## Optimizing parameters for using the parallel auditory brainstem response (pABR) to quickly estimate hearing thresholds

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## Abbreviations:

ABR - auditory brainstem response
ASSR - auditory steady-state response
pABR - parallel auditory brainstem response
dB peSPL - decibels peak-equivalent (baseline-to-peak) sound pressure level
dB nHL - decibels normal hearing level
PT - pure tone
RETSPL - reference equivalent threshold in sound pressure level

## Highlights

- The pABR yields robust responses across stimulus rates and intensities.
- The optimal rate is 40 Hz , but using multiple rates may prove useful.
- The pABR shows some adaptation with increased stimulation rate.
- Extended analysis windows improve response detection for low stimulus frequencies.
- Behavioral thresholds subtly change across pABR rate, giving similar dB nHL values.


#### Abstract

Timely assessments are critical to providing early intervention and better hearing and spoken language outcomes for children with hearing loss. To facilitate faster diagnostic hearing assessments in infants, we developed the parallel auditory brainstem response ( $p A B R$ ), which presents randomly timed trains of tone pips at five frequencies to each ear simultaneously. We have shown that the pABR yields high-quality waveforms that are similar to the standard, single-frequency serial ABR but in a fraction of the recording time. While well-documented for standard ABRs, it is yet unknown how presentation rate and level interact to affect responses collected in parallel to random tone pip stimuli. Therefore, in this study we determined the optimal range of parameters for the PABR by recording responses across a range of six presentation rates, each at a low and high stimulus level. We show that a wide range of rates yields robust responses in under 15 minutes, but 40 Hz is the optimal singular presentation rate. Extending the analysis window to include later components of the response offers further time-saving advantages for the temporally broader responses to low frequency tone pips. Perceptual thresholds that subtly change across rate allow for a testing paradigm that easily transitions between rates, which may be useful for quickly estimating thresholds for different configurations of hearing loss. These optimized parameters facilitate expediency and effectiveness of the pABR to estimate hearing thresholds in a clinical setting.


## 1. Introduction

Early identification of hearing loss and timely intervention is important for promoting typical auditory development and spoken language acquisition (Ching et al., 2014; Cullington et al., 2017; May-Mederake, 2012; Moeller, 2000; Niparko et al., 2010). Currently the gold standard for estimating hearing thresholds in young infants, and other individuals who do not provide reliable behavioral responses, involves serially measuring electrophysiological auditory brainstem responses (ABRs) to frequency-specific tone pip stimuli presented over a range of intensities to each ear separately (American Academy of Audiology, 2012; BC Early Hearing Program, 2012; NHS Newborn Hearing Screening Programme, 2013; Ontario Ministry of Children, Community and Social Services, 2018). These diagnostic ABRs can take a long time, and often yield incomplete information because the child cannot sleep or remain still long enough to obtain the necessary responses. Multiple visits to obtain a complete assessment delays treatment, carries additional costs and risk of attrition, adds stress to the family as they await clinical decisions, and burdens clinician times and resources. To address the time constraints of testing, we recently validated the new parallel ABR ( pABR ) as a viable method for facilitating faster recording of canonical ABR waveforms than traditional serial methods (Polonenko and Maddox, 2019). However, the optimal presentation rates across level for the pABR have yet to be established. In this paper we determined the optimal parameters for using the pABR to estimate hearing thresholds.

The pABR method uses time-saving strategies of simultaneous presentation of stimulus sequences at five frequencies to both ears and randomized stimulus timing sequences. Simultaneous presentation has been a successful tool used for estimating hearing thresholds with the auditory steady-state response (Luts et al., 2006; Sininger et al., 2018; Van Maanen and Stapells, 2010). While simultaneous presentation allows for multiple responses to be recorded, randomization allows for unrestricted analysis windows, affording higher stimulation rates and better estimates of the pre-stimulus noise (Burkard et al., 1990; Eysholdt and Schreiner, 1982; Polonenko and Maddox, 2019; Valderrama et al., 2016, 2014; Wang et al., 2013). These in turn provide better estimates of signal-to-noise ratio (SNR), a key metric that dictates testing time. However, the actual SNR gains achieved by higher rates become a trade-off between the reduction in noise and the shrinkage of response amplitudes due to neural adaptation at higher rates (e.g., Burkard et al., 1990; Burkard and Hecox, 1983; Chiappa et al., 1979; Don et al., 1977; Jiang et al., 2009).

The optimal range for stimulation rate across intensities is well studied for serial ABR measurement, but the effects of simultaneous stimulation across all frequencies with random timing are not obvious. Parallel presentation across frequency bands and ears may lead to cochlear excitation patterns that differ from the standard single-frequency ABR. Indeed, each frequency may act as a masker for the other frequencies, particularly at higher levels when there is more spread of activation along the cochlea. Preliminary
evidence for different interactions comes from the longer latencies and smaller amplitudes of wave V for the pABR than serial ABR, particularly at higher intensities and lower frequencies (Polonenko and Maddox, 2019). Potential interactions that depend on both stimulus level and rate may result in optimal stimulus parameters for the pABR that differ from the standard ABR.

Clinical application of the pABR for threshold estimation will also depend on accurate calibration of the pABR stimuli. There are two considerations for calibration due to the short duration of tone pip stimuli. First, transient stimuli such as tone pips are physically calibrated in peak equivalent SPL (dB peSPL) by matching the amplitude of the tone pip to that of a 1000 Hz tone because the time constants of sound level meters are too long to adequately capture the level of the short stimuli (Laukli and Burkard, 2015). The amplitudes can be matched by the baseline-to-peak (peSPL) or peak-to-peak (ppeSPL) of the transient (for a discussion of the merits of both approaches see Laukli and Burkard, 2015). We chose to calibrate our pABR stimuli in dB peSPL since our stimuli were slightly asymmetric and for the ease of comparing to clicks and converting to other metrics such as peak SPL (pSPL). Second, transient stimuli are then psychoacoustically calibrated into units of $d B$ normal hearing level ( dB nHL ) because perceptual sensitivity in dB peSPL (or dB SPL for tones) varies by frequency. Due to temporal integration, perceptual thresholds for brief stimuli such as tone pips are elevated compared to tones, and vary by pip duration and stimulation rate (Gorga et al., 1984; Gorga and Thornton, 1989; Sharma et al., 2003; Watson and Gengel, 1969). Therefore, the correction factors for converting thresholds in dB peSPL to the flattened curve of 0 dB nHL are specific to the tone pip parameters and transducers.

Therefore, in this study we investigated the effects of stimulus level and presentation rate on responses measured using the pABR method, with the goal of determining the optimal stimulus parameters and dB peSPL to dB nHL correction factors before evaluating clinical implementation of the pABR for threshold estimation. We show that the pABR yields responses with good SNR that can be recorded over a wide range of rates in reasonable recording times. Furthermore, we show that extending the analysis window to include additional components of the response offers advantages for response detection in many subjects, particularly for the broader responses to low frequency tone pips. Correction factors for perceptual thresholds were relatively similar (within 3.5-6 dB) across stimulation rates.

## 2. Methods

We completed two experiments. First, pABR electroencephalographic (EEG) responses were recorded to different rates and intensities. Second, behavioral thresholds were measured for pure tones and for the pABR stimuli at each rate to determine the correction factors that relate the stimulus level in dB peSPL to perceptual thresholds in dB nHL .

### 2.1. Subjects

EEG responses and psychoacoustic perceptual thresholds were collected in two separate experiments, each with a different set of 20 adults ( 13 females, 6 males, 1 non-identifying person for experiment 1; and 11 females, 9 males for experiment 2). There was an additional subject recruited for perceptual threshold testing because one subject was excluded due to unreliable, sporadic thresholds from repeatedly falling asleep during behavioral testing. All subjects gave informed consent before participating in the experiments, which were done under protocols approved by the University of Rochester Institutional Review Board (\#3866). The mean $\pm$ SD (range) age was $22.5 \pm 4.2$ (18-35) years for EEG testing, and $21.8 \pm 3.4$ (18-33) years for behavioral testing.

Normal hearing thresholds, defined as $\leq 20 \mathrm{~dB}$ HL, were confirmed at octave frequencies from 250-8000 Hz . Tympanometry and otoscopy confirmed normal middle and outer ear function. Distortion product emission (DPOAE) testing confirmed normal outer hair cell function from $1-4 \mathrm{kHz}$, barring 2 subjects who had a DPOAE but poor SNR at 2 kHz in one of their ears. Most subjects also had DPOAEs at 500 Hz , but the noise floor was high and the DPOAE did not reach the 6 dB SNR criteria for one ear in 2 subjects and for both ears in 4 subjects.

