

Sensorineural hearing loss impairs sensitivity but spares temporal integration for detection of frequency modulation

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The effect of the number of modulation cycles (N) on frequency-modulation (FM) detection thresholds (FMDTs) was measured with and without interfering amplitude modulation (AM) for hearing-impaired (HI) listeners, using a 500-Hz sinusoidal carrier and FM rates of 2 and 20 Hz. The data were compared with FMDTs for normal-hearing (NH) listeners and AM detection thresholds (AMDTs) for NH and HI listeners [Wallaert, Moore, and Lorenzi (2016). *J. Acoust. Soc.* **139**, 3088–3096; Wallaert, Moore, Ewert, and Lorenzi (2017). *J. Acoust. Soc.* **141**, 971–980]. FMDTs were higher for HI than for NH listeners, but the effect of increasing N was similar across groups. In contrast, AMDTs were lower and the effect of increasing N was greater for HI listeners than for NH listeners. A model of temporal-envelope processing based on a modulation filter-bank and a template-matching decision strategy accounted better for the FMDTs at 20 Hz than at 2 Hz for young NH listeners and predicted greater temporal integration of FM than observed for all groups. These results suggest that different mechanisms underlie AM and FM detection at low rates and that hearing loss impairs FM-detection mechanisms, but preserves the memory and decision processes responsible for temporal integration of FM. © 2018 Acoustical Society of America.

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I. INTRODUCTION

Communication sounds, including speech and animal vocalizations, contain relatively slow (<5–10 Hz) patterns of frequency modulation (FM) that play an important role in the discrimination and identification of the sounds (e.g., Rees and Malmierca, 2005; Zeng *et al.*, 2005). Consistent with this idea, several psychophysical studies have shown that sensitivity to slow FM is associated with speech identification for both normal-hearing (NH) and hearing-impaired (HI) individuals when speech reception is limited by acoustic degradation or competing speech sounds (Buss *et al.*, 2004; Strelcyk and Dau, 2009; Johannesen *et al.*, 2016). To understand the nature of the link between FM detection and speech perception, it is important to clarify the sensory and non-sensory mechanisms involved in FM detection and the effects of cochlear hearing loss and age on FM perception (Paraouty *et al.*, 2016; Whiteford *et al.*, 2017). That is the goal of the present study.

Many studies indicate that sensorineural hearing loss impairs the ability to detect FM, sometimes substantially (for a review, see Moore, 2014). This has been reported for a

wide range of audiometric configurations, stimulus levels, carrier frequencies, modulation rates and modulation patterns (e.g., Moore and Skrodzka, 2002; Lacher-Fougère and Demany, 1998; Buss *et al.*, 2004; Strelcyk and Dau, 2009; Ernst and Moore, 2012; Johannesen *et al.*, 2016; Kortlang *et al.*, 2016; Paraouty *et al.*, 2016). The deficits for hearing-impaired (HI) listeners are generally interpreted as resulting from degradation of the sensory encoding of FM. In the normal auditory system, information about FM is potentially conveyed by two cues: (1) temporal-envelope cues, related to the dynamic changes in the distribution of excitation along the basilar membrane within the cochlea (resulting in fluctuations in firing rate of neurons with characteristic frequencies below and above the carrier frequency); (2) temporal fine-structure (TFS) cues related to the waveform of the stimulus at each point on the basilar membrane (and the corresponding fine timing of the action potentials in neurons with different characteristic frequencies) (Rees and Malmierca, 2005; Paraouty *et al.*, 2016). It has been proposed that for normal-hearing (NH) listeners, FM is detected via TFS cues when the FM rate is low (<5 Hz) and when the carrier frequency is below about 4 kHz (Demany and Semal, 1986, 1989; Sek and Moore, 1995; Moore and Sek, 1996; Moore and Skrodzka, 2002; Ernst and Moore, 2010;

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Paraouty *et al.*, 2016; Paraouty *et al.*, 2018; Wallaert *et al.*, 2016), and via temporal-envelope cues when the FM is fast or when the carrier frequency is higher than 4 kHz (Zwicker, 1956; Maiwald, 1967; Saberi and Hafter, 1995; Moore and Sek, 1996; Ernst and Moore, 2010; Paraouty *et al.*, 2016; Paraouty *et al.*, 2018).

The ability to use temporal-envelope cues may be reduced in the impaired auditory system because of (1) reduced conversion of FM into temporal-envelope cues at the outputs of the cochlear filters, resulting from the loss of outer hair cells in the cochlea and the consequent broadening of the filters (Glasberg and Moore, 1986); (2) loss of auditory-nerve fibers (Kujawa and Liberman, 2009) and the consequent impoverished (i.e., more noisy) neural representation of temporal-envelope cues in the early auditory system, as suggested by the psychophysical, electrophysiological and modeling work of Bharadwaj *et al.* (2015), Goodman *et al.* (2017), and Paul *et al.* (2017); (3) central changes, such as a loss of inhibition, which may affect envelope extraction and processing (Davis *et al.*, 2010).

A reduced ability to use TFS cues may result from: (1) reduced precision of neural phase locking or a reduced number of neurons conveying phase locking (Kujawa and Liberman, 2009); (2) changes in the relative phase of response at different points along the basilar membrane (Ruggero, 1994), which would disrupt central mechanisms decoding TFS information based on correlation of the outputs of adjacent places (Shamma, 1985; Carney *et al.*, 2002); (3) more complex and more rapidly varying neural TFS resulting from broader cochlear filters (Moore, 2008); (4) a mismatch between neural TFS information and the place on the basilar membrane that would “normally” respond to that information (Henry *et al.*, 2016); (5) central changes following cochlear hearing loss, such as loss of neural inhibition (Moore, 2008), as suggested by models assuming that TFS may be recoded spatially at the brainstem level via lateral inhibition (Shamma and Lorenzi, 2013; see also Davis *et al.*, 2010).

For HI listeners, the poorer-than-normal sensitivity to high-rate FM may result mainly from reduced conversion of FM into temporal-envelope cues, whereas the poorer-than-normal sensitivity to low-rate FM for low carrier frequencies may result from abnormal encoding and/or use of TFS cues. However, the origin of the observed deficits in FM detection remains a matter of debate (Ernst and Moore, 2012; Sheft *et al.*, 2012; Kortlang *et al.*, 2016; Paraouty *et al.*, 2016; Wallaert *et al.*, 2016; Whiteford *et al.*, 2017), and it is possible that the deficits result partly from reduced “processing efficiency,” that is a reduced ability of the central auditory system to make optimal use of available sensory information, perhaps caused by a decline in short-term memory and decision-making capacities. Consistent with this idea, recent work suggests that aging and sensorineural hearing loss are associated with reduced processing efficiency (modeled as increased “internal noise”) for amplitude-modulation (AM) detection (Füllgrabe *et al.*, 2015; Paraouty *et al.*, 2016; Wallaert *et al.*, 2017), although some studies have shown no relationship between age and sensitivity to AM (Schoof and Rosen, 2014, Whiteford *et al.*, 2017).

The present study was designed to clarify the relative contributions of sensory and non-sensory factors to FM detection for older HI listeners by combining a psychophysical and modeling approach. To do this, temporal integration was compared for AM and FM detection. Temporal integration here refers to the improvement in modulation detection thresholds with increasing number of modulation cycles, N (Viemeister, 1979; Hartmann and Klein, 1980). The temporal integration of AM and FM is assumed to reflect central (i.e., decision) processes involving “multiple looks” (Sheft and Yost, 1990; Viemeister and Wakefield, 1991) or a template-matching process (Dau *et al.*, 1997a,b).

Wallaert *et al.* (2017) measured AM detection thresholds (AMDTs) for NH listeners and listeners with mild-to-moderate sensorineural hearing loss using a carrier frequency of 500 Hz and modulation rates of 2 and 20 Hz. AMDTs decreased (i.e., improved) with increasing N for both groups and AMDTs were smaller for the HI than for the NH group. Also, temporal integration of AM (the beneficial effect of increasing N) was greater for the HI group. Wallaert *et al.* (2017) developed a computational model based on the modulation-filterbank concept and a template-matching decision strategy (Dau *et al.*, 1997a,b) to account for the data. The data and the simulations suggested that the loss of amplitude compression in the impaired cochlea was mainly responsible for the enhanced sensitivity and temporal integration of AM found for the HI listeners. They also suggested that, for AM detection, cochlear damage is associated with increased internal noise, but preserved short-term memory and decision mechanisms. We thus reasoned that, if FM detection relies on the use of temporal-envelope cues resulting from FM-to-AM conversion at the outputs of the cochlear filters, sensorineural hearing loss should have similar effects on the temporal integration of AM and FM cues. In other words, temporal integration of FM should be greater for HI listeners than for NH listeners.

