# Changing the Paradigm for School Hearing Screening Globally: Evaluation of Screening Protocols From Two Randomized Trials in Rural Alaska 

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#### Abstract

Objectives: Diagnostic accuracy was evaluated for various screening tools, including mobile health (mHealth) pure-tone screening, tympanometry, distortion product otoacoustic emissions (DPOAE), and inclusion of high frequencies to determine the most accurate screening protocol for identifying children with hearing loss in rural Alaska where the prevalence of middle ear disease is high.

Design: Hearing screening data were collected as part of two cluster randomized trials conducted in 15 communities in rural northwest Alaska. All children enrolled in school from preschool to 12th grade were eligible. Analysis was limited to data collected 2018 to 2019 ( $n=1449$ ), when both trials were running and measurement of high frequencies were included in the protocols. Analyses included estimates of diagnostic accuracy for each screening tool, as well as exploring performance by age and grade. Multiple imputation was used to assess diagnostic accuracy in younger children, where missing data were more prevalent due to requirements for conditioned responses. The audiometric reference standard included otoscopy, tympanometry, and high frequencies to ensure detection of infection-related and noise-induced hearing loss.


Results: Both the mHealth pure-tone screen and DPOAE screen performed better when tympanometry was added to the protocol (increase in sensitivity of $19.9 \%$, $95 \%$ Confidence Interval (CI): 15.9 to 24.1 for mHealth screen, $17.9 \%, 95 \% \mathrm{CI}$ : 14.0 to 21.8 for high-frequency mHealth screen,

[^0]and $10.4 \%, 95 \% \mathrm{CI}: 7.5$ to 13.9 for DPOAE). The addition of 6 kHz to the mHealth pure-tone screen provided an 8.7 percentage point improvement in sensitivity ( $95 \% \mathrm{Cl}: 6.5$ to 11.3). Completeness of data for both the reference standard and the mHealth screening tool differed substantially by age, due to difficulty with behavioral testing in young children. By age 7, children were able to complete behavioral testing, and data indicated that high-frequency mHealth pure-tone screen with tympanometry was the superior tool for children 7 years and older. For children 3 to 6 years of age, DPOAE plus tympanometry performed the best, both for complete data and multiply imputed data, which better approximates accuracy for children with missing data.

Conclusions: This study directly evaluated pure-tone, DPOAE, and tympanometry tools as part of school hearing screening in rural Alaskan children (3 to 18+ years). Results from this study indicate that tympanometry is a key component in the hearing screening protocol, particularly in environments with higher prevalence of infection-related hearing loss. DPOAE is the preferred hearing screening tool when evaluating children younger than 7 years of age (below 2nd grade in the United States) due to the frequency of missing data with behavioral testing in this age group. For children 7 years and older, the addition of high frequencies to pure-tone screening increased the accuracy of screening, likely due to improved identification of hearing loss from noise exposure. The lack of a consistent reference standard in the literature makes comparing across studies challenging. In our study with a reference standard inclusive of otoscopy, tympanometry, and high frequencies, less than ideal sensitivities were found even for the most sensitive screening protocols, suggesting more investigation is necessary to ensure screening programs are appropriately identifying noise- and infection-related hearing loss in rural, low-resource settings.

Key words: Child health, Hearing loss, Hearing screening, Infectionrelated hearing loss, Otitis media, Otoacoustic emission screening, Puretone screening, Rural health, School screening, Tympanometry.
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## IDEA

Inclusion, Diversity, Equity, Accessibility Article.

## INTRODUCTION

Seventy million children in the world have hearing loss, and underserved populations are disproportionately affected (Haile et al. 2021). The World Health Organization (WHO) estimates that $60 \%$ of childhood hearing loss is preventable (World Health Organization 2021), with this estimate rising to $75 \%$ in low-resource settings where infection-related hearing loss is common (Smith \& Boss 2010; World Health Organization 2012; Olusanya et al. 2014). Childhood hearing loss has wellknown, lifelong effects on educational attainment, psychosocial
outcomes, and vocational opportunities, and treatment significantly improves outcomes (Järvelin et al. 1997; Bess et al. 1998; Wake et al. 2004; Kennedy et al. 2006; Khairi Md Daud et al. 2010; Jung \& Bhattacharyya 2012; Lieu et al. 2012; Emmett \& Francis 2015; Tomblin et al. 2015). Consequently, early identification of childhood hearing loss is crucial for prevention and treatment, especially in low-resource settings (Robinshaw 1995; Moeller 2000).

School hearing screening is an essential public health approach to addressing childhood hearing loss (Flanary et al. 1999; Anderson et al. 2011; Swanepoel et al. 2013; World Health Organization 2020). Hearing screening is particularly important in rural, underserved regions, where access to care is limited and communities often experience a high burden of infectionrelated hearing loss. Rural Alaska is one such example, where nearly $75 \%$ of rural communities are not connected to a hospital by road and most physicians are concentrated in urban areas (Hofstetter et al. 2010; Carroll et al. 2011; Kokesh et al. 2011). While Alaska mandates school hearing screenings, recommendations for specific screening protocols are not included in the mandate, and the effectiveness of existing protocols has yet to be evaluated (Alaska Statutes 2019).

Despite consensus on the need for school hearing screening, screening guidelines are inconsistently implemented and often lack the necessary scientific rigor (Anderson et al. 2011; Skarzynski \& Piotrowska 2012; Sekhar et al. 2013; Prieve et al. 2015; Yong et al. 2020). A recent review of school hearing screening programs globally by Yong et al. (2020) found the presence of screening programs to be inconsistent regardless of mandates, and screening protocols to be variable. The most common protocols included pure-tone screening, but specifics regarding which and number of frequencies were inconsistent, and the use of additional testing such as otoacoustic emissions (OAE), otoscopy and tympanometry varied. Pure-tone screening protocols most commonly included $0.5,1,2,4 \mathrm{kHz}$, with recommendations to add 6 and 8 kHz in adolescents due to noise exposure (Sekhar et al. 2016). OAE screening was recommended only when indicated, such as with children who are unable to follow directions ( $<3$ years of age; Anderson et al. 2011). Threshold definitions for followup referral also varied, with studies and guidelines ranging from 25 to 40 dB HL. Most concerningly, many studies do not include a benchmark audiometric assessment, which is needed to assess diagnostic accuracy and the true prevalence of hearing loss among school children (Yong et al. 2020). The establishment of standardized evidence-based school hearing screening guidelines is essential to improve existing screening programs, inform policy development, drive high quality research, and better measure the impact of screening and treatment interventions.

To begin to address this gap, the diagnostic accuracy of various hearing screening protocols was evaluated. Protocols included mobile health (mHealth) pure-tone screening, tympanometry, distortion product otoacoustic emissions (DPOAE), and inclusion of high frequencies against a benchmark audiometric evaluation for children, preschool to 12th grade. This evaluation was done as part of two cluster randomized trials in rural Northwest, Alaska that were designed to evaluate a new school hearing screening and follow-up process using mHealth and telemedicine solutions (Emmett et al. 2022). Our aim was to determine the most accurate screening protocol for identifying
children with hearing loss in rural Alaska where the prevalence of middle ear disease is high.

## MATERIALS AND METHODS

## Study Design

Hearing Norton Sound comprised two cluster randomized controlled trials testing digital innovations to improve timely identification and treatment of childhood hearing loss in rural Alaska, with full protocols published previously (Emmett et al. 2019a, b). Briefly, the main trial was conducted over two academic years ( 2017 to 2019) in the 15 communities in rural Northwest Alaska served by the Bering Strait School District. In the second year of the trial, an ancillary trial was added to include preschool children in the 14 communities within the region that had preschools. All students enrolled in preschool and grades $\mathrm{K}-12$ were invited to participate. Written consent and verbal child assent were obtained for all children, with parental consent obtained for participants younger than 18 years of age. All participating children underwent the school hearing screening protocol (otoacoustic emission screening), a mHealth plus tympanometry screening protocol, and a benchmark audiometric assessment (Fig. 1). A referral was generated if any protocol indicated the need for follow-up testing (in other words, did not pass). The benchmark audiometric assessment completed on screening day was not used as a formal diagnostic assessment but as a reference standard for evaluating the accuracy of the screening protocols. If abnormal results were found on the benchmark assessment, a referral was generated similar to the screening protocols, and the child entered one of the two referral pathways, which were cluster randomized at the community level.

The hearing screening protocols and audiometric assessment were conducted on the same day in each of the local schools and preschool centers. Testing occurred in quiet rooms available during school hours and included empty classrooms, libraries, or school offices. Noise levels were monitored using functionality available within the equipment. Rooms were marked for hearing testing, and quiet signs were hung to reduce external noise from students. Testing was paused during the school bell and noisier student movement activities. If the room became too noisy or equipment indicated a noisy environment, testing was paused until the noise stopped. School staff completed the school hearing screening, layperson study staff completed the mHealth plus tympanometry screening, and audiologists completed the benchmark audiometric assessment. All study team members and school staff were blinded to the results of the other testing protocols.

The Institutional Review Boards of Alaska Area, Norton Sound Health Corporation, and Duke University approved the trial. The trials are registered with ClinicalTrials.gov (NCT03309553, NCT03662256).

