Poor neural and perceptual phoneme discrimination during acoustic variation in dyslexia

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Whereas natural acoustic variation in speech does not compromise phoneme discrimination in healthy adults, it was hypothesized to be a challenge for developmental dyslexics. We investigated dyslexics’ neural and perceptual discrimination of native language phonemes during acoustic variation. Dyslexics and non-dyslexics heard /æ/ and /i/ phonemes in a context with f variation and then in a context without it. Mismatch negativity (MMN) and P3a responses to phoneme changes were recorded with electroencephalogram to compare groups during ignore and attentive listening. Perceptual phoneme discrimination in the variable context was evaluated with hit-ratios and reaction times. MMN/N2bs were diminished in dyslexics in the variable context. Hit-ratios were smaller in dyslexics than controls. MMNs did not differ between groups in the context without variation. These results suggest that even distinctive vowels are challenging to discriminate for dyslexics when the context resembles natural variability of speech. This most likely reflects poor categorical perception of phonemes in dyslexics. Difficulties to detect linguistically relevant invariant information during acoustic variation in speech may contribute to dyslexics’ deficits in forming native language phoneme representations during infancy. Future studies should acknowledge that simple experimental paradigms with repetitive stimuli can be insensitive to dyslexics’ speech processing deficits.

Adequate language skills are essential for human communication, but also for cognitive development and academic achievement. Language development starts when the infant is exposed to native language speech and learns to extract meaningful units like phonemes and words from it. This learning is challenging as the acoustical features of phonemes differ between individual speakers, and within each speaker due to, for example, prosodic variation and surrounding phonemes. In order to learn and efficiently perceive the phoneme categories of one’s native language¹, the human brain must tolerate this variability while still being sensitive to differences between phonemes. Studies on event-related potentials Event-related potentials (ERPs) recorded with magnetoencephalography (MEG) and electroencephalography (EEG) have suggested that not only adults² but even newborn infants³ might have this ability. When presented with a sound stream of different native language phonemes uttered by several speakers, mismatch negativity (MMN) was found in adults and newborns to phoneme changes (its magnetic counterpart MMNm² and its infant counterpart mismatch response, MMR³). This was interpreted as evidence of neural extraction of phoneme categories²,³.

Although the brain of typically developing individuals automatically and effortlessly discriminates changes in phonemes even in a variable context, this ability can be compromised in various developmental disorders. The most prevalent, heritable language-related developmental disorder is developmental dyslexia that hampers the acquisition of a fluent reading skill⁴–⁷, affecting up to 5–17% of children⁶,⁷. Dyslexia stems from various neurodevelopmental structural and functional abnormalities⁴–⁸ and is currently thought to be mainly based on a deficit in forming robust phonological representations during native-language acquisition⁵,⁶,⁸,¹². Alternatively or additionally, dyslexia might result from poor access to these representations¹¹,¹³.

The phonological processing deficit hypothesis in dyslexia has gained support from studies using the MMN as an index of speech-sound representations and sound-discrimination accuracy⁴–⁶,¹⁴. The MMN is an ERP component with a negative polarity elicited 100–250 ms after stimulus change onset in a repetitive sound stream reflecting pre-attentive sound discrimination¹⁷,¹⁸. When the deviance is salient enough to attract the listener’s attention,
the MMN is typically followed by a negative N2b, these two responses forming an “N2” response\(^{19}\), and a positive P3a component\(^{20,21}\). The MMN is enhanced to native versus foreign language phonemes, reflecting memory traces of the native-language speech sounds, i.e., phoneme representations\(^{22,23}\). While robust MMNs are associated with well-formed phonological representations and language skills, we\(^{24}\), absent, delayed, or atypically lateralized MMN responses are connected with language disorders\(^{16,24}\). Furthermore, these abnormal MMNs may predict future language and reading abilities\(^{24,26}\), suggesting that they have a strong association with language-related skills.

In addition to diminished MMN amplitudes to changes in speech sounds\(^{27–31}\), dyslexics have problems in later, attentive stages of speech processing. For example, whereas dyslexics were found to discriminate large duration changes in pseudowords in an intact manner as evidenced by normal-like MMN amplitudes, they failed to identify their position in an attentive detection task, as reflected by an absent N2b response\(^{32}\). Furthermore, unlike control participants, dyslexics failed to demonstrate a P300/P3a enhancement to phoneme changes in words and pseudowords, interpreted to reflect attentional deficits in phoneme detection in dyslexia\(^{33}\).