## 2.2. pABR stimuli

Details of the pABR stimulus construction and method can be found in Polonenko and Maddox (2019). Briefly, stimuli to each ear comprised summed independent, randomly timed trains of Blackman windowed 5-cycle cosine tone pips centered at octave frequencies from 500 to 8000 Hz . Individual tone pips had durations of $10,5,2.5,1.25$ and 0.625 ms for the frequencies $500,1000,2000,4000$ and 8000 Hz respectively. Thirty unique 1 s stereo epochs were created to ensure sufficient statistical independence between the pseudorandom Poisson processes controlling timing of the tone pip trains (Maddox and Lee, 2018; Polonenko and Maddox, 2019). To create these tone pip trains, unit-height impulses were randomly inserted across 1 s and convolved with the tone pip. The number of impulses corresponded to the stimulus presentation rate. Polarity was randomly set to $\pm 1$ so that half the tone pips were condensation and the other half rarefaction. For the EEG experiment, an inverted version of each of the 30 unique epochs was presented in sequence to counter-phase the stimuli to help mitigate stimulus artifact (i.e., Epoch $\mathrm{A}^{+}, \mathrm{A}^{-}, \mathrm{B}^{+}$, $B^{-}$, etc, where $A$ and $B$ represent independent epochs and the superscript sign denotes the phase). For the behavioral experiment, a token from these 30 unique epochs was randomly chosen with replacement for each presentation of the stimulus.

The tone pip stimuli were calibrated to 80 dB peak-equivalent SPL (peSPL) by matching the amplitudes of the peak tone pip cosine component to the amplitude of a 1000 Hz sinusoid tone that read 80 dB SPL on a sound level meter (2240, Bruel \& Kjaer) when played through an insert earphone (ER-2, Etymotic Research) attached to a $2-\mathrm{cc}$ coupler (RA0038, G.R.A.S.). The other stimulus levels ( $L$ ) in dB peSPL were obtained by multiplying the reference-level tone pip by $10^{(L-80) / 20}$. For the behavioral experiment, pure tones were created with amplitudes that were also calibrated to the same 80 dB SPL tone.

Stimuli were created at a sampling rate of 48 kHz and presented through ER-2 insert earphones connected to a sound card (Babyface Pro, RME, Haimhausen, Germany). For the EEG, the sound card was also connected to a headphone amplifier (HB7, Tucker Davis Techologies, Alachua, FL, USA), which sent an inverted stimulus to a second "dummy" set of earphones that had a blocked tube and was taped in the same orientation to the stimulus earphones. This setup further mitigated stimulus artifact by cancelling electromagnetic fields close to the transducers. The earphones were also hung from the ceiling by magnets to allow as much distance as possible between the transducers and EEG electrodes. Stimulus presentation was controlled by a python script using publicly available software at https://github.com/LABSN/expyfun (Larson et al., 2014). The sound card's optical digital out was also used to send digital signals that precisely marked the beginning of each 1 s epoch, which were then converted to trigger pulses by a custom trigger box (modified from a design by the National Acoustic Laboratories, Sydney, NSW, Australia). These triggers were then sent to the EEG system in order to synchronize responses with stimuli.

### 2.3. EEG experiment

### 2.3.1. Stimulus conditions and EEG recording

We recorded responses in both ears to pABR stimulation with average presentation rates of 20, 40, 60, 80, 100 , and 120 Hz , each at intensities of 51 and 81 dB peSPL. For a single 2-hour recording session, this afforded 10 minutes for each of the 12 conditions, resulting in averaged responses comprised of 12,000 ( 20 Hz rate) to 72,000 ( 120 Hz rate) repetitions. Conditions were interleaved to prevent changes in impedance, subject state, or EEG noise from affecting one condition more than the others.

Two-channel scalp potentials were recorded with BrainVision's PyCorder software, using passive $\mathrm{Ag} / \mathrm{AgCl}$ electrodes connected to two differential preamplifiers (BrainVision LLC, Greenboro, SC). In standard 10-20 coordinates, the non-inverting (positive) electrode was positioned at FCz (just anterior of the vertex), the inverting (negative) electrodes at A1 and A2 (left and right earlobes), and the ground electrode at FPz (frontal pole). The non-inverting and ground electrodes were plugged into y-connectors that split between the two differential pre-amplifiers. Data were sampled at 10 kHz and high-pass filtered at 0.1 Hz . Triggers marked the beginning of each epoch rather than each individual tone pip stimulus for two reasons: 1) to avoid trigger overlap due to random stimulation of 10 tone pips (5 for each ear), and 2) to efficiently
analyze 1 s blocks of data in the frequency domain, which is mathematically equivalent to - but faster than - averaging responses to each individual tone pip. Participants reclined in a darkened sound treated audiometric booth during testing, and were encouraged to rest.

### 2.3.2. pABR response calculation

Further details can be found in Polonenko and Maddox (2019) but a brief description is provided below. Using the mne-python package (Gramfort et al., 2013), raw EEG was filtered offline from $30-2000 \mathrm{~Hz}$ using a first order causal Butterworth filter, and then notch-filtered at odd multiples of 60 Hz up to 2500 Hz to remove electrical line noise.

As mentioned above, triggers denoted the beginning of each 1 s epoch. This epoch, along with 500 ms before and after it was extracted for each trigger, giving 2 s of EEG data, denoted as $y$. This same EEG was used to derive responses for each of the 10 tone pips for that epoch. For each tone pip of frequency, $f$, and ear, $e$, we took the rectified impulse sequence used to create the tone pip train - a unit-height impulse at the onset of each tone pip in the 1 s epoch - and zero-padded it with 500 ms before and after to give a 2 s impulse train with all the impulses in the center 1 s , which was denoted $x_{f, e}$. The response, $w_{f, e}$ was then calculated as the circular cross-correlation of the 2 s EEG and the 2 s zero-padded rectified pulse train, performed in the frequency domain as $w_{f, e}=1 / n F^{-1}\left\{F\left\{x_{f, e}\right\}^{*} F\{y\}\right\}$ where $F$ denotes the fast Fourier transform, $F^{-1}$ its inverse, * denotes complex conjugation, and $n$ the number of impulses in a sequence (e.g., 40 for the 40 Hz stimulation rate). Due to the circular nature of the cross-correlation, the time interval $[0,500] \mathrm{ms}$ was at the beginning of $w_{f, e}$ and $[-500,0) \mathrm{ms}$ at the end. Concatenating these two time intervals (i.e., discarding the middle 1 s of $w_{f, e}$ ) gave the final response from $[-500,500] \mathrm{ms}$, where 0 ms denotes the onset of the tone pip. This was repeated for each of the 10 tone pips and for each of the two EEG channels for every epoch.

Average responses for each condition (level, rate, channel, ear, and tone pip frequency) were calculated by first weighting each epoch by the inverse variance of its pre-stimulus baseline from -480 to -20 ms relative to the summed pre-stimulus inverse variances of all epochs for that condition, and then summing across the weighted epochs. This method resembles Bayesian averaging (Elberling and Wahlgreen, 1985), but leverages the much longer 500 ms pre-stimulus baseline afforded by random stimulus timing. Using this averaging method, very noisy epochs contribute much less to the grand average by assigning a weight close to zero. This avoids the need for rejecting epochs based on threshold criteria. Responses were also averaged across channels to reduce noise because we were not interested in ipsilateral versus contralateral differences for this paper. However, it would be easy to keep the two channels separate for clinical applications.

### 2.3.3. EEG data analysis

The primary objective of this paper was to determine the optimal rate for quickly obtaining waveforms for all 10 tone pips. To achieve this, we: 1) compared the wave V latency ( ms ) and amplitude ( $\mu \mathrm{V}$ ) across conditions using linear mixed effect regression with rate and intensity fixed effects and a random intercept per subject; 2) quantified the response SNRs; and 3) estimated the recording time required for all responses in a rate-intensity combination to achieve 0 dB SNR. We chose a threshold of 0 dB SNR based on when waveforms became clearly identifiable and what we have done previously (Maddox and Lee, 2018; Polonenko and Maddox, 2020, 2019). Of course, other dB SNR thresholds would change the estimated times to reach this criterion, but in a proportional way for each condition. Two analysis time windows were tested to determine SNR: a 10 ms window to include wave V of the ABR, and a 30 ms extended window to include wave V of the ABR and early components of the middle latency response (MLR).