## Equipment and Procedures

School Screening Protocol - In Bering Strait School District, students are screened annually using DPOAE (Biologic AudX, Natus, Denmark). All school hearing equipment was calibrated annually per American National Standards on Acoustics (ANSI) requirement S3.6. The screening was automated and involved the screener placing a soft tip in the ear and recording a pass or refer for each ear. If there was too much noise or if the tip

Protocols and Benchmark Assessment for Data Collection

School Screen

- Distortion Product Otoacoustic Emission Screen (DPOAE)
mHealth with
Tympanometry Screen

Benchmark Audiometric
Assessment

- Otoscopy
- Tympanometry
- Audiogram (air/bone)
(0.5, 1, 2, 4, 6, 8 kHz )
- mHealth pure-tone screening
(1, 2, 4, 6 kHz )
- Tympanometry


## Protocol Variations for Data Analysis

- Tool 1: mHealth pure-tone screening (1, 2, 4 kHz )
- Tool 2: High frequency (HF) mHealth screening (1, 2, 4, 6 kHz )
- Tool 3: DPOAE
- Tool 4: mHealth screen with tympanometry (1, 2, 4 kHz )
- Tool 5: HF mHealth screen with tympanometry (1, 2, 4, 6 kHz )
- Tool 6: DPOAE with tympanometry

Fig. 1. Overview of protocols used for trial data collection and protocols evaluated during data analysis.

TABLE 1. Reference standard and index tool referral criteria*

| Definitions of Target Conditions* |  |
| :---: | :---: |
| Criteria | Definition |
| Middle ear disease | - Referral on otoscopy (retraction, effusion, acute otitis media, otorrhea, perforation, presence of tympanostomy tube, or external otitis) OR <br> - Referral on tympanometry (type B or negative pressure $<-200$ daPa) |
| Audiometric evaluation with high frequency (>25 dB standard) | - Pure-tone average $>25 \mathrm{~dB}$ (World Health Organization 2014) ( $0.5,1,2,4 \mathrm{kHz}$ ) or an individual frequency $\geq 30 \mathrm{~dB}(0.5,1,2,4,6,8 \mathrm{kHz})$; OR <br> - Type B or C tympanogram (<-200 daPa) (FitzZaland \& Zink 1984) OR <br> Audiologist-interpreted pathology on otoscopy (retraction, effusion, acute otitis media, otorrhea, perforation, presence of tympanostomy tube, external otitis, cerumen impaction, foreign body) |
| Audiometric evaluation with high frequency ( $\geq 20 \mathrm{~dB}$ standard) | - Pure-tone average $\geq 20 \mathrm{~dB}$ (World Health Organization 2021) ( $0.5,1,2,4 \mathrm{kHz}$ ) in either ear or an individual frequency $\geq 30 \mathrm{~dB}(0.5,1,2,4,6,8 \mathrm{kHz}$ ); OR <br> - Type B or C tympanogram (<-200 daPa) (FitzZaland \& Zink 1984) OR <br> - Audiologist-interpreted pathology on otoscopy (retraction, effusion, acute otitis media, otorrhea, perforation, presence of tympanostomy tube, external otitis, cerumen impaction, foreign body) |
| Index (Screening) Tool Referral Criteria* |  |
| Evaluation | Criteria for Referral |
| mHealth pure-tone screen | - No response at 20 dB at 1, 2, or 4 kHz on rescreen (Mahomed-Asmail et al. 2016) |
| High-frequency mHealth puretone screen | - No response at 20 dB at 1, 2, 4, or 6 kHz on rescreen (Mahomed-Asmail et al. 2016) |
| School screen (DPOAE) | - 2 or more frequencies (2, 3, 4, 5 kHz ) did not meet predetermined criteria for otoacoustic emission (Gorga et al. 1997) |
| mHealth pure-tone screen plus tympanometry | - No response at 20 dB at 1, 2 , or 4 kHz on rescreen (Mahomed-Asmail et al. 2016) OR <br> - Type B or C tympanogram (<-200 daPa) (FitzZaland \& Zink 1984) |
| High-frequency mHealth puretone screen plus tympanometry | - No response at 20 dB at $1,2,4$, or 6 kHz on rescreen (Mahomed-Asmail et al. 2016) OR <br> - Type B or C tympanogram (<-200 daPa) (FitzZaland \& Zink 1984) |
| DPOAE plus tympanometry | - 2 or more frequencies ( $2,3,4,5 \mathrm{kHz}$ ) did not meet predetermined criteria for otoacoustic emission (Gorga et al. 1997) <br> - Type B or C tympanogram (<-200 daPa) (FitzZaland \& Zink 1984) |

[^1]was occluded, the machine prompted the screener to address the issue. Emissions were measured at $2,3,4$, and 5 kHz for each
ear using an overall pass/refer criteria in which three out of four frequencies had to meet predetermined criteria (Gorga et al.
1997), with no formal rescreen process (Table 1). School teachers, typically special education teachers and support staff, completed the school screening. Training was provided to teachers by school administration (e.g., Director of Special Education Services), and technical support was provided by audiology staff at the Norton Sound Health Corporation, as is standard practice.
mHealth Plus Tympanometry Screening Protocol • The mHealth screen plus tympanometry protocol included a smartphone-based pure-tone hearing screening and a middle ear evaluation using tympanometry (FitzZaland \& Zink 1984; Swanepoel et al. 2014; Mahomed-Asmail et al. 2016; Yousuf Hussein et al. 2016, 2018). Layperson study staff completing the screening received initial training by audiology study staff that included how to use the equipment, categorize tympanogram types, and basic troubleshooting. A protocol that screened both hearing and middle ear function was selected based on systematic reviews and practice guidelines (FitzZaland \& Zink 1984; Prieve et al. 2015) for school screening, as well as consideration of the prevalence of infection-related hearing loss in rural Alaska (Reed et al. 1967; Curns et al. 2002; Singleton et al. 2009, 2018).

Pure-tone hearing screening was administered using a validated, smartphone-based hearing screening application (hearX HearScreen, South Africa). Before screening, each participant received verbal instruction and a practice session built into the software was performed to confirm their understanding of the task. Frequencies screened included $1,2,4$, and 6 kHz , presented at 20 dB HL (with the additional higher frequency added in the second year of the trial; Sekhar et al. 2016). Ambient noise levels were monitored, and the screener was notified to pause testing if excessive levels were reached. A lay-friendly green, yellow, or red bar also continuously displayed on the screen throughout testing to alert the screener of noise levels. Any frequency that did not elicit a response was rescreened at the end of initial screening (Mahomed-Asmail et al. 2016). A referral was generated if there was no response to any frequency in either ear on the rescreen (Table 1).

Tympanometry was performed with a diagnostic tympanometer set to screening mode (Otoflex 100, Otometrics, Denmark). A referral was generated in the case of a flat (Type B) tympanogram or negative pressure $<-200$ daPa (Table 1; FitzZaland \& Zink 1984; Lyons et al. 2004). All study equipment was calibrated annually per ANSI requirement S3.6.
Benchmark Audiometric Assessment • On hearing screening day, an audiometric assessment was performed on all participants to provide a reference standard for the screening protocols. This assessment included diagnostic audiometry using Shoebox, a validated mHealth tablet audiometer (Shoebox Audiometry, Clearwater Clinical, Canada; Thompson et al. 2015), tympanometry (Otometrics Otoflex 100, Denmark), and digital otoscopy (Otometrics Otocam, Denmark). For pure-tone testing (air and bone), participants were given verbal instructions to raise their hand when they heard a beep. A practice tone was given at 1000 Hz to confirm understanding of the task. Following standard practice in audiometric assessment, each threshold was obtained and then confirmed during testing to ensure reliability. Study team members who are trained audiologists performed the assessment. They were blinded to the results of the other screening protocols. Air conduction thresholds were assessed at $0.5,1,2,4,6$, and 8 kHz (with the higher frequencies added
in the second year of the trial). Referrals from diagnostic audiometry were generated for any single air conduction threshold $\geq 30 \mathrm{~dB} \mathrm{HL}$, or a pure-tone average (PTA) of $>25 \mathrm{~dB} \mathrm{HL}(0.5,1$, 2, and 4 kHz ) (World Health Organization 2014). If maximum ambient noise levels were reached, a notification was sent to the audiologist who paused testing. Individual thresholds $\geq 30 \mathrm{~dB}$ HL were included in the referral criteria to capture middle ear disease and/or noise-induced hearing loss that may only affect one frequency. Bone conduction testing was performed if the corresponding air conduction threshold exceeded 25 dB HL .

Tympanometry and digital otoscopy were performed by the audiologist. Type B (flat) tympanograms or Type C (negative pressure $<-200 \mathrm{daPa}$ ) generated a referral. Digital otoscopy was performed, with pathological findings (e.g., occluding cerumen, retraction, effusion, acute otitis media, otorrhea, perforation, patent or plugged tube, external otitis, foreign body) generating a referral at the discretion of the audiologist. See Table 1 for a summary of referral criteria for the screening protocols and benchmark audiometric assessment. All study equipment was calibrated annually per ANSI requirement S3.6.

## Statistical Analysis

This study evaluated the diagnostic accuracy of 6 variations of the two screening protocols from the second year of the trial (Fig. 1 and Table 1):

1. Tool 1: mHealth pure-tone screening $(1,2,4 \mathrm{kHz})$ alone
2. Tool 2: High-frequency mHealth pure-tone screening (1, $2,4,6 \mathrm{kHz})$
3. Tool 3: DPOAE
4. Tool 4: mHealth pure-tone screening $(1,2,4 \mathrm{kHz})$ with tympanometry
5. Tool 5: High-frequency mHealth pure-tone screening (1, $2,4,6 \mathrm{kHz}$ ) with tympanometry
6. Tool 6: DPOAE with tympanometry

This analysis included an estimation of the diagnostic accuracy of each of the six protocol variations, quantification of the differences between diagnostic accuracy of various protocols, and an exploration of differential accuracy by age group, defined by an evaluation of missing data (age 3 to 6 versus 7 years of age and older), and grade (preschool to 1st versus 2 nd grade and up). Differences were explored by age due to the higher prevalence of middle ear disease and the difficulty of obtaining behavioral responses in the youngest children. Analyses were limited to data from the second year of the main trial due to the addition of the ancillary trial for preschool children and highfrequency data in year 2 (2018 to 2019).

In March of 2021, the WHO published new guidelines by which to judge the presence of hearing loss in children (World Health Organization 2021), specifying that the cutoff for hearing loss be lowered to a PTA of at least 20 dB HL from the previous version of a PTA greater than 25 dB HL (World Health Organization 2014). Both the new and former WHO definitions of hearing loss were included in this analysis.