In the present study, FM detection thresholds (FMDTs) were measured at 40 dB sensation level (SL) for listeners (aged between 50 and 64 years) with mild-to-moderate sensorineural hearing loss (designated HIo), using a 500-Hz sinusoidal carrier and modulation rates of 2 and 20 Hz. For HIo listeners with absolute thresholds of 40 dB HL or more, the level was set to 80 dB sound pressure level (SPL). FMDTs were measured with and without interfering AM at the same rate as the FM. The AM was present in both intervals of a forced-choice trial, and was therefore uninformative, whereas the FM was present in only one interval. The task was to identify the interval with the FM. The AM was used to make it more difficult for the listeners to use temporal-envelope cues. In particular, if FM is detected by monitoring changes in excitation at a single point on the excitation pattern (Zwicker, 1952, 1956), the interfering AM should greatly impair performance (Moore and Sek, 1996). FMDTs were also measured with and without interfering AM for young NH (NH_y) listeners and older NH (NH_o) listeners matched in age with the HIo listeners. The data were compared with FMDTs measured by Wallaert *et al.* (2016) for NH_y and NH_o listeners and AMDTs measured by Wallaert *et al.* (2016) and Wallaert *et al.* (2017) for NH_y,

NHo, and HIo listeners under identical conditions. Finally, the data were compared to the predictions of a model of temporal-envelope processing based on the assumption that modulation detection is achieved by cross-correlating the outputs of AM channels with memory-stored templates according to an “optimal detector” scheme (Dau *et al.*, 1997a,b; see also Ardoint *et al.*, 2008). The model incorporated stages simulating temporal-envelope processing by low-level sensory mechanisms (cochlear filtering, instantaneous amplitude compression, adaptation), mid-level processes (bandpass AM filtering), and higher-level non-sensory processes (internal noise, memory decay in the temporal-envelope domain, and template matching).

II. METHOD

A. Listeners

1. Hearing-impaired listeners

Twelve HIo listeners aged between 50 and 64 years [mean = 59 years; standard deviation (SD) = 4 years] were tested for FM detection with interfering AM. Nine of these were also tested for FM detection without interfering AM. The audiograms for the tested (right) ears of all 12 listeners are shown in Fig. 1. All had audiometric thresholds ≤ 60 dB HL between 0.25 and 4 kHz. The severity of hearing loss was classified as mild to moderate based on audiometric thresholds. The audiometric thresholds at the tested frequency (0.5 kHz) ranged between 30 and 50 dB HL (mean = 40 dB HL; SD = 5.6 dB). For the 9 HIo listeners who were tested for FM detection without interfering AM, the audiometric threshold at the tested frequency ranged

between 30 and 45 dB HL (mean = 38 dB HL; SD = 5 dB). The cochlear origin of hearing loss was diagnosed based on air-conduction, bone-conduction and impedance audiometry. Eleven out of the 12 HIo listeners participated in a previous study that investigated temporal integration for AM detection (Wallaert *et al.*, 2017).

2. Normal-hearing listeners

Sixteen NHy listeners aged between 22 and 28 years (mean = 24 years; SD = 2 years) and 15 NHo listeners aged between 47 and 66 years (mean = 55 years; SD = 8 years) were tested for FM detection with interfering AM and for AM detection. The data for 15 of the NHy listeners and 14 of the NHo listeners were reported by Wallaert *et al.* (2016) and Wallaert *et al.* (2017). All of these NHy and NHo listeners had audiometric thresholds less than 20 dB HL for the tested (right) ear for octave frequencies between 0.25 and 3 kHz, but some of the NHo listeners had elevated audiometric thresholds for frequencies above 3 kHz. The mean audiometric threshold at 0.5 kHz was 7.8 dB HL (SD = 3.1 dB) for the NHy group and 9.3 dB HL (SD = 5 dB) for the NHo group. Audiometric thresholds at 0.5 kHz were not significantly different between the NHy and NHo groups [$t(29) = -1.03$; $p = 0.313$]. A second t -test showed no significant difference in age between the NHo and HIo groups [$t(25) = -1.11$; $p = 0.275$].

Eleven of the listeners for each group were also tested for FM detection without interfering AM. For the 11 NHy and 11 NHo listeners who were tested for FM detection without interfering AM, the mean audiometric threshold at 0.5 kHz was 7.7 dB HL (SD = 3.4 dB) for the NHy group and 9.5 dB HL (SD = 5.7 dB) for the NHo group. A t -test showed no significant difference in audiometric thresholds at 0.5 kHz between the two NH groups [$t(20) = 0.91$; $p = 0.375$]. A second t -test showed no significant difference in age between the NHo and HIo groups [$t(21) = 1.31$; $p = 0.204$]. The data for 8 of the 11 NHy listeners were reported by Wallaert *et al.* (2016).

All listeners were fully informed about the goal of the study and provided written consent before their participation. This study was approved by the local ethical committee of University Paris Descartes (CERES, No. IRB: 20143200001072 and No. IRB: 20153600001072).

B. Procedure

FMDTs were measured using a two-interval forced-choice adaptive procedure estimating the 70.7% point on the psychometric function (Levitt, 1971). Each trial contained a target (with FM) and a standard (without FM) stimulus, in random order, with a silent interval of 600 ms between them. Listeners were asked to indicate which interval contained the “extra” pitch fluctuation. The root-mean-square level of the two stimuli was, on average, the same. To reduce the ability to use possible cues relating to small overall loudness differences, the levels of the standard and target stimuli were roved independently over a range of ± 1.5 dB. The onset and offset ramps had durations of 250 and 25 ms for the modulation rates of 2 and 20 Hz, respectively (the ramp duration

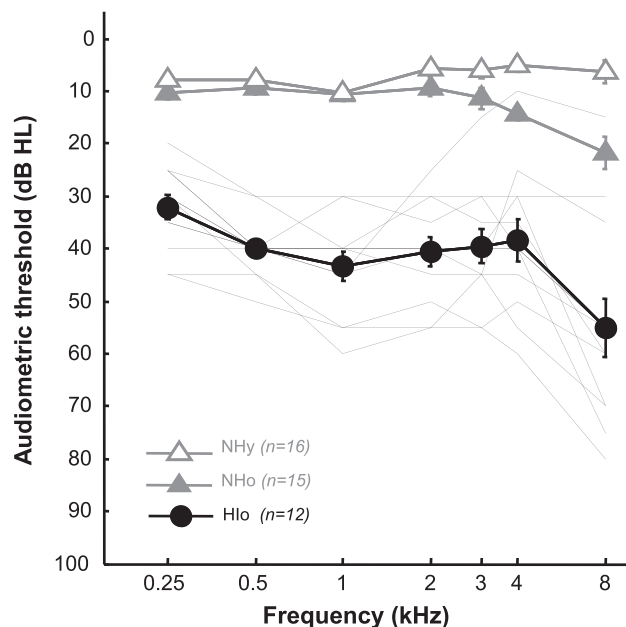


FIG. 1. Individual (thin lines) and mean (filled circles and black thick lines) audiometric thresholds for the older hearing-impaired (HIo) listeners for the right (tested) ear. Mean thresholds for the young normal-hearing (NHy) group are shown by open triangles and mean thresholds for the older normal-hearing (NHo) group are shown by filled gray triangles. Error bars indicate ± 1 standard error of the mean. They are omitted when they would be smaller than the size of the symbol used to plot the data.

was equal to half the period of the modulation). In conditions with interfering AM, the AM was present in both intervals of a trial, and was therefore uninformative. For both the AM and FM detection tasks, the duration of each signal was determined by the number of modulation cycles, N , and the modulation rate, f_m . For the FM detection task, N was 2, 3, 4, 5, or 9 cycles when FM was presented with interfering AM and 2, 3, or 4 cycles when FM was presented without any interfering AM. For the AM detection task, N was 2, 3, 4, 5, or 9 cycles. Each interval was marked by a light on the computer screen. Visual feedback as to the correct response was provided after each response.

The tracking variable was the frequency excursion in Hz, Δf (see Sec. II C for details). A run started with the tracking variable well above the estimated detection threshold for all groups (the starting value of Δf was $20f_m$ for both rates). Following two consecutive correct responses, the value of Δf was decreased, while following one incorrect response it was increased. The value of Δf was changed by a factor of 1.5625 (1.252^2) until one reversal had occurred, and then by a factor of 1.25. Fourteen reversals were obtained for each run, and the threshold estimate for that run was taken as the geometric mean of the values of Δf at the last six reversals. Two threshold estimates were obtained for each condition. The final estimate of the threshold was taken as the geometric mean of the two threshold estimates.

C. Stimuli

The stimuli were identical to those used by Wallaert *et al.* (2016). All stimuli were generated digitally at a sampling rate of 44.1 kHz. They were presented using Sennheiser HD 280 pro headphones (Old Lyme, CT) and an external soundcard (ECHO Indigo DJ 1–2, Santa Barbara, California; 16-bit resolution) at a mean SL of 40 dB, except for 3 HIo listeners with absolute thresholds of 40 dB HL or more, for whom the level was set to 80 dB SPL. Levels were calibrated using a Bruel & Kjaer 2250 sound level meter and ear simulator type 4153 (Naerum, Denmark) complying with IEC 60318-1. Stimuli were presented only to the right ear.