The dB SNR of each averaged response (i.e., after 600 epochs, or 10 minutes) was estimated according to the formula: $\mathrm{SNR}_{600}=10 \log _{10}\left[\left(\sigma^{2} S_{+N}-\sigma^{2}{ }_{N}\right) / \sigma^{2}{ }^{2}\right]$ where $\sigma^{2}{ }_{N}$ was the variance of the noise calculated as the mean variance over 10 ms (ABR wave $V$ window) or 30 ms (ABR/MLR extended window) intervals from
-480 to -20 ms , and $\sigma^{2}{ }_{s+N}$ was the variance of the signal and noise calculated as the variance in the respective 10 ms or 30 ms latency range starting at a lag that captures wave V for each tone pip's frequency: $10.5,7.5,6.5,5.0$, and 5.0 ms for $500,1000,2000,4000$ and 8000 Hz respectively (Polonenko and Maddox, 2019; Stapells, 2010). Then we standardized the SNR to a 1 minute ( 60 s ) run: $\mathrm{SNR}_{60}=$ $\mathrm{SN}_{600}+10 \log _{10}(60 / 600)$. From SNR 60 we estimated the time-to- 0 dB SNR as $60 \times 10^{- \text {SNR60 / } 10}$. This time was calculated for each tone pip, but the overall acquisition time for a condition is based on the slowest waveform, and as such, was calculated as the maximum time-to-0 dB of the 10 simultaneously acquired waveforms. Cumulative density functions were computed across subjects of time-to- 0 dB for each tone pip in order to determine the optimal presentation rate - the rate at which $90 \%$ of subjects reached an SNR $\geq 0$ dB for all 10 tone pips in the shortest recording time.

The linear mixed effects regressions and their power analyses were performed using the Imer4, ImerTest and simR packages in R (Bates et al., 2015; Green and MacLeod, 2016; Kuznetsova et al., 2017; R Core Team, 2020). To calculate power, the likelihood ratio test was performed on 1000 Monte Carlo permutations of the response variables based on the fitted model.

### 2.4. Perceptual thresholds experiment

### 2.4.1. Stimulus conditions and psychoacoustics parameters

The 1 s stimulus tokens used for EEG were also used for determining perceptual thresholds for dB nHL correction factors. However, the tone pip trains were not presented in parallel but serial to determine the threshold for each tone pip frequency. In addition to the tone pip stimuli, we measured thresholds for 1 s cosine pure tones at each frequency, which were calibrated using the same 1000 Hz tone at 80 dB SPL that was used to calibrate the pABR tone pips. The tones had raised cosine window edges set to 35 ms , which was within the American National Standards Institute (ANSI) S3.6-2010 rise/fall standards and matched that of our audiometer used for hearing screening.

During the behavioral task, subjects sat in a sound treated audiometric booth, looked at a dark computer monitor screen with a central white fixation dot, and responded with keyboard presses when they heard the stimulus. Stimulus presentation time was jittered by a random number between 1 to 4 s . Perceptual thresholds were measured using an automated tracker based on the modified Hughson Westlake method (Carhart and Jerger, 1959), with a 5 dB base step size in a 2-down/1-up paradigm and a starting level of 40 dB (pe)SPL. If there was no response for the starting level, then the level was increased in 20 dB steps until the subject responded or a maximum level of 85 dB (pe)SPL was reached. Threshold was defined as the level at which 2 out of 3 correct responses were given when the level of the stimulus was ascending. All 70 threshold tracks were randomly presented over the course of the experiment (2 ears $\times 5$ frequencies $\times 7$ rates, with 0 Hz rate representing tones). For each presentation of a pABR tone pip, a random token was chosen with replacement from the thirty unique 1 s tokens. Breaks of at least 15 s were provided after every 4 threshold tracks, and subjects chose when to continue after a break if they needed longer than 15 $s$ to rest.

### 2.4.2. Data analysis

Attentional state drifted in some subjects resulting in a few spuriously high thresholds. Thresholds were considered outliers and removed when the threshold to the pABR stimulus was $>40 \mathrm{~dB}$ above that for the pure tone, and the track was confirmed to be poor and reflecting dozing (i.e., the intensity increased to 85 dB peSPL with no response). Of 1,400 thresholds, 23 ( $1.6 \%$ ) were removed and there was never more than 3 of 40 data points removed for a frequency-rate condition.

The reference values in dB nHL were calculated similarly to what has been done before (Gorga et al., 1993; Sharma et al., 2003; Stapells and Oates, 1997). The thresholds to pure tones were subtracted from the thresholds to the brief pABR stimuli to correct for temporal integration and the subject's own pure tone thresholds. These corrections were modeled using linear mixed effects regression with fixed effects of rate, logged frequency, and their 2-way interaction, as well as a random intercept for subject-ear. Then the
corrections derived from the model for each rate-frequency condition were converted to reference values to give 0 dB nHL by adding them to the HA-1 coupler reference equivalent threshold in SPL (RETSPL) for the ER-2 earphones (i.e., the conversion of SPL to audiometric zero).

## 3. Results

### 3.1. The pABR yields canonical brainstem responses that characteristically show adaptation at higher rates.

We recorded the pABR over a range of stimulation rates in 20 Hz steps and at two intensities. Figure 1 shows the grand average waveforms for each of these conditions, and for each ear and tone pip frequency. Overall, morphology of the pABR responses resembled the canonical responses from traditional ABR methods, with lower frequency responses exhibiting a broader wave V than the higher frequencies. Although wave V is the primary focus of methods for estimating hearing thresholds, Figure 1 also shows that additional ABR waves I and III were clearly visible in the higher frequency responses across several presentation rates, especially at the higher intensity of 81 dB peSPL.


Figure 1. Grand average waveforms across stimulation rates and tone pip frequencies, plotted for both the left and right ears and for a high (top) and low (bottom) intensity. Areas show $\pm 1$ SEM, computed across subjects. All responses are plotted over the interval 0 to 20 ms .

Waveforms were visually inspected and quantified for the presence, amplitude and latency of wave V . Amplitude was defined as the peak to following trough. All 2,400 responses were quantified by a trained audiologist (MJP), and the other author (RKM) quantified a subset of 720 responses ( $30 \%$ ) from a random selection of 6 participants. The intraclass correlation coefficient for absolute agreement (ICC3) was $\geq 0.81$ for each frequency and measure (the lowest two ICC3 $95 \%$ confidence intervals were $0.76-0.85$ and $0.89-$ 0.94 for 500 Hz latency and 1000 Hz amplitude respectively, all others were $\geq 0.94$ ), indicating good agreement for chosen wave V peaks. There was not a clear wave V in 13 waveforms. These absent responses were for 500 Hz at the two highest stimulation rates of $100 \mathrm{~Hz}(\mathrm{n}=6)$ and $120 \mathrm{~Hz}(\mathrm{n}=7)$, and mostly for 51 dB peSPL ( $3 / 13$ at 81 dB peSPL). For further analyses, the latencies of missing waves were removed and the amplitudes considered to be zero.

We modeled wave V latency (Figure 2A) and amplitude (Figure 2B) using linear mixed effects models, with a random intercept for each subject and fixed factors of rate (in log units for amplitude due to the non-linear relationship), intensity, ear, frequency in log units, and gender. We included the ear-frequency interaction, as well as all 2-way and 3-way interactions between rate, intensity, and frequency. There was one subject who did not identify as male or female and could not be included in the full model due to insufficient numbers for a third gender category. Details of the full statistical models for latency and amplitude are given in Supplemental Table 1A and 1B respectively. There was not a significant effect of gender for latency ( $0.22 \pm 0.16 \mathrm{~ms}, t(19)=1.38, p=0.184$, power $=0.29$ [ $95 \%$ confidence interval: $0.26-0.32$ ]), but there was a trend that responses from female subjects were slightly larger ( $0.025 \pm 0.012 \mu \mathrm{~V}[95 \%$ confidence interval $=-0.001-0.049 \mu \mathrm{~V}], t(19)=2.05, p=0.054$, power $=0.55[95 \%$ confidence interval $=$ $0.52-0.58]$ ). To include all 20 subjects, we confirmed that the significant effects in the full model were maintained in models excluding the non-significant fixed effect of gender, and the details of these statistical models are found in Table 1. Wave V latency showed a difference between ears ( $p=0.003$ ) but also a significant ear-frequency interaction ( $p=0.008$ ), indicating that responses for the right ear were faster for lower frequencies (mean $\pm$ SEM difference: $0.28 \pm 0.07 \mathrm{~ms}$ for 500 Hz ) but similar for higher frequencies ( $0.02 \pm 0.03 \mathrm{~ms}$ difference for 8000 Hz ). Consistent with our previous study (Polonenko and Maddox, 2019), there were also significant effects of intensity, frequency, and a significant intensity-frequency interaction (all $p<0.01$ ), indicating that latency decreased with increasing frequency and increasing intensity, and the effect of intensity was greater at lower frequencies. The slight increase in latency with increasing rate was not significant ( $p=0.875$ ), and there was no significant rate-intensity, rate-frequency, or rate-intensity-frequency interactions (all $p>0.109$ ). Unlike latency, wave V amplitude showed no effect of ear or an ear-frequency interaction (both $p>0.118$ ). Also consistent with our previous study (Polonenko and Maddox, 2019), wave V amplitude increased with increasing intensity at a greater rate for higher frequencies (intensity-frequency interaction, $p<0.001$ ). Here, we also showed that amplitude decreases with increasing rate to a greater extent at higher intensities and higher frequencies (rate-intensityfrequency interaction, $p=0.010$ ). There was an exception for 8000 Hz , which showed similar or smaller amplitudes than 4000 Hz for the lower rates.