Dyslexia has also been associated with broader auditory difficulties, namely in processing acoustic changes in non-speech sounds\(^{34,35}\). These studies have suggested that small stimulus differences are particularly challenging for the auditory system of dyslexic individuals\(^{36,37,38}\). Furthermore, temporal or order changes in sound pairs elicited MMNs with normal-like amplitudes in dyslexic participants, whereas adding sounds around the pairs diminished the MMN more in dyslexic than control participants\(^{39,40}\). This was interpreted as a sensory memory deficit involving elevated masking effects of the surrounding sounds in dyslexics\(^{35}\). The result can also be considered as compromised auditory processing in dyslexia when the context is complex and variable. Accordingly, in a so-called multi-feature paradigm with several auditory deviants presented in the same experiment, dyslexics demonstrated smaller MMNs than in a simple, repetitive oddball paradigm\(^{41}\). The authors concluded that the acoustic variation in a multi-feature paradigm compromises dyslexics’ processing and can thus provide a sensitive measure for the auditory deficits in dyslexia.

Even though paradigms with a variable sound context, resembling natural speech, may thus be more sensitive to tap into the auditory deficits in dyslexia, most neurophysiological studies have so far investigated the neural basis of dyslexia with repetitive stimuli. MMN studies considered to tap phoneme discrimination have typically included single exemplars of two phonemes, one serving as the repetitive standard and the other one as the rare deviant stimulus (e.g., /da/ vs. /ga/)\(^{31}\). In the light of results presented above, such stimulation might fail to identify their position in an attentive detection task, as reflected by an absent N2b response\(^{32}\). Furthermore, unlike control participants, dyslexics failed to demonstrate a P300/P3a enhancement to phoneme changes in words and pseudowords, interpreted to reflect attentional deficits in phoneme detection in dyslexia\(^{33}\).

The aim of the present study was to determine neural and perceptual phoneme processing in dyslexia in a speech sound context with continuous variation. We used very distinct vowels, Finnish /i/-/æ/ presented in pairs /i/-/i/ or /i/-/æ/ with acoustic variation accomplished by presenting the pairs from several predefined frequency bands\(^{42}\), levels of variable context mimicking natural speech (e.g., speaker differences). The paradigm also included another change type, which was not included in the analyses of the present study. MMN and P3a were recorded to the deviant stimulus (from /i/ to /æ/), from dyslexics and non-dyslexic controls during ignore and attentive listening conditions (VariableIgnore and VariableAttend, respectively). During attentive listening, the MMN was expected to be followed and/or overlapped by N2b, and therefore two different latency windows were used to try to differentiate between the two responses: one for MMN, and one for MMN/N2b. Participants were also asked about their explicit awareness of the nature of the stimuli in the variable context, both after the VariableIgnore condition, and after VariableAttend condition during a short familiarization sequence (VariableFamiliarization). Perceptual phoneme discrimination was studied separately in the variable context, quantified as hit-ratios and reaction times to phoneme changes. At the end of the experiment, we also presented the vowels without fo-variation (constant context) in an ignore condition (labeled: ConstantIgnore). The specific research questions were: (1) is neural and perceptual phoneme discrimination compromised in a variable auditory context in dyslexia, (2) do dyslexics have difficulties both in attentive and pre-attentive listening conditions, and (3) is neural phoneme discrimination compromised in a constant auditory context in dyslexia.

While dyslexics have problems in discriminating small sound differences in simple contexts, it can be predicted based on earlier findings\(^{45}\) that even quite salient sound differences might be challenging for them in a more variable context resembling natural speech. Accordingly, we expected no or small group differences in the neural discrimination of the large phoneme difference in ConstantIgnore condition. However, when presented in an acoustically variable context, we predicted poorer phoneme discrimination in dyslexic than typically reading participants, evident as smaller MMN/N2b amplitudes in both VariableIgnore and VariableAttend conditions as well as lower hit-ratios and longer reaction times. Since an earlier study showed attentional deficits in phoneme processing in dyslexics\(^{31}\), we also expected a diminished P3a in dyslexic participants in ignore and attentive listening conditions.

Results

Neural phoneme discrimination. The ERP waves to standard /i/-/i/ and deviant /i/-/æ/ phoneme pairs are shown in Fig. 1, subtraction curves illustrating the MMN/N2b and P3a responses in Fig. 2, and scalp distributions of MMN/N2b and P3a responses in Fig. 3. In VariableIgnore, phoneme changes elicited a statistically significant MMN and P3a in both groups (one-sample t-tests reported in Table 1). According to group effects in repeated-measures analyses of variance (RM-ANOVAs), MMN amplitude was statistically significantly smaller in
In VariableAttend, phoneme changes elicited a statistically significant MMN and an MMN/N2b in both groups (Table 1). According to a group effect in the RM-ANOVA, MMN/N2b amplitude was statistically significantly smaller in dyslexics than controls, F(1,36) = 6.67, p = 0.01, ηp² = 0.16. No significant group differences were found for the MMN (p = 0.11) or P3a amplitude (p = 0.12).