For the FMDTs measured with interfering AM, the standard stimulus contained AM but not FM. The target stimulus contained both AM and FM. Equation (1) describes the target stimulus $T(t)$,

$$T(t) = AM(t) \sin[(2\pi f_c t + \Phi) + \beta(\sin(2\pi f_m t + \varphi))], \quad (1)$$

with $AM(t) = [1 + m \sin(2\pi f_m t + 3\pi/2)]$ with $m = 0.33$ and $\beta = \Delta f/f_m$, where Δf is the frequency excursion in Hz, f_m is the modulation rate (2 or 20 Hz), φ is the starting phase of the FM, f_c is the carrier frequency (500 Hz), Φ is the starting phase of the carrier, and t is time in s. The values of φ and Φ were randomly and independently chosen for each stimulus. The interfering AM had a fixed modulation index of 0.333, corresponding to a peak-to-valley ratio of 6 dB, as in Moore and Glasberg (1989). It was chosen to be large enough to disrupt cues for FM detection based on changes in excitation level, but not so large that it would induce substantial level-related pitch shifts (Verschuure and van Meeteren, 1975;

Emmerich *et al.*, 1989). Although the starting phase of the AM was fixed, its phase relative to that of the FM was random (because φ was chosen randomly), so the AM should still have been effective in disrupting the use of temporal-envelope cues. For the standard stimulus, Δf was set to 0. For the FMDTs measured without interfering AM, the value of m was set to 0.

III. RESULTS

A. AMDTs versus FMDTs with and without AM ($N = 2$ –4 cycles)

Figure 2 shows mean AMDTs [top panels, taken from Wallaert *et al.* (2016) and Wallaert *et al.* (2017)] and FMDTs (bottom panels) as a function of N , for the NHy (left-most panels), NHo (middle panels), and HIo (right-most panels) listeners. FMDTs (lower panels) were measured with (grey lines) and without (black lines) interfering AM. In each panel, the filled circles and open triangles show the thresholds for $f_m = 2$ Hz and $f_m = 20$ Hz, respectively. AMDTs are expressed as $20\log_{10}m$ (dB) and FMDTs are expressed as Δf (Hz, log scale).

The reader is referred to Wallaert *et al.* (2016) for analysis of the AMDTs and FMDTs for the NHy and NHo listeners and for discussion of the effects of age on AM and FM detection. The FMDTs for the HIo listeners are comparable to those reported previously (Moore and Skrodzka, 2002; Lacher-Fougère and Demany, 1998; Buss *et al.*, 2004; Strelcyk and Dau, 2009; Ernst and Moore, 2012; Johannesen *et al.*, 2016; Paraouty *et al.*, 2016) for FM rates at or below 20 Hz and carrier frequencies below 1 kHz. In addition, the results are consistent with those of Kortlang *et al.* (2016), who assessed the detection of random slow FM (1–4 Hz), with and without superimposed AM.

A mixed-model analysis of variance (ANOVA) was conducted on the AMDTs with between-subjects factor

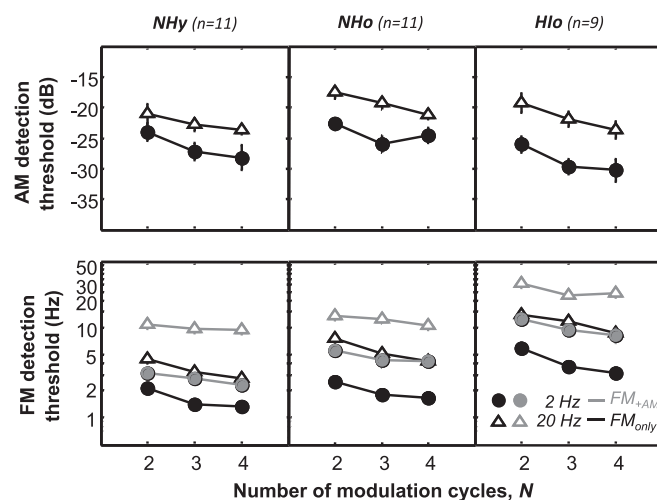


FIG. 2. Mean AMDTs (top panels) and FMDTs (bottom panels) as a function of N for the NHy (left panels), NHo (middle panels), and HIo (right panels) groups. In each panel, the filled circles and open triangles show the thresholds for $f_m = 2$ and 20 Hz, respectively. FMDTs measured without interfering AM (“FM-only” condition) are shown as black symbols and black lines. FMDTs measured with interfering AM (“FM+AM” condition) are shown as gray symbols and gray lines.

group (3 levels: NHy, NHo, and HIo) and within-subjects factors N (3 levels) and f_m (2 levels). The effect of f_m was significant [$F(1, 28) = 47.53, p < 0.001$]. For all three groups, AMDTs were lower (i.e., better) for $f_m = 2$ Hz than for $f_m = 20$ Hz. The effect of N was significant [$F(2, 56) = 26.01, p < 0.001$]. For each f_m and each group, AMDTs decreased (i.e., improved) with increasing N . The interaction between N and f_m was not significant [$F(2, 56) = 1.43, p = 0.24$], indicating that AMDTs decreased similarly with increasing N for the two modulation rates. The interaction between N and group was not significant [$F(4, 56) < 1, p = 0.80$]. This indicates that the temporal integration of AM cues was similar for all groups. This appears to be inconsistent with the results of Wallaert *et al.* (2017), who found greater temporal integration of AM for HIo listeners than for NHy and NHo listeners. However, the study of Wallaert *et al.* (2017) included higher values of N (5 and 9), making it easier to detect differences across groups. The effect of group was significant [$F(2, 28) = 3.46, p = 0.045$]. *Post hoc* comparisons were based on Fisher's protected least-significant difference test. For all conditions, AMDTs were higher for the NHo than for the NHy group ($p = 0.049$), and were lower for the HIo group than for the NHo group ($p = 0.022$), indicating a deleterious effect of greater age and a beneficial effect of hearing loss. The interaction between f_m and group was not significant [$F(2, 28) = 1.28, p = 0.29$], indicating that the effect of f_m was similar for the three groups. None of the other interactions involving group were significant [$N \times f_m \times \text{group}: F(4, 56) < 1$].

A mixed-model ANOVA was conducted on the (log-transformed) FMDTs with within-subject factors presence/absence of interfering AM (2 levels), N (3 levels), and f_m (2 levels), and between-subjects factor group (3 levels). The effect of group was significant [$F(2, 28) = 96.5; p < 0.001$], FMDTs being higher for the older groups than for the younger group, and being higher for the HIo group than for the NHo group, as shown by *post hoc* comparisons (both $p < 0.001$). The effect of interfering AM was significant [$F(1, 28) = 350.4; p < 0.001$], FM detection being worse in the presence of interfering AM. The effect of N was significant [$F(2, 56) = 94.3; p < 0.001$], FMDTs decreasing with increasing N . The effect of f_m was significant [$F(1, 28) = 308.9; p < 0.001$], FM detection being better for $f_m = 2$ Hz than for $f_m = 20$ Hz. The interaction between interfering AM and f_m was significant [$F(1, 28) = 5.8; p = 0.023$], the detrimental effect of the interfering AM being greater for $f_m = 20$ Hz than for $f_m = 2$ Hz ($p < 0.001$). This finding is consistent with previous work (Moore and Sek, 1996; Ernst and Moore, 2010, 2012) and with the notion that temporal-envelope cues play a greater role in FM detection at $f_m = 20$ Hz than at $f_m = 2$ Hz. The interaction between interfering AM and N was significant [$F(2, 56) = 5.6; p = 0.006$], the decrease in threshold with increasing N being greater in the absence than in the presence of interfering AM for all groups of listeners and for both modulation rates. For example, for the NHo group the threshold for $f_m = 20$ Hz decreased from 7.5 Hz for $N = 2$ to 4.2 Hz for $N = 4$ for FM only (a factor of 0.56), while for FM + AM, the threshold decreased from 13.7 Hz for $N = 2$ to 10.7 Hz for $N = 4$ (a factor of 0.78). The interaction between interfering AM, group and f_m was significant [$F(2, 28) = 5.8; p = 0.008$].

To analyze this interaction further, an additional mixed-model ANOVA was conducted on the ratio of the FMDTs measured with and without interfering AM (giving a measure of the interference effect caused by the AM), with within-subject factors N (3 levels) and f_m (2 levels), and between-subjects factor group (3 levels). The interaction between group and f_m was significant [$F(2, 28) = 4.895; p = 0.015$]. *Post hoc* analysis indicated that the deleterious effect of interfering AM was greater at $f_m = 20$ Hz than at $f_m = 2$ Hz for the NHy group only ($p < 0.001$). This pattern of results is consistent with the idea that NHy listeners can detect FM for low carrier frequencies and very low FM rates using a cue other than that resulting from FM-to-AM conversion (Moore and Sek, 1994, 1996; Sek and Moore, 1995) and that the ability to use this cue is reduced with increasing age (He *et al.*, 2007; Kortlang *et al.*, 2016) and with hearing loss (Moore and Skrodzka, 2002; Paraouty *et al.*, 2016).

