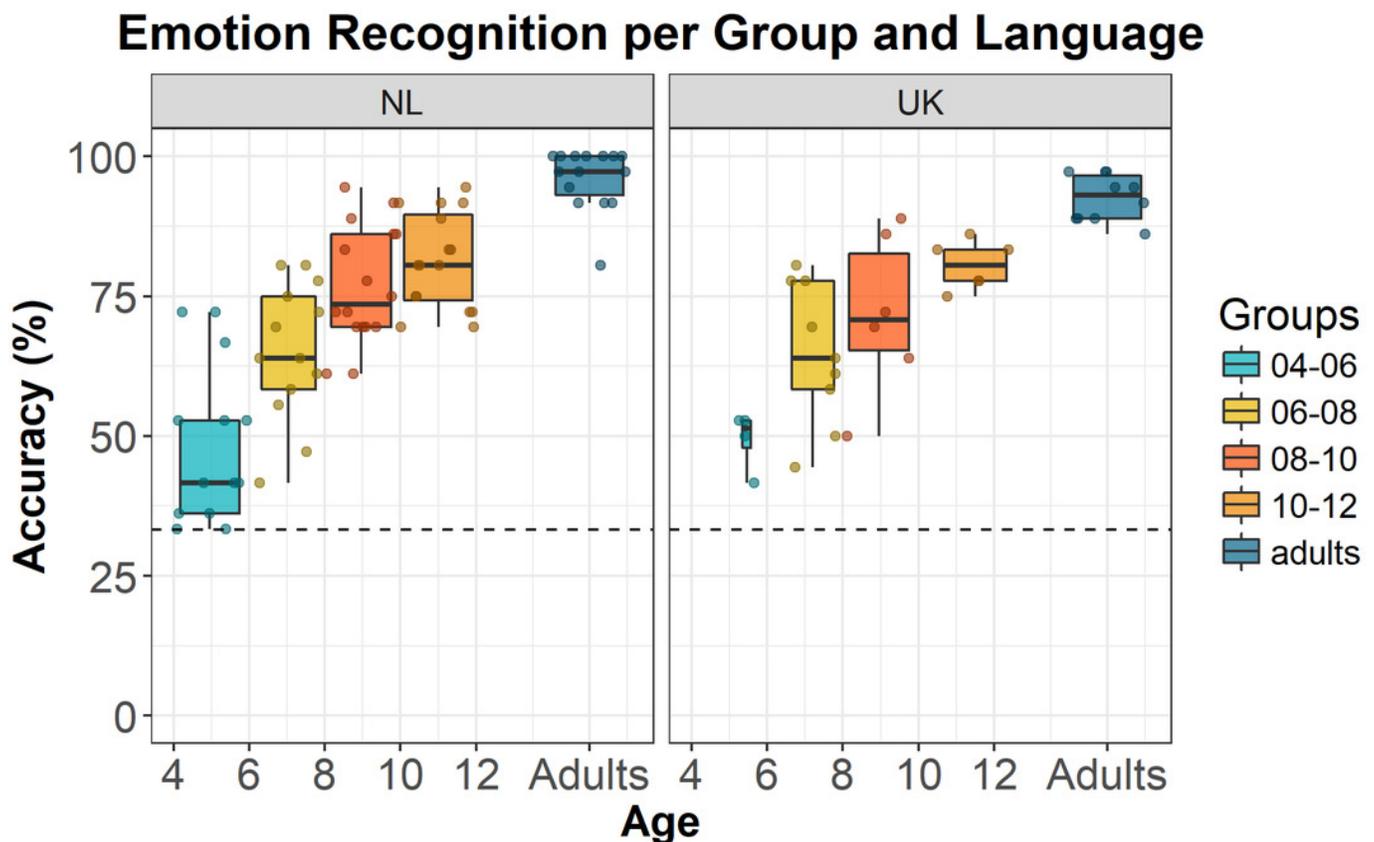


Figure 3

Emotion recognition in Dutch CI children.

Accuracy scores of Dutch CI children (N = 14) for the EmoHI test per age group. The dots show individual data points at Dutch CI children's chronological age (left panel) and at their hearing age (right panel). The boxplots show NH Dutch children's median accuracy scores per age group, and the lower and upper quartiles, reproduced from Figure 2. The whiskers indicate the lowest and highest data points of NH Dutch children within plus or minus 1.5 times the interquartile range.