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In **ConstantIgnore**, phoneme changes elicited a statistically significant MMN and a P3a in both groups (Table 1). There were no statistically significant group differences in RM-ANOVA (for MMN, $p = 0.58$; for P3a, $p = 0.13$).

**Phoneme perception in variable context.** Most participants in both dyslexic and control groups demonstrated explicit awareness of the phoneme change, as they could verbally describe the phoneme change after hearing it in **VariableIgnore** and then in a short familiarization period of attentive listening (**VariableFamiliarization**), at least to some extent (Table 2). There were no statistically significant group differences in the scores given to their verbal responses (independent-samples Mann-Whitney U tests after **VariableIgnore** $p = 0.30$, after **VariableFamiliarization** $p = 0.20$).

Both groups performed above chance level in behavioral detection of the phoneme changes in **VariableAttend** (one-sample t-tests reported in Table 3). Dyslexics had statistically significantly lower hit-ratios than controls (independent-samples Mann-Whitney U test, $U = 98.50$, $p = 0.03$), whereas no group differences were found for reaction times ($p = 0.96$).

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**Figure 3.** Voltage maps showing scalp distributions of MMN, MMN/N2b, and P3a mean amplitudes on the defined latency windows in dyslexic and controls in the three sequences. Ten control participants’ data from the variable paradigm were reported in44.
Discussion

The present study demonstrated deficient neural discrimination of phoneme changes in dyslexia in a variable auditory context, evident in the MMN amplitude in the ignore listening condition (VariableIgnore) as well as in the MMN/N2b amplitude in the attentive listening condition (VariableAttend). In addition, there was a trend of a diminished P3a in the dyslexic compared to control group (in the VariableIgnore condition). Dyslexics were also less accurate than controls in behavioral detection of the phoneme changes in the VariableAttend condition. In contrast, no significant group differences were observed in the MMN or P3a amplitudes when the phoneme change was presented in the ConstantIgnore condition without acoustic variation. These findings demonstrate a marked deficit in dyslexics’ ability to neurally and perceptually discriminate between acoustically distinctive native language phonemes in the presence of phoneme variation, consistent with our hypothesis. We propose that these results offer evidence for neural level categorical phoneme processing deficits that may underlie the reading problems in dyslexia.

| Condition       | Response | Time window | Group    | Peak latency (ms) | Mean amplitude (μV) |
|-----------------|----------|-------------|----------|-------------------|---------------------|
| VariableIgnore  | MMN      | 110–160     | Dyslexics| 130.56 (13.70)    | −1.35 (0.87)***     |
|                 |          |             | Controls | 135.16 (16.20)    | −2.06 (1.09)***     |
| P3a             |          | 205–255     | Dyslexics| 230.60 (25.64)    | 2.45 (1.45)***      |
|                 |          |             | Controls | 227.15 (19.45)    | 3.18 (1.44)***      |
| VariableAttend  | MMN      | 110–160     | Dyslexics| −1.74 (1.02)***   |                     |
|                 |          |             | Controls | −2.29 (1.11)***   |                     |
| MMN/N2b         |          | 130–180     | Dyslexics| 152.04 (33.65)    | −1.62 (1.08)***     |
|                 |          |             | Controls | 152.73 (30.78)    | −2.72 (1.40)***     |
| P3a             |          | 240–290     | Dyslexics| 263.58 (37.89)    | 1.53 (1.52)**       |
|                 |          |             | Controls | 258.20 (34.45)    | 2.60 (2.17)***      |
| ConstantIgnore  | MMN      | 110–160     | Dyslexics| 129.92 (10.74)    | −2.22 (1.09)***     |
|                 |          |             | Controls | 139.70 (35.03)    | −2.39 (1.33)***     |
| P3a             |          | 205–255     | Dyslexics| 235.61 (17.46)    | 2.72 (1.32)***      |
|                 |          |             | Controls | 228.08 (12.37)    | 3.41 (1.83)***      |

Table 1. The MMN, MMN/N2b and P3a time windows (ms), peak latencies (ms), and mean amplitudes (μV) in VariableIgnore, VariableAttend, and ConstantIgnore on Fz electrode.