B. AMDTs compared to FMDTs with AM ($N = 2-9$ cycles)

Figure 3 shows mean AMDTs (top panels) and FMDTs measured with interfering AM (bottom panels) as a function of N for the NHy (left-most panels), NHo (middle panels), and HIo (right-most panels) listeners.

A mixed-model ANOVA was conducted on the AMDTs with between-subjects factor group (3 levels: NHy, NHo, and HIo) and within-subjects factors N (5 levels) and f_m (2 levels). The effect of f_m was significant [$F(1, 40) = 73.79, p < 0.001$]. For all groups, AMDTs were lower (i.e., better) for $f_m = 2$ Hz than for $f_m = 20$ Hz. The effect of N was significant [$F(4, 160) = 63.63, p < 0.001$]. For each f_m and each group, AMDTs decreased (improved) with increasing N . The interaction between N and f_m was significant [$F(4, 160) = 3.70, p = 0.007$]. Consistent with the results of Wallaert *et al.* (2017), the interaction between N and group was significant [$F(8, 160) = 3.68, p < 0.001$]. The effect of group was significant [$F(2, 40) = 9.95, p < 0.001$]. *Post hoc* comparisons showed that for all N , AMDTs were higher for the NHo group than for the NHy group ($p = 0.002$), but were

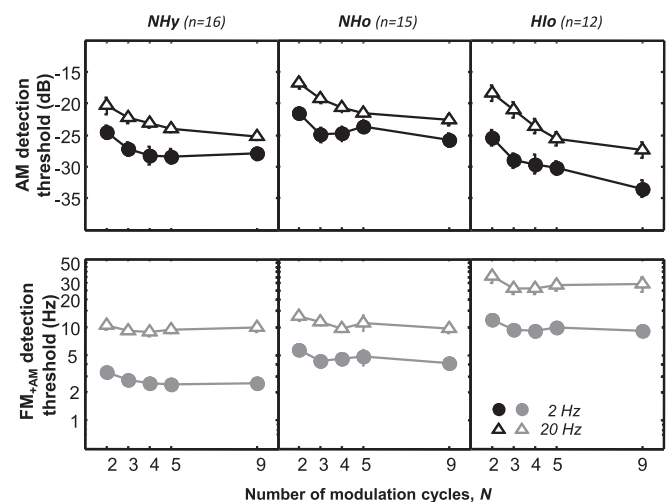


FIG. 3. As Fig. 2, except for the greater range of N , and the fact that FMDTs were measured only with interfering AM.

lower for the HIo group than for the NHo group ($p < 0.001$), indicating a deleterious effect of greater age but a beneficial effect of hearing loss. The interaction between f_m and group [$F(2, 40) = 1.65$, $p = 0.20$] was not significant: the effect of f_m was similar for the three groups. None of the other interactions involving group was significant ($N \times f_m \times \text{group}$: [$F(8, 160) < 1$]).

A linear regression analysis was conducted on the individual AMDTs [log-transformed AMDTs versus $\log(N)$]. A repeated-measures ANOVA was conducted on the resulting slopes with between-subject factor group (3 levels) and within-subjects factor f_m (2 levels). There was a significant effect of f_m [$F(1, 40) = 7.64$, $p = 0.008$], a significant effect of group [$F(2, 40) = 9.1$, $p < 0.001$] and no significant interaction [$F(2, 40) < 1$, $p = 0.611$]. *Post hoc* analyses showed that temporal integration for AM detection was: (1) greater at 20 Hz than at 2 Hz; (2) greater for the HIo than for the two NH groups (both $p < 0.002$).

A mixed-model ANOVA was conducted on the FMDTs with between-subjects factor group (3 levels) and within-subjects factors N (5 levels) and f_m (2 levels). The effect of f_m was significant [$F(1, 40) = 314.6$, $p < 0.001$]. For all groups, FMDTs were lower for $f_m = 2$ Hz than for $f_m = 20$ Hz. The effect of N was significant [$F(4, 160) = 14.5$, $p < 0.001$]. The interaction between N and f_m was not significant [$F(4, 160) < 1$], suggesting that FMDTs decreased similarly with increasing N for the two modulation rates. The interaction between N and group was not significant [$F(8, 160) < 1$], indicating that FMDTs decreased similarly with increasing N for all groups. The effect of group was significant [$F(2, 40) = 66.2$, $p < 0.001$]. For all conditions, FMDTs were higher for the NHo than for the NHy group ($p = 0.004$) and were higher for the HIo than for the NHo group ($p < 0.001$), indicating deleterious effects of both age and hearing loss. There was a significant interaction between f_m and group [$F(2, 40) = 3.6$, $p = 0.03$]. The ratio between FMDTs for $f_m = 20$ and 2 Hz was 3.6 for the NHy group, 2.4 for the NHo group, and 2.9 for the HIo group. The difference between the NHy and NHo groups is consistent with the finding of Wallaert *et al.* (2016) that age had a greater effect on FMDTs at 2 Hz ($p < 0.001$) than at 20 Hz ($p = 1$). This might reflect the effects of age on the use of TFS cues for 2-Hz FM detection. Hearing loss was associated with an increase in FMDTs for both modulation rates (all $p < 0.001$), consistent with the results of Lacher-Fougère and Demany (1998), Moore and Skrodzka (2002), and Strelcyk and Dau (2009). This may happen because hearing loss reduces the ability to use both temporal-envelope cues (reduced FM-to-AM conversion because of broader auditory filters) and TFS cues. None of the other interactions involving group was significant.

IV. MODELING AM AND FM DETECTION

A. Rationale

The present data combined with those reported by Wallaert *et al.* (2016) and Wallaert *et al.* (2017) show a differential effect of hearing loss on AM and FM detection and integration: FM detection was poorer for the HIo than for the

NHo group but temporal integration of FM cues was similar for the two groups, whereas AM detection was better for the HIo than for the NHo group and temporal integration of AM cues was greater for the HIo than for the NHo group. At first sight, this dissociation suggests different mechanisms for AM and FM detection and integration when f_c is low (here, 500 Hz) and suggests that hearing loss preserves the memory and decision processes responsible for temporal integration of FM cues. To assess whether this interpretation is correct, the FMDTs were compared with the predictions of an envelope-processing model whose parameters were initially adjusted to fit the AMDTs. The model is described in Sec. IV B.

B. The model

The general structure of the model is similar to that described by Wallaert *et al.* (2017). The first stage was a set of five linear gammatone filters (Patterson *et al.*, 1995) that simulated the bandpass filtering of the basilar membrane in the cochlea. One gammatone filter (called the on-frequency filter) was centered on the carrier frequency of the signal (500 Hz). The remaining four filters (the off-frequency filters) were centered one and two Cams (units of the ERB_N-number scale; Glasberg and Moore, 1990) above and below the carrier frequency. In what follows, the sequence of stages based on the output of each of the simulated auditory filters is referred to as a channel. In the second stage, the outputs of the five gammatone filters were half-wave rectified. For simulating normal hearing, the rectified output of the on-frequency filter was processed by a broken-stick input-output function, which applied compression for levels above a given threshold level, chosen so that compression occurred only for stimuli with levels above 40 dB SPL. The compression was implemented by raising the amplitude to the power 0.3. The rectified signals at the outputs of the four off-frequency filters were not compressed. This crudely simulates the physiological finding that compression in the cochlea occurs mainly for input frequencies close to the characteristic frequency of the place whose response is being measured (Robles and Ruggero, 2001).

The signals derived from the outputs of the five auditory filters were highpass filtered (cutoff = 2.5 Hz; rolloff = 20 dB/decade) to simulate the effects of adaptation in the AM domain (Tchorz and Kollmeier, 1999). The resulting signals were passed through a set of 10 bandpass (modulation) filters, one set for each channel, to simulate frequency-selective processing in the AM domain (Dau *et al.*, 1997a,b). The modulation filters had a Q value of 1 and a rolloff of ± 20 dB/decade (Ewert and Dau, 2000; Ewert *et al.*, 2002; Lorenzi *et al.*, 2001; Sek and Moore, 2002). The center frequencies of the modulation bandpass filters ranged between 2 and 120 Hz (Moore *et al.*, 2009) and were spaced logarithmically. For each modulation filter centered below 10 Hz, the waveform at the output of the filter was passed on for further processing, while for each filter centered at and above 10 Hz only the Hilbert envelope of the output was passed on. This was done to simulate the loss of sensitivity to envelope phase for rates above 10 Hz (Dau *et al.*, 1997a,b). Each envelope of the envelope (the so-called “venvelope” Ewert *et al.*, 2002)

was scaled so that the root-mean-square value at the output of modulation filters was the same before and after the Hilbert transformation. Figure 4 shows the final model outputs for each gammatone filter and each modulation filter in response to an FM tone [$f_c = 500$ Hz; $N = 9$; $f_m = 2$ Hz (left panels) and $f_m = 20$ Hz (right panels)] with a suprathreshold frequency excursion ($\Delta f = 20f_m$). The figure shows the final output patterns for the on-frequency and off-frequency channels. For $f_m = 2$ Hz, the fluctuation rate of the output was twice f_m for the on-frequency channel, and there was a large phase shift in output between the off-frequency channels centered above and below 500 Hz. These features were not clearly apparent for $f_m = 20$ Hz, because of envelope extraction.