Confusion matrices were presented for all index screening tools, with STARD diagrams constructed for each index protocol to illustrate sample flow from eligibility to formation of the analytic sample, consistent with STARD guidelines (Bossuyt et al. 2016).

Diagnostic accuracy statistics included calculations of sensitivity (Se), specificity (Sp), positive predictive value (PPV),
negative predictive value (NPV), Youden index, likelihood ratio for positive test results ( $\mathrm{LR}+$ ), likelihood ratio for negative test results (LR-), and percent concordance (overall accuracy). All diagnostic accuracy statistics were calculated at the level of the ear. Because accuracy statistics were computed at the level of the ear, clustering in outcomes (by child) is likely and was accounted for by calculating each statistic using generalized estimating equations (GEE; Leisenring et al. 1997; Rutter 2000; Genders et al. 2012). GEE regressions were specified with binomial distribution with identity link and an independence working correlation matrix. Details of the regression specification and calculation of each type of diagnostic accuracy statistic can be found in the Supplemental Digital Content, http://links.lww. com/EANDH/B85. Differences in mean estimates were calculated between tools, with $95 \%$ confidence intervals constructed using bootstrapping (Leisenring et al. 1997; Rutter 2000). See Supplemental Digital Content, http://links.lww.com/EANDH/ B85, for further details on the methods.

Our benchmark assessment was defined using referral status based on a PTA greater than 25 dB HL on $0.5,1,2$, and 4 kHz tones or findings of any individual tone of at least 30 dB HL on $0.5,1,2,4,6$, or 8 kHz tones for audiometry (World Health Organization 2014), pathological findings on otoscopy, or Type B or C findings on tympanometry (see Table 1 for detailed definition). To be used as benchmark data for complete case analysis, at least three tones were required $(0.5,1,2$, or 4 kHz$)$ to be nonmissing and at least two high-frequency tones ( 4,6 , or 8 kHz ) to be nonmissing. In addition, both tympanometry and otoscopy were required to have nonmissing values.

Exploratory analyses were conducted using alternative reference standard definitions: (1) a benchmark audiometric evaluation with referral thresholds of $\geq 20 \mathrm{~dB} \mathrm{HL}$ (current WHO definition for hearing loss); and (2) using middle ear disease as the referent condition. Diagnostic accuracy was also analyzed by age ( 3 to 6 years versus 7 years of age and older) by introducing interaction terms to our regressions to calculate stratified accuracy statistics.

The original study was not specifically powered to detect a particular precision for the calculation of diagnostic accuracy; thus, no justification for study sample size is presented.

## Missing Data

Missing reference data were expected to be more prevalent in younger participants due to requirements for conditioned response process for audiometry (the reference standard). It is also plausible that children with a history of hearing loss and/ or middle ear disease are more likely to experience cognitive delay, resulting in the inability to condition and provide reference data, which may lead to a bias in some diagnostic accuracy statistics (Se, Sp, PPV, NPV; Whiting et al. 2004; Naaktgeboren et al. 2016). Therefore, as a sensitivity analysis, a multiple imputation process was implemented using chained equations (White et al. 2011) to produce an alternative set of estimates for each diagnostic accuracy metric (Naaktgeboren et al. 2016). Two variations of the analysis with imputation were performed. First, accuracy statistics were calculated using a multiply imputed reference standard but assumed any missing index tool component had a "pass" status. This was to accurately reflect the ability of the screening tool to identify ear/hearing pathology in the field (e.g., inability to obtain behavioral responses
for pure-tone testing). Second, multiple imputation was used for both reference standard and index tool to estimate what the accuracy of the screening tool might have been if there were no missing data. Details of the multiple imputation process can be found in the Supplemental Digital Content, http://links.lww. com/EANDH/B85.

All analyses were conducted using Stata SE version 17 software.

## RESULTS

## Baseline Characteristics of the Analytic Sample

In year 2 of the trial, 1449 children were screened (1034 rescreened from the first study year, 262 new K-12 participants in the second study year, and 153 preschool children; see Fig. 2), of whom 1318 had benchmark audiometric assessments (reference standard) in at least 1 ear. Participant flow for each of the index screening protocols can be found in Figures 1-6, Supplemental Digital Content, http://links.lww.com/EANDH/ B86.

Baseline characteristics of children screened in year 2 can be found in Table 2. The median age for children in the sample was 10 years old, with $71.2 \%$ of the sample below age 13 . Slightly more participants were male ( $\mathrm{n}=777,54 \%$ ), most were Alaska Native ( $\mathrm{n}=1389,96 \%$ ), and most had at least 1 caregiver with a high school diploma or GED ( $\mathrm{n}=1,347,95 \%$ ). Based on the audiometric assessment, a total of 147 (10\%) children had a mild hearing loss or greater (PTA of $>25 \mathrm{~dB}$ HL at $0.5,1,2$, $4 \mathrm{kHz})$ in at least 1 ear, and $246(17 \%)$ had middle ear disease. Overall, nearly $8 \%$ of children had both middle ear disease and hearing loss, while $9.2 \%$ had middle ear disease with no hearing loss, and $2.8 \%$ had hearing loss without middle ear disease. A comparison of baseline characteristics for children with and without missing reference standard data is provided in Table 1, Supplemental Digital Content, http://links.lww.com/ EANDH/B89. Children with missing data were more likely to be younger and have middle ear disease. Though missing data were less prevalent for DPOAE and tympanometry screening components, ears that had missing data for one of the tools were more likely to have pathological findings on the other tool (Table 2, Supplemental Digital Content, http://links.lww.com/ EANDH/B89).

## Diagnostic Accuracy

Concordance between index tools and the audiometric assessment (reference standard) ranged from 83 to $87 \%$ for complete case data (Table 3). The mHealth screen plus tympanometry (MS + Tymp) and high-frequency mHealth screen with tympanometry (HF MS + Tymp) had the highest concordance (86.9 and $87.4 \%$, respectively). See Table 3, Supplemental Digital Content, http://links.lww.com/EANDH/B89 for confusion matrices for each of the screening tools compared with the full audiometric evaluation with high frequencies.

All diagnostic accuracy measures were completed using complete case data and two variations of multiple imputation: (1) full imputation of both reference standard and index tools; and (2) imputation of reference standard with missing index tools set to "pass," to more accurately reflect the ability of the screening tool to identify ear/hearing pathology in the field (e.g., mimicking the real-world scenario where an inability to obtain behavioral responses for pure-tone testing results in
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Fig. 2. STrengthening the Reporting of OBservational studies in Epidemiology (STROBE) diagram for inclusion in study sample from main trial and ancillary trial. Final analytic study sample highlighted in red.
children not actually receiving a referral). Sensitivity, specificity, PPV, NPV, LR+, LR-, and Youden index are presented in Table 3 for complete case data and in Table 4, Supplemental Digital Content, http://links.lww.com/EANDH/B89, for the variations of multiple imputation. Results for each index tool are described later with a focus on the sensitivity of each tool in detecting hearing loss as defined by WHO (PTA of $>25 \mathrm{~dB} \mathrm{HL}$ ) and/or middle ear disease as defined by pathological findings on otoscopy/tympanometry.

Diagnostic accuracy results were also evaluated by age using complete case and multiple imputation. It is well known that younger children may not be able to condition for behavioral audiometry. It is also known that younger children are more likely to have middle ear disease and infection-related hearing loss. For these reasons, it is expected to have missing data for reference and index tools that require behavioral responses. Figure 3 shows the proportion of children with
missing data by age and grade for each component of the index tools (e.g., otoscopy, tympanometry, number of frequencies obtained). The proportion of children with any missing data for any ear was higher for children younger than 7 years of age (1st grade and below) compared with children ages 7 and older. As expected, the age-related pattern of missing data was most prominent in components of the reference standard and in index tools that required behavioral responses (e.g., pure-tone screening). Conversely, there was a low and consistent amount of missing data across all ages for objective measurements (e.g., DPOAE, tympanometry). Based on the observed cut point of increased missing data younger than age 7, diagnostic accuracy results were stratified by age group (3 to 6 years and 7 years and older) and are described for each of the index tools later. Diagnostic accuracy metrics stratified by age are displayed in Figure 4A, B and are described later for each index tool.

TABLE 2. Baseline sociodemographics and clinical characteristics of participants $(\mathrm{N}=1449)$

|  | All Screened, N (\%) |
| :---: | :---: |
| Child age |  |
| Mean (SD) | 9.91 (4.08) |
| Median (Q1, Q3) | 10.0 (7.0, 13.0) |
| Child age range |  |
| 3-6 | 346 (23.9\%) |
| 7-9 | 369 (25.5\%) |
| 10-12 | 317 (21.9\%) |
| 13-15 | 247 (17.1\%) |
| 16+ | 169 (11.7\%) |
| Missing | 1 |
| Age at screening |  |
| 3-6 | 346 (23.9\%) |
| 7+ | 1102 (76.1\%) |
| Missing | 1 |
| Female | 671 (46.3\%) |
| Missing | 1 |
| American Indian or Alaska Native | 1389 (95.9\%) |
| Grade level |  |
| Preschool | 153 (10.6\%) |
| K-5 | 705 (48.7\%) |
| 6-8 | 304 (21.0\%) |
| 9-12 | 287 (19.8\%) |
| Grade at screening |  |
| Preschool-1st | 383 (26.4\%) |
| 2nd-12th | 1066 (73.6\%) |
| Highest education level of any caregiver |  |
| <12 grade | 76 (5.3\%) |
| HS diploma or GED | 915 (64.3\%) |
| Some college | 290 (20.4\%) |
| College degree | 142 (10.0\%) |
| Missing | 26 |
| HL severity |  |
| No hearing loss in either ear | 1244 (89.4\%) |
| Mild (PTA >25-40 dB) | 127 (9.1\%) |
| Moderate+ (PTA 41+dB) | 20 (1.4\%) |
| Missing | 58 |
| MED |  |
| No | 1193 (82.9\%) |
| Yes | 246 (17.1\%) |
| Missing | 10 |
| Combined HL and MED status ( $>25 \mathrm{~dB}$ ) |  |
| No MED, no HL | 1114 (80.3\%) |
| MED, no HL | 127 (9.2\%) |
| HL, no MED | 39 (2.8\%) |
| MED + HL | 107 (7.7\%) |
| Missing | 62 |

GED, general educational development; HL, Hearing loss; HS, high school; K, kindergarten; MED, Middle ear disease; PTA, pure-tone average.