| After VariableIgnore | Group    | 0 points | 1 point | 2 points | Total |
|----------------------|----------|----------|---------|----------|-------|
| Dyslexics            | 6        | 6        | 6       | 18       |
| Controls              | 5        | 4        | 11      | 20       |

| After VariableFamiliarization | Group    | 0 points | 1 point | 2 points | Total |
|-------------------------------|----------|----------|---------|----------|-------|
| Dyslexics                    | 3        | 7        | 8       | 18       |
| Controls                      | 2        | 4        | 14      | 20       |

Table 2. Verbal response scores. Note: The table shows number of participants who demonstrated no awareness (0 points), some awareness (1 point), and complete awareness (2 points) of the vowel deviant after VariableIgnore (ignore condition) and VariableFamiliarization (attentive condition). Ten control participants’ data were reported in44.

| Sequence          | Group    | H, %     | FA, %    | HR, %     | RT, ms |
|-------------------|----------|----------|----------|-----------|--------|
|                   |          | Mean     | Range    | Mean      | Range  |
| VariableFamiliarization        | Dyslexics| 77.2 (28.4)| 5.2 (5.7)| 69.7 (29.6)| 0.0–100.0| 587.5 (233.7)| 308.7–1073.4|
|                               | Controls | 97.2 (6.1)| 4.5 (6.9)| 80.1 (22.0)| 42.9–100.0| 521.3 (118.4)| 374.6–791.2 |
| VariableAttend         | Dyslexics| 86.3 (22.8)| 4.4 (8.6)| 78.6 (28.8)***| 11.7–100.0| 460.3 (88.2)| 321.0–672.9 |
|                       | Controls | 99.2 (2.0)| 2.9 (9.9)| 92.9 (20.6)***| 21.1–100.0| 453.7 (72.4)| 342.0–596.0 |

Table 3. Mean hit (H) and false alarm (FA) percentages, hit-ratios (HR), and reaction times (RT) during VariableFamiliarization and VariableAttend. Note: Standard deviation is in parentheses. Hit percentages are calculated as hits per targets and false alarm percentages as false alarms per standards. Hit-ratios in VariableAttend differing statistically significantly from chance-level (10%) are marked with asterisks. Ten control participants’ data were reported in44. *In VariableFamiliarization, the instruction was to react to both deviant types, and thus hit-ratio was calculated as hit-% per button presses that were not hits to the other deviant (rule violation). No statistical tests were conducted for this sequence. **One dyslexic participant demonstrated an extremely low hit percentage in VariableAttend despite good performance in VariableFamiliarization. This was interpreted as a misunderstanding of task instructions and the data of that participant in VariableAttend was omitted from analyses. ***p < 0.001, in one-sample t-tests against chance-level (10.0). All tests survive the Bonferroni-corrected critical p-value of 0.01.
Acoustic variation is an essential part of natural speech due to, e.g., differences between speakers and prosodic changes. Previous work has shown that it does not compromise neural auditory processing of native language speech sounds in healthy adults and newborns\textsuperscript{23,44}, interpreted as categorical phoneme processing in adults and a readiness to these functions at birth. However, in light of our results, such variation may pose a challenge to auditory processing in dyslexics, as indicated by their diminished MMN/N2b in the VariableIgnore and VariableAttend but not in the ConstantIgnore condition. Discriminating large acoustic differences in constant contexts is known to be less affected or even normal-like in dyslexia\textsuperscript{35}.

Settings with high acoustic variation are more likely to require categorical phoneme processing than ones with repetitive stimulation, and thus, our results could reflect compromised categorical phoneme processing\textsuperscript{46–49}, being in line with the allophonic perception theory of dyslexia\textsuperscript{43,45,46}. According to the theory, the categorical perception difficulty in dyslexia is associated with a heightened sensitivity to differences between allophones, variants of phonemes that still belong to the same phoneme category in a given language\textsuperscript{33,45,46}. The allophonic perception theory of dyslexia (in at-risk children\textsuperscript{47}; in dyslexic children\textsuperscript{48}) has been tested by recording MMN to a within-category deviant (allophonic contrast: an allophone of the same phoneme), and to a between-category deviant (phonemic contrast: different phoneme). The results demonstrated neural discrimination of within-category deviants only in dyslexics\textsuperscript{49} or enhanced discrimination of between-category deviants in controls\textsuperscript{47,48}. In one study, the MMN findings were also paralleled by behavioral results showing that Mandarin-speaking dyslexic children were deficient in an identification task presenting lexical tones as a continuum (exemplars of the same lexical tones were presented in the MMN paradigm\textsuperscript{49}).