Figure 2. Mean wave $V$ latency $(A)$ and amplitude $(B)$ as a function of stimulation rate at a low (left) and high (right) intensity. Stimulus frequency is indicated beside each line. Error bars (where large enough to be seen) indicate $\pm 1$ SEM. Crosses joined by dotted lines indicate left ear responses and circles joined by solid lines indicate right ear responses.

Table 1. Linear Mixed Effects Models for Wave V Latency and Amplitude

| Fixed Effect | Estimate | SE | df | t | p |  | Power (95\% CI) |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| A. Latency formula: latency ~ rate + intensity + logfreq + ear + rate:intensity + rate:logfreq + intensity:logfreq + logfreq:ear + rate:intensity:logfreq + (1 \| subject) |  |  |  |  |  |  |  |
| Intercept [Left] | 39.38 | 1.71 | 2375 | 23.05 | < 0.001 | *** | 1.00 (1.00, 1.00) |
| rate | 0.00 | 0.02 | 2367 | -0.16 | 0.875 |  | 0.04 (0.03, 0.05) |
| intensity | -0.18 | 0.03 | 2367 | -7.13 | < 0.001 | ** | 1.00 (1.00, 1.00) |
| logfreq | -8.15 | 0.51 | 2367 | 15.90 | < 0.001 | *** | 1.00 (1.00, 1.00) |
| Ear [Right] | -0.99 | 0.33 | 2367 | -2.98 | 0.003 | ** | 0.84 (0.82, 0.86) |
| rate:intensity | 0.00 | 0.00 | 2367 | 1.61 | 0.109 |  | 0.36 (0.33, 0.39) |
| rate:logfreq | 0.00 | 0.01 | 2367 | 0.38 | 0.701 |  | 0.05 (0.04, 0.07) |
| intensity:logfreq | 0.04 | 0.01 | 2367 | 5.33 | < 0.001 | *** | 1.00 (0.99, 1.00) |
| logfreq:ear [Right] | 0.26 | 0.10 | 2367 | 2.64 | 0.008 | ** | 0.75 (0.73, 0.78) |
| rate:intensity:logfreq | 0.00 | 0.00 | 2367 | -1.57 | 0.117 |  | 0.35 (0.32, 0.38) |

B. Amplitude formula: amplitude ~ lograte + intensity + logfreq + ear + lograte:intensity + lograte:logfreq + intensity:logfreq + logfreq:ear + lograte:intensity:logfreq + (1 | subject)

| Intercept [Left] | 0.26 | 0.20 | 2384 | 1.33 | 0.183 |  | $0.27(0.24,0.30)$ |
| :--- | ---: | :--- | :--- | ---: | :--- | :--- | :--- |
| lograte | -0.19 | 0.11 | 2380 | -1.79 | 0.074 | . | $0.42(0.39,0.45)$ |
| intensity | -0.01 | 0.00 | 2380 | -1.75 | 0.080 | . | $0.39(0.36,0.42)$ |
| logfreq | -0.06 | 0.06 | 2380 | -1.01 | 0.312 |  | $0.18(0.16,0.21)$ |
| ear [Right] | -0.01 | 0.01 | 2380 | -0.79 | 0.431 |  | $0.15(0.13,0.17)$ |
| lograte:intensity | 0.00 | 0.00 | 2380 | 1.18 | 0.238 |  | $0.22(0.20,0.25)$ |
| lograte:logfreq | 0.06 | 0.03 | 2380 | 1.73 | 0.083 | . | $0.41(0.38,0.44)$ |
|  |  |  |  |  |  |  |  |
| intensity:logfreq | 0.00 | 0.00 | 2380 | 3.61 | $<0.001$ | $* * *$ | $0.94(0.93,0.96)$ |
| logfreq:ear [Right] | 0.01 | 0.00 | 2380 | 1.56 | 0.118 |  | $0.35(0.32,0.38)$ |
| lograte:intensity:logfreq | 0.00 | 0.00 | 2380 | -2.56 | 0.010 | $*$ | $0.71(0.68,0.74)$ |

Note: $S E=$ standard error; $\log$ freq $=\log _{10}\left(\right.$ frequency ); $\operatorname{lograte}=\log _{10}($ rate $) ; ~ . p<0.1 ; ~ * p<$ 0.05 ; ** $p<0.01$; $^{* * *} p<0.001$

### 3.2. Acquisition times are fastest for a stimulation rate of 40 Hz

Next, we explored how the changes in amplitude with rate affect the time required for responses to reach $\geq$ 0 dB SNR using a 10 ms analysis window. We extrapolated to a maximum of 20 minutes, which was twice our recording time but represented the minimum time required for serial collection of each response based on our previous study (Polonenko and Maddox, 2019). To determine the optimal pABR rate for the majority of subjects, the cumulative proportion of subjects was computed as a function of recording time. The cumulative density functions (CDF) for the 40 Hz rate are shown in Figure 3A, and the CDFs for all rates are provided in Supplemental Figure 1. Figure 3B shows the time to 0 dB SNR for $90 \%$ and $50 \%$ (median time) of responses for each rate, which were taken from the CDFs.


Figure 3. Acquisition times for waveforms to reach $\geq 0 d B S N R$ for a low (left) and high (right) presentation level for each tone pip frequency (indicated by line color). (A) The cumulative density function (CDF) is shown for the 40 Hz stimulation rate. From the CDF for each stimulation rate, the time for waveforms to reach $\geq 0 \mathrm{~dB}$ SNR in $90 \%$ and $50 \%$ of subjects (median) were calculated and displayed in (B). Shaded areas represent time estimations extrapolated past the 10-minute recording time.

Acquisition times were faster for the higher tone-pip frequencies and lower stimulation rates. Half the subjects had all waveforms within 9.6 minutes for 51 dB peSPL and 3.5 minutes for 81 dB peSPL, except for the 120 Hz rate at 81 dB peSPL ( 5.8 minutes) and for the 80 Hz and 120 Hz rates at 51 dB peSPL (12.9 and $>20$ minutes respectively). In fact, for a 40 Hz stimulation rate the median time was 7.3 and 2.2 minutes for 51 and 81 dB peSPL. However, the acquisition time necessary for most subjects was limited by the 500 Hz tone pip - the broadest and lowest-amplitude response. The estimated time for $\geq 90 \%$ of subjects to reach 0 dB SNR for $2000-8000 \mathrm{~Hz}$ was $\leq 9$ and 4 minutes for 51 and 81 dB peSPL respectively. But for 500 Hz the acquisition time - and thus, the total time for the pABR - was > 20 minutes for all rates at the lower intensity, and 7.7 minutes for 40 Hz but $>15$ minutes for the other rates at the higher intensity. At the end of the $10-$ minute recording session, $48-72 \%$ of the 500 Hz responses reached criterion at the lower intensity and 60-92\% reached criterion at the higher intensity. Based on the 50\% and $90 \%$ metrics, a 40 Hz stimulation rate appears optimal for ensuring the timeliest robust responses from most subjects, although rates between $20-60 \mathrm{~Hz}$ required similar times for the mid and higher frequencies.

### 3.3. Extended analysis windows afforded by random timing improves SNR and saves time for low frequencies in some cases.

The random timing of the pABR allows for extending the analysis window to view more components of the evoked response. This advantage may improve SNR and acquisition estimates for the broader low frequency responses, which are present but vary less over 10 ms than the high frequency responses. Figure 4 shows the same responses from Figure 1 with the time window extended from 20 to 40 ms , which allows an analysis window of 30 ms for each tone pip frequency. With this extended window, the negative trough following wave V is now visible for the lower frequency responses (along with the higher frequency responses, which were visible with the shorter window), as well as the early components of middle latency response (MLR).

500 Hz
Left Right

$\overline{10} \mathrm{~ms} \quad \mid 0.1 \mu \mathrm{~V}$


2000 Hz
4000 Hz




Figure 4. Grand average waveforms across stimulation rates and tone pip frequencies, plotted for both the left and right ears and for a high (top) and low (bottom) intensity. Areas show $\pm 1$ SEM across subjects. All responses are plotted over the interval 0 to 40 ms .