Tool 1: mHealth Pure-Tone Screening (1, 2, 4 kHz ) Alone - The sensitivity and specificity for the mhealth screening (MS) using complete case data was $40.3 \%$ ( 36.2 to 44.5 ) and $94.9 \%$ ( 93.9 to 95.9 ), respectively (Table 3 ). MS had the lowest sensitivity compared with the other index tools and the highest specificity, although specificity was greater than $90 \%$ for all the index tools. Overall, sensitivity and specificity of MS using multiple imputation for all children was similar to complete case findings (see Table 4, Supplemental Digital Content, http://links.lww.com/EANDH/B89). When evaluating diagnostic accuracy by age (Tables 4 and 5), sensitivity of MS dropped 17.9 percentage points in children 3 to 6 years of age compared
with all children and was essentially unchanged for children 7 years of age and older. Using the fully imputed reference standard and index data to account for missing data in the youngest children (Fig. 4A), results suggested slightly higher sensitivity for children 3 to 6 years of age (orange open circles) than for older children. However, when the missing index tool was set to "pass," the sensitivity went down (open orange triangles), indicating lower sensitivity in real-world settings. When evaluating test performance by age, a heatmap was used to assess differences in sensitivity, specificity, and Youden index for the two age groups using complete case data (Fig. 5A, B; see Figures 7-10, Supplemental Digital Content, http://links.lww.com/ EANDH/B87, for multiply imputed data), with MS showing the lowest performance. For middle ear disease, MS was the least sensitive ( $45.7 \%, 40.4$ to 51.0 ) compared with the other index tools using complete case data (Table 3).
Tool 2: High-Frequency mHealth Pure-Tone Screening $(\mathbf{1}, \mathbf{2}, \mathbf{4}, \mathbf{6 k H z}) \cdot$ The sensitivity and specificity for the highfrequency MS (HF MS) using complete case data was 49.1\% ( 44.8 to 53.3 ) and $93.7 \%$ ( 92.6 to 94.8 ), respectively (Table 3 ) and were similar using multiple imputation (see Table 4, Supplemental Digital Content, http://links.lww.com/EANDH/ B89). When evaluating diagnostic accuracy by age (Tables 4 and 5 ), sensitivity of HF MS dropped 26.7 percentage points in children 3 to 6 years of age compared with all children and remained unchanged for children 7 years of age and older. Similar to MS, when using the fully imputed reference standard and index data to account for missing data in the youngest children (Fig. 4A), results for HF MS suggested slightly higher sensitivity for children 3 to 6 years of age (orange open circles) than for older children, but when the missing index tool was set to "pass," the sensitivity dropped (open orange triangles).
Tool 3: DPOAE - The sensitivity and specificity for DPOAE screening using complete case data was $57.7 \%$ (53.5 to 61.8 ) and $91.3 \%$ ( 90.1 to 92.6 ), respectively (Table 3). When evaluating diagnostic accuracy by age (Tables 4 and 5), sensitivity was essentially the same for children 3 to 6 years of age and children 7 years of age and older compared with all children. For detecting middle ear disease, DPOAE was more sensitive ( $67.6 \%, 62.8$ to 72.4 ) than MS or HF MS but not as sensitive as index tools that included tympanometry (Table 3).
Tool 4: mHealth Pure-Tone Screening (1, 2, 4 kHz ) With Tympanometry - The sensitivity and specificity for the mhealth pure-tone screening with tympanometry (MS + Tymp) using complete case data was $60.2 \%$ ( 56.0 to 64.4) and $94.0 \%$ ( 92.9 to 95.0 ), respectively (Table 3) and was similar using multiple imputation (see Table 4, Supplemental Digital Content, http://links.lww. com/EANDH/B89). When evaluating diagnostic accuracy by age (Tables 4 and 5), sensitivity of MS + Tymp increased by 6.5 percentage points in children 3 to 6 years of age compared with all children and remained essentially unchanged for children 7 years of age and older. The primary driver of the increase in sensitivity of MS + Tymp for children 3 to 6 years of age was tympanometry, with little gained from using multiple imputation to address missing behavioral data in the youngest children (Fig. 4A, B).
Tool 5: High-Frequency mHealth Pure-Tone Screening (1, $\mathbf{2 , 4 , 6} \mathbf{k H z}$ ) With Tympanometry • The sensitivity and specificity for the high-frequency mhealth pure-tone screening with tympanometry (HF MS + Tymp) using complete case data was $67.0 \%$ ( 63.0 to 71.0 ) and $92.8 \%$ ( 91.6 to 93.9 ), respectively



Fig. 3. Proportion of children with any data missing for various screening and evaluation components. CNE indicates could not evaluate; OAE, otoacoustic emissions.
(Table 3). The HF MS + Tymp had one of the two highest combined sensitivities and specificities (Youden index $=59.8 \%$, 55.6 to 63.9 ), along with DPOAE plus tympanometry (DPOAE + Tymp; Youden index $=58.6 \%, 54.5$ to 62.8 ), compared with the other index tools. Sensitivity and specificity of HF MS + Tymp using complete case data were similar using multiple imputation (see Table 4, Supplemental Digital Content, http:// links.lww.com/EANDH/B89).

When evaluating diagnostic accuracy and test performance by age (Tables 4 and 5), sensitivity of HF MS + Tymp was essentially the same for children 3 to 6 years of age and children 7 years of age and older compared with all children. For children 7 years of age and older, complete case results (solid blue circles) suggest HF MS + Tymp had the highest sensitivity at $67.0 \%$ ( 62.7 to 71.3 ; Table 5), though differences between DPOAE + Tymp and high-frequency mHealth plus tympanometry were within the bounds of random variation (difference in sensitivity $=0.4 \%,-3.6$ to 4.6 ; Fig. 5A). This was also seen on Youden index, which combines sensitivity and specificity together (Fig. 4B); performance was slightly better for HF MS + Tymp compared with DPOAE + Tymp in children 7 years of age and older (Youden index $=59.8 \%$, 55.3 to 64.3; Fig. 4B; solid blue circles) compared with DPOAE + Tymp (difference $=$ $3.4 \%,-1.1$ to 7.6 ; Fig. 5B; solid blue circles).
Tool 6: DPOAE With Tympanometry - The sensitivity and specificity for DPOAE + Tymp screening using complete case data
was $68.1 \%$ ( 64.1 to 72.1 ) and $90.5 \%$ ( 89.3 to 91.8 ), respectively (Table 3). Similar to HF MS + Tymp, DPOAE + Tymp yielded one of the highest sensitivities and specificities (Youden index $=58.6 \%$, 54.5 to 62.8 ) compared with the other index tools and results were similar using multiple imputation (see Table 4, Supplemental Digital Content, http://links.lww.com/EANDH/B89).

When evaluating diagnostic accuracy by age using complete case data (Tables 4 and 5), sensitivity of the DPOAE + Tymp performed 10.2 percentage points better in children 3 to 6 years of age (Table 4) compared with all children (Table 3) and was essentially unchanged for children 7 years of age and older (Table 5). DPOAE + Tymp was the most sensitive index test for children 3 to 6 years old ( $\mathrm{Se}=78.3 \%, 68.5$ to 88.0; Table 4), with 11.6 percentage point ( 3.7 to 21.0 ) higher sensitivity than the next most sensitive instruments (MS + Tymp and HF MS + Tymp; Fig. 5A, heatmap). For children 3 to 6 years old, DPOAE alone contributed $55.7 \%$ in sensitivity ( 41.1 to 67.4 ), with tympanometry providing the additional $22.5 \%$ (11.5 to 34.0 ) sensitivity (Fig. 5A). For comparison, tympanometry contributed $44.3 \%$ in sensitivity ( 28.8 to 57.4 ) when combined with HF MS in the youngest children. For older children (Fig. 5A; upper right panel), tympanometry performed similarly with the HF MS and DPOAE index tools, adding $14.2 \%$ ( 10.5 to 17.7) and $13.7 \%$ ( 8.8 to 19.8 ), respectively, suggesting that tympanometry is driving sensitivity for younger children due to worse performance with behavioral testing.


Fig. 4. Graphical representation of accuracy metrics of screening tools. A, Sensitivity, specificity of index tools with full audiometric evaluation (with high frequency) gold standard (PTA $>25 \mathrm{~dB}$ criteria), stratified by age ( 3 to $6 y, 7+y$ ), based on complete case analysis (solid circles), multiply imputed reference standard (with missing index tools as "pass"), and fully multiply imputed data (missing reference and index tools imputed). B, Youden index, positive and negative likelihood ratios of index tools with full audiometric evaluation (with high frequency) gold standard (PTA $>25 \mathrm{~dB}$ criteria), stratified by age ( 3 to 6 $y, 7+y$ ), based on complete case analysis (full circles), multiply imputed reference standard (with missing index tools as "pass"), and fully multiply imputed data (missing reference and index tools imputed). CC indicates complete case; DPOAE, distortion product otoacoustic emissions; DPOAE + tymp, distortion product otoacoustic emissions with tympanometry; MS, mHealth screen; HF MS, high frequency mHealth screen; HF MS + Tymp, high frequency mHealth screen plus tympanometry; MI, multiple imputation; MS + Tymp, mHealth screen plus tympanometry; PTA, pure-tone average.