Based on the allophonic perception theory, the present results may also have important implications for understanding the developmental trajectory of dyslexia. During early language development, certain allophonic features are grouped together to make language-specific neural representations\textsuperscript{4,45,49}. Should this development not succeed, the result could be the core dysfunction in dyslexia: weak formation of accurate phoneme representations\textsuperscript{8,11,12}. Future research in infants at familial risk for dyslexia should investigate whether their neural phoneme discrimination ability is compromised in variable acoustic contexts that most likely call for categorical processing. If this deficit is associated with phonological problems later in development, it would support the association suggested above.

Whereas the results of the present experiment have been interpreted to be in line with the allophonic theory of dyslexia, another promising theoretical framework for them stems from the procedural learning hypothesis of dyslexia and related language disorders (e.g.\textsuperscript{50}). Gabay et al. have demonstrated that dyslexics have difficulties in incidental learning of auditory categories and statistical regularities\textsuperscript{51,52}, and suggested that these could indicate broad implicit (or procedural) learning problems that may be the underlying cause for the poor acquisition of native language phoneme categories in dyslexia. Future research will show, whether the dyslexics’ deficits in processing variable auditory information in the present study stem from general challenges in implicit or categorical processing, or from anomalies more specific to speech and language networks of the brain\textsuperscript{14}.

When interpreting the constant context results of our study, it is also relevant to note the fixed order of the experimental sequences, with the VariableIgnore and VariableAttend conditions always presented prior to the ConstantIgnore condition. The reason for this choice was the large and salient acoustical difference between the naturally uttered /i/ and /æ/ phonemes in the ConstantIgnore condition. Had it been presented earlier during the experiment, the stimuli would have caught the participants’ attention and could have aided the processing of the phoneme change in the following Variable conditions. Due to the fixed order of sequences, a learning effect in the dyslexic but not the control group (e.g., due to a ceiling effect) during the experiment could explain or contribute to the lack of group difference in the ConstantIgnore condition. This explanation is, however, unlikely for several reasons. Firstly, the phoneme contrast chosen for the study has a large acoustic difference, processing of which should be little affected by dyslexia based on previous work\textsuperscript{35}. Secondly, dyslexics have been found to have specific difficulties in neural auditory learning\textsuperscript{33–35}. Even so, due to the possibility of, for example, learning or fatigue effects in the ConstantIgnore condition, the neural responses in the Constant and Variable conditions were not directly statistically compared in this study.

Our results showing diminished MMN/N2b responses among dyslexics also during attentive listening are in line with our hypothesis and a previous study showing problems in dyslexics’ neural auditory discrimination also at the attentive processing level, evidenced by an absent N2b response to vowel duration changes in dyslexics\textsuperscript{42}. Indeed, by visual inspection of the ERP waveforms in Fig. 2, it seems that the N2b response might be absent in the dyslexic group of the present study. The results of the statistical tests support this by showing a significant group difference at the MMN/N2b latency but not at the earlier MMN latency. It is noteworthy that during the VariableAttend condition, the participants were instructed to detect and respond to another deviant type, namely, violations of a complex rule in the auditory stream. A demanding primary task may diminish discriminative responses to the unattended deviants (e.g., P3a\textsuperscript{49}), possibly particularly in the dyslexic group if the task was more demanding for them. This could even explain the lack of an MMN enhancement or an N2b in the dyslexic group in the VariableAttend condition. However, our finding on impaired perceptual discrimination of the phoneme changes is compatible with the interpretation of a genuine deficit in attentive processing of the phoneme changes in a variable context.

The current study also found an insignificant trend for the P3a amplitude to be diminished in dyslexics in the VariableIgnore condition, consistent with a previous study\textsuperscript{33}. This reduced P3a amplitude, indicating poor attention shifting to changes, might result from insufficient change discrimination as suggested by the diminished MMN in these participants. While this insignificant effect had a reasonable effect size, the robustness of this finding should be confirmed by future research.

As expected, both dyslexics and controls could verbally describe the phoneme change in the acoustically variable context when queried about them after stimulus presentation, with no statistically significant differences in response scores between the groups. The result is not surprising, as a failure to detect them would indicate severe
hearing- or language-related difficulties, not reported by the dyslexics of the present study. Similarly, behavioral detection of the phoneme changes in the variable context as indicated by hit-ratios during Variable Attend condition was clearly above chance level in both groups. However, dyslexics were significantly less accurate than controls in phoneme change detection, which emerged as a lower hit rate but not in the reaction time. Thus, the compromised processing of native language phonemes in a variable context in dyslexia was evident even at the perceptual level, which is rather striking when taking into account the large acoustic difference between the two vowels. Perhaps dyslexics’ difficulties in correctly reacting to deviant phonemes were due to the requirement to rapidly press a button to them when they occurred among stimuli presented with a rather fast pace, which is challenging to their auditory system.