Figure 5 compares the acquisition times for the low frequency tone-pips at low stimulation rates when using a 30 ms versus 10 ms window to estimate SNR. We focused on 20 and 40 Hz because these stimulation rates showed the best recording times with the 30 ms analysis window, as well as the greatest response variation over the extended window for 500 and 1000 Hz tone pips. For many subjects the 30 ms window provided similar or better estimates of SNR and acquisition times, especially for the 500 Hz tone pip. In Figure 5A, the CDFs for the 20 Hz stimulation rate began with a similar trajectory, but grew faster for the 30 ms window (i.e., diverged from the curve for the 10 ms window) for recording times $>4$ minutes (at $\sim 35 \%$ of ears) for 500 Hz and $>6$ minutes (at $\sim 70 \%$ ears) for 1000 Hz at 51 dB peSPL, and after $\sim 5.5$ minutes for 500 Hz (at $\sim 72 \%$ of ears) at 81 dB peSPL. The 1000 Hz CDF for the 10 ms window was higher than that for the 30 ms window at all times for 81 dB peSPL. This means that the 30 ms analysis window provided a time benefit for the $\sim 65 \%$ of 500 Hz waveforms and $\sim 30 \%$ of 1000 Hz waveforms that took longer than 4-6 minutes to reach criterion SNR at the lower intensity level, but the 10 ms window was adequate for the quicker waveforms (i.e., < 4-6 minutes) and for the most of the 1000 Hz tone pip waveforms at the higher intensity.


Figure 5. Extending the analysis window from 10 to 30 ms can improve response $d B$ SNR and acquisition time for low frequency tone pips. (A) An example cumulative density function (CDF) is shown for the 20 Hz stimulation rate. Recording time required for waveforms to reach 0 dB SNR with a low (left) and high (right) presentation level for 500 and 1000 Hz tone pips when using an extended analysis window of 30 ms . Stimulus frequency is indicated by line color. (B) The distribution of extended window benefit ratios for using a 30 versus 10 ms analysis window. The horizontal black line indicates the interquartile range and the vertical solid black line denotes the median ratio. Ratios are on a log2 scale, with ratios >1 indicating a benefit to the 30 ms versus 10 ms window. The 10 ms window includes wave $V$ of the $A B R$, and the extended 30 $m s$ window also includes components of the middle latency response. The dashed line represents similar times to reach 0 dB SNR for both analysis windows.

Consistent with the CDFs, the distribution of extended window benefit ratios in Figure 5B suggest that the 30 ms analysis window provides a time benefit for the slower set of waveforms, with significant improvements for some subjects. The greatest extended window benefit ratios for a 30 ms window occurred for 500 Hz at 51 dB peSPL. Half the subjects had speedup ratios $\geq 1$, and for the "slowest $25 \%$ " of subjects (i.e. $75^{\text {th }}$ percentile and higher), the 30 ms window gave extended window benefit ratios of $2-7$, corresponding to $5.7-16.1$ minutes saved by using a 30 ms window. At this intensity, the $75^{\text {th }}$ percentile extended window benefit ratios were $<1.6$ (up to ~3 minutes saved) for 1000 Hz , but there were also some cases that benefited from the 30 ms window by a ratio of $3-5$, or up to $13-15$ minutes saved. At the higher intensity of 81 dB peSPL, there were faster or similar recording times for the 10 ms window in at least half the subjects, with the median extended window benefit ratios $\leq 1$ for both stimulus rates and tone pip frequencies. However, the 30 ms window benefited about half the subjects for 500 Hz , and there were significant improvements for some subjects for both 500 Hz and 1000 Hz . The $75^{\text {th }}$ percentile extended window benefit ratios were $<1$ for 1000 Hz and $<1.4$ for 500 Hz (up to 1.2 minutes saved by the 30 ms window). Again, even for the high intensity, there were some extreme cases for whom the 30 ms provided an extended window benefit ratio up to 5.5 , corresponding to a maximum of 5 to 16.5 minutes saved. To succinctly summarize the above, having the option to use a 30 ms window will speed the exam for some patients.

### 3.4. Behavioral thresholds for pABR stimuli subtly change with rate

Having examined the effects of stimulation rate on the pABR responses and acquisition times, we next compared perceptual thresholds to the pABR stimuli with those of pure tones to obtain normative values. Figure 6A shows the perceptual thresholds in $d B$ SPL for the pure tones and $d B$ peSPL for the pABR stimuli. Thresholds to the pure tones varied between -10 and 10 dB SPL and were elevated for the pABR stimuli, as expected due to temporal integration of brief stimuli. Thresholds for the pABR stimuli subtly decreased with increasing stimulation rate for each tone pip frequency. This pattern was similar for each subject-ear, as indicated by the light colored lines. The difference between the thresholds to pABR stimuli and pure tones ranged between 0 and 40 dB but were on average between 10 and 21 dB depending on rate and tone pip frequency (Figure 6B).


Figure 6. Perceptual thresholds show subtle changes across different stimulation rates. (A) Perception thresholds for pure tones (PT) and the pABR stimuli with different rates are shown for individuals (color) and the group mean (black). (B) The difference between thresholds to the pABR and pure tone stimuli. Individual colored lines are given a slight random vertical offset between $\pm 1$ dB to make the individual data with similar thresholds easier to see.

Next, the normative values for 0 dB nHL were calculated. First, the difference in thresholds, or correction factors, for the pABR stimuli (from Figure 6B) were modeled using linear mixed effects regression. Details of the statistical model are provided in Table 2. As shown in Figure 7A, the threshold difference significantly decreased with increasing stimulation rate ( $p=0.004$ ) and increased with increasing frequency ( $p<0.001$ ), but there was not a significant interaction between rate and frequency ( $p=0.085$ ). The mean difference in correction factor between stimulation rates of 20 and 120 Hz ranged from 3.5 dB for the 500 Hz tone pip to 6.0 dB for the 8000 Hz tone pip. Second, the reference-equivalent thresholds in SPL (RETSPLs) for our ER-2 insert earphones were added to the correction factors to give the normative values for 0 dB nHL (Figure 7B). The values from Figure 7 are also provided in Table 3 for ease of reference.

Table 2. Linear Mixed Effects Model for pABR Correction Values
Model formula: correction ~ rate + logfreq + rate:logfreq + (1 | subject-ear)

| Fixed Effect | Estimate | SE | df | t | p |  | Power (95\% CI) |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| Intercept | 3.01 | 3.20 | 1162 | 0.94 | 0.348 |  | $0.14(0.12,0.16)$ |
| rate | -0.12 | 0.04 | 1138 | -2.87 | 0.004 | $* *$ | $0.80(0.77,0.82)$ |
| logfreq | 4.74 | 0.96 | 1138 | 4.97 | $<0.001$ | $* * *$ | $1.00(0.99,1.00)$ |
| rate:logfreq | 0.02 | 0.01 | 1138 | 1.73 | 0.085 |  | $0.39(0.36,0.43)$ |

Note: $S E=$ standard error; $\log$ freq $=\log _{10}$ (frequency); correction values $=$ threshold differences for pABR tone pip versus pure tone; *p 0.05 ; ** $p<0.01$; *** $p<0.001$


Figure 7. Correction factors for pABR stimuli. The modeled threshold differences, or correction factors, in (A) are added to the appropriate reference-equivalent threshold in SPL (RETSPL) for the transducer (in our study, ER-2 with HA-1 coupler) to give the normative values for audiometric zero (i.e., $d B \mathrm{nHL}$ ) in ( $B$ ). $P T=$ pure tone

Table 3. Correction and normative values for converting $p A B R d B$ peSPL to 0 dB nHL

| Tone pip | 20 Hz | 40 Hz | 60 Hz | 80 Hz | 100 Hz | 120 Hz |
| ---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Model-estimated correction factors (dB) |  |  |  |  |  |  |
| 500 Hz | 14.6 | 13.4 | 12.2 | 11.0 | 9.8 | 8.6 |
| 1000 Hz | 16.2 | 15.1 | 14.0 | 12.9 | 11.9 | 10.8 |
| 2000 Hz | 17.7 | 16.8 | 15.8 | 14.9 | 13.9 | 13.0 |
| 4000 Hz | 19.3 | 18.5 | 17.6 | 16.8 | 16.0 | 15.2 |
| 8000 Hz | 20.8 | 20.1 | 19.4 | 18.8 | 18.1 | 17.4 |
|  |  |  |  |  |  | ER-2 normative values for 0 |
|  | dB nHL (dB) |  |  |  |  |  |
| 500 Hz | 20.6 | 19.4 | 18.2 | 17.0 | 15.8 | 14.6 |
| 1000 Hz | 16.2 | 15.1 | 14.0 | 12.9 | 11.9 | 10.8 |
| 2000 Hz | 20.2 | 19.3 | 18.3 | 17.4 | 16.4 | 15.5 |
| 4000 Hz | 19.3 | 18.5 | 17.6 | 16.8 | 16.0 | 15.2 |
| 8000 Hz | 17.3 | 16.6 | 15.9 | 15.2 | 14.6 | 13.9 |

${ }^{1}$ RETSPL for the ER-2 transducer (calibrated in an HA-1 coupler) was added to the model-estimated correction factors: $500 \mathrm{~Hz}=6$ $\mathrm{dB}, 1000 \mathrm{~Hz}=0 \mathrm{~dB}, 2000 \mathrm{~Hz}=2.5 \mathrm{~dB}, 4000 \mathrm{~Hz}=0 \mathrm{~dB}, 8000 \mathrm{~Hz}$ $=-3.5 \mathrm{~Hz}$

With these normative values, the 51 and 81 dB peSPL intensities used to evoke the pABR responses convert to a range from $30-35$ and $60-65 \mathrm{~dB}$ dB nHL respectively for a 20 Hz stimulation rate to $36-40$ and $66-70 \mathrm{~dB} \mathrm{nHL}$ for 120 Hz rate. For the 40 Hz stimulation rate, 51 and 81 dB peSPL corresponded to $32-36$ and $62-66 \mathrm{~dB} \mathrm{nHL}$ respectively, with an average dB nHL across tone pip frequency of 33 and 63 dB nHL .