For children 3 to 6 years old, higher performance for the DPOAE + Tymp was also seen in Youden index, which combines sensitivity and specificity (Youden index $=72.0 \%, 62.0$ to 82.1 ; Fig. 4B; solid orange circles), compared with HF MS + Tymp (difference $=12.5 \%$, 3.7 to 22.8; Fig. 5B, heatmap). The reverse was true for older children, with HF MS + Tymp having the highest Youden index $(59.9 \%, 55.3$ to 64.3$)$ compared with DPOAE + Tymp (Fig. 4B; solid blue circles; difference $=3.4 \%,-1.1$ to 7.6).

For the detection of middle ear disease, DPOAE + Tymp had the highest sensitivity ( $88.2 \%, 84.8$ to 91.5 ) compared with all the other index tests using complete case data (Table 3).

## Diagnostic Accuracy by Grade

Diagnostic accuracy results compared by grade were similar to results stratified by age. See Tables 5-6, Supplemental Digital Content, http://links.lww.com/EANDH/B89, and Figures 11-14, Supplemental Digital Content, http://links.lww.com/EANDH/ B88, for results presented by grade, which are grouped preschool to first grade (multiply imputed) and second grade and up (complete case).

## Diagnostic Accuracy by Threshold Definition

The WHO established a new definition of hearing loss after the completion of this study, changing from a PTA of $>25 \mathrm{~dB}$ HL at $0.5,1,2,4 \mathrm{kHz}$ to $\geq 20 \mathrm{~dB}$ HL (a 10 dB difference; World Health Organization 2021). Despite using the former WHO definition of hearing loss in the study protocol, diagnostic accuracy by index tool was also evaluated using the new WHO definition for children 7 years of age and older. This analysis was limited to older children because more specific threshold data were obtained for older children (e.g., below 20 dB HL ) compared with younger children, where often if 20 dB HL response was obtained (normal per study protocol), additional threshold testing was not done in these more difficult to test children. The pattern of results for the older children using the new $\geq 20 \mathrm{~dB}$ HL definition paralleled findings using the 25 dB HL definition, with the mH ealth screen plus tympanometry and DPOAE plus tympanometry demonstrating the highest sensitivity (Table 5), and differences between the two falling within the range of random variation (difference $=$ $0.2 \%,-3.9$ to 4.4 ). However, overall sensitivity was reduced by about 5 to 10 percentage points across the index tools.


Fig. 4. Continued.

## DISCUSSION

To our knowledge, this study includes the largest dataset that directly evaluated both behavioral pure-tone screening, objective OAE screening, and the inclusion of tympanometry for screening a large age range of children (3 to 18+ years of age) in a rural underserved area. Findings from this study, conducted in a rural Alaskan population, highlight the importance of incorporating tympanometry into screening protocols in rural environments with high prevalence of infection-related hearing loss. Findings also suggest the importance of adding high frequencies to the pure-tone screening to ensure identification of noise-induced hearing loss. Our data indicate a clear age cutoff (younger than 7 years) when OAEs are the preferred screening tool due to the degree of missing behavioral screening data among younger children who cannot reliably complete pure-tone testing.

The accuracy of two hearing screening protocols and their various components ( mHealth pure-tone screening, DPOAE, tympanometry, and addition of high frequencies) were evaluated against a benchmark audiometric evaluation that included otoscopy, tympanometry, and pure-tone hearing testing. The mHealth pure-tone screen with high-frequency plus tympanometry (HF MS + Tymp) performed the best in children 7 years of age and older (2nd grade and up) and was more accurate than the school screening (DPOAE alone). In contrast, the DPOAE plus tympanometry (DPOAE + Tymp) protocol performed strongest
in the youngest children ( 3 to 6 years of age), an age group that had difficulty completing the behavioral hearing screening and assessment. Despite limited evidence in the literature supporting the addition of tympanometry to the hearing screening protocol (Roberts 1976; FitzZaland \& Zink 1984; Lyons et al. 2004), adding tympanometry to either DPOAE or mHealth pure-tone screening notably improved sensitivity in this rural Alaskan population where $9.2 \%$ of children had middle ear disease without hearing loss ( $\mathrm{PTA}>25 \mathrm{~dB}$ ).

In general, sensitivity to hearing loss ranged from 40 to $68 \%$ for all variations of the screening protocols, which is lower than most of the previous literature (Prieve et al. 2015). However, the reference standard used, testing environment (sound booth versus field testing), and screening protocols in prior studies have all varied. A benchmark audiometric assessment that was inclusive of otoscopy and tympanometry was used. The comprehensive nature of our benchmark assessment may have contributed to the mHealth pure-tone screen alone yielding the lowest sensitivity ( $40.3 \%$ ) in our analysis, which is lower than the $75 \%$ sensitivity previously reported using the same mHealth pure-tone screening in 1070 school-aged children (5 to 12 years of age; Mahomed-Asmail et al. 2016). There is an overall lack of consensus on what the reference standard should be, with most studies using various definitions of pure-tone testing (Prieve et al. 2015). Our comprehensive reference standard was used to ensure screening protocols are


Fig. 5. Heatmap of differences between index tools. A, Heatmap of differences (with 95\% confidence intervals) in sensitivity, specificity between index tools, using a full audiometric evaluation including high-frequency tones as gold standard ( $>25 \mathrm{~dB}$ criteria), with estimates stratified by age group ( 3 to $6,7+$ ) using complete case data and cluster bootstrapping with percentile confidence intervals. B, Heatmap of differences (with 95\% confidence intervals) in Youden index between index tools, using a full audiometric evaluation including high-frequency tones as gold standard ( $>25 \mathrm{~dB}$ criteria), with estimates stratified by age group ( 3 to $6,7+$ ) using complete case data and cluster bootstrapping with percentile confidence intervals. DPOAE indicates distortion production otoacoustic emissions; DPOAE_Tymp, distortion product otoacoustic emissions with tympanometry; MS, mHealth screen; MS HF, High frequency mHealth screen; MS_tymp, mhealth Screen with tympanometry; MS_HF_Tymp, high frequency mHealth screen with tympanometry.
detecting children with hearing loss and/or middle ear disease in populations with high prevalence of infection-related hearing loss.

The addition of the 6 kHz high frequency to the mHealth pure-tone screen added 8.8 percentage points to sensitivity. Sekhar et al. (2016) found that adding 6 and 8 kHz to the standard pure-tone screening protocol of $0.5,1,2$, and 4 kHz resulted in a 20 -point jump in sensitivity from $58.1 \%$ (42.1 to 73.0 ) to $79.1 \%$ ( 64.0 to $90.0 ; p$ value $=0.003$ ) and a nearly 19-point jump when adding 6 kHz only ( $76.7 \%, 61.4$ to 88.2 ; $p$ value 0.005 ). Conversely, the authors found a corresponding 10-point drop in specificity with the addition of high frequencies $(91.2 \%, 83.4$ to 96.1 to $81.3 \%, 71.8$ to 88.7 for 6 and 8 kHz and $84.6 \%, 75.5$ to 91.3 for 6 kHz ), while only a 1.2 dB drop in specificity was found when adding $6 \mathrm{kHz}(94.9 \%, 93.9$ to 95.9 to $93.7 \%, 92.6$ to 94.8 ). In our study, adding 6 kHz to the hearing screening increased sensitivity while preserving specificity.

The DPOAE screening alone had a sensitivity of $57.7 \%$ for hearing loss and performed better than $m H e a l t h$ puretone screening alone when evaluated across all children in our study. Few studies have directly compared OAE and pure-tone
screening in the school environment (Sabo et al. 2000; Sliwa et al. 2011). These two studies looked at age ranges of 5 to 9 years (Sabo et al. 2000) and 10 to 14 years (Sliwa et al. 2011) and had variable results, which ultimately suggested that puretone screening performed better than OAE. However, pure-tone audiometry requires children to provide reliable behavioral responses. For younger children or for those who are difficult to test, pure-tone screening is often not possible. Children younger than 7 years of age (1st grade and below) were less likely to be able to complete behavioral testing, and thus, DPOAE was the more reliable and accurate assessment of hearing loss. This was evident in our data when evaluating the performance of each of the screening tools by two age groups: younger children ( 3 to 6 years) and older children (7 years of age and older).

To estimate performance in younger children where there were missing data due to the inability for younger children to compete behavioral responses, alternative estimates were obtained using two methods to account for missing data: one that estimated all missing reference standard data based on other available information (assuming one could obtain results for the index tool) and another that approximated real-world


Fig. 5. Continued.
accuracy by setting the missing index results to "pass" (e.g., treating missing data as a failure in the ability to obtain a "refer" status in some children). While sensitivity estimates for the mHealth pure-tone screen increased for young children when using the full imputation analysis (from 22.4 to $28.6 \%$ ), sensitivity decreased to $16.8 \%$ when setting the missing screening results to "pass," which is thought to closer approximate how the tool might perform in the real world in children from 3 to 6 years of age. Ultimately, these low sensitivities, even with statistical estimates for how these index tools would perform if results were obtained, suggest that behavioral hearing screening measures in children 3 to 6 years of age are not appropriate, and objective measures, such as OAE, are necessary.

The addition of tympanometry to the DPOAE and the mHealth pure-tone screen resulted in a 10- and 18-point improvement in sensitivity, respectively. Our results are consistent with those of Lyons et al. (2004), who found that the addition of tympanometry enhanced hearing screening performance in a sample of 1003 children 5 to 6 years old. The prevalence of middle ear disease in their sample was $13.2 \%$, while our total sample ( $\mathrm{n}=1449$, preschool to 12th grade) had a prevalence of middle ear disease of $17.1 \%$. Among the children referred by tympanometry in Lyons' et al study, $65 \%$ passed pure-tone screening (pure-tone threshold $>25 \mathrm{~dB}$ HL at $0.5,1,2,4 \mathrm{kHz}$ in at least 1 ear), corroborating our conclusion of the essential role of tympanometry in detecting middle ear disease in screening programs.