The present results highlight the huge challenge of normal speech listening conditions for the speech system of dyslexic individuals: in a variable auditory context mimicking natural variability of speech, dyslexics detect poorly even the most salient phoneme differences. This may even stem from an innate difficulty in perceiving or implicitly adopting auditory categories, either in speech or more generally in complex (auditory) material. This difficulty could compromise the acquisition of native language phoneme representations during language learning in infancy, and thus underlie the phonological deficits that are considered the core difficulties in dyslexia.

The results also suggest that simple experimental paradigms with repetitive stimuli can be insensitive to the difficulties underlying developmental dyslexia. This should be taken into account in future neurophysiological studies aiming to find out which processes are intact and which ones are deficient in dyslexics. This is highly relevant in order to find the optimally sensitive markers of language and reading disorders in different age and severity groups, which is a major challenge in the field.

Methods

Participants. The study included altogether 39 participants; one participant was excluded due to having absolute pitch. The participants in the dyslectic group (n = 18, nine males, mean age 32.5 years, SD 8.9 years) had to have their reading speed or accuracy below one SD from the population mean in at least two out of three reading tests: word list reading, pseudoword list reading, and reading aloud a narrative text (standardized based on a control data). Most participants (17 out of 18) were least 2 SD below the population mean in at least one reading test. Second, their symptoms had to date back to childhood (based on an interview or the Adult Reading History Questionnaire, ARHQ). The control group participants reported no history of reading difficulties (n = 20, 10 males, mean age 29.5 years, SD 7.9 years). All participants reported being right handed, native monolingual Finnish speakers with normal hearing, normal or corrected-to-normal vision, without other neurological or psychiatric conditions than dyslexia in the dyslexic group. Attention-related impairments were screened for with Adult ADHD Self-Report Scale Symptom Checklist (ASRS-v1.1). The control and dyslexic groups did not differ statistically significantly in age, gender distribution, or education level (chi square test for gender $p = 0.28$, and for education level $p = 0.47$; independent samples t-test for age $p = 0.28$).

The participants gave a written informed consent and received a compensation for their participation (vouchers for cultural or exercise activities). Ethical approval was received from the University of Helsinki Review Board in Humanities and Social and Behavioural Sciences, and the study was conducted in accordance with the declaration of Helsinki. Part of the data of 10 control participants (approximately 26% overlap in the participant sample) were also reported in a previous study.

Experimental stimuli and paradigms. The stimuli were Finnish phonemes /i/ and /æ/ uttered by a female Finnish native speaker, chosen based on their large acoustic difference and edited with Praat and Adobe Audition CS6. Build 708 (Adobe Systems Inc., California, USA). Sound intensity levels were root-mean-square (RMS) normalized between the phonemes, and the phonemes were cut from the end with natural attack retained. Audition CS6 5.0. Build 708 (Adobe Systems Inc., California, USA). The phonemes were transposed to seven frequency levels one to three semitones lower (174.3, 184.6, 195.4 Hz) and one to four semitones higher (217.8, 229.7, 242.5, and 256.2 Hz) than the natural level. The phonemes were always presented as stimulus pairs /i/-/i/ or /i/-/æ/ (530-ms duration and a 70-ms silent gap in between) in a variable and a constant oddball paradigm (Fig. 4). The variable paradigm was created to probe two distinct neural processes: phoneme discrimination, on the one hand, and detection of rule-based auditory regularities, on the other (introduced in Virtala et al. 2009). The data concerning rule detection (/i/-/i/ pairs) will be reported elsewhere.

The variable paradigm included 42 /i/-/i/ pairs (21 with rising, 21 with falling frequency) and 21 /i/-/æ/ pairs (with rising frequency) with all possible frequency combinations except frequency difference within a pair being always $> 1$ semitone. The /i/-/i/ pairs with a rising frequency served as the standards (probability 80%), while /i/-/æ/ pairs with a rising frequency (vowel deviants, 10%), and /i/-/i/ pairs with a falling frequency (rule violations, 10%) served as deviants.

The constant paradigm only included phonemes at the natural /f/ level (206.8 Hz). Each phoneme thus had eight $f_2$ frequency levels in a typical range for female speech. The phonemes were presented as stimulus pairs /i/-/i/ or /i/-/æ/ (530-ms duration and a 70-ms silent gap in between) in a variable and a constant oddball paradigm (Fig. 4). The variable paradigm was created to probe two distinct neural processes: phoneme discrimination, on the one hand, and detection of rule-based auditory regularities, on the other (introduced in Virtala et al. 2009). The data concerning rule detection (/i/-/i/ pairs) will be reported elsewhere.