The outputs of the modulation filters (the envelope for $f_m < 10$ Hz; the envelope for $f_m \geq 10$ Hz) were down-sampled by a factor 10 and then “degraded” by two sources of internal noise, which were introduced to limit the performance of the model. These noises were: (1) an additive noise, ε_{add} , and (2) an additive time-varying memory noise, characterized by parameter ε_{mem} . Both noises were modeled as Gaussian noises with zero mean and with magnitudes specified by their SD σ . Randomly drawn samples of each noise were added independently to each sample point of the outputs of the modulation filters. ε_{add} was introduced to limit intensity discrimination and AM sensitivity (Dau *et al.*, 1997a,b). ε_{mem} was introduced to simulate imperfect retention of temporal-envelope information (Ardoint *et al.*, 2008; Wallaert *et al.*, 2017). This noise primarily played a role for

very long stimuli (e.g., for 4.5-s stimuli, as used when $N = 9$ and $f_m = 2$ Hz). The SD of the memory noise increased backward in time according to an exponential function with a 1.4-s half life. The parameter σ_{mem} corresponds to the SD of the memory noise. The resulting (noisy) signals were used as input to the decision stage of the model. Equation (2) describes the noise terms and how they were combined with model signals,

$$I_{noisy}(t, cf, BMF) = I(t, cf, BMF) + \varepsilon_{add} + \varepsilon_{mem}e^{t/\tau}, \quad (2)$$

with $\varepsilon_{add} = N(0, \sigma_{add})$ and $\varepsilon_{mem} = N(0, \sigma_{mem})$.

N here is meant to denote a sample from the normal distribution, t is the time sample index in memory, increasing in the backward direction, i.e., the time relative to the end of the stimulus ($t = 0$ corresponds to the most recent sample), cf is the center frequency of the gammatone filter, and BMF is the center frequency of the modulation filter (its “best modulation frequency”). The internal representation, $I(\dots)$ is a 50-dimensional vector (5 channels \times 10 modulation filters per channel), and the noise samples were independent for each dimension and each time sample.

The decision stage was realized as a simplified version of the optimal detector described by Dau *et al.* (1997a,b). The output of the model was computed for the two stimuli in each trial. A template was generated at the beginning of each simulated threshold measurement (that is, for the first trial of each adaptive staircase) as the difference between the model output in response to the target and standard stimuli. This was done with the two internal noise sources set to zero.

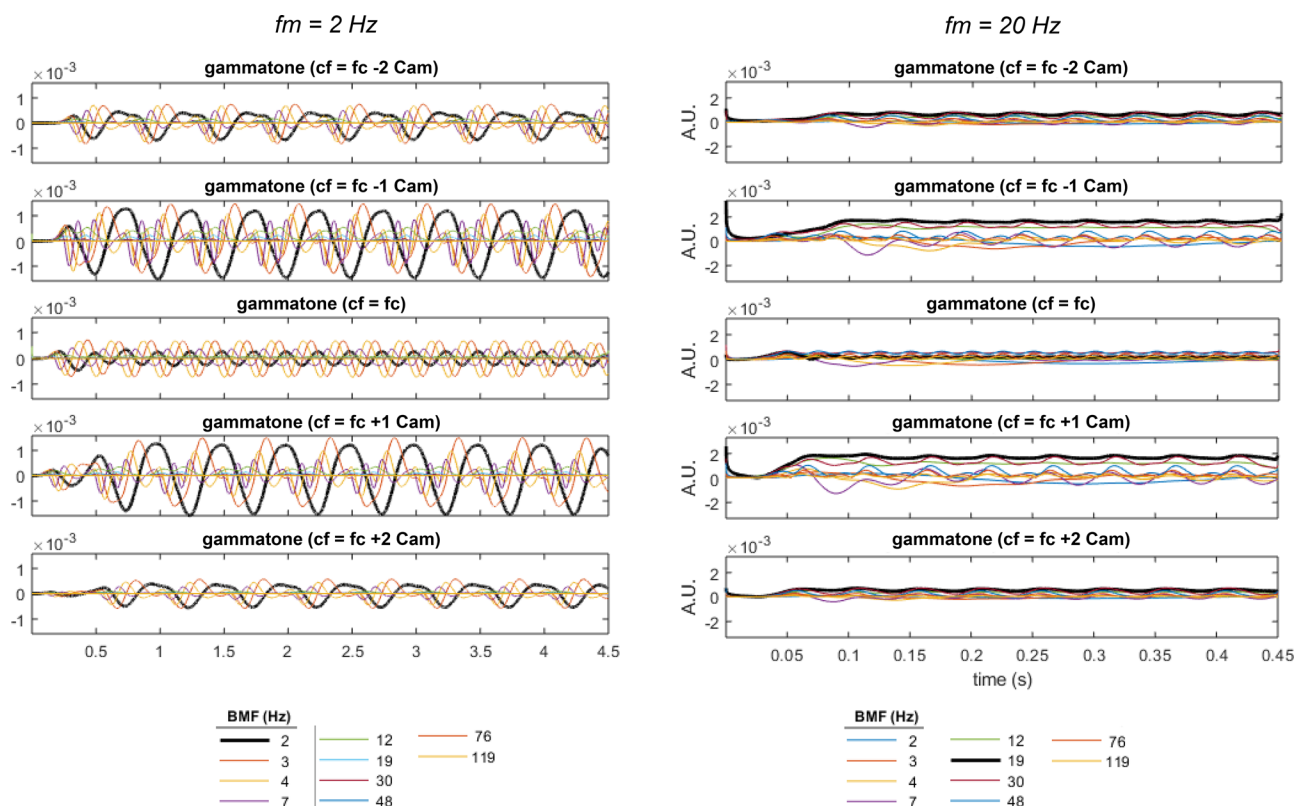


FIG. 4. (Color online) Internal representation of a 2-Hz (left panels) or 20-Hz (right panels) FM signal (500-Hz carrier) for each channel [with center frequency (cf)] and each modulation filter [with best modulation frequency (BMF)]. The black line indicates the output of the modulation filter closest to the target rate (2 or 19 Hz).

Note that this largely cancelled out the effects of the added AM on the internal representation, and therefore it represented an idealized version of what listeners do. For each subsequent trial, the template was cross-correlated with the model output for each interval in that trial. The lags used by the cross-correlation device were restricted to ± 1 modulation cycle. The normalized cross-correlation was computed separately for each channel and each modulation filter. The correlation functions were then summed across all channels to estimate the lag corresponding to the best match. The interval leading to the largest cross-correlation was taken as the target interval identified by the model for that trial. Stimuli were generated as for the behavioral experiment including the roving of overall level. Ninety thresholds were simulated and averaged for each condition.

C. Choice of model parameters

To model the data for the NHy and NHo groups, the bandwidths of the gammatone filters were set to either 0.7 or 1 ERB_N (Glasberg and Moore, 1990). The same values were used for these two groups because auditory filters do not broaden with increasing age when the audiometric threshold remains normal (Lutman *et al.*, 1991; Peters and Moore, 1992). The values of ERB_N represent average values of the bandwidths of the auditory filters estimated using data from simultaneous masking experiments (mostly with notched noise). The smaller value of 0.7 ERB_N was used based on the suggestion that human cochlear tuning may be sharper than estimated using simultaneous notched-noise masking (Oxenham and Shera, 2003) and also based on previous attempts to model AM and FM detection for NH listeners, which showed that filters with bandwidths less than 1 ERB_N were required to give a good fit to the data (Moore and Sek, 1994). To model the data for the HIo group, the bandwidths of the gammatone filters were set to either 1.4 or 2 ERB_N , simulating the reduced frequency selectivity associated with moderate sensorineural hearing loss (Glasberg and Moore, 1986; Moore, 2007). The compression parameter was set to 0.3 to model the data for the NHy and NHo groups, simulating “normal” cochlear compression for the on-frequency filter. For the HI group, the compression parameter was set to 1.0, simulating the loss of compression associated with cochlear hearing loss. The cutoff frequency of the highpass filter used to model adaptation was chosen so as to predict the relative values of the AMDTs for the two modulation rates. The values of the two noise parameters were chosen by first adjusting parameter ε_{add} and then parameter ε_{mem} so as to fit the AMDTs for the NHy listeners. Subsequently, parameter ε_{add} was adjusted to fit the AMDTs for the NHo and HIo listeners, while keeping ε_{mem} constant. Consistent with the modeling described by Wallaert *et al.* (2017), the values of ε_{add} obtained in this way were higher than for the NHy listeners by a factor 1.3 for the NHo listeners and by a factor 5.3 for the HIo listeners.