Finally, the importance of the definition of hearing loss for pure-tone screening and the implications for diagnostic performance should not be overlooked. The WHO recently published new guidelines that lower the definition for hearing loss to a PTA of $\geq 20 \mathrm{~dB}$ HL from the previous definition of a PTA $>25$ dB HL: a difference of 10 dB . Lowering the cutoff value, in theory, would reduce the number of children missed. However, school screening becomes logistically difficult at these levels due to the lack of sound-treated rooms (Driscoll et al. 2001; Lyons et al. 2004). Furthermore, a change in definition has an impact on screening protocols. At the time of our study, the WHO definition of hearing loss was PTA $>25 \mathrm{~dB}$. To maintain consistency with the study protocol but also report data that are
comparable for future work, the performance of both the new and former WHO definitions in older children were evaluated. However, there are some inherent weaknesses in using the new definition with data from our study. In the youngest children, who were difficult to condition and fatigued quickly, study audiologists did not test below normal hearing as defined at the time. In other words, reliable responses at 20 dB HL were marked as threshold and considered normal hearing; however, using the new definition, these potentially suprathreshold responses could be artificially inflating the prevalence of hearing loss for the youngest children. Thus, a comparison using the new definition was feasible only for older children in our study and not possible for younger children.

The new WHO definition for hearing loss of $\geq 20 \mathrm{~dB}$ HL decreased the overall sensitivity across the index tools by 5 to 10 dB , with the tool with the highest sensitivity (HF MS + Tymp) decreasing by about 10 percentage points when compared with the 25 dB HL definition. This is due to both the protocol used for our study at the time, as well as the limits of the screening tools used. For the mHealth pure-tone screen, children were screened at 20 dB , with a positive response at all frequencies resulting in a pass. The screening protocol would need to be changed to screen at 15 dB HL across frequencies to accurately screen using the new WHO definition of hearing loss, and this low threshold may pose challenges with reliability in the absence of a sound-treated environment. The new WHO definition exceeds the limits of the DPOAE screening tool, where performance is best when normal hearing is defined as audiometric thresholds between 20 and 30 dB HL (Gorga et al. 1997). One can expect to see performance of both tools decrease with the more stringent definition for hearing loss. Future research in school-based hearing screenings will need to take the new WHO definition of hearing loss into consideration and accommodate for ambient noise experienced in the field (e.g., ANSI-standard headphones).

## Limitations

There were significant missing data for younger children who could not perform behavioral pure-tone testing. Thus, multiple
TABLE 3. Diagnostic accuracy (with $95 \%$ confidence intervals) of index screening protocols by reference standard using complete case data for all ages

| Tool | N | Sensitivity | Specificity | PPV | NPV | LR+ | LR- | Youden Index | Concordance |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Full audiometric evaluation with high frequency ( $>25 \mathrm{~dB})^{*}$ |  |  |  |  |  |  |  |  |  |
| MS | 2541 | 40.3 (36.2, 44.5) | 94.9 (93.9, 95.9) | 68.0 (62.9, 73.1) | 85.6 (84.1, 87.0) | 7.92 (6.22, 9.63) | 0.63 (0.58, 0.67) | 35.2 (31.0, 39.5) | 83.4 (81.9, 84.8) |
| HF MS | 2541 | 49.1 (44.8, 53.3) | 93.7 (92.6, 94.8) | 67.7 (63.1, 72.3) | 87.3 (85.9, 88.7) | 7.80 (6.32, 9.28) | 0.54 (0.50, 0.59) | 42.8 (38.4, 47.1) | 84.3 (82.8, 85.7) |
| DPOAE | 2560 | 57.7 (53.5, 61.8) | 91.3 (90.1, 92.6) | 64.1 (59.8, 68.3) | 89.0 (87.6, 90.3) | 6.65 (5.60, 7.71) | 0.46 (0.42, 0.51) | 49.0 (44.7, 53.3) | $84.2(82.8,85.6)$ |
| MS + Tymp | 2525 | 60.2 (56.0, 64.4) | 94.0 (92.9, 95.0) | 72.7 (68.5, 76.8) | 89.9 (88.6, 91.2) | 10.01 (8.14, 11.88) | 0.42 (0.38, 0.47) | 54.2 (49.9, 58.5) | 86.9 (85.6, 88.2) |
| HF MS + Tymp | 2525 | 67.0 (63.0, 71.0) | 92.8 (91.6, 93.9) | 71.1 (67.2, 75.1) | 91.4 (90.1, 92.6) | 9.28 (7.72, 10.84) | 0.36 (0.31, 0.40) | 59.8 (55.6, 63.9) | 87.4 (86.1, 88.7) |
| DPOAE + Tymp | 2542 | 68.1 (64.1, 72.1) | 90.5 (89.3, 91.8) | 65.6 (61.7, 69.6) | 91.5 (90.2, 92.7) | 7.20 (6.14, 8.26) | 0.35 (0.31, 0.40) | 58.6 (54.5, 62.8) | 85.8 (84.5, 87.2) |
| Middle ear disease $\dagger$ |  |  |  |  |  |  |  |  |  |
| MS | 2733 | 45.7 (40.4, 51.0) | 91.6 (90.5, 92.7) | 43.5 (38.4, 48.7) | 92.3 (91.2, 93.3) | 5.45 (4.49, 6.40) | 0.59 (0.53, 0.65) | 37.3 (31.9, 42.7) | 85.9 (84.6, 87.2) |
| HF MS | 2733 | 50.1 (44.8, 55.5) | 88.9 (87.7, 90.2) | 39.1 (34.5, 43.7) | 92.6 (91.6, 93.7) | 4.53 (3.83, 5.23) | 0.56 (0.50, 0.62) | 39.1 (33.6, 44.5) | 84.1 (82.7, 85.5) |
| DPOAE | 2840 | 67.6 (62.8, 72.4) | 87.5 (86.2, 88.8) | 44.6 (40.5, 48.7) | 94.8 (93.9, 95.7) | 5.43 (4.74, 6.11) | 0.37 (0.32, 0.43) | 55.1 (50.2, 60.1) | 85.0 (83.7, 86.3) |
| MS + Tymp | 2711 | 82.6 (78.5, 86.7) | 90.4 (89.3, 91.6) | 54.2 (49.8, 58.6) | 97.4 (96.8, 98.1) | 8.63 (7.48, 9.78) | 0.19 (0.15, 0.24) | 73.0 (68.7, 77.3) | 89.5 (88.3, 90.6) |
| HF MS + Tymp | 2711 | 84.4 (80.5, 88.3) | 87.9 (86.6, 89.2) | 48.8 (44.7, 53.0) | 97.6 (97.0, 98.3) | 6.96 (6.14, 7.78) | 0.18 (0.13, 0.22) | 72.3 (68.1, 76.4) | 87.5 (86.2, 88.7) |
| DPOAE + Tymp | 2817 | 88.2 (84.8, 91.5) | 86.6 (85.3, 87.9) | 48.7 (44.8, 52.5) | 98.1 (97.5, 98.6) | 6.58 (5.87, 7.28) | 0.14 (0.10, 0.18) | 74.8 (71.1, 78.4) | 86.8 (85.5, 88.0) |

TABLE 4. Diagnostic accuracy statistics (with $95 \%$ confidence intervals) for children aged 3 to $6^{*}$ by index tool and missing data approach, by reference standard