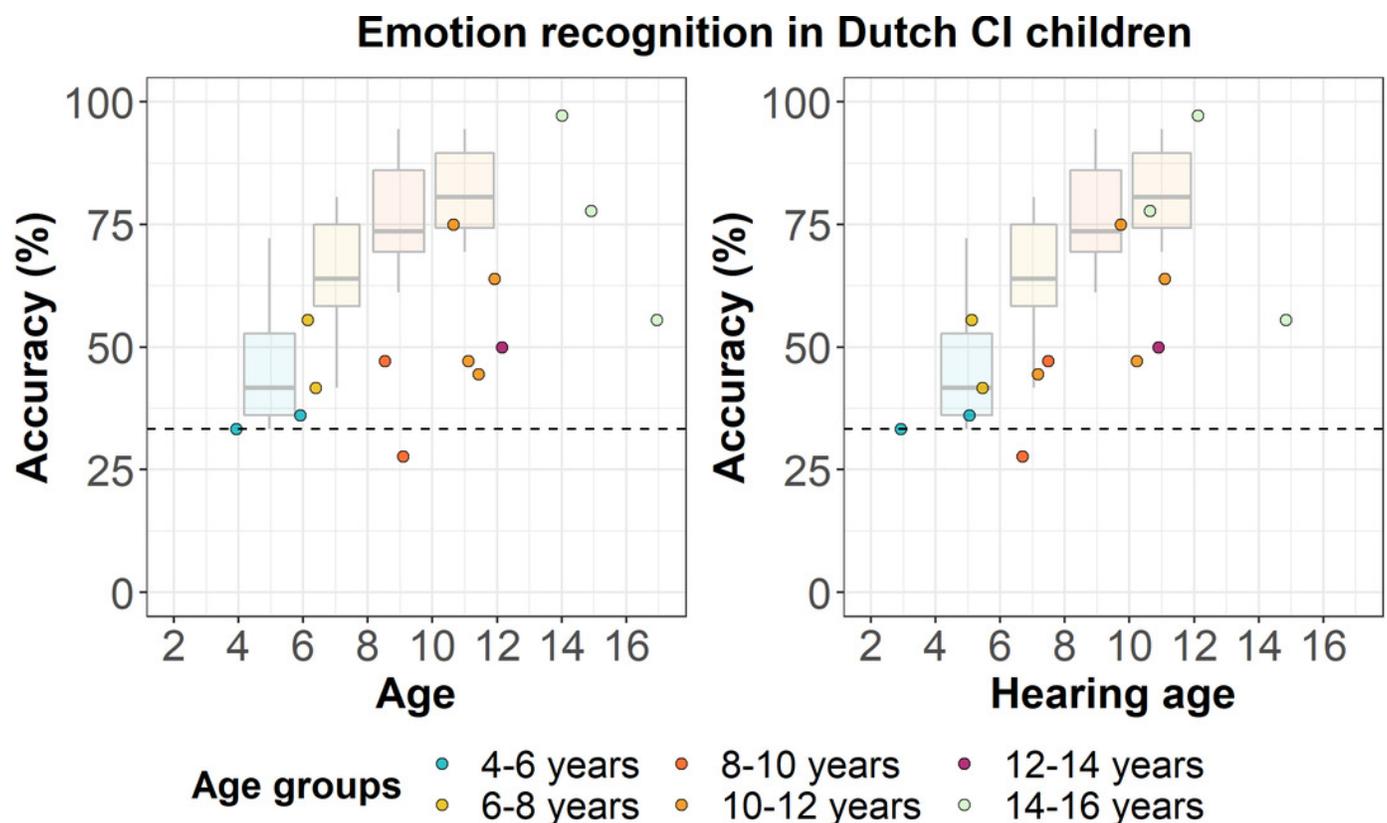


Table 1 (on next page)

Overview of the speakers' voice characteristics.

Table 1: Overview of the speakers' voice characteristics.

Speaker	Age	Gender	Height	Mean F0	F0 range
T2	36	F	1.68 m	302.23 Hz	200.71 Hz - 437.38 Hz
T3	27	M	1.85 m	166.92 Hz	100.99 Hz - 296.47 Hz
T5	25	F	1.63 m	282.89 Hz	199.49 Hz - 429.38 Hz
T6	24	M	1.75 m	167.76 Hz	87.46 Hz - 285.79 Hz

Table 2 (on next page)

Overview of the mean accuracy scores for all participant groups.

Table 2: Overview of the mean accuracy scores for all participant groups.

Age groups	Participant groups		
	<i>Dutch NH</i>	<i>English NH</i>	<i>Dutch CI</i>
4-6 years			
6-8 years	65.2%	64.8%	48.6%
8-10 years	76.7%	71.8%	37.5%
10-12 years	81.2%	80.6%	57.6%
12-14 years	-	-	50.0%
14-16 years	-	-	76.9%
Adults	96.1%	92.0%	-