D. Modeling results

Figures 5–8 show the predictions of the model as symbols connected by dashed lines for AM detection (top

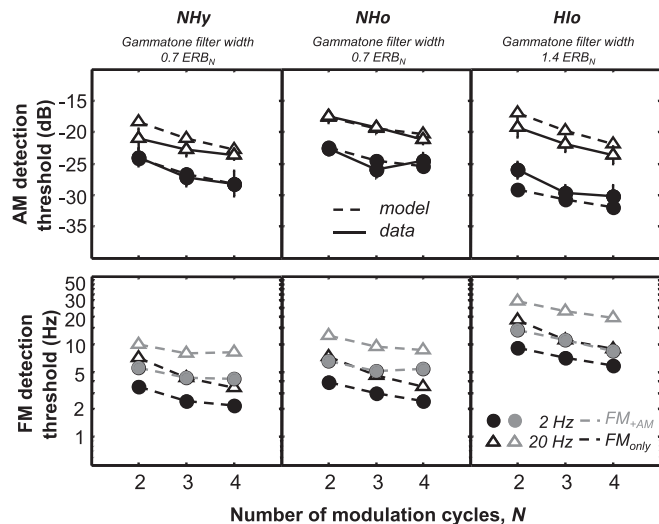


FIG. 5. Predicted AMDTs and FMDTs (dashed lines) for the models simulating the NHy, NHo, and HIo listeners. The widths of the gammatone filters were set to 0.7 ERB_N for the NHy and NHo models, and 1.4 ERB_N for the HIo model. Obtained AMDTs are shown by black symbols and continuous black lines in the top panels. Otherwise as Fig. 2.

panels) and FM detection (bottom panels). Black lines and symbols denote AMDTs and FMDTs measured without interfering AM. Gray lines and symbols denote FMDTs measured with interfering AM. Symbols connected by solid lines (when present) show the obtained thresholds.

1. Effect of simulated auditory filter width on predicted AMDTs

Consider first the effect of the bandwidths of the simulated auditory filters for the two NH groups on AM detection (top-left and top-middle panels in Figs. 5–8). Generally, the data were fitted more accurately with the bandwidth of 0.7 ERB_N than with the bandwidth of 1 ERB_N , especially for the 20-Hz rate. This is consistent with the proposal that the cochlear filters in NH ears are somewhat sharper than estimated using simultaneous notched-noise masking (Oxenham

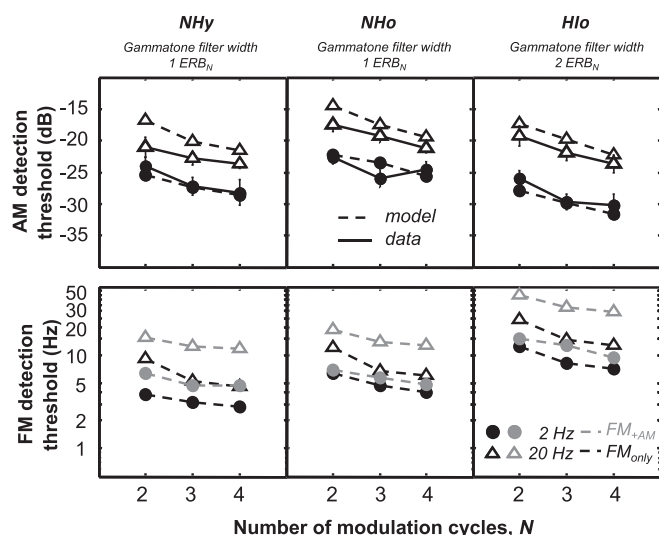


FIG. 6. As Fig. 5, but with the widths of the gammatone filters set to 1 ERB_N for the NHy and NHo models, and 2 ERB_N for the HIo model.

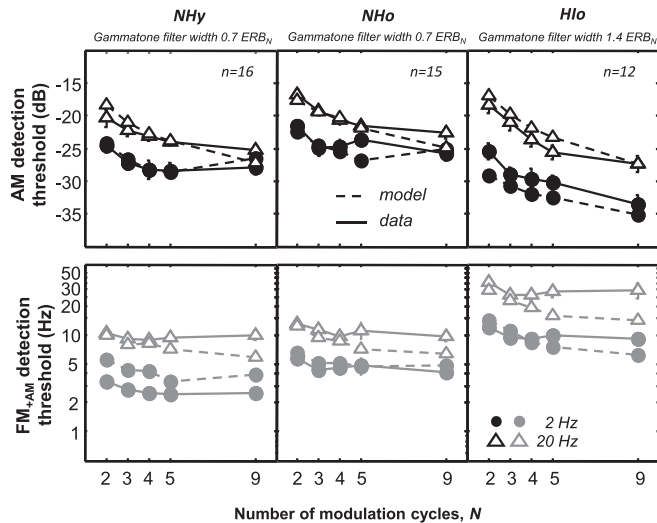


FIG. 7. Obtained (solid lines) and predicted (dashed lines) AMDTs (top) and FMDTs (bottom) for each group. The widths of the gammatone filters were set to 0.7 ERB_N for the NHy and NHo models, and 1.4 ERB_N for the Hlo model. FMDTs were measured only with interfering AM.

and Shera, 2003). The AM-detection data for the Hlo listeners were fitted roughly equally well using the simulated auditory filters with bandwidths of 1.4 and 2 ERB_N.

2. Effects of age and hearing loss on predicted AMDTs

The model predictions shown in the top panels of Figs. 5–8 captured the effects of AM rate, N and group (i.e., the effects of age and hearing loss) on the AMDTs reasonably well. However, the model made slightly less accurate predictions than the model described by Wallaert *et al.* (2017). For example, the model predicted greater temporal integration for AM than observed for the NHy listeners when $f_m = 20$ Hz (see the top-left panels in Figs. 7 and 8), and lower AM thresholds than observed for the Hlo listeners when $f_m = 2$ Hz (top-right panels of Figs. 5–8). However, the discrepancy in the latter case was small when the widths of the simulated filters were 2 ERB_N (see Figs. 6 and 8) and the

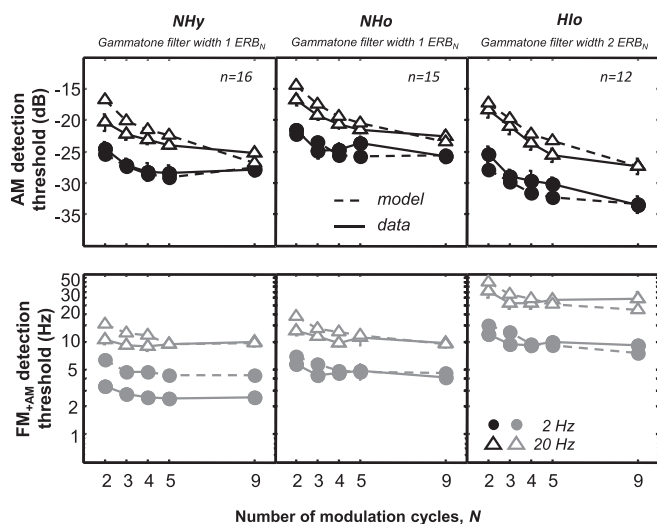


FIG. 8. As Fig. 7, but with the widths of the gammatone filters set to 1 ERB_N for the NHy and NHo models, and 2 ERB_N for the Hlo model.

average absolute deviations between the obtained and predicted thresholds (across N) were reasonably small, ranging from 0.2 to 2 dB across conditions and groups.

3. Effects of age and hearing loss on predicted FMDTs

The model predictions shown in the bottom panels of Figs. 5–8 captured some of the main trends in the data for FM detection. Specifically, for both values of the widths of the gammatone filters, the predictions captured the effects of modulation rate (the predicted FMDTs were always lower for $f_m = 2$ than for $f_m = 20$ Hz), the effects of N (the predicted FMDTs improved gradually with increasing N), and the effects of interfering AM (the predicted FMDTs were always poorer in the presence of interfering AM). Consistent with the general form of the results, the model predicted that FMDTs would be higher with greater age and with hearing loss. However, the predicted FMDTs were often higher than the obtained FMDTs, especially for the NHy group in the presence of interfering AM and for $f_m = 2$ Hz (see, for example, the bottom-left panels in Figs. 7 and 8). The discrepancy between the predictions and the data was somewhat less when the width of the simulated gammatone filters was 0.7 ERB_N than when it was 1 ERB_N, (compare Figs. 7 and 8), but it nevertheless remained quite large for the 0.7 ERB_N bandwidth.

As can be seen by comparing Figs. 2 and 5 and 6, FMDTs without and with interfering AM with $N = 2, 3$, and 4 were predicted more accurately when the widths of the gammatone filters were set to 0.7 ERB_N for both NH model and 1.4 ERB_N for the Hlo model. The goodness of fit was assessed by taking the absolute value of the logarithm of the ratio between predicted and obtained FMDTs and averaging this across values of N and the presence/absence of AM; the smaller this average, called log-AV, the better is the fit. For the NH model, log-AV was 0.12 when the filter width was 0.7 ERB_N and 0.21 when it was 1 ERB_N. For the Hlo model, log-AV was 0.12 when the filter width was 1.4 ERB_N and 0.17 when it was 2 ERB_N.