## 4. Discussion

Here, we describe how the pABR changes with stimulation rate and establish normative correction values for PABR levels based on perceptual thresholds. A wide range of rates yields robust responses in reasonable recording times for most subjects. For adults with normal hearing, the total recording time is limited by the broader component wave V of the waveforms for the low frequency tone pips. For some subjects with particularly broad responses, extending the analysis window improves response detection and the acquisition time necessary to reach SNR criterion. The perceptual thresholds to pABR stimuli subtly change with rate, giving a relatively similar set of correction factors to convert the level of the pABR stimuli from dB peSPL to nHL . Overall, the 40 Hz stimulation rate is the singular optimal rate, but in the clinic a range of rates may be useful for facilitating faster acquisition of elevated hearing thresholds across frequency.

Responses to pABR stimulation show adaptation to higher rates, both at a low and a high intensity. Even though the pABR uses random timing and simultaneous presentation of all 10 tone pips, wave V amplitude decreases with increasing frequency in a similar way to responses evoked by serially presented click stimuli (e.g., Burkard et al., 1990; Burkard and Hecox, 1983; Chiappa et al., 1979; Don et al., 1977; Jiang et al., 2009), but the latency minimally changes (Figure 2, Table 1, Supplemental Table 1). The benefit of higher rates is decreased noise, as variance reduces linearly with increasing number of stimuli. However, at some point adaptation limits this benefit by decreasing the response amplitude enough that SNR and response detection suffer. This trade-off can be seen in the estimates of recording time required to reach 0 dB SNR. The acquisition times improve (i.e., become faster) or remain similar for rates up to either 60 or 80 Hz - especially for the mid-to-high frequencies - and then lengthen again for the higher rates (Figure 3B) as the responses become smaller and broader (Figures 1, 4). When considering all tone pip frequencies at both intensities, the fastest recording times for most subjects is achieved with a 40 Hz stimulation rate - a rate that is consistently used in current clinical protocols (American Academy of Audiology, 2012; BC Early Hearing Program, 2012; Ontario Ministry of Children, Community and Social Services, 2018). However, the trade-off between adaptation and SNR is subtle for the pABR stimuli, especially depending on the tone pip of interest. If focusing on low frequency tone pips then the $20-40 \mathrm{~Hz}$ rates are optimal, but for tone pips $\geq$ 2000 Hz , higher rates continue to improve acquisition times by a few minutes for most subjects (Figure 3). A few minutes represents valuable time when conducting diagnostic tests on infants, when the length of napping, and thus remaining testing time, is unknown. Furthermore, the effect of rate may not be as drastic for infants - amplitudes for click stimuli do not decrease as much for infants compared to adults, although they start off with a smaller amplitude for lower rates (Lasky, 1997, 1984). Therefore, despite adaptation, a method that utilizes a combination of rates may speed up the time required to estimate hearing thresholds that may differ across frequencies, and will need to be tested in the clinic and with infants.

Acquisition times are reasonable for the pABR stimuli, and can be supported by extending the analysis window to better capture broader responses in some subjects. For most subjects, an analysis window of 10 ms adequately covers the wave V component (Figures 1,5 ) and provides timely estimates to 0 dB SNR, with median total recording times for all 10 tone pips at most rates within 10 minutes for the lower intensity and within 4 minutes for a higher intensity (Figure 3). However, the recording time at a given level, at which the pABR yields responses for all frequencies in both ears, depends on the slowest response to emerge. For our adults with normal hearing, the broader 500 and 1000 Hz responses are the slowest - these two responses increase the median testing time for most rates from < 4 minutes for the lower intensity and <2 minutes for the higher intensity to $<10$ and $<4$ minutes respectively. These are still acceptable times to simultaneously collect 10 responses (Polonenko and Maddox, 2019), but there are cases where the recording times are much longer for the low frequency tone pips. The "slowest quartile" of subjects have testing times that are < 10 minutes for $2-8 \mathrm{kHz}$ tone pips but > 15 minutes for the low frequency tone pips (Figures 3, 5). In the cases where the low-frequency tone pip responses are visible, but the time for reaching the criterion SNR is taking longer than 6-9 minutes, there can be a significant speedup benefit of 5-16 minutes (corresponding to speedup ratios of 2-7) to using an extended analysis window that captures more of the broader response (Figure 4; Stapells and Oates, 1997). This longer analysis window which is
afforded by the random timing of the pABR and can be done for the same recording data, thereby not requiring extra recording runs/time. Next, the stimulation rate can be reduced to 20 Hz , which gives the most speedup advantage for detecting a response for 500 Hz at a lower intensity (Figure 5). This flexibility of using multiple analysis windows and stimulation rates gives another option in the toolkit that is easily implemented with the pABR.

Measurement time will also depend on hearing thresholds and implementation into a clinical setting. Time is limited by the 500 and 1000 Hz responses in the context of adults with normal hearing, but most hearing losses are more severe in the higher frequencies (e.g., Pittman and Stelmachowicz, 2003). When obtaining responses at higher intensities, the threshold for the lower tone pip frequencies will either be established already or a response confirmed as present at the higher intensity. Then the time will be limited by the SNR of the higher tone pip frequency responses. Response amplitudes tend to be more linear for hearing loss and for high frequencies, because high frequency responses do not suffer the same blurring together of tone pips or adaptation (shallower amplitude-rate slopes at a level closer to threshold I Figure 2; smaller changes in recording time in Figure 3). Both of these suggest that there may still be time-saving advantages of using higher rates when searching for elevated thresholds at higher frequencies. At the lower intensity of 51 dB peSPL, $90 \%$ of subjects reached criterion within 5 minutes for the $2-8 \mathrm{kHz}$ tone pips, compared to $7-9$ minutes for rates $<80 \mathrm{~Hz}$. Using faster rates for higher frequencies may save valuable time and allow more intensities to be tested within a recording session, giving a more complete exam. Of course the actual acquisition times will depend on the stopping criteria and implementation in the clinic. Here we used 0 dB SNR, but the reported minutes will scale if that threshold is changed (doubling, e.g., if it is increased to 3 dB SNR). We will next evaluate the pABR in a clinical setting and determine the time to find thresholds for a variety of degrees and shapes of hearing loss in adults who are able to sit through a complete session. Then, because the responses and acquisition times may differ with infants (Werner et al., 1993), we will finally test the method for evaluating hearing thresholds in infants.