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The constant paradigm only included phonemes at the natural /f/ level (206.8 Hz). The standard was /i/-/i/ (probability 90%), and the deviant was /i/-/æ/ (vowel deviant, 10%). In both variable and constant paradigms, the stimuli were presented with a 25-ms jitter in 10-ms steps (975, 985… 1025 ms between stimulus onsets in order to reduce phase-locked neural activity to the predictable stimulus onsets) pseudo-randomly, with at least one standard preceding every deviant.

Experimental procedure. EEG was recorded during stimulus presentation via headphones (Sony Dynamic Stereo Headphones, MDR-7506), in two sessions, while the participant sat in a soundproof, electrically shielded chamber. Stimuli were presented at approximately 65 dB SPL (Presentation software, NeuroBehavioral Systems Inc., California, USA), version 17.2, and behavioral responses were recorded with Cedrus RB844 response pad.
(Cedrus Corporation, California, USA). In ignore conditions the participant watched a subtitled soundless movie, and was instructed not to pay attention to the sounds. In attentive conditions the movie was turned off, and the participant was instructed to pay attention to the sounds, and press a response button to target deviants.

An overview of the experimental protocol can be found in Table 4. First, the participants heard the variable paradigm in a 21-minute long sequence in an ignore condition (VariableIgnore, 1260 stimuli, 126 vowel deviants), and then in a 90-second long attentive familiarization session (VariableFamiliarization, 90 stimuli, 9 vowel deviants). Before and after the session, participants were queried about the nature of the two deviants in order to orientate the participants to the detection task and to study whether explicit awareness of the deviants arises. Then they were informed about the nature of the deviants, and had to detect first one and then the other of them while the variable paradigm was presented in two ~10-min sequences in counter-balanced order in an attentive condition (VariableAttend, two blocks, each with 630 stimuli, 63 vowel deviants). Finally, the constant paradigm was presented in a 21-min-long sequence in ignore condition (ConstantIgnore, 1260 stimuli, 126 deviants). The first two (VariableIgnore, VariableFamiliarization) and the last sequence (ConstantIgnore) were always presented in the same order, in order to minimize the participants’ explicit awareness of the nature of the stimuli during the presentation of the variable paradigms.

EEG was recorded during all sequences except VariableFamiliarization, and the participant was instructed to avoid moving or blinking and to minimize eye movements by, for example, fixating eyes on a self-chosen point at the screen in front of him/her.

EEG recording and analysis. The EEG (sampling rate 512 Hz) was recorded using the BioSemi system (headcap and amplifier: Biosemi ActiveTwo mk2, BioSemi B. V., Amsterdam, The Netherlands) with a 64-active-electrode cap, referenced to the CMS, and electrodes placed according to the international 10–20-system. External Ag/AgCl electrodes were placed on left and right mastoids and nose, as well as below and at the outer corner of the right eye to record the vertical (VEOG) and horizontal electro-oculogram (HEOG), respectively.

Data analyses were performed with BESA Research 6.0 Software (BESA GmbH, Gräfelfing, Germany). Data were offline re-referenced to the average of mastoid electrodes and filtered at 1–30 Hz (slope 12 dB/oct., zero phase). Peripheral electrodes (close to the edge of the electrode cap) including a lot of high-frequency noise were excluded from the data and other noisy electrodes replaced with the interpolating algorithm in BESA 6.0 (max. three interpolated electrodes per participant per condition).

The EEG was epoched into −100–975-ms time windows at phoneme pair onset with a −100–0-ms baseline correction. An automatic eye-blink correction was performed (detection thresholds 150 μV for horizontal, 250 μV for vertical eye movements, principal component analysis components corresponding to eye movements were subtracted from the original EEG signal, BESA v 6.054). Epochs with other high-amplitude artifacts exceeding ±120 μV were automatically removed. Epochs were averaged separately for each sequence, participant, stimulus type, and electrode. Difference waves were calculated by subtracting the response elicited by the standards from those elicited by the deviants.

All participants had at least 80% accepted epochs from each sequence. The average amounts of deviant trials per sequence were: in VariableIgnore, dyslexics 123 (range 110–126) and controls 125 (range 120–126); in VariableAttend, 62 (56–63) and 63 (61–63); in ConstantIgnore, 124 (121–126) and 125 (124–126). The responses to vowel deviants were analyzed in that block of the VariableAttend sequence where the vowel deviants did not serve as targets, responses in the other block most likely including confounding motor artefacts in the EEG signal due to button presses.