The use of sharper gammatone filters resulted in larger temporal-envelope fluctuations generated by FM-to-AM conversion and this allowed the model to predict lower FMDTs, that were more consistent with the data. However, for FMDTs obtained with interfering AM using a wider range of N (Fig. 3), the predictions for the two older groups and $f_m = 20$ Hz were more accurate for the wider simulated auditory filters (Fig. 8) than for the narrower simulated auditory filters (Fig. 7).

The model predicted FMDTs with and without interfering AM (data in Fig. 2) more accurately for $f_m = 20$ Hz than for $f_m = 2$ Hz. For the NHy model with filter width 0.7 ERB_N, log-AV was 0.17 when $f_m = 2$ Hz and 0.07 when $f_m = 20$ Hz. For the NHo model with filter width 0.7 ERB_N, log-AV was 0.23 when $f_m = 2$ Hz and 0.10 when $f_m = 20$ Hz. For the Hlo model with filter width 1.4 ERB_N, log-AV was 0.16 when $f_m = 2$ Hz and 0.07 when $f_m = 20$ Hz. This is consistent with the idea that FMDTs for $f_m = 20$ Hz are based entirely on the use of temporal envelope cues, while some other cue or cues play a role for $f_m = 2$ Hz.

4. Effect of interfering AM on predicted FMDTs

Interestingly, the model did predict the greater detrimental effect of interfering AM on FMDTs for $f_m = 20$ Hz than for $f_m = 2$ Hz. However, inconsistent with the data (Fig. 2, bottom panels), the predicted effect of interfering AM was of similar magnitude for the NHy, NHo, and HIo models for both modulation rates (Figs. 5 and 6, bottom panels). For both values of the width of the gammatone filters, the ratio of predicted FMDTs with and without interfering AM (averaged across N) ranged between 1.3 and 1.6 for $f_m = 2$ Hz and was about 2 for $f_m = 20$ Hz for the NHy, NHo, and HIo models. Corresponding obtained ratios were 1.8 for the NHy listeners and 2.6 for the NHo and HIo listeners for $f_m = 2$ Hz, and 2.8 for the NHy listeners, 2.1 for the NHo listeners, and 2.5 for the HIo listeners for $f_m = 20$ Hz. This inconsistency between the data and predictions occurred because the predicted FMDTs obtained without interfering AM for $f_m = 2$ Hz were systematically higher (i.e., poorer) than the obtained FMDTs for all three groups. The predicted FMDTs obtained with interfering AM for $f_m = 2$ Hz were close to the obtained FMDTs. This pattern of results can be explained in one or both of two ways: (1) FM-to-AM cues contributed to FM detection at a low modulation rate ($f_m = 2$ Hz), but were insufficient to explain the experimental data; (2) the NHy, NHo, and HIo listeners used a cue distinct from temporal-envelope cues when detecting FM, and this extra cue (presumably, TFS) was still available—but to a lesser extent—for the NHo and HIo listeners. It appears that this additional cue can be used more effectively in the absence than in the presence of interfering AM.

5. Temporal integration of FM

Whatever the width of the gammatone filters, the predicted temporal integration for FM in the absence of interfering AM was roughly consistent with the data. However, temporal integration was measured using a narrow range of N (2–4 cycles) in this condition. For both widths of the gammatone filters, the predicted temporal integration for FM in the presence of interfering AM, when measured using a wide range of N (2–9 cycles), was much higher than observed for each group of listeners for $f_m = 20$ Hz. The discrepancy was smaller for $f_m = 2$ Hz, but was still apparent for the HIo group. As shown in Fig. 7, when the assumed bandwidths of the auditory filters were small (0.7 ERB_N for the two NH groups and 1.4 ERB_N for the HIo group), this “over-integration” effect led to predicted FMDTs that were below obtained FMDTs for large N . As shown in Fig. 8, when the assumed bandwidths of the auditory filters were larger (1 ERB_N for the two NH groups and 2 ERB_N for the HIo group), the predicted FMDTs were above the obtained FMDTs for small N .

V. DISCUSSION

A. Effects of age and hearing loss on AM detection and temporal integration

For each value of N and for both AM rates, AMDTs for the HIo listeners were significantly lower (i.e., better) than

those for the NHo listeners tested at the same SL. This beneficial effect of sensorineural hearing loss on AM sensitivity has been explained as reflecting the loss of cochlear compression and the consequent loudness recruitment for the HI listeners. The latter has the effect of increasing the strength of the perceived fluctuations in AM sounds (Moore *et al.*, 1996) and thus, the sensitivity to AM, at least for low SLs (Jerger, 1962; Moore, 2007). The interaction between N and group was significant, temporal integration of AM being greater for the HIo group than for the two NH groups. This effect was predicted by the model (see the top panels of Figs. 7 and 8), consistent with the idea that it arises from loss of amplitude compression in the cochlea. Overall the results are consistent with the notion that at least some aspects of “processing efficiency” related to the short-term storage of temporal-envelope information and decision making are spared by cochlear damage (Wallaert *et al.*, 2017).

Overall, the model presented here made slightly less accurate predictions of AMDTs than the version of the model described by Wallaert *et al.* (2017), which used a single off-frequency gammatone filter centered 1 Cam above the carrier frequency. More precisely, temporal integration of AM for $f_m = 20$ Hz for NHy listeners was better predicted by the model of Wallaert *et al.* (2017). This difference resulted partly from differences in the number and center frequencies of the simulated auditory filters and partly from differences in the implementation of the template-matching decision device [a simple correlation process in Wallaert *et al.* (2017) versus cross-correlation in the current model]. It appears that the cross-correlation device is more efficient than a simple correlation device and real listeners. The cross-correlation device is more robust to (internal) noise than a simple correlation device. The current simulations also suggest that real listeners are less optimal than assumed here. It may be the case that human listeners cannot make perfect comparisons between their internal template and the noisy output of the modulation filters. In future studies, this central inefficiency could be modeled by adding a temporal jitter to the lags used by the cross-correlation process, hence limiting more strongly the comparison between the internal template and the outputs of the modulation filters at high modulation rates.

B. Effects of age and hearing loss on FM detection

The FMDTs for the HIo listeners were significantly higher (poorer) than those for the NHo listeners. This detrimental effect of hearing loss on FM detection is consistent with previous results obtained for older listeners with sensorineural hearing loss (Moore and Skrodzka, 2002; Lacher-Fougère and Demany, 1998; Buss *et al.*, 2004; Strelcyk and Dau, 2009; Ernst and Moore, 2012; Paraouty *et al.*, 2016) when the NH and HI groups were compared at equal SLs.

The detrimental effect of age on FM detection predicted by the model depended on a small increase in the additive internal noise used to degrade the internal representation of temporal-envelope cues at the outputs of the modulation filters. The detrimental effect of hearing loss on FM detection predicted by the model depended on the combined effects of

(1) the broadening of the gammatone filters and the consequent reduction of FM-to-AM conversion and (2) a substantial increase in the additive internal noise. The increase in internal noise had to be substantial, because the detrimental effects were partially counteracted by the loss of cochlear compression and subsequent enhancement of temporal-envelope cues resulting from FM-to-AM conversion.

Although the model reproduced some trends in the data, the model did not provide a unified account of AM and FM detection. The modeling showed that whatever the bandwidth of the simulated auditory filters, the predicted FMDTs for $f_m = 2$ Hz were higher than obtained (especially for the NHy listeners) and temporal integration of FM was overestimated for both modulation rates for all three groups. Although it is conceivable that more accurate predictions of FMDTs and temporal integration for $f_m = 20$ Hz may be obtained by using a more accurate simulation of cochlear frequency selectivity and by making the cross-correlation process less optimal (see above), it seems unlikely that such a model would succeed in predicting the low FMDTs found for the NHy listeners for $f_m = 2$ Hz. The general failure of this multi-band model of temporal-envelope processing argues for separate mechanisms for AM and FM detection for very low modulation rates and low carrier frequencies.

C. Interference effects of AM on FM

The interaction between the presence/absence of interfering AM and modulation rate was significant, the detrimental effect of the AM being greater for $f_m = 20$ Hz than for $f_m = 2$ Hz (Fig. 2), but this effect was mainly driven by the results for the NHy group, as supported by the significant three-way interaction between group, presence/absence of AM, and modulation rate. The results for the NHy group replicate previous findings (Moore and Sek, 1996; Ernst and Moore, 2010, 2012). The results are consistent with the idea that, for the NHy listeners: (1) FM detection depended partly on a cue or cues other than temporal envelope, presumably TFS cues, and that (2) TFS cues were only slightly disrupted by the interfering AM. The ability to use TFS cues worsens with increasing age (Moore et al., 2012a; Moore et al., 2012b) and with hearing loss (Hopkins and Moore, 2007; Moore, 2014) and this may account for the finding that the effect of the interfering AM for $f_m = 2$ Hz was greater for the NHo and HIo groups than for the NHy group.