Clinical implementation of the pABR also requires calibration of the pABR stimuli using perceptual thresholds. Perceptual thresholds to the brief pABR stimuli show some temporal integration with increasing rate (Figures 6,7 ), but less than full integration. The energy increases nearly 6 -fold - or 8 dB - from a stimulation rate of 20 to 120 Hz , but the differences in perceptual thresholds ranged from 3.5 dB for the 8000 Hz tone pip to 6 dB for the 500 Hz tone pip (Figure 7, Table 3). This minimal change in thresholds, and thus correction factors, across stimulation rates makes a multiple-rate paradigm easy to implement in an effort to obtain thresholds in the fastest recording time. For the optimal rate of 40 Hz , our normative values of 15.1-19.4 dB nHL for ER-2 earphones (Table 3, bottom) are lower than most reported values of $20-26 \mathrm{~dB} \mathrm{nHL}$ for tone pips at similar stimulation rates ( $37.1-39.1 \mathrm{~Hz}, 41 \mathrm{~Hz}$ ) using ER-3A inserts (Sharma et al., 2003; Stapells, 2010; Stapells and Oates, 1997). This holds even when we use our correction factors (Table 3, top) and convert to dB nHL using the RETSPLs for ER-3A inserts. This suggests that the pABR may require lower levels to obtain a response, but there are other variables that may contribute to these different norms. Primarily, our method adjusts for both temporal integration and the subject's pure-tone threshold, whereas these other norms do not correct for thresholds < 15-20 dB HL (Sharma et al., 2003; Stapells, 2010; Stapells and Oates, 1997). Our values are more similar to the 17-21 dB nHL values obtained using the similar method of subtracting the pure-tone threshold from the threshold to the tone pip (Gorga et al., 1993). Other variables that contribute to some minor variation in norms are final step sizes (here we used 5 dB , others have used 2 dB ), duration of the stimuli (like our study, most use 5 cycles, but some use 4 cycles), and calibration units for the tone pips (dB pSPL, peSPL, ppeSPL). We have provided the correction values in dB (Table 3, top) from which our normative dB nHL values were calculated, so that our values can be used by future studies by simply adding the RETSPLs for the transducers being used to the correction factors. We recommend using our correction factors because they directly compare our subjects' thresholds to pure-tones and tone pips while using the same transducer, thereby accounting for temporal integration, hearing threshold re: 0 dB HL , and transducer. When using different transducers for future studies, however, it is important to note that the frequency responses of earphones differ, which may affect the morphology and amplitudes of the pABR responses to high-frequency tone pips in particular. For example, ER-3A inserts are commonly used in the clinical systems, which have a spectrum that decreases
after 8 kHz . This is appropriate as most clinical diagnostic exams only test up to 4 kHz . But the pABR as implemented here tests up to 8 kHz , so we use the ER-2 inserts that have a flatter spectrum to 10 kHz . These differences in ER-2 and ER-3A transducer spectra have resulted in differences in ABRs to chirp stimuli (Elberling et al., 2012). Finally, these correction and normative values are for perception. Often, higher dB nHL levels are needed to evoke an electrophysiological response, and additional correction factors are needed to convert the physiological dB nHL level to estimated perceptual level (dB eHL). For example, for some systems, a normal hearing threshold of 25 dB eHL is established if an ABR response is present at $35-40 \mathrm{~dB} \mathrm{nHL}$ for 500 Hz but 25 dB nHL for 4 kHz (American Academy of Audiology, 2012; BC Early Hearing Program, 2012; Ontario Ministry of Children, Community and Social Services, 2018). Now that we have established the dB nHL corrections, our next step is to determine the relationship between dB nHL and dB eHL thresholds for a range of hearing loss severities and configurations.

For this study we focused on the wave V component of the pABR responses. However, additional earlier ABR and later middle-latency components are visible in the responses to pABR stimuli, particularly in at the higher intensity of 81 dB peSPL (Figures 1, 4). While not quantified herein, measuring the earlier waves may provide useful information for other clinical and research applications, such as evaluating cochlear synaptopathy (Bharadwaj et al., 2014; Bramhall et al., 2017; Liberman et al., 2016; Prendergast et al., 2017). Perhaps measuring responses at a low and high rate may reveal differences in synchronization at different stages of early auditory processing (Milloy et al., 2017). Often clicks of higher intensity ( $>100 \mathrm{~dB}$ peSPL) are used but even 81 dB peSPL yields robust responses with the pABR. Furthermore, results from our earlier work suggest that the pABR may be more place-specific at higher intensities than serially presented stimuli (Polonenko and Maddox, 2019). Future studies can investigate the utility of the pABR for other application than estimating hearing thresholds.

## 5. Conclusions

The pABR evokes robust responses across a range of rates and intensities within reasonable recording times. The random timing affords extended analysis windows, allowing better estimates of noise in the prestimulus interval and faster detection of broader responses to low frequency tone pips or responses at lower intensities. A pABR method utilizing multiple stimulation may be useful in quickly estimating thresholds, particularly when thresholds are elevated at high but not low frequencies. We recommend that testing start with a stimulation rate of 40 Hz and a 10 ms analysis window. If responses are visible but longer times are needed to reach stopping criterion, then we suggest first increasing the analysis window to 30 ms and then change the rate as necessary. For calibration, we recommended using the correction factors established here and then adding the appropriate RETSPL for the specific transducer, so that the norms account for temporal integration, pure-tone threshold, and transducer. Finally, our future studies will evaluate the relationship between the ABR and perceptual thresholds as well as the measurement time in a clinical setting.

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## Declaration of interest

None.
Author contributions
Melissa Polonenko: Conceptualization, Data curation, Formal analysis, Investigation, Methodology, Project administration, Software, Validation, Visualization, Writing - original draft, review \& editing

Ross Maddox: Conceptualization, Funding acquisition, Methodology, Resources, Software, supervision, Writing - review \& editing

## Data availability

EEG data will be made available in the EEG-BIDS format (Pernet et al., 2019) on Dryad (insert DOI when available), as well as the stimulus files and python code necessary to derive the pABR responses. The behavioral data are deposited to the same Dryad repository.

## Supplemental material

The supplementary document provides the CDFs for all rates and intensities (Supplemental Figures 1 and 2), as well as details of the linear mixed effects models for wave V latency and amplitude that include the gender variable (Supplemental Table 1).

## References

American Academy of Audiology, 2012. Audiologic Guidelines for the Assessment of Hearing in Infants and Young Children. American Speech-Language-Hearing Association, Reston, VA.
Bates, D., Mächler, M., Bolker, B., Walker, S., 2015. Fitting Linear Mixed-Effects Models Using Ime4. J Stat Softw 67, 1-48.
BC Early Hearing Program, 2012. Audiology assessment protocol.
Bharadwaj, H.M., Verhulst, S., Shaheen, L., Liberman, M.C., Shinn-Cunningham, B.G., 2014. Cochlear neuropathy and the coding of supra-threshold sound. Front. Syst. Neurosci. 8. https://doi.org/10.3389/fnsys.2014.00026
Bramhall, N.F., Konrad-Martin, D., McMillan, G.P., Griest, S.E., 2017. Auditory Brainstem Response Altered in Humans with Noise Exposure Despite Normal Outer Hair Cell Function. Ear and Hearing 38, e1-e12. https://doi.org/10.1097/AUD.00000000000000370
Burkard, R., Hecox, K., 1983. The effect of broadband noise on the human brainstem auditory evoked response. I. Rate and intensity effects. The Journal of the Acoustical Society of America 74, 12041213. https://doi.org/10.1121/1.390024

Burkard, R., Shi, Y., Hecox, K.E., 1990. A comparison of maximum length and Legendre sequences for the derivation of brain-stem auditory-evoked responses at rapid rates of stimulation. The Journal of the Acoustical Society of America 87, 1656-1664. https://doi.org/10.1121/1.399413
Carhart, R., Jerger, J.F., 1959. Preferred Method For Clinical Determination Of Pure-Tone Thresholds. Journal of Speech and Hearing Disorders 24, 330-345. https://doi.org/10.1044/jshd.2404.330
Chiappa, K.H., Gladstone, K.J., Young, R.R., 1979. Brain Stem Auditory Evoked Responses: Studies of Waveform Variations in 50 Normal Human Subjects. Arch Neurol 36, 81-87. https://doi.org/10.1001/archneur.1979.00500380051005
Ching, T.Y.C., Day, J., Van Buynder, P., Hou, S., Zhang, V., Seeto, M., Burns, L., Flynn, C., 2014. Language and speech perception of young children with bimodal fitting or bilateral cochlear implants. Cochlear Implants Int 15 Suppl 1, S43-46. https://doi.org/10.1179/1467010014Z.000000000168
Cullington, H.E., Bele, D., Brinton, J.C., Cooper, S., Daft, M., Harding, J., Hatton, N., Humphries, J., Lutman, M.E., Maddocks, J., Maggs, J., Millward, K., O'Donoghue, G., Patel, S., Rajput, K., Salmon, V., Sear, T., Speers, A., Wheeler, A., Wilson, K., 2017. United Kingdom national paediatric bilateral project: Demographics and results of localization and speech perception testing. Cochlear Implants International 18, 2-22. https://doi.org/10.1080/14670100.2016.1265055
Don, M., Allen, A.R., Starr, A., 1977. Effect of Click Rate on the Latency of Auditory Brain Stem Responses in Humans. Ann Otol Rhinol Laryngol 86, 186-195. https://doi.org/10.1177/000348947708600209
Elberling, C., Kristensen, S.G.B., Don, M., 2012. Auditory brainstem responses to chirps delivered by different insert earphones. J Acoust Soc Am 131, 2091-2100. https://doi.org/10.1121/1.3677257
Elberling, C., Wahlgreen, O., 1985. Estimation of Auditory Brainstem Response, Abr, by Means of Bayesian Inference. Scandinavian Audiology 14, 89-96. https://doi.org/10.3109/01050398509045928
Eysholdt, U., Schreiner, C., 1982. Maximum length sequences -- a fast method for measuring brain-stemevoked responses. Audiology 21, 242-250. https://doi.org/10.3109/00206098209072742
Gorga, M.P., Beauchaine, K.A., Reiland, J.K., Worthington, D.W., Javel, E., 1984. The effects of stimulus duration on ABR and behavioral thresholds. The Journal of the Acoustical Society of America 76, 616-619. https://doi.org/10.1121/1.391158