**Figure 4. Experimental paradigms.** Adapted from Virtala et al.44.
Quantification and statistical analysis of EEG and behavioral data. Latencies of MMN/N2b (N2b contribution expected in the attentive conditions) and P3a peak amplitudes were assessed from individual participants from the midline electrodes (Fz, FCz, and Cz) using the time windows (measured from the onset of the second phoneme, the deviance onset) of 100–300 ms for MMN/N2b and 150–450 ms for P3a, based on previous literature and visual inspection of the ERP waveforms. RM-ANOVA was separately conducted for MMN/N2b and P3a latencies: Group (dyslexia/control) x Electrode (Fz, FCz, Cz).

No group differences were found for the latencies (in all \( p > 0.05 \)), and thus the same 50-ms time windows centered at the group mean peak latencies were used for both groups to calculate mean amplitudes for MMN/N2b and P3a. In Variable Attend, the MMN was calculated from the same time window as in Variable Ignore, as the MMN in the attentive condition was considered to overlap with other attention-related components (mainly N2b), and an additional time window was centered at the actual peak of the response (termed MMN/N2b). One-sample two-tailed t-tests with Bonferroni-corrections were used to determine the presence of MMN, MMN/N2b, and P3a at Fz electrode (two components, two groups, and three sequences, plus MMN/N2b in Variable Attend, 14 t-tests in total). Group effects on MMN, MMN/N2b, and P3a amplitudes were analyzed in RM-ANOVAs with group as a between-subject’s factor (two components, three sequences, plus MMN/N2b, seven RM-ANOVAs in total). Nine electrodes close to the fronto-central midline (F1, Fz, F2, FC1, FCz, FC2, C1, Cz, C2) were included in all the RM-ANOVAs (within-subjects factor: electrode) in order to improve the signal-to-noise-ratio; however, the spatial distribution of the components was not analyzed. When sphericity assumption was violated, Greenhouse-Geisser correction was used. Effect sizes are reported using partial eta squared (\( \eta^2 \)).

Four participants in control group and one in dyslexic group had no data from Constant Ignore sequence that was added to the paradigm later on.

Verbal responses after Variable Ignore and Variable Familiarization were scored as 0 (no answer or incorrect answer), 1 (correct partial answer, such as ‘vowels changed’), or 2 (correct answer, e.g., ‘vowel changed from /i/ to /æ/’). Comparison between groups indicates that participants of nonparametric independent samples Mann-Whitney U test due to their skewed distributions. Behavioral performance in Variable Familiarization and Variable Attend was quantified as hit-ratios (hit-% per button presses) and reaction times (in ms). In Variable Familiarization, the instruction was to react to both deviant types, and thus hit-ratio was calculated as hit-% per button presses that were not hits to the other deviant (rule violation). Because this sequence was also very short, hit-ratio and reaction time were not statistically analyzed. Hit-ratio in Variable Attend was compared against chance-level (10%, probability of the vowel deviant in the sequence) with a one-sample t-test. Hit-ratio and reaction time in Variable Attend were compared between groups with non-parametric independent samples Mann-Whitney U tests, as they were not normally distributed [hit-rate, Shapiro-Wilk(37) = 0.63, \( p < 0.001 \); reaction time, Shapiro-Wilk(37) = 0.95, \( p = 0.11 \)].

Data availability

As no common repositories for neurocognitive data are available for the authors and the ethical permission does not include a clause determining the specifics of data availability, the data can be provided for readers upon reasonable request to the first author, as is common practice in the field.

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Table 4. Experimental protocol.

| Condition          | EEG | Given instructions (I), correct answers (A), and queries (Q) |
|--------------------|-----|-------------------------------------------------------------|
| Variable Ignore    | Yes | I: ”Your task is to focus on the silent movie and ignore the presented sound stream.” |
|                    |     | Q: ”The sound stream you heard varies constantly, but occasionally, two types of changes occur in it. Can you name these changes in the sound stream?” |
| Variable Familiarization | No | A: ”In the stream of /æ/ sounds, there are vowel changes from /æ/ to /i/ and rule violations as follows: when in most of the vowel pairs, pitch rises so that first sound is lower than the next sound, in some vowel pairs it falls, so that first sound is higher than the next sound.” |
| Variable Attend    | Yes | I: ”Again, focus on listening to the sound stream. Push the response box button always immediately after hearing a change.” |
| Variable Attend    | Yes | Q: ”Can you now tell, what kind of changes occur in the sound stream?” |
| Constant Ignore    | Yes | A: ”Your task is to focus on the silent movie and ignore the presented sound stream.” |

- Table 4: Experimental protocol.
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Author contributions
T.K., P.V. and E.P. designed the study. S.T. and P.V. analyzed the data and prepared the figures and tables. All authors contributed to preparing the manuscript.

Competing interests
The authors declare no competing interests.

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