| Reference Standard and Index Tool | N | Sensitivity | Specificity | PPV | NPV | LR+ | LR- | Youden Index |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| High-frequency gold standard (>25dB) $\dagger$ MS |  |  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |  |  |
| Complete case | 2541 | 22.4 (12.4, 32.4) | 94.9 (92.6, 97.2) | 45.5 (28.5, 62.4) | 86.5 (83.1, 89.9) | 4.4 (1.60, 7.13 ) | 0.82 (0.71, 0.93) | 17.3 (7.0, 27.5) |
| Ref MI, missing index as pass | 2898 | 16.8 (11.3, 22.3) | 94.6 (92.6, 96.6) | 53.6 (40.7, 66.4) | 75.3 (71.4, 79.1) | 3.1 (1.54, 4.65) | 0.88 (0.82, 0.94) | 11.3 (5.4, 17.3) |
| Ref MI, missing index MI | 2898 | 28.6 (21.7, 35.6) | 93.8 (91.4, 96.1) | 65.8 (55.3, 76.3) | 75.8 (72.0, 79.7) | 4.6 (2.59, 6.62) | 0.76 (0.69, 0.84) | 22.4 (15.2, 29.5) |
|  |  |  |  |  |  |  |  |  |
| Complete case | 2541 | 22.4 (12.4, 32.4) | 93.7 (91.2, 96.3) | 40.5 (24.7, 56.4) | 86.4 (82.9, 89.8) | 3.6 (1.42, 5.72) | 0.83 (0.72, 0.94) | 16.1 (5.8, 26.4) |
| Ref MI, missing index as pass | 2898 | 18.2 (12.5, 23.9) | 93.1 (90.9, 95.4) | 49.7 (37.7, 61.8) | 75.3 (71.4, 79.2) | 2.7 (1.44, 3.87) | 0.88 (0.81, 0.94) | 11.3 (5.2, 17.5) |
| Ref MI, missing index MI | 2898 | 31.8 (24.6, 39.1) | 91.9 (89.2, 94.5) | 62.1 (52.1, 72.1) | 76.3 (72.4, 80.1) | 3.9 (2.41, 5.43) | 0.74 (0.66, 0.82) | 23.7 (16.2, 31.2) |
| DPOAE |  |  |  |  |  |  |  |  |
| Complete case | 2560 | 55.7 (44.1, 67.4) | 94.6 (92.3, 96.9) | 66.1 (54.0, 78.2) | 91.9 (89.1, 94.6) | 10.3 (5.43, 15.24) | 0.47 (0.34, 0.59) | 50.3 (38.5, 62.2) |
| Ref MI, missing index as pass | 2898 | 47.4 (39.8, 55.0) | 93.7 (91.6, 95.9) | 73.9 (65.6, 82.1) | 82.7 (79.0, 86.3) | $7.6(4.63,10.56)$ | 0.56 (0.48, 0.64) | 41.2 (33.2, 49.1) |
| Ref MI, missing index MI | 2898 | 45.7 (38.6, 52.9) | 93.8 (91.6, 96.1) | 75.6 (67.7, 83.6) | 80.5 (76.8, 84.2) | $7.4(4.48,10.37)$ | 0.58 (0.50, 0.66) | 39.6 (32.0, 47.1) |
| MS + Tympanometry |  |  |  |  |  |  |  |  |
| Complete case | 2525 | 66.7 (55.3, 78.0) | 94.0 (91.5, 96.5) | 67.7 (56.3, 79.1) | 93.7 (91.2, 96.3) | 11.1 (6.11, 16.05) | 0.35 (0.23, 0.48) | 60.6 (49.0, 72.3) |
| Ref MI, missing index as pass | 2898 | 58.0 (49.7, 66.4) | 93.2 (90.9, 95.4) | 76.0 (68.8, 83.2) | 85.6 (81.8, 89.4) | $8.5(5.27,11.72)$ | 0.45 (0.36, 0.54) | $51.2(42.3,60.1)$ |
| Ref MI, missing index MI | 2898 | 62.9 (55.4, 70.4) | 92.4 (89.7, 95.1) | 77.7 (70.7, 84.6) | 85.6 (82.1, 89.1) | $8.3(5.35,11.31)$ | 0.40 (0.32, 0.48) | 55.3 (47.7, 63.0) |
|  |  |  |  |  |  |  |  |  |
| Complete case | 2525 | 66.7 (55.3, 78.0) | 92.8 (90.1, 95.5) | 63.8 (52.4, 75.1) | 93.6 (91.1, 96.2) | 9.3 (5.45, 13.16) | 0.36 (0.24, 0.48) | 59.5 (47.8, 71.2) |
| Ref MI, missing index as pass | 2898 | 59.3 (51.4, 67.3) | 91.9 (89.5, 94.3) | 73.1 (66.0, 80.3) | 85.8 (82.1, 89.5) | 7.3 (4.89, 9.72) | 0.44 (0.35, 0.53) | $51.2(42.8,59.6)$ |
| Ref MI, missing index MI | 2898 | 65.3 (57.8, 72.8) | 90.7 (87.9, 93.6) | 74.7 (67.8, 81.5) | $86.2(82.6,89.8)$ | 7.1 (4.80, 9.31) | 0.38 (0.30, 0.47) | 56.0 (48.2, 63.8) |
|  |  |  |  |  |  |  |  |  |
| Complete case | 2542 | 78.3 (68.5, 88.0) | 93.8 (91.3, 96.2) | 70.1 (59.9, 80.4) | 95.8 (93.8, 97.9) | 12.6 (7.35, 17.76) | 0.23 (0.13, 0.34) | 72.0 (62.0, 82.1) |
| Ref MI, missing index as pass | 2898 | 66.8 (59.0, 74.6) | 92.5 (90.1, 94.8) | 76.8 (70.1, 83.5) | 88.2 (84.7, 91.6) | $8.9(5.86,11.87)$ | 0.36 (0.27, 0.44) | $59.2(51.0,67.5)$ |
| Ref MI, missing index MI | 2898 | 64.6 (57.5, 71.8) | 92.6 (90.1, 95.0) | 78.4 (71.9, 85.0) | $86.2(82.7,89.7)$ | $8.7(5.73,11.67)$ | 0.38 (0.30, 0.46) | $57.2(49.7,64.7)$ |

Ctive value; Tymp, tym-
Youden Index
$17.3(7.0,27.5)$


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 panometry.
TABLE 4. (Continued)

| Reference Standard and Index Tool | N | Sensitivity | Specificity | PPV | NPV | LR+ | LR- | Youden Index |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Middle ear disease $\ddagger$ |  |  |  |  |  |  |  |  |
| MS |  |  |  |  |  |  |  |  |
| Complete case | 2733 | 26.1 (17.1, 35.1) | 92.6 (90.2, 94.9) | 40.7 (28.1, 53.2) | 86.5 (83.5, 89.5) | 3.5 (1.86, 5.16) | 0.80 (0.70, 0.90) | 18.7 (9.4, 27.9) |
| Ref MI, missing index as pass | 2898 | 19.5 (12.6, 26.4) | 94.0 (92.0, 95.9) | 42.0 (29.4, 54.7) | 83.9 (81.0, 86.7) | 3.2 (1.67, 4.79) | 0.86 (0.78, 0.93) | 13.4 (6.2, 20.6) |
| Ref MI, missing index MI | 2898 | 29.7 (21.5, 37.8) | 91.0 (88.2, 93.7) | 42.6 (31.5, 53.7) | 85.1 (82.3, 88.0) | 3.3 (1.96, 4.63) | 0.77 (0.68, 0.87) | 20.6 (12.1, 29.1) |
| HF MS |  |  |  |  |  |  |  |  |
| Complete case | 2733 | 26.1 (17.1, 35.1) | 90.4 (87.8, 93.1) | 34.8 (23.5, 46.0) | 86.2 (83.2, 89.3) | 2.7 (1.52, 3.94) | 0.82 (0.72, 0.92) | 16.5 (7.2, 25.9) |
| Ref MI, missing index as pass | 2898 | 19.5 (12.6, 26.4) | 92.2 (90.0, 94.4) | 35.9 (24.6, 47.3) | 83.6 (80.7, 86.5) | 2.5 (1.36, 3.64) | 0.87 (0.80, 0.95) | 11.7 (4.4, 19.0) |
| Ref MI, missing index MI | 2898 | 31.1 (22.7, 39.4) | 88.5 (85.4, 91.5) | 37.8 (27.9, 47.8) | 85.0 (82.1, 87.9) | 2.7 (1.70, 3.70) | 0.78 (0.68, 0.88) | 19.5 (10.7, 28.3) |
|  |  |  |  |  |  |  |  |  |
| Complete case | 2840 | 57.1 (48.3, 66.0) | 91.3 (88.9, 93.6) | 58.6 (49.7, 67.6) | 90.8 (88.4, 93.2) | 6.5 (4.51, 8.59) | 0.47 (0.37, 0.57) | 48.4 (39.2, 57.6) |
| Ref MI, missing index as pass | 2898 | 57.7 (49.0, 66.3) | 91.6 (89.3, 93.9) | 60.7 (51.6, 69.7) | 90.6 (88.2, 93.0) | 6.9 (4.67, 9.07) | 0.46 (0.37, 0.56) | 49.3 (40.2, 58.3) |
| Ref MI, missing index MI | 2898 | 58.8 (50.2, 67.5) | 91.4 (89.0, 93.8) | 60.7 (51.9, 69.5) | 90.8 (88.4, 93.2) | 6.8 (4.71, 8.98) | 0.45 (0.35, 0.55) | $50.2(41.2,59.2)$ |
|  |  |  |  |  |  |  |  |  |
| Complete case | 2711 | 82.0 (74.0, 90.0) | 91.0 (88.5, 93.6) | 63.5 (54.7, 72.3) | 96.4 (94.7, 98.1) | 9.2 (6.37, 11.95) | 0.20 (0.11, 0.29) | 73.1 (64.7, 81.5) |
| Ref MI, missing index as pass | 2898 | 79.3 (72.2, 86.4) | 92.4 (90.2, 94.6) | 70.1 (62.3, 77.8) | 95.2 (93.4, 97.0) | 10.4 (7.21, 13.65) | 0.22 (0.15, 0.30) | 71.7 (64.2, 79.1) |
| Ref MI, missing index MI | 2898 | 84.0 (77.1, 90.8) | 89.7 (86.6, 92.7) | 64.7 (56.4, 73.1) | 96.1 (94.4, 97.9) | $8.2(5.69,10.62)$ | 0.18 (0.10, 0.26) | 73.6 (66.1, 81.1) |
|  |  |  |  |  |  |  |  |  |
| Complete case | 2711 | 82.0 (74.0, 90.0) | 89.1 (86.3, 91.9) | 58.9 (50.2, 67.5) | 96.3 (94.5, 98.1) | 7.5 (5.46, 9.63) | 0.20 (0.11, 0.29) | 71.1 (62.7, 79.6) |
| Ref MI, missing index as pass | 2898 | 79.3 (72.2, 86.4) | 90.8 (88.4, 93.2) | 65.9 (58.2, 73.7) | 95.1 (93.3, 96.9) | 8.6 (6.21, 11.04) | 0.23 (0.15, 0.31) | 70.1 (62.5, 77.6) |
| Ref MI, missing index MI | 2898 | $84.2(77.6,90.8)$ | 87.4 (84.2, 90.6) | 60.1 (52.1, 68.1) | 96.1 (94.3, 97.8) | $6.7(4.91,8.47)$ | 0.18 (0.10, 0.26) | 71.6 (64.2, 79.0) |
| DPOAE + Tympanometry |  |  |  |  |  |  |  |  |
| Complete case | 2817 | 87.9 (82.0, 93.9) | 90.1 (87.7, 92.6) | 65.4 (57.9, 72.9) | $97.2(95.8,98.7)$ | 8.9 (6.58, 11.26) | 0.13 (0.07, 0.20) | 78.1 (71.6, 84.5) |
| Ref MI, missing index as pass | 2898 | 85.7 (79.6, 91.8) | 90.3 (87.8, 92.8) | 66.5 (59.1, 74.0) | 96.6 (95.0, 98.1) | $8.9(6.48,11.22)$ | 0.16 (0.09, 0.23) | 76.0 (69.4, 82.7) |
| Ref MI, missing index MI | 2898 | 88.1 (82.2, 94.0) | 90.1 (87.6, 92.6) | 66.7 (59.4, 74.0) | 97.1 (95.6, 98.6) | $8.9(6.55,11.21)$ | 0.13 (0.07, 0.20) | 78.2 (71.8, 84.6) |