Gorga, M.P., Kaminski, J.R., Beauchaine, K.L., Bergman, B.M., 1993. A Comparison of Auditory Brain Stem Response Thresholds and latencies Elicited by Air- and Bone-Conducted Stimuli. Ear and Hearing 14, 85-94.
Gorga, M.P., Thornton, A.R., 1989. The choice of stimuli for ABR measurements. Ear Hear 10, 217-230. https://doi.org/10.1097/00003446-198908000-00002
Gramfort, A., Luessi, M., Larson, E., Engemann, D.A., Strohmeier, D., Brodbeck, C., Goj, R., Jas, M., Brooks, T., Parkkonen, L., Hämäläinen, M., 2013. MEG and EEG data analysis with MNE-Python. Front. Neurosci. 7. https://doi.org/10.3389/fnins.2013.00267
Green, P., MacLeod, C.J., 2016. SIMR: an R package for power analysis of generalized linear mixed models by simulation. Methods in Ecology and Evolution 7, 493-498. https://doi.org/10.1111/2041210X. 12504
Jiang, Z.D., Wu, Y.Y., Wilkinson, A.R., 2009. Age-related changes in BAER at different click rates from neonates to adults. Acta Paediatr. 98, 1284-1287. https://doi.org/10.1111/j.16512227.2009.01312.x

Kuznetsova, A., Brockhoff, P.B., Christensen, R.H.B., 2017. ImerTest Package: Tests in Linear Mixed Effects Models. Journal of Statistical Software 82, 1-26. https://doi.org/10.18637/jss.v082.i13
Larson, E., McCloy, D., Maddox, R., Pospisil, D., 2014. expyfun: Python experimental paradigm functions, version 2.0.0. Zenodo. https://doi.org/10.5281/zenodo. 11640
Lasky, R.E., 1997. Rate and adaptation effects on the auditory evoked brainstem response in human newborns and adults. Hearing Research 111, 165-176. https://doi.org/10.1016/S0378-5955(97)00106-8
Lasky, R.E., 1984. A developmental study on the effect of stimulus rate on the auditory evoked brain-stem response. Electroencephalogr Clin Neurophysiol 59, 411-419. https://doi.org/10.1016/0168-5597(84)90042-x
Laukli, E., Burkard, R., 2015. Calibration/Standardization of Short-Duration Stimuli. Semin Hear 36, 3-10. https://doi.org/10.1055/s-0034-1396923
Liberman, M.C., Epstein, M.J., Cleveland, S.S., Wang, H., Maison, S.F., 2016. Toward a Differential Diagnosis of Hidden Hearing Loss in Humans. PLOS ONE 11, e0162726. https://doi.org/10.1371/journal.pone. 0162726
Luts, H., Desloovere, C., Wouters, J., 2006. Clinical Application of Dichotic Multiple-Stimulus Auditory Steady-State Responses in High-Risk Newborns and Young Children. AUD 11, 24-37. https://doi.org/10.1159/000088852
Maddox, R.K., Lee, A.K.C., 2018. Auditory Brainstem Responses to Continuous Natural Speech in Human Listeners. eNeuro 5. https://doi.org/10.1523/ENEURO.0441-17.2018
May-Mederake, B., 2012. Early intervention and assessment of speech and language development in young children with cochlear implants. Int J Pediatr Otorhinolaryngol 76, 939-946. https://doi.org/10.1016/j.ijporl.2012.02.051
Milloy, V., Fournier, P., Benoit, D., Noreña, A., Koravand, A., 2017. Auditory Brainstem Responses in Tinnitus: A Review of Who, How, and What? Front. Aging Neurosci. 9. https://doi.org/10.3389/fnagi.2017.00237
Moeller, M.P., 2000. Early Intervention and Language Development in Children Who Are Deaf and Hard of Hearing. Pediatrics 106, e43-e43. https://doi.org/10.1542/peds.106.3.e43
NHS Newborn Hearing Screening Programme, 2013. Guidelines for the early audiological assessment and management of babies referred from the Newborn Hearing Screening Programme.
Niparko, J.K., Tobey, E.A., Thal, D.J., Eisenberg, L.S., Wang, N.-Y., Quittner, A.L., Fink, N.E., 2010. Spoken language development in children following cochlear implantation. JAMA 303, 1498-1506. https://doi.org/10.1001/jama.2010.451
Ontario Ministry of Children, Community and Social Services, 2018. Ontario Infant Hearing Program: Protocol for auditory brainstem response -based audiological assessment (ABRA), Version 2018.01.

Pernet, C.R., Appelhoff, S., Gorgolewski, K.J., Flandin, G., Phillips, C., Delorme, A., Oostenveld, R., 2019. EEG-BIDS, an extension to the brain imaging data structure for electroencephalography. Scientific Data 6, 103. https://doi.org/10.1038/s41597-019-0104-8
Pittman, A.L., Stelmachowicz, P.G., 2003. Hearing loss in children and adults: Audiometric configuration, asymmetry, and progression. Ear and hearing 24, 198-205.
https://doi.org/10.1097/01.AUD.0000069226.22983.80

Polonenko, M.J., Maddox, R.K., 2020. Exposing distinct subcortical components of the auditory brainstem response evoked by continuous naturalistic speech. bioRxiv 2020.08.20.258301. https://doi.org/10.1101/2020.08.20.258301
Polonenko, M.J., Maddox, R.K., 2019. The Parallel Auditory Brainstem Response. Trends in Hearing 23, 2331216519871395. https://doi.org/10.1177/2331216519871395

Prendergast, G., Guest, H., Munro, K.J., Kluk, K., Léger, A., Hall, D.A., Heinz, M.G., Plack, C.J., 2017. Effects of noise exposure on young adults with normal audiograms I: Electrophysiology. Hearing Research 344, 68-81. https://doi.org/10.1016/j.heares.2016.10.028
R Core Team, 2020. R: A language and environment for statistical computing. R Foundation for Statistical Computing, Vienna, Austria.
Sharma, M., Purdy, S.C., Bonnici, L., 2003. Behavioural and Electroacoustic Calibration of Air-conducted Click and Toneburst Auditory Brainstem Response Stimuli. Australian and New Zealand Journal of Audiology 25, 54-60. https://doi.org/10.1375/audi.25.1.54.31122
Sininger, Y.S., Hunter, L.L., Hayes, D., Roush, P.A., Uhler, K.M., 2018. Evaluation of Speed and Accuracy of Next-Generation Auditory Steady State Response and Auditory Brainstem Response Audiometry in Children With Normal Hearing and Hearing Loss. Ear and Hearing 39, 1207-1223. https://doi.org/10.1097/AUD.0000000000000580
Stapells, D.R., 2010. Frequency-Specific ABR and ASSR Threshold Assessment in Young Infants. A Sound Foundation through Early Amplification 40.
Stapells, D.R., Oates, P., 1997. Estimation of the Pure-Tone Audiogram by the Auditory Brainstem Response: A Review. AUD 2, 257-280. https://doi.org/10.1159/000259252
Valderrama, J.T., de la Torre, A., Alvarez, I.M., Segura, J.C., Thornton, A.R.D., Sainz, M., Vargas, J.L., 2014. Auditory brainstem and middle latency responses recorded at fast rates with randomized stimulation. The Journal of the Acoustical Society of America 136, 3233-3248. https://doi.org/10.1121/1.4900832
Valderrama, J.T., de la Torre, A., Medina, C., Segura, J.C., Thornton, A.R.D., 2016. Selective processing of auditory evoked responses with iterative-randomized stimulation and averaging: A strategy for evaluating the time-invariant assumption. Hearing Research 333, 66-76. https://doi.org/10.1016/j.heares.2015.12.009
Van Maanen, A., Stapells, D.R., 2010. Multiple-ASSR Thresholds in Infants and Young Children with Hearing Loss. Journal of the American Academy of Audiology 21, 535-545. https://doi.org/10.3766/jaaa.21.8.5
Wang, T., Zhan, C., Yan, G., Bohórquez, J., Özdamar, Ö., 2013. A preliminary investigation of the deconvolution of auditory evoked potentials using a session jittering paradigm. J. Neural Eng. 10, 026023. https://doi.org/10.1088/1741-2560/10/2/026023

Watson, C.S., Gengel, R.W., 1969. Signal Duration and Signal Frequency in Relation to Auditory Sensitivity. The Journal of the Acoustical Society of America 46, 989-997. https://doi.org/10.1121/1.1911819
Werner, L.A., Folsom, R.C., Mancl, L.R., 1993. The relationship between auditory brainstem response and behavioral thresholds in normal hearing infants and adults. Hearing Research 68, 131-141. https://doi.org/10.1016/0378-5955(93)90071-8