Although this explanation is plausible, the model based on temporal-envelope cues alone did predict a greater effect of the interfering AM on FM detection for $f_m = 20$ Hz than for $f_m = 2$ Hz, when the auditory filters were assumed to have bandwidths of 1 ERB_N for the NH groups and 2 ERB_N for the HIo group (see Fig. 6, bottom). This happened because, in the model, AM phase information was removed for modulation filters tuned above 10 Hz but preserved for modulation filters tuned below 2 Hz. This loss of phase information limited the effectiveness of the cross-correlation device (the template-matching process) in extracting the pattern of envelope cues resulting from FM-to-AM conversion for $f_m = 20$ Hz. However, the model may be unrealistic in the assumption that AM phase can be compared precisely across

channels for low f_m and small AM depths (Green et al., 1990), as is implicit in the template-matching process. In addition, the interference effect predicted by the model for $f_m = 2$ Hz was much smaller than the obtained interference effect, and the model predicted similar interference effects for all three groups, which is inconsistent with the data. Therefore, it seems that the model does not correctly predict the pattern of interference effects produced by the AM.

Assuming that FM detection for $f_m = 2$ Hz was mediated by the use of TFS cues, at least for the NHy listeners, the obtained results suggest that interfering AM does have some adverse effect on the ability to use TFS cues. This may occur because the phase at which nerve spikes occur depends somewhat on stimulus level (Johnson, 1980; Palmer and Russell, 1986; Ernst and Moore, 2010) and on whether the amplitude is increasing or decreasing (Moore, 1973). Hence, the AM may lead to small fluctuations in the TFS that resemble those produced by FM, making AM detection harder. It may also be the case that adding the AM to FM makes the task more cognitively challenging. In the absence of AM, listeners merely have to detect that there is some kind of fluctuation at a 2-Hz rate in the target interval. When the interfering AM is present, a strong fluctuation in loudness at a 2-Hz rate occurs in both intervals, and the listener has to identify the interval with the weak additional fluctuation in pitch. This may be more difficult, in the same way that the detection of changes in the pitch of complex tones is more difficult when the tones being compared differ in harmonic content, and therefore timbre (Moore and Glasberg, 1990). Such interference effects are not captured by the current model structure.

D. Temporal integration of FM cues

Consistent with the observation of enhanced temporal integration of AM for HIo listeners, the model predicted that temporal integration of FM should be greater for HIo than for NHy and NHo listeners. This trend is visible in Figs. 7 and 8. The ratio between the predicted FMDTs for $f_m = 20$ Hz at $N = 2$ and $N = 9$ was 2 for the HIo model and 1.6 for the NHy model. In fact, the temporal integration of FM information was similar for the three groups. It appears that sensorineural hearing loss does not affect the central processes underlying temporal integration of FM information, such as the combination of “multiple looks” (Viemeister and Wakefield, 1991) or template matching (Dau et al., 1997a,b).

For FM detection in the presence of interfering AM, temporal integration was very small for all three groups (Fig. 3, bottom panels); FMDTs changed by less than a factor of 2 as N was increased from 2 to 9. This may have happened because the disruptive effect of the AM depended primarily on the phase of the AM relative to that of the FM in the signal interval (Moore and Sek, 1992); some relative phases are more disruptive than others. For example, when the instantaneous frequency is moving upwards, this leads to a decrease in excitation level on the low-frequency side of the excitation pattern, but this might be cancelled or changed into an increase if the amplitude is also increasing. Although the relative phase of the AM and FM changed from one trial to

the next, it was fixed within a given stimulus. Essentially, for a stimulus with N cycles, the same information was repeated N times. The “noise” associated with the random variation in the relative phase of the AM and FM may have limited the amount of temporal integration.

Overall, the small amount of temporal integration for FM in the presence of interfering AM was not predicted by the model (Figs. 7 and 8, bottom panels). It may be the case that a template based on a single sample of AM+FM with random relative phase does not represent adequately what the auditory system would do to perform the task. A more realistic simulation might be to use a template based on a sample of FM alone. This strategy was simulated for the FM+AM condition (see Fig. 9, top-right panel) but the predictions of temporal integration for the NHy group were no more accurate than those obtained using an “optimal” template obtained by subtracting the patterns at the outputs of the modulation filters for the target and comparison intervals (see Fig. 9, top-left panel). Thus, as pointed out above, the failure of the model probably occurs because human listeners cannot make perfect comparison between their internal template and the output of modulation filters, or they cannot construct a perfect (or “optimal” template based on the difference between the internal representations of the two intervals.

The data and model predictions were obtained using FM stimuli in the presence of interfering AM with a fixed starting phase only. To assess how the model handled greater stimulus uncertainty, we compared model predictions with and without roving of the phase of the interfering AM. The results are plotted in Fig. 9 (bottom panels) using both types

of templates (an “optimal” template vs a sub-optimal template based on a single sample of FM). Similar predictions were obtained with and without roving the AM phase, indicating that the cross-correlation device used at the decision stage of the present model could handle uncertainty as to AM and FM starting phases, presumably as real listeners would. This suggests that the current model structure is adequate, although real listeners appear less optimal than the model, presumably because their internal templates are not perfect. Further work is warranted to explore to which extent the cross-correlation process is noisy. Two alternative structures of the model could also be considered in future studies of FM detection and integration. The first model, developed by Ewert and Dau (2000), discards temporal-envelope phase information and uses the envelope power as a decision statistic. The second model, developed by Ewert *et al.* (2018), also discards temporal-envelope phase information and uses both TFS and envelope cues.

VI. SUMMARY AND CONCLUSIONS

The effects of age and sensorineural hearing loss on the detection and temporal integration of AM and FM were investigated. FMDTs were measured at 40 or 80 dB SPL (whichever was lower) for a group of listeners with mild-to-moderate sensorineural hearing loss, aged between 50 and 64 years, using a carrier frequency of 500 Hz and modulation rates of 2 and 20 Hz. The number of modulation cycles, N , varied between 2 and 9. The data were compared with FMDTs and AMDTs measured for young and older normal-hearing listeners (Wallaert *et al.*, 2016; Wallaert *et al.*, 2017).

FMDTs were higher for the hearing-impaired listeners than for the normal-hearing listeners, but the effect of increasing N was similar across groups. In contrast, AMDTs were lower (better) for the hearing-impaired listeners and the effect of increasing N was greater for them than for the normal-hearing listeners.

A model based on peripheral filtering and envelope extraction followed by a modulation filterbank and a template-based optimal detector was developed to interpret the data. AM and FM detection was limited by two internal noises (an additive noise and an additive memory noise) applied after modulation filtering, whose SD was adjusted to fit the AMDTs. Overall, the model accounted better for FMDTs for the 20-Hz modulation rate than for the 2-Hz rate, and predicted greater temporal integration for FM than observed for all groups.

Taken together, the psychophysical data and modeling results suggest that (1) FM detection for a modulation rate of 2 Hz and low carrier frequencies probably depends on a cue or cues other than those arising from FM-to-AM conversion, for example cues related to temporal fine structure; (2) greater age is associated with increased FMDTs and this can be explained partly by increased internal noise and partly by reduced sensitivity to temporal fine structure; (3) hearing loss impairs the mechanisms responsible for FM detection, but preserves the memory and decision processes responsible for temporal integration of FM.

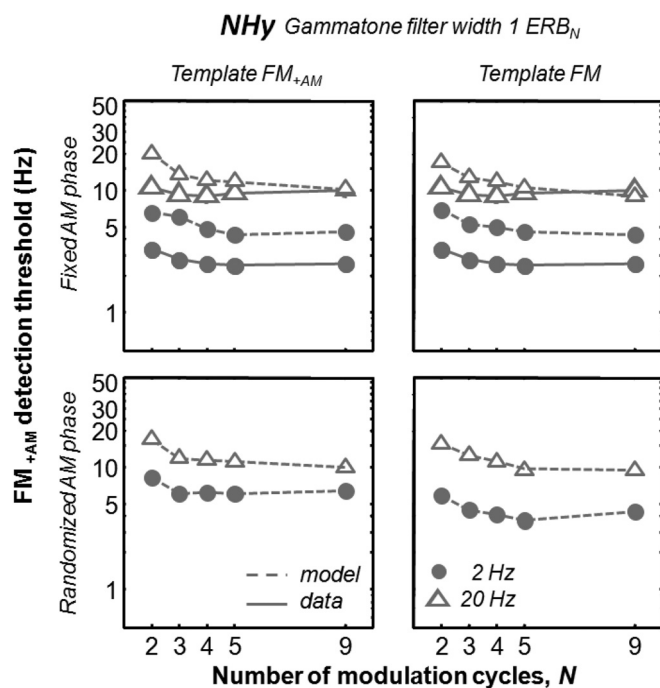


FIG. 9. Predicted FMDTs with interfering AM for the NHy group obtained using either an optimal template based on the difference between the internal representations of each interval (left panels) or a template based on a sample of FM alone (right panels), for a fixed AM phase (top panels) or randomized AM phase (bottom panels).

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