[^2]| Tool | N | Sensitivity | Specificity | PPV | NPV | LR+ | LR- | Youden Index |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| High-frequency gold standard (>25 dB) $\dagger$ |  |  |  |  |  |  |  |  |
| MS | 2541 | 42.9 (38.4, 47.4) | 94.9 (93.9, 96.0) | 70.6 (65.4, 75.9) | 85.4 (83.7, 87.0) | 8.4 (6.47, 10.40) | 0.60 (0.55, 0.65) | 37.8 (33.2, 42.4) |
| HF MS | 2541 | 52.9 (48.4, 57.4) | 93.7 (92.5, 94.9) | 70.5 (65.8, 75.3) | 87.5 (85.9, 89.0) | $8.4(6.68,10.12)$ | 0.50 (0.45, 0.55) | 46.6 (41.9, 51.2) |
| DPOAE | 2560 | 58.0 (53.5, 62.4) | 90.6 (89.2, 92.0) | 63.8 (59.2, 68.3) | 88.3 (86.8, 89.8) | 6.2 (5.12, 7.20) | 0.46 (0.41, 0.51) | 48.6 (43.9, 53.2) |
| MS + Tymp | 2525 | 59.3 (54.8, 63.7) | 94.0 (92.8, 95.1) | 73.5 (69.1, 78.0) | 89.1 (87.6, 90.6) | 9.9 (7.83, 11.88) | 0.43 (0.39, 0.48) | 53.3 (48.6, 57.9) |
| HF MS + Tymp | 2525 | 67.0 (62.7, 71.3) | 92.8 (91.5, 94.0) | 72.3 (68.1, 76.6) | 90.9 (89.5, 92.3) | 9.3 (7.56, 10.98) | 0.36 (0.31, 0.40) | 59.8 (55.3, 64.3) |
| DPOAE + Tymp | 2542 | 66.6 (62.3, 70.9) | 89.8 (88.4, 91.3) | 64.9 (60.6, 69.2) | 90.5 (89.1, 91.9) | 6.5 (5.51, 7.57) | 0.37 (0.32, 0.42) | 56.4 (51.9, 60.9) |
| High-frequency gold standard ( 220 dB ) $\ddagger$ |  |  |  |  |  |  |  |  |
| MS | 2541 | 38.1 (34.3, 41.9) | 97.0 (96.2, 97.9) | 84.6 (80.4, 88.8) | 78.6 (76.7, 80.5) | 12.9 (8.93, 16.85) | 0.64 (0.60, 0.68) | 35.2 (31.3, 39.0) |
| HF MS | 2541 | 46.1 (42.3, 50.0) | 96.0 (95.0, 97.0) | 83.0 (79.1, 86.9) | 80.7 (78.8, 82.5) | 11.4 (8.45, 14.44) | 0.56 (0.52, 0.60) | 42.1 (38.1, 46.1) |
| DPOAE | 2560 | 49.9 (46.0, 53.8) | 92.6 (91.2, 93.9) | 74.3 (70.2, 78.4) | 81.1 (79.3, 83.0) | 6.7 (5.41, 8.04) | 0.54 (0.50, 0.58) | 42.5 (38.4, 46.6) |
| MS + Tymp | 2525 | 50.5 (46.6, 54.4) | 96.1 (95.1, 97.1) | 84.5 (80.8, 88.2) | 82.1 (80.3, 83.9) | 12.9 (9.51, 16.32) | 0.52 (0.47, 0.56) | 46.6 (42.5, 50.6) |
| HF MS + Tymp | 2525 | 56.9 (53.0, 60.7) | 95.0 (93.9, 96.1) | 82.8 (79.2, 86.4) | 83.9 (82.2, 85.7) | $11.4(8.75,14.05)$ | 0.45 (0.41, 0.50) | $51.9(47.8,55.9)$ |
| DPOAE+Tymp | 2542 | 56.4 (52.5, 60.3) | 91.7 (90.3, 93.1) | 74.2 (70.2, 78.1) | $83.2(81.4,85.0)$ | 6.8 (5.54, 8.01) | 0.48 (0.43, 0.52) | 48.1 (43.9, 52.2) |
| Middle ear disease§ |  |  |  |  |  |  |  |  |
| MS | 2733 | 53.0 (46.8, 59.3) | 91.4 (90.1, 92.6) | 44.1 (38.5, 49.8) | 93.8 (92.7, 94.9) | 6.1 (5.00, 7.29) | 0.51 (0.45, 0.58) | 44.4 (38.1, 50.8) |
| HF MS | 2733 | 59.1 (53.0, 65.2) | 88.6 (87.1, 90.0) | 39.9 (34.9, 44.9) | 94.4 (93.3, 95.5) | $5.2(4.33,6.00)$ | 0.46 (0.39, 0.53) | 47.7 (41.4, 54.0) |
| DPOAE | 2840 | 72.6 (67.0, 78.1) | 86.5 (85.0, 88.0) | 40.9 (36.3, 45.5) | 96.1 (95.2, 97.0) | $5.4(4.64,6.10)$ | 0.32 (0.25, 0.38) | 59.1 (53.3, 64.8) |
| MS + Tymp | 2711 | 82.8 (78.0, 87.6) | 90.3 (89.0, 91.6) | $51.4(46.4,56.4)$ | 97.7 (97.0, 98.4) | 8.5 (7.26, 9.79) | 0.19 (0.14, 0.24) | 73.1 (68.1, 78.0) |
| HF MS + Tymp | 2711 | 85.3 (80.8, 89.8) | 87.6 (86.1, 89.0) | 46.0 (41.4, 50.7) | 98.0 (97.3, 98.6) | 6.9 (5.97, 7.76) | 0.17 (0.12, 0.22) | 72.9 (68.1, 77.6) |
| DPOAE + Tymp | 2817 | 88.3 (84.2, 92.4) | 85.6 (84.0, 87.2) | 43.3 (38.9, 47.7) | 98.3 (97.7, 98.9) | 6.1 (5.40, 6.85) | 0.14 (0.09, 0.18) | 73.9 (69.5, 78.2) |

[^3]imputation was conducted to understand how each of these tools might perform, particularly in the younger age group ( 3 to 6 years), where behavioral responses could not be obtained, and results were not missing at random. However, the ability of multiple imputation to produce unbiased estimates relies on the availability of enough variables that predict missingness and missing data values themselves (Sterne et al. 2009). In addition, the use of a comprehensive reference standard, while essential for ensuring children with middle ear disease are identified, reduces our ability to compare results of diagnostic accuracy across studies.

## Strengths

To our knowledge, this is the first study to directly evaluate both behavioral pure-tone screening and objective OAE screening tools, as well as the inclusion of tympanometry in children across all school-ages ( 3 to $18+$ years). Furthermore, a large dataset was used to evaluate these various screening protocols. The reference standard or benchmark assessment was completed on all children, in contrast with many studies that include a benchmark on only a portion of the sample. Our reference standard also included otoscopy and tympanometry to prioritize detection of both hearing loss and/or middle ear disease in this population.

## Clinical Implications

There are substantial public health implications of this study. The addition of tympanometry to the mHealth pure-tone screening for older children and DPOAE screening for younger children (3 to 6 years of age) significantly improved the sensitivity of the tools without decreasing specificity. Tympanometry helped to more accurately identify children in need of additional testing and decreased the number of children missed with mild hearing loss and middle ear disease. Our findings support the addition of tympanometry as a required element in screening programs for rural and underserved areas globally, where ear infections are common.

Hearing screening protocols should differ for younger (3 to 6 years) and older school children (aged 7 and older). Our findings indicate that DPOAE plus tympanometry is the preferred screening protocol in children 3 to 6 years of age (preschool to 1 st grade). DPOAE plus tympanometry is easier to obtain in the youngest cohort and is more accurate when compared with other screening tools that involve behavioral responses. Our findings suggest that the mHealth pure-tone screen with high frequency and tympanometry is the preferred screening protocol in children ages 7 and older. Depending on the needs of a screening program, however, DPOAE could be used interchangeably with the mHealth pure-tone screen when combined with tympanometry.

Standardized use of the most appropriate protocol for a given population is a critical component of any screening program, yet there continues to be a lack of consensus in the literature on which screening tools are the most accurate (Prieve et al. 2015). Results from our study should inform guidelines for screening and are generalizable to rural populations globally where infec-tion-related hearing loss is most prevalent.

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De-identified data that support the findings of this study are available upon reasonable written request, with necessary approvals and execution of a formal data use agreement.

The authors have no conflicts of interest to disclose.
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[^1]:    *All target condition definitions and referral criteria were prespecified.
    DPOAE, distortion product otoacoustic emissions.

[^2]:    
     otitis media, otorrhea, perforation, patent or plugged tube, external otitis, foreign body) requiring healthcare follow-up.
    $\ddagger$ Reference standard includes type B or C tympanometry OR otoscopy findings of retraction, effusion, acute otitis media, otorhea, perforation, presence of tympanostomy tube, or external otitis requiring healthcare follow-up. NPV, negative predictive value.

[^3]:    
    
     $\ddagger$ Reference standard includes referral for: pure-tone average $(0.5,1,2,4 \mathrm{kHz})>20 \mathrm{~dB}$ OR any tone $(0.5,1,2,4,6,8 \mathrm{kHz})$
    otitis media, otorrhea, perforation, patent or plugged tube, external otitis, foreign body) requiring healthcare follow-up.
     tive